

Early College, Early Success

Early College High School Initiative Impact Study

September 2013

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This report is part of an ongoing series of reports based on the evaluation of the Bill & Melinda Gates Foundation's Early College High School Initiative. The views, findings, conclusions, and recommendations expressed herein are those of the authors and do not necessarily express the viewpoint of the foundation. Direct inquiries to Andrea Berger at 2800 Campus Drive Suite 200, San Mateo, CA 94403; or at aberger@air.org

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Contents

Acknowledgments	i
Contents.....	ii
Executive Summary	iv
About the Bill & Melinda Gates Foundation’s Early College High School Initiative (ECHSI)	iv
About the Study.....	iv
Key Study Findings.....	v
Summing Up.....	vi
Chapter 1. Introduction.....	1
Research on Dual Enrollment and Early Colleges	3
The ECHSI Evaluation.....	7
Overview of the ECHSI Impact Study	8
Chapter 2. Research Design	11
ECHSI Impact Study Conceptual Framework	11
Identifying Eligible Early Colleges.....	13
Identifying Early College and Comparison Students	16
Characteristics of Study Schools	17
Data Sources.....	19
Baseline Equivalence	23
Analytic Methods	24
Reporting Findings	28
Chapter 3. Early College Impact on Student Outcomes.....	29
High School Outcomes.....	29
College Outcomes.....	32
Conclusion	48
Chapter 4. High School Experiences.....	50
College Exposure in High School	50
Academic Rigor.....	56
Supports.....	58
Conclusion	65
Chapter 5. Summary	66
Early College Impact on Outcomes	67
Differential Early College Impact.....	68

Early College Impact on High School Experiences	69
Caveats and Future Research	70
Conclusion	72
References.....	74
Appendix A: Measures	82
Appendix B: Samples and Data Sources.....	89
Administrative Data	89
Survey Data.....	93
Appendix C: Missing Data	97
Appendix D: Technical Details on Impact Analysis	101
Multilevel Model to Estimate the Overall Early College Impact (Research Question 1)	101
Multilevel Model to Estimate the Variation in Early College Impact Across Different Types of Students (Research Question 2)	103
Appendix E: Summary of Impact Findings.....	105
Appendix F: Sensitivity Analyses.....	112
Comparison of Impact Results With and Without Specific Sites.....	112
Comparison of Impact Results Based on the Administrative Data Sample and Survey Sample.....	114
Comparison of Impact Results Based on the Fixed-Effects Model and a Random- Effects Model	115
Comparison of Impact Results That Included and Excluded Imputed Outcome Data	117
Comparison of Impact Results That Included and Excluded Baseline Characteristics	118
Appendix G: Complier Effects Analyses	119

Executive Summary

About the Bill & Melinda Gates Foundation's Early College High School Initiative (ECHSI)

In 2002, the Bill & Melinda Gates Foundation launched the ECHSI with the primary goal of increasing the opportunity for underserved students to earn a postsecondary credential. To achieve this goal, Early Colleges provide underserved students with exposure to, and support in, college while they are in high school. Early Colleges partner with colleges and universities to offer all students an opportunity to earn an associate's degree or up to two years of college credits toward a bachelor's degree during high school at no or low cost to the students. The underlying assumption is that engaging underrepresented students in a rigorous high school curriculum tied to the incentive of earning college credit will motivate them and increase their access to additional postsecondary education and credentials after high school. Since 2002, more than 240 Early Colleges have opened nationwide.

About the Study

This study focused on the *impact* of Early Colleges. It addressed two questions:

1. Do Early College students have better outcomes than they would have had at other high schools?
2. Does the impact of Early Colleges vary by student background characteristics (e.g., gender and family income)?

To answer these questions, we conducted a lottery-based randomized experiment, taking advantage of the fact that some Early Colleges used lotteries in their admissions processes. By comparing the outcomes for students who participated in admissions lotteries and were offered enrollment with the outcomes for students who participated in the lotteries but were not offered enrollment, we can draw causal conclusions about the impact of Early Colleges.

The primary student outcomes for this study were high school graduation, college enrollment, and college degree attainment. We also examined students' high school and college experiences. Data on student background characteristics and high school outcomes came from administrative records from schools, districts, and states; data on college outcomes came from the National Student Clearinghouse (NSC); and data on high school and college experiences and intermediate outcomes such as college credit accrual came from a student survey.

We assessed the impact of Early Colleges on these outcomes for a sample of 10 Early Colleges that did the following:

- Enrolled students in grades 9–12 and had high school graduates in the study years (2005–2011)
- Used lotteries as part of the admission processes in at least one of the study cohorts (students who entered ninth grade in 2005–06, 2006–07, or 2007–08)
- Retained the lottery records

Eight of the 10 Early Colleges in the study were included in the student survey. The overall study sample included 2,458 students and the survey sample included 1,294 students. The study extended through three years past high school.

Key Study Findings

- **High School Graduation**

Early College students were significantly more likely to graduate from high school than comparison students. Overall, graduation rates for both groups were high. However, 86 percent of Early College students graduated from high school, which was significantly higher than the 81 percent for comparison students.

- **College Enrollment**

Early College students were significantly more likely to enroll in college than comparison students. During the study period, 80 percent of Early College students enrolled, compared with 71 percent of comparison students. In addition, Early College students were more likely than comparison students to enroll in both two-year and four-year colleges or universities. Although the gap in enrollment rates between the two groups decreased over time, comparison students' college enrollments did not catch up to those of Early College students during the study period.

- **College Degree Attainment**

Early College students were significantly more likely to earn a college degree than comparison students. During the study period, 22 percent of Early College students earned a college degree (typically an associate's degree), as compared with only 2 percent of comparison students. In addition, Early College students earned college degrees far earlier than is typical: 20 percent of Early College students earned a degree by the time they graduated from high school.

- **Impact for Student Subgroups**

Early College impact generally did not differ by subgroup, and when the impact differed, the difference was generally in favor of underrepresented groups. The Early College impact on high school graduation and college enrollment did not differ significantly based on gender, race/ethnicity, family income, first-generation college-going status, or pre-high school achievement. In other words, all student groups experienced the impact of attending an Early College. The Early College impact on college degree attainment did not differ based on first-generation college-going status, but were stronger for female than male students, stronger for minority than non-minority students, stronger for lower income than higher income students, and stronger for students with higher middle school achievement than lower achieving students.

Summing Up

Although the findings from this study are applicable only to the 10 Early Colleges included in the study sample, they provide strong evidence for the positive impact of Early Colleges on students. Early College students had a greater opportunity than their peers to enroll in and graduate from college. They also appeared to be on a different academic trajectory, with Early College students earning college degrees and enrolling in four-year institutions at higher rates than comparison students. In addition, Early Colleges appeared to mitigate the traditional educational attainment gaps between advantaged and disadvantaged students.

These Early Colleges likely attracted academically prepared and ambitious students to their lotteries. Prior to high school, lottery applicants generally performed above the state average in the ELA and mathematics assessments. Furthermore, both Early College and comparison students had impressive high school graduation rates and college enrollment rates, though Early College students' rates were higher.

The Early Colleges in this study yielded significant and meaningful improvements in almost every student outcome examined. Early College students were benefitting from their Early College experience beyond high school, and we expect these benefits to continue. For example, Early College students may earn more college degrees, may accrue less educational debt, and may begin their careers sooner (and thus may have higher lifetime earnings) compared with other students.

Chapter 1. Introduction

The Early College High School Initiative (ECHSI), launched by the Bill & Melinda Gates Foundation in 2002, provided funds for the development of Early College High Schools (hereafter referred to as “Early Colleges”). Early Colleges offer students who are traditionally underrepresented in postsecondary education the opportunity to pursue a high school diploma while simultaneously earning college credits. The primary goal of the ECHSI is to increase students’ access to a postsecondary credential. The solution offered by the ECHSI is to improve underrepresented students’ likelihood of earning a college degree by enrolling them in college courses while they are in high school and can receive support from high school staff.

This report provides the findings from an evaluation of the ECHSI. The evaluation sought to determine if Early College students had better outcomes than they would have had at other high schools. We used a lottery-based randomized experiment. The primary student outcomes evaluated were high school graduation, college enrollment, and college degree attainment.

There is substantial evidence that a postsecondary degree or credential prepares students for successful entry into the workforce. Bachelor’s degree holders earn more over a lifetime than individuals with only a high school diploma (Carnevale, Rose, & Cheah, 2011), and college degree earners fared better in the recent American recession than adults who held only a high school diploma (Grusky, Bird, Rodriguez, & Wimer, 2013). Moreover, workforce projections consistently predict that the lion’s share of future jobs will require a postsecondary degree (Carnevale, Smith, Stone, Kotamraju, Steuernagel, & Green, 2011). Postsecondary success therefore represents the most critical goal for the initiative.

The ECHSI focuses in particular on supporting underrepresented students in achieving a college credential. Research has consistently shown that minority students and students from disadvantaged families are underrepresented as college degree recipients. First, Hispanic and African American students are less likely than non-minority students to earn a bachelor’s degree (NCES, 2012b). Second, low-income students are less likely to earn a college degree of any type than higher income students (NCES, 2012c). Third, students who are the first in their family to go to college are less likely to leave college with a degree than students whose parents have attended college (NCES, 2012c). As a result, student subgroups historically underrepresented among college degree recipients are the intended target population of the ECHSI.

Offering college courses to high school students is not unique to the ECHSI. In 2010–11, 82 percent of public high schools offered dual credit courses (Thomas, Marken, Gray, &

Lewis, 2013). In addition, approximately 53 percent of postsecondary institutions reported enrolling high school students in college courses either within or outside formal dual enrollment programs (Marken, Gray, & Lewis, 2013).¹ Despite the availability of dual enrollment programs, less than 10 percent of public high school students took advantage of them in 2010–11.²

Early Colleges facilitate dual enrollment through established course sequences. Through the ECHSI, Early Colleges partner with colleges and universities to offer enrolled students an opportunity to earn an associate’s degree or up to two years of college credits toward the bachelor’s degree during high school at no cost to the students. The underlying assumption is that engaging underrepresented students in a rigorous high school curriculum tied to the incentive of earning college credits will motivate them and increase their access to additional postsecondary education and credentials after high school.

Early Colleges differ from traditional high schools in more than just offering dual enrollment. These differences are codified in the five Core Principles of the ECHSI:

1. “Early college schools are committed to serving students underrepresented in higher education.”
2. “Early college schools are created and sustained by a local education agency, a higher education institution, and the community, all of whom are jointly accountable for student success.”
3. “Early college schools and their higher education partners and community jointly develop an integrated academic program so all students earn one to two years of transferable college credit leading to college completion.”
4. “Early college schools engage all students in a comprehensive support system that develops academic and social skills as well as the behaviors and conditions necessary for college completion.”
5. “Early college schools and their higher education and community partners work with intermediaries to create conditions and advocate for supportive policies that advance the early college movement” (Jobs for the Future, 2008, p. 2).

Of particular note is the initiative’s focus on supports as part of Core Principle 4. Early Colleges strive to have *all* students, not just academically advanced students, succeed in college courses. To accomplish this goal, they provide additional supports to students for high school and college courses. Early Colleges offer advisories, classes with high school

¹ Dual enrollment programs are formal mechanisms that enable high school students to take college courses. Many dual enrollment programs are also dual *credit* programs, in which students can earn both high school and college credits for the same course (Kleiner & Lewis, 2005). We use the term “dual enrollment” hereafter to encompass both types of programs.

² Calculated based on the total number of students enrolled in college during high school (Thomas et al., 2013) divided by the total number of students in high school (NCES, 2012a).

teachers to support particular college courses, and more accessible individual supports (AIR & SRI, 2008, 2009).³ In addition, Early Colleges provide supports in the formal transition to college. Specific supports, such as help in completing college applications and financial aid forms, are important given that the complexity of the process is a barrier to college attendance for academically qualified, low-income students (Bettinger, Long, Oreopoulos, & Sanbonmatsu, 2009; Hoxby & Avery, 2012).

In addition to the Core Principles, the ECHSI emphasizes the 3 Rs—rigor, relevance, and relationships. Rigorous instruction is intended to build students' content knowledge and learning habits. Relevant instruction is designed to engage students in understanding why they are learning a topic and in making real-world connections. Finally, personalized relationships between instructors and students are expected to support student engagement and achievement. Taken together, these principles and attributes of the ECHSI cover the features recommended for improving high school students' access to and success in college (Tierney, Bailey, Constantine, Finkelstein, & Hurd, 2009).

Since 2002, more than 240 Early Colleges have opened nationwide as part of the ECHSI (Jobs for the Future, 2013). The ECHSI operates through 13 grantee organizations, or intermediaries, that receive foundation funding to work with local partners—such as school districts, community organizations, tribes, high schools, community colleges, and universities—to open Early Colleges.⁴

In the 11 years since the ECHSI started, the call to improve high school education, college access, and college degree attainment has become louder. In the 2013 State of the Union Address (Office of the Press Secretary, 2013), President Obama stated, “Now at schools like P-Tech [an Early College] in Brooklyn, a collaboration between New York Public Schools and City University of New York and IBM, students will graduate with a high school diploma and an associate's degree in computers or engineering. We need to give every American student opportunities like this.” The ECHSI strives to provide just these opportunities; the findings from this report can inform policymakers and stakeholders about the ECHSI, its schools, and its impact on students.

Research on Dual Enrollment and Early Colleges

Although the AIR and SRI evaluation has been the most comprehensive study of the ECHSI, there have been other evaluations of dual enrollment and Early Colleges. Below, we review other descriptive and correlational studies of dual enrollment and Early Colleges as

³ The purpose of an advisory class is to ensure that at least one adult in the school gives attention to the academic and emotional needs of each student.

⁴ Organizations other than the 13 supported by the foundation have opened Early Colleges. For example, the state of Michigan has started Early Colleges (Hoffman & Webb, 2009).

well as several studies of the impact of high school reform initiatives, including the ECHSI, on student outcomes.

Dual Enrollment

The primary goal of providing college experiences to high school students is to increase the likelihood that students will finish a postsecondary credential. Correlational and quasi-experimental research provides suggestive evidence of dual enrollment's effectiveness in meeting goals such as college preparedness and completion. A correlational study conducted in two states (Karp, Calcagno, Hughes, Jeong, & Bailey, 2007) found that dual enrollment was associated with positive outcomes on a number of measures: Students who had taken college classes during high school were more likely to earn high school degrees, enroll in college, enroll in a four-year college, enroll full time, and persist in college than were students without college experience. In addition, the study found that students who received college credits during high school had higher college grade point averages (GPAs) and earned more college credits within three years of high school graduation. Another correlational study using a large federal database found similar positive outcomes for dual enrollment students, including enrollment in college, persistence in college, and college graduation (Swanson, 2008). A quasi-experimental study using a large federal database also found that dual enrollment participation increased the probability of attaining any postsecondary degree by 8 percent and a bachelor's degree by 7 percent (An, 2012). A quasi-experimental study of dual enrollment in Texas found that participation was associated with college attendance and completion (Struhl & Vargas, 2012).

Dual enrollment has also been associated with positive outcomes for students traditionally underrepresented in college. A correlational study found that dual enrollment was associated with gains in college enrollment and GPA for low-income students and lower achieving students in Florida (Community College Research Center, 2012). A quasi-experimental study on the Concurrent Course Initiative (CCI) in California, which implements career-focused dual enrollment and targets students who are low income, struggling academically, and traditionally underrepresented in college, found that participants had higher graduation rates, were more likely to enroll in a four-year college, had greater college persistence rates, accumulated more college credits as they progressed through college, and were less likely to enroll in basic skills courses in college than non-participants (Hughes, Rodriguez, Edwards, & Belfield, 2012; Rodriguez, Hughes, & Belfield, 2012). Similarly, a quasi-experimental study using national longitudinal data found that first-generation students who participated in dual enrollment were more likely to attain a postsecondary degree (of any kind) and earn a bachelor's degree (An, 2012).

Several high school programs integrate college-level content or provide college-course access to high school students. A descriptive study of programs that allow high school students to take college-level classes for college credits, such as tech-prep programs, International Baccalaureate programs, and middle college high schools, found three primary benefits for students: (a) an opportunity to earn free college credit, (b) a chance to gain “a taste” of college, and (c) increased student confidence in their own academic abilities (Hughes, Karp, Fermin, & Bailey, 2005). A correlational study (Speroni, 2011) comparing outcomes for students participating in dual enrollment with those for students taking Advanced Placement (AP) courses found that dual enrollment students were more likely to go to college after high school than students who took AP courses. However, the positive outcomes for dual enrollment were present only for students who took those courses on a college campus.

Early Colleges

Although the research on dual enrollment is promising, Early Colleges provide a more comprehensive experience than just dual enrollment, as stated in the Core Principles. A descriptive study conducted by the National Center for Restructuring Schools and Teaching, which works with the Middle College National Consortium, an ECHSI grantee organization, found that Middle Colleges succeeded in providing their students with early access to college courses, and that each year higher numbers of students from diverse racial, ethnic, and socioeconomic backgrounds participated in college coursework (Kim & Barnett, 2008). In addition, a study of Early Colleges in Texas found that Early College attendance was associated with a higher probability of exceeding state standards in mathematics in 9th, 10th, and 11th grades (SRI, 2011).

As the number of Early Colleges in operation long enough to graduate their first classes of students has grown, data are becoming available on post-high-school outcomes. In a descriptive study that examined the outcomes for 900 graduates from 11 Early Colleges in Texas, students accrued an average of 24 college credits by the time they graduated, and more than one third earned an associate’s degree (Jobs for the Future, 2011). Webb and Mayka (2011) examined graduate data for the 2007, 2008, and 2009 graduating classes in 64 Early Colleges. They reported that 24 percent of 2009 graduates who had enrolled in Early College for four years earned an associate’s degree or two years of college credit, and 44 percent accrued at least one year of college credit by high school graduation. Nearly three-fourths (73 percent) of the graduates, for whom data were available, enrolled in college the year after high school. In addition, a longitudinal qualitative study of two Early Colleges, which followed students from ninth grade through their second year of college, found positive social outcomes for Early College students, including improvements in their ability to adapt to college demands and increases in the likelihood of them seeking out academic support, taking on leadership roles, and supporting their peers (Nakkula, 2011).

These Early College studies are encouraging, but none compared Early College students with non-Early College students. One correlational study that did compare Early College and non-Early College students, conducted by AIR and SRI (2009), found that students in Early Colleges graduated at higher rates than students in other schools in the same district.

Impact Studies

The studies described thus far cannot attribute the differences in student outcomes to the Early Colleges. In fact, given the rigorous curriculum involved, it could be that Early Colleges attract, recruit, and enroll students who are different from students attending typical high schools. For example, Early College students could be more motivated, be better prepared, and have more supportive families. In other words, the previously cited correlational studies do not provide a valid assessment of the impact of Early Colleges.

The impact of Early College is best determined through an experiment in which students are assigned to Early Colleges or other high schools through a randomization process such as a lottery. The use of random assignment ensures that students in the treatment (Early College) group and their counterparts in the comparison group are similar in both observed and unobserved characteristics prior to high school, meaning that subsequent differences in student outcomes can be attributed to the different types of high schools they attended rather than to preexisting differences in motivation, aptitude, educational aspirations, or other characteristics.

One experimental study of Early Colleges is a longitudinal study of the ECHSI's North Carolina Learn and Earn Initiative that is currently being conducted by the SERVE Center. The study found that Early College students were more likely to be "on track for college" than comparison group students (SERVE Center, 2010). Early College ninth grade students were more likely to take core college preparatory courses and succeed in them. Early College students also had higher attendance rates, lower suspension rates, and higher levels of engagement than control students (Edmunds, Bernstein, Unlu, Glennie, & Willse, 2012; Edmunds, Willse, Arshavsky, & Dallas, 2013).

Two impact studies of other high school reform initiatives similar to the ECHSI yielded positive findings. MDRC used a random assignment design to study the impact of Career Academies in nine high schools. MDRC tracked students for 12 years from the time of high school entry. They found that Career Academies improved the likelihood that students at risk of dropping out stayed in school, made academic progress, and graduated (Kemple & Snipes, 2000). In addition, Career Academies increased earnings for young men and students at risk of dropping out of high school (Kemple, 2004, 2008).

The second study, by Mathematica Policy Research, examined a predecessor of the ECHSI, a middle college high school located on a college campus, which operated as an alternative school for dropout students or students with poor attendance (Dynarski, Gleason, Rangarajan, & Wood, 1998). The study used a random assignment design with a sample of 394 students. Most of the students were over age for their grade or had previously dropped out of school. Most comparison group students participated in other regular or alternative education programs. The study found that students at this middle college high school were no more likely to stay in school or graduate in the two years after random assignment than students in the comparison group.

The ECHSI Evaluation

The results reported in the chapters that follow are based on work conducted during the final years of a multi-year evaluation of the ECHSI conducted by AIR and SRI. In 2002, AIR initiated an evaluation of the ECHSI with support from the Bill & Melinda Gates Foundation. The original evaluation was designed to answer three primary research questions:

1. What are the demographic, structural, organizational, and instructional characteristics of Early Colleges?
2. What factors support or inhibit the planning and development of Early Colleges?
3. What are the intermediate and long-term outcomes for students attending Early Colleges, especially for students traditionally underrepresented in the postsecondary system?

Between 2002 and 2009, we interviewed each of the ECHSI grantees annually, surveyed school leaders in every Early College annually, conducted more than 70 site visits, and surveyed more than 5,000 students in more than 70 Early Colleges. Drawing on these data, AIR and SRI produced annual reports describing the characteristics of Early Colleges and the ECHSI participants, describing factors facilitating and constraining the planning and development of Early Colleges, and examining student outcomes.

Findings from the first eight evaluation years indicated that Early Colleges were generally implemented with fidelity to the Core Principles and had positive student outcomes.⁵ Over half of the Early Colleges were located on college campuses. To help students succeed in their coursework and the transition to college, Early Colleges provided a variety of supports, including advisories, tutoring, and academic support classes. The Early College student population was 67 percent minority and 53 percent low income—both higher percentages than found in the districts the students came from. Additionally, 46 percent of Early College students were first-

⁵ Results are from AIR & SRI, 2005, 2006, 2007, 2008, and 2009.

generation college students. Academically, Early Colleges boasted higher proficiency rates on state achievement tests than comparison districts. Most students took advantage of the opportunity to earn college credit, with 61 percent of students reporting taking at least one college class (including 73 percent of 12th graders) and a college GPA of 3.1. On average, Early College students graduated with a semester to a year of college credits, and 88 percent of graduates enrolled in college in the fall after graduation.

Overview of the ECHSI Impact Study

In 2010, the AIR-SRI evaluation of the ECHSI moved in a new direction, focusing on determining the *impact* of Early Colleges rather than documenting the development and implementation of the ECHSI. The overarching research question for the impact study is the following:

- Do Early College students have better outcomes than they would have had at other high schools?

In addition to the overall impact of Early College, the study also examines potential variation in Early College impact:

- Does the impact of Early Colleges vary by student background characteristics (e.g., gender and family income)?

We addressed these questions using a lottery-based randomized experiment, taking advantage of the fact that starting with the second year of the ECHSI, some of the Early Colleges used lotteries in their admissions processes. Our descriptive studies found consistently positive experiences and outcomes for Early College students, but we could not determine whether the positive findings were attributable to the characteristics of the students who chose to attend Early Colleges or to the Early Colleges themselves. In a lottery study, the only measurable difference between lottery applicants who were offered enrollment (“won the lottery”) and lottery applicants who were not offered enrollment (“lost the lottery”) is the lottery itself. By comparing outcomes for students who were offered enrollment with those who were not offered enrollment, we can draw valid causal conclusions about the impact of Early Colleges.

The primary student outcomes for this study are consistent with the goals of the ECHSI and the foundation’s college-readiness and postsecondary success strategies (Bill & Melinda Gates Foundation, 2009). The outcomes include whether students

- graduated from high school,
- enrolled in college, and

- earned a college certificate or degree (either during their time in high school or afterward).

We assessed the impact of Early Colleges on these outcomes and other student outcomes based on a sample of 10 Early Colleges that (1) enrolled students in grades 9–12 and had high school graduates in the study years (2005–2011), (2) used lotteries in their admission processes in at least one of the study cohorts: ninth graders in 2005–06, 2006–07, or 2007–08, and (3) retained the lottery records. This study followed students from ninth grade through up to four years after high school. Exhibit 1.1 displays the progression of students through high school for each cohort, if the students progressed at the expected pace. Study cohorts are numbered based on the year in which students entered ninth grade:

- Cohort 1 students entered ninth grade in 2005–06 and were expected to graduate in 2008–09 if they progressed at the normal pace.
- Cohort 2 students entered ninth grade in 2006–07 and were expected to graduate in 2009–10.
- Cohort 3 students entered ninth grade in 2007–08 and were expected to graduate in 2010–11.

Exhibit 1.1. Study Cohorts and Students' Expected Progression

Cohort	2005–06	2006–07	2007–08	2008–09	2009–10	2010–11	2011–12	2012–13
1	Year 1 9th	Year 2 10th	Year 3 11th	Year 4 12th	Year 5 1st post-HS	Year 6 2nd post-HS	Year 7 3rd post-HS	Year 8 4th post-HS
2		Year 1 9th	Year 2 10th	Year 3 11th	Year 4 12th	Year 5 1st post-HS	Year 6 2nd post-HS	Year 7 3rd post-HS
3			Year 1 9th	Year 2 10th	Year 3 11th	Year 4 12th	Year 5 1st post-HS	Year 6 2nd post-HS

NOTE: This table displays a traditional educational progression. Students may take more or less time to complete high school.

We drew on student record data from schools, districts, states, and the National Student Clearinghouse (NSC),⁶ as well as from a student survey to measure student outcomes. The high school student record data cover student high school outcomes through spring 2011.

⁶ The National Student Clearinghouse (NSC) collects data from higher education institutions across the country. Data are collected on student enrollments and degree completions. The data cover over 96 percent of all student enrollments in public and private colleges and universities (2013).

The NSC data cover student college outcomes through fall 2012.⁷ The student survey was administered October 2011 through January 2012. Therefore, for the youngest students (Cohort 3), all data collections capture students at least through their expected high school graduation date and into their expected first year of college enrollment.

The remaining sections of this report are organized as follows. Chapter 2 provides a detailed description of the study design. Chapter 3 reports the findings on high school and college outcomes, and Chapter 4 reports the findings on student high school experiences. Chapter 5 summarizes the study's findings. The technical appendices provide additional information on study design, data analyses, and findings. Appendix A defines the measures and identifies the data sources. Appendix B describes the administrative and survey data samples; it includes study counts, data collection procedures, and survey response rates. Appendix C displays a table of missing data rates for administrative and survey measures. Appendix D explains the technical details of the impact models that were used to respond to the two research questions. Appendix E shows analysis statistics for all impact findings presented in the report. Appendix F presents a series of sensitivity analyses. Appendix G shows the results of an analysis of the impact that Early Colleges had on students who attended Early College.

⁷ Note that the only data available for the 2012–13 year were the fall enrollments from the NSC. We did not have enrollment or degree attainment data for the full academic year.

Chapter 2. Research Design

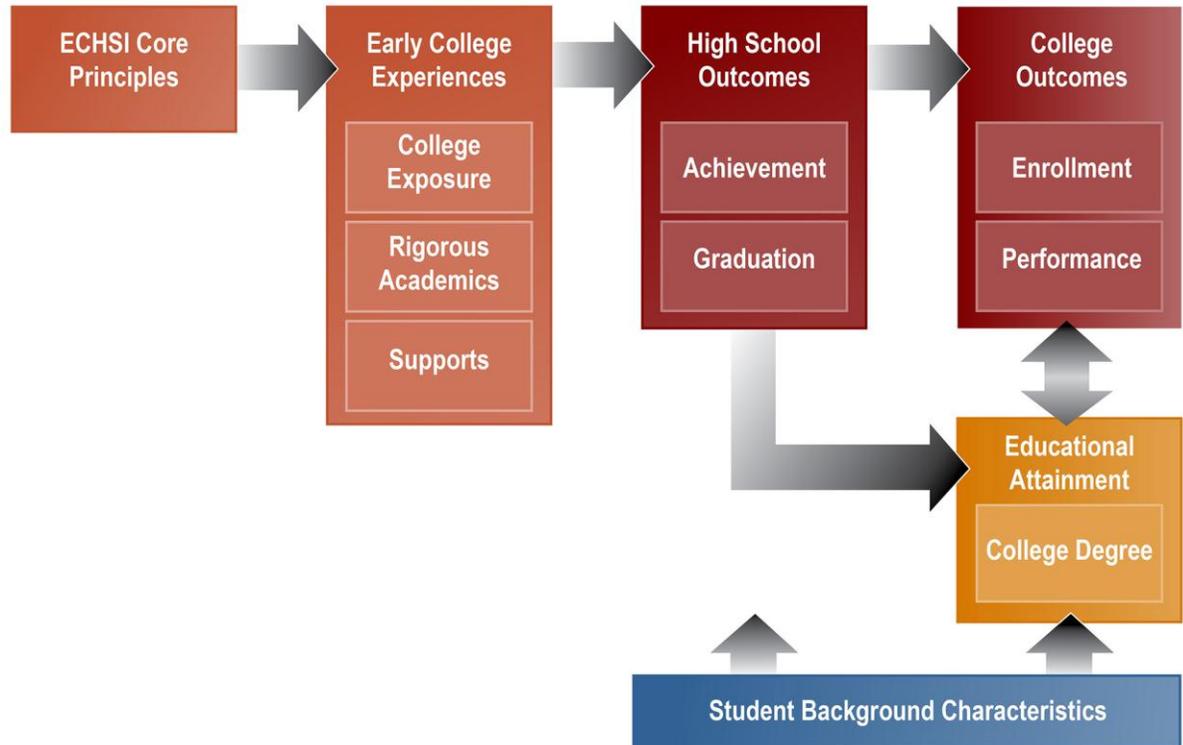
This chapter provides a description of the conceptual framework as well as an overview of the study samples, data collection activities, and analytic approach. Additional details on the research design are included in the technical appendices.

ECHSI Impact Study Conceptual Framework

To guide the study, we formulated a conceptual framework describing the key features of students' Early College experiences that are hypothesized to influence their subsequent high school and postsecondary outcomes and ultimate educational attainment (see Exhibit 2.1). Early Colleges are expected to implement programs consistent with the ECHSI Core Principles. In particular, they are expected to provide college exposure, rigorous academics, and student supports. These high school features in turn are expected to promote improved high school outcomes, including high school achievement and graduation. Students' high school outcomes may lead them to engage in further college education or lead directly to college degree attainment if the students complete sufficient postsecondary credits while in high school. Finally, student background characteristics may affect student outcomes differently both during and after high school, and may also serve as potential moderators for the Early College impact on outcomes.

We measured several key aspects of students' experiences in high school, high school outcomes, college outcomes, and educational attainment. Here, we provide an overview of the measured variables. Appendix A lists all of the measured variables, together with variable descriptions and the data sources.

Exhibit 2.1. ECHSI Impact Study Conceptual Framework



To measure students' Early College experiences, we focused on features intended to differentiate Early Colleges from traditional high schools: *College Exposure*, *Rigorous Academics*, and *Supports*. To measure college exposure, we examined students' college enrollment and credit accumulation while in high school. To measure rigorous academics, we examined course sequences in mathematics and science and frequency of rigorous instructional activities. To measure supports, we examined instructor support for students' academic, social, and emotional well-being; the college-going culture in the school; and support for the college enrollment process. We focused on college preparation–specific supports because research suggests that supports in college preparation are associated with higher college enrollment and completion rates for underrepresented students (Bettinger, Long, Oreopoulos, & Sanbonmatsu, 2009; Hoxby & Avery, 2012).⁸

High School Outcomes provide stepping stones to the initiative goal of college degree attainment. We examined two high school outcomes: *Achievement* and *Graduation*. To measure achievement, we examined high school ELA and mathematics assessment scores

⁸ Other features may also differ between Early Colleges and the schools that comparison students attended. For example, some Early Colleges have a STEM focus. Additionally, there may be other ancillary differences. For example, students in Early Colleges may benefit from attending school with like-minded peers. On the other hand, there may be some opportunity costs associated with being in an Early College. For example, students in Early Colleges may have less access to extracurricular activities or may face more challenges associated with transportation than students in other schools.

and grade point averages. For high school graduation, we measured the percentage of students earning a high school diploma.

Because students may not attend college after high school, we differentiate between college experience while in high school and college experience after high school. *College Outcomes* include outcomes that would be precursors to a college degree if students continued their education after high school: *Enrollment* and *Performance*. To measure *Enrollment*, we examined whether or not students enrolled in college and the type of institution they attended. To measure *Performance*, we examined developmental course-taking, college GPA, educational plans, students' perceptions of academic difficulty in college, and persistence (students' year-to-year college enrollment).

To measure *Educational Attainment*, we examined whether students earned a *College Degree*, either during or after high school. By college degree, we mean any postsecondary credential, including certificates, associate's degrees, or bachelor's degrees.⁹

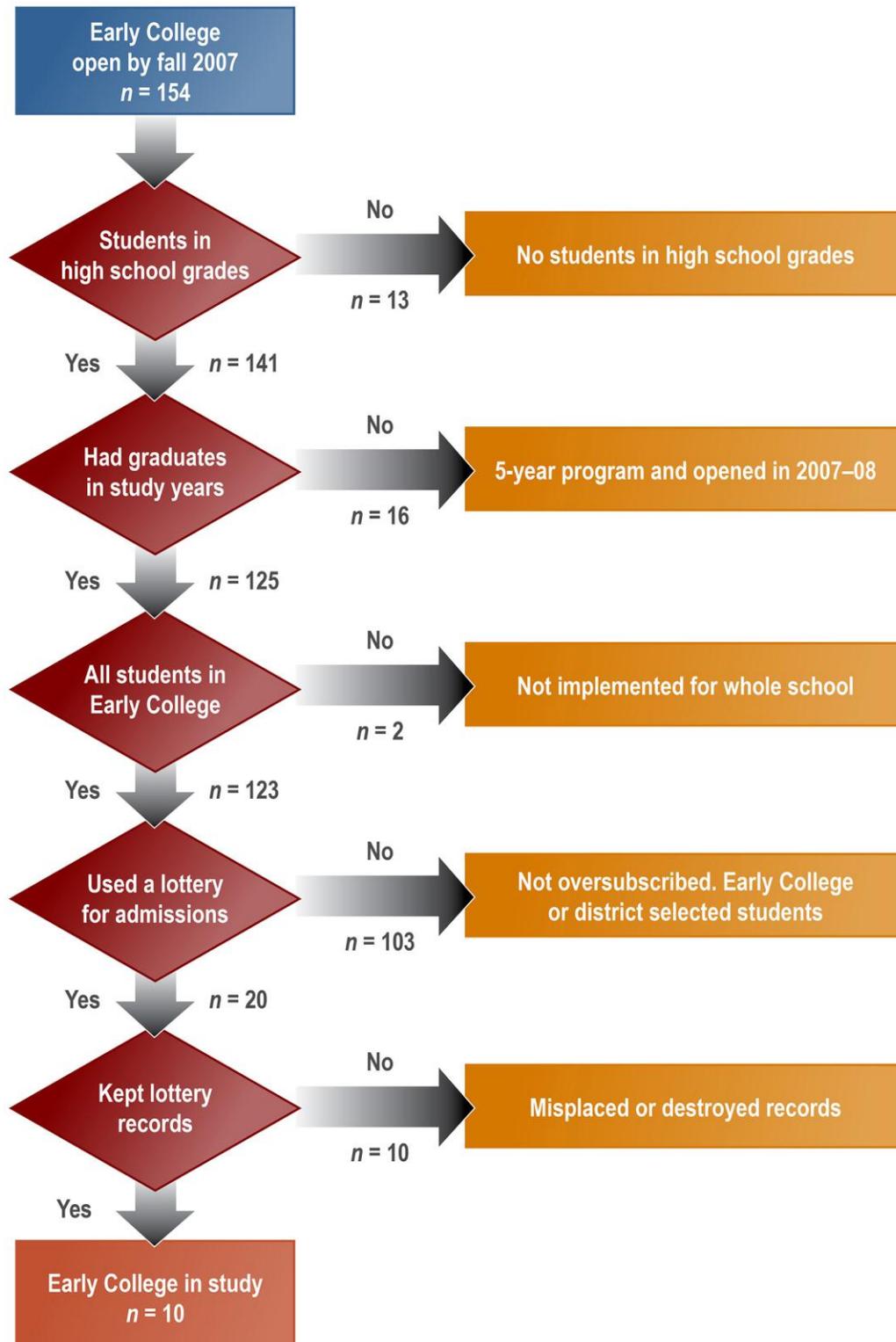
To measure *Student Background Characteristics*, we examined the following student variables, which may influence student outcomes both during and after high school: gender, student race and ethnicity, first-generation college-going status, low-income status, and pre-high-school academic achievement.

Identifying Eligible Early Colleges

To identify Early Colleges that were eligible for the impact study, we sought Early Colleges that met several criteria. Generally, the broad criteria were that the school was open and had graduates during the study period, used a lottery for admissions, and retained lottery records. We examined the 154 Early Colleges that were open by fall 2007 to identify eligible sites for the study, and we included 10 sites in the final sample. Exhibit 2.2 shows a summary of the reasons that Early Colleges were excluded and the number of Early Colleges excluded for each reason.

⁹ We use the term "degree," though it includes certificates, for clarity and to emphasize the most commonly attained credentials, which were postsecondary degrees. As will be presented in Chapter 3, few students earned a certificate.

Exhibit 2.2. Flowchart for Identifying Early Colleges for the ECHSI Impact Study



Using Lotteries Retrospectively

The study design is retrospective: we sought sites that conducted lotteries long enough in the past that students who had entered Early Colleges at the time the lotteries were conducted would have had the opportunity to graduate from high school and enter postsecondary education by the time data collection concluded. The retrospective feature of the design made it possible to estimate the impact on postsecondary outcomes within a reasonably short time frame.

To be included in the study sample, we sought Early Colleges that held a lottery for at least one of the three study cohorts shown in Exhibit 1.1. Three Early Colleges in the sample conducted lotteries for Cohort 1 (2005–06); seven conducted lotteries for Cohort 2 (2006–07); and seven conducted lotteries for Cohort 3 (2007–08). Appendix B shows the cohorts included for each Early College. The lotteries that were the basis for the study were conducted by school staff, district staff, or contractors. Because we did not have control over the random assignment process, we took steps to examine the quality of the lotteries. We put together a detailed account of the lottery process for each Early College, drawing on information obtained from extensive conversations with staff members in each school. In some cases—for example, sites where fellow researchers ran the lottery—we are quite confident in the quality of the lottery process. In other cases—for example, sites where the current school or district staff were not present at the time of the lottery—we have less information. Appendix B includes more details about lottery documentation, and Appendix F includes sensitivity analyses where we excluded sites with unclear lottery documentation.

There is some precedent for working with historical lottery records. A retrospective lottery study funded by the Bill & Melinda Gates Foundation investigated the impact of New York City’s small schools of choice on students’ academic achievement (Bloom, Thompson, & Unterman, 2010). The researchers relied on the districtwide lottery records for school enrollment, which resulted in a sample of more than 21,000 students in four annual cohorts who applied to 105 oversubscribed schools. A different study of New York City charter schools used 725 lotteries (one for each grade in each school each year) to estimate the effect of charter schools’ policies on achievement (Hoxby & Murarka, 2009). Others successfully used individual charter schools’ historical records of their lotteries in a retrospective lottery design to study the effectiveness of charter schools in Boston (Abdulkadiroglu et al., 2009) and Massachusetts (Angrist et al., 2011). Both studies included high schools and found that the treatment and comparison groups did not differ significantly on background characteristics or baseline test scores, which suggests that the lotteries held by the schools were valid.

Identifying Early College and Comparison Students

Early Colleges provided the following information about the status of each student who applied:

- Whether the student was a lottery participant
- Whether the student was accepted from the initial lottery or from a randomized wait-list

In our study, we defined “Early College students” (or treatment students) as all students who were offered admission to the Early College from a lottery prior to the first day of school. We did not differentiate between students who were accepted from the initial lottery and students who were accepted from a randomized wait-list. Our comparison students included all students who participated in the lottery but were not offered admission to the Early College prior to the first day of school. Although some Early Colleges held lotteries to accept students in multiple grades, our study included only the lotteries for the first grade level of the high school. Exhibit 2.3 includes the number of sites and Early College and comparison students for each cohort year. The 10 study Early Colleges held a total of 17 lotteries across cohorts.

Exhibit 2.3. Number of Early Colleges and Number of Students in Study Sample, by Cohort Year

Cohort Year	Number of Early Colleges	Number of Early College Students	Number of Comparison Students
2005–06	3	133	343
2006–07	7	431	551
2007–08	7	480	520
TOTAL	10*	1,044	1,414

* Some Early Colleges had multiple participating cohorts; therefore the number of Early Colleges across the three cohorts is more than the total number of Early Colleges in the study sample.

Random assignment to the Early College or comparison condition is not the same as attending or not attending an Early College. Early College students may not have attended an Early College (i.e., “no-shows”), and comparison students may have attended an Early College (i.e., “crossovers”). We defined a “no-show” as an Early College student who did not enroll in the Early College during the first year of high school, and a “crossover” as a comparison student who attended an Early College during the first year of high school. Comparison students who attended an Early College that was not in our study sample were also considered “crossovers,” as they received “treatment” similar to that for the Early College students. Across the 10 study sites, the no-show rate was 22 percent and the crossover rate was 2 percent (see Appendix B

for no-show and crossover rates for each site).¹⁰ One site had a sizable no-show rate (close to or over 50 percent in three lotteries), and one site had a sizable crossover rate (28 percent). We conducted sensitivity analyses with and without these sites on several key outcomes (see Appendix F for results).

Characteristics of Study Schools

Before delving into the characteristics of Early College and comparison students, we first examine the schools that study participants attended: the 10 Early Colleges in the study and the schools that comparison students attended. Drawing on data from an Early College survey (see details about the survey in AIR & SRI, 2009) and publicly available data, we examined the characteristics of these schools in 2007–08, when students in the youngest cohort were in 9th grade and students in the oldest cohort were in 11th grade.¹¹ Below, we first describe the Early Colleges in our study sample, followed by the schools attended by the comparison students.

Early Colleges

The 10 Early Colleges were located in five states throughout the country: 5 in urban areas, 2 in mid-sized cities, and 3 in small towns. Nine of the Early Colleges opened as new schools and one was an existing school that became an Early College. The average total student enrollment was about 290, ranging in size from about 100 to over 600. All of the schools met the typical definition of a small school (less than 150 students per grade), with about 90 students per grade on average. In 2007–08, four recently opened Early Colleges were in the process of adding a grade with each successive year of enrollment and did not yet serve all high school grades. In addition, two Early Colleges served grades 9–13, or had five-year programs.

On average, 49 percent of the students in the study’s Early Colleges were minority, with a range of 12 to 100 percent minority.¹² Three schools served a student population that was at least 80 percent Hispanic or African American. On average, 44 percent of the students in the Early Colleges were low income (i.e., eligible for the free and reduced-price lunch program, FRPL) with a range of 9 to 99 percent.

Based on our earlier descriptive research, we are able to characterize the implementation of the ECHSI in these 10 sites during the years the students attended them (see AIR & SRI,

¹⁰ Calculation of no-show and crossover rates was based on non-missing data. We did not have enrollment records for the first year of high school for 9.6 percent of the students in our study sample.

¹¹ When 2007–08 data were not available, we used 2008–09 data or data for the closest year we could find.

¹² These statistics are for the entire school populations. In subsequent sections we examine the characteristics of our study participants.

2009, for details on the 2007–08 school survey data). Most of the schools had been open as Early Colleges for at least two years as of 2007–08: three opened in 2004–05, three opened in 2005–06, three opened in 2006–07, and only one was in its first year of implementation in 2007–08. Six Early Colleges were district-run schools, and the remaining four were charter schools. Most of the schools also had a focus in addition to providing opportunities to earn college credit: five had a STEM focus, and two had a teacher preparation focus. The Early Colleges offered a wide array of supports, with all 10 Early Colleges providing tutoring and college preparatory and access information that highlighted scholarships and other financial aid information. In addition, Early Colleges offered these supports:

- Five Early Colleges offered advisories during the school day.
- Seven Early Colleges offered classes in the summer, evenings, or weekends/school breaks.
- Two Early Colleges had extended school days.
- Seven Early Colleges had block scheduling.

In terms of the implementation of the “college” part of “Early College”:

- Seven Early Colleges had course sequences in place to allow students to earn at least two years of college credit;
- Two Early Colleges had course sequences to allow students to earn at least one year of college credit; and
- One Early College had a course sequence that allowed students to earn at least some college credit.

Eight of the 10 Early Colleges were located on college campuses. Seven of the 10 Early Colleges had a two-year public college partner, two had a four-year public college partner, and one had both a two-year and a four-year public college partner. Seven Early Colleges had students start college courses in ninth grade, and five Early Colleges noted that all ninth grade students took college courses. All but one Early College had college instructors, rather than qualified high school instructors, teaching college courses. Only one Early College offered Advanced Placement (AP) classes.

Schools Attended by the Comparison Students

The comparison students in the study attended 272 different high schools. For enrollment and demographic data, we examined the high schools attended by 80 percent of the comparison students in the study sample (a total of 62 schools). These schools differed in various respects from the 10 Early Colleges in the study. These schools were generally

much larger than the Early Colleges, with enrollment ranging from 145 to 2,875 students (1,248 students on average).¹³ Only 14 of the 62 schools met the typical definition of a small school—enrollment of fewer than 150 students per grade. Of the students enrolled in these 62 schools, 61 percent were minority, and 60 percent were low income (or eligible for FRPL); both percentages were higher than those for the Early Colleges in the study.

To obtain data on the characteristics of the school curriculum, we examined the websites for the three high schools most commonly attended by the comparison students of each study site (30 schools total).¹⁴ In these schools, AP courses seemed to be more prevalent than dual enrollment as a strategy for students to earn college credit. Of the 30 schools attended by comparison students, 27 offered AP courses and 14 offered dual enrollment courses. In terms of support systems, all 30 schools had guidance and career services available, and some also provided specialized supports such as adult mentors for each student, summer programs on college campuses, or college prep programs in science and mathematics.

Overall, the schools attended by Early College students and comparison students differed in several noteworthy ways. The Early Colleges in the study were small schools typically located on college campuses. The Early Colleges provided students with the opportunity to earn a large number of college credits, and they offered an academic support system tailored to preparing students for success in college. The majority of the students who did not attend Early Colleges enrolled in larger high schools with larger minority and low-income student populations. Those schools provided fewer academic supports (e.g., tutoring) and a less direct focus on college readiness for all students.

Data Sources

To address the study's research questions, we collected data from multiple sources. We gathered educational record data came from Early Colleges, districts, state departments of education, and the NSC. For data not available from administrative records, we surveyed students after their expected high school graduation date. Each data collection activity is described below. Appendix A maps all variables analyzed to the data sources, and Appendix B includes more details about data collection.

Administrative (Educational Record) Data

We relied on administrative data to measure high school outcomes, student characteristics, and postsecondary outcomes. Administrative (or educational record) data have the benefit of

¹³ The range and mean excludes an online high school program that served over 8,000 students.

¹⁴ One school attended by the comparison students was an Early College managed by the same intermediary as an Early College in the study. It opened as a replication of the study site. Appendix B includes more details about how students attending this school were treated in analyses.

being authoritative (since they are the official student records) and are the primary source for many of the education outcomes and student characteristics examined in this study. We collected education record data from multiple sources. Appendix B provides more details on these data sources.

Student Characteristics and High School Outcomes

We used administrative data to measure student characteristics and high school outcomes. When study participants attended and remained enrolled in Early Colleges or in one of the school districts or states that provided data, we generally had complete data on their background characteristics (including eighth grade achievement) and high school outcomes. The source of the data differed by site, and for some sites, we drew from multiple data sources.

Postsecondary Outcomes

To measure student postsecondary attendance and degree attainment, we relied on data from the NSC.¹⁵ We linked the administrative data from schools, districts, and states to the NSC postsecondary data. For study students who attended colleges that contribute to the NSC and allowed their records to be made available, we received data on their college enrollments and degrees earned both during and after high school.

Student Survey Data

Because administrative data were not available for some variables of interest (e.g., student high school experiences), we also administered a student survey. The student survey provided data about the high school experiences for both Early College and comparison students, as well as data on high school and longer term outcomes that were not captured by administrative data. The survey also included an open-ended item that allowed students to comment on their high school and college experiences.

The survey was drawn from the administrative data sample and included randomly selected students who participated in the 2006–07 and 2007–08 lotteries in eight Early Colleges that agreed to provide us with student contact information.¹⁶ The two excluded Early Colleges could not provide student contact information. We limited the survey sample to students from Cohorts 2 and 3. Cohort 1 was excluded because pilot work demonstrated that older

¹⁵ NSC data provide conservative estimates of college enrollment and degree attainment. If a student did not have a record in the NSC, then that student was coded as not being in college. However, students may be missing from the NSC because (a) they attend a college that does not provide data to NSC, (b) they did not allow NSC to share their individual record data, or (c) their name or birthday in our record did not match that in the NSC. We have no reason to expect NSC data to be differentially missing for treatment and comparison students.

¹⁶ Student-level non-response-adjusted survey weights were applied to analyses of survey-based outcomes; thus the analysis results are generalizable to all participants in the lotteries in the survey sample.

students were harder to locate and had difficulty remembering details of their high school experiences.

Across the eight study sites and two cohorts, 1,416 students from the study were sampled for the student survey and 1,294 responded. The survey was administered October 2011 to January 2012 via web and telephone. The survey response rate was 94 percent for Early College students and 88 percent for comparison students, with an overall response rate of 91 percent. Across sites, response rates ranged from 83 percent to 100 percent. Exhibit 2.4 shows the number of survey participants in the treatment and comparison groups in each cohort. Appendix B provides details about the survey sample, pilot testing and administration, response rates, and open-ended data.

Exhibit 2.4. Number of Early College and Comparison Students in the Survey Sample and Response Rates, by Cohort Year

Cohort Year	Number of Early Colleges in Survey Sample	Number of Early College Students Surveyed (Response Rate)	Number of Comparison Students Surveyed (Response Rate)
2006–07	6	355 (95%)	310 (87%)
2007–08	6	415 (93%)	336 (90%)
TOTAL	8	770 (94%)	646 (88%)

NOTES: Four of the eight sites have both cohorts represented in the survey sample.

Data Collection for Each Cohort

Data were collected during the same timeframe for all cohorts. As a result, the data collection timeframe covered different years for each cohort. The oldest cohort had two more years of data than the youngest cohort. Exhibit 2.5 displays which type of data were collected for each cohort both by academic year and by years after starting ninth grade. Note that two Early Colleges had optional five-year programs. They were excluded from Cohort 3 because some students in these cohorts would not have had a chance to graduate within the study timeframe.¹⁷

¹⁷ In addition, one Early College in our sample had a five-year option for students in Cohort 3. However, almost every study student attending this Early College graduated in four years.

Exhibit 2.5. Data Collection Activities, by Year and Study Cohort

Academic Year									
Data Source	2004–05	2005–06	2006–07	2007–08	2008–09	2009–10	2010–11	2011–12	Fall 2012
Cohort 1									
	Baseline	Year 1 9th	Year 2 10th	Year 3 11th	Year 4 12th	Year 5 1st post-HS	Year 6 2nd post-HS	Year 7 3rd post-HS	Year 8 4th post-HS
Admin Record	X	X	X	X	X	X	X		
Student Survey									
NSC		X	X	X	X	X	X	X	X
Cohort 2									
		Baseline	Year 1 9th	Year 2 10th	Year 3 11th	Year 4 12th	Year 5 1st post-HS	Year 6 2nd post-HS	Year 7 3rd post-HS
Admin Record		X	X	X	X	X	X		
Student Survey								X	
NSC			X	X	X	X	X	X	X
Cohort 3									
			Baseline	Year 1 9th	Year 2 10th	Year 3 11th	Year 4 12th	Year 5 1st post-HS	Year 6 2nd post-HS
Admin Record			X	X	X	X	X		
Student Survey								X	
NSC				X	X	X	X	X	X

NOTES: The typical educational progression is shown for reference. Students may spend more or less time in high school. Cohort 1 did not participate in the student survey.

Baseline Equivalence

The results of our impact study rely on the assumption of random assignment during the lottery process. Because we were not in control of the lottery processes, we relied on school accounts of their lottery procedures to determine whether students were randomly selected to attend the Early College. To verify that students who were selected to attend the Early College did not systematically differ from comparison students, we examined the baseline equivalence of the two study groups for a variety of student background characteristics, including gender, minority status, eligibility for free or reduced-price lunch, first-generation status, and ELA and mathematics test scores prior to high school.¹⁸

We examined group equivalence in two ways. We first conducted a likelihood ratio test of global equivalence using a model that predicted treatment assignment using the full set of student background characteristics. Appendix B includes a table showing baseline equivalence using the global model. We then examined group equivalence in each individual characteristic using a model that predicted the characteristic using treatment assignment (i.e., lottery winners or not).¹⁹ The global equivalence test shows that there was a significant overall difference between the two study groups in the set of student characteristics examined ($p < .01$). We also conducted a global equivalence test excluding the prior ELA assessment from the model, and the overall difference between the two study groups was not significant. The tests of group equivalence in individual student characteristics show that the two groups were not significantly different in any characteristic except in prior ELA scores (see Exhibit 2.6). We believe the single significant difference was likely due to chance.²⁰

¹⁸ We also collected student-level data about English language learner (ELL) status and Individualized Education Plan (IEP) status before entering high school. However, only a small proportion of students in our sample were ELLs (less than 1 percent) or had IEPs (7 percent); therefore we did not include these two variables in the baseline equivalence analyses or as covariates in the impact analyses.

¹⁹ All baseline equivalence tests were conducted using two-level models that were similar to the main impact model (see Appendix D), which takes into account the clustering of students within lotteries with a random intercept and fixed slopes at the lottery level.

²⁰ We examined prior ELA and mathematics scores in each of the 17 lotteries. We examined cases where the difference between the groups was larger than 0.2 standard deviations. For prior ELA scores, Early College students scored higher than comparison students in seven lotteries, and comparison students scored higher in two lotteries, leaving eight lotteries with a gap of less than 0.2 standard deviations. For prior mathematics scores, Early College students scored higher in four lotteries, and comparison students scored higher in four lotteries, leaving nine lotteries with a gap of less than .2 standard deviations.

Exhibit 2.6. Background Characteristics of Early College and Comparison Students and Group Differences

Characteristics	Early College	Comparison	Difference
Female	51.8%	55.0%	-3.2%
Minority ^a	52.4%	53.6%	-1.2%
First-generation college going	30.7%	34.4%	-3.7%
Low income	46.5%	42.3%	4.2%
Prior achievement in ELA	.25	.15	.11**
Prior achievement in math	.23	.29	-.07

n = 2,458 students (1,044 Early College, 1,414 comparison)

NOTES: All data are from administrative data sources except for first-generation status, which comes from the student survey. Early College group means are unadjusted means, and comparison group means were computed by subtracting the estimated group difference from the unadjusted Early College group means. Prior achievement scores were converted to z-scores and were standardized using publicly available statewide assessment means and standard deviations. The values in the Difference column may not match the difference between the Early College and Comparison group means due to rounding.

^a Among students who were minority, 73.3 percent were Black, 20.2 percent were Hispanic, 2.9 percent were Asian or Pacific Islander, 2.9 percent were multi-racial, and .8 percent were another ethnic or racial group.

* *p* < .05; ** *p* < .01; *** *p* < .001

Analytic Methods

This study was designed to assess the impact of the Early Colleges on a variety of student outcomes during high school and beyond. To address our first research question, we estimated the impact of Early College on students who were *offered admission* to an Early College based on a lottery. To address our second research question, we examined the degree to which the impact of Early Colleges differed for students with different background characteristics. In all models used to address these research questions, we included the following baseline covariates: female, minority, first generation, low income, prior achievement in ELA, and prior achievement in mathematics. The analysis details are described in this section. In addition, we describe our approach to handling missing data and the generalizability of the study findings.

Estimating the Impact of Being Offered Admission to an Early College (Research Question 1)

We used two different approaches to estimate the impact of Early College. The intent-to-treat (ITT) analysis estimates the impact of being offered admission to an Early College through a lottery, regardless of whether the student actually enrolled in the Early College. The complier analysis estimates the impact of *attending* an Early College for students who

attended due to winning the lottery. These two types of impact estimates would be equivalent if all students complied with their treatment assignment—that is, if all students who won the lottery attended the Early College and no students who lost the lottery attended an Early College. The estimates may differ, however, if some lottery winners did not attend the Early College (i.e., no-shows) or if some who did not win the lottery enrolled in the Early College (i.e., crossovers).

Our primary impact analyses were ITT analyses, in which we compared the outcomes of students offered admission to Early Colleges through a lottery (i.e., the treatment group) and students not offered admission (i.e., the comparison group). (The model is described in further detail in Appendix D.) Defining students' treatment status on the basis of lottery results preserves the benefits of random assignment, maintaining the equivalence of the two study groups and thus ensuring the causal validity of the ITT impact estimates. We also examined the complier effects of Early Colleges on key outcomes, taking into account both no-shows and crossovers (see Appendix G for details about complier analyses).

To take into account the clustering of students within lotteries, our impact analyses were based on a two-level model, where the intercept was modeled as a random effect to represent potential differences in average student outcomes across lotteries. For example, some lotteries may have attracted more motivated or better prepared students than others.

We estimated a common treatment effect across all lotteries (based on a fixed-effects approach) because the number of lotteries was too small to provide stable estimates of the variation in treatment effects across lotteries for some outcomes. The use of a common treatment effect means that the results should be generalized only to the set of Early Colleges in the sample. In Appendix F, we provide a supplementary analysis of the variation in treatment effect for two key outcomes for which a random-effects analysis could be conducted without estimation problems. The analysis reported in Appendix F provides similar overall results, and it describes the extent to which the impact varies across Early Colleges.

Although we assessed the impact of Early Colleges on a variety of high school and postsecondary outcomes, we consider three outcomes “primary”: high school graduation, ever attending any type of postsecondary institution, and ever obtaining any type of postsecondary degree.²¹ We consider the remaining outcomes secondary.

²¹ Each of the three primary measures pertains to a unique type of student outcome. Thus, we did not apply multiple comparisons corrections to the primary outcomes, because multiple comparisons corrections are typically applied to multiple-measures within the same outcome domain. We also did not apply multiple-comparisons corrections to secondary outcomes. We provide the exact p-values of findings for all student outcomes in Appendix E, allowing readers to make corrections appropriate for their own purposes. See the What Works Clearinghouse (2011) handbook for a discussion of multiple correction standards.

Analyses of Variation in Early College Impact Across Students With Different Background Characteristics (Research Question 2)

This study's second research question asks whether the effect of being admitted to an Early College varies across students with different background characteristics. As noted in the first chapter, research has consistently found disparities in college degree attainment: minority, low-income, and first-generation college-going students are less likely on average to earn college degrees than their peers (NCES, 2012b). In fact, one of the guiding principles of the ECHSI is to particularly serve these disadvantaged groups of students.

We examined the potential differential effects of Early College on students with different background characteristics by incorporating treatment-by-student-characteristic interaction terms into the impact models. We explored whether the effects of being admitted to an Early College on key outcomes differed significantly by gender, race/ethnicity, first-generation college-going status, low-income status, or level of prior mathematics and ELA achievement.

For example, we measured the difference in Early College impact on high school graduation between minority and non-minority students by adding a treatment-by-minority interaction term to the student level of the main impact model. We performed similar analyses to test the potential differential effects of Early Colleges associated with gender, low-income status, first-generation college-going status, and prior ELA and mathematics achievement scores (see Appendix D for details about testing for differences by student demographics). These analyses were conducted for three key outcomes: high school graduation, college enrollment, and college degree attainment.

Missing Data

As explained earlier, data for this study came from the NSC, a student survey, and administrative records. We requested postsecondary enrollment and degree attainment data from the NSC for each student in our sample. We assumed that students for whom the NSC could not find matching records did not attend college or attain a postsecondary degree. Therefore, by definition, outcomes that exclusively use NSC data have no missing data. Measures based on the student survey had minimal missing data (most were 2 percent or less). Measures based on administrative records had higher rates of missing data (for example, high school mathematics assessments had a missing rate of 34 percent). Appendix C provides detailed information about missing data rates for measures of student outcomes and background characteristics.

To address the potential selection bias caused by non-random missing data, we used a multiple imputation approach to impute missing data. (See Appendix C for details.) We

generated 10 imputed data sets, conducted all analyses using each imputed data set separately, and then combined estimates across the 10 data sets, taking into account the uncertainty in imputed values both within and across the imputed data sets. Our primary impact analyses were conducted using the full sample with both imputed outcomes and imputed covariates. As sensitivity analyses, we also conducted the impact analyses using the imputed data sets excluding students with imputed outcomes. Results from these sensitivity analyses are presented in Appendix F. These results rarely differed from those presented in the text.

Generalizability of Findings

Our goal for the study is to assess the degree to which Early Colleges improve student outcomes. Such a question could theoretically be answered by randomly assigning students to Early College and comparison conditions at a randomly selected set of Early Colleges across the country. However, although the randomization of lottery-based admissions offers us the opportunity to draw causal conclusions about the impact of Early College, not all Early Colleges use a lottery to determine admissions, and the decision about whether or not to use an admissions lottery is itself not random. To offer a lottery, a school must have had more applicants than it had seats available and must further have decided to make admission a random process. Among Early Colleges that used an admissions lottery, the study pool was further narrowed to those that had the ability to provide data (particularly lottery records) for this retrospective study. Therefore, the final study sample includes a nonrandom set of Early Colleges.

Most of the Early Colleges in our study used multiple criteria to admit students, and the admissions lottery applied to only a subset of applicants. For example, many schools automatically accepted siblings of current students and children of staff. The study speaks only to the impact on applicants within the study schools whose initial offer of admission relied on an admissions lottery.

Due to the purposeful sample of schools and the fact that only some applicants to these schools were chosen for admission by lottery, the study findings cannot be generalized to schools and students outside of the study sample. However, our focus on Early Colleges for which we could verify a random lottery process allows us the unique opportunity to compare the outcomes of students who were randomly selected to attend an Early College with the outcomes of students who did not win the lottery but would have otherwise attended the same Early College. By taking advantage of this naturally occurring experiment, we were able to observe the counterfactual, or the outcome that lottery winners would have experienced had they not been randomly selected to attend the Early College. Despite its

limited external validity, this study enables us to draw causal conclusions about the impact of Early College through a rigorous design with strong internal validity.

Reporting Findings

In the chapters that follow, we report the estimated impact of Early Colleges on a variety of student outcomes. The Early College group means are unadjusted means. Comparison group means were computed by subtracting estimated treatment effects from the unadjusted Early College group means. Thus, the comparison group means represent the outcomes that would have been expected had the Early College students been assigned to the comparison condition. Appendix E provides more detailed findings, including estimated effect sizes, from all impact analyses. We also provide effect sizes in the report when they provide meaningful context for interpreting the findings.

Chapter 3. Early College Impact on Student Outcomes

This chapter presents the impact of being admitted to an Early College on student outcomes. We first report the findings for high school outcomes, including academic achievement and high school graduation. We then report the findings for college outcomes, including enrollment, degree attainment, and performance. In addition to the overall Early College impact on these outcomes, we also examine whether the Early College impact on three key outcomes (high school graduation, college enrollment, and degree attainment) differed for students with different background characteristics.

High School Outcomes

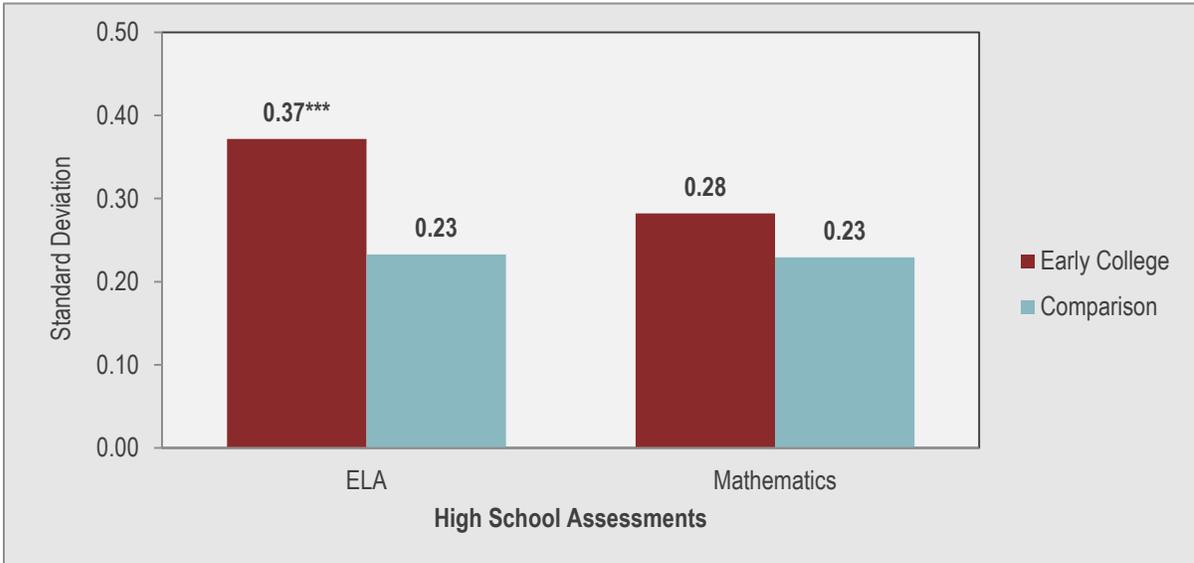
Achievement

We measured high school achievement using standardized assessment scores in English language arts (ELA) and mathematics, usually measured in 10th grade, and GPA. Our previous research suggests that students attending Early Colleges were more likely to be proficient on their state assessments than students attending other area high schools, and had GPAs of 3.0, about the national average (AIR & SRI, 2009; NCES, 2011).

In this study, we found that being admitted to an Early College had a statistically significant positive impact on student ELA achievement (standardized scores were 0.37 for Early College students and 0.23 for comparison students; see Exhibit 3.1).²² If the standardized scores were translated into percentiles, Early College students would score at the 64th percentile, compared with the 59th percentile for comparison students. However, being admitted to an Early College did not have a significant impact on mathematics achievement or on GPA. In mathematics, Early College students had an average standardized test score of 0.28 and comparison students had an average of 0.23 (see Exhibit 3.1). Although a slightly different metric, this finding differs from the findings from research in Texas, which indicated that Early College students in Texas had a higher probability of passing high school mathematics assessments than did comparison students (SRI, 2011). For both subjects, Early College and comparison students were above average for their states. Both the Early College and comparison students reported earning a GPA of 2.98, or a “B” average (see Exhibit 3.2). Thus, across our three achievement measures, both Early College and comparison students were doing well academically in high school.

²² Mathematics and ELA assessment scores were standardized to have a mean of 0 and standard deviation of 1 based on the grade-level mean and standard deviation for each state in a given year. An average score of 0.37, for instance, can be interpreted as 0.37 standard deviations above the state average.

Exhibit 3.1. High School ELA and Mathematics Assessment Scores, by Study Group



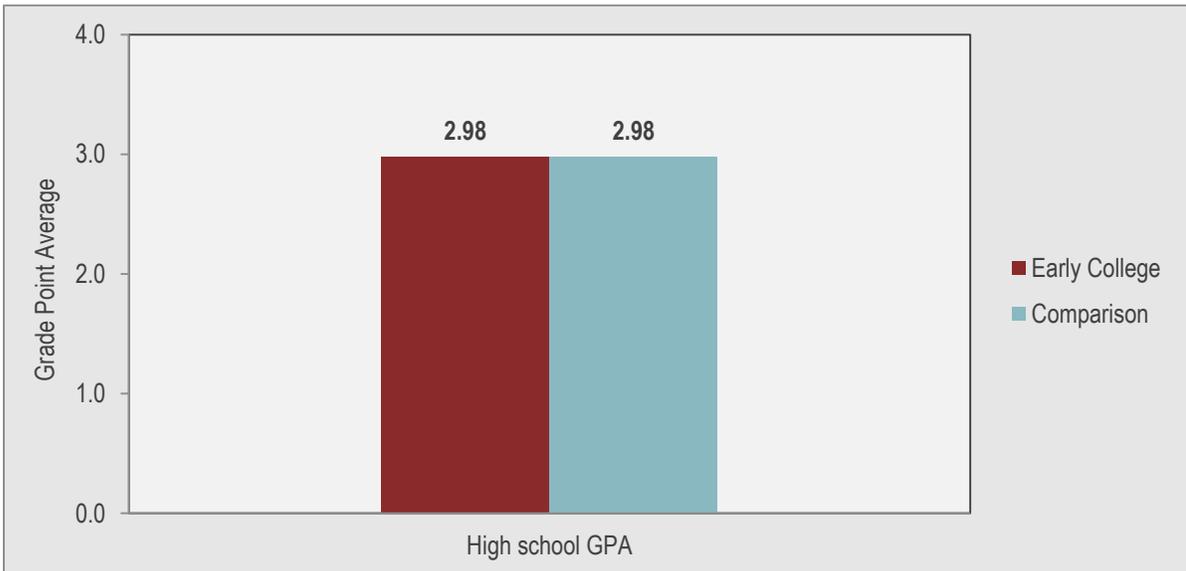
n = 2,458 students (1,044 Early College, 1,414 comparison)

SOURCE: Administrative data from 2005–2011

NOTES: Early College group means are unadjusted means. Comparison group means were computed by subtracting estimated treatment effects from the unadjusted Early College group means.

* *p* < .05; ** *p* < .01; *** *p* < .001

Exhibit 3.2. High School Grade Point Average, by Study Group



n = 1,294 students (724 Early College, 570 comparison)

SOURCE: Student survey data from 2010–11

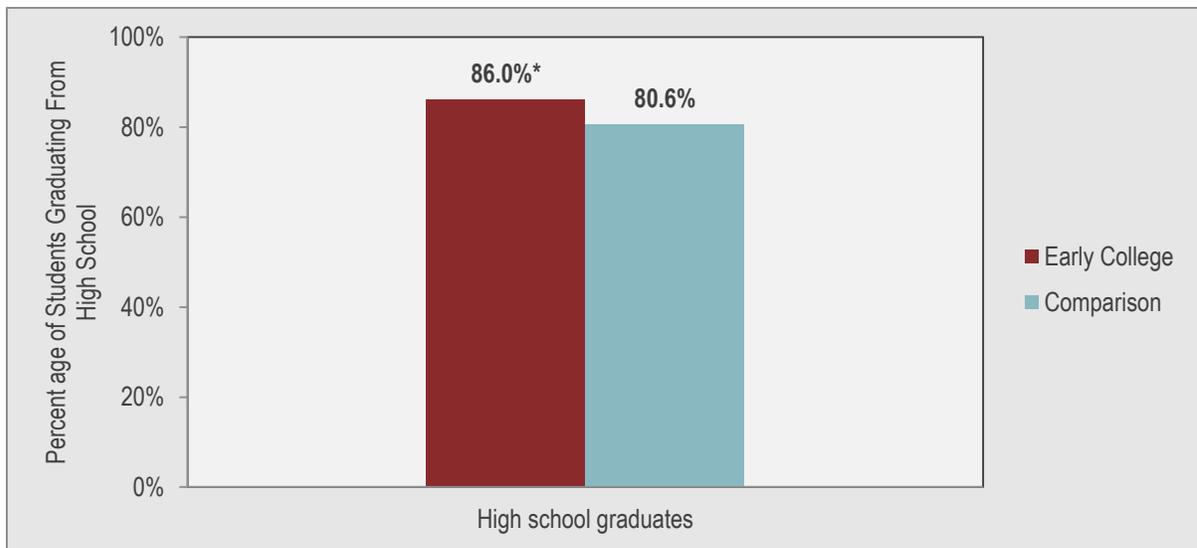
NOTES: Early College group means are unadjusted means, and comparison group means were computed by subtracting estimated treatment effects from the unadjusted Early College group means.

* *p* < .05; ** *p* < .01; *** *p* < .001

High School Graduation

Being admitted to an Early College had a statistically significant positive effect on the likelihood of graduating from high school (86.0 percent for Early College students and 80.6 percent for comparison students; see Exhibit 3.3).²³ In fact, the graduation rates of both groups compared favorably with the national on-time graduation rate of 75.5 percent reported for the 2008–09 academic year, the year in which our study’s oldest cohort was expected to graduate (NCES, 2012d).²⁴ Although the majority of students in both study groups graduated from high school, not all students finished at the school where they began, and not all students finished. However, there were no significant differences between Early College students and comparison students in transfer or dropout rates.²⁵ See the *Leaving Early Colleges for Area Alternatives?* text box for more information about transfer rates for the two groups.

Exhibit 3.3. Percentage of Students Graduating From High School, by Study Group



n = 2,458 students (1,044 Early College, 1,414 comparison)

SOURCE: Administrative data from 2005–2011

NOTES: Early College group means are unadjusted means, and comparison group means were computed by subtracting estimated treatment effects from the unadjusted Early College group means.

* *p* < .05; ** *p* < .01; *** *p* < .001

²³ These estimates may underestimate eventual graduation rates, as the youngest cohort (Cohort 3) had only four years to graduate by the end of our data collection. In the older cohorts, approximately 3 percent of Early College and comparison students took five years to graduate (excluding students attending five-year programs).

²⁴ Note that because two of the Early Colleges in our study are five-year programs, we report an overall graduation rate rather than the on-time four-year graduation rate reported by NCES.

²⁵ We examined student withdrawals (i.e., leaving a high school for any reason), including transferring to another public or private high school, beginning home schooling, being expelled, being incarcerated, or dropping out. Both Early College and comparison students left the high school they first enrolled in at similar rates (32 percent for Early College students and 37 percent for comparison students—not a significant difference). Drop out rates, when separated from the overall withdrawal rates, are also similar for both Early College and comparison students (about 5 percent for both groups).

In addition to the overall impact of Early Colleges on high school graduation, we examined whether Early Colleges had differential effects for students with different background characteristics (Research Question 2). We found no significant differences in the impact of Early College on high school graduation by gender, minority status, first-generation college-going status, or low-income status. Furthermore, the Early College effects on high school graduation were similar for students with different prior ELA and mathematics achievement scores. See Appendix E for the detailed results of these subgroup analyses.

Leaving Early Colleges for Area Alternatives?

Our earlier research suggested that Early College students may leave their high school because Early Colleges tend to be small and students may want the extracurricular activities or elective coursework that come with a more traditional high school experience; alternatively, they may not feel ready for the rigors of college coursework (AIR & SRI, 2008). Thus, we examined whether Early College students transferred locally to another high school more frequently than comparison students.* The percentage of students who transferred to local high school alternatives did not differ significantly between the Early College and comparison students: 17 percent of Early College students and 19 percent of comparison students transferred before graduating or dropping out.

* We defined a local transfer as one where students left the high school to attend a different high school in the district, to attend a private school, or to be home schooled.

College Outcomes

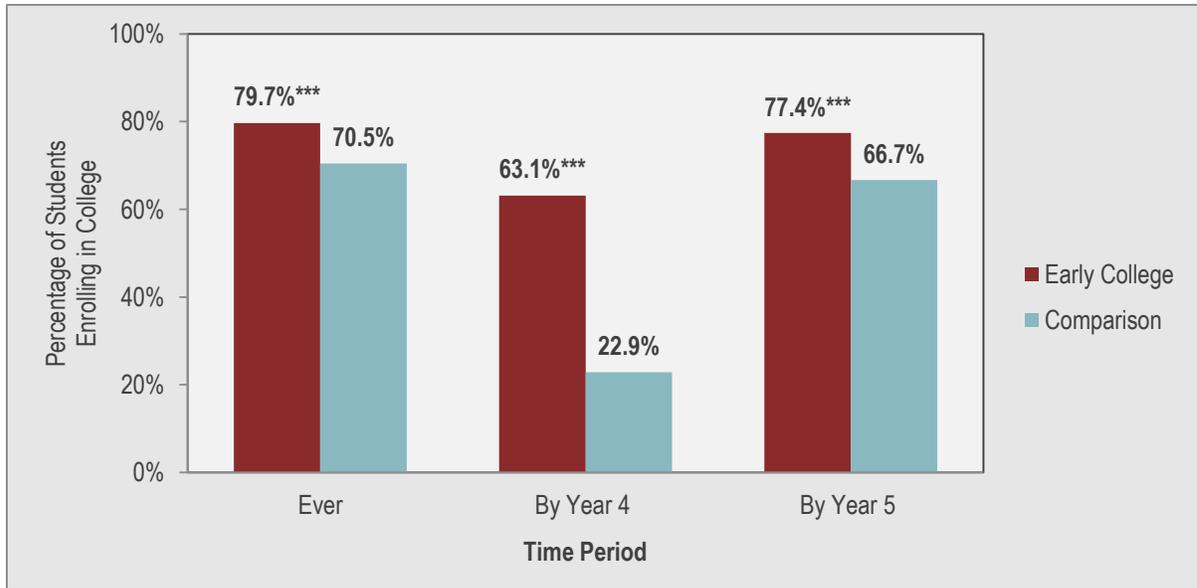
Information about students' academic performance and graduation rates sheds light on the effectiveness of Early Colleges in producing high school success. However, the ultimate goal of the ECHSI is for students to earn a postsecondary degree or credential that prepares them for successful entry into the workforce. This section examines the effectiveness of Early Colleges in improving key college outcomes for students: college enrollment, degree attainment, and performance in college.

College Enrollment

Because Early Colleges build in college course-taking as part of their design, we should expect Early College students to enroll in college courses at higher rates during their high school years than comparison students (the next chapter on high school experiences examines college enrollment during high school in detail). However, Early College and comparison students alike had the opportunity to enroll in college following high school graduation. Therefore, in our impact analyses, we examined whether students in the study

ever enrolled in college.²⁶ We found that being admitted to an Early College had a statistically significant positive impact on college enrollment: 79.7 percent of Early College students had at least one record of college enrollment, roughly 9 percentage points higher than the college enrollment rate for comparison students, 70.5 percent (see Exhibit 3.4). Our analyses of differential Early College impact indicated that the Early College impact on college enrollment was similar for students with different background characteristics (i.e., gender, minority status, first-generation college-going status, low-income status, or prior achievement). See Appendix E for detailed results from the differential impact analyses.

Exhibit 3.4. Percentage of Students Who Ever Enrolled in College and Who Enrolled by Year 4 and by Year 5 After Starting Ninth Grade, by Study Group



n = 2,458 students (1,044 Early College, 1,414 comparison)

SOURCE: National Student Clearinghouse, 2005–2012

NOTES: Early College means are unadjusted means, and comparison group means were computed by subtracting estimated treatment effects from the unadjusted Early College means.

* *p* < .05; ** *p* < .01; *** *p* < .001

To cast further light on the impact of Early Colleges on college attendance, we conducted additional analyses examining college enrollment by students’ fourth and fifth years after starting ninth grade. The enrollment rates by Year 4 reflect the time period when students would traditionally still be in high school. By this point in time, Early Colleges had a significant impact on rates of college enrollment: 63.1 percent of Early College students had at least one record of college enrollment during high school, compared with 22.9 percent of comparison students (see Exhibit 3.4).

²⁶ “Ever” indicates “at any time during our study period.” Therefore, students in the oldest cohort have had a longer period of time to enroll in and graduate from college compared to students in the youngest cohort. In our models, we account for this difference, as students are only compared within each cohort.

We also examined enrollment rates by the end of Year 5. This measure is important for two reasons. First, it represents a timeframe when all students on a traditional trajectory would have had an opportunity to finish high school and to enroll in college after high school completion.²⁷ Second, it represents the latest point in time for which we have data for all study cohorts. By the end of Year 5, 77.4 percent of Early College students and 66.7 percent of comparison students had enrolled in college (see Exhibit 3.4). Between Year 4 and Year 5, the gap between the groups narrowed from 40.2 to 10.7 percentage points.²⁸ Despite this decrease in the gap, the difference between the two groups remained statistically significant. Although Year 5 (one year past high school) is the last point at which the entire study sample had data available, we had data for two years beyond high school (i.e., Year 6) for the two oldest cohorts. The *College Enrollment Trends for the Two Oldest Cohorts* text box explores enrollment patterns for these two cohorts.

²⁷ Note that this is not universally true. As described in Chapter 2, some students in the study—primarily those attending Early Colleges—attended a school with an optional fifth year.

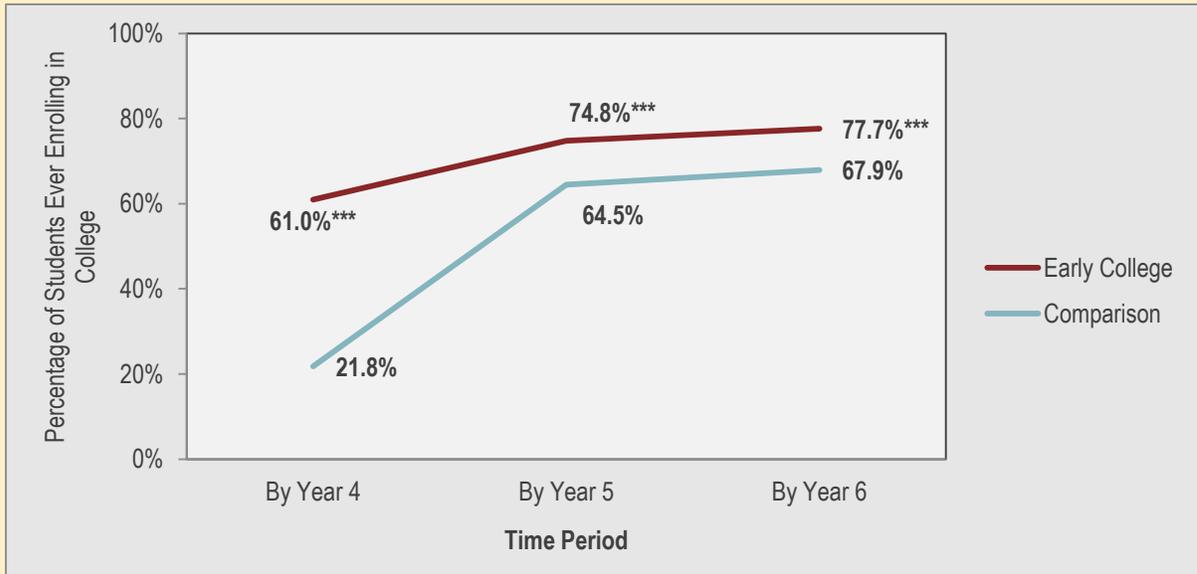
²⁸ This finding suggests that 14.3 percent of Early College students (the difference between the percentages in Year 4 and Year 5) enrolled in college for the first time in Year 5, and that 43.8 of comparison students did the same.

College Enrollment Trends for the Two Oldest Cohorts

Two student cohorts have data available for six years after entering ninth grade. By examining student outcomes for two years past typical high school graduation, we are able to get a sense of what we might observe if we were to track the full study sample for additional years.

College enrollment rates increased for both Early College and comparison students between Year 4 and Year 6, with comparison students closing a sizeable portion of the gap in Year 5—the period of time during which students on a traditional trajectory would have completed high school and had the opportunity to move on to college. While the gap in enrollment rates between the two groups declined from 39.2 percentage points in Year 4 to 10.3 percentage points in Year 5, it remained stable at 9.8 percentage points by the end of Year 6. Differences in all three years were statistically significant. These findings suggest that while the gap between the groups narrowed after the conclusion of high school, comparison students did not catch up to their Early College counterparts as of two years after high school.

Percentages of Students Who Enrolled in College by Year 4, by Year 5, and by Year 6 After Starting Ninth Grade for the 2005–06 and 2006–07 Cohorts, by Study Group



n = 1,458 students (564 Early College, 894 comparison)

SOURCE: National Student Clearinghouse, 2005–2012

NOTES: Early College means are unadjusted means, and comparison means were computed by subtracting estimated treatment effects from the unadjusted Early College means.

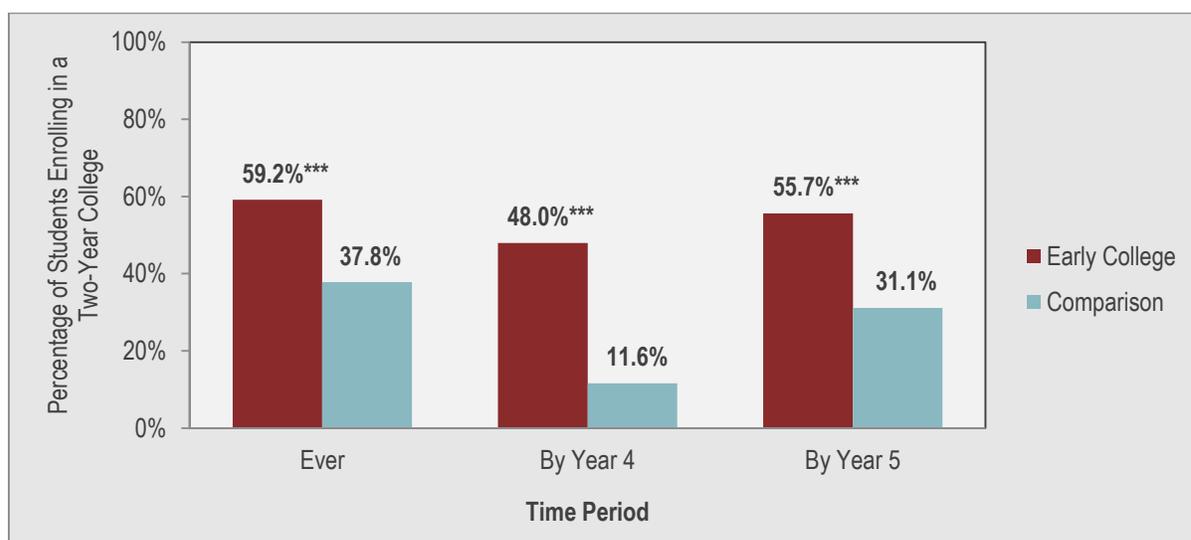
* *p* < .05; ** *p* < .01; *** *p* < .001

In addition to examining *whether* and *when* students enrolled in college, we also examined *where* they enrolled. Our descriptive studies indicate that Early Colleges primarily partner with two-year institutions of higher education: 76 percent of Early Colleges in the ECHSI in 2007–08 partnered with two-year colleges, while 35 percent partnered with four-year

colleges; 11 percent partnered with both (AIR & SRI, 2009). As described in Chapter 2, our study sites have a similar composition: 8 of 10 Early Colleges partnered with two-year colleges, 2 partnered with four-year colleges, and 1 partnered with both.²⁹ The fact that the majority of Early Colleges partnered with two-year colleges has led to the criticism that Early Colleges may funnel students primarily into two-year colleges and away from educational pathways that would lead to bachelor’s degrees.

Our results indicate that being admitted to an Early College had a statistically significant positive impact on attending both two-year and four-year colleges. The percentage of Early College students who attended two-year colleges (59.2 percent) was significantly higher than the percentage for comparison students (37.8 percent) (see Exhibit 3.5). This difference might be expected, particularly during the high school years, when Early Colleges frequently partner with local two-year institutions. Indeed, a gap of more than 36 percentage points existed between the two groups by the end of Year 4 (48.0 percent for Early College students and 11.6 percent for comparison students), which would mark the end of the high school experience for students on a traditional trajectory. By the end of Year 5, the gap shrank to 25 percentage points (55.7 percent for Early College students and 31.1 percent for comparison students), but it remained statistically significant.

Exhibit 3.5. Percentage of Students Who Ever Enrolled in a Two-Year College and Who Enrolled in a Two-Year College by Year 4 and by Year 5 After Starting Ninth Grade, by Study Group



n = 2,458 students (1,044 Early College, 1,414 comparison)

SOURCE: National Student Clearinghouse, 2005–2012

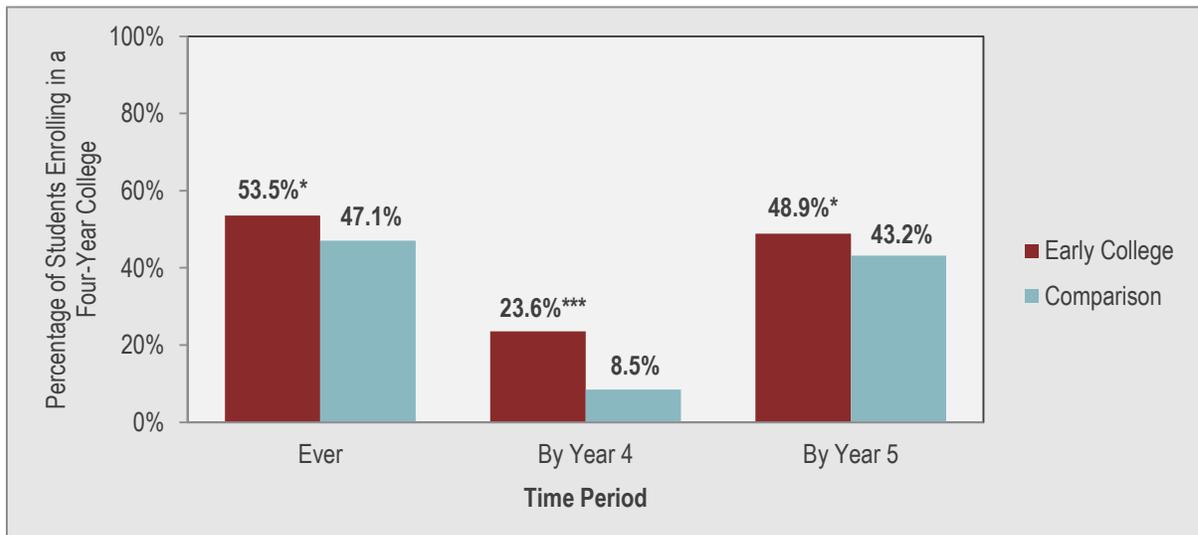
NOTES: Early College means are unadjusted means, and comparison group means were computed by subtracting estimated treatment effects from the unadjusted Early College means.

* *p* < .05; ** *p* < .01; *** *p* < .001

²⁹ To place these figures in the national context, 29 percent of full-time college enrollments in fall 2010 were at two-year institutions and 71 percent were at four-year institutions; 65 percent of part-time fall college enrollments in fall 2010 were at two-year institutions and 35 percent were at four-year institutions (NCES, 2012f).

Perhaps more notable is the trend for enrollment at four-year colleges. If Early Colleges funnel students primarily towards attending two-year institutions, we might see lower rates of four-year college attendance for Early College students than for comparison students. In fact, the opposite is true. Being admitted to an Early College had a statistically significant positive impact on ever attending a four-year college (see Exhibit 3.6).³⁰ Although the gap in four-year college enrollment between Early College students and comparison students narrowed from Year 4 to Year 5, it remained statistically significant. By Year 5, 48.9 percent of Early College students and 43.2 percent of comparison students had enrolled in a four-year college.

Exhibit 3.6. Percentage of Students Who Ever Enrolled in a Four-Year College and Who Enrolled in a Four-Year College by Year 4 and by Year 5 After Starting Ninth Grade, by Study Group



n = 2,458 students (1,044 Early College, 1,414 comparison)

SOURCE: National Student Clearinghouse, 2005–2012

NOTES: Early College means are unadjusted means, and comparison group means were computed by subtracting estimated treatment effects from the unadjusted Early College means.

* *p* < .05; ** *p* < .01; *** *p* < .001

The findings for four-year enrollments are particularly important because enrollment in a four-year institution is less likely for students from disadvantaged groups, even if academically prepared. For example, Horn and Nunez (2000) found that even after controlling for academic qualifications, first-generation students were less likely than their peers to enroll in a four-year college. The impact study findings indicate that Early Colleges were *not* guiding students away from postsecondary paths that would lead to bachelor’s degrees. For additional information about students’ enrollment, see the text box, *Do Early College Students Attend Early College Partner Institutions?*

³⁰ Students could, of course, attend multiple types of colleges.

Do Early College Students Attend Early College Partner Institutions?

Our descriptive evaluation of Early Colleges found that one of the primary motivating factors for postsecondary institutions to partner with Early Colleges was the opportunity to build a pipeline for student enrollment (AIR & SRI, 2009). However, the pipeline may already be strong; institutions designed to serve their local communities, especially the two-year public colleges that compose the majority of Early College partners, may attract students from all local high schools, with or without the Early College intervention. If Early Colleges produce higher student enrollments in the partner institution, other colleges and universities may have a stronger motivation to develop similar relationships with high schools in the future. Our study found that after high school graduation (when attendance at a partner institution would be a student's choice and not a structural feature of their high school), the percentage of Early College students attending the Early College's partner institution was approximately 12 percentage points higher than that for comparison students (55.8 percent for Early College students and 43.7 percent for comparison students), a statistically significant difference.* The findings suggest that from a college perspective, an Early College partnership does in fact expand the pipeline of students.

* This measure also incorporates students who earned a degree at the partner institution, even if they did so while in high school.

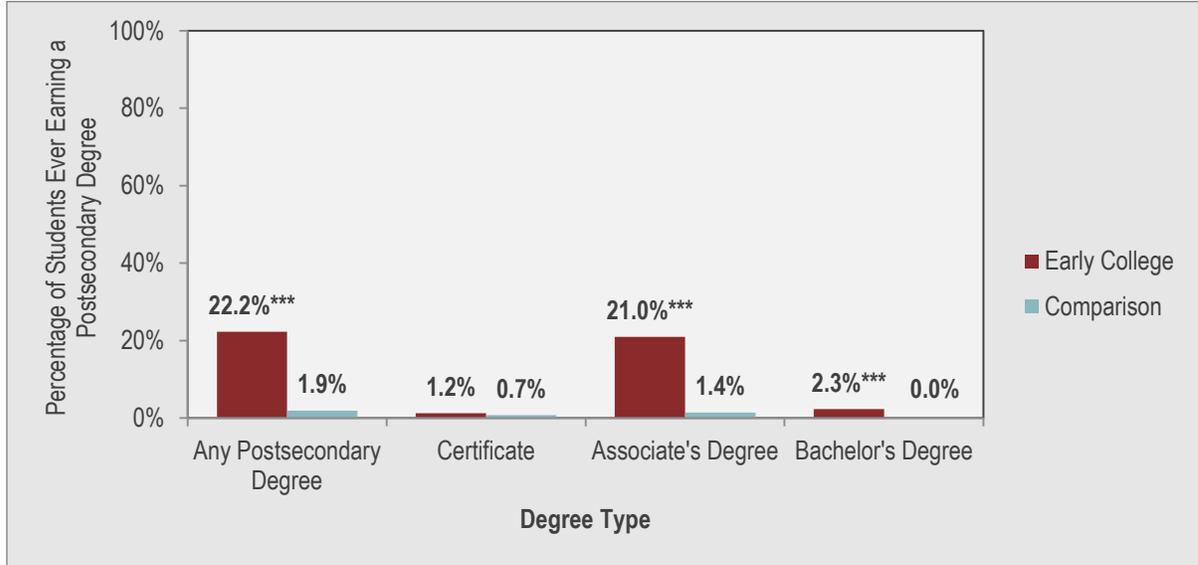
Degree Attainment

The results above describe student exposure and access to college. Enrollment, however, is important only as an indicator of students' likelihood of attaining a postsecondary credential or degree. Research and job projections continue to highlight a college degree as the key to meaningful participation in the workforce, resulting in increased earning potential and opportunity for advancement. Thus, the fundamental question for the study is whether Early College students were more likely to earn postsecondary degrees.

Because Early Colleges start students working toward a college degree, we should expect Early College students to complete college degrees at higher rates than comparison students during or soon after high school. However, comparison students may catch up in later years. Therefore, we also consider the year in which students completed their college degree.

The results indicate that being admitted to an Early College had a statistically significant positive impact on degree attainment. By the end of the 2011–12 academic year, 22.2 percent of Early College students earned postsecondary degrees, compared with 1.9 percent of comparison students (see Exhibit 3.7).

Exhibit 3.7. Percentage of Students Ever Earning a Postsecondary Degree, by Degree Type and Study Group



n = 2,458 students (1,044 Early College, 1,414 comparison)

SOURCE: National Student Clearinghouse, 2005–2012

NOTES: Early College means are unadjusted means, and comparison group means were computed by subtracting estimated treatment effects from the unadjusted Early College means.

* *p* < .05; ** *p* < .01; *** *p* < .001

The significant positive treatment effect held for associate’s and bachelor’s degrees, but not for certificates. Twenty-one percent of Early College students earned an associate’s degree, compared with 1.4 percent of comparison students (see Exhibit 3.7). Bachelor’s degree attainment understandably occurred at lower rates, as no students in our study had an opportunity to attend college for the four years after high school that a bachelor’s degree traditionally requires. Nevertheless, a significant difference between the study groups existed, with 2.3 percent of Early College students earning a bachelor’s degree and virtually no comparison students doing the same.³¹ Certificate attainment for the two groups of students was similar, with few students in either group earning a certificate (1.2 percent of Early College students and 0.7 percent of comparison students). The majority of certificate programs require one year of coursework or less to complete, meaning that students in the study should have had the opportunity to complete a certificate program if that was their desired path. The low rate of certificate attainment for both groups suggests that students in the study who pursued a college education did so primarily by enrolling in degree-granting programs.

In addition to the overall effect of Early Colleges on degree attainment, we also examined whether the Early College effect differed by student background characteristics (Research Question 2). Although the effect of Early Colleges on degree attainment was similar for first-

³¹ Note that the sum of the percentage of students earning associate’s degrees and bachelor’s degrees exceeds the overall percentage of students earning any degree because many of the students who earned a bachelor’s degree had already earned an associate’s degree.

generation students and non-first-generation students, it differed significantly for the student subgroups defined by the following characteristics:

- *Gender:* The Early College impact on college degree attainment was significantly stronger for females than for males. Female Early College students were approximately 19 times more likely to receive a college degree than female comparison students (22.8 percent vs. 1.2 percent).³² Male Early College students were approximately 7 times more likely to obtain a college degree than male comparison students (21.7 percent vs. 2.9 percent).
- *Race:* The Early College impact on college degree attainment was significantly stronger for minority than for white students. Among minority students, Early College students were 29 times more likely to obtain a college degree than comparison students (26.5 percent vs. 0.9 percent). Among white students, Early College students were approximately 8 times more likely to obtain a college degree than comparison students (22.8 percent vs. 2.8 percent).
- *Income:* The Early College impact on college degree attainment was significantly stronger for low-income students. Specifically, low-income Early College students were approximately 25 times more likely than low-income comparison students to obtain a college degree (19.7 percent vs. 0.8 percent). In contrast, higher income Early College students were approximately 7 times more likely to obtain a degree than higher income comparison students (24.5 percent vs. 3.4 percent).
- *Prior Achievement:* The impact of Early College on college degree attainment was significantly stronger for students who entered high school with better mathematics and ELA scores. The difference between Early College students and comparison students was smallest among students with lower prior ELA and mathematics test scores and largest among students with higher ELA and mathematics test scores.

Appendix E provides additional details on these analyses.

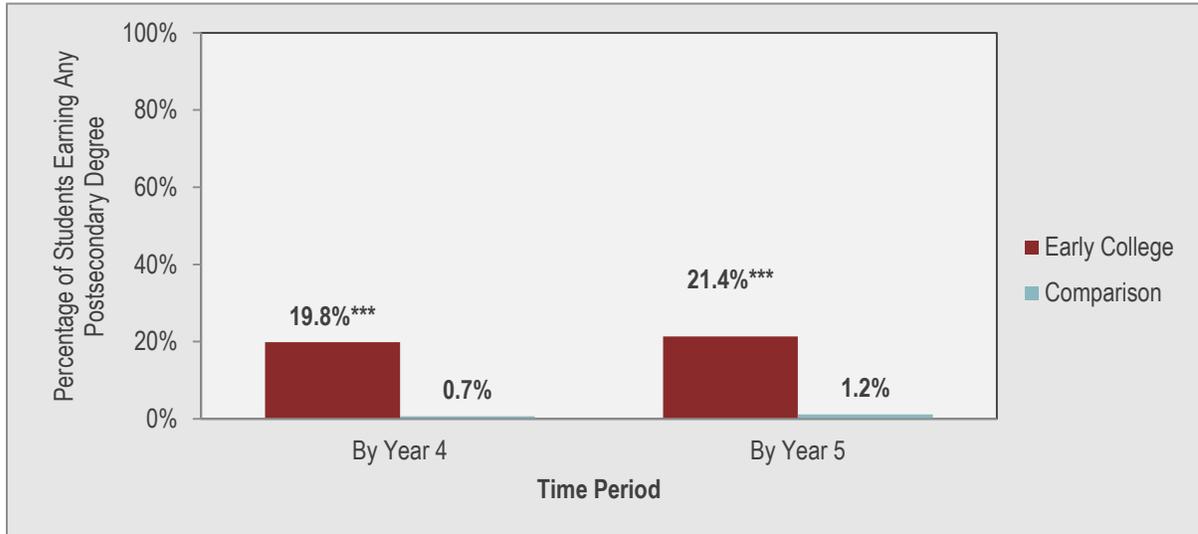
As we did for college enrollment, we moved beyond overall measures of college degree attainment to examine degree attainment by Year 4 and Year 5.³³ The data suggest that the overwhelming majority of Early College students who earned a college degree did so during high school. Of all Early College students, 19.8 percent had received at least one degree by Year 4, and 21.4 percent had received at least one degree by Year 5 (see Exhibit 3.8). In contrast, very few comparison students had earned a college degree by either point in time

³² Although the text expresses results in terms of the ratio of the probability of receiving a college degree for Early College and comparison students, the analyses are based on the ratio of the odds of attending college. See Appendix E for details.

³³ For students following a traditional trajectory, the fourth and fifth years would represent the final year of high school and the first year after high school, respectively. By referring to the number of years after beginning ninth grade, we were able to examine our entire sample on the same playing field, including those students who dropped out of high school, those who took extra time to earn their high school diploma, and those for whom we lacked high school graduation data.

(0.7 percent and 1.2 percent, respectively). See the *College Degree Attainment Trends for the Two Oldest Cohorts* text box for degree attainment patterns through Year 6 for our two oldest cohorts.

Exhibit 3.8. Percentage of Students Who Earned a Postsecondary Degree by Year 4 and by Year 5 After Starting Ninth Grade, by Study Group



n = 2,458 students (1,044 Early College, 1,414 comparison)

SOURCE: National Student Clearinghouse, 2005–2012

NOTES: Early College means are unadjusted means, and comparison group means were computed by subtracting estimated treatment effects from the unadjusted Early College means.

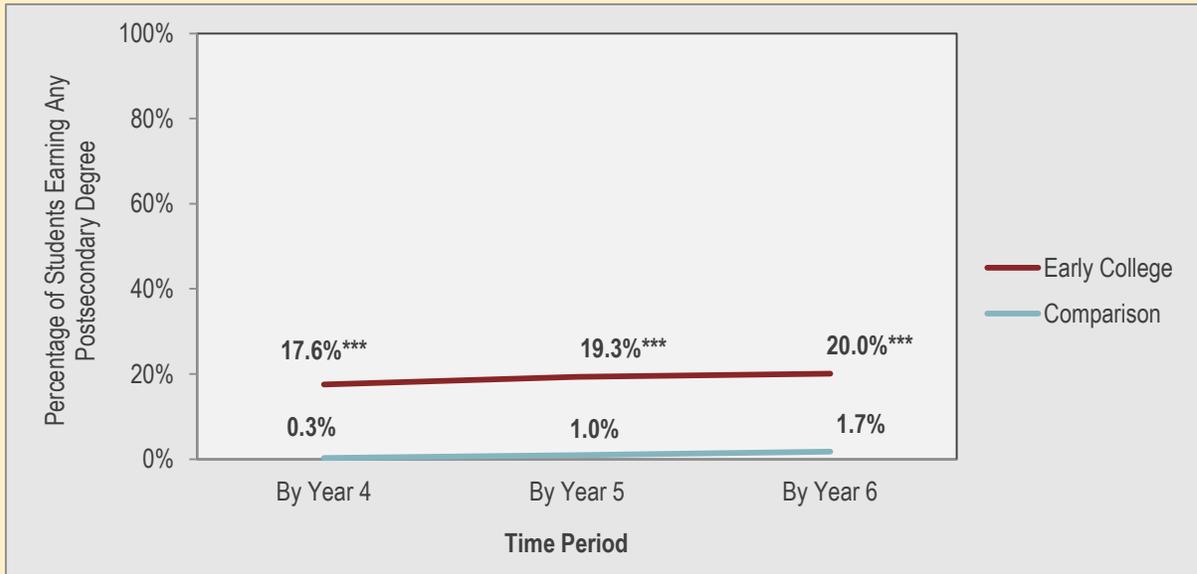
* *p* < .05; ** *p* < .01; *** *p* < .001

College Degree Attainment Trends for the Two Oldest Cohorts

We again explore data for our two oldest cohorts, which have data available for six years after beginning ninth grade. This sixth year is particularly interesting for tracking college degree attainment, as students on a traditional trajectory would have had two years after high school completion to earn an associate’s degree. These analyses are also suggestive of what we might see if we could track the full study sample for additional years.

The percentage of Early College students who earned a postsecondary degree increased from 17.6 percent by the end of Year 4 to 20.0 percent by the end of Year 6. In contrast, the percentage of comparison students who completed a postsecondary degree increased from 0.3 percent to 1.7 percent over the same time period, for a gap of over 18 percentage points between the two groups. This difference remained stable and statistically significant; comparison students did not catch up to their Early College counterparts as of two years after high school.

Percentages of Students Who Attained a College Degree by Year 4, by Year 5, and by Year 6 After Starting Ninth Grade for the 2005–06 and 2006–07 Cohorts, by Study Group



n = 1,458 students (564 Early College, 894 comparison)
 SOURCE: National Student Clearinghouse, 2005–2012
 NOTES: Early College means are unadjusted means, and comparison means were computed by subtracting estimated treatment effects from the unadjusted Early College means.
 * *p* < .05; ** *p* < .01; *** *p* < .001

College After High School

Our findings for college enrollment and degree attainment suggest that most of the difference between the two study groups took place within four years after starting ninth grade. Although some of the gaps shrank after high school, especially for college enrollment rates, the gaps persisted and remained statistically significant through the end of Year 5; we found no evidence that the comparison students caught up to their Early College peers. Nevertheless, the findings raise an important question: what impact do Early Colleges have after students leave the highly structured and scaffolded high school environment? Because we tracked our full study sample only through the end of Year 5, our data do not allow us to make inferences about the long-term degree attainment rates that would be most useful for answering this question. Nevertheless, we explored post-high school outcomes to better understand the impact of Early Colleges. For the purposes of this discussion, “after high school” refers to the period of time after the end of Year 4.³⁴

We first examined college enrollment after the end of Year 4 and found no statistically significant difference between the rates for Early College students (71.1 percent) and comparison students (68.4 percent; see Exhibit 3.9).³⁵ The overall enrollment rates for both groups compare favorably with national data, which indicate that 68 percent of high school graduates in 2010 enrolled in two-year or four-year colleges immediately following high school completion;³⁶ the percentage drops for low-income students (52 percent), African American students (66 percent), and Hispanic students (60 percent) (NCES, 2012e).

Students in both groups also attended two-year colleges at comparable rates after Year 4, with 32.8 percent of Early College students and 34.8 percent for comparison students (see Exhibit 3.9). Nationally, 26 percent of high school completers enrolled in two-year colleges after high school in 2011 (NCES, 2013).

The story differs when examining enrollment in four-year colleges. Early Colleges had a statistically significant positive impact on enrollment at four-year colleges after high school: 51.2 percent of Early College students and 45.5 percent of comparison students attended a four-year college after high school. Therefore, even though most of the Early Colleges

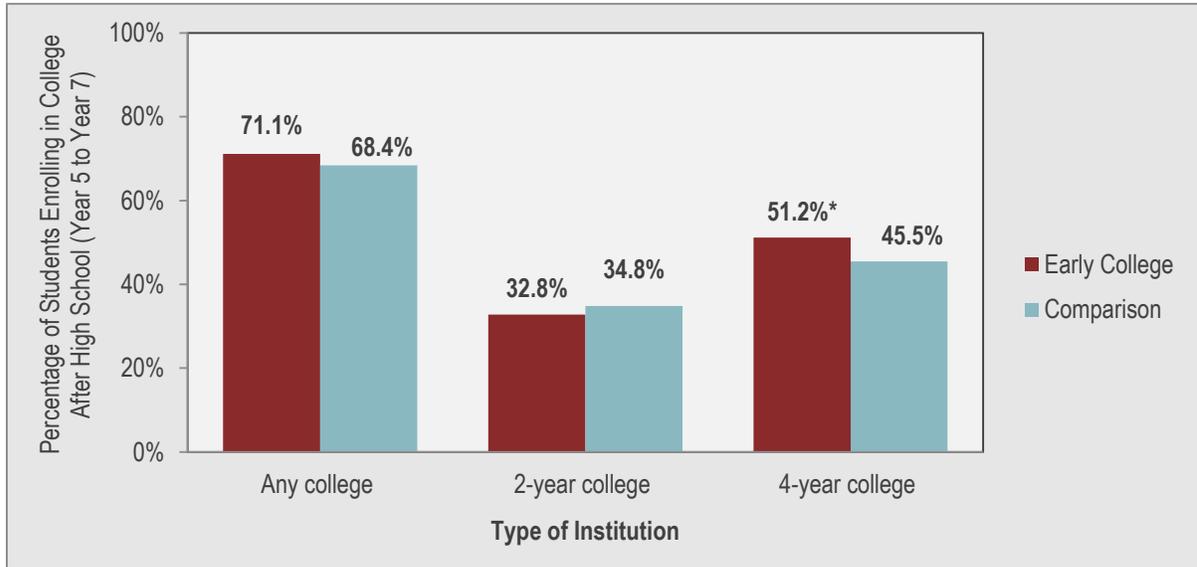
³⁴ For students following a traditional trajectory, these post-Year 4 outcomes should correspond to the years after high school. However, as noted in Chapter 2, some students participate in five-year high school programs and might still be in high school after the conclusion of Year 4.

³⁵ We use Year 4 here rather than high school graduation to take full advantage of available data; whereas we have Year 4 outcomes available for all students in our study, students who drop out of high school or lack graduation dates in our data would otherwise need to be dropped from our analysis, thus lowering our sample size for these variables. Sensitivity analyses that used the high school graduation date instead of Year 4 to define “after high school” produced college enrollment rates that were higher for both groups (81.3 percent for Early College students and 80.2 percent for comparison students), but these rates remained statistically indistinguishable.

³⁶ Note that these national data for overall attendance rates and attendance rates at 2-year and 4-year colleges refer only to high school *completers*. In contrast, the percentages reported in this study refer to the entire pool of students who *applied* to Early Colleges.

partnered with two-year colleges, Early College students were more likely to attend four-year institutions than comparison students, both during and after high school. Both study groups had higher rates of attending four-year colleges after high school than the national rate of 42 percent (NCES, 2013).

Exhibit 3.9. Percentage of Students Enrolling in College Between Year 5 and Year 7 After Starting Ninth Grade, by Study Group



n = 2,458 students (1,044 Early College, 1,414 comparison)

SOURCE: National Student Clearinghouse, 2005–2012

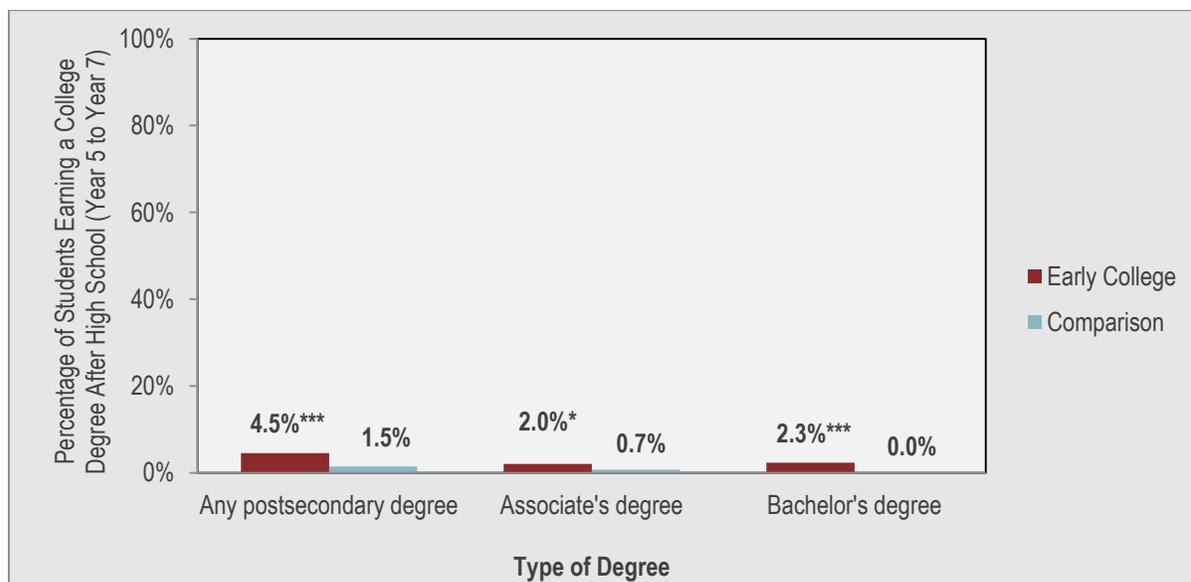
NOTES: Early College means are unadjusted means, and comparison group means were computed by subtracting estimated treatment effects from the unadjusted Early College means.

* *p* < .05; ** *p* < .01; *** *p* < .001

We also examined rates of degree attainment *after* high school. Overall, Early College students had higher rates of degree attainment after Year 4: 4.5 percent of Early College students earned a postsecondary degree or credential, as compared with 1.5 percent of comparison students (see Exhibit 3.10).³⁷ This Early College impact held for both associate’s degrees and bachelor’s degrees. Two percent of Early College students earned an associate’s degree after Year 4, as compared with 0.7 percent of comparison students; 2.3 percent of Early College students earned a bachelor’s degree, compared with virtually no comparison students. The differences for all three measures were statistically significant.

³⁷ As we did for college enrollment, we use Year 4 rather than high school graduation to take full advantage of available data; whereas we have Year 4 outcomes available for all students in our study, students who dropped out of high school or lacked graduation dates in our data would otherwise need to be dropped from our analysis, thus lowering our sample size for these variables. Analyses that used high school graduation date to define “after high school” produced degree attainment rates that were higher for both groups (10.8 percent for Early College students and 3.3 percent for comparison students); the difference between the groups was statistically significant.

Exhibit 3.10. Percentage of Students Who Earned Postsecondary Degrees Between Year 5 and Year 7, by Degree Type and Study Group



n = 2,458 students (1,044 Early College, 1,414 comparison)

SOURCE: National Student Clearinghouse, 2005–2012

NOTES: Early College means are unadjusted means, and comparison group means were computed by subtracting estimated treatment effects from the unadjusted Early College means.

* $p < .05$; ** $p < .01$; *** $p < .001$

What do these findings tell us about the impact of Early Colleges during and after high school? The results from this study suggest that the impact of Early Colleges occurred primarily during the high school years—it is in this timeframe that the magnitude of the group differences was the largest, and where enrollment and degree attainment results were consistently statistically significant. After high school, significant differences continued to exist in four-year college enrollment and degree attainment. The reader may be tempted to conclude from these findings that Early Colleges provide limited benefit after high school. However, the more important interpretation may be that Early Colleges provided students with an edge over the comparison students during high school, and the edge persisted even after high school. A complete understanding of how long the Early College impact persists would require tracking degree attainment and workforce outcomes over a more extended time period.

Although questions about the long-term impact of Early Colleges remain, the available evidence strongly indicates that Early College students complete college ahead of their comparison group peers. Even if comparison students were to catch up over time, Early Colleges offer the benefit of acceleration. Students who earn degrees earlier have the opportunity to enter the workforce earlier and potentially realize additional lifetime earnings. At the same time, earning a college degree while in high school can save money for

students and their families, as Early Colleges often cover most, if not all, of the college costs incurred during high school (AIR & SRI, 2008).

Student survey responses suggest some awareness of these benefits among Early College students.³⁸ One student attested to the cost savings benefits by explaining, “This was probably the best decision of my life. It has helped me get some college education that I might not have been able to afford otherwise.” Other Early College students highlighted the benefits of accelerating degree attainment. According to one, “Early College was great preparation for the real world and helped me earn a degree several years earlier than most people that I know. At first, it was difficult to be in college at such an early age, but I got used to it after a couple years and I am very thankful for the experience.”

College Performance

In this section, we explore students’ college performance after high school in terms of remediation, grades, perceptions of academic difficulty, and persistence. These analyses serve two purposes. First, they provide insight into the extent to which students might be on track to earn a postsecondary degree or credential. Second, the data provide an additional window into students’ successes *after* leaving the highly structured and supportive Early College environment. The Early College charge is not only to provide access to college while students are in high school, but also to prepare them to continue in college after high school, particularly if they have not yet earned a degree.

The following analyses include only those students who attended college after high school.³⁹ Unlike students in the overall study sample who were randomly assigned to treatment and comparison conditions, this subset of students—students who attended college after high school—was not randomly assigned. It is possible that among this subset of students, Early College students might be systematically different from the comparison students.⁴⁰ Therefore, the following results should be interpreted with caution.

- *Developmental Coursework*: One measure of students’ success in the transition to college is whether they are placed in non-credit-earning, developmental courses; enrollment in these remedial courses suggests a high school experience that insufficiently prepared the student for college academics, and some research has suggested that it is also associated with a decreased likelihood of college graduation

³⁸ At the end of the survey, students were asked, “Would you like to tell us anything else about your high school or college experiences?” See Appendix B for more information on the open-ended response data and analysis.

³⁹ The specific sample for each measure depends on the data source and measure. See the additional footnotes associated with each measure for more information.

⁴⁰ As discussed earlier in the chapter, roughly 70 percent of both Early College students and comparison students enrolled in college after Year 4 according to NSC data. However, the differences in unobserved characteristics—which are addressed through the randomization process that initially divided students into Early College and comparison groups—are not accounted for here.

- (e.g., Adelman, 1999; Complete College America, 2012). Data from the student survey suggest that overall, approximately one fifth of all students who attended college after high school enrolled in a college developmental course in mathematics, reading, or writing (18 percent of Early College students and 22 percent of comparison students, not a statistically significant difference).⁴¹
- *College GPA:* A second indicator of students' success in college is their performance in college courses. We expected that students who were equipped for success in college coursework would earn better grades than underprepared students would. The survey asked students who completed at least one term of college after high school to report on their college grades.⁴² Both Early College and comparison students reported about a "B" average, with a GPA of 3.1 for both groups.
 - *Perceptions of Academic Difficulty:* Students' perceptions of their transition to college might reveal potential differences in high school preparation between the study groups. On the student survey, Early College students reported experiencing significantly less difficulty in college than their comparison peers (2.0 versus 2.2 on a 4-point scale on which 1 means "very easy" and 4 means "very difficult"; see Appendix A for details about the scale).⁴³ The effect size is 0.22.
 - *Persistence in College:* By examining the extent to which students continue to enroll in college in consecutive years, we can assess whether students are on the path toward degree attainment. Of the students who had NSC records of college enrollment in Year 5, the level of persistence to the fall of Year 6 was comparable between Early College students (67.4 percent) and comparison students (66.4 percent).⁴⁴

The differences between the groups in terms of developmental coursework, grades, perceived difficulty, and persistence were small when they existed at all. Further study might help expand our understanding about the ways in which Early Colleges impact not only college access but also college performance and degree attainment.

⁴¹ Data on developmental coursework came from the student survey for the subsample of students who reported attending college after finishing or leaving high school ($n = 1,002$; 562 Early College, 440 comparison).

⁴² Since the survey was administered in fall 2011, data on college GPA were primarily applicable to the older of the two survey cohorts who, on a traditional path, could have completed up to a year of college at the time of the survey. The younger survey cohort had typically just graduated from high school and were beginning their first year of college after high school, so they had not yet earned any college grades. Thus, this item reflects a reduced sample size of 455 students (253 Early College, 202 comparison) who reported completing at least one term of college "after finishing or leaving high school."

⁴³ Data on academic difficulty came from the student survey for the subsample of students who had completed at least one term of college after finishing or leaving high school. ($n = 455$; 253 Early College, 202 comparison).

⁴⁴ This measure of persistence uses NSC data, and includes students who attended college after high school, where "after high school" refers to the time period after the completion of a student's fourth year after entering ninth grade.

Conclusion

The data we collected indicate that the Early Colleges in our sample were highly effective at getting students on the path to a college degree. Some significant impacts existed on high school outcomes—most notably high school graduation—but the real story is evident in the findings for college degree attainment, which consistently demonstrate a significant Early College impact.

In high school, being admitted to an Early College had a significant positive impact on students' performance on ELA state assessments and on the students' likelihood of graduating from high school. The Early Colleges in our sample did not have a statistically significant impact, however, on students' high school mathematics scores and GPAs.

We found that that being admitted to an Early College had a significant positive impact on students' college enrollment and degree attainment. Early College students were more likely than comparison students to enroll in college overall, and at both two-year and four-year colleges. Because Early College students start college in high school, we should expect Early College students to complete college degrees earlier. However, Early College students were more likely to earn college degrees at every point in time we examined.

We also examined whether the effects of Early Colleges differed for students with different background characteristics. We found that the effect of Early College on graduating from high school and college enrollment did not differ for students with different characteristics. However, the effect of Early College on college degree attainment was stronger for female, minority, and low-income students, as well as students with higher levels of prior achievement relative to their peers.

After leaving high school, Early College students were more likely than comparison students to enroll in a four-year institution and to have earned a college degree. These persistent differences are likely due to the head start Early College students received while in high school. However, Early College students had about the same likelihood as comparison students of enrolling at a two-year college after high school, and overall college-going rates were also comparable. For the subset of students who enrolled in college after high school, Early College and comparison students performed comparably on measures related to college performance and persistence when attending college after high school.

Our analyses suggest that the college enrollment and degree attainment differences between Early College and comparison students were largest by the end of the traditional high school experience (four years after entering ninth grade). These differences narrowed in later years, but statistically significant gaps remained on measures of whether students had ever enrolled in college or earned a degree. Because our data sources only capture outcomes for our

complete sample through the fifth year after starting ninth grade, we cannot definitively answer the question of whether comparison students might eventually catch up to Early College students. Further study that considers outcomes for additional years beyond high school is required to determine whether long-term degree attainment and workforce outcomes are different between Early College and comparison students. Such research might help us understand whether Early Colleges act primarily as an accelerating mechanism, or whether they also produce higher degree attainment and job earnings for students over time.

Chapter 4. High School Experiences

The previous chapter showed that Early College students fared significantly better than comparison students on a variety of high school and college outcomes. As the introduction to this report described, Early Colleges aim to provide students with rigorous academics and a comprehensive academic and social support system to equip them with the skills necessary for college completion. This chapter explores several key features of Early Colleges to understand the extent to which the treatment and comparison students differed in their experiences while in high school. Specifically, we examined students' exposure to college in high school, the academic rigor of the courses students took in high school, and student supports offered by high schools. Most of these measures come from the student survey, administered to students in Year 5 or Year 6 after entering high school. Average differences on survey scales can be difficult to interpret, so we report effect sizes throughout this chapter to help interpret the size of the differences.⁴⁵

College Exposure in High School

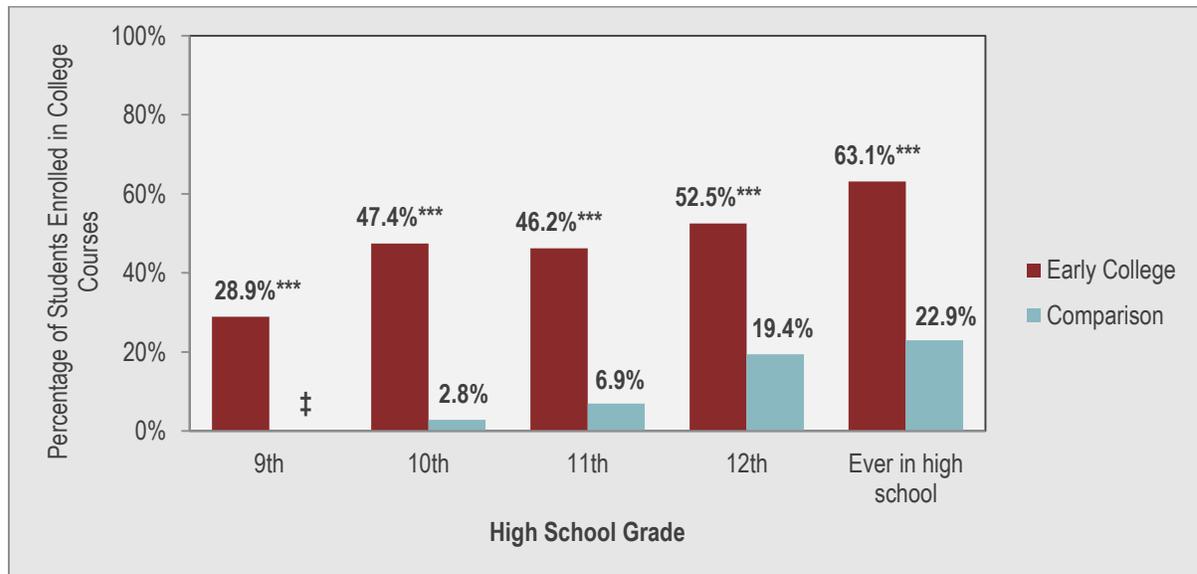
One of the ECHSI Core Principles is for students to earn at least one year of college credit in high school. To accomplish this, students must enroll in college and successfully complete their college courses. This section examines both Early College and comparison students' patterns of college enrollment and credit accrual in high school. College enrollment was measured using NSC data and credit accrual was measured using student survey data.

College Enrollment in High School

Chapter 3 demonstrated that Early College had a significant positive impact on college enrollment during high school. To understand the pattern of college access throughout high school, we examined college enrollment in each high school grade. As Exhibit 4.1 shows, Early College had a statistically significant positive impact on college enrollment in each grade, although both groups were more likely to enroll in college during the later years of high school. In ninth grade, 28.9 percent of Early College students and almost no comparison students enrolled in college. In 12th grade, enrollment rates for both groups increased, but a gap remained; over half (52.5 percent) of Early College students and about one fifth (19.4 percent) of comparison students enrolled in college.

⁴⁵ According to the What Works Clearinghouse (2011), effect sizes that are at least 0.25 are generally considered "substantively important" in the field of education. A substantively important effect indicates that there is a meaningful difference between groups on a given outcome measure.

Exhibit 4.1. Percentage of Students Who Enrolled in College in High School, by Grade and Study Group



$n = 2,458$ students (1,044 Early College, 1,414 comparison)

SOURCE: National Student Clearinghouse, 2005–2012

NOTES: Early College means are unadjusted means, and comparison group means were computed by subtracting estimated Early College effects from the unadjusted Early College means.

‡ Too few students to report

* $p < .05$; ** $p < .01$; *** $p < .001$

As noted in the introduction, nationwide in 2010–11, less than 10 percent of high school students enrolled in college courses; Early College students' college enrollment rate exceeded this national rate in each year of high school. The rates for comparison students were quite high in 12th grade as well. These findings suggest that the study students were highly motivated to attend college.

Although the goal of the Early Colleges is to get all students enrolled in college while in high school, our findings suggest that the Early Colleges did not meet this goal. Almost 37 percent of Early College students did not enroll in college while in high school (see Exhibit 4.1). There are three possible reasons for this. First, as noted in Chapter 2, the NSC provides conservative estimates for college enrollment. Second, some students in our Early College group never attended an Early College, and others left the Early College before high school graduation. Third, not all students enrolled in college during high school. This last explanation is consistent with our previous research; we found that about one third of upper grade students were not enrolled in college classes (AIR & SRI, 2008, 2009). Our prior work found that the extent to which Early Colleges structure college course-taking for their students varies substantially. See the text box, *How Early Colleges Integrate College Courses*, for additional details.

How Early Colleges Integrate College Courses

We know a good deal about how schools in the ECHSI integrate college coursework from our previous research, including timing, course sequencing, and course location. The timing of college enrollment varies across Early Colleges, though most Early Colleges introduce students to college courses early in high school. For example, more than half of Early Colleges in the ECHSI (59 percent) had at least some students enrolled in credit-bearing college classes in ninth grade (AIR & SRI, 2009). Early Colleges also vary in how they structure the course sequence. Some Early Colleges prescribed the college courses available to students. Early Colleges reported that this approach ensures that students not only meet high school graduation requirements but also accumulate a meaningful and transferable set of classes for use in future enrollment at four-year colleges (AIR & SRI, 2009). The exhibit below includes a sample Early College's college course sequence, which illustrates a common Early College approach of gradually giving students more college-level courses in the later high school grades.

Integrating College Courses at an Early College Located on a College Campus

Grade	College Courses' Instructors and Students	College Courses and Credits Possible
9th	Students are in classes taught by high school staff serving as adjunct college instructors.	During the academic year: 2 courses Total: up to 6 credits
10th	Students are taught by college instructors in classes that are only for Early College students.	During the academic year: 2 courses During the summer: 1 course Total: up to 9 credits
11th	Students are in classes with traditional college students. Often by the junior year, dual enrollment courses make up 75% of a student's schedule.	During the academic year: 4 courses During the summer: 1 courses Total: up to 21 credits
12th	Students are in classes with traditional college students. Often by the senior year, dual enrollment courses make up 100% of a student's schedule.	During the academic year: 4 courses During the summer: 2 courses Total: up to 24 credits

SOURCE: AIR & SRI, 2009

Another component of college integration is location; Early Colleges opened on college campuses whenever possible. In this study, 8 of the 10 sites were located on a college campus. Often termed "the power of site," the concept is that students respond to the high expectations and peer models that the college environment provides by taking more responsibility for their education. For Early Colleges located on a college campus, students have the opportunity to take dual enrollment courses predominantly taught by college faculty. Previous research also documented that Early Colleges located on college campuses had higher attendance and assessment proficiency rates compared to other Early Colleges. Students at Early Colleges located on college campuses reported more academic engagement and self-confidence, fewer disruptive behaviors among their peers, greater college credit accumulation, and higher post-Early-College educational aspirations than students at Early Colleges not located on a college campus (AIR & SRI, 2008, 2009).

Still, Early College students began accessing college earlier and enrolled in college during high school at significantly higher rates than their comparison peers. From prior research, we know that exposure to college instruction in high school is valuable for helping students understand the academic expectations of college coursework (AIR & SRI, 2006, 2007). Prior studies found that high school and college instructors varied in their instructional approach and the levels of support they provided to students. Whereas college professors presented information and placed the responsibility on students to learn the material, high school instructors emphasized the material's relevance to students' lives and provided students with more support for learning the material (Duffy, Cassidy, Keating, & Berger, 2009). Prior work has also found that college professors did not give Early College students any special treatment (AIR & SRI, 2006) and that students reported appreciating being treated "more like adults" in their college courses, relative to their high school courses (AIR & SRI, 2007).

Consistent with these prior findings, in students' open-ended survey responses, many reflected on how college exposure in high school prepared them academically for college after high school. For example, one Early College student noted, "I felt that being able to start taking college courses at [Early College] while still in high school made it much easier to adapt from high school to full-time college student after graduation." Another Early College student echoed this: "Being able to take college classes in high school was a wonderful opportunity for me. I felt much more prepared than my peers when I came to college and coursework got harder."

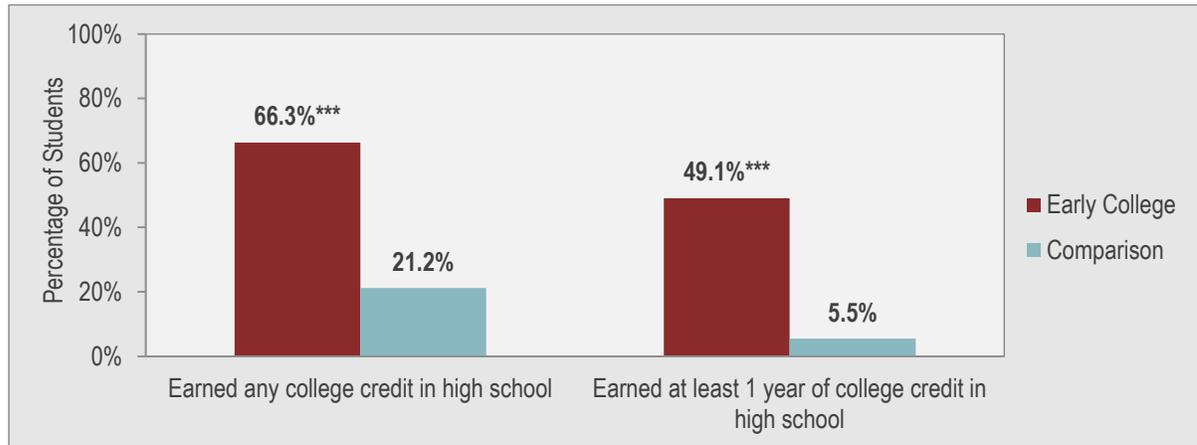
Student survey responses also illustrated that being exposed to college in high school gave them a head start in acclimating to the increased freedom and time management skills required of college students. One Early College student said, "My high school was located on [a] university campus so it was a really great experience for me. I walked around with other college students and had access to the university's buildings, and it felt liberating." Another Early College student stated, "I had a great time enrolled in high school and college. Being immersed in both cultures simultaneously made me a better multitasker and forced me to grow up."

College Credit Accrual

Of course, it is not just exposure to college courses but also college credit accrual that puts students on an accelerated path to postsecondary degree attainment. Early College had a statistically significant positive impact on earning college credits in high school, with 66.3 percent of Early College students and 21.2 percent of comparison students earning any college credit (see Exhibit 4.2). Additionally, Early College students were significantly more likely to meet the initiative's goal of earning at least one year of college credit. As Exhibit 4.2

shows, almost half (49.1 percent) of Early College students earned at least one year of college credit, relative to 5.5 percent of comparison students.

Exhibit 4.2. Percentage of Students Who Earned College Credit in High School, by Study Group



n = 1,294 students (724 Early College, 570 comparison)

SOURCE: Student survey data from 2011–12

NOTES: Early College means are unadjusted means, and comparison group means were computed by subtracting estimated Early College effects from the unadjusted Early College means.

* *p* < .05; ** *p* < .01; *** *p* < .001

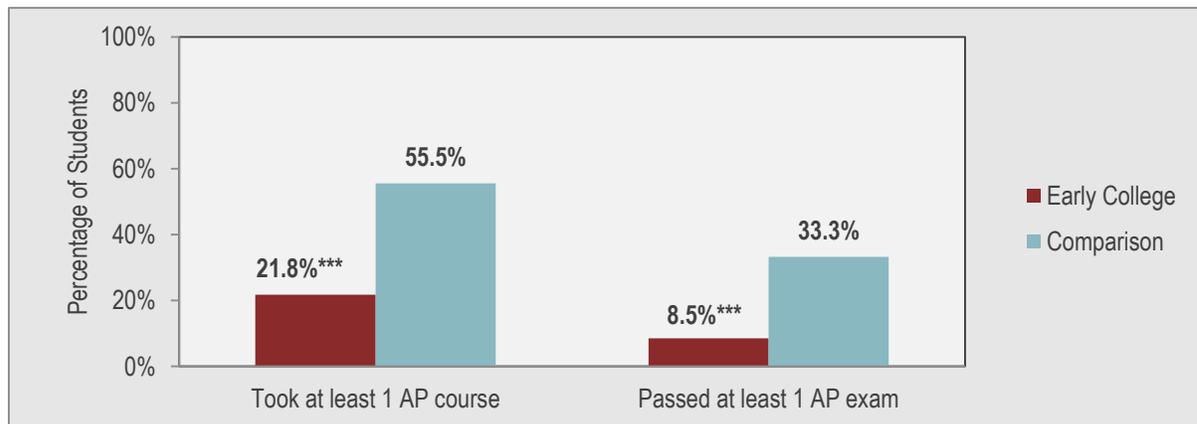
Overall, the rates of college enrollment and credit accrual for treatment students indicate that Early Colleges provided college exposure, as the initiative intends. See the sidebar, *How Early Colleges Integrate College Courses*, for additional details.

In open-ended survey responses, Early College students commented on the importance of earning college credit while in high school to their later college progression. One Early College student noted, “The program of being at an Early College and taking so many dual credit courses along with actual college courses has given me the greatest opportunity to prepare myself for what the real world offers. Being already a sophomore in college barely graduating from high school is a great achievement.” Another Early College student said, “My experience at [Early College] is one that I will never forget. It paved the path to where I am today, enrolled in [University’s nursing program] at the age of 18. If I had not attended [Early College], I would be applying to the program two years from now. [Early College] helped me to discover my true potential.”

Comparison students may not have had access to college courses, but they may have had access to Advanced Placement (AP) coursework and, thus, the opportunity to earn college credits by passing AP exams. We found that comparison students were significantly more likely than their Early College peers to enroll in an AP course in high school. As Exhibit 4.3 shows, over half (55.5 percent) of comparison students took at least one AP course, whereas less than a quarter (21.8 percent) of Early College students took at least one AP

course in high school. Several comparison students who were enrolled in college after high school commented on how useful their AP courses were in preparing them for college. One comparison student said, “My AP English classes were really the only thing that remotely helped me prepare for college. Nothing else in high school was really helpful at all.”

Exhibit 4.3. Percentage of Students Who Enrolled in at Least One AP Course and Passed at Least One AP Exam in High School, by Study Group



n = 1,294 students (724 Early College, 570 comparison)

SOURCE: Student survey data from 2011–12

NOTES: Early College means are unadjusted means, and comparison group means were computed by subtracting estimated Early College effects from the unadjusted Early College means.

* $p < .05$; ** $p < .01$; *** $p < .001$

To earn college credit, students taking AP courses must pass the accompanying exam. As Exhibit 4.3 illustrates, comparison students were significantly more likely to pass at least one AP exam; 33.3 percent of comparison students compared with 8.5 percent of Early College students passed any AP exam. The Early College student rates of AP course-taking and exam passage may seem high considering their access to college courses. However, as noted previously, some treatment (Early College) students never attended the Early College and some transferred out; these students may have taken AP courses at their high schools. Additionally, some Early College students had access to AP courses.

Although comparison students enrolled in AP courses and passed AP exams at significantly higher rates than Early College students, AP course-taking did not lead to substantial college credit accumulation. On average, Early College and comparison students passed less than one AP exam (0.23 AP exams passed for Early College students and 0.70 for comparison students); thus AP coursework did not meaningfully accelerate students' path toward postsecondary degree attainment.

As this section has shown, college exposure in high school helped Early College students to see college as a possibility and provided them with a head start toward postsecondary

degree attainment by allowing them to earn a substantial amount of college credit in high school.

Academic Rigor

Taking college courses most notably differentiates Early College students' high school experience from their peers, but Early Colleges also are expected to offer rigorous high school and college courses. Completing a program of college-preparatory coursework is a traditional indicator of college readiness for high school students. High school transcript studies have found that academic curricular intensity, defined as the number of Carnegie units completed in English, mathematics, science, history, and foreign language as well as the number of Advanced Placement and remedial courses taken, is more predictive of bachelor's degree attainment than high school GPA, class rank, or test scores (Adelman, 1999, 2006). Therefore, we analyzed several indicators of high school academics to understand whether there were differences in the rigor of students' high school courses and academic preparation for college.

Mathematics and science are two academic subjects with commonly defined college-preparatory courses. Although there are no national standards for college readiness, we defined a college-preparatory mathematics course sequence as algebra I, algebra II, and geometry. This sequence is specified by four of the five states in our study. We also analyzed students' completion of an advanced mathematics course (either pre-calculus or calculus) as an indicator of students' readiness for college mathematics. For science, we defined the college-preparatory course sequence as biology, chemistry, and physics, which is specified by three of the five study states.

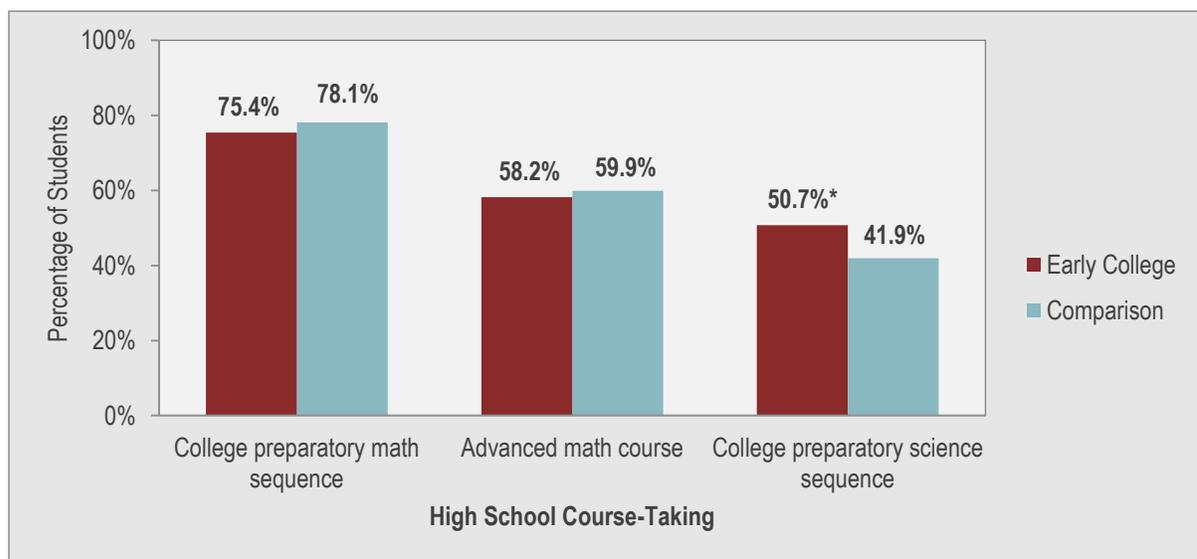
As Exhibit 4.4 shows, there was no significant difference between Early College and comparison students in completing a college-preparatory mathematics sequence or an advanced mathematics course. Overall, over three quarters of study students completed a college-preparatory mathematics sequence in high school (75.4 percent Early College, 78.1 percent comparison). Additionally, almost 60 percent of students in both groups completed an advanced mathematics course in high school (58.2 percent Early College, 59.9 percent comparison).

An impact study of North Carolina Early Colleges found that, in ninth grade, Early College students were significantly more likely than comparison students to take algebra I or a higher mathematics course (Edmunds, Bernstein, et al., 2012). However, despite the statistically significant difference, overall rates were high across groups; 90 percent of Early College students and 81 percent of control students took these courses in ninth grade (Edmunds, Bernstein, et al., 2012). In this study, students reported all of the mathematics

courses they took in 9th through 12th grade, including their high school and college courses. The studies used different measures, but both studies found that Early College and comparison students completed college preparatory mathematics courses at high rates.

In science, however, Early Colleges had a statistically significant, positive impact on course-taking. Slightly over half (50.7 percent) of Early College students and 41.9 percent of comparison students completed a college preparatory science sequence (see Exhibit 4.4).

Exhibit 4.4. Percentage of Students Who Completed College Preparatory Mathematics and Science Courses in High School, by Study Group



n = 1,294 students (724 Early College, 570 comparison)

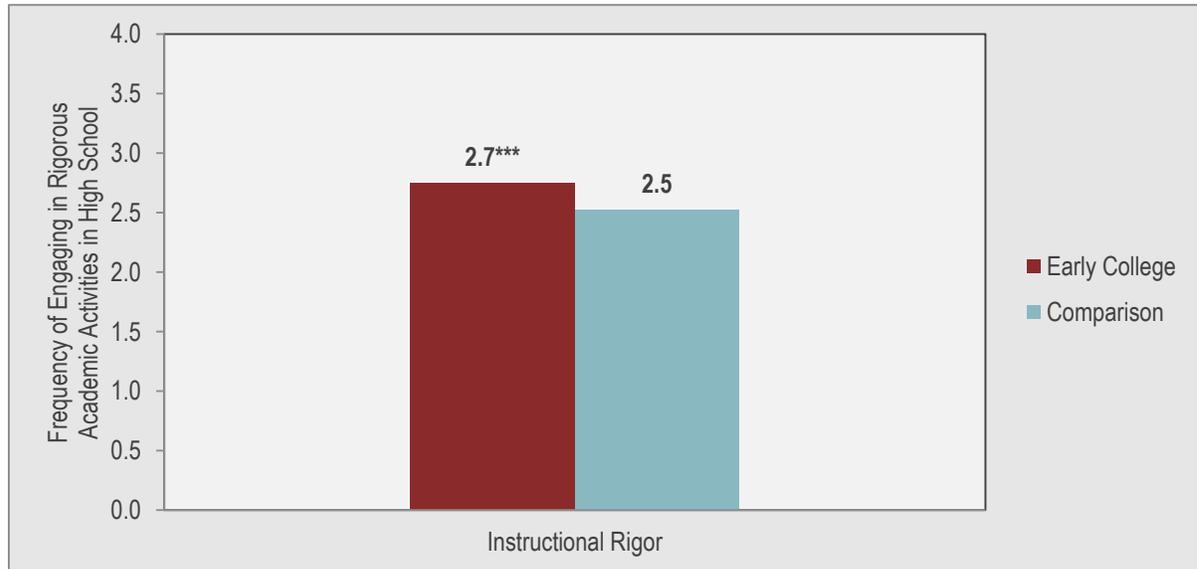
SOURCE: Student survey data from 2011–12

NOTES: Early College means are unadjusted means, and comparison group means were computed by subtracting estimated Early College effects from the unadjusted Early College means.

* $p < .05$; ** $p < .01$; *** $p < .001$

The student survey also included items about instructional rigor (together forming an instructional rigor scale), which asked students to report the frequency with which they engaged in various activities in their high school courses, such as writing five or more pages on a topic, researching information, and explaining their thinking. Appendix A contains further information on these items and the scale. Early College had a positive impact on instructional rigor; Early College students reported engaging in rigorous learning activities significantly more frequently than did the comparison students, with means of 2.7 and 2.5, respectively, on a 0 to 4 scale, on which 0 indicates “never” and 4 indicates “almost every day” (effect size = 0.35; see Exhibit 4.5). On average, students in both groups reported engaging in rigorous academic activities several times per month.

Exhibit 4.5. Students' Reported Frequency of Engaging in Rigorous Academic Activities in High School, by Study Group



$n = 1,294$ students (724 Early College, 570 comparison)

SOURCE: Student survey data from 2011–12

NOTES: Early College means are unadjusted means, and comparison group means were computed by subtracting estimated Early College effects from the unadjusted Early College means. Response options ranged from “never” to “almost every day.”

* $p < .05$; ** $p < .01$; *** $p < .001$

Our survey measures provide only a glimpse into the academic rigor of Early College and comparison students' high school experiences, which is one of the Early College curricular and instructional emphases. Students' responses to the open-ended survey question supported the finding that Early College students perceived their high schools to be more rigorous than comparison students perceived theirs. One Early College student said about her school, “My high school experience was different than any other regular high school. It was all academics and it took so much more hard work than other teens our age. But even after hearing what it was like to go through ‘the best four years of your life’ at a regular high school, I wouldn't change it for anything else.”

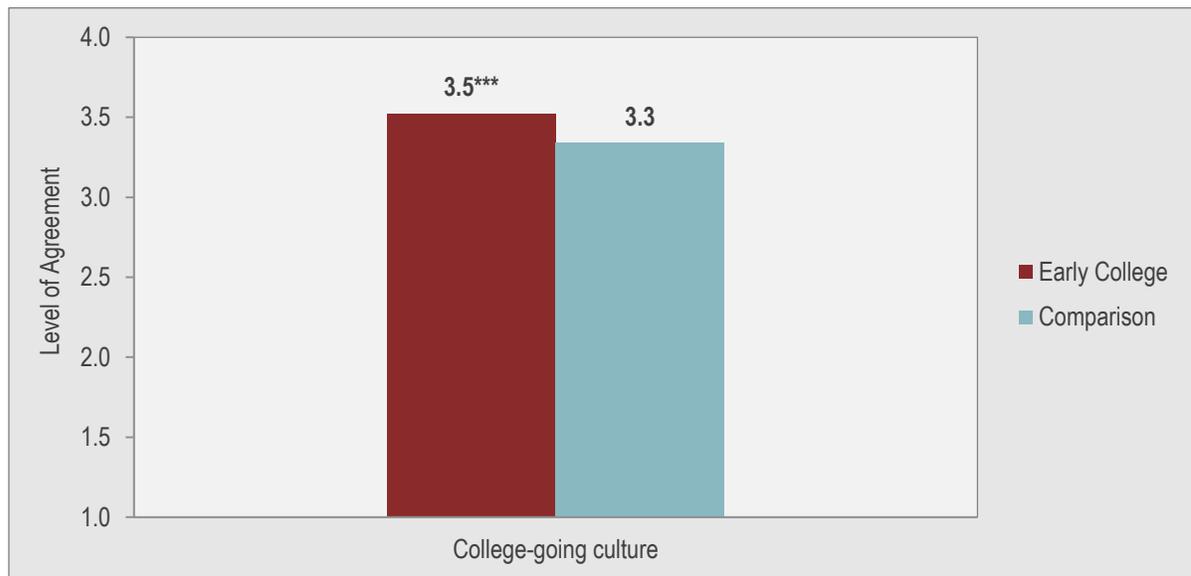
Supports

In addition to offering students access to dual enrollment courses, supports are often required to help students adjust to the different norms and expectations at the college level (Cassidy, Keating, & Young, 2010). To address this need, Early Colleges are expected to combine college exposure and academic rigor with academic and social supports to help students manage college coursework and provide them with the skills required for college success and completion. There are a wide variety of supports that Early Colleges provide, from academic tutoring and advising to study skills, time management, self-advocacy, and

other “college life skills” (AIR & SRI, 2008, 2009; Cassidy et al., 2010). The supports examined in this study are not comprehensive, but they include several measures that prior work has identified as important features of Early Colleges—college-going culture, general college information, instructor support, and several specific college preparation supports (AIR & SRI, 2008, 2009; Duffy et al., 2009). This section explores whether Early College students received greater supports from their schools to prepare for college than their comparison peers.

First, Early Colleges aim to establish an environment where all students feel they are expected to go to college. Our survey measured college-going culture as the extent to which teachers, principals, and students in their high school expected students to go to college. Appendix A contains additional information about this scale. As Exhibit 4.6 demonstrates, Early College students reported a significantly stronger college-going culture at their high schools than comparison students. The average score for Early College students was 3.5, compared with 3.3 for comparison students, on the 1 to 4 college-going culture scale on which 3 represents agreement and 4 represents strong agreement (effect size = 0.32).

Exhibit 4.6. Students’ Reported College-Going Culture in High School, by Study Group



n = 1,294 students (724 Early College, 570 comparison)

SOURCE: Student survey data from 2011–12

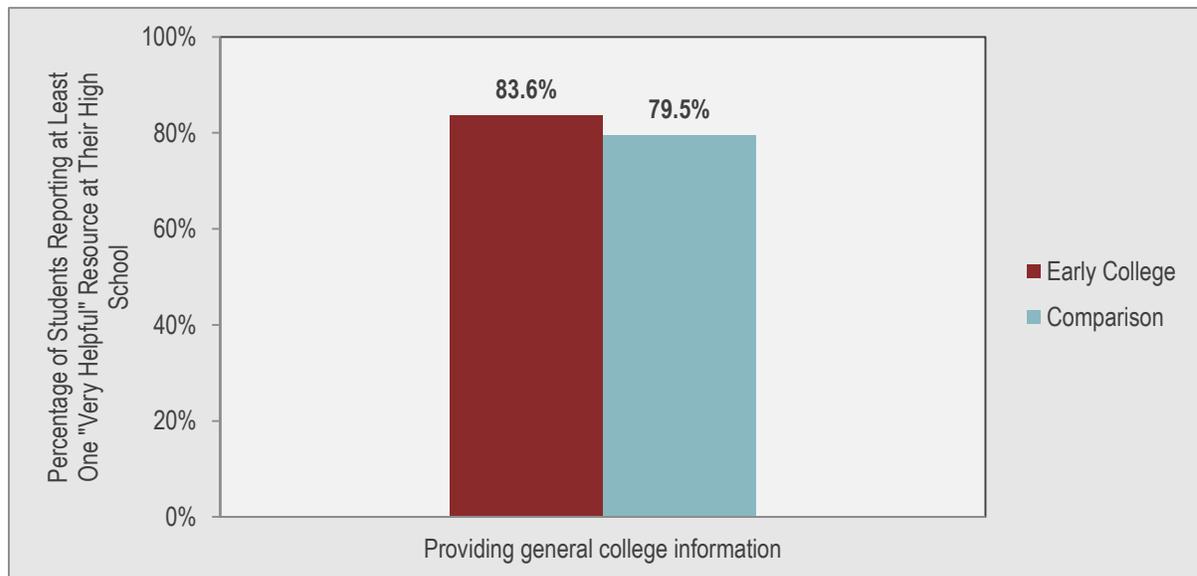
NOTES: Early College means are unadjusted means, and comparison group means were computed by subtracting estimated Early College effects from the unadjusted Early College means. Response options ranged from “strongly disagree” to “strongly agree.”

* $p < .05$; ** $p < .01$; *** $p < .001$

Second, Early Colleges aim to support students in meeting the college-going expectations described above. One way Early Colleges do this is by talking about college and providing students with information about college. Our survey asked whether students had at least

one “very helpful” resource at their high school to provide them with general information about college. As Exhibit 4.7 shows, about 80 percent of students in both groups reported having a “very helpful” resource to learn about college (83.6 percent Early College compared with 79.5 percent comparison—a difference that was not statistically significant).⁴⁶

Exhibit 4.7. Percentage of Students Who Reported at Least One “Very Helpful” Resource at Their High School for Providing General College Information, by Study Group



n = 1,294 students (724 Early College, 570 comparison)

SOURCE: Student survey data from 2011–12

NOTES: Early College means are unadjusted means, and comparison group means were computed by subtracting estimated Early College effects from the unadjusted Early College means.

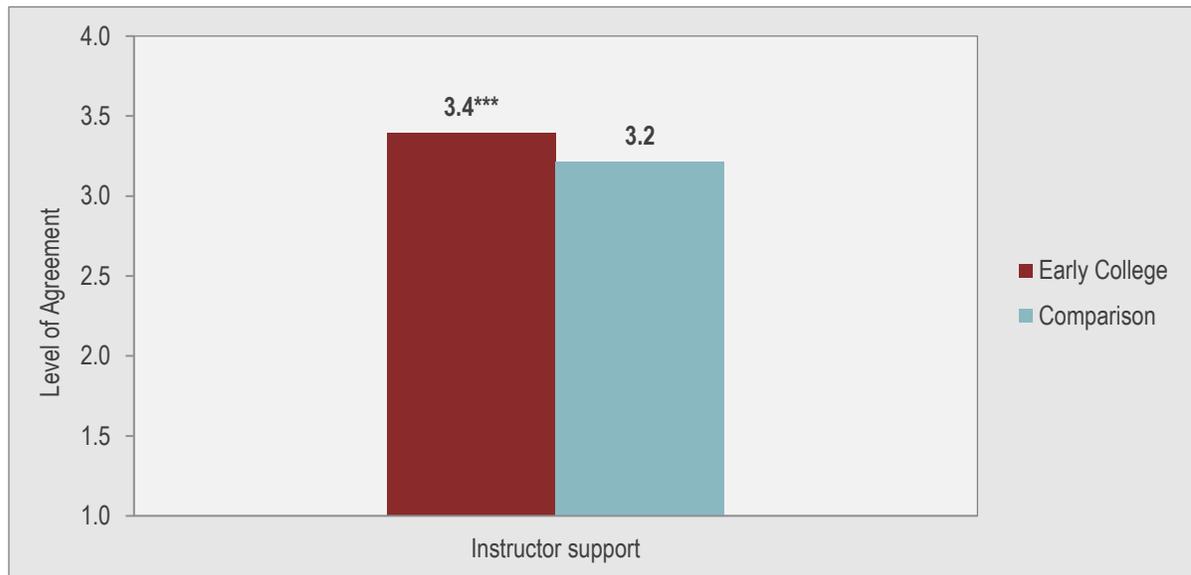
* *p* < .05; ** *p* < .01; *** *p* < .001

Third, Early Colleges aim to support students academically and socially. Prior research has shown that many Early Colleges in the initiative integrate features to promote personalized instruction, including teachers moving with their students to the next grade level and providing small-group and individualized instruction (AIR & SRI, 2007). The student survey measured instructor support as an indicator of the Early College emphases on personalization and instructor-student relationships to support students. The scale contained items asking the extent to which students agreed that their high school teachers cared about them and encouraged them, and other similar items. Appendix A contains additional information about this scale. Both groups agreed that their high school instructors were supportive, but the level of support was significantly stronger for Early College students. As Exhibit 4.8 illustrates, Early College students had a mean score of 3.4 and comparison

⁴⁶ We also examined whether students received general college information from resources outside of school (e.g., family, friends). About 40 percent of both groups reported having at least one “very helpful” resource for providing them with general college information outside of school (38.8 percent Early College, 40.0 percent comparison; a statistically insignificant difference).

students had a mean score of 3.2 on the instructor support scale, on which 3 represents agreement and 4 represents strong agreement (effect size = 0.31).

Exhibit 4.8. Students' Reported Instructor Support in High School, by Study Group



n = 1,294 students (724 Early College, 570 comparison)

SOURCE: Student survey data from 2011–12

NOTES: Early College means are unadjusted means, and comparison group means were computed by subtracting estimated Early College effects from the unadjusted Early College means. Response options ranged from “strongly disagree” to “strongly agree.”

* $p < .05$; ** $p < .01$; *** $p < .001$

On the survey, Early College students noted the support they received from their high school teachers. One said, “The teachers were always there to help and [took] the time to give us information about college. We had complete access to the faculty at all times.” Another commented, “My teachers were driven to make sure we succeeded in achieving both [an associate's degree and a high school diploma] and in pursuing a higher version of education.”

Fourth, Early Colleges aim to provide specific supports for students to prepare for and apply to college. Prior research found that Early Colleges provide a variety of college preparation supports, including college preparation and support courses, college information sessions, college entrance exam preparation, college application help, financial aid application help, college tours, and career guidance (AIR & SRI, 2008, 2009). In 2008–09, 89 percent of surveyed Early Colleges reported providing formal academic or social support classes or seminars (AIR & SRI, 2009).⁴⁷ In 2006–07, 59 percent of the surveyed Early Colleges reported having support classes with a goal of exposing students to college and

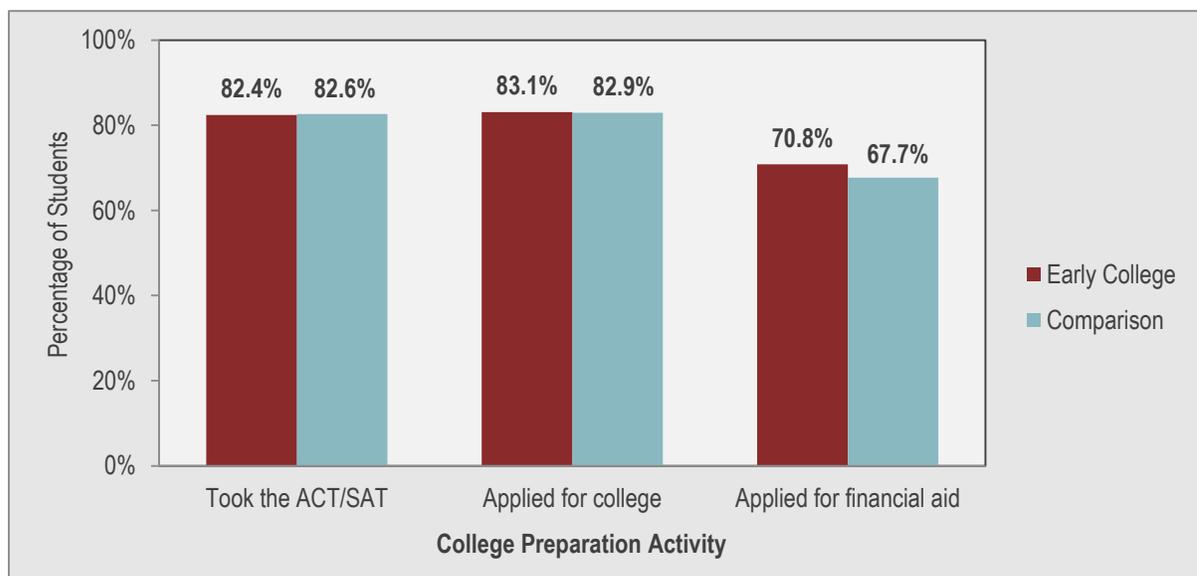
⁴⁷ See Hindo, Barnett, and Kim (2010) for a description of Early College seminars devoted to supporting college courses.

employment topics (AIR & SRI, 2008). For example, one Early College class was called “Apply for College.”

Our student survey asked about high school supports for three college preparation activities: preparing for the ACT or SAT, completing college applications, and completing financial aid applications. The analyses of these measures were based on a non-random subsample. For example, students were asked about the sources and quality of help they received preparing for the ACT or SAT only if they reported taking the ACT or SAT exam.

Exhibit 4.9 shows that Early College and comparison students did not differ significantly in their rates of participation in each of three activities we asked about on the survey. Among both Early College and comparison students, about 80 percent took the ACT or SAT, about 80 percent applied for college, and about 70 percent applied for financial aid. The similar percentages of students in both groups suggest that it is unlikely that the subset of Early College students and comparison students included in the college preparation support analyses were systematically different from the overall sample. Nevertheless, this subsample was not randomly selected; results from the following analyses should be interpreted with caution.

Exhibit 4.9. Student Participation in College Preparation Activities, by Study Group



n = 1,294 students (724 Early College, 570 comparison)

SOURCE: Student survey data from 2011–12

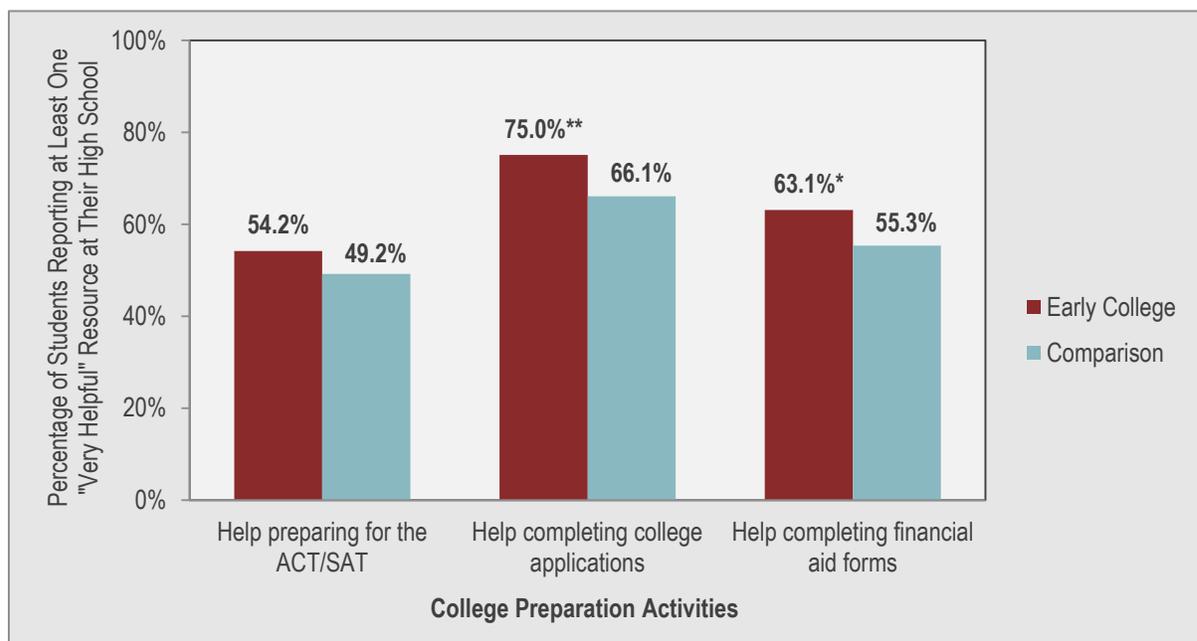
NOTES: Early College means are unadjusted means, and comparison group means were computed by subtracting estimated Early College effects from the unadjusted Early College means.

* *p* < .05; ** *p* < .01; *** *p* < .001

For each of the above activities, the survey asked students about supports provided in school and outside of school, resulting in a total of six college preparation support

measures. Focusing on the quality of support, each measure indicates whether the student reported having at least one “very helpful” resource (e.g., teacher, counselor) for the specified college preparation activity (see Appendix A for more information). Exhibit 4.10 shows that there were significant differences between Early College and comparison students in two of the three college preparation supports at their high school. Three quarters (75.0 percent) of Early College students reported having at least one very helpful resource at their high school to help them with college applications, versus 66.1 percent of comparison students (effect size = 0.26). Further, 63.1 percent of Early College students reported having at least one helpful resource at their high school to help them with financial aid forms, versus 55.3 percent of comparison students (effect size = 0.20). These findings are consistent with prior research, which found that Early Colleges provide systematic college and financial aid application supports (AIR & SRI, 2009). However, students’ reports of receiving help preparing for the ACT or SAT were about the same for the Early College and comparison groups.⁴⁸

Exhibit 4.10. Percentage of Students Who Reported at Least One “Very Helpful” Resource at Their High School, by College Preparation Activity and Study Group



The sample sizes vary by item because students were only asked about the supports they received for each activity they reported completing: SAT/ACT help $n = 1,053$ (596 Early College, 457 comparison); College application help $n = 1,067$ (601 Early College, 466 comparison); Financial aid help $n = 890$ (512 Early College, 378 comparison).

SOURCE: Student survey data from 2011–12

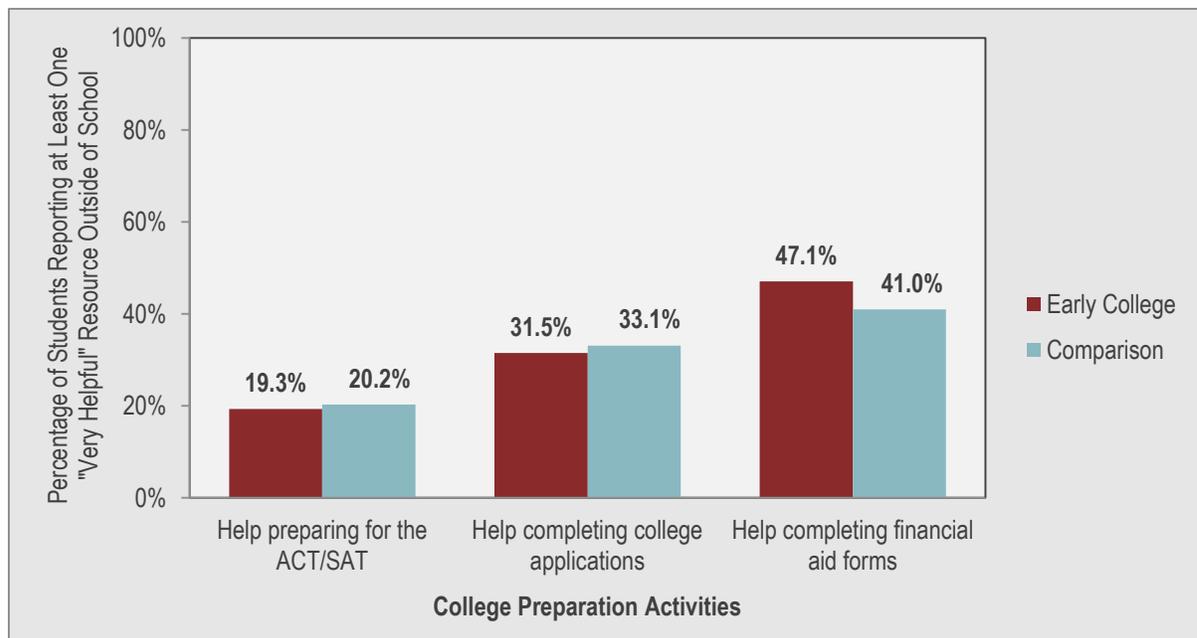
NOTES: Early College means are unadjusted means, and comparison group means were computed by subtracting estimated Early College effects from the unadjusted Early College means.

* $p < .05$; ** $p < .01$; *** $p < .001$

⁴⁸ In addition to examining ACT/SAT-taking, we examined ACT/SAT scores as an indicator of college readiness. Since students could take either the ACT or SAT or both exams, we converted students’ highest reported SAT score into ACT units and used students’ highest overall exam score (ACT, n.d.). Using ACT units, Early College students scored an average of 23 and comparison students scored an average of 22—not a significant difference.

Although Early College students received significantly stronger college and financial aid application supports from their school than comparison students, it is possible that comparison students may have found similar help elsewhere. Therefore, we examined support for college preparation activities that students found outside of school. As Exhibit 4.11 shows, the percentage of students reporting at least one “very helpful” resource outside of school varied across specific college preparation activities. However, similar percentages of Early College and comparison students reported help with each activity; differences were not statistically significant.

Exhibit 4.11. Percentage of Students Who Reported at Least One “Very Helpful” Resource Outside of School, by College Preparation Activity and Study Group



The sample sizes vary by item because students were only asked about the supports they received for each activity they reported completing: ACT/SAT help $n = 1,053$ (596 Early College, 457 comparison); College application help $n = 1,067$ (601 Early College, 466 comparison); Financial aid help $n = 890$ (512 Early College, 378 comparison).

SOURCE: Student survey data from 2011–12

NOTES: Early College means are unadjusted means, and comparison group means were computed by subtracting estimated Early College effects from the unadjusted Early College means.

* $p < .05$; ** $p < .01$; *** $p < .001$

The survey data indicated that both Early College and comparison students took steps to prepare for college and both groups had access to supports. However, Early College students experienced significantly higher college-going expectations and felt more supported by instructors. Additionally, there is some evidence to suggest that Early College students received stronger support at their high school to complete college applications and apply for financial aid than comparison students. The sentiment of several comparison students was reflected in this statement by one student: “I was left to figure out applying for colleges by myself.” The college and financial aid application process is difficult to navigate, and school

supports are helpful, especially for first-generation college-goers and disadvantaged students who are the initiative's target population and who often do not have help from other resources. As one student who attended an Early College but transferred to another school said, "I had no help other than a family member who did not have college experience but wanted me to attend college, so no one around me knew how to even apply." Thus, college application supports may distinguish Early Colleges from other high schools.

Conclusion

As this chapter has demonstrated, being admitted to an Early College had a statistically significant impact on students' high school experiences. First, Early College students earned significantly more college credits than their comparison peers, putting them on a faster track to college degree attainment. Second, Early College students reported a significantly more rigorous high school academic experience than comparison students did. Third, Early College students reported significantly stronger college-going culture and instructor support than comparison students. Fourth, there is evidence to suggest that Early College students received stronger college application and financial aid application supports than their comparison peers. However, as noted above, findings about specific college preparation supports only apply to a non-random subset of the survey sample.

The high school experiences and supports measured in this study were limited due to the retrospective nature of the survey. They do not represent the full range of students' high school experiences or the comprehensive set of academic and social supports that Early Colleges provide. Nevertheless, these findings suggest that a distinguishing feature of the Early College model is providing systematic supports to help students make a successful transition to college. As a whole, the measures in this chapter provide context to the outcome differences discussed in the previous chapter, illustrating that Early Colleges had a positive and meaningful impact on students' college exposure, college credit accrual, and supports in high school.

Chapter 5. Summary

The ECHSI, initiated by the Bill & Melinda Gates Foundation, has been growing for over a decade. Between 2002 and 2012, over 250 Early Colleges opened as part of this initiative, and many more Early Colleges unaffiliated with the ECHSI have opened nationwide (Jobs for the Future, 2012). AIR and SRI studied the ECHSI for seven years (2002–09), documenting growth and sustainability. By 2009, Early Colleges appeared to be working well for many students (AIR & SRI, 2008, 2009). Early Colleges nationally were serving primarily minority and low-income students. Early Colleges achieved higher assessment proficiency rates and higher graduation rates than other area high schools. Most importantly, Early College graduates earned between a semester and a year of college credits while in high school.

By 2009, evidence was promising, but many questions remained. Most of the evidence from the program focused on high school outcomes since there were few high school graduates during the early years of the initiative. Early Colleges reported on the college plans of students and students reported on the amount of college credits they would accrue by graduation, but the question remained: What are the long-term outcomes for Early College students?

In addition, the prior research evidence on Early Colleges was largely descriptive. Early Colleges could have been recruiting higher performing students. Students who chose to enroll could have been more academically motivated and engaged. A descriptive examination cannot fully disentangle the influence of these factors from the causal impact of Early Colleges on students, prompting another question: What is the impact of Early Colleges on students?

Finally, although the overall findings from previous research were positive, evidence indicated that some types of students benefited more from attending an Early College than others. For example, more females than males seemed to stay enrolled in high school. In addition, minority students, low-income students, and first-generation college-going students reported lower GPAs than non-minority students, high-income students, and students who were not first-generation college-goers. Thus, prompting a final question: Does the impact of Early Colleges systematically differ for different groups of students?

Buoyed by the positive findings from the initial evaluation work and inspired by these remaining questions, we embarked on a study to determine the program's impact on both students' high school and postsecondary outcomes. Our two guiding research questions were as follows:

1. Do Early College students have better outcomes than they would have had at other high schools?
2. Does the impact of Early Colleges vary by student background characteristics?

We used existing lottery admission records to compare the educational outcomes for students admitted to Early Colleges by lottery to the educational outcomes for students who were not admitted by lottery. Because the lottery-based randomization ensured that the Early College and comparison students were similar at high school entry, we can draw strong conclusions about impact. By examining data from schools, districts, states, the NSC, and students, we can provide strong evidence related to these research questions.

Early College Impact on Outcomes

Do Early College students have better outcomes than they would have had at other high schools?

In high school, Early College students had significantly higher ELA assessment scores and graduation rates than comparison students. However, the groups did not differ significantly on high school mathematics scores or GPA.

In terms of college enrollment and degree attainment, Early Colleges provided students a large advantage. Early College students were more likely than comparison students to have enrolled in college. They were also more likely to have earned a college degree. Because Early College students start college in high school, we should expect Early College students to enroll in college and complete college degrees earlier. However, both of these findings held for every point in time we examined. In other words, there was no evidence of comparison students “catching up” to Early College students in later years.

Almost 20 percent of Early College students earned a college degree, usually an associate’s degree, by the end of the traditional high school years. These findings are consistent with other recent research on Early Colleges. A study of North Carolina Early Colleges found that about one quarter of Early College students earned a college degree within two years of high school (Edmunds, Unlu, Glennie, Bernstein, & Smith, 2013). Similarly, Jobs for the Future (2013) found that at established Early Colleges nationally, about one quarter of graduates obtained a college degree while in high school.

Early College students were significantly more likely to enroll in a four-year college than comparison students, both during and after high school. Although most Early College students who started college while in high school enrolled in a two-year college, most students who enrolled after high school enrolled in a four-year college. These findings

suggest that Early Colleges set students on a different academic trajectory. Early Colleges were not diverting students away from four-year colleges.

Differential Early College Impact

Does the impact of Early Colleges vary by student background characteristics?

We found that the effects of Early College were generally similar for students with different background characteristics, but when the effects differed, the difference was generally in favor of underrepresented groups. The Early College impact on high school graduation and college enrollment was similar for students with different background characteristics.⁴⁹ For college degree attainment, Early Colleges not only had a significant overall impact on all students, but also had significantly stronger impacts for the traditionally underrepresented student groups than for their peers.

The Early College impact on degree attainment was stronger for

- minority students relative to non-minority students, and
- low-income students relative to higher income students.

Given that research has shown that, generally, minority and low-income students are less likely to obtain a college degree relative to their peers (NCES, 2012b and 2012c), our findings about the stronger Early College impact on minority and low-income students' college degree attainment suggest that Early Colleges reduced the commonly observed gaps in degree attainment related to minority status and low-income status. In Texas, Struhl and Vargas (2012) also found that participation in dual enrollment programs increased the likelihood of college degree attainment for all students regardless of race, ethnicity, or income. Of particular note is that, on average, minority Early College students were at least as likely as non-minority Early College students to have earned a college degree.

On the other hand, the Early College impact on college degree attainment was stronger for

- female students relative to male students, and
- students with higher levels of prior achievement relative to students with lower levels of prior achievement in ELA and mathematics.

⁴⁹ In this study, we only examined differences in Early College impacts based on student characteristics for three key outcomes. It is possible that the Early College impacts on other outcomes may differ for students with different characteristics. Struhl and Vargas (2013), for example, found that the positive effect of participation in dual enrollment programs on the likelihood of attending a four-year institution was stronger for low-income students than for other students.

Female and higher-achieving students are typically more likely to obtain a college degree (NCES, 2012g; Adelman, 2006). These results suggest that Early Colleges may have actually widened the gaps in degree attainment related to gender and prior achievement.

Taken together, these results show that Early Colleges did not leave underrepresented students behind. The goal of the ECHSI is to reach students from underrepresented populations and make college completion a common outcome. The Early Colleges included in this study certainly achieved the intended impacts for underrepresented groups.

A note of caution should be observed when considering the impact of Early Colleges on the outcomes for traditionally underrepresented student groups. Although the goal of the ECHSI is to reach students from underrepresented populations, these Early Colleges attracted more academically prepared and academically ambitious students than typical district students. Overall, both Early College and comparison students had impressive high school graduation rates, exceeding 80 percent. By comparison, in one large urban district where a large number of the study students attended high school, the estimated four-year high school graduation rate in 2009 was just over 50 percent (EPE Research Center, 2012). College enrollment rates for students in the study sample were quite high as well—over 70 percent. By comparison, only 40 percent of 18-to-24-year-olds in the nation enrolled in college in 2010 (NCES, 2012h).

Therefore, although this study found that the impact of Early Colleges on degree completion was stronger for traditionally underrepresented students, it is important to note that, because our sample comprises lottery participants in selected sites, it is not representative of the population of underrepresented students in America.

Early College Impact on High School Experiences

As expected, the high school experiences for Early College students differed significantly from those of comparison students.

College Exposure – Students admitted to Early Colleges received significantly more exposure to college in high school than did their peers in the comparison group. About half of the Early College students earned at least one year of college credit while in high school. Although comparison students also had access to college classes, they accumulated significantly fewer college credits.

Rigorous Academics – When the ECHSI was starting, observers and stakeholders wondered if the schools could provide rigorous academics and introduce college courses. The fear was that the pressure to take college classes would lead students into easy college classes and away from rigorous high school classes. The evidence suggests that this did

not occur. Early College students engaged in rigorous courses and activities at the same level as, or at an even higher level than, the comparison students.

Supports – Our evidence indicates that study students felt well supported in high school. Generally, they felt that their peers and teachers wanted them to go to college, their teachers were there to help them, and their schools provided helpful supports in applying for college. Although Early College students felt more strongly supported than comparison students, the general message is that regardless of where they went to school, most of these students had access to supports.

Caveats and Future Research

This study provides strong evidence of the positive impact of Early College on students. However, several caveats are worth repeating. First, these findings are only applicable to the 10 Early Colleges included in this study. During the study years, there were over 150 Early Colleges open across the country and many of them had been open for at least five years. There are many Early Colleges that these 10 sites may not represent. For example, the study Early Colleges may have been particularly effective, gaining a reputation that led to their oversubscription, and, hence, a lottery for admission. Alternatively, they may have been well managed, as evidenced by their keeping of lottery records for many years.

Second, these findings are only applicable to the study years. These Early Colleges may have improved or worsened over time. Earlier research (AIR & SRI, 2008) suggested that student outcomes were stronger in the first years of an Early College's opening.

Third, these findings are only applicable to lottery participants. Many students apply to Early Colleges and are accepted without going through a lottery. For example, some Early Colleges automatically enrolled students with certain assessment scores. Students who did not participate in the lottery are not represented by this study.

Fourth, these results are based on the premise that the lotteries resulted in random assignment of students to attend or not attend an Early College. As we have noted, our extensive research turned up only minor concerns over lottery implementation in two sites, and even with those sites excluded, the findings do not change much. However, we did not run the lotteries, and we found a significant baseline difference between Early College and comparison students in one baseline student characteristic—student ELA test scores. Given that there was no significant baseline difference in mathematics scores, the observed difference in mathematics scores was in the opposite direction of the difference in ELA, and there were no significant differences in student demographics, we believe the lotteries were fair. But there could have been procedures that resulted in some students not being randomly assigned.

These caveats suggest that a representative impact study would be highly desirable. One approach could be to randomly select Early Colleges from the ECHSI and then follow students prospectively after random assignment. A study of Early Colleges in North Carolina is a step in this direction (Edmunds, Bernstein, et al., 2012), but it does not include a representative set of Early Colleges or students. Although potentially enlightening, this type of study would certainly be a challenge, as not all schools are oversubscribed, and not all schools use a lottery for admission.

Another important avenue for research involves following students for a longer period of time. This study followed students through up to three years after high school. However, many statistics on postsecondary attainment allow four years after high school to attain an associate's degree and six years to attain a bachelor's degree (NCES, 2012i). If additional research were to follow students over a longer period of time, we hypothesize that, that the following will be true for Early College students relative to comparison students:

- *Early College students will accrue less educational debt.* Early College students accrued significant college credits during high school at no or reduced cost. If they spend less time in college after high school, they should finish their education with less debt.
- *Early College students will have an advantage in finding employment.* Earning a degree may provide advantages to Early College students when competing for a job against others with weaker educational qualifications. In addition, earning a degree earlier may provide advantages to Early College students when competing against others with the same qualifications: if a student graduates earlier than other students, it may signal to potential employers that the student is more ambitious and academically successful than other applicants with the same credentials.⁵⁰
- *Early College students will have higher lifetime earnings.* If Early College students join the workforce earlier than their peers with the same education level, and are more competitive in obtaining jobs, then the Early College is increasing their potential for lifetime earnings.

Finally, these benefits may go beyond the students and their families. An earlier study estimated the return on investment based on the preliminary assumption that about 48 percent of Early College students and 20 percent of traditional students eventually obtain an associate's or bachelor's degree (Palaich, Augenblick, & Maloney, 2007; Vargas, 2013). Under these assumptions, which are appropriate based on the impacts reported for this study, the authors found long-term, financial benefits both for Early College students and

⁵⁰ See, for example, Flores-Lagunes and Light (2010), which indicates that among college degree holders, longer completion times have negative workforce outcomes.

their families and for educational institutions and governments. Therefore, a promising line of future research is to examine the impact of Early Colleges on longer-term outcomes.

In this study, we only scratched the surface in examining the treatment, or the “black box.” We hope that future research will investigate the high school experiences more deeply and test the conceptual framework. Additionally, studies including a larger number of sites may allow researchers to examine the variation in Early College impact, and factors that may relate to the variation in impact. For example, early descriptive research suggested that Early Colleges on college campuses provided greater benefits to students than other Early Colleges (AIR and SRI, 2009). This could be tested by comparing the Early College impact for Early Colleges located on a college campus with the impact for Early Colleges located on a high school campus in a larger-scale multisite impact study.

Finally, this research inspires several questions about policies that might support Early College. To replicate these results, must schools implement the full Early College model, or can high schools leverage current dual enrollment policies to improve student access and success in college? What supports are provided by Early Colleges, and how do they relate to student success in college? What is the role of state policy in the success of Early Colleges and dual enrollment programs?⁵¹ Can online college coursework be successfully used to reform high school education?

Conclusion

The Early Colleges in this study yielded significant and meaningful improvements in student outcomes. We believe the success of the Early College model lies in the relationship between high school and college and its vision for educating young adults. This initiative challenges long-held assumptions about who can be successful in college and when. By combining two systems, secondary and postsecondary, it provides a different way of thinking about the role, and potential, of college. The ECHSI challenges the artificial separation between high school and college. The initiative completely reengineers the educational pathway, and many students have experienced greater success following this new path.

We conclude the report with the words of two successful Early College students. Clinton earned an associate’s degree by the time he graduated from his Early College.⁵² After high school graduation, he enrolled in a “highly competitive” four-year college and by the end of

⁵¹ For example, Alabama is working toward allowing any high school student to take community college courses for free (McClure, 2013).

⁵² All names have been changed to protect student confidentiality.

our study he was in his third year of college.⁵³ Clinton said, “My time at [the Early College] has prepared me for schoolwork at a higher level because I was basically performing the same level of work throughout high school. The environment pushed me to take every opportunity offered to me... I am a better student for having attended [Early College].” For Clinton, the Early College provided the preparation he needed to succeed at an academically demanding university.

Alexia enrolled in a “very competitive” four-year college after attaining an associate’s degree in high school. By the end of this study, she was enrolled for her second year of college after high school. She reflected on the Early College’s effect on accelerating her education and her readiness for college: “[The Early College] allowed me to receive my associate’s degree nearly for free. Without [the Early College], I would not have my competitive edge that I have now at [college]; and I wouldn’t have the same confidence, college smarts, or goals.” According to Alexia, attending an Early College not only gave her the opportunity to earn a college credential at little cost but also gave her the skills to help her succeed at the competitive college. As both of these students demonstrate, Early Colleges had an important impact on their educational outcomes and personal development. These students exemplify the difference that Early Colleges made in the lives of students.

⁵³ To protect the identity of students, we include the selectivity of colleges using the Barron’s ranking system (Barron’s Profiles of American Colleges, 2013) instead of using the institutions’ names.

References

- Abdulkadiroglu, A., Angrist, J., Cohodes, S., Dynarski, S., Fullerton, J., Kane, T., et al. (2009). *Informing the debate: Comparing Boston's charter, pilot and traditional schools*. Boston: The Boston Foundation. Retrieved from http://www.gse.harvard.edu/%7Epfpie/pdf/InformingTheDebate_Final.pdf
- ACT. (n.d.). *Compare ACT & SAT Scores*. Retrieved from <http://www.act.org/solutions/college-career-readiness/compare-act-sat/>
- Adelman, C. (1999). *Answers in the tool box: Academic intensity, attendance patterns, and bachelor's degree attainment*. Washington, DC: U.S. Department of Education.
- Adelman, C. (2006). *The toolbox revisited: Paths to degree completion from high school through college*. Washington, DC: U.S. Department of Education. Retrieved from <http://www2.ed.gov/rschstat/research/pubs/toolboxrevisit/toolbox.pdf>
- American Institutes for Research & SRI. (2005). *Early College High School Initiative: Evaluation year-end report: 2003–2004*. Washington, DC: American Institutes for Research.
- American Institutes for Research & SRI. (2006). *Early College High School Initiative: 2003–05 evaluation report*. Washington, DC: American Institutes for Research.
- American Institutes for Research & SRI. (2007). *Evaluation of the Early College High School Initiative: Select topics on implementation*. Washington, DC: American Institutes for Research.
- American Institutes for Research & SRI. (2008). *2003–2007 Early College High School Initiative evaluation: Emerging patterns and relationships*. Washington, DC: American Institutes for Research.
- American Institutes for Research & SRI. (2009). *Early College High School Initiative evaluation synthesis report: Six years and counting: The ECHSI matures*. Washington, DC: American Institutes for Research.
- An, B. (2012). The impact of dual enrollment on college degree attainment: Do low-SES students benefit? *Educational Evaluation and Policy Analysis*, 35(1), 57–75.
- Angrist, J., Cohodes, S., Dynarski, S., Fullerton, J., Kane, T., Pathak, P., et al. (2011). *Student achievement in Massachusetts' charter schools*. Cambridge, MA: Center for Education Policy Research.

- Angrist, J., Imbens, G., & Rubin, D. (1996). Identification of causal effects using instrumental variables. *Journal of American Statistical Association*, 91, 444–455.
- Barron's Profiles of American Colleges. (2013). Retrieved from <http://www.barronspac.com/>
- Bettinger, E. P., Long, B. T., Oreopoulos, P., & Sanbonmatsu, L. (2009). *The role of simplification and information in college decisions: Results from the H&R Block FAFSA experiment*. Cambridge, MA: National Bureau of Economic Research. Retrieved from http://www.nber.org/papers/w15361.pdf?new_window=1
- Bill & Melinda Gates Foundation. (2009). *College-Ready*. Retrieved from <http://www.gatesfoundation.org/learning/Documents/College-ready-education-plan-brochure.pdf>
- Bloom, H. S., Thompson, S. L., & Unterman, R. (2010). *Transforming the high school experience: How New York City's new small schools are boosting student achievement and graduation rates*. New York: MDRC.
- Carnevale, A. P., Rose, S. J., & Cheah, B. (2011, August). *The college payoff: Education, occupations, lifetime earnings*. Washington, DC: Center on Education and the Workforce, Georgetown University. Retrieved from <http://cew.georgetown.edu/collegepayoff/>
- Carnevale, A. P., Smith, N. Stone III, J. R., Kotamraju, P., Steuernagel, B., & Green, K. A. (2011, November). *Career clusters: Forecasting demand for high school through college jobs*. Washington, DC: Center on Education and the Workforce, Georgetown University. (Executive summary). Retrieved from <http://cew.georgetown.edu/clusters/>
- Cassidy, L., Keating, K., & Young, V. (2010). *Dual enrollment: Lessons learned on school-level implementation*. Menlo Park, CA: SRI International.
- Community College Research Center. (2012). *What we know about dual enrollment*. New York: Community College Research Center, Institute on Education and the Economy, Teachers College, Columbia University. Retrieved from <http://ccrc.tc.columbia.edu/Publication.asp?UID=1054>
- Complete College America. (2012). *Remediation: Higher education's bridge to nowhere*. Washington, DC: Author.
- Duffy, H., Cassidy, L., Keating, K., & Berger, A. (2009). *Instruction across the high school-college divide*. Washington, DC: American Institutes for Research.

- Dynarski, M., Gleason, P., Rangarajan, A., & Wood, R. (1998). *Impacts of dropout prevention programs: Final report. A research report from the School Dropout Demonstration Assistance Program evaluation*. Princeton, NJ: Mathematica Policy Research.
- Edmunds, J., Bernstein, L., Unlu, F., Glennie, E., & Willse, J. (2012). Expanding the start of the college pipeline: Ninth grade findings from an experimental study of the impact of the early college high school model. *Journal of Research on Educational Effectiveness*, 5(2), 136–159.
- Edmunds, J., Unlu, F., Glennie, E., Bernstein, L., & Smith, A. (2013). *The impact of the Early College High School model on post-secondary enrollment*. Presentation at SREE conference, March 7–9, 2013, Washington, DC.
- Edmunds, J., Willse, J., Arshavsky, N., & Dallas, A. (2013). Mandated engagement: The impact of early college high schools. *Teachers College Record* 115(7). Retrieved from <http://www.tcrecord.org/Content.asp?ContentId=17044>
- EPE Research Center. (2012). District graduation rate map tool. Retrieved from <http://www.edweek.org/apps/gmap/>
- Flores-Lagunes, A., & Light, A. (2010). Interpreting degree effects in returns to education. *Journal of Human Resources* 4 (2010), 439–467.
- Gennetian, L. A., Morris, P. A., Bos, J. M., & Bloom, H. S. (2005). Constructing instrumental variables from experimental data to explore how treatments produce effects. In H. S. Bloom (Ed.), *Learning more from social experiments: Evolving analytic approaches* (pp. 75–114). New York: Russell Sage Foundation.
- Grusky, D. B., Bird, R. B., Rodriguez, N., & Wimer, C. (2013). *How much protection does a college degree afford? The impact of the recession on recent college graduates*. Washington, DC: The Pew Charitable Trusts.
- Hedges, L. V. (1981). Distribution theory for Glass's estimator of effect size and related estimators. *Journal of Educational Statistics*, 6(2): 106–128.
- Hindo, C., Barnett, E., & Kim, J. (2010). *A support program for high school students undertaking college courses*. Seminar given at the National Center for Restructuring Education, Schools and Teaching (NCREST), Columbia University in New York.
- Hoffman, N., & Webb, M. (2009, June). Early-college high school: Modest experiment or national movement? *Education Week*, 28(35). Retrieved from <http://www.edweek.org/ew/articles/2009/06/11/35hoffman.html> (login required).

- Horn, L., & Nuñez, A.-M. (2000). *Mapping the road to college: First-generation students' math track, planning strategies, and context of support* (<http://nces.ed.gov/pubsearch/pubsinfo.asp?pubid=2000153>). U.S. Department of Education, National Center for Education Statistics. Washington, DC: U.S. Government Printing Office.
- Hoxby, C. M., & Avery, C. (2012). *The missing "one-offs": The hidden supply of high-achieving, low income students*. Cambridge, MA: National Bureau of Economic Research. Retrieved from http://www.brookings.edu/~media/Projects/BPEA/Spring%202013/2013a_hoxby.pdf
- Hoxby, C., & Murarka, S. (2009). *Charter schools in New York City: Who enrolls and how they affect their students' achievement* (Working Paper 14852). Cambridge, MA: National Bureau of Economic Research.
- Hughes, K. L., Karp, M. M., Fermin, B. J., & Bailey, T. R. (2005). *Pathways to college access and success*. Washington, DC: U.S. Department of Education, Office of Vocational and Adult Education.
- Hughes, K. L., Rodriguez, O., Edwards, L., & Belfield, C. (2012). *Broadening the benefits of dual enrollment: Reaching underachieving and underrepresented students with career-focused programs*. New York: Community College Research Center, Teachers College, Columbia University.
- Jobs for the Future. (2008). *Early College High School Initiative Core Principles*. Boston: Author. Retrieved from <http://www.earlycolleges.org/downloads/coreprinciples.pdf>
- Jobs for the Future. (2011). *Making the grade: Texas early college high schools prepare students for college*. Boston: Author. Retrieved from <http://www.jff.org/publications/education/making-grade-texas-early-college-high-sc/1203>
- Jobs for the Future. (2012). *Reinventing high schools for postsecondary success*. Retrieved from http://www.jff.org/sites/default/files/u3/ECDS_Brochure_110712_electronic.pdf
- Jobs for the Future. (2013). *Early college high schools get results*. Boston, MA: Author. Retrieved from http://www.jff.org/sites/default/files/u3/ECHS_get_results_022513.pdf
- Karp, M. M., Calcagno, J. C., Hughes, K. L., Jeong, D. W., & Bailey, T. R. (2007). *The postsecondary achievement of participants in dual enrollment: An analysis of student outcomes in two states*. St. Paul, MN: National Research Center for Career and Technical Education, University of Minnesota.

- Kemple, J. J. (2004). *Career academies: Impacts on labor market outcomes and educational attainment*. New York: MDRC. Retrieved from <http://www.mdrc.org/publications/366/full.pdf>
- Kemple, J. J. (2008). *Career academies: Long-term impacts on labor market outcomes, educational attainment, and transitions to adulthood*. New York: MDRC.
- Kemple, J., & Snipes, J. C. (2000). *Career academies: Impacts on students' engagement and performance in high school*. New York: MDRC.
- Kim, J. E., & Barnett, E. A. (2008). *2006–07 MCNC early college high school students: Participation and performance in college coursework*. New York: National Center for Restructuring Schools, Education, and Teaching, Teachers College, Columbia University.
- Kleiner, B., & Lewis, L. (2005). *Dual enrollment of high school students at postsecondary institutions: 2002–03* (NCES 2005–008). Washington, DC: U.S. Department of Education, National Center for Education Statistics. Retrieved from <http://nces.ed.gov/pubs2005/2005008.pdf>
- Marken, S., Gray, L., & Lewis, L. (2013). *Dual enrollment programs and courses for high school students at postsecondary institutions: 2010–11* (NCES 2013-002). U.S. Department of Education. Washington, DC: National Center for Education Statistics. Retrieved from <http://nces.ed.gov/pubsearch>
- McClure, A. (2013, January 22). *Two-year college chancellor wants to make college courses free for high school students*. Alabama.com. Retrieved from http://blog.al.com/wire/2013/01/two-year_college_chancellor_wa.html
- Nakkula, M. (2011). *Early college graduates: Adapting, thriving, and leading in college*. Boston: Jobs for the Future. Retrieved from <http://www.jff.org/publications/education/early-college-graduates-adapting-thriving/1207>
- National Student Clearinghouse. (2013). Who We Are. Retrieved from <http://www.studentclearinghouse.org/about/>
- NCES. (2011). *America's high school graduates: Results of the 2009 NAEP high school transcript study*. Retrieved from <http://nces.ed.gov/nationsreportcard/pdf/studies/2011462.pdf>

- NCES. (2012a). Actual and projected public school enrollment in grades prekindergarten (preK) through 12, by grade level and region: Selected school years, 1970–71 through 2021–22 [Table A-3-1]. *The condition of education 2012*. Washington, DC: U.S. Department of Education. Retrieved from <http://nces.ed.gov/programs/coe/tables/table-enl-1.asp>
- NCES. (2012b). Graduation rates of first-time postsecondary students who started as full-time degree/certificate-seeking students, by sex, race/ethnicity, time to completion, and level and control of institution where student started: Selected cohort entry years, 1996 through 2007 [Table 345]. *Digest of education statistics 2011*. Washington, DC: U.S. Department of Education. Retrieved from http://nces.ed.gov/programs/digest/d11/tables/dt11_345.asp
- NCES. (2012c). Percentage distribution of first-time postsecondary students starting at 2- and 4-year institutions during the 2003–04 academic year, by highest degree attained, enrollment status, and selected characteristics: Spring 2009 [Table 347]. *Digest of education statistics 2011*. Washington, DC: U.S. Department of Education. Retrieved from http://nces.ed.gov/programs/digest/d11/tables/dt11_347.asp
- NCES. (2012d). Public high school graduation rates [Indicator 32-2012]. *The condition of education 2012* (NCES 2012-032). Retrieved from http://nces.ed.gov/programs/coe/pdf/coe_scr.pdf
- NCES. (2012e). Immediate transition to college [Indicator 34-2012]. *The condition of education 2012* (NCES 2012-034). Retrieved from http://nces.ed.gov/programs/coe/pdf/coe_trc.pdf
- NCES. (2012f). Characteristics of undergraduate institutions [Indicator 36-2012]. *The condition of education 2012* (NCES 2012-034). Retrieved from http://nces.ed.gov/pubs2012/2012045_4.pdf
- NCES. (2012g). Percentage of 25- to 29-year-olds who attained the selected levels of education, by race/ethnicity and sex: Selected years, 1980–2011 [Table A-48-1]. *The condition of education 2012*. Washington, DC: U.S. Department of Education. Retrieved from <http://nces.ed.gov/programs/coe/tables/table-eda-1.asp>
- NCES. (2012h). Enrollment rates of 18- to 24-year-olds in degree-granting institutions, by level of institution and sex and race/ethnicity of student: 1967 through 2010 [Table 213]. *Digest of Education Statistics, 2011*. Washington, DC: U.S. Department of Education. Retrieved from http://nces.ed.gov/programs/digest/d11/tables/dt11_213.asp

- NCES. (2012i). *Integrated postsecondary education data system glossary*. Retrieved from <http://nces.ed.gov/ipeds/glossary/index.asp?searchtype=term&keyword=complet&Search=Search>
- NCES. (2013). Recent high school completers and their enrollment in 2-year and 4-year colleges, by sex: 1960 through 2011 [Table 209]. *Digest of education statistics 2012* [Advanced release of selected 2012 digest tables]. Washington, DC: U.S. Department of Education. Retrieved from http://nces.ed.gov/programs/digest/d12/tables/dt12_209.asp
- National Student Clearinghouse. (2013). *About the Clearinghouse*. Retrieved from <http://www.studentclearinghouse.org/about/aboutus.htm>
- Office of the Press Secretary. (2013). *Remarks by the president in the state of the union address*. Retrieved from <http://www.whitehouse.gov/the-press-office/2013/02/12/remarks-president-state-union-address>
- Palaich, R., Augenblick, J., & Maloney, M. (2007). Return on investment analysis of integrating grades 9–14. In N. Hoffman, J. Vargas, A. Venezia, M. Miller. (Eds.), *Minding the Gap: Why Integrating High School with College Makes Sense and How to Do it*. (pp. 183–190). Cambridge, MA: Harvard Education Press.
- Raghunathan T. E., Lepkowski J. M., VanHoewyk J., Solenberger P. (2001). A multivariate technique for multiply imputing missing values using a sequence of regression models. *Survey Methodology*, 27, 85–95.
- Rodriguez, O., Hughes, K. L., & Belfield, C. (2012). *Bridging college and careers: Using dual enrollment to enhance career and technical education pathways* (NCPR Working Paper). New York, NY: National Center for Postsecondary Research. Retrieved from http://www.postsecondaryresearch.org/i/a/document/NCPRWorkingPaper_RodriguezHughesBelfield_DualEnrollment.pdf
- SERVE Center. (2010). *A better 9th grade: Early results from an experimental study of the early college high school model*. Browns Summit, NC: Author.
- Speroni, C. (2011). *Determinants of students' success: The role of advanced placement and dual enrollment programs* (NCPR Working Paper). New York, NY: National Center for Postsecondary Research. Retrieved from http://www.postsecondaryresearch.org/i/a/document/19811_Speroni_AP_DE_paper_110311_FINAL.pdf
- SRI. (2011). *Evaluation of the Texas High School Project: Third comprehensive annual report*. Menlo Park, CA: Author.

- Struhl, B., & Vargas, J. (2012). *Taking college courses in high school: A strategy for college readiness*. Boston, MA: Jobs for the Future. Retrieved from http://www.jff.org/sites/default/files/TakingCollegeCourses_101712.pdf
- Swanson, J. (2008). *An analysis of the impact of high school dual enrollment course participation on post-secondary academic success, persistence and degree completion*. Unpublished manuscript. University of Iowa. Retrieved from <http://nacep.org/wp-content/uploads/2010/02/Dissertation-2008-Joni-L.-Swanson.pdf>
- Thomas, N., Marken, S., Gray, L., & Lewis, L. (2013). *Dual credit and exam-based courses in U.S. public high schools: 2010–11* (NCES 2013-001). U.S. Department of Education. Washington, DC: National Center for Education Statistics. Retrieved from <http://nces.ed.gov/pubsearch>.
- Tierney, W. G., Bailey, T., Constantine, J., Finkelstein, N., & Hurd, N. F. (2009). *Helping students navigate the path to college: What high schools can do: A practice guide* (NCEE #2009-4066). Washington, DC: National Center for Education Evaluation and Regional Assistance, Institute of Education Sciences, U.S. Department of Education. Retrieved from <http://ies.ed.gov/ncee/wwc/publications/practiceguides/>
- Vargas, J. (2013). *The economic payoff for closing college-readiness and completion gaps*. Boston, MA: Jobs for the Future. Retrieved from <http://www.jff.org/publications/education/economic-payoff-closing-college-readines/1511>
- What Works Clearinghouse. (2011). *WWC procedures and version 2.1 standards handbook*. Washington, DC: Author.
- Webb, M., & Mayka, L. (2011). *Unconventional wisdom: A profile of the graduates of early college high schools*. Boston: Jobs for the Future. Retrieved from http://www.jff.org/sites/default/files/Unconventional_Wisdom_PDF_033011.pdf

Appendix A: Measures

Exhibit A.1 lists all variables that were used in this report, including their descriptions and their data sources: an administrative source (educational record data from schools, districts, states, and the National Student Clearinghouse [NSC]) or the student survey. The exhibit is organized by type of measure: student background characteristics, high school outcomes, college outcomes, and high school experiences.

Exhibit A.1. Student Background Characteristic Measures, Descriptions, and Data Sources

Measure	Description	Data Source
Female	Dichotomous indicator of student gender	Administrative & Survey
Minority	Dichotomous indicator of whether the student is African American, Hispanic, Asian, Pacific Islander, Native American, multi-racial, or other minority group	Administrative & Survey
First-generation college-going	Dichotomous indicator of whether either of the student's parents attended college	Survey
Low income	Dichotomous indicator of whether student was eligible for the free or reduced-price lunch program, typically in eighth grade	Administrative
English language learner (ELL)	Dichotomous indicator of whether the student was identified as an English language learner, typically in eighth grade	Administrative
Individualized Education Plan (IEP)	Dichotomous indicator of whether student had an Individualized Education Plan, typically in eighth grade	Administrative
Prior achievement in ELA	Standardized test score (z score) in English language arts (ELA) prior to entering high school, typically from eighth grade; standardized using the state mean and standard deviation for each year and grade level	Administrative
Prior achievement in mathematics	Standardized test score (z score) in mathematics prior to entering high school, typically from eighth grade; standardized using the state mean and standard deviation for each year and grade level	Administrative

Exhibit A.2. High School Outcome Measures, Descriptions, and Data Sources

Measure	Description	Data Source
High School Achievement		
Achievement in ELA	Standardized test score (z score) in high school English language arts (ELA), typically from 10th grade; standardized using the state mean and standard deviation for each year and grade level	Administrative
Achievement in mathematics	Standardized test score (z score) in high school mathematics, typically from 10th grade; standardized using the state mean and standard deviation for each year and grade level	Administrative
High school GPA	A 0–4 variable indicating students' high school grade point average	Survey
Persistence		
Withdrawal from high school	Dichotomous indicator of whether student withdrew from initial high school in which enrolled; withdrawals include transfers, dropouts, students expelled or incarcerated, and other withdrawal reasons	Administrative
Drop out	Dichotomous indicator of whether student dropped out of high school	Administrative
Local transfer	Dichotomous indicator of whether student withdrew from initial high school to transfer to another local option, including to attend other local public or private schools or for home schooling	Administrative
Graduation		
High school graduation ^a	Dichotomous indicator of whether student ever completed high school with a diploma or General Educational Development (GED) certificate	Administrative

^a Fewer than five students in the study sample received GED certificates.

Exhibit A.3. College Outcome Measures, Descriptions, and Data Sources

Measure	Description	Data Source
College Enrollment		
Ever enrolled in college	Dichotomous indicator of whether a student had ever enrolled in college For Cohort 1, data cover from May 2005 through October 2012 (Year 1 through Year 7). For Cohort 2, data cover from May 2006 through October 2012 (Year 1 through Year 6). For Cohort 3, data cover from May 2007 through October 2012 (Year 1 through Year 5).	NSC
Enrolled in college by Year 4 ^a	Dichotomous indicator of whether a student enrolled in college by July of Year 4 after starting ninth grade	NSC
Enrolled in college by Year 5 ^a	Dichotomous indicator of whether a student enrolled in college by July of Year 5 after starting ninth grade	NSC
Enrolled by Year 4 for 2005–06 and 2006–07 Cohorts	Dichotomous indicator of whether a student enrolled in college by July of Year 4 after starting ninth grade for 2005–06 and 2006–07 Cohorts	NSC
Enrolled by Year 5 for 2005–06 and 2006–07 Cohorts	Dichotomous indicators of whether a student enrolled in college by July of Year 5 after starting ninth grade for 2005–06 and 2006–07 Cohorts	NSC
Enrolled by Year 6 for 2005–06 and 2006–07 Cohorts	Dichotomous indicators of whether a student enrolled in college by July of Year 6 after starting ninth grade for 2005–06 and 2006–07 Cohorts	NSC
Ever enrolled in a 2-year college	Dichotomous indicator of whether a student ever enrolled in a 2-year college	NSC
Enrolled in a 2-year college by Year 4	Dichotomous indicator of whether a student enrolled in a 2-year college by July of Year 4 after starting ninth grade	NSC
Enrolled in a 2-year college by Year 5	Dichotomous indicator of whether a student enrolled in a 2-year college by July of Year 5 after starting ninth grade	NSC
Ever enrolled in a 4-year college	Dichotomous indicator of whether a student ever enrolled in a 4-year college	NSC
Enrolled in a 4-year college by Year 4	Dichotomous indicator of whether a student enrolled in a 4-year college by July of Year 4 after starting ninth grade	NSC
Enrolled in a 4-year college by Year 5	Dichotomous indicator of whether a student enrolled in a 4-year college by July of Year 5 after starting ninth grade	NSC
Enrolled in partner institutions	Dichotomous indicator of whether a student ever enrolled in the partner institution after high school graduation date	Administrative & NSC
Enrolled in college between Year 5 and Year 7 at any college	Dichotomous indicator of whether a student enrolled between July of Year 5 and October of Year 7 after starting ninth grade at any college	NSC
Enrolled at any college after high school graduation date	Dichotomous indicator of whether a student enrolled at any college after date of high school graduation	Administrative & NSC

Exhibit A.3. College Outcome Measures, Descriptions, and Data Sources (cont.)

Measure	Description	Data Source
College Enrollment		
Enrolled in college between Year 5 and Year 7 at a 2-year college	Dichotomous indicator of whether a student enrolled between July of Year 5 and October of Year 7 after starting ninth grade at a 2-year college	NSC
Enrolled in college between Year 5 and Year 7 at a 4-year college	Dichotomous indicator of whether a student enrolled between August of Year 5 and October of Year 7 after starting ninth grade at a 4-year college	NSC
College Degree Attainment		
Any postsecondary degree ^b	Dichotomous indicator of whether a student ever received any type of postsecondary credential including a certificate, associate degree, or bachelor degree For Cohort 1, data cover from May 2005 through October 2012 (Year 1 through Year 7). For Cohort 2, data cover from May 2006 through October 2012 (Year 1 through Year 6). For Cohort 3, data cover from May 2007 through October 2012 (Year 1 through Year 5).	NSC
Ever earned a certificate	Dichotomous indicator of whether a student ever received a postsecondary certificate	NSC
Ever earned A.A. degree	Dichotomous indicator of whether a student ever received an associate's degree	NSC
Ever earned B.A. degree	Dichotomous indicator of whether a student ever received a bachelor's degree	NSC
Postsecondary degree earned by Year 4	Dichotomous indicator of whether a student received any type of postsecondary credential by the end of August of Year 4 after starting ninth grade	NSC
Postsecondary degree earned by Year 5	Dichotomous indicator of whether a student received any type of postsecondary credential by the end of August of Year 5 after starting ninth grade	NSC
Postsecondary degree earned by Year 4 for 2005–06 and 2006–07 cohorts	Dichotomous indicator of whether a student in the 2005–06 or 2006–07 cohort received any type of postsecondary credential by the end of August of Year 4 after starting ninth grade	NSC
Postsecondary degree earned by Year 5 for 2005–06 and 2006–07 cohorts	Dichotomous indicator of whether a student in the 2005–06 or 2006–07 cohort received any type of postsecondary credential by the end of August of Year 5 after starting ninth grade	NSC
Postsecondary degree earned by Year 6 for 2005–06 and 2006–07 cohorts	Dichotomous indicator of whether a student in the 2005–06 or 2006–07 cohort received any type of postsecondary credential by the end of August of Year 6 after starting ninth grade	NSC

Exhibit A.3. College Outcome Measures, Descriptions, and Data Sources (cont.)

Measure	Description	Data Source
College Degree Attainment (cont.)		
Earned any type of postsecondary degree between Year 5 and Year 7	Dichotomous indicator of whether a student received any type of postsecondary credential between July of Year 5 and October of Year 7 after starting ninth grade	NSC
Earned any type of postsecondary degree after high school graduation date	Dichotomous indicator of whether a student received any type of postsecondary credential after date of graduation from high school	Administrative & NSC
Earned A.A. degree between Year 5 and Year 7	Dichotomous indicator of whether a student received an associate's degree between July of Year 5 and October of Year 7 after starting ninth grade	NSC
Earned a B.A. degree between Year 5 and Year 7	Dichotomous indicator of whether a student received a bachelor's degree between July of Year 5 and October of Year 7 after starting ninth grade	NSC
College Performance		
Developmental coursework ^c	Dichotomous indicator of whether a student enrolled in any developmental courses in college after high school	Survey
College GPA ^d	A 0–4 variable indicating students' college grade point average after high school	Survey
Perceptions of academic difficulty in college ^d	A 1–4 scale measuring students' level of difficulty keeping up with schoolwork, reading college materials, and writing papers (1 = very easy and 4 = very difficult); reliability (α) = 0.66 (scale included three items)	Survey
Persistence in college	Dichotomous indicator of whether a student was enrolled in college on October 1 in Year 5 and Year 6 after starting ninth grade	NSC

^a Year 4 corresponds to academic year 2008–09 for Cohort 1, 2009–10 for Cohort 2, and 2010–11 for Cohort 3. Year 5 corresponds to academic year 2009–10 for Cohort 1, 2010–11 for Cohort 2, and 2011–12 for Cohort 3. See Exhibit 1.1 for a full correspondence between cohort years and academic years.

^b In this study sample, 13 Early College students and 9 comparison students earned certificates.

^c This item was administered only to students who, at the time of survey administration, reported ever enrolling in college after high school.

^d These items were administered only to students who, at the time of survey administration, reported completing at least one term of college after high school.

Exhibit A.4. High School Experience Measures, Descriptions, and Data Sources

Measure	Description	Data Source
College Exposure		
Enrolled in college in 9th grade	Dichotomous indicator of whether a student enrolled in college between August and July of Year 1 after starting ninth grade	NSC
Enrolled in college in 10th grade	Dichotomous indicator of whether a student enrolled in college between August and July of Year 2 after starting ninth grade	NSC
Enrolled in college in 11th grade	Dichotomous indicator of whether a student enrolled in college between August and July of Year 3 after starting ninth grade	NSC
Enrolled in college in 12th grade	Dichotomous indicator of whether a student enrolled in college between August and July of Year 4 after starting ninth grade	NSC
Ever enrolled in college in high school	Dichotomous indicator of whether a student enrolled in college by August of Year 4 after starting ninth grade (same as variable, ever enrolled in college by Year 4)	NSC
Earned any college credit in high school	Dichotomous indicator of whether a student attained any college credit in high school	Survey
Earned 1 year of college credit in high school	Dichotomous indicator of whether a student obtained at least one year of college credit in high school	Survey
Took at least 1 AP course	Dichotomous indicator of whether a student took at least one AP course in high school	Survey
Passed at least 1 AP exam	Dichotomous indicator of whether a student passed at least one AP exam	Survey
Rigorous Academics		
College preparatory math sequence	Dichotomous indicator of whether a student completed algebra I, algebra II, and geometry in high school	Survey
Advanced math course	Dichotomous indicator of whether a student completed pre-calculus or calculus in high school	Survey
College preparatory science sequence	Dichotomous indicator of whether a student completed biology, chemistry, and physics in high school	Survey
Instructional rigor	A 0–4 scale measuring the frequency with which students reported defending their ideas, writing five-page papers, explaining thinking, applying what they had learned, engaging in discussions, doing research, presenting work, and receiving feedback in 9th through 12th grade (0 = never and 4 = almost every day); reliability (α) = 0.82 (scale included eight items)	Survey
College-going culture	A 1–4 scale measuring the extent to which the principal, teachers, and students expected students in the high school to go to college (1 = strongly disagree and 4 = strongly agree); reliability (α) = 0.80 (scale included three items)	Survey

Exhibit A.4. High School Experience Measures, Descriptions, and Data Sources (cont.)

Measure	Description	Data Source
Supports		
General college information in school	Dichotomous variable indicating whether a student reported at least one very helpful resource for obtaining general information about college in school	Survey
General college information outside of school	Dichotomous variable indicating whether a student reported at least one very helpful resource for obtaining general information about college outside of school	Survey
Instructor support	A 1–4 scale measuring the extent to which teachers cared if students came to school, praised students for their effort, helped students, listened to students, encouraged students, and cared about students (1 = strongly disagree and 4 = strongly agree); reliability (α) = 0.88 (scale included five items)	Survey
Took the ACT/SAT	A dichotomous variable indicating whether a student took the ACT and/or SAT in high school	Survey
ACT/SAT score	A continuous variable, ranging from 1 to 36, representing students' highest ACT or SAT score, with SAT scores converted into ACT units	Survey
Applied for college	A dichotomous variable indicating whether a student applied for college	Survey
Applied for financial aid	A dichotomous variable indicating whether a student applied for financial aid	Survey
ACT/SAT preparation help in school ^a	Dichotomous variable indicating whether a student reported at least one very helpful resource for preparing for the ACT or SAT in school	Survey
College application help in school ^a	Dichotomous variable indicating whether a student reported at least one very helpful resource for completing college applications in school	Survey
Financial aid application help in school ^a	Dichotomous variable indicating whether a student reported at least one very helpful resource for completing financial aid forms in school	Survey
ACT/SAT preparation help outside of school ^a	Dichotomous variable indicating whether a student reported at least one very helpful resource for preparing for the ACT or SAT outside of school	Survey
College application help outside of school ^a	Dichotomous variable indicating whether a student reported at least one very helpful resource for completing college applications outside of school	Survey
Financial aid application help outside of school ^a	Dichotomous variable indicating whether a student reported at least one very helpful resource for completing financial aid forms outside of school	Survey

^a These items were administered only to students who reported taking the ACT or SAT, filling out college applications, and applying for financial aid.

Appendix B: Samples and Data Sources

The study includes two overlapping samples: the administrative data sample and the survey sample. The administrative data sample includes all students who participated in a lottery to attend 10 Early Colleges between 2005–06 and 2007–08. The survey sample was drawn from the administrative data sample. This appendix describes the administrative data sample, including the sample size, no-show and crossover rates, and data collection processes. It also provides details on the survey sample, including survey weights, response rates, data collection processes, and baseline testing.

Administrative Data

Sample Size

The administrative data sample included 1,044 Early College and 1,414 comparison students (2,458 students in total). Thirteen students applied to two lotteries, either in successive cohort years or at different sites. These students were treated as if they were separate (independent) students in determining sample size and in analyses. Two Early Colleges had a five-year program, and these sites were included in the study for only the 2005–06 or 2006–07 cohorts to allow sufficient time for high school graduation.

Exhibit B.1 shows the sample size for each site and cohort. There were separate lotteries for each site and cohort. Three Early Colleges had sublotteries in which lotteries were conducted by feeder district, feeder school, or criteria established by the Early College. See Appendix D for a description of how sublotteries were treated in analysis. In total, there were 17 main lotteries in the administrative data sample. The smallest lottery had 39 students and the largest lottery had 326 students.

Exhibit B.1. Administrative Data Sample Sizes, by Study Site and Cohort

Study Sites	Study Cohorts					
	2005–06		2006–07		2007–08	
	T	C	T	C	T	C
Site A			27	43		
Site B			85	103	87	54
Site C	30	282	71	231	69	257
Site D			106	13	85	38
Site E	62	24			21	18
Site F			51	39	57	64
Site G					124	74
Site H			52	91		
Site I	41	37	39	31		
Site J					37	15
Total	133	343	431	551	480	520

NOTES: Shaded cells are years that the school (a) was not open, (b) did not have a lottery, (c) did not have lottery records, or (d) did not have a graduating student cohort during the study period because it offered a five-year program.

No-Show and Crossover Rates

Exhibit B.2 displays no-show and crossover rates for each lottery in the study. “No-shows” are students chosen by lottery to attend an Early College (treatment students) who did not enroll in an Early College in the first year of high school. “Crossovers” are students who were not selected to attend an Early College (comparison students) who nevertheless enrolled in an Early College during the first year of high school. The no-show rate for individual lotteries ranged from 0 percent to 58.1 percent, with an overall no-show rate of 22.0 percent.⁵⁴ The overall crossover rate was 1.9 percent. Many lotteries did not have any comparison students attending an Early College; however, one lottery had a crossover rate of 28.4 percent.⁵⁵ For all key outcome variables, we performed sensitivity analyses excluding the site with a high no-show rate (Site C) and the site with a high crossover rate (Site B) (see Appendix F).

⁵⁴ The site with a no-show rate of 58.1 percent, Site C, is located in a district that had independent lotteries for all schools in the district. Because students might have entered and won multiple lotteries, many students failed to attend after winning the lottery, resulting in a high no-show rate.

⁵⁵ The site with a crossover rate of 28.4 percent, Site B, is located near another Early College affiliated with the ECHSI but not part of this study. Students in our study who attended this other Early College were coded as receiving the treatment.

Exhibit B.2. No-Show and Crossover Rates, by Study Site and Cohort

Study Sites	Study Cohorts					
	2005–06		2006–07		2007–08	
	No-shows	Crossovers	No-shows	Crossovers	No-shows	Crossovers
Site A			7.4%	0.0%		
Site B			6.0%	28.4%	6.9%	2.3%
Site C	45.5%	0.0%	58.1%	0.0%	57.4%	0.0%
Site D			36.2%	8.3%	11.9%	0.0%
Site E	19.7%	0.0%			9.5%	0.0%
Site F			0.0%	0.0%	0.0%	0.0%
Site G					30.8%	0.0%
Site H			3.8%	1.1%		
Site I	16.2%	0.0%	39.4%	0.0%		
Site J					10.8%	0.0%

NOTES: Rates are based on enrollment data for students' first year in high school. $n = 2,223$.

Data Collection From Schools, Districts, and State Departments of Education

We collected administrative data covering 2004–05 to 2010–11 from multiple sources, including Early Colleges, districts, and state departments of education. For each site, we determined the source that could most efficiently provide each type of data. For most sites, we collected data directly from the school, district, or state; for four sites, however, we worked with a subcontractor who collected the data. When possible, we requested the same data from an additional source for corroboration. Data on treatment group status and lottery documentation were usually provided by the Early Colleges, and data on student background characteristics and outcomes generally came from districts and states.

We worked closely with every data source provider to understand their data file format and variable definitions through phone calls and written documentation, and we obtained the sites' final verification of our interpretation of their data. In particular, we worked closely with sites to understand the lottery record data. Of the 10 study sites, 8 provided clear lottery documentation, and the lottery data were consistent with the documentation. At two sites, Early College staff were not able to provide clear documentation of their lottery processes. At one of these sites, school staff partially documented and partially described from memory

the decision rules for running the lottery, although the staff members felt confident about their recollections. At the second site, school staff had limited recollections of the lottery process.

We have taken two approaches to mitigate any potential bias introduced by the two sites that lacked clear descriptions of their lotteries. First, we conducted sensitivity analyses on key outcomes with and without each of these sites (see Appendix F for results). Second, we examined baseline equivalence and controlled for student baseline characteristics (including prior achievement) in all impact analyses. We used two different types of models. In the first model, we tested whether treatment group status was predicted by the set of student background characteristics (female, minority, low income, first generation, and prior test scores), and we found a significant group difference. The model findings for the administrative sample are presented in Exhibit B.3. In the second type of model, we tested individual characteristics to examine whether each was predicted by treatment group status. As noted in Chapter 2 (see Exhibit 2.6), we found a significant difference between the groups on ELA prior achievement.

Exhibit B.3. Likelihood-Ratio Test to Predict Treatment Assignment Using the Administrative Sample

Model	-2 Log Likelihood	Chi-Square	P-Value
Empty model	2,843.2	---	---
Full model	2,822.3	20.9	.0019

n = 2,458 students (1,044 Early College, 1,414 comparison)

NOTES: The empty model includes only subplottery indicators as covariates. The full model includes subplotteries and baseline characteristics (female, minority, first generation, low income, prior ELA, and prior mathematics).

Data Collection From the National Student Clearinghouse

Postsecondary enrollment and degree completion data came from the National Student Clearinghouse (NSC). The NSC collects information from more than 3,300 U.S. public and private colleges that together enroll more than 96 percent of college students in the nation (NSC, 2013). To obtain college enrollment and completion information for students in the study, the study team submitted the following information to the NSC: first and last names (for all students), birthdates (for 98 percent of students), and middle initials (for 33 percent of students). For each student matched to the database, the NSC provided a record of each enrollment in a participating postsecondary institution through the fall term of 2012 and completion information for certificates, associate's degrees, and bachelor's degrees earned through the summer of 2012. Each NSC record includes the following:

- The name, state, and type of postsecondary institution (i.e., 2- versus 4-year, public versus private) in which the student enrolled

- The beginning and ending dates of the student's enrollment
- Whether the student earned a credential, and, if so, the type of credential earned (e.g., certificate, associate of arts, bachelor of arts)

Of the 2,458 students for whom we requested records, the NSC matched 1,691 (69 percent) to at least one postsecondary enrollment record. Although the NSC captures the vast majority of college enrollments during and after high school, enrollment records could be missing if a student attended a non-participating institution, if a student refused to allow his or her records to be reported, or if the study did not provide sufficient detail (or incorrect information) for a specific match (e.g., if we were unable to provide a birthdate and middle initial). Because the NSC data do not allow researchers to distinguish a student who did not attend college (or complete a credential) from a student with a record missing for the reasons just listed, our findings underestimate college enrollment and completion.

Survey Data

Sample Size

The survey was drawn from the administrative data sample, and includes randomly selected students who participated in the 12 2006–07 and 2007–08 lotteries in eight Early Colleges that agreed to provide us with student contact information. The size of the survey sample was determined by a power analysis conducted during the design phase of this study. At the time we conducted the power analysis, we estimated that 15 lotteries would be included in the survey. Based on the power analysis, and assuming 15 lotteries, we concluded that a total survey sample of 1,500 students with 50 Early College students and 50 comparison students per lottery would be sufficient for detecting an effect as small as 7 percentage points for both high school graduation and college enrollment (effect sizes = 0.18 and 0.17, respectively, assuming that 60 percent of comparison students would graduate from high school and 42 percent of comparison students would enroll in college).

Because we had 12 rather than 15 lotteries in the final survey sample, and there were several instances where a site had fewer than 50 students in one or both study conditions for a given lottery, we included up to 100 Early College students and 100 comparison students in each lottery to reach the target sample size. For lotteries with more than 100 students in a condition, we randomly sampled 100 students in that condition.

Overall, 1,416 students were sampled for the survey, representing 58 percent of the total administrative sample, 2 of the 3 cohorts, 8 of the 10 sites, and 12 of the 17 lotteries. A few students participated in two different lotteries; they were sampled in each lottery as though they were independent students. Adjustments were made after initial sampling because

some of the students sampled were deemed ineligible for the survey (e.g., deceased, under age 18, or not a lottery participant). Students under age 18 at the time of the survey were not eligible for the survey because they could not provide their own consent to participate. See Exhibit B.4 for the final sample size for each site and lottery after the adjustment. We conducted sensitivity testing to compare key outcomes based on administrative data using the full administrative data sample and the survey sample, and the comparison showed little difference (see Appendix F).

Exhibit B.4. Final Survey Sample Sizes, by Study Site and Cohort

Study Sites	Study Cohorts			
	2006–07		2007–08	
	T	C	T	C
Site A	27	43		
Site B	75	93	86	54
Site C	71	99	69	98
Site D	91	10	82	27
Site E			21	18
Site F	51	37	57	66
Site G			100	73
Site H				
Site I	40	28		
Site J				
Total	355	310	415	336

We conducted baseline equivalence testing on the survey sample using the same methods as for the administrative sample, presented above and in Chapter 2. We used two different types of models. In the first model, we tested whether treatment group status was predicted by the set of student background characteristics: female, minority, low income, first generation, and prior test scores, and we found a significant group difference. The findings for the survey sample are presented in Exhibit B.5. In the second type of model, we tested individual characteristics to examine whether each was predicted by treatment group status. We found no significant difference between the groups for any characteristic. See Exhibit B.6 for results of the set of models tested for group equivalence.

Exhibit B.5. Likelihood-Ratio Test to Predict Treatment Assignment Using the Survey Sample

Model	-2 Log Likelihood	Chi-Square	P-Value
Empty model	2,102.9	---	---
Full model	2,090.0	12.9	.0448

n = 1,294 students (724 Early College, 570 comparison)

NOTES: The empty model includes only subplottery indicators as covariates. The full model includes subplotteries and baseline characteristics (female, minority, first generation, low income, prior ELA, and prior mathematics).

Exhibit B.6. Average Background Characteristics of Early College and Comparison Students and Testing for Group Difference on Each Characteristic Using the Survey Sample

Characteristics	Early College	Comparison	Difference
Female	51.2%	52.0%	-0.8%
Minority	55.7%	60.2%	-4.5%
First generation	22.2%	20.4%	1.8%
Low income	47.2%	43.8%	3.4%
Prior achievement in ELA	.28	.21	.07
Prior achievement in math	.28	.29	-.01

n = 1,294 students (724 Early College, 570 comparison)

NOTES: All data are from the survey data source except for low income and prior test scores, which comes from administrative data. Early College group means are unadjusted means, and comparison group means were computed by subtracting the estimated group difference from the unadjusted Early College group means. Prior achievement scores were converted to z-scores and were standardized using publicly available statewide assessment means and standard deviations. The values in the Difference columns may not match the difference between the Early College and Comparison group means due to rounding. The p-values for group differences are based on logistic regression for binary student demographic characteristics and OLS regression for prior mathematics and ELA scores.

* *p* < .05; ** *p* < .01; *** *p* < .001

Pilot Testing and Administration

We conducted three rounds of pilot testing prior to the launch of the survey. First, we conducted a tracking pilot to determine the feasibility of locating students for the survey based on contact information from their Early College applications, which were four to five years old at the time of the pilot. AIR subcontracted Survey Research Management (SRM), an organization that specializes in student tracking and survey administration. We conducted the tracking pilot with 160 students in fall 2010, and SRM located 76 percent of the pilot students. We thus concluded that conducting a student survey based on retrospective contact information was feasible. Second, we piloted the survey instrument by conducting cognitive interviews in spring 2011 with 16 students. Third, SRM conducted a timed pilot test in summer 2011 with 15 students to test the survey length in both online and computer-assisted telephone interview (CATI) formats. After the cognitive interviews and timed pilot, we revised

the survey to accurately capture information from the students in the study and ensure that the survey would take, on average, approximately 30 minutes to complete.

The survey administration took place from October 2011 to January 2012. The subcontractor contacted students primarily using the phone number(s) and address(es) provided on their Early College application, regularly calling non-respondents and sending mailings throughout the administration timeframe to inform them about the survey and solicit their participation. Participants could choose whether to take the survey online or via CATI. We provided participating students with an Amazon.com or Target gift card as an incentive. Overall, 1,294 students responded to the survey. The response rate was 91.4 percent (94.0 percent for Early College students, 88.2 percent for comparison students). The cohort-specific response rates are presented in Exhibit 2.4 and the participation rates by survey mode are presented in Exhibit B.7.

Exhibit B.7. Percentage of Survey Respondents, by Mode of Administration

Survey Mode	Percentage of Survey Respondents		
	Overall	Early College	Comparison
CATI	49.2%	47.8%	50.9%
Online	50.9%	52.2%	49.1%

Based on the survey sampling rates and response rates, we computed non-response-adjusted survey weights as the inverse of the product of sampling rate and response rate within each study condition within each lottery. The survey weights were applied to all analyses of survey data so that the results can be generalized to all participants in the lotteries included in the survey sample.

Open-Ended Data

The analytic measures constructed from survey items are described in Appendix A. In addition, we included an item at the end of the survey in which students were asked, “Would you like to tell us anything else about your high school or college experiences?” We received responses from 586 students of the 1,294 survey respondents, including 50.6 percent of treatment respondents and 38.6 percent of comparison respondents.

We coded all open-ended responses in a two-stage process, first specifying themes of interest based on our conceptual framework (e.g., high school supports) and then using open coding to identify additional themes based on student responses (e.g., preparation for college). Respondent quotes are used throughout the report to provide context for the impact findings.

Appendix C: Missing Data

Exhibits C.1 and C.2 below show the missing data rates for analysis variables prior to imputation.⁵⁶ Three variables have overall missing rates above 25 percent. The first-generation college-going variable originated from survey data but is used in all analyses. This variable was missing for all students who did not take the survey, which is the primary reason that 49.0 percent of students were missing this information. The high school mathematics assessment variable was missing for 33.8 percent of students primarily because four sites were located in states with assessments that were not comparable to other assessments in the study, and we did not use these scores. “Enrolled in a partner institution” was missing for 27.1 percent of students because graduation date was not available for all students, which was required to create this variable.

Exhibit C.1. Pre-imputation Variable Missing Rates for the Administrative Data Sample, Overall and by Study Group

Variable	Percentage Missing		
	Overall (n = 2,458)	Early College (n = 1,044)	Comparison (n = 1,414)
Female	0.1%	0.1%	0.1%
Minority	0.4%	0.6%	0.2%
First-generation college-going ^a	49.0%	33.3%	60.6%
Low income	8.1%	10.9%	6.1%
ELL	10.9%	15.4%	7.6%
IEP	24.1%	29.9%	19.9%
Prior achievement in ELA	16.0%	14.5%	17.1%
Prior achievement in mathematics	18.1%	18.4%	18.0%
High school achievement in ELA	12.9%	8.3%	16.3%
High school achievement in mathematics	33.8%	35.6%	32.4%
Withdrawal from high school	8.7%	5.5%	11.0%
Drop out	8.7%	5.5%	11.0%
Local transfer	8.7%	5.5%	11.0%
High school graduation	10.2%	6.5%	12.9%

⁵⁶ As described in Appendix B, it is not possible to determine the rate of missing data on measures from the NSC. Students in our sample who lack NSC data are either students who did not attend college, students who attended a college not in the NSC, students who refused permission for the NSC to provide their data, or students for whom our name and other information was not consistent with their name in the NSC.

Exhibit C.1. Pre-imputation Variable Missing Rates for the Administrative Data Sample, Overall and by Study Group (cont.)

Variable	Percentage Missing		
	Overall (n = 2,458)	Early College (n = 1,044)	Comparison (n = 1,414)
Enrolled in a partner institution ^b	27.1%	17.6%	34.9%
Enrolled at any college after high school graduation date	10.2%	6.5%	12.9%
Earned any type of postsecondary degree after high school graduation date	10.2%	6.5%	12.9%

^a Survey data served as the source for this variable because it was not consistently available in administrative data.

^b This variable uses the date associated with high school graduation to determine if enrollment in a partner institution is after high school; therefore, this variable is missing when we do not have a graduation date for a student.

Exhibit C.2. Pre-imputation Variable Missing Rates for the Survey Data Sample, Overall and by Treatment Status

Variable	Percentage Missing		
	Overall (n = 1,294)	Early College (n = 724)	Comparison (n = 570)
Female	0.5%	0.6%	0.4%
Minority	1.3%	1.2%	1.4%
First generation college-going	2.7%	2.9%	2.5%
Low income ^a	11.1%	11.3%	10.9%
Prior achievement in ELA ^a	16.9%	17.4%	16.1%
Prior achievement in mathematics ^a	20.1%	21.8%	17.9%
High school GPA	1.6%	1.9%	1.2%
Developmental course-taking ^b	0.0%	0.0%	0.0%
College GPA ^b	2.0%	1.6%	2.5%
Perceptions of academic difficulty in college ^b	0.2%	0.0%	0.5%
Earned any college credit in high school	2.2%	2.4%	2.1%
Earned one year of college credit in high school	2.2%	2.4%	2.1%
Took at least one AP course	6.1%	9.4%	1.9%
Passed at least one AP exam	6.1%	9.4%	1.9%
College preparatory math sequence	0.0%	0.0%	0.0%

Exhibit C.2. Pre-imputation Variable Missing Rates for the Survey Data Sample, Overall and by Treatment Status (cont.)

Variable	Percentage Missing		
	Overall (<i>n</i> = 1,294)	Early College (<i>n</i> = 724)	Comparison (<i>n</i> = 570)
Advanced mathematics course	0.0%	0.0%	0.0%
College preparatory science sequence	0.0%	0.0%	0.0%
High school instructional rigor	0.2%	0.3%	0.0%
High school college-going culture	0.1%	0.1%	0.0%
General college information in school	0.0%	0.0%	0.0%
General college information outside of school	0.0%	0.0%	0.0%
High school instructor support	0.1%	0.1%	0.0%
Took the ACT/SAT	0.1%	0.1%	0.0%
ACT/SAT score ^b	0.0%	0.0%	0.0%
Applied for college	0.2%	0.1%	0.2%
Applied for financial aid	0.2%	0.1%	0.2%
ACT/SAT preparation help in school ^b	0.0%	0.0%	0.0%
College application help in school ^b	0.0%	0.0%	0.0%
Financial aid application help in school ^b	0.0%	0.0%	0.0%
ACT/SAT preparation help outside of school ^b	0.0%	0.0%	0.0%
College application help outside of school ^b	0.0%	0.0%	0.0%
Financial aid application help outside of school ^b	0.0%	0.0%	0.0%

^a Administrative data served as the source for this variable because it was unavailable in survey data.

^b The missing rates for these variables are based on the number of eligible students for the item. For example, ACT/SAT items were only asked of those who reported taking the ACT or SAT (*n* = 1,053), questions about help with college applications were only asked of those who reported doing each activity (*n* = 1,067 applied to college, *n* = 890 applied for financial aid), questions about remedial coursework were asked of those who reported enrolling in college after high school (*n* = 1,002) and college academic difficulty and college GPA were asked of those who had completed at least one term of college after high school (*n* = 455).

We handled missing data in impact analyses through multiple imputation using the SAS IVEware procedure. The IVEware procedure implements multiple imputation by chained equations developed by Raghunathan, Lepkowski, VanHoewyk, and Solenberger (2001). The procedure cycles through the variables in the data set, modeling each variable conditional on the others, starting with the variable with the fewest missing data. The

imputed values are predicted values based on the imputation model, with the appropriate random error added to reflect the uncertainty in the predicted values.

We performed imputation using a master data set that combined data from administrative records, the NSC, and the student survey. The imputation model incorporated all variables used in the impact analyses, including measures of student background characteristics, high school outcomes, college outcomes, and high school experiences, as well as a set of treatment-by-student-characteristic interaction terms that were part of the differential impact analyses. In addition, the imputation model included filter variables to restrict the imputation of missing values for certain variables to students to which the variables applied. For example, missing data on survey measures were only imputed for students in the survey sample.

We generated 10 imputed data sets and conducted all analyses using each of the 10 data sets separately. We then combined estimates across the 10 data sets, taking into account the uncertainty in imputed values both within and across the imputed data sets. Our primary impact analyses were conducted using the fully imputed data sets, including imputed values on outcome measures. As a sensitivity test, we also performed each analysis excluding students with imputed outcome values. The results from the sensitivity analysis are presented in Appendix F.

Appendix D: Technical Details on Impact Analysis

Multilevel Model to Estimate the Overall Early College Impact (Research Question 1)

Our primary impact analyses are intent-to-treat (ITT) analyses that assess the overall Early College impacts on students who were offered admission to an Early College based on a lottery. Given the presence of noncompliance (i.e., no-shows and crossovers), we supplemented the ITT analyses with analyses of the Early College impacts on lottery winners who actually attended an Early College (i.e., compliers). Details about the complier effect analyses and the results are presented in Appendix G.

To estimate the overall ITT effects of Early Colleges across lotteries, we constructed a two-level model that takes into account the clustering of students within lotteries. We modeled the intercept as a random effect to represent the potential variation in average student outcomes across lotteries. We modeled the Early College effect as fixed at the lottery level, because the number of lotteries in the study was too small to generate stable estimates of the variation in Early College effect across lotteries. Compared with a random-effects model with both random intercept and random treatment slope at the lottery level, the fixed-effects model is associated with greater statistical power and does not require the assumption that the lotteries in the study sample were representative of a larger population of lotteries.⁵⁷ One limitation of the fixed-effects model, however, is that it does not allow us to generalize study findings to Early College admission lotteries beyond those in the study sample, or examine the variation in Early College impact across lotteries and factors that may be associated with such variation, if any.

Exhibit D.1 presents the specification of a fixed-effects hierarchical generalized linear model (HGLM) for assessing the Early College effect on a binary outcome (graduation from high school in this example). The impact model for continuous outcomes (e.g., high school achievement scores) was specified similarly based on a hierarchical linear model (HLM).

⁵⁷ Student-level non-response adjusted survey weights were applied to analyses of survey-based outcomes; thus the analysis results are generalizable to all participants in the lotteries in the survey sample.

Exhibit D.1. Hierarchical Generalized Linear Model for Assessing the ITT Effect of Early Colleges on the Probability of Graduating From High School

Level-1 Model (Student Level)

$$\log[\phi_{ij}/(1 - \phi_{ij})] = \beta_{0j} + \beta_{1j} * EC_{ij} + \beta_{2j} * X_{ij} + \sum_{m=2}^m (\beta_{3mj} * SUBLOTmij) + r_{ij}$$

where

- ϕ_{ij} is the probability of graduating from high school for student i in lottery j ;
- EC_{ij} is a dummy indicator for treatment status: $EC_{ij} = 1$ if the student was assigned to an Early College based on lottery and 0 otherwise, centered on lottery mean;
- X_{ij} is a vector of student characteristics, including gender, race, low income, and standardized achievement scores in prior ELA and mathematics, grand-mean centered;
- $SUBLOTmij$ is a set of effect-coded indicators for the m sublotteries within a lottery with multiple sublotteries;⁵⁸
- β_{0j} is the average graduation rate (in logits) among comparison students in lottery j ;
- β_{1j} is difference in graduation rate between Early College students and comparison students in lottery j ;
- β_{2j} is the relationship between student characteristic X and graduation rate in lottery j ;
- β_{3mj} is the difference between the average graduation rate for comparison students in sublottery m and the average graduation rate for comparison students across all sublotteries in the given lottery with sublotteries; and
- r_{ij} is a random error associated with student i in lottery j .

Level-2 Model (Lottery Level)

$$\beta_{0j} = \gamma_{00} + u_{0j}$$

$$\beta_{1j} = \gamma_{10}$$

$$\beta_{2j} = \gamma_{20}$$

$$\beta_{3mj} = \gamma_{3m0}$$

where

- γ_{00} is the average graduation rate (in logits) among comparison students across all lotteries;
- γ_{10} is the average difference in graduation rate between Early College students and comparison students across all lotteries;
- γ_{20} is the average relationship between student characteristic X and graduation rate across all lotteries; and
- γ_{3m0} is the difference between the average graduation rate for comparison students in sublottery m and the average graduation rate for comparison students across all sublotteries in the given lottery with sublotteries.
- u_{0j} is a random error associated with lottery j , representing variation across lotteries in the average graduation rate for comparison students.

The model was estimated using the adaptive Gaussian-Hermite quadrature (AGQ) method, which is generally considered the preferred estimation method for multilevel logit models. It

⁵⁸ For a given lottery with m sublotteries, $SUBLOTmij$ was coded -1 for students in the omitted reference sublottery (i.e., if $m = 1$), 1 for students in sublottery m within the given lottery, and 0 for all other students. There is one set of sublottery indicators for each lottery with sublotteries in the level-1 equation, although we show only one set here for simplicity.

tends to produce more accurate results than alternative estimation methods such as the penalized quasi-likelihood method (i.e., the default of the HGLM module in the HLM7.0 program) or the pseudo-likelihood method (i.e., the default of the SAS GLIMMIX procedure), particularly when the higher-level variance is substantial. The estimate of primary interest from the model is γ_{10} , which represents a precision weighted overall treatment effect across all lotteries in the study sample, with larger weights for lotteries with more students. The analysis was repeated using each of the 10 multiply imputed data sets, and the estimates were combined across data sets, taking into account the uncertainty in imputed values both within and across the imputed data sets.

Multilevel Model to Estimate the Variation in Early College Impact Across Different Types of Students (Research Question 2)

In addition to the overall Early College effects on student outcomes, we also examined the potential differential effects of Early Colleges on students with different background characteristics by incorporating treatment-by-student-characteristic interactions into the impact model. For example, we measured the difference in Early College effect on high school graduation between minority and non-minority students by adding a treatment-by-non-minority interaction term to the main impact model (see Exhibit D.2). The lottery-level estimate for the interaction term (γ_{40}) captures the average difference in Early College effect on high school graduation between minority and non-minority students across all lotteries in the study sample.

Exhibit D.2. Hierarchical Generalized Linear Model for Assessing the Difference Between Minority and Non-minority Students in Early College Effect on the Probability of Graduating From High School

Level-1 Model (Student Level)

$$\log[\phi_j/(1 - \phi_{ij})] = \beta_{0j} + \beta_{1j} * EC_{ij} + \beta_{2j} * X_{ij} + \sum_{m=2}^m (\beta_{3mj} * SUBLOT_{mij}) + \beta_{4j} * EC_{ij} * MINORITY_{ij} + r_{ij}$$

where

- $EC_{ij} * MINORITY_{ij}$ is the interaction between treatment status (EC) and minority status for student i in lottery j ;
- β_{4j} is the difference in Early College effect between non-minority and minority students (i.e., differential Early College effect) in lottery j ; and
- Other terms are defined similarly to those in the main impact model shown in Appendix D.

Level-2 Model (Lottery Level)

$$\beta_{0j} = \gamma_{00} + u_{0j}$$

$$\beta_{1j} = \gamma_{10}$$

$$\beta_{2j} = \gamma_{20}$$

$$\beta_{3mj} = \gamma_{3m0}$$

$$\beta_{4j} = \gamma_{40}$$

where

- β_{4j} is the average difference in Early College effect between non-minority and minority students (i.e., average differential Early College effect) across all lotteries; and
- Other terms are defined similarly to those in the main impact model shown in Appendix D.

We performed similar analyses to test the potential differential effects of Early Colleges associated with gender, low-income status, first-generation status, and prior achievement. The model presented in Exhibit D.2 requires that, within each lottery, both Early College students and comparison students be present within each of the subgroups we examine. Lotteries that do not satisfy this requirement must be removed from analyses because, to estimate the impact of attending an Early College within a subgroup, there must be both Early College students and comparison students within the subgroup. For example, within two lotteries in the study, all Early College students were minority, and thus Early College impacts among non-minority students could not be estimated. To estimate the differential Early College impact for minority and non-minority students, we therefore removed these two lotteries from our analyses.

Appendix E: Summary of Impact Findings

This appendix provides detailed ITT estimates for all outcomes examined in the overall impact analyses and differential impact analyses. Exhibits E.1– E.4 summarize the results from the overall impact analyses for binary and continuous variables, and Exhibits E.5 and E.6 summarizes the results from the analyses of differential Early College impact on three key outcomes (graduation from high school, ever enrolled in college, and ever earned a postsecondary degree). The tables include the percentage of Early College (EC) and comparison (C) students who experienced the outcomes as well as effect sizes and p-values.⁵⁹

Exhibit E.1. Summary of ITT Estimates of the Overall Early College Impact on High School and College Binary Outcomes

Outcome	Analysis <i>n</i>	Effect in Logits	Odds Ratio	Std. Error (logit)	Probabilities		Effect Size	P-Value
					EC	C		
Withdrawal from initial high school	2,458	-0.21	0.81	0.11	32.2%	36.9%	-0.127	.0552
Drop out	2,458	0.02	1.02	0.24	4.9%	4.8%	0.011	.9408
Local transfer	2,458	-0.15	0.86	0.13	16.6%	18.7%	-0.089	.2733
High school graduation	2,458	0.39	1.48	0.15	86.0%	80.6%	0.236	.0103
Ever enrolled in college	2,458	0.50	1.65	0.11	79.7%	70.5%	0.302	<.0001
Enrolled in college by Year 4	2,458	1.75	5.77	0.11	63.1%	22.9%	1.062	<.0001
Enrolled in college by Year 5	2,458	0.54	1.71	0.11	77.4%	66.7%	0.326	<.0001
Enrolled by Year 4 for 2005–06 and 2006–07 cohorts	1,458	1.73	5.62	0.15	61.0%	21.8%	1.046	<.0001
Enrolled by Year 5 for 2005–06 and 2006–07 cohorts	1,458	0.49	1.64	0.14	74.8%	64.5%	0.299	.0005
Enrolled by Year 6 for 2005–06 and 2006–07 cohorts	1,458	0.49	1.64	0.14	77.7%	67.9%	0.300	.0006

⁵⁹ Effect sizes for binary variables are based on the following formula (Hedges, 1981):
$$\sqrt{\frac{X_1 - X_2}{(n_1 - 1)S_1^2 + (n_2 - 1)S_2^2}} \cdot \frac{1}{(n_1 + n_2 - 2)}$$

Exhibit E.1. Summary of ITT Estimates of the Overall Early College Impact on High School and College Binary Outcomes (cont.)

Outcome	Analysis <i>n</i>	Effect in Logits	Odds Ratio	Std. Error (logit)	Probabilities		Effect Size	P-Value
					EC	C		
Ever enrolled in a 2-year college	2,458	0.87	2.39	0.11	59.2%	37.8%	0.528	<.0001
Enrolled in a 2-year college by Year 4	2,458	1.95	7.05	0.13	48.0%	11.6%	1.184	<.0001
Enrolled in a 2-year college by Year 5	2,458	1.02	2.77	0.11	55.7%	31.1%	0.618	<.0001
Ever enrolled in a 4-year college	2,458	0.26	1.30	0.10	53.5%	47.1%	0.157	.0131
Enrolled in a 4-year college by Year 4	2,458	1.20	3.32	0.17	23.6%	8.5%	0.727	<.0001
Enrolled in a 4-year college by Year 5	2,458	0.23	1.26	0.11	48.9%	43.2%	0.138	.0338
Enrolled in partner institutions	1,942	0.49	1.63	0.11	55.8%	43.7%	0.300	<.0001
Any postsecondary degree	2,458	2.69	14.79	0.23	22.2%	1.9%	1.633	<.0001
Ever earned a certificate	2,458	0.54	1.71	0.48	1.2%	0.7%	0.327	.2658
Ever earned an A.A. degree	2,458	2.92	18.56	0.26	21.0%	1.4%	1.770	<.0001
Ever earned a B.A. degree	2,458	3.99	54.31	1.11	2.3%	0.0%	2.421	.0003
Postsecondary degree earned by Year 4	2,458	3.61	36.94	0.35	19.8%	0.7%	2.188	<.0001
Postsecondary degree earned by Year 5	2,458	3.13	22.87	0.28	21.4%	1.2%	1.897	<.0001
Postsecondary degree earned by Year 4 for 2005–06 and 2006–07 cohorts	1,458	4.44	85.06	0.68	17.6%	0.3%	2.693	<.0001
Postsecondary degree earned by Year 5 for 2005–06 and 2006–07 cohorts	1,458	3.21	24.73	0.39	19.3%	1.0%	1.944	<.0001
Postsecondary degree earned by Year 6 for 2005–06 and 2006–07 cohorts	1,458	2.66	14.27	0.31	20.0%	1.7%	1.611	<.0001
Enrolled in any college between Year 5 and Year 7	2,458	0.13	1.14	0.10	71.1%	68.4%	.078	.2181

Exhibit E.1. Summary of ITT Estimates of the Overall Early College Impact on High School and College Binary Outcomes (cont.)

Outcome	Analysis <i>n</i>	Effect in Logits	Odds Ratio	Std. Error (logit)	Probabilities		Effect Size	P-Value
					EC	C		
Enrolled at any college after high school graduation date	1,791	0.07	1.07	0.14	81.3%	80.2%	0.042	.6138
Enrolled in college between Year 5 and Year 7 at 2-year college	2,458	-0.09	0.91	0.10	32.8%	34.8%	-0.057	.3591
Enrolled in college between Year 5 and Year 7 at 4-year college	2,458	0.23	1.26	0.10	51.2%	45.5%	0.138	.0270
Earned any type of postsecondary degree between Year 5 and Year 7	2,458	1.15	3.17	0.31	4.5%	1.5%	0.700	.0002
Earned any type of postsecondary degree after high school graduation date	1,791	1.28	3.60	0.26	10.8%	3.3%	0.776	<.0001
Earned A.A. degree between Year 5 and Year 7	2,458	1.02	2.78	0.42	2.0%	0.7%	0.620	.0144
Earned B.A. degree between Year 5 and Year 7	2,458	3.99	54.31	1.11	2.3%	0.0%	2.421	.0003
Developmental coursework	1,002	-0.24	0.79	0.17	18.2%	22.0%	-0.146	.1472
Persistence in college	1,569	0.05	1.05	0.13	67.4%	66.4%	0.028	.7289

NOTES: The treatment group probabilities are unadjusted probabilities; the comparison group probabilities were computed based on the unadjusted treatment group probabilities and estimated Early College effects.

Exhibit E.2. Summary of ITT Estimates of the Overall Early College Impact on High School Experiences, Binary Outcomes

Outcome	Analysis <i>n</i>	Effect in Logits	Odds Ratio	Std. Error (logit)	Probabilities		Effect Size	P-Value
					EC	C		
Enrolled in college in 9th grade	2,458	6.05	422.11	0.53	28.9%	‡	3.664	<.0001
Enrolled in college in 10th grade	2,458	3.45	31.64	0.19	47.4%	2.8%	2.094	<.0001
Enrolled in college in 11th grade	2,458	2.45	11.63	0.15	46.2%	6.9%	1.487	<.0001
Enrolled in college in 12th grade	2,458	1.52	4.58	0.11	52.5%	19.4%	0.923	<.0001
Ever enrolled in college in high school	2,458	1.75	5.77	0.11	63.1%	22.9%	1.062	<.0001
Earned any college credit in high school	1,294	1.99	7.32	0.15	66.3%	21.2%	1.207	<.0001
Earned 1 year of college credit in high school	1,294	2.81	16.69	0.19	49.1%	5.5%	1.706	<.0001
Took at least 1 AP course	1,294	-1.50	0.22	0.15	21.8%	55.5%	-0.910	<.0001
Passed at least 1 AP exam	1,294	-1.68	0.19	0.21	8.5%	33.3%	-1.017	<.0001
College preparatory math sequence	1,294	-0.15	0.86	0.13	75.4%	78.1%	-0.091	.2421
Advanced math course	1,294	-0.07	0.93	0.13	58.2%	59.9%	-0.043	.5869
College preparatory science sequence	1,294	0.35	1.43	0.12	50.7%	41.9%	0.215	.0035
General college information in school	1,294	0.27	1.31	0.14	83.6%	79.5%	0.165	.0602
General college information outside of school	1,294	-0.05	0.95	0.11	38.8%	40.0%	-0.031	.6395
Took the ACT/SAT	1,294	0.00	0.99	0.14	82.4%	82.6%	-0.006	.9481
Applied for college	1,294	0.02	1.02	0.15	83.1%	82.9%	0.010	.9104
Applied for financial aid	1,294	0.15	1.16	0.12	70.8%	67.7%	0.088	.2269
ACT/SAT preparation help in school	1,053	0.20	1.22	0.13	54.2%	49.2%	0.122	.1109
College application help in school	1,067	0.43	1.54	0.14	75.0%	66.1%	0.263	.0015
Financial aid application help in school	890	0.32	1.38	0.14	63.1%	55.3%	0.195	.0233
ACT/SAT preparation help outside of school	1,053	-0.06	0.94	0.15	19.3%	20.2%	-0.036	.6913
College application help outside of school	1,067	-0.07	0.93	0.13	31.5%	33.1%	-0.045	.5558
Financial aid application help outside of school	890	0.25	1.28	0.13	47.1%	41.0%	0.151	.0640

NOTES: The treatment group probabilities are unadjusted probabilities; the comparison group probabilities were computed based on the unadjusted treatment group probabilities and estimated Early College effects.

‡ Too few students to report

Exhibit E.3. Summary of ITT Estimates of the Overall Early College Impact on High School and College Continuous Outcomes

Outcome	Analysis <i>n</i>	Effect	Std. Error	Mean		Effect Size	P-Value
				EC	C		
Achievement in ELA	2,458	0.14	0.04	0.37	0.23	0.147	.0001
Achievement in mathematics	2,458	0.05	0.04	0.28	0.23	0.056	.1908
High school GPA	1,294	0.00	0.04	2.98	2.98	-0.004	.9440
College GPA	455	-0.02	0.07	3.07	3.09	-0.024	.8150
Perceptions of academic difficulty in college	455	-0.13	0.06	2.04	2.17	-0.220	.0322

NOTES: The treatment group means are unadjusted means; the comparison group means were computed based on the unadjusted treatment group means and estimated Early College effects.

Exhibit E.4. Summary of ITT Estimates of the Overall Early College Impact on High School Experiences Continuous Outcomes

Outcome	Analysis <i>n</i>	Effect	Std. Error	Mean		Effect Size	P-Value
				EC	C		
Instructional rigor	1,294	0.22	0.04	2.7	2.5	0.346	<.0001
College-going culture	1,294	0.18	0.03	3.5	3.3	0.318	<.0001
Instructor support	1,294	0.18	0.03	3.4	3.2	0.314	<.0001
ACT/SAT score	1,053	.36	.30	22.7	22.4	.068	.2397

NOTES: The treatment group means are unadjusted means; the comparison group means were computed by subtracting the estimated Early College effects from the unadjusted treatment group means. ACT/SAT score is reported in ACT units.

Exhibit E.5. Differential Early College Impact on High School Graduation, Ever Enrolled in College, and Any Postsecondary Degree, by Student Background Characteristics

Student Characteristics	X = 1 (Probability)				X = 0 (Probability)				Differential Effect		
	EC	C	Difference	N	EC	C	Difference	N	Odds Ratio	Difference in Effect	P-Value
High School Graduation											
Female	84.9%	83.1%	1.8%	1,264	87.1%	77.8%	9.4%	1,194	0.6	-7.5%	.0764
Minority	87.4%	81.8%	5.6%	965	89.0%	82.5%	6.5%	855	0.9	-0.9%	.7523
Low income	82.6%	73.7%	8.9%	1,263	88.8%	86.6%	2.1%	1,125	1.4	6.7%	.2759
First generation	80.0%	77.8%	2.3%	956	88.6%	81.7%	6.9%	1,502	0.7	-4.6%	.1984
Ever Enrolled in College											
Female	81.0%	74.9%	6.1%	1,264	78.3%	65.6%	12.7%	1,194	0.8	-6.7%	.2018
Minority	80.3%	72.2%	8.1%	965	83.2%	72.9%	10.3%	855	0.9	-2.2%	.5399
Low income	74.9%	64.3%	10.6%	1,263	84.5%	75.5%	9.1%	1,125	0.9	1.5%	.7801
First generation	73.9%	68.3%	5.5%	956	82.2%	71.5%	10.7%	1,502	0.7	-5.2%	.3091
Any Postsecondary Degree											
Female	22.8%	1.2%	21.6%	1,264	21.7%	2.9%	18.8%	1,194	2.6	2.8%	.0310
Minority	26.5%	.9%	25.6%	965	22.8%	2.8%	19.9%	855	3.9	5.7%	.0081
Low income	19.7%	.8%	18.9%	1,263	24.5%	3.4%	21.2%	1,125	3.4	-2.3%	.0177
First generation	21.1%	1.4%	19.7%	956	22.6%	2.1%	20.5%	1,502	1.4	-0.7%	.5537

NOTES: X = 1 for female, minority, low income, first generation; X = 0 for male, non-minority, not low income, not first generation. The treatment group probabilities within a given student subgroup are unadjusted probabilities; the comparison group probabilities were computed based on the unadjusted treatment group probabilities and estimated Early College effects within the subgroup. The values in the Difference columns may not match the difference between the Early College and Comparison group means due to rounding. To analyze differential effects for minority and non-minority students, two lotteries were removed from analyses because zero Early College students were non-minority, and thus Early College impacts among non-minority students could not be estimated within these lotteries. Similarly, one lottery was removed from analyses of differential Early College effects among low-income students because zero students within this lottery were low-income.

Exhibit E.6. Differential Early College Impact on High School Graduation, Ever Enrolled in College, and Any Postsecondary Degree, by Prior Achievement

Prior Achievement	X = -1 Standard Deviation (Probability)			X = 0 Standard Deviation (Probability)			X = +1 Standard Deviation (Probability)			Differential Effect		
	EC	C	Difference	EC	C	Difference	EC	C	Difference	Odds Ratio	N	P-Value
High School Graduation												
ELA	81.3%	77.9%	3.3%	87.7%	81.7%	6.0%	92.1%	84.9%	7.1%	1.3	2,458	.1148
Mathematics	81.0%	77.3%	3.8%	87.7%	81.8%	5.9%	92.2%	85.6%	6.7%	1.3	2,458	.1536
Ever Enrolled in College												
ELA	73.6%	65.5%	8.1%	80.0%	70.5%	9.5%	85.1%	75.0%	10.2%	1.1	2,458	.3110
Mathematics	72.4%	60.9%	11.5%	79.8%	70.6%	9.1%	85.5%	78.8%	6.8%	1.0	2,458	.8194
Any Postsecondary Degree												
ELA	7.6%	1.2%	6.4%	8.7%	0.8%	7.9%	10.0%	0.5%	9.5%	1.8	2,458	.0308
Mathematics	4.8%	0.9%	3.9%	8.7%	0.9%	7.9%	15.4%	0.8%	14.5%	2.0	2,458	.0143

NOTES: The treatment group probabilities for a given level of prior achievement (i.e., 1 SD below the state average, state average, and 1 SD above the state average) are predicted probabilities when all control variables other than the prior achievement measure were set to their grand means. The comparison group probabilities were computed based on the predicted treatment group probabilities and the estimated differential Early College effects. The values in the Difference columns may not match the difference between the Early College and Comparison group means due to rounding.

Appendix F: Sensitivity Analyses

We performed five types of sensitivity analyses to assess the overall Early College impact on primary outcomes (high school graduation, college enrollment, and any postsecondary degree). First, we conducted impact analyses that excluded particular sites due to: a high no-show rate, a high crossover rate, incomplete documentation of the lottery, unavailability of high school mathematics assessment scores, or significant group difference in prior ELA assessment scores. Second, we performed impact analyses of outcomes from the administrative data using the survey sample and compared the results to those based on the administrative data sample. Third, we conducted impact analyses on selected outcomes incorporating random variation in the treatment effect across sites and compared the results with those based on the fixed-effects model. Fourth, we conducted the impact analyses for primary outcomes excluding students with missing outcome data, and compared the results with the full-sample results based on imputed data. Finally, we compared results for selected outcomes using ITT models that excluded baseline characteristics as covariates with results from our main model.

Comparison of Impact Results With and Without Specific Sites

Exhibit F.1 compares findings for three outcomes using the main impact model with findings from analyses that excluded specific sites. We tested the sensitivity of the impact findings to the exclusion of Sites A and F because their lotteries were not fully documented. Site A's staff described the lottery process with reasonable detail. However, the data did not fully match their explanation of who was included in the lottery. Site F's lottery was also not well documented.

We also conducted sensitivity analyses that excluded Site B, because it had a high crossover rate (28.4 percent in 2006–07), and its lottery winners had high ELA scores at baseline. Some students who lost the lottery attended another Early College that was in the same district, and we coded enrollees of this other Early College as receiving the treatment, thus counting as crossovers.

In another sensitivity analysis, we excluded Site C because it had high no-show rates in all three lotteries (45.5 percent in 2005–06, 58.1 percent in 2006–07, and 57.4 percent in 2007–08). This site is situated in a district that ran district-wide lotteries for all schools. Each school's lottery was independent, so students might have applied to and won multiple lotteries. As a result, about half of students who won the Site C lottery did not attend, presumably because they also won another lottery at a school they preferred to attend.

Exhibit F.1. Results of Early College Impact on High School Graduation, College Enrollment, and Degree Attainment With and Without Specific Sites

Analysis Sample	Analysis <i>n</i>	Effect in Logits	Odds Ratio	Std. Error	Probabilities		Effect Size	P-Value
					EC	C		
High School Graduation								
Full sample	2,458	0.39	1.48	0.15	86.0%	80.6%	0.236	.0103
Excluding Site A	2,388	0.40	1.49	0.15	85.9%	80.3%	0.241	.0094
Excluding Site B	2,129	0.26	1.29	0.16	85.0%	81.5%	0.156	.1125
Excluding Site C	1,518	0.74	2.09	0.22	90.3%	81.7%	0.447	.0008
Excluding Site F	2,247	0.34	1.40	0.15	84.5%	79.5%	0.206	.0220
Ever Enrolled in College								
Full sample	2,458	0.50	1.65	0.11	79.7%	70.5%	0.302	<.0001
Excluding Site A	2,388	0.53	1.70	0.11	79.9%	70.0%	0.323	<.0001
Excluding Site B	2,129	0.44	1.55	0.12	78.8%	70.6%	0.265	.0004
Excluding Site C	1,518	0.72	2.05	0.15	84.6%	72.8%	0.435	<.0001
Excluding Site F	2,247	0.45	1.56	0.12	78.0%	69.4%	0.271	<.0001
Any Postsecondary Degree								
Full sample	2,458	2.69	14.79	0.23	22.2%	1.9%	1.633	<.0001
Excluding Site A	2,388	2.64	14.02	0.23	22.2%	2.0%	1.600	<.0001
Excluding Site B	2,129	2.83	17.01	0.24	25.7%	2.0%	1.718	<.0001
Excluding Site C	1,518	3.02	20.58	0.26	26.4%	1.7%	1.833	<.0001
Excluding Site F	2,247	2.08	7.98	0.24	16.7%	2.4%	1.259	<.0001

NOTES: The treatment group probabilities are unadjusted probabilities; the comparison group probabilities were computed based on the unadjusted treatment group probabilities and estimated Early College effects.

Finally, we tested the sensitivity of findings about Early College impact on high school mathematics achievement to the exclusion of four sites (Sites G, H, I, and J) because they did not have high school mathematics scores due to special circumstances related to their states' testing programs (see Exhibit F.2).

In general, the results of the analyses excluding these sites were very similar to the results based on the full sample. There was only one difference in the statistical significance of the

impact estimates: When Site B was excluded from the analyses for high school graduation, there was no longer a significant difference between Early College and comparison students.

Exhibit F.2. Results of Early College Impact on High School Mathematics Assessments With and Without Specific Sites

Analysis Sample	Analysis <i>n</i>	Effect in Logits	Odds Ratio	Std. Error	Means		Effect Size	P-Value
					EC	C		
Full sample	2,458	0.05	NA	0.04	0.28	0.23	0.056	.1908
Excluding Sites G, H, I, and J	1,917	0.04	NA	0.04	0.20	0.16	0.043	.2550

NOTES: The treatment group means are unadjusted means; the comparison group means were computed based on the unadjusted treatment group means and estimated Early College effects.

Comparison of Impact Results Based on the Administrative Data Sample and Survey Sample

In the second set of sensitivity analyses, we examined whether the impact findings based on the survey sample were similar to the findings based on the administrative data sample. As shown in Exhibit F.3, the findings for the three outcomes examined were similar based on the two samples.

Exhibit F.3. Results of Early College Impact on High School Graduation, College Enrollment, and Degree Attainment Based on the Administrative Data Sample and Survey Sample

Analysis Sample	Analysis <i>n</i>	Effect in Logits	Odds Ratio	Std. Error	Probabilities		Effect Size	P-Value
					EC	C		
High School Graduation								
Full sample	2,458	0.39	1.48	0.15	86.0%	80.6%	0.236	.0103
Survey	1,286	0.41	1.51	0.19	87.2%	81.9%	0.248	.0339
Ever Enrolled in College								
Full sample	2,458	0.50	1.65	0.11	79.7%	70.5%	0.302	<.0001
Survey	1,286	0.42	1.51	0.15	78.9%	71.2%	0.252	.0052
Any Postsecondary Degree								
Full sample	2,458	2.69	14.79	0.23	22.2%	1.9%	1.633	<.0001
Survey	1,286	2.84	17.05	0.31	19.5%	1.4%	1.719	<.0001

NOTES: The treatment group probabilities are unadjusted probabilities; the comparison group probabilities were computed based on the unadjusted treatment group probabilities and estimated Early College effects.

Comparison of Impact Results Based on the Fixed-Effects Model and a Random-Effects Model

Our main impact analyses were based on a fixed-effects model that estimated a common Early College impact across lotteries because the number of lotteries was too small to provide stable estimates of the variation in Early College impact across lotteries for some outcomes. As a sensitivity analysis, we reran the impact analysis using a random-effects model for two outcomes that did not have estimation problems when the Early College effect was modeled as a random effect at the lottery level.

As shown in Exhibit F.4, the findings about the Early College impact on college enrollment and postsecondary degree attainment based on the fixed-effects model and the random-effects model were similar. Exhibit F.5 shows that there was no significant variation in the treatment effect on these two outcomes across lotteries, and Exhibits F.6 and F.7 present bar charts that depict the variation in Early College impact across lotteries.

Exhibit F.4. Comparison of Impact Results on the Fixed-Effects Model and Random-Effects Model for Ever Enrolling in College and Ever Earning a Postsecondary Credential Based on a Random-Effects Model

Outcome	Analysis Sample	Effect in Logits	Odds Ratio	Std. Error	Probabilities		Effect Size	P-Value
					EC	C		
Ever enrolled in college	Fixed	0.50	1.65	0.11	79.7%	70.5%	0.302	<.0001
	Random	0.61	1.84	0.17	79.7%	68.1%	0.369	.0003
Any postsecondary degree	Fixed	2.69	14.79	0.23	22.2%	1.9%	1.633	<.0001
	Random	1.95	7.00	0.61	22.2%	3.9%	1.179	.0015

NOTES: The analysis sample included 2,458 students (1,044 treatment, 1,414 comparison) and 17 lotteries. The treatment group probabilities are unadjusted probabilities; the comparison group probabilities were computed based on the unadjusted treatment group probabilities and estimated Early College effects.

Exhibit F.5. Variance of the Early College Impact on Ever Enrolling in College and Ever Earning a Postsecondary Credential Based on a Random-Effects Model

Outcome	Variance of EC Effect (logit ²)	Std. Error	T-Statistic	P-Value
Ever enrolled in college	0.18	0.13	1.38	.1677
Any postsecondary degree	3.62	2.09	1.73	.0838

NOTES: The analysis sample included 2,458 students (1,044 treatment, 1,414 comparison) and 17 lotteries. The treatment group probabilities are unadjusted probabilities; the comparison group probabilities were computed based on the unadjusted treatment group probabilities and estimated Early College effects.

Exhibit F.6. Lottery-Specific Early College Impact on Ever Enrolled in College Based on a Random-Effects Model

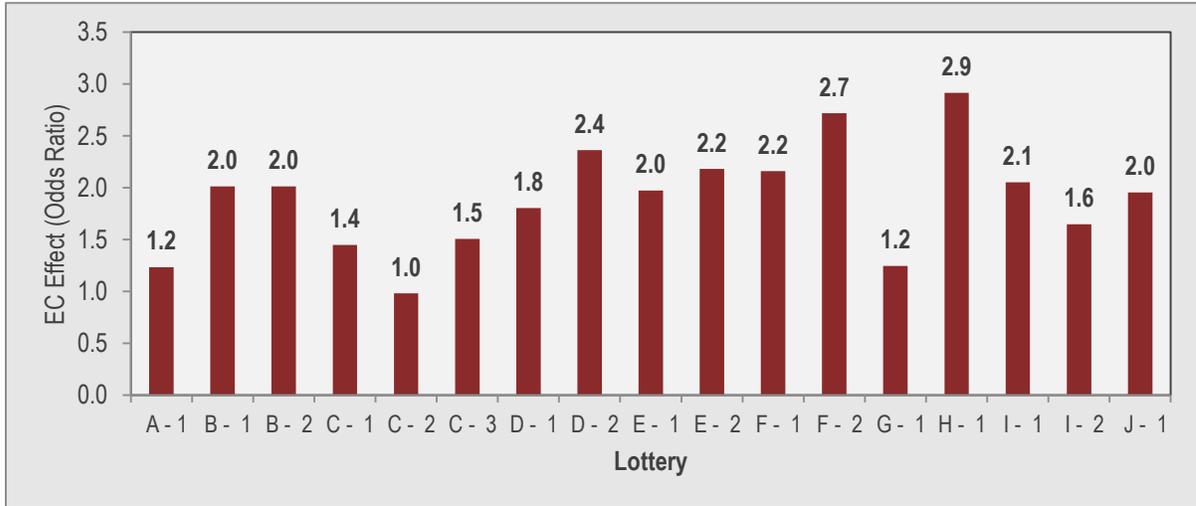
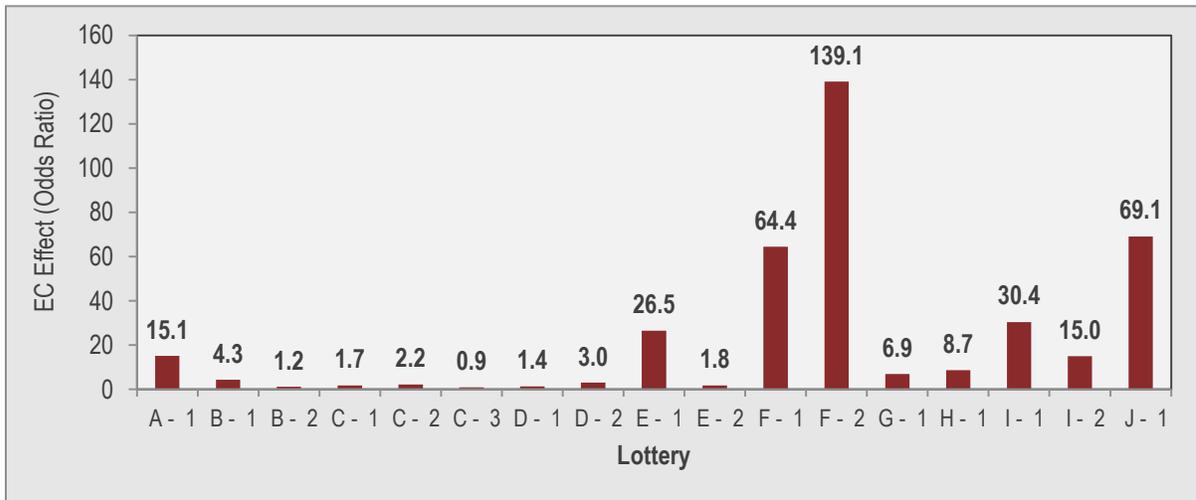


Exhibit F.7. Lottery-Specific Early College Impact on Any College Degree Based on a Random-Effects Model



NOTES: The large odds ratio for lottery F-2 is due to the fact that no comparison students in this lottery obtained postsecondary degrees and Early College students demonstrated very high rates of degree completion.

Comparison of Impact Results That Included and Excluded Imputed Outcome Data

All of the analyses presented in the body of the report were based on fully imputed data sets with imputed values for both outcomes and covariates. As a sensitivity analysis, we reran our main ITT model for three outcomes excluding students with missing outcome data. Because variables created from NSC data (i.e., college enrollment and college degree) do not have missing cases, we instead used high school graduation, ELA assessment score, and earned college credit during high school for this set of analyses. Exhibits F.8 and F.9 show that the Early College impact on high school graduation became non-significant after students with missing outcome data were excluded from the analysis. Findings for the other two outcomes, however, were similar with and without imputed outcome data.

Exhibit F.8. Results of Impact Analyses That Included and Excluded Missing Outcome Data on High School Graduation, and Earned College Credit During High School

Outcome	Analysis Sample	Analysis <i>n</i>	Effect in Logits	Odds Ratio	Std. Error	Probabilities		Effect Size	P-Value
						EC	C		
High school graduation	Full sample	2,458	0.39	1.48	0.15	86.0%	80.6%	0.236	.0103
	Excluding missing outcome data	2,207	0.17	1.19	0.15	88.0%	86.1%	0.105	.2579
Earned college credit during high school	Full sample	1,294	1.99	7.32	0.15	66.3%	21.2%	1.207	<.0001
	Excluding missing outcome data	1,265	2.08	8.04	0.15	66.6%	19.9%	1.264	<.0001

NOTES: The treatment group probabilities are unadjusted probabilities; the comparison group probabilities were computed based on the unadjusted treatment group probabilities and estimated Early College effects.

Exhibit F.9. Results of Impact Analyses That Included and Excluded Missing Outcome Data on ELA Assessment Score

Outcome	Analysis Sample	Analysis <i>n</i>	Effect in Logits	Odds Ratio	Std. Error	Means		Effect Size	P-Value
						EC	C		
ELA assessment score	Full sample	2,458	0.14	NA	0.04	0.37	0.23	0.147	<.0001
	Excluding missing outcome data	2,140	0.12	NA	0.03	0.42	0.30	0.126	.0004

NOTES: The treatment group means are unadjusted probabilities; the comparison group means were computed based on the unadjusted treatment group means and estimated Early College effects.

Comparison of Impact Results That Included and Excluded Baseline Characteristics

We included baseline characteristics in all analyses. As a sensitivity test, we also reran our main ITT model for three outcomes excluding baseline characteristics (gender, minority, low income, first generation, and prior test scores), and findings were similar to our inclusive model. See Exhibit F.10 for the comparison between models that included and excluded baseline characteristics as covariates.

Exhibit F.10. Comparison of Impact Results That Included and Excluded Baseline Characteristics on High School Graduation, College Enrollment, and Degree Attainment

Outcome	Analysis Sample	Effect in Logits	Odds Ratio	Std. Error	Probabilities		Effect Size	P-Value
					EC	C		
High school graduation	Full sample	0.39	1.48	0.15	86.0%	80.6%	0.236	.0103
	Excluding baseline characteristics	0.40	1.50	0.15	86.0%	80.4%	0.244	.0066
Ever enrolled in college	Full sample	0.50	1.65	0.11	79.7%	70.5%	0.302	<.0001
	Excluding baseline characteristics	0.49	1.64	0.11	79.7%	70.6%	0.298	<.0001
Any postsecondary degree	Full sample	2.69	14.79	0.23	22.2%	1.9%	1.633	<.0001
	Excluding baseline characteristics	2.59	13.30	0.22	22.2%	2.1%	1.568	<.0001

NOTES: The treatment group probabilities are unadjusted probabilities; the comparison group probabilities were computed based on the unadjusted treatment group probabilities and estimated Early College effects.

Appendix G: Complier Effects Analyses

Given the presence of no-shows and crossovers in some sites, we supplemented the ITT effect analyses with complier effect analyses that estimate the impact of attending an Early College (as opposed to being offered admission) for lottery winners. The Early College effect on compliers (i.e., lottery winners who attended an Early College) was estimated using an instrumental variable (IV) approach, which is particularly well suited to estimating the effects of mediators (e.g., treatment receipt, or Early College attendance, in this case) in an experimental context (Angrist, Imbens, & Rubin, 1996; Gennetian, Morris, Bos, & Bloom, 2005). An IV analysis typically involves two stages. During the first stage, an instrumental variable is used to obtain the predicted values of the mediator of interest. The predicted values, instead of the original values, of the mediator are then used in the second stage to predict the outcome. Important covariates are included in both stages to improve the precision of the IV estimates of the mediator effect.

For the IV approach to generate a valid estimate of the causal effect of the mediator on the outcome, two conditions must be met. First, the instrument must co-vary with the mediator. All else being equal, the stronger the covariation, the more precise the IV estimates. Second, the instrument must be uncorrelated with the outcome when the mediator is taken into account. This condition is also known as the *exclusion restriction* assumption, which essentially assumes that the effect of the instrument on the outcome is completely mediated through the mediator and that no other causal paths exist between the instrument and the outcome.

In the Early College impact study, treatment assignment is expected to affect, or co-vary with, Early College attendance, because students who won the lottery were more likely to attend an Early College than students who did not, as evidenced by the relatively low no-show and crossover rates in most sites.⁶⁰ It is difficult to hypothesize a path by which winning the lottery could improve student outcomes other than through Early College attendance (i.e., exclusion restriction). Lottery-based random assignment is thus a natural choice of instrument for Early College attendance in our case, as it meets both conditions for a valid IV analysis. The logic of the analyses of Early College effects on lottery winners who attended Early Colleges based on the IV approach is illustrated in Exhibit G.1.

Exhibit G.1. Logic of Complier Effects Analysis Based on the Instrumental Variable (IV) Approach



⁶⁰ For the purpose of complier analyses, we defined Early College attendance based on whether a student attended an Early College (regardless of whether or not the Early College was in the study) during the first year of high school.

Specifically, our IV analyses of the Early College effects on lottery winners who attended Early Colleges proceeded in two stages. In the first stage, we obtained the predicted probability (in logits) of attending an Early College for each student based on a model similar to the one used for the ITT impact analysis (see Appendix D), except that the dependent variable for the first-stage equation was Early College attendance rather than a student outcome. Based on the results of the first-stage equation, we converted the predicted values of Early College attendance (in logit) for each student into the predicted probability of attendance that ranged between 0 and 1. The second-stage equation of the IV analyses also was similar to the ITT impact model, except that the treatment indicator variable in the ITT model was replaced with the predicted probability of attendance estimated during the first stage.

Ideally, the two stages of an IV analysis should be estimated simultaneously in a single analysis to properly take into account the estimation error associated with the predicted probability of Early College attendance from the first stage. However, the IV analysis modules available in existing software programs cannot accommodate multilevel logit models for binary outcomes. Therefore, we carried out the two IV stages in two separate steps. This two-step IV approach may have somewhat underestimated the standard errors of the complier effect estimates, as it could not properly take into account the uncertainty in the predicted values of the Early College attendance. The size of the effect estimates, however, is not affected by the two-step approach.

The IV estimates of complier effects of Early Colleges as well as the corresponding ITT effects are summarized in Exhibit G.2. As expected, the complier effect estimates were larger than the ITT effect estimates. For example, for the outcome of ever earning a postsecondary credential, the effect size for the complier effect was 2.229, as compared with an effect size of 1.633 for the ITT effect. The statistical significance of the complier effects, however, was generally consistent with the significance of the ITT effects.

Exhibit G.2. Estimates of Complier Effects and ITT Effects of Early Colleges on High School Graduation, Ever Enrolled in College, and Any Postsecondary Degree

Outcome	Analysis <i>n</i>	Effect in Logits	Odds Ratio	Std. Error	Probabilities		Effect Size	P-Value
					EC	C		
High School Graduation								
ITT effect	2,458	0.39	1.48	0.15	86.0%	80.6%	0.236	.0103
Complier effect	2,458	0.79	2.21	0.24	89.2%	78.9%	0.481	.0009
Ever Enrolled in College								
ITT effect	2,458	0.50	1.65	0.11	79.7%	70.5%	0.302	<.0001
Complier effect	2,458	0.95	2.58	0.16	83.3%	66.0%	0.574	<.0001
Any Postsecondary Degree								
ITT effect	2,458	2.69	14.79	0.23	22.2%	1.9%	1.633	<.0001
Complier effect	2,458	3.68	39.57	0.31	26.8%	0.9%	2.229	<.0001

NOTES: The treatment group probabilities are unadjusted probabilities; the comparison group probabilities were computed based on the unadjusted treatment group probabilities and estimated Early College effects.

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