




2024

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Recommended Citation

Ponisciak, S.M., & Dallavis, J.W. (2024). Student achievement growth before and during COVID-19: Comparing in-person and remote learning in Catholic and public schools. *Journal of Catholic Education*, 27(2), 76–106. <https://doi.org/10.15365/joce.2702052024>

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Cover Page Footnote

The authors thank Lindsay Haas and Eric Stickney of Renaissance Learning for providing Renaissance Star data, and for discussions and review; colleagues at NWEA for providing MAP Growth data files; and Kathy Mears, former president of the National Catholic Education Association, for facilitating this work. This research was supported in part by the Notre Dame Center for Research Computing.

Student Achievement Growth Before and During COVID-19: Comparing In-Person and Remote Learning in Catholic and Public Schools

*Stephen Ponisciak*¹ and *Julie W. Dallavis*^{1,2}

Abstract: In response to COVID-19, U.S. students learned remotely from mid-March to June 2020. At the start of academic year 2020–21, many schools remained remote but others—primarily Catholic and other private schools—reopened. We consider Catholic schooling as a proxy for in-person instruction and use national data from Renaissance Star and MAP Growth assessments to compare the achievement of similar students pre-pandemic, during the height of mitigation strategies, and after most schools reopened. In a departure from pre-pandemic growth patterns, students in Catholic schools showed more growth than those in public schools during the height of mitigation strategies, suggesting the importance of in-person instruction.

Keywords: academic achievement, sector differences, Catholic schools, elementary schools, COVID-19, in-person instruction

In March 2020, the novel coronavirus COVID-19 led to global community lockdowns as health and public leaders attempted to provide the greatest safety for the public amid the spread of the virus. Schools across the U.S. closed their physical doors and learning shifted from in-person to virtual, with students learning from home, many over a computer, from mid-March to June 2020. During the following academic year 2020–21, many schools remained virtual (Henderson et al., 2021; Malkus & Christensen, 2022; Oster et al., 2021). Others—primarily Catholic and other private schools with local governance—reopened to students at the start of the school year

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and remained open, returning to in-person instruction (Kowalski & Ponisciak, 2021; National Catholic Educational Association [NCEA], 2020; Reyes, 2020).

During that year, student achievement growth on interim assessments in public schools decreased on average compared to previous years in all grades and subjects (Dawson, 2021; Kuhfeld et al., 2022; Renaissance Learning, 2021). This decrease may be attributed to a number of pandemic-related issues, in particular students' socio-emotional, mental, and physical health (George et al., 2021; Hertz et al., 2022; Mayra et al., 2022), absenteeism (Santibañez & Guarino, 2021), and the mode of student instruction (Darling-Aduana et al., 2022; Fisher et al., 2022; Tomasik et al., 2021). Common wisdom would point to virtual or remote schooling—the closest of these issues to curriculum and instruction—as an important mechanism related to this decrease. Recent analyses have attempted to investigate differences between the academic performance of students who experienced in-person instruction versus remote online instruction during academic year 2020–21 (Darling-Aduana et al., 2022; Kogan & Lavertu, 2021; Sass & Goldring, 2022).

We contribute to this literature using national data to compare Catholic and public-school student achievement to examine whether the mode of instruction was related to student achievement in math and reading in the elementary and middle grades during the COVID-19 pandemic. We use data from two national formative assessments—NWEA MAP Growth and Renaissance Star—to estimate differences in performance between Catholic schools, which were more likely to be in-person during 2020–21, and public schools that remained largely virtual (Henderson et al., 2021; Malkus & Christensen, 2022; National Assessment of Educational Progress [NAEP], 2021; NCEA, 2020; Oster et al., 2021). Both before and during the pandemic, we examine similar students in similar schools and/or local contexts, which allows us to attempt to control for selection and to provide comparisons that account for previous student achievement and school context. Due to data limitations, we cannot directly match Catholic and public schools on the mode of instruction, but our analyses of two national tests suggest that on average, students in schools that were more likely to be in-person experienced more academic growth during the pandemic.

Our examination of mode of instruction for student academic success is relevant for several reasons. Although the COVID-19 virus is now endemic and no longer poses the same threat to public health, it exposed the population's relative vulnerability to novel contagions and the weaknesses that exist in global healthcare. Should another pandemic arise, understanding the effects of virtual and in-person schooling on academics, socio-emotional learning, and disease transmission may help policymakers and school and government leaders to make informed decisions related to the careful balance between education and health. Further, additional understanding of the mechanisms related to decreased learning during the pandemic can assist in making the case for the improvement of virtual instruction as well as a deeper consideration for the

value of the social and relational aspects of schooling. Continued attention to these issues in the field may better equip teachers for the possibility of a future shift to virtual learning.

Background Literature

Impact of COVID on Student Achievement

The pandemic left an indelible mark on education. Estimates of the effect on K-12 learning in public schools suggest declines in academic growth across subjects, levels, and region as well as at different time points of the pandemic period (Kogan & Lavertu, 2021; Sass & Goldring, 2022; West et al., 2021). Metro (Sass & Goldring, 2022), state (Kogan & Lavertu, 2021), and national analyses (Dawson, 2021; Kuhfeld et al., 2022; Renaissance Learning, 2021) all report an initial decline during the period of March-May 2020. These declines are a reduction in achievement growth, rather than a loss of knowledge, with some researchers estimating losses in terms of months of schooling (Kogan & Lavertu, 2021; West et al., 2021). Researchers have also found that younger students (König & Frey, 2022) and students from minority and marginalized populations experienced greater declines (Sass & Goldring, 2022; West et al., 2021). These declines have surfaced in summative assessments (Kogan & Lavertu, 2021), interim, formative assessments (Dawson, 2021; Kuhfeld et al., 2022; Renaissance Learning, 2021), and student grades (Fisher et al., 2022). On average, achievement growth remained lower than pre-pandemic levels during academic year 2020–21, with some evidence of greater variation among students (Kuhfeld et al., 2022).

Researchers have explored several contributing factors. Some have focused on health and well-being, exploring the effect of community lockdowns and remote learning on students' socio-emotional, mental, and physical health (George et al., 2021; Hertz et al., 2022; Mayra et al., 2022). Others examined student engagement with remote learning, including absenteeism (Chiu, 2021; Darling-Aduana et al., 2022; Domina et al., 2021; Santibañez & Guarino, 2021), as well as technological difficulties that hampered student progress (Domina et al., 2021). These factors all relate in some manner to the mode of schooling, specifically whether schools opened for in-person learning or relied on remote instruction during academic year 2020–21.

Prevalence of In-Person and Remote Instruction during COVID

The nearly uniform move to emergency remote teaching and learning in March 2020 forced students and teachers to adapt quickly to considerable changes (Hodges et al., 2020). During the “emergency” period of March-May, teachers, students, and families did their best to respond to the COVID-19 crisis but faced many issues related to technological readiness, accessibility, resources, and competencies. How to facilitate communication between home and school, manage learning materials, support learning, and engage students in remote instruction had to be developed by teachers in real-time (Al Mazrooei et al., 2022). Without previous experience engaging students

in the behavioral, cognitive, and emotional aspects of online learning, teachers faced significant challenges in daily instruction (Chiu, 2021). Additionally, student engagement during this time varied by technological resources, social connections among families, and diverse learning opportunities (Domina et al., 2021). Research has found that on average, students scored lower during this period compared to non-pandemic cohorts, suggesting less than normal growth during the remote learning period (West et al., 2021).

Although schools closed fairly uniformly in March 2020, reopening for in-person instruction in academic year 2020–21 varied considerably (Malkus, 2020; NCEA, 2020; Oster et al., 2021; Porter-Magee et al., 2022). Several surveys found that only about 40% of U.S. public schools opened for in-person instruction in fall 2020 (Henderson et al., 2021; Oster et al., 2021; Malkus, 2020) and only 60% of public schools were open in-person by the end of the school year (NAEP, 2021; Oster et al., 2021). School opening data collected throughout this period suggests several trends by region, student age, and school type. Schools in the South were more likely to open in person (Oster et al., 2021), elementary schools were more likely to open than middle and high schools (NAEP, 2021; Oster et al., 2021), and private schools with local governance were more likely to be open than their public school neighbors (Henderson et al., 2021; Malkus & Christensen, 2022; NAEP, 2021).

In contrast, a survey of Catholic school leaders by the National Catholic Educational Association reported that 92% of U.S. K-12 Catholic schools opened for some form of in-person instruction in 2020–21 (NCEA, 2020; Porter-Magee et al., 2022; Reyes, 2020). The Institute for Education Sciences cited similar proportions of in-person Catholic schools in the NAEP 2021 School Survey, a nationally representative sample of public and private schools. They reported that 90% of Catholic schools serving fourth graders and 86% serving eighth graders were open in February 2021 compared to 51% and 46% of public schools respectively. These numbers climbed to 93% and 91% for Catholic schools and 62% and 64% for public schools in May 2021 (NAEP, 2021).

Mode of Instruction Comparisons

Several studies have attempted to examine how these differences in the mode of instruction may have affected student achievement. Surveys of teachers during this time suggest that remote and in-person instruction placed students on different learning paths. Those teaching remotely reported less instructional time and less curricular content coverage compared to previous years (Kaufman & Diliberti, 2021; West et al., 2021). Roughly 90% of remote teachers reported teaching at least one synchronous, or live, class per day. Although there was considerable variation, on average, remote teachers reported less rigorous and less comprehensive instruction during the 2020–21 school year. Remote teachers also reported higher proportions of missing assignments and failing students compared to in-person teachers (Kaufman & Diliberti, 2021).

Online charter school achievement research offers insights from a similar form of instructional and material delivery. One study found that online charter schools provided less synchronous contact between teacher and student and that the primary mode of learning was independent study, with close to a third of online charter schools providing only self-paced learning (Gill et al., 2015). Student engagement in online charters was reported as one of the biggest challenges along with the high level of parent expectations for managing student learning (Gill et al., 2015), similar to findings from the pandemic (Chiu, 2021; Domina et al., 2021). Online charter students have experienced less academic growth compared to their traditional public-school peers (Ahn & McEachin, 2017; Fitzpatrick et al., 2020; Woodworth et al., 2015), suggesting that the mode of instruction—in-person versus remote—is important for how much students learn.

To examine differences in learning by mode of instruction during the pandemic, one study used a natural experiment to examine the impact of emergency distance learning (Tomasik et al., 2021). They compared 8 weeks of learning data pre-pandemic with data from the 8 weeks of closure in spring 2020 in Switzerland. They found that secondary students were largely unaffected but that learning in the primary grades slowed and the variance between students increased (Tomasik et al., 2021). Other studies have used matched analyses of student test scores, comparing students experiencing in-person instruction with those experiencing remote learning. Among these, analyses concluded that remote students demonstrated negative achievement growth compared to in-person students. In one state, a study of third grade students who were fully remote had summative test score declines that were 3 times greater than those who attended in person (Kogan & Lavertu, 2021). Remote students also demonstrated less growth compared to in-person students on interim, formative assessments (Darling-Aduana et al., 2022; Sass & Goldring, 2022).

School Sector as a Proxy for Instruction

In this study, we use assessment data from two national formative assessments to further consider differences in performance between students who experienced in-person and remote schooling, using school sector as a proxy for mode of instruction. Although research from the 1990s suggests there may be a Catholic school effect on achievement at the high school level (Bryk et al., 1993; Coleman & Hoffer, 1987), research has not established this effect in elementary or middle school. Analyses of pre-pandemic achievement outcomes have found that, when researchers attempt to account for selection into schools, students in Catholic and public schools score similarly in elementary (Carbonaro, 2006) and middle school (Hallinan & Kubitschek, 2012). Further, matched analyses of formative assessment data just prior to the pandemic also demonstrate that similar students, in similar Catholic and public schools, on average score similarly (Ponisciak & Dallavis, 2022). As there were no differences between Catholic and public school scores pre-pandemic and because of the high proportion of Catholic schools that were open in-person compared to public schools, we use school sector as a proxy for in-person instruction to better

understand its association with student achievement outcomes. If Catholic school achievement growth outpaces public school growth during the year that nearly all Catholic schools were open and the majority of public schools were remote, these data can lend complementary and suggestive evidence that in-person learning is more conducive to student achievement in comparison to current methods of remote learning.

Although the current study cannot clarify what is effective about in-person learning or ineffective about remote learning, it can contribute to the growing evidence of differences in achievement associated with these modes of instruction. Because of research on online charter schools, the extensive challenges reported by remote teachers and students, and the existing comparisons between in-person and remote instruction, we expect that students in Catholic schools, who were more likely to attend school in-person during academic year 2020–21, experienced more academic growth compared to their public-school counterparts who were more likely to attend school remotely. We present descriptive data from NWEA MAP Growth and follow with more detailed analyses of Renaissance Star data.

Data and Methods

We use national data from two popular formative assessments administered in K-8 schools in the US: NWEA MAP Growth and Renaissance Star. Unlike the commonly used, cross-sectional National Assessment of Educational Progress (NAEP), the MAP and Star tests are taken multiple times each year and allow us to follow individual students over time to estimate growth. These tests are also used by educators in the schools to track student progress over time. Both tests are adaptive, adjusting to each student's responses to match content to their estimated achievement level. Therefore, growth can be estimated on a comparable scale for all time periods and grades (Soland, 2019; Thum & Hauser, 2015). Scores for both tests are reported on the RIT (Rasch unIT) scale, a linear transformation of the logit scale units from the Rasch model (Rasch, 1960). Both tests provide teachers with real-time information on student progress related to targeted skill development. MAP Growth is administered to over 12 million students nationwide in primary and secondary grade levels, usually three times per school year (fall, winter, spring). The Star assessments are also administered throughout the school year. During the 2020–21 school year, about 31,000 schools in all 50 states and the District of Columbia administered Star, resulting in a total of about 50,000,000 test events. We examined data from 2018–19 to 2021–22; there was little data in spring 2020 due to the pandemic.

Because of the adaptive design, the reliability of scores for both tests is high. MAP Growth assessments are untimed, but generally require 40–60 minutes per subject, and students typically answer 40–53 items per session. Coupled with adaptivity, the test is long enough that student-specific standard errors of measurement are typically very small (Thum & Hauser, 2015), and

estimates of test-level reliabilities (Cronbach's alpha) for MAP Growth generally exceed 0.95 (Northwest Evaluation Association [NWEA], 2011). Star has a reliability of at least 0.90 in math in each grade (Renaissance Learning, 2019a) and at least 0.94 in reading in each grade (Renaissance Learning, 2019b). Star Reading and Star Math have received strong reviews as progress monitoring measures (National Center on Intensive Intervention [NCII], 2021), and have been independently reviewed and found to have fully convincing evidence of reliability, validity, and classification accuracy (NCII, 2021b), while MAP Growth is also acknowledged for its strong reliability, validity, and classification accuracy (NCII, 2021b).

Although these tests are similar in format, nature, reliability, and popularity, the datasets shared by the testing companies differ in important ways that dictate the types of analyses we were able to conduct. Using the MAP Growth data, we examined average growth for groups of similar students because individual student data were not available to us. With Star, we matched similar students in similar schools but had access to less student demographic information. In the following sections, we provide additional details on each dataset as well as the analyses conducted.

Data Summary

MAP Growth

MAP Growth data was provided by NWEA's research department as a data file containing the average gain, standard deviation, and number of students, for both public and Catholic schools (see Appendix for descriptive summary of data). Data were included for each group of students defined by year (Fall 2018–Spring 2019; Fall 2020–Spring 2021; Fall 2021–Spring 2022), grade (K-12), NCES urban location code (Large/mid-size/small city; large/mid-size/small suburb; distant/fringe/remote town; distant/fringe/remote rural), race/ethnicity (American Indian or Alaskan Native; Asian; Black or African American; Hispanic or Latino; Multi-ethnic; Not specified or other; White), subject, and 5-point range of pre-test (fall) scores. Groups with fewer than 10 students were not reported. This allowed us to examine differences in average growth between Catholic and public schools before and during the pandemic for students from different types of metropolitan areas, prior test scores, and demographics, but we could not follow individual students or schools over time.

The number of students taking MAP Growth in public schools decreased from 2019 to 2021, and rebounded in 2022, with many more students tested in public than in Catholic schools (see Table A1). Catholic schools saw slight declines in some grades, and slight increases in others, from 2019 to 2021, and further increases in 2022. Students in large suburban and large city settings comprised more of the sample than those in other locations, in both the Catholic and public sectors (see Table A2). Student demographics differed in Catholic and public schools; most students in Catholic schools were White, while White students comprised a smaller majority in public schools (see Table A3).

Renaissance Star

Before providing the data, researchers from Renaissance matched Catholic schools to public schools exactly by metropolitan area (urban, suburban, town, or rural, determined by NCES locale code and ZIP code) and the minimum grade level offered in 2018–19. Potential school matches were not required to be physically near each other. Within the exact-matched schools, Renaissance researchers used nearest-neighbor propensity score matching, based on the average score (measured in NCE units) in 2018–19 and number of students per grade, to find the best match for each Catholic school. Schools were matched separately by grade range, with two groups—K-5 and 6-8—so a school could have multiple matches if they served more than one grade range. Schools were matched separately in reading and math. In reading, matches were found for 27% of Catholic schools serving grades 1-5, and 26% of Catholic schools serving grades 6-8. In math, matches were found for 52% of Catholic schools serving grades 1-5, and 51% of Catholic schools serving grades 6-8. We then used the matched schools in our student matching procedures.

Within the matched sample of schools, there were 893 Catholic schools with math scores and 847 with reading scores. Due to small samples in kindergarten, in all subsequent analyses, we examined results in grades 1-8. The number of students tested decreased from 2019 to 2022, with more students typically tested in math than in reading, and more students tested in public than in Catholic schools (see Appendix for a descriptive summary of data). Schools in suburban settings comprised more of the sample than those in urban, town, or rural/non-metro areas (see Table A4), and the percentages of students in these schools followed similar patterns. Student demographics differed in Catholic and public schools (see Table A5). Among students with available information, most students in Catholic schools were White, while most students in public schools were non-White. Information about student race/ethnicity and gender was more often missing in the Catholic school data.

Data Analysis

MAP Growth

The MAP Growth data allowed us to compare groups of students in Catholic schools to similar groups of students in public schools in similar contexts. If similar students with similar initial scores in similar contexts demonstrated different levels of average growth in Catholic and public schools, some of that difference may be due to school sector (during years not affected by a pandemic) or to the increased likelihood of schools in a sector offering in-person schooling.

We examined growth by comparing the average gain in each student group in Catholic schools in each year (defined by the fall test score in groups of 5 score points; student race/ethnicity; school year; and metro area type) to the average gain in the same student group in public schools in the same year. We made the same comparison for Catholic schools to public schools in 2018–19

and to Catholic schools in 2018–19 to provide baseline comparisons prior to COVID. For example, we compared the average math gain of Asian students in Catholic schools in 2020–21 in large urban metro areas with fall scores from 150-154 in grade 3 to the same group in public schools in 2020–21; in public schools in 2018–19; and in Catholic schools in 2018–19. We aggregated these by grade level, race/ethnicity, and metro area type, yielding results in the form of the percentage of the comparison group's gain made by the group of interest. Next, we made the same comparisons using a different reference group: we compared to the aggregate for each pretest score group (over all metro area types and race/ethnicity groups). Thus we compared the average math gain of Asian students in Catholic schools in 2020–21 in large urban metro areas with fall scores from 150-154 in grade 3 to the average gain of all students in public schools with fall scores from 150-154 in grade 3 in 2020–21; all students in public schools in 2018–19; and all students in Catholic schools in 2018–19. For reporting purposes, we combined the metro area types into four groups: city, suburban, town, and rural.

Renaissance Star

Although we have student-level data in the Renaissance Star data, we lack a full picture of student demographics in Catholic schools due to the optional nature of the self-reported school data, which complicates efforts to address these issues. One way to partially mitigate the effects of these factors is by examining student growth percentiles (SGPs; [Betebenner, 2009](#)). Using this method, we compared students' scores to those of students with similar prior scores, with a similar amount of time between tests ([Renaissance Learning, 2022](#)). In [Table 1](#), we show the median SGP from fall to spring in Catholic and matched public schools in both math and reading. We show results separately for grades 1-5 and 6-8, because the patterns are somewhat different, as well as by the type of metro area, since the reopening gap was larger in urban and suburban areas ([NAEP, 2021](#)). For example, in grades 1-5 math in suburban schools, the median SGP in Catholic schools remained at 46 in 2019 and 2021, and increased somewhat to 48 in 2022, while in public schools, it fell from 55 to 52, and then rebounded to 58 in 2022. Meanwhile, in schools that were in town settings, the median SGP in grades 1-5 math increased in both Catholic and public schools in 2021. In reading, we found similar outcomes: results in Catholic and public schools followed similar patterns in town and rural/non-metro settings, while in urban and suburban settings, public schools saw a decrease in SGP in 2021 when Catholic schools' SGPs remained steady.

However, these SGPs only account for prior test scores and time between tests. In addition, the population of tested students in both sectors declined over time. In order to provide a clearer picture of achievement and growth in Catholic and public schools, and to compare more directly to similar students in similar schools, we use student-level matching. As noted earlier, if students with similar initial scores (in similar schools) demonstrate different levels of growth in Catholic and public schools, some of that difference may be due to school sector differences.

Table 1

Median Fall to Spring SGP in Catholic and Matched Public Schools by Subject, Metro Type, Grade Levels, and Year in Renaissance Star Data

	Metro Type	Year	Grades 1-5				Grades 6-8			
			Catholic		Public		Catholic		Public	
			N	SGP	N	SGP	N	SGP	N	SGP
Math	Rural/Non-Metro	2019	3373	48	5653	55	1071	54	2064	52
		2021	3361	53	4717	60	1050	56	1952	57.5
		2022	2737	50	2373	60	839	51	490	54
	Sub-urban	2019	51983	46	113769	55	27909	51	132804	50
		2021	48320	46	89103	52	26608	52	118408	47
		2022	40536	48	80487	58	21562	53	114687	51
	Town	2019	6286	49	24793	53	3459	50	11031	51
		2021	5849	55	18561	57	3521	54	10968	51
		2022	5008	49	17544	56	3079	53	8197	52
	Urban	2019	9519	49	30483	55	5382	57	17731	48
		2021	7694	49	28160	48	4826	56	19898	46
		2022	6360	52	26575	55	3217	56	16125	50
Reading	Rural/Non-Metro	2019	2361	54	2444	57	605	54	628	49
		2021	1815	52	2339	58	577	52	608	47
		2022	1675	52	1948	57	421	52	480	48
	Sub-urban	2019	38224	54	88594	56	16241	53	74895	50
		2021	35164	55	66831	52	15713	53	68243	45
		2022	29676	52	63272	54	13196	48	62188	47
	Town	2019	4423	54	13923	56	2316	51.5	10920	49
		2021	3579	56	9989	56	2480	48	9188	46
		2022	3013	55	8854	56	1880	46	7155	46
	Urban	2019	10250	57	32625	55	5468	56	11975	48
		2021	8657	57	27795	48	4917	55	12271	48
		2022	6916	54	24193	52	3659	51	12305	47

Schools might use Renaissance Star in one subject but not both, or might use the reading and math tests differently (e.g., in different grades, or only for intervention; E. Stickney, 1/17/2023, personal communication). Therefore, a substantial proportion of students have data only in math or only in reading. Because many students in Catholic schools lacked demographic data, we used multiple pre-tests, which other authors consider a partial solution to missing demographics (Ballou et al., 2004; Ehlert et al., 2014; Johnson et al., 2015). We estimated models using several matching methods, using multiple pretests in the same subject from adjacent time periods, and using multiple pretests in different subjects from the same time period when available. We relied on two versions of Mahalanobis matching: kernel matching and nearest-neighbor matching. We only display results

from kernel pairwise matching for brevity. We used these methods because they are appropriate for normally distributed continuous variables and for datasets with relatively few matching variables (Stuart, 2010). We used the *kmatch* procedure in Stata (Jann, 2017) to implement these matches and to employ entropy balancing (Hainmueller, 2012; Hainmueller & Xu, 2013) for the mean and variance of the continuous matching variables to generate more comparable samples.

When measuring growth starting in the fall semester, we matched on the fall test score in the same subject and the other subject, and the time between the fall and spring tests, for students in the same grade and year, in the matched school previously determined by Renaissance. Thus, a student in grade 2 in the Catholic school in school pair A in 2019 is matched to students in grade 2 in the public school in 2019 in that school pair. We standardized all test scores by subject, grade, and year. When measuring growth starting in the winter, we matched on the prior winter and fall scores in the same subject.

We incorporated entropy balancing following the matching step, in order to remove any remaining imbalance in matching variables via weighting. We estimated hierarchical models (Raudenbush & Bryk, 2002) with a random effect for each school (separately for each year), regressing the current score on the student-level matching variables and the interaction of grade and prior test scores, including an indicator for whether the school was Catholic, and including weights determined in the entropy balancing step. As an equation,

$$Y_{ij} = \gamma_{00} + \gamma_{01}Catholic_j + \gamma_{10g} + \gamma_{11g}Y_{ij}^1 + \gamma_{12g}Y_{ij}^2 + \gamma_{13g}T_{ij} + u_{0j} + r_{ij}$$

where Y_{ij} is the test score of interest in the current year for student i in school j ; $Catholic_j$ indicates whether the school was Catholic; γ_{10g} is a grade-specific intercept; Y_{ij}^1 is the student's prior score in the same subject (with grade-specific slope γ_{11g}); Y_{ij}^2 is the prior score in the other subject, or the second previous score in the same subject, with grade-specific slope γ_{12g} ; T_{ij} is the number of days between the current and prior tests, with grade-specific slope γ_{13g} ; u_{0j} is a random effect for school j , and r_{ij} is an error term. The coefficient of the Catholic indicator in this model is our estimate of the Catholic effect, adjusting for the potentially different slopes of pre-tests and time between tests in different grades.

Results

MAP Growth

Before the pandemic, Catholic schools' students' gains in 2018–19 were on average smaller than those of similar students in public schools: compared to public school students who had similar fall scores, the same race/ethnicity, and the same type of metro area, students in Catholic schools made gains that were 86.5% as large in math, and 89.3% as large in reading (see Table 2). In both subjects, gains in Catholic schools were larger relative to those in public schools for students

Table 2*Sector Gains During COVID Years as Percentage of 2018–19 Gains*

Subject	Grade	Sector Gain as Percentage of 2018–19 Public Gain				
		2018–19	2020–21		2021–22	
		Catholic*	Catholic	Public	Catholic	Public
Math	All	86.5	86.8	81.4	83.2	99.0
	K-5	86.5	84.5	80.7	82.4	99.3
	6-8	92.2	100.2	85.2	90.0	96.9
Reading	All	89.3	76.8	67.1	84.3	94.4
	K-5	89.6	79.8	71.9	85.4	97.5
	6-8	99.3	70.2	40.3	90.1	85.1

* By definition, the values for 2018–19 Public schools are 100.0.

with lower fall scores. Math and reading gains in Catholic schools were lower on average than in public schools in all grade ranges but were more similar in the middle grades for math. Gains for all race/ethnicity groups were lower in Catholic schools in 2018–19 than in public schools. Gains in all types of metro areas were lower in Catholic schools in 2018–19 (see [Table 3](#)).

In 2020–21, when public schools were more likely to institute remote instruction, these results largely reversed. In both subjects, gains in Catholic schools were larger than in public schools in 2020–21 (see [Table 2](#)). However, growth in Catholic schools in 2020–21 did not reach the level of public-school growth in 2018–19: Catholic school gains in 2020–21 were 86.8% of 2018–19 public school gains in math and 76.8% in reading, and were similar to growth in Catholic schools in 2018–19 in math, and worse in reading. The largest differences in growth in 2020–21 between Catholic and public schools occurred in reading in grades 6–8. Compared to public school growth in 2020–21, Catholic school growth in 2020–21 was better in all grade ranges, for all racial/ethnic groups (see [Table 3](#); although differences in math for white, Asian, and multi-racial students were small), and in all metro area types (except math in rural areas).

In 2021–22, when public schools had largely reopened for in-person instruction, growth differences mostly reverted to the pre-pandemic pattern (see [Table 2](#)). Growth in Catholic schools was lower than growth in public schools in 2021–22 (84% in math, 89% in reading), lower than growth in public schools in 2018–19 (83%, 84%), and slightly lower than growth in Catholic schools in 2018–19 (96% in math, 94% in reading). In one slight departure from the previous pattern, Catholic school growth in 2021–22 was better than 2021–22 public school growth in reading in grades 6–8, but not in math.

Catholic school growth in reading in 2021–22 was similar to public school growth in town areas (see [Table 3](#)); Catholic school growth in 2021–22 in town and rural settings outpaced

Table 3**Sector Gains as Percentage of Same-Group and Total Public Gains in 2018–19**

Subject	Subgroup	Sector Gain as Percentage of Same-Group 2018–19 Public Gain				Sector Gain as Percentage of 2018–19 Total Public Gain				
		2020–21		2021–22		2020–21		2021–22		
		Catholic	Public	Catholic	Public	Catholic	Public	Catholic	Public	
Math	Asian/Pacific	82.2	77.0	80.6	97.8	91.0	85.3	89.3	89.3	108.3
	Black	85.4	65.3	81.7	98.0	76.5	58.5	73.2	73.2	87.8
	Hispanic/Latino	89.2	74.7	84.3	99.9	86.5	72.4	81.7	81.7	96.8
	Multiple	86.3	77.4	81.4	98.9	84.6	75.9	79.8	79.8	96.9
	Other/NA*	83.8	86.7	80.4	96.5	85.2	88.2	81.8	81.8	98.1
	White	86.0	90.6	83.0	99.1	88.8	93.6	85.7	85.7	102.4
	Urban	86.7	83.4	83.9	99.3	84.1	80.9	70.5	81.3	96.3
	Suburban	85.8	86.5	81.4	98.6	86.9	87.6	78.2	82.5	99.9
	Town	91.9	99.8	90.2	100.5	93.0	101.1	97.8	91.4	101.7
	Rural	88.2	94.8	84.3	98.6	90.2	96.9	98.9	86.2	100.8
Reading	Asian/Pacific	85.4	68.7	82.0	91.7	96.9	77.9	69.1	93.0	104.1
	Black	86.4	56.5	80.8	93.1	73.7	48.1	37.0	68.9	79.4
	Hispanic/Latino	90.9	69.2	80.9	92.8	83.1	63.3	48.8	74.0	84.8
	Multiple	89.4	66.0	82.1	92.8	87.8	64.8	57.4	80.6	91.1
	Other/NA*	87.3	76.1	81.0	90.5	88.6	77.3	63.6	82.3	91.9
	White	89.5	80.6	86.1	96.0	95.7	86.2	82.2	92.0	102.7
	Urban	86.2	71.2	80.5	92.5	82.1	67.8	53.7	76.7	88.1
	Suburban	91.4	76.9	85.5	94.1	92.6	77.9	64.4	86.6	95.3
	Town	95.7	93.9	96.8	98.6	98.7	96.8	84.5	99.8	101.6
	Rural	91.2	87.6	86.3	96.9	95.9	92.1	88.5	90.7	101.9

* Other/NA includes students listed as “other,” those with no data, and American Indian or Alaska Native.

2018–19 public growth. Reading growth in Catholic schools in 2021–22 was similar to Catholic growth in 2018–19 in town settings. Growth in Catholic schools in 2021–22 was lower than in public schools in 2021–22 for all race/ethnicity groups, and Catholic schools' growth in 2021–22 was somewhat lower than public school growth in 2018–19 for all groups.

Interactions

While within-group comparisons may be useful, it is also important to compare each group to the population; there is no reason to expect different growth for students of different race/ethnicity or students from different types of metro areas if they have the same test scores in the fall (see [Table 3](#)). Thus, we examined the same comparisons of Catholic and public-school growth where the reference group is all students in the score group, rather than just the students with the same demographic background. For example, Asian students in Catholic schools in 2018–19 achieved 85.4% of the reading growth of similar-scoring Asian students in public schools in 2018–19, but this result is 96.9% of the reading growth of all students in public schools in 2018–19. Meanwhile, Black students in Catholic schools in 2018–19 achieved 85.4% of the math growth of similar-scoring Black students in public schools in 2018–19 (and 86.4% of reading growth), but this figure amounted to just 76.5% of the math growth (73.7% of reading growth) of all similar-scoring students in public schools in 2018–19. Thus, the apparent Catholic effect that appears in 2020–21 is not the same for all groups.

As detailed in [Table 3](#), Asian students in Catholic schools in 2020–21 outgrew similar-scoring Asian students in public schools in math and reading (achieving 77% and 68.7% of the gains made by Asian students in public schools in 2018–19 in math and reading respectively, compared with 76.1% and 60.9% for 2020–21 Asian students in public schools), and outgrew all similar-scoring students regardless of race/ethnicity in reading (77.9% vs. 69.1%), but not in math (85.3% vs. 89.3%). Meanwhile, Black students in Catholic schools in 2020–21 outgrew similar-scoring Black students in public schools in math and reading, while growing more than the average of all similar-scoring students in public schools in reading, but less in math; the same was true, to a lesser degree, for Hispanic/Latino students. This pattern shifted in 2021–22: Black and Hispanic/Latino students in Catholic schools did not perform as well as students of the same race/ethnicity in public schools, but still performed better relative to these students than to the population of all students. Thus, Black and Hispanic/Latino students' growth appears larger relative to similar-scoring Black and Hispanic/Latino peers in public schools than relative to similar-scoring students of all racial/ethnic groups; the reverse is typically true for Asian and White students. Because we lacked further information about the schools these students attended, we could not determine the effect of concentrated poverty, neighborhood segregation, or other factors, on these results.

Table 4*Estimated Catholic Effect by Year, Subject, and Time Period in Renaissance Star Data*

Term	Year	Math		Reading	
		Estimate	SE	Estimate	SE
Fall to Spring	2019	-0.067*	0.022	0.017	0.013
	2021	0.003	0.028	0.094*	0.017
	2022	-0.111*	0.027	0.062*	0.017
Fall to Winter	2019	-0.058*	0.018	0.009	0.012
	2020	-0.054*	0.019	0.024*	0.011
	2021	0.023	0.023	0.060*	0.013
	2022	-0.056*	0.023	0.020	0.015
Winter to Winter	2020	-0.007	0.011	0.024*	0.012
	2021	0.055*	0.011	0.098*	0.010
	2022	-0.013	0.015	0.011	0.014

Note. * Indicates statistical significance at $p < 0.05$.

Renaissance Star

In [Table 4](#), we report the estimated Catholic effect (from the statistical model detailed earlier) for each year and subject. We show results for fall to winter (matching on fall pretests in both subjects), fall to spring (matching on pretests in both subjects), and winter to winter (with pre-tests in the same subject, in winter and the immediately prior fall), with data from a kernel pairwise match (results with kernel cross-validated matching, and nearest-neighbor matching, follow similar patterns).

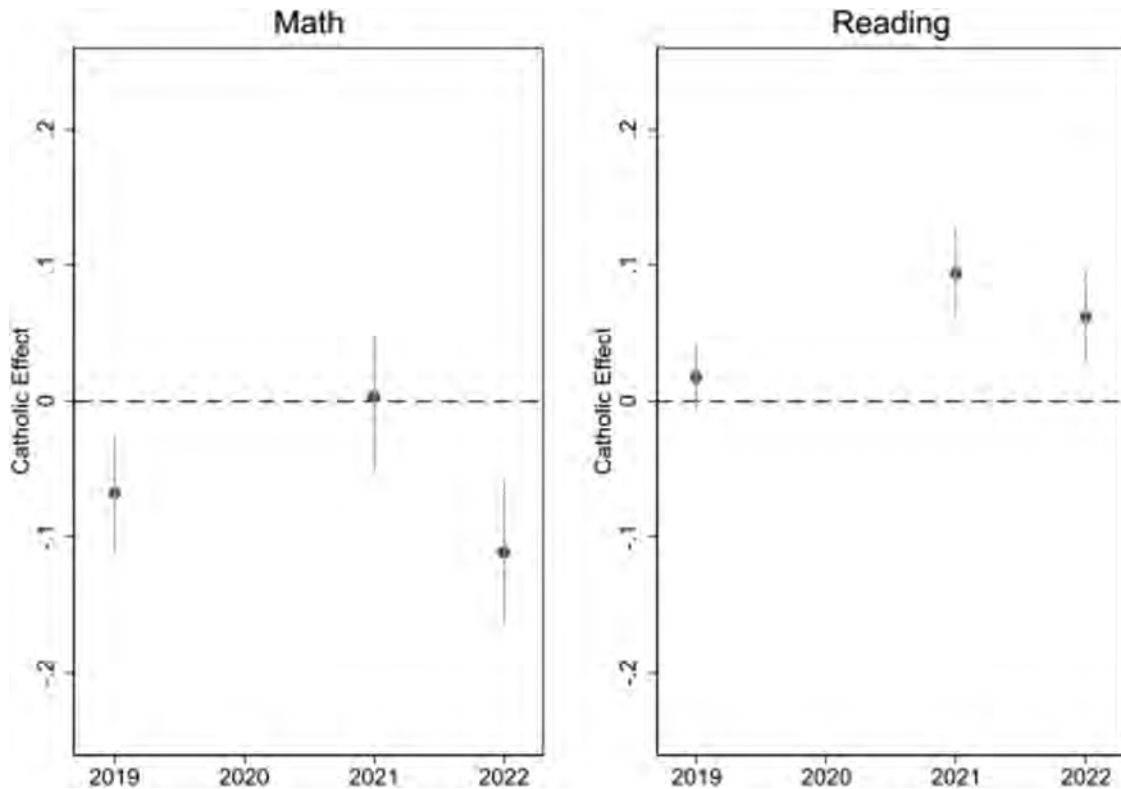
As shown in [Table 4](#), and [Figures 1](#) (fall to spring), [2](#) (fall to winter), and [3](#) (winter to winter), in pre-pandemic data, we found no difference between students in Catholic and public schools in math, or a small public school advantage; in pre-pandemic reading data, we saw no difference, or a small Catholic school advantage. During the height of pandemic mitigation efforts—fall to winter and fall to spring of the 2020–21 school year, and winter 2019–20 to winter 2020–21—the previous public-school advantage disappeared in math (and became a Catholic school advantage in the winter-to-winter measure), and in reading, the null or small Catholic school effect increased. Then, when we examined measures that included the 2021–22 school year, all Catholic effects declined, with almost all results returning to pre-pandemic levels.

Interactions

Prior research has found that Catholic schools may be differentially effective for some groups of students. Lacking student demographic data, we examined whether the measured Catholic school effects were consistent across grade levels, and across levels of incoming achievement. We did this

Figure 1

Catholic Effect by Year and Subject in Renaissance Star Data, Fall to Spring, Matching on Other-Subject Fall Score



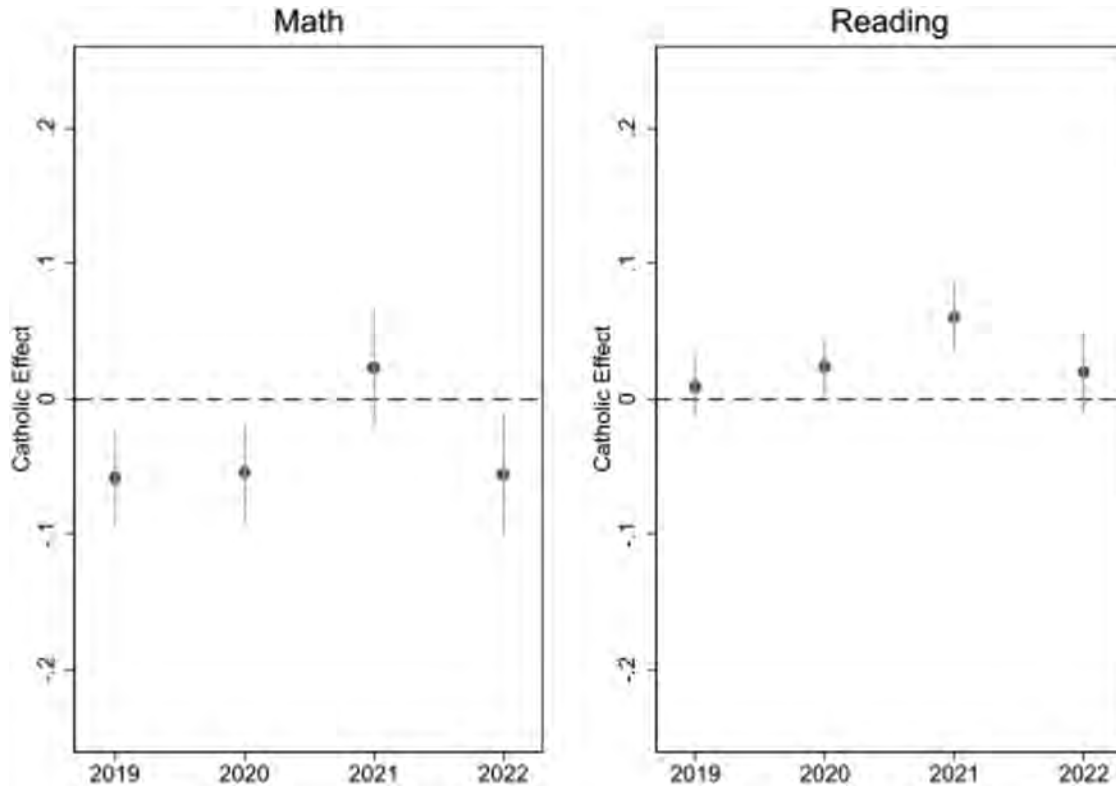
by adding an interaction term to the model, allowing for a separate Catholic school effect for students in upper grades, or for students whose prior test score was at or above the 50th percentile. Students in grades 6-8 in Catholic schools either scored similarly to, or better than, their matched peers in these grades in public schools, as shown in [Table 5](#). We show estimates for one matching method, kernel pairwise matching, because results for the other methods were similar.

Students with initial scores at or above the 50th percentile in Catholic schools either scored similarly to, or slightly worse than, their matched peers in public schools, as shown in [Table 6](#). We again show estimates for one matching method, kernel pairwise matching, because results for the other methods were very similar.

The above results suggest that Catholic schools demonstrated more growth during the 2020–21 school year. This may be due to the greater likelihood that Catholic schools offered in-person instruction. We examine this more closely by following students who had complete data: test scores in fall 2018, winter 2018–19, spring 2019, fall 2019, winter 2019–20, fall 2020, spring

Figure 2

Catholic Effect by Year and Subject in Renaissance Star Data, Fall to Winter, Matching on Other-Subject Fall Score



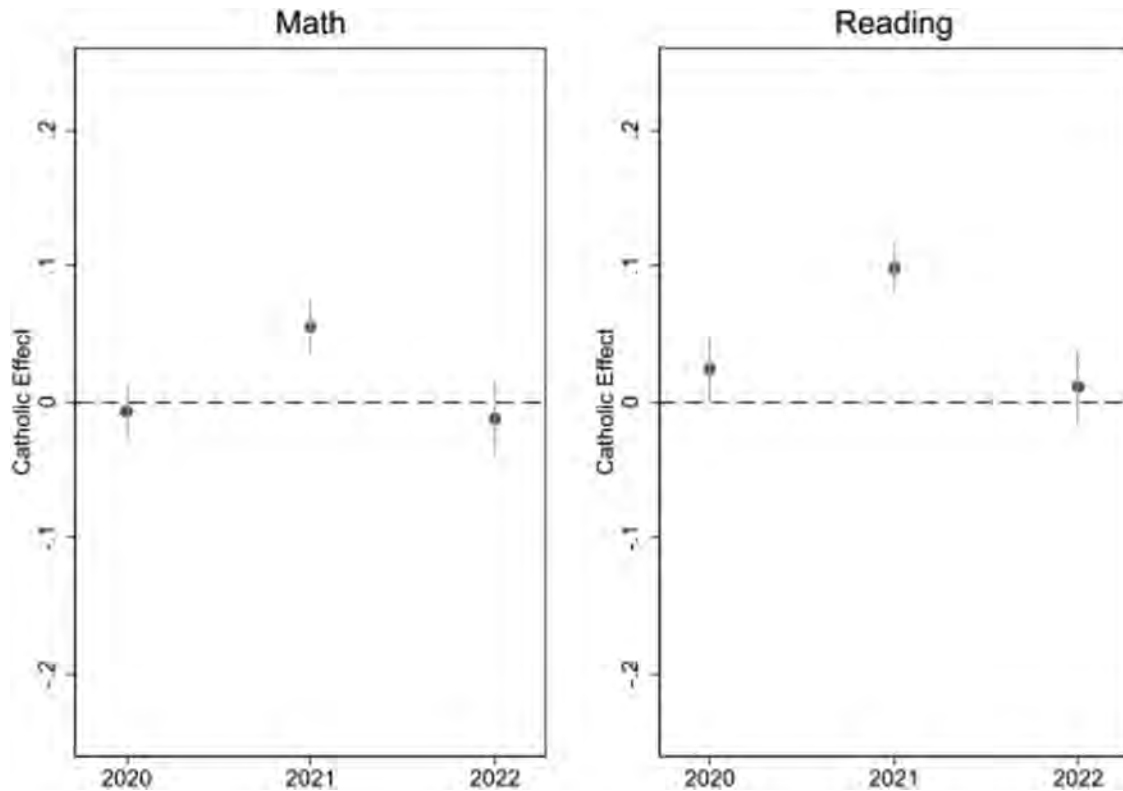
2021, fall 2021, and spring 2022. We used the same matching procedures and statistical models to estimate differences for this cohort, and found that the gap between initially similar students in matched Catholic and public schools widened during 2020–21 and began to shrink back to its pre-pandemic size in 2021–22, as shown in [Figure 4](#) and [Table 7](#).

Discussion

Our descriptive analyses of NWEA MAP Growth data, comparing groups of similarly achieving students in similar school contexts, suggest a positive impact on student achievement on these assessments in math and reading in grades K-8 in Catholic schools during the 2020–21 school year, when Catholic schools were more likely to offer in-person instruction than public schools. This positive impact appears to have shrunk or disappeared during the 2021–22 school year as public schools reopened for in-person instruction. These effects were not felt by all groups equally, however, illustrating the importance of comparisons that are not just group-to-same-group, but group-to-other-groups as well: absent any mitigating factors, students with

Figure 3

Catholic Effect by Year and Subject in Renaissance Star Data, Winter to Winter, Matching on Same-Subject Fall Score



similar pretest scores should show similar rates of growth, and if this is not the case, the resulting differences should be examined. Per our analyses, there are greater growth gaps over this time for Black, Hispanic/Latino, and multi-race students, compared to the growth rates of White and Asian students. This suggests that more attention should be devoted to closing growth gaps in Catholic schools. These findings also emphasize the importance of collecting student demographic data, which is often incomplete in private school data collection; without it, such comparisons cannot be made.

Our matched student analyses of Renaissance Star data, where we compared similarly achieving students in similar school contexts, also suggest a positive impact on student achievement on the Star assessments in math and reading in grades 1-8 in Catholic schools during the 2020–21 school year, which then shrunk or disappeared during the 2021–22 school year as public schools fully reopened. These findings provide suggestive evidence of the importance of in-person instruction for achievement growth, complementing findings from previous examinations of in-person versus remote learning (Darling-Aduana et al., 2022; Kogan & Lavertu, 2021; Sass & Goldring,

Table 5*Catholic Effect and Upper Grades Catholic Effect by Year, Subject, and Test Pair in Renaissance Star Data*

Term	Year	Math				Reading			
		Catholic		Catholic*Upper Grades		Catholic		Catholic*Upper Grades	
		Estimate	SE	Estimate	SE	Estimate	SE	Estimate	SE
Fall to Spring	2019	-0.088*	0.029	0.053	0.052	-0.009	0.016	0.068*	0.024
	2021	-0.033	0.038	0.088	0.059	0.045	0.025	0.112*	0.036
	2022	-0.150*	0.035	0.108*	0.053	0.038	0.020	0.060	0.031
Fall to Winter	2019	-0.092*	0.024	0.092*	0.034	-0.015	0.016	0.060*	0.025
	2020	-0.061*	0.025	0.019	0.039	-0.005	0.014	0.070*	0.022
	2021	0.003	0.031	0.051	0.047	0.050*	0.022	0.023	0.034
	2022	-0.094*	0.025	0.099	0.051	0.005	0.019	0.038	0.030
Winter to Winter	2020	-0.074*	0.013	0.168*	0.018	-0.003	0.014	0.090*	0.025
	2021	0.006	0.016	0.127*	0.023	0.077*	0.012	0.078*	0.022
	2022	-0.097*	0.019	0.173*	0.027	0.004	0.017	0.039	0.027

Note. * Indicates statistical significance at $p < 0.05$.

Table 6*Catholic Effect and Higher-Scoring Catholic Effect by Year, Subject, and Test Pair in Renaissance Star Data*

Term	Year	Math				Reading			
		Catholic		Catholic*At or above 50th		Catholic		Catholic*At or above 50th	
		Estimate	SE	Estimate	SE	Estimate	SE	Estimate	SE
Fall to Spring	2019	-0.027	0.034	-0.058*	0.029	0.022	0.019	-0.006	0.018
	2021	0.049	0.036	-0.070*	0.031	0.117*	0.022	-0.040	0.022
	2022	-0.097*	0.035	-0.021	0.028	0.077*	0.025	-0.026	0.022
Fall to Winter	2019	-0.081*	0.026	0.032	0.029	0.010	0.017	-0.001	0.015
	2020	-0.057*	0.027	0.004	0.024	0.044*	0.017	-0.035*	0.017
	2021	0.043	0.029	-0.030	0.025	0.078*	0.017	-0.031	0.020
	2022	-0.037	0.032	-0.028	0.026	0.011	0.022	0.015	0.021
Winter to Winter	2020	0.016	0.015	-0.036*	0.014	0.040*	0.015	-0.031*	0.013
	2021	0.101*	0.018	-0.062*	0.017	0.126*	0.016	-0.044*	0.015
	2022	-0.005	0.020	-0.029	0.018	0.014	0.019	0.002	0.017

Note. * Indicates statistical significance at $p < 0.05$.

Figure 4

Catholic Effect by Term and Subject in Renaissance Star Data: Students Tested at All Time Points Beginning in Fall 2018

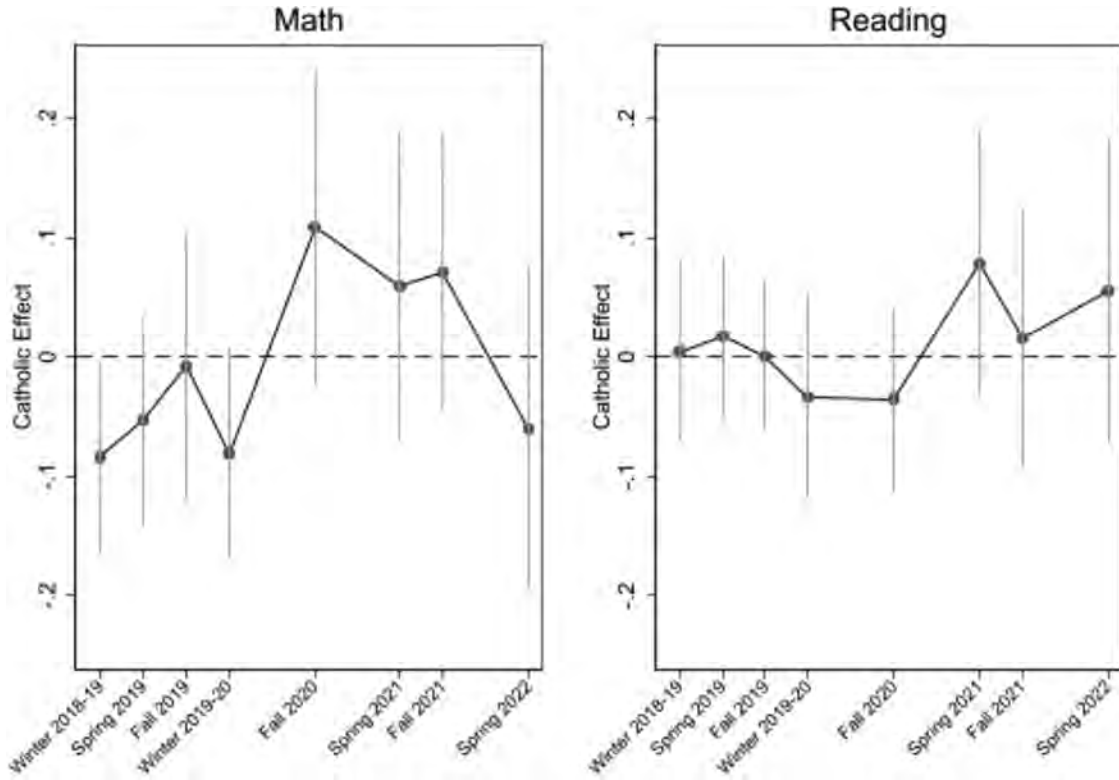


Table 7

Catholic Effect by Term and Subject in Renaissance Star Data: Students Tested at All Listed Time Points Beginning in Fall 2018

Term	Math		Reading	
	Estimate	SE	Estimate	SE
Winter 2018–19	-0.084*	0.042	0.005	0.039
Spring 2019	-0.053	0.045	0.018	0.035
Fall 2019	-0.008	0.058	0.001	0.032
Winter 2019–20	-0.081	0.045	-0.033	0.045
Fall 2020	0.109	0.068	-0.035	0.040
Spring 2021	0.059	0.066	0.078	0.057
Fall 2021	0.071	0.060	0.016	0.055
Spring 2022	-0.060	0.069	0.055	0.065

Note. * Indicates statistical significance at $p < 0.05$.

2022; Tomasik et al., 2021). These analyses also echo previous findings of lower achievement in online charter schools compared to brick-and-mortar charter schools (Ahn & McEachin, 2017; Fitzpatrick et al., 2020).

When Catholic schools returned to in-person learning, despite necessary changes to the learning environment to meet health and safety protocols (Kowalski & Ponisciak, 2021), these analyses suggest that students, particularly middle grades students, experienced more growth than public school students who were primarily learning remotely. Further, when public schools returned to in-person learning in 2021–22, students returned to similar levels of growth as Catholic school students, providing further support for the benefits of in-person instruction.

In retrospect, the decision to reopen schools for in-person learning seems to be a positive decision from an educational standpoint. However, several studies have offered mixed evidence on whether there were tradeoffs for community health outcomes and an increase in pandemic spread related to resuming in-person instruction (Chernozhukov et al., 2021; Ertem et al., 2021; Fukumoto et al., 2021).

Although schools have reopened and COVID-19 no longer poses the same threat to public health, this study provides support for continued attention toward improving remote learning. With remote learning in its infancy, available primarily in online charter schools in 2020, educators were not prepared to make the sudden switch to teaching remotely. Through trial and error, teachers had to assist students in learning while encountering issues related to technology, parent availability, and student engagement (Chiu, 2021; Domina et al., 2021). Online learning platforms, the Internet, and technological devices make learning in the home feasible and an attractive option for some students and families. Educators should continue to pursue improving this mode of instruction in non-pandemic times, allowing for experimentation under more stable conditions to determine what is successful and what aspects of remote instruction need improvement in preparation for future uncertainty.

While these matched analyses attempt to account for selection into Catholic schools, they are still aggregate findings that may obscure important group differences in student achievement during the different phases of the pandemic. In order to consider whether pandemic learning introduced greater variation among students as some analyses have demonstrated (Kuhfeld et al., 2022), more demographic information is needed. Additional data entered in the optional data fields during the interim test registration process at the school level, particularly for Catholic schools, can assist in advancing future research on group differences.

This work is subject to several limitations. First, we examine interim test data and to be included in the analysis, students needed test data at multiple time points. On average, we have found that students with more test scores usually have higher scores. Thus, our estimates may not capture the full range of students. In addition, because of the requirement of data at multiple

time points, our analyses do not take into account students who moved from a public school to a Catholic school during this period. Further, during this time some public school students took interim tests remotely and therefore had possibly less supervision, but potentially greater help from adults compared to in-school test administration. In addition, although Star assessments are used nationally, the tested students may not be fully representative of either Catholic or public schools and students. Finally, we were unable to match closed and open schools due to data limitations; therefore, our findings are only suggestive of an in-person difference in achievement during this time. To further investigate this question from a causal perspective, students attending in-person would need to be matched directly with students attending remotely.

Conclusion

The decision to shift the format of instruction in a school to remote learning for reasons of health and safety are complex and rely on data from multiple perspectives. Unfortunately, weighing the ultimate positive and negative consequences of actions in real time is not usually possible. However, careful examination of previous decisions can assist with similar choices and situations in the future. Our analyses suggest that student learning suffers when schools use remote instruction. The academic progress of students, while perhaps second to health, is important for policymakers, school and district leaders, and parents to consider in the event of a similar health event affecting the population.

Because of the importance of health safety, educators should continue to develop, strengthen, and improve the content and delivery of remote instruction to better serve students in the event that remote instruction again becomes necessary. Although traditional instruction appears to outpace remote instruction, further innovation, technology, and experience may result in improved outcomes for remote learning over time.

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Appendix

Table A1
Number of Students by Sector, Year, Subject, and Grade

MAP Growth		Catholic				Public			
	Grade	2019	2020	2021	2022	2019	2020	2021	2022
Math	K	14220		14565	19005	380514		251302	404617
	1	19574		18881	26154	518832		367518	564354
	2	24095		24035	30863	616091		450776	639893
	3	25636		25580	32509	615571		477719	616127
	4	26580		25691	32267	608051		482831	616742
	5	26960		25705	32361	619500		485848	617938
	6	26697		25718	32009	604540		446221	576925
	7	23712		23460	30323	527456		414958	565080
	8	21390		19340	25572	466085		352009	485516
	K	14448		14142	18582	383529		241891	353736
Reading	1	19776		18692	25597	493292		357848	494547
	2	24018		23561	30396	607324		442297	579793
	3	25261		25285	32097	602055		467345	588262
	4	26181		25682	31993	587521		464816	591994
	5	26463		25488	32114	604351		465029	593088
	6	26377		25540	31820	581264		434246	559133
	7	23325		23482	30229	520022		411055	550668
	8	21248		21703	28088	468992		392632	539137
Renaissance Star		Catholic				Public			
	Grade	2019	2020	2021	2022	2019	2020	2021	2022
Math	1	16358	14485	14782	9543	42953	43099	37173	23831
	2	18859	18128	17538	13000	49833	49059	45020	32278
	3	19081	18599	17997	13224	45332	46147	41893	30580
	4	19057	18340	18038	13521	42108	42357	39664	28437
	5	19279	18111	17784	12460	35355	35653	33449	25106
	6	16517	15951	15280	11117	87677	86362	82277	62950
	7	15473	15079	14821	10176	71127	72827	70319	54505
	8	14985	14731	14317	11124	64195	66746	66850	52613
Reading	1	14159	12452	12679	7609	33222	28879	23471	14867
	2	16429	16075	15333	11670	43786	43069	37786	29389
	3	16289	16243	15629	12040	41790	41558	36220	28702
	4	16396	15742	15504	11746	39786	39919	35415	26356
	5	16368	15871	15142	10817	36949	36125	31582	24895
	6	13099	12891	12226	9308	63268	63019	55253	43172
	7	11855	11567	11407	8085	45915	46797	42674	31759
	8	11353	11210	10721	8289	47026	48117	44511	35922

Table A2*Number of Students by Metropolitan Type in MAP Growth data*

	Metro Type	Catholic			Public		
		2019	2021	2022	2019	2021	2022
Math	City, Large	60594	44805	68747	990522	684655	1014946
	City, Mid-size	17165	17231	21455	278666	219218	313233
	City, Small	21286	25886	31091	378868	258129	348069
	Rural, Distant	3346	3056	3224	247182	198557	238844
	Rural, Fringe	4503	4923	5832	467966	393865	485334
	Rural, Remote	971	1031	794	63580	58053	54525
	Suburb, Large	72797	74010	93036	1850688	1374226	1972948
	Suburb, Mid-size	6051	6064	7306	134921	104497	129842
	Suburb, Small	1637	1749	2830	57588	44933	62705
	Town, Distant	10228	13293	14345	253308	204743	238717
	Town, Fringe	3709	3335	3923	105225	84165	102479
	Town, Remote	6587	7592	8480	128145	104141	125550
Reading	City, Large	60600	45198	67910	915979	675296	932043
	City, Mid-size	16851	17251	21320	266670	208540	294485
	City, Small	20773	25943	31474	371226	242578	330177
	Rural, Distant	3247	3057	3251	247262	200241	240675
	Rural, Fringe	4535	4850	5860	460505	398873	469401
	Rural, Remote	960	993	713	61383	59042	53584
	Suburb, Large	72511	74486	93569	1866888	1367878	1882837
	Suburb, Mid-size	5750	5865	7204	123794	94632	125528
	Suburb, Small	1600	1762	2822	56818	44694	60632
	Town, Distant	10110	13349	14565	247275	202426	239905
	Town, Fringe	3709	3288	3836	105044	83206	99322
	Town, Remote	6451	7533	8416	125506	99753	121769

Table A3*Student Demographics in Catholic and Public Schools in MAP Growth Data*

	Race/Ethnicity	Catholic			Public		
		2019	2021	2022	2019	2021	2022
Math	Total N	208874	202975	261063	4956659	3729182	5087192
	American Indian or Alaska Native	0.2	0.0	0.1	0.3	0.0	0.1
	Asian	2.6	2.0	2.7	3.1	2.8	3.4
	Black	8.5	5.9	7.2	14.5	11.1	12.9
	Hispanic/Latino	12.8	11.1	13.5	18.4	20.3	22.2
	Multiple	3.9	4.2	4.6	2.9	3.4	3.8
	NA/Other	12.5	14.1	14.2	5.3	4.5	4.4
	White	59.4	62.6	57.7	55.5	57.9	53.1
	Reading	Total N	207097	203575	260940	4848350	3677159
American Indian or Alaska Native		0.2	0.0	0.0	0.3	0.0	0.0
Asian		2.6	2.1	2.8	3.1	3.1	3.7
Black		8.4	5.8	7.0	14.6	11.1	13.0
Hispanic/Latino		12.8	11.1	13.4	17.4	19.2	20.7
Multiple		3.9	4.2	4.5	2.8	3.3	3.6
NA/Other		12.7	14.0	14.2	5.3	4.5	4.6
White		59.5	62.8	58.1	56.4	58.8	54.3

Table A4*Number of Schools and Proportion of Students by Metropolitan Type in Renaissance Star Data*

Metropolitan Type	Math				Reading			
	Number of Schools		Percentage of Students		Number of Schools		Percentage of Students	
	Catholic	Public	Catholic	Public	Catholic	Public	Catholic	Public
Urban	152	152	12	16	183	183	18	20
Suburban	521	521	72	71	481	481	68	68
Town	140	140	10	11	130	130	9	10
Rural	80	80	6	2	53	53	4	1

Table A5

Student Demographics in Renaissance Star Catholic and Public School Data, Average over Years 2018–19 to 2021–22

Grades		Catholic				Public				
		Math		Reading		Math		Reading		
		1-5	6-8	1-5	6-8	1-5	6-8	1-5	6-8	
N		328184	169571	284193	132011	769327	838448	673766	567433	
Race/Ethnicity	Asian	3.3	4.1	1.6	2.3	7.8	5.9	6.2	5.1	
	Black	1.1	1.0	0.7	0.8	4.2	6.7	2.8	4.2	
	Hispanic	7.3	9.6	1.6	2.5	6.5	9.5	10.0	11.0	
	Multiple	2.3	2.6	0.9	1.4	2.5	2.3	2.1	2.0	
	Native American	0.1	0.1	0.0	0.0	0.8	1.0	0.6	0.9	
	Native Hawaiian	0.4	0.2	0.2	0.1	1.1	0.2	0.8	0.1	
	White	14.2	17.0	9.7	12.0	39.6	44.0	33.6	36.2	
	Unknown or Other	71.3	65.4	85.3	80.9	37.4	30.5	44.0	40.3	
	Gender	Female	32.4	32.6	28.8	29.7	39.2	40.6	38.0	39.0
		Male	31.7	31.9	28.4	29.0	40.8	42.3	39.5	40.8
Unknown		35.8	35.4	42.8	41.3	19.9	17.1	22.5	20.2	