
Do Charter Schools Improve Student Achievement? Evidence from a National Randomized Study

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Policy Context

- **Charter schools are publicly financed, freed from many regulations**
- **Several other countries follow similar models**
- **Central to current U.S. education reform efforts**
 - **Currently serve 1.7 million public school students (3.5%) in 40 states and DC**
 - **Likely to further expand under Race to the Top**

Research on Charter Schools

- **Fixed-effects studies**
 - Include several districts or states
 - Typically find insignificant or negative impacts
- **Lottery-based studies**
 - Rigorous experimental designs
 - Focused on single urban areas or state
 - Large positive impacts

Contribution of the Mathematica Study

- **First multi-state, randomized study of charter school impacts**
 - 36 charter middle schools in 15 states
 - Lotteries monitored to ensure results truly random
- **Findings**
 - No impact on student achievement overall
 - Significant variation across schools
 - Positive impacts in more disadvantaged schools, schools in urban areas

Study Design

Recruitment of Charter Schools Into the Study

- **Eligibility for inclusion**
 - Middle schools
 - At least two years' experience as charter schools
 - Oversubscribed; hold admissions lotteries
- **Contacted nearly 500 potentially eligible charter middle schools over two years**
- **Final school sample included 36 charter middle schools in 15 states**
 - 2005-06 and 2006-07 school years

Study Versus Non-Study Charter Schools

Similarities

- Location, size, and operating structure
- Revenues and facilities
- Time in school and use of ability grouping
- Principal experience/education
- Autonomy
- Proportion of students with IEPs

Differences

Study schools had:

- More experienced teachers
- More white (53% vs. 38%) and fewer black (16% vs. 29%) students
- Fewer disadvantaged students (44% vs. 62%)
- More students meeting state proficiency standards (e.g., 66% vs. 51% in math)

Experimental Design Based on Admissions Lotteries

- **Careful monitoring of lotteries**
- **Sample: 2,330 applicants to study charter schools**
 - Treatment group: 1,400 offered admission to charter school
 - Control group: 930 not offered admission
- **Key outcomes: reading and math test scores**
 - State/district administrative records
 - Two years of follow-up
 - Converted to z-scores

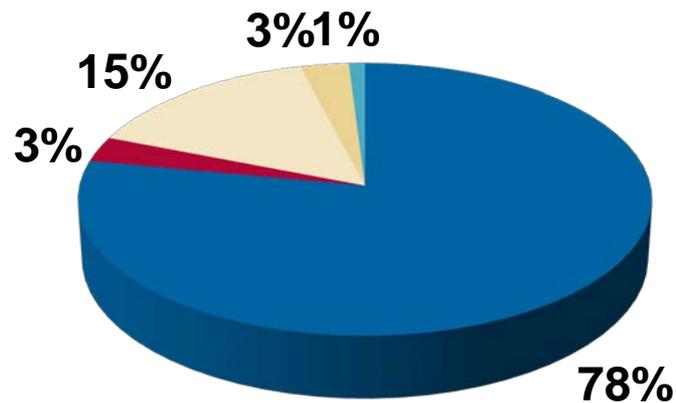
Treatment and Control Groups Similar at Baseline

Characteristic	Treatment	Control
Average Test Scores (percentile)		
Reading	66.6	67.4
Math	67.7	67.7
Number of Absences	5.94	5.49
Race/Ethnicity		
% white	60%	57%
% black	11%	10%
% Hispanic	27%	29%
Age (years)	11.52	11.51
% certified for free or reduced price meals	34%	34%

NOTE: No statistically significant differences between treatment and control groups.

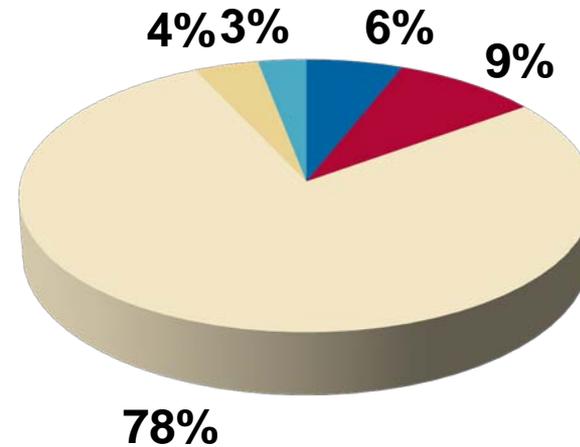
Type of School Attended in Year 1

Treatment Students



- Study charter
- Other charter

Control Students



- Traditional public
- Private
- Other/Unknown

Estimating Charter School Impacts

- **Impact of charter school admission (ITT)**

- Estimate OLS model of site-level impacts δ_j

$$Y_{ij} = X_{ij}\beta + \delta_j T_{ij} + e_{ij}$$

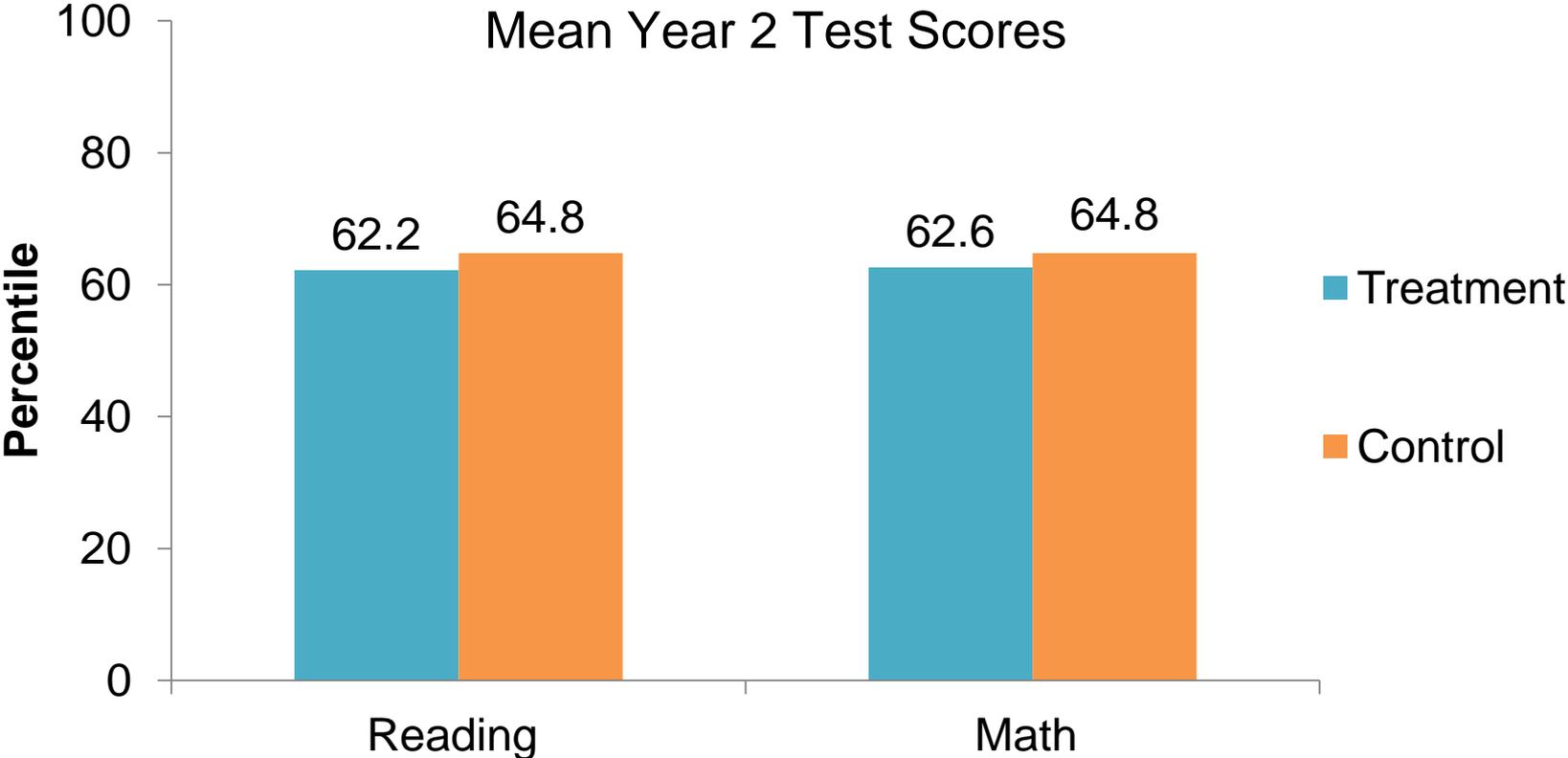
- Average impacts δ_j across sites to get estimate impact of charter school admission

- **Impact of charter school attendance (TOT)**

- Same approach, with lottery result as instrumental variable for attendance

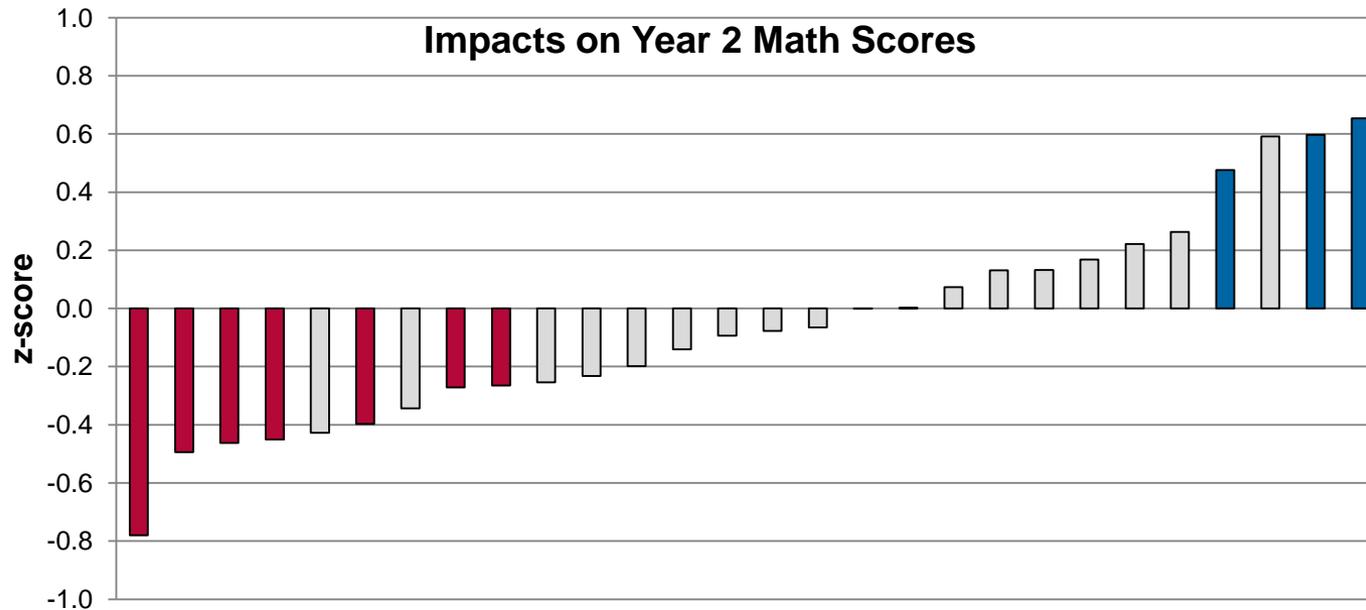
Results

No Significant Impacts on Student Achievement



NOTE: No statistically significant differences between treatment and control groups after adjustment for the multiple hypotheses tested.

Significant Variation in Site-Level Impacts



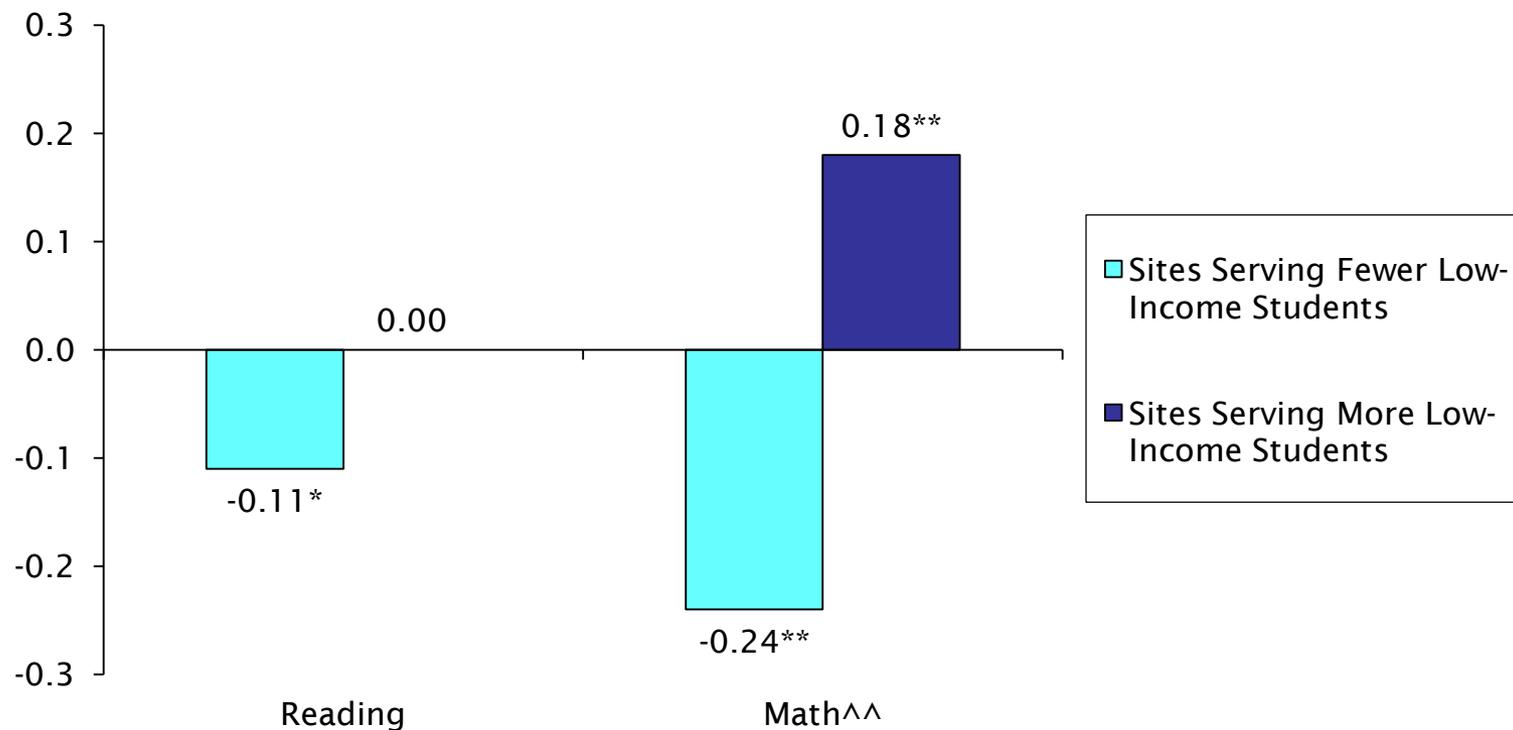
Colored bars are statistically significant impacts at the 0.05 level, two-tailed test.
Variation in impacts is statistically significant at the 0.01 level, two-tailed test.

Range: -0.78 to 0.65 (Math) -0.43 to 0.33 (Reading)
Standard Deviation: 0.36 (Math) 0.24 (Reading)

Impacts Greater in More Disadvantaged, Urban Sites

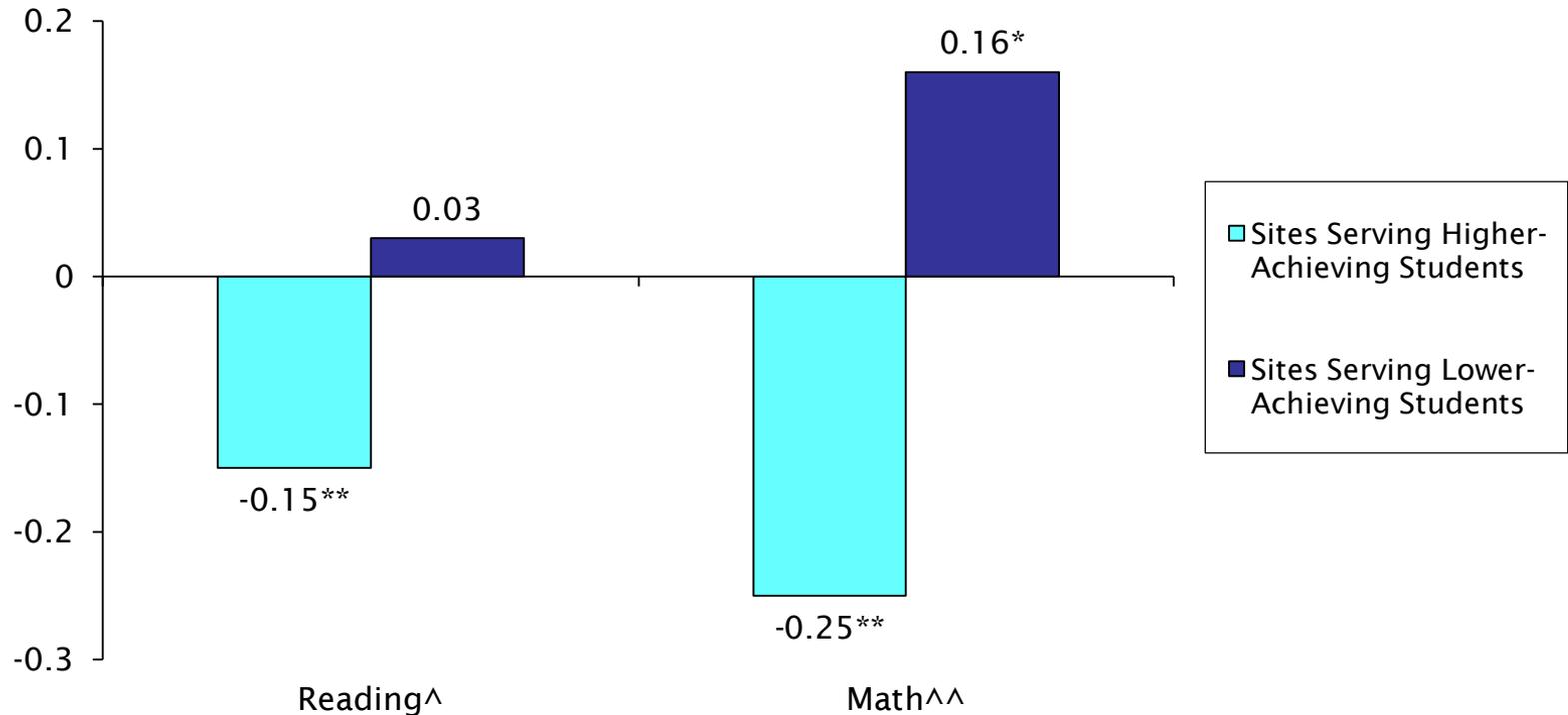
Subgroup categories	Significant difference in impacts?
% Certification for free/reduced-price lunch	Yes
Average baseline achievement	Yes
Urbanicity	Yes

Impacts on Year 2 Test Scores, by Site Characteristics (Percentage Eligible for Free or Reduced-Price Meals)



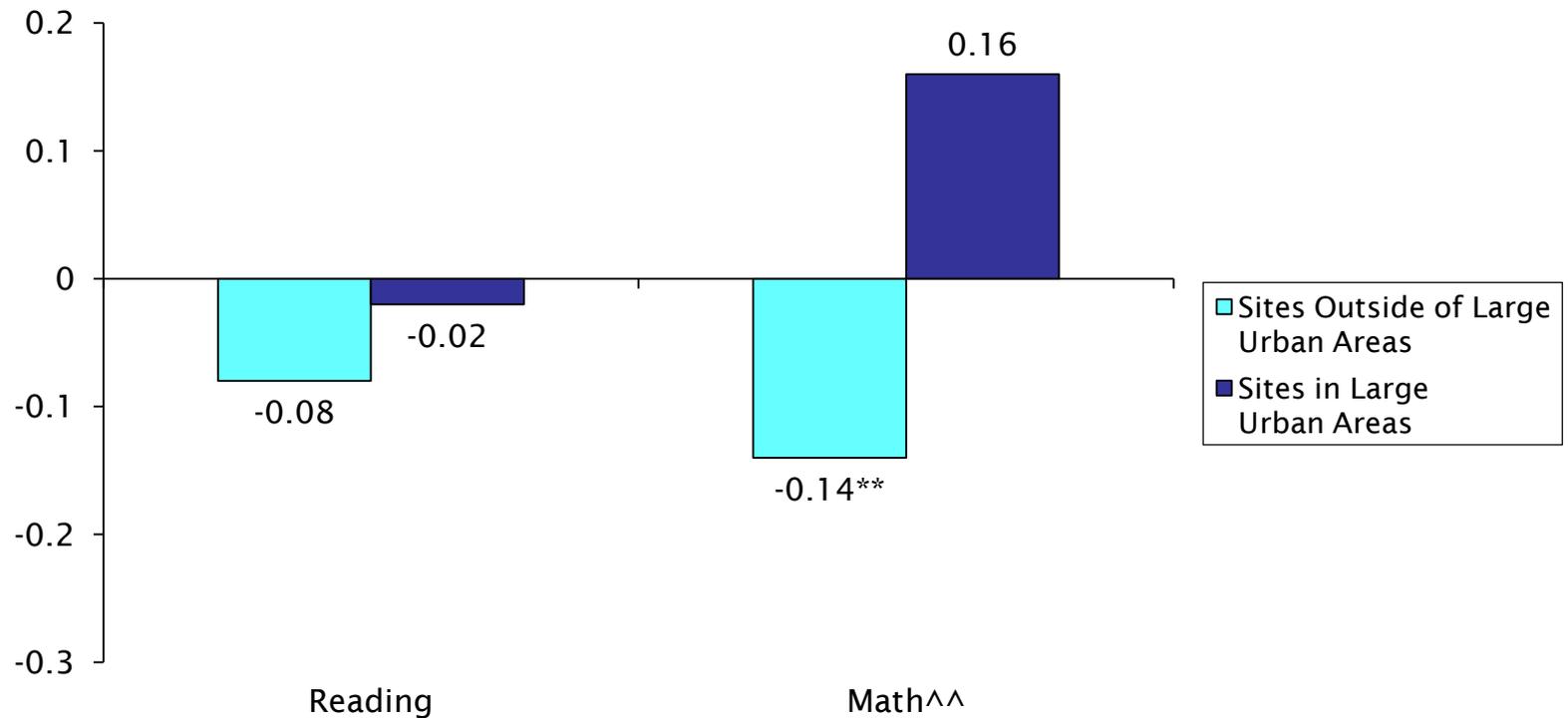
Statistically significant at the 0.05 (*) or 0.01 (**) level after multiple comparison adjustment.
Difference between subgroups significant at the 0.05 (^) or 0.01 (^) level after multiple comparison adjustment.

Impacts on Year 2 Test Scores, by Site Characteristics (Students' Baseline Achievement Levels)



Statistically significant at the 0.05 (*) or 0.01 (**) level after multiple comparison adjustment.
Difference between subgroups significant at the 0.05 (^) or 0.01 (^^) level after multiple comparison adjustment.

Impacts on Year 2 Test Scores, by Site Characteristics (Urbanicity)



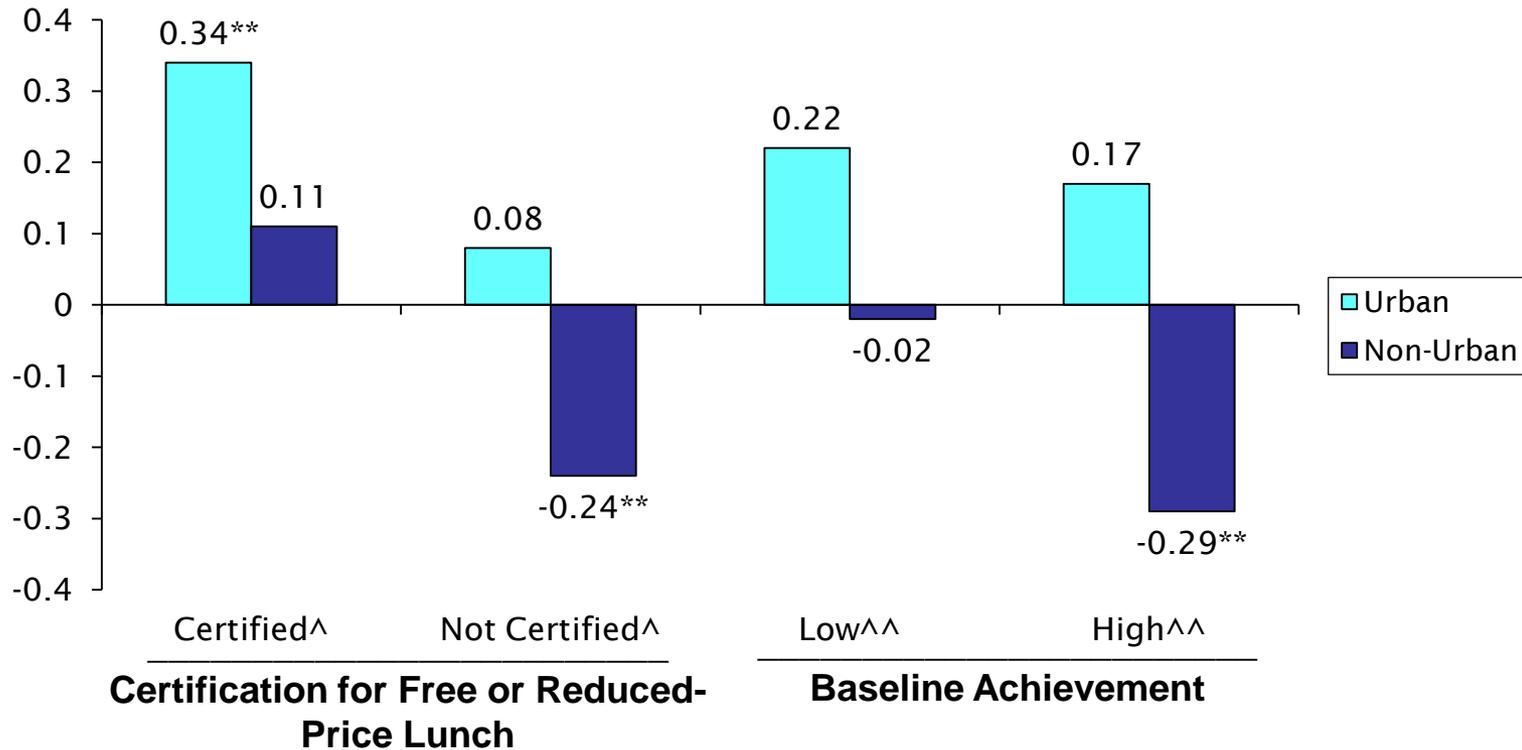
Statistically significant at the 0.05 (*) or 0.01 (**) level after multiple comparison adjustment.
Difference between subgroups significant at the 0.05 (^) or 0.01 (^^) level after multiple comparison adjustment.

Why Do Impacts Vary Across Sites?

Why Are Impacts Greater in More Disadvantaged Sites?

- 1. Are charter schools more effective for the populations served by the urban schools?**
 - Examine urban/suburban difference in impacts by student subgroup
- 2. Are urban charter schools stronger than non-urban charter schools?**
 - Examine correlation of impacts and mean achievement in treatment schools
- 3. Are urban comparison schools weaker than non-urban comparison schools?**
 - Examine correlation of impacts and mean achievement in control schools

Differences in Urban and Non-Urban Impacts Persist Even Within Student Subgroups



Statistically significant at the 0.05 (*) or 0.01 (**) level after multiple comparison adjustment. Difference between subgroups significant at the 0.05 (^) or 0.01 (^^) level after multiple comparison adjustment.

No Significant Correlation Between Impacts and Achievement in Treatment Schools

	Correlation of Impacts and Mean Scores for	
	Treatment Group	
Year 2 Reading	0.07	
Year 2 Math	0.18	
Number of Sites	28	

Correlation statistically significant at the 0.05 (†) or 0.01 (††) level before adjustment for multiple hypothesis testing.

Site-Level Impacts Significantly Negatively Correlated with Control Group Means

	Correlation of Impacts and Mean Scores for	
	Treatment Group	Control Group
Year 2 Reading	0.07	-0.39†
Year 2 Math	0.18	-0.41†
Number of Sites	28	28

Correlation statistically significant at the 0.05 (†) or 0.01 (††) level before adjustment for multiple hypothesis testing.

Summary of Findings

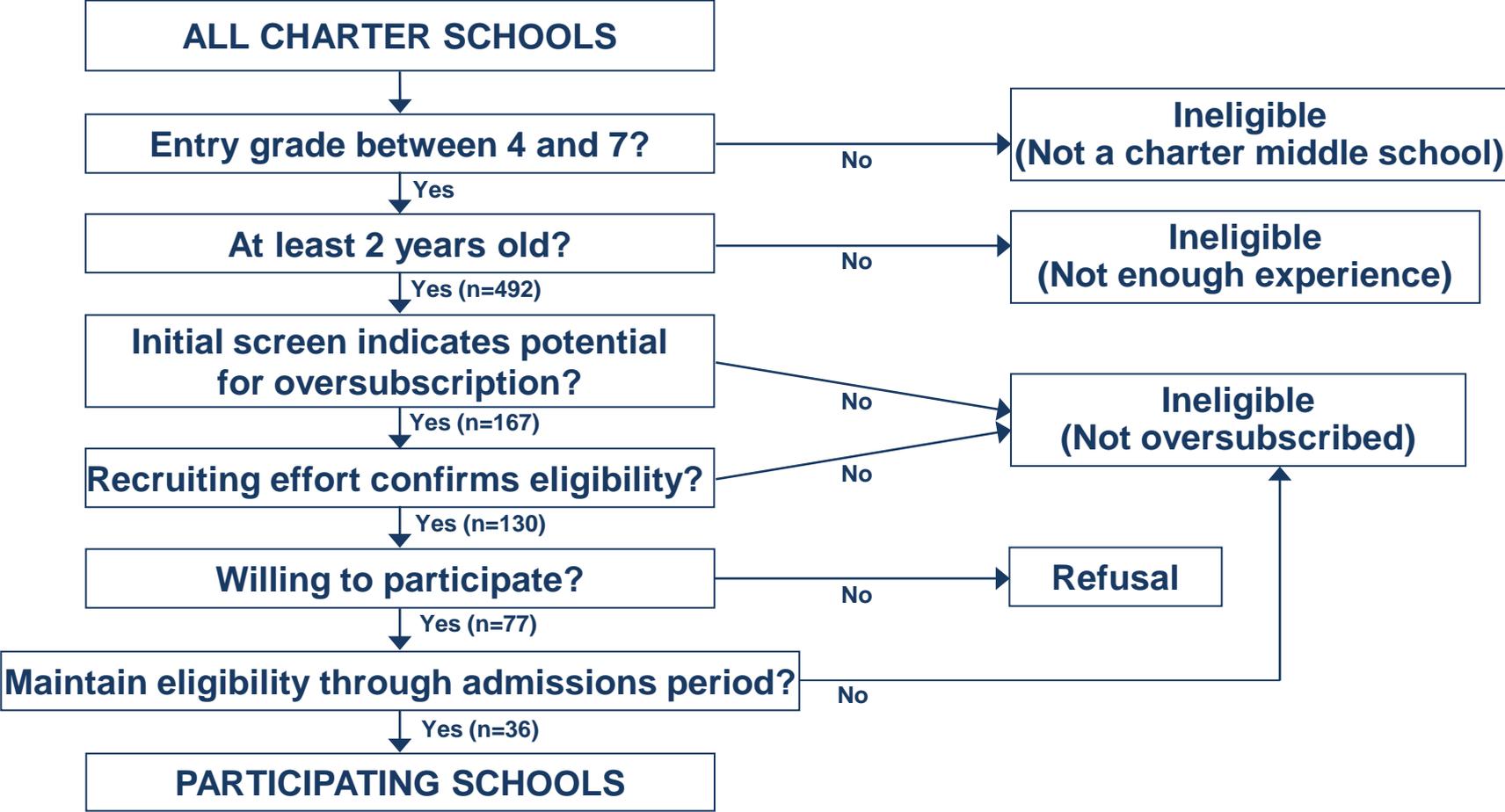
- **Overall, no significant impacts on achievement**
- **Impacts vary significantly across sites**
 - Range from negative to positive
- **Most successful schools were those serving disadvantaged students in large urban areas**
 - Quality of educational opportunities available to control group may explain some of the variation in impacts across students and sites

Evaluation report available at

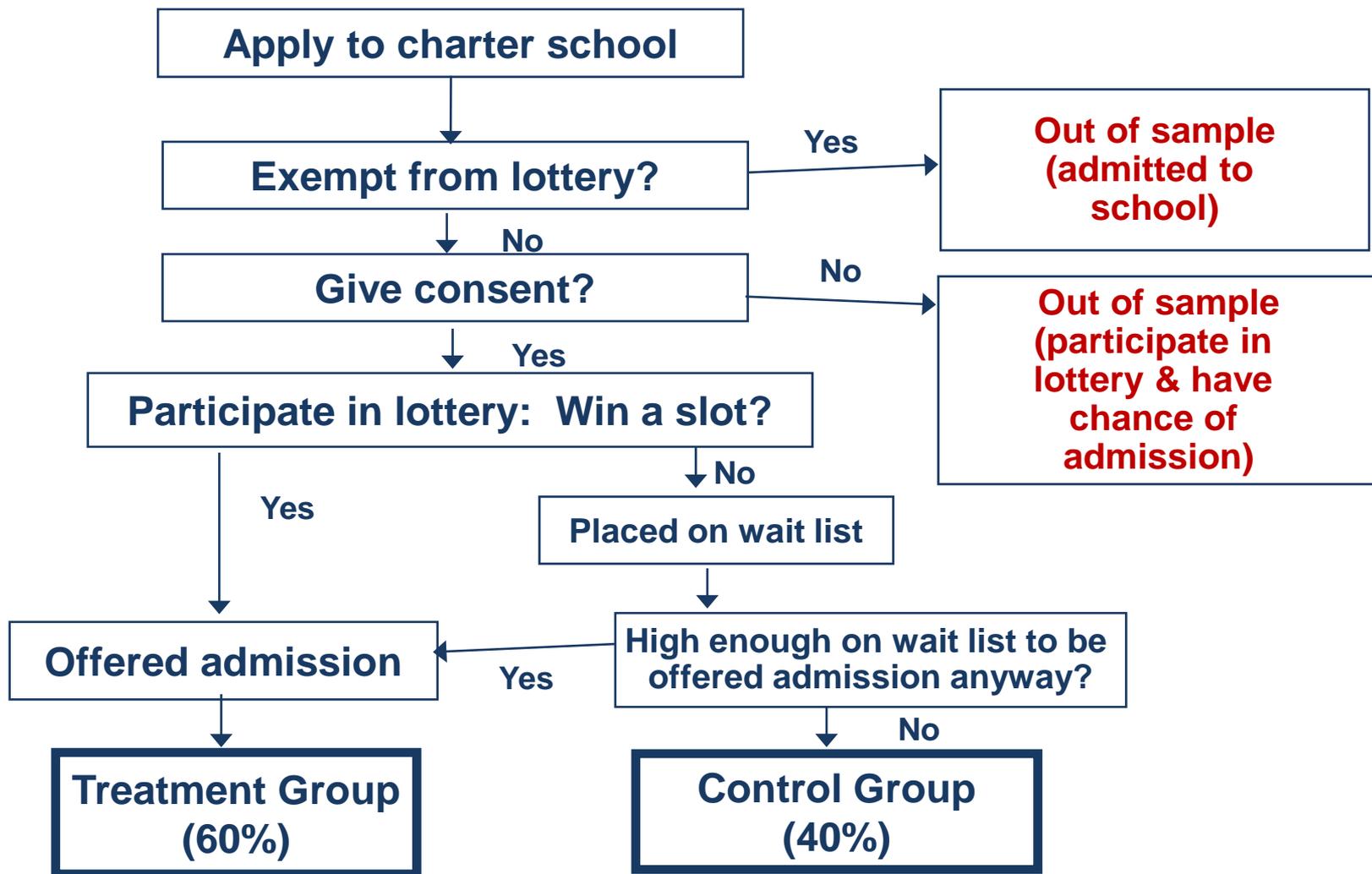
**[www.mathematica-mpr.com/publications/PDFs/
education/charter_school_impacts.pdf](http://www.mathematica-mpr.com/publications/PDFs/education/charter_school_impacts.pdf)**

Supplemental Slides

School Selection Process



Student Sample Selection Process



Data Collection Timeline

Instrument	Cohort 1	Cohort 2
Baseline survey	Spring/Summer 2005	Spring/Summer 2006
School records		
Baseline year	2004-2005	2005-2006
1st follow-up year	2005-2006	2006-2007
2nd follow-up year	2006-2007	2007-2008
Student/parent surveys		
Student survey	Spring 2006	Spring 2007
Parent survey	Spring 2006	Spring 2007
Principal surveys		
Study schools	Fall 2006	Fall 2007
Non-study charter schools	Fall 2007	

What Policy Factors Are Related to Impacts?

- **Two school characteristics most consistently related to impacts**
 - School size (-)
 - Ability grouping (+)
- **Several characteristics significantly related to impacts before but not after controlling for other factors**
 - Per-student revenue (+)
 - Student-teacher ratio (+)
 - Hours of operation (+)
- **Other policy-related factors not related to impacts**