#### Utilizing Administrative Data to Answer Causal Questions about Education Policies and Programs

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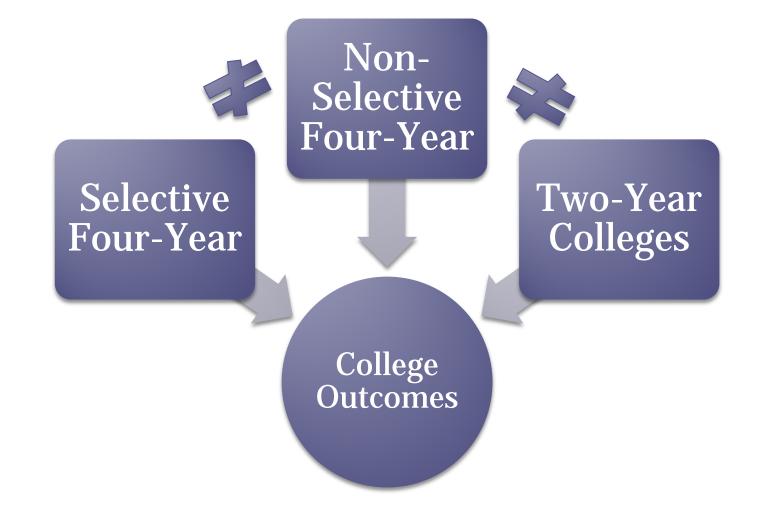
#### Presentation Outline

- Drawing Causality in Education Research
  Challenges and new methods
- Quasi-experimental designs with California administrative data
  - A few examples

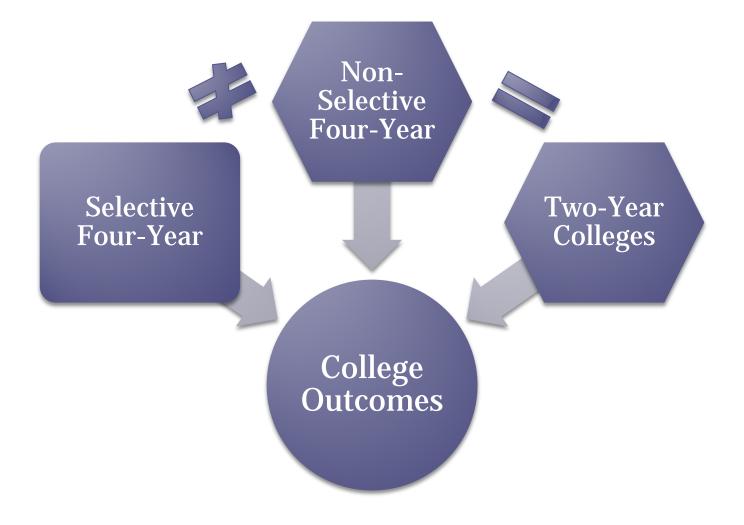
# The challenge of drawing causality

- Educational destinations and programs are not randomly assigned to students
- Our desire is to determine how the outcomes for individuals who receive a treatment differ from what the outcomes would have been in the absence of the treatment.
- <u>The Counterfactual</u>—the condition to which individuals would have been exposed to in the absence of this treatment (program, policy, etc.)

# Ubiquitous selection problem that plagues education research



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## Establishing a Counterfactual

 The challenge is to determine how the outcomes for individuals who receive a "treatment" differ from what the outcomes would have been in the absence of the "treatment"

	Value of Outcome in Treatment Group	Value of Outcome in Control Group
Treatment Group (Four-Year Colleges)	Known	Unknown
Control Group (Community Colleges)	Unknown	Known

#### The Randomized Experiment & New Quasi-Experimental Approaches

- Randomized Experiments
  - Solve the problem of exogenous assignment
  - Groups are equal in expectation
- New quasi-experimental methods simulate the randomized experiment
- Capitalize on exogenous assignments to treatment; How?
  - Natural Experiments—utilize changes in policies that disrupt the status quo
  - Assignment to group is based on arbitrary cutoffs

#### Example 1: Admissions "Experiment"— UC's Guaranteed Transfer Option

 Mismatch hypothesis—students and colleges are often said to be "mismatched" when student academic ability is substantially lower (or higher) than the school mean.

## Background

- Evidence on how such mismatches affect college completion is not conclusive.
  - Students are more likely to graduate if they attend institutions at which they are about average on measures of academic ability
  - Attending a more selective institution, regardless of relative academic preparation, is associated with higher graduation rates and future earnings

# Why should selectivity matter?

- Peer effects—selective institutions may provide advantages through a more highly prepared set of peers
- Differential effects for disadvantaged students

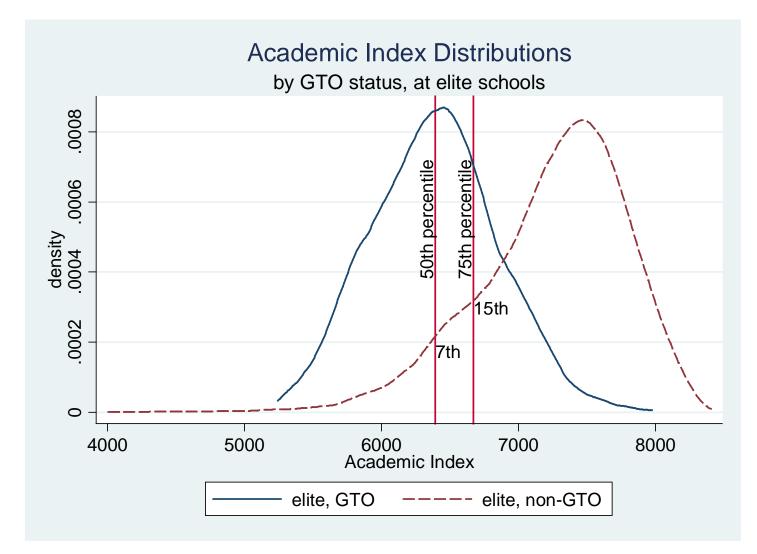
### UC Guaranteed Transfer Option

- Budget cuts of 2004 admissions cycle led to UC eligible students being denied admission to UC
- Mandated by UC Office of the President, all campuses had to make GTO offers
- Budget restored later that spring, GTO students entered specified campuses in fall 2004 instead of two years later.

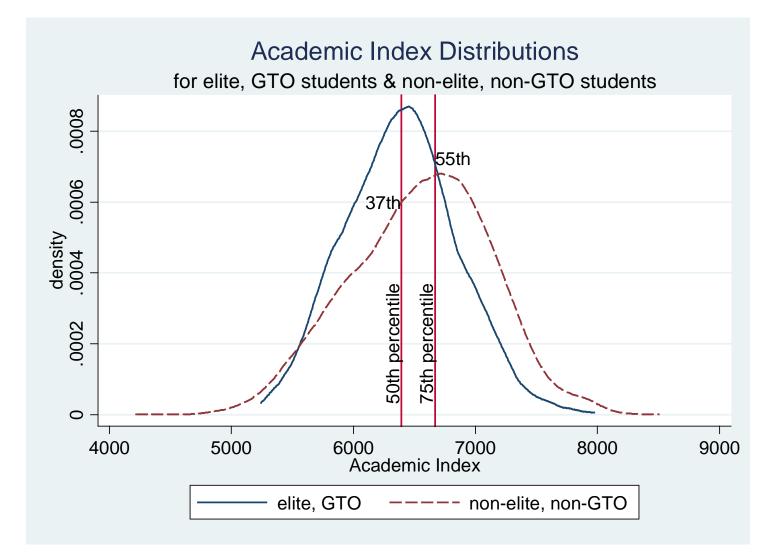
### UC Guaranteed Transfer Option

- Who are the GTO students?
  UC eligible students initially denied admission
- "Lottery Winners" in admission
  - GTO students admitted to the three elite campuses (Berkeley, Los Angeles, San Diego) Represent a unique opportunity to test the mismatch hypothesis.

#### Descriptive Statistics—GTO and Non-GTO at Elite Institutions



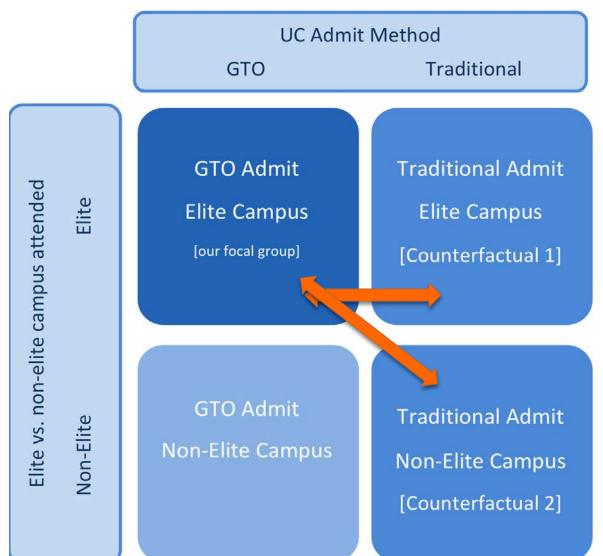
# Descriptive Statistics—GTO at Elite Institutions compared with Non-GTO at Non-Elite



#### **Research Questions**

- Do GTO students at elite UC institutions have similar persistence and performance outcomes as:
  - (1) students at these selective institutions who were admitted via the traditional admissions process?; and
  - (2) students observationally similar to the GTO admits who applied to and attended less selective UCs?

# Analytic Strategy



# Analytic Strategy

- Data—UC Office of the President
- Outcomes—Persistence, Cumulative GPA, and Accumulated Credits
- Compare GTO students at Elite Campuses to two counterfactual states:
  - Non-GTO at Elite Campuses
  - Non-GTO at Non-Elite Campuses
- Add the following controls:
  - Academic credentials
  - Demographic characteristics
  - Application patterns (self-revelation)

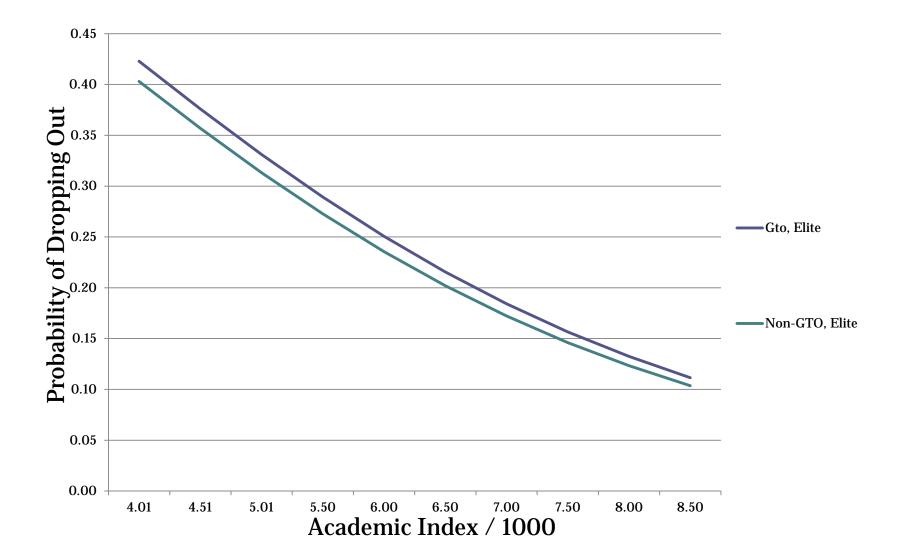
# Findings

- There is a very small penalty to mismatch between GTO students and traditional admits at elite institutions
  - less than one-half of a grade point average
  - About 7 fewer credits by the end of year one

Similar risk to dropping out

- There is a very small penalty to mismatch between GTO students at elite campuses when compared to traditional admits at non-elite campuses
  - 1/4<sup>th</sup> of grade point average
  - Bout 5 fewer credits by the end of year one
  - Lower risk of dropping out

### Predicted Hazard of Dropping Out



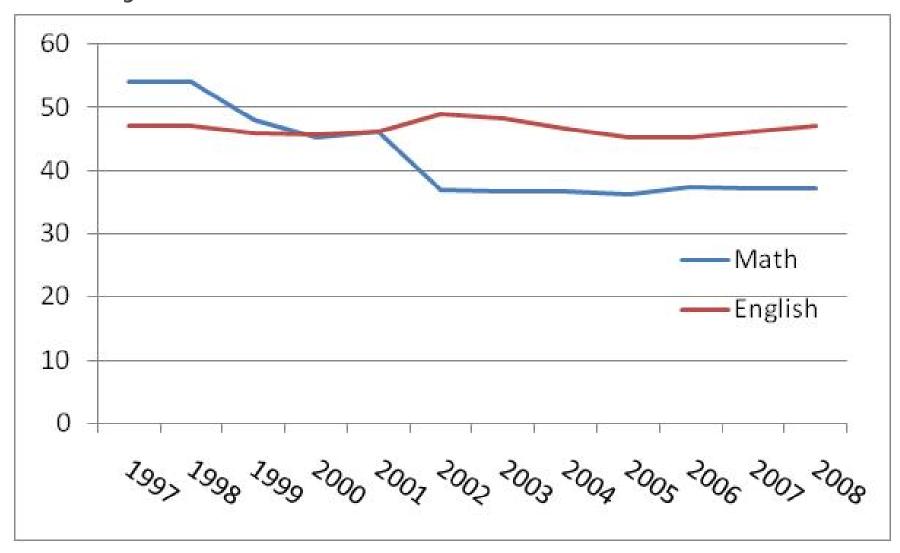
# Findings

- So mismatch hypothesis somewhat right, but where it matters the least
  - Mismatch slightly reduces GPA and cumulative credits
  - Bowever, mismatch does not reduce persistence

#### Example 2: California's Early Assessment Program

- Context
  - High college remediation rates
  - Align high school standards and assessments with the skills required for success after high school
- Where should remediation occur?
  - Bridge between K-12 schooling and college readiness
  - Role of secondary schools or community colleges, but not BA-granting institutions.
- Costs associated with remediation
  - "Paying Double"
  - Estimated cost of remediation at 4-year colleges is over \$500 million (Strong American Schools, 2008)

#### Remediation Need at California State University– Rate Systemwide



#### Early Assessment Program Overview

- Goals of EAP:
  - Provide an early signal to students about their college readiness
  - CSU collaboration with secondary school community
  - Provide 12<sup>th</sup> grade interventions
- Components of EAP:
  - 1. 11<sup>th</sup> grade testing (early assessment)
  - 2. Professional development for teachers
  - 3. Supplemental preparation for students

#### **Overview of EAP Testing Component**

#### • Assessment:

- Optional 15 questions on the mandatory 11<sup>th</sup> grade CST
- Additional items developed by CSU faculty
- Score based on CST augmented with EAP items
- Signal:
  - 1. Exempt
  - 2. Non-Exempt
  - 3. Conditional Exempt (in math only)

#### **Research Questions**

- How does participation in the Early Assessment Program affect students' probability of requiring remedial coursework in college?
- How has school level participation in the Early Assessment Program influenced school outcomes, in particular 11<sup>th</sup> grade test scores?

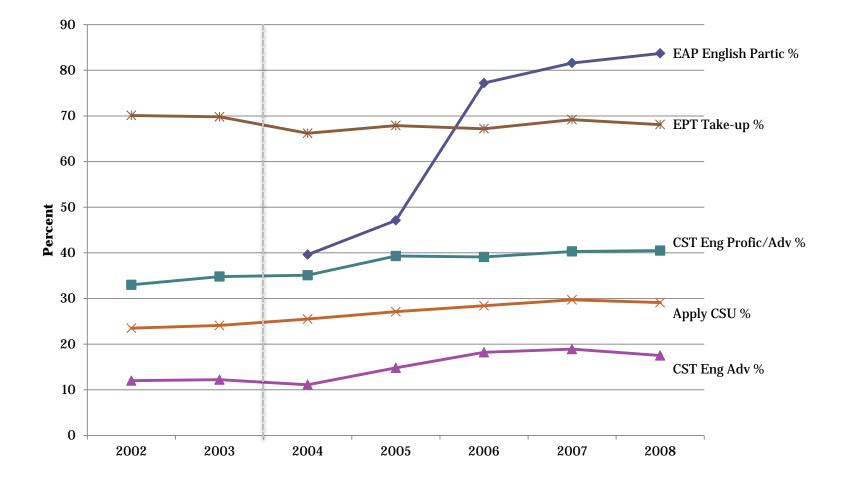
### Data

- California Department of Education
  EAP participation and test results
  School Characteristics
- CSU Office of the Chancellor
  - Application information
  - Remediation assessments
  - Other college outcomes

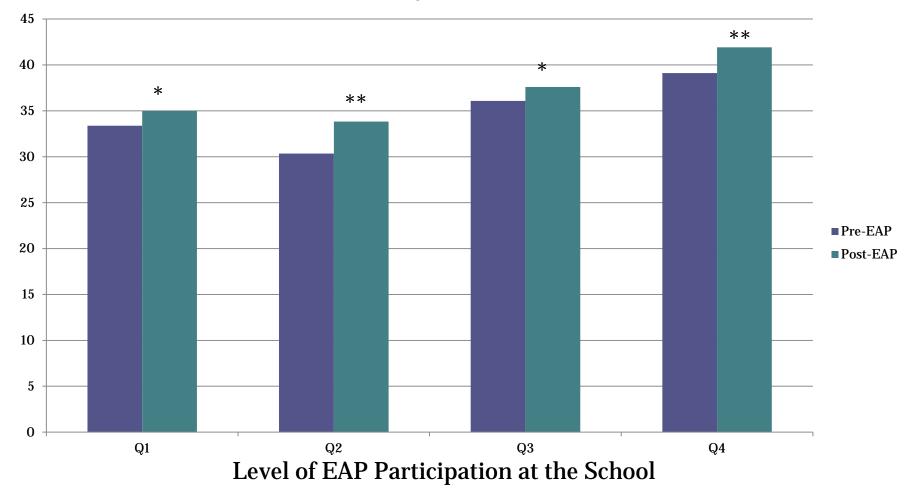
# Analytic Strategy

- Model remediation need for first-time freshman in Math and English, respectively, as a function of:
  - Individual characteristics
  - Attributes of individual's high school
  - EAP availability
  - Participation in EAP
- Investigate selection into EAP at the individual and school level
- Among those that participate in EAP, model college application behavior as a function of EAP signal (Exempt/Non-Exempt)

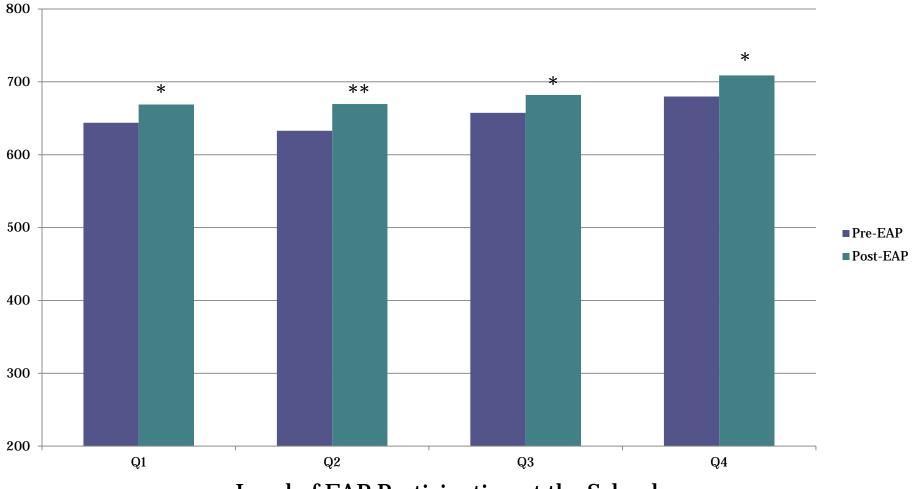
#### Mean School Percentages on Outcomes



#### Results Fitted Values for CST Proficiency from Interrupted Time Series



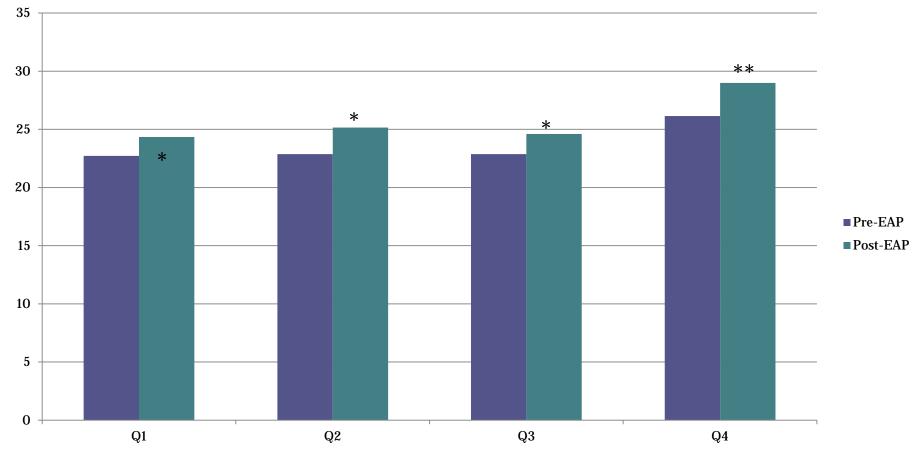
#### Results Fitted Values for API from Interrupted Time Series



Level of EAP Participation at the School

### Results Fitted Values for CSU Application

from Interrupted Time Series



Level of EAP Participation at the School

#### Results: Why the increase in test scores? A Difference in Difference Approach

	EAP Q1		EAP Q2		EAP Q3		EAP Q4	
Grade	10 <sup>th</sup>	11 <sup>th</sup>						
Pre -	- 32.76	32.45	33.81	33.81	33.54	36.66	42.76	43.06
Post	34.66	34.39	35.80	35.80	36.07	38.97	46.93	46.63
Difference -	1.89	1.94	1.99	2.53	2.36	2.27	4.17	3.57
DID	-	0.05		0.53		-0.09		-0.60
DIDID				0.49		-0.14		-0.64

#### Conclusions

- Participation in EAP does modestly improve school outcomes (and student outcomes, from other work not shown)
- Mechanism does *not* appear to be through increasing individual stakes on 11<sup>th</sup> grade assessments.

New Work: Investigating the Multiple Missions of Community Colleges

- Transfer Function of the Community Colleges
  - Student Transfer Achievement Reform Act (Senate Bill 1440, 2010)
  - Did policy lead to improved outcomes (e.g. increased transfers, quicker time to degree)?
- Workforce Development at Community Colleges
  - Changes to funding structure of non-credit courses
  - Did incentives lead to changes in composition of enrollees and improve participants' outcomes?