# Choices and Resources for Improved Student Outcomes: Evidence from Brazil

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### Precursor

### I'm looking for feedback on:

- Presentation Clarity (Oral & Visual)
- Common Criticisms/Questions To Address
- Interest & Significance of Results

## Motivation

- Learning drives economic growth, individual wage improvements, and reduces inequality in the developing world (González-Velosa et al., 2016; Hanushek & Woessmann, 2015)
- More than three-quarters of Brazilian youth are unable to perform at the lowest level of competence in reading and mathematics (OECD, 2019)
- However, access to schooling is not a major problem anymore (Adelman & Szekely, 2016; Bassi et al., 2015; Szekely & Karver, 2021)
- Increasing the quality of education in the developing world remains difficult - with much of the education provided in schools being low-quality with low learning outcomes (Bruns and Luque, 2014; Evans and Popova, 2015)

#### Introduction

- As of 2018, 68% of Brazilian youth still lacked minimally adequate competencies in Mathematics
- 43% of Brazilian students scored below the minimum level of proficiency in reading, mathematics, and science
  - The OECD average was 13% for the statistic (OECD, 2019)

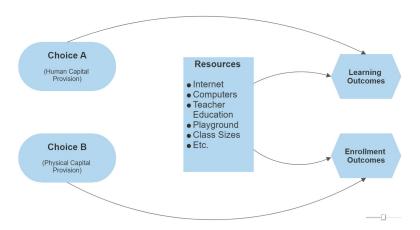
**This research:** Studies *choices* that schools and municipalities in Brazil can implement, given their *current resources*, to provide *better student learning outcomes*, and lower dropout & failure rates.

## **Existing Literature**

- Existing literature has evaluated reasons for low learning and resources for improving learning in the developing world
- Not much has been studied quantitatively about which bundles of resources complement different kinds of managerial choices for improving learning outcomes
- This is an important question because schools have different resources and may benefit differently from implementing a strategy

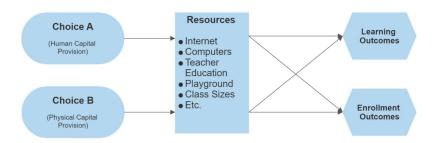
## Literature Gap Addressed

As Glewwe and Muralidharan (2016) note, the following can be used to describe the state of the current literature in an abstract manner.



## Literature Gap Addressed

And this is how our research approaches the problem.



# Background

#### How are decisions made in Brazilian municipalities?

- School officials do not have much autonomy in making decisions (Adelman and Lemos, 2021)
- Instead, their primary role is to identify issues and report them to the municipality which then decides how its approach to the issue
- Since municipalities make a choice on an action, we study our data at the municipality-level

## Methodology

#### How do we achieve this?

- Utilized the Strategic Treatment Effects (STE) framework developed by Guzman (2021)
- Examined three kinds of actions at the municipal level:
  - Focusing on providing the best human capital to schools
  - o Focusing on providing the best physical capital to schools
  - Providing high-quality human capital & physical capital
- Evaluated the effect of these strategies on 5 outcomes:
  - Learning Outcomes: Math & Portuguese scores
  - Enrollment Outcomes: Pass Rates, Failure Rates, & Dropout Rates

# The Strategic Treatment Effects Framework

Under the STE framework, each municipality is identified by its unique set of resources. Two kinds of benefits achieved from choices are then defined:

- Operational Efficiency Benefit: Equal benefits reaped by all municipalities, regardless of their resources
- Idiosyncratic Benefit: Heterogeneous benefits reaped at different intensities by different municipalities, depending on their resources available

On a broad level, the framework allows one to separate the operational efficiency benefits from the idiosyncratic benefits.

## The Strategic Treatment Effects Framework

Isolating the idiosyncratic benefits allows us to directly understand which resources help drive (or dampen) the effects of a choice.

Since the framework is able to work with high-dimensional data, we are able to map *all* possible observable resources and their interactions to get a better sense of the resource bundles that are crucial in helping schools gain from a choice made by the municipalities.

## **Baseline Results**

Controlling for school type and geography, municipal choices do seem to be beneficial for student enrollment outcomes.

Table: Enrollment Outcomes

	Dependent variable:								
	Approval Rate			Failure Rate			Abandonment Rate		
	(1)	(2)	(3)	(4)	(5)	(6)	(7)	(8)	(9)
Physical Capital Focus	3.196***			-2.700***			-3.088***		
	(0.185)			(0.136)			(0.096)		
Human Capital Focus		1.926***			-1.570***			-1.787***	
		(0.114)			(0.084)			(0.059)	
Human and Physical Capital Focus			0.661*			-1.598***			-2.964***
			(0.396)			(0.292)			(0.206)
Observations	204,420	204,420	204,420	204,420	204,420	204,420	204,420	204,420	204,420
R <sup>2</sup>	0.164	0.164	0.162	0.099	0.099	0.098	0.109	0.108	0.105
Adjusted R <sup>2</sup>	0.164	0.164	0.162	0.099	0.099	0.098	0.109	0.108	0.105

Note:

 $^*p{<}0.1;\ ^{**}p{<}0.05;\ ^{***}p{<}0.01$ 

## Results

Figure: Outcome – Dropout Rates

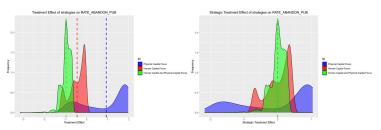
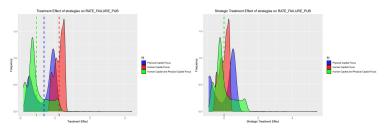


Figure: Outcome - Failure Rates



## Results

Figure: Outcome – Math Scores

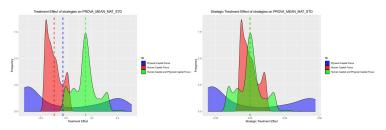
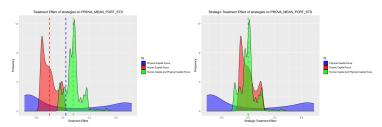


Figure: Outcome - Portuguese Scores



#### Discussion

- The benefits of a physical capital focus seem to be much varied across all outcomes but failure rates.
- As expected, the intersection of both choices amplifies their effects and outperforms either choice individually.
- If one had to choose between a physical capital focus, and a human capital focus, there would exist a trade-off between the expected benefit of the choice and the 'riskiness' (variance in benefits) of implementing the choice.

## **Implications**

The use of the STE framework allows us to eliminate the trade off between the expected benefit of the choice and the 'riskiness' of the choice.

#### With the framework, we can:

- Identify what resources are common at either ends of the spectrum
- Incorporate that knowledge into our decision-making, allowing us to be aware of where we would lie on the spectrum if we implement a given choice

#### Conclusion

This research connects existing knowledge of two fields that have not historically overlapped - strategy and development.

#### We discover:

- A key framework that accounts for resources available in schools to understand the effects of municipal actions on student outcomes.
- Differences in distributions of effects of choices across multiple municipalities.
- A trade-off that policy-makers might face in this situation, and how our framework helps eliminate it – allowing for better decisions

## Thank you for listening!

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