Context and the Reform

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Decentralization of Public Education: Does Everyone Benefit?

Evidence from Colombia

Zelda Brutti

European University Institute LSE (Visitor 2013/2014)

SITE Conference 2014 - Sep 1st 2014

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Decentralizing the public education service

Responsibility and power shifted to lower levels of government

• Especially in developing countries \Rightarrow to the municipal level

Chile, Argentina, Bolivia, Brazil and Colombia India, Thailand, Vietnam and the Philippines South Africa, Senegal, Ethiopia and Uganda Ukraine, Serbia and Bulgaria

Western countries ⇒ to the school level

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Decentralizing the public education service

Heterogeneous Outcomes

- Heterogeneity across places (local authorities)
 - Bardhan and Mookherjee (JPE, 2005 ; EJ, 2006)
 - Galiani et al. (JPE, 2008)
 - Reinikka and Svensson (QJE, 2004)
- Heterogeneity across people (poors vs. elites; minorities vs. dominants)
 (heting at al. 2005; Transport 2010)

(Juetting et al. 2005; Tranchant 2010)

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This Paper

- Look at the 2001 Colombian reform: decentralization of public service provision
- Focus on Education, look at outcomes in terms of quality (test scores) and efficiency (enrollment rates)
- Focus on heterogeneity of impact and distributional effects across the territory and across population strata

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Decentralization of public education

Empirical challenges

"Many influential surveys have found that the empirical evidence of decentralization's effects on service delivery is weak, incomplete and often contradictory" (*Channa and Faguet, 2012*)

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Decentralization of public education

Empirical challenges

"Many influential surveys have found that the empirical evidence of decentralization's effects on service delivery is weak, incomplete and often contradictory" (*Channa and Faguet, 2012*)

• Typical case A)

More autonomy to all local authorities

 \Rightarrow cannot disentangle other macro shocks / dynamics

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Decentralization of public education

Empirical challenges

"Many influential surveys have found that the empirical evidence of decentralization's effects on service delivery is weak, incomplete and often contradictory" (*Channa and Faguet, 2012*)

• Typical case A)

More autonomy to all local authorities

- \Rightarrow cannot disentangle other macro shocks / dynamics
- Typical case B)

More autonomy to well-performing local authorities

 \Rightarrow cannot isolate the counterfactual

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The Colombian Reform

Summary of events

- Law 715/2001⇒ Reform in public service provision (Health, Education, Other basic services)
- Aims: increasing efficiency of service delivery, decreasing inequality, spurring decentralization

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The Colombian Reform

Summary of events

- Law 715/2001⇒ Reform in public service provision (Health, Education, Other basic services)
- Aims: increasing efficiency of service delivery, decreasing inequality, spurring decentralization
- Education:
 - municipalities with 100+ thousand inhabitants given autonomy over service managment and delivery
 - Municipalities with 100- thousand inhabitants put under the authority of the department (region)

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The Colombian Reform

Preview of results

- Quality of education over the 10 years following the reform (standardized high school test scores)
 - Positive impact of autonomy for high-developed municipalities
 - Negative impact of autonomy for low-developed municipalities
- Gap increasing over time
- Magnitudes:
 - +/- 0.15 student standard deviations over the 10 years
 - +/- 0.3 looking at years 8,9 and 10 only

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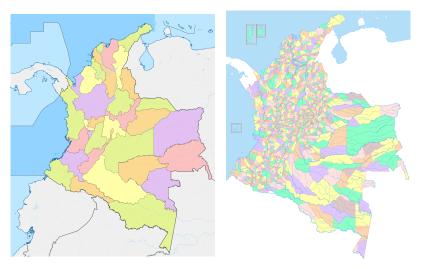
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Local authorities in Colombia



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Public Education in Colombia

- 11 years of schooling (9 compulsory and 2 optional)
- Public education enrollees are 83% of total

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Public Education in Colombia

- 11 years of schooling (9 compulsory and 2 optional)
- Public education enrollees are 83% of total
- 90% of total expenditure from Central Government transfers

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The 2001 Reform

Pre-reform situation (1993 - 2001):

- 80% of transfers to departments, 20% to municipalities
- both departments and municipalities have saying in management of education
- duplicity and overlap of competencies

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The 2001 Reform

Pre-reform situation (1993 - 2001):

- 80% of transfers to departments, 20% to municipalities
- both departments and municipalities have saying in management of education
- duplicity and overlap of competencies

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The 2001 Reform

After the reform (2002 onwards):

• distinction between 'certified' and 'non certified' municipalities

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The 2001 Reform

After the reform (2002 onwards):

- distinction between 'certified' and 'non certified' municipalities
- Certified municipalities manage education autonomously, and receive 100% of transfers to do so
- Non-certified municipalities have their education service managed by departments
 - (receive transfers for 4.4% of total cost, w. restrictions on use)

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The 2001 Reform

The Certification cutoff

• Certified municipalities: 100,000+ inhabitants in 2002

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The 2001 Reform

The Certification cutoff

- Certified municipalities: 100,000+ inhabitants in 2002
- Projections made by National Statistics Office in 1993

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The 2001 Reform

The Certification cutoff

- Certified municipalities: 100,000+ inhabitants in 2002
- Projections made by National Statistics Office in 1993
- Cutoff strictly enforced, no exceptions

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The 2001 Reform

The Certification cutoff

- Certified municipalities: 100,000+ inhabitants in 2002
- Projections made by National Statistics Office in 1993
- Cutoff strictly enforced, no exceptions

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The 2001 Reform

The 40 Certified municipalities



1/3 of Colombia's population and pupil share

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Data				
Test Scores				

- Colombia has long running tradition of standardized testing
- ICFES: Governmental agency that administers tests across the country

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Data				
Test Scores				

- Colombia has long running tradition of standardized testing
- ICFES: Governmental agency that administers tests across the country
- Saber 11: standardized high school test, all students after the 11th school year (41%)

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Data				
Test Scores				

- Colombia has long running tradition of standardized testing
- ICFES: Governmental agency that administers tests across the country
- Saber 11: standardized high school test, all students after the 11th school year (41%)
- student-level data from 2000 to 2012; take municipal averages (for now)

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Data

Municipal development

- Municipalities periodically evaluated and assigned scores (National Statistics Office and 'National Planning Department')
- Municipal Development Index
 - Main municipal development indicator up to 2013
 - Contains social variables (life quality in the municipality) and financial variables (municipal finance status)
 - Last pre-reform measure is 2001

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Data

Municipal development

- Municipalities periodically evaluated and assigned scores (National Statistics Office and 'National Planning Department')
- Municipal Development Index
 - Main municipal development indicator up to 2013
 - Contains social variables (life quality in the municipality) and financial variables (municipal finance status)
 - Last pre-reform measure is 2001
- Unsatisfied Basic Needs Indicator
 - Widely used poverty measure
 - Last pre-reform measure is 1993 (Census)
 - Use it here for robustness checks

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Identification I

Sharp Regression Discontinuity Design

- Inhabitant count was the only criterion to determine certification
- $C_i = 1 \{P_i > c\}$ with P_i = population (running v.), $c = 100\,000$
- $\tau = \mathbb{E}[Y_i(1) Y_i(0)|P_i = c] = \mathbb{E}[Y_i(1)|P_i = c] \mathbb{E}[Y_i(0)|P_i = c]$

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Identification I

Sharp Regression Discontinuity Design

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- Assumptions:
 - Unconfoundedness: $Y_i(0), Y_i(1) \perp C_i | P_i$
 - Smoothness: $\mathbb{E}[Y_i(0)|P_i = p]$ and $\mathbb{E}[Y_i(1)|P_i = p]$ continuous at least at p = c

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Identification I

Sharp Regression Discontinuity Design

- Inhabitant count was the only criterion to determine certification
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 - Smoothness: $\mathbb{E}[Y_i(0)|P_i = p]$ and $\mathbb{E}[Y_i(1)|P_i = p]$ continuous at least at p = c

$$Y_i = \alpha + \tau^{RD} C_i + f(P_i) + \epsilon_i$$

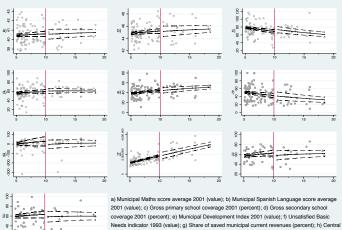
$$Y_i = \alpha + \tau_0^{RD} C_i + \tau_1^{RD} C_i * D_i + \beta D_i + f(P_i) + \epsilon_i$$

Regression Discontinuity

Next Steps

Identification I

Smoothness



Govt. transfers for education 2001 (1,000s of Pesos); i) Transparency index 2005 (value); j) 20 Visibility and accountability index 2005 (value).

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RD Results

Mathematics

Table: Saber 11 Mathematics test scores

	(1) All	(2) Bottom 25%	(3) Bottom 50%	(4) Top 50%	(5) Top 25%	(6) Interaction
Certified Certif.*MDI'01 perc.	0.167 (0.63) 	-1.580 (0.99)	0.399 (0.94)	0.729 (0.87)	2.201** (0.86)	-2.542*** (0.56) 0.037***
MDI'01 percentile						(0.01) 0.023*** (0.00)
F(Population)	l Yes	Yes	Yes	Yes	Yes	Yes
N R-sq.	7,572 0.013	6,536 0.003	7,100 0.003	472 0.011	275 0.050	7,561 0.084

Standard errors clustered by municipality in parentheses

* p<.10 ** p<.05 *** p<.01

Context and the Reform

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RD Results

Spanish Language

Table: Saber 11 Language test scores

	(1) All	(2) Bottom 25%	(3) Bottom 50%	(4) Top 50%	(5) Top 25%	(6) Interaction
Certified Certif.*MDI'01 perc. MDI'01 percentile	0.073 (0.66)	-1.553 (1.00)	0.319 (0.94)	0.521 (0.90)	1.810 (1.14)	-2.428*** (0.66) 0.035*** (0.01) 0.031*** (0.00)
F(Population) N R-sq.	Yes 7,572 0.018	Yes 6,536 0.003	Yes 7,100 0.004	Yes 472 0.011	Yes 275 0.035	(0.00) Yes 7,561 0.123

Standard errors clustered by municipality in parentheses

* p<.10 ** p<.05 *** p<.01

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RD Results

As time passes (High-Developed)

Table: Over-time dynamics (High-developed 25%)

	Mathematics			Spanish Language				
	(1)	(2)	(3)	(4)	(5)	(6)		
	Post 2004	Post 2007	Post 2010	Post 2004	Post 2007	Post 2010		
Certified	2.366**	3.004***	3.802**	1.636	1.359	1.922		
	(0.92)	(1.06)	(1.52)	(1.09)	(1.04)	(1.29)		
F(Population)	Yes	Yes	Yes	Yes	Yes	Yes		
N	225	150	75	225	150	75		
R-sq.	0.069	0.137	0.199	0.038	0.126	0.137		

Standard errors clustered by municipality in parentheses

* p<.10 ** p<.05 *** p<.01

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Regression Discontinuity

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RD Results

As time passes (Low-Developed)

Table: Over-time dynamics (Low-developed 25%)

		Mathematics			Spanish Language				
	(1)	(2)	(3)	(4)	(5)	(6)			
	Post 2004	Post 2007	Post 2010	Post 2004	Post 2007	Post 2010			
Certified	-1.800	-2.233*	-3.170**	-1.468	-1.607	-2.030*			
	(1.12)	(1.29)	(1.60)	' (1.02)	(1.06)	(1.12)			
F(Population)	Yes	Yes	Yes	Yes	Yes	Yes			
N	5,344	3,609	1,809	5,344	3,609	1,809			
R-sq.	0.003	0.005	0.007	0.003	0.004	0.007			

Standard errors clustered by municipality in parentheses

* p<.10 ** p<.05 *** p<.01

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RD Results

As time passes (Interaction term)

Table: Over-time dynamics (Interaction term)

		Mathematics		Spanish Language				
	(1)	(2)	(3)	(4)	(5)	(6)		
	Post 2004	Post 2007	Post 2010	Post 2004	Post 2007	Post 2010		
Certified	-2.833***	-3.382***	-4.142***	-2.354***	-2.549***	-3.190***		
	(0.63)	(0.79)	(1.09)	' (0.68)	(0.68)	(0.83)		
Certif.*MDI'01 perc.	0.041*** (0.01)	0.049*** (0.01)	0.059*** (0.01)	0.035***	0.038*** (0.01)	0.044*** (0.01)		
MDI'01 percentile	0.025***	0.030***	0.040***	0.031***	0.029***	0.037***		
	(0.00)	(0.00)	(0.00)	(0.00)	(0.00)	(0.00)		
•				1				
F(Population)	Yes	Yes	Yes	I Yes	Yes	Yes		
N	6,181	4,172	2,091	6,181	4,172	2,091		
R-sq.	0.091	0.125	0.197	0.115	0.162	0.246		

Standard errors clustered by municipality in parentheses

* p<.10 ** p<.05 *** p<.01

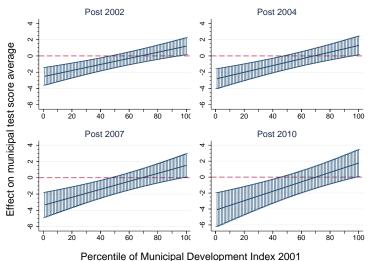
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RD Results

As time passes - Marginal Effects (Math)



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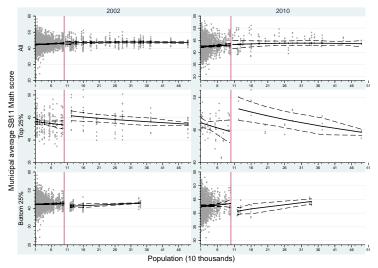
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Graphical Results (Math)



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Robustness Checks

Different polynomials on the 2 sides (Math)

Table: Saber 11 Math scores - 2 polynomials

	(1)	(2)	(3)	(4)	(5)	(6)
	All	Bottom 25%	Bottom 50%	Top 50%	Top 25%	Interaction
Certified Certif.*MDI'01 perc. MDI'01 percentile	0.176 (1.12)	-2.259* (1.37)	1.211 (1.60)	-0.307 (1.27)	3.065*** (0.81)	-2.267** (0.88) 0.038*** (0.01) 0.023*** (0.00)
F(Population)	Yes	Yes	Yes	Yes	Yes	Yes
N	7,572	6,536	7,100	472	275	7,561
R-sq.	0.013	0.003	0.004	0.028	0.073	0.084

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Robustness Checks

Different polynomials on the 2 sides (Language)

Table: Saber 11 Language scores - 2 polynomials

	(1)	(2)	(3)	(4)	(5)	(6)
	All	Bottom 25%	Bottom 50%	Top 50%	Top 25%	Interaction
Certified Certif.*MDI'01 perc. MDI'01 percentile	0.072 (1.14)	-3.602*** (1.31)	1.274 (1.60)	-0.432 (1.18)	2.379** (1.10)	-2.043** (0.96) 0.035*** (0.01) 0.031*** (0.00)
F(Population)	Yes	Yes	Yes	Yes	Yes	Yes
N	7,572	6,536	7,100	472	275	7,561
R-sq.	0.018	0.003	0.004	0.029	0.073	0.124

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Identification II

Local Linear Regression on a Discontinuity Sample

- Focus on a 'discontinuity sample' of municipalities (à la Angrist and Levy, QJE 1999)
- Around the 100,000 cutoff, certification is as good as randomly assigned

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Identification II

Local Linear Regression on a Discontinuity Sample

- Focus on a 'discontinuity sample' of municipalities (à la Angrist and Levy, QJE 1999)
- Around the 100,000 cutoff, certification is as good as randomly assigned
- Fixed effects regression

$$Y_{it} = \alpha + \tau^{LLR} C_{it} + \gamma M_i + \delta T_t + \epsilon_{it}$$

Allowing for heterogeneity

$$Y_{it} = \alpha + \tau_0^{LLR} C_{it} + \tau_1^{LLR} C_{it} * D_i + \gamma M_i + \delta \mathbf{T}_{\mathbf{t}} + \epsilon_{it}$$

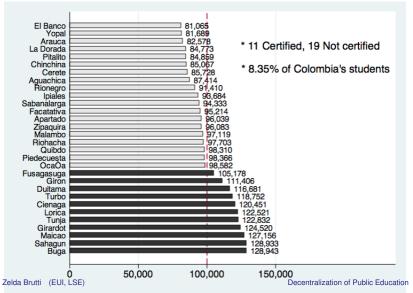
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The sample

80,000 - 130,000 inhabitants



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LLR Results

Mathematics

Table: Saber 11 Math scores

		ation only	•	Dev. Ind.
	(1) OLS	(2) FE	(3) OLS	(4) FE
Certified	0.064 (0.76)	0.016 (0.53)	-7.074*** (1.39)	-3.666*** (1.26)
Certified * MDI01	(0110)	(0.00)	0.158***	0.081** (0.03)
				(0000)
Time dummies	Yes	Yes	Yes	Yes
N N groups	389	389 30	389	389 30
R-sq.	0.39	0.67	0.52	0.68

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Spanish Language

Table: Saber 11 Language scores

		tion only	Municipal I	
	(1) OLS	(2) FE	(3) OLS	(4) FE
Certified	-0.051 (0.80)	-0.006 (0.26)	-7.701*** (1.52)	-0.915 (0.55)
Certified * MDI01	()	()	0.169*** (0.03)	0.020* (0.01)
Time dummies	Yes	Yes	Yes	Yes
N N groups	389	389 30	389	389 30
R-sq.	0.38	0.77	0.52	0.77

Standard errors clustered by municipality in parentheses

* p<.10 ** p<.05 *** p<.01

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Robustness Checks

Common Trend Assumption

			Language (4)
-0.154	-0.526	-0.501	0.460
(0.55)	-0.002	(0.48)	(0.82) -0.005
	0.013**		(0.01) -0.009
	(0.00)		(0.01)
Yes	Yes	Yes	Yes
390	390	390	390
0.08	0.22	0.28	0.40
	(1) -0.154 (0.55) Yes	-0.154 (0.55) -0.526 (0.91) -0.002 (0.01) 0.013** (0.00) Yes Yes 390 390	(1) (2) (3) -0.154 -0.526 -0.501 (0.55) (0.91) (0.48) -0.002 (0.01) 0.013*** (0.00) Ves Yes Yes Yes Yes 390 390 390

Table: Common trend (from 2000 to 2001)

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Robustness Checks

Different Cutoffs for the Continuity Sample

Table: Different Sample Cutoffs

	90,000 - 120,000				65,000 - 145,000			
	(1) Mate	(2) Mate	(3) Lang	(4) Lang	(5) Mate	(6) Mate	(7) Lang	(8) Lang
Certified	0.906 (0.93)	-6.303*** (0.78)	0.873 (1.36)	-10.119*** (0.99)	0.352 (0.44)	-2.972** (1.19)	0.283 (0.63)	-7.192*** (1.45)
Certified * MDI01	()	0.153*** (0.02)	()	0.233*** (0.02)	(-)	0.072** (0.03)	()	0.162*** (0.03)
Time dummies	Yes	Yes	Yes	Yes	Yes	Yes	Yes	Yes
N	194	194	194	194	595	582	595	582
N groups R-sq.	15 0.68	15 0.69	0.35	0.49	46 0.61	45 0.62	0.40	0.49

Standard errors clustered by municipality in parentheses * p<.10 ** p<.05 *** p<.01

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Robustness Checks

Explicitly controlling for population

(Development-specific time trends

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Conclusions (so far)

Results on educational quality (consistent across the two strategies):

- Average effect close to zero
- Positive impact of autonomous management of education for high-developed municipalities
- Negative impact for low-developed municipalities
- Gap between the two is intensifying over time

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Next Steps

- Results on enrollment rates
- Channels
 - Staffing plans
 - Reshuffled during the transitional period (2003 2004)
 - Teacher pays and pensions: 86% of total expenditure
 - ...
- Heterogeneity across people
 - impact of reform on students by SES