# Political Economy II: Deep Determinants of Development: Micro Evidence

14.740x: Foundations of Development Policy

Professor Ben Olken

#### Introduction

- In the previous lecture, we introduced the idea that the effect of "institutions" may persist long after the institution itself is no longer there
  - E.g., the legacy of extractive institutions under colonialism
- But, how might this happen?
  - Something must happen in between to allow these things to persist.
    What is it?
  - And how do we know?

## An example from Peru

#### Dell 2010: "The Persistent Effects of Peru's Mining Mita"

- What's the point of this paper?
- What was the Mita?
  - In colonial Peru and Bolivia, a major economic activity was mining, based at Potosí (silver) and Huancavelica (mercury)
  - To support the mines, from 1573 to 1812, indigenous communities were forced to send  $\frac{1}{7}$  of their adult male population to work in the mines(!)
- Why might this matter at the time?
  - Local native elites were required to find the conscripts. What might this do?
  - Reduce trust, undermine institutions, encourage outmigration, make it hard to get good labor
- Why might it matter now?

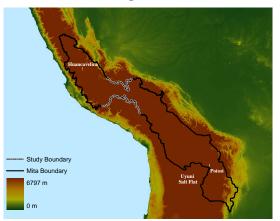
Olken () Deep Determinants 3 / 33

## Regression Discontinuity

• To identify the impact of the Mita, Dell takes advantage of the fact that the Mita had a well-defined border

#### The Mita

Figure 1



The mita boundary is in black and the study boundary in light gray. Districts falling inside the contiguous area formed by the mita boundary contributed to the mita. Elevation is shown in the background.

## Regression Discontinuity

- To identify the impact of the Mita, Dell takes advantage of the fact that the Mita had a well-defined border. Why might she do that?
- She focuses on the part of the border not coincident with mountains etc. Why?
- She then traces how communities on both sides of the border evolved from 1573 to present to tease out how the Mita may have had a long run impact
- This is an example of a general empirical design called "regression discontinuity."
- This will also come up a numer of times this semester, so let's take a bit of a detour to explore what this is.

## Regression discontinuity

- Consider a case where treatment is assigned based on a strict threshold.
- This is a sharp RD:

$$T_i = 1 \text{ if } X_i \ge c$$
  
= 0 if  $X_i < c$ 

- Can you think of some examples of discontinuities?
  - Win an election if the most votes
  - Eligible for Medicare when you turn 65
  - Become a National Merit Semi-Finalist if your PSAT scores above a certain threshold
  - Legally allowed to buy alcohol when you turn 21
  - etc.

## Regression discontinuity

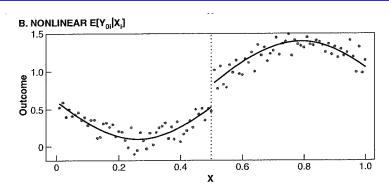
- What does a discontinuity buy us?
- Lots of things in the world vary with X
  - e.g., you become more mature as you age
- The idea is that except for the treatment, which varies discontinuously - the other covariates change continuously
  - e.g. you can legally buy alcohol when you turn 21, but your maturity grows continuously as you age
  - e.g., better popular politicians running for Governor get more votes, but there is a huge difference between getting 1 more vote than the competitor and getting 1 fewer vote, in that one of you becomes Governor and the other does not
- Technically, the assumption is that:

$$\lim_{x\downarrow c} E[Y_i(0)|X_i=x] = \lim_{x\uparrow c} E[Y_i(0)|X_i=x]$$

where  $Y_i(0)$  is the counterfactual outcome variable if there had been no treatment

Olken () Deep Determinants 8 / 33

## RD in pictures



## Fuzzy regression discontinuity

- Note that in some of these examples the discontinuity may not be strict
  - ullet e.g., some people < 21 were able to buy alcohol
  - But, it discontinuously becomes easier to buy alcohol once you turn 21
  - This is called a "fuzzy" RD, and here what we require is

$$\lim_{x\downarrow c} pr(T_i = 1|X_i = x) \neq \lim_{x\uparrow c} pr(T_i = 1|X_i = x)$$

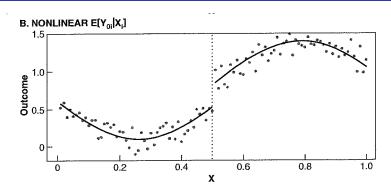
- The same general ideas hold we use the "jump" in T at the discontinuity to gain identification
- RD in practice
  - RD regressions tend to estimate equations like

$$y = \beta \mathbf{1}_{X_i > c} + f(X_i) + \varepsilon$$

where  $\mathbf{1}_{X_i>c}$  is a dummy variable for being above the discontinuity, and  $f(X_i)$  is a very flexible function of the  $X_i$  (e.g. quadratic, cubic, etc)

 $oldsymbol{\circ}$  eta is the coefficient of interest

## RD in pictures



#### Back to the Mita

• In the Mita case, what is X? What is the discontinuity?

Olken () Deep Determinants 12 / 33

#### Back to the Mita





The mita boundary is in black and the study boundary in light gray. Districts falling inside the contiguous area formed by the mita boundary contributed to the mita. Elevation is shown in the background.

#### Back to the Mita

- In the Mita case, what is X?What is the discontinuity?
- This case is a little tricky since the discontinuity is a border, and X is really in two dimensions
- So in this case, Dell does it several ways
  - polynomial in latitude and longitude
  - distance to the mine at Potosi
  - distance to the border
- She also "zooms in" to get closer to the border this is also common practice

## Checking the discontinuity

- How might you check that the discontinuity the border is a good empirical design?
- You should check that nothing else systematically varies at the border
- In this case, what could you check?
  - Geography (elevation, slope)
  - Pre-period characteristics (log 1572 tribute rate)
- (Aside: why do we log so many variables? If a variable is in logs, how do we interpret coefficients?)

Olken () Deep Determinants 15 / 33

## Checking the discontinuity

TABLE I SUMMARY STATISTICS<sup>a</sup>

	Sample Falls Within											
	<100 km of Mita Boundary			<75 km of Mita Boundary		<50 km of Mita Boundary		<25 km of Mita Boundary				
	Inside	Outside	s.e.	Inside	Outside	s.e.	Inside	Outside	s.e.	Inside	Outside	s.e.
GIS Measures												
Elevation	4042	4018	[188.77] (85.54)	4085	4103	[166.92] (82.75)	4117	4096	[169.45] (89.61)	4135	4060	[146.16] (115.15)
Slope	5.54	7.21	[0.88]* (0.49)***	5.75	7.02	[0.86] (0.52)**	5.87	6.95	[0.95] (0.58)*	5.77	7.21	[0.90] (0.79)
Observations	177	95		144	86		104	73		48	52	
% Indigenous	63.59	58.84	[11.19] (9.76)	71.00	64.55	[8.04] (8.14)	71.01	64.54	[8.42] (8.43)	74.47	63.35	[10.87] (10.52)
Observations	1112	366		831	330		683	330		329	251	
Log 1572 tribute rate	1.57	1.60	[0.04] (0.03)	1.57	1.60	[0.04] (0.03)	1.58	1.61	[0.05] (0.04)	1.65	1.61	[0.02]* (0.03)

(Continues)

## Checking the discontinuity

TABLE I-Continued

	Sample Falls Within											
	<100 km of Mita Boundary		<75 km of Mita Boundary		< 50 km of Mita Boundary			<25 km of Mita Boundary				
	Inside	Outside	s.e.	Inside	Outside	s.e.	Inside	Outside	s.e.	Inside	Outside	s.e.
% 1572 tribute to												
Spanish Nobility	59.80	63.82	[1.39]*** (1.36)***	59.98	63.69	[1.56]** (1.53)**	62.01	63.07	[1.12] (1.34)	61.01	63.17	[1.58] (2.21)
Spanish Priests	21.05	19.10	[0.90]** (0.94)**	21.90	19.45	[1.02]** (1.02)**	20.59	19.93	[0.76] (0.92)	21.45	19.98	[1.01] (1.33)
Spanish Justices	13.36	12.58	[0.53] (0.48)*	13.31	12.46	[0.65] (0.60)	12.81	12.48	[0.43] (0.55)	13.06	12.37	[0.56] (0.79)
Indigenous Mayors	5.67	4.40	[0.78] (0.85)	4.55	4.29	[0.26] (0.29)	4.42	4.47	[0.34] (0.33)	4.48	4.42	[0.29] (0.39)
Observations	63	41		47	37		35	30		18	24	

#### Results

#### Does the Mita matter today?

TABLE II LIVING STANDARDS<sup>a</sup>

	Dependent Variable									
	Log Eq	uiv. Hausehold Consumptio	on (2001)		Stunted Growth, Children 6-9 (2005)					
Sample Within:	<100 km	<75 km	<50 km	<100 km	<75 km	<50 km	Border			
	of Bound.	of Bound.	of Bound.	of Bound.	of Bound.	of Bound.	District			
	(1)	(2)	(3)	(4)	(5)	(6)	(7)			
		Panel A	. Cubic Polynomial in	Latitude and Longitu	de					
Mita	-0.284	-0.216	-0.331	0.070	0.084*	0.087*	0.114**			
	(0.198)	(0.207)	(0.219)	(0.043)	(0.046)	(0.048)	(0.049)			
$R^2$	0.060	0.060	0.069	0.051	0.020	0.017	0.050			
		Pane	B. Cubic Polynomial	in Distance to Potosí						
Mita	-0.337***	-0.307***	-0.329***	0.080***	0.078***	0.078***	0.063*			
	(0.087)	(0.101)	(0.096)	(0.021)	(0.022)	(0.024)	(0.032)			
$R^2$	0.046	0.036	0.047	0.049	0.017	0.013	0.047			
		Panel C. 0	Cubic Polynomial in D	istance to Mita Bound	lary					
Mita	-0.277***	-0.230**	-0.224**	0.073***	0.061***	0.064***	0.055*			
	(0.078)	(0.089)	(0.092)	(0.023)	(0.022)	(0.023)	(0.030)			
$R^2$	0.044	0.042	0.040	0.040	0.015	0.013	0.043			
Geo. controls	ves	ves	ves	yes	ves	yes	yes			
Boundary F.E.s	yes	yes	yes	yes	yes	yes	yes			
Clusters	71	60	52	289	239	185	63			
Observations	1478	1161	1013	158,848	115,761	100,446	37,421			

#### Channels of Persistence

#### Land Tenure and Labor Systems

$$\label{eq:table_vi} \begin{split} & TABLE \; VI \\ LAND \; TENURE \; AND \; LABOR \; SYSTEMS^a \end{split}$$

			Dependent Variable		
	Haciendas per District in 1689	Haciendas per 1000 District Residents in 1689	Percent of Rural Tributary Population in Haciendas in ca. 1845	Percent of Rural Population in Haciendas in 1940	Land Gini in 1994
	(1)	(2)	(3)	(4)	(5)
		bic Polynomial i	n Latitude and L	ongitude	
Mita	-12.683*** (3.221)	-6.453** (2.490)	-0.127* (0.067)	-0.066 (0.086)	0.078 (0.053)
$R^2$	0.538	0.582	0.410	0.421	0.245
	Panel B. 0	Cubic Polynomia	al in Distance to	Potosí	
Mita	-10.316*** (2.057)	-7.570*** (1.478)	-0.204** (0.082)	-0.143*** (0.051)	0.107*** (0.036)
$R^2$	0.494	0.514	0.308	0.346	0.194
	Panel C. Cubi	c Polynomial in	Distance to Mita	Boundary	
Mita	-11.336*** (2.074)	-8.516*** (1.665)	-0.212*** (0.060)	-0.120*** (0.045)	0.124*** (0.033)
$R^2$	0.494	0.497	0.316	0.336	0.226
Geo. controls	ves	ves	ves	ves	yes
Boundary F.E.s	yes	yes	yes	yes	yes
Mean dep. var.	6.500	5.336	0.135	0.263	0.783
Observations	74	74	81	119	181

## Channels of Persistence

#### Education

TABLE VII EDUCATION<sup>a</sup>

		Dependent Variable	
	<u> </u>	Mean Years	Mean Years
	Literacy	of Schooling	of Schooling
	1876	1940	2001
	(1)	(2)	(3)
	Panel A. Cubic Polynomial i	n Latitude and Longitude	
Mita	-0.015	-0.265	-1.479*
	(0.012)	(0.177)	(0.872)
$R^2$	0.401	0.280	0.020
	Panel B. Cubic Polynomia	al in Distance to Potosí	
Mita	-0.020***	-0.181**	-0.341
	(0.007)	(0.078)	(0.451)
$R^2$	0.345	0.187	0.007
	Panel C. Cubic Polynomial in		
Mita	-0.022***	-0.209***	-0.111
	(0.006)	(0.076)	(0.429)
$R^2$	0.301	0.234	0.004
Geo. controls	yes	yes	yes
Boundary F.E.s	yes	yes	yes
Mean dep. var.	0.036	0.470	4.457
Clusters	95	118	52
Observations	95	118	4038

## Channels of Persistence

Roads

TABLE VIII ROADS<sup>a</sup>

		Dependent Variable	
	Density of	Density of	Density of Paved/Gravel
	Local Road	Regional Road	Regional
	Networks	Networks	Roads
	(1)	(2)	(3)
P	anel A. Cubic Polynomial	in Latitude and Longitude	
Mita	0.464	-29.276*	-22.426*
	(18.575)	(16.038)	(12.178)
$R^2$	0.232	0.293	0.271
	Panel B. Cubic Polynom	ial in Distance to Potosí	
Mita	-1.522	-32.644***	-30.698***
	(12.101)	(8.988)	(8.155)
$R^2$	0.217	0.271	0.256
Pa	nel C. Cubic Polynomial in	Distance to Mita Boundary	
Mita	0.535	-35.831***	-32.458***
	(12.227)	(9.386)	(8.638)
$R^2$	0.213	0.226	0.208
Geo. controls	yes	yes	yes
Boundary F.E.s	yes	yes	yes
Mean dep. var.	85.34	33.55	22.51
Observations	185	185	185

#### Bottom line

- What has the paper shown?
- Looking over time, areas inside the Mita area had:
  - Fewer haciendas
  - Fewer public goods (roads)
  - Less education
  - Less income today
  - And more likely to have Shining Path violence
- Suggests channels of institutional persistence

Olken () Deep Determinants 22 / 33

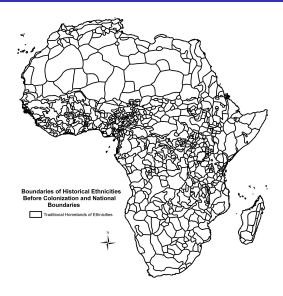
#### Ethnic institutions or national institutions

Michalopoulos and Papaioannou: "Divide and Rule or Rule of the Divided? Evidence from Africa"

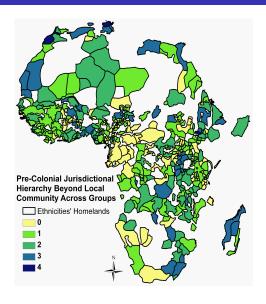
- Acemoglu, Johnson, and Robinson argued it was national institutions (influenced by colonialization) that affect modern development
- However, others have argued that in fact, pre-colonial ethnic institutions may also be important – how pre-colonial ethnic institutions were organized may also affect contemporary development.
- Why? One reason is that in many African countries, national governments have little power outside of national capitals, so old, pre-colonial institutions may largely be in place
- MP seek to answer this question, using a similar RD approach
  - Obtain data on pre-colonial ethnic boundaries and ethnic instituions from Murdock's *Ethnolinguistic Atlas of Africa*
  - Use the fact that national borders in Africa were drawn artificially
  - Use data on light intensity at night (remember the Korea picture?) to see how economic activity changes across the national border within

Olken () Deep Determinants 23 / 33

#### Ethnic Homelands before Colonization



#### Pre-Colonial Institutions before Colonization



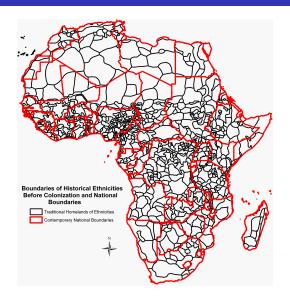
#### How African Borders Were Created



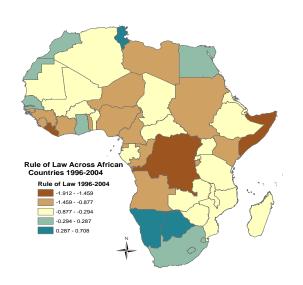
#### How African Borders Were Created

- African borders were decided in Berlin in 1884/1885 and 1890s
  - Colonizers had not even explored most of Africa when borders were agreed.
  - No ethnicity-specific measure predicts which ethnicities were partitioned
  - Drawing involved protectorates, large (free-trade) areas, and spheres of in‡uence rather than potential states.

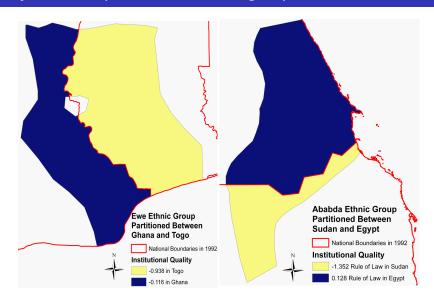
#### African Borders vs. Ethnic Borders



#### African Borders and National Institutions



## They examine partitioned ethnic groups



## Results show that national instittuions matter much less within ethnicities

Panel A: Global Polynomial Control Function Method

	(1)	(2)	(3)	(4)	(5)	(6)	
Rule of Law	0.8153***	0.0644	0.6432**	0.0349			
	(0.2645)	(0.2795)	(0.2591)	(0.3294)			
Control of Corruption					0.9522*** (0.2990)	-0.1235 (0.3214)	
Adjusted R-squared	0.301	0.843	0.403	0.846	0.298	0.841	
Ethnicity Fixed Effects	No	Yes	No	Yes	No	Yes	
Population Density	Yes	Yes	Yes	Yes	Yes	Yes	
RD Polynomial	Yes	Yes	Yes	Yes	Yes	Yes	
Location Controls	No	No	Yes	Yes	No	No	
Geographic Controls	No	No	Yes	Yes	No	No	
Observations	454	454	454	454	454	454	

#### Conclusions

- What have we learned from this?
  - Long-lasting effects of institutions colonial and ethnic
  - Visible within countries, not just between countries

Olken () Deep Determinants 32 / 33

#### References

- Dell (2010): "The Persistent Effects of Peru's Mining MITA"
- Michalopoulos and Papaioannou (2011): "Divide and Rule or the Rule of the Divided? Evidence from Africa"

Olken () Deep Determinants 33 / 33