

# Commuting Infrastructure in Fragmented Cities

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## Cities, local governments, and transport infrastructure

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  - Significant commuting across governments:
  - **Santiago** → 73% across municipalities + 80% of travel time in municipal roads

## Cities, local governments, and transport infrastructure

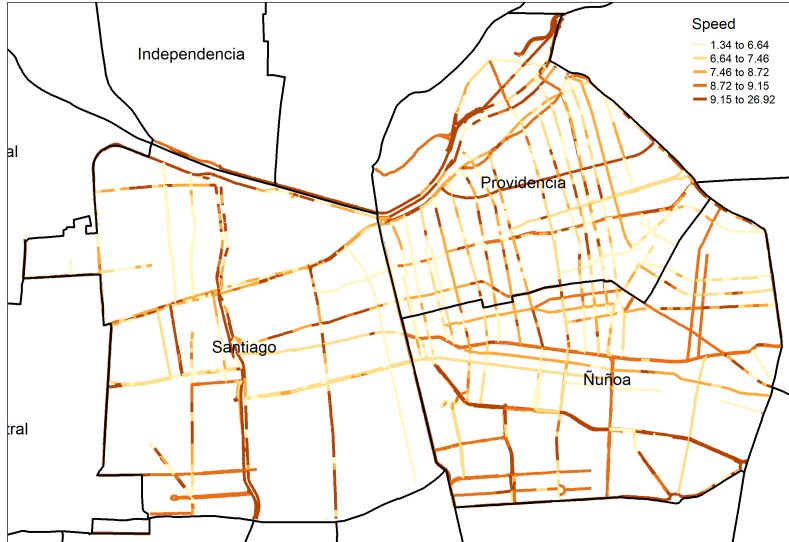
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**How does decentralization affect commuting infrastructure (roads) within cities?**

**What are the implications for welfare and the distribution of economic activity?**

## Santiago: Main avenues across municipalities



# This paper

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1. **Theory:** City equilibrium  $\leftrightarrow$  Commuting infrastructure decided by municipalities
  - Internal structure of the city: Locations with different amenities and productivity
  - Households choose where to live and work within the city
  - Municipalities build infrastructure maximize their residents' and workers' wage bill

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→ Productive/central municipalities underinvest

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→ “In between” municipalities underinvest the most



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  - Productive/central municipalities underinvest
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  - “In between” municipalities underinvest the most
- $\uparrow$  cross-jurisdiction commuting costs,  $\uparrow$  dispersed employment  $\implies$  polycentric city

## 2. **Empirical Application:** Santiago, Chile

- Testing the model predictions → Infrastructure at the border
- Estimate the model
- Counterfactuals: Centralized Santiago

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**Preview of the results** from the counterfactual analysis:

- It is not only about building more, but allocating roads more efficiently.

# Plan for today

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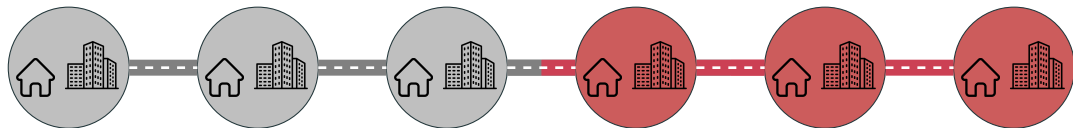
1. **Model:** Simplified model → **Linear city**
  - Mechanisms and model predictions
2. **Empirical application:** Santiago, Chile
  - Pattern of infrastructure at the border
  - Estimation of the model's parameters
  - Counterfactual analysis

## Theoretical Framework

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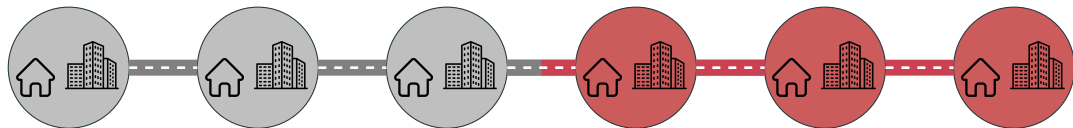
## Overview of the model in words - Linear city

- **Geography:** Locations and edges in a line
  - Locations: Land for production and housing. Heterogeneous productivity and amenities



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- **Commuting:** Traveling through an edge is costly
  - Function of infrastructure (+ traffic flows in the full model)
- **Local governments:** Subset of locations & edges.
  - Choose the edges' infrastructure level to maximize their residents' and workers' wage bill





## Households:

- Households face land prices,  $q_{Ri}$ , amenities,  $\bar{B}_i$ , wages,  $w_j$ , and commuting costs,  $\tau_{ij}$
- + idiosyncratic preference shocks for residency and workplace:  $\varepsilon_{ij} \sim \text{Fréchet}(\theta)$

Travel Demand:  $L_{ij} = \tau_{ij}^{-\theta} \left( \frac{\bar{B}_i}{q_{Ri}^{1-\alpha}} \right)^\theta w_j^\theta \frac{L}{U^\theta}$ , where  $U \equiv \left[ \sum_{rs} \tau_{ij}^{-\theta} \times \left( \frac{\bar{B}_i}{q_{Ri}^{1-\alpha}} \right)^\theta \times w_j^\theta \right]^{\frac{1}{\theta}}$

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## Commuting:

$$\tau_{ij} = \prod_{k\ell} \mathbb{1}_{ij}^{k\ell} d_{k\ell}, \quad \text{where } \mathbb{1}_{ij}^{k\ell} = 1 \text{ if pair } ij \text{ uses edge } k\ell$$

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**Firms:** Competitively produce a **freely traded** numeraire good using land and labor

## Government's objective

- A local government  $g$  chooses  $I_{k\ell}$  in their jurisdiction  $\{\mathcal{J}^g, \mathcal{E}^g\}$  to maximize their residents' and workers' wage bill, minus building costs:

$$\max_{I_{k\ell} \in \mathcal{E}^g} \sum_{ij} \left\{ \omega_R \mathbb{1}[i \in \mathcal{J}^g] L_{ij} w_j + \omega_F \mathbb{1}[j \in \mathcal{J}^g] L_{ij} w_j \right\} - \sum_{(k\ell) \in \mathcal{E}^g} \delta_{k\ell}^I I_{k\ell}$$

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- This objective function nests the following:

1. Maximize **land value** when

$$\omega_R = (1 - \alpha), \quad \omega_F = \frac{(1 - \beta)}{\beta}$$

2. Maximize **tax revenue** when

$$\omega_R = \tau_H(1 - \alpha), \quad \omega_F = \tau_W$$

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- Subject to:
  1. Equilibrium travel demands:  $L_{ij}$   $[\lambda_{ij}^g]$
  2. Equilibrium wage (from labor demand):  $w_i$   $[\eta_{Fi}^g]$
  3. Residential land market clearing:  $q_{Ri}$   $[\eta_{Ri}^g]$
- Government  $g$  takes other governments  $g'$  infrastructure investments as given



## City Equilibrium

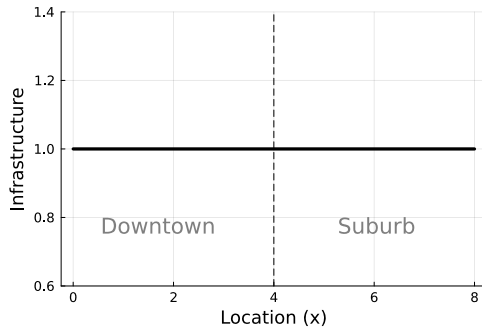
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### Exogenous Characteristics

Productivity

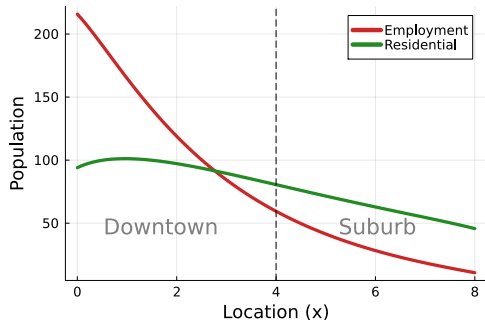


Infrastructure (Roads)

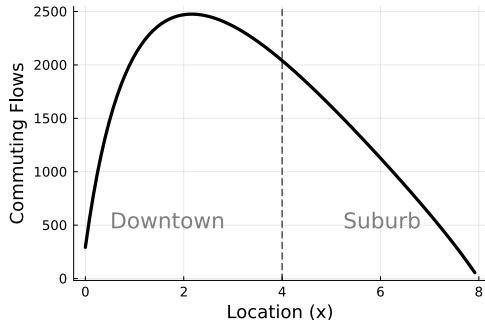


## Example city: Endogenous quantities

Population



Traffic Flows



## Optimal Infrastructure

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## Government's problem: Optimal infrastructure

- From the F.O.C. with respect to  $I_{kl}$ :

$$\underbrace{-\frac{\partial d_{kl}}{\partial I_{kl}} \sum_{ij} \lambda_{ij}^g \frac{\partial L_{ij}}{\partial d_{kl}}}_{\text{Benefit of I}} = \underbrace{\delta_{kl}^I}_{\text{Cost of I}}$$

## Government's problem: Optimal infrastructure

- From the F.O.C. with respect to  $I_{kl}$ :

$$\underbrace{-\frac{\partial d_{kl}}{\partial I_{kl}}}_{\text{Direct Effect}} \sum_{ij} \lambda_{ij}^g \frac{\partial L_{ij}}{\partial d_{kl}} = \underbrace{\delta_{kl}^I}_{\text{Cost of I}}$$

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- $\sum_{ij} \lambda_{ij}^g \frac{\partial L_{ij}}{\partial d_{kl}}$  is the **total value captured by government  $g$  from a reduction in  $d_{kl}$** :

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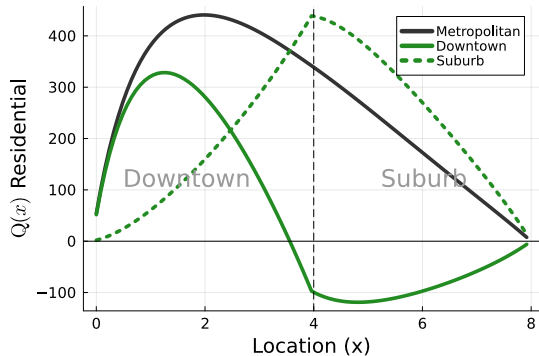
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$$\underbrace{\sum_{ij} \left( \mathbb{1}[i \in \mathcal{J}^g] \omega_R w_j + \eta_{Ri}^g \frac{\partial q_{Ri}}{\partial L_{ij}} \right) \frac{\partial L_{ij}}{\partial d_{kl}}}_{\text{Residential Effect: } \equiv Q_{kl}^g(R)} + \underbrace{\sum_{ij} \left( \mathbb{1}[j \in \mathcal{J}^g] \omega_F w_j + \eta_{Fj}^g \frac{\partial w_j}{\partial L_{ij}} \right) \frac{\partial L_{ij}}{\partial d_{kl}}}_{\text{Employment Effect: } \equiv Q_{kl}^g(F)}$$

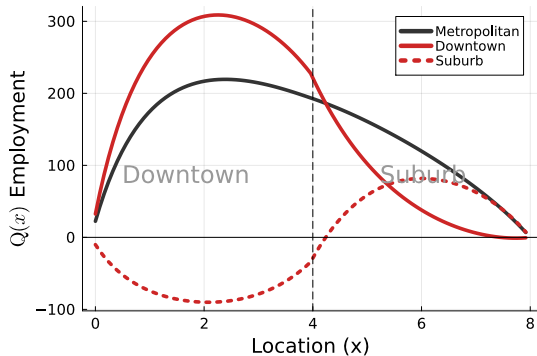


# Residential and employment forces

Residential Effect

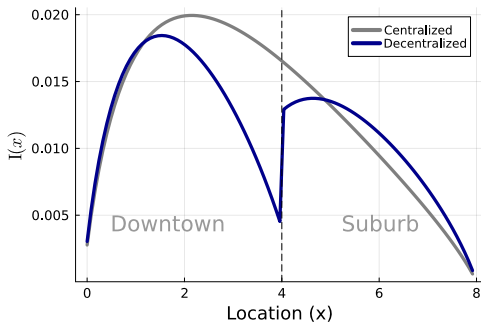


Employment Effect



# Centralized vs Decentralized Equilibrium

(a) Infrastructure:  $I^g$  and  $I^*$



(b) Relative:  $I^g/I^*$



City structure

Political Weights

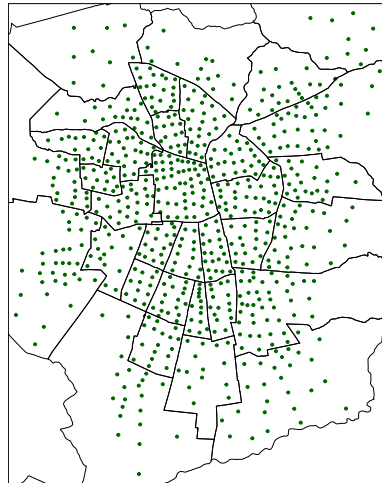
Other Objectives

## **Empirical Application: Santiago**

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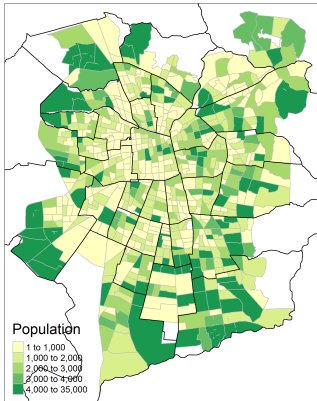
# Data

- Origin-Destination Travel Survey (2012)  $\rightarrow L_{ij}$
- Land use and tax appraisal data (SII, 2014)  $\rightarrow \bar{H}_R$  and  $\bar{H}_F$
- Traffic flows and speeds (2022) for 70 locations
  - **Flows:** Automatic traffic measurement stations.
  - **Speed:** Google Maps API, real-time speed
- Road network:
  - Roads by type (ownership) documented by the government (Census 2017)
  - Open Street Maps: Width and number of lanes, type of road

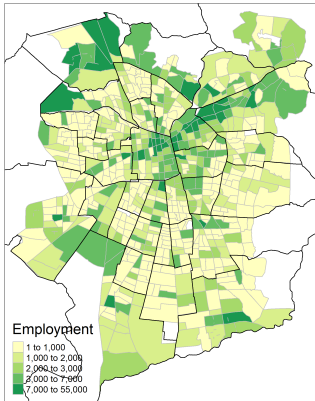


# Data: Population, Employment and Density Distribution

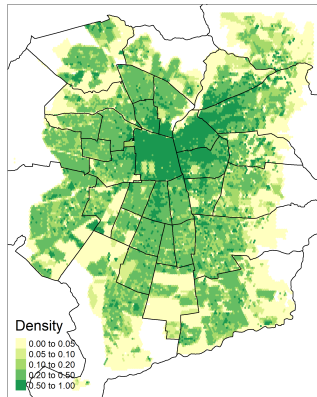
(a) Population



(b) Employment



(c) Urban Density



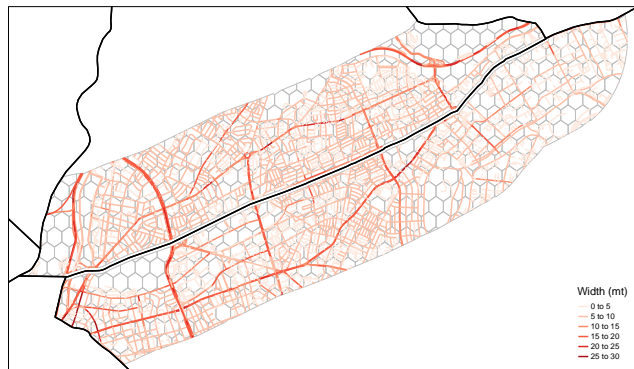
## Infrastructure at the border

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## Road density at the border between municipalities

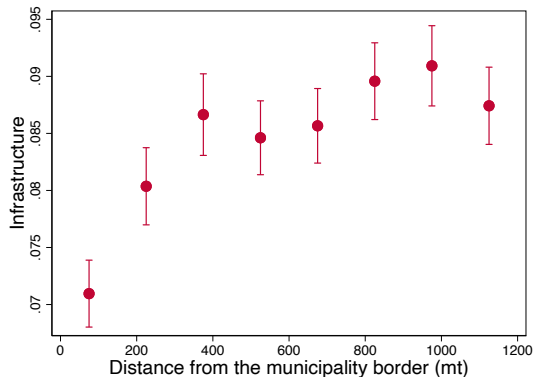
- Select borders that: 1) do not coincide with a highway, 2) smooth geography
- Measure percentage of land covered in roads in a buffer around the border

**Figure 3:** Example of one border between municipalities



# 1. Decreasing density of roads closer to the border

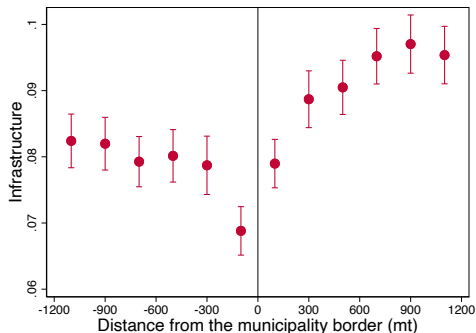
**Figure 4:** Average road density as function of distance





## 2. Discontinuity in road density at the border between municipalities

Figure 5: Average road density



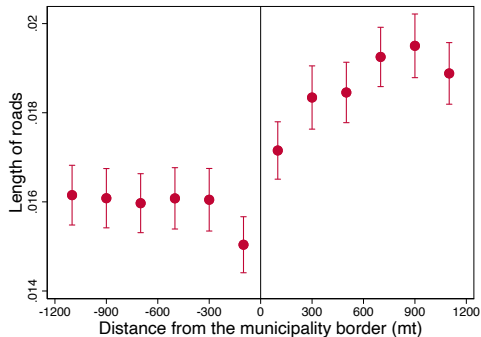
- **Ordering** procedure around the border:
  - Average infrastructure: Highest overall level on the right side of the border
- Similar pattern in other cities in Latin America: Other cities

Placebo Borders

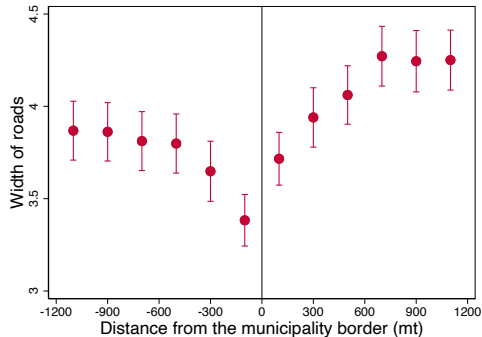
Balance

### 3. Discontinuity in road density at the border: “Extensive” vs “Intensive”

(a) Average length



(b) Average width



## Model Estimation

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1. **Land share parameters:**  $(1 - \alpha)$  and  $(1 - \beta)$

- Household survey (CASEN): Land share of utility,  $1 - \alpha = 0.25$
- From Tsivanidis ([2019](#)): Land share of production,  $1 - \beta = 0.2$

## Estimation: Key Parameters

### 1. Land share parameters: $(1 - \alpha)$ and $(1 - \beta)$

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### 2. Parameters of the transportation technology:

- Congestion elasticity,  $\sigma = 0.14$ : real time flow and speed data in Santiago Estimation
- Infrastructure elasticity,  $\xi = 0.13$ : Discontinuity in infrastructure at the border
- Exogenous edge-level speed,  $\bar{t}_{k\ell}$ : invert given  $\sigma$ ,  $\xi$ , and travel times from Google maps

## Estimation: Government Weights

Take a link  $(k, \ell)$  across municipalities:  $g(k) \neq g(\ell)$

- **Assumption:** Building costs are the same across the municipality border
- This implies the following moment condition:

$$\underbrace{\frac{I_{kl}^{g(k)}}{I_{kl}^{g(\ell)}}}_{\text{Data}} = \underbrace{\frac{t_{kl}^k \sum_{ij} \lambda_{ij}^{g(k)} \frac{\partial L_{ij}}{\partial d_{kl}}}{t_{kl}^\ell \sum_{ij} \lambda_{ij}^{g(\ell)} \frac{\partial L_{ij}}{\partial d_{kl}}}}_{\text{Data} + \text{Model function of } \omega_R \text{ and } \omega_F}$$

- By minimum distance estimation:

$$\omega_R = 0.33, \quad \omega_F = 0.26$$



## Estimation: Other Parameters

### 3. Location characteristics:

- Use the gravity equation and observed  $L_{ij}$  to invert  $\{\bar{A}_i, \bar{B}_i\}$

### 4. Building costs: Building costs at the border

- Invert from the model such that the observed infrastructure =  $I_{kl}^g$  from the model:

$$\underbrace{-\frac{\partial d_{kl}}{\partial I_{kl}} \left(1 - \frac{\partial Q_{kl}}{\partial d_{kl}} \frac{\partial d_{kl}}{\partial Q_{kl}}\right)^{-1} \sum_{ij} \lambda_{ij}^g \frac{\partial L_{ij}}{\partial d_{kl}}}_{\text{Data+Model}} = \underbrace{\delta_{kl}^I}_{\text{Building Cost}}$$

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### 5. Shape parameters of idiosyncratic preferences: $\mu$ , $\theta$ , and $\rho$

- **City choice:** From Head and Mayer (2013)  $\mu = 2$
- **Within city residence-work choice:** From Pérez Pérez et al. (2022):  $\theta = 8$
- **Commuting Route choice:** I am setting  $\rho = 90$  (condition for spectral radius  $< 1$ )



## Counterfactual: Centralized City

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Two counterfactuals:

1. **Centralized city**: one metropolitan planner choosing the transport infrastructure
2. **Centralized city | budget**: metropolitan planner, **conditional to baseline budget**

**Table 1:** Aggregate effects (%)

| Variable                      | Centralized | Centralized Budget |
|-------------------------------|-------------|--------------------|
| Population                    | 5.3         | 3.5                |
| Welfare                       | 2.3         | 1.5                |
| Surplus                       | 4.2         | 3.9                |
| Expenditure in Infrastructure | 77          | 0                  |
| Average commuting costs       | -0.9        | -0.3               |

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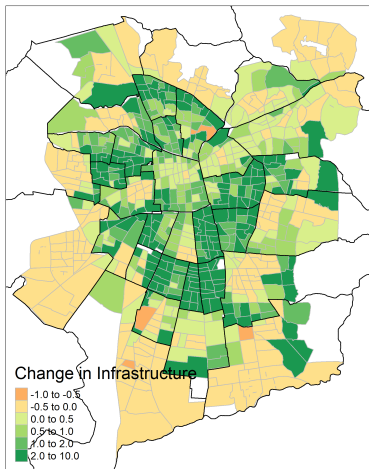
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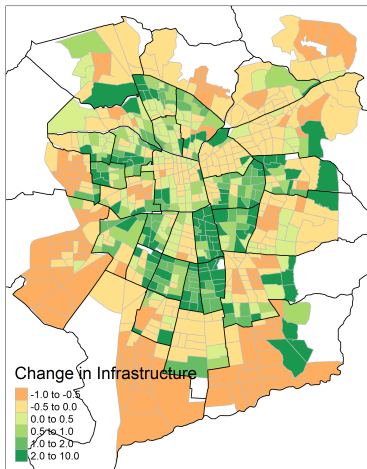
| Variable                      | Centralized | Centralized Budget | Relative |
|-------------------------------|-------------|--------------------|----------|
| Population                    | 5.3         | 3.5                | 66%      |
| Welfare                       | 2.3         | 1.5                | 65%      |
| Surplus                       | 4.2         | 3.9                | 93%      |
| Expenditure in Infrastructure | 77          | 0                  | -        |
| Average commuting costs       | -0.9        | -0.3               | 30%      |

## Centralized counterfactual: Distribution of $\Delta I_{kl}$ in space

(a)  $\% \Delta I_{kl}$

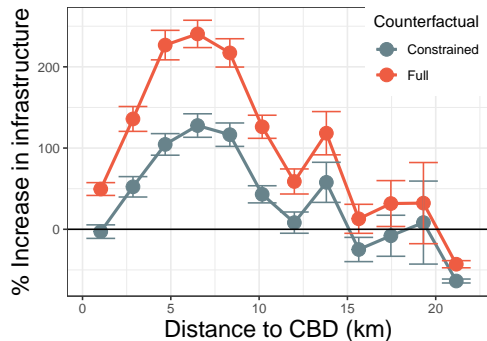


(b)  $\% \Delta I_{kl}$  with budget

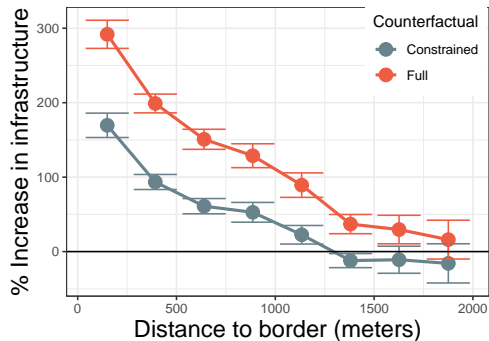


## Centralized counterfactual: Distribution of $\Delta I_{kl}$ in space

(a) Distance to CBD

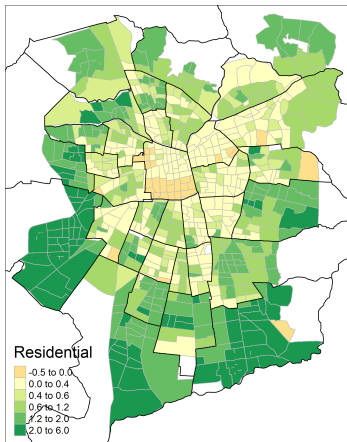


(b) Distance to border

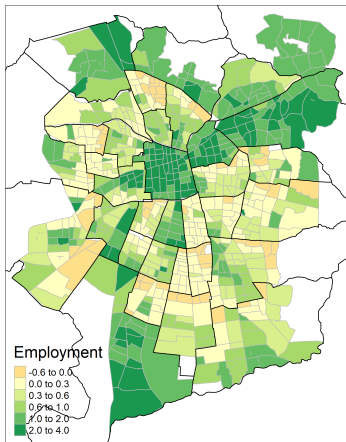


# Explaining under-investment: Residential and employment forces

(a) Residential Flows:  $\frac{Q(R)^g}{Q(R)^*}$

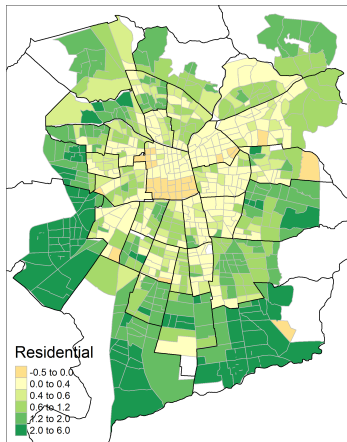


(b) Employment Flows:  $\frac{Q(F)^g}{Q(F)^*}$

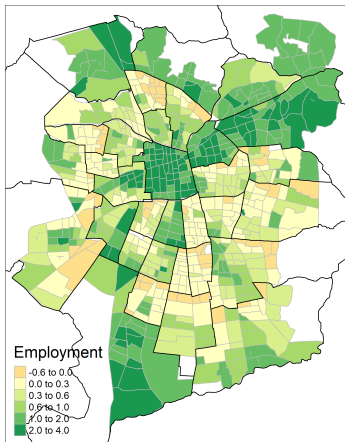


# Explaining under-investment: Residential and employment forces

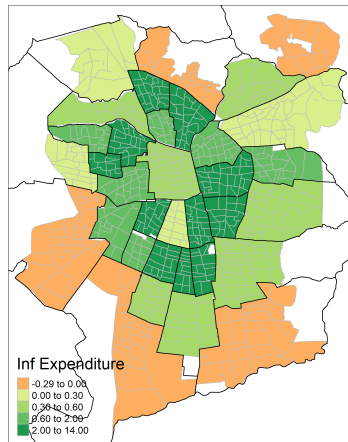
(a) Residential Flows:  $\frac{Q(R)^g}{Q(R)^*}$



(b) Employment Flows:  $\frac{Q(F)^g}{Q(F)^*}$



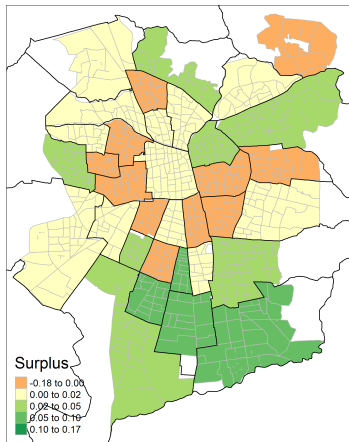
(c) % $\Delta$  Total Expenditure





## Discussion: Trade-offs of decentralization

Figure 10:  $\Delta$  in surplus



- **Centralized city:**  
⇒ Bigger + more “specialized” + longer commutes
- **Decentralized city:**  
⇒ Smaller + Polycentric + “15-minute” city
- Trade-offs of these two urban patters:  
⇒ Winners and losers of decentralization

## Conclusion

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- Local governments around the world play an important role in local commuting infrastructure investment
- Metropolitan areas are highly fragmented
- **This paper:**  
New quantitative spatial model studying local governments' incentives to invest in commuting infrastructure  $\implies$  **misallocation of infrastructure**

## Conclusion

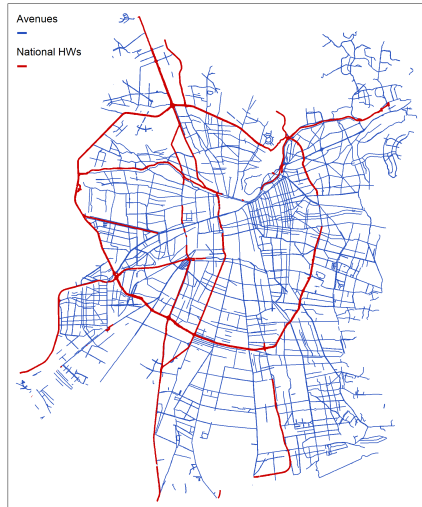
- Local governments around the world play an important role in local commuting infrastructure investment
- Metropolitan areas are highly fragmented
- **This paper:**  
New quantitative spatial model studying local governments' incentives to invest in commuting infrastructure  $\implies$  **misallocation of infrastructure**

### Future research:

- Incorporate households' socio-economic heterogeneity Results by SES
- Environmental externalities: pollution and disamenities from traffic/infrastructure

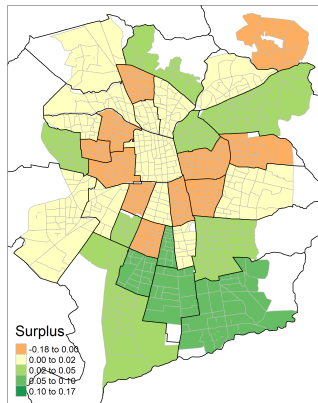
Thank you!

- Metropolitan infrastructure is provided by **municipalities** and the **national governments**:
  - 83% of “large” roads are municipal
  - 96% of all roads are municipal
- Using Google Maps and the Origin-Destination travel survey (2012):
  - The average commuting trip **spends 80% of the travel time** on municipal infrastructure
- I focus on the road network:
  - 62% of commutes use surface transport (car, taxi, bus, bike). 31% travel by car

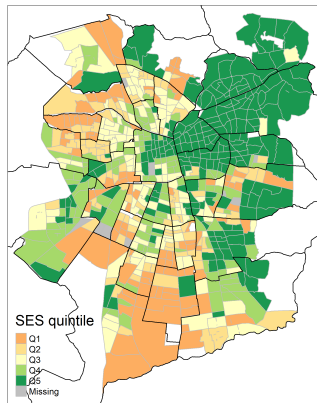


# Winners and losers by socio-economic status

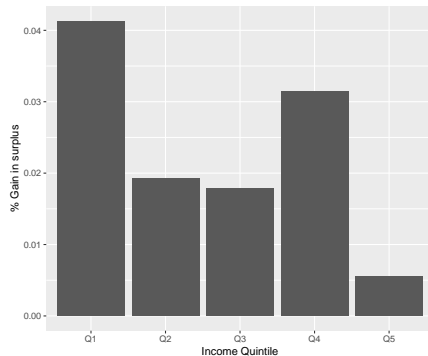
(a)  $\Delta$  in surplus by municipality



(b) SES



(c) Surplus gain by income quintile



# Government's Problem: Constraints

- Travel demand:

$$L_{ij} = \tau_{ij}^{\theta} \left( \frac{\bar{B}_i}{r_{Ri}^{1-\alpha}} \right)^{\theta} w_j^{\theta} \frac{L}{\bar{W}^{\theta}}, \quad \forall i, j \in \mathcal{J}$$

- Wage (from labor demand)

$$w_i = \bar{A}_i \left( \frac{\beta}{1-\beta} \frac{\bar{H}_{Fi}}{L_{Fi}} \right)^{1-\beta}, \quad \forall i \in \mathcal{J}$$

- Residential land market clearing:

$$r_{Ri} = (1-\alpha) \frac{L_{Ri}}{\bar{H}_{Ri}} \mathbb{E}[w_k | i], \quad \forall i \in \mathcal{J}$$

- Business land market clearing:

$$r_{Fi} = \left( \frac{w_i^{\beta}}{\bar{A}_i} \right)^{\frac{1}{\beta-1}}, \quad \forall i \in \mathcal{J}$$

- Commuting costs:

$$\tau_{ij} = \prod_{(k,\ell) \in \mathcal{R}_{ij}} d_{k\ell}, \quad d_{k\ell} = \exp \left( \bar{t}_{k\ell} \frac{Q_{k\ell}^{\sigma}}{I_{k\ell}^{\xi}} \right)$$



## Stochastic Routing: Matrix Magic

- Idiosyncratic preferences for routes + no restrictions on possible routes:

$$\mathbf{A} \equiv [d_{ij}^{-\rho}], \quad \tau_{ij} \equiv \left( \sum_{r \in \mathcal{R}_{ij}} \tau_{ij,r}^{-\rho} \right)^{-\frac{1}{\rho}} \implies \tau_{ij}^{-\rho} = \sum_{K=0}^{\infty} A_{ij}^K$$

- Under some conditions of  $\mathbf{A}$ :

$$\sum_{K=0}^{\infty} \mathbf{A}^K = (\mathbf{I} - \mathbf{A})^{-1} \equiv \mathbf{B} \implies \tau_{ij} = b_{ij}^{-\frac{1}{\rho}}$$

# Role of congestion

- Now the optimal infrastructure is given by:

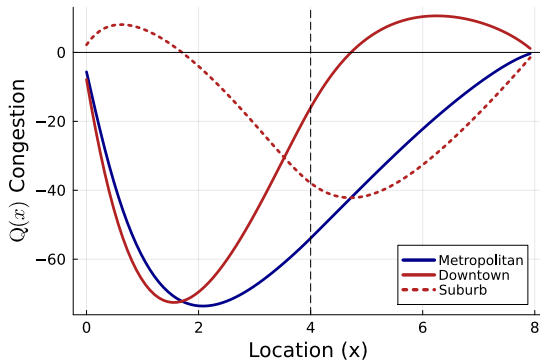
$$\underbrace{-\frac{\partial d_{kl}}{\partial I_{kl}} \left(1 - \frac{\partial Q_{kl}}{\partial d_{kl}} \frac{\partial d_{kl}}{\partial Q_{kl}}\right)^{-1} \sum_{ij} \lambda_{ij}^g \frac{\partial L_{ij}}{\partial d_{kl}}}_{\text{Benefits}} = \underbrace{\delta_{kl}^I}_{\text{Building cost}}$$

- $\sum_{ij} \lambda_{ij}^g \frac{\partial L_{ij}}{\partial d_{kl}}$  is the total land value captured by government  $g$  from a reduction in  $d_{kl}$ :

$$\sum_{ij} \lambda_{ij}^g \frac{\partial L_{ij}}{\partial d_{kl}} = \underbrace{\sum_{ij} \eta_{Ri}^g \frac{\partial q_{Ri}}{\partial L_{ij}} \frac{\partial L_{ij}}{\partial d_{kl}}}_{\text{Residential E.: } \equiv Q_{kl}^g(R)} + \underbrace{\sum_{ij} \eta_{Fj}^g \frac{\partial q_{Fj}}{\partial L_{ij}} \frac{\partial L_{ij}}{\partial d_{kl}}}_{\text{Employment E.: } \equiv Q_{kl}^g(F)} + \underbrace{\sum_{ij} \sum_{kl} \phi_{kl}^g \left( \frac{\partial Q_{kl}}{\partial L_{ij}} \frac{\partial L_{ij}}{\partial d_{kl}} + \frac{\partial Q_{kl}}{\partial \pi_{ij}^{kl}} \frac{\partial \pi_{ij}^{kl}}{\partial d_{kl}} \right)}_{\text{Congestion Effect: } \equiv Q_{kl}^g(Q)}$$

# Congestion effect

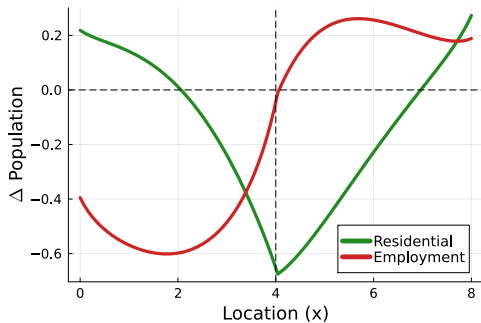
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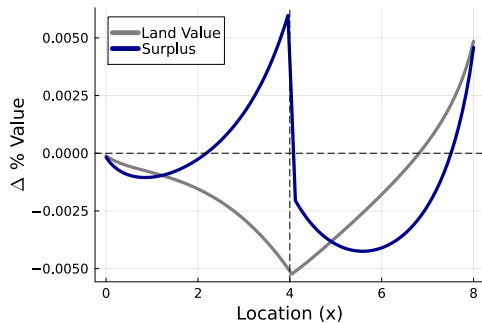
- Difference between decentralized and centralized equilibrium:

$$\Delta X = X_{\text{Decentralized}} - X_{\text{Centralized}}$$

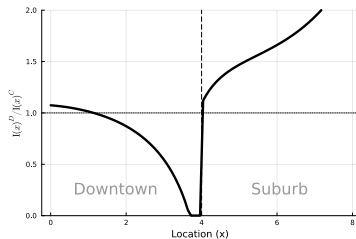
(a) Population



(b) Land Value & Surplus



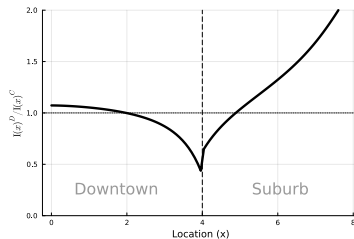
(a)  $\frac{\omega_F}{\omega_R} = 0.5$



(b)  $\frac{\omega_F}{\omega_R} = 1$



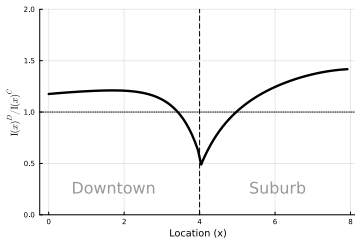
(c)  $\frac{\omega_F}{\omega_R} = 1.5$



# Other objective functions for the governments [back](#)

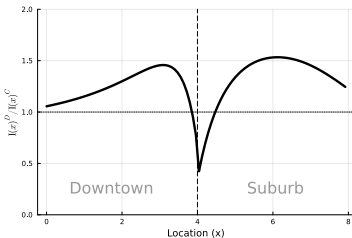
**(a) Total Utility:**  

$$\sum_{ij} \{ \omega_R \mathbb{1}_i L_{ij} U + \omega_F \mathbb{1}_j L_{ij} U \}$$



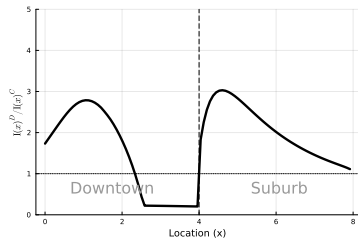
**(b) Weighted by “real” wages:**  

$$\left\{ \omega_R \mathbb{1}_i L_{ij} \frac{w_j}{\tau_{ij} q_{Ri}^{1-\alpha}} + \omega_F \mathbb{1}_j L_{ij} \frac{w_j}{\tau_{ij} q_{Ri}^{1-\alpha}} \right\}$$



**(c) Average real wages:**  

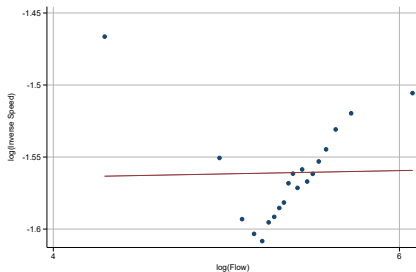
$$\left\{ \omega_R \mathbb{1}_i \frac{L_{ij}}{L_{Ri}} \frac{w_j}{\tau_{ij} q_{Ri}^{1-\alpha}} + \omega_F \mathbb{1}_j \frac{L_{ij}}{L_{Fj}} \frac{w_j}{\tau_{ij} q_{Ri}^{1-\alpha}} \right\}$$



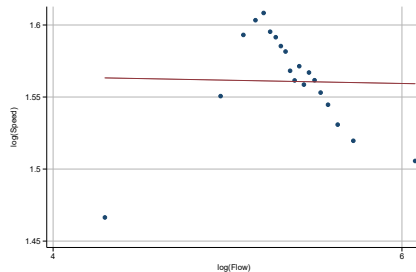
## 70 locations in Santiago → Relationship between flows and speed

Bin-scatter controlling for Fixed Effects: day of the week, hour of the day, and intersection.

**(a)**  $\log(\text{Travel time})$  and  $\log(\text{traffic flows})$

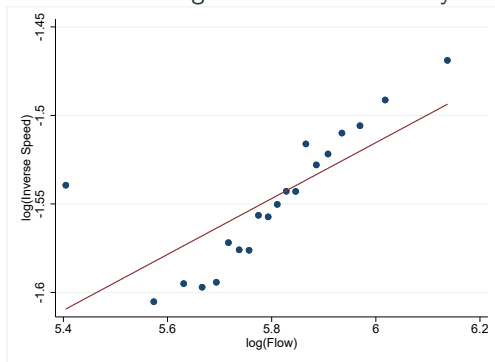


**(b)**  $\log(\text{Speed})$  and  $\log(\text{traffic flows})$



# Congested roads: Relationship between flows and speed

Bin-scatter controlling for Fixed Effects: day of the week, hour of the day, and intersection.



**Table 2: OLS**

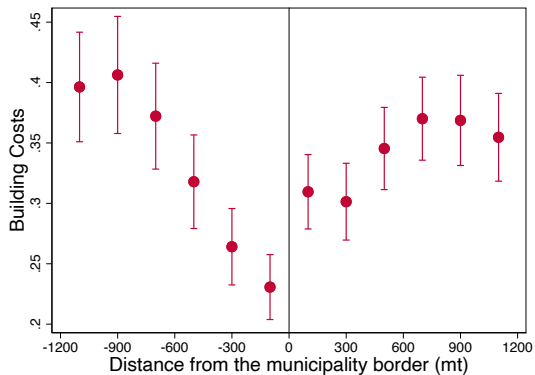
|  | $\ln(\text{Speed})$        |
|--|----------------------------|
| $\ln(\text{Traffic Flow})$               | $-0.144^{***}$<br>(0.0103) |
| Observations                             | 35068                      |
| Adjusted $R^2$                           | 0.617                      |
| FE: Hour, day of the week, intersection. |                            |

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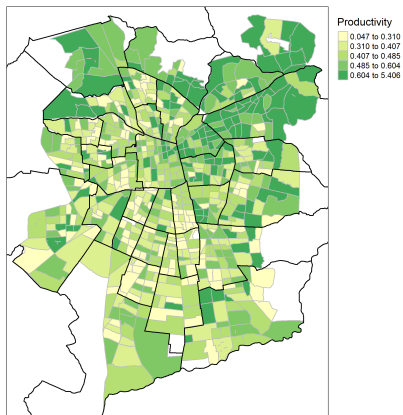
## Recovered building costs at the border

**Figure 16:** Average building cost

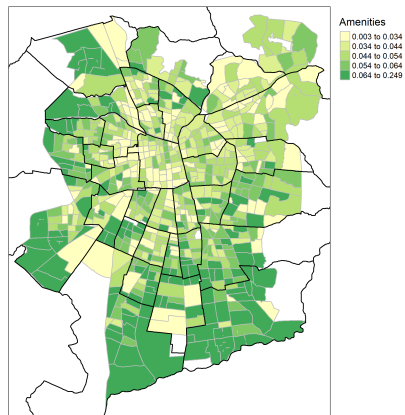


# Amenities and Productivities

(a) Productivities



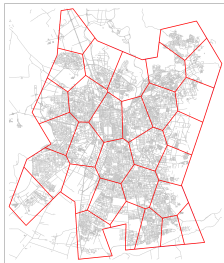
(b) Amenities



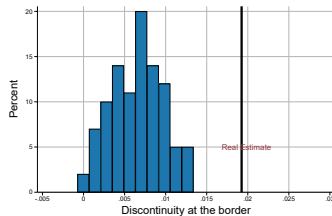
# Placebo Test: Fake municipality borders

Figure 18: Placebo Analysis

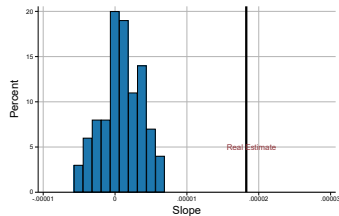
Placebo municipalities



(a) Discontinuities histogram

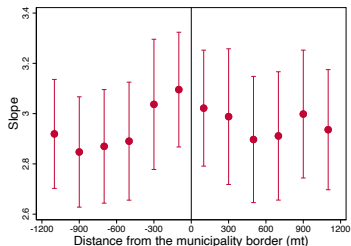


(b) Slope histogram

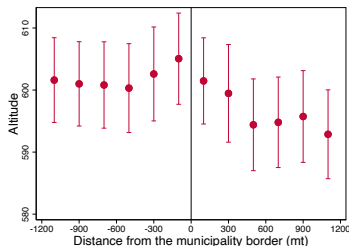


# Other variables at the border between municipalities

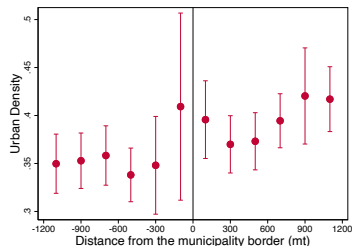
(a) Slope



(b) Altitude



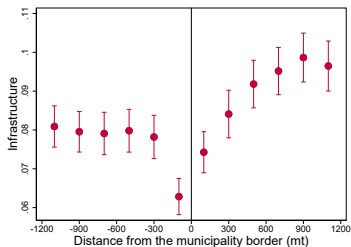
(c) Built density (endogenous)



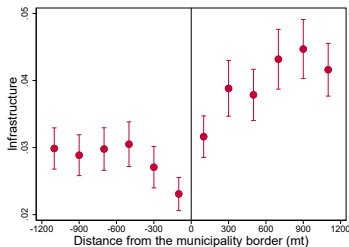
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## Other cities in Latin America have similar patterns [back](#)

(a) Bogotá, Colombia



(b) Lima, Peru



(c) Mexico City

