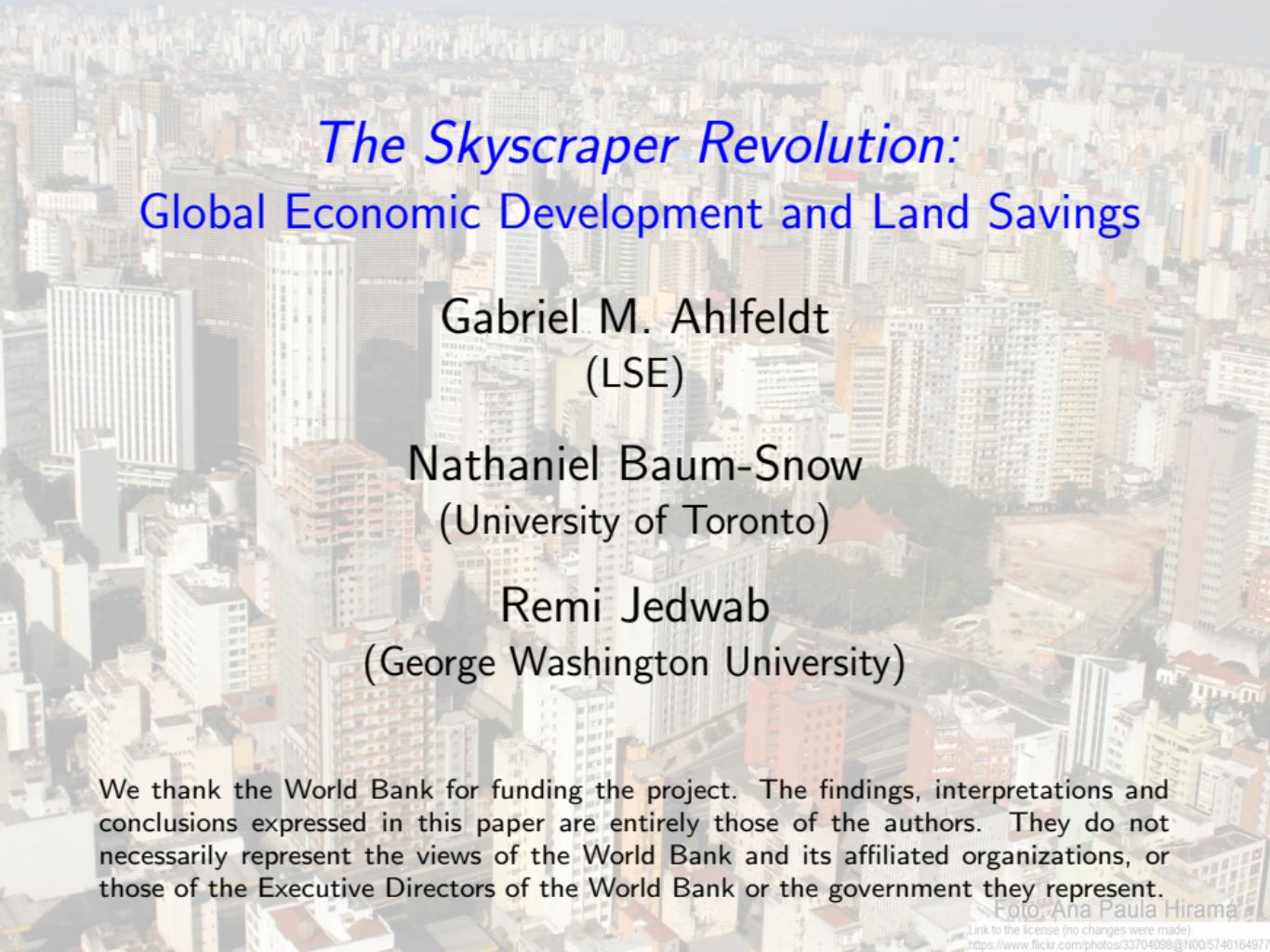




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# *The Skyscraper Revolution: Global Economic Development and Land Savings*

Gabriel M. Ahlfeldt  
(LSE)

Nathaniel Baum-Snow  
(University of Toronto)

Remi Jedwab  
(George Washington University)

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# Outline

Introduction

Data

Empirics

Model

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- ▶ Exponential growth in global aggregate building height since 1970s
  - ▶ Much in developing economies (previous photo: São Paulo)
  - ▶ 15 trillion dollars c. 2015. 10% of built volume in million+ cities

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- ▶ Main literature: (i) urban transportation infrastructure & city growth (railroads, roads, subways) (ii) technology & economic development

## Our Analysis

- ▶ Global panel data analysis
  - ▶ Novel database: 12,877 world cities (90% world's urban pop) in 1975 and 2015. RHS: tall building stock. LHS: pop, area.
  - ▶ Emporis: data on all tall buildings ( $\geq 55$  m, 180 ft, 14 stories) ever built worldwide: height, construction year, some cost info

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  - ▶ “Clean slate” of tall buildings in developing countries in 1975  
Larger cities 1975 more likely to adopt tall buildings post-1975
  - ▶ But foundations needed to resist lateral winds. If bedrock ...
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- ▶ Height elasticities: pop 13%, built area -16%, pop. density 29%
- ▶ Model: Economic benefits of tall buildings  $\sim 6\%$  of global welfare (ignore costs). 1/4 realized, likely due to height restrictions

# Literature

## 1. Economics of skyscrapers [we study global economic effects]

Barr '10, '12, Barr et al '11, Ahlfeldt & McMillen 2018, Liu et al '18, '20, Ahlfeldt & Barr '20, '22, Jedwab et al '20, '21, Jedwab & Barr '22, Jedwab '22

## 2. Causes of sprawl [we focus on the role of tall buildings]

Bertaud & Brueckner '05, Burchfield et al '06, Baum-Snow '07, '22, Brueckner & Sridhar '12, Jedwab et al '20, '21, Ahlfeldt & Barr '22

## 3. Economics of density [we examine the effects of tall buildings]

Combes & Gobillon '15, Ahlfeldt & Pietrostefani '19, Duranton & Puga '20 for surveys; Rosenthal & Strange '08 and Combes et al '11 for geological IVs

## 4. Global differences in urbanization [we find heterogeneous effects]

Jedwab et al '17, '19, '21, Chauvin et al '16, Bryan & Morten '18

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- ▶ Sample: 12,877 50K+ agglomerations\* today (*urban centres* from GHS)
- ▶ City-level outcomes:

From GHS, *pop*, *built-up area* and *land area* 1975 (1990 2000) 2015

Radiance calibrated version of the DMSP *night lights* 1996-2011\*\*

Global *land use* data 1982-2015 (deforestation, cropland, etc.)

- ▶ Main variable of interest:

*Tall building stocks (km)* for each city 1975 (1990 2000) 2015

*Emporis*: city, height ( $\geq 55$  m, 180 ft, 14 stories), year of construction

Information provided by industry. "*Emporis collects information about the full life-cycle of each building, from idea to demolition*"

\* Urban centres correspond to commuting zones. For example, New York UC includes "New York; Islip; Newark; Jersey City; Yonkers; Huntington; Paterson; Stamford; Elizabeth; New Brunswick"

\*\* Radiance calibrated = NOT top coded at 63.



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Over 700,000 buildings worldwide

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## Emporis Research

Use Emporis Research to analyze building-related information. View contact details of companies you wish to connect with. Whether you are looking for major



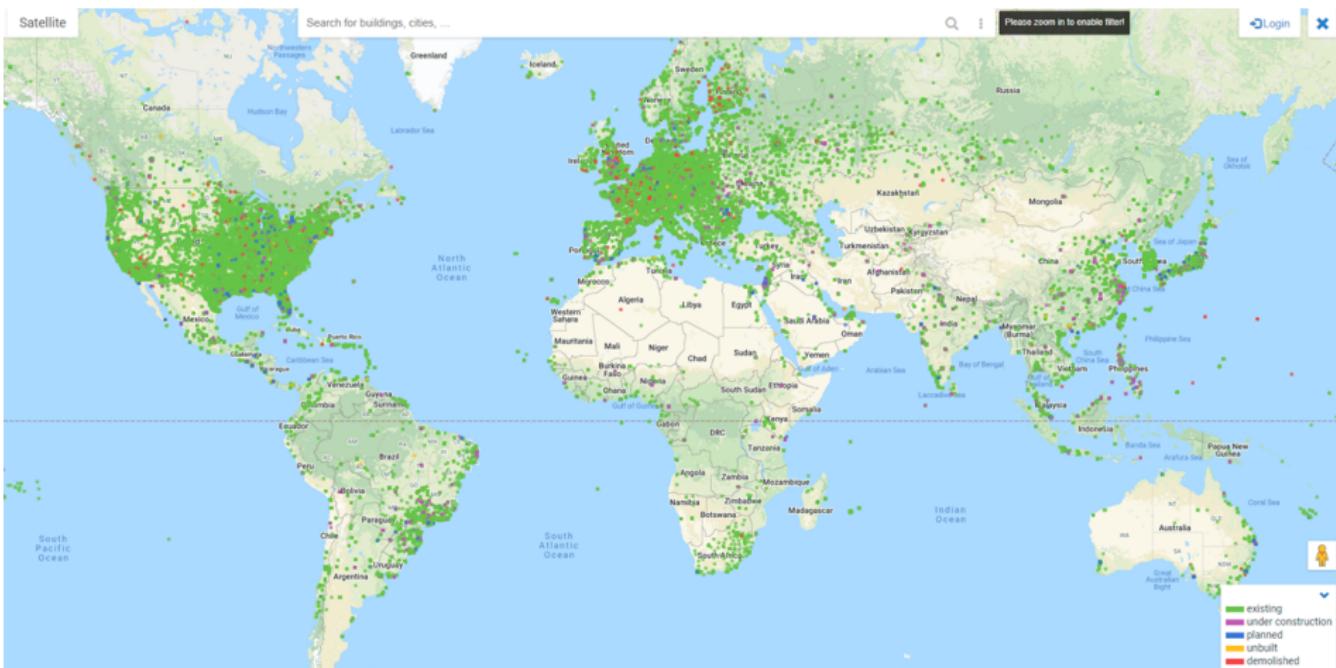
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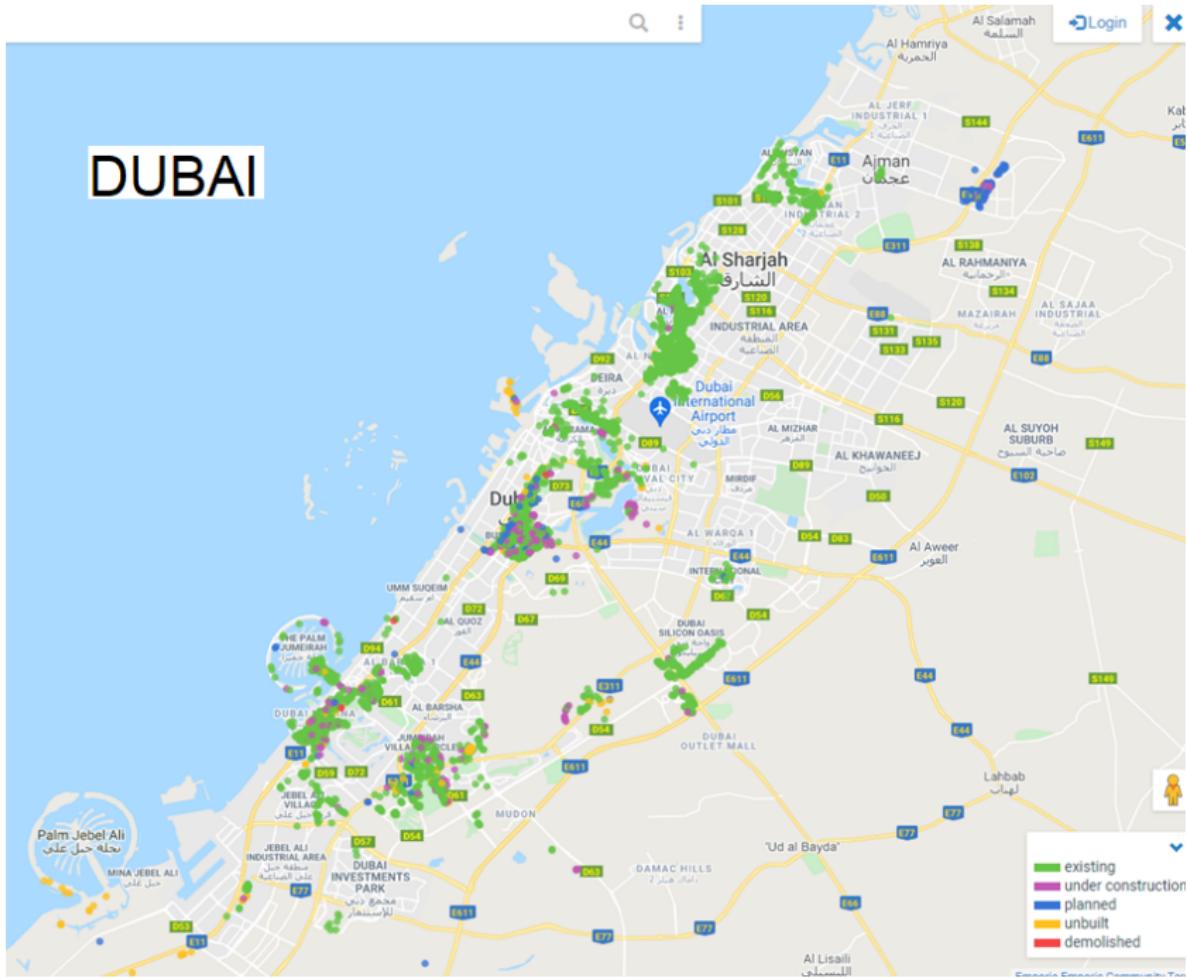
## Premium Company

Promote your company with Emporis.com's online public directory. This Emporis premium offering enhances your company's image and serves as a



Data for 270K tall buildings (buildings  $\geq 55$  m  $\approx 180$  ft  $\approx 14$  stories)

DUBAI



## Examples of Concrete Tall Buildings ( $\geq 55 \text{ m} \approx 180 \text{ ft}$ )



Dubai (Burj Khalifa reaches 830 m = 2,722 ft)

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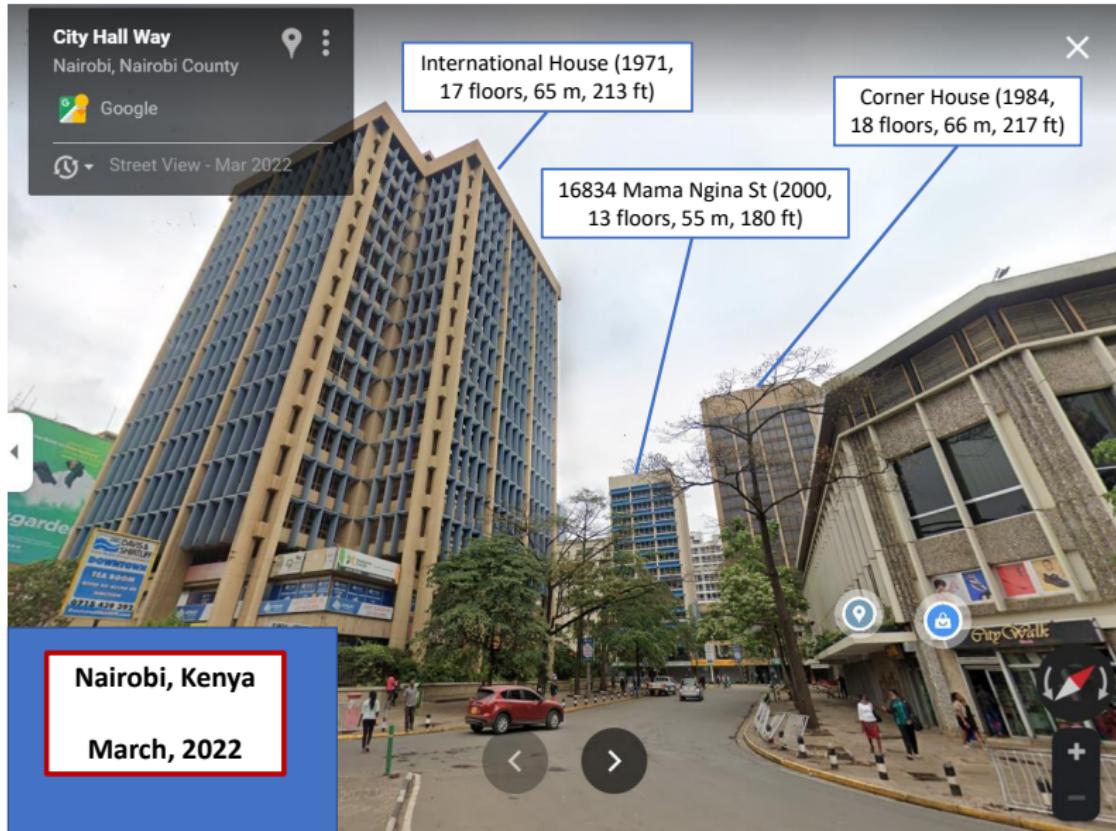
Hong Kong (International Commerce Centre reaches  $484 \text{ m} = 1,588 \text{ ft}$ )

## Examples of Concrete Tall Buildings ( $\geq 55 \text{ m} \approx 180 \text{ ft}$ )

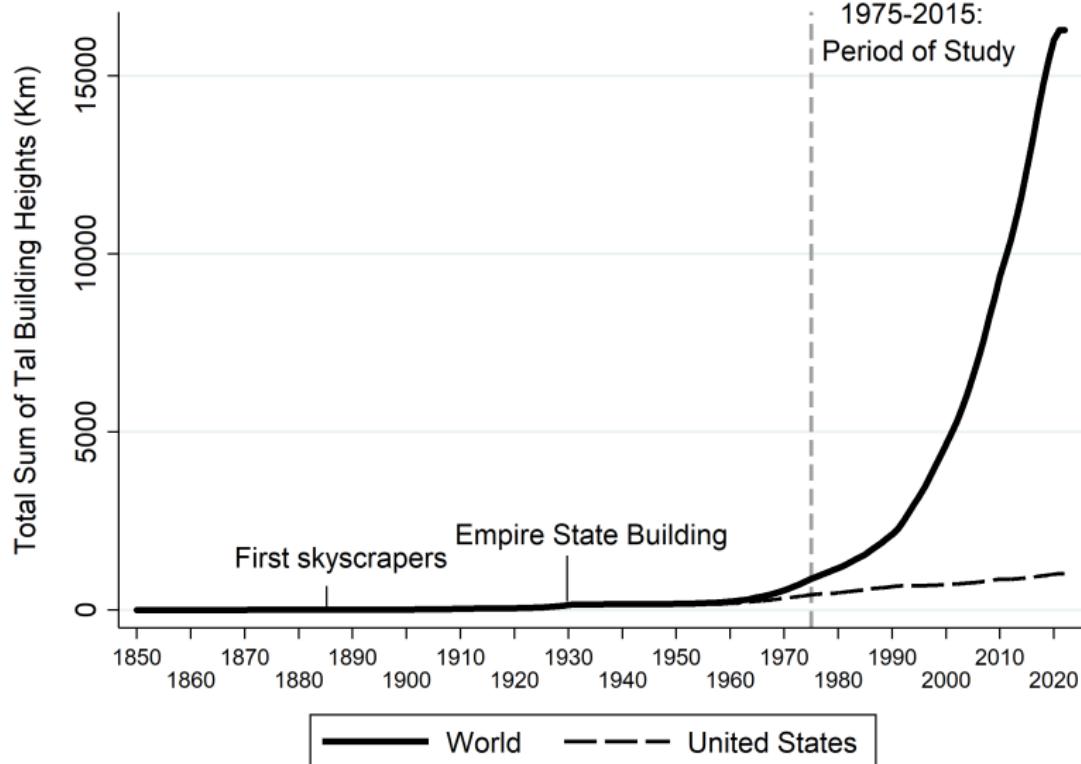


Nairobi (Britam Tower reaches 200 m = 656 ft)

# Examples of Concrete Tall Buildings ( $\geq 55$ m $\approx 180$ ft)

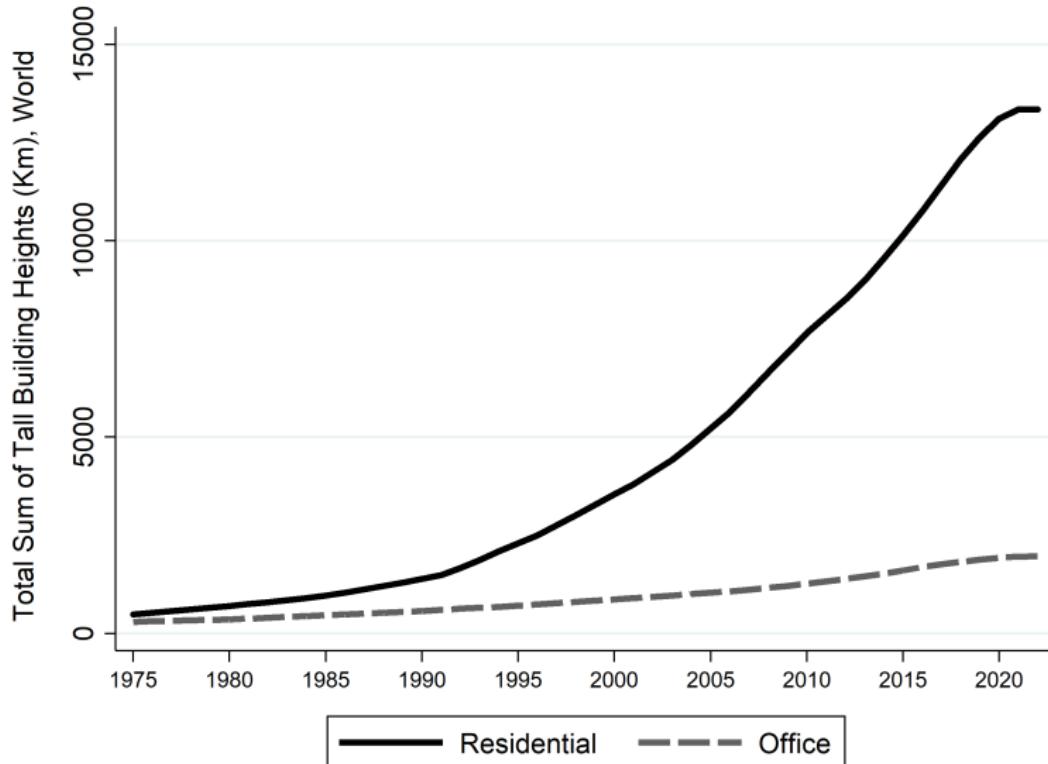


# The Global Stock of Tall Buildings



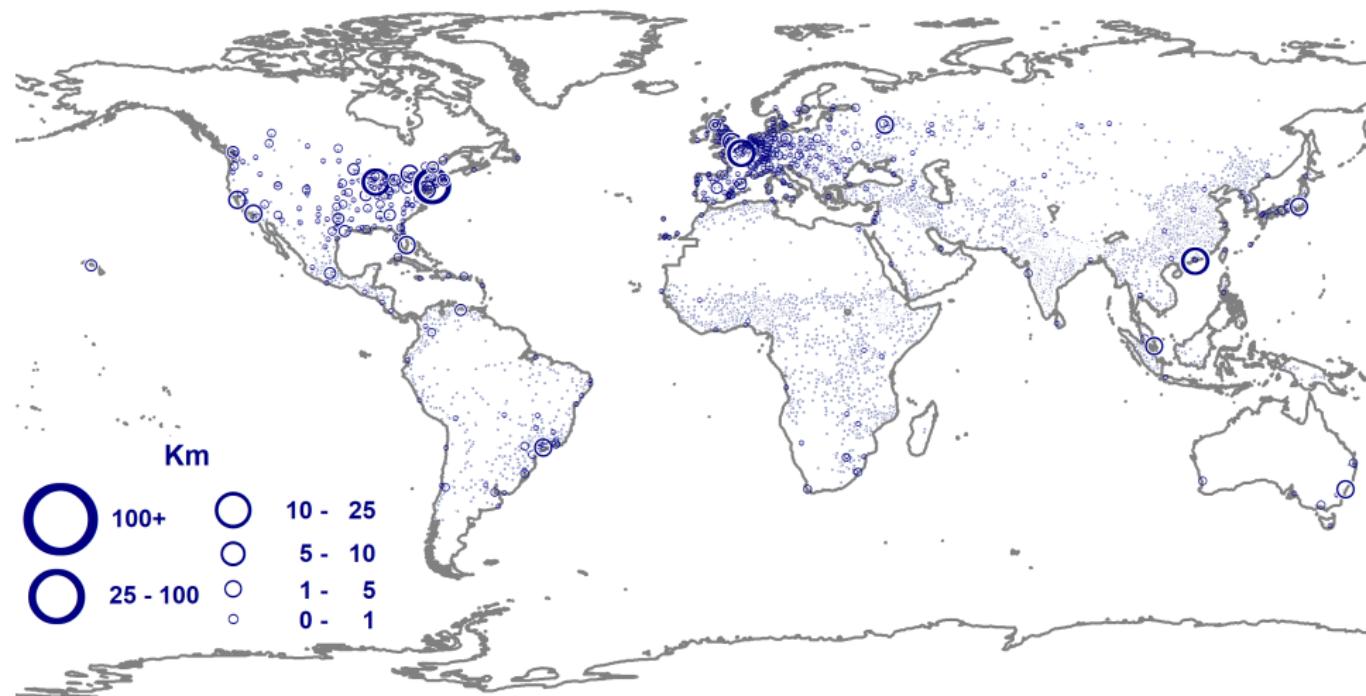
Includes all buildings  $\geq 55$  meters,  $\approx 14$  floors. 1975-2015: +11,500 km  $\approx 26K$   
Empire State Buildings  $\approx 3x$  Euclidean distance between NYC and LA!

# Most Recent Tall Building Construction is Residential



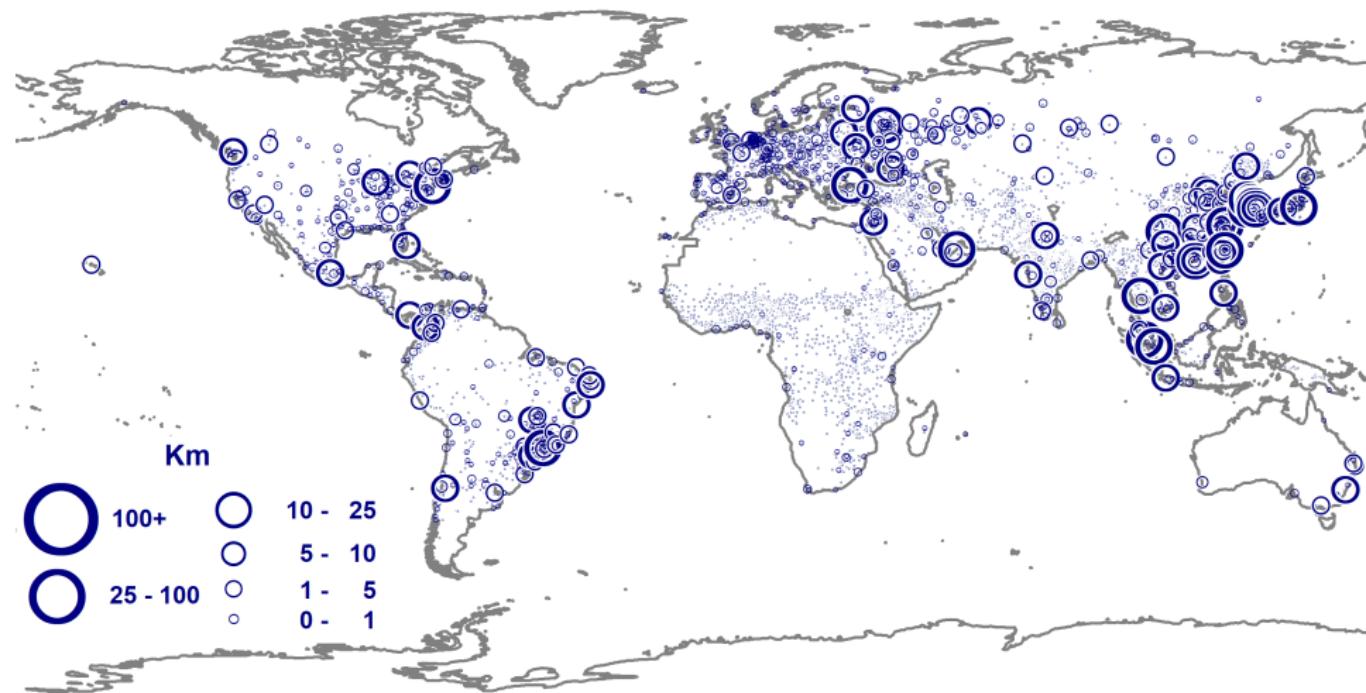
World of residential towers: Increased 7x more for residential buildings (typically in the 55-100 m range) than for commercial/office buildings (100 m+).

# The Stock of Skyscraper Heights in 1975



Developing countries start with a clean slate of tall buildings circa 1975.

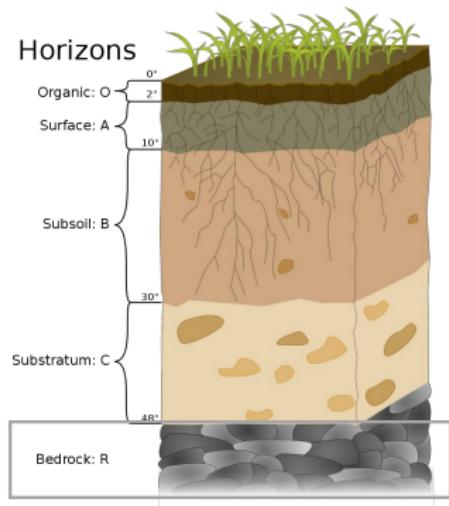
# The Flow of Skyscraper Heights 1975-2015



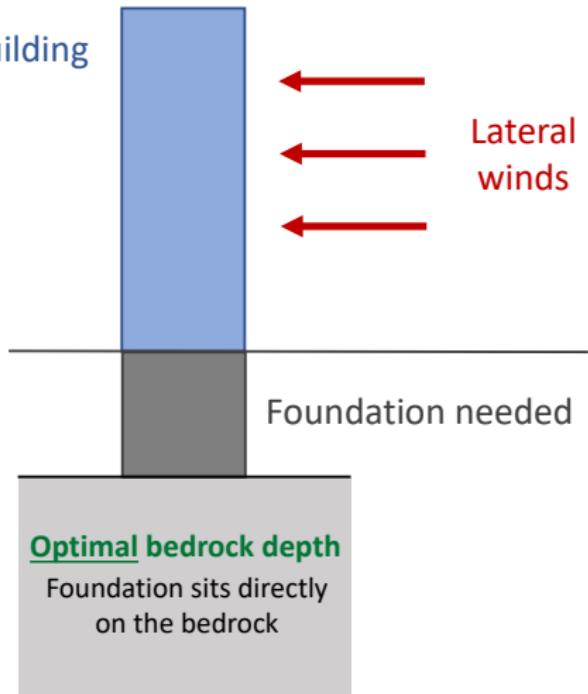
Skyscraper revolution in developing countries in 1975-2015

Due to falling “cost of height” (data for the U.S. and the World)

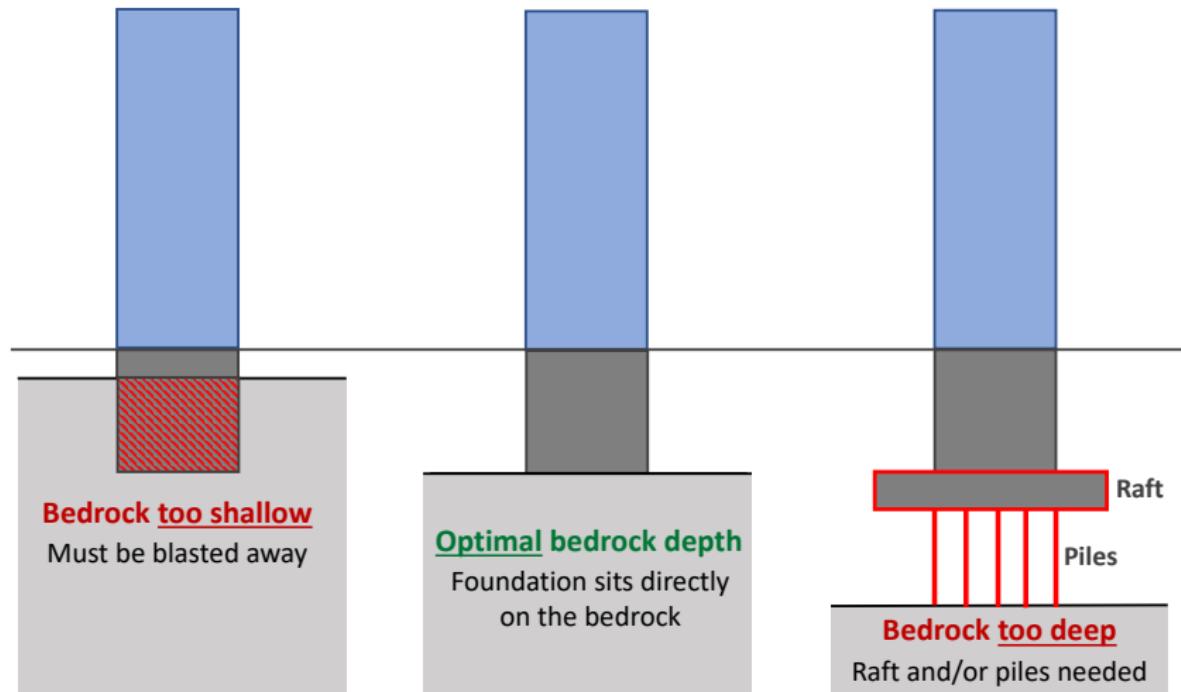
# Role of Bedrock I (needed to build the identification strategy)



Tall building



## Role of Bedrock II (needed to build the identification strategy)



Construction cost per sq ft data for ~1,000 tall buildings in 55 countries: intermediary bedrock depth saves 5-10% (vs. shallow or deep bedrock).

## DiD

1. Developing countries start with **clean slate of tall buildings** in 1975:
  - ▶ Initially, both their large cities and small cities have few tall buildings.

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  - ▶ Lower cost of height globally (innovations: concrete, softwares, cranes...)
  - ▶ Should disproportionately benefit larger cities (demand shifter).

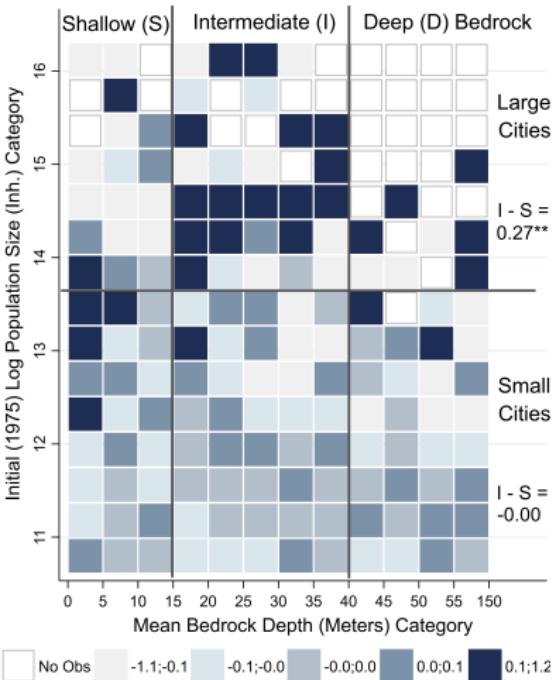
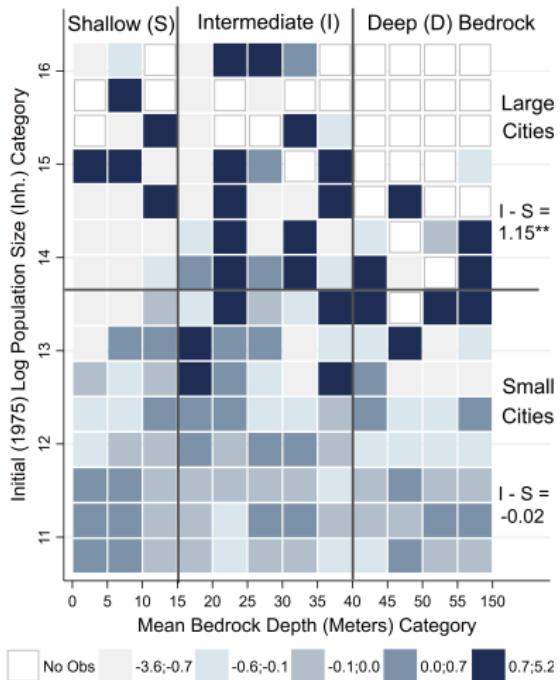
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- DiD:
- ▶ (large vs. small cities in the initial year 1975)  $\times$  (intermediate bedrock depth vs. shallow/deep bedrock depth)  $\times$  (2015 vs. 1975)
  - ▶ Use DiD directly or use it as IV for change in heights 1975-2015

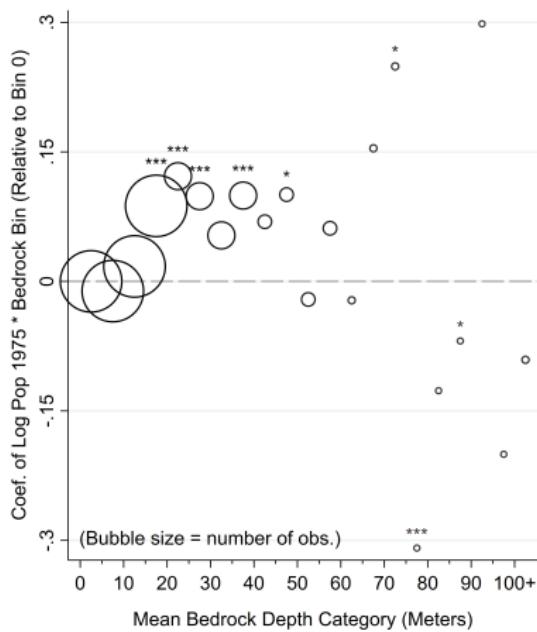
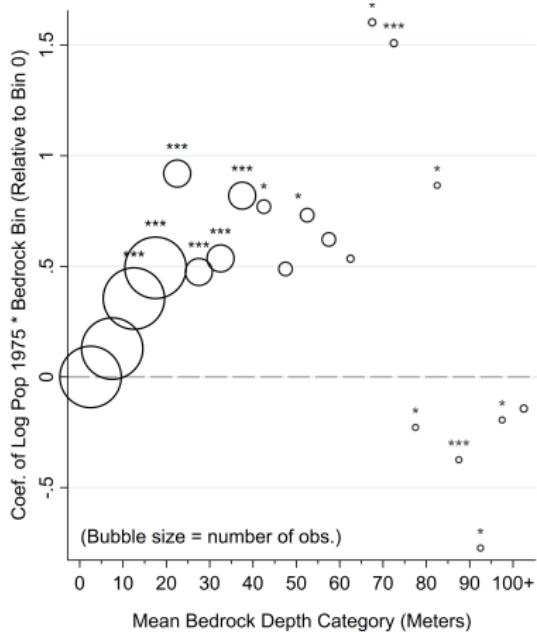
Figure: Residualized Log Changes in Heights and Pop., 1975-2015



12K developing country cities, pop category FE, bedrock category FE, country FE

Implied Wald estimate of the elasticity of population with respect to heights = 0.23\*\*

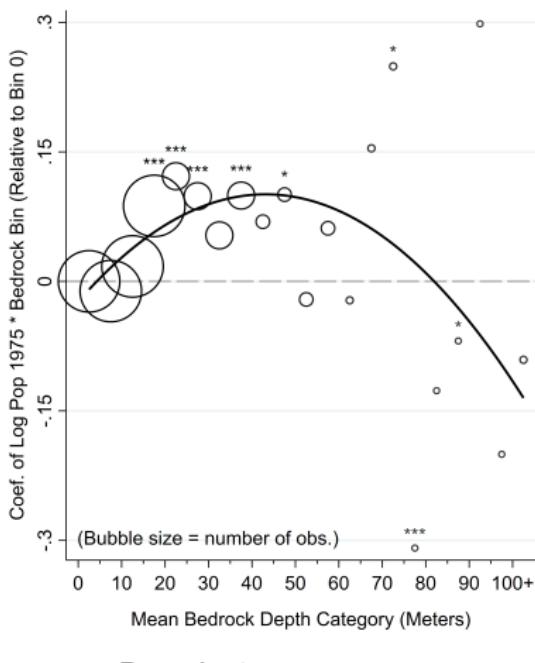
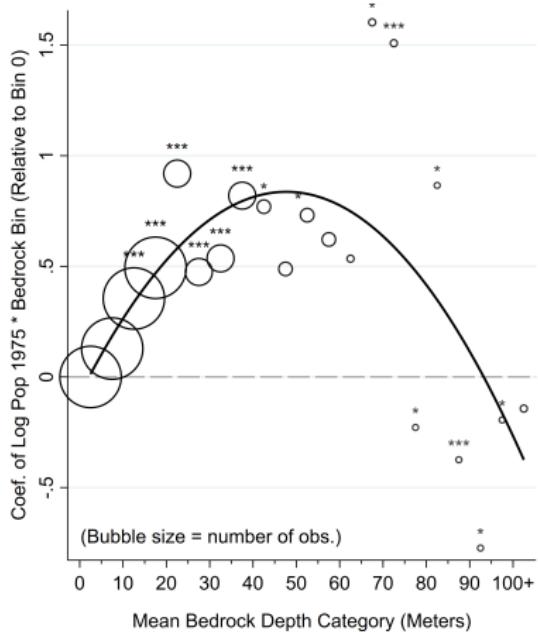
Figure: Log Changes in Heights and Population, 1975-2015



12K developing cntry cities, bedrock bin FE, log pop 1975 as control, cntry FE

We show for each bedrock depth bin the coefficient of log initial pop 1975.

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## First Stage Estimates (3rd Column)

	$\Delta \ln \text{Height} \text{ 1975-2015}$		
In Pop 1975	0.8730*** [0.0351]	0.8741*** [0.0351]	0.4753*** [0.0653]
Bedrock Depth		-0.0028* [0.0016]	-0.3248*** [0.0612]
(Bedrock Depth) <sup>2</sup>		0.0000 [0.0000]	0.0021** [0.0009]
Bedrock Depth			0.0276***
X In Pop 1975			[0.0054]
(Bedrock Depth) <sup>2</sup>			-0.0002**
X In Pop 1975			[0.0001]
Country FE	Y	Y	Y
R-squared	0.17	0.17	0.18
Observations	12,869	12,869	12,869

Faster height growth in initially larger cities\*intermediate bedrock. 1st stage F = 28.42

## The Change as a Final Level: Log Heights 1975 vs. 2015

	1975	2015	$\Delta$ 1975-2015
Panel A: All Countries			
Bedrock Depth	0.0126***	0.0402***	0.0276***
$\times$ In Pop 1975	[0.0032]	[0.0062]	[0.0054]
$(\text{Bedrock Depth})^2$	-0.0002***	-0.0003***	-0.0002**
$\times$ In Pop 1975	[0.0000]	[0.0001]	[0.0001]
R-Squared	0.18	0.33	0.18
Panel B: Developing Economies			
Bedrock Depth	0.0030	0.0292***	0.0262***
$\times$ In Pop 1975	[0.0028]	[0.0060]	[0.0056]
$(\text{Bedrock Depth})^2$	-0.0000*	-0.0002**	-0.0002**
$\times$ In Pop 1975	[0.0000]	[0.0001]	[0.0001]
R-squared	0.14	0.29	0.22

Developing economies: Little heights in 1975.  $g(\text{bedrock}, \text{pop75})$  irrelevant

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## Main IV Results (1975-2015)

Period $s-t$ :	$\Delta \ln \text{Population}$ 1975-2015	$\Delta \ln \text{Built Area}$ 1975-2015	$\Delta \ln \text{Urban Area}$ 1975-2015	$\Delta \ln \text{Pop Dens.}$ 1975-2015
Panel A: All Countries (Observations = 12,849)				
$\Delta \ln(\text{Heights}+1)$	0.12*** [0.03]	-0.17*** [0.04]	-0.15** [0.06]	0.27*** [0.07]
First Stage F	28.42	28.42	28.42	28.42
Panel B: Developing Economies (Observations = 11,257)				
$\Delta \ln(\text{Heights}+1)$	0.13*** [0.03]	-0.16*** [0.04]	-0.18** [0.08]	0.31*** [0.08]
First Stage F	22.84	22.84	22.84	22.84

- ▶ Doubling heights increases city **pop** by 12%, decreases city **built area** by 17% (urban area: 15%), increases city **pop density** by 27% (relative).
- ▶ Driven by cities in developing countries (88% of sample)
- ▶ Radiance calibrated lights (not top-coded) 1990-2015: 15% (not shown)

## Robustness Checks for $g(\text{Bedrock Depth, Pop 1975})$ IVs

- ▶ **Identifying assumption:** IVs uncorrelated with city level tall building demand growth conditional on  $f_1(\text{bedrock})$ ,  $f_2(\text{pop 1975})$ , FE

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- ▶ Results hold if we restrict the sample to cities with a mean bedrock depth deeper than the 25th pctile in the data ( $6 \text{ m} \approx 20 \text{ feet}$ ):
  - ▶ Topsoil up to 0.25 m; Subsoil up to 0.9 m; Root systems up to 2 m
  - ▶ Utility lines typically buried max 1-2 m deep
  - ▶ Subgrade (formation level) underneath highways never as deep
  - ▶ Sometimes deep subway stations (e.g., underground bunkers) → drop

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- ▶ **Controls:**  $\log \text{pop}_{75} \times (\text{coast, lakes, altitude, ruggedness, ag suit, wind, quakes, market access, subways, mines})$  [very weak corr w/ bedrock]

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- ▶ **No placebo effects** of IV pre-1975 or in height-constrained countries. Effects of central bedrock on central heights only (within-city placebo)

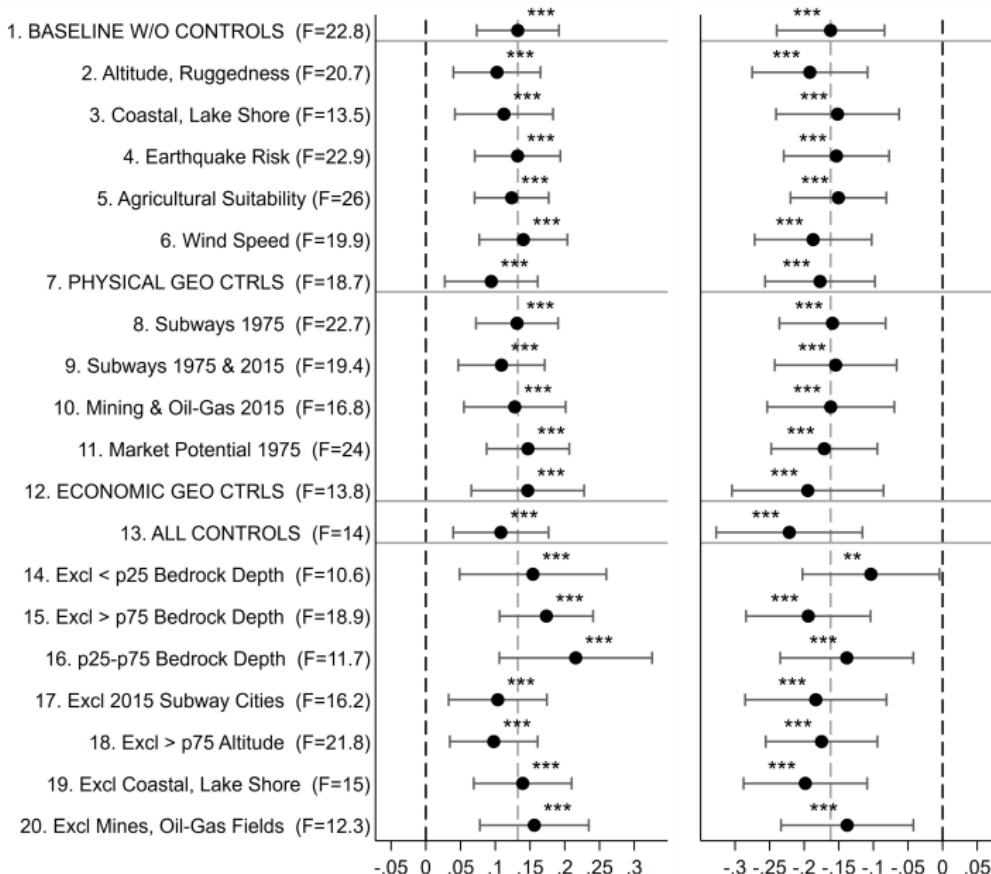
# Temporal and Spatial Placebo Checks

Table 2: Temporal and Spatial Placebo Checks

Dependent Variable:	(1)	(2)	(3)		(4)		(5)
	$\Delta \ln \text{Pop}$ (Buringh)	$\Delta \ln \text{Central Heights (H)}$	Central	Periph.	Central	Periph.	$\Delta \ln \text{Pop}$
	1975-2015	1950-1975	Bedrock	Bedrock	Bedrock	Bedrock	Constrained Countries
Bedrock* $\ln 1975 \text{ Pop}$	0.017*** [0.006]	0.004 [0.014]	0.035** [0.017]	-0.015 [0.018]	0.022 [0.022]	-0.003 [0.023]	0.004 [0.007]
Bedrock <sup>2</sup> * $\ln 1975 \text{ Pop}$	-0.0005*** [0.0001]	0.0000 [0.0004]	-0.000 [0.000]	-0.000 [0.000]	-0.000 [0.000]	-0.000 [0.000]	-0.0000 [0.0001]
Partial First Stage F	-	-	7.54	2.16	1.54	0.29	-
Observations (Cities)	560	560	9,377		9,377		3,315

- ▶ No placebo effects of IV pre-1975 or in height-constrained countries.
- ▶ Height-constrained countries: using the data in 2015, identify whether cities have relatively less heights given pop, economic size, controls
- ▶ Effects of central bedrock on central heights only (within-city placebo)

(a)  $\Delta \ln$  Population      (b)  $\Delta \ln$  Built Area



## Interpretation: Urban Growth vs. Redistribution

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- ▶ Estimates driven by **developing economies** where “clean slate” as of 1975 and context of rural-to-urban (not city-to-city) migration
- ▶ Similar estimates if **developed economies before 1975** when similar context of rural-to-urban (not city-to-city) migration [IN ONE SLIDE]
- ▶ Using sample of **countries <20% urbanized in 1975**, pop estimate unchanged, built area estimate -0.08 (not significantly different)

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- ▶ Using sample of **countries <20% urbanized in 1975**, pop estimate unchanged, built area estimate -0.08 (not significantly different)
- ▶ Estimates only slightly larger with **1st or 2nd level admin division FE** making us compare neighboring cities (China: provinces, prefectures)
- ▶ Using as controls (similarly instrumented) **market potential changes** from  $\Delta$ Heights of neighboring cities (with Euclidean distance as weights)

# Historical IVs

Table 4: IV Results by World Region and Time Period

	(1)-(3) Developing Economies (1975-2015)			(4)-(6) Developed Economies		
	Asia (no Middle-East)	Other Countries	Unconstrained Countries	1975-2015 All	1850-1975 (Historical) 55 Developed	39 European
Panel A: $\Delta \ln \text{Population}$						
$\Delta \ln(\text{Heights}+1)$	0.17*** [0.03]	0.15** [0.07]	0.21*** [0.04]	0.00 [0.03]	0.14** [0.06]	0.20** [0.10]
Panel B: $\Delta \ln \text{Built Area}$						
$\Delta \ln(\text{Heights}+1)$	-0.20*** [0.04]	-0.26*** [0.09]	-0.39*** [0.09]	-0.04 [0.03]	- -	- -
First Stage F	20.92	7.88	11.36	14.28	10.94	5.51
Observations	6,990	4,267	5,315	1,592	918	1,095

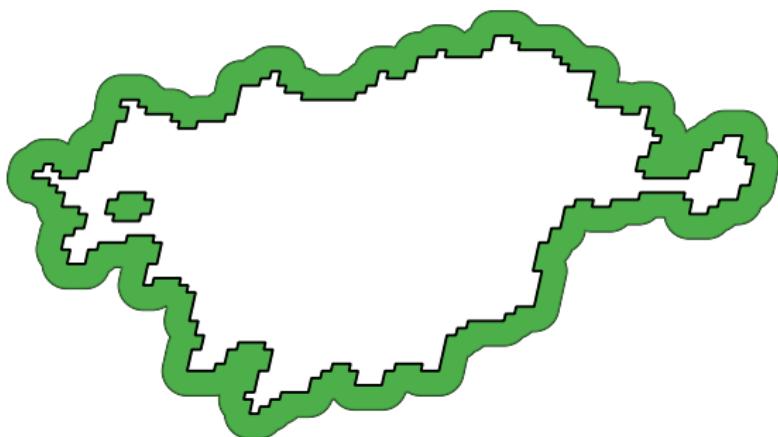
- ▶ Focus on 1850-1975 when developed economies still developing

Sources: (5) Buringh and Hub (2013), (6) Bairoch (1988).

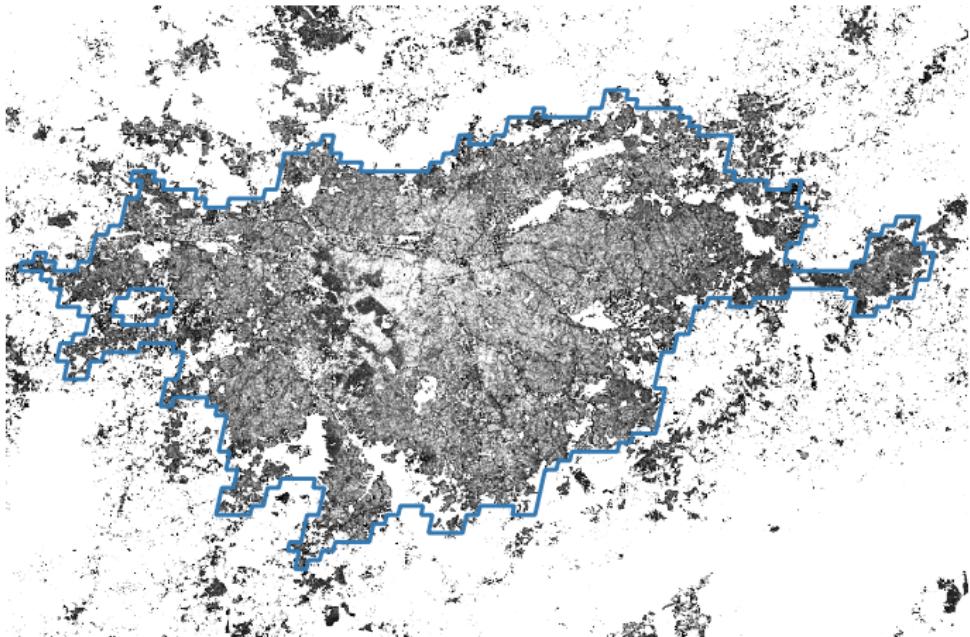
- ▶ IVs from bedrock depth  $\times \log \text{pop}$  1850  $\rightarrow$  similar pop elasticities

## Implied Magnitude and Land Savings

- ▶ Absent construction, 1975-2015 agg urban pop change would be ~20% smaller and agg built area change ~20% larger
- ▶ 12% from tree cover, 73% other veg (incl cropland), 15% non-veg
  - ▶ Use height elasticity of area by city size to predict land expansion
  - ▶ Assume spatially uniform land expansion and study land use



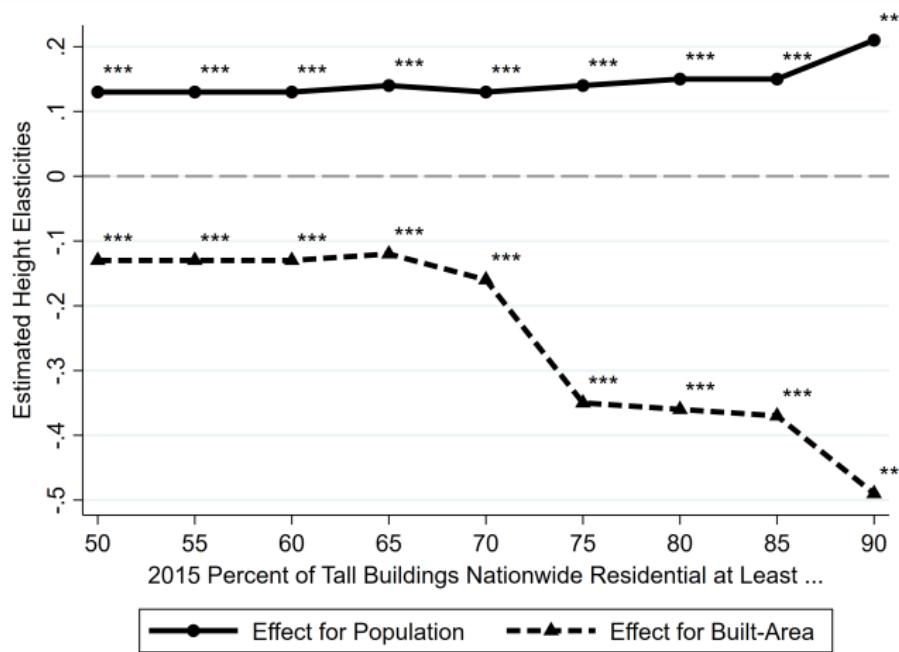
Prediction for São Paulo (had the city not built tall buildings)



**Building volumes c. 2015** at resolution of 90m\*90m (satellite synthetic aperture radar (SAR) data). Source: Esch, Deininger, Jedwab & Palacios-Lopez 2024

- 1) Elasticity of tall built volume wrt tall building heights = 0.93\*\*\* (close to 1)
- 2) Results hold if control for non-tall (< 55 m) buildings (bedrock doesn't matter)
- 3) Elasticity of volume wrt tall building heights = -0.26\*\*\* (i.e., compactness)

## Results by Country Tall Building Residential Share



Developing economies with higher residential shares in tall buildings (on the right) have greater population *and* land savings responses to height.  
Strong response for area (vertical housing and suburbs clear substitutes)

# Outline

Introduction

Data

Empirics

Model

## Taking stock

- ▶ Empirics show that supply of height
  - ▶ increases city population
  - ▶ shrinks city area
- ▶ Canonical models
  - ▶ Population fixed in standard monocentric city model (Alonso, 1964)
  - ▶ City area fixed endowment in QSM (Ahlfeldt et al. 2015)
  - ▶ City area *grows* in open-city model (Ahlfeldt & Barr, 2022)
- ▶ **Need an imperfectly open-city model**
  - ▶ Blend standard land-use model (Duranton & Puga, 2015) and QSM
  - ▶ Stylized monocentric city structure with endogenous CBD area
  - ▶ Designed for quantitative analysis

## Monocentric City Model with Endogenous CBD

- ▶ Highlights causal mechanisms and facilitates evaluation of the welfare consequences of different planning regimes and technological change.
- ▶ **Residents:** preferences over floorspace and an outside good; amenity from vertical distance (views) and horizontal distance (commuting);

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  - ▶ Rural hinterland. Workers have discrete choice of entering city (Ahlfeldt et al (2022)'s approach to modelling labour market entry)
  - ▶ *Imperfectly open* city which nests *closed-city* and *open-city* cases

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- ▶ **Equilibrium:** land market clears (highest bidder); labor market clears

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Parameter		Value	Source
$1 - \alpha^C$	Share of floor space in production	0.15	<a href="#">Lucas and Rossi-Hansberg (2002)</a>
$1 - \alpha^R$	Share of floor space in consumption	0.33	<a href="#">Combes et al. (2019)</a>
$\beta$	Agglomeration elasticity in production	0.03	<a href="#">Combes and Gobillon (2015)</a>
$\theta^C$	Commercial height elasticity of construction cost	0.5	<a href="#">Ahlfeldt and McMillen (2018)</a>
$\theta^R$	Residential height elasticity of construction cost	0.55	<a href="#">Ahlfeldt and McMillen (2018)</a>
$\omega^C$	Commercial height elasticity of rent	0.03	<a href="#">Liu et al. (2018)</a>
$\omega^R$	Residential height elasticity of rent	0.07	<a href="#">Danton and Himbert (2018)</a>
$\tau^C$	Production amenity decay	0.014	See text and Appendix Section <a href="#">C.2</a>
$\tau^R$	Residential amenity decay	0.016	See text and Appendix Section <a href="#">C.2</a>
$\zeta$	Preference heterogeneity	3.3	See text and Appendix Section <a href="#">C.2</a>

Notes: We set the scale parameters to  $\bar{a}^C = \bar{a}^R = 2$ ,  $c^C = c^R = 150$ ,  $r^A = 50$ ,  $\bar{N} = 6$  million,  $\ell = 0.5$ ,  $\bar{x} = 100$  km and invert  $\tilde{U}$  so that  $\mu = 0.5$ . In the baseline parameterization, height limits are not binding ( $\bar{S}^C = \bar{S}^R = \infty$ ).

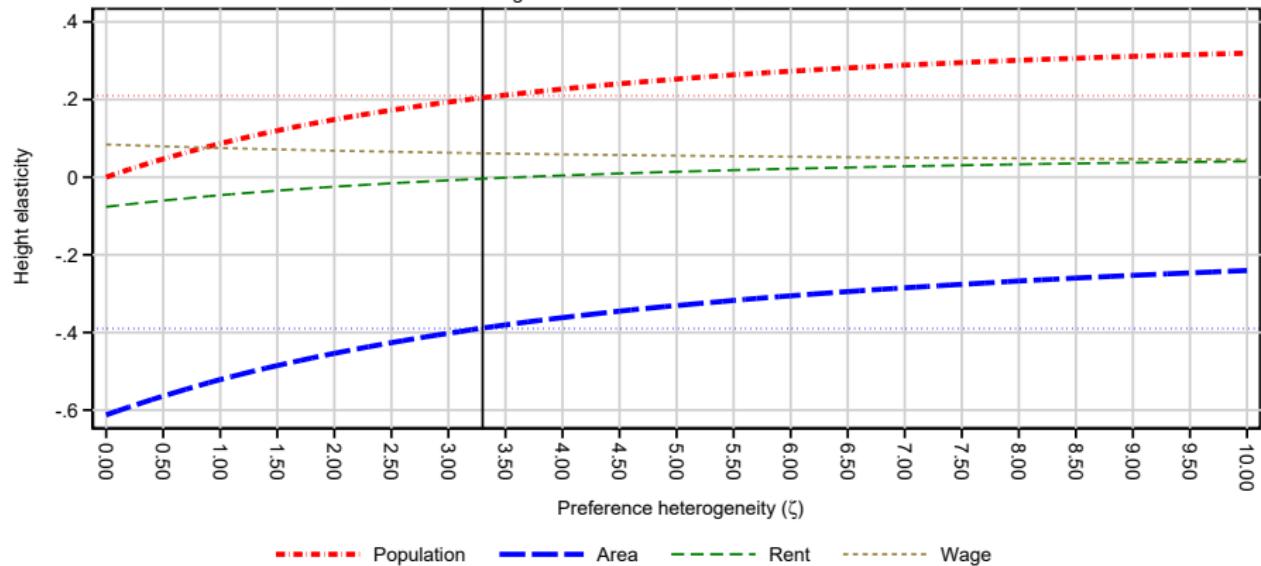
- ▶ Set **amenity decay values** to match average height gradients in data:
  - ▶ CoreLogic for Chicago, patterns verified for the world using satellite-based building volumes for unconstrained 1m+ cities (Esch et al 2024)

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- ▶ Set **amenity decay values** to match average height gradients in data:
  - ▶ CoreLogic for Chicago, patterns verified for the world using satellite-based building volumes for unconstrained 1m+ cities (Esch et al 2024)
- ▶ Preference heterogeneity = 3.3 to match height elasticity estimates
  - ▶ From countries with most cities *unconstrained* by height regulation.
  - ▶ From conditional **height gaps** estimated globally (Barr & Jedwab 2023)
  - ▶ Implied LR **migration elasticity**  $\approx 1.7$ , close to US and intl literature

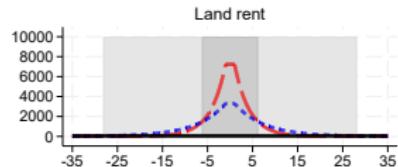
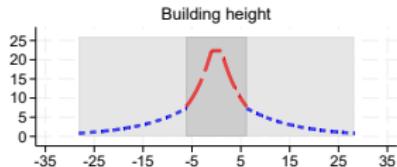
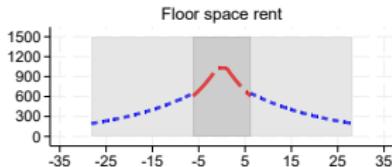
Height measurement threshold = 3



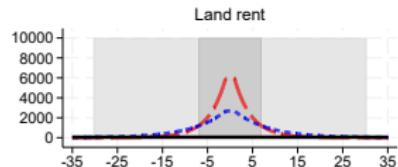
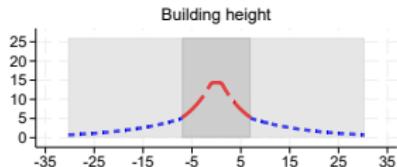
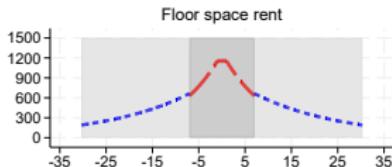
**The larger  $\zeta$ , the stronger the pop and area responses to heights**

- ⇒ Also calibrate height measurement threshold ( $\mathcal{T}$ ) (must be positive)
- ⇒ Under  $\zeta = 3.3$ ,  $\mathcal{T} = 3$ , we exactly match moments in data
- ⇒ And elasticity of rent wrt heights  $\approx 0$  (rents won't vary with heights)

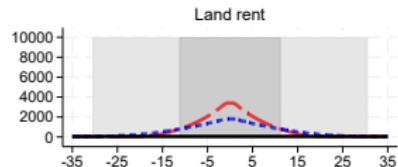
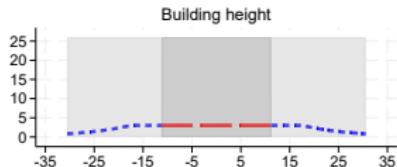
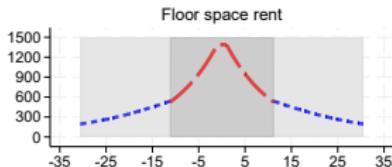
### a. Baseline parametrization



### b. 20% higher cost of height

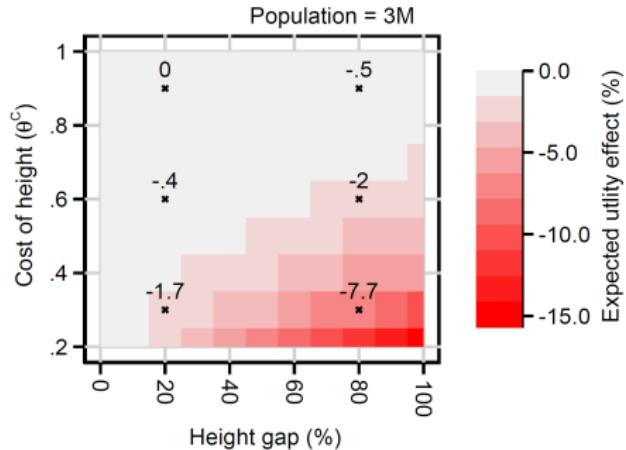
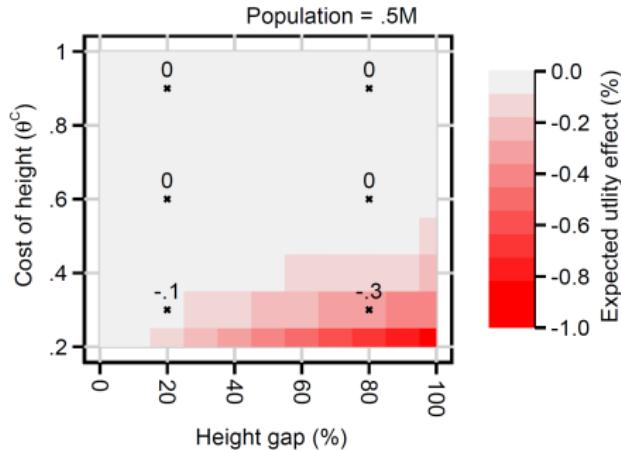


### c. Binding height limit



— Commercial    ··· Residential    — Agricultural    ■ Urban area    ■■■ CBD

**Increasing cost of height and height limits reduce expected utility**  
[For our stylized city of 3 million]



Utility losses increase with the stringency of height restrictions ([height gap](#))

But the utility loss from height restrictions ...

... increases with [city population size](#) (here, 3000K vs. 500K)

... especially when the [cost of height](#) is low ("good" bedrock)

We then conduct city-specific counterfactual for the 12,877 world cities

→ Map bedrock to cost of height, invert  $\{\bar{S}^U, \tilde{U}\}$  to match height gap, pop

# Global worker welfare effects

World region	City characteristics			Expected utility $\mathcal{V}$		Agg land rent $\mathcal{R}$	
	In cities >1 mill.	Cost of height $\theta$ (bedrock)	Est. height gap	No tall building	No height limit	No tall building	No height limit
Developing Economies	43.3%	0.54	44.8%	-1.6%	4.9%	-1.2%	-4.3%
			<ul style="list-style-type: none"> <li>• <i>Wage in City</i> (A):</li> <li>• <i>Rent in City</i> (B):</li> <li>• <i>Commute Cost in City</i> (C):</li> </ul>	-2.5% -3.6% 2.9%	4.7% 7.1% -5.6%		
			Urban Utility (A-0.33*B-C)	-4.2%	7.9%		
			Share Adjusted Rent (-0.33*B-C)	0.40	0.41		
Developed Economies	59.6%	0.39	75.9%	-3.1%	11.1%	-2.3%	-10.0%
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			Urban Utility (A-0.33*B-C)	-6.0%	-15.6%		
			Share Adjusted Rent (-0.33*B-C)	0.50	0.40		
All Economies	46.3%	0.51	50.5%	-1.8%	6.0%	-1.4%	-5.4%

- ▶ Tall buildings have the potential to increase worker welfare by **6.0%**  
Larger in developed economies (large gap\*large cities\*low cost of height)
- ▶ **3/4** to be realized (likely due to height restrictions, which could be justified)

# North America vs. Europe

World region	Urban pop. (BN)	City characteristics			Expected utility ( $\mathcal{V}$ )		Agg. land rent ( $\mathcal{R}$ )	
		In cities >1 mill.	Cost of height $\theta$	Est. height gap	No tall building	No height limit	No tall building	No height limit
Africa, G	0.55	34.7%	0.44	48.1%	-0.8%	7.5%	-0.3%	-6.4%
Asia, G	1.95	44.5%	0.59	40.8%	-1.6%	3.7%	-1.3%	-3.2%
Europe, G	0.04	29.2%	0.49	48.5%	-0.8%	1.2%	0.2%	-0.8%
Latin America, G	0.33	52.9%	0.41	62.7%	-2.6%	7.9%	-2.1%	-7.2%
Mean, G	2.87	43.3%	0.54	44.8%	-1.6%	4.9%	-1.2%	-4.3%
Asia, D	0.19	77.2%	0.39	64.0%	-6.5%	15.7%	-0.4%	-14.6%
Europe, D	0.25	41.4%	0.32	84.6%	-1.3%	8.8%	-3.2%	-7.4%
Latin America, D	0.02	48.6%	0.99	59.4%	-0.8%	1.8%	0.4%	-1.3%
North America, D	0.17	67.4%	0.43	76.6%	-2.6%	10.4%	-3.6%	-9.4%
Oceania, D	0.01	64.2%	0.34	90.0%	-0.6%	12.2%	-0.3%	-8.0%
Mean, D	0.64	59.6%	0.39	75.9%	-3.1%	11.1%	-2.3%	-10.0%
Mean, all	3.51	46.3%	0.51	50.5%	-1.6%	6.0%	-1.4%	-5.4%

► Slightly larger in North America than Europe

(larger cities effect >> higher cost of height and lower gap effects)

# Mechanisms

World region	City characteristics			Expected utility $\mathcal{V}$		Agg land rent $\mathcal{R}$	
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Developing Economies	43.3%	0.54	44.8%	-1.6%	4.9%	-1.2%	-4.3%
		• <i>Wage in City (A):</i>		-2.5%	4.7%		
		• <i>Rent in City (B):</i>		-3.6%	7.1%		
		• <i>Commute Cost in City (C):</i>		2.9%	-5.6%		
		Urban Utility (A-0.33*B-C)		-4.2%	7.9%		
		Share Adjusted Rent (-0.33*B-C)	0.40	0.41			

- ▶ Wage goes up (localized and city-wide agglomeration economies)
- ▶ Rent goes up due to in-migration (but decreases conditional on pop.)
- ▶ Local amenities improve / commute costs decrease
- ▶ Urban utility goes up (= wage - 0.33\*rent - commute cost)
- ▶ Wage accounts for ~60%, adjusted rent (rent & commute) ~40%
- ▶ Same patterns for developed economies

# Global land rent effects

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All Economies	46.3%	0.51	50.5%	-1.8%	6.0%	-1.4%	-5.4%

- ▶ Aggregate land rent would fall by **5.4%** if height limits removed
- ▶ Land rent increases in center but city more compact, less land
- ▶ Leads to transfers from the immobile land factor to the mobile labor force.

# Sensitivity Analyses

	Implied $\zeta$	Implied $\mathcal{T}$	No tall building	Expected utility $\mathcal{V}$	No height limit	Agg land rent $\mathcal{R}$	No height limit
Baseline parameterization	3.3	3.0	-1.8%	6.0%	-1.4%	-5.4%	
Height gap cutoff 75 <sup>th</sup> percentile	3.3	3.0	-3.3%	3.4%	-0.4%	-3.6%	
Floorspace production share = 0.10	3.7	3.0	-1.7%	5.6%	-1.2%	-7.4%	
Floorspace production share = 0.20	3.1	2.7	-2.0%	6.3%	-1.5%	-3.8%	
Citywide agglomeration elasticity = 0.00	3.6	4.3	-1.0%	3.0%	0.1%	-3.6%	
Citywide agglomeration elasticity = 0.06	2.5	2.4	-2.9%	8.9%	-2.3%	-7.9%	
Amenity decay parameters 10% higher	3.2	3.2	-1.9%	6.1%	-1.3%	-5.6%	
Amenity decay parameters 10% lower	3.6	2.7	-1.7%	5.7%	-1.5%	-5.1%	

- ▶ Results overall robust
- ▶ Work from home: gains remain large thanks to residential towers
- ▶ Agglomeration economies: gains halved if shut down

## Conclusions

- ▶ The **Skyscraper Revolution** has fundamentally changed the nature of cities around the world, especially in developing economies.
- ▶ Estimated elasticities of city population of 0.12, built up area of -0.17 and city population density of 0.29 with respect to city height.
- ▶ Implication is that skyscraper construction has accommodated a large share of urbanization and facilitated large land savings globally.
- ▶ Land savings largest for short vegetation/cropland, then forested land
- ▶ Calibrated model indicates economic benefits of  $\sim 6\%$ , of which about only one-fourth has been realized. We ignore the costs.

Welfare cost will increase over time as cost of height falls (in our construction costs data, the cost of height decreased by  $\approx 2\%$  per year)