

# Particulate Matter and Labor Supply: Evidence from Mexico City

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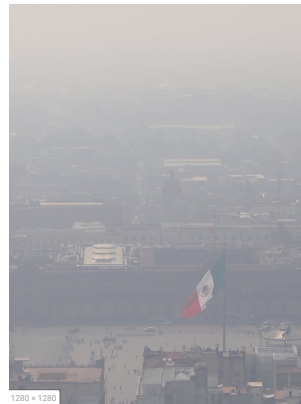
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# Introduction

- Exposure to PM2.5 has negative S-T and L-T health impacts
- **If exposure labor > exposure leisure**  
→ **Trade-off: health vs. income**
- Workers with income closely linked to hours worked:  
low income, informal, etc.



1280 x 1280

source: WSJ.com

# Preview of Results

Estimate the S-T response of labor supply and hospital admissions for respiratory diseases to PM2.5

## Preview of Results:

- PM 2.5 has a **negative**, non-linear effect on labor supply
- PM 2.5 has **positive**, non-linear effect on hospital admissions for respiratory diseases
- Relative to formal workers, informal workers reduce hours worked less on days with high PM2.5 and compensate less over the following days  
→ **informal workers have larger negative impacts on health and income**
- Income constraints likely to play a role: smaller reductions in labor supply when previous days had high PM2.5

# Particulate Matter and Health

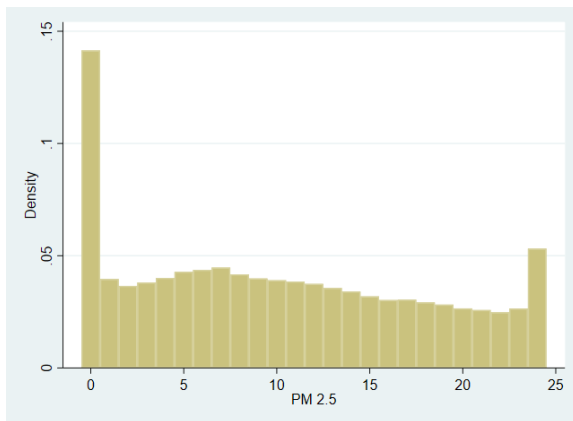
## Particulate Matter:

- Particulate matter is causally linked to respiratory and cardiovascular disease and mortality (U.S. EPA, 2009)
- Short-term and long-term exposure can have serious health impacts (Anderson et al, 2012; Crouse et al., 2015; Cesaroni et al., 2014; Lin et al., 2002; Tertre et al., 2002;)

## Fine Particulate Matter (PM<sub>2.5</sub>):

- Fine PM has stronger and broader health impacts than coarser PM (Bell et al., 2014; Pope and Douglas, 2006)

# Particulate Matter in Mexico City



In study sample, mean number of hours above WHO PM 2.5 Air Quality Guideline: 10.1 hours

# Sources of Data

- ① Labor supply data: National Survey of Occupation and Employment (ENOE) collected by INEGI
- ② Hospitalizations data: Automated Subsystem of Hospital Expenditures from Secretary of Health
- ③ Air pollution and weather data: Ground monitoring stations network available from SEDEMA
- ④ Precipitation data: CHIRPS from University of California Santa Barbara

# Air Pollution Variables

	PM 2.5	PM 10
	(1)	(2)
Interim Target 1 (IT1)	75	150
Interim Target 2 (IT2)	50	100
Interim Target 3 (IT3)	37.5	75
Air Quality Guideline (AQG)	25	50

Notes: PM 2.5 and PM 10 are measured in  $\mu g/m^3$  (WHO, 2005).

# Baseline Regression Model: Labor Supply

$$y_{ilm,tw} = \alpha_m + \phi_w + \beta PM2.5_{lm,tw} + \gamma X_{ilm,tw} + \epsilon_{ilm,tw}$$

Where unit of observation is:

- Individual  $i$
- Who resides in locality  $l$
- Of municipality  $m$
- On day  $t$
- That falls within week  $w$

Time-varying controls:

- Maximum temperature in locality  $l$
- Precipitation in municipality  $m$  and it's square
- Day of week FE
- Age and it's square
- Gender
- Years of schooling and it's square



# Baseline Regression Model: Hospital Admissions

$$y_{hm,tcy} = \alpha_m + \phi_{cy} + \beta PM2.5_{lm,tcy} + \epsilon_{hm,tcy}$$

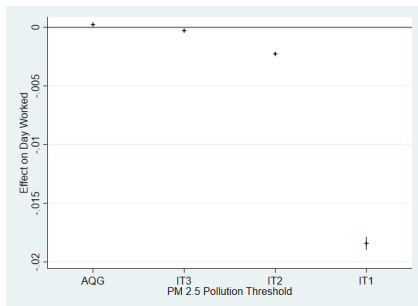
Where unit of observation is a hospital admission in:

- Hospital  $h$
- Located in locality  $l$
- Of municipality  $m$
- On day  $t$
- Within month  $m$
- In year  $y$

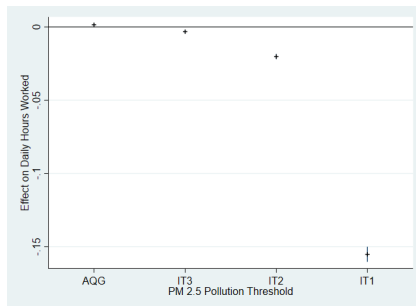
Restrict sample to exclude admissions related to pregnancy or child birth

# PM2.5 and Labor Supply: Negative, Non-Linear Relationship

Panel A: Worked Day

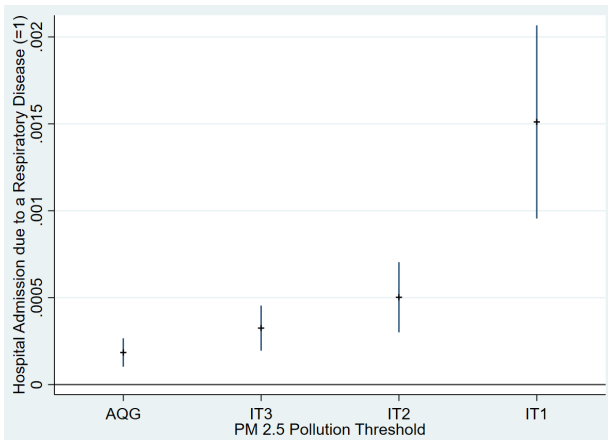


Panel B: Daily Hours Worked



Table

# PM2.5 and Hospital Admissions: Positive, Non-Linear Relationship



# PM2.5 and Labor Supply: Heterogeneity by Employment Characteristics/Status

	Daily Hours Worked				
Characteristic	-0.569*** (0.005)	-0.624*** (0.006)	-0.139*** (0.005)	0.117*** (0.008)	-0.391*** (0.014)
Hours Above PM2.5 IT1	-0.183*** (0.004)	-0.168*** (0.003)	-0.166*** (0.004)	-0.169*** (0.004)	-0.212*** (0.016)
Characteristic x Hours Above PM2.5 IT1	0.049*** (0.006)	0.051*** (0.007)	0.024*** (0.006)	0.027*** (0.006)	0.030* (0.018)
Characteristic	Informal	Self Employed	Non-wage Employee	Low Education	Low Income
N	2,232,239	2,232,239	2,232,032	2,232,239	391,276

# PM2.5 and Hospital Admissions: Heterogeneity by Share of Informality

	Respiratory Disease (==1)	
Hours Above PM2.5 IT1	-0.0027 (0.0021)	0.0004 (0.0007)
Hours Above PM2.5 IT1 x Share Informality	0.0073** (0.0037)	
Hours Above PM2.5 IT1 x Share Informality Q2		0.0010 (0.0008)
Hours Above PM2.5 IT1 x Share Informality Q3		0.0005 (0.0011)
Hours Above PM2.5 IT1 x Share Informality Q4		0.0023** (0.0011)
Method	Controls	Controls
N	1,290,481	1,290,481

# PM2.5 and Labor Supply: Weekly-Level

	Weekly Hours Worked			
	Formal Workers		Informal Workers	
Hours Above PM2.5 IT1	-0.058* (0.035)	-0.078** (0.034)	-0.088** (0.035)	-0.093*** (0.035)
Method	Baseline	Occupation Controls	Baseline	Occupation Controls
N	159,348	159,348	180,084	180,084

# PM2.5 and Hospital Admissions: Weekly Level

	Respiratory Disease (==1)
Hours Above PM2.5 IT1	0.0011*** (0.0003)
Mean Hours Above PM2.5 IT1 Prior Week	0.0030*** (0.0011)
Method	Prior Week
N	1,292,219

# Summary of Results

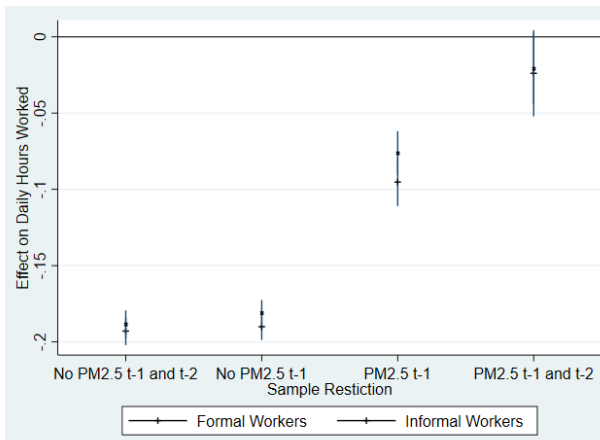
Informal workers suffer greater impacts of high PM2.5 than formal workers:

- ① Exposure to PM2.5 and negative health impacts
- ② Labor supply and income losses

Income constraints may be playing an important role in workers' decisions



# Role of Income Constraints: Consecutive Days with High PM2.5



# Policy Implications

- Impacts to labor supply are another externality of PM2.5
  - Strong non-linear relationships implies focus on policies to decrease peaks of PM2.5
  - Large impacts imply even costly policies to reduce PM2.5 are worthwhile
- Health and labor supply impacts of PM2.5 are largest for workers with lower and more uncertain income
  - Distributional implications
  - Programs to support the health and income of informal and low SES workers

THANK YOU!

# Robustness and Falsification Tests

- 1 Robustness and falsification tests for daily hours worked [Table](#)
- 2 Daily hours above WHO IT1 and daily hospital admissions for digestive and circulatory diseases [Figure](#)

# PM2.5 and Labor Supply

	Day Worked		Daily Hours Worked	
Hours Above PM2.5 IT1	-0.018*** (0.000)	-0.018*** (0.000)	-0.155*** (0.003)	-0.155*** (0.003)
Method	Baseline	Occupation Controls	Baseline	Occupation Controls
N	2,232,239	2,232,239	2,232,239	2,232,239

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# PM2.5 and Hospital Admissions for Respiratory Disease

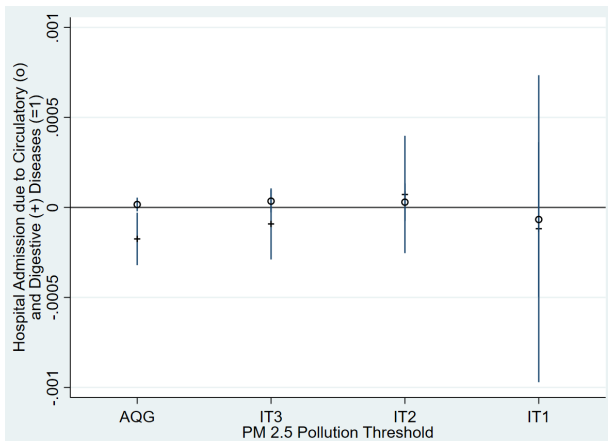
	Respiratory Disease (==1)	
Hours Above PM2.5 IT1	0.015*** (0.0003)	0.013*** (0.0003)
Method	Baseline	Controls
N	1,302,701	1,291,703

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# Robustness and Falsification Tests Table: Labor Supply

	Daily Hours Worked								Usual Daily Hours Worked
	(1)	(2)	(3)	(4)	(5)	(6)	(7)	(8)	(9)
Hours Above PM2.5 IT1 Threshold	-0.199*** (0.004)					-0.272*** (0.057)	-0.217*** (0.047)	-0.154*** (0.003)	0.002 (0.007)
Hours Above PM10 IT1 Threshold		-0.085*** (0.003)	-0.091*** (0.003)						
Max Hours Above PM25-PM10 IT1 Threshold				-0.108*** (0.003)					
Min Hours Above PM25-PM10 IT1 Threshold					-0.166*** (0.005)				
Lead Hours Above PM2.5 IT1 Threshold								-0.006** (0.003)	
Method	PM2.5	PM10	PM10 -	Max IT1	Min IT1		IV -	Lead	Usual
Sample	Weekdays	Full	Indiv. FE Full	PM2.5-PM10 Full	PM2.5-PM10 Full	IV Full	Indiv. FE Full	Full	Hours Weekdays
N	1,593,422	2,328,400	2,328,369	2,338,133	2,338,133	2,224,744	2,224,708	2,230,682	152,784
R2	0.074	0.283	0.475	0.283	0.283	0.279	0.324	0.285	0.042

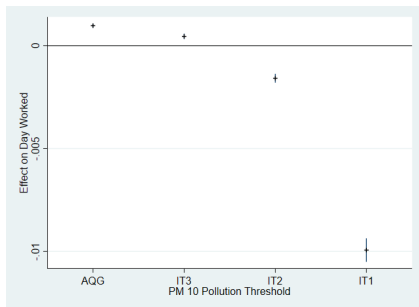
# Falsification Figure: Hospital Admissions for Digestive and Circulatory Diseases



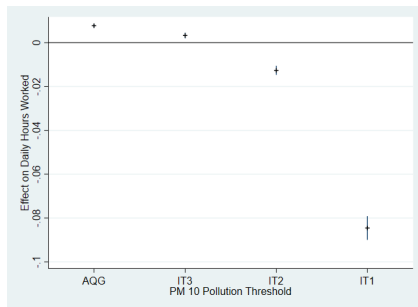


# Negative Non-Linear Relationship

Panel A: Worked Day



Panel B: Daily Hours Worked



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# WHO Thresholds

	PM 2.5 (1)	PM 10 (2)
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