### Strategic Local Regulators and the Efficacy of Uniform Pollution Standards

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# Motivation

- Local air quality depends on local regulators' efforts in regulating industry emissions.
- Federal EPA determines local violation status based on local monitor readings
- Violations to the national standard are subject to punishments on both local regulators and local economy (i.e., new pollution source review program, state implementation plan, withholding federal highway funding).
- After the revision of the  $PM_{2.5}$  national standard (NAAQS) in 2006
  - there are initially 208 non-attainment counties
  - 5 years later, only 17 counties switched to attainment

## Research Question

- Is a universal national air quality standard always effective, given that local jurisdictions control the investment of local regulation resources?
- How does a local regulator allocate investment of local regulation resources?
- How does the allocation of local regulation resources change in response to more stringent national standards?

### Economic Intuition

Local regulator's objective is to minimize:

 $\label{eq:cost} \begin{array}{l} \textit{Total Cost} = \textit{Indirect Regulation Cost} + \textit{Expected Cost of Pollution Damage} \\ \textit{age} + \textit{Expected Violation Penalties} \end{array}$ 

More plant-specific regulation resources from the local regulator means

- Higher direct regulation cost
- Less plant emissions → Lower cost of pollution damage
- Lower expected monitor readings → Lower probability of violation, lower expected violation penalties

#### Local Regulator's Problem

- Marginal Net Benefit of Emissions = Avoided marginal Direct Regulation Cost -Marginal Pollution Damage
- Marginal Cost of Emissions = Marginal Expected Violation Penalties



# Local Regulator's Response to More Stringent National Standard



Empirical Analysis: Monitor Level Analysis

U.S. EPA changed NAAQS "PM $_{2.5}$  24-hour Standard" from 65  $\mu g/m^3$  in 1997 to 35  $\mu g/m^3$  in 2006

- Monitor-by-Year data
  - 994 continuous monitors, active both before and after (including) 2006
  - 128 "Expected Violating Monitors": never complied after the revision (2007-2011)
  - 866 "Expected Compliant Monitors": complied for at least one year after revision (2007-2011)
  - Non-continuous (temporarily active) monitors are excluded from the monitor level analysis

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# Empirical Analysis: Monitor Level Analysis





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## Empirical Analysis: Plant Level Analysis

- Plant-by-Year data
  - 33,848 plants from TRI
  - Greenstone (2002): map TRI chemicals to particulate matter
  - Compare plants near "Expected Violating Monitors" (793 plants) and plants near "Expected Compliant Monitors" (5,681 plants) with "Control Plants" (27,374 plants)
  - Here, "near" is defined by arbitrary distance threshold at 5KM



(a) Plants near "Expected Violating Monitors"  $% \left( {{\left[ {{{\mathbf{F}}_{{\mathbf{F}}}} \right]}_{{\mathbf{F}}}} \right)$ 



(b) Plants near "Expected Compliant Monitors"

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## Conclusion

- We propose a theoretical model to describe the strategic behavior of local regulators.
- Our theory suggests that when the national pollution standard is too expensive to comply with, local regulators may intentionally violate it.
- Instead of a universal national standard, it might be better to customize more achievable pollution standards for each area to avoid the intentional violation.

# Questions, Comments and Suggestions

Thank you!

- Email: ruohao.zhang@kellogg.northwestern.edu
- Working paper is available on my personal website: https://ruohaozhang.weebly.com/publications-working-papers.html

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# Monitor Map



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# Plant Map



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### Monitor Readings

$$m_j = \beta X_j + \sum_{i \in I_j} f(d_{ij})e_i + u_j, \tag{1}$$

 $m_j$ : readings of monitor J, captures the emissions from

- Local industry
- Other unregulated background economic activities (such as traffic and unregulated residential/commercial fuel combustion)
- $I_j$ : Industrial plants located near monitor j
- $e_i$ : emissions from plant i
- $d_{ij}$ : Distance between plant i and monitor j
- $u_j$ : Random component

Local Regulator's Problem: Expected Violation Penalty

Let s be the national standard, K is a fixed violation penalty,

- Violation if  $m_j > s$
- Compliance if  $m_j \leq s$

Expected monitor reading:

$$M_j = \beta X_j + \sum_{i \in I_j} f(d_{ij})e_i \tag{2}$$

Expected violation penalty:

$$(1 - Pr(m_j \le s))K = (1 - Pr(\beta X_j + \sum_{i \in I_j} f(d_{ij})e_i + u_j \le s))K$$
 (3)

#### Local Regulator's Problem: Other Costs

Local regulator determines the regulation resources on each plant i to reduce the plant emissions  $\boldsymbol{e}_i$ 

- Lower  $e_i$  requires more regulation resources
- Indirect regulation cost on plant *i*:  $C(e_i, \theta_i)$ , decrease in  $e_i$
- $\theta_i$  is the plant characteristics

Plant i's emissions  $e_i$  also cause local welfare loss

- Expected cost of pollution damage:  $G(M_j; \sigma_j)$ , increase in  $M_j$
- $\sigma_j$  is the socio-economic characteristics of the neighborhood around monitor j

$$\min_{e_i|i\in I_j} \sum_{i\in I_j} C(e_i;\theta_i) + G(M_j;\sigma_j) + \left(1 - Pr(m_j \le s)\right) K$$

$$= \sum_{i\in I_j} C(e_i,\theta_i) + G\left(\beta X_j + \sum_{i\in I_j} f(d_{ij})e_i;\sigma_j\right)$$

$$+ \left(1 - Pr(\beta X_j + \sum_{i\in I_j} f(d_{ij})e_i + u_j \le s)\right) K.$$
(4)

Zhang and Khanna.

# Indirect Regulation Cost

Indirect regulation cost function  $C(e_i, \theta_i)$  is defined according to a oneto-one monotonic mapping between plant optimal emissions  $e_i$  to plantspecific regulation cost.



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### Empirical Analysis: Monitor Level Analysis

	Outcome Variable: $log(annual PM_{2.5} monitor readings, \mu g/m^3)$			
Independent Variables	(1)	(2)	(3)	(4)
Revision $\times$ Expected Violating	$0.190^{***}$ (0.055)	$0.080^{**}$ (0.037)	$\begin{array}{c} 0.181^{***} \\ (0.051) \end{array}$	$0.078^{**}$ (0.037)
Expected Violating Monitors	$\begin{array}{c} 0.077 \\ (0.117) \end{array}$	$\begin{array}{c} 0.144 \\ (0.113) \end{array}$	$\begin{array}{c} 0.067 \\ (0.117) \end{array}$	$\begin{array}{c} 0.146 \\ (0.113) \end{array}$
Population Density (100 people per $\mathrm{KM}^2$ )			$\begin{array}{c} 0.004^{*} \\ (0.002) \end{array}$	-0.003 (0.024)
Income per Capita (\$1,000)			-0.002 (0.002)	-0.001 (0.001)
GDP per Capita (\$1,000)			$\begin{array}{c} 0.0002 \\ (0.001) \end{array}$	$0.002^{**}$ (0.001)
County FE	Ν	Υ	Ν	Υ
Year FE	Y	Υ	Υ	Υ
R <sup>2</sup> Adjusted R <sup>2</sup> Sample size	0.110 0.109 7,395	0.819 0.801 7,395	0.132 0.131 7,347	0.819 0.802 7,347

Table 3: Monitor Level Analysis: Difference-in-differences Results

Note: Standard errors are clustered at the state level. There are fewer observations in column (3) and (4) because of missing social-economic variables for some counties. Significance level: \*\*\* p < .01, \*\* p < .05, \* p < .1.

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### Empirical Analysis: Plant Level Analysis

	Dependent variable:		
	log(PM + 0.1), PM emissions in lbs.		
	(1)	(2)	
Near Expected Violating Monitors $\times$ Revision	0.106**	0.106**	
	(0.053)	(0.051)	
Near Expected Compliant Monitors × Revision	$-0.086^{***}$	$-0.084^{***}$	
· · · · · · · · · · · · · · · · · · ·	(0.022)	(0.022)	
Non attainment County		0.024	
Non-actainment County		(0.022)	
Number of all EPA Inspection		-0.017	
		(0.013)	
Air Emission Ratio		0.908***	
		(0.067)	
Population Density (100 people per $KM^2$ )		0.055	
ropulation benaty (100 people per RM )		(0.038)	
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Income per Capita (\$1,000)		-0.002	
		(0.002)	
GDP per Capita (\$1,000)		0.002***	
		(0.001)	
Plant FE	Y	Y	
Year FE	Y	Y	
Observations	229,436	227.229	
$\mathbb{R}^2$	0.891	0.895	
Adjusted R <sup>2</sup>	0.872	0.877	

Table 4: Plant Level Analysis: Difference-in-differences Results

Note: For dependent variable, we add 0.1 to PM before taking natural logs to avoid losing observations with PM = 0. Standard errors are clustered at the state level. There are fewer observations in column (2) because of missing social-economic variables for some counties. Significance level: "\*  $\mathbf{p} < .01$ , "  $\mathbf{p} < .05$ , "  $\mathbf{p} < .1$ .

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