# Greenstone (2002)

"The Impacts of Environmental Regulations on Industrial Activity:

Evidence from the 1970 and 1977 Clean Air Act Amendments and the

Census of Manufactures"

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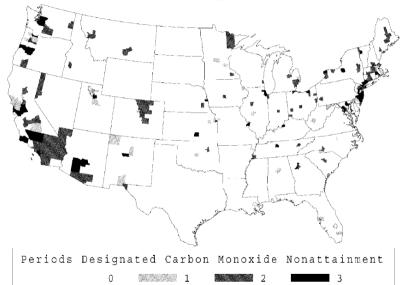
#### Introduction

- Anecdotal evidence shows environmental regulations place costs on firms
  - Manufacturing plants spend almost \$30 billion a year to comply with environmental regulations
- Empirical research fails to get negative industrial activity effects by environmental regulations
  - Some suggests that environmental regulations do not harm regulated rms or their workers and may even benet them
- ⇒ This paper documents negative impact on industrial activity by environmental regulations using comprehensive data

#### The 1970 CAAAs

- The 1970 CAAAs establish separate federal air quality standards for CO, O<sub>3</sub>, SO<sub>2</sub> and TSPs.
  - All counties are assigned a nonattainment or attainment status for each pollutant
  - Nonattainment counties have more stringent regulations on polluters
  - Attainment counties have less restrictions on polluters
- Polluters are defined by industry emissions (EPA's estimates)
  - Industries that account for 7% emissions over total of that pollutant
  - $\Rightarrow$  12 industries are designated as emitters of  $\geq 1$  pollutant

# The 1970 CAAAs: Nonattainment Designation of CO



#### Data

#### Censuses of Manufactures, 1967–1987

- Five surveys in four periods 1967, 1972, 1977, 1982 and 1987
- Plant level panel data
- Plant employment, capital stock, total shipments, location and industry

Code of Federal Regulations, 1967–1987

• County level nonattainment/attainment status for each period

# Nonattainment/attainment status

	Nonattainment Period $t$ (1)	Attainment Period $t-1$ and Nonattainment Period $t$ (2)	Nonattainment Period $t-1$ and Attainment Period $t$ (3)				
	A. Carbon Monoxide (CO)						
1967-72	0	0	0				
1972 - 77	81	81	0				
1977 - 82	144	90	27				
1982 – 87	137	15	22				
		B. Ozone (O <sub>3</sub> )					
1967-72	0	0	0				
1972 - 77	32	32	0				
1977 - 82	626	595	1				
1982 – 87	560	104	170				
		C. Sulfur Dioxide (SC	O <sub>2</sub> )				
1967-72	0	0	0				
1972 - 77	34	34	0				
1977 - 82	87	75	22				
1982 – 87	60	7	34				
		D. Total Suspended Particula	ites (TSPs)				
1967-72	0	0	0				
1972 - 77	296	296	0				
1977-82	235	108	169				
1982 - 87	176	24	83				

# Identification strategy

$$\begin{split} \% \Delta E_{pt} = & \frac{E_{pt} - E_{pt-5}}{(E_{pt} + E_{pt-5})/2} \\ = & \beta_1 \mathbf{X}_{pt-5} + \beta_{2t} \text{ ind } _i + \beta_{3t} \text{ nonattain } _{ct-5} \\ & + \beta_4 1 (\text{ emit CO} = 1 \& \text{ nonattain CO} = 1)_{cit-5} \\ & + \beta_5 1 (\text{ emit O}_3 = 1 \& \text{ nonattain O}_3 = 1)_{cit-5} \\ & + \beta_6 1 (\text{ emit SO}_2 = 1 \& \text{ nonattain SO}_2 = 1)_{cit-5} \\ & + \beta_7 1 (\text{ emit TSPs} = 1 \& \text{ nonattain TSPs} = 1)_{cit-5} + \alpha_p + \gamma_{ct} + \Delta u_{pt} \end{split}$$

- Assumptions
  - $\mathbf{0} \ \Delta u_{pt} | X \perp \mathsf{Nonattainment Status}_{ct}$
  - $\Delta u_{pt} X \perp \text{Emitter}_{it}$

## Identification strategy

- $\beta_{2t}$  ind i: industry×period fixed effects
  - Federal wide industry specific shocks
- $\alpha_p$ : plant fixed effects
  - Plant specifics that correlate with nonatainment status
- $\gamma_{ct}$ : county×period fixed effects
  - Shocks to all plants within a county-period

# Total employment

	(1)	(2)	(3)	(4)
CO regulation effect $(\beta_4)$	084	075	086	163
	(.032)	(.031)	(.030)	(.045)
$O_3$ regulation effect $(\beta_5)$	.001	.022	011	049
	(.011)	(.010)	(.010)	(.015)
$SO_2$ regulation effect $(\beta_6)$	004	016	.003	.001
	(.029)	(.028)	(.029)	(.036)
TSPs regulation effect	024	010	020	024
$(\beta_7)$	(.014)	(.013)	(.013)	(.024)
$R^2$	.109	.119	.144	.504
Industry by period fixed				
effects	yes	yes	yes	yes
Nonattainment by period	,	,	,	,
fixed effects	yes	yes	no	no
County fixed effects	no	yes	no	no
County by period fixed		•		
effects	no	no	yes	yes
Plant fixed effects	no	no	no	yes

# Capital stock and shipments

	(1)	(2)	(3)	(4)		
	A. Capital Stock (N=1,607,332)					
CO regulation effect $(\beta_4)$	047	047	097	092		
0	(.043)	(.042)	(.043)	(.062)		
$O_3$ regulation effect $(\beta_5)$	009	.016	001	041		
	(.022)	(.021)	(.021)	(.029)		
$SO_2$ regulation effect $(\beta_6)$	024	048	057	063		
- 0	(.047)	(.049)	(.055)	(.048)		
TSPs regulation effect	.026	.042	.010	043		
$(\beta_7)$	(.027)	(.025)	(.024)	(.039)		
$R^2$	.074	.109	.155	.462		
	B. Shipments (N=1,737,753)					
CO regulation effect $(\beta_4)$	058	036	072	146		
	(.029)	(.029)	(.029)	(.046)		
$O_3$ regulation effect $(\beta_5)$	.022	.048	.019	032		
_	(.018)	(.018)	(.016)	(.024)		
$SO_2$ regulation effect ( $\beta_6$ )	007	026	027	010		
	(.033)	(.030)	(.030)	(.039)		
TSPs regulation effect	014	002	010	032		
$(\beta_7)$	(.019)	(.018)	(.018)	(.034)		
$R^2$	.127	.142	.185	.516		
Industry by period fixed						
effects	yes	yes	yes	yes		
Nonattainment by period						
fixed effects	yes	yes	no	no		
County fixed effects	no	yes	no	no		
County by period fixed						
effects	no	no	yes	yes		
Plant fixed effects	no	no	no	yes		

## Heterogeneity in regulation effects

Industry Name (SIC Code)	CO Regulation Effects (1)	$O_3$ Regulation Effects (2)	$SO_2$ Regulation Effects (3)	TSPs Regulation Effects (4)
industry Name (SIC Code)	(1)	(4)	(3)	(4)
Lumber and wood (24)				006
				(.034)
Pulp and paper (2611–31)	080	110	105	.006
	(.077)	(.056)	(.074)	(.064)
Iron and steel (3312–13,	177	104	.038	012
3321–25)	(.061)	(.068)	(.059)	(.050)
Printing (2711–89)		072		
		(.027)		
Organic chemicals		.071		
(2961–69)		(.151)		
Rubber and plastic (30)		093		
F1 : . 1 . 1 (04)		(.046)		
Fabricated metals (34)		013		
Matanasahiatan (971)		(.026)		
Motor vehicles (371)		026		
T		(.057)	000	
Inorganic chemicals			089	
(2812–19)	133	.172	(.113) 180	
Petroleum refining (2911)	133 (.092)	(.101)	(.109)	
Stone alon and along (99)	(.092)	072	.039	063
Stone, clay, and glass (32)		(.039)		(.039)
Nonferrous metals (333–34)	169	(.039)	(.062) 063	(.039)
Nomerrous metals (555–54)	169 (163)		(.147)	
$\chi^2$ statistic of equality	1.03	11.67	5.82	1.57
x statistic of equality	(.79)	(.17)	(.32)	(4.67)
	4,40	(-17)	()	(,,,,,,,,,,,,,,,,,,,,,,,,,,,,,,,,,,,,,,

 $H_0$ : The environmental regulation effects are equal across industries.

#### Robustness checks

	Base Specification (0)	Dynamic Model (1)	Limit Sample to "Stayers" (2)	4.5% Emission Rule (3)		
		A. Total Employment				
CO regulation effect $(\beta_4)$	086	094	059	097		
	(.030)	(.028)	(.023)	(.028)		
$O_3$ regulation effect $(\beta_5)$	011	007	019	016		
	(.010)	(.010)	(.008)	(.010)		
$SO_2$ regulation effect ( $\beta_6$ )	.003	.005	.010	.006		
	(.029)	(.027)	(.021)	(.028)		
TSPs regulation effect $(\beta_7)$	020	013	022	013		
	(.013)	(.014)	(.011)	(.013)		

# Total employment: magnitude

	Estimated Regulation-Induced Change, 1972–77 to 1982–87		Mean of Change 1972–77 Ratio 1972–77 and of Col. TO 1982–87 1 to			Ratio of Col. 1 to Col.
	Mean (1)	95% Confidence Interval (2)	1982–87 (3)	Levels (4)	Col. 3 (5)	4 (6)
	A. Total Employment					
CO emitters	-119,100	[-54,600, -183,500]	-296,502	892,312	.402	133
O <sub>3</sub> emitters	-423,400	[-169,400, -677,400]	-169,000	5,496,651	2.505	077
SO <sub>2</sub> emitters	800	[57,400, -55,800]	-359,821	1,537,994	002	.001
TSPs emitters	-50,200	[48,200, -148,500]	-374,081	1,884,883	.134	027
All manufacturers	-591,900	[-118,400, -1,065,200]	-250,183	17,215,016	2.366	034

#### Conclusion

- Environmental regulations restrict industrial activity
  - Nonattainment counties lost 590,000 jobs, \$37 billion in capital stock, and \$75 billion of output in polluting industries.
- The regulation effects are evident across polluting industries
- Future research
  - Causality
  - Industrial activity being cut or reallocated?

#### References

Greenstone, M. (2002). The impacts of environmental regulations on industrial activity: Evidence from the 1970 and 1977 clean air act amendments and the census of manufactures. Journal of political economy 110(6), 1175-1219.