

# Smokestacks and the Swamp

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# Political Ideology and Firm Behavior

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- How do politicians' ideologies affect firms' operating decisions?
  - We know that *firms'* political ideologies affect their decisions (Hutton et al., 2014, 2015; Di Giulia and Kostovetsky, 2014; Fos et al., 2021)
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Rep. Neal Dunn  
(R–Panama City)

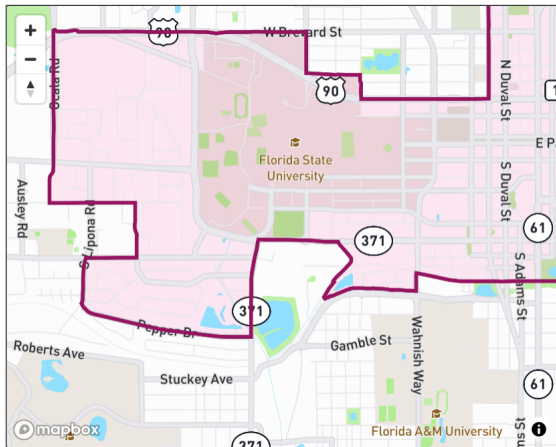


Rep. Al Lawson  
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  1. Can't use legislation
  2. Difficult to measure effect of political speech on firms
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## What we do

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- **Examine impact of close U.S. Congressional elections on firm emissions and production**
  - We use close elections as a shock to political ideology
  - Emissions represent a measurable firm action
  - Regression discontinuity (RD) design
  - Real effects: changes in pollution-related health problems
  - Also examine inspections and enforcement data from EPA/states
- **As proxy for political ideology, we use the *political party* of the winning candidate**
  - Virtually 100% of LCV-endorsed politicians are Democrats
    - Al Lawson: LCV 2020 score of 100%; lifetime score of 87%
    - Neal Dunn: LCV 2020 score of 5%; lifetime score of 4%
  - Numerous tests support ideological channel

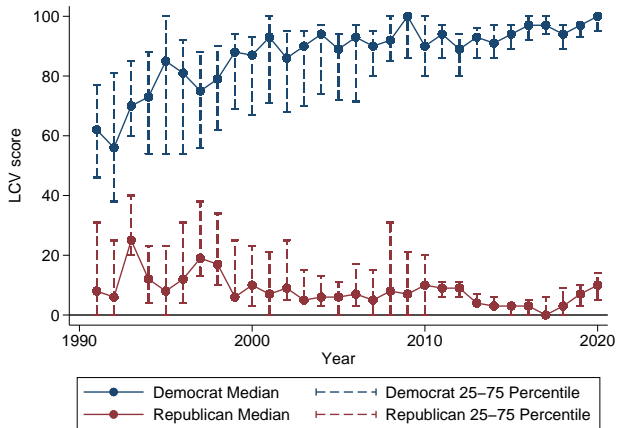
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## LCV scores for Democrats vs. Republicans over time

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## What we find

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### 1. Firm pollution decisions vary based on political party of their U.S. representative

- Pollution significantly lower in districts represented by a closely-elected Democrat
  - (Very) large magnitudes
  - No differences in production
- Firms reallocate pollution between their facilities based on the party affiliation of politicians

### 2. Mechanism (suggestive)

- Inspections and enforcement by environmental agencies increase when district is represented by a Democrat

### 3. Real effects

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## Literature

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- Political economy
  - Konisky and Woods (2003), Monogan et al. (2017), Lipscomb and Mobarak (2018)
- Environmental economics
  - Helland and Whitford (2003), Neumayer (2003), Fredriksson et al. (2005)
- Finance
  - **Firm pollution:** Akey and Appel (2020), Hsu, Li, and Tsou (2020), Shive and Forster (2020)
  - **Politicians influencing regulators:** Mehta et al. (2020), Mehta and Zhao (2020), Akey et al. (2021)
  - **Firms' political ideologies:** Kim et al. (2013), Di Giulia and Kostovetsky (2014), Hutton et al. (2014, 2015), Unsal et al. (2016), Elnahas and Kim (2017), Fos et al. (2021)
- Strategy and Organizational Behavior
  - Briscoe and Joshi (2017), Gupta and Wowak (2017), Gupta et al. (2017), Park et al. (2020), Gupta et al. (2021)

## Background: Theory

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- Why would a firm change its behavior because of the ideology of its U.S. representative?
- Assumption: firm managers maximize value
- A handful of possible channels:
  - Political favor-trading
  - Political interference (e.g. pushing for more/less enforcement)
  - Catering to voting blocs
  - Information content of elections
  - Omitted variables (credit/procurement/employment, etc.)
- Our results are most consistent with political interference through enforcement
  - Changes in expected enforcement intensity cause firms to re-optimize pollution decisions

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## Data

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- We focus on the U.S. House of Representatives from 1991 to 2016
  - 435 districts divided among states every 10 years based on population
  - Biennial election cycle (even-numbered years)
- Main data sources
  - TRI: Toxic Release Inventory (770 chemicals in 33 categories)
    - Emissions at the facility-year-chemical level
  - ECHO: Enforcement and Compliance History Online
  - Federal Election Commission: Candidate data, election results
  - Lewis et al. (2013): Congressional district shapefiles
- Other data sources
  - Health data: Center for Medicare and Medicaid Services (CMS)
    - Hospital level data on utilization and payments

## Regression discontinuity design

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Our main tests employ a **regression discontinuity (RD) design**

- Ferreira and Gyourko (2009), Akey (2015), Do et al. (2012), etc.

Our RD tests take two forms:

1. Local linear OLS regressions

- The sample is restricted to elections with a margin of 5% or less.

$$Y_{i(jd)ct} = \beta_1 \text{Democrat Win}_{dt} + \theta f(\text{Win Margin}_{dt}) + \delta \text{Democrat Win}_{dt} \times f(\text{Win Margin}_{dt}) + \beta^c + \epsilon_{it} .$$

2. Nonparametric polynomial specifications

- Calonico et al. (2014) and Cattaneo et al. (2019): construct nonparametric RD tests with an optimally-selected bandwidth

$$Y_{i(jd)t} = \beta_1 \text{Democrat Win}_{dt} + \theta g(\text{Win Margin}_{dt}) + \epsilon_{it}$$

## Baseline results: RD tests on Emissions

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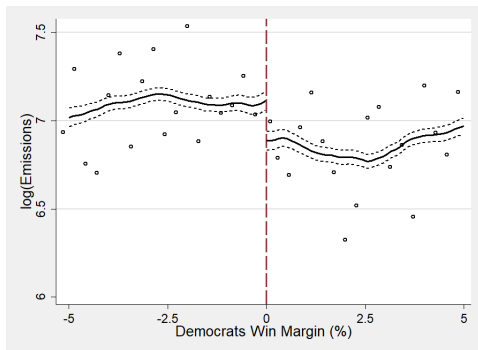
- Main prediction: Lower pollution after a Democrat wins close election.
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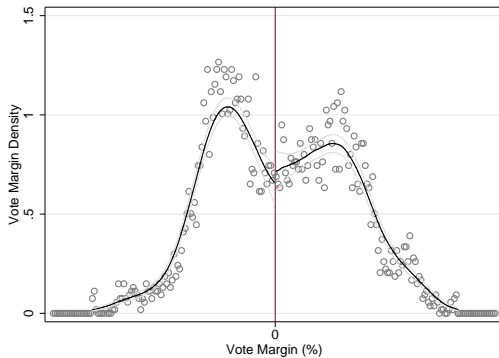
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Dep. Variable: log(Emissions)							
	(1)	(2)	(3)	(4)	(5)	(6)	(7)
Democrat Win	-0.213** (0.08)	-0.397** (0.16)	-0.305*** (0.12)	-0.355*** (0.03)	-0.349*** (0.03)	-0.353*** (0.04)	-0.355*** (0.04)
Method	Local OLS	Local OLS	Local OLS	NP	NP	NP	NP
Polynomial	Zero	Linear	Linear	Linear	Linear	Quadratic	Quadratic
Kernel	-	-	-	Tri.	Epa.	Tri.	Epa.
Chemical FE	No	No	Yes	-	-	-	-
Observations	94,140	94,140	94,111	1,329,508	1,329,508	1,329,508	1,329,508

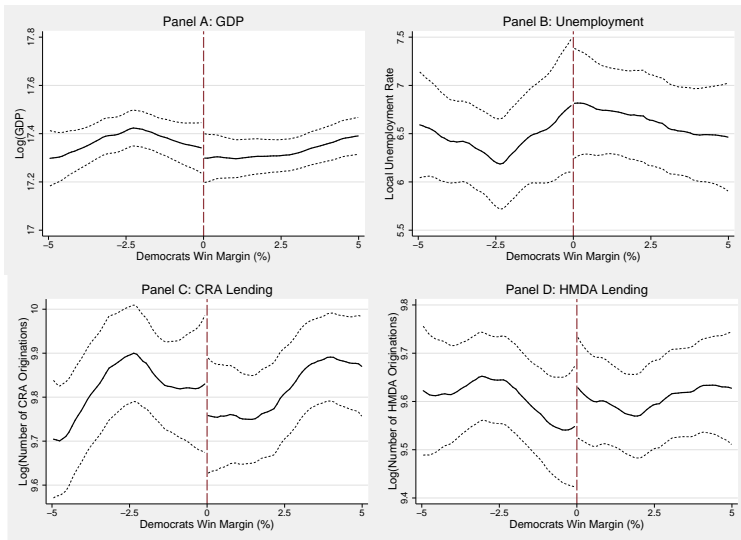
- Two different RD methods produce similar results

## Robustness: McCrary (2008) test

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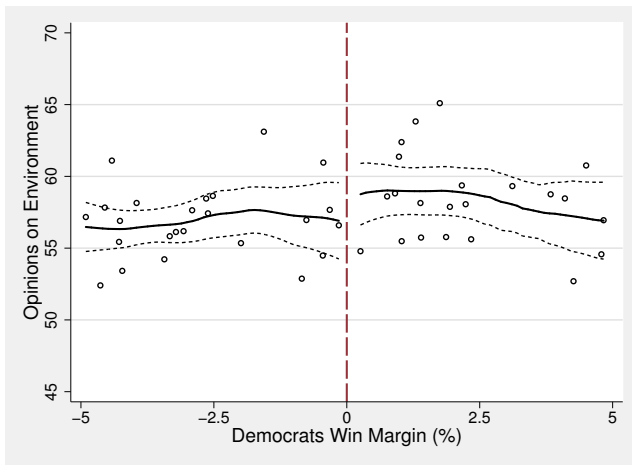
## Robustness: Covariate balance



## Robustness: Public opinion about the environment

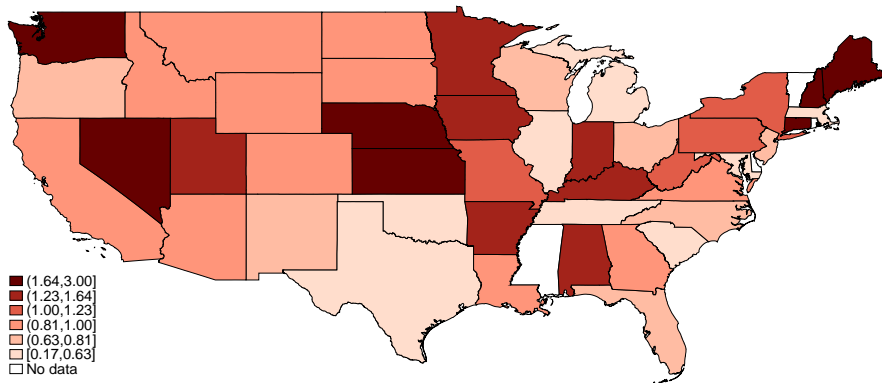
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- Data from Yale Climate Opinion Maps, 2020



## Robustness: Close election propensity

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## Robustness: RD tests on residuals

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- First, regress emissions on district and state  $\times$  chemical  $\times$  year FE (columns 1-2) or firm  $\times$  chemical  $\times$  year FE (columns 3-4)
- Then perform RD on residuals
  - Similar to Lowes and Montero (2020)

	Dep. Variable: log(Emissions) Residuals			
	(1)	(2)	(3)	(4)
Democrat Win	-0.145** (0.07)	-0.031* (0.02)	-0.034 (0.07)	-0.052*** (0.02)
Method	Local OLS	NP	Local OLS	NP
Polynomial	Linear	Linear	Linear	Linear
Kernel	–	Tri.	–	Tri.
Chemical FE	Yes	–	Yes	–
Observations	90,555	1,281,479	57,320	811,995



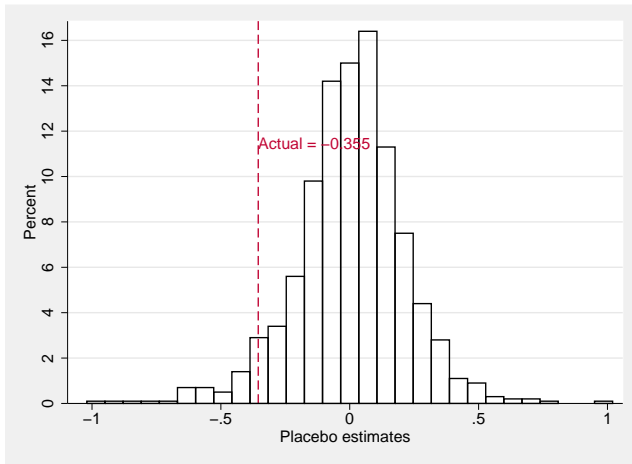
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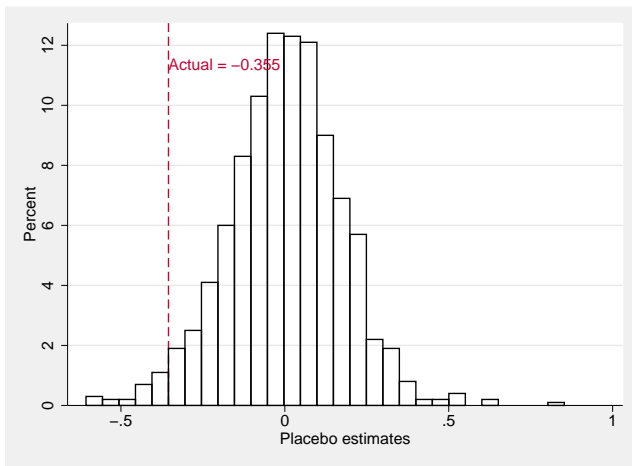
## Robustness: Placebo tests (randomized vote margin)

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## Robustness: Placebo tests (randomized political party)

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## Robustness: Is effect coming from higher production?

- Pollution *per unit* of production falls significantly

	log(Cumulative Emissions/Production)	
	(1)	(2)
Democrat Win	-0.102*	-0.073***
	(0.06)	(0.02)
Method	Local OLS	NP
Polynomial	Linear	Linear
Kernel	–	Tri.
Chemical FE	Yes	–
Observations	84,304	1,178,094

- Buntaine, Greenstone, He, Liu, Wang, and Zhang (2021) use abatement electricity data to show that firms dial up/down abatement devices to control pollution without affecting production

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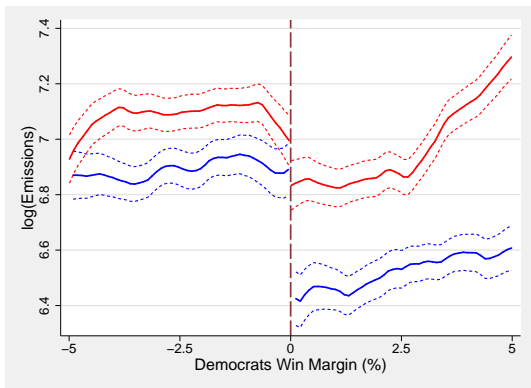
- Production level does not change after close Democrat win

	log(Cumulative Production)	
	(1)	(2)
Democrat Win	0.000 (0.02)	0.010 (0.01)
Method	Local OLS	NP
Polynomial	Linear	Linear
Kernel	–	Tri.
Chemical FE	46,618	630,875

## Robustness: Are governors driving the effect?

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- We would expect results to be stronger under Democratic governors, but they should also exist under Republican governors



## Ideology: Theory

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- Goal: identify effect of politicians' ideology on firm outcomes
- We use political parties *as a proxy for* ideology
  - Interparty variation >>> Intraparty variation
- Determinants of ideology
  - Personal beliefs
  - Electoral/career incentives
  - Median voter model: policies targeted at median voter
    - Large pollution changes despite no differences in public opinion
  - Lobby/voting bloc model: policies aimed at specific voting blocs
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- Question: Are political parties reasonable proxies for politicians' personal ideologies?

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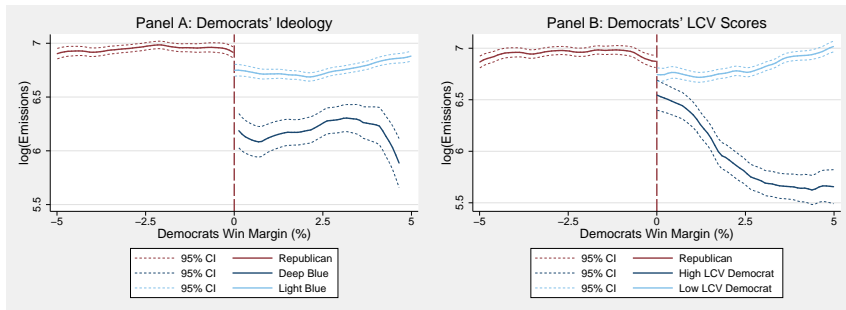
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## Ideology: *Within-party* ideology differences

- We would expect results to be stronger for liberal versus moderate Democrats



## Ideology: Switchers

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- Define Switchers
  - A district switches from being represented by a Democrat to being represented by a Republican (and vice versa)

R-D switchers

D-R switchers

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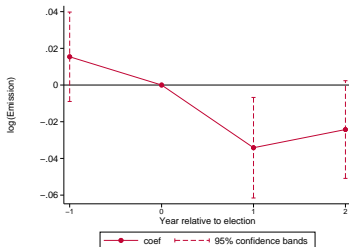
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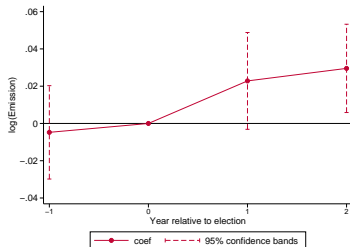
# Ideology: Switchers

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## Ideology: Switchers

	log(Emissions): R-D Switchers		log(Emissions): D-R Switchers	
	(1)	(2)	(3)	(4)
Switchers $\times$ Post Election	-0.059*** (0.01)		0.029*** (0.01)	
Switchers $\times$ Election Year -1		0.008 (0.01)		-0.005 (0.01)
Switchers $\times$ Election Year +1		-0.061*** (0.01)		0.023* (0.01)
Switchers $\times$ Election Year +2		-0.049*** (0.01)		0.030** (0.01)
Low-Order Terms	Yes	Yes	Yes	Yes
District $\times$ Election Year FE	Yes	Yes	Yes	Yes
Facility $\times$ Chemical FE	Yes	Yes	Yes	Yes
Observations	1,516,595	1,516,595	1,407,224	1,407,224

- Relative emissions at facilities in R-D district decline by approximately 6% and relative emissions at facilities in D-R district rise by approximately 3%.

## Ideology: Political power interactions

- Political power is a necessary condition for our channel
- Holding power fixed, should see strongest effects for *more ideological* politicians
  - Less environmental engagement → less likely to intervene

	Dep. Variable: log(Emissions)		
	(1)	(2)	(3)
Democrat Win	-0.026** (0.01)	-0.020* (0.01)	-0.020* (0.01)
Democrat × Chair	0.039 (0.04)	0.017 (0.04)	0.016 (0.04)
Ideological × Democrat × Chair	-0.143** (0.07)	-0.168** (0.07)	-0.222*** (0.07)
Lower Order Terms	Yes	Yes	Yes
Firm × Chemical × Year FE	Yes	Yes	Yes
Facility × Chemical FE	Yes	Yes	Yes
State × Year FE	No	Yes	No
State × Year × Chemical FE	No	No	Yes
Observations	761,731	761,731	718,698

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## Firm Reallocation: Cross-sectional OLS

- Do firms reallocate pollution across plants due to party affiliation of representatives?

	Dep. Variable: log(Emissions)				
	(1)	(2)	(3)	(4)	(5)
Democrat Win	-0.058*** (0.02)	-0.044*** (0.01)	-0.026* (0.01)	-0.020** (0.01)	-0.025** (0.01)
Linear Interaction	No	No	No	No	Yes
District FE	Yes	Yes	No	No	No
Year FE	Yes	No	No	No	No
Firm $\times$ Year FE	No	Yes	No	No	No
District $\times$ Chemical FE	No	No	Yes	No	No
Firm $\times$ Chemical $\times$ Year FE	No	No	Yes	Yes	Yes
Facility $\times$ Chemical FE	No	No	No	Yes	Yes
Observations	1,329,508	1,293,847	796,544	782,632	782,632

- Suggestive of within-firm reallocation of pollution
- Also rules out channels such as firms' political beliefs

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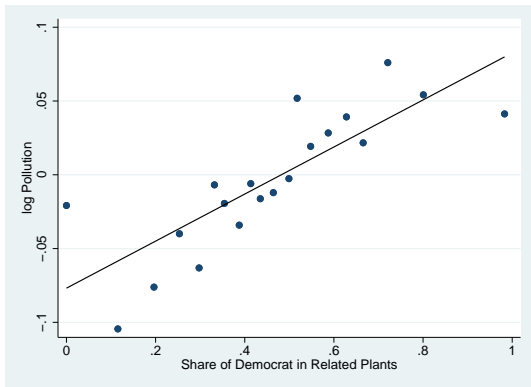
## Firm Reallocation: Bertrand-Mullainathan-style strategy

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- Define *Other Facilities' Democrat Share*
  - The extent to which the firm's other plants are represented by Democrats.
- Plants pollute more if other plants owned by the same firm have a high Democrat share.

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	log(Pollution) (1)	log(Pollution) (2)	log(Pollution) (3)	log(Pollution) (4)
Other Facilities' Democrat Share	0.028** (0.013)	0.063*** (0.015)		
Local Democrat	-0.018* (0.011)		-0.017* (0.010)	
High Democrat Share			0.015** (0.007)	0.027*** (0.008)
Chemical $\times$ Year	Yes	No	Yes	No
Facility $\times$ Chemical	Yes	Yes	Yes	Yes
District $\times$ Chemical $\times$ Year	No	Yes	No	Yes
Adj.-R <sup>2</sup>	0.890	0.922	0.890	0.922
Obs.	1,128,556	897,686	1,128,556	897,686

- Even after completely absorbing time-varying factors at the local district level (column 2 and 4), pollution is higher at the local facility by as much as 3-6% when the firm's other facilities are represented by Democrats.

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Local Democrat	-0.018* (0.011)		-0.017* (0.010)	
High Democrat Share			0.015** (0.007)	0.027*** (0.008)
Chemical $\times$ Year	Yes	No	Yes	No
Facility $\times$ Chemical	Yes	Yes	Yes	Yes
District $\times$ Chemical $\times$ Year	No	Yes	No	Yes
Adj.-R <sup>2</sup>	0.890	0.922	0.890	0.922
Obs.	1,128,556	897,686	1,128,556	897,686

- Even after completely absorbing time-varying factors at the local district level (column 2 and 4), pollution is higher at the local facility by as much as 3-6% when the firm's other facilities are represented by Democrats.

## Mechanism: Theory

---

- Recall, a handful of possible channels:
  1. Political favor-trading
  2. Time-varying enforcement
  3. Catering to voting blocs
  4. Information content of elections
  5. Omitted variables (credit/procurement/employment, etc.)
- Existing tests find little support for 3, 4, and 5
  - Voting blocs: why would pollution change?
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- Explaining the equilibrium drop in pollution
  - Why would profit-maximizing firms reduce pollution per unit of output just because their new representative is a Democrat?
- Potential tradeoff: abatement costs vs. pecuniary/non-pecuniary enforcement costs
  - To work, *some firms must "over"-pollute under R representatives*
  - Formal (fines, penalties) vs. informal (letter) enforcement
  - If  $\Pr(\text{inspection})$  under R representative  $\approx \varepsilon$ ,  $E[\text{benefits to over-pollution}] > E[\text{costs}]$
  - If  $\Pr(\text{inspection}) \uparrow$  under D representative, could be optimal to reduce pollution
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## Mechanism: Regulatory interference

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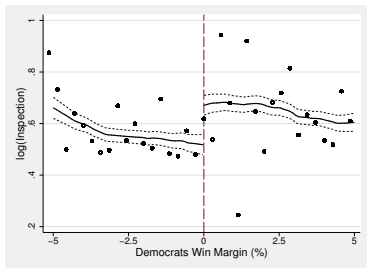
- Federal environmental laws apply to all firms at the same time.
- Hence, variation in inspections/enforcement must be driven by factors unrelated to legislation

Inspection

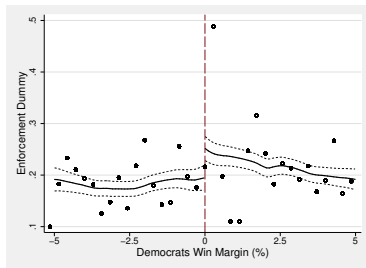
Enforcement

## Mechanism: Regulatory interference

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Inspection



Enforcement

## Mechanism: Inspections

	log(Inspections)		Inspection Dummy	
	(1)	(2)	(3)	(4)
Democrat Win	0.214*** (0.07)	0.177*** (0.02)	0.029 (0.03)	0.022*** (0.01)
Method	Local OLS	NP	Local OLS	NP
Polynomial	Linear	Linear	Linear	Linear
Kernel	–	Tri.	–	Tri.
Observations	9,418	132,987	30,773	414,341

- Marginal wins by Democrats are associated with increased inspections along both the intensive and extensive margins.



## Mechanism: Enforcement outcomes per inspection

	<u>Enforcement Inspections</u>		<u>Informal Enf. Inspections</u>		<u>Formal Enf. Inspections</u>		<u>Penalties Inspections</u>	
	(1)	(2)	(3)	(4)	(5)	(6)	(7)	(8)
Democrat Win	0.050 (0.04)	0.055*** (0.01)	0.058** (0.03)	0.055*** (0.01)	-0.005 (0.02)	0.009* (0.00)	-47.603 (61.21)	28.617 (23.84)
Method	Local OLS	NP	Local OLS	NP	Local OLS	NP	Local OLS	NP
Polynomial	Linear	Linear	Linear	Linear	Linear	Linear	Linear	Linear
Kernel	–	Tri.	–	Tri.	–	Tri.	–	Tri.
Observations	9,419	132,989	9,419	132,989	9,419	132,989	9,419	132,989

- Conditional on inspections, districts just won by Democrats are associated with an increase in informal but not formal enforcement.
- Consistent with firms updating pollution behavior so as not to breach emission limits after Democrat is elected
  - To-do: Exploit variation in penalties across chemical/pollution types

## Real effects: Respiratory diseases

- What are the consequences of pollution differences due to political ideology?
  - To-do: Compustat
  - Examine changes in pollution-related health effects
  - We expect to see less respiratory-related hospital visits in areas with a high number of plants when Democrats are elected

	log(Number of Discharges)			log(Total Payments)		
	(1)	(2)	(3)	(4)	(5)	(6)
Democrat Win	0.014 (0.02)	0.007 (0.02)		0.101*** (0.02)	0.021 (0.02)	
High Num. Plants	0.325*** (0.02)	0.288*** (0.02)	0.188*** (0.03)	0.350*** (0.02)	0.301*** (0.02)	0.189*** (0.03)
Democrat Win × High Num. Plants	-0.082*** (0.03)	-0.071** (0.03)	-0.066** (0.03)	-0.126*** (0.03)	-0.075** (0.03)	-0.073** (0.03)
ZIP FE	Yes	Yes	No	Yes	Yes	No
Census District FE	No	Yes	No	No	Yes	No
Year FE	Yes	Yes	No	Yes	Yes	No
District-Year FE	No	No	Yes	No	No	Yes
ZIP-District FE	No	No	Yes	No	No	Yes
R-Squared	0.187	0.239	0.273	0.207	0.264	0.299
Observations	60,351	60,349	60,336	60,351	60,349	60,336

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## Real effects: Placebo test

- We expect no changes in health conditions that are unrelated to pollution
- Health conditions that are plausibly less related to pollution.
  - infectious disorders, mental diseases, alcohol/drug use or induced mental disorders, injuries, poison, and toxic effects of drugs, and burns

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Democrat Win	0.023 (0.02)	-0.012 (0.04)		0.131*** (0.03)	-0.041 (0.04)	
High Num. Plants	0.212*** (0.02)	0.149*** (0.03)	0.112*** (0.03)	0.259*** (0.03)	0.167*** (0.03)	0.124*** (0.04)
Democrat Win × High Num. Plants	0.035 (0.03)	0.060* (0.04)	0.004 (0.05)	-0.041 (0.04)	0.053 (0.04)	0.004 (0.05)
ZIP FE	Yes	Yes	No	Yes	Yes	No
Census District FE	No	Yes	No	No	Yes	No
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District-Year FE	No	No	Yes	No	No	Yes
ZIP-District FE	No	No	Yes	No	No	Yes
MDC FE	Yes	Yes	Yes	Yes	Yes	Yes
R-Squared	0.216	0.249	0.275	0.431	0.469	0.493
Observations	28,276	28,273	28,227	28,276	28,273	28,227

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  - Yes!
- Close-election RD results:
  - Lower pollution in areas won by closely-elected Democrats
  - Firm reallocation between plants based on the party affiliation of the politicians
  - Higher inspections and enforcement as well
  - Real effects: Less respiratory disease
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