

# Does Private Equity Ownership Make Firms Cleaner? The Role Of Environmental Liability Risks

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“The tiny reptile lives (...) where Vista Proppants & Logistics Ltd. was looking to build a sand mine. Vista is owned by a **private equity firm**, First Reserve Corp (...). [The lizard] was prolific enough to stay off any endangered or threatened lists. What Vista did next may be surprising. The miners worked with local conservationists to make sure as **few lizards as possible were harmed**”.

Source: Bloomberg, Melissa Mittelman

The graphic features the text "MY PLAN TO REIN IN WALL STREET" in a bold, black, sans-serif font. The words "MY PLAN TO" are smaller and positioned above "REIN IN WALL STREET". The background is a light beige color with a faint, repeating pattern of green-tinted suits and ties, suggesting a corporate or financial setting.

# MY PLAN TO REIN IN WALL STREET

"Sometimes the companies do well. But far too often, the private equity firms are like **vampires** – bleeding the company dry and walking away enriched even as the company succumbs. (...)"

Source: End Wall Street's Stranglehold On Our Economy, Elizabeth Warren

## Research question

**Do PE firms create shareholder value at the expense of society?**

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## **Consumers**

Health care (Pradhan et al., 2014 and Eliason et al., 2019), restaurant (Berstein et al. 2016 (RFS)), retail products (Fracassi et al. 2018), education (Eaton et al. 2018 (RFS))

## **Governments**

Kaplan, 1989 (JF), Eaton et al. 2018 (RFS), Olbert et al. 2019 (R&R, JF)

## **Workers**

Boucly et al. 2011 (JFE), Davis et al. 2014 (AER), Cohn et al. 2019 (R&R, RFS)

<b>Missing stakeholder: people incurring the cost of pollution</b>
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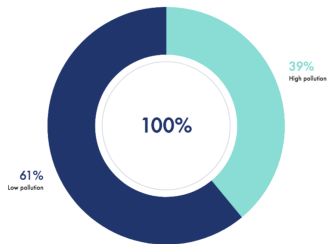
<b>Missing stakeholder: people incurring the cost of pollution</b>
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**What is the economic mechanism, friction, incentive driving the effect?**

# Why it matters

- PE firms managed \$3.4 trillion of assets in June 2018

- They invest heavily in industries that pollute: 30 to 40% of acquisitions
  - ▶ Include: Natural resources, energy, heavy industry and infrastructure sectors



- Toxic pollution has adverse effects on public health, worker productivity, housing price and environmental sustainability

## Challenges and suggested solutions

- **Challenge 1: Finding micro-data on pollution and its intensity**
- **Challenge 2: Endogeneity of PE deals**

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  - ▶ Collect administrative data on chemicals and satellite data on CO2 emissions
  - ▶ Unique and novel picture on corporate environmental policies
- **Challenge 2: Endogeneity of PE deals**
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- ▶ Adopt and validate a **nearest-neighbor** research design
- ▶ use a novel natural experiment and PE contracts to understand the channels

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- ▶ Second sector in terms of PE attractiveness (after computer industry)
- ▶ 55 million households live in a shale basin
- ▶ 28% of methane emissions come from the oil and gas industry in the US

# Findings

- **PE ownership causes *a drop* in pollution**
  - ▶ 70% of the baseline level for toxic pollutants
  - ▶ 50% of the baseline rate of flaring

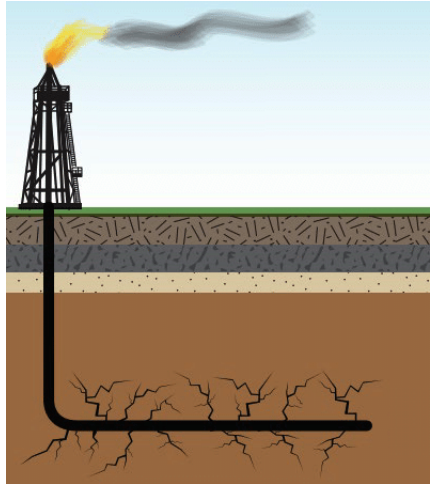
# Findings

- **PE ownership causes a drop in pollution**
  - ▶ 70% of the baseline level for toxic pollutants
  - ▶ 50% of the baseline rate of flaring
- Consistent with the maximization of **long-term** shareholder value
- PE firms reduce pollution to increase the **exit value**
  - ▶ Polluted assets are traded with a negative discount
    - ★ They expose the new owner to more environmental liability risks
    - ★ Informational and belief frictions about these risks create heterogeneous demand
  - ▶ Incentive to change the amount of pollution (Osborne and Pitchik, 1987)
    - ★ Increase the number of potential buyers
    - ★ Attract buyers with a higher valuation

## Institutional framework

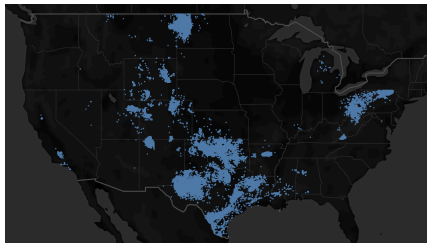
# Fracking: background

- Oil and gas companies:
  - ▶ Find an acreage
  - ▶ Drill a well
- Injection of toxic chemicals
  - ▶ Hydraulic fracturing: creates cracks in the rock to extract the oil and gas
- Gas is sometimes burnt (flaring) when extracting oil
  - ▶ Gas and oil are often co-product



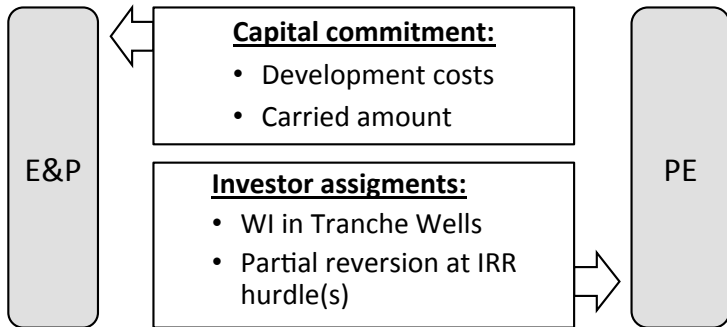
# Oil and gas datasets

- Use administrative databases merged to commercial data
  - **Toxic component:** congressional reports
  - Exempt from federal regulation and local anecdotal evidence of contamination
- Construct a dataset on flaring using satellite imaging methods
- Descriptive statistics of the sample:
  - 135,503 projects started between 2010 and 2019
  - Between 75 and 135 billion dollars
  - 97.49 projects for a firm on average
  - Average rate of pollution: 0.3 toxic chemical and 20% of flaring
  - 106 final PE deals with transfer of ownership, 55 PE firms and 50 DrillCo contracts



Geographical distribution of the projects

## Drillco contracts



- No change in control rights: "**We don't micro-manage operational details about how you're fracking the wells**" (Tim Murray from Benefit Street Partners)
- No value at exit but streams of income

Net effect of PE ownership on pollution

# Identification approach

**Endogeneity problem:** PE firms do not randomize. Their acquisition can plausibly correlate with major milestones in the development of the firm, like an expansion

**Location L ( $\Phi=0.2$ ), time 1**



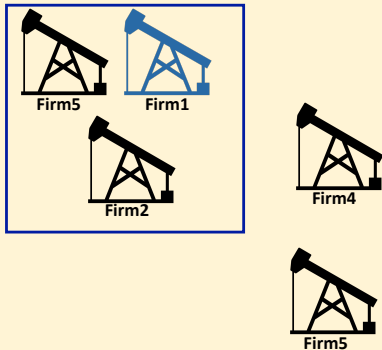
**Location H ( $\Phi=0.8$ ), time 2**



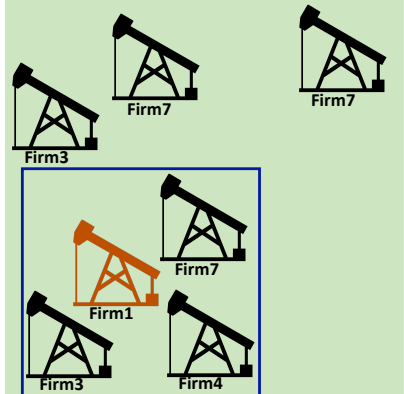
# Identification approach

**Identifying assumption:** Project-level marginal cost and benefit of polluting are the same for two wells located in the same area and completed the same year

Location L ( $\Phi=0.2$ ), time 1



Location H ( $\Phi=0.8$ ), time 2

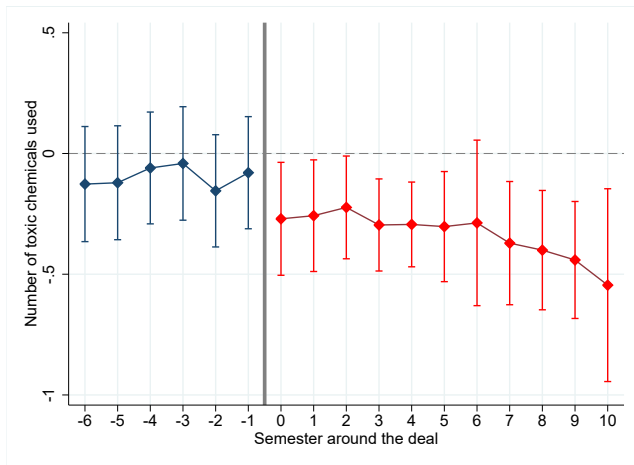


## Difference-in-differences: toxic chemicals

$$Y_{pijt} = \text{Firm}_i + \text{Year}_t \times \text{Location}_j + \sum_{\tau=-6}^{10} \gamma_{\tau} \cdot (\mathbb{1}_{i,t,\tau}) + X_{pt} + \epsilon_{pijt}$$

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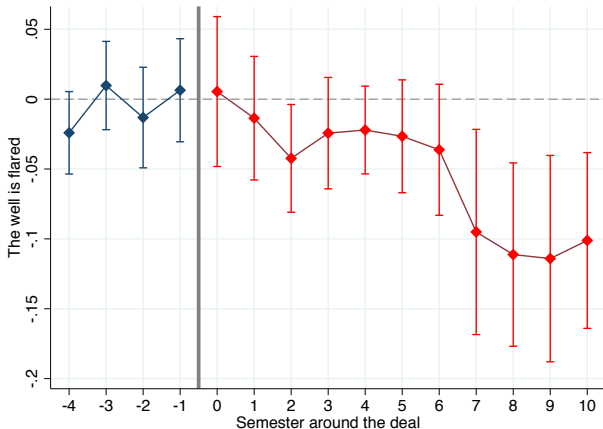
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**Reduction equivalent to 70% of the baseline number of toxic chemical**

## Difference-in-differences: flaring

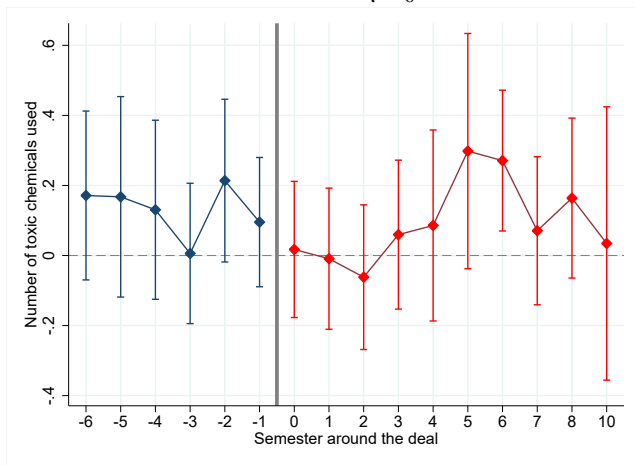
$$\text{Flaring}_{pijt} = \text{Firm}_i + \text{Year}_t \times \text{Location}_j + \sum_{\tau=-4}^{10} \gamma_{\tau} \cdot (\mathbb{1}_{i,t,\tau}) + X_{pt} + \epsilon_{pijt}$$



**Reduction equivalent to 50% of the baseline rate in flaring**

# Difference-in-differences: Drillco contracts

$$Y_{pijt} = \text{Firm}_i + \text{Year}_t \times \text{Location}_j + \sum_{\tau=-6}^{10} \gamma_{\tau} \cdot (\mathbb{1}_{i,t,\tau}) + X_{pt} + \epsilon_{pijt}$$

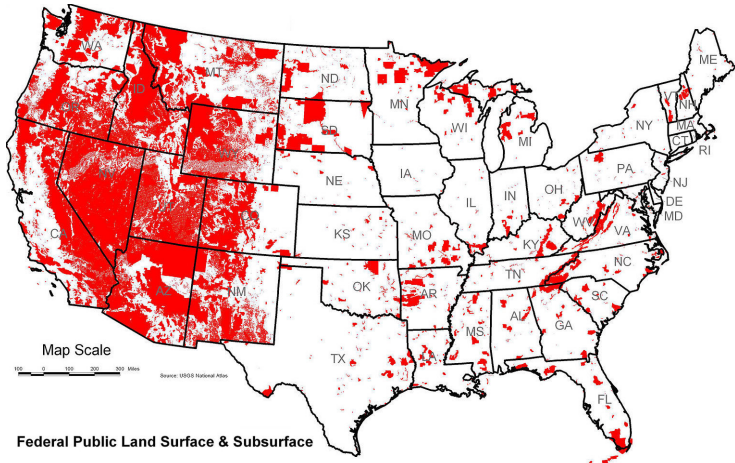


**No economic and significant statistical effect on pollution**

## The role of environmental liability risks

# Natural experiment: background

- Bureau of Land Management (BLM): responsible for the environmental regulation of Native American reservation / federal land



# Natural experiment: background

## 2012-2015: the rule is drafted, debated and discussed

- Improve the **disclosure** of operational activities
- Increase the quality and **integrity of the wellbore**
- Increase the standard of **water protection**: "isolate all usable water and other mineral-bearing formations and protect them from contamination"

## 2015-2018: The ability of BLM to regulate fracking is challenged

- March 20, 2015: various petitioners filed a motion for **preliminary injunction** to challenge the fracking rule
- June 21, 2016: the **rule is abrogated** by the District of Wyoming and three days after the BLM appealed
- January 20, 2017: Trump is inaugurated and the rule is voided in July 25, 2017

## 2018-today: the rescind is challenged

- State of California and a group of environmental activists **sue the BLM** for voiding the fracking rule

## Triple-difference (1/2)

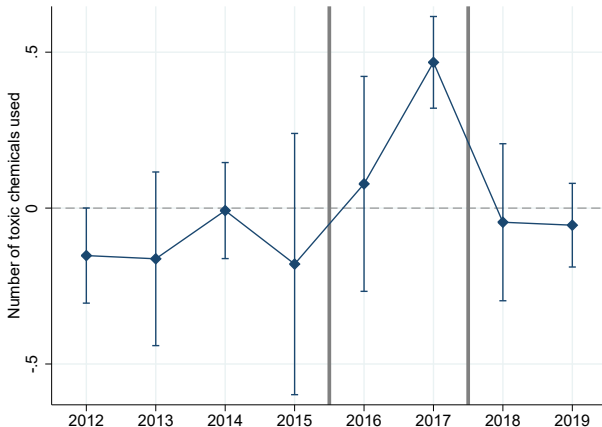
$$Y_{pijt} = \text{Firm}_i \times \text{Year}_t + \text{Location}_j \times \text{Year}_t + \sum_{\tau=2012}^{2019} (\text{year}=\tau) \times (\text{BLM})_{pt} \times (\gamma_{\tau} + \beta_{\tau} \cdot \text{PE}_{it}) + X_{pt} + \epsilon_{ijt}$$

### ● Interpretation:

- ▶ Difference in pollution between regulated and non-regulated areas for projects drilled the same year in the same location
- ▶  $\beta_{\tau}$  is the evolution of this difference for PE-backed firms with respect to non PE-backed firms during year  $\tau$
- ▶ After purging out firm-level time trends and observable characteristics in projects

## Triple-difference (2/2)

$$Y_{pijt} = \text{Firm}_i \times \text{Year}_t + \text{Location}_j \times \text{Year}_t + \sum_{\tau=2012}^{2019} (\text{year}=\tau) \times (\text{BLM})_{pt} \times (\gamma_{\tau} + \beta_{\tau} \cdot \text{PE}_{it}) + X_{pt} + \epsilon_{ijt}$$



**More *relative* pollution in areas where regulatory risk is lower**

# Results And Economic Discussion

- Reject theories based on **non-pecuniary motivations**
  - ▶ Unless strong asymmetric information between limited and general partners
  - ▶ If ESG is a substitution to government failures ((Benabou and Tirole (2010)), then we should expect a decrease of pollution
- Reject an explanation fully driven by **technological change**
  - ▶ Technological progress doesn't correlate with spatial regulatory risks

# Potential non-exclusive channels

- Investment **horizon channel**

▶ Public listing

▶ Cash flow

- ▶ Asymmetric information between managers and public investors => Managers take inefficient actions to signal their types (Stein (1989) and (Grenadier et al. (2011))

- PE firms **reduce pollution to increase the exit value**

- ▶ Polluted assets are traded with a negative discount

▶ Evidence

- ★ They expose the new owner to more environmental liability risks
- ★ Clean-up (CERCLA), litigation and future compliance cost
- ★ Informational and belief frictions about these risks create heterogeneous demand
- ▶ Incentive to change the amount of pollution (Osborne and Pitchik, 1987)
  - ★ Increase the number of potential buyers
  - ★ Attract buyers with a higher valuation

- Interaction of these two channels explains why the decrease in pollution is higher with time

# Concluding remarks

- PE control leads to a **reduction of pollution**
  - ▶ 70% reduction of toxic chemicals
  - ▶ 50% reduction in flaring
- Driven by **pecuniary motives** from a long-term investor
- **Implication:** Initiatives to decarbonize portfolios could come at the cost of increasing pollution in dirty industries
  - ▶ Goal of decarbonization: to reduce production of fossil fuels
  - ▶ Mechanism: make the cost of capital higher
  - ▶ However, an unintended effect could be to increase pollution in the oil and gas

## **Appendix**

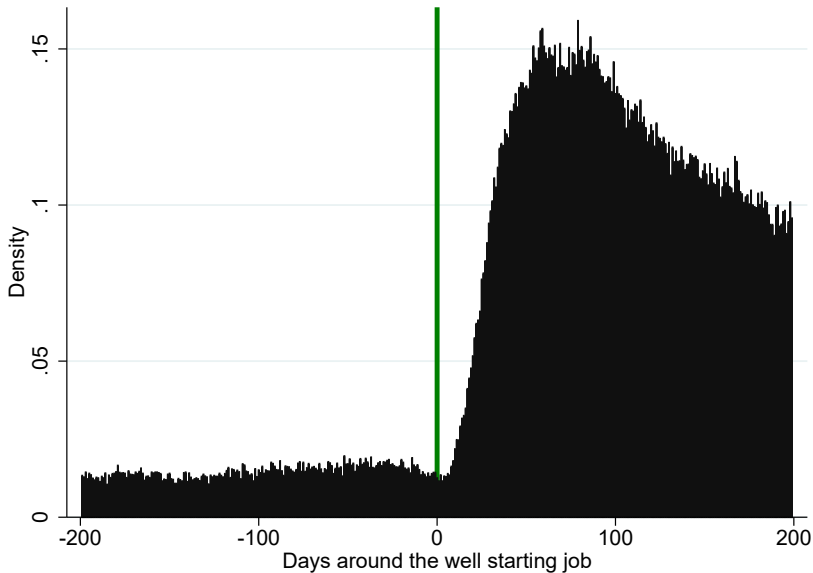
## Flaring: usage of satellite dataset

Follow the advance of remote sensing (Elvidge et Al., 2013):

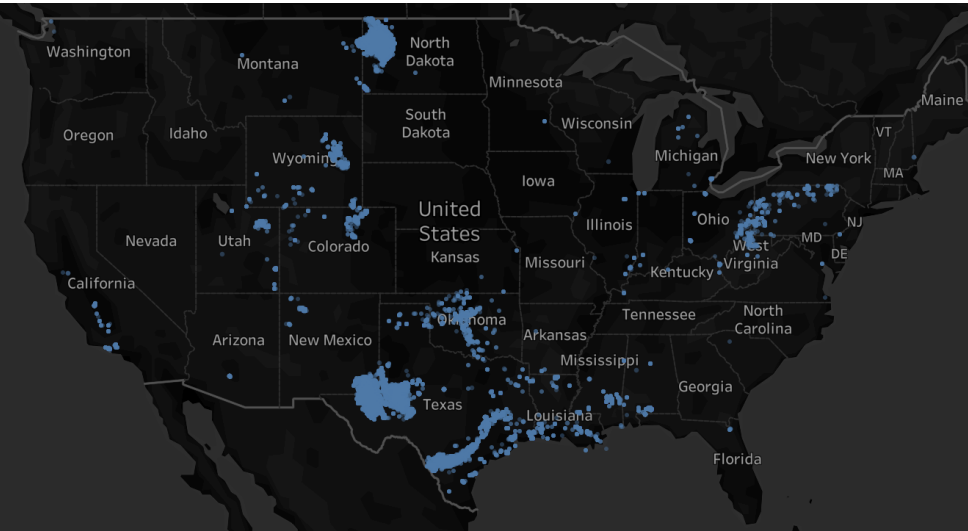
- Satellite pyrometer - NASA/NOAA Visible Infrared Imaging Radiometer Suite (VIIRS) collects the radiation
- Collect the background temperature from NOAA
- Invert the Max Planck equation and use the Wien's Displacement Law
- Temperature for each square at nadir: Flaring if  $1600^{\circ}\text{C}$  and  $2000^{\circ}\text{C}$

**One limitation:** cannot identify flaring if two wells are too close to each other

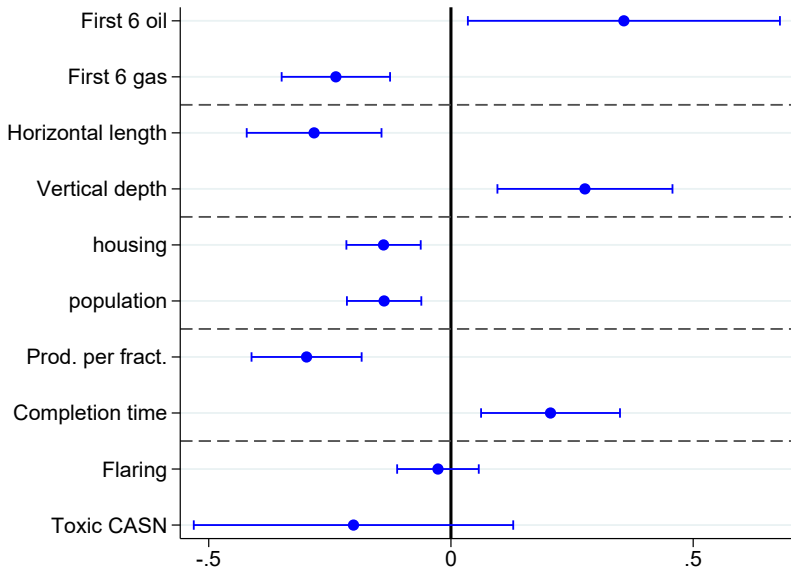
## Flaring predicts correctly drilling activities (1/2)



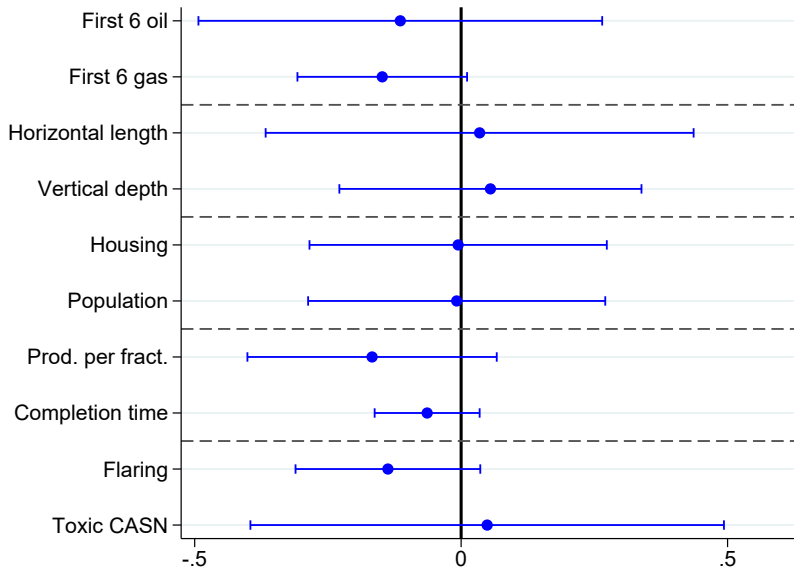
## Flaring predicts correctly drilling activities (2/2)



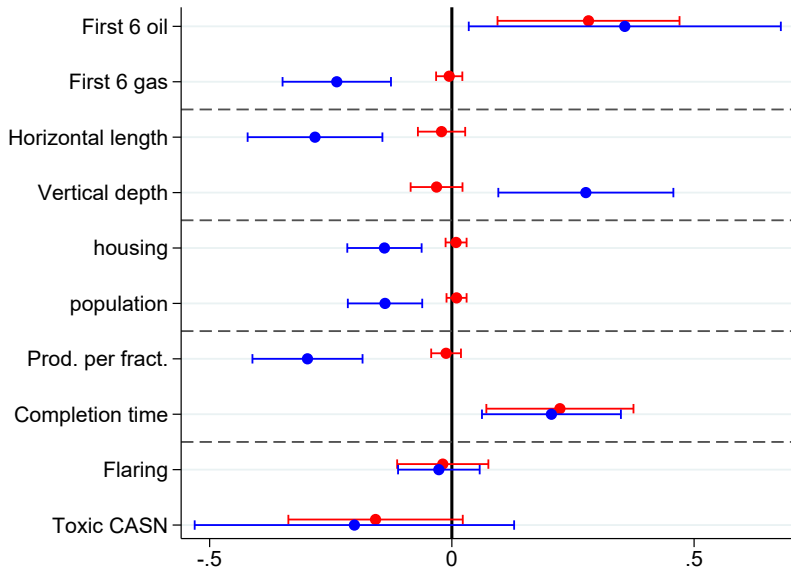
# Selection problems: PE ownership



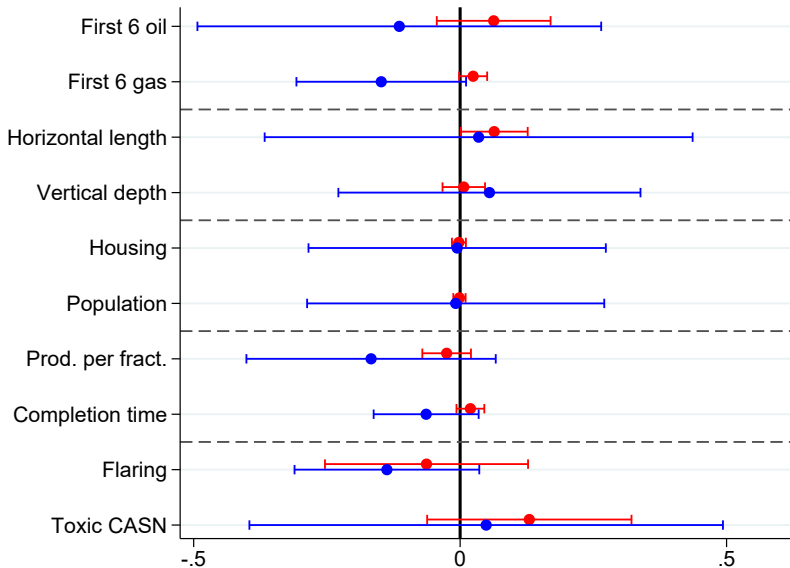
# Selection problems: Drillco



## Reliability of the empirical design (1/2)



## Reliability of the empirical design (2/2)



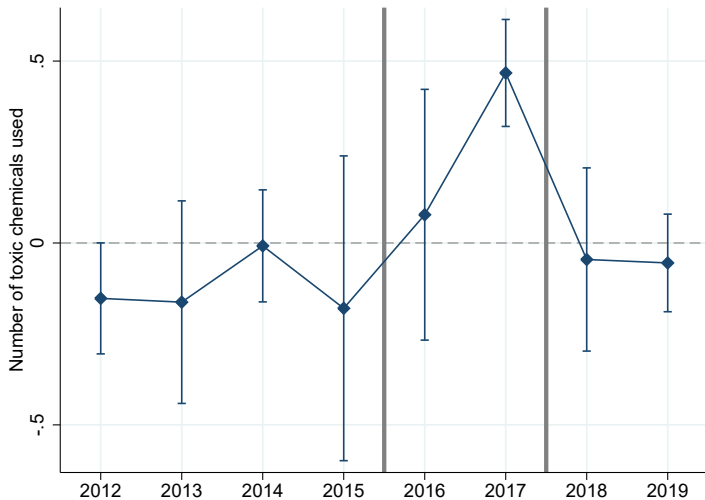
# Specification

$$Y_{ijt} = \mathbf{Year}_t \times \mathbf{Firm}_i + \mathbf{Year}_t \times \mathbf{Location}_j + \sum_{\tau=-6}^{10} (\gamma_{\tau} \cdot \mathbb{1}_{i,t,\tau} \times \mathbf{BLM}_{it}) + X_{ijt} + \epsilon_{ijt}$$

Where for a project of firm  $i$  in a location  $j$  at time  $t$ :

- **$\mathbf{BLM}_{it}$** : Takes value 1 if the project is located in an area regulated by BLM
- $Y_{ijt}$  is either the number of toxic chemicals or a dummy for flaring
- Time-varying project-level controls (horizontal length, vertical depth and production (oil and gas))
- $\mathbf{Firm}_i$  and  $\mathbf{Year}_t$ : firm FE and year FE
- $\mathbf{Location}_j$ : first two-digit latitude longitude FE or basin FE
- $\mathbb{1}_{i,t,\tau}$  takes the value 1 if firm  $i$  is at time  $t$   $\tau$  semester(s) from the deal (control or DrillCo), 0 otherwise

# Main results



## Stylized fact 1a): Public listing

Based on 7 IPO between 2011 and 2019:

	<i>Dependent variable: Number of toxic chemicals</i>		
	(1)	(2)	(3)
Post IPO	0.140*	0.141*	0.275*
	(0.077)	(0.077)	(0.143)
Before IPO			0.210
			(0.211)
Controls		X	X
Firm FE	X	X	X
Location $\times$ Year FE	X	X	X

## Stylized fact 1b): Earnings forecasts

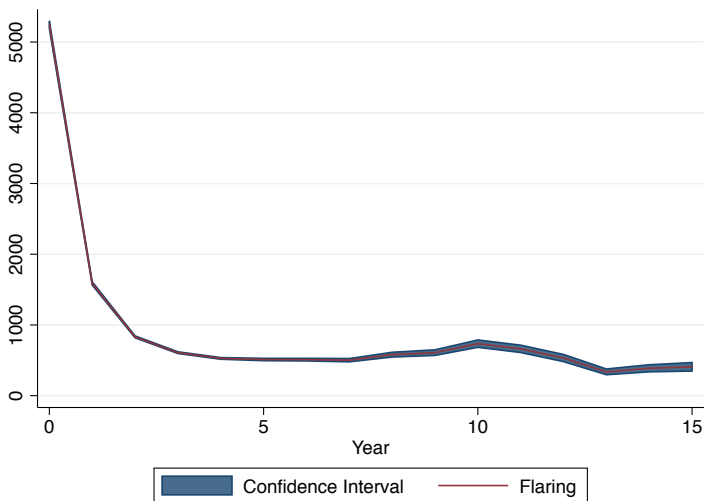
<i>Dependent variable: Number of toxic chemicals</i>		
	(1)	(2)
Under estimate	0.062*** (0.022)	0.062*** (0.022)
Over estimate	-0.011 (0.088)	-0.012 (0.088)
(mean) actual	-0.013 (0.012)	-0.013 (0.012)
Controls		X
Firm FE	X	X
Location $\times$ Year FE	X	X

## Stylized fact 2: cash flow of flaring

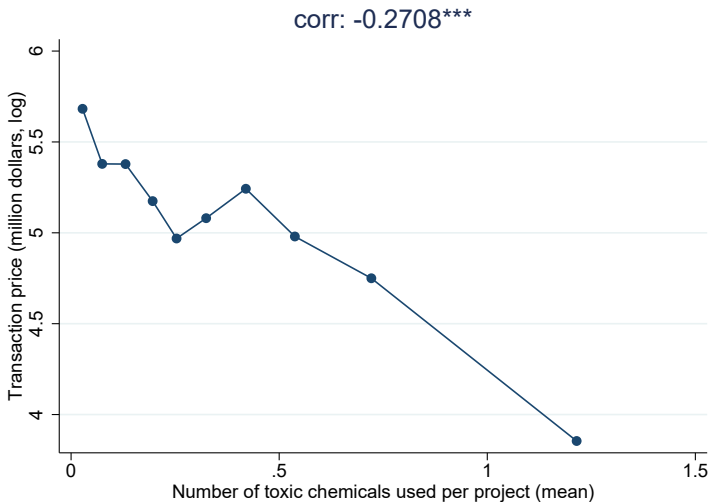
- Cost paid at the beginning of the project
  - ▶ Dehydrators and compressors needs to be installed close to the well.  
\$210,000 per well in the Bakken (INGAA)
  - ▶ Connect to a pipeline: \$29,000 to \$167,000 per mile for a diameter range between 2 and 22 inches(INGAA)

## Stylized fact 2: cash flow of flaring

- Gains are not immediate:



## Stylized fact: pollution discount in real asset markets



# Identification threats

- Focus on marginal locations
  - ▶  $C = \frac{\text{Number of projects in basin } j \text{ for firm } i}{\text{Total number of projects for firm } i}$
- Drop PE-backed firms that have too much wells in a region
  - ▶  $M = \frac{\text{Number of projects in basin } j \text{ for firm } i}{\text{Total number of projects in basin } j}$
- Is this lower pollution associated with a higher exposure to human activity?
  - ▶ No: (1) exposure is reduced and (2) does not affect the results
- Is this reduction driven by an increase in opacity and strategic exposure?
  - ▶ No: (1) the quality of reporting increases and (2) does not affect the results
- Other measure of pollution
  - ▶ Use a noisier measure: EPA's Integrated Risk Information System (IRIS)
- Other measures of geographical proximity
  - ▶ State-Level and 60 by 60 miles square