

# The importance of accounting for market power and the production process in environmental policy: evidence from U.S. oil refineries

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# Introduction and Motivation

- Policy makers are increasingly concerned with regulating emissions from transportation fuels
- Two key features of the transportation sector make it exceptionally difficult to regulate
  - Imperfect competition
    - When firms are imperfectly competitive, regulation can exacerbate market power (Seade, 1986)
  - Regulation in a multi-product setting
    - Incomplete regulation can lead to production reallocation that results in emissions leakage as well as inefficient production (Fowlie, 2009, Auffhammer and Kellogg, 2011, Brown et al., 2006)
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- I test whether these conditions occur in the oil refining industry as a result of the national U.S. Renewable Fuel Standard
- I implement a novel production function approach combined with very detailed data to estimate markups and marginal costs for all refineries in the U.S.
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- I find significant variation in markups across firms, products, and locations
- In 2013, a shock to renewable fuel credit prices (RIN's) *increased* markups for gasoline and ultra low-sulfur diesel
- In 2013, credit prices (RIN's) were excessively passed onto wholesale gasoline and diesel prices
- The policy had spillover effects to non-regulated fuels
  - Firms reallocated production to non-regulated fuels (aviation fuel), leading to potential emissions leakage
  - Non-regulated fuel prices, markups, and marginal costs were also affected
- I intend to evaluate the welfare effects of failing to account for market power and multi-product production process in policy making

# Findings

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- Confidential Production and Sales Data From Energy Information Administration (2004 - 2014)
  - Monthly Inputs
    - Crude quantities (refinery level)
    - Imported and Domestic Crude Prices (firm-PADD level)
    - Crude quality - API gravity and sulfur content
    - Distillation capacity (refinery level)
    - Labor inputs (state level)
  - Monthly Outputs
    - Quantities of all production outputs (used for production function estimation)
    - Shipments of all outputs by refinery (used in the markup estimation)
    - Sales prices of all products by state (firm level)
- Renewable Fuel Standard Credit Prices (RIN's)

# Methodology: Markup Definition (De Loecker and Goldberg et al. 2014)

$$\mu_j = \frac{P_j}{mc_j} = \theta_j^c \left( \frac{P_j Q_j}{(p^c q^c) \rho_j} \right)$$

- $\theta_j^c$  is the output elasticity with respect to crude oil input
- $\frac{P_j Q_j}{(p^c q^c)}$  is the revenue share of product  $j$  relative to input expenditure on product  $j$
- $\rho_j$  is share of sales of product  $j$

$$q_{ijt} = \alpha + \beta_k \mathbf{k}_{ijt} + \theta_j^c c_{ijt} + \beta_l l_{st} + g_t(\omega_{it}) + \varepsilon_{ijt}$$

- $q_{ijt} = \log(Q_{ijt})$  outputs
- $\mathbf{k}_{ijt} = \log(\rho_{ijt} \mathbf{K}_{it})$  vector of capacity measures multiplied by product share
- $c_{ijt} = \log(\rho_{ijt} C_{it})$  crude oil input multiplied by product share
- $l_{st}$  is a measure of labor usage
- $g_t(\omega_{it})$  is refinery specific unobserved productivity

## Key Challenge:

Addressing potential correlation between  $\omega_{it}$  and  $c_{ijt}$

## Solution

- Structural Approach - Olley and Pakes (1996), Levinsohn and Petrin (2003), Akerberg, Caves, and Frazer (2006)



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# Production Function Estimates

	Gasoline	Diesel	Aviation	Other
Crude Inputs	0.807** (0.401)	0.779*** (0.214)	0.771*** (0.112)	0.747*** (0.214)
Capital	0.113 (0.395)	0.188 (0.222)	0.148 (0.117)	0.189 (0.151)
Labor	0.065*** (0.008)	0.024*** (0.005)	0.018*** (0.005)	0.058*** (0.015)
PADD FE	Y	Y	Y	Y
Controls	Y	Y	Y	Y
N	19870	19968	10040	15349

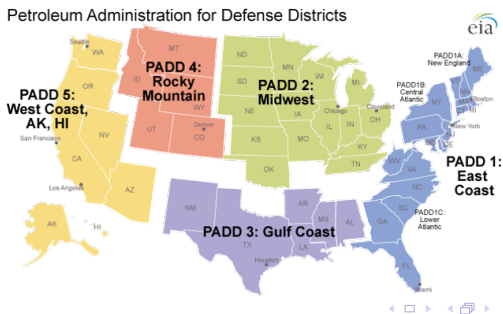
\*  $p < 0.1$ , \*\*  $p < 0.05$ , \*\*\*  $p < 0.01$

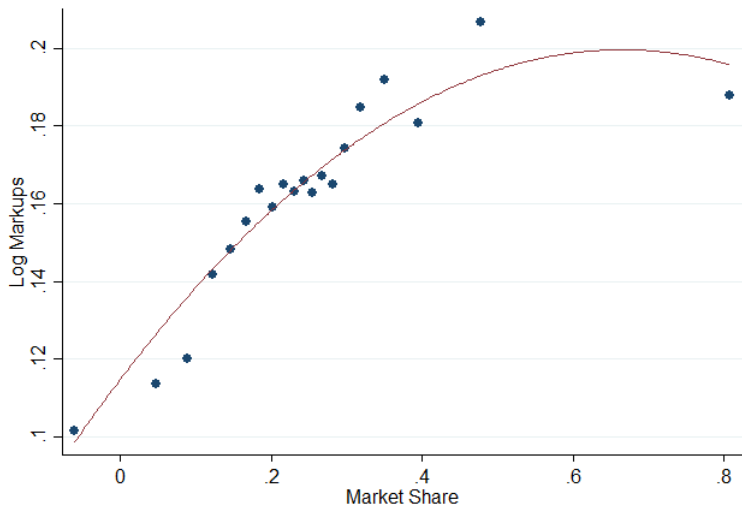
**Instruments:** lagged crude inputs, current capital and labor, lagged market share, interactions (lagged crude inputs x lagged market share)

**Controls:** API gravity and sulfur content, PADD dummies, market share

# Markup Summary Statistics by Region

PADD	Median	Mean	Min	Max	N
1	1.180	1.204	0	3.344	20063
2	1.141	1.186	0	58.702	53004
3	1.229	1.512	0	167.607	20702
4	1.192	1.207	0	6.250	10768
5	1.212	1.260	0	3.692	16008
Total	1.173	1.257	0	167.607	120545



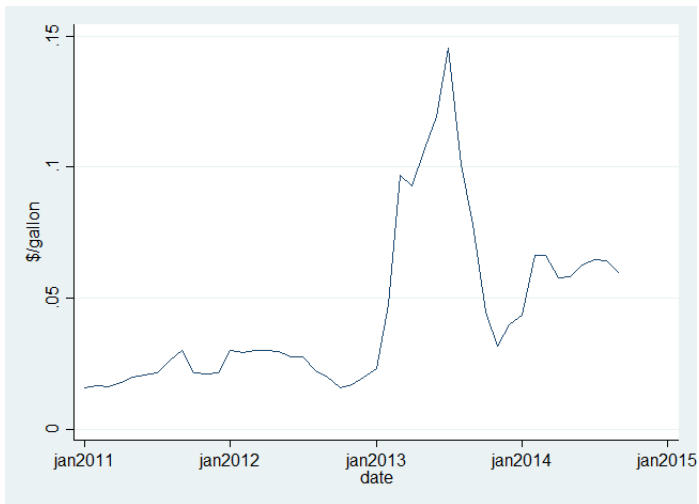


Inner 98th Percentile of Markups. Absorbing firm, fuel, time fixed effects.

- Policy Goals
  - Ensure gasoline and diesel are blended with renewable fuels
  - Reduce greenhouse gas emissions from transportation fuels
  - Reduce petroleum imports
- Takeaways for today's presentation
  - Conventional fuel (gasoline and diesel) is taxed (called the RIN obligation)
  - Renewable fuel is subsidized e.g., ethanol, biodiesel, advanced biodiesel

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# RIN Price or The Tax on Gasoline and Diesel Production





# Prices, Marginal Costs, Markups, Quantities and RFS Credit Prices (RIN)

$$\Delta P_{fjst} = \beta_0 + \beta_1 \Delta RIN_t + \beta_2 \Delta P_{fst}^{crude} + \beta_3 X_{fjst} + m_t + \varepsilon_{fjst}$$

- $\Delta P_{fjst}$  - firm  $f$ 's price of product  $j$  sold in state  $s$  at time  $t$
- $\Delta RIN_t$  - average RIN obligation in time period  $t$
- $\Delta P_{fst}^{crude}$  - price of crude for firm  $f$  in state  $s$
- $X_{fjst}$  includes the number of firms in a market
- $m_t$  - seasonal dummies

# Output Prices and RIN Credit Prices

	$\Delta$ Price 2013 All Fuels	$\Delta$ Price 2013 Gasoline	$\Delta$ Price 2013 Diesel	$\Delta$ Price 2013 Other
$\Delta$ RIN Price	0.855*** (0.103)	1.824*** (0.105)	-0.021 (0.101)	1.116*** (0.340)
$\Delta$ Crude Price	0.138*** (0.022)	0.152*** (0.033)	0.134*** (0.024)	0.093 (0.074)
Seasonal FE	Y	Y	Y	Y
Controls	Y	Y	Y	Y
R-squared	0.219	0.381	0.247	0.154
N	7532	2941	3083	1508

\*  $p < 0.1$ , \*\*  $p < 0.05$ , \*\*\*  $p < 0.01$

Standard errors clustered at the firm-product-state level

# Marginal Costs, Markups, and Credit (RIN) Prices

$$\ln \Pi_{fjst} = \gamma_0 + \gamma_1 \ln RIN_t + \gamma_2 \mathbf{X}_{fjt} + \lambda_{ft} + J_j + m_t + G_f + v_{fjst}$$

- $\ln \Pi_{fjst}$  - log of firm  $f$ 's *markup or marginal cost* for product  $j$  in state  $s$  at time  $t$
- $\ln RIN_t$  - log RIN obligation
- $\mathbf{X}_{fjt}$  - market share, productivity, the number of firms in a market, log crude prices
- $\lambda_{ft}$  - firm-year fixed effects
- $J_j$  - product fixed effects
- $m_t$  - seasonal fixed effects
- $G_f$  - PADD fixed effects

	Log MC Gas+Diesel >=2012	Log $\mu$ Gas+Diesel >=2012	Log $\mu$ Gas 2013	Log $\mu$ Reg Diesel 2013	Log $\mu$ ULSD 2013	Log $\mu$ Other >=2012
Log RIN price	0.056*** (0.003)	-0.016*** (0.003)	0.084*** (0.005)	-0.029* (0.017)	0.012** (0.005)	-0.012* (0.006)
Firm-Year FE	Y	Y	Y	Y	Y	Y
Fuel FE	Y	Y	Y	Y	Y	Y
PADD FE	Y	Y	Y	Y	Y	Y
Seasonal FE	Y	Y	Y	Y	Y	Y
Controls	Y	Y	Y	Y	Y	Y
R-squared	0.763	0.568	0.615	0.582	0.625	0.579
N	16904	16904	2971	497	2614	4123

\*  $p < 0.1$ , \*\*  $p < 0.05$ , \*\*\*  $p < 0.01$

Standard errors clustered at the firm-product-state level

$$PS_{rt}^j = \delta_0 + \delta_1 RIN_t + \lambda_{rt} + m_t + v_{rt}$$

- $PS_{rt}^j$  - product share for fuel  $j$  including
  - Regulated Fuels
    - Conventional gasoline
    - Reformulated gasoline
    - Regular diesel
    - Ultra low sulfur diesel
  - Unregulated Fuels
    - Aviation fuel
- $RIN_t$  - RIN prices
- $\lambda_{rt}$  - refinery-year fixed effects
- $m_t$  seasonal dummies

# Production Decisions and Credit Prices

	CONV	RFG	Diesel	ULSD	Aviation
RIN Prices	0.020 (0.059)	0.074 (0.106)	-0.082* (0.046)	0.011 (0.062)	0.026* (0.014)
Seasonal Dummy	-0.011*** (0.004)	0.005 (0.006)	-0.003 (0.002)	0.010*** (0.003)	0.001 (0.001)
Refinery-Year FE	Y	Y	Y	Y	Y
R-squared	0.932	0.942	0.955	0.921	0.790
N	3694	1415	3977	3709	283

\*  $p < 0.1$ , \*\*  $p < 0.05$ , \*\*\*  $p < 0.01$

Standard errors clustered at the refinery-product level

- 1 Jointly estimate firm-product level markups and marginal costs for petroleum products
- 2 I find that the Renewable Fuel Standard
  - 1 *Increased* markups for gasoline and ultra low-sulfur diesel in 2013
  - 2 Caused firms to reallocate production to non-regulated fuels
- 3 Next Step: to develop welfare estimates of the results.

Thank You  
Comments?