

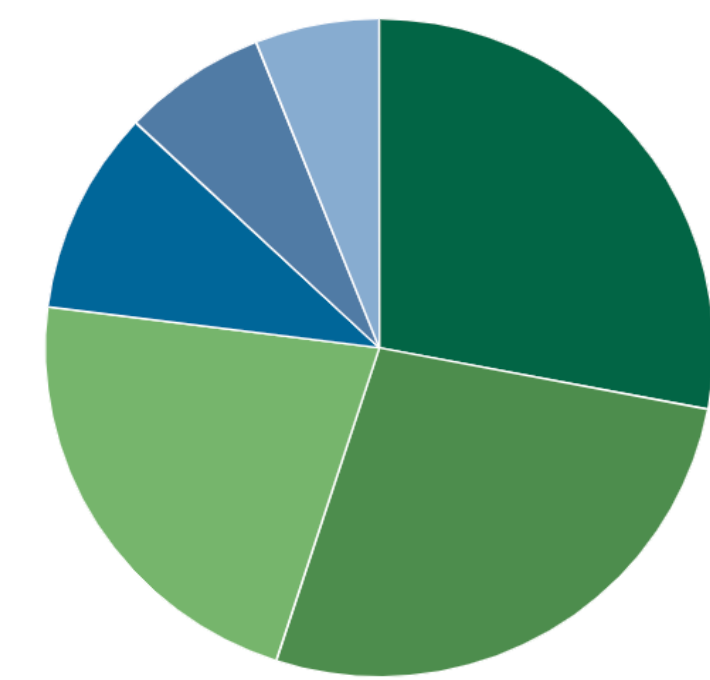
The Effects of Heavy-Duty Vehicle Fuel Economy Standards

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Motivation

- The transportation sector is the largest contributor to US greenhouse gas emissions (28% as of 2018)
- Trucks are < 10% of vehicles on the road, 20% of transport CO₂ emissions
- Fuel efficiency regulations were only **imposed recently** (announced in 2011, implemented in 2014), virtually **no ex post research exists** on truck policies

2018 U.S. GHG Emissions by Sector



2018 U.S. Transportation Sector GHG Emissions by Source

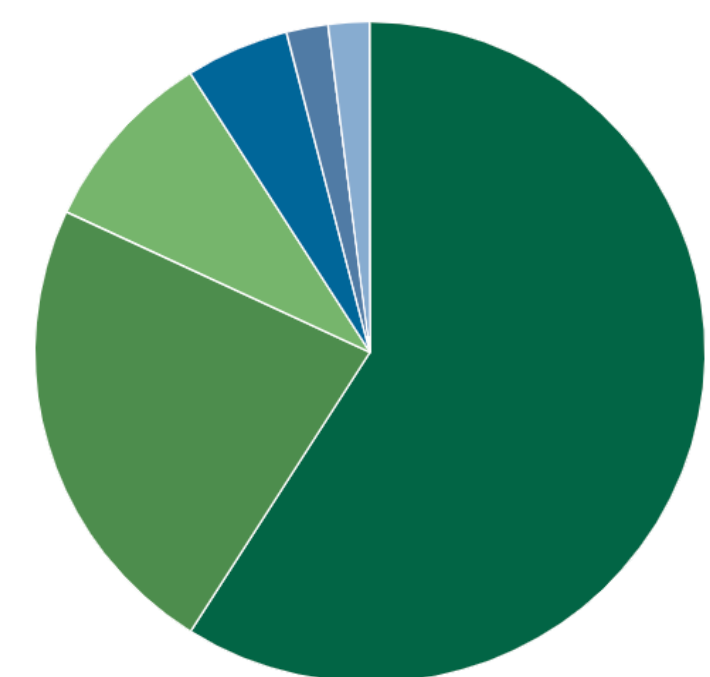


Figure 1. 2018 GHG emissions by sector, transport emissions by source. Source: EPA

Research Questions

- What is the effect of recent truck fuel economy standards on consumer welfare, manufacturer profits, fleet attributes and safety, environmental damages?
- Are there heterogeneous consequences for different buyers or manufacturers?

Empirical Setting

Truck Characteristics

- Vehicles characterized by gross vehicle weight rating
- Heavy duty trucks (class 7 and 8) can be combination tractors or vocational vehicles
- Buyers also care about: presence of sleeper cab, roof height, axle configuration, fuel intensity...

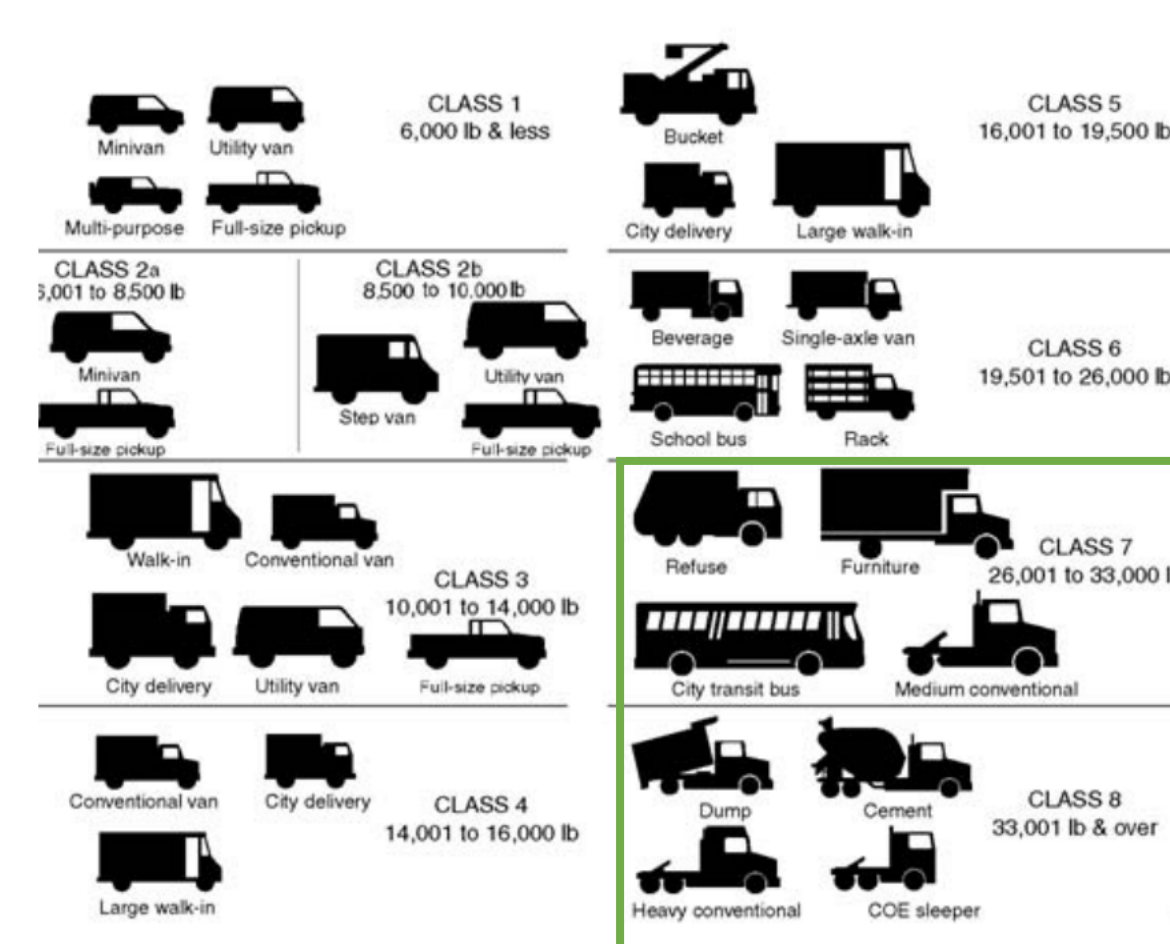


Figure 2. Examples of trucks by class
Source: Commercial Carrier Journal

Market

- Truck manufacturers: 8 firms, producing 11 brands in the data
- Truck buyers: use trucks for widely varying commercial purposes (especially freight)

Policy: Heavy-Duty National Program Phase I (2014-2018)

	EPA Emissions Standards (g CO ₂ /ton-mile)			NHTSA Fuel Consumption Standards (gal/1,000 ton-mile)		
	Low Roof	Mid Roof	High Roof	Low Roof	Mid Roof	High Roof
Day Cab Class 7	104	115	120	10.2	11.3	11.8
Day Cab Class 8	80	86	89	7.8	8.4	8.7
Sleeper Cab Class 8	66	73	72	6.5	7.2	7.1

Figure 3. Standards by category for 2017.

Data

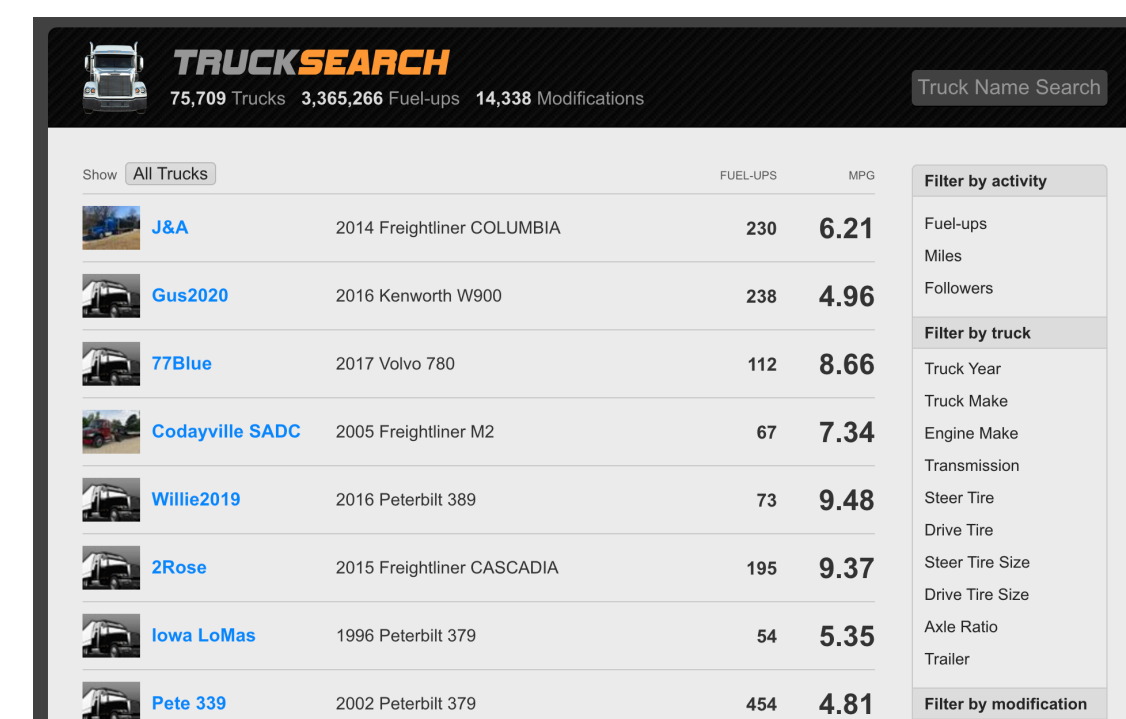
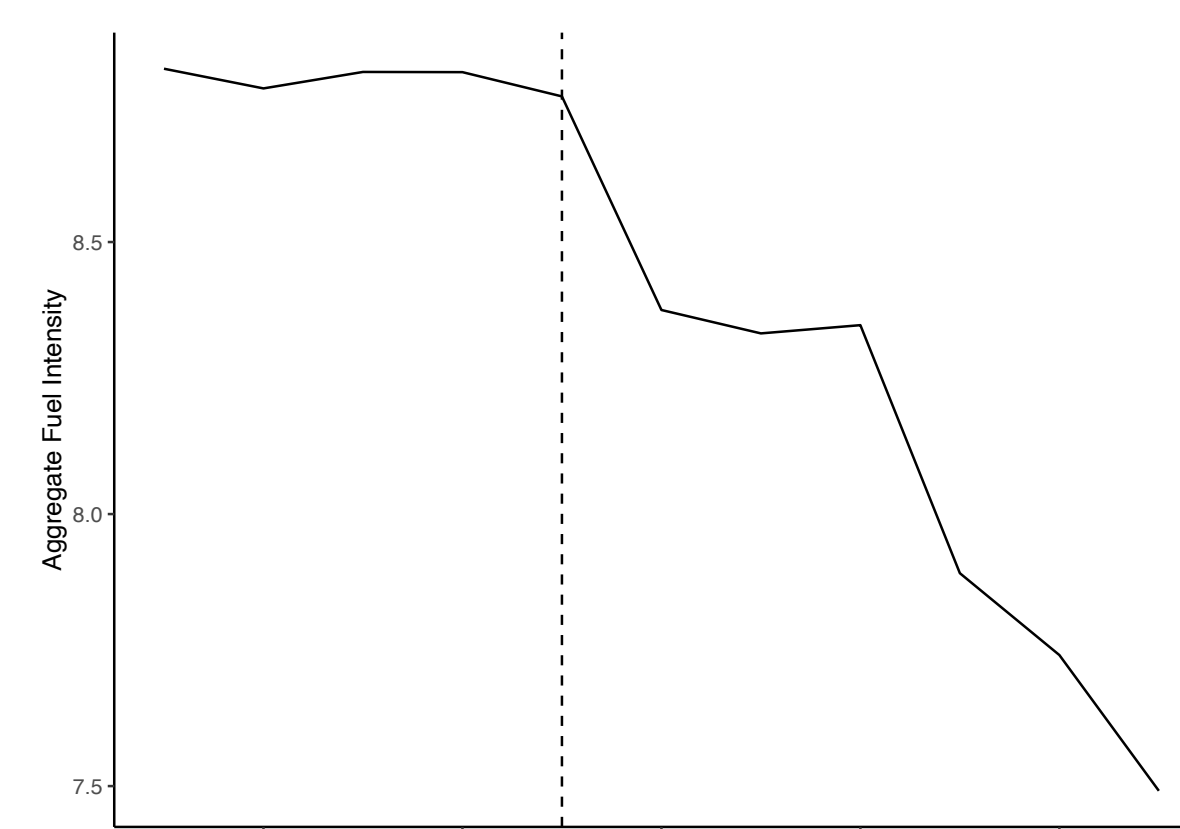


Figure 4. Fuel efficiency data source.



- Annual sales data by model, 2009-2019
- Truck model attributes
- Fuel efficiency from fuel tracking website
- State-level manufacturing wages from BLS, plant assembly location from VINs
- Industry-level employment from County Business Patterns

Figure 5 (left). Aggregate fuel intensity of non-vocational trucks sold, 2009-2019.

Model/Estimation

Demand Model
2009-2019
data

Buyer i chooses truck j to maximize utility $U_{i,j} = x_j(\beta_x + \sum_{ind} 1(i \text{ in } ind) \beta_x^{ind} + \beta_x^u) + p_j \beta_p + \xi_j + \varepsilon_{i,j}$

- x_j : truck attributes
- p_j : truck price
- $1(i \text{ in } ind)$: indicator that buyer i is in industry ind
- ξ_j : unobs. truck attributes

Firm f chooses prices to maximize profits and comply with policy

$$\max_p \sum_{j \in J_f} [(p_j - mc_j) q_j(p) + \sum_r \lambda_r q_j(p) L_{j,r}]$$

- mc_j : marginal cost
- q_j : quantity
- λ_r : shadow cost of policy on regulatory group r
- $L_{j,r}$: truck j 's distance from group r standard

→ Derive marginal cost function using FOCs $mc_{j,t} = \alpha + \gamma X_{j,t} + \omega_{j,t} + g_{f,r,t}(e_j)$

- $\omega_{j,t}$: time-truck specific error term
- $g_{f,r,t}(e_j)$: firm-group-specific shadow cost that depends on vehicle fuel intensity, policy timing

Counterfactual Simulations

Re-solve for market equilibrium in the absence of policy

Results

Supply and demand estimates:

	logit	random coeffs
Mean parameters		
Prices	-0.02 (0.004)	-0.015 (0.004)
GVW	0.888 (0.457)	0.568 (0.45)
Class 7 day cab	2.729 (0.54)	3.258 (0.531)
Class 8 day cab	1.385 (0.444)	1.744 (0.435)
Sleeper cab	2.131 (0.631)	2.492 (0.619)
4x2 axle config.	0.265 (0.099)	0.304 (0.099)
6x4 axle config.	2.403 (0.142)	2.475 (0.14)
Medium conventional cab	-0.217 (0.12)	-0.133 (0.118)
Non-conventional cab	0.139 (0.166)	0.278 (0.163)
Fuel Intensity (FI)	0.114 (0.040)	0.166 (0.045)
Day x FI	-0.102 (0.056)	-0.261 (0.055)
Sleeper x FI	-0.189 (0.084)	-0.302 (0.082)
Constant	-5.786 (0.943)	-4.272 (0.92)
Buyer attribute interactions		
Vocational x Construction	-	0.531 (0.011)
Vocational x General Freight	-	-2.176 (0.092)
Vocational x Sanitation	-	0.493 (0.013)
Vocational x Specialized Hauling	-	-0.106 (0.019)

Table 1. Demand model estimated with and without industry preferences.

	(1)	(2)	(3)	(4)	(5)
Post-standard	13.04 (8.19)	40.92 (8.2)	4.03 (8.32)	26.31 (14.57)	-16.61 (12.84)
Post-standard x fuel intensity	-0.7 (0.77)	0.83 (0.73)	0.85 (0.72)	2.23 (1.51)	2.97 (1.32)
Post-standard x sleeper	-30.09 (13.86)	-51.05 (12.25)	-48.16 (12.07)	-41.4 (12.09)	-38.33 (11.95)
Post-standard x sleeper x fuel intensity	3.81 (1.49)	5.45 (1.31)	5.11 (1.3)	4.37 (1.3)	4.02 (1.28)
PACCAR x Post-standard	-52.28 (3.21)	-5.74 (5.35)	-26.17 (17.59)	25.56 (16.64)	
Navistar x Post-standard	-22.42 (8.8)	10.82 (6.94)	0.2 (18.61)	39.73 (17.61)	
Daimler x Post-standard	-58.77 (3.25)	-7.21 (5.79)	-76.43 (16.24)	-15.97 (15.16)	
PACCAR x fuel intensity x Post-standard	-2.57 (1.85)	-3.23 (1.7)			
Navistar x fuel intensity x Post-standard	-2.43 (2.03)	-3.08 (1.88)			
Daimler x fuel intensity x Post-standard	2.06 (1.73)	0.98 (1.55)			
Average Policy Cost					
PACCAR Day Cab	4.98	-1.82	8.01	-3.67	5.97
PACCAR Sleeper	10.56	-6.50	3.16	-5.30	4.11
Navistar Day Cab	6.69	26.12	22.61	24.69	22.13
Navistar Sleeper	8.83	19.86	16.40	19.92	17.45
Daimler Day Cab	6.45	-10.06	4.76	-9.88	4.41
Daimler Sleeper	8.06	-18.04	-3.10	-21.35	-6.38
Volvo Day Cab	6.31	48.88	12.14	47.68	11.79
Volvo Sleeper	8.98	42.57	5.86	40.32	3.70
Firm FE	✓	✓	✓	✓	✓
Firm x fuel intensity	✓	✓	✓	✓	✓
Firm x time	✓	✓	✓	✓	✓

Table 2. Estimates of the policy-induced components of marginal cost for non-vocational vehicles.

Counterfactual results:

- Under policy, **consumers worse off** and **manufacturer profits increase**
- Compensating variation: \$27 -\$47M
- Increased profit: \$4-\$6B

	% Change Profit
PACCAR	+4 to 10%
International	+1 to 7%
Daimler	+3 to 13%
Volvo	-8 to +4%

Table 3. Change in profits by manufacturer of non-vocational vehicles.

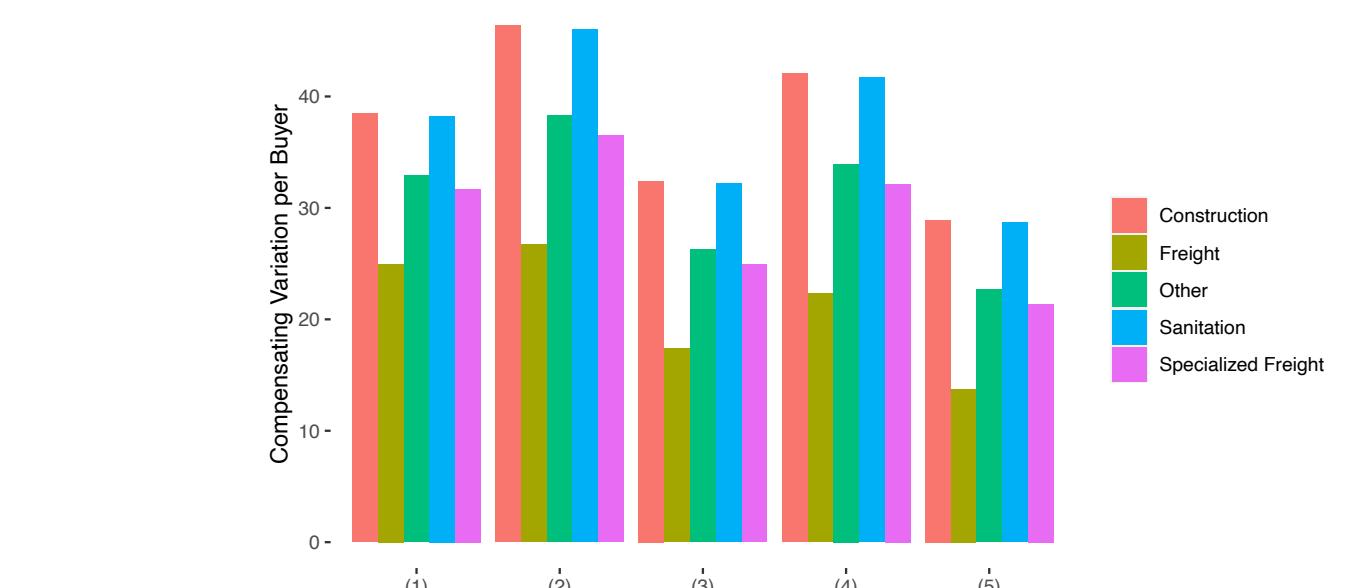


Figure 6. Compensating variation by industry across model specifications.

- Characteristics of vehicles sold change:
 - Fuel intensity improved by .5-1.5%
 - GVW of day and sleeper cabs increased .3-2%
 - Sales-weighted average prices fell, but average price increased up to 7%

Findings and Next Steps

- Truck fuel economy standards benefited many manufacturers
- Consumers, esp. sanitation and construction buyers, were made worse off because it was harder for these buyers to switch to alternative vehicles
- Policy had indirect effects on safety, road damage via GVW
- Future work:
 - Additional counterfactual simulations of alternative policy specifications (uniform policy, mpg-based policy)
 - Environmental damages