

# How Does Shared Mobility Affect Personal Vehicle Ownership, Use, and Emissions?

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## Introduction: Transportation in transition

### Potential paradigm change:

- Transportation sector emits most CO<sub>2</sub> in the U.S.
- New shared mobility services (e.g., Uber and Lyft) have already changed how many urban travelers move.

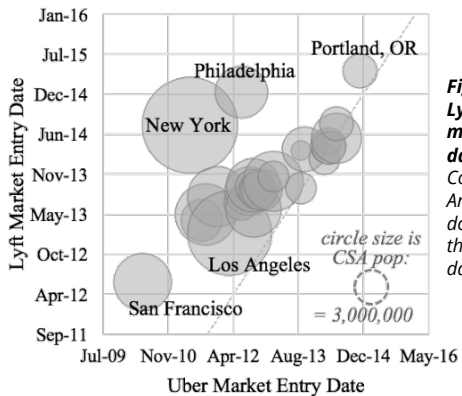
**Energy and emissions implications:** U.S. DOE national laboratories estimate **60% lower or 200% higher** (for shared autonomous vehicles)

**Limited research to-date suggests vehicle ownership declines given access to automated or shared mobility options:**

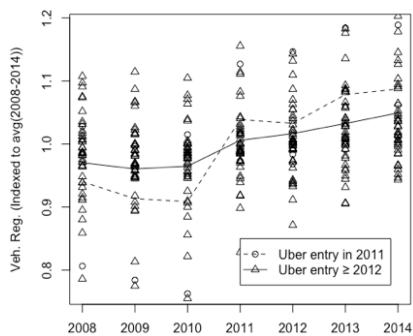
	Vehicle Ownership	Vehicle Usage
Simulated shared, autonomous vehicles [1]	1-11 vehicles replaced per SAV	6-16% decline
Survey of Car2Go users [2]	9 vehicles replaced per Car2Go vehicle	8% increase

This research applies an econometric approach to analyzing next-generation mobility.

## Background: Shared mobility market entry timing



**Figure 1. Uber and Lyft comparative market launch dates differ by Combined Statistical Area (CSA). The dotted line reflects the coincidence of dates on both axes.**



**Figure 2. Comparison of vehicle registrations (indexed to 2008) in 48 states\* and DC, grouped by "early" Uber entry (in 2011) and "late" Uber entry (≥ 2012).**

\*DOT's State Statistical Abstracts do not include NY, and CA is excluded here because Uber "enters" prominently twice there (San Francisco in 2010 and Los Angeles and San Diego in 2012)

## Approach: Econometric modeling

**A difference-in-difference model with fixed effects examines vehicle ownership using state-level data from 2008-2014:**

- Uber and Lyft market launch data
- Annual light-duty vehicle registrations and state populations (DOT's Office of Highway Policy Information's State Statistical Abstracts),
- Real personal income data (Bureau of Economic Analysis), and
- Average gas price by state (Energy Information Administration)

$$y_{st} = \beta x_{st} + \gamma v_s + \delta w_t + \epsilon_{st}$$

change in vehicle ownership (from year 2008), in state  $s$  and year  $t$  (after 2008);

state-time covariates, including controls for population, gas price, real personal income, and an indicator variable (or set of indicator variables) indicating access to shared mobility

vectors of unobserved state fixed effects,  $v_s$  and unobserved annual time fixed effects,  $w_t$

unexplained error

Four structural approaches are used:

- (I) baseline
- (II) baseline + discrete annual indicators ("SmdiscX" for an Uber presence of "X" years in Table 1)
- (III) baseline + linear indicator ("SMlinear", years since Uber entry)
- (IV) baseline + lagged binary indicator ("SMbinary", >2 years of Uber or not)

## Illustrative Regression Results

**Table 1. Regression results with change vehicle ownership since 2008 as dependent variable.**

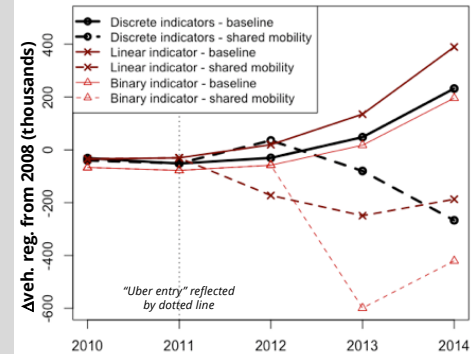
	(I)	(II)	(III)	(IV)
(Intercept)	-8.394e7+ (4.460e7)	-10.239e8* (4.457e7)	-9.143e7* (4.41276)	-10.083e8* (4.421e7)
log(Population)	8.130e6* (9.110e-1)	8.911e6** (3.359e7)	8.553e6* (3.346e6)	8.887e6** (3.340e6)
GasPrice	-2.776e5** (9.143e4)	-2.667e5** (8.633e4)	-2.606e5** (8.642e4)	-2.644e5** (8.603e4)
log(Income)	-1.829e6 (1.730e6)	-1.517e6 (1.714e-3)	-1.806e6 (1.709e6)	-1.584e6 (1.705e6)
SMdisc1	—	5.169e4 (1.342e5)	—	—
SMdisc2	—	-1.310e5 (1.790e5)	—	—
SMdisc3	—	-4.833e5* (2.281e5)	—	—
SMdisc3+	—	-8.078e5* (3.204e5)	—	—
SMlinear	—	—	-1.921e5** (6.579e4)	—
SMbinary	—	—	—	-6.165e5** (1.894e5)

Note: \*\*\*\*p<0.001, \*\*\*p<0.01, \*\*p<0.05, +p<0.10; n=300

Shared mobility indicators: (II) discrete annual, (III) linear, and (IV) binary

## Discussion: Shared mobility implications for vehicle numbers

**Shared mobility indicators are statistically significant and negative in specifications (II), (III), and (IV).** The implications are depicted in Figure 3 for a synthetic "average" state, where shared mobility is associated with a reduction in vehicle registrations of ~100,000-500,000, or 2-10% of the state vehicle population.



**Figure 3 shows a synthetic "average" state of just over 6 million residents, where roughly 5 million vehicles are registered and 15,000 net additional vehicles are registered each year.**

The implied change in net vehicle registrations is a large one. For context, **consider illustrative reductions in Pennsylvania vehicle registrations:**

- ~2-10% statewide
- ~3-15% in Philadelphia and Pittsburgh metro areas, or
- ~13-60% in the cities themselves.

## Summary and Conclusions

- The growth of shared mobility services and the rapid advance of vehicle automation technology make increasingly important an improved understanding of effects on private vehicle ownership, use, and emissions.
- **State-level models suggest access to shared mobility corresponds to reductions in additional vehicle registrations.**
- **Future research will refine these preliminary specifications using individual vehicle data, which are more suited for identifying localized effects.**

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## References

- [1] Fagnant, D., K. Kockelman, and P. Bansal (2015). "Operations of a Shared Autonomous Fleet for the Austin, Texas Market." *Transportation Research Board*.
- [2] Martin, E. and S. Shaheen (2016). "The Impacts of Car2go on Vehicle Ownership, Modal Shift, Vehicle Miles Traveled, and Greenhouse Gas Emissions: An Analysis of Five North American Cities". UC-Berkeley Working Paper.