

NHTS Workshop, Washington, DC, June 6~7, 2011

## **Developing Vehicle Ownership and Use Models from the 2001 and 2009 NHTS Data for Environmental Policy Analysis**

**Lei Zhang** (Assistant Professor, 301-405-2881, lei@umd.edu),  
**Yijing Lu, Xiang He, Jasmy Methipara, Xiaojie Cong, Nick  
Ferrari, and Cory Krause** (Graduate Research Assistants)

Transportation Systems Research Lab  
Department of Civil and Environmental Engineering  
University of Maryland – College Park

# Background

## Travel Survey

- ✍ Primary data source in the U.S. for travel behavior analysis and travel demand modeling at all levels

## National Household Travel Survey

- ✍ Socio-economic, demographic, location, vehicle ownership, and travel information at the household level
- ✍ The most comprehensive dataset for travel analysis and monitoring at the national level in the U.S.

## Travel Survey Trend

- ✍ Cross-sectional → (Rotating) Panel
- ✍ Mail/Telephone-based methods → GPS-based methods
- ✍ Decisions → Decision-making processes

# NHTS Data Processing and Integration

## Integration with EPA Nonattainment Data

- ✍ Identifying whether or not an NHTS household resides in a nonattainment area for each criteria pollutant over time.

## Integration with Energy/Environmental Data

- ✍ Fuel price at the state and county levels;
- ✍ Vehicle characteristics such as price, fuel type, pollution emission rates, etc..

## Integration with Land Use Data

- ✍ Merging NHTS household travel behavior information with trip origin, trip destination, and metropolitan land use characteristics information.

# Research Questions

Develop statistical models based on the NHTS data to answer the following environmental and energy policy questions:

- ✍ What is the impact of **air quality control and EPA nonattainment designation** on travel behavior and VMT?
- ✍ What is the impact of **green transportation financing policies** (e.g. green VMT fees, marginal-cost pricing) on Vehicle ownership, VMT, revenue, and equity?
- ✍ What is the impact of **land use policies** (e.g. high density, mixed development, neighborhood design) on travel behavior and VMT?
- ✍ How do **high gas prices** influence travel behavior, and subsequently soak time distributions?

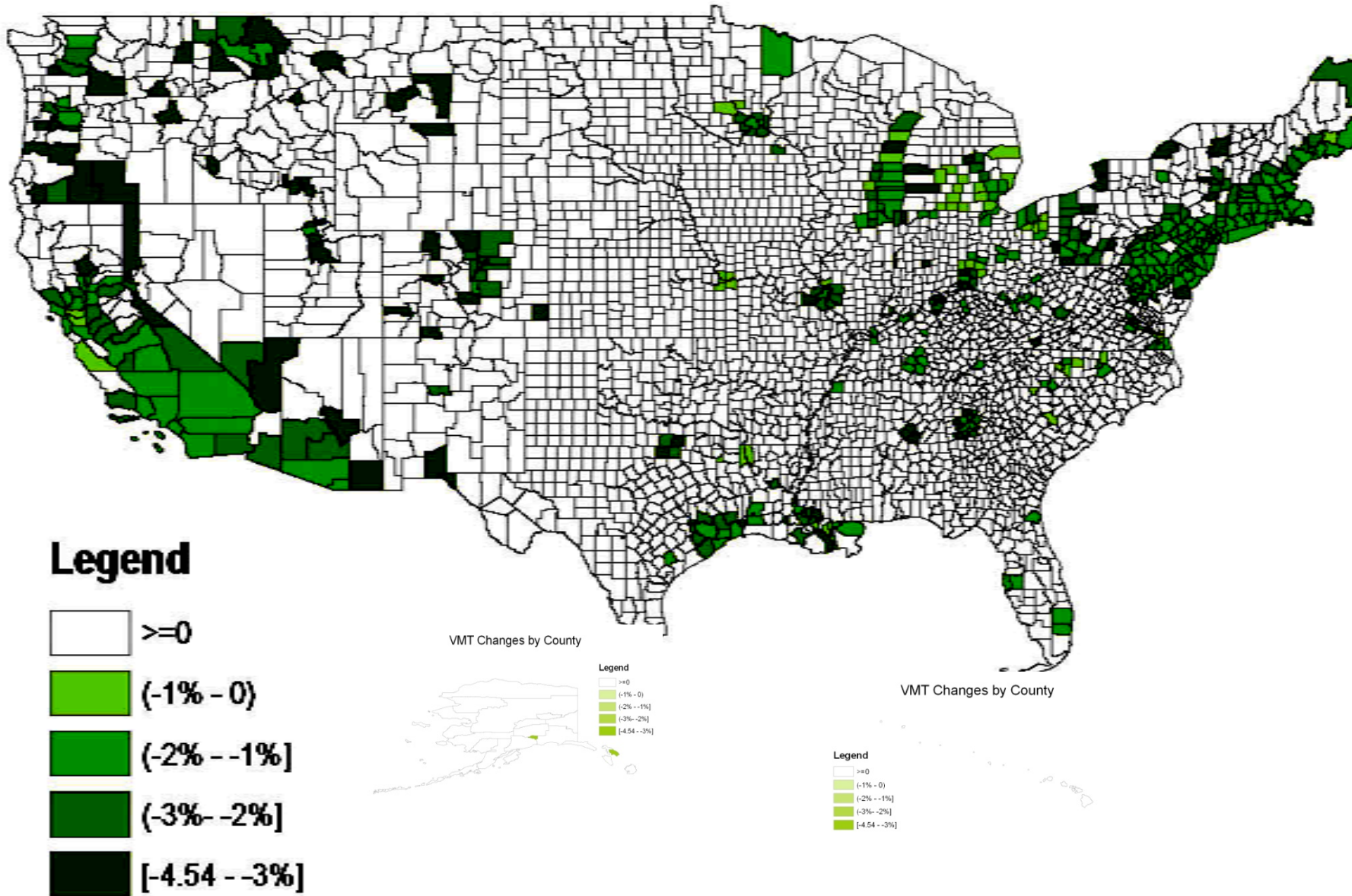
# **Environmental and Energy Policy Analysis #1**

**What is the impact of air quality control and EPA nonattainment designation on travel behavior and VMT?**

# Household-Level Model Results

Dependent Var.: In (VMT)	Model 1	Model 2
<b>Nonattainment Status: Own County</b>	<b>-0.0165*</b> <b>(0.060)</b>	<b>-0.0465**</b> <b>(0.012)</b>
<b>Nonattainment Status: Adjacent County</b>		<b>0.0349*</b> <b>(0.066)</b>
<b>Large urban area</b>	<b>0.0206*</b> <b>(0.079)</b>	<b>0.0199*</b> <b>(0.089)</b>
<b>Small urban area</b>	<b>-0.0313**</b> <b>(0.004)</b>	<b>-0.0296**</b> <b>(0.007)</b>
<b>Distance to Urban Center</b>	<b>-0.0002**</b> <b>(0.048)</b>	<b>-0.0002**</b> <b>(0.043)</b>
<b>In(Population density)</b>	<b>-0.0612**</b> <b>(0.000)</b>	<b>-0.0613**</b> <b>(0.000)</b>
<b>Number of transit trips taken</b>	<b>-0.1620**</b> <b>(0.000)</b>	<b>-0.1635**</b> <b>(0.000)</b>
<b>Adjusted R-Square</b>	<b>0.7113</b>	<b>0.7116</b>
<b>Household socio-economic and demographic variables not shown.</b>		

# Impact of Air Quality Control on VMT



# Findings from Household-Level Analysis

## Average Impact of Nonattainment Designation

- ✍ 1.64% reduction in vehicle miles traveled
- ✍ 1.76% reduction in VMT based on HPMS 1968~2008

## Spatial Variation of the Impact

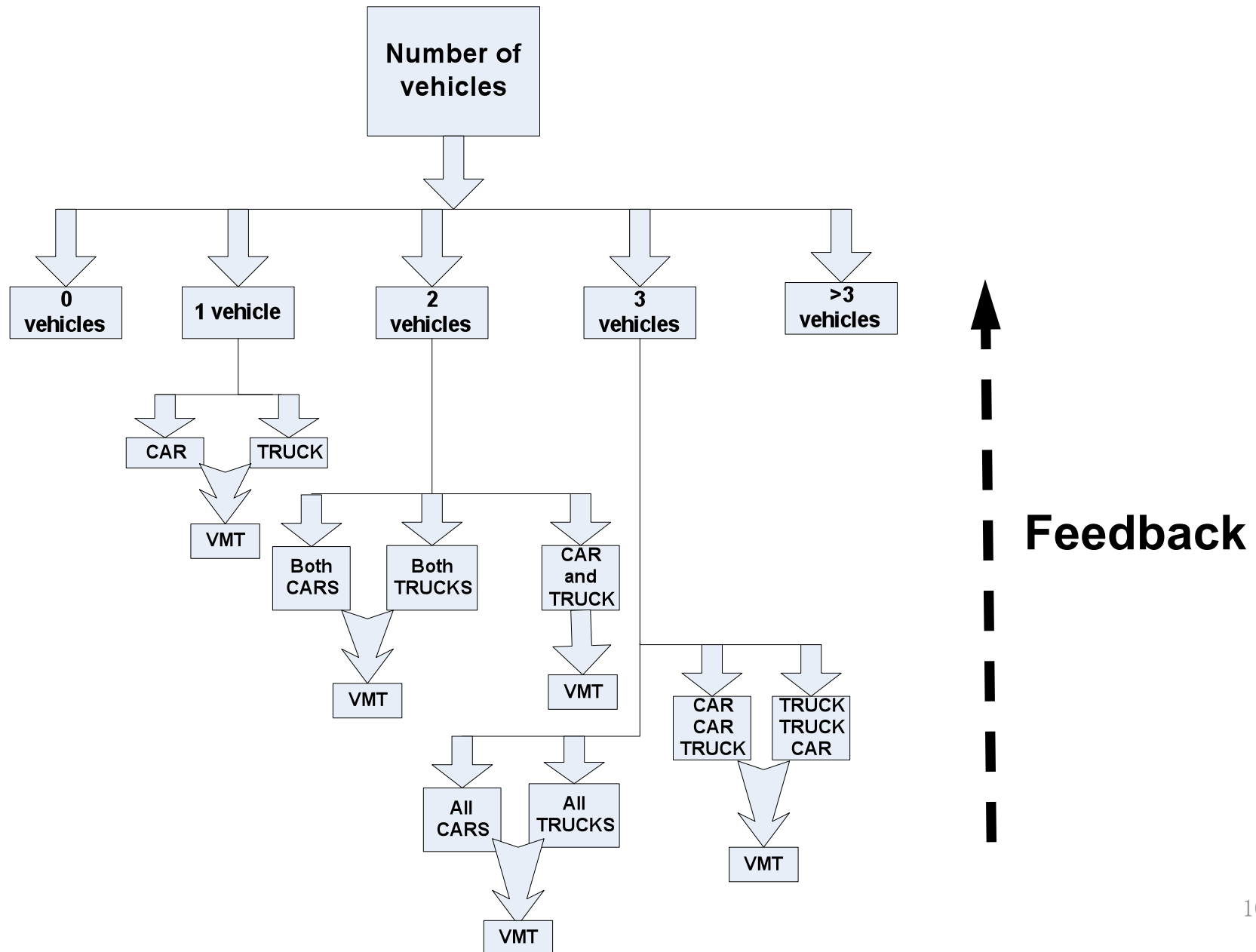
- ✍ 4.54% VMT reduction in counties that only have *attainment* surrounding counties
- ✍ 1.15% VMT reduction in counties that only have *nonattainment* surrounding counties



## **Environmental and Energy Policy Analysis #2**

**What is the impact of green transportation financing policies (e.g. green VMT fees, congestion pricing, emission taxes) on vehicle ownership, VMT, revenue, and equity at the national and state levels?**

# Discrete-Continuous Mixed Logit Model



# Vehicle Number Choice

	One Vehicle	Two Vehicle	Three Vehicle	Four Vehicle
Variable	Coefficient	Coefficient	Coefficient	Coefficient
Constant	-3.040**	-8.990**	-14.300**	-18.800**
Driver Count	2.860**	5.560**	7.300**	8.240**
Resp_Age16~34	-0.215**	0.488**	0.717**	1.110**
Resp_Age35~64	0.021	0.627**	1.140**	1.570**
Children Count/Household Size	0.052	0.504**	-0.137	-0.944**
<b>Driving Cost/Mile</b>	<b>0.260*</b>	<b>0.048</b>	<b>-0.307</b>	<b>-0.545*</b>
<b>Income (100,000\$)</b>	<b>2.120**</b>	<b>3.740**</b>	<b>4.360**</b>	<b>4.680**</b>
MSA>1 million with Rail	0.063	-0.155	-0.434**	-0.670**
MSA>1 million without Rail	0.321**	0.169**	-0.194**	-0.522**
MSA<1 million	0.206**	0.089	-0.213**	-0.576**
Resp_American of Afrian	-0.971**	-1.300**	-1.160**	-1.450**
Resp_Asian	0.017	-0.210	-0.168	-1.000**
Resp_Other Race	-0.526**	-0.603**	-0.508**	-0.541**
Male Respondent	-0.287**	0.155**	0.184**	0.320**
Own House	1.260**	2.430**	2.990**	3.580**
<b>Residential Density</b>	<b>-0.104**</b>	<b>-0.193**</b>	<b>-0.257**</b>	<b>-0.329**</b>

# Vehicle Type Choice

	Small Car	Large Car	Small SUV	Large SUV	Small Truck	Large Truck	Minivan
Variables	Coefficient	Coefficient	Coefficient	Coefficient	Coefficient	Coefficient	Coefficient
<b>Driving Cost/Mile</b>	<b>-0.46100**</b>						
<b>Vehicle Price</b>	<b>-0.00015**</b>						
<b>Price*Income</b>	<b>0.00032**</b>						
Interior Room	0.00991**						
Horse Power	0.00952**						
-Towing	0.000	0.000	0.00011	0.00071**	0.0001	0.00014**	0.00038
<b>Income (100,000\$)</b>	<b>0.259*</b>	<b>-1.730**</b>	<b>0.908**</b>	<b>-2.420**</b>	<b>0.347</b>	<b>-2.110**</b>	<b>0.0000</b>
Household Size	-0.948**	-0.559**	-0.655**	0.151**	-0.697**	0.022	0.0000
MSA>1 million with Rail	2.270**	0.176	1.030**	-1.550**	-0.701**	-3.080**	0.0000
MSA>1 million without Rail	0.947**	0.124	0.310**	-0.672**	-0.699**	-1.290**	0.0000
MSA<1 million	0.577**	0.105	0.191	-0.627**	-0.520**	-1.220**	0.0000
Constant	1.060	1.770	0.416	4.490*	1.240	1.440	0.0000

# Vehicle Miles Traveled

<b>Dependent Var.: ln (VMT)</b>	<b>Coefficients</b>	<b>P-Value</b>
<b>ln(driving cost/mile)</b>	<b>-2.6628</b>	<b>0.000</b>
<b>ln(income)</b>	<b>-0.1526</b>	<b>0.042</b>
<b>ln(driving cost/mile)* ln(income)</b>	<b>0.1777</b>	<b>0.000</b>
<b>ln(driving cost/mile)* (vehicle substitute)</b>	<b>0.0102</b>	<b>0.002</b>
<b>ln(vehicle count)</b>	<b>0.8089</b>	<b>0.000</b>
<b>Vehicle Substitute</b>	<b>-0.0307</b>	<b>0.000</b>
<b>Household socio-demographic variables not shown.</b>		

# Effectiveness for Revenue Generation

## Gas Tax

Increase federal tax by 10 cents/gallon to **28.4 cents/gallon**

## Vehicle Miles Traveled Tax (VMT)

To achieve the same level of revenue increase, the fixed VMT charge needs to be **1.5 cents/mile**

## Green VMT

Charge vehicles with > 20 mpg fuel efficiency **1 cent/mile**

Charge vehicle with < 20 mpg fuel efficiency **2.1 cents/mile**

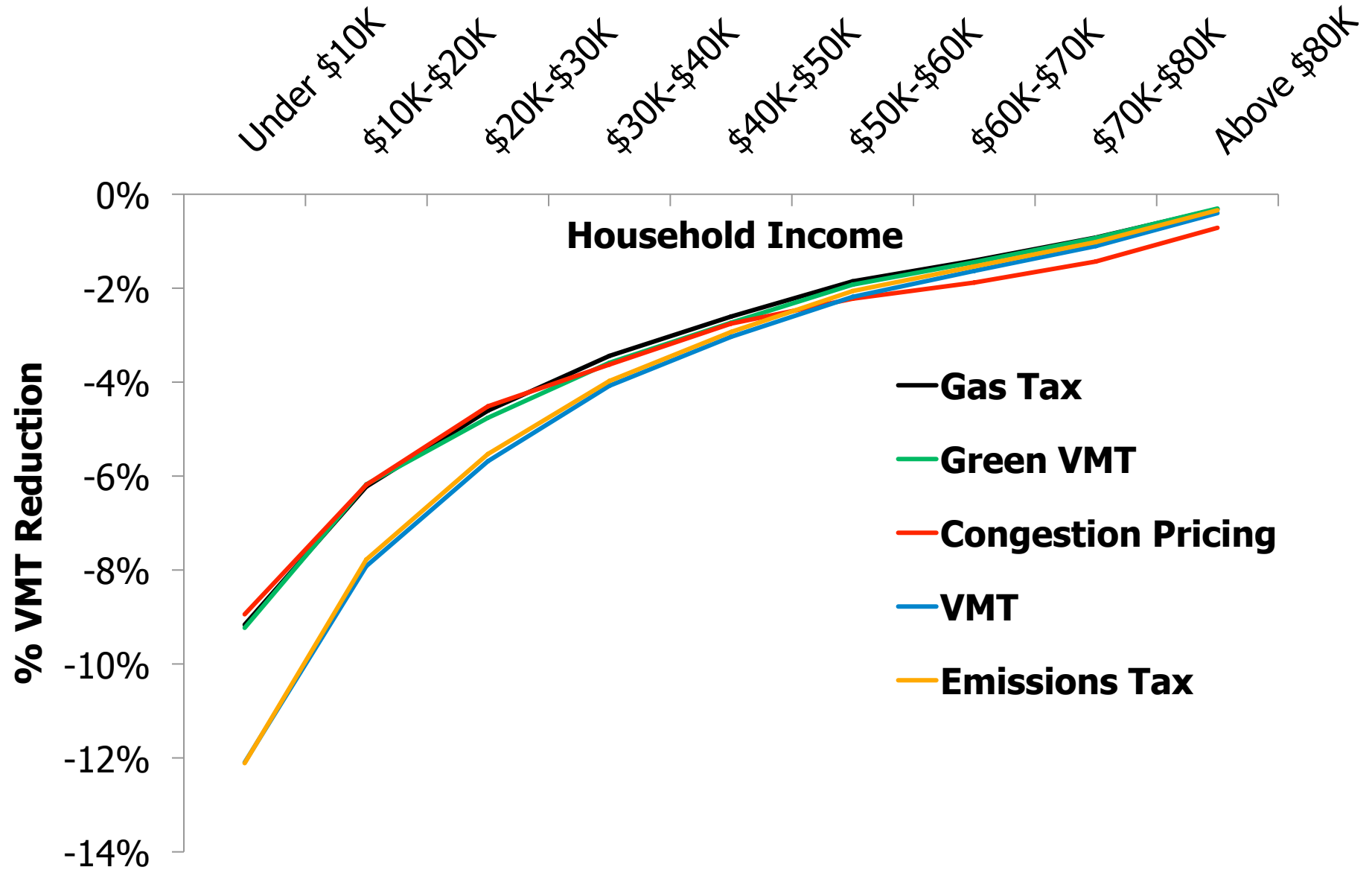
## Congestion Pricing

Charge road users a per-mile fee that ranges from **1 to 3.4 cents/mile** based on level of MSA congestion

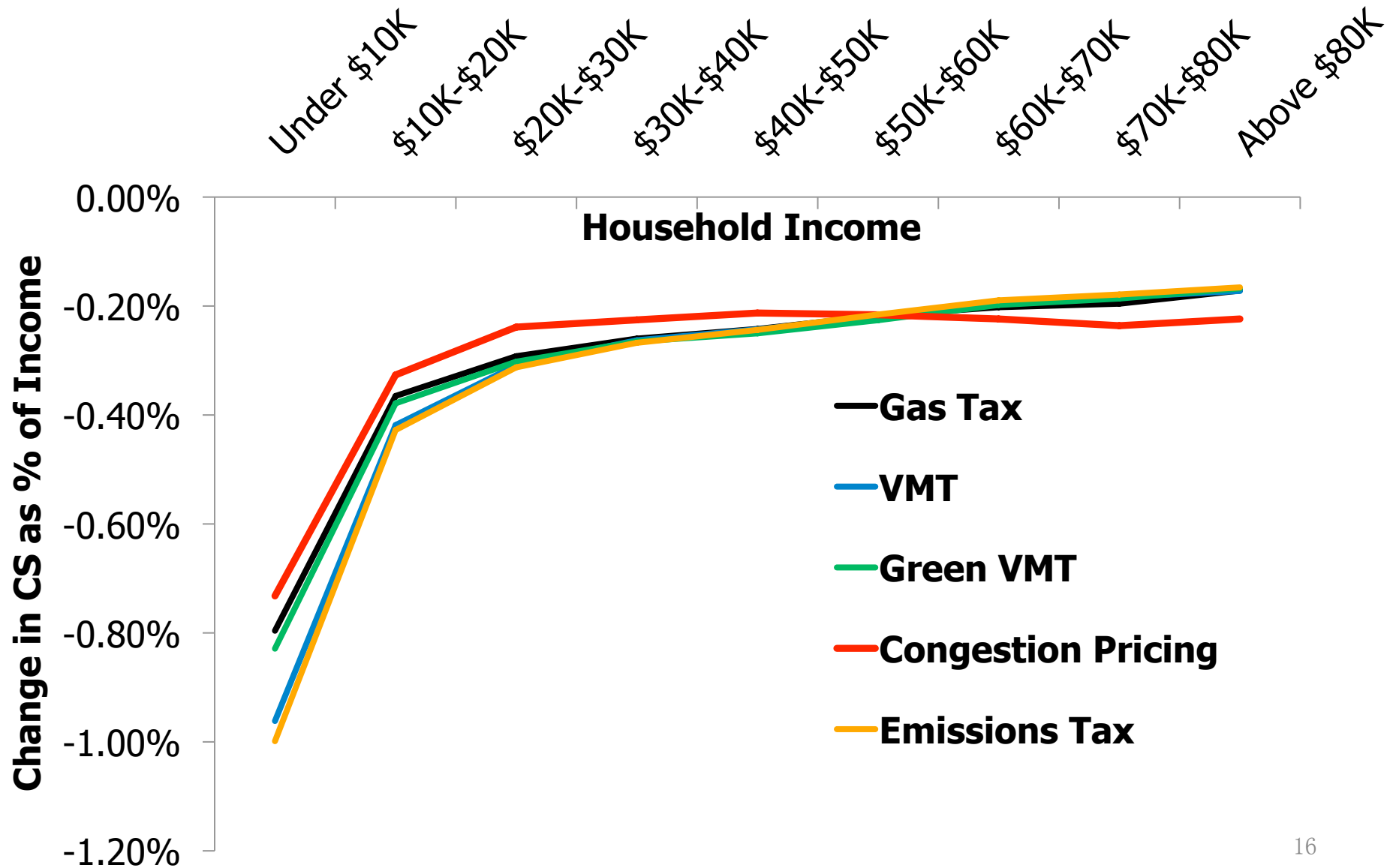
## Emission Tax

Charge road users a per-mile fee that ranges from **1 to 2.3 cents/mile** based on their EPA vehicle emission

# VMT Reduction by Household Income

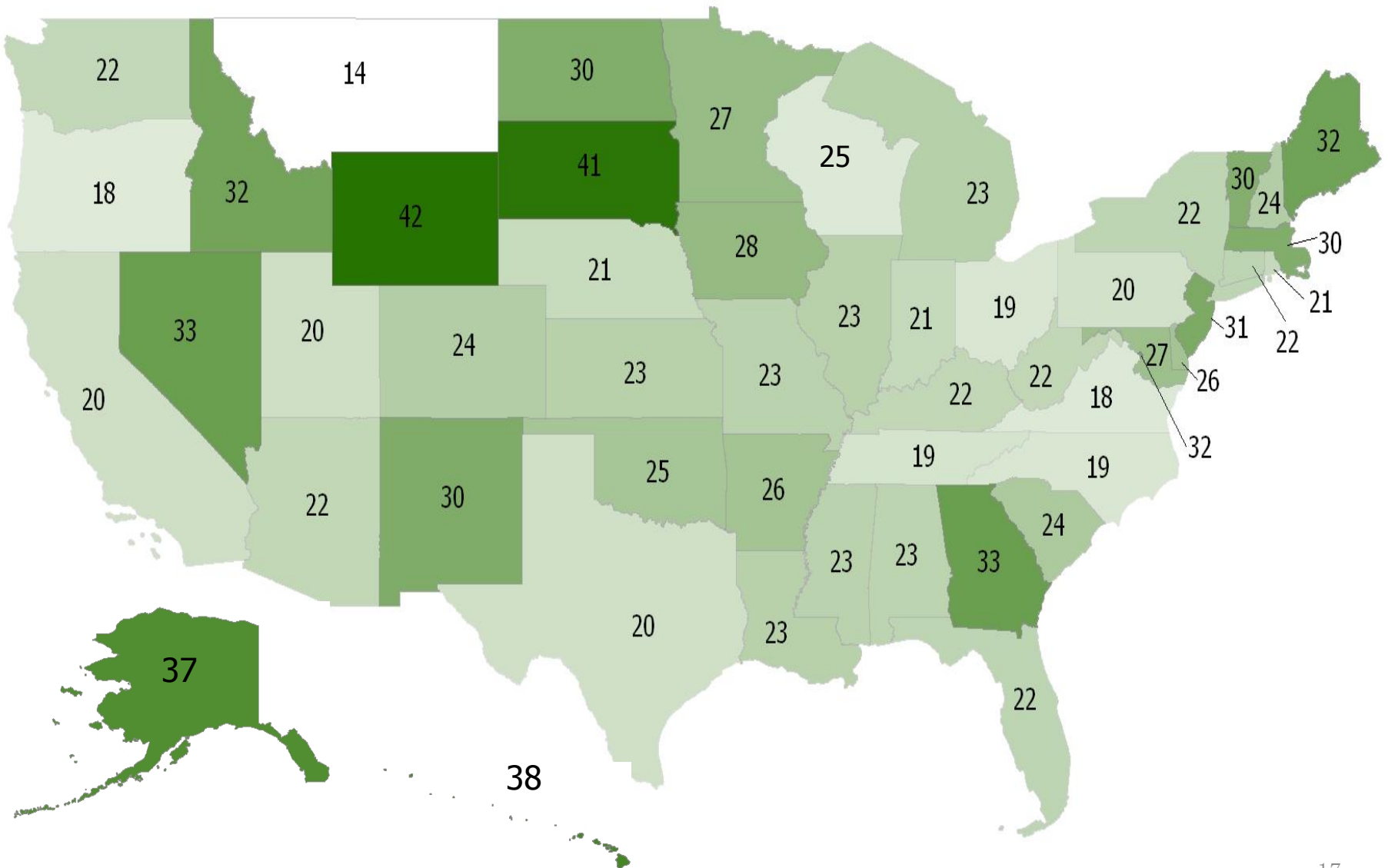


# Changes in Consumer Surplus: By Income Group

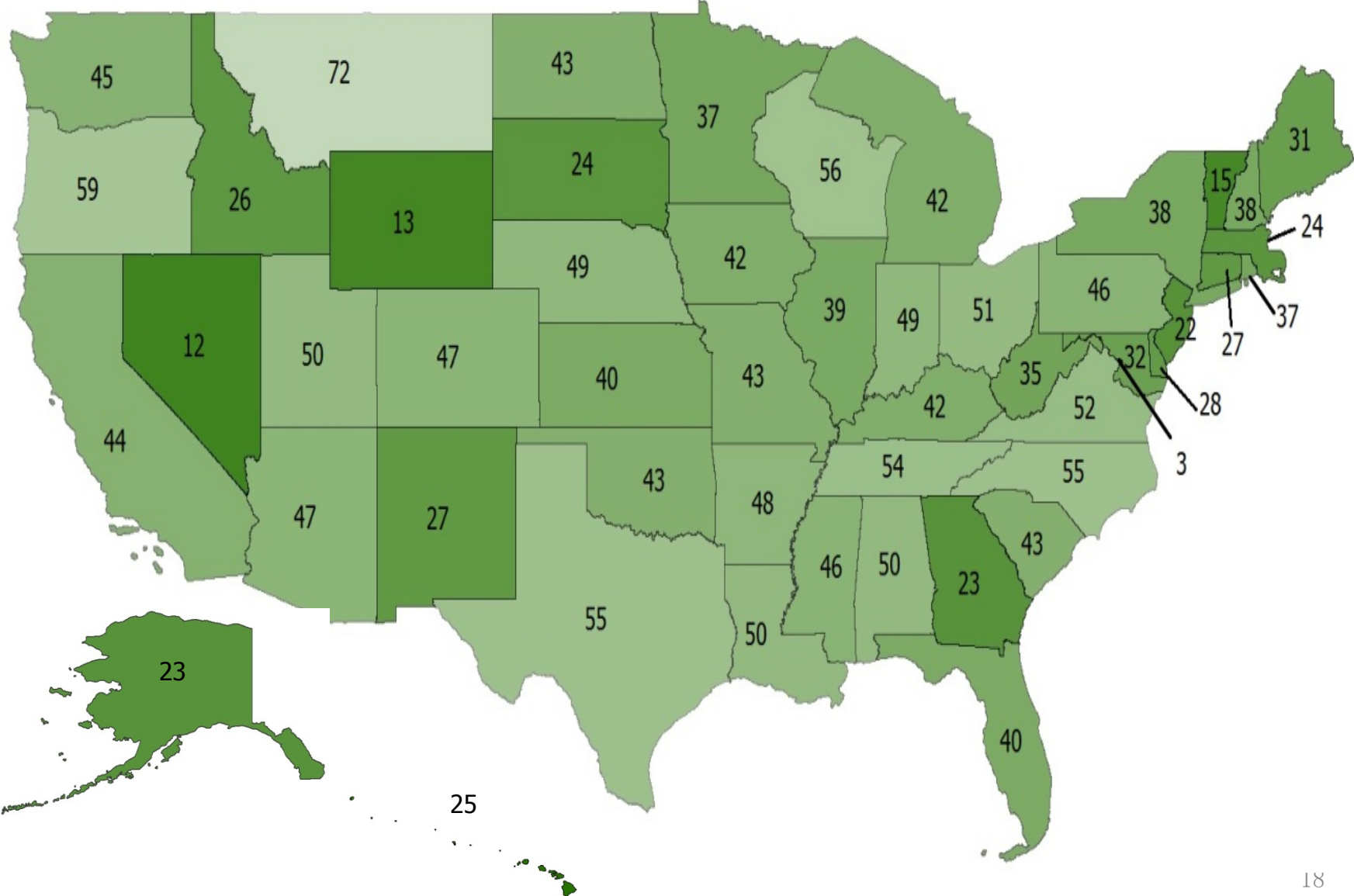




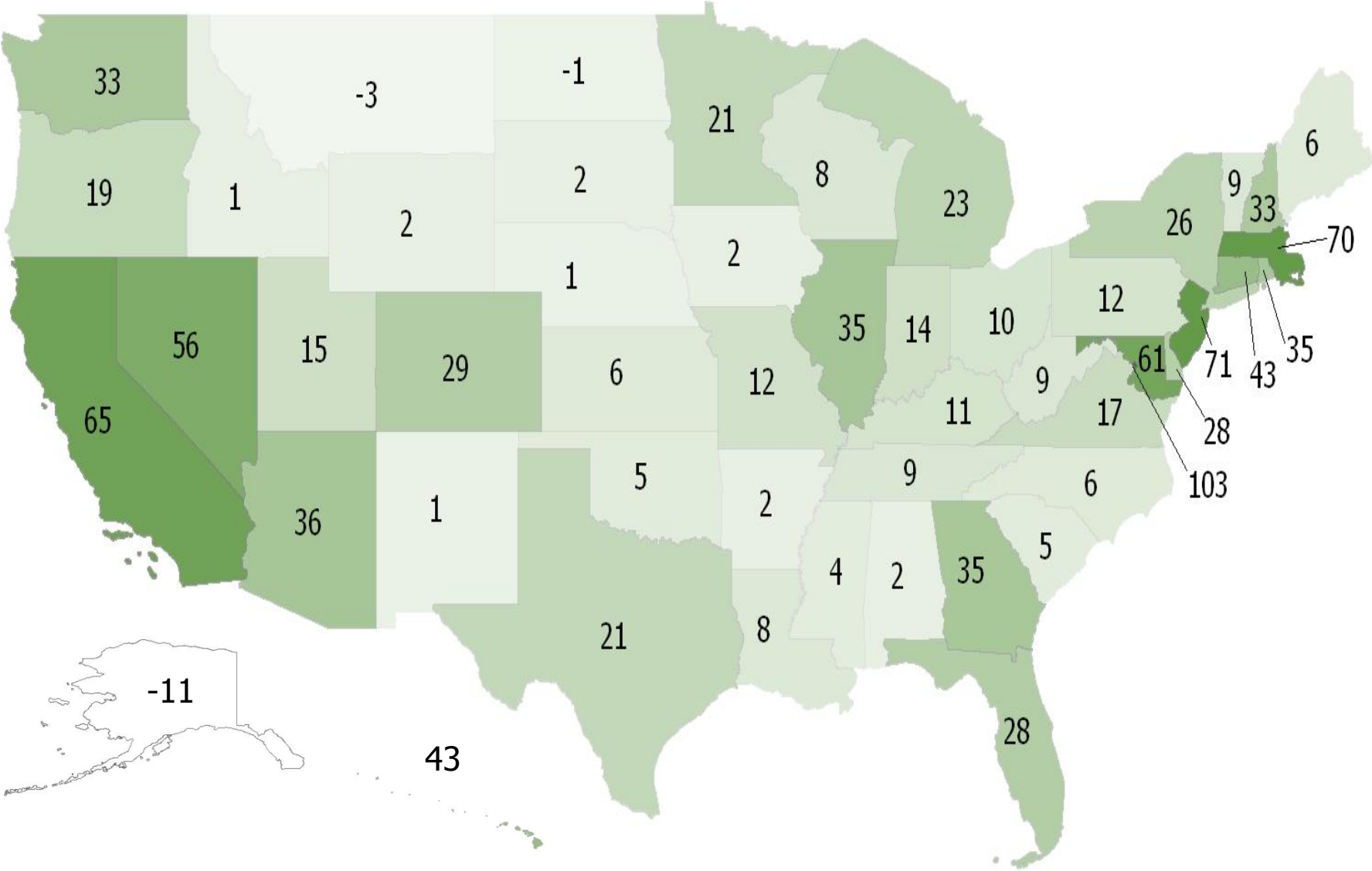
# Percentage Change in State Revenue Green VMT Fee



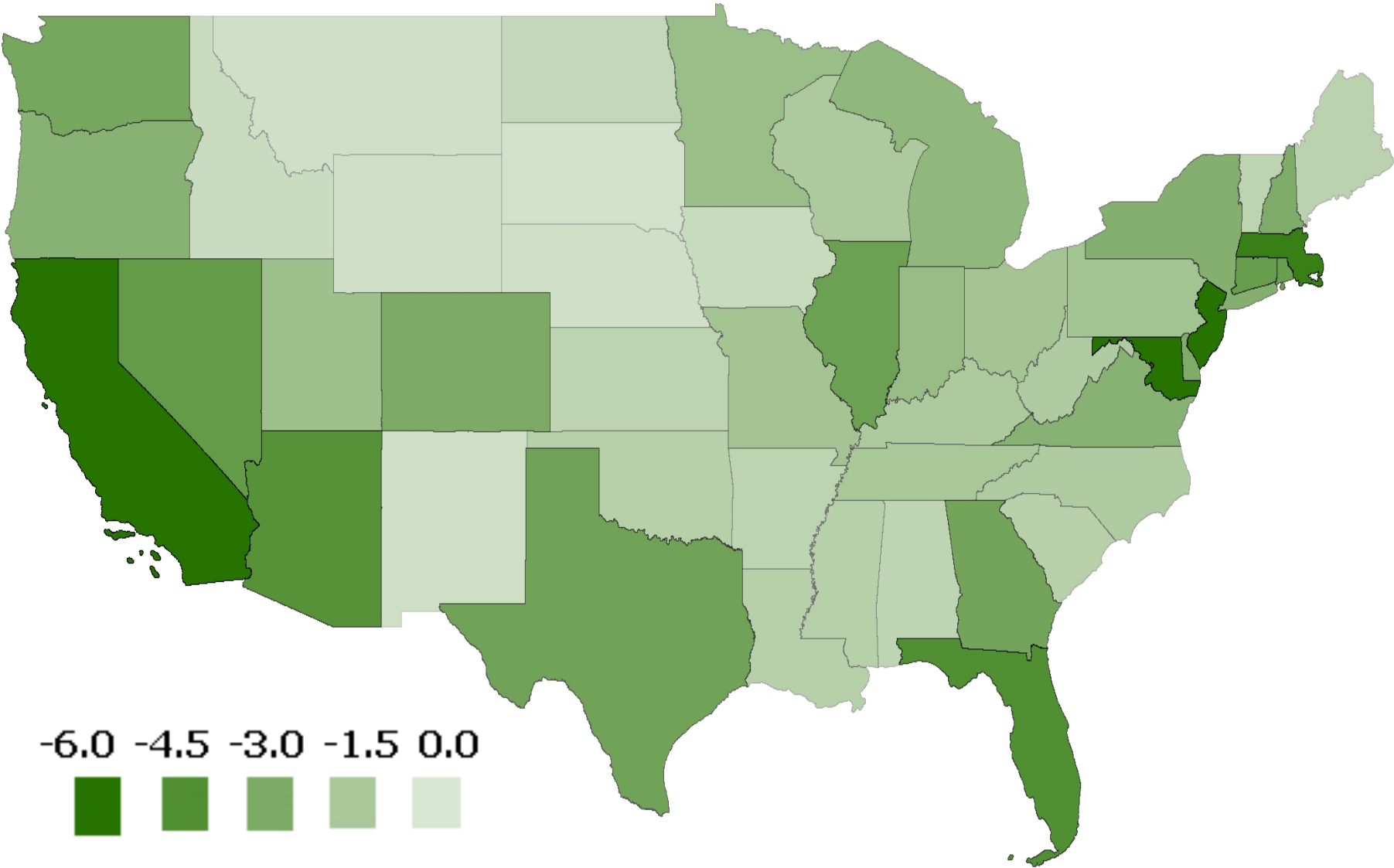
# Percentage Change in State Revenue: Emission Tax



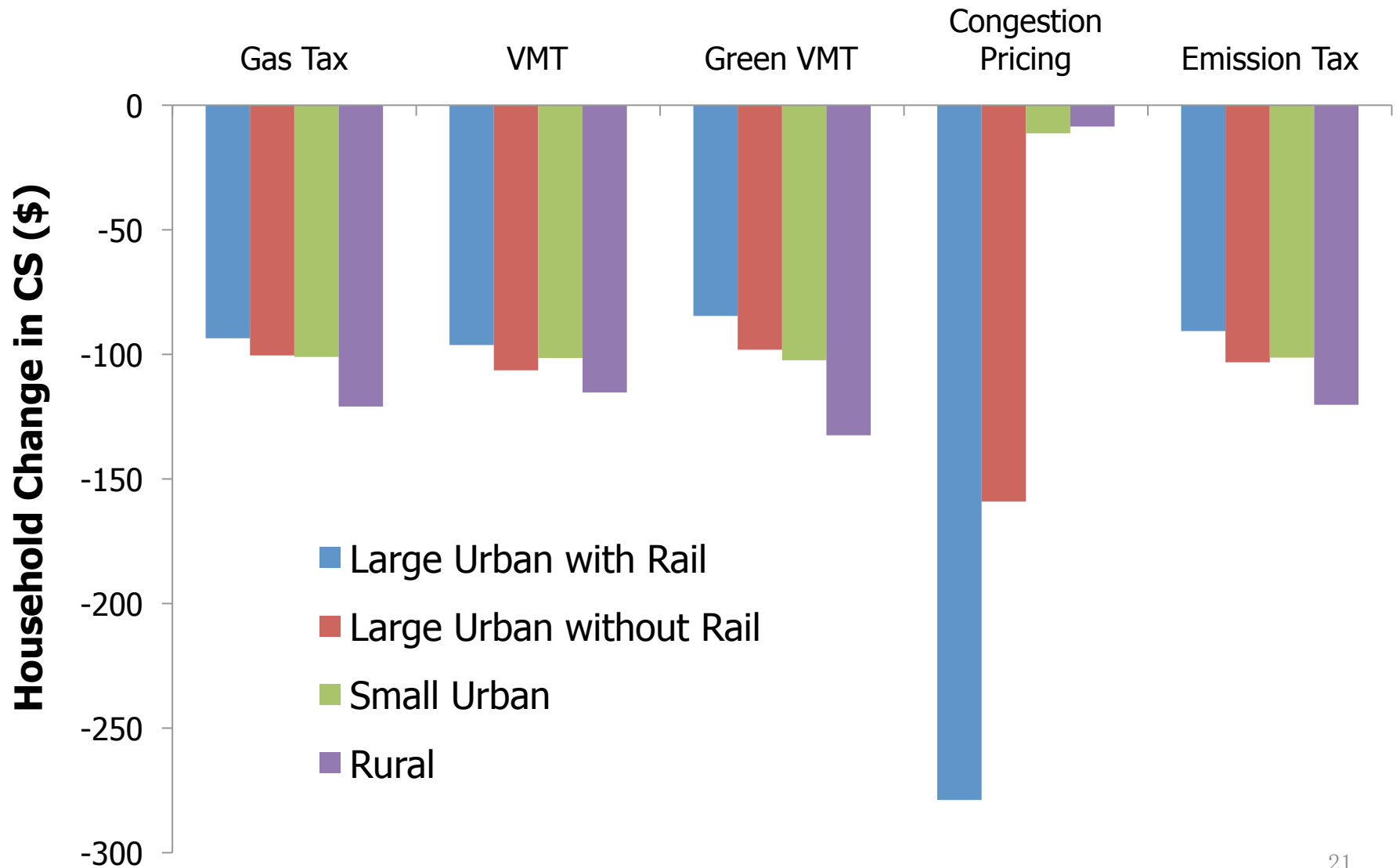
# Percentage Change in State Revenue: Congestion Pricing



# Percentage Change in VMT by State: Congestion Pricing



# Changes in Consumer Surplus: By Level of Urbanization



## **Environmental and Energy Policy Analysis #3**

**What is the impact of land use policies (e.g. high density, mixed development, neighborhood design) on travel behavior and VMT?**

# Defining Land Use Policy Variables

## Density

- ✍ Residential density (building sqft/area)
- ✍ Commercial density (building sqft/area)
- ✍ Industrial density (building sqft/area)
- ✍ Office density (building sqft/area)

## Mixed Use

$$Entropy = - \sum_j \frac{P_j * \ln (P_j)}{\ln (J)}$$

- ✍ Six (J=6) land use types are considered: residential, commercial, industrial, office, government and others.

## Average Block Size

## Distance to CBD

Etc.

# Methodological Issues and Research Design

## Methodological Issues

- ✍ Causality (self-selection)
- ✍ Spatial auto-correlation
- ✍ Inter-trip dependency (tour)
- ✍ Geographic scale

## Research Design

- ✍ Address these issues with careful control for travel attitude in modeling, and multilevel/structural equation modeling methods.
- ✍ Compare metropolitan areas that have different land use characteristics and policies, using the same analytical approach

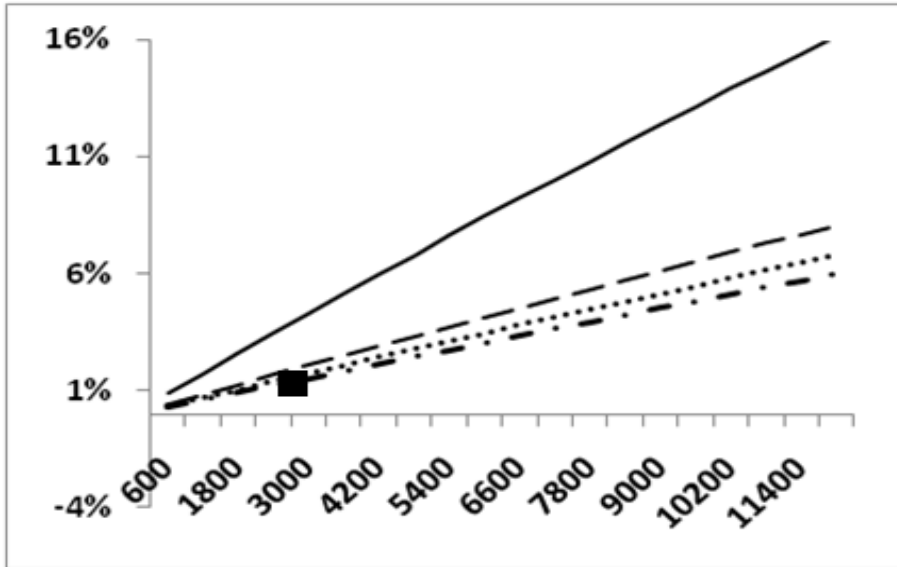


## Impact of Land Use on per-capita VMT

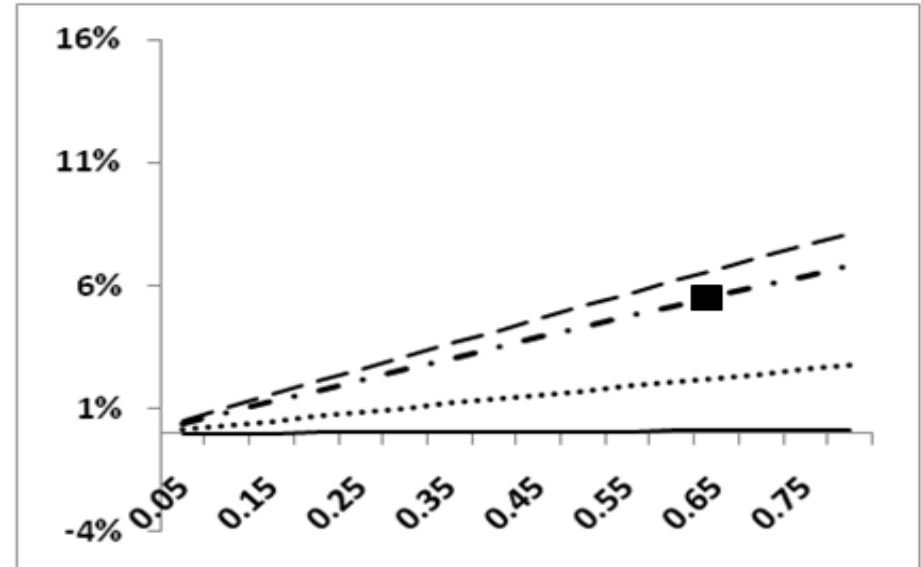
<b>Land Use Variables</b>	<b>Seattle</b>	<b>Baltimore</b>	<b>DC</b>	<b>Virginia</b>
<b>Residential density</b>	<b>-0.308</b>	<b>-0.344</b>	<b>-0.444</b>	<b>-0.262</b>
<b>Employment density</b>	<b>-0.071</b>	<b>-0.085</b>	<b>-0.010</b>	<b>0.034</b>
<b>Mixed Development</b>	<b>-0.149</b>	<b>-0.074</b>	<b>-0.195</b>	<b>-0.003</b>
<b>Average block size</b>	<b>0.153</b>	<b>0.089</b>	<b>0.021</b>	<b>0.220</b>
<b>Distance from CBD</b>	<b>0.331</b>	<b>0.264</b>	<b>0.456</b>	<b>-0.043</b>
<b>Distance to bus stop</b>	<b>0.036</b>	<b>---</b>	<b>---</b>	<b>---</b>
<b>Household socio-demographic variables not shown.</b>				

# Policy Analysis Applications

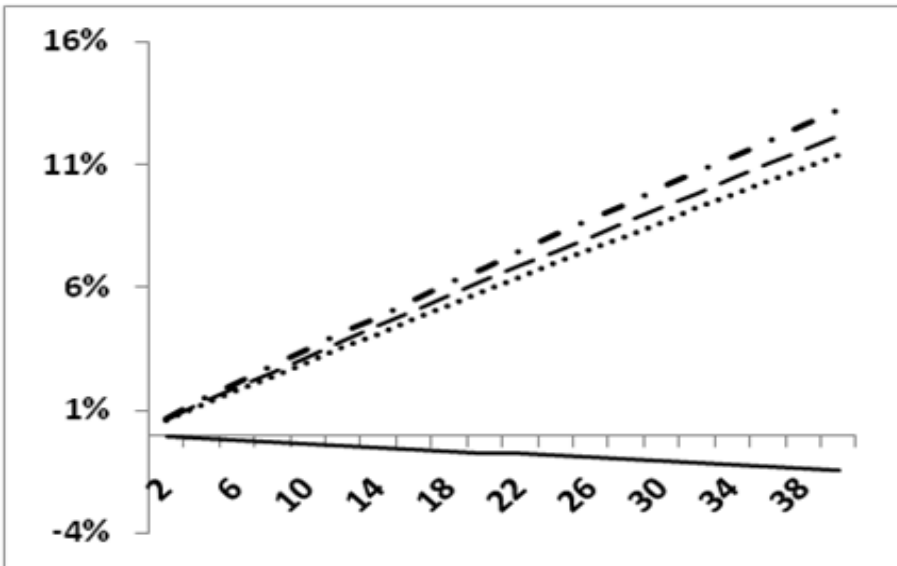
- - Seattle    ····· Baltimore  
 — Virginia    — · DC



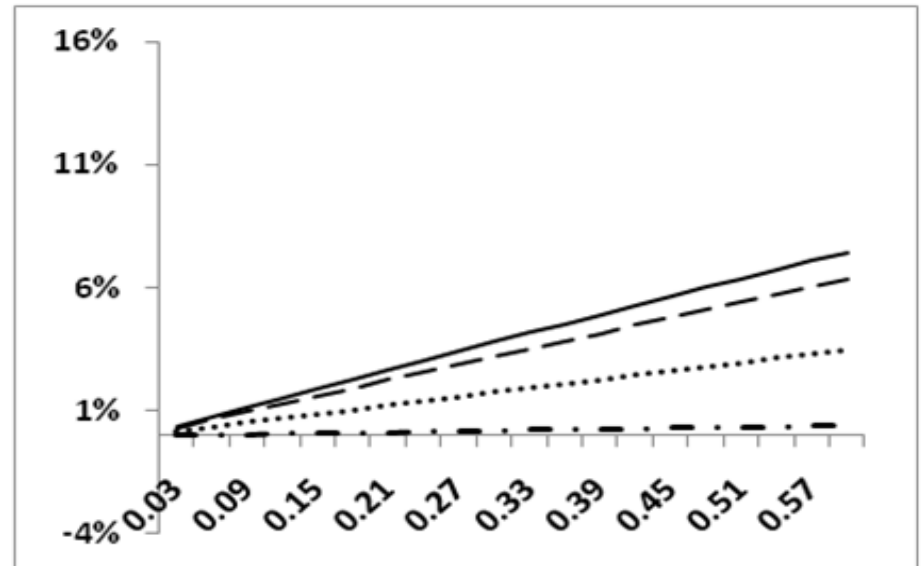
a. Residential Density (persons/sqm)



b. Mixed Development: Entropy (no unit)



c. Compact Development: Distance to CBD (mile)



d. Neighborhood Design: Block Size (mile)

# Conclusions

- ✍ **Air quality control and EPA's nonattainment designation have a statistically significant negative correlation with vehicle miles traveled.**
- ✍ **Green transportation financing policies will result in significant reduction in VMT, fuel consumption, and pollution/GHG emissions. While the lowest-income (< \$25K/year) households are hurt the most, the regressivity of green transportation financing policies is similar to that of policies increasing fuel taxes.**
- ✍ **Land use policies can effectively influence travel behavior and VMT, but the actual impact depend on existing local and metropolitan land use characteristics.**
- ✍ **NHTS provides important and often necessary information for critical environmental and energy policy analysis; and its value is even higher in add-on states.**

# Thank you!

## Additional Questions and Comments

**Lei Zhang**

**Assistant Professor**

**Department of Civil & Environmental Engineering**

**University of Maryland – College Park**

**[lei@umd.edu](mailto:lei@umd.edu), 301-405-2881**

## Acknowledgement

**Funding support from:**

**Federal Highway Administration (FHWA)**

**Maryland State Highway Administration (MSHA)**

**USDOT UTC Program: CITSM at UMD**

**Views herein do not necessarily represent FHWA or MSHA views. The authors are responsible for all statements.**