



# Equity Implications of Atlanta Vehicle Inspection & Maintenance (I/M) Program

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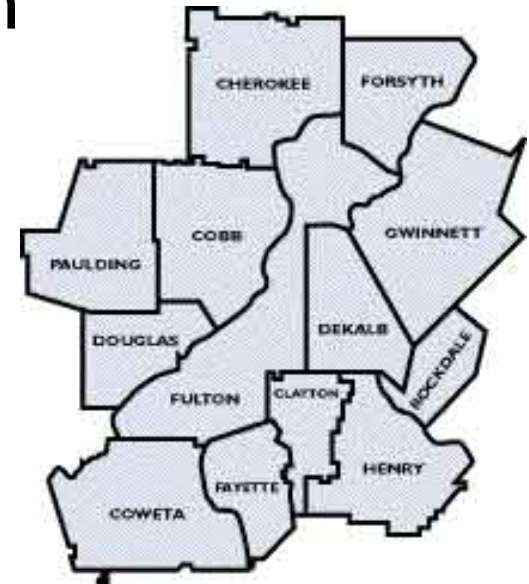


# Outlines

- Background of I/M program
- I/M program: Costs of motorists
- Research question
- Data sources
- Hypotheses & models
- Samples & methods
- Results
- Conclusion
- Policy Implication

# Background of I/M Program

- Severe air pollution problem in Atlanta
  - Violation of 1-hr national standard for **ozone**
  - Main source of ozone precursors is **vehicles**
  - Clean Air Act Amendment 1990 mandate state to set up vehicle **I/M program**
- Atlanta vehicle I/M program
  - 3 years or older
  - Registered in 13 counties
  - Gasoline engine
  - Few exemptions





# I/M Program: Costs of Motorist

- **Expectations**

- Vehicles kept clean
  - Optimal operating condition
  - Regular maintenance (at least once a year)
- Air getting cleaner

- **Benefit**

- Unharmful human health

- **Short-run Costs**

- Inspection fee
- Travel time & cost
- Waiting time
- **Repair costs**
  - Pre-inspection
  - Post-inspection (if failing 1<sup>st</sup> test)

- **Long-run Costs**

- Total cost of ownership (TCO)

# Research Question

- Focus on Short-run costs
  - Data limitation (1 yr cross-section)
- Focus on Repair costs
  - Other costs assumed similar across income groups
- Use Proxy of Repair costs: **Fail the 1<sup>st</sup> inspection**
  - Data limitation
    - Unobserved pre-test repair costs
    - Measurement error of post-test repair costs

**Are vehicles owned by low-income households likely to *fail the first inspections* more than those owned by high-income?**



# Hypotheses & Models

Dependent Variable:

**Probability of a vehicle failing the 1<sup>st</sup> inspection (p)**

**p = Proxy of POST-inspection repair costs**

$$\ln\left(\frac{p}{1-p}\right) = \beta_0 + \beta_1 \text{Income} + \varepsilon; H_A : \beta_1 < 0$$

*Vehicle owned by LOW-income household is MORE likely to fail*



*LOW-income household bears MORE of (POST-test) repair costs*

$$\ln\left(\frac{p}{1-p}\right) = \beta_0 + \beta_1 \text{Income} + \beta_j \text{Motorist} + \beta_k \text{Vehicle} + \varepsilon; H_A : \beta_1 < 0$$

**Income = Proxy of PRE-inspection repair costs (maintenance)**

*Vehicle owned by LOW-income household is MORE likely to fail*



*HIGH-income household bears MORE of (PRE-test) repair costs*

# Data sources

## I/M Inspection Records 2000



### Vehicle

#### Characteristics

Make, Model Year  
Type, Cylinder, etc.

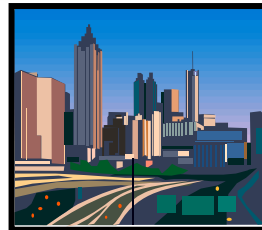
#### Location

#### Pass-Fail results

United States  
**Census  
2000**

&

**ARC**



**Atlanta Household  
Travel Survey 2001-2002**

### Income

#### Block group

CENSUS 2000

#### Vehicle group

AHTS 2001-2002



# Samples & Methods

- **Aggregate-income sample (685,714)**
  - **No individual income** for each vehicle
  - Possible bias results
- **Logistic models**
  - Simple regression
    - **Median imputation of income**
  - Monte-Carlo methods
    - Simulate artificial individual income
  - Heterogeneous vs. Homogeneous grouping

- **Individual-income sample (465)**
  - Individual income for each vehicle available
  - Small sample size
- **Logistic models**
  - Simple regression
  - Bootstrap methods

# Results: Bootstrap & Monte Carlo

Dependent Variable: Ln  
(Odds of Failing 1<sup>st</sup> Inspection)

$H_0$ : Odds of Failing 1<sup>st</sup> Inspection  
are the same across income  
groups

→ Same level of POST test repair

Restricted  
Model

Table 7, 8 (A)

Main Independent Variables: Ln(Annual Household Income)		Observed Individual AHI		Simulated Individual AHI		Group AHI	
Estimation Methods	Income Data	Coef.	z	Coef.	z	Coef.	z
Bootstrap Logit	AHTS	-0.619	-1.53	-	-	-	-
Logit	AHTS	-0.619	-1.72	-	-	-	-
Monte Carlo Logit	CENSUS	-	-	-0.12	-22.4	-	-
Monte Carlo Logit	AHTS	-	-	-0.18	-23.3	-	-
Logit	CENSUS	-	-	-	-	-0.572	-49.6
Logit	AHTS	-	-	-	-	-0.98	-58.0
Observations		465		685,714		685,714	

# Results: Bootstrap & Monte Carlo

**Dependent Variable: Ln  
(Odds of Failing 1<sup>st</sup> Inspection)**

$H_0$ : Odds of Failing 1<sup>st</sup> Inspection are the same across income groups, given same vehicles  
→ Same level of PRE test repair

**Unrestricted Model**

**Table 7, 8 (B)**

Main Independent Variables: Ln(Annual Household Income)		Observed Individual AHI		Simulated Individual AHI		Group AHI	
Estimation Methods	Income Data	Coef.	z	Coef.	z	Coef.	z
Bootstrap Logit	AHTS	-0.282	-0.57	-	-	-	-
Logit	AHTS	-0.282	-0.75	-	-	-	-
Monte Carlo Logit	CENSUS	-	-	-0.031	-5.25	-	-
Monte Carlo Logit	AHTS	-	-	-0.020	-2.57	-	-
Logit	CENSUS	-	-	-	-	-0.261	-16.83
Logit	AHTS	-	-	-	-	-0.152	-8.05
Observations		465		685,714		685,714	

# Results: Homogeneous vs. Heterogeneous Grouping

Dependent Variable: Ln  
(Odds of Failing 1<sup>st</sup> Inspection)

Restricted Model  
Unrestricted Model

Table 10  
(A), (B)  
6 Samples

Main Independent Variable	Highly Homogeneous Income Group			Highly Heterogeneous Income Group		
Ln(Annual Household Income)	Gini	SD	CV	Gini	SD	CV
Block Group Median AHI	-0.462	-0.381	-0.385	-0.524	-0.591	-0.638
(z statistics)	(7.20)	(5.01)	(5.15)	(8.09)	(8.79)	(11.0)
Block Group Median AHI	-0.093	-0.144	-0.157	-0.302	-0.239	-0.308
(z statistics)	(0.65)	(1.02)	(1.17)	(2.88)	(2.28)	(3.23)
Observations	13,907	13,975	14,120	13,721	14,016	13,716

# Results: Summary

Income Variables	Model Specifications	
	Restricted	Unrestricted
<b>Observed income</b>		
Individual income	-0.62*	-0.28 Unbiased estimates
Group income	-1.31***	-1.19*** Ecological fallacy
<b>Simulated income</b>		
Individual from block group info	-0.12***	-0.03*** Not substantive effect
Individual from vehicle group info	-0.18***	-0.02*** Not substantive effect
<b>Group level income</b>		
<u>Median group income</u>		
Census block group	-0.57***	-0.26*** Ecological fallacy
Vehicle characteristics group	-0.98***	-0.15*** Ecological fallacy
<u>Census block group income</u>		
Heterogeneous group	-0.59***	-0.30*** Ecological fallacy
Homogeneous group	-0.38***	-0.14 Unbiased estimates



# Conclusion

- Vehicles owned by low-income household is **MORE** likely to fail the 1<sup>st</sup> inspection
  - Low-income households bear more burden (POST test repair cost) in complying with I/M program
- Vehicles owned by low-income household is **EQUALLY** likely to fail the 1<sup>st</sup> inspection, given the same vehicles
  - Low-income households maintain (PRE test repair costs) their vehicles roughly the same level as high-income households
- Cost of I/M compliance is **NOT** equally distributed across income groups





# Policy Implications

- Clean vehicles → Clean air?
  - Low-income owners cannot afford the costs
    - Clean-for-a-day phenomena
    - Ineffective repair last for a short-period
    - ‘Wash sale’ to people living outside I/M areas
    - Illegal driving without registration
- Supplemental programs may help...
  - Repair subsidy
  - Old vehicle scrapping program: Orange county, CA
  - Warning: fungibility



# Comments & Suggestions ???

Thank You  
for Your Time ...

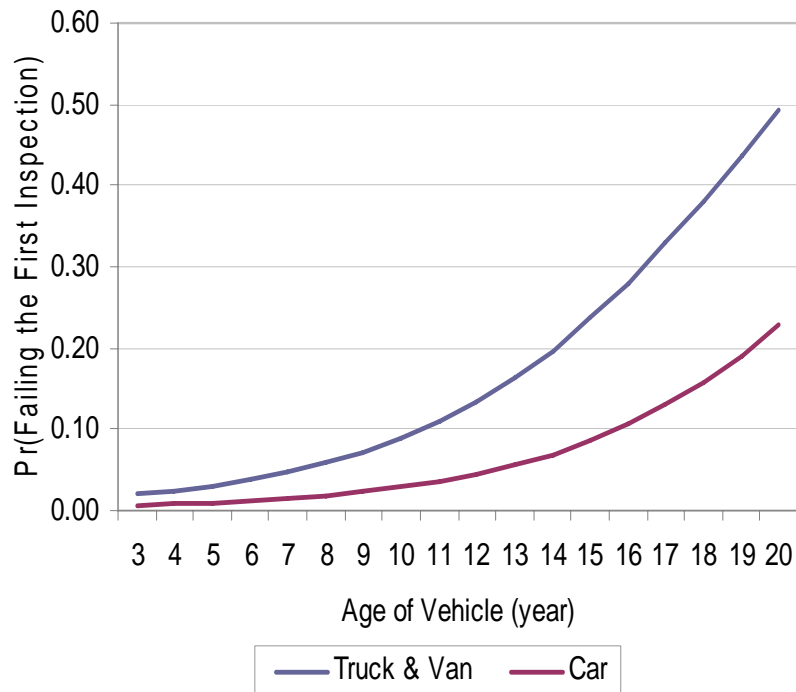
# Appendix: Summary statistics of two Samples

Variables	Aggregate-Income Sample				Individual-Income Sample				Difference	
	Mean	Std. Div.	Min	Max	Mean	Std. Div.	Min	Max	t z	P( T  >  t ) P( Z  >  z )
<b>Dependent Variables</b>										
First inspection result (Pass = 0; Fail = 1)	0.07	0.25	0	1	0.05	0.23	0	1	1.69	0.09
<b>Independent Variables</b>										
<i>Household income (\$US)</i>										
Observed Ln of individual income					10.83	0.6	8.52	11.51		
Ln of <i>block</i> group median income	10.94	0.39	7.82	12.21						
Ln of <i>vehicle</i> group median income	11.01	0.26	8.52	11.51						
<i>Owner characteristics in the block group</i>										
Median age of population (year)	34.2	4.76	12.6	75.4						
Percent black population	0.26	0.3	0	1						
Percent other ethnic population	0.09	0.08	0	0.72						
Percent Latino population	0.07	0.1	0	0.84						
Percent male population	0.49	0.04	0.13	1						
Black					0.26	0.44	0	1		
Other					0.14	0.35	0	1		
<i>Vehicle characteristics</i>										
Age (year)	6.81	3.61	0.5	19.5	6.93	3.31	3	20	-0.78	0.43
Ln of mileage	9.09	3.28	0	13.82	11.41	0.56	8.21	12.91	-88.31	0
Displacement (liter)	3.03	1.17	1	7.4	2.94	1.05	1	5.9	1.85	0.07
Location of production: European	0.05	0.22	0	1	0.07	0.25	0	1	-1.98	0.05
Location of production: Asian	0.2	0.4	0	1	0.24	0.43	0	1	-2.16	0.03
Location of production: Other	0.12	0.33	0	1	0.12	0.33	0	1	0	1
Fuel Induction: EFI	0.16	0.36	0	1	0.21	0.41	0	1	-2.94	0
Fuel induction: FI	0.21	0.41	0	1	0.22	0.42	0	1	-0.53	0.6
Fuel induction: MFI	0.33	0.47	0	1	0.29	0.45	0	1	1.83	0.07
Exhaust gas recirculation (EGR)	0.78	0.41	0	1	0.76	0.43	0	1	1.04	0.3
Thermostatic air cleaner (TAC)	0.1	0.3	0	1	0.07	0.25	0	1	2.16	0.03
Type: Car	0.73	0.44	0	1	0.72	0.45	0	1	0.49	0.63
Type: Van	0.14	0.35	0	1	0.18	0.39	0	1	-2.48	0.01
<b>Number of groups</b>										
Census block groups		4,157					-			
Vehicle groups (Make-Model Year-Cylinder-Type)		1,014					-			
Observations	685,714				465					

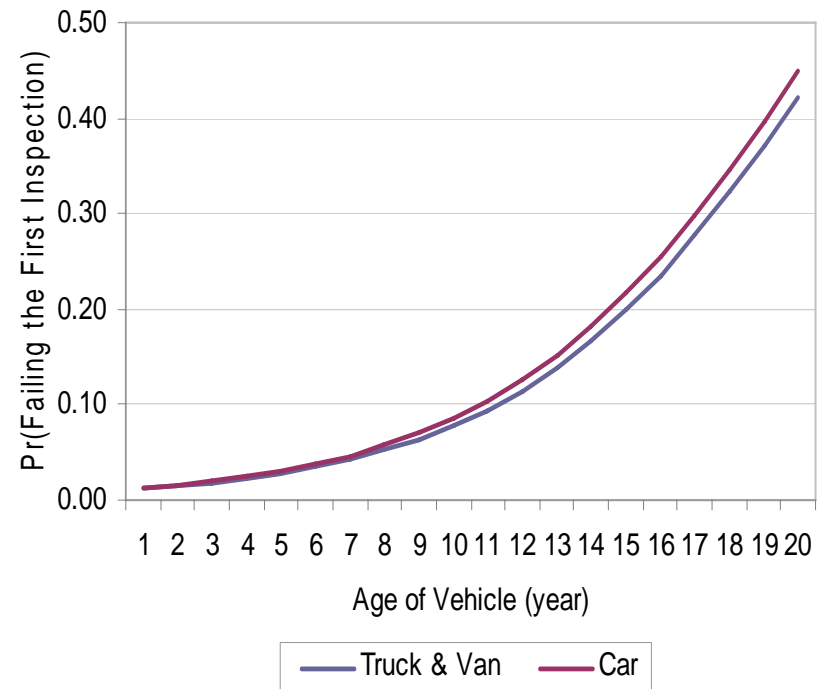
# Appendix: Summary statistics of simulated income

Descriptive Statistics	Empirical Distribution		Log-Normal Distribution	
	AHTS 2001	CENSUS 2000	AHTS 2001	CENSUS 2000
Mean	10.915	10.837	10.915	10.837
Standard deviation	0.583	0.887	0.615	0.887
Minimum	8.517	8.517	3.998	5.625
Maximum	11.513	12.612	15.950	15.678
1st Percentile	8.517	8.517	9.178	8.624
5th Percentile	9.616	8.517	9.856	9.349
10th Percentile	10.127	9.741	10.142	9.707
25th Percentile	10.714	10.373	10.559	10.269
50th Percentile	11.120	10.906	10.967	10.857
75th Percentile	11.379	11.374	11.326	11.425
90th Percentile	11.513	11.828	11.599	11.940
95th Percentile	11.513	12.070	11.801	12.256
99th Percentile	11.513	12.612	12.257	12.880
Skewness	-1.478	-0.667	-0.597	-0.136
Kurtosis	5.784	3.704	5.018	3.346
Total sampling dist.	1000	1000	1000	1000

# Appendix: Effects of vehicle age and type

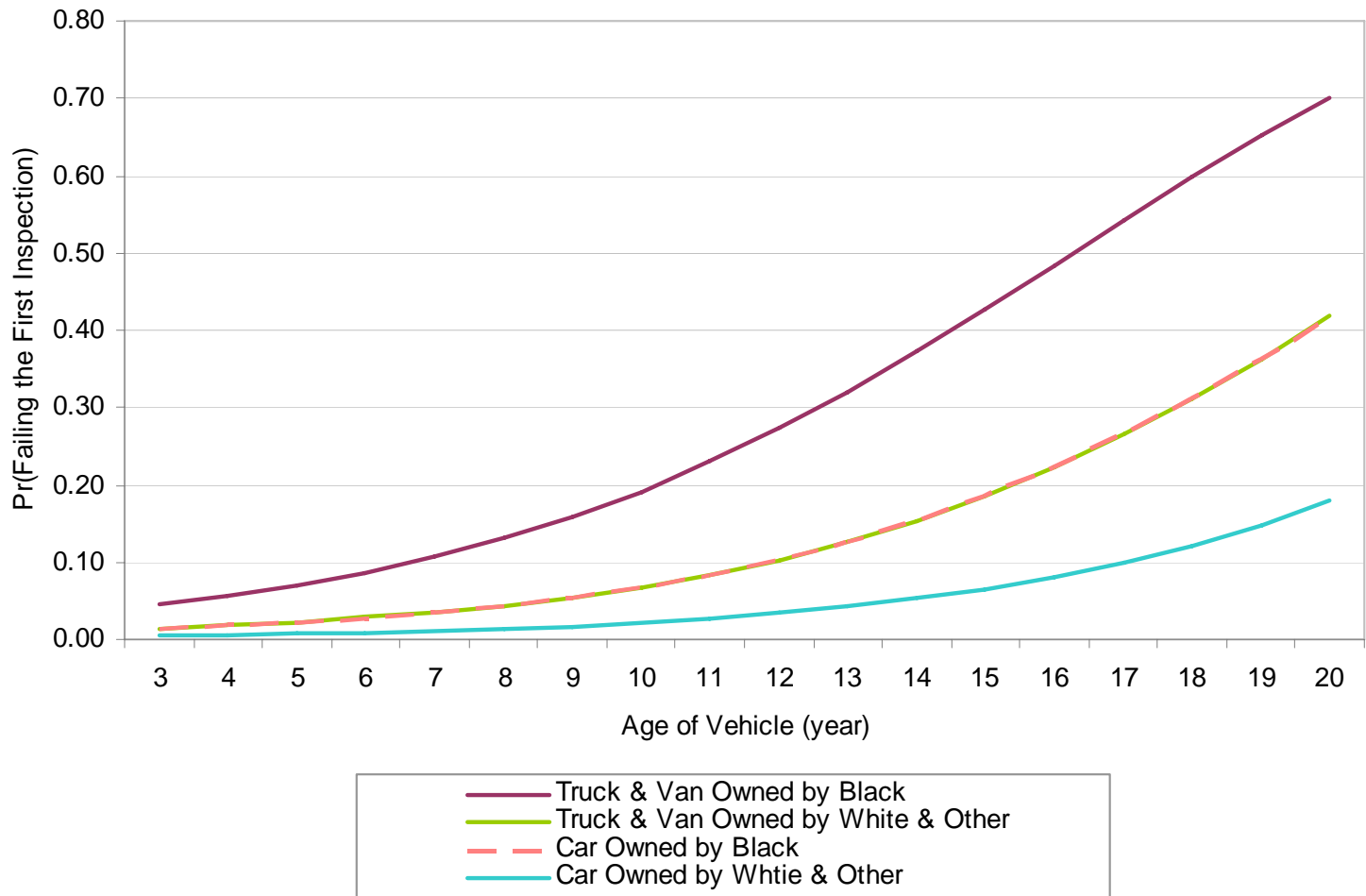


Individual Income Sample  
(465)



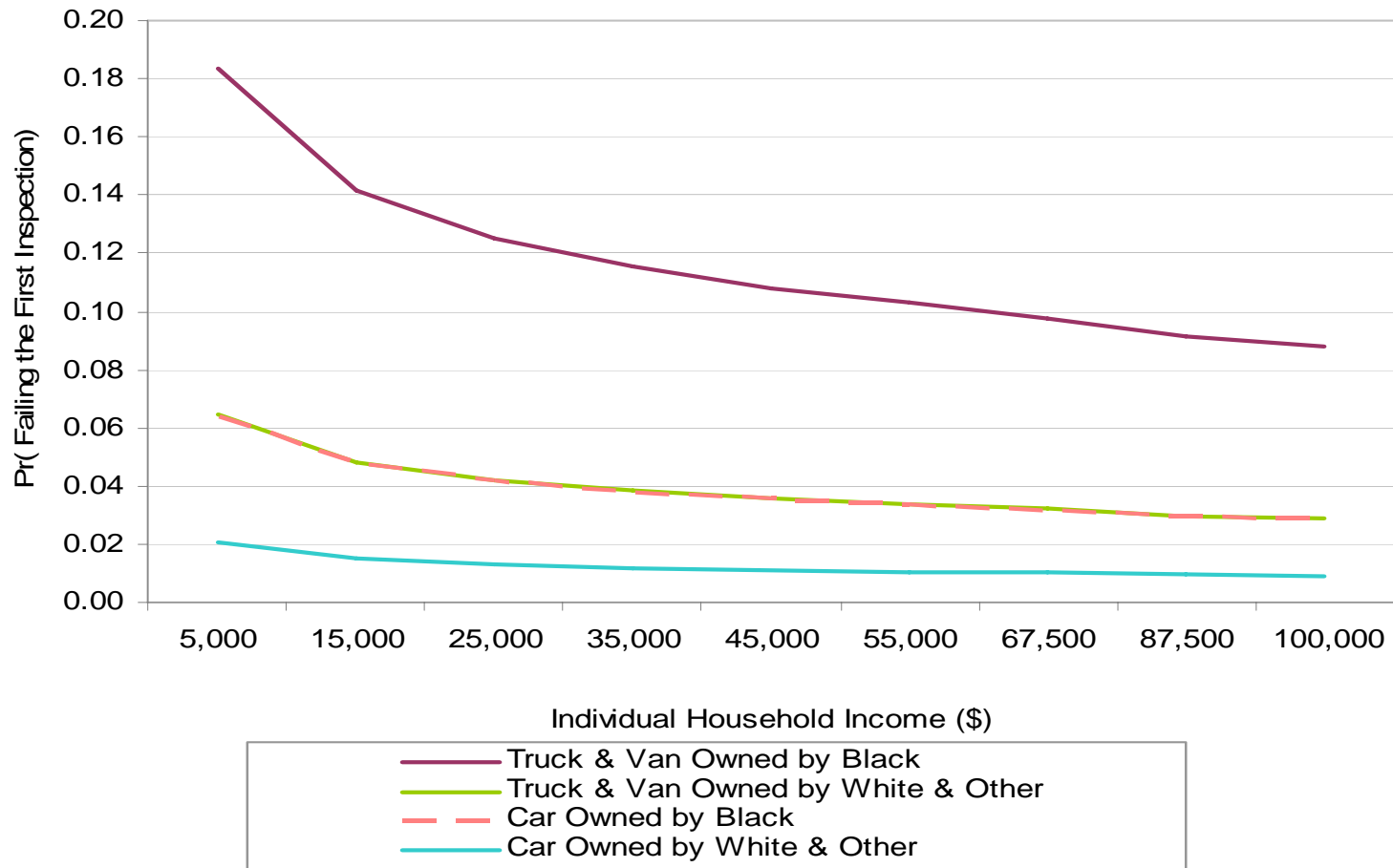
Aggregate Income Sample  
(685,714)

# Appendix: Effect of vehicle age, type and owner's ethnicity





# Appendix: Effects of owner's income & ethnicity and vehicle type



# Appendix: Effects of share of black population in block group and vehicle age

