## Conspicuous Consumption:

# Vehicle Purchases by Non-Prime Consumers

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<sup>&</sup>lt;sup>1</sup>The views expressed in this article are those of the authors and do not necessarily represent the views of the Federal Reserve Bank of Dallas or the Federal Reserve System.

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- Lower-income consumers may emulate their richer peers' consumption of visible luxury goods.
  - ▶ ⇒ Purchase luxury goods to **keep up with the Joneses**
- ➤ Purchase **more** conspicuous luxury goods than what the inherent functionality of the goods warrants.

#### Research Question

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  - "Keeping up with the Joneses"

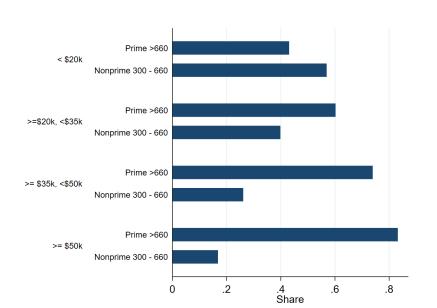
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- ▶ Do the preferences for prestige by non-prime consumers lead them to purchase more expensive vehicle?
  - Status signaling?
  - "Keeping up with the Joneses"
- ► What are the financial **consequences** of large spending on vehicles by non-prime consumers?
  - Delinquency, repossession, credit score, etc.
  - Standing of other financial accounts (credit cards, mortgages, etc.)

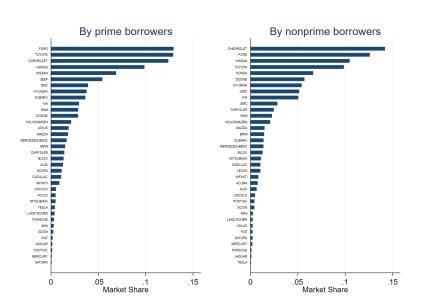
#### Data

- AutoCount
   — Experian Monthly Report on auto loan underwritings
  - Brand/make, model, new/used, segment
  - By consumers' Zip Code
  - By consumers' credit score
  - 2015-2019
- New York Fed/Equifax Consumer Credit Panel
  - Monthly financial outcomes:
    - Balance
    - Delinquency status, Repossessions, Charge-offs
    - Credit Scores
  - Trade line level
  - Observe consumer identifier

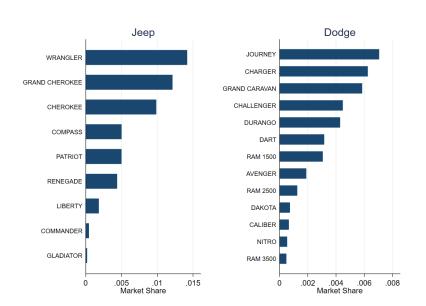
## Who Buy Expensive Vehicles?



#### **Brand Market Shares**



#### Model Market Shares



#### Empirical Framework: Relative Demand for Prestige

Estimate the demand for prestige relative to the average consumer:

$$\log(s_m^k) - \log(\bar{s}_m) = \alpha_k - \bar{\alpha} - (\beta_k - \bar{\beta})\log(P_m) + (\eta_k - \bar{\eta})F(X_m) + (\gamma_k - \bar{\gamma})c_m + \delta^k - \bar{\delta} + \zeta_m^k - \bar{\zeta}_m$$

- $ightharpoonup c_m$  We measure prestige by computing the share of vehicles sold per brand/make that are classified as luxury.
  - ▶ Define luxury on segment (luxury, premium, or upscale)
  - For robustness, also based on the value of new vehicles.

### Results: Demand for Prestige Stronger for Non-Prime

	Dep Var: Relative Log (Model Market Share)						
	(1)	(2)	(3)	(4)			
Log (Model Value)	-0.6840***	-0.6836***	-0.6819***	-0.6868***			
	(0.0098)	(0.0098)	(0.0098)	(0.0010)			
Due ned Lawrence Chaus	0.0500***	0.0750***	0.0547***	0.0000***			
Brand Luxury Share	0.0536***	0.0753***	0.0547***	0.0902***			
	(0.0102)	(0.0104)	(0.0116)	(0.0075)			
Brand Pick-up Share		0.1219***	0.1127***				
Brana r lok up onalo		(0.0101)	(0.0101)				
		,	,				
Brand Alt-Energy Share			-0.1303***				
			(0.0219)				
Luxury Definition	Segment	Segment	Segment	Model Value			
Observations	99,913	99,913	99,913	99,913			

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- ▶ In general, prime/higher-income consumers buy more expensive and more prestigious vehicles on average
- Preferences for conspicuous prestige in vehicles
  - ➤ Willing to pay more for prestige
- Prestigious brands come with higher price tag on average
  - ▶ → Buy more expensive vehicles

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- Consumer cares about his/her status of perceived income relative to her social reference group
- The society does not see true income but sees prestige consumption and income distribution of consumers' "tagged" groups – your friends, neighbors
- Since higher-income consumers on average buy more prestige:
  - Prestige would serve as a *signal* of one's status:
  - Prediction:Demand for prestige ↑ as reference group's mean income ↓ and income inequality ↑

## Results: Evidence for Status Signaling (1/2)

		Dep Var: Relative Log (Model Market Share)							
		(1)	(2)	(3)	(4)	(5)			
Log (Model Value)	Base	-0.6167***	-0.6392***	-0.4581***	-0.444***	-0.444**			
3,,		(0.0116)	(0.0114)	(0.0235)	(0.0239)	(0.0249)			
	Black	-0.1869***			-0.0606*	-0.0632			
		(0.0572)			(0.0367)	(0.0379			
	Hispanic	-0.1845***			-0.0783**	-0.106**			
		(0.0461)			(0.0315)	(0.0351			
	Asian	0.2314***			0.1895**	0.219**			
		(0.0920)			(0.0749)	(0.0863			
	Income <\$40K		-0.2731***		-0.1756***	-0.175**			
			(0.0422)		(0.0320)	(0.0332			
	Income >\$120K		0.4805***		0.4008***	0.428**			
			(0.0479)		(0.0463)	(0.0504			
	Gini - 0.3783 - 0.4174			-0.1703***	-0.1204***	-0.1299*			
				(0.0290)	(0.0274)	(0.0291			
	Gini - 0.4174 - 0.4576			-0.2140***	-0.1290***	-0.1338*			
				(0.0262)	(0.0279)	(0.0293			
	Gini >0.4576			-0.1880***	-0.0784***	-0.0499			
				(0.0290)	(0.0289)	(0.0303			

## Results: Evidence for Status Signaling (2/2)

Brand Luxury Share	Base	0.0685***	0.0284***	0.0680**	0.0518**	0.0294
		(0.0138)	(0.0101)	(0.0272)	(0.0240)	(0.0219)
	Black	0.3678***			0.2339***	0.2508***
		(0.0394)			(0.0261)	(0.0223)
	Hispanic	-0.1780***			-0.1546***	-0.0587***
		(0.0518)			(0.0281)	(0.0171)
	Asian	0.1363***			0.0786*	-0.0105
		(0.0480)			(0.0414)	(0.0414)
	Income <\$40K		0.2030***		0.0781***	0.0749***
			(0.0435)		(0.0247)	(0.0192)
	Income >\$120K		0.3414***		0.2681***	0.1906***
			(0.0376)		(0.0300)	(0.0214)
	Gini - 0.3783 - 0.4174			-0.0669*	-0.0203	0.0092
				(0.0355)	(0.0283)	(0.0248)
	Gini - 0.4174 - 0.4576			-0.0137	0.0333	0.0496**
				(0.0326)	(0.0266)	(0.0238)
	Gini >0.4576			0.2103***	0.2030***	0.1155***
				(0.0313)	(0.0288)	(0.0253)
Luxury Definition		Segment	Segment	Segment	Segment	Model Value
Observation		178,335	190,897	316,583	610,088	610,088

## Demand for Prestige: Peer Emulation

- Demand for prestige is a function of peer's consumption of prestige
  - Keep up with the Joneses' visible prestige
- Prediction: non-prime consumers whose prime neighbors have a higher level of prestige consumption should have higher demand for prestige.

#### Results: Evidence for Peer Emulation

	Dep Var: Relative Log (Model Market Shar				
	(1)	(2)	(3)		
Log (Model Value)	-0.8872***	-0.8347***	-2.3892***		
	(0.0401)	(0.1800)	(0.3017)		
Log (Model Value) × Prime Neighbors' Luxury Share	2.817***	1.4875	3.8768***		
	(0.3515)	(0.9545)	(0.6518)		
Brand Luxury Share	-0.1005	0.2940*	-1.2083***		
·	(0.0878)	(0.1575)	(0.2195)		
Brand Luxury Share × Prime Neighbors' Luxury Share	2.8690***	3.9279***	2.6861***		
, , , ,	(0.6473)	(0.5287)	(0.5696)		
Control for Neighborhood Chars $\times$ Log (Model Value) and X Brand Luxury Share	No	Yes	Yes		
Luxury Definition	Segment	Segment	Model Value		
	319,345	318,649	318,649		

#### Impact of Large Spending on Non-Prime Consumers

- Trade Line level panel regressions, NY Fed/Equifax CCP data
- Observed consumer identifier.

$$Y_{ijt} = \beta_0 + \beta_1 log(Balance)_{ij0} + \beta_2 Score_{ij0} + \delta_i + \tau_t + \epsilon_{ijt}$$

- ▶ *i* borrowers
- j − trade lines
- ightharpoonup t months
- $ightharpoonup log(Balance)_{ij0}$  Initial balance
- $ightharpoonup Score_{ij0}$  Initial credit score

# Delinquency

	Dep Var: auto loan delinquent less than 5 months						
VARIABLES	(1)	(2)	(3)	(4)			
log (Initial Balance)	0.0110***	0.00117***	0.0379***	0.0280***			
	(0.000207)	(0.000122)	(0.000746)	(0.000521)			
Initial Risk Score	-4.31e-05***						
	(4.60e-06)						
Constant	-0.0550***	-0.00670***	-0.293***	-0.216***			
	(0.00366)	(0.00118)	(0.00703)	(0.00495)			
Sample	All	Prime (660-850)	Subprime (280-619)	Non-prime (280-659)			
Observations	7,627,802	5,001,179	1,656,404	2,624,374			
R-squared	0.244	0.203	0.261	0.249			

# Repossessions

		Dep Var: vehicle repossessed							
VARIABLES	(1)	(2)	(3)	(4)					
Log (Initial Balance)	0.00138***	0.000238***	0.00556***	0.00369***					
	(8.29e-05)	(3.39e-05)	(0.000351)	(0.000230)					
Initial Risk Score	-1.22e-05***								
	(2.29e-06)								
Constant	-0.00102	-0.00189***	-0.0360***	-0.0242***					
	(0.00172)	(0.000327)	(0.00327)	(0.00217)					
Sample	All	Prime (660-850)	Subprime (280-619)	Non-prime (280-659)					
Observations	7,627,802	5,001,179	1,656,404	2,624,374					
R-squared	0.300	0.271	0.327	0.313					

## **Credit Scores**

	Dep Var: change from initial score							
VARIABLES	(1)	(2)	(3)	(4)				
Log (Initial Balance)	0.551***	0.527***	-0.982***	-1.047***				
Initial Risk Score	(0.0440) -0.707***	(0.0640)	(0.210)	(0.161)				
	(0.00125)							
Loan Age	0.00283*** (6.91e-05)	0.0114*** (0.000103)	0.00461*** (0.000376)	0.00371*** (0.000290)				
Constant	485.0***	-10.40***	10.44***	8.364***				
	(0.976)	(0.625)	(2.024)	(1.554)				
Sample	All	Prime (660-850)	Subprime (280-619)	Non-prime (280-659)				
Observations	7,619,970	4,993,168	1,652,479	2,619,291				
R-squared	0.543	0.505	0.474	0.459				

## Other Accounts

	Dep Var: delinquency in							
	Any Loan	Any Loan	Mortgage	Mortgage	Credit card	Credit card		
VARIABLES	(1)	(2)	(3)	(4)	(5)	(6)		
Log (Initial Auto Loan Balance)	0.000306***	0.0179***	1.91e-06	0.000776***	-7.61e-05***	0.00399***		
	(1.58e-05)	(0.000121)	(3.65e-06)	(3.38e-05)	(9.89e-06)	(8.17e-05)		
Constant	0.00858***	0.261***	0.000598***	0.0183***	0.00541***	0.125***		
	(4.38e-05)	(0.000325)	(1.01e-05)	(9.05e-05)	(2.73e-05)	(0.000219)		
Sample	Prime	Non-prime	Prime	Non-prime	Prime	Non-prime		
Observations	18,817,166	10,417,767	18,817,166	10,417,767	18,817,166	10,417,767		
R-squared	0.469	0.610	0.247	0.494	0.531	0.562		

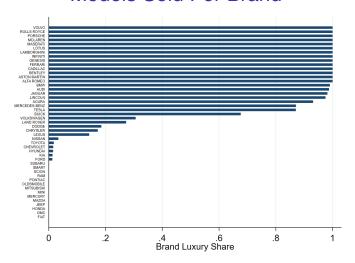
#### Conclusion

- We use a unique vehicle purchase data to analyze conspicuous consumption motives behind non-prime consumers' vehicle buying choices
- Non-prime consumers' demand for expensive vehicles is partially driven up by their preferences for prestigious brands
  - Status Signaling
  - Peer Emulation (Keep Up with the Joneses)
- Larger borrowing on auto loans by non-prime consumers leads to adverse financial consequences

## AutoCount Data: Average Transaction Characteristics

Transaction type	New	Used	All	All	New	Used	New	Used
Prime status	All	All	Υ	N	Υ	Υ	N	N
Amount financed (\$)	30,618	19,483	25,426	21,556	30,638	20,907	30,569	17,915
Vehicle value (\$)	31,280	18,658	26,550	19,310	32,970	20,988	27,287	16,095
Loan-to-value ratio	1.12	1.49	1.21	1.54	1.05	1.34	1.27	1.65
Interest rate (%)	5.25	9.15	4.54	12.13	3.78	5.20	8.72	13.51
Maturity term (months)	69	64	66	66	67	65	73	64
Monthly payment (\$)	517	373	432	426	509	365	535	381
Total (million)	26	40	40	27	18	21	7.8	19

# Measure of Prestige – Share of Luxury Models Sold Per Brand





## **Brand Luxury Premium**

