# Middlemen as Information Intermediaries: Evidence from Used Car Markets 

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Middlemen are everywhere...

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## What are their roles?

1. Facilitate search and matching

- Theory: Rubinstein and Wolinsky (1987), Spulber (1996), Rust and Hall (2003), Wright and Wong (2014)
- Empirical: Gavazza (2016), Hendel, Nevo, and Ortalo-Magne (2009) Salz (wp)

2. Information certifier: Biglaiser (1993) and Lizzeri (1999)

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## What we do...

- Examine the the role of used car dealers in relieving asymmetric information.
- Present a model of dealer experts motivated by features of used car markets.
- Empirically test two key implications of the model:
- Role/Value of Dealers: Dealer price premium is increasing in age.
- Test of AI: Cars sold from private parties turn over more quickly.


## Why do we car(e)?

Academic:

- Used cars classic example of market with AI.
- Dealers are "counteracting institution" in the parlance of Akerloff.

Practical:

- On-line peer-to-peer marketplaces typically have explicit certification/review mechanisms.
- Yet, significant amount of trade happens off-line.
- How do these market function with less developed certification mechanisms?


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## Used Cars

- US total sales $\sim \$ 300$ billion. Roughly $3-4$ times the gross merchandise volume for eBay.
- Cars are complicated machines that require specialized care and maintenance - market ripe with information asymmetries.
- Two-thirds of used car transactions (in our sample) occur through a "dealer." Dealers are regulated, have reputation, and offer warranties and guarantees.


## Model

## Owners (Sellers)

- Used car with two potential quality states: $\{H, L\}$ (private information).
- Car state in private info of owner (seller).
- Quality shock arrives at some rate that changes the state. [Cont. time]
- Liquidity shock arrives at some rate that forces owner to sell.
- Seller can visit dealer with some exogenous probability.


## Dealer

- Runs test to discover true quality of car.
- Makes a take-it-or-leave-it offer (potentially losing).
- Dealer sets selling price and earns price minus cost.
- Receives extra disutilty from selling an $L$.


## Model

## Buyers

- $2+$ buyers, receive single unit of utility from car until it turns bad.
- Simultaneously bid for car - Bertrand competition.
- Observes the vintage, but does not observe quality or whether the car had been inspected by dealer.


## Resales

- In a second "resale" stage, buyers receive liquidity shock with some probability and must sell.
- Buyer may also sell if they do not receive liquidity shock.
- Resale market observes vintage, but not the selling motive or previous seller.


## Model - Important Assumptions

1. Exogenous Liquidity Shock + Dealer Visit

- Induces exogenous mixing of High and Low cars in private market.
- Ex: In Hedel \& Lizerri (1999) - market tranches and distribution of valuations.
- We can allow from some endogenous self selection.

2. Value of High and Low car

- Assumption: Utility from $H$ is greater than $L$.
- Both types depreciate with vintage.
- This difference decreases over time [goes to zero].

3. Dealer cost of selling "lemon"

- Dealer less myopic than private sellers.
- Stories: Damage to long run reputation, warranty costs, regulation.


## Model - Results

## Equilibrium

- Buyers bid expected quality in private market.
- Seller accepts dealers' offer it is greater than outside option.
- Dealers only trade in $H$ type. Price equals buyer's utility.
- Resale market price is nonzero.


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## Dealer Premium

1. Dealer's price premium in dollar terms is humped shaped in age.
2. Dealer's price premium in percentage terms is greater than one and increasing in age.
Intuition: Older cars more likely to be lemons - buyer values dealer certainty. But as cars get really old, depreciation wins out.

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## Car Resales

3. Buyer less likely to resell car if originally purchased from a dealer. Intuition: All lemons want to be sold + liquidity shock cars.

## Data

VA and PA car registrations / transactions

- Transaction date
- VIN (squish) of car
- odometer
- buyer zipcode,
- seller identity (if dealer) or zip (if individual).

VA Data (dealer premium)

- 2007-2014, 5.2 mil transactions
- Observe "squish VIN."

PA Data (resales)

- 2014-2016 1.8 mil. transactions
- Observe full VIN.


## Dealer Premium - Data

Table: Summary of Virginia DMV Data

|  | Mean | SD | Q25 | Q50 | Q75 |
| :--- | :---: | :---: | :---: | :---: | :---: |
| Private Party Transactions |  |  |  |  |  |
| Price | 3,960 | 5,144 | 1,000 | 2,000 | 4,500 |
| Mileage | 134,376 | 67,290 | 92,183 | 132,315 | 171,300 |
| Age | 11.14 | 4.38 | 8 | 11 | 14 |
| Dealer Transactions |  |  |  |  |  |
| Price | 13,032 | 8,518 | 6,349 | 12,000 | 17,779 |
| Mileage | 77,402 | 53,325 | 36,449 | 66,675 | 107,811 |
| Age | 5.99 | 4.05 | 3 | 5 | 9 |
| Dealer Sales: $60.09 \%$ |  |  |  |  |  |
| Total Observations: $5,469,241$ |  |  |  |  |  |

## Dealer Premium - Data

- The dealer's price premium is humped shaped in age.
- The dealer's price premium in percentage terms is increasing in age.



## Dealer Price Premium - Empirical Strategy

- Hedonic price regression with model/make/MY/trim fixed effects.
- Include seller type (dealer) and car age dummy interactions.
- Idea: compare the price of the same type of car between dealers and private sales.
- Use four samples:
- Baseline
- Exclude new-car dealers
- Exclude "unpopular" models
- Exclude age<4


## Dealer Price Premium - Results



## Dealer Price Premium - Results



## Car Resales - Data

Implication: A buyer is less likely to resell his car if the car was purchased from a dealer.

- We take all cars that we observe transacted in 2014 and follow them.

Table: Resales after Purchase

|  | Dealer Sales |  | Private Sales |  |
| :--- | :---: | :---: | :---: | :---: |
| No. of Sales | 648,106 | $(57 \%)$ | 491,290 | $(43 \%)$ |
| Resale within one quarter | 6,150 | $(0.95 \%)$ | 10,865 | $(2.21 \%)$ |
| Resale within two quarters | 12,938 | $(2.00 \%)$ | 19,067 | $(3.88 \%)$ |
| Resale within three quarters | 20,765 | $(3.20 \%)$ | 27,183 | $(5.53 \%)$ |
| Resale within four quarters | 29,661 | $(4.58 \%)$ | 35,843 | $(7.30 \%)$ |

Note: Percentage of cars transacted in 2014 resold after one, two, three, and four quarters. Source: Pennsylvania Department of Transportation.

## Car Resales - Empirical Strategy

- Look at resale rates by 3 month intervals.
- Control for model/make/MY/trim fixed effects.
- Instrument for seller type
- Type of person to buy from dealer is more likely not to resell (high value of time...).
- IV: local make/model dealer inventories.


## Car Resales - Results

Table: Immediate Resale after Purchase: Logit with Product Fixed Effects

|  |  | Resale Time Window |  |  |
| :--- | :---: | :---: | :---: | :---: |
|  | One | Two | Three | Four |
|  | Quarter | Quarters | Quarters | Quarters |
| Bought from Dealer | -0.392 | -0.259 | -0.186 | -0.144 |
|  | $(0.018)$ | $(0.013)$ | $(0.011)$ | $(0.009)$ |
| Log Mileage | 0.135 | 0.179 | 0.176 | 0.170 |
|  | $(0.019)$ | $(0.014)$ | $(0.011)$ | $(0.010)$ |

## Car Resales - IV Results

Table: Immediate Resale after Purchase: Control Function

|  | Fixed Effects Logit |  |  | Control Function |  |
| :--- | :---: | :---: | :---: | :---: | :---: | :---: |
|  | Resale Window |  |  | Resale Window |  |
|  | One | Two |  | One | Two |
|  | Quarter | Quarters |  | Quarter | Quarters |
| Bought from Dealer | -0.540 | -0.441 |  | -0.488 | -0.441 |
|  | $(0.063)$ | $(0.045)$ |  | $(0.062)$ | $(0.045)$ |
| Log Mileage | 0.212 | 0.272 |  | 0.323 | 0.273 |
|  | $(0.070)$ | $(0.051)$ |  | $(0.122)$ | $(0.093)$ |

## Alternative: Middlemen Reducing Search Frictions

- Cars of different ages considered as different sub-markets. In each submarket,
- A monopoly dealer can frictionlessly trade with other parties
- Buyers and sellers with idiosyncratic search costs decide whether go to dealer or search directly for each other


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- Buyers and sellers with idiosyncratic search costs decide whether go to dealer or search directly for each other
- 1. Random Search: distributions of buyers' search cost are identical in all submarkets
- dealer price premium in dollars would be constant in car age, in percentage would be decreasing in car age
- 2. Search and Sorting: distributions of buyers' search cost vary across all submarkets
- dealer share and price premium are positively correlated


## Alternative: Middlemen Reducing Search Frictions

- 3. Search and Market Thickness:
- In thicker markets, products sell quicker and dealer price premium should be lower
- Dealer price premium and time on the market are positively correlated

Table 6: Weeks on the Market before Sale

| Car Age | 1 | 2 | 3 | 4 | 5 | 6 | 7 | 8 | 9 | 10 |
| :--- | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| Mean | 7,39 | 7.15 | 7.09 | 6.88 | 6.27 | 6.03 | 5.85 | 5.58 | 5.19 | 5.02 |
| SE | 6.76 | 6.59 | 6.51 | 6.48 | 5.97 | 5.80 | 5.89 | 5.81 | 5.58 | 5.60 |
| No. of Cars | 20,293 | 19,148 | 19,081 | 11,240 | 8,175 | 6,095 | 8,515 | 7,520 | 6,616 | 5,854 |
| Car Age | 11 | 12 | 13 | 14 | 15 | 16 | 17 | 18 | 19 | 20 |
| Mean | 4.96 | 4.71 | 4.39 | 4.27 | 4.25 | 4.08 | 3.86 | 3.61 | 4.18 | 3.85 |
| SE | 5.72 | 5.64 | 5.54 | 5.72 | 5.73 | 5.31 | 5.53 | 4.54 | 5.17 | 5.30 |
| No. of Cars | 5,039 | 4,016 | 3,036 | 2,127 | 1,654 | 1,158 | 748 | 594 | 360 | 293 |

Note: This table reports the means and standard deviations of weeks before sale for dealer cars by car age. It also reports the number of dealer cars that were on sale by car age. The sample includes 131,567 used cars sold by dealers in four areas of Pennsylvania from January 2015 to July 2016. Source: Pennsylvania Department of Transportation and Cars.com.

## Summary and Discussion

- We present a model where dealers act as experts to screen cars based on privately informed quality.
- The model predicts
- The premium a dealer can charge is increasing in the age of the cars.
- Buyer less likely to resell car if originally purchased from a dealer.
- We find empirical support for these implications in car registrations data.
- Findings suggests dealers play an important role in certifying quality and resolving information asymmetries, which is captured through a dealer premium.

