## Price Discrimination and Food Waste

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Presented at National Academy of Sciences, Engineering, and Medicine Washington, DC.

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October 17, 2018


## Introduction

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- Scale of food waste problem is well-understood:
- $\$ 165$ billion in value (Buzby et al. 2014)
- $25 \%$ of fresh water (Hall et al. 2009)
- 18\% of volume in landfills (EPA 2016)
- 300 million bbls of oil (Hall et al. 2009)
- Waste at retail level alone is substantial:
- 19.5 million tonnes of edible food
- Sources of pre-consumer food waste
- Farmers: Harvesting all food not optimal
- Retailers: Price discriminate by quality-grading
- Minimum quality standards
- Maintain reputation for high-quality produce
- Results in excess supply of graded products
- Substantial loss in farm value
- Evidence that consumers will buy: Imperfect Produce


## Distribution of Food Quality / WTP



## Objective

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- To explain how quality-based price discrimation leads to retail loss
- To empirically test price-discrimination hypothesis
- To determine the degee of loss in a fresh supply chain
- To demonstrate new loss-identification strategy
- To show impact of price-discrimination on retail and farm revenue


## Contribution

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- Explain retail loss as consequence of optimizing behavior
- Devise identification strategy for supply-chain loss
- Estimate of retail loss due to quality-based price discrimination
- Estimate impact on value lost in supply chain due to WTP for quality


## Economic Model

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- Consumers demand produce with higher quality
- Retailers maximize profit subject to grading standard
- Grading standard is costly to maintain
- We derive an equilibrium quality standard
- Two cases:
- Case 1: Farmers do not produce enough to meet standard
- No food waste when grading cost are sufficiently low
- Case 2: Farmers produce more than enough
- Graded food sent to retail channel priced out of consumer's reach
- Simulate potential for loss in retail channel
- Scale of retail food waste problem:
- Retail price discrimination potential driver of food waste
- For reasonable parameters, retail loss $=37.5 \%$


## Data

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## Retail Scanner Data

- Nielsen Scantrack data for bagged fresh apples
- Every store of major US retail supermarket chain
- 52 weeks from Oct. 2014 - Oct. 2015
- Six varieties of apples:
- Ambrosia
- Fuji
- Gala
- Honeycrisp
- Jazz
- Pink Lady
- 14 different UPCs over bagged items
- Quality data from agronomic literature
- Miller, et al. $(2004,2007)$
- Henroid et al. (2008)
- Wholesale prices from Washington Tree Fruit Assn.


## Retail Data

| Item | Description | Measure | Units | Value | Std. Dev. |
| :---: | :---: | :---: | :---: | :---: | :---: |
| Item 1 | Ambrosia, 4 lb . | Retail Price | \$/lb | 1.7894 | 0.1667 |
| Item 2 | Fuji, 5 lb . | Retail Price | \$/lb | 1.2133 | 0.2095 |
| Item 3 | Fuji, 6 lb . | Retail Price | \$/lb | 1.2366 | 0.0984 |
| Item 4 | Fuji, 7 lb . | Retail Price | \$/lb | 1.0241 | 0.0954 |
| Item 5 | Gala, 5 lb . | Retail Price | \$/lb | 1.2059 | 0.2415 |
| Item 6 | Gala, 6 lb . | Retail Price | \$/lb | 1.1973 | 0.1408 |
| Item 7 | Gala, 7 lb . | Retail Price | \$/lb | 0.9899 | 0.1032 |
| Item 8 | Gala, 8 lb . | Retail Price | \$/lb | 0.8614 | 0.1225 |
| Item 9 | Honeycrisp, 4 lb . | Retail Price | \$/lb | 2.3584 | 0.4606 |
| Item 10 | Jazz, 4 lb . | Retail Price | \$/lb | 1.6063 | 0.1942 |
| Item 11 | Jazz, 4 lb . | Retail Price | \$/lb | 1.3948 | 0.0383 |
| Item 12 | Pink Lady, 2 lb . | Retail Price | \$/lb | 3.4389 | 0.1603 |
| Item 13 | Pink Lady, 4 lb . | Retail Price | \$/lb | 1.4132 | 0.1810 |
| Item 14 | Pink Lady, 5 lb . | Retail Price | \$/lb | 1.3632 | 0.0950 |

## Empirical Model

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## Empirical Model

- Estimate random utility model of demand
- Standard, mixed-logit form
- Allow for non-linear preference for quality
- Consistent with empirical IO literature (McManus 2007)
- Preference for quality randomly distributed over consumers
- Recover shape of WTP for quality:
- Non-parametric, kernel-density estimator
- Epanechnikov (1969) weighting function
- Allows for non-normal empirical distributions
- Compare to distribution of quality grown on farm:
- Log-normal distribution
- Shifts according to variety
- Henroid, et al. (2008)


## Results

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Table 2. Empirical Model of Price Discrimination: Non-Linear

|  | Model 1: Fixed |  | Model 2: Random |  |
| :--- | :---: | ---: | ---: | ---: |
| Variable | Estimate | Std. Err. | Estimate | Std. Err. |
| Random Parameter Means |  |  |  |  |
| Quality | 0.0538 | 0.0007 | 0.5832 | 0.0636 |
| Price | -0.3597 | 0.0084 | -0.3408 | 0.0059 |
| Random Parameter Std. Devs. |  |  |  |  |
| Quality |  | 0.0207 | 0.0023 |  |
| Price |  | 0.0770 | 0.0003 |  |
| Random Parameter Function |  |  |  |  |
| Qual (Variety 2) |  | 0.0132 | 0.0197 |  |
| Qual (Variety 3) |  | 0.0513 | 0.0199 |  |
| Qual (Variety 4) |  | 0.0119 | 0.0110 |  |
| Qual (Variety 5) |  | 0.0419 | 0.0483 |  |
| Qual (Variety 6) |  | 0.0495 | 0.0315 |  |
| LLF | -3851.23 | -235.974 |  |  |

## Results

Table 3. Non-Parametric Kernel Density Estimates

|  | Linear Model |  | Non-Linear Model |  |
| :--- | ---: | ---: | ---: | ---: |
|  | Empirical | Log-Normal | Empirical | Log-Normal |
| Bandwidth | 0.0354 | 0.0353 | 0.1853 | 0.1850 |
| Mean | 1.6011 | 1.6011 | 0.2379 | 0.2379 |
| Standard | 0.2089 | 0.2086 | 1.0947 | 1.0929 |
| Skewness | 0.2918 | 0.0000 | 1.5326 | 0.0000 |
| Kurtosis-3 | -1.3139 | -0.0380 | 2.8910 | -0.0380 |
| $\chi^{2}$ | 6.5485 | 0.0047 | 52.7325 | 0.0047 |
| Minimum | 1.2844 | 0.8705 | 0.0066 | 0.0005 |
| Maximum | 1.9373 | 2.3317 | 0.6137 | 1.0934 |
| Points | 1062 |  | 1062 |  |
| \% Food Loss | 10.0814 |  | 12.0732 |  |

Note: Kernel densities estimated with Epanechnikov function.

## Density of WTP for Quality



## Results

| Table 4. Estimates of Farm Value Loss (\$ mil.) |  |  |  |
| :--- | ---: | ---: | ---: |
| WTP Quality | Loss (\%) | Retail Value | Farm Value |
| Baseline | $10 \%$ | $\$ 350$ | $\$ 109$ |
| $1 \%$ | $21 \%$ | $\$ 746$ | $\$ 231$ |
| $2 \%$ | $31 \%$ | $\$ 1,099$ | $\$ 341$ |
| $5 \%$ | $44 \%$ | $\$ 1,551$ | $\$ 481$ |
| $10 \%$ | $49 \%$ | $\$ 1,722$ | $\$ 534$ |

Note: Farm share from ERS-USDA (2018)

## General Equilibrium Considerations

- Farm value lost due to retail quality discrimination
- Value can be recovered by:
- Secondary markets: eg. sharing economy
- Direct markets: eg. farmers markets
- Donation markets: eg. food banks
- What if we used the whole distribution of quality?
- Average price falls
- Quantity demanded increases
- Returns per acre may rise
- Long run increase in acreage possible
- Lower imports for tradable produce
- More complete use of planted acreage
- Small "rebound" effect possible


## Conclusions

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- Quality-based price discrimination can generate surplus food
- Farmers produce a continuous distribution of quality
- Retailers have an incentive to truncate that distribution
- We test this hypothesis using store-level scanner data
- Fresh produce sold through retailers is:
- Horizontally differentiated
- Vertically differentiated
- We use variety-, package-,market-variation to identify WTP for quality
- Distribution of quality preference is recovered via kernel density
- We find that retailer behavior is responsible for $10 \%$ loss in apples
- Retail loss represents $\$ 100.0 \mathrm{~m}$ opportunity to gain farm-revenue
- Loss due to retail intermediation likely similar for other products


## Thank you! Questions?

