

# Behavioral Industrial Organization\*

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\*Thanks to Hunt Allcott for providing concise slides on Grubb and Osborne (2015) that were the basis for slides 29–45.

# What is Behavioral Industrial Organization?

- Standard IO: Profit maximizing firms and expected utility maximizing consumers with correct beliefs.
- Sometimes the simplification is a bad approximation.
- Behavioral IO: Enrich models with more realistic models of behavior for market participants.

# Behavioral Industrial Organization

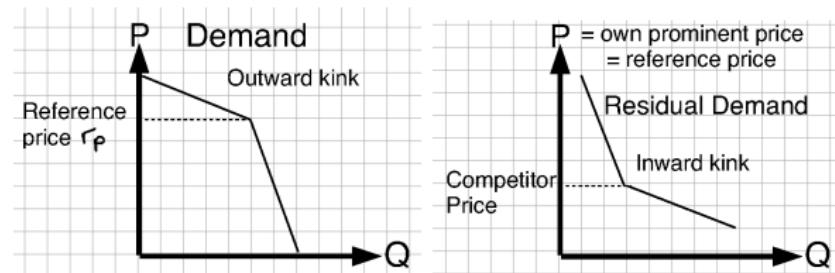
- Behavioral Consumers
  - ① Non-Standard Preferences
  - ② Failing to choose the best price due to
    - ① Suboptimal Search
    - ② Confusopoly: Confusion Comparing Prices
    - ③ Excessive Inertia
  - ③ Overconfidence & Systematic Misweighting
- Behavioral Managers and Firms
  - Firms are run by people, and people make mistakes...

# Behavioral Consumers: (1) Non-standard Preferences

- How do profit maximizing firms respond to consumers that are
  - Loss averse? (Grubb, 2015c; Heidhues and Köszegi, 2018, 5.1)
  - Present biased and sophisticated? (Heidhues and Köszegi, 2018, 5.2))
  - Conspicuous consumers? (Heidhues and Köszegi, 2018, 5.3))
  - Fairness loving?
  - Status-seeking?
  - Ambiguity averse?
- Market response maybe be beneficial or exploitative.
  - Beneficial example: Offering commitment devices.
    - Seems rare in practice (Laibson, 2015).

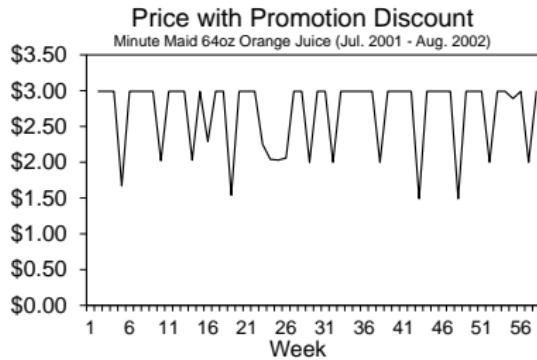
# Example: Selling to Loss Averse Consumers I

- ① First-order risk aversion (Kőszegi and Rabin, 2007)
  - Consumers demand insurance for small risks
  - Firms charge flat rates (Herweg and Mierendorff, 2013)
- ② Comparison Effect: Kinks in demand curves
  - Heidhues and Kőszegi (2014) & Spiegler (2012):
    - Fixed reference point  $\rightarrow$  outward kink  $\rightarrow$  rigid pricing
    - Price increases coded as losses—loom larger than price cuts
    - Focal prices & low pass-through
  - Zhou (2011):
    - Firm set reference point  $\rightarrow$  inward kink  $\rightarrow$  random pricing



## Example: Selling to Loss Averse Consumers II

- ③ Stochastic pricing: Low prices create *attachment* (raising WTP) and high prices exploit
  - Interpretation: Hurts consumer by *lowering* utility of not buying
  - Regular prices and sales (Heidhues and Kőszegi, 2014)



- Black Friday pricing (Rosato, 2016)
- ④ Managing expectations matters (Karle and Peitz, 2014, 2017)
  - Firms delay full disclosure to exploit attachment effect
  - Mandating early disclosure can lower prices & raise CS

## Behavioral Consumers: (2) Failing to choose the best price

Consumers tend to (Grubb, 2015a):

- ① Search too little
  - Example: U.S. Mortgage market (broker segment)
  - Woodward and Hall (2012): gain visiting 1 more broker  $\approx \$1,000$
  - Conclusion: reject rational search
- ② Miscompare prices or quality (confusion)
  - Example: U.K. electricity tariff choice. Wilson and Waddams Price (2010): 6–12% of those switching for a cheaper rate switch to a plan dominated by original tariff
- ③ Switch too little (excessive inertia)
  - Example: Choosing employer based health insurance plan
  - Handel (2013): average switching cost  $\approx \$2,000$
  - Conclusion: additional sources of inertia such as inattention (Kiss, 2014), forgetting, or procrastination (Madeira, 2015).

## Behavioral Consumers: (2) Failing to choose the best price

Lack of search & price confusion → *noisy* choices.

- Decision errors differ across consumers
- Firm perspective—like spurious product differentiation
- Creates market power → raises markups even with many sellers

## Behavioral Consumers: (2) Failing to choose the best price

Lack of search & price confusion → *noisy* choices.

- Decision errors differ across consumers
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- Creates market power → raises markups even with many sellers

Connection to Dimitry's talk on Thursday

- With differentiated firms and/or outside option, noisy choices are also allocatively inefficient (but harder to identify mistakes)

## Firms obfuscate to dampen search.

Example: Drip pricing

- Lab: Drip pricing profitably dampens search (OFT, 2010)
- Field: Retailers hide price in S&H fees to defeat price comparison engine (Ellison and Ellison, 2009)
- Theory: Firm's raise own search costs in equilibrium (Wilson, 2010; Ellison and Wolitzky, 2012).

# Confusopoly: Consumer confusion about quality

Screenshot of CVS.com website showing product comparison between CVS Aspirin and Bayer Aspirin.

**CVS.com Header:** CVS.com | MinuteClinic | Photo | Optical | Welcome to CVS.com! | Sign In or Create an Account | Español | Store Locator | CVS 10% myWeekly Ad | myCVS® Store | 999 WATERTOWN STREET, WEST NEWTON, MA 02465 | Change Store | + Feedback

**Product Comparison:**

Product	Image	Price	Rating	Stock Status
CVS Aspirin 325 Mg Coated Tablets Regular Strength		\$2.49 (2.5¢ / ea.)	★★★★★ (1)	FREE Shipping Eligible Ship & Save Eligible
Bayer Aspirin Safety Coated 325 Mg Caplets		\$6.99 (7.0¢ / ea.)	★★★★★ (1)	FREE Shipping Eligible

**Product Details:**

- CVS Aspirin 325 Mg Coated Tablets Regular Strength:
  - Size: 100 EA
  - FREE Shipping Eligible
  - Ship & Save Eligible
- Bayer Aspirin Safety Coated 325 Mg Caplets:
  - Size: 100 EA
  - FREE Shipping Eligible

**Offer:** Buy 1, Get 1 50% Off [View Deal Details](#)

**Comparison Summary:**

- Bayer (\$6.99) vs. Store brand (\$2.49)
  - Same active ingredient
  - Same dosage
  - Same directions
  - Same pill count
  - Both coated tablets
- National aspirin brands 25% of sales, 60% of expenditure.

# Confusopoly: Consumer confusion about quality

Bronnenberg, Dubé, Gentzkow, and Shapiro (2015)

Aspirin Market	Brand name sales share
Typical Consumers	26%
Pharmacists	9%
Pharmacist couples	Data unavailable

Were all consumers pharmacists:

- Prices fall 37%
- Expenditure falls 15% (\$435 million)

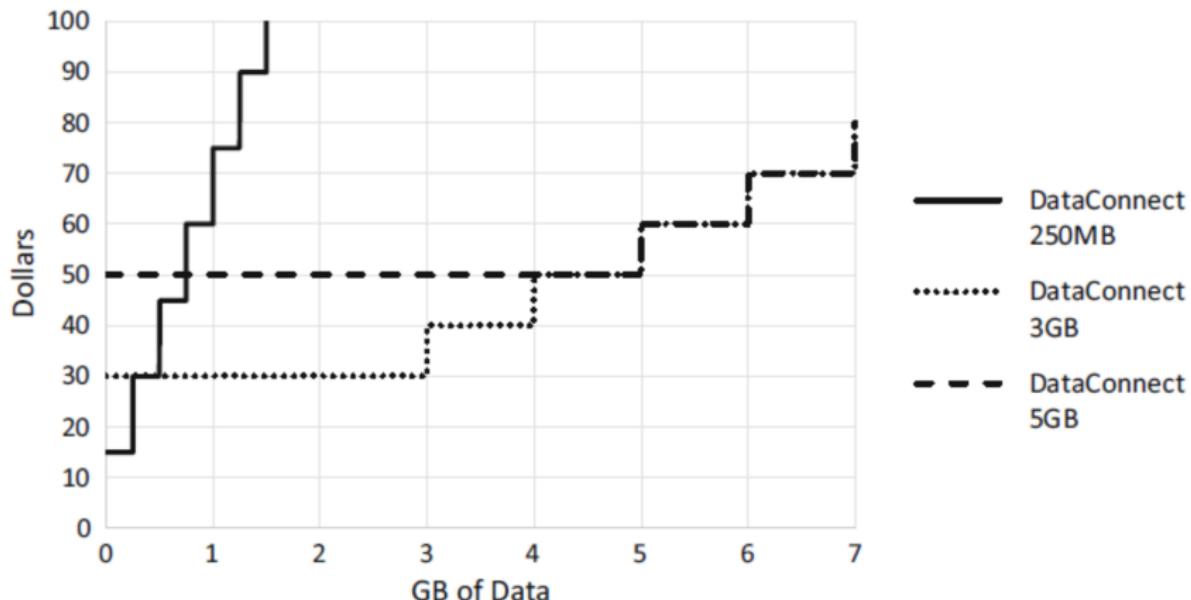
# Which plan would you choose for Netflix on your iPad?

## DataConnect Plans for:

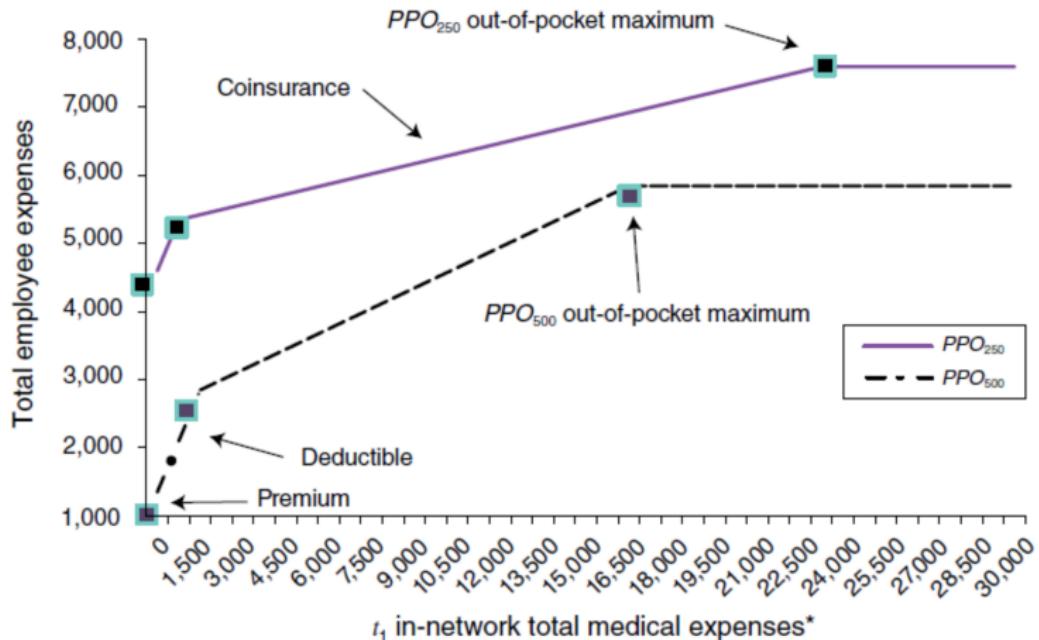
iPad, Tablets, Camera and Gaming Devices

Data ?	Plan Charges	AT&T Wi-Fi Access ?	Domestic Overage Fees ?	Canadian Data ?	International Data ?	
DataConnect 250MB	\$14.99	✓	\$14.99 per 250 MB	\$0.015/KB	\$0.0195/KB	<a href="#">Add</a> <a href="#">View details</a>
DataConnect 3GB	\$30.00	✓	\$10.00 per 1 GB	\$0.015/KB	\$0.0195/KB	<a href="#">Add</a> <a href="#">View details</a>
DataConnect 5GB	\$50.00	✓	\$10.00 per 1 GB	\$0.015/KB	\$0.0195/KB	<a href="#">Add</a> <a href="#">View details</a>

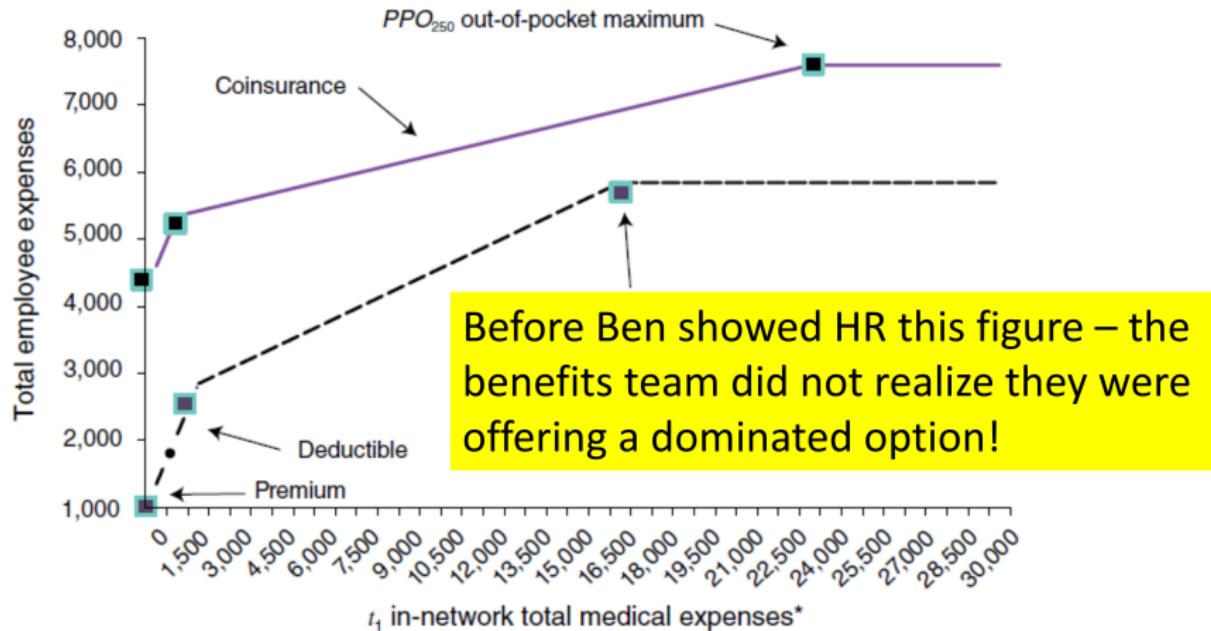
# Which plan would you choose for Netflix on your iPad?



## 7% new employees choose dominated plan (Handel 2014)



## 7% new employees choose dominated plan (Handel 2014)



# Confusopoly: Price Obfuscation

## Model

- Homogenous good Duopoly, unit demand
- Firms simultaneously choose a price and a price frame
  - Ex: Inclusive price (\$9.99) vs. partitioned price (\$1.99 plus \$8 S&H)
- $\pi(x, y) = \Pr(\text{can compare prices across frames } x \text{ and } y)$
- Those who cannot compare prices choose randomly

## Insights

- Firms obfuscate
- Firms may choose more complex frames and higher prices with
  - more competitors (Chioveanu and Zhou, 2013)
  - increased comparability of simple frames (Piccione and Spiegler, 2012)
- Firm response can undermine transparency policies

# Behavioral Consumers: (3) Overconfidence and systematic misweighting

Consumers often misweight product attributes

- Example: underweight hidden fees

Themes

- Behavioral First Welfare Theorem:
  - Competition maximizes joint *perceived* surplus
- Firms exploit biases with complicated pricing features
- Exploitation (intensive margin) distortion
- Participation (extensive margin) distortion
- Cross-subsidies & Ripoff externalities
  - Firms can facilitate exploitation of the naïve by the sophisticated

# Firms complicate contracts to exploit bias



# Firms hide costs in hidden fees and add hurdles and traps to exploit overoptimism about navigating contract terms

- Consumers underweight hidden fees



- Firms charge hidden fees
- Overoptimism about remembering to act (prospective memory)  
Overoptimism about procrastination (self-control)
  - Firms set memory hurdles & procrastination traps
  - Free trials, teaser rates, and auto-renewal
  - Mail-in rebates
  - Bonus cash back (quarterly activation required)
- Overoptimism about attention
  - Firms set attention hurdles—price changes at thresholds
  - Overdraft fees, Credit card-over limit fees, Data overage charges, Frequent flyer awards

## Firms distort contracts to exploit biased usage forecasts

- Overestimate usage → distort marginal price ↓ and quality ↑
- Underestimate usage → distort marginal price ↑ and quality ↓

# Exploiting overprecision of demand forecasts

Grubb (2009): Overprecision: correctly forecast median data use  $Q$  but underestimate variance of data needs

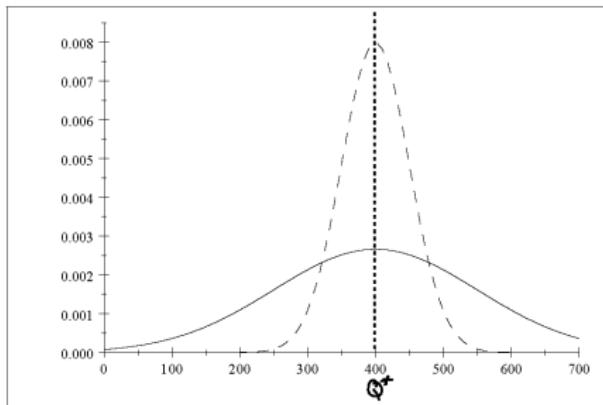


Figure 1  
Three-Part Tariff Pricing

- Overestimate using  $q^{th}$  MB for  $q < Q$ : Distort marginal price ↓
- Underestimate using  $q^{th}$  MB for  $q > Q$ : Distort marginal price ↑
- → 3-part Tariff (data overages, data throttling, car lease, overdraft fees, credit card teaser rates,...)

# Exploiting overoptimism about self control

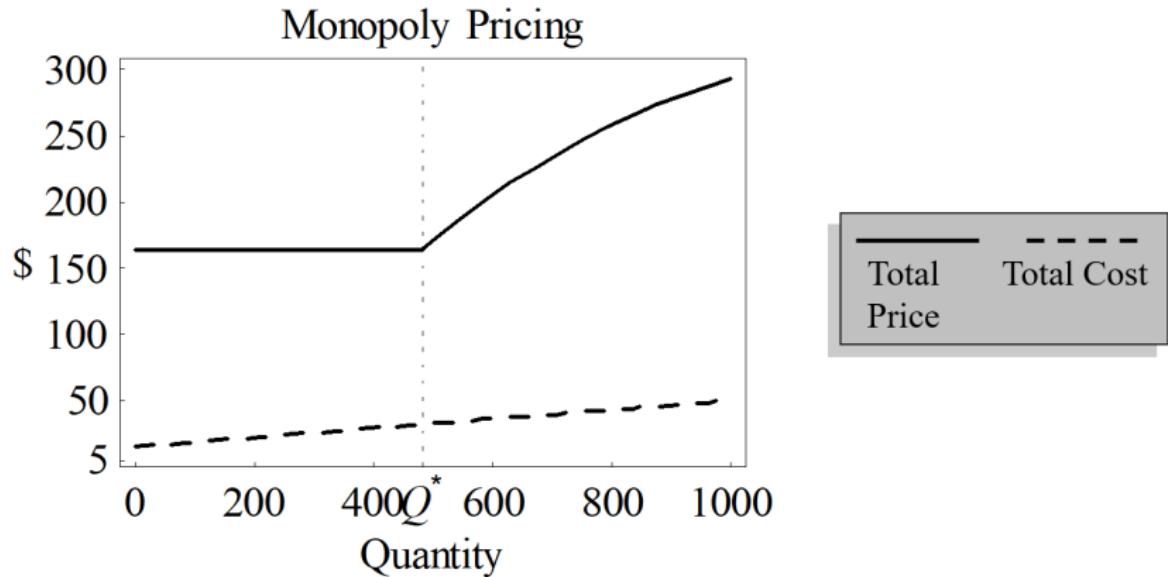
DellaVigna and Malmendier (2004)

- Investment goods: present costs, future benefits
  - Gym workout, language class
  - Overconfident → overestimate usage
  - High up-front fees, low usage fees, high quality

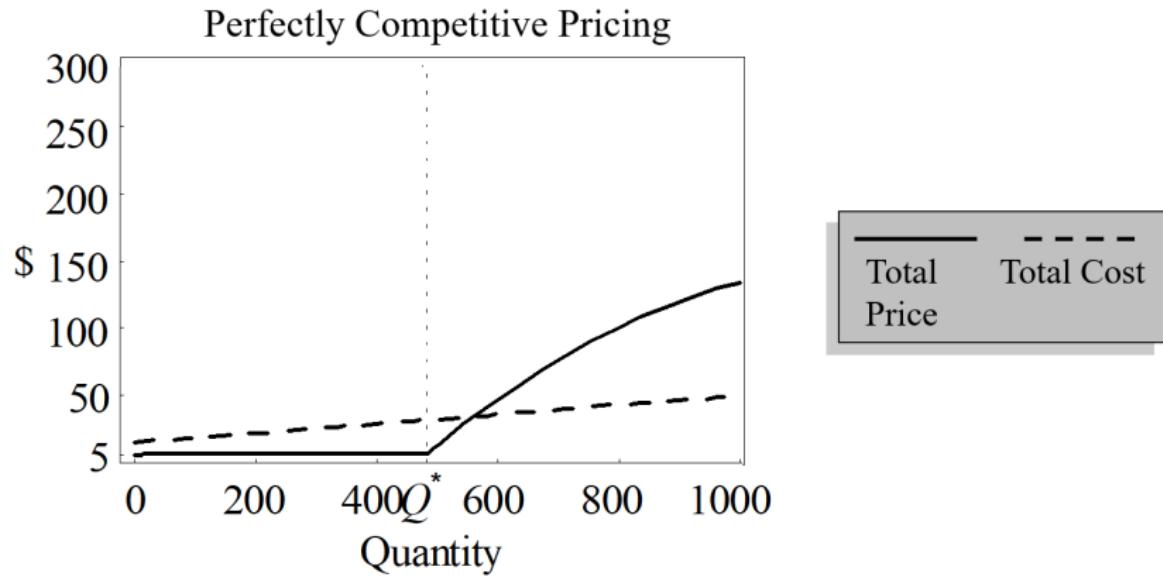
DellaVigna and Malmendier (2006) “Paying not to go to the gym”

- Members with \$70/mo flat-rate membership attend avg. 4.3/mo
- ≈ \$17 per visit
- Buying \$10 day passes would save \$600 during their membership.

## Complex pricing is robust to competition



# Complex pricing is robust to competition



How does systematic misweighting affect welfare?

# Ripoff Externalities

Suggested papers: Gabaix and Laibson (2006), Bubb and Kaufman (2013), and Armstrong (2015)

## Model

- Bank cost  $c$  per account, monthly account fee  $p$ , hidden fee  $a \leq \bar{a}$
- $(1 - \alpha)$  Ninjas: Avoid fees
- $\alpha$  Naive: Pay  $a$  in fees, but don't realize (OC in ninja skills / unaware)
- $\pi = p + \alpha a - c$

Competitive Equilibrium:  $a = \bar{a}$  and  $\pi = 0 \rightarrow p = c - \alpha \bar{a}$

- Ninjas pay  $p = c - \alpha \bar{a} < c$
- Naive pay  $p + \bar{a} = c + (1 - \alpha) \bar{a} > c$

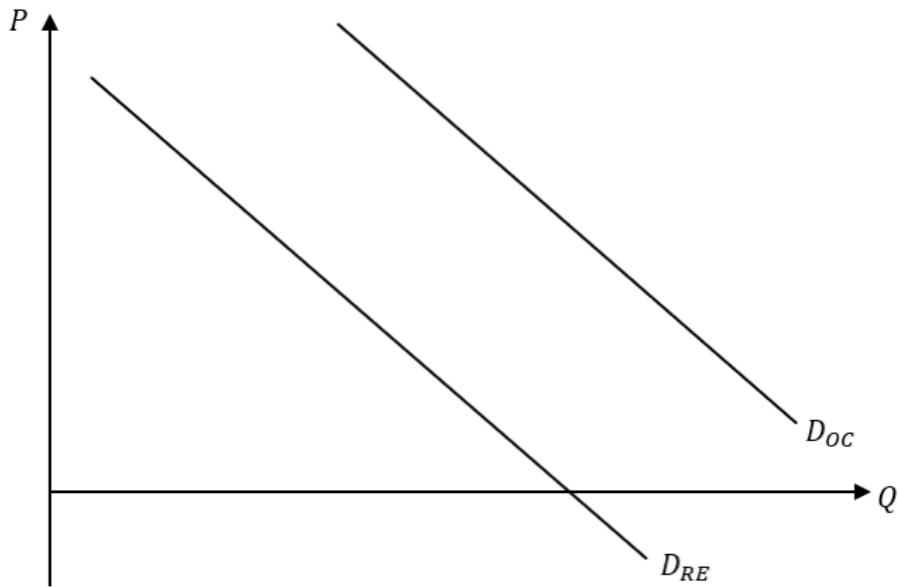
## Insight

- Naive consumers cross-subsidize Ninjas
- Naive payment increases in # Ninjas  $\rightarrow$  Ninja training camp can save some naifs, but those who do not attend are made worse off!

# How does systematic misweighting affect welfare?

- Usage on the intensive margin? (Exploitation distortions)
  - Marginal price distortions distort usage on the intensive margin
    - Hidden checked bag fees encourage competition for carry-on space
    - High overage rates discourage data use
  - Complicated contract terms lead to socially wasteful effort
    - Filling out mail-in rebates
    - Tracking account balances
- Purchase on extensive margin? (Participation distortion)
- Distribution of surplus between firms and consumers?

## Competitive Case with Homogeneous Bias (Grubb, 2015b)

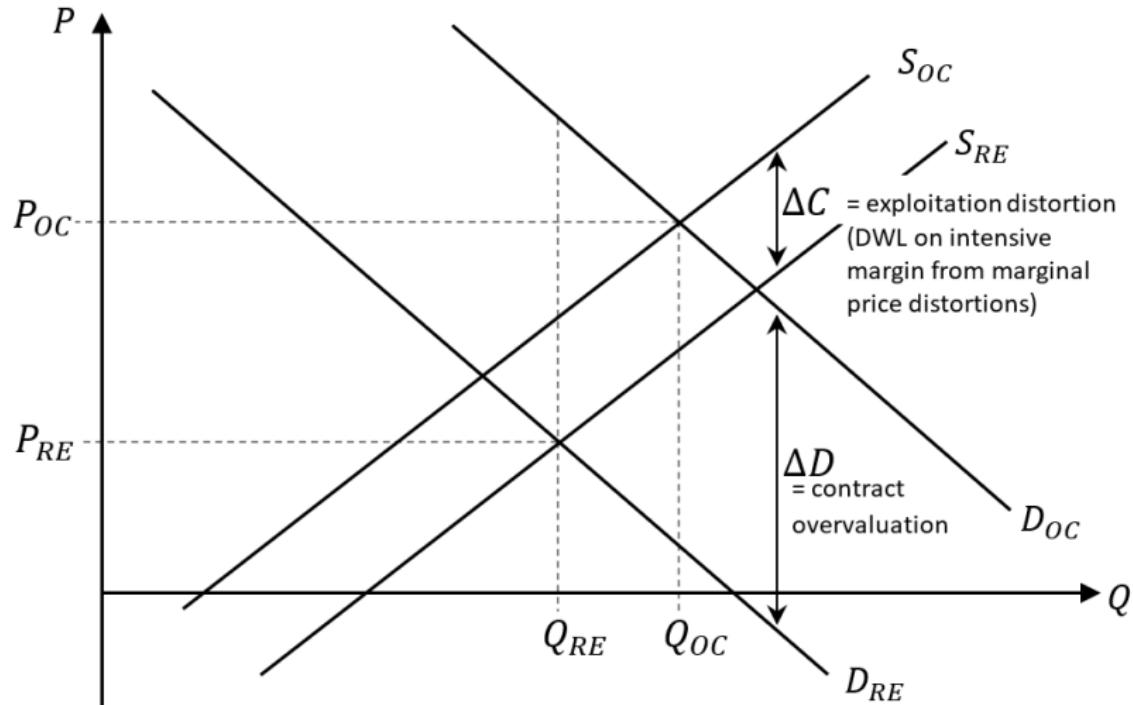


- RE = Rational Expectations (True welfare relevant preferences)
- OC = Overconfident (Biased demand)

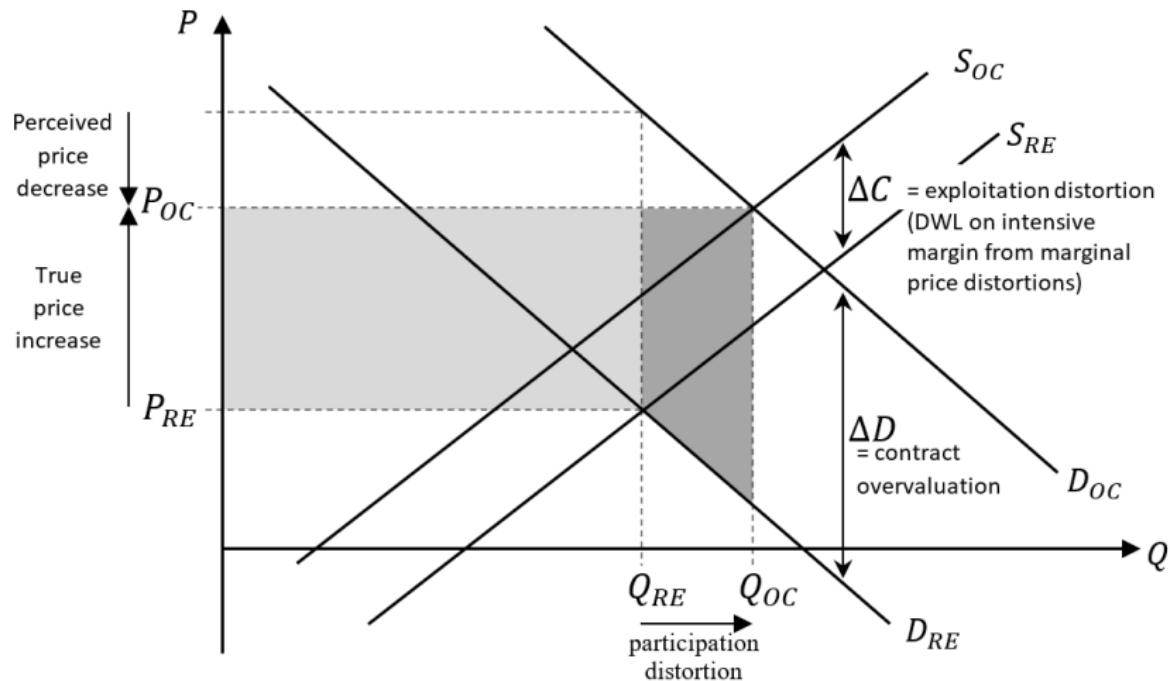
## Example

- MC data = 0
- RE: Wireless plan = \$50/mo unlimited data.
  - “contract” =  $p_{RE}$  = unlimited data
  - “price” =  $P_{RE}$  = \$50.
- OC: Wireless plan = \$40/mo, 5 GB data, and \$1 per 100 MB overage  
Consumers pay \$10 overage & forgo \$5 value of curtailed data usage.
  - $P_{OC} = \$55$  (not \$40!)
  - “contract” is
    - $p_{OC} =$  “5 GB data, \$1 per 100 MB overage, and \$15 cash back”.
  - \$15 refund offsets:
    - \$10 in overage fees and \$5 value of forgone data usage
    - Makes contracts comparable (same  $U$ )
  - $\Delta C = \$15 \text{ refund} - \$10 \text{ overage} = \$5 = \text{Exploitation distortion}$

# Competitive Case with Homogeneous Bias (Grubb, 2015b)



# Competitive Case with Homogeneous Bias (Grubb, 2015b)



## Price changes depend on pass-through

Given constant pass-through rate  $\rho$ :

- Overconfidence inflates true price (of utility  $U$ ):

$$\Delta P = P_{OC} - P_{RE} = (1 - \rho) \Delta D + \rho \Delta C$$

- Overconfidence reduces perceived price:

$$\Delta P^* = \Delta P - \Delta D = -\rho (\Delta D - \Delta C)$$

- Expressions hold with firm market power  
(even though the figure does not)

## Grubb and Osborne (2015)

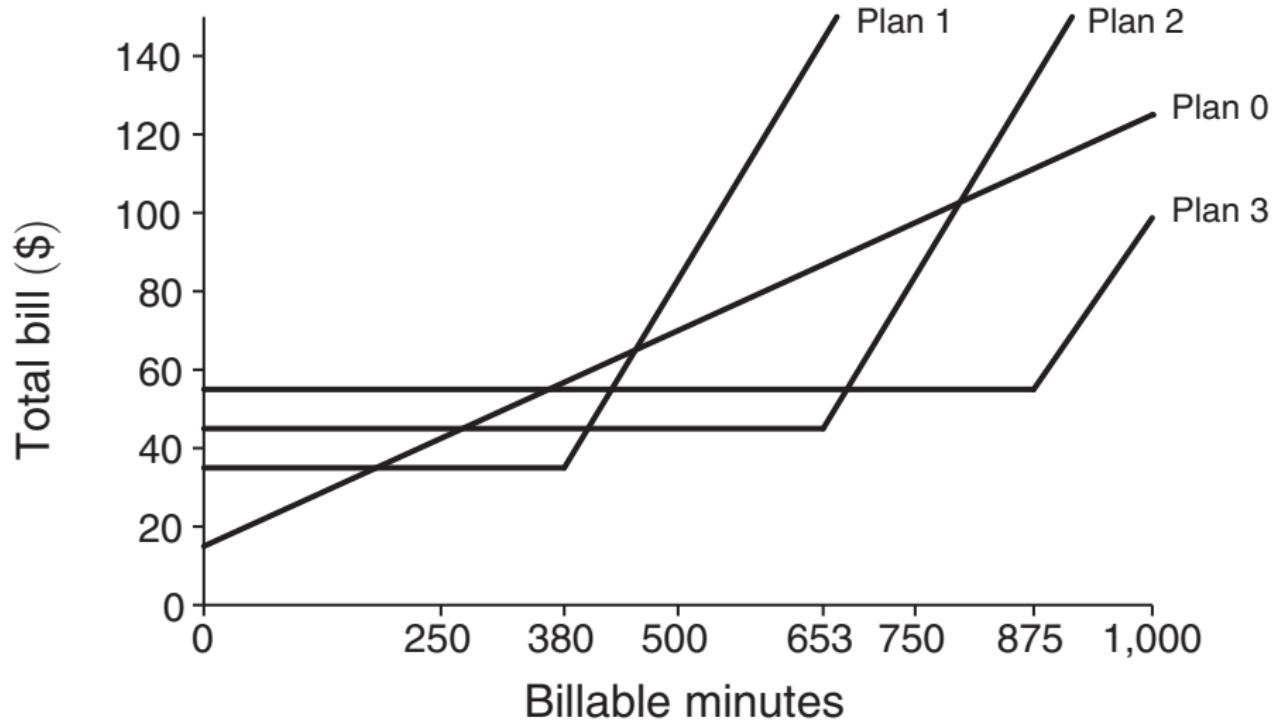
- Research question: what are the welfare effects of alerting cellular phone customers when they exceed usage allowances?
- Policy: cellular carriers agreed to provide alerts as of April 2013
- Key intuition:
  - Holding prices fixed, “unshrouding” prices benefits consumers
  - But firms offset this by increasing base good prices in equilibrium
- Approach:
  - Structural model of cellular phone usage, including estimates of bias
  - Counterfactuals with endogenous pricing

## Data and Stylized Facts

## Grubb and Osborne (2015): Data

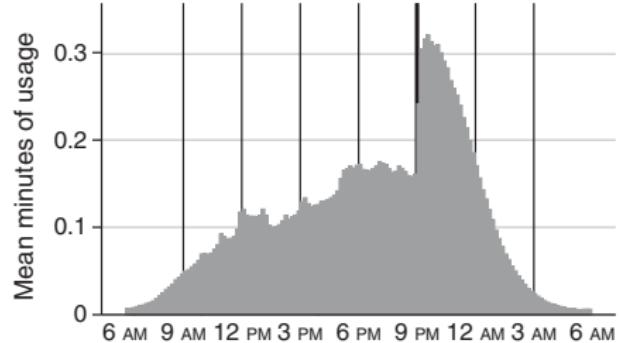
- Monthly billing record for students at a major university who were customers of a national cellular carrier
  - Limit to August 2002–July 2004, and subscribers who newly joined during that period
  - 1,261 subscribers
- Choice set: prices and characteristics of all plans available from any carrier

## Available plans

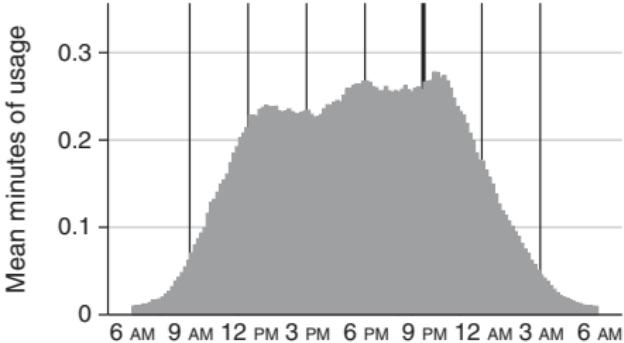


# Fact 1: Consumers are price sensitive

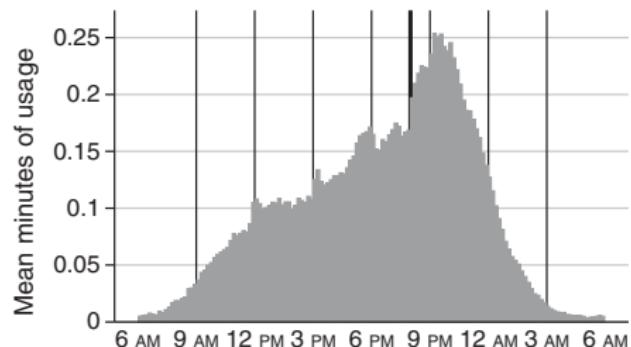
Panel A. Weekday (peak 6 AM–9 PM)



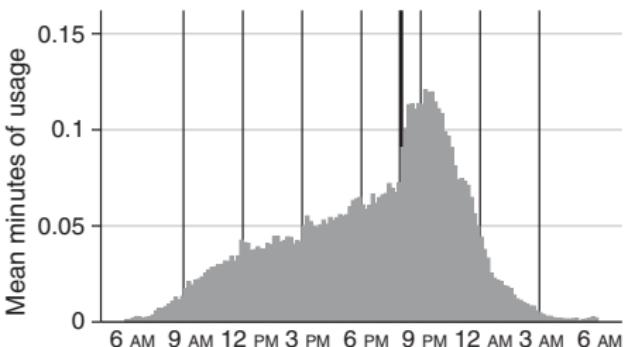
Panel B. Weekend (peak 6 AM–9 PM)



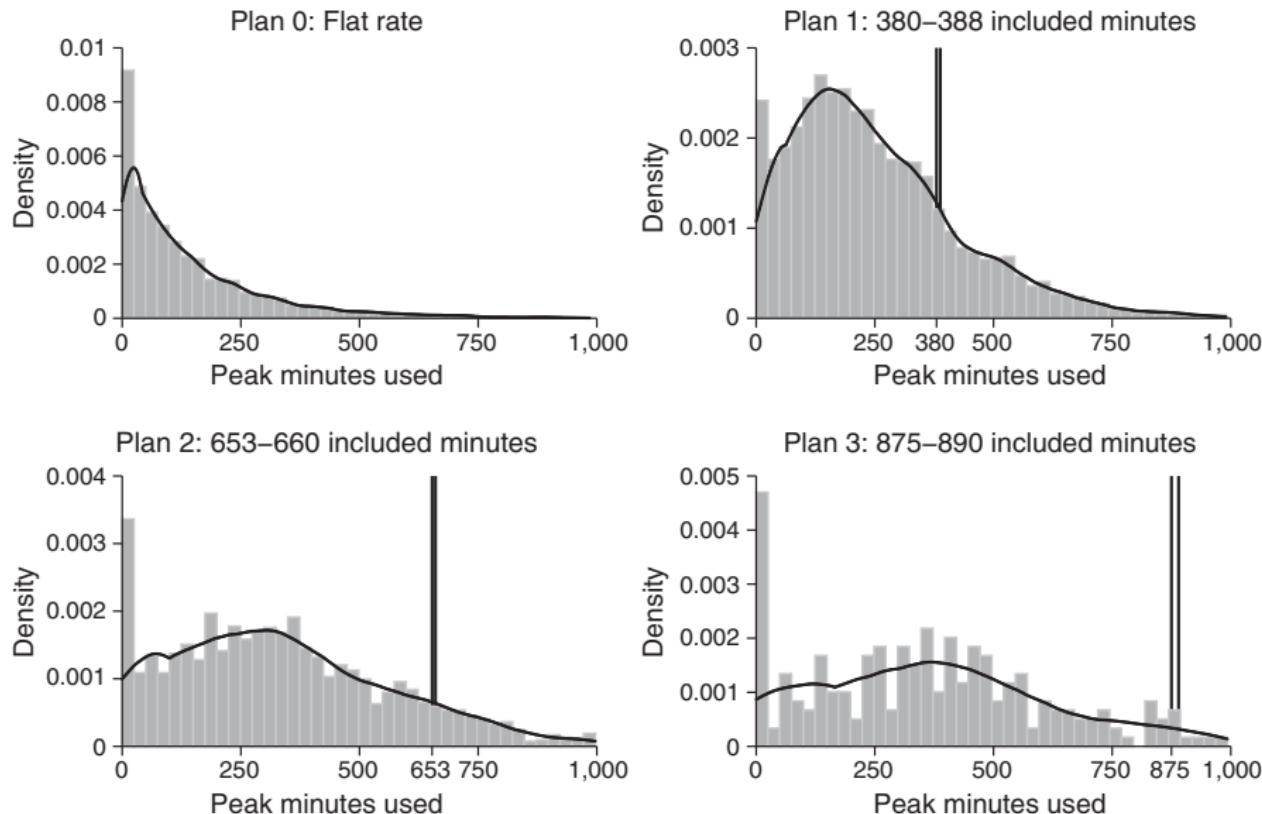
Panel C. Weekday (peak 7 AM–8 PM)



Panel D. Weekday outgoing landline (peak 7 AM–8 PM)

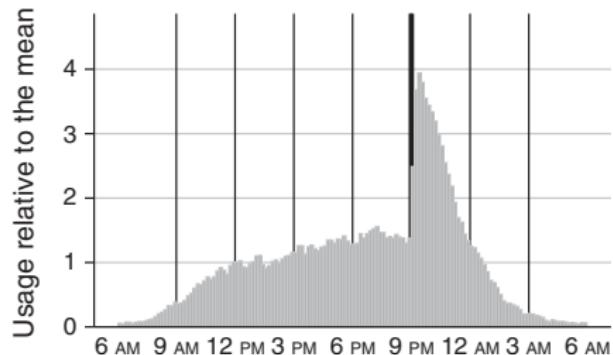


## Fact 2: No bunching at included minute limits



## Fact 3: Still wait for off-peak even when far below allowance

Panel A. First three weeks



Panel B. Final week

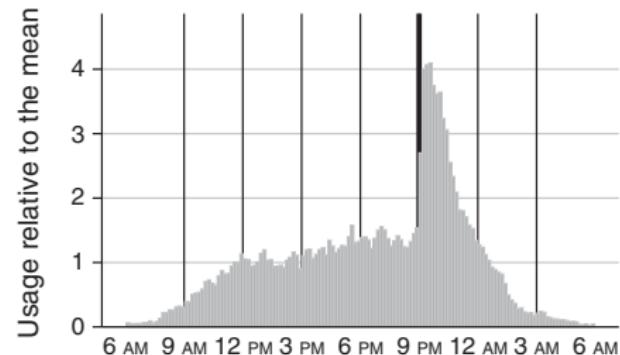


FIGURE 4. WEEKDAY USAGE PATTERNS IN MONTHS SUBSTANTIALLY BELOW ALLOWANCE

## Fact 4: Average consumer could have saved money with a less convex or larger plan

TABLE 1—SAVINGS OPPORTUNITIES

Opportunity	(1)	(2)	(3)
Enrollment dates	10/02–8/03	9/03 onward	10/02–8/03
Enrollment change	plan 1–3 → plan 0	plan 1 → plan 2	plan 1 → plan 2
Affected customers	246 (34 percent)	437 (56 percent)	96 (14 percent)
Savings per affected bill	\$8.73	\$2.68	\$5.45

*Notes:* Savings opportunities indicate that consumers choose overly risky plans (overconfidence) predictably. Savings estimates are a lower bound because we cannot always distinguish in- and out-of-network calls.

# Model

# Model

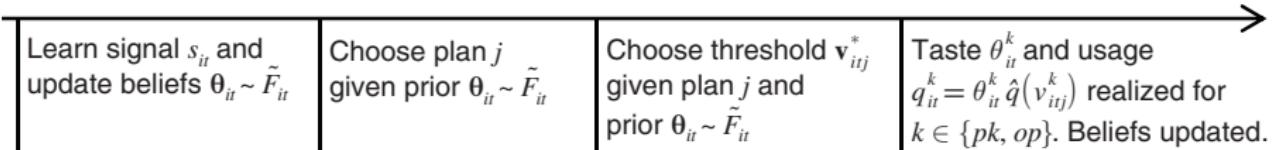
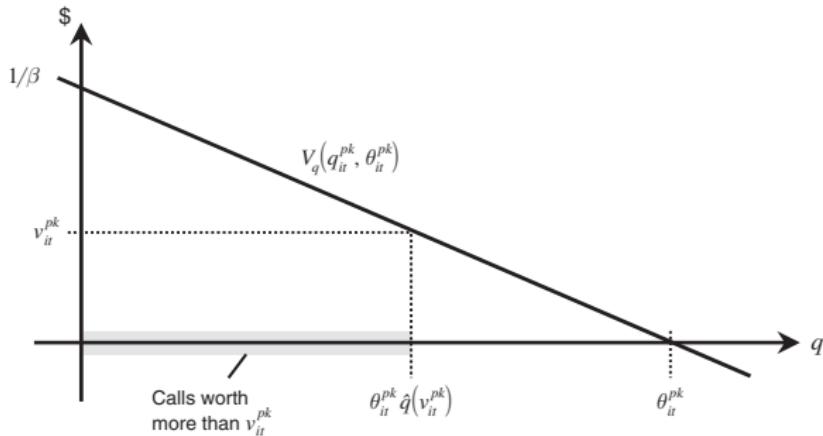


FIGURE 5. MODEL TIME LINE



- Do not choose  $q$
- Instead choose optimal threshold  $v_{itj}^*$  and make calls of higher value

FIGURE 6. PEAK INVERSE DEMAND CURVE AND CALLING THRESHOLD

# Bias

$\delta$  controls two kinds of overprecision:

- Peak consumption type  $\mu_i^{pk}$
- Monthly signals  $s_{it}$  and peak taste shocks  $\varepsilon_{it}^{pk}$
- $\delta = 1$  if rational expectations,  $\delta < 1$  if overprecision

## Identification and Estimation

# Identification and Estimation

## Overview:

- Price sensitivity parameter  $\beta$ : assume call demand same from 9–0PM as 8–9PM, identify from Plan 0 (\$0.11 on-peak, \$0 off-peak)
  - Ignores storability of demand
- Beliefs about usage type and variance: initial plan choices
- Actual usage shock distribution: usage
- Estimate via Maximum Simulated Likelihood

# Identification and Estimation

## Overview:

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- Beliefs about usage type and variance: initial plan choices
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- Estimate via Maximum Simulated Likelihood

## Plan choice mistakes:

- Consumers chose overly risky plans
  - $\hat{\delta} = 0.38$ : consumers underestimate the variance of future calling demand by 62%
- Consumers chose overly “small” plans (too few included minutes)
  - $\hat{b}_1 = -55$ : consumers underestimate their average peak usage

## Counterfactual Simulations

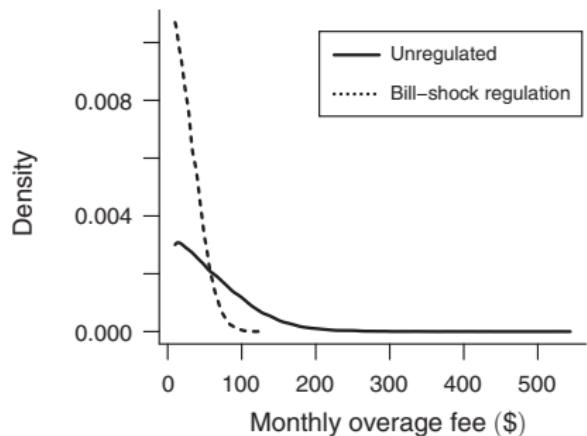
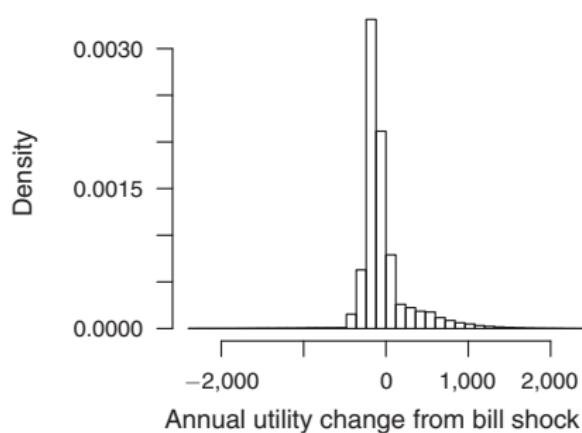
# Counterfactual Simulations

TABLE 5—EFFECT OF BILL-SHOCK REGULATION AND REMOVING BIASES WITH ENDOGENOUS PRICES

Biases:		Estimates No (1)	Estimates Yes (prices fixed) (2)	Estimates Yes (3)	$\delta = 1$ No (4)	No biases No (5)
Bill-shock regulation:						
Plan 1	$M$	42.88	42.88	39.28	42.32	52.59
	$Q$	216	216	0	0	0
	$p$	0.50	0.50	0.17	0.13	0.07
	Share	39	43	26	42	37
Plan 2	$M$	48.64	48.64	50.66	70.63	69.41
	$Q$	383	383	80	$\infty$	$\infty$
	$p$	0.50	0.50	0.12	N/A	N/A
	Share	38	36	23	46	52
Plan 3	$M$	58.12	58.12	68.23		
	$Q$	623	623	540		
	$p$	0.50	0.50	0.12		
	Share	14	11	40		
Outside good share		10	10	12	11	11
Usage		240	199	239	262	288
Average revenue		223	2	152	136	75
Annual profit		501	305	509	512	512
Annual consumer welfare		903	1,006	870	884	907
Annual total welfare		1,404	1,311	1,379	1,396	1,419
$\Delta$ annual profit		−196	7	11	11	
$\Delta$ annual consumer welfare		103	−33	−19	4	
$\Delta$ annual total welfare		−93	−26	−8	15	

*Notes:* All welfare and profit numbers are expressed in dollars per customer per year. Because the counterfactuals in columns 4 and 5 produced two-part tariffs, bill-shock regulation has no additional effect. We simulate 10,000 consumers for 12 months.

# Distributional consequences of bill-shock regulation



- Perhaps fairness benefits may outweigh the modeled average loss?

## Grubb and Osborne (2015): Conclusions

- Assumptions and limitations:
  - Selected sample and early time period
  - Parametric model of learning, belief bias etc.
  - Binding, exogenous \$0.50/minute bound on overage rates
  - Myopic plan choice and static usage demand
- But the basic economics are clear:
  - Firms respond endogenously when consumers are debiased
  - Reduce exploitative overage fees, but offset through higher monthly charges and/or reduced minute allowances
  - Unintended consequences: substitution to outside option

Thank you!

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