

BERKELEY PH.D. IO SLIDES:  
ADVERSE SELECTION AND INERTIA IN HEALTH INSURANCE  
MARKETS: WHEN NUDGING HURTS

BENJAMIN R. HANDEL

UC-BERKELEY

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- Referee Report 2 due this Friday
- Problem Set 1 begin work

# INTRODUCTION

## ADVERSE SELECTION & SWITCHING COSTS

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- Two potential impediments to efficient health insurance markets:
  - ① Switching Costs
  - ② Adverse Selection
- Switching costs and adverse selection have each been studied in *isolation* but *interaction* can also be important
- Primary questions:
  - Are switching costs large?
  - Do switching costs significantly impact consumer choices and markets?
  - How does the degree of adverse selection depend on switching costs?
  - What is the welfare impact of reducing switching costs in equilibrium?

# WHAT ARE SWITCHING COSTS?

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## BROAD DEFINITION

### 1 Transaction costs:

- Time / hassle costs of actually changing health plan
- Time / hassle costs of researching alternative options

### 2 Learning

### 3 Re-Optimization Cost & Biased Beliefs

- Realized price change vs. ex ante expectations
- Collection of complex decisions

### 4 Status-quo bias / inertia:

- Persistence can result from deviations from rational behavior
- Default option

### 5 Switching providers:

- **Do not** measure these in my setting

# DATA AND METHODS

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- Unique propriety panel data set on consumer health plan choice and utilization from large firm
  - ① Natural experiment: Forced re-enrollment into new health plan menu
  - ② Detailed medical utilization data
  - ③ Leads to simple identification of switching costs
- Panel discrete choice model quantifies:
  - ① Switching Costs
  - ② Ex ante health risk
  - ③ Heterogeneous risk preferences

# MAIN RESULTS

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- ❶ Large switching costs lead to poor choices as market changes
  - Pattern of 'active' choice
- ❷ Partial equilibrium counterfactual: Policy that reduces switching costs by 75% increases consumer welfare by 6%
- ❸ Full equilibrium counterfactual: Same policy improves choices conditional on prices but exacerbates adverse selection, leading to 8% decrease in consumer welfare.
- ❹ *Doubles* existing welfare loss from adverse selection in observed environment.

# RELATED LITERATURE

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- Switching costs and choice inadequacy:
  - 1 Farrell & Klemperer (2006)
  - 2 Dube et al. (2009), Shum (2004), Shcherbakov (2009)
  - 3 Madrian & Shea (2001), Samuelson & Zeckhauser (1988)
- Adverse selection and/or insurance choice:
  - 1 Einav et al. (2011), Einav et al. (2009), Carlin & Town (2009)
  - 2 Levin et al. (2010), Lustig (2009), Cardon & Hendel (2001), Cutler & Reber (1998)
  - 3 Abaluck & Gruber (2009), Ericson (2011)
  - 4 Einav et al. (2010), Cutler et al. (2008)

# OUTLINE

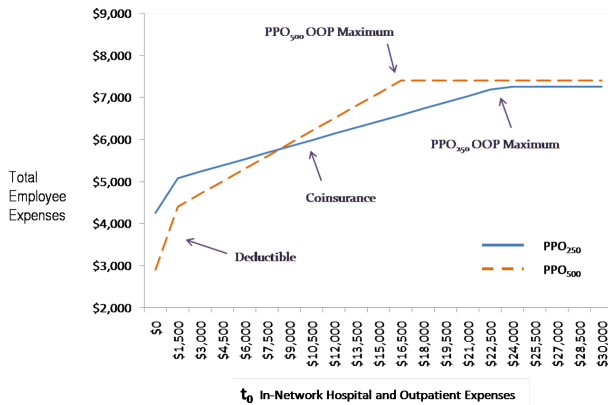
- 1 DATA / PRELIMINARY RESULTS
- 2 CHOICE MODEL
- 3 RESULTS
- 4 COUNTERFACTUAL ANALYSIS
- 5 CONCLUSIONS



# MOTIVATING EXAMPLE: SWITCHING COSTS

## EVIDENCE FROM DOMINATED PLAN CHOICE

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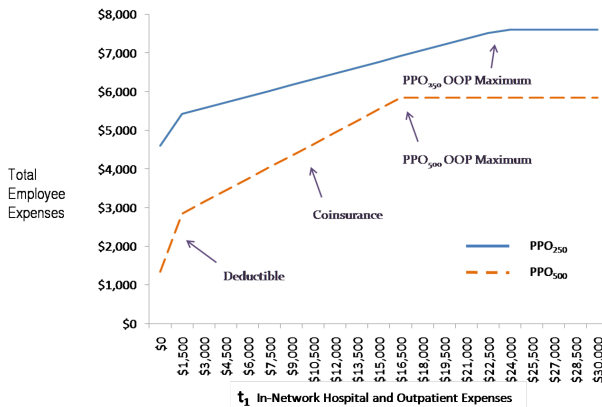


- Sick people should choose more insurance, healthy people less

# MOTIVATING EXAMPLE: SWITCHING COSTS

## EVIDENCE FROM DOMINATED PLAN CHOICE

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- 30 % of families had plan become completely dominated over time.
- 89% of those families continue to choose plan once it is dominated.

# DATA OVERVIEW

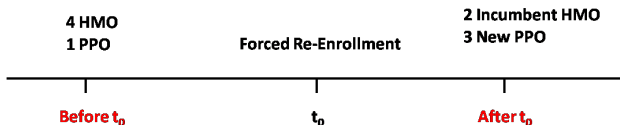
[▶ SKIP SLIDE](#)

- Individual-level panel dataset provided by large employer ( $\approx 10,000$  employees) from 2004–2009:
  - ① **Choices:** Health, FSA, HSA, dental, vision
  - ② **Detailed plan characteristics**
  - ③ **Demographics:** Age, gender, income, family structure, time at firm, advanced degree, quantitative, zip code
- Every claim for every individual and covered dependent in PPO
  - ① **Medical:** Diagnostic code (ICD-9), procedure code (CPT/NDC), provider id, provider specialty
  - ② **Financial:** Total claim, insurer paid, deductible, coinsurance, copayment, claim date, network, pharmacy

# NATURAL EXPERIMENT: MENU CHANGE

## FORCED RE-ENROLLMENT

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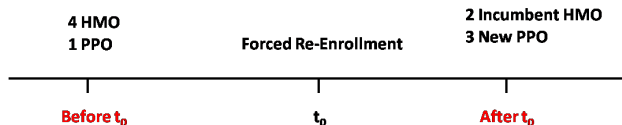


- Forced  $t_0$  re-enrollment:
  - Major initiative at firm to ensure 'active' choice
  - No default option at  $t_0$
  - After  $t_0$ , employees have prior choice as default option
- 3 PPO post- $t_0$  only differentiated financially

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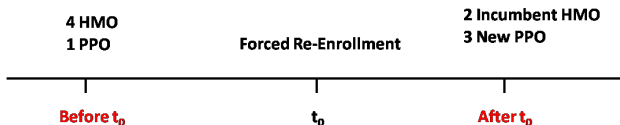


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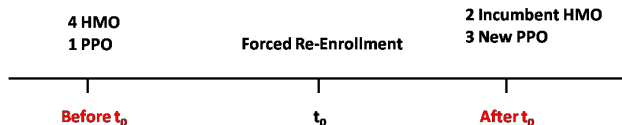


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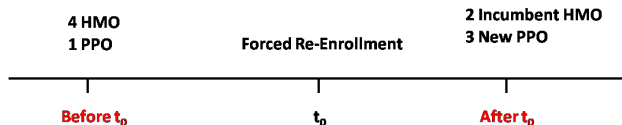


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# PLAN CHARACTERISTICS

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	PPO <sub>250</sub>	PPO <sub>500</sub>	PPO <sub>1200</sub>
DEDUCTIBLE	250 (750)	500 (1500)	1200 (2400)
CO-INSURANCE	10%	20%	20%
PHY. VISIT CO-PAY	25	25	NA
ER CO-PAY	100	100	NA
MENTAL HEALTH CI	50%	50%	50%
PHARMA CO-PAY	5/25/45* (10/50/75)	5/25/45* (10/50/75)	NA NA
OUT-OF-POCKET MAX			
Inc. Tier 1	1000 (3000)	1500 (4500)	2000 (6000)
Tier 2/3	2000 (5000)	3000 (7000)	4000 (8000)
Tier 4/5	3000 (8000)	4000 (9000)	5000 (10000)

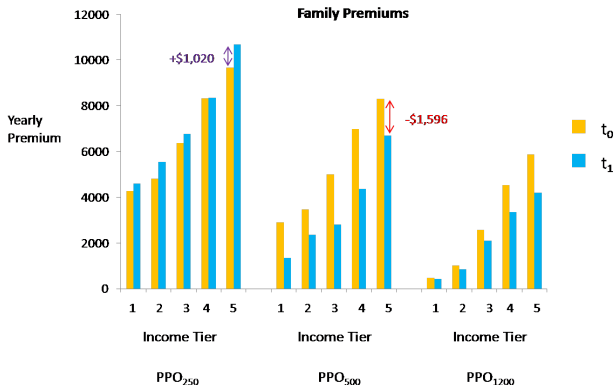
\* Prescription Max of 1500 per person

\*\* Out of Network Characteristics not Listed Above

# HEALTH PLAN PREMIUMS

## LARGE PRICE CHANGES

- Premiums depend on covered dependents and income
- Significant price changes for years with a default option



# SWITCHING COSTS

## EVIDENCE FROM NEW ENTRANTS

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	Year $t_0$	Year $t_1$
<b>Cohort 1</b> <b>New Entrants at <math>t_0</math></b> <b>N = 1377</b>	PPO <sub>250</sub>	21 %
	PPO <sub>500</sub>	23 %
	PPO <sub>1200</sub>	17 %
	HMO <sub>1</sub>	20 %
	HMO <sub>2</sub>	19 %
<b>Cohort 2</b> <b>New Entrants at <math>t_1</math></b> <b>N = 1305</b>	PPO <sub>250</sub>	-
	PPO <sub>500</sub>	43 %
	PPO <sub>1200</sub>	14 %
	HMO <sub>1</sub>	20 %
	HMO <sub>2</sub>	12 %

# SWITCHING COSTS

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	PPO <sub>500</sub>	-
	PPO <sub>1200</sub>	-
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	HMO <sub>2</sub>	-

# SWITCHING COSTS

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	HMO <sub>1</sub>	-
	HMO <sub>2</sub>	-

20 %

26 %

15 %

20 %

19 %

11 %

43 %

14 %

20 %

12 %

# SWITCHING COSTS

## EVIDENCE FROM NEW ENTRANTS

► SKIP SLIDE

	Cohort 1 New Entrants at $t_0$  N = 1377	Cohort 2 New Entrants at $t_1$  N = 1305
Median age	31	31
Mean age	33	32
Income tier 1	50 %	47 %
Income tier 2	31 %	32 %
Income tier 3	10 %	12 %
Income tier 4	4 %	4 %
Income tier 5	5 %	5 %

# PATTERN OF ACTIVE CHOICE

## MULTIPLE DECISION ANALYSIS

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	<i>PPO</i> <sub>250</sub> Switchers	<i>PPO</i> <sub>250</sub> Stayers	All Switchers	All Stayers
Sample Size	174	1626	384	2786
FSA 2008 Enrollee	41%	31%	39%	25%
Dental Switch	13.1%	3.2%	14.5%	3.8%
Mean Income Tier	2.2	2.5	2.1	2.3
Quantitative Manager	17%	20%	14%	17%
Mean Age	40.6	48.3	39.1	44.0
Single	56%	50%	59%	53%

- FSA choice is back to zero default

# SAMPLE COMPOSITION

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- Only consider choice among PPO options
  - **Benefit:** Observe detailed medical data
  - **Cost:** Potential for selection bias
  - **Benefit and Cost:** Switching costs exclude costs of changing providers
- Restriction that employee continuously enrolled over 3 years  $t_{-1}$  through  $t_2$ 
  - **Benefit:** Past year of medical data for all choices
  - **Cost:** Specific population not necessarily representative
  - **Cost:** Lose 'new entrant' population



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# SUMMARY STATISTICS

## SAMPLE DEMOGRAPHICS

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	All Employees	PPO Ever 04-09	Final Sample
EMPLOYEES	11,253	5,667	2,023
GENDER (MALE %)	47.4%	45.9%	48.5%
AGE	39.9 (37)	39.9 (37)	46 (46)
INCOME			
Tier 1	31.3%	31.7%	20.3%
Tier 2	36.6%	39.4%	41.4%
Tier 3	17.3%	18.5%	23.9%
Tier 4	6.5%	5.6%	7.5%
Tier 5	8.3%	4.8%	6.9%
FAMILY SIZE			
1	59.9 %	57.1 %	44.5 %
2	15.5 %	18.4 %	21.2 %
3	10.4 %	10.7 %	13.9 %
4+	14.2 %	13.8 %	27.9 %
STAFF GROUPING			
MANAGER	25.7%	24.3%	34.3%
WHITE-COLLAR	46.1%	47.5%	43.1%
BLUE-COLLAR	28.3%	27.9%	21.7%



## ADVERSE SELECTION

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EVIDENCE OF SIGNIFICANT ADVERSE SELECTION AGAINST  $PPO_{250}$ 

	N	Mean Fam Size	Mean	25th pct	Median	75th pct
$PPO_{-1}$	2022	2.24	13331	1257	4916	13022
$PPO_{250} t_0$	1328	2.18	16976	2041	6628	16135
$PPO_{500} t_0$	338	2.20	6151	554	2244	6989
$PPO_{1200} t_0$	280	2.53	6742	658	2958	8073
$PPO_{250} t_1$	1244	2.19	17270	2041	6651	16707
$PPO_{500} t_1$	461	2.19	7759	708	2659	8588
$PPO_{1200} t_1$	232	2.57	6008	589	2815	7191

- Table uses  $t_{-1}$  claims levels in all years

# CHOICE FRAMEWORK

## REALIZED UTILITY MODEL

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- Model to quantify switching costs and their welfare impact in environment with adverse selection
  - Data alone provide evidence of large switching costs
- Panel discrete choice model from  $t_0$  to  $t_2$  quantifies:
  - 1 Switching costs
  - 2 Ex ante health risk
  - 3 Heterogeneous risk preferences
- Explicit estimates of expected-utility function parameters
- Simple supply-side pricing model

# CONSUMER EXPECTED UTILITY

## CONSUMER BELIEFS

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- Each family  $k$  has uncertainty  $F_{kjt}(OOP)$  about future health expenditures for plan  $j$  at the time  $t$  of plan choice
- Consumers maximize expected utility over set of plans  $J$ :

$$\max_{j \in J} U_{kjt} = \int_0^{\infty} u_k(m_j, OOP) f_{kjt}(OOP) dOOP$$

- Estimate  $\widehat{F_{kjt}(OOP)}$  derived from separate cost model
- Consumer expenditure beliefs conform to  $\widehat{F_{kjt}(OOP)}$

# EMPIRICAL SETUP

## CARA

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- Consumers have constant absolute risk aversion (CARA) utility index:

$$u_k(m_j, OOP) = -\frac{1}{\gamma_k} e^{-\gamma_k (X_k^A)(m_j - OOP)}$$

$$m_j = W_{kt} - P_{kjt} + \eta(X_k^B)\mathbf{1}_{j=j-1} + \delta_k(Y_k)\mathbf{1}_{PPO_{1200}} + a_j H_k + \epsilon_{kjt}(Y_k)$$

- $W_{kt}$  – wealth,  $P_{kjt}$  – premium,  $\eta$  – switching cost,  $\delta_k$  – CDHP preference,  $X_k$  – demographics,  $Y_k$  – family status,  $a_j$  – high-cost heuristic,  $H_k$  high-cost indicator
- Empirical utility:

$$\max_{j \in J} U_{kjt} = \int_0^\infty u_k(m_j, OOP) \widehat{f_{kjt}(OOP)} dOOP$$

# COST MODEL

ESTIMATING  $F_{kjt}$

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- Cost model separate from choice model:
  - **Assumption:** No private information or moral hazard
  - Based on data analysis
  - Robustness check
- Estimate  $\widehat{F_{kjt}(OOP)}$  is information set at time of plan choice.
  - Incorporates past year of medical information with ACG software
  - Consumer could have **more** or **less** information than  $F_{kjt}$
- Potential sources of private information:
  - 1 Pregnancy
  - 2 Condition Intensity
  - 3 Genetic predisposition
  - 4 Robustness check

► Details

# COST MODEL II

## OUTLINE OF METHODS

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- ACG software predicts future expenditures  $\theta$  using past medical information  $\xi$  and demographics  $\zeta$ :

$$A : \xi \times \zeta \rightarrow \theta$$

- Divide claims into four distinct categories  $c \in C$
- Group individuals into ex ante risk cells for each  $c$ 
  - Estimate joint distribution over  $C$  with ex post data
- Plan-specific out-of-pocket expenditure mapping:

$$\Omega_j : C \rightarrow OOP_j$$

- Incorporate family-level restrictions

# CLAIM LEVELS BY CATEGORY

	PPO <sub>-1</sub>	PPO <sub>250</sub>	PPO <sub>500</sub>	PPO <sub>1200</sub>
<b>Pharmacy</b>				
Mean	\$973	\$1420	\$586	\$388
Median	\$81	\$246	\$72	\$22
<b>Mental Health (&gt;0)</b>				
Mean	\$2401	\$2228	\$1744	\$2134
Median	\$1260	\$1211	\$1243	\$924
<b>Hospital / Physician</b>				
Mean	\$4588	\$5772	\$2537	\$2722
Median	\$428	\$717	\$255	\$366
<b>Physician OV</b>				
Mean	\$461	\$571	\$381	\$223
Median	\$278	\$356	\$226	\$120

# CHOICE MODEL

## UNOBSERVED HETEROGENEITY

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- Risk preferences normally distributed conditional on demographics  $X_k$ :

$$\gamma_k(X_k) \Rightarrow N(\mu_\gamma(X_k))$$

$$\mu_\gamma(X_k) = \mu_0 + \beta X_k$$

- Other assumptions:

- $\delta_k$  normally distributed  $N(\mu_\delta(Y_k), \sigma_\delta^2(Y_k))$
- $\epsilon_j$  normally distributed  $N(0, \sigma_{\epsilon_j}^2(Y_k))$



# MODEL IDENTIFICATION

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## MENU CHANGE

- Menu change w/ no default allows observation of same consumers in periods with and without switching costs
- Unobserved heterogeneity:
  - Same within each consumer over time
  - Population distribution same over time
- **Switching Costs vs. Unobserved Heterogeneity:**
  - Switching costs shifts choices only  $t_1$  and after
  - Unobserved Heterogeneity shifts choices in all periods
  - Combination of initial choice, panel, detailed medical/cost data, and network homogeneity
- **Risk Preference vs.  $PPO_{1200}$  intercept:**
  - $\gamma$  determines choices between all plans
  - $\delta$  determines choices between  $PPO_{1200}$  and other two

# ROBUSTNESS

## ALTERNATIVE SPECIFICATIONS

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- ❶ Basic specification with no detailed demographics linked to switching costs and risk preferences
- ❷ Moral Hazard:
  - Simple framework to check if price sensitivity substantially impacts switching cost and risk preference estimates.
  - Assume high end of price elasticity estimated in literature.
  - Assume MH manifests as reduction of purely wasteful services.
- ❸ Log-normal risk preferences
- ❹ No idiosyncratic error  $\epsilon$  (similar to EFRSC 2011)

# ESTIMATION

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- Simulated maximum likelihood for choice sequence starting at  $t_0$  for each  $k$
- **Optimization:** Maximize probability of choices in data with respect to model parameters
  - Simulate draws from  $F_{kjt}$
  - Simulate draws from preference random coefficients
  - Normalization of  $\epsilon$  and  $U_{kjt}$
  - Smoothed Accept-Reject of each sequence for given parameters
- **Robustness:** Utility function, unobserved heterogeneity

## ESTIMATION

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- Simulated maximum likelihood
- Q draws from each  $F_{kjt}$
- Z draws of preferences conditional on parameters:

$$\theta \equiv (\mu, \beta, \sigma_\gamma, \mu_\delta(Y_k), \sigma_\delta(Y_k), \alpha_j(Y_k), \sigma_{\epsilon_j}, \eta(Y_k)).$$

- Smoothed Accept-Reject for each choice given  $\theta$

$$Pr(j = j^*) = \frac{\left( \frac{\frac{1}{-U_{kj^*t}}(\cdot)}{\sum_J \frac{1}{-U_{kj^*t}}(\cdot)} \right)^\tau}{\sum_{\hat{j}} \left( \frac{\frac{1}{-U_{kj^*t}}(\cdot)}{\sum_J \frac{1}{-U_{kj^*t}}(\cdot)} \right)^\tau}$$

- Maximize probability that predicted choice sequences  $\hat{P}_k^{j^3}$  match actual ones  $d_{kj^3}$ :

$$SLL(\theta) = \sum_{k \in K} \sum_{j^3 \in J^3} d_{kj^3} \ln \hat{P}_k^{j^3}$$

## RESULTS

## LARGE SWITCHING COSTS

Parameter	Base	Primary	MH Robust	$\gamma$ Robust	$\epsilon$ Robust
Switching Cost Individual, $\eta_s$	1779 (72)	1729 (28)	1859 (107)	2430 (116)	1944 (150)
Switching Cost Family, $\eta_f$	2354 (62)	2480 (26)	2355 (113)	3006 (94)	2365 (34)
SC - FSA	- -	-551 (56)	-669 (155)	-723 (131)	-417 (50)
SC - Income	- -	-32 (13)	-59 (15)	-8 (43)	-7 (15)
SC - Quant	- -	5 (138)	-40 (80)	-537 (223)	-6 (92)
SC - Manager	- -	198 (292)	277 (164)	875 (200)	224 (244)
SC - Chronic	- -	80 (46)	29 (67)	-221 (148)	67 (35)
SC - Salient	- -	156 (83)	95 (60)	61 (212)	123 (54)
SC - Total Pop. Mean, $\eta$ [Pop. Standard Deviation]	2032 [446]	2087 [286]	1886 [387]	1914 [731]	1986 [316]
Risk Aversion Mean - Intercept, $\mu$	$3.12 * 10^{-4}$ $(1.1 * 10^{-5})$	$2.32 * 10^{-4}$ $(9.0 * 10^{-6})$	$2.31 * 10^{-4}$ $1.10 * 10^{-5}$	-8.94 (0.43)	$1.90 * 10^{-4}$ $1.0 * 10^{-5}$
Risk Aversion Mean - Income,	$4.21 * 10^{-5}$ $(3.0 * 10^{-6})$	$2.90 * 10^{-5}$ $(4.0 * 10^{-6})$	$1.80 * 10^{-5}$ $3.00 * 10^{-6}$	0.07 (0.016)	$2.40 * 10^{-5}$ $3.00 * 10^{-6}$
Risk Aversion Mean - Age,	- -	$2.27 * 10^{-6}$ $(1.7 * 10^{-7})$	$3.45 * 10^{-6}$ $1.80 * 10^{-7}$	0.28* (0.011)	$2.59 * 10^{-6}$ $1.50 * 10^{-7}$
Risk Aversion Std. Deviation, $\sigma_\gamma$	$1.88 * 10^{-4}$ $(8.0 * 10^{-6})$	$1.88 * 10^{-4}$ $(6.63 * 10^{-5})$	$1.27 * 10^{-4}$ $6.00 * 10^{-6}$	1.37 (0.06)	$1.04 * 10^{-4}$ $5.9 * 10^{-5}$

## RESULTS II

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## INTERPRETATION OF RISK PARAMETERS

	Absolute Risk Aversion	Interpretation
<b>Normal Heterogeneity</b>		
Mean / Median Individual	$4.22 * 10^{-4}$	94.6
25th percentile	$2.95 * 10^{-4}$	96.1
75th percentile	$5.49 * 10^{-4}$	93.8
95th percentile	$7.31 * 10^{-4}$	92.2
99th percentile	$8.59 * 10^{-4}$	91.8
<b>Log normal Heterogeneity</b>		
Mean	$9.82 * 10^{-4}$	91.0
25th percentile	$1.53 * 10^{-4}$	97.2
Median	$3.85 * 10^{-4}$	95.0
75th percentile	$9.72 * 10^{-4}$	91.1
95th percentile	$3.70 * 10^{-3}$	72.8
99th percentile	$9.30 * 10^{-3}$	51.1
<b>Comparable Estimates</b>		
Cohen-Einav (2007) Benchmark Mean	$3.1 * 10^{-3}$	76.5
Cohen-Einav (2007) Benchmark Median	$3.4 * 10^{-5}$	99.7
Gertner (1993)	$3.1 * 10^{-4}$	97.0
Holt & Laury (2002)	$3.2 * 10^{-2}$	21.0
Sydnor (2006)	$2.0 * 10^{-3}$	83.3

# COUNTERFACTUAL ANALYSIS

## REDUCTION IN SWITCHING COSTS

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- Investigate counterfactual environment with reduced switching costs
- Price-conscious consumer choice is cornerstone of:
  - National insurance reform: health insurance exchanges
  - Large employer purchasing strategies
- Policies to reduce switching costs:
  - 1 Personalized plan recommendations
  - 2 Decision making tools
  - 3 Standardized /simple benefit representation
  - 4 Choice framing
  - 5 Strong oversight body for all consumer decision issues

# 'NAIVE' ANALYSIS

## HOLDING PRICES FIXED

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- Similar to previous analyses studying choice inadequacy
  - Consumer welfare can only increase
- Switching costs reduced to  $Z\eta_k$ :

$$U_{kjt}(P_{kjt}, Z\eta_k, \mathbf{1}_{kj,t-1}) = \int_0^\infty f_{kjt}(OOP) u(OOP, P_{kjt}, Z\eta_k, \mathbf{1}_{kj,t-1}) dOOP$$

- Choose plan to maximize expected utility in each  $t$
- Use certainty equivalent metric to quantify welfare change

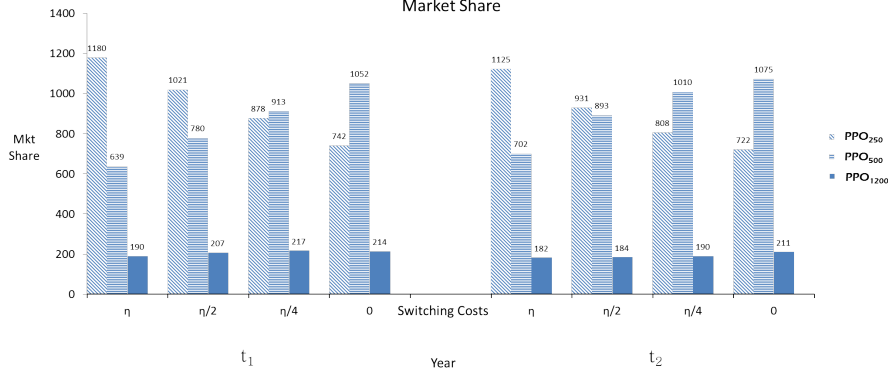


# 'NAIVE' PRICING POLICY IMPACT

## MARKET SHARE CHANGES

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Partial Equilibrium Information Provision  
Market Share

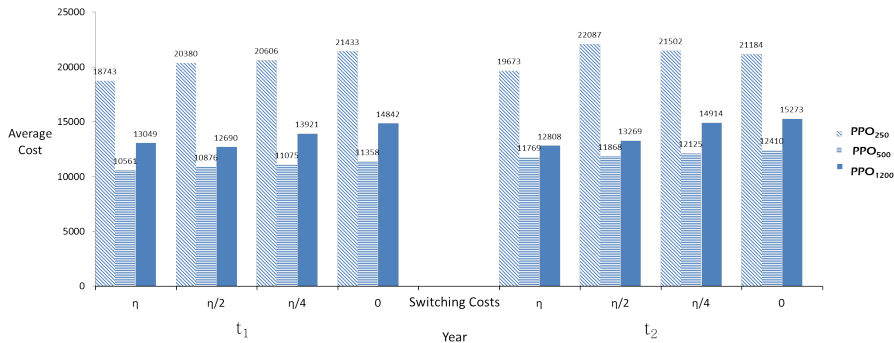


# 'NAIVE' PRICING POLICY IMPACT

## AVERAGE COST CHANGES

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Partial Equilibrium Information Provision  
Plan Family Average Cost



# WELFARE ANALYSIS

## TANGIBLE COSTS?

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- Certainty equivalent  $Q_{kjt}$  makes consumer indifferent between certain  $Q_{kjt}$  and risky payoff from  $j$ 
  - $Q$  calculated *net* of switching costs (depends on *source*)
  - Denote  $Q$  for choice with policy  $Z$  as  $Q_{kjt}^Z$
- $\kappa$  portion of switching costs that are tangible welfare loss

$$\begin{aligned}
 u(Q_{kjt}^\kappa) &= -\frac{1}{\gamma_k(X_k^A)} e^{-\gamma_k(X_k^A)(W - Q_{kjt}^\kappa)} \\
 &= U_{kjt}(P_{kjt}, \kappa Z \eta_k, \mathbf{1}_{kj,t-1})
 \end{aligned}$$

# WELFARE ANALYSIS

## POPULATION METRIC

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- Individual level consumer welfare impact:

$$\Delta CS_{kjt} = Q_{kjZt}^Z - Q_{kjt}$$

- Mean welfare change:

$$\Delta TS_t^Z = \frac{1}{\|K\|} \sum_k \Delta CS_{kjt}^Z + \frac{1}{\|K\|} \sum_k (P_{kjt}^Z - P_{kjt})$$

- Population welfare change comes from risk preference matching

# 'NAIVE' POLICY WELFARE IMPACT

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 $Z = .25$ 

	$t_1$	$t_2$
<b>Mean <math>\Delta</math> CEQ</b>		
Population	\$96	\$114
Switchers Only	\$175	\$196
<b>Mean Welfare Change: % Total Premiums</b>		
Mean Employee Premium (MEP)	\$2,067	\$1,954
Welfare Change Population	4.6%	5.8%
Welfare Change Switchers	8.5%	10.0%
<b>Mean Welfare Change: % Total Emp. Spending</b>		
Mean Total Emp. Spending	\$4,373	\$4,486
Welfare Change Population	2.2%	2.5%
Welfare Change Switchers	4.0%	4.4%

# FULL RE-PRICING ANALYSIS

## ENDOGENOUS INSURANCE PRICING

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- Insurance prices adjust along with new choices for  $Z < 1$
- Recreate exact pricing rule
  - Close to prior work, resembles common pricing environments
- Start at given prices  $p_0$
- Total premium lagged average cost:

$$TP_{jt}^y = AC_{K_{j,t-1}^y} + L$$

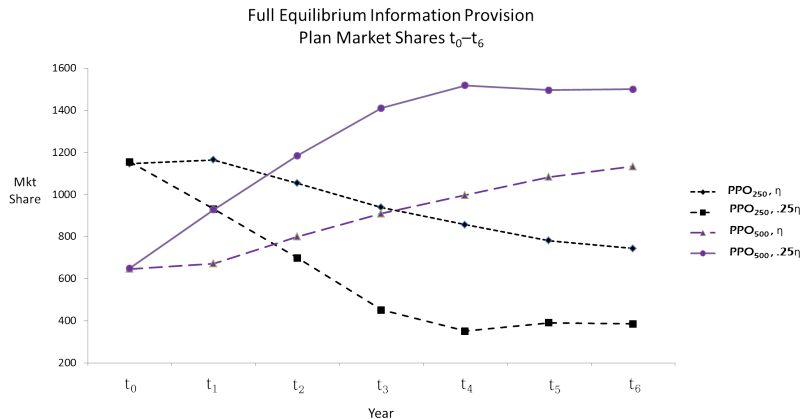
- Firm gives subsidy for all  $j$  as % of  $PPO_{1200}$  premium:

$$P_{kjt} = TP_{jt}^y - S(X_k) TP_{PPO_{1200}t}^y$$

# IMPACT OF POLICY ON MARKET SHARE

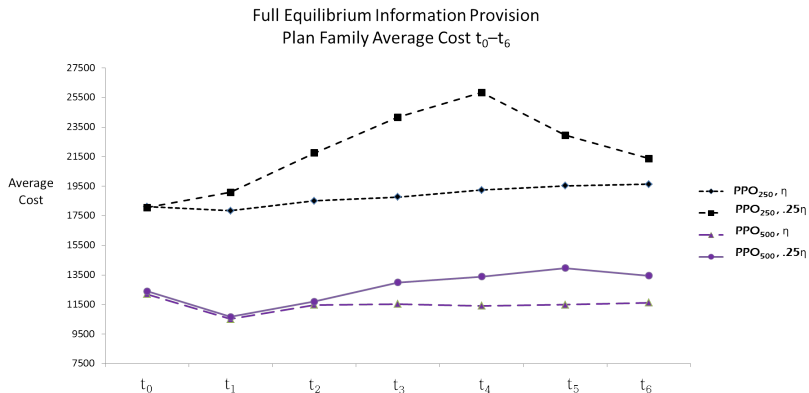
## DEATH SPIRAL?

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# IMPACT ON PLAN PRICES

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► Average Cost



# FULL EQUILIBRIUM WELFARE IMPACT

## WHEN NUDGING HURTS.....

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	$t_1$	$t_2$	$t_4$	$t_6$	Avg. $t_1$ - $t_6$
<b>Mean <math>\Delta</math> CEQ</b>					
Population	-\$63	-\$104	-\$144	-\$118	-\$115
Switcher Pop. %	51%	49%	48%	53%	49%
Switchers Only	\$86	\$175	\$ 245	\$242	\$186
Non-Switchers Only	-\$205	-\$391	-\$555	-\$432	-\$442
<b>Welfare Change: % Premiums</b>					
Mean Employee Premium	\$1,471	\$1,591	\$1,455	\$1,259	\$1,500
Welfare Change Population	-4.8%	-6.5%	-9.9%	-9.4%	-7.7%
Welfare Change Switchers	5.6%	11.0%	16.9%	19.2%	12.4%
Welfare Change Non-Switchers	-13.9%	-24.6%	-38.1%	-34.3%	-29.4%
<b>Welfare Change: % Total Spending</b>					
Mean Total Emp. Spending	\$3,755	\$4,097	\$4,022	\$3,862	\$4,015
Welfare Change Population	-1.7%	-2.5%	-3.6%	-3.06%	-2.9%
Welfare Change Switchers	2.3%	4.3%	6.1%	6.3%	4.6%
Welfare Change Non-Switchers	-5.5%	-9.5%	-13.8%	-11.2%	-11.0%

► More

# FULL EQUILIBRIUM WELFARE IMPACT

## POLICY EFFECTIVENESS & FIRST BEST

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	First-Best	Baseline	.75 $\eta$	.5 $\eta$	.25 $\eta$	0
<b>Mean <math>\Delta</math> CEQ</b> (% of Premiums)						
Population	\$123 (8.2%)	- (-)	-\$41 (-2.7%)	-\$73 (-4.9%)	-\$115 (-7.7%)	-\$107 (-7.1%)
Switchers	-\$538 (-35.9%)	- (-)	\$1,017 (67.8%)	\$766 (51.0%)	\$186 (12.4%)	\$118 (7.9%)
Non-Switchers	\$953 (63.5%)	- (-)	-\$249 (-16.6%)	-\$371 (-24.8%)	-\$442 (-29.4%)	-\$382 (-25.4%)
Single	-\$683 (-45.5%)	- (-)	-\$153 (-10.2%)	-\$295 (-19.7%)	-\$319 (-21.2%)	-\$286 (-19.0%)
Family	\$826 (55%)	- (-)	-\$54 (3.6%)	\$119 (7.9%)	\$61 (4.1%)	\$47 (3.1%)

# FULL EQUILIBRIUM WELFARE IMPACT

## TANGIBLE SWITCHING COSTS $\kappa$

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Welfare Impact		$\eta$	$.75\eta$	$.5\eta$	$.25\eta$	0
$\kappa = 0$	Welfare Relevant SC	0	0	0	0	0
	$\Delta$ CEQ (% Premiums)	-	-\$41 (-2.7%)	-\$73 (-4.9%)	-\$115 (-7.7%)	-\$107 (-7.1%)
$\kappa = 0.25$	Welfare Relevant SC	46	47	36	21	0
	$\Delta$ CEQ (% Premiums)	-	-\$42 (-2.8%)	-\$63 (-4.2%)	-\$90 (-6.0%)	-\$61 (-4.1%)
$\kappa = 0.5$	Welfare Relevant SC	93	94	71	42	0
	$\Delta$ CEQ (% Premiums)	-	-\$42 (-2.8%)	-\$51 (-3.4%)	-\$64 (-4.3%)	-\$14 (-0.9%)
$\kappa = 1$	Welfare Relevant SC	185	188	142	83	0
	$\Delta$ CEQ (% Premiums)	-	-\$44 (-2.9%)	-\$30 (-2.0%)	-\$13 (-0.9%)	-\$78 (5.2%)

# CONCLUSIONS I

## POLICY IMPLICATIONS

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### ● Individual Allocation:

- Substantial choice frictions  $\Rightarrow$  Substantial scope to improve individual plan choice
- Additional trade-off with de-regulation (Part D?): firm market power vs. adverse selection

### ● Health Market Design:

- National Health Exchanges and Large Employer Settings
- **Even conditional on improving choices:** policies to improve consumer choices and combat adverse selection should not be independent
- In certain cases, tools/policies to improve decisions can have significant negative welfare impact
- Contract characteristics, subsidy policy, choice framing
- **Distribution of welfare can be significantly affected**

# CONCLUSIONS II

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- Evidence of large switching costs
  - What are the sources?
- Link between switching costs and adverse selection
  - Large welfare impact
  - Impact relative to observed adverse selection welfare loss
  - Policy implications
  - Sophisticated firm pricing models?
- Second-best analysis with choice inadequacy issues
- A few more things to think about:
  - Test of dynamic choice / forward-looking consumers
  - Pricing regulation, adverse selection, and re-classification risk
- **Discussion of Handel / Kolstad (2013)**