The Effect of the Affordable Care Act on the Labor Supply, Savings, and Social Security of Older Americans

Eric French Hans-Martin von Gaudecker John Jones

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 - Low-cost, high-quality group insurance
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 - Low-cost, high-quality group insurance
 - ► For many, only available when working
 - \Rightarrow Many may have worked in part for health insurance
- At age 65, everyone became eligible for Medicare
 - Low cost, high-quality group insurance
 - Severed job-insurance link

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- French and Jones (2011)
- Medicare has important effects on retirement

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 - French and Jones (2011)
- Medicare has important effects on retirement
- People with strong job-insurance link tend to retire at the Medicare eligibility age (65)

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 - Work disincentives through income-based subsidies

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Some states expanded Medicaid (mostly 2014), some did not

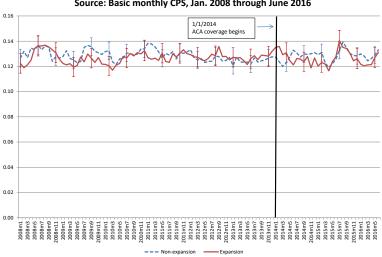
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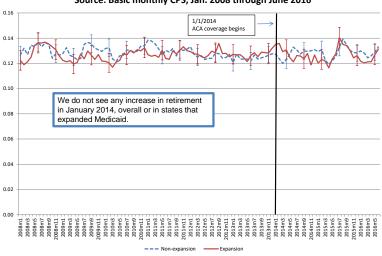
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- Several papers compare retirement patterns in states with and without Medicaid expansions
- Small estimated effects on labor supply

The Medicaid Expansion and Retirement



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	Uninsured		Retiree or Tied	
	Expansion	Non-expansion	Expansion	Non-expansion
2013	12	16	65	59
	Medicaid		Private	e non-group
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2013	9	9	12	12

Percent of US population ages 55-64.



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2013				

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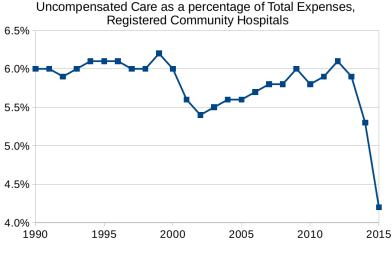
It is key to allow for multiple sources of insurance

- Changes in coverage across states very heterogeneous
 - States that did not expand Medicaid coverage had bigger take up of private coverage through exchanges

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- Changes in coverage across states very heterogeneous
 - States that did not expand Medicaid coverage had bigger take up of private coverage through exchanges
- Implicit insurance through default on medical bills
 - ► 6% of total medical bills are unpaid
 - Can be huge disincentive to labor supply and savings

Decline in use of uncompensated care



Source: Health Forum, AHA Annual Survey Data.

Our contribution

• We estimate a retirement model that accounts for:

- medical expense uncertainty
- ► the saving decision
- multiple insurance possibilities (uninsured, private non-group, employer-provided, Medicaid, Medicare, combinations)
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- medical expense uncertainty
- the saving decision
- multiple insurance possibilities (uninsured, private non-group, employer-provided, Medicaid, Medicare, combinations)
- default on medical bills
- Then use the model to predict the effects of the ACA
- Preliminary findings
 - Small aggregate disemployment effects, but very heterogeneous
 - Default on medical bills key for finding small effects

Data: households with a man aged 50+

- HRS (from 1992-2012)
 - > Detailed information on labor supply, wages, health, and assets
 - Pension data used to estimate pension accrual rates and initial pension wealth.
 - Social Security earnings histories used to estimate initial Social Security wealth.
 - Out-of-pocket medical spending

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- MEPS (from 2000-2012).
 - Total billable medical spending
 - Detailed information on who paid for the care
 - > Data obtained using data from self reports and providers

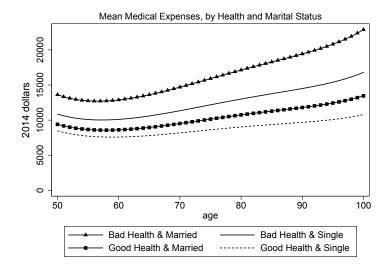
Household total medical spending

- The mean and variance of total medical spending are functions of health, marital status, and age.
- Households face transitory and persistent shocks to medical expenses.

$$\ln Z_t = \mu_z(H_t, SP_t, t) + \sigma_z(H_t, SP_t, t) \times \psi_t$$

 ψ_t has a permanent and a transitory component

Household total medical spending



MEPS data, estimated using a fixed effects estimator

Household total and out-of-pocket medical spending

	Younger than 65		65 and	Older
	Total	OOP	Total	OOP
Mean	10,310	1,860	13,750	2,180
Median	4,780	1,060	6,900	1,310
90 th percentile	24,030	4,370	32,770	5,000
95 th percentile	38,470	6,130	48,660	7,000

MEPS data, OOP includes co-pays and deductibles, excludes premia

Health Insurance States

3 types of (employer-provided) health insurance

- Retiree = insurance you can hold onto after you leave your job
- Tied = insurance that ends shortly after you leave your job
- Non-group = no employer provided insurance

Health Insurance States and Possibilities

State	Choice Set not disabled, age < 65
Retiree	Retiree
Tied	Tied
Non-Group	Uninsured, Private Non-Group



Health Insurance States and Possibilities

State	Possibilities \mid DI recipient or age>65, high income and assets
Retiree	Retiree, Retiree + Medicare
Tied	Tied, Tied + Medicare
Non-Group	Uninsured, Private Non-Group, Medicare



Health Insurance States and Possibilities

State	Possibilities \mid DI recipient or age<65, low income and assets
Retiree	Retiree, Retiree + Medicare, Medicare + Medicaid
Tied	Tied, Tied + Medicare, Medicare + Medicaid
Non-Group	Uninsured, Private Non-Group, Medicare, Medicare + Medicaid

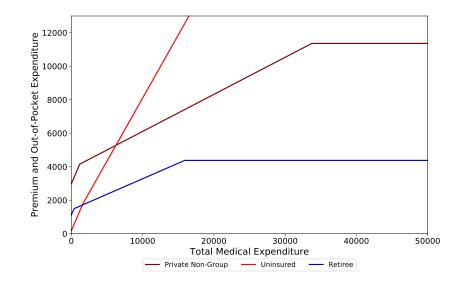


Health insurance budget sets

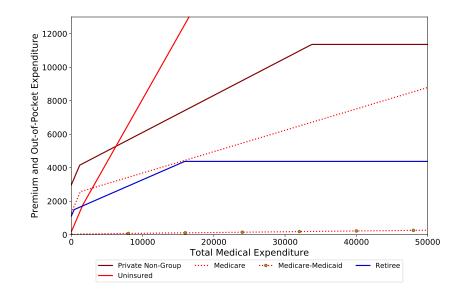
Four components to describe a health insurance contract

- Premium
- Deductible
- Co-pay
- Stop-loss

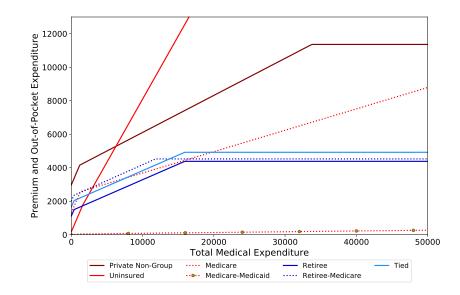
Budget sets by health insurance type, age < 65



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Insurance premia

Insurance premia are functions of

- insurance type
- age
- participation in the labor market
- marital status
- expected medical expenses (forecasted using lagged medical spending)

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 - expenditures_t includes: consumption; out of pocket medical expenses and insurance premia.
 - transfers_t provide a "consumption floor" (Hubbard, Skinner, and Zeldes, 1995), capturing insurance provided via non-payment of medical expenses

Recursive Formulation

$$\begin{aligned} V_t(X_t) &= \max_{C_t, N_t, B_t, I_t^+} \left\{ \frac{1}{1 - \nu} \Big(C_t^{\gamma} L_t^{1 - \gamma} \Big)^{1 - \nu} + \beta (1 - s_{t+1}) \frac{\theta_B}{1 - \nu} (A_{t+1} + \kappa)^{\gamma (1 - \nu)} \right. \\ &+ \beta s_{t+1} \int V_{t+1}(X_{t+1}) dF(X_{t+1} | X_t, t, C_t, N_t, B_t, I_t^+) \Big\} \\ L_t &= L - N_t - \phi_{Pt} P_t - \phi_{RE} RE_t - \phi_H H_t, \end{aligned}$$

Choice Vars: C_t = equivalized consumption; N_t = hours worked; I_t^+ = insurance choice; P_t = participation (=1 if $N_t > 0$); RE_t = re-entry (=1 if $N_{t-1} = 0$ and $N_t > 0$) **State Vars:** $X_t = (A_t, B_{t-1}, AIME_t, I_t, H_t, \omega_t, \zeta_{t-1}, \Upsilon_t)$

Endogenous State Variables - Not Stochastic

 $A_t = \text{assets};$ $I_t = \text{Health Insurance Type} \in \{\text{retiree}, \text{tied}, \text{none}\}$

 B_{t-1} = whether already applied for Social Security benefits \in {no, yes}

 P_{t-1} = whether working last period \in {no, yes}

 $AIME_t$ = Average Indexed Monthly Earnings

Exogenous State Variables – Stochastic

 H_t = health status \in {*disabled*, *bad*, *good*}

 $\omega_t = \text{persistent wage shock}$

 $\zeta_{t-1} = \text{persistent medical expense shock (realized after time-t - 1 decisions)}$

 $\Upsilon_t = marital status and spousal employment$

Solution and estimation

Method of Simulated Moments, two steps

- Step 1: estimate parameters of total medical spending, health, mortality, coinsurance rates, etc.
- Step 2: taking as given the estimated first-step parameters, choose preference parameters etc. to match asset, labor supply, insurance data using Method of Simulated Moments

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- Step 1: estimate parameters of total medical spending, health, mortality, coinsurance rates, etc.
- Step 2: taking as given the estimated first-step parameters, choose preference parameters etc. to match asset, labor supply, insurance data using Method of Simulated Moments
- Estimation is computationally intensive
 - We solve the model on GPUs (using Python and Numba)
 - Implementation is an order of magnitude faster than on a 100-node cluster

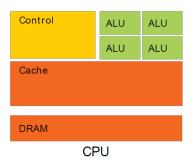
- The acceleration of CPU power has slowed down
 - Due to physical limits, Moore's law (transistors per die doubling every two years) no longer holds
 - Less incremental demand: Modern CPUs are fast enough for day-to-day applications

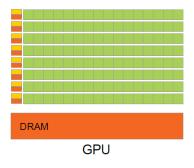
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- Less incremental demand: Modern CPUs are fast enough for day-to-day applications
- GPU power continues to accelerate
 - Demand for increased speed remains high: Computer games, (ultra) high-definition video
 - Increasingly used in high-performance computing

Basic architecture:

- ► Many very small computing units (think of each deciding on the colors of a portion of the screen) → Massive parallelization
- Each unit is rather "dumb": Can do floating point operations, but weak at control flow (if/then, loops)
- Very efficient, very scalable for arithmetic calculations





Reproduced from: NVIDIA (2016)

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 - Example: Solve model at a particular parameter vector (Lee & Wiswall, 2007)

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 - 1. Creating a sparse grid of feasible state-choice combinations
 - 2. Calculating contemporaneous quantities (within-period utility, end-of-period assets)
 - 3. Calculating continuation values
 - 4. Finding optimal choices
 - 5. Simulating agents' decisions

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 - 5. Simulating agents' decisions
- GPU programming is not user-friendly

Preference Parameter Estimates

$$U(C_t, L_t) = \frac{1}{1 - \nu} \left(C_t^{\gamma} L_t^{1 - \gamma} \right)^{1 - \nu}$$

$$L_t = L - N_t - \phi_{Pt} P_t - \phi_{RE} RE_t - \phi_H H_t$$

$$C_t = \text{equivalized consumption, } N_t = \text{work hours, } P_t = 1 \text{ if working,}$$

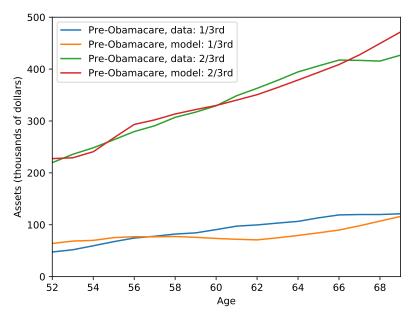
$$RE_t = 1 \text{ if working this period, not last period, } H_t = \text{health status}$$

		Preference type		
		1	2	3
γ	consumption weight	0.63	0.14	0.83
β	time discount factor	0.92	0.99	0.66
ν	coefficient of RRA		5.4	
L	leisure endowment		3,249	
ϕ_H	leisure cost of bad health		552	
ϕ_{P0}	fixed cost, intercept		514	
ϕ_{P1}	fixed cost, age trend (age-60)		78	
$\phi_{\it RE}$	re-entry cost		156	

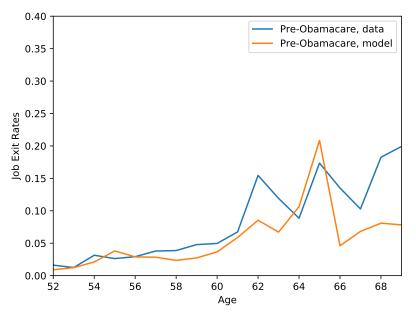
Average Frisch labor supply elasticity, intensive margin: .3

- Labor supply elasticity bigger when including extensive margin
- Average coefficient of relative risk aversion, consumption: 3.4

Assets



Job Exit Rate, Initially Tied Health Insurance



Individual mandate

- uninsured individuals pay tax penalty
- rises to greater of {\$695 per year, 2.5% of income}

Individual mandate

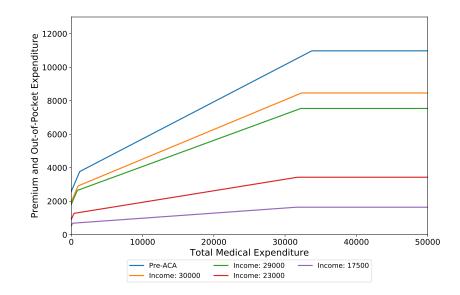
- uninsured individuals pay tax penalty
- rises to greater of {\$695 per year, 2.5% of income}
- Insurance policy restrictions
 - Community rating
 - Cap on out-of-pocket expenditures
 - Total medical expenditures \geq 0.8 \times premiums
 - ▶ Insurer covers ≥ 70% of expenses (baseline "Silver" policy)

- Premium subsidiy
 - ▶ for households with income between 100% and 400% of Federal Poverty Level (FPL)
 - upper bound on how much households pay OOP for insurance, rising from 2% of income to 9.5%
 - any premia above the bound covered by government

Premium subsidiy

- ▶ for households with income between 100% and 400% of Federal Poverty Level (FPL)
- upper bound on how much households pay OOP for insurance, rising from 2% of income to 9.5%
- any premia above the bound covered by government
- Deductible and co-pay subsidies
 - For households with income \leq 250% of FPL
 - As income falls, subsidies increase via reduced deductibles and co-pays

Effect of the ACA on premia, co-pays, deductibles



Reforms we model: Medicaid

Pre-ACA

- Households without dependents qualify for Medicaid only via disability
- Income and (financial) wealth tests
- Post-ACA
 - \blacktriangleright Any household with income $\leq 138\%$ of FPL qualifies
 - No wealth test
 - More than 30 states participate

Results: Effect of Obamacare

We present the statistics for

- Insurance Coverage
- Assets
- Employment

both

- Before Obamacare
- > Year after Obamacare, using post-Obamacare decision rules
- Obamacare is unanticipated (an "MIT shock")

	Uninsured		Retir	Retiree or Tied		
	Expansion	Non-expansion	Expansion Non-expans			
2013	24	24	61	61		
	Medicaid		Private non-group			
	Expansion	Non-expansion	Expansion	Non-expansion		
2013	Expansion 8	Non-expansion 8	Expansion 7	Non-expansion 7		

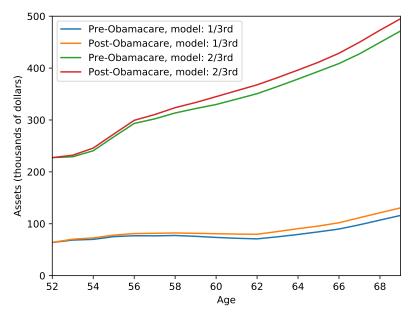
	Uninsured		Retiree or Tied		
	Expansion	Non-expansion		Expansion	Non-expansion
2013	24	24		61	61
2015	9	18			
	Medicaid			Private	e non-group
	Expansion	Non-expansion		Expansion	Non-expansion
2013	8	8		7	7

	Uninsured		Retiree or Tied		
	Expansion	Non-expansion		Expansion	Non-expansion
2013	24	24		61	61
2015	9	18		57	59
	Medicaid			Private non-group	
	Expansion	Non-expansion		Expansion	Non-expansion
2013	8	8		7	7

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2013	8	8		7	7
2015	22	9			

	Uninsured		Retiree or Tied		
	Expansion	Non-expansion		Expansion	Non-expansion
2013	24	24		61	61
2015	9	18		57	59
	Medicaid			Private	e non-group
	Expansion	Non-expansion		Expansion	Non-expansion
2013	8	8		7	7
2015	22	9		12	15

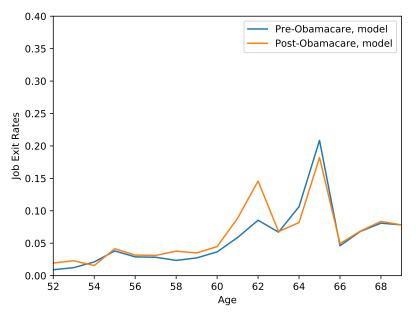
Assets



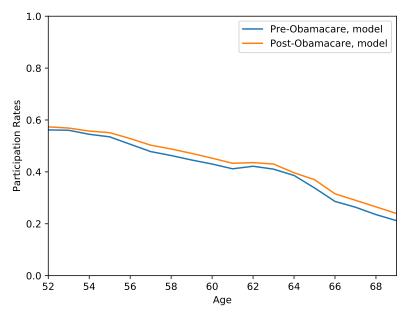
Employment Rates, 55-64, Model

Pre-Obamacare	58.2
Obamacare, with expansion	57.6
Obamacare, without expansion	57.7

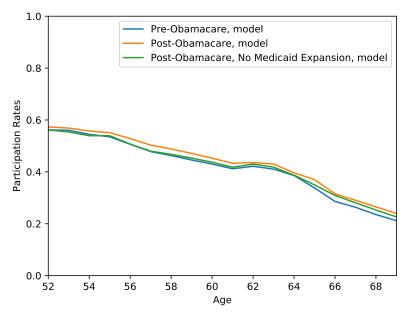
Job Exit Rate, Initially Tied Health Insurance



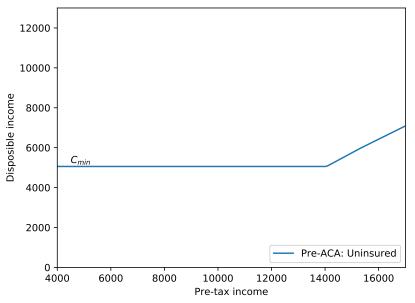
Participation Rates, Bottom Assets Tercile, No Group Health Insurance



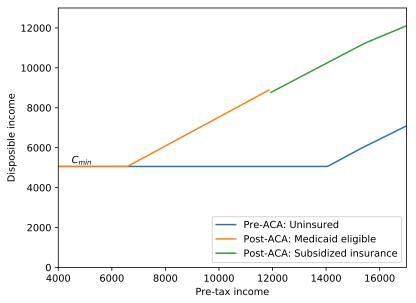
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Budget Set of Person without EPHI, no assets, \$8,000 total medical bills



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Strong effects of ACA on insurance choice

- Strong effects of ACA on insurance choice
- Modest effects of ACA on employment

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- Slightly positive effect of ACA on savings

- Strong effects of ACA on insurance choice
- Modest effects of ACA on employment
 - But very heterogeneous effects across the income distribution
- Slightly positive effect of ACA on savings
- Default on medical bills as an alternative "insurance" mechanism key to understand effects

Elasticity of Labor Supply

Solve for (approximate) Frisch leisure elasticity analytically

$$\mathit{IES}_{\mathit{I}} = \frac{\gamma(1-\nu)-1}{\nu}$$

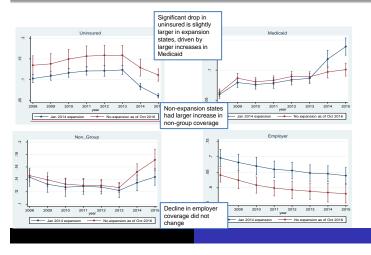
The Frisch labor supply elasticity is

$$IES_{h} = -\frac{h_{t}}{leisure_{t}}IES_{l} = -\frac{h_{t}}{L-h_{t}}\frac{\gamma(1-\nu)-1}{\nu}$$
(1)

.

The Medicaid Expansion and Retirement

Sources of coverage, Expansion vs. non-expansion states Individuals ages 55-64, American Community Survey



From Levy, Buchmueller, and Nikpay (2017) Back to table

Health Insurance State Transitions

Health Insurance States and Possibilities

l_{t-1}	$P_{t-1} = 1$	I _t	t	H _t = disabled	cat. needy Y _t , A _t	Payment sources
retiree		retiree	< 65	no		R
				yes	no	R + MC
			\geq 65		no	R + MC
		non-group	< 65	yes	yes	(MC +) MA
			\geq 65		yes	MC + MA
tied	yes	tied	< 65	no		т
			\geq 65		no	T + MC
		non-group	\geq 65		yes	MC + MA
	no	non-group	< 65	no		{U, P}
				yes	no	МС
					yes	(MC +) MA
			\geq 65		no	МС
					yes	MC + MA
non-group		non-group	< 65	no		{U, P}
				yes	no	мс
					yes	(MC +) MA
			\geq 65		no	мс
					yes	MC + MA

4/4