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Saving During Retirement

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Assets held after retirement are large

- More than one-third of total wealth in the United States is held by households whose heads are over age 65 (Wolff 2004).
- Many countries are in similar circumstances.
- Why people save during retirement is a crucial question for
 - The elderly's consumption and welfare.
 - Policy evaluation.

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Assets held after retirement do not decline fast with age

- Retired US households and especially those with high income
 - Decumulate their net worth more slowly than implied by a
 - Basic life-cycle model
 - People start retirement with assets and income (Social Security entitlements).
 - There is lifespan uncertainty.
 - People save to smooth their consumption while alive.

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Potential saving motives behind this behavior?

Today, we will explore

- Medical expenses
- Heterogeneity in uncertain lifetimes
- Public insurance programs
- Bequest motives

Research joint with Eric French and John Jones, various papers.



Notice that

• The first three factors have to do with risks, and hence affect precautionary savings

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- Medical expenses
- Heterogeneity in uncertain lifetimes
- Public insurance programs
- Bequests and family structure are tightly connected to bequest motives.

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Identifying precautionary savings vs. bequest motives

- Assets are fungible: They can be used to
 - Smooth consumption in presence of shocks
 - Leave bequests
- How to separately identify saving
 - Against risks (precautionary motives)
 - For one's heirs (bequests and family structure motives)?

Identifying precautionary savings vs. bequest motives

- We can measure the risks well.
- But the strength of two key saving motives also depends on
 - Patience
 - Risk aversion
 - The strength of the bequest motive
 - The extent to which bequests are a luxury good
- These four parameters are hard to separately identify using assets data only.
- Distinction of precautionary savings/bequest motives is crucial (De Nardi, French, and Jones 2016, AR).

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Goal for this talk

- Document some retirement US facts
- Discuss the role of these forces in shaping retirement savings
 - Medical expenses (DFJ 2010 JPE and 2016 AER)
 - Bequests
 - Public insurance programs
 - Life expectancy (DFJ 2009 AER P&P)
- What have we learned and what remains to be done?

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Health and Retirement Survey (AHEAD) data, US

- Household heads aged 70 or older in 1994
- Consider only the retired singles
- Follow-up interviews every two years
- 2,688 individuals
- Use full, unbalanced panel

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Net worth by age and cohort



• High-income retirees dissave very little until really old

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Net worth by age and cohort



• High-income retirees dissave very little until really old

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Average medical expenses



Out-of-pocket medical costs rise with age and permanent income

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Life expectancy at age 70 in the US

- By income:
 - Top quintile of income distribution: 14.7 years
 - Bottom quintile of income distribution: 11.1 years
- By gender:
 - Women: 14.3 years
 - Men 9.7
- People who self report being in good health at age 70 live longer

This might have an important effect on retirement savings.



Retirement Savings Facts, summary

- Medical expenses rise fast with age and permanent income during retirement.
- Many elderly individuals keep lots of assets.
- High income individuals deplete their assets more slowly than low income individuals.
- High income people, women, and healthy people live much longer.

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This holds true for both singles and couples. We will focus on singles in this talk.

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More Facts: Heterogeneity

- Data show considerable heterogeneity in
 - Life expectancy
 - Medical expenses
- By:
 - Age
 - Gender
 - Permanent income
 - Health

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Heterogeneity implications

- For saving behavior
 - Differential mortality \Rightarrow Heterogenous saving rates, with high PI people and women saving more.
 - Medical expenses rise quickly with age \Rightarrow Keep assets for old age.
 - Medical expenses rising with $\mathsf{PI} \Rightarrow \mathsf{High} \; \mathsf{PI}$ people dissave more slowly.

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Heterogeneity implications: continued

- For observed sample: mortality bias
 - Sample changes: High PI people + women live longer







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• In an unbalanced panel, this causes observed assets to **increase** with age

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How do we address these questions?

We write down a structural model, which we estimate in two steps:

- First step: Estimate mortality and medical expenses as a function of age, gender, health and permanent income.
- Second step: Use first step results to estimate our model with method of simulated moments.

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More on the second step

- Match median assets by permanent income quintile, cohort and age.
- Correct for cohort effects by using cohort-specific moments and initial conditions.
- Correct for mortality bias (rich people live longer) by allowing mortality rates to depend on permanent income and gender.



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Benchmark model

- Singles only, abstract from spousal survival.
- Households maximize total expected lifetime utility.
- Flow utility from consumption (CRRA). Utility can vary with health.
- **Rational expectations.** Expectations about mortality rates, health cost distribution, etc., are estimated from the data.
- **Bequest motive.** Functional form follows De Nardi (2004): bequests are a luxury good.



- Health status: age-, gender- and permanent-income-specific Markov chain.
- **Survival:** function of gender, age, health status, and permanent income.
- Medical expenses:

$$\begin{aligned} \ln(m_t) &= m(g, h_t, I, t) + \sigma(g, h_t, I, t)\psi_t, \\ \psi_t &= \zeta_t + \xi_t, \\ \zeta_t &= AR(1) \text{ shock}, \\ \xi_t &= \text{ white noise shock.} \end{aligned}$$

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- Standard asset accumulation equation
- Government transfers support a consumption floor

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Borrowing constraint

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Recursive formulation

$$\begin{aligned} V_t(x_t, g, I, h_t, \zeta_t) &= \max_{c_t, x_{t+1}} \left\{ [1 + \delta h_t] \frac{c_t^{1-\nu}}{1-\nu} \\ &+ \beta s_{g,h,I,t} E_t \Big(V_{t+1}(x_{t+1}, g, I, h_{t+1}, \zeta_{t+1}) \Big) \\ &+ \beta (1 - s_{g,h,I,t}) \theta \frac{(x_t - c_t + k)}{1-\nu} \right\} \end{aligned}$$

 $x_t = \text{cash-on-hand}$ $g = \text{gender}; \quad I = \text{permanent income}$ $h_t = \text{health status (0 <math>\Rightarrow$ bad, 1 \Rightarrow good) $\zeta_t = \text{persistent health cost shock}$



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Estimation results (DFJ 2010 JPE)

- The model's estimated preference parameters are consistent with many other estimates ($\nu = 3.8$, $\beta = 0.97$).
- Estimated government insurance is stingy (consumption floor: \$2,600 a year).
- The model fits the data well.
- The model generates similar mortality bias to the one in the data.

Mortality bias



Figure: Left panel \rightarrow AHEAD data; right panel \rightarrow benchmark model

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Estimation results: bequests

- Bequest motives are large for the richest people, but very imprecisely estimated.
 - They do not improve the model's fit.
 - They do not not change other parameters.
- This does **not** mean bequests are unimportant:
 - The estimated bequest motive implies that **the period before certain death** the rich bequeath 88 cents of every dollar.
 - Our moments (mainly assets) likely are not enough to identify bequest motives.

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Eliminating medical expenditures



 Eliminating out-of-pocket medical expenditures has a big effect on savings.

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Reducing the consumption floor by 20%



• Lowering the consumption floor has a significant effect on savings, especially for richer singles.

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Conclusions from DFJ 2010 JPE, and 2016 AER

- Medical spending that rises fast with income and age goes a long way to explaining savings of single retirees
- Social insurance (from Medicaid) affects savings even of the high income
- Above results robust to allowing for
 - Endogenous medical spending
 - Bequest motives

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Life expectancy heterogeneity, AER 2009

How much of the asset accumulation of old rich people is due to longer life expectancy and lifespan risk?

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Median net worth, various mortalities



Savings by age and permanent income. From top: baseline; all sick; all males and sick; all male, sick, and poor.

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Median net worth: eliminating lifespan risk



Savings by age and permanent income. All male, sick, and poor. Top: with lifespan uncertainty. Bottom: no lifespan uncertainty.

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Life expectancy and savings, conclusions (DFJ 2009 AER)

- Differences in life expectancy related to health, gender, and permanent income are important to understanding savings patterns across groups.
- The effect of each factor is of a similar order of magnitude.
- The risk of living beyond one's expected lifespan has huge effects on saving.

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Medicaid paper (DFJ 2016 AER)

- Better model means-tested government health insurance.
- Also match program participation, not just assets.
- Find larger bequest motives. Why?
 - Matching Medicaid recipiency identifies a more generous Medicaid.
 - This requires weaker precautionary savings and stronger bequest motives.
- Medical expenses still key to explain savings.

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What have we learned so far more broadly?

- Medical expenses have large effects on savings during retirement, especially for higher income people.
- Heterogeneity in mortality is large and important. So is lifespan uncertainty.
- Government insurance also affects the savings of initially well-off people.
- Careful measuring and modeling of both risks and insurance and additional target moments (than assets) are crucial for disentangling saving motives.

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What have we learned so far about identification?

We can fit patterns of dissaving after retirement using

- Precautionary motives
- Bequest motives

Both motives imply similar patterns of dissaving.

 \Rightarrow Several preference parameter configurations fit retirement savings.

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What's the solution?

Use other data to distinguish between precautionary motives and bequest motives, such as

- Government insurance take up rate: De Nardi, French and Jones (2016).
- Private insurance choices: Lockwood (2015), Inkmann and Michaelides (2012).
- Hypothetical responses: Ameriks et al. (2015).
- Housing: Nakajima and Telyukova (2015).



Benchmark model

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Conclusions

Broader ideas for future research

- Evaluating more the role of the family and savings. How should we model the family? How does the family affects risks and insurance?
- Do children help parents? Do they do it for money?
- How should be best model health investment? What moments should we match?
- Cross-country comparisons.