

# Why does consumption fluctuate in old age and how should the government insure it?

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October 4, 2020

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# Motivation

- ▶ Population is aging in many countries
  - ▶ Old-age dependency ratio: 21 in 1990 vs. 30 in 2019
  - ▶ Projected to increase to 49 in 2050
- ▶ Aging associated with more frequent and severe health problems

⇒ Older households can face **both income and health shocks**

⇒ **How important are these shocks and to what extent are people able to insure against their economic consequences?**

⇒ **Implications:** value of additional health insurance

# Measuring insurance

- ▶ Insurance: extent to which an initial change in current resources is passed on to current consumption
  - ▶ Income shocks :
    - ▶ Change in **resources**
  - ▶ Health shocks :
    - ▶ Change in **resources** (medical spending, earning capacity)
    - ▶ Change in **utility**
- ⇒ Changes in utility **should be passed on to consumption**
- ⇒ Whether the response of consumption reflects lack of insurance depends on **why consumption responds**

# Contributions

1. Measure transitory **income and health risk** in old age
  - ▶ Focus on transitory shocks
  - ▶ Large variance of both income and health transitory shocks
2. Estimate **pass-through of shocks to consumption**
  - ▶ Consumption responds significantly to both
  - ▶ Substantial heterogeneity across goods and households
3. Determine the share of the response to health shocks **reflecting change in resources vs. shift in utility**
  - ▶ Shift in utility explains most of the response
  - ▶ Modest effect of health shocks on available resources

## Literature Review

1. **Impact of health shocks on economic outcomes:** Dobkin, Finkelstein, Kluender, and Notowidigdo (2018), Morrison, Gupta, Olson, Mstat, and Keenan (2013); Meyer and Mok (2016), Poterba, Venti, and Wise (2017)
2. **Dependence between utility of consumption and health:** Viscusi and Evans (1990), Evans and Viscusi (1991), Finkelstein, Luttmer, and Notowidigdo (2009), Finkelstein, Luttmer, and Notowidigdo (2013)
3. **Consumption insurance:** Cochrane (1991), Attanasio and Davis (1996); Krueger and Perri (2005, 2006), Blundell and Preston (1998), Blundell, Low, and Preston (2013), Blundell, Pistaferri, and Preston (2008)
4. **Savings and risk during retirement:** Love, Palumbo, and Smith (2009), De Nardi, French, and Jones (2010), Blundell, Crawford, French, and Tetlow (2016), Poterba, Venti, and Wise (2018); Kopeccky and Koreshkova (2014); Braun, Kopeccky, and Koreshkova (2016)

# Plan

Data: HRS and CAMS

Methodology for estimating variances and pass-through

Results for variances and pass-through

Structural model to distinguish resources from utility effects

Results for decomposition between the effects of resources and utility

Conclusion

# Data

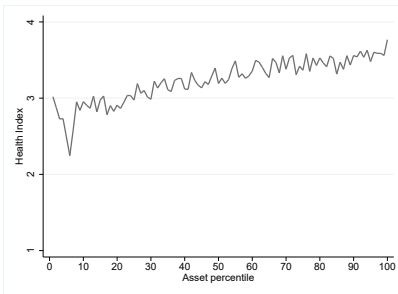
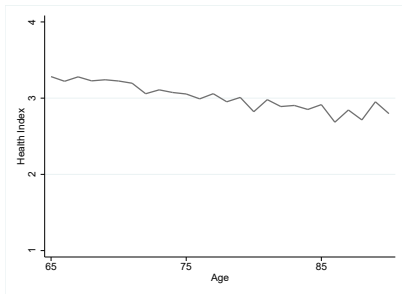
- ▶ **Health and Retirement Survey (HRS)** - Rand version of data  
⇒ Income and health data
- ▶ **Consumption and Activities Mail Survey (CAMS)**  
⇒ Consumption and medical expenditures data
- ▶ Both collected biannually: a period is **two years**
- ▶ Observation period is **2001-2013**

## Health index

- ▶ Predicted value from regression **self-reported health** (1-5 scale) on **objective measures of health** (health conditions and ability to perform physical activities + initial health status + age + year)
- ▶ Avoids capturing fluctuations in self-reported health that are **not driven by objective fluctuations**
- ▶ Similar to Blundell, Britton, Costa-Diaz and French (2017)
- ▶ For households with two spouses, we use the average of the two
- ▶ The lower the health index, the worse is health



# Health index by age (left panel) and by wealth (right panel) without attrition



# Income, wealth and consumption

- ▶ **Income:**
  - ▶ Net income (earnings, pensions, capital income, benefits, other income); sum of incomes of head and spouse (if any)
- ▶ **Wealth:**
  - ▶ Net wealth per adult equivalent; deflated using 2015 CPI
  - ▶ Low-wealth: below \$ 75,000 per adult equivalent
  - ▶ High-wealth: above \$ 75,000 per adult equivalent
- ▶ **Nondurable consumption:**
  - ▶ Sum of necessities (food, utilities, and car-related expenses), plus expenses on leisure activities and on equipment; deflated using category specific 2015 CPI
- ▶ **Medical expenses:**
  - ▶ Out-of-pocket expenditures on drugs, on medical services and medical supplies; deflated using category specific 2015 CPI

# Income categories

Includes:

- ▶ earnings
- ▶ capital income
- ▶ pensions
- ▶ income from Social Security disability and Supplemental Security income
- ▶ income from Social Security retirement and widow benefits
- ▶ unemployment benefits and worker's compensation
- ▶ veterans benefits, welfare, and food stamps
- ▶ alimony, other income, and lump sums from insurance, pension, and inheritance

NB: 73.79% have a head fully retired, 13.09% partly retired, 8% work part time or full time, remainder are not in the labour force

# Consumption categories

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## Consumption

|             |             |  |
|-------------|-------------|--|
| Necessities | Food        | Food at home, food away from home  |
|             | Utilities   | Electricity, water, heat, phone and internet   |
| Luxuries    | Car-related | Car insurance, car repairs, gasoline   |
|             | Leisure     | Trips and vacations, tickets, sport equipment, hobbies equipment, contributions to charities, gifts                        |
|             | Equipment   | House supplies, house services, yard/garden supplies, yard/garden services, clothing, personal care equipment and services |

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## Medical exp.

|                |                                    |
|----------------|------------------------------------|
| Drugs          | Drugs                              |
| Serv. and sup. | Medical services, medical supplies |

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## Sample selection

- ▶ All households with complete information, age 65-90, interviewed in regular interview year in the HRS
- ▶ Trim at top and bottom 1% in change of log consumption, income, and medical expenditures
- ▶ Demographic controls for: year of birth, year, education, race, region, number of household members, marital status, labor force status (both husband and wife, if present), year interactions.

⇒ **5,105 observations**

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# Statistical model

$$\ln(\tilde{y}_{i,t}) = p_{i,t}^y + \varepsilon_{i,t}^y, \quad \text{with} \quad p_{i,t}^y = p_{i,t-1}^y + \eta_{i,t}^y.$$

$$\tilde{h}_{i,t} = p_{i,t}^h + \varepsilon_{i,t}^h, \quad \text{with} \quad p_{i,t}^h = p_{i,t-1}^h + \eta_{i,t}^h,$$

Assumptions:

- i  $\varepsilon^h, \eta^h, \varepsilon^y, \eta^y$ , are **drawn independently over time and across households** (but not necessarily drawn from same distributions at each period and for each household)
- ii  $\varepsilon_{i,t}$  and  $\eta_{i,t}$  are independent of one another, but the  $\varepsilon_{i,t}^y$  and  $\varepsilon_{i,t}^h$  **can be correlated**, and  $\eta_{i,t}^y$  and  $\eta_{i,t}^h$  **can be correlated**

Consumption (net of demographics) simply a flexible function of current and past shocks

# Moments

|                           | $\Delta \ln(y_t)$ | $\Delta \ln(y_{t+1})$ | $\Delta \ln(y_{t+2})$ |
|---------------------------|-------------------|-----------------------|-----------------------|
| $cov(\Delta \ln(y_t), .)$ | .215***<br>(.007) | -.088***<br>(.005)    | -.008<br>(.005)       |
| $cov(\Delta \ln(c_t), .)$ | .016***<br>(.003) | -.010***<br>(.003)    | -.001<br>(.004)       |
| Obs.                      | 5,105             | 5,105                 | 3,127                 |
|                           | $\Delta h_t$      | $\Delta h_{t+1}$      | $\Delta h_{t+2}$      |
| $cov(\Delta h_t, .)$      | .064***<br>(.002) | -.02***<br>(.001)     | -.003<br>(.002)       |
| $cov(\Delta \ln(c_t), .)$ | .006***<br>(.002) | -.004**<br>(.002)     | .005**<br>(.002)      |
| Obs.                      | 5,105             | 5,105                 | 3,127                 |

Standard errors in parentheses. \* at 10%, \*\* at 5%, \*\*\* at 1%



# Discussion of statistical model

**Income** shocks after age 65:

- ▶ transitory-permanent process standard for modeling earnings
- ▶ **no evidence of different dynamics** when including pensions, capital, other income
- ▶ similar overall results when **excluding capital income**

**Health** shocks after age 65:

- ▶ **No significant effect of health insurance:** Black, Espin-Sanchez, French, and Litvak (2017)
- ▶ **No significant effect of past medical expenses:** Brook et al. (1983), Fisher et al. (2003), Finkelstein and McKnight (2008)

## Parameters to estimate

Transitory risk:

$$\text{var}(\boldsymbol{\varepsilon}_{i,t}^y) \quad \text{and} \quad \text{var}(\boldsymbol{\varepsilon}_{i,t}^h)$$

Pass-through coefficients:

$$\phi^{\varepsilon^y} = \frac{\text{cov}(\Delta \ln(\tilde{c}_{i,t}), \boldsymbol{\varepsilon}_{i,t}^y)}{\text{var}(\boldsymbol{\varepsilon}_{i,t}^y)} \quad \text{and} \quad \phi^{\varepsilon^h} = \frac{\text{cov}(\Delta \ln(\tilde{c}_{i,t}), \boldsymbol{\varepsilon}_{i,t}^h)}{\text{var}(\boldsymbol{\varepsilon}_{i,t}^h)}$$

- ▶ Share of transitory income fluctuations in the sample that translates into consumption fluctuations (idem for health)
- ▶ Can be interpreted as an elasticity under additional assumptions

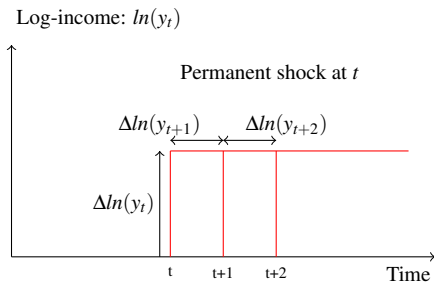
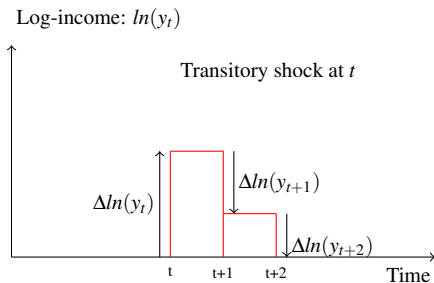
# Identification strategy

**Problem:**  $\varepsilon_t^y$  and  $\varepsilon_t^h$  not observed in the data, only  $\Delta \ln(y_t)$  and  $\Delta h_t$  are

**Solution:**

- ▶ Use future growth  $\Delta \ln(y_{t+1})$  and  $\Delta h_{t+1}$  as instrument
- ▶ Capture the mean reversion of the transitory shock at  $t$
- ▶ Independent of the permanent shock at  $t$

# Identification: instrumenting with future growth



# Estimating restrictions for income and health risk

- ▶ Variance of temporary health shocks:

$$\text{var}(\boldsymbol{\varepsilon}_{i,t}^h) = \text{cov}(\Delta h_{i,t}, -\Delta h_{i,t+1})$$

- ▶ Variance of temporary income shocks:

$$\text{var}(\boldsymbol{\varepsilon}_{i,t}^y) = \text{cov}(\Delta \ln(y_{i,t}), -\Delta \ln(y_{i,t+1}))$$

- ▶ Other parameters:

- ▶ Variance of permanent income shocks:

$$\text{var}(\boldsymbol{\eta}_t^y) = \text{cov}(\Delta \tilde{y}_t, \Delta \tilde{y}_{t-1} + \Delta \tilde{y}_t + \Delta \tilde{y}_{t+1}).$$

- ▶ Variance of permanent health shocks:

$$\text{var}(\boldsymbol{\eta}_t^h) = \text{cov}(\Delta \tilde{h}_t, \Delta \tilde{h}_{t-1} + \Delta \tilde{h}_t + \Delta \tilde{h}_{t+1}),$$

- ▶ Covariance:

$$\text{cov}(\boldsymbol{\varepsilon}_t^h, \boldsymbol{\varepsilon}_t^y) = \text{cov}(\Delta \tilde{y}_t, -\Delta \tilde{h}_{t+1}),$$

$$\text{cov}(\boldsymbol{\varepsilon}_t^h, \boldsymbol{\varepsilon}_t^y) = \text{cov}(\Delta \tilde{h}_t, -\Delta \tilde{y}_{t+1}).$$

# Estimating restrictions for covariance with consumption and pass-through

- ▶ Again, use future growth as an instrument:

$$\text{cov}(\Delta \ln(\tilde{c}_{i,t}), \varepsilon_{i,t}^h) = \text{cov}(\Delta \ln(\tilde{c}_{i,t}), -\Delta \tilde{h}_{i,t+1})$$

$$\text{cov}(\Delta \ln(\tilde{c}_{i,t}), \varepsilon_{i,t}^y) = \text{cov}(\Delta \ln(\tilde{c}_{i,t}), -\Delta \ln(\tilde{y}_{i,t+1}))$$

- ▶ Pass-through coefficients are identified from:

$$\hat{\phi}_c^{\varepsilon^h} = \frac{\text{cov}(\Delta \ln(\tilde{c}_{i,t}), -\Delta \tilde{h}_{i,t+1})}{\text{cov}(\Delta \tilde{h}_{i,t}, -\Delta \tilde{h}_{i,t+1})} = \phi_c^{\varepsilon^h}$$

$$\hat{\phi}_c^{\varepsilon^y} = \frac{\text{cov}(\Delta \ln(\tilde{c}_{i,t}), -\Delta \ln(\tilde{y}_{i,t+1}))}{\text{cov}(\Delta \ln(\tilde{y}_{i,t}), -\Delta \ln(\tilde{y}_{i,t+1}))} = \phi_c^{\varepsilon^y}$$

- ▶ Not possible to estimate the pass-through to permanent shocks without more stringent restrictions

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## Income risk

|                        | All               | Low wealth        | High wealth       |
|------------------------|-------------------|-------------------|-------------------|
| $var(\varepsilon_t^y)$ | .088***<br>(.005) | .067***<br>(.009) | .093***<br>(.005) |
| Obs.                   | 5105              | 1000              | 4105              |
| $var(\eta_t^y)$        | .029***<br>(.005) | .018*<br>(.01)    | .031***<br>(.006) |
| Obs.                   | 3494              | 655               | 2839              |

Standard errors in parentheses. \* at 10%, \*\* at 5%, \*\*\* at 1%

⇒ Transitory risk is 3 times larger than permanent risk

⇒ Larger for high wealth households



## Income risk excluding capital income

|                            | All               | Low wealth       | High wealth       |
|----------------------------|-------------------|------------------|-------------------|
| $var(\varepsilon_{i,t}^y)$ | .097***<br>(.006) | .075***<br>(.01) | .103***<br>(.006) |
| $var(\eta_{i,t}^y)$        | .035***<br>(.007) | .009<br>(.013)   | .041***<br>(.008) |

Standard errors in parentheses. \* at 10%, \*\* at 5%, \*\*\* at 1%

## Health risk

|   | All               | Low wealth        | High wealth       |
|---|-------------------|-------------------|-------------------|
| $var(\varepsilon_{i,t}^h)$                      | .020***<br>(.001) | .035***<br>(.004) | .017***<br>(.001) |
| Obs.  | 5105              | 1000              | 4105              |
| $var(\eta_{i,t}^h)$                             | .019***<br>(.002) | .032***<br>(.005) | .017***<br>(.002) |
| Obs.  | 3494              | 655               | 2839              |
| $cov(\varepsilon_{i,t}^h, \varepsilon_{i,t}^y)$ | .003**<br>(.001)  | .003<br>(.003)    | .003**<br>(.001)  |
| Obs.  | 5105              | 1000              | 4105              |

Standard errors in parentheses. \* at 10%, \*\* at 5%, \*\*\* at 1%

- ⇒ Transitory risk is as large as permanent risk
- ⇒ Substantially larger for low wealth households
- ⇒ S.d. = 0.141 (change in ability to carry 10 lb = 0.152; change in score for depression 0.045)

## Pass-through to consumption

|                        | Income shocks     |                   |                  | Health shocks     |                   |                 |
|------------------------|-------------------|-------------------|------------------|-------------------|-------------------|-----------------|
|                        | All               | Low w.            | High w.          | All               | Low w.            | High w.         |
| Nondurables            | .109***<br>(.036) | .23**<br>(.101)   | .087**<br>(.039) | .173**<br>(.085)  | .325***<br>(.12)  | .094<br>(.112)  |
| <i>Necessities</i>     | .089**<br>(.04)   | .332***<br>(.109) | .046<br>(.042)   | .082<br>(.089)    | .321***<br>(.131) | -.041<br>(.114) |
| <i>Leis. &amp; eq.</i> | .105*<br>(.063)   | -.21<br>(.175)    | .16***<br>(.066) | .361***<br>(.147) | .354*<br>(.212)   | .365*<br>(.191) |
| Obs.                   | 5105              | 1000              | 4105             | 5105              | 1000              | 4105            |

Standard errors in parentheses. \* at 10%, \*\* at 5%, \*\*\* at 1%

⇒ No perfect insurance against transitory income shocks

⇒ Significant response of consumption to transitory health shocks

## Pass-through excluding capital income

|                       | Income shock      |                   |                   | Health shock      |                   |                 |
|-----------------------|-------------------|-------------------|-------------------|-------------------|-------------------|-----------------|
|                       | Total             | Low w.            | High w.           | Total             | Low w.            | High w.         |
| Nondurables           | .095***<br>(.036) | .186*<br>(.101)   | .078**<br>(.038)  | .172**<br>(.085)  | .325***<br>(.12)  | .093<br>(.112)  |
| <i>Necessities</i>    | .066*<br>(.039)   | .283***<br>(.105) | .027<br>(.041)    | .082<br>(.089)    | .321***<br>(.131) | -.041<br>(.114) |
| <i>Leis &amp; eq.</i> | .12**<br>(.06)    | -.182<br>(.173)   | .174***<br>(.062) | .358***<br>(.147) | .354*<br>(.212)   | .36*<br>(.191)  |
| Obs.                  | 5139              | 1017              | 4122              | 5101              | 1000              | 4101            |

Standard errors in parentheses. \* at 10%, \*\* at 5%, \*\*\* at 1%

## Pass-through with low and high liquid wealth

|                    | Income shock     |                   |                | Health shock    |                 |                |
|--------------------|------------------|-------------------|----------------|-----------------|-----------------|----------------|
|                    | High w.          | Low liq.          | High liq.      | High w.         | Low liq.        | High liq.      |
| Nondurables        | .087**<br>(.039) | .212***<br>(.083) | .047<br>(.042) | .094<br>(.112)  | .01<br>(.187)   | .149<br>(.141) |
| <i>Necessities</i> | .046<br>(.042)   | .146<br>(.094)    | .013<br>(.047) | -.041<br>(.114) | -.174<br>(.193) | .046<br>(.139) |
| <i>Luxuries</i>    | .16***<br>(.066) | .312**<br>(.151)  | .11<br>(.07)   | .365*<br>(.191) | .494<br>(.311)  | .281<br>(.238) |
| Obs.               | 4174             | 1247              | 2927           | 4105            | 1221            | 2884           |

Standard errors in parentheses. \* at 10%, \*\* at 5%, \*\*\* at 1%

⇒ the Wealthy Hand-to-Mouth are driving the response of high wealth households to a transitory income shock

## Pass-through to out-of-pocket medical expenses

- ▶ No response to an income shock
- ▶ Significant response to a health shock but modest level change (\$ 1,571 for a 1 unit change in health)
- ▶ Driven by low-wealth households (\$ 2,517 for a 1 unit change in health among low-wealth households)

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# Household maximization problem

$$\max_{\{c_t\}_{t=0}^T} \sum_{t=0}^T \beta^t E_0 \left[ s_t(\pi_t^h) \left( \sum_{k=1}^K \delta_k(h_t) u(c_t^k) + \kappa(h_t) v(\tilde{m}_t) - \alpha(h_t) \right) \right]$$

subject to:

$$p_{t+1} a_{t+1} = (1 + r_t) p_t a_t + p_t y_t - p_t^m m_t(\tilde{m}_t) - \sum_{k=1}^K p_t^k c_t^k \quad \forall t,$$

$$c_t^k \geq 0 \quad \forall t, \quad \forall k,$$

$$a_T \geq 0,$$

- ▶ Survival probabilities  $s_t(\pi_t^h)$  allowed to depend on the permanent component of health
- ▶ Utility additively separable in each good  $k$  and in medical expenses
- ▶ Health-dependent weight  $\delta_k(h_t)$  on the utility derived from each good  $k$



## Expressions of the pass-through coefficients in this model

- ▶ Obtain **expressions of the elasticities** of consumption to transitory income and health shocks
- ▶ They write as the sum of the contributions of the effect of the shock on **resources** and its effect on **utility**
- ▶ **Two coefficients:**
  - The effect on consumption of an additional change in resources caused by the shock
  - The effect on consumption of the shift in utility caused by an additional change in current health caused by the shock

# Expressions of the pass-through coefficients in this model

$$\begin{aligned}
 \frac{d\ln(c_t^k)}{d\varepsilon_t^h} = & \underbrace{\left( \frac{d\ln(y_t)}{d\varepsilon_t^h} \frac{p_t y_t}{p_t} - \frac{d\ln(m_t)}{d\varepsilon_t^h} \frac{p_t^m m_t}{p_t} - \sum_{l \neq k} \frac{d\ln(c_t^l)}{d\varepsilon_t^h} \frac{p_t^l c_t^l}{p_t} \right)}_{\substack{\text{effect of the shock on real future assets (resources)} \\ \frac{da_{t+1}/p_t}{d\varepsilon_t^h} \\ \text{multiplier of resources on consumption} \\ A_t^k}} \\
 & \underbrace{= 0 \text{ if the shock does not affect income nor other spending}} \\
 & + \underbrace{\left( \frac{dh_t}{d\varepsilon_t^h} \right)}_{\substack{\text{effect of the shock on current health} \\ \text{multiplier of the shift in utility caused by a change in health on consumption} \\ B_t^k}}, \\
 & \underbrace{= 0 \text{ if } \delta_1(\cdot) \text{ is a constant}}
 \end{aligned}$$

Expression of income elasticity  $d\ln(c_t^k)/d\varepsilon_t^y$  with similar  $A_t^k$  and  $B_t^k$ .

# Expressions of the pass-through coefficients in this model

$$\begin{aligned}
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 & \underbrace{= 0 \text{ if the shock does not affect income nor other spending}} \\
 & + \underbrace{\left( \frac{dh_t}{d\varepsilon_t^h} \right)}_{\substack{\text{effect of the shock on current health} \\ \text{multiplier of the shift in utility caused by a change in health on consumption} \\ B_t^k}}, \\
 & \underbrace{= 0 \text{ if } \delta_1(\cdot) \text{ is a constant}}
 \end{aligned}$$

Expression of income elasticity  $d\ln(c_t^k)/d\varepsilon_t^y$  with similar  $A_t^k$  and  $B_t^k$ .

## Analytical expressions of the multipliers

$$A_t^k = \frac{E_t \left[ \frac{dc_{t+1}^k}{da_{t+1}} \frac{-u''(c_{t+1}^k)}{-u''(c_t^k)} \frac{\delta_k(h_{t+1})}{\delta_k(h_t)} \frac{s_{t+1}(\pi_{t+1}^h)}{s_t(\pi_t^h)} \frac{p_t^k}{p_{t+1}^k/p_{t+1}} \right] \beta(1+r)}{c_t^k + \frac{c_t^k p_t^k}{p_t} E_t \left[ \frac{dc_{t+1}^k}{da_{t+1}} \frac{-u''(c_{t+1}^k)}{-u''(c_t^k)} \frac{\delta_k(h_{t+1})}{\delta_k(h_t)} \frac{s_{t+1}(\pi_{t+1}^h)}{s_t(\pi_t^h)} \frac{p_t^k}{p_{t+1}^k/p_{t+1}} \right] \beta(1+r)}$$

$$B_t^k = \frac{\frac{\delta_k'(h_t)}{\delta_k(h_t)} \frac{u'(c_t^k)}{-u''(c_t^k)}}{c_t^k + \frac{c_t^k p_t^k}{p_t} E_t \left[ \frac{dc_{t+1}^k}{da_{t+1}} \frac{-u''(c_{t+1}^k)}{-u''(c_t^k)} \frac{\delta_k(h_{t+1})}{\delta_k(h_t)} \frac{s_{t+1}(\pi_{t+1}^h)}{s_t(\pi_t^h)} \frac{p_t^k}{p_{t+1}^k/p_{t+1}} \right] \beta(1+r)}$$

Note that  $A_t^k$  and  $B_t^k$  capture the effect of the multiplier on the borrowing constraint.

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## Decomposition results

|   | All                 | Low wealth          | High wealth        |
|---|---------------------|---------------------|--------------------|
| $\phi_c^{\varepsilon^h}$                  | 0.196**<br>(0.086)  | 0.381***<br>(0.121) | 0.083**<br>(0.115) |
| Contribution of change in resources       | 0.023***<br>(0.012) | 0.034*<br>(0.020)   | 0.023**<br>(0.015) |
| <i>Av. change in resources - 1 health</i> | \$11,893            | \$5,118             | \$15,395           |
| <i>Resources multiplier (\$1,000)</i>     | 0.002***<br>(0.001) | 0.007*<br>(0.004)   | 0.002**<br>(0.001) |
| Contribution of shift in utility          | 0.173**<br>(0.086)  | 0.346***<br>(0.121) | 0.081<br>(0.112)   |
| Obs.                                      | 4,975               | 956                 | 4,019              |

Standard errors in parentheses. \* at 10%, \*\* at 5%, \*\*\* at 1%

NB: Effect of shift in utility is **not necessarily homogeneous** by wealth

## Decomposition results - Necessities and utilities

|                                     | All                | Low wealth          | High wealth        |
|-------------------------------------|--------------------|---------------------|--------------------|
| <i>Necessities</i>                  |                    |                     |                    |
| $\phi_c^{\varepsilon^h}$            | .1<br>(.09)        | .38***<br>(.13)     | -.037<br>(.115)    |
| Contribution of change in resources | 0.014**<br>(0.007) | 0.034***<br>(0.001) | 0.023<br>(0.023)   |
| Contribution of shift in utility    | .086<br>(.09)      | .339***<br>(.13)    | -.047<br>(.115)    |
| <i>Luxuries</i>                     |                    |                     |                    |
| $\phi_c^{\varepsilon^h}$            | .379***<br>(.148)  | .389*<br>(.223)     | .374**<br>(.189)   |
| Contribution of change in resources | 0.021<br>(0.011)   | -0.011<br>(0.008)   | 0.044**<br>(0.015) |
| Contribution of shift in utility    | .358***<br>(.148)  | .4*<br>(.226)       | .33*<br>(.189)     |
| Obs.                                | 4971               | 954                 | 4017               |

Standard errors in parentheses. \* at 10%, \*\* at 5%, \*\*\* at 1%

# Plan

Data: HRS and CAMS

Methodology for estimating variances and pass-through

Results for variances and pass-through

Structural model to distinguish resources from utility effects

Results for decomposition between the effects of resources and utility

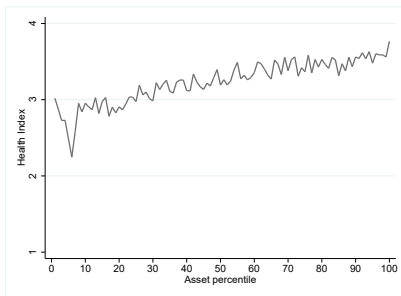
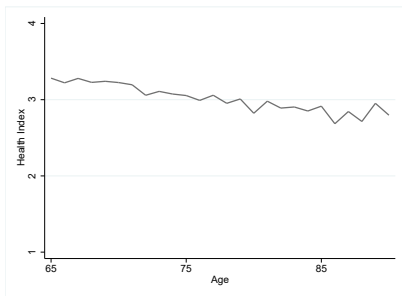
**Conclusion**



# Conclusion

- ▶ Households in old age are subject to **substantial transitory income and health risks**
- ▶ They are **not perfectly insured against transitory income shocks** (except for high total wealth and high liquid wealth households)
- ▶ They are **relatively well insured against transitory health shocks**, because these shocks have **modest economic consequences**, in particular for low-wealth households

# Health index by age (left panel) and by wealth (right panel) without attrition



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## Income categories

Income includes:

- ▶ earnings (wage/salary income, bonuses/overtime pay/commissions/tips, 2nd job or military reserve earnings, professional practice or trade income)
- ▶ capital income (business or farm income, self-employment earnings, business income, gross rent, dividend and interest income, trust funds or royalties, and other asset income)
- ▶ pensions (income from all pensions and annuities)
- ▶ income from Social Security disability and Supplemental Security income
- ▶ income from Social Security retirement and widow benefits
- ▶ unemployment benefits and worker's compensation
- ▶ veterans benefits, welfare, and food stamps
- ▶ alimony, other income, and lump sums from insurance, pension, and inheritance

# Consumption categories

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## Consumption

|             |             |  |
|-------------|-------------|--|
| Necessities | Food        | Food at home, food away from home  |
|             | Utilities   | Electricity, water, heat, phone and internet   |
|             | Car-related | Car insurance, car repairs, gasoline   |
| Luxuries    | Leisure     | Trips and vacations, tickets, sport equipment, hobbies equipment, contributions to charities, gifts                        |
|             | Equipment   | House supplies, house services, yard/garden supplies, yard/garden services, clothing, personal care equipment and services |

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## Medical exp.

|                |                                    |
|----------------|------------------------------------|
| Drugs          | Drugs                              |
| Serv. and sup. | Medical services, medical supplies |

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## Sample selection

- ▶ All households with complete information, age 65-90, interviewed in regular interview year in the HRS
- ▶ Trim at top and bottom 1% in change of log consumption, income, and medical expenditures
- ▶ Demographic controls for: year of birth, year, education, race, region, number of household members, marital status, labor force status (both husband and wife, if present), year interactions.

⇒ **5,105 observations**

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# Discussion of statistical model

**Income** shocks after age 65:

- ▶ transitory-permanent process standard for modeling earnings
- ▶ **no evidence of different dynamics** when including pensions, capital, other income
- ▶ similar overall results when **excluding capital income**

**Health** shocks after age 65:

- ▶ **No significant effect of health insurance:** Black, Espin-Sanchez, French, and Litvak (2017)
- ▶ **No significant effect of past medical expenses:** Brook et al. (1983), Fisher et al. (2003), Finkelstein and McKnight (2008)

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# Moments

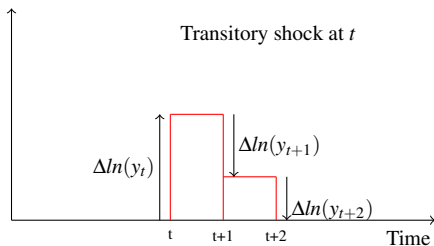
|                               | $\Delta \ln(y_t)$ | $\Delta \ln(y_{t+1})$ | $\Delta \ln(y_{t+2})$ |
|-------------------------------|-------------------|-----------------------|-----------------------|
| $cov(\Delta \ln(y_t), \cdot)$ | .215***<br>(.007) | -.088***<br>(.005)    | -.008<br>(.005)       |
| $cov(\Delta \ln(c_t), \cdot)$ | .016***<br>(.003) | -.010***<br>(.003)    | -.001<br>(.004)       |
| Obs.                          | 5,105             | 5,105                 | 3,127                 |
|                               | $\Delta h_t$      | $\Delta h_{t+1}$      | $\Delta h_{t+2}$      |
| $cov(\Delta h_t, \cdot)$      | .064***<br>(.002) | -.02***<br>(.001)     | -.003<br>(.002)       |
| $cov(\Delta \ln(c_t), \cdot)$ | .006***<br>(.002) | -.004**<br>(.002)     | .005**<br>(.002)      |
| Obs.                          | 5,105             | 5,105                 | 3,127                 |

Standard errors in parentheses. \* at 10%, \*\* at 5%, \*\*\* at 1%

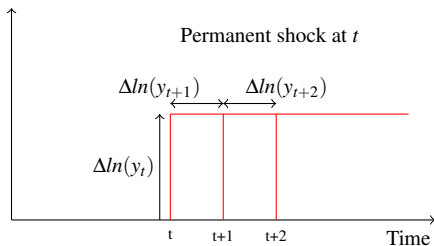
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# Identification: instrumenting with future growth

Log-income:  $\ln(y_t)$



Log-income:  $\ln(y_t)$





# Estimating restrictions for income and health risk

- ▶ Variance of temporary health shocks:

$$\text{var}(\varepsilon_{i,t}^h) = \text{cov}(\Delta h_{i,t}, -\Delta h_{i,t+1})$$

- ▶ Variance of temporary income shocks:

$$\text{var}(\varepsilon_{i,t}^y) = \text{cov}(\Delta \ln(y_{i,t}), -\Delta \ln(y_{i,t+1}))$$

- ▶ Other parameters:

- ▶ Variance of permanent income shocks:

$$\text{var}(\eta_t^y) = \text{cov}(\Delta \tilde{y}_t, \Delta \tilde{y}_{t-1} + \Delta \tilde{y}_t + \Delta \tilde{y}_{t+1}).$$

- ▶ Variance of permanent health shocks:

$$\text{var}(\eta_t^h) = \text{cov}(\Delta \tilde{h}_t, \Delta \tilde{h}_{t-1} + \Delta \tilde{h}_t + \Delta \tilde{h}_{t+1}),$$

- ▶ Covariance:

$$\text{cov}(\varepsilon_t^h, \varepsilon_t^y) = \text{cov}(\Delta \tilde{y}_t, -\Delta \tilde{h}_{t+1}),$$

$$\text{cov}(\varepsilon_t^h, \varepsilon_t^y) = \text{cov}(\Delta \tilde{h}_t, -\Delta \tilde{y}_{t+1}).$$

## Estimating restrictions for covariance with consumption and pass-through

- ▶ Again, use future growth as an instrument:

$$\text{cov}(\Delta \ln(\tilde{c}_{i,t}), \varepsilon_{i,t}^h) = \text{cov}(\Delta \ln(\tilde{c}_{i,t}), -\Delta \tilde{h}_{i,t+1})$$

$$\text{cov}(\Delta \ln(\tilde{c}_{i,t}), \varepsilon_{i,t}^y) = \text{cov}(\Delta \ln(\tilde{c}_{i,t}), -\Delta \ln(\tilde{y}_{i,t+1}))$$

- ▶ Pass-through coefficients are identified from:

$$\hat{\phi}_c^{\varepsilon^h} = \frac{\text{cov}(\Delta \ln(\tilde{c}_{i,t}), -\Delta \tilde{h}_{i,t+1})}{\text{cov}(\Delta \tilde{h}_{i,t}, -\Delta \tilde{h}_{i,t+1})} = \phi_c^{\varepsilon^h}$$

$$\hat{\phi}_c^{\varepsilon^y} = \frac{\text{cov}(\Delta \ln(\tilde{c}_{i,t}), -\Delta \ln(\tilde{y}_{i,t+1}))}{\text{cov}(\Delta \ln(\tilde{y}_{i,t}), -\Delta \ln(\tilde{y}_{i,t+1}))} = \phi_c^{\varepsilon^y}$$

- ▶ Not possible to estimate the pass-through to permanent shocks without more stringent restrictions

## Income risk excluding capital income

|                            | All               | Low wealth       | High wealth       |
|----------------------------|-------------------|------------------|-------------------|
| $var(\varepsilon_{i,t}^y)$ | .097***<br>(.006) | .075***<br>(.01) | .103***<br>(.006) |
| $var(\eta_{i,t}^y)$        | .035***<br>(.007) | .009<br>(.013)   | .041***<br>(.008) |

Standard errors in parentheses. \* at 10%, \*\* at 5%, \*\*\* at 1%

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## Pass-through excluding capital income

|                       | Income shock      |                   |                   | Health shock      |                   |                 |
|-----------------------|-------------------|-------------------|-------------------|-------------------|-------------------|-----------------|
|                       | Total             | Low w.            | High w.           | Total             | Low w.            | High w.         |
| Nondurables           | .095***<br>(.036) | .186*<br>(.101)   | .078**<br>(.038)  | .172**<br>(.085)  | .325***<br>(.12)  | .093<br>(.112)  |
| <i>Necessities</i>    | .066*<br>(.039)   | .283***<br>(.105) | .027<br>(.041)    | .082<br>(.089)    | .321***<br>(.131) | -.041<br>(.114) |
| <i>Leis &amp; eq.</i> | .12**<br>(.06)    | -.182<br>(.173)   | .174***<br>(.062) | .358***<br>(.147) | .354*<br>(.212)   | .36*<br>(.191)  |
| Obs.                  | 5139              | 1017              | 4122              | 5101              | 1000              | 4101            |

Standard errors in parentheses. \* at 10%, \*\* at 5%, \*\*\* at 1%

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## Pass-through with low and high liquid wealth

|                    | Income shock     |                   |                | Health shock    |                 |                |
|--------------------|------------------|-------------------|----------------|-----------------|-----------------|----------------|
|                    | High w.          | Low liq.          | High liq.      | High w.         | Low liq.        | High liq.      |
| Nondurables        | .087**<br>(.039) | .212***<br>(.083) | .047<br>(.042) | .094<br>(.112)  | .01<br>(.187)   | .149<br>(.141) |
| <i>Necessities</i> | .046<br>(.042)   | .146<br>(.094)    | .013<br>(.047) | -.041<br>(.114) | -.174<br>(.193) | .046<br>(.139) |
| <i>Luxuries</i>    | .16***<br>(.066) | .312**<br>(.151)  | .11<br>(.07)   | .365*<br>(.191) | .494<br>(.311)  | .281<br>(.238) |
| Obs.               | 4174             | 1247              | 2927           | 4105            | 1221            | 2884           |

Standard errors in parentheses. \* at 10%, \*\* at 5%, \*\*\* at 1%

⇒ the Wealthy Hand-to-Mouth are driving the response of high wealth households to a transitory income shock

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# Expressions of the pass-through coefficients in this model

$$\begin{aligned}
 \frac{d\ln(c_t^k)}{d\varepsilon_t^h} &= \underbrace{\left( \frac{d\ln(y_t)}{d\varepsilon_t^h} \frac{p_t y_t}{p_t} - \frac{d\ln(m_t)}{d\varepsilon_t^h} \frac{p_t^m m_t}{p_t} - \sum_{l \neq k} \frac{d\ln(c_t^l)}{d\varepsilon_t^h} \frac{p_t^l c_t^l}{p_t} \right)}_{\substack{\text{effect of the shock on real future assets (resources) } \frac{da_{t+1}/p_t}{d\varepsilon_t^h} \\ \text{multiplier of resources on consumption } A_t^k}} \\
 &= 0 \text{ if the shock does not affect income nor other spending} \\
 &+ \underbrace{\left( \frac{dh_t}{d\varepsilon_t^h} \right)}_{\substack{\text{effect of the shock on current health} = 1 \\ \text{multiplier of the shift in utility caused by a change in health on consumption } B_t^k}}, \\
 &= 0 \text{ if } \delta_1(\cdot) \text{ is a constant}
 \end{aligned}$$

Expression of income elasticity  $d\ln(c_t^k)/d\varepsilon_t^y$  with similar  $A_t^k$  and  $B_t^k$ .  
 Note that  $A_t^k$  and  $B_t^k$  capture the effect of the multiplier on the borrowing constraint.

# Analytical expressions of the multipliers

$$A_t^k = \frac{E_t \left[ \frac{dc_{t+1}^k}{da_{t+1}} \frac{-u''(c_{t+1}^k)}{-u''(c_t^k)} \frac{\delta_k(h_{t+1})}{\delta_k(h_t)} \frac{s_{t+1}(\pi_{t+1}^h)}{s_t(\pi_t^h)} \frac{p_t^k}{p_{t+1}^k/p_{t+1}} \right] \beta(1+r)}{c_t^k + \frac{c_t^k p_t^k}{p_t} E_t \left[ \frac{dc_{t+1}^k}{da_{t+1}} \frac{-u''(c_{t+1}^k)}{-u''(c_t^k)} \frac{\delta_k(h_{t+1})}{\delta_k(h_t)} \frac{s_{t+1}(\pi_{t+1}^h)}{s_t(\pi_t^h)} \frac{p_t^k}{p_{t+1}^k/p_{t+1}} \right] \beta(1+r)}$$
$$B_t^k = \frac{\frac{\delta_k'(h_t)}{\delta_k(h_t)} \frac{u'(c_t^k)}{-u''(c_t^k)}}{c_t^k + \frac{c_t^k p_t^k}{p_t} E_t \left[ \frac{dc_{t+1}^k}{da_{t+1}} \frac{-u''(c_{t+1}^k)}{-u''(c_t^k)} \frac{\delta_k(h_{t+1})}{\delta_k(h_t)} \frac{s_{t+1}(\pi_{t+1}^h)}{s_t(\pi_t^h)} \frac{p_t^k}{p_{t+1}^k/p_{t+1}} \right] \beta(1+r)}$$

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# Estimators

We make homogeneity assumptions to use two additional restrictions:

$$\phi_{c^k}^{\varepsilon^h} \approx \underbrace{\left( \phi_y^{\varepsilon^h} \frac{p_t y_t}{p_{t+1}} - \phi_m^{\varepsilon^h} \frac{p_t^m m_t}{p_{t+1}} - \sum_{l \neq k} \phi_{c^l}^{\varepsilon^h} \frac{p_t^l c_t^l}{p_{t+1}} \right) A^k}_{\substack{\text{contribution of change in resources} \\ = 0 \text{ if the shock does not} \\ \text{affect income nor other spending}}} + \underbrace{B^k}_{\substack{\text{contribution of change} \\ \text{in marginal utility} \\ = 0 \text{ if } \delta_1(\cdot) \text{ is a constant}}} \quad (1)$$

$$\phi_{c^k}^{\varepsilon^y} \approx \underbrace{\left( \frac{p_t y_t}{p_{t+1}} - \phi_m^{\varepsilon^y} \frac{p_t^m m_t}{p_{t+1}} - \sum_{l \neq k} \phi_{c^l}^{\varepsilon^y} \frac{p_t^l c_t^l}{p_{t+1}} \right) A^k}_{\substack{\text{contribution of change in resources} \\ = 0 \text{ if the shock does not} \\ \text{affect income nor other spending}}} + \underbrace{\phi_h^{\varepsilon^y} B^k}_{\substack{\text{contribution of change} \\ \text{in marginal utility} \\ = 0 \text{ if } \delta_1(\cdot) \text{ is a constant}}} \quad (2)$$

► These restrictions can identify  $A^k$  and  $B^k$

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## Consumption categories

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|              |                |  |
|--------------|----------------|--|
| Consumption  |                |  |
| Necessities  | Food           | Food at home, food away from home  |
|              | Utilities      | Electricity, water, heat, phone and internet   |
|              | Car-related    | Car insurance, car repairs, gasoline   |
| Luxuries     | Leisure        | Trips and vacations, tickets, sport equipment, hobbies equipment, contributions to charities, gifts                        |
|              | Equipment      | House supplies, house services, yard/garden supplies, yard/garden services, clothing, personal care equipment and services |
| <hr/>        |                |  |
| Medical exp. | Drugs          | Drugs  |
|              | Serv. and sup. | Medical services, medical supplies   |

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# Estimators

- ▶ Variance of temporary income shocks:

$$\text{var}(\boldsymbol{\varepsilon}_{i,t}^y) = \text{cov}(\Delta \ln(y_{i,t}), -\Delta \ln(y_{i,t+1}))$$

- ▶ Variance of temporary health shocks:

$$\text{var}(\boldsymbol{\varepsilon}_{i,t}^h) = \text{cov}(\Delta h_{i,t}, -\Delta h_{i,t+1})$$

- ▶ Variance of permanent shocks and covariances between shocks estimated with different instruments

## Identification strategy and estimators

- ▶ Again, use future growth as an instrument:

$$\text{cov}(\Delta \ln(\tilde{c}_{i,t}), \boldsymbol{\varepsilon}_{i,t}^h) = \text{cov}(\Delta \ln(\tilde{c}_{i,t}), -\Delta \tilde{h}_{i,t+1})$$

$$\text{cov}(\Delta \ln(\tilde{c}_{i,t}), \boldsymbol{\varepsilon}_{i,t}^y) = \text{cov}(\Delta \ln(\tilde{c}_{i,t}), -\Delta \ln(\tilde{y}_{i,t+1}))$$

- ▶ Pass-through coefficients are identified from:

$$\hat{\phi}_c^{\varepsilon^h} = \frac{\text{cov}(\Delta \ln(\tilde{c}_{i,t}), -\Delta \tilde{h}_{i,t+1})}{\text{cov}(\Delta \tilde{h}_{i,t}, -\Delta \tilde{h}_{i,t+1})} = \phi_c^{\varepsilon^h}$$

$$\hat{\phi}_c^{\varepsilon^y} = \frac{\text{cov}(\Delta \ln(\tilde{c}_{i,t}), -\Delta \ln(\tilde{y}_{i,t+1}))}{\text{cov}(\Delta \ln(\tilde{y}_{i,t}), -\Delta \ln(\tilde{y}_{i,t+1}))} = \phi_c^{\varepsilon^y}$$

- ▶ Not possible to estimate the pass-through to permanent shocks without more stringent restrictions

# Estimators

We make homogeneity assumptions to use two additional restrictions:

$$\phi_{c^k}^{\varepsilon^h} \approx \underbrace{\left( \phi_y^{\varepsilon^h} \frac{p_t y_t}{p_{t+1}} - \phi_m^{\varepsilon^h} \frac{p_t^m m_t}{p_{t+1}} - \sum_{l \neq k} \phi_{c^l}^{\varepsilon^h} \frac{p_t^l c_t^l}{p_{t+1}} \right) A^k}_{\substack{\text{contribution of change in resources} \\ = 0 \text{ if the shock does not} \\ \text{affect income nor other spending}}} + \underbrace{B^k}_{\substack{\text{contribution of change} \\ \text{in marginal utility} \\ = 0 \text{ if } \delta_1(\cdot) \text{ is a constant}}} \quad (3)$$

$$\phi_{c^k}^{\varepsilon^y} \approx \underbrace{\left( \frac{p_t y_t}{p_{t+1}} - \phi_m^{\varepsilon^y} \frac{p_t^m m_t}{p_{t+1}} - \sum_{l \neq k} \phi_{c^l}^{\varepsilon^y} \frac{p_t^l c_t^l}{p_{t+1}} \right) A^k}_{\substack{\text{contribution of change in resources} \\ = 0 \text{ if the shock does not} \\ \text{affect income nor other spending}}} + \underbrace{\phi_h^{\varepsilon^y} B^k}_{\substack{\text{contribution of change} \\ \text{in marginal utility} \\ = 0 \text{ if } \delta_1(\cdot) \text{ is a constant}}} \quad (4)$$

- ▶ These restrictions can identify  $A^k$  and  $B^k$

# Analytical expressions of the multipliers

$$A_t^k = \frac{E_t \left[ \frac{dc_{t+1}^k}{da_{t+1}} \frac{-u''(c_{t+1}^k)}{-u''(c_t^k)} \frac{\delta_k(h_{t+1})}{\delta_k(h_t)} \frac{s_{t+1}(\pi_{t+1}^h)}{s_t(\pi_t^h)} \frac{p_t^k}{p_{t+1}^k/p_{t+1}} \right] \beta(1+r)}{c_t^k + \frac{c_t^k p_t^k}{p_t} E_t \left[ \frac{dc_{t+1}^k}{da_{t+1}} \frac{-u''(c_{t+1}^k)}{-u''(c_t^k)} \frac{\delta_k(h_{t+1})}{\delta_k(h_t)} \frac{s_{t+1}(\pi_{t+1}^h)}{s_t(\pi_t^h)} \frac{p_t^k}{p_{t+1}^k/p_{t+1}} \right] \beta(1+r)}$$

$$B_t^k = \frac{\frac{\delta_k'(h_t)}{\delta_k(h_t)} \frac{u'(c_t^k)}{-u''(c_t^k)}}{c_t^k + \frac{c_t^k p_t^k}{p_t} E_t \left[ \frac{dc_{t+1}^k}{da_{t+1}} \frac{-u''(c_{t+1}^k)}{-u''(c_t^k)} \frac{\delta_k(h_{t+1})}{\delta_k(h_t)} \frac{s_{t+1}(\pi_{t+1}^h)}{s_t(\pi_t^h)} \frac{p_t^k}{p_{t+1}^k/p_{t+1}} \right] \beta(1+r)}$$

# Income and health risk excluding capital income

|   | All               | Low wealth        | High wealth       |
|---|-------------------|-------------------|-------------------|
| $var(\varepsilon_{i,t}^y)$                      | .097***<br>(.006) | .075***<br>(.01)  | .103***<br>(.006) |
| $var(\eta_{i,t}^y)$                             | .035***<br>(.007) | .009<br>(.013)    | .041***<br>(.008) |
| $var(\varepsilon_{i,t}^h)$                      | .02***<br>(.001)  | .035***<br>(.004) | .017***<br>(.001) |
| $var(\eta_{i,t}^h)$                             | .019***<br>(.002) | .032***<br>(.005) | .016***<br>(.002) |
| $cov(\varepsilon_{i,t}^h, \Delta \ln(y_{i,t}))$ | .004**<br>(.002)  | .003<br>(.004)    | .004**<br>(.002)  |

Standard errors in parentheses. \* at 10%, \*\* at 5%, \*\*\* at 1%

## Pass-through excluding capital income

|                       | Income shock      |                   |                   | Health shock      |                   |                 |
|-----------------------|-------------------|-------------------|-------------------|-------------------|-------------------|-----------------|
|                       | Total             | Low w.            | High w.           | Total             | Low w.            | High w.         |
| Nondurables           | .095***<br>(.036) | .186*<br>(.101)   | .078**<br>(.038)  | .172**<br>(.085)  | .325***<br>(.12)  | .093<br>(.112)  |
| <i>Necessities</i>    | .066*<br>(.039)   | .283***<br>(.105) | .027<br>(.041)    | .082<br>(.089)    | .321***<br>(.131) | -.041<br>(.114) |
| <i>Leis &amp; eq.</i> | .12**<br>(.06)    | -.182<br>(.173)   | .174***<br>(.062) | .358***<br>(.147) | .354*<br>(.212)   | .36*<br>(.191)  |
| Obs.                  | 5139              | 1017              | 4122              | 5101              | 1000              | 4101            |

Standard errors in parentheses. \* at 10%, \*\* at 5%, \*\*\* at 1%