

Health Heterogeneity and the Preferences for Consumption Growth

Jay H. Hong Josep Pijoan-Mas José-Víctor Ríos-Rull

Seoul National University CEMFI, CEPR Minnesota, Mpls Fed, CAERP

*Colloque CIREQ Montréal de macroéconomie
La santé et la vieillesse
April 2015*

Introduction

- A big question in Macroeconomics is what determines savings.
 - The old are special (DeNardi, French, Jones (2015), Ameriks, Briggs, Caplin, Shapiro Tonetti (2015))
 - There is an increasing number of them.

- Two fundamental characteristics of the old
 - Their health worsens with age
 - It does so at different rate for people in different socio-economic groups Pijoan-Mas, Ríos-Rull (2014)

- ▷ *How do age and health shape preferences and consumption decisions?*
 - Surprisingly, little work exploring effects of health on consumption

Objective

We estimate the effect of health on the marginal utility of consumption

- We use a model where the evolution of health is itself endogenous
- But we use only the consumption Euler equation to estimate structural parameters
 - We exploit differences in consumption growth by age, education, wealth, and health groups
 - We use estimates of health transitions by age, education, and wealth.
 - We interpret them as the outcome of optimal behavior.
- ▷ Hence, *we do not need to know the whole health production technology.*

Conventional wisdom

The **marginal utility** of consumption **falls** when **health declines**

- Domeij, Johannesson (2006) and Scholz, Seshadri (2012)
 - Exploit the average joint decline of health and consumption with age
 - ▷ But age-consumption decline may be due to other reasons
Gourinchas, Parker (2002); Aguiar, Hurst (2013)
- Finkelstein, Luttmer, Notowidigdo (2012)
 - Subjective well-being increases with health, more so for individuals with larger permanent income
 - ▷ But not necessarily related to consumption expenditure
- Koijen, Van Nieuwerburgh, Yogo (2012)
 - Households own too little long-term care insurance, too many annuities

Main findings

- 1 At age 65, **better health** gives **higher marginal utility** of consumption
 - You need healthy time to enjoy life
- 2 However, as individuals age, this difference narrows down
 - Consumption expenditure also substitutes for healthy time
 - Hence, **low health** may give **high marginal utility** of consumption
- 3 We provide some direct evidence of the **age effect of health** on consumption composition

Model: main elements

- Individuals differ in:
 - age (i), education (e), health (h), wealth (a), income (s)
- They choose
 - nonmedical expend (c), medical expend (x), health-related behaviour (y)
- Education $e \in E = \{c, h, d\}$ is predetermined.
 - (potentially) different patience β^e
 - (potentially) different income process $\pi^{e,i}(s' | s, h)$
 - (potentially) maybe different health technologies $\Gamma^{e,i}$
- Health stock $h \in H$ evolves stochastically $\Gamma^{e,i}(h' | h, x, y)$
 - different survival probability $\gamma^i(h)$
 - different income process $\pi^{e,i}(s' | s, h)$
 - different value of medical expenditure $\varepsilon^i(h)$
 - different value of non-medical expenditure $\chi^i(h)$

Preferences

Within period utility function:

$$u^i(h, c, x, y) = \chi^i(h) \frac{c^{1-\sigma_c}}{1-\sigma_c} - \nu_0 y^{\nu_1} - \frac{\varepsilon^i(h)}{x^{\sigma_x}} \quad \sigma_c, \sigma_x, \nu_0, \nu_1 > 0$$

- $\chi^i(h)$ regulates the health-dependence of u_c
 - It is the object of interest.
- We choose not to make ν_0 health-dependent: we think of y as preventive health-behavior
- $\varepsilon^i(h)$ regulates the health-dependence of u_x
 - In the main exercise we will ignore this part.
 - But extension: $\varepsilon^i(h)$ stochastic to address the role of **medical expenditure uncertainty** in consumption growth.

The Optimization Problem

- The Bellman equation:

$$v^{e,i}(a, h, s) = \max_{c, x, y} \left\{ u^i(h, c, x, y) + \beta^e \psi^i(h) \sum_{s', h'} \Gamma^i(h' | h, x, y) \pi^{e,i}(s' | s, h) \mathbb{E}_{\varepsilon' | h'} v^{e,i+1}(a', h', s') \right\}$$

$$\text{s.t.} \quad c + x + a' = a(1 + r) + s$$

- The model can be solved to deliver decision rules

$$c^{e,i}(a, h, s), \quad x^{e,i}(a, h, s), \quad y^{e,i}(a, h, s)$$

The FOC

▷ Consumption Euler equation,

$$\chi^i(h) c^{-\sigma_c} = \beta^e \psi^i(h) (1+r) \sum_{s', h'} \Gamma^i(h' | h, x, y) \pi^{e,i}(s' | s, h) \chi^{i+1}(h') (c')^{-\sigma_c}$$

▷ Optimal health expenditure

$$\begin{aligned} \chi^i(h) c^{-\sigma_c} &= \beta^e \psi^i(h) \sum_{s', h'} \Gamma_x^i(h' | h, x, y) \pi^{e,i}(s' | s, h) v^{e,i+1}(s', h', a') \\ &- \varepsilon^i(h) - \sigma_x x^{-\sigma_x - 1} \quad \text{in extension} \end{aligned}$$

▷ Optimal health behavior

$$u_y = \beta^e \psi^i(h) \sum_{s', h'} \Gamma_y^i(h' | h, x, y) \pi^{e,i}(s' | s, h) v^{e,i+1}(s', h', a')$$

Problem: Estimating the Law of Motion for Health

Need to measure *effects of health investments* on health evolution

$$\Gamma^i(h' | h, x, y) \quad \text{and} \quad \Gamma_x^i(h' | h, x, y) \quad \text{and} \quad \Gamma_y^i(h' | h, x, y)$$

- Very hard to measure directly due to endogeneity bias
(typically one finds $\Gamma_x^i < 0$ and $\Gamma_y^i < 0$)
- In addition, a substantial part of x is not strictly health care

Our Solution

- 1) Use only the Euler equation of consumption
 - No need to solve the full dynamic problem
 - No need to measure $\Gamma_x^i(h'|h, x, y)$ and $\Gamma_y^i(h'|h, x, y)$

- 2) Replace health investments by their optimal policies
 - Take the law of motion for health

$$\Gamma^i(h' | h, x, y)$$

- replace the x and y by their optimal policies

$$x^{e,i}(a, h, s) \quad \text{and} \quad y^{e,i}(a, h, s)$$

- Then, the law of motion of health is function of the state variables:

$$\Gamma^{e,i}(h' | a, h, s)$$

which is easy to estimate

Consumption growth and information about $\chi(h)$

$$\beta^e \psi^i(h) (1+r) \sum_{h'} \Gamma^{e,i}(h' | h, a) \frac{\chi^{i+1}(h')}{\chi^i(h)} \left(\frac{c^{e,i+1}(h', a')}{c^{e,i}(h, a)} \right)^{-\sigma} = 1$$

- 1/ If health was constant ($\Gamma^{e,i}$ diagonal), *higher consumption growth for high health* due to $\psi^i(h)$
- 2/ With changing health
 - Changes in health affect consumption growth through $\chi^{i+1}(h')/\chi^i(h)$
 - If health and consumption are complements ($\chi(h_g) > \chi(h_b)$)
Consumption growth higher for low health
 - If health and consumption are substitutes ($\chi(h_g) < \chi(h_b)$)
Consumption growth higher for high health
- 3/ If health expenditure uncertainty differs across health types, a further reason for consumption growth differences

The model moment conditions

- For each agent of type (e, i, a, h) :
 - The realised value of the Euler eqn. depends on the shock h'

$$f(e, i, a, h; h') = \beta^e (1+r) \frac{\chi(h')}{\chi(h)} \left(\frac{c^{e,i+1}(h', a^{e,i+1}(h, a))}{c^{e,i}(h, a)} \right)^{-\sigma} - 1$$

- So we can rewrite the Euler equation in expectation as:

$$\mathbb{E}_{h'|e,i,a,h} \left[f(e, i, a, h; h',) \right] = \psi^i(h) \sum_{h'} \Gamma^{e,i}(h' | h, a) f(e, i, a, h; h') = 0$$

- Which give one moment condition for every type

The Empirical Analog

- We have a discretized state space $\Omega \equiv E \times I \times A \times H$
(Ω is a discrete set with M elements indexed by m)
- For each individual j we observe
 - current state $\omega_j \in \Omega$
 - realized shocks tomorrow h'_j
 - consumption chosen tomorrow
- Hence, the empirical analog of our orthogonality conditions requires to compute the average consumption growth for each type ω_j, h'_j

The Empirical Analog

- In particular:

- For each individual type ω_j, h'_j ,

$$\tilde{f}(\omega_j, h'_j; \theta) = \beta^{e_j} (1+r) \frac{\chi(h'_j)}{\chi(h_j)} \sum \mathbf{1}_{\omega_j, h'_j} \left(\frac{c'_j}{c_j} \right)^{-\sigma} - 1$$

- Hence, the empirical moment condition for every type $\omega_m \in \Omega$ is

$$\tilde{g}_m(\text{data}; \theta) = \sum_j \mathbf{1}_{(\omega_j = \omega_m)} \psi^{i_j}(h_j) \sum_{h'_l \in H} \mathbf{1}_{(h'_l = h_l)} \Gamma^{e_j, i_j}(h'_j | h_j, a_j) \tilde{f}(\omega_j, h'_j; \theta)$$

- Minimize the weighted quadratic loss function

$$\tilde{Q}_J(\text{data}; \theta) = \frac{1}{2} \tilde{g}(\text{data}; \theta)' W \tilde{g}(\text{data}; \theta)$$

Data

- PSID 1999-2013
- Why: it has good data on
 - a) non-durable consumption and services
 - b) oop med expenditures (*drugs, doctors, hospital, nursing homes, insurance*)
 - c) Wealth (*household total net worth*) and health (*self-rated*)
- Use HRS estimates of
 - Survival probabilities, $\psi^i(h)$
 - Health transitions, $\Gamma^{e,i}(h' | h, a)$

Pijoan-Mas, Rios-Rull (2014)

Preliminary Estimations

- Sample selection:
 - Households aged 65-85 → No need to deal with earnings uncertainty
 - Headed by males
 - We lump together married and non-married
 - (equivalized) consumption growth observations: 2,809
 - Moment conditions
 - age group i (4) $\in \{65-69, 70-74, 75-79, 80+\}$
 - education e (3) $\in \{c, h, d\}$
 - health h (2) $\in \{\text{good}, \text{bad}\}$
 - wealth a (5) : wealth quintiles
- ▷ 120 ($= 4 \times 3 \times 2 \times 5$) moment conditions

Preliminary Estimations

- We pose a simple parametric structure for the age-dependence of the health modifier

$$\chi^i(h) = \chi_a(h) + \chi_b(h) \times i$$

where

- $\chi_a(h)$: health modifier by health status at age 50
 - $\chi_b(h)$: change of health modifier with age
- We pose two identifying restrictions
 - $\chi_a(h_g) = 1$
 - $\chi_b(h_g) = 0$
 - Hence, we have a maximum of 6 parameters to identify
 - $\chi_a(h_g), \chi_a(h_g)$
 - $\beta_c, \beta_h, \beta_d$
 - σ_c

Results – Men, 65+ only, time-varying χ

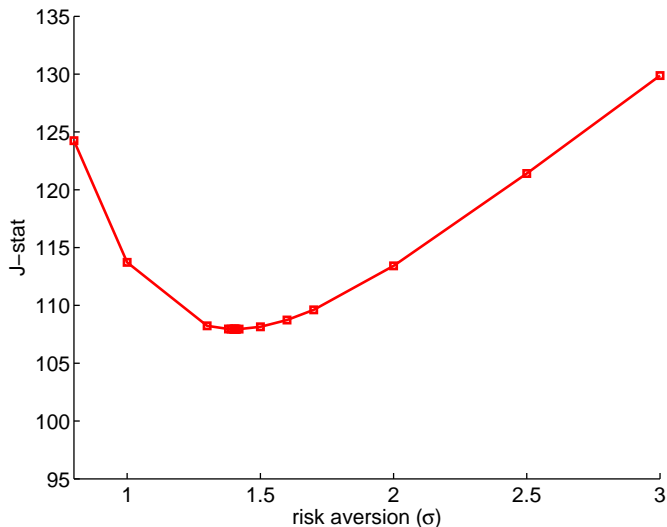
- common β

Results across different σ , (with $r = 2\%$, Consumption (ndc_s1_v1))

	$\sigma = 0.8$	$\sigma = 1$	$\sigma = 1.5$
β	0.9953 (.0037)	0.9832 (.0045)	0.9455 (.0064)
$\chi_a(b)$	0.7816 (.0402)	0.7869 (.0491)	0.7854 (.0733)
$\chi_b(b)$	0.0024 (.0044)	0.0023 (.0053)	0.0038 (.0076)
J stat (p -value)	124.25 (.2211)	113.72 (.4632)	108.15 (.6115)
	$\sigma = 2$	$\sigma = 2.5$	$\sigma = 3$
β	0.8989 (.0084)	0.8447 (.0102)	0.8447 (.0116)
$\chi_a(b)$	0.7776 (.1007)	0.7694 (.1314)	0.7694 (.1674)
$\chi_b(b)$	0.0063 (.0100)	0.0094 (.0124)	0.0094 (.0150)
J stat (p -value)	113.42 (.4712)	121.41 (.2776)	129.88 (.1324)

Picking the right σ

- Men, 65+ only, χ age dependent



Results – Men, 65+ only, time-varying χ

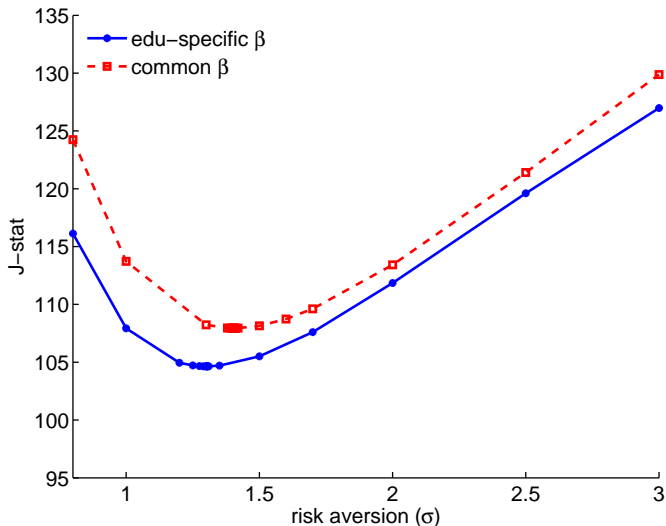
- education-specific β

Results across different σ , (with $r = 2\%$, Consumption (ndc_s1_v1))

	$\sigma = 0.8$	$\sigma = 1$	$\sigma = 1.5$
β^d	1.0143 (.0078)	1.0023 (.0094)	0.9642 (.0133)
β^h	0.9940 (.0050)	0.9815 (.0061)	0.9416 (.0089)
β^c	0.9859 (.0057)	0.9743 (.0071)	0.9396 (.0108)
$\chi_a(b)$	0.7918 (.0407)	0.7979 (.0499)	0.7992 (.0747)
$\chi_b(b)$	0.0006 (.0044)	0.0004 (.0053)	0.0018 (.0076)
J stat (p -value)	116.13 (.3507)	107.93 (.5647)	105.50 (.6294)
	$\sigma = 2$	$\sigma = 2.5$	$\sigma = 3$
β^d	0.9173 (.0166)	0.8639 (.0194)	0.8056 (.0216)
β^h	0.8910 (.0116)	0.8321 (.0141)	0.7672 (.0161)
β^c	0.8988 (.0147)	0.8537 (.0186)	0.8053 (.0221)
$\chi_a(b)$	0.7921 (.1021)	0.7835 (.1324)	0.7846 (.1674)
$\chi_b(b)$	0.0044 (.0100)	0.0079 (.0124)	0.0114 (.0150)
J stat (p -value)	111.84 (.4597)	119.61 (.2716)	126.98 (.1425)

Picking the right σ

- Men, 65+ only, χ age dependent

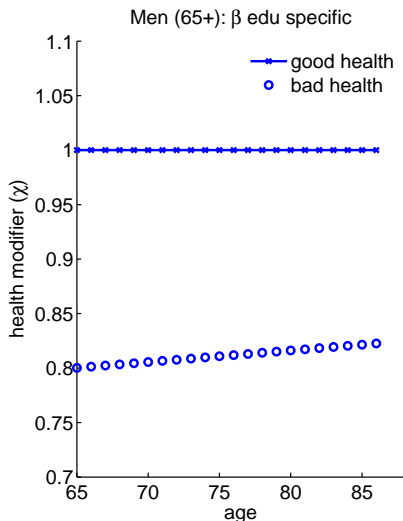
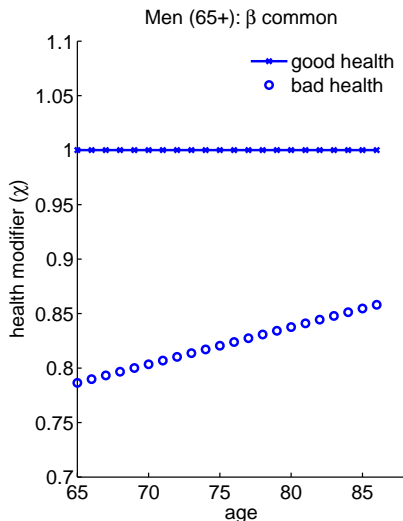


with the right σ (Men, 65+ only)Results, (with $r = 2\%$, Consumption (ndc_s1_v1))

	β common		β edu specific	
	$\sigma=1.405$		$\sigma=1.303$	
β^d	0.9534	-	0.9804	(0.0118)
β^h	0.9534	(0.0060)	0.9587	(0.0078)
β^c	0.9534	-	0.9542	(0.0093)
$\chi_a(g)$ (good)	1.	-	1.	-
$\chi_a(b)$ (bad)	0.7864	(0.0685)	0.8002	(0.0646)
$\chi_b(g)$ (good)	0.	-	0.	-
$\chi_b(b)$ (bad)	0.0034	(0.0072)	0.0011	(0.0067)
J stat (p -value)	107.94	(0.6168)	104.65	(0.6517)

Health modifier across age

- Men, 65+ only



Uncertainty in health expenditure (Extension)

- Consumption growth differences between health types can be different because they face different uncertainty in health expenditures
- Two different strategies to account for this possibility:
 - 1/ $\varepsilon^i(h)$ is zero and x is stochastic and dependent on e, i, a, h .
 - 2/ $\varepsilon^i(h)$ is stochastic, independent of $e, a \rightarrow$ endogenous choices make x to be related to a , and e .
- We extend the estimation strategy and distinguish the average consumption growth for individuals $(e, i, a, h; h)$ that differ in ε'
- We consider two equal probability levels for ε' : high and low
- We identify an individual's ε' differently depending on the model:
 - 1/ Whether x' is above or below the median conditional on $(e, i, a, h; h')$
 - 2/ Whether x'/c' is above or below the median conditional on $(e, i, a, h; h')$

Results – Men, 65+ only, time-varying χ

- common β

Results across different σ , (with $r = 2\%$, $\sigma=1.405$, Consumption (ndc_s1_v1))

	No exp shock		xp shock		ratio shock	
β	0.9534	(.0060)	0.9554	(.0060)	0.9558	(.0061)
$\chi_a(b)$	0.7864	(.0685)	0.8272	(.0699)	0.8426	(.0725)
$\chi_b(b)$	0.0034	(.0072)	-0.0010	(.0072)	-0.0018	(.0072)
J stat (p -value)	104.65	(0.6517)	110.33	(.5536)	114.74	(.4366)

Consumption Composition

Idea

- We use the PSID waves of 2005, 2007, 2009, 2011
 - Richer data on consumption items than years 1999+
 - It aggregates to 70% of NIPA, better than CEX, [Attanasio, Pistaferri \(2013\)](#)*

- We build three consumption series
 - c , non-durable consumption and services
 - c_s , consumption expenditures that substitutes healthy time
(*food home, food delivered, household repairs, bus, taxis, other transport*)
 - c_c , consumption expenditures that complement healthy time
(*food out, trips, recreation*)

- Explore effects of health at different ages on the budget shares
 - c_s/c
 - c_c/c

Consumption Composition

Results

	c_s/c (%)		c_c/c (%)	
	Estimates	S.E.	Estimates	S.E.
$50 \leq age \leq 59$	31.3	(0.67)	11.6	(0.56)
$60 \leq age \leq 69$	33.8	(0.81)	12.3	(0.68)
$70 \leq age \leq 85$	34.7	(0.77)	12.6	(0.65)
$(50 \leq age \leq 59) \times h_{good}$	-0.10	(0.67)	2.63	(0.56)
$(60 \leq age \leq 69) \times h_{good}$	-1.58	(0.81)	2.81	(0.68)
$(70 \leq age \leq 85) \times h_{good}$	-1.99	(0.78)	4.59	(0.65)
$(50 \leq age \leq 59) \times h_{exc}, h_{vg}$	-1.39	(0.67)	4.56	(0.56)
$(60 \leq age \leq 69) \times h_{exc}, h_{vg}$	-3.73	(0.89)	5.83	(0.75)
$(70 \leq age \leq 85) \times h_{exc}, h_{vg}$	-3.60	(0.98)	6.20	(0.82)
working	-2.11	(0.46)	0.86	(0.39)
married	-2.26	(0.44)	-1.80	(0.37)
college	-1.29	(0.39)	5.54	(0.33)
wealth (million \$)	-0.06	(0.17)	0.92	(0.15)

Note: Missing category: h_{fair}, h_{poor} ; Number obs: 6,103

Consumption Composition

Summary

- Individuals in good health
 - Spend more in goods that complement healthy time
 - Spend less in goods that substitute for healthy time
 - The difference is bigger for older groups
- ▶ The difference between good and bad health implies different things at different ages

Conclusion

- We use consumption Euler equations to estimate the effect of health on the marginal utility of consumption
- We find that
 - 1 At age 65, **better health** gives **higher marginal utility** of consumption
 - You need healthy time to enjoy life
 - 2 At later ages, the difference narrows down: **lower health** gives **higher marginal utility** of consumption
 - Consumption expenditure substitutes for healthy time
 - 3 Health differences imply differences in consumption patterns that are different at different ages