# Non-linear household earnings dynamics, self-insurance and welfare

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## Motivation

Nature of income inequality/risk: critical for many questions in economics. E.g.:

- Consumption and wealth distribution
- Ability to self-insure/welfare
- $\implies$  Scope for social insurance and redistribution
- Better datasets and new methods are challenging long held views about labour income risk
- $\blacktriangleright \implies$  What are the implications for:
  - Consumption and wealth inequality
  - Self-insurance
  - Welfare

"Canonical" model of earnings dynamics

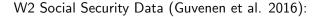
Detrended labor earnings follow a (log-) linear process. E.g.

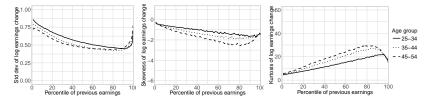
$$\log Y_{it} = f(t) + \delta_i + \eta_{it} + \varepsilon_{it}$$
$$\eta_{it} = \rho \eta_{i,t-1} + v_{it}$$

with  $\delta_i$ ,  $\eta_{i1}$ ,  $v_{it}$ ,  $\varepsilon_{it}$  normally distributed.

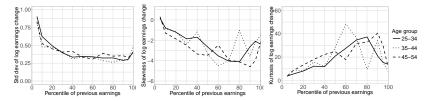
- Three main features:
  - Age-independence of conditional 2nd and higher moments
  - Normality: Shocks are symmetrically distributed + no fat tails
  - Linearity: conditional 2nd and higher moments independent of  $\eta_{i,t-1}$

### Individual, pre-tax earnings do not fit the canonical model



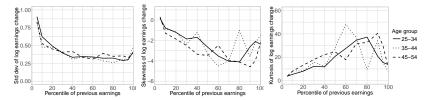


Similarly in the PSID:

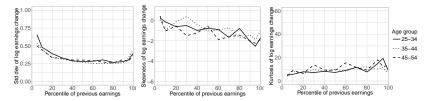


#### ...nor do HH, disposable earnings

#### Rich features of individual, pre-tax earnings



are also present in disposable, HH earnings



# This paper

- Estimate a flexible process à la Arellano, Blundell and Bonhomme (2017) for household post-tax labor earnings using the PSID.
- Use a structural life-cycle model to compare the implications of the flexible process against canonical permanent + transitory process.

# Findings

Allowing for a flexible earnings dynamics:

- Significantly improves the fit of the growth of consumption dispersion over age
- Implies a pass-through of "permanent" earnings shocks in line with the estimates in Blundell, Pistaferri and Preston (2008)
- ... but does not improve the fit of the wealth distribution
- Lower welfare gains from removing earnings risk

### Two strands of literature

Quantitative models of consumption and wealth inequality

(Huggett, 1996; De Nardi, 2004; Storesletten, Telmer and Yaron, 2006; ...)

#### Richer specifications of earnings dynamics

(Geweke and Keane, 2000; Meghir and Pistaferri, 2004; Browning, Ejrnaes and Alvarez, 2010; Altonji, Smith and Vidangos, 2013; Blundell, Graber and Mogstad, 2015; Arellano, Blundell and Bonhomme, 2017; Guvenen, Karahan, Ozkan and Song, 2016...)

- PSID core sample, 1968-1992, joint earnings for all HH (25-60)
- Disposable earnings obtained by regression as in Guvenen and Smith (2014)
- Equivalization by regression on number of family members
- Residual disposable earnings net of time and age fixed-effects

#### A flexible but parsimonious model

Arellano, Blundell and Bonhomme (2017)

Let  $Q_z(q|\cdot)$  denote the conditional quantile function for z

$$y_{it} = \eta_{it} + \varepsilon_{it}, \quad t = 1, \dots, T$$
  

$$\eta_{it} = Q_{\eta}(v_{it}|\eta_{i,t-1}, t)$$
  

$$\varepsilon_{it} = Q_{\varepsilon}(u_{it}|t)$$
  

$$\eta_{i1} = Q_{\eta_1}(v_{i1})$$
  

$$u_{it}, v_{i1}, (v_{it}|\eta_{i,t-1}, \eta_{i,t-2}, \dots) \sim U(0, 1)$$

Persistence

$$\rho_t(q,\eta_{i,t-1}) = \frac{\partial Q_\eta(q|\eta_{i,t-1},t)}{\partial \eta_{i,t-1}}, \quad \rho_t(q) = \mathbb{E}_\eta \left[ \frac{\partial Q_\eta(q|\eta_{i,t-1},t)}{\partial \eta_{i,t-1}} \right]$$

#### The flexible model: summary Extra features

The flexible model considered allows for

- Age dependence of conditional 2nd and higher moments
- Non-normality of shocks
- ▶ Non-linearity in  $\eta_{i,t-1}$  and its innovation

# A flexible but parsimonious model

Parameterization

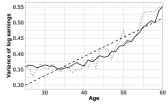
Let  $\psi^k$ , k = 0, 1, ... denote a family of bivariate, polynomial fns.

$$Q_{\eta}(q|\eta_{i,t-1}, age_{it}) = \sum_{k=0}^{K} \alpha_{k}^{\eta}(q)\psi^{k}(\eta_{i,t-1}, age_{it})$$
$$Q_{\varepsilon}(q|age_{it}) = \sum_{k=0}^{K} \alpha_{k}^{\varepsilon}(q)\psi^{k}(age_{it})$$
$$Q_{\eta_{1}}(q|age_{i1}) = \sum_{k=0}^{K} \alpha_{k}^{\eta_{1}}(q)\psi^{k}(age_{i1})$$

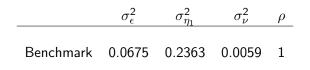
## Canonical benchmark

 Estimated by fitting variances and autocovariances of earnings over the life-cycle

$$y_{it} = \eta_{it} + \varepsilon_{it}$$
$$\eta_{it} = \rho \eta_{i,t-1} + v_{it}$$

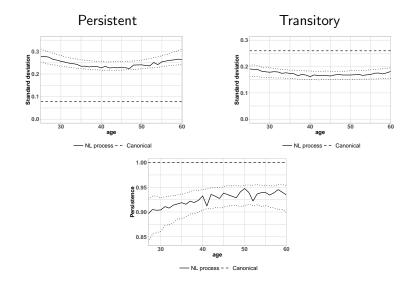


----- NL process - - Canonical ····· Data

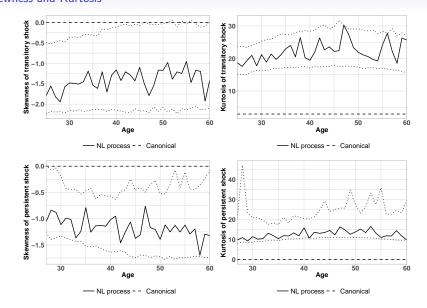




# Features of NL vs canonical earnings processes

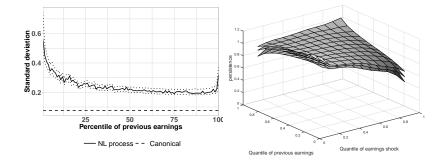


#### Features of NL vs canonical earnings processes Skewness and Kurtosis



# Features of NL vs canonical earnings processes

Nonlinearity



# Study consumption and wealth

- So, these earnings dynamics are much richer. Does it matter for:
  - Evolution of consumption inequality over the life cycle?
  - Saving behavior and wealth inequality?
  - Households ability to self-insure and welfare
- Use these earnings process in a quantitative life-cycle model
- Decompose the contribution of different features of the earnings process

Model implications

# OLG model, key features

- Ex-ante identical agents. Idiosyncratic earnings shocks
- Working life age 25-60, then retirement until death
- Age-dependent probability of dying. Die for sure at age 86
- Infinitely-lived government, old age Social Security
- Single risk-free asset

# Preferences and technology

#### Period utility

$$u(c_t)=\frac{c_t^{1-\sigma}}{1-\sigma}.$$

- $\blacktriangleright$  Discount factor  $\beta$
- Agents supply labor inelastically
- Earnings follow, alternatively, the two empirical processes described

## Markets and government

- Incomplete assets markets: Agents can invest in a risk-free asset and can only borrow up to exogenous limit <u>a</u>
- ► No annuity markets ⇒ Flow of accidental bequests lost to the economy
- Government
  - Provides old-age pensions
  - r net of tax
  - Earnings process estimated on disposable income

## Workers

$$V(t, z, \eta) = \max_{c, a'} \left\{ u(c) + \beta s_t E_t V(t+1, z', \eta') \right\}$$
  
s.t.  $a' = z - c, \quad a' \ge \underline{a}$   
 $z = (1+r)a + \eta + \epsilon$ 

### Retirees

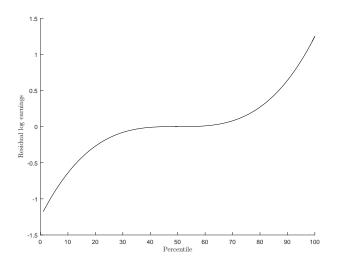
$$W(t, z, p) = \max_{c, a'} \left\{ u(c) + \beta s_t E_t W(t+1, z', p) \right\}$$
  
s.t.  $a' = z - c, \quad a' \ge \underline{a}$   
 $z = (1+r)a + p$ 

• No utility from bequests W(T, z, p) = 0

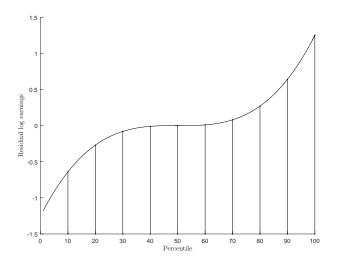
## Calibration

- CRRA coefficient  $\sigma = 2$
- Risk-free rate r = 0.04
- Survival probabilities are taken from Bell, Wade and Goss (1992)
- $\beta$  calibrated to match W/Y = 3.1 in each of the economies
  - Benchmark: β = 0.957
  - NL process: β = 0.939
- <u>a</u> = 0.12 (SCF average credit card limit)
- Pension benefit: non-linear function of last period gross earnings (Kaplan and Violante 2010)
- Discretization of NL earnings process by simulation

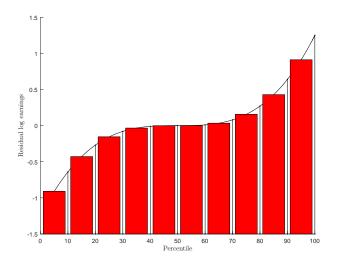
# Discretization of NL earnings process Grid points



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# Discretization of NL earnings process

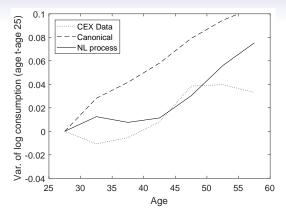
The elements  $\pi_{mn}^t$  of the transition matrix  $\Pi^t$  between age tand t + 1 are the proportion of individuals in bin m at age tthat are in bin n at age t + 1.

$$\begin{pmatrix} \bar{z}_{t}^{1} \\ \bar{z}_{t}^{2} \\ \vdots \\ \vdots \\ z_{t}^{N} \end{pmatrix} \qquad \begin{pmatrix} \pi_{11}^{t} & \pi_{12}^{t} & \cdots & \pi_{1N}^{t} \\ \pi_{21}^{t} & \pi_{22}^{t} & \cdots & \pi_{2N}^{t} \\ \vdots & \vdots & \vdots & \vdots \\ \pi_{N1}^{t} & \pi_{N2}^{t} & \cdots & \pi_{NN}^{t} \end{pmatrix}$$

$$\mathbf{z}_{t} \qquad \qquad \mathbf{\Pi}^{t}$$

**Consumption** implications

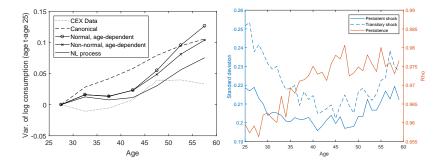
# Variance of log consumption, data and models



- Benchmark generates too large increase by age
- NL process generates substantially lower growth and captures (until age 47) non-monotonicity
- Very hard to match without HIP (Guvenen 2007; Huggett, Ventura and Yaron 2011)

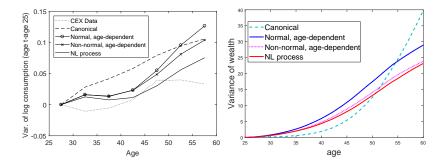
### Opening the black box

Age-dependent second moments

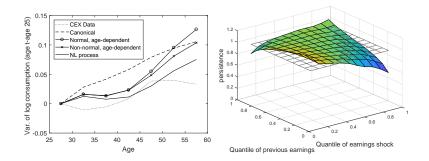


### Opening the black box

Age-dependent moments + non-normality



# Opening the black box Full NL



### BPP insurance coefficients

 Blundell, Pistaferri and Preston (2008): Fraction of earning shock not reflected in consumption response

$$\phi^{\mathsf{x}} = 1 - \frac{\mathsf{cov}(\Delta c_{it}, z_{it}^{\mathsf{x}})}{\mathsf{var}(z_{it}^{\mathsf{x}})}$$

with  $z_{it}^{x}$  shock to  $x_{it}$ .

- Model true coefficients: earnings shocks are observed
- In the data, BPP identification (assuming "canonical" process):

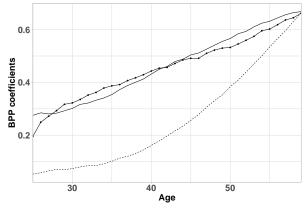
$$\phi^{\eta} = 1 - \frac{\operatorname{cov}(\Delta c_{it}, y_{i,t+1} - y_{i,t-2})}{\operatorname{cov}(\Delta y_{it}, y_{i,t+1} - y_{i,t-2})}, \ \phi^{\epsilon} = 1 - \frac{\operatorname{cov}(\Delta c_{it}, \Delta y_{i,t+1})}{\operatorname{cov}(\Delta y_{i,t}, \Delta y_{i,t+1})}$$

# BPP insurance coefficients

Process/Coefficients	$\psi^{p}_{BPP}$	$\psi^{tr}_{BPP}$	$\psi^{p}$	$\psi^{tr}$	
	Da	Pata: BPP (2008)			
Canonical (S.E. in parenthesis)	0.36	0.95	—	_	
	(0.09)	(0.04)			
	Model				
Canonical	0.13	0.89	0.31	0.92	
Nonlinear process	0.43	0.82	0.46	0.91	
Normal, age-dependent	0.42	0.83	0.46	0.88	
Non-normal, age-dependent	0.42	0.83	0.46	0.88	

Table: Insurance coefficients

### $\phi^\eta$ by age



- NL process ··· Canonical - Normal, age-dependent

# Wealth Inequality

Wealth-	Percentage wealth in the top						
income	Wealth						
ratio	Gini	1%	5%	20%	40%	60%	80%
U.S. data (SCF 1989)							
3.1	.79	30	54	81	94	99	100
Benchmark							
3.1	.64	9	29	65	88	97	100.1
NL Process							
3.1	.61	7	25	61	85	96	99.9

- NL process does not help to improve the fit of the wealth distribution
- Not even with a process based on W2 administrative data (De Nardi, Fella, and Paz-Pardo, 2016)

## Welfare costs of earnings risk

Process	Welfare cost			
Benchmark	28.3			
NL process	26.2			

- Lower persistence  $\rightarrow$  lower relevance of initial realization
- ▶ With NL process, more equal distribution of lifetime income
- Easier to insure with precautionary savings

# Conclusions

- Disposable, HH Earnings have much richer dynamics that traditionally assumed
- In a life-cycle model these richer dynamics
  - imply an age profile of consumption dispersion substantially closer to that in the data
  - and a more realistic pass-through of persistent earnings shocks to consumption
  - ... but do not improve the fit of the wealth distribution

	$\sigma_{\epsilon}^2$	$\sigma_{\eta_1}^2$	$\sigma_{\nu}^2$	ρ
Benchmark (year effects)	0.0675	0.2363	0.0059	1
Cohort effects (Kaplan)	0.0655	0.2394	0.0057	1
STY04 (coh. effects)	0.063	0.2105	0.0166	0.9989

▶ back