Outline

Valentina Michelangeli

Macroeconomic Analysis Division Congressional Budget Office

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Results

## Motivation

## **Empirical Evidences:**

- The Baby Boomer retirement started in 2001.
- By 2030, one out of five people is projected to be 65 years or older.
- More than 80 percent of older households own their homes, which are worth approximately \$4 trillion.
- In the 1990s, reverse mortgages became available and provided a new way to convert home equity into cash.



# Reverse Mortage

Reverse mortgages let homeowners

Model

- a) remain in their homes for as long as possible
- b) borrow against their home equity at terms that include large up-front costs and high interest rates.
- There are no monthly or other payments to be made during the term of the loan.
- Repayment of principal plus cumulated interests is triggered by moving, is repaid out of house sale proceeds, and is capped by the value of those proceeds (nonrecourse loan).
- To be eligible:
  - a) a borrower must be 62 or older
  - b) own the home outright or have a low loan balance
  - c) have no other liens against the home
  - d) no credit or income requirements



Results

Model

Your home is in San Francisco County. Your attained age is 62.

Value of your home	\$100,000
Loan principal limit	\$49,200
Less loan fees to lender	\$2,000
Less Mortgage Insurance	\$2,000
Less other closing costs	\$1,914
Less service fee set-aside	\$4,631
Cash available to you	\$38,655
Current interest rate index	2.8%
Lender's margin	3.10%
Current loan interest rate	5.18%
<b>HUD Mortgage Insurance</b>	0.50%
Current effective loan rate	5.68%

Source reversemortgage.com (October 2008)



# The Reverse Mortgage Market

Model

- The reverse mortgage market was created in 1987 with the HUD (Department of Housing and Urban Development) program called Home Equity Conversion Mortgage (HECM)
- Reverse mortgages are specifically designed for house-rich but cash-poor homeowners. However, these homeowners have not bought them.
- Potential Market: 13.2 million older households (Stucki 2005)
- Actual Market: 265,234 federally insured reverse mortgages in 2007, about 1% of the 30.8 million households with at least one member age 62 and older in 2006



Outline

## Questions:

- 1- Does it pay to get a reverse mortgage?
- 2- Why do house-rich but cash-poor homeowners choose not to cash in the home equity through a reverse mortgage but prefer to mantain low level of consumption?
- This study estimates a dynamic structural life-cycle model of retiree consumption, housing and moving decisions. These decisions are made in light of lifespan and mobility uncertainty.
- Data: Subsample of single retirees from the Health and Retirement Study that could qualify for a reverse mortgage.



Outline

- I obtain reasonable estimates for the structural preference parameters.
- I provide a plausible explanation for the relative weakness in reverse mortgage demand.

Reverse mortgages:

- A bad option for house-rich but cash-poor households
- PROS: Provide liquidity and a form of longevity insurance
- CONS: Large up-front costs and the moving risk
- 3 I use a set of tools from numerical analysis to estimate and solve the empirical model.



Outline

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- **8** Conclusions



## Empirical Evidence about Reverse Morgagees

Model

- Between 1993 and 2004, the median annual income of reverse mortgage borrowers increased from \$12,289 to \$18,240.
- The median net worth among the general population of older households, excluding home equity, was \$23,369 in 2000.
- Close to half of reverse mortgage borrowers (46 percent) have homes worth \$100,000 to \$200,000, compared with only about one-third of general homeowners (34 percent)
- Davidoff et al. (2007) shows that, empirically, reverse mortgagees have exited homes unusually rapidly.
- About 60% of loan terminations are attributed to death and about 40% to moving out.



Outline

- Life-cycle and Precautionary Savings: Gourinchas and Parker (2002), Cagetti (2003), French (2005), Hubbard et al. (1994), Palumbo (1999), Hurd (1989)
- Housing and Portfolio Choice: Cocco (2005), Yao and Zhang (2005)
- Discrete Choice:
  Rust (1987), Hotz and Miller (1993),
  Aguirragabiria and Mira (2002), Keane and Wolpin (1997)
- Numerical Analysis: Judd and Su (2007)



Outline

#### Preferences

$$U_{it}(C_{it}, H_{it}) = \frac{(C_{it}^{1-\omega}(\psi^{rent}H_{it})^{\omega})^{1-\gamma}}{1-\gamma} + \varepsilon_{it}(d_{it})$$

where  $\varepsilon_{it}(d_{it})$  is a vector of unobserved utility components associated to the discrete housing choice and it is Extreme Value Type I distributed

Budgect Constraint

$$A_{it+1} = (1+r)A_{it} + y - C_{it} - \psi_{it} - M_{it}$$

Bequest Function:

$$b(TW_{it}) = \theta_B \frac{TW_{it}^{1-\gamma}}{1-\gamma}$$



## Choice Set

Outline

■ Discrete Choice: Housing

$$d_{it}^1 = egin{cases} D_{it}^M = 1 & ext{if household } i ext{ moves out of her house in period } t \ D_{it}^M = 0 & ext{otherwise} \end{cases}$$

$$d_{it}^2|d_{it}^1 = \begin{cases} D_{it}^O = 1 & \text{if household } i \text{ owns her house in period } t \\ D_{it}^O = 0 & \text{if household } i \text{ rents her house in period } t \end{cases}$$

$$d_{it}^3 | d_{it}^1, d_{it}^2 = H_{it}$$

The discrete choice set is

$$d_{it} = \{d_{it}^1, d_{it}^2, d_{it}^3\}$$

■ Continuous Choice: Consumption C<sub>it</sub>



Model

Results

#### Per-Period Cost

$$\psi_{it} = [D_i^O \psi^{own} + (1 - D_i^O) \psi^{rent}] H_{it}^*$$

where

$$H_{it}^* = D_{it}^M H_{it} + (1 - D_{it}^M) H_{it-1}$$

Moving Cost

$$M_{it} = D_{it}^{M} D_{it-1}^{O} [D_{it}^{O} H_{it} - H_{it-1} + H_{it} \phi(D_{it}^{O})] + D_{it}^{M} (1 - D_{it-1}^{O}) (1 - D_{it}^{O}) H_{it} \phi^{rent}$$

where the transaction costs are:

$$\phi(D_{it}^O) = [D_{it}^O \phi^{own} + (1 - D_{it}^O) \phi^{rent}]$$



Results

## Value Function

Outline

$$V_t(X_{it}, arepsilon_{it}) = \max_{d_{it}, C_{it}} U(d_{it}, C_{it}) + arepsilon_{it}(d_{it}) + eta_{it}H_{it+1}E[V_{it+1}(W_{it+1}, H_{it}^*, D_{it}^O, arepsilon_{it+1}|X_{it}, C_{it})] + b(TW_{it+1})$$
 subject to  $W_{it+1} = (1+r)W_{it} + y - C_{it} - \psi_{it} - M_{it} + H_{it}^* = D_{it}^M H_{it} + (1-D_{it}^M)H_{it-1}$ 

State Space:  $X_{it} = \{W_{it}, H_{it-1}, D_{it-1}^{O}, Age_{it}\}$ 

Preference parameters to estimate:  $\theta = \{\gamma, \omega, \sigma, \theta_B\}$ 

 $C_{it} > C_{MINI}$ 

Results

Outline

Bellman Equation:

$$V_t(X_{it}, \varepsilon_{it}) = \max_{d_{it}, C_{it}} \left[ U(d_{it}, C_{it}) + \varepsilon_{it}(d_{it}) + \beta \eta_{it+1} EV(X_{it+1}) \right]$$

$$= \max_{d_{it}} \left\{ \left[ \max_{C_{it}} \{ [\textit{U}(\textit{d}_{it}, \textit{C}_{it}) + \beta \eta_{it+1} \textit{EV}(\textit{X}_{it+1})] | \textit{d}_{it} \} \right] + \varepsilon_{it}(\textit{d}_{it}) \right\}$$

Inner Maximization (consumption conditional on housing)

$$r(X_{it}, d_{it}) = \max_{C_{it}} [U(d_{it}, C_{it}) + \beta \eta_{it+1} EV_{t+1}(X_{it+1}) | d_{it}]$$

 Outer Maximization (housing) Conditional Choice Probabilities

$$P(j|X_{it}, \theta) = \frac{\exp\{r(X_{it}, j)\}}{\sum_{k \in d_{it}(X_{it})} \exp\{r(X_{it}, k)\}}$$

where

$$EV_{t+1}(X_{it+1}) = \ln \left[ \sum_{k \in d_t(X_t)} \exp\{r(X_{it}, k)\} \right]$$



#### Measurement Error in Consumption

Model

$$\Pr(c_{n,t}|d_{n,tp}^{H},A_{n,tp}^{data},H_{n,tp}^{data},Q_{n,tp}^{data}) = \frac{1}{\sqrt{2\pi\sigma^2}}e^{-\frac{(c_{n,tp}^{data}-c_{n,tp}^{pred})^2}{2\sigma^2}}$$

Discrete Choice Probability

$$\Pr(d_{n,tp}^{H}|A_{n,tp}^{data},H_{n,tp}^{data},Q_{n,tp}^{data}) = \frac{e^{V_{d,n,tp}}}{\sum_{m} e^{V_{m,n,tp}}}$$

Joint Probability of Housing and Consumption Choice

$$\Pr(d_{n,tp}^{H}, c_{n,tp} | A_{n,tp}^{data}, H_{n,tp}^{data}, Q_{n,tp}^{data}) = \Pr(d_{n,tp}^{H} | A_{n,tp}^{data}, H_{n,tp}, Q_{n,tp}^{data}) \cdot \Pr(c_{n,t} | d_{n,tp}^{H}, A_{n,tp}^{data}, H_{n,tp}^{data}, Q_{n,tp}^{data}) \cdot \Pr(c_{n,t} | d_{n,tp}^{H}, A_{n,tp}^{data}, H_{n,tp}^{data}, H_{n,tp}^{d$$

Log-Likelihood

$$\mathcal{L}(\theta) = \sum_{n=1}^{N} \sum_{t_{n}=1}^{TP} \log \Pr(d_{n,t_{p}}^{H}, c_{n,t_{p}} | A_{n,t_{p}}^{data}, H_{n,t_{p}}^{data}, Q_{n,t_{p}}^{data}, \theta)$$



# Four Tools from Applied Mathematics

Model

#### Basic Idea:

Use methods and software developed by computational scientists and mathematicians to reduce the computational burdens of structural estimation and to significantly increase the precision in the economic results.

- Mathematical Programming with Equilibrium Constraints
- Flexible Polynomial Approximation
- Shape Preservation
- Envelope Theorem



## Simple Life-Cycle Model: One continuous state variable

Backward Solution for the True Value Function

The last period value function is known and equal to  $V_T(W)$ In periods t = 1...(T-1) the Bellman equation is:

$$V_t(W) = \max_{c} (u(c) + \beta EV_{t+1}(RW - c))$$

Given  $V_{t+1}$ , the Bellman equation implies, for each wealth level W, three equations that determine optimal consumption,  $c^*$ ,  $V_t(W)$ , and  $V'_t(W)$ :

- Bellman equation:  $V_t(A) = u(c^*) + \beta V_{t+1}(RW c^*)$
- Euler equation:  $u'(c^*) \beta V'_{t+1}(RW c^*) = 0$
- Envelope condition:  $V'(W) = \beta RV'(RW c^*)$



## Backward Solution for the Approximate Value Function

Choose a functional form and a finite grid of wealth levels

Time t value function is approximated by

Model

$$V_t(W) = \Phi(W; a_t) = \sum_{k=0}^{7} a_{k+1,t} (W - \overline{W}_t)^k$$

■ We would like to find coefficients a<sub>t</sub> such that each time t Bellman equation, along with the Euler equation and envelope condition, holds with the  $\Phi$  approximation

$$\Phi(W; a_t) = \max_{c} (u(c) + \beta \Phi_{t+1}(RW - c; a_{t+1}))$$



Results

- Define three set of errors,  $\lambda_t^b \geq 0, \lambda_{i,t}^e \geq 0, \lambda_t^{env} \geq 0$ , that satisfy the following inequalities
- Bellman error

$$-\lambda_t^b \leq \Phi(W_{i,t}; a_t) - [u(c_{i,t}^*) + \beta \Phi_{t+1}(RW_{i,t} - c_{i,t}^*; a_{t+1})] \leq \lambda_t^b$$

Euler error

$$-\lambda_{i,t}^{\mathsf{e}} \leq u'(c_{i,t}^*) - \beta \Phi'(RW_{i,t} - c_{i,t}^*; \mathsf{a}_{t+1}) \leq \lambda_{i,t}^{\mathsf{e}}$$

Envelope error

$$-\lambda_t^{\textit{env}} \leq \Phi'(W_{i,t}; a_t) - R\beta \Phi'_{t+1}(RW_{i,t} - c^*_{i,t}; a_{t+1}) \leq \lambda_t^{\textit{env}}$$



Minimize the sum of the errors:

Model

$$\min_{a,c,\lambda} \sum_{t} \sum_{i} \lambda_{i,t}^{e} + \sum_{t} \lambda_{t}^{b} + \sum_{t} \lambda_{t}^{env}$$

subject to:

- Bellman error
- Euler error
- Envelope error
- Transversality condition

where the Transversality condition:

$$\Phi(W_{i,t}; a_{i,t}) \ge \Phi(W_{i-1,t}; a_t) + \frac{(\Phi(W_{i+1,t}; a_t) - \Phi(W_{i-1,t}; a_t))}{(W_{i+1,t-W_{i-1,t}})} (W_{i,t} - W_{i-1,t})$$

Results

# **Empirical Part**

- We have continuous data on assets and consumption.
- We assume that the measurement error in consumption is normally distributed with mean 0 and unknown variance  $\sigma^2$ .
- We can use the Euler equation to recover the predicted value of consumption.
- The probability that household n chooses consumption  $c_{n,tp}$  in period tp is:

$$\mathsf{Pr}(c_{n,tp}|W_{n,tp}^{data}) = rac{1}{\sqrt{2\pi\sigma^2}} e^{-rac{(c_{n,tp}^{data}-c_{n,tp}^{pred})^2}{2\sigma^2}}$$

Therefore the log-likelihood is given by:

$$\mathcal{L}(\theta) = \sum_{n=1}^{N} \sum_{t_{D}=1}^{TP} \log \Pr(c_{n,t_{D}} | A_{n,t_{D}}^{data}, \theta)$$



Results

# Structural Estimation with Dynamic Programming

Conventional Approach

Model

- 1 Take a guess of the structural parameters
- Solve the dynamic programming problem
- Calculate the log-likelihood
- Repeat 1,2,3 until the log-likelihood is maximized
- Constrained Optimization (MPEC) Approach

$$\max_{a,c,\lambda,\theta} \mathcal{L}(\theta) - Penalty \cdot \Lambda$$

- Bellman error
- Euler error
- Envelope error
- Transversality condition

where 
$$\Lambda = \sum_t \sum_i \lambda_{i,t}^e + \sum_t \lambda_t^b + \sum_t \lambda_t^{env}$$



# Dynamic Programming

#### Minimize the Sum of Frrors

Model

$$\Lambda = \sum_t \sum_i \sum_j \sum_z \lambda^e_{i,j,z,t} + \sum_t \sum_j \sum_z \lambda^b_{j,z,t} + \sum_t \sum_j \sum_z \lambda^{env}_{j,z,t} + \sum_t \sum_i \sum_j \sum_z \sum_d \lambda^{cons}_{i,j,d,z,t}$$

subject to:

$$\begin{split} &-\lambda_{i,j,z,t}^{\text{e}} \leq \textit{EulerEquation}_{i,j,z,t} \leq \lambda_{i,j,z,t}^{\text{e}} \\ &-\lambda_{j,z,t}^{\text{b}} \leq \textit{BellmanEquation}_{j,z,t} \leq \lambda_{j,z,t}^{\text{b}} \\ &-\lambda_{j,z,t}^{\textit{env}} \leq \textit{EnvelopeCondition}_{j,z,t} \leq \lambda_{j,z,t}^{\textit{env}} \\ &-\lambda_{i,j,d,z,t}^{\textit{cons}} \leq \textit{PolicyFunction}_{i,j,d,z,t} \leq \lambda_{i,j,d,z,t}^{\textit{cons}} \end{split}$$



# Solving DP and Estimation with the MPEC

Model

$$\underset{\theta, a, c}{\mathsf{Max}} \mathcal{L}(\theta) - \mathsf{Penalty} \cdot \Lambda$$

subject to:

Euler error

Bellman error

Envelope error

Policy function error

Transversality condition

where

$$\mathcal{L}(\theta) = \sum_{n=1}^{N} \sum_{tp=1}^{TP} \log \Pr(d_{n,tp}^{H}, c_{n,tp} | A_{n,tp}^{data}, H_{n,tp}^{data}, \theta)$$



Solution Method

Outline

# The Health and Retirement Study (HRS) and The Consumption and Activities Mail Survey (CAMS). US data (2000-2005).

- We select a group of 165 households that qualify for a reverse mortgage.
- Characteristics: 62 years old or older, single, retiree, homeowner, complete information about consumption and financial situation.

		Percentiles		iviin	iviax	
	25%	50%	75%			_
Н	\$40,000	\$70,000	\$90,000	\$ 3,000	\$170,000	
W	\$6,000	\$25,000	\$69,500	\$0	\$276,548	
С	\$6,347	\$9,774	\$15,409	\$650	\$84,380	
SS	\$7,200	\$9,600	\$11,748	\$0	\$ 18,907	
Age	69	75	80	66	86	



Results

Model

		Percentiles		Min	Max
	25%	50%	75%		
Stocks	\$0	\$0	\$0	\$ 0	\$125,000
Chck	\$750	\$3,600	\$10,000	\$ 0	\$100,000
Cds	\$0	\$0	\$5,300	\$ 0	\$273,548
Tran	\$1,000	\$4,000	\$8,000	\$ 0	\$30,000
Bonds	\$0	\$0	\$0	\$ 0	\$80,000
IRA	\$0	\$0	\$2,5000	\$ 0	\$137,000
Debt	\$0	\$0	\$0	\$ 0	\$12,000

■ For almost all the retirees in the sample, the financial portfolio does not contain risky assets.



Outline

- In each period, about 8% of the households in our sample moves out of their homes.
- Among those who moved, about 20% decide to rent a new house, while about 80% buy a new house.
- The moving decision does not appear to be strictly related with age.
- About 50% of the retirees move near or with children or other relatives or friends. About 25% move for financial reasons. and the remaining 25% move because of health problems. weather or climate reasons, to have a better location, or for other reasons



Outline

Parameter	Variable	Estimate
$\overline{\gamma}$	Coefficient of relative risk aversion	1.4196 (0.013)
$\omega$	Preference parameter over housing	0.5325 (0.032)
$\sigma$	s.d. of measurement error in consumption	1.206 (0.640)
$ heta_B$	Degree of altruism	0.000 (0.001)

■ The standard errors are computed using a bootstrap procedure.



Outline

Results

The welfare gain from a reverse mortgage is calculated as a percentage increase in the initial non-housing financial wealth that makes the household without reverse mortgage as well off in expected utility terms as with the reverse mortgage.



## Simulation of Welfare Gain from Reverse Mortgage

		HOUSE
	House-Poor	House-Rich
FINANCIAL WEALTH		
Cash-Poor	\$8,500	\$ 10,600
Cash-Rich	\$107,800	\$ 90,200

## where:

Financial Wealth House Value

Cash-Poor: < \$40,000 House-Poor: <\$60,000 Cash-Rich: > \$40,000House-Rich: >\$60,000



## Simulation of Welfare Gain from Reverse Mortgage

## Median Welfare Gain, Baseline Case

Model

		HOUSE
	House-Poor	House-Rich
FINANCIAL WEALTH		
Cash-Poor	-9%(- \$ 767)	-14%(- \$ 1,525)
Cash-Rich	50%(\$ 53,302)	41% (\$ 36,863)

- PROS of RM: liquidity and a form of longevity insurance.
- CONS of RM: high up-front cost and moving risk.



## Median Welfare Gain

		HOUSE
	House-Poor	House-Rich
FINANCIAL WEALTH		
Cash-Poor	207%(\$ 17,600)	430%(\$ 45,622)
Cash-Rich	18%(\$ 19,054)	54%(\$ 48,883)

## Median Welfare Gain

		HOUSE
	House-Poor	House-Rich
FINANCIAL WEALTH		
Cash-Poor	2%(\$ 146)	-12%(\$ 1,374)
Cash-Rich	56%(\$ 60,021)	49%(\$ 43,784)

## 10% Cut in Current Income

## Median Welfare Gain

		HOUSE
	House-Poor	House-Rich
FINANCIAL WEALTH		
Cash-Poor	-20% (\$ 1,657)	-16% (\$ 1,654)
Cash-Rich	49% (\$ 53,298)	46% (\$ 41,728)



Outline

## Innovative structural dynamic life-cycle model of consumption, housing and mobility choice to calculate the welfare benefits of allowing retirees to cash in their home equity through a reverse mortgage.

- First application of a set of four mathematical tools to estimate and solve an empirical model.
- Reverse mortgages provide liquidity and a form of longevity insurance, but introduce a new risk, the moving risk. These financial instruments are risky especially for house-rich but cash-poor homeowners.
- Gambling can make someone who is initially poor relatively rich. However, luck plays an important role in this gamble.

Thank you



Outline

## Continuous and Discrete State Variables

Let W be a continuous state variable and J be a discrete state variable.

Model

Time t value function is approximated by

$$V_t(W, J) = \Phi(W, J; a_t) = \sum_{k=0}^{7} a_{k+1, t} (W - \overline{W}_t)^k$$

The constrained optimization approach to a life-cycle model with continuous and discrete state variables is:

$$\textit{Minimize} \sum_{i} \sum_{j} \sum_{t} \lambda_{i,j,t}^{e} + \sum_{j} \sum_{t} \lambda_{j,t}^{b} + \sum_{j} \sum_{t} \lambda_{j,t}^{env}$$

subject to

- Bellman Error:

$$-\lambda_{j,t}^{b} \leq \Phi(W, J; a_{t}) - [u(c^{*}, J) + \beta \Phi(RW - c^{*}, J; a_{t+1})] \leq \lambda_{j,t}^{b}$$

- Euler Error

$$-\lambda_{i,j,t}^{e} \leq u'(c^*,J) - \beta \Phi'(RW - c^*,J;a_{t+1}) \leq \lambda_{i,j,t}^{env}$$

- Envelope Error:

$$-\lambda_{i,t}^{env} \leq \Phi'(W,J;a_t) - R\beta\Phi'(RW-c^*,J;a_{t+1}) \leq \lambda_{i,t}^{env}$$



Outline

# Appendix: DP with Approximation of the Value Function

Euler Equations:

$$u'(c_{dN}^*, H) - \beta \eta_{t+1} R V'_{t+1} (RW - c_{dN}^* - \psi + y; H, Q) = 0$$

$$u'(c_{dMhq}^{*}, h) - \beta \eta_{t+1}RV'_{t+1}(RW - c_{dMhq}^{*} - \psi - M + y; h, q) = 0$$

Bellman Equation:

$$V_t(W, H, Q) = \ln \left\{ \exp(\widehat{V}_{d^N, t}) + \sum_{q} \sum_{h} \exp(\widehat{V}_{d^{Mhq}, t}) \right\}$$

Envelope Condition:

$$V_t'(W,H,Q) = \Pr(\mathit{NM}|W,H,Q) \cdot \hat{V}_{d^N,t}' + \sum_q \sum_h \Pr(\mathit{Mhq}|W,H,Q) \cdot \hat{V}_{d^{Mhq},t}'$$



Value Function Approximation

Model

$$V_t(W, H, Q) = \Phi(W, H, Q; a_t, \overline{W}_t) = \sum_{k=0}^{7} a_{k+1, H, Q, t} (W - \overline{W}_t)^k$$

Policy Function Approximation

$$c_{d,t}^*\left(W,H,Q\right) = \Phi(W,H,Q;b_{d,t},\overline{W}_t) = \sum_{k=0}^7 b_{k+1,H,Q,d,t} (W-\overline{W}_t)^k$$

We would like to find coefficients  $a_t$  and  $b_{d,t}$  such that each time t Bellman equation, along with the Euler and Envelope conditions, holds with the  $\Phi$  approximation



Model

Results

#### Euler Errors

$$-\lambda_{i,j,z,t}^{\rm e} \leq u'(c_{i,j,dN_{,t}}^*,H_{j,t}) - \beta R\Phi'(RW_{i,t}-c_{i,j,dN_{,t}}^*-\psi+y;H_{j,t},Q_t;a_{t+1}) \leq \lambda_{i,j,z,t}^{\rm e}$$

$$-\lambda_{i,j,z,t}^{\rm e} \leq u'(c_{i,j,dMhq,t}^*,H_{t+1}) - \beta R\Phi'(RW_{i,t} - c_{i,j,dMhq,t}^* - \psi - M + y;H_{t+1},Q_{t+1};a_{t+1}) \leq \lambda_{i,j,z,t}^{\rm e}$$

Bellman Error

$$-\lambda_{j,z,t}^b \leq \Phi(W_{i,t},H_{j,t},Q_t;a_t) - \ln \left\{ \exp(\widehat{V}_{i,j,dN,t}) + \sum_q \sum_h \exp(\widehat{V}_{i,j,dMhq,t}) \right\} \leq \lambda_{j,z,t}^b$$

where

$$\hat{V}_{i,j,dN,t} = u(c^*_{i,j,dN,t}, H_{j,t}) + \beta \eta_{t+1} \Phi(RW_{i,t} - c^*_{i,j,dN,t} - \psi + y; H_{j,t}, Q_t; a_{t+1})$$

$$\widehat{V}_{i,j,dMhq,t} = u(c^*_{i,j,dMhq,t}, H_{t+1}) + \beta \eta_{t+1} \Phi(RW - c^*_{i,j,dMhq,t} - \psi - M + y; H_{t+1}, Q_{t+1}; a_{t+1})$$



Model

$$\begin{split} &-\lambda_{j,z,t}^{\textit{env}} \leq \Phi'(W_{i,t}, H_{j,t}, Q_t; a_t) - \{f_{i,j,d}N_{,t} \cdot \Phi'(RW_{i,t} - c_{i,j,d}^*N_{,t} - \psi + y; H_{j,t}, Q_t; a_{t+1}) \\ &+ \sum_{q} \sum_{h} [f_{i,j,d}M_{hq},_t \cdot \Phi'(RW_{i,t} - c_{i,j,d}M_{hq},_t - \psi - M; H_{t+1}, Q_{t+1}; a_{t+1})]\} \leq \lambda_{j,z,t}^{\textit{env}} \end{split}$$

where

$$f_{i,j,d,t} = \Pr(d|W_{i,t}, H_{j,t}, Q_t) = \frac{\exp(\widehat{V}_{i,j,d,t})}{\exp(\widehat{V}_{i,j,dN,t}) + \sum_q \sum_h \exp(\widehat{V}_{i,j,dMhq,t})}$$

Policy Function Error

$$-\lambda_{i,j,z,d,t}^{cons} \leq \Phi(W_{i,t}, H_{j,t}, Q_t; b_t) - c_{i,j,d,t}^*(W_{i,t}, H_{j,t}, Q_t) \leq \lambda_{i,j,z,d,t}^{cons}$$



# Dynamic Programming

#### Minimize the Sum of Errors

Model

$$\Lambda = \sum_t \sum_i \sum_j \sum_z \lambda^{\rm e}_{i,j,z,t} + \sum_t \sum_j \sum_z \lambda^{\rm b}_{j,z,t} + \sum_t \sum_j \sum_z \lambda^{\rm env}_{j,z,t} + \sum_t \sum_i \sum_j \sum_z \sum_d \lambda^{\rm cons}_{i,j,d,z,t}$$

subject to:

$$\begin{split} &-\lambda_{i,j,z,t}^{\text{e}} \leq \textit{EulerEquation}_{i,j,z,t} \leq \lambda_{i,j,z,t}^{\text{e}} \\ &-\lambda_{j,z,t}^{\text{b}} \leq \textit{BellmanEquation}_{j,z,t} \leq \lambda_{j,z,t}^{\text{b}} \\ &-\lambda_{j,z,t}^{\textit{env}} \leq \textit{EnvelopeCondition}_{j,z,t} \leq \lambda_{j,z,t}^{\textit{env}} \\ &-\lambda_{i,j,d,z,t}^{\textit{cons}} \leq \textit{PolicyFunction}_{i,j,d,z,t} \leq \lambda_{i,j,d,z,t}^{\textit{cons}} \end{split}$$





# Loglikelihood

Outline

Measurement Error in Consumption

Model

$$\Pr(c_{n,t}|d_{n,tp}^{H}, W_{n,tp}^{data}, H_{n,tp}^{data}, Q_{n,tp}^{data}) = \frac{1}{\sqrt{2\pi\sigma^2}} e^{-\frac{(c_{n,tp}^{data} - c_{n,tp}^{pred})^2}{2\sigma^2}}$$

Discrete Choice Probability

$$\Pr(d_{n,tp}^{H}|W_{n,tp}^{data},H_{n,tp}^{data},Q_{n,tp}^{data}) = \frac{e^{V_{d,n,tp}}}{\sum_{m} e^{V_{m,n,tp}}}$$

Joint Probability of Housing and Consumption Choice

$$\Pr(d_{n,tp}^{H}, c_{n,tp} | W_{n,tp}^{data}, H_{n,tp}^{data}, Q_{n,tp}^{data}) = \Pr(d_{n,tp}^{H} | W_{n,tp}^{data}, H_{n,tp}, Q_{n,tp}^{data}) \cdot \Pr(c_{n,t} | d_{n,tp}^{H}, W_{n,tp}^{data}, H_{n,tp}^{data}, Q_{n,tp}^{data})$$

Log-Likelihood

$$\mathcal{L}(\theta) = \sum_{n=1}^{N} \sum_{tp=1}^{TP} \log \Pr(d_{n,tp}^{H}, c_{n,tp} | W_{n,tp}^{data}, H_{n,tp}^{data}, Q_{n,tp}^{data}, \theta)$$

■ Go back



# Solving DP and Estimation with the MPEC

Model

$$\max_{\theta,a,c} \mathcal{L}(\theta) - Penalty \cdot \Lambda$$

subject to:

Euler error

Bellman error

Envelope error

Policy function error

where

$$\mathcal{L}(\theta) = \sum_{n=1}^{N} \sum_{tp=1}^{IP} \log \Pr(d_{n,tp}^{H}, c_{n,tp} | W_{n,tp}^{data}, H_{n,tp}^{data}, \theta)$$

We assume that there is a measurement error in consumption  $\sim N(0,\sigma^2)$ 



Outline

## Empirical Evidence about Reverse Morgagees

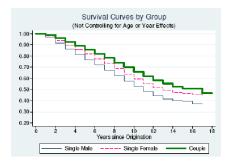


Figure: Survival Curves of HECM Loans for Single Males, Single Females, and Couples (Bowen et al., 2008)

