

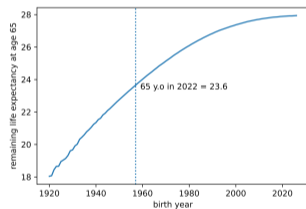
Asset Decumulation and Risk Management in Retirement

Pierre-Carl Michaud (HEC Montréal) Pascal St-Amour (Lausanne)

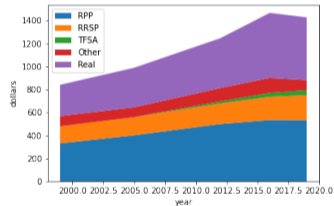
November 2022

The Outlook has Changed for Retirees

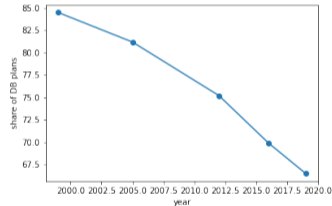
In Canada, retirees



(a) Live longer



(b) Have More Wealth



(c) Have Less DB Cov.

The Problem

Figuring out how to decumulate savings is a hard problem

- ▶ time of death is uncertain
- ▶ housing and medical (LTC) risks
- ▶ Household composition
- ▶ Might want to leave something for the kids

Insurance

One can insure, at some cost against risks

- ▶ Self-insurance (wealth and housing): Yaari (1965), Abel (1985), Hurd (1989), Hubbard et al. (1995), Palumbo (1999), Ameriks et al. (2011), De Nardi et al. (2010), Lockwood (2018) and McGee (2022)
- ▶ Annuities: Inkmann et al. (2011), Lockwood (2012), Hubener et al. (2014), Peijnenburg et al. (2016, 2017), Laitner et al. (2018)
- ▶ Long-term care insurance: Brown and Finkelstein (2007), Lockwood (2018), Ameriks et al. (2018), Braun et al. (2019), Boyer et al. (2020a)
- ▶ Reverse mortgages: Shan (2011), Nakajima (2012), Shao et al. (2015), Haurin et al. (2016), Nakajima and Telyukova (2017), Shao et al. (2018), and Cocco and Lopes (2020)

Low Awareness and Demand for Insurance

Boyer et al. (2020a) and Boyer et al. (2020b) document low awareness and demand in Canada

Product	Take-up	Intentions
Annuities	12%	13%
LTCI	3%	26%
RMR	1%	7%

But what is the benchmark (how large should take-up be)?

This Paper

- ▶ A stated-preference experiment for all three insurance products (LTCL, RMR and annuities)
- ▶ A stochastic life-cycle model that is tailored to custom-fit each respondent's situation, preferences and account for household composition, housing and expectations
- ▶ A behavioral response mapping that accounts for noise (trembling-hand) and status-quo bias
- ▶ Once estimated and filtered, quantitative analysis of asset decumulation and risk management motives
- ▶ Is there a demand for bundling?

Model Roadmap

- ▶ Demography and Time: Households: i (head), and $j = 1, 2, \dots, N$ (spouse). Time is denoted $t = 0, 1, 2, \dots, T$ (0 around age 65), Households are composed of singles (denoted i), or of couples (denoted as ij)
- ▶ Several Risks:
 - ▶ Health evolves over 4 possible states (respondent specific), $s_{it} \in \mathcal{S} = \{G, \ell, LD\}$. Singles and couples (16 possible health states), $s_{ijt} = (s_{it}, s_{jt})$, heterogeneous beliefs, transition probabilities, $q_{it}^n(s, s')$. [▶ Details on transitions](#)
 - ▶ House Price Dynamics follow CMA specific random walk with heterogeneous beliefs [▶ Modelling](#)
 - ▶ Out-of-pocket Medical costs depend on health state and CMA specific, $M_{ijt} = M(s_{ijt}), \quad s_{ijt} \in \mathcal{S}^2$
- ▶ Resources: Agents have initial financial wealth W_0 , a primary residence with value P_0^H , a mortgage D_0 , receive annuity income, Y_0 and can borrow using credit card or HELOCs. They can purchase in initial period reverse mortgage, annuities or long-term care insurance.
- ▶ Households are Epstein-Zin utility maximizers and have a warm-glow bequest motive

Housing

- ▶ Period- t home-owning status of household: $H_t \in \{0, 1\}$ (rent, own). We account for market frictions by incorporating moving costs as well as by ruling out intra-period home repurchases, i.e., a seller must rent for at least one period before purchasing another home (Cocco and Lopes (2020)).
- ▶ The household's net housing wealth W_t^H is zero for renters and is otherwise given by house value net of principal and interests on mortgages D_t :

$$W_t^H = H_t \left[P_t^H - D_t(1 + r_d) \right],$$

where r_d is the mortgage rate of interest.

▶ Mortgages

▶ Expenses

▶ Housing Flows

Preferences and Problem

We assume agents have Epstein-Zin preferences with CES intra-period utility and a warm-glow bequest motive. Utility is given by

$$V_{ijt} = \max \left\{ (1 - \beta) u_{ijt}^{1-\varepsilon} + \beta \left[\mathbb{E}_t \sum_{s' \in \mathcal{S}^2} q_{ijt}^1(s, s') V_{ijt+1}^{1-\gamma} \right]^{\frac{1-\varepsilon}{1-\gamma}} \right\}^{\frac{1}{1-\varepsilon}},$$
$$u_{ijt} = \left(\frac{\nu_{ijt}}{n_t} \right) \left[C_t^{1-\rho} + \nu_H H_t^{1-\rho} \right]^{\frac{1}{1-\rho}}$$
$$V_{ijt+1} = b^{\frac{1}{1-\gamma}} X_{t+1}, \quad \text{for } s' = (\mathcal{D}', \mathcal{D}')$$

The respondent picks:

- ▶ a state-contingent consumption plan and a decision rule for when to sell the house in the future
- ▶ whether or not to purchase insurance

Experiment

We aim to estimate parameters of this model using a stated-choice experiment.

- ▶ In May 2019 respondents aged 60 to 70 from the 11 major CMA in Canada
- ▶ 1581 households (home owners) with reliable data on balance sheet, income, non-missing data etc.
- ▶ We present 12 scenarios with price and benefit information for Annuities, LTCI and RMR. These feature randomization in order to help identify parameters of interest.

Reported probabilities

Table: Choice probabilities by scenario

	Annuities	LTCI	Reverse mortgage
a. Takeup rates and knowledge			
probability buys	0.108	0.174	0.073
probability zero (all scenarios) knows product	0.558	0.392	0.638
	0.269	0.109	0.287
b. Price and benefit (within) elasticities			
Price	-0.584	-0.794	-1.285
Benefit	0.497	0.525	0.143

Model Calibration: Survival Expectations

- ▶ We ask respondents (and spouse) a lot of information on their current health. Along with other information (age, education, gender), we use a health dynamics simulator to compute objective survival probabilities of each respondent Boyer et al. (2020a).
- ▶ We also ask respondents (and spouse) for their subjective probability of surviving to age 85.
- ▶ We calibrate the following health process to match both objective and subjective risks.

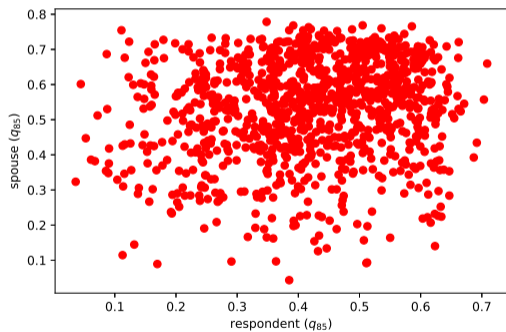
$$\begin{aligned} q_{it}(s, s') &= \Pr_t [s_{it+1} = s' \mid s_{it} = s] \\ &= \frac{\exp [\alpha_i(s') t + \delta_i(s, s')]}{\sum_{s' \in \mathcal{S}} \exp [\alpha_i(s') t + \delta_i(s, s')]} \end{aligned}$$

where we allow, $\delta_i(s, \mathcal{D}) = \tilde{\delta}_i(s, \mathcal{D}) + \xi$ for $s \in (G, \ell, L)$ to capture survival beliefs.

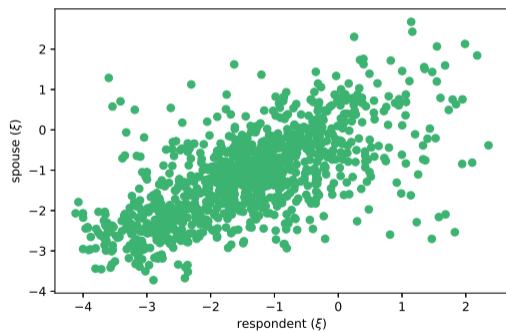
Joint Distribution of Survival Risks

Respondents (and spouse) optimistic.

Figure: Objective and Subjective Survival Beliefs Distributions



(a) Objective



(b) Subjective

House Price Expectations

Objective Risks:

- ▶ We use data from Teranet on historical house price indices by census metropolitan area (CMA) for the period 1991 to 2017 to compute annual real growth rates g and volatility σ .
- ▶ We test for and do not reject the null of no unit root for ϵ_t using an Augmented Dicky Fuller (ADF) test, for 10 out of the 11 CMAs (Ottawa being the exception).
- ▶ Overall, we find heterogeneity in average growth rates over the recent period (2010-2017), with Toronto and Vancouver house prices increasing at a rate of 6.4% and 6.2% per year respectively compared to much more modest growth in Montreal (1.4%) and Calgary or Edmonton (respectively 0.7% and -0.01%) respectively.

▶ house price modelling

Subjective Expectations

- ▶ The cumulative change in house prices (percent terms) after T years, $\Delta^T p_t^H = p_{t+T}^H - p_t^H$ is approximately normally distributed with mean $g_{T,c} = Tg_c$ and standard deviation $\sigma_{T,c} = \sqrt{T}\sigma_c$.
- ▶ The probability that the cumulative return after 10 years is lower than some threshold p is given by

$$\Pr(\Delta^T p^H < p) = \Phi\left(\frac{p - \mu_i g_{T,c}}{\zeta_i \sigma_{T,c}}\right)$$

- ▶ In question Q23 of the survey, respondents report J analogs of these probabilities, $l_{i,j}$, at thresholds (p_1, \dots, p_J) . For each threshold, we set the following restriction:

$$l_{i,j} - \Phi\left(\frac{p_j - \mu_i g_{T,c}}{\zeta_i \sigma_{T,c}}\right) = 0$$

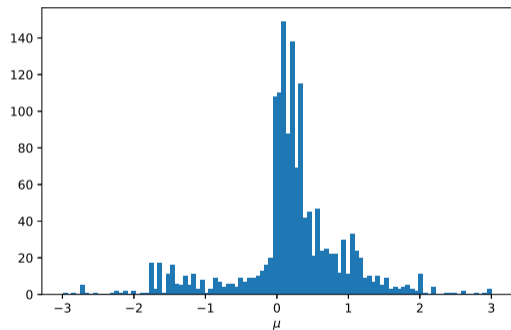
Denote by $L_i(\mu_i, \zeta_i)$ the set of J such restrictions.

- ▶ We use a minimum distance estimator to estimate (μ_i, ζ_i) for each respondents,

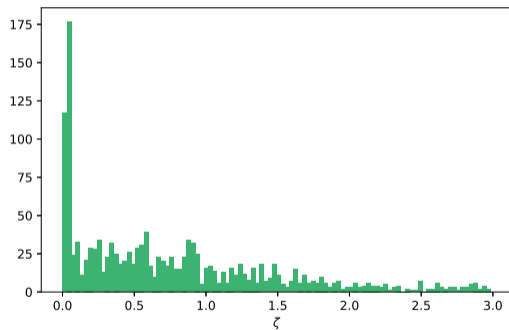
$$(\hat{\mu}_i, \hat{\zeta}_i) = \arg \min_{\mu_i, \zeta_i} L_i(\mu_i, \zeta_i)' L_i(\mu_i, \zeta_i).$$

House Price Expectations

Figure: Distribution of House Price Growth and Volatility Shifter Estimates



(a) Mean growth shifter



(b) Standard deviation shifter

Preference Shifters

We use a set of preference questions to capture preference types. We recode reported answers on Likert scales into binary variables. This introduces heterogeneity in $(\varepsilon, \gamma, b, \nu_h)$.

We ask the following in addition to a standard subjective risk aversion question:

Q24 Do you agree with the following statements? (Answers: 5 Strongly Agree; 4 Agree; 3 Disagree; 2 Strongly Disagree; 1 Don't know)

- (1) Parents should set aside money to leave to their children or heirs once they die, even when it means somewhat sacrificing their own comfort in retirement
- (2) A house is an asset that should only be sold in case of financial hardship
- (3) I prefer to live well but for fewer years than to live long and have to sacrifice my quality of life

» Distribution of Shifters

Estimation

- ▶ Each respondent, indexed $i = 1, \dots, N$
- ▶ Scenarios $k = 1, \dots, K$, three-dimensional tuple for the prices $\mathbf{P}_{i,k} = (P_{i,k}^A, P_{i,k}^L, \pi_{i,k}^R)$ and for benefits $\mathbf{B}_{i,k} = (b_{i,k}^A, b_{i,k}^L, L_{0,i,k})$ in annuities, LTC insurance and reverse mortgage products.
- ▶ $j(k)$ maps to the product type $\{A, L, R\}$ featured in scenario k .
- ▶ Each agent i reports probabilities $p_{i,k} \in [0, 1]$ of purchasing product k , relative to the benchmark case $\mathbf{B}_{i,0} = (0, 0, 0)$ and $\mathbf{P}_{i,0} = (0, 0, 0)$ of no participation in the three products.

Experience Utility

For given parameters θ solve $N \times K$ times for values

$$V_{i,k}(\theta) \equiv V(\mathbf{X}_i, \mathbf{P}_{i,k}, \mathbf{B}_{i,k}, \theta). \quad (1)$$

Define

$$\tilde{V}_{i,k}(\theta) = V_{i,k}(\theta) - V_{i,0}(\theta) \quad (2)$$

This is experience utility gain from purchasing a product

Decision utility

We account for behavioral considerations by specifying instead that agents purchase product k if

$$-\delta_{i,j(k)}^* + \tilde{V}_{i,k}(\theta) + v_{i,k} > 0, \quad (3)$$

With a logistic assumption on $v_{i,k}$ we get

$$p_{i,k}(\theta) = \frac{\exp(-\delta_{i,j(k)} + \lambda_{v,j(k)} \tilde{V}_{i,k}(\theta))}{1 + \exp(-\delta_{i,j(k)} + \lambda_{v,j(k)} \tilde{V}_{i,k}(\theta))}. \quad (4)$$

Estimator

Concentrated fixed effect NLS estimator:

- ▶ Transform $p_{i,k}(\theta)$:

$$g_{i,k} = \log \frac{p_{i,k}}{1 - p_{i,k}} = \delta_{i,j(k)} + \lambda_{v,j(k)} \tilde{V}_{i,k}(\theta). \quad (5)$$

- ▶ Within difference, for a given product, eliminates $\delta_{i,j(k)}$
- ▶ For given θ , can estimate $\lambda_{v,j(k)}$ by OLS. Avoids numerical search jointly with θ .
- ▶ allow λ_v to vary by product type (A, L, R) and also by whether or not respondents know the product based on their responses (if they respond that they know the product *a lot*).
- ▶ Estimate θ by NLS.
- ▶ Clustered standard errors (at respondent level)
- ▶ Over 20 000 DP problems to solve at each iterations...

Parameter Estimates

Table: Non-linear least squares estimates

Parameter	Point estimate	Std. Err.
a. Base preference		
ε	0.233	0.009
$\Delta\varepsilon$	-0.167	0.024
γ	0.439	0.022
$\Delta\gamma$	0.292	0.051
b. Housing and state-dependence		
ρ	0.877	0.039
$\nu_{c,2}$	0.172	0.019
$\nu_{c,3}$	0.073	0.008
ν_h	0.220	0.421
$\Delta\nu_h$	0.009	0.463
c. Bequests		
b	0.045	0.054
Δb	0.124	0.059
d. Info content utility gradients		
$\lambda_{v,A(0)}$	0.008	0.006
$\lambda_{v,A(1)}$	0.007	0.008
$\lambda_{v,L(0)}$	0.095	0.015
$\lambda_{v,L(1)}$	0.099	0.016
$\lambda_{v,R(0)}$	0.010	0.003
$\lambda_{v,R(1)}$	0.017	0.002
within SSE	7980.57	

Optimal Risk Management

We run a series of counterfactuals to understand low optimal take-up in the scenarios presented.

Table: Counter-factual optimal take-up of risk management products

Counter-factual	ANN	LTCI	RMR
Baseline	0.294	0.380	0.395
1. No health-dep. margin. utility	0.339	0.438	0.306
2. No subj. survival expectations	0.192	0.197	0.434
3. No subj. house price expectations	0.278	0.390	0.140
4. Constant house prices	0.287	0.361	0.743
5. No resource floor	0.301	0.350	0.341
6. No bequest motive	0.288	0.348	0.420

Bundling

The purchase of each risk management product is considered in isolation. Is there a demand for bundling? Interesting combinations:

- ▶ Annuities + Reverse mortgage: This allows to extract home equity and receive it as an annuity to protect against longevity risk.
- ▶ Annuities + LTCL: Allows for a state-dependent annuity where the benefit is larger when in poor health. Protects against longevity and health risk.
- ▶ RMR and LTCL: The reverse mortgage can help finance premiums for liquidity constrained households.

Bundling

We compare demand for each product individually when the choice set is constrained and when products can be purchased jointly. We allow for extensive and intensive margin (how much to purchase).

Table: Demand for bundling: Pick-up rates

ANN	LTCI	RMR	Joint	Independent
a. Distribution of take-ups				
No	No	No	0.366	0.372
		Yes	0.398	0.421
	Yes	No	0.083	0.078
Yes	No	Yes	0.054	0.074
		No	0.021	0.021
	Yes	Yes	0.055	0.016
		No	0.006	0.008
		Yes	0.016	0.009
b. Total take-ups				
ANN			0.098	0.055
LTCI			0.160	0.169
RMR			0.523	0.521

Conclusion

- ▶ Asset decumulation in retirement is complex. Risk management goes hand-in-hand with the speed at which assets are used to finance consumption.
- ▶ We estimate a benchmark model of asset decumulation and risk management in retirement from hypothetical choice situations households face.
- ▶ Our contribution lies in the identification of preferences from experimental data while accounting for the various complexities households face.
- ▶ For estimation, we outfit the optimal choice model with a behavioral apparatus which allows to match choices from the model to choices expressed in the experiment. This allows us to account for status-quo bias as well as noise considerations in hypothetical choice situations.

Conclusion

- ▶ Estimates of the model reveal a strong desire on the part of households to substitute consumption intertemporally, modest levels of risk aversion, a decreasing marginal utility of consumption with poor health and a relatively weak preference for bequests.
- ▶ Our estimates imply that optimal take-up of fairly priced risk management products is much larger than observed take-ups in the experiment. However, optimal take-up is far from 100% for each products.
- ▶ A number of factors play a role in these results.
 - ▶ For annuities, existing replacement income from retirement programs appears to generate a relatively low optimal demand for additional annuities.
 - ▶ For long-term care insurance, one important factor appears to be the declining marginal utility of consumption with poor health.
 - ▶ For reverse mortgages, house price expectations appear to be important.
- ▶ Of the three products, the model generates the highest optimal demand for reverse mortgages. There appears to be a high demand in the model for extracting home equity to finance near term consumption as well as the purchase of annuities.

House Price Risk

► Back to roadmap

Let $p_t^H \equiv \log(P_t^H)$ denote log home-owning prices P_t^H and let P_t^r denote rental prices, jointly distributed as:

$$p_t^H = g + p_{t-1}^H + \epsilon_t \quad (6a)$$

$$\epsilon_t \sim \text{NID}(0, \sigma^2) \quad (6b)$$

$$P_t^r = \phi P_t^H, \quad \phi \in (0, 1) \quad (6c)$$

We will allow for subjective beliefs to impact this process.

Mortgages

► Back to housing

We follow Goria and Midrigan (2018) by modeling mortgages as perpetuals with falling coupons. Specifically, the next-period mortgage value D_{t+1} cannot exceed $\xi^D \in (0, 1)$ of outstanding mortgages for continuing owners, i.e. $(H_t, H_{t+1}) = (1, 1)$, or a share $\omega^D \in (0, 1)$ of house value for new mortgages, i.e. $(H_t, H_{t+1}) = (0, 1)$:

$$D_{t+1} \leq \left[\xi^D H_t D_t + (1 - H_t) \omega^D P_t^H \right] H_{t+1}.$$

We will henceforth assume that the constraint is binding, i.e. conditional upon housing statuses (H_t, H_{t+1}) , new mortgages D_{t+1} are not a choice variable. Equivalently, the household cannot adjust repayment on outstanding mortgages, and must disburse $(1 - \omega^D)$ of new house purchases as collateral.

Housing Expenses

► Back to housing Finally, housing (C_t^H) and moving (MC_t) expenses – incurred only upon a change in housing status – are given as:

$$\begin{aligned}C_t^H &= (1 - H_{t+1}) P_t^r + H_{t+1} P_t^H - D_{t+1}, \\MC_t &= H_t(1 - H_{t+1}) MC_t^s + (1 - H_t) H_{t+1} MC_t^b, \\MC_t^k &= \tau_0^k + \tau_1^k P_t^H, \quad k = s, b\end{aligned}$$

where τ_0^k, τ_1^k are fixed and proportional costs paid out as moving expenses that may differ for sellers and buyers.

Transfers

» Back to Budget Constraint

Cash-on-Hand is given by

$$\begin{aligned}\tilde{X}_t &= W_t + W_t^H + Y_t + Z_t^{ben} - M_{ijt} \\ TR_t &= \max \left[X_{\min} + (1 - H_{t+1})P_t^r - \tilde{X}_t, 0 \right] \\ X_t &= \tilde{X}_t + TR_t - C_t^h - MC_t - Z_t^{prem}.\end{aligned}$$

The household allocates disposable net cash-on-hand X_t between savings $W_{t+1}/(1 + r_t)$, and non-housing consumption C_t so as to satisfy the budget constraint:

$$\frac{W_{t+1}}{1 + r_t} + C_t \leq X_t$$

Experiment: Reverse mortgages

» Back to Scenarios

RM Intro Screen: When we use the expression “current home equity”, we are referring to the current market value of your primary residence after subtracting outstanding mortgage balances. For the rest of this section, try to have your current home equity in mind. We are going to show you some simple reverse mortgage products and ask you to rate them.

Each reverse mortgage has two attributes:

- a) The percentage of your current home equity that you borrow.
- b) A fixed annual interest rate on the balance of the loan, generating interests that you do not need to pay before you move, sell or die.

Suppose you have the certainty that you will never be put under pressure to sell your residence and that the contract terms will be respected.

For scenarios, we first set the maximal loan-to-value (LTV) ratio that can be borrowed as a function of the age of the respondent: 30% for those age 60-64 and 40% for those 65-70 (market). We then consider two borrowing levels, : 50% and 100% of maximal LTV. We randomly pick (without replacement) from (2,4,6 and 8%) interest rate ($r_h + \pi$). The actual rate currently charged for RM is close to 6%. We emphasize the NNEG.

Extracting Home Equity: Fair Reverse mortgages pricing

- ▶ The reverse mortgage (RMR) allows owners to borrow up to a share ω^R of house value. The debt at origination L_0 is rolled over until the house is sold following which the cumulated interests and principal must be repaid up to an upper bound determined by house value at termination.
- ▶ The RMR contract satisfies the borrowing constraint:

$$H_{t+1}L_0 \leq \omega^R P_t^H H_t, \quad t = 0$$

- ▶ The reverse mortgage contract relies on the home-owning continuation probabilities q_{ijt}^h , as well as corresponding survival (i.e. non-termination) up to time t denoted S_{ijt}^h that both depend on the health statuses of household ij 's member(s):

$$q_{ijt}^h = \Pr[H_{t+1} = 1 \mid H_t = 1, s_{ijt}], \quad S_{ijt}^h = \prod_{k=0}^{t-1} q_{ijk}^h$$

Fair Pricing of RMR

- ▶ To understand the pricing of such a loan, consider the case where a reverse-mortgaged house is sold at time $t = T^h > 0$ (r_h is HELOC rate). The nominal amount due L_{ijt} ; loss to lender l_{ijt} ; and effective payment by borrower b_{ijt} are:

$$L_{ijt} = L_0 \exp \left[\left(r_h + \tau^R \pi_{ij} \right) t \right],$$

$$l_{ijt} = \max \left[L_{ijt} - P_t^H, 0 \right],$$

$$b_{ijt} = \min [L_{ijt}, P_t^H].$$

- ▶ The household status-dependent insurance premium $\pi_{ij} = \pi(s_{ij0})$ is implicitly defined from equality between non-negative equity guarantee (NNEG) and mortgage insurance premia (MIP):

$$\underbrace{E_0 \sum_{t=0}^T \exp(-r_h t) S_{ijt}^h (1 - q_{ijt}^h) l_{ijt}}_{\text{NNEG}} = \underbrace{\pi_{ij} \sum_{t=0}^T \exp(-r_h t) S_{ijt}^h L_{ijt}}_{\text{MIP}}$$

References I

- Abel, Andrew B. (1985) 'Precautionary saving and accidental bequests.' *American Economic Review* 75(4), 777 – 791
- Ameriks, John, Andrew Caplin, Steven Laufer, and Stijn Van Nieuwerburgh (2011) 'The joy of giving or assisted living? using strategic surveys to separate public care aversion from bequest motives.' *Journal of Finance* 66(2), 519 – 561
- Ameriks, John, Joseph Briggs, Andrew Caplin, Matthew D. Shapiro, and Christopher Tonetti (2018) 'The long-term-care insurance puzzle: Modeling and measurement.' Unpublished manuscript, Stanford University, June
- Andersen, Steffen, Glenn W. Harrison, Morten I. Lau, and E. Elisabet Rutstrom (2018) 'Multiattribute utility theory, intertemporal utility, and correlation aversion.' *International Economic Review* 59(2), 537 – 555
- Boyer, M. Martin, Philippe d'Astous, and Pierre-Carl Michaud (2022) 'Tax-Preferred Savings Vehicles: Can Financial Education Improve Asset Location Decisions?' *The Review of Economics and Statistics* pp. 1–16

References II

- Boyer, M. Martin, Philippe De Donder, Claude Fluet, Marie-Louise Leroux, and Pierre-Carl Michaud (2020a) 'Long-term care insurance: Information frictions and selection.' *American Economic Journal: Economic Policy* 12(3), 134 – 169
- Boyer, M. Martin, Sébastien Box-Couillard, and Pierre-Carl Michaud (2020b) 'Demand for annuities: Price sensitivity, risk perceptions, and knowledge.' *Journal of Economic Behavior and Organization* 180, 883–902
- Braun, R. Anton, Karen A. Kopecky, and Tatyana Koreshkova (2019) 'Old, frail, and uninsured: Accounting for features of the U.S. long-term care insurance market.' *Econometrica* 87(3), 981 – 1019
- Brown, Jeffrey R., and Amy Finkelstein (2007) 'Why is the market for long-term care insurance so small?' *Journal of Public Economics* 91(10), 1967–1991
- Cocco, Joao F., and Paula Lopes (2020) 'Aging in place, housing maintenance, and reverse mortgages.' *Review of Economic Studies* 87(4), 1799 – 1836
- De Nardi, Mariacristina, Eric French, and John Bailey Jones (2010) 'Why do the elderly save? The role of medical expenses.' *Journal of Political Economy* 118(1), 39–75

References III

- Gorea, Denis, and Virgiliu Midrigan (2018) 'Liquidity constraints in the U.S. housing market.' NBER Working Paper w23345, National Bureau of Economic Research, June
- Haurin, Donald, Chao Ma, Stephanie Moulton, Maximilian Schmeiser, Jason Seligman, and Wei Shi (2016) 'Spatial variation in reverse mortgages usage: House price dynamics and consumer selection.' *Journal of Real Estate Finance and Economics* 53(3), 392 – 417
- Hubbard, R. Glenn, Jonathan Skinner, and Stephen P. Zeldes (1995) 'Precautionary saving and social insurance.' *Journal of Political Economy* 103(2), 360 – 399
- Hubener, Andreas, Raimond Maurer, and Ralph Rogalla (2014) 'Optimal portfolio choice with annuities and life insurance for retired couples.' *Review of Finance* 18(1), 147 – 188
- Hurd, Michael D. (1989) 'Mortality risk and bequests.' *Econometrica* 57(4), 779–813
- Inkmann, Joachim, Paula Lopes, and Alexander Michaelides (2011) 'How deep is the annuity market participation puzzle?' *Review of Financial Studies* 24(1), 279 – 319

References IV

- Laitner, John, Dan Silverman, and Dmitriy Stolyarov (2018) 'The role of annuitized wealth in post-retirement behavior.' *American Economic Journal: Macroeconomics* 10(3), 71 – 117
- Lockwood, Lee M. (2012) 'Bequest motives and the annuity puzzle.' *Review of Economic Dynamics* 15(2), 226 – 243
- (2018) 'Incidental bequests and the choice to self-insure late-life risks.' *American Economic Review* 108(9), 2513 – 2550
- Nakajima, Makoto (2012) 'Everything you always wanted to know about reverse mortgages but were afraid to ask.' *Federal Reserve Bank of Philadelphia Business Review* pp. 19–31
- Nakajima, Makoto, and Irina A. Telyukova (2017) 'Reverse Mortgage Loans: A Quantitative Analysis.' *The Journal of Finance* 72(2), 911–950
- Palumbo, Michael G. (1999) 'Uncertain medical expenses and precautionary saving near the end of the life cycle.' *Review of Economic Studies* 66(2), 395–421

References V

- Peijnenburg, Kim, Theo Nijman, and Bas J. M. Werker (2017) 'Health cost risk: A potential solution to the annuity puzzle.' *Economic Journal* 127(603), 1598 – 1625
- Peijnenburg, Kim, Theo Nijman, and Bas J.M. Werker (2016) 'The annuity puzzle remains a puzzle.' *Journal of Economic Dynamics and Control* 70, 18 – 35
- Shan, Hui (2011) 'Reversing the trend: The recent expansion of the reverse mortgage market.' *Real Estate Economics* 39(4), 743 – 768
- Shao, Adam W., Hua Chen, and Michael Sherris (2018) 'To borrow or insure? long term care costs and the impact of housing.' manuscript, School of Risk and Actuarial Studies and CEPAR, UNSW Business School, UNSW Australia, January
- Shao, Adam W., Katja Hanewald, and Michael Harris (2015) 'Reverse mortgage pricing and risk analysis allowing for idiosyncratic house price risk and longevity risk.' *Insurance: Mathematics and Economics* 63, 76–90
- Yaari, Menahem E. (1965) 'Uncertain Lifetime, Life Insurance, and the Theory of the Consumer.' *The Review of Economic Studies* 32(2), 137