# Retirement Eggs and Retirement Baskets 

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[^0]How do people save over their lifetime across their portfolio of assets?

## Hump shaped wealth accumulation

Standard lifecycle accumulation follows hump shape

```
Accumulate
```


## Decumulate



## Saving motives

Saving motivated by:

- Consumption smoothing (Modogliani, 1986)
- Bequests (Kotlikof and Summers, 1981)
- Precautionary saving (Gounchiars and Parker, 2002; Aiyagari, 1994)

Mediating factors: job tenure \& mobility, investment returns, preference heterogeneity, lifetime earning dynamics more generally

## From overall wealth levels to portfolio allocation

Significant advantages to accumulating wealth via portfolios with different compositions

Role of private pensions in the provision of retirement income

Worldwide shift from defined benefit (DB) to defined contribution (DC)

Quality of people's portfolios bears increasing weight on old age savings adequacy

## Our research question

How do

1. standard saving motives,
2. pension choices,
3. investment returns,
4. preferences \& frictions
interact to drive lifetime savings across the main asset classes?

## Our eggs and baskets



## Our paper

- Structural lifecycle model of optimal consumption and portfolio choice
- housing \& financial wealth in safe / risky assets, inside / outside pension plans
- uninsurable labor income risk and borrowing constraints
- SMM on panel admin data matched with nationally represent. survey data for members of an industry-wide retirement fund
- Run counterfactuals to isolate marginal saving motives effects


## Main findings

Consumption smoothing

- Boosts significantly all forms of saving, particularly for females
- Encourages DC plan uptake
- Increases financial and pension wealth after middle years
- Raise early housing wealth


## Main findings (cont.)

Bequests

- Boosts pension wealth, slightly increases financial wealth, displaces housing, particularly for females (bequests substitute for consumption)
- Operates on pension wealth almost solely via plan choice
- Encourages DC plan uptake (bequests are luxury goods)
- Females stronger bequest motives induces riskier portfolio
- Increases financial wealth after middle years, with the later boost in non-liquid wealth dampening the effect


## Main findings (cont.)

Precautionary saving

- Do not directly add any extra financial or pension wealth
- Mortgage payments have dual role: 'savings' and insurance
- Encourages DC plan uptake and indirectly increases pension balances by shielding them from labor income uncertainty


## Main finding (cont.)

Pension - housing complementarity

- Costless switching out of plan defaults leads to higher pension and housing wealth
- Similar effect from higher pension returns

Mortgage redraws dampens overall exposure of wealth to wage risk and the need for financial wealth, boosting DC uptake

## Technical contribution

- Novel and fast scan method to efficiently compute solutions to higher dimensional optimization problems with non-convexities
- Monte Carlo gradient free algorithms to perform our estimation on a large compute cluster; contribute to practical scaling of distributed dynamic programming algorithms on high performance computational (HPC) infrastructure


## Structure of talk

1. Institutional context • Unisuper
2. Reduced form results $\rightarrow$ Reduced form
3. Structural model and estimation $\bullet$ Gostructural
4. Simulated accumulation profiles $\stackrel{\text { Structural } \mathrm{ft}}{ }$
5. Counterfactuals and decomposing saving motives $\rightarrow$ Counterfactuals

Institutional context

## UniSuper structure

Table A1. UniSuper plan features

|  | Mandatory | Default Option | Alternative Options |
| :--- | :---: | :---: | :---: |
| Enrolment | - | - | - |
| Plan type | - | $D B$ | $D C$ (within 1 yr) |
| Employer contributions | $17 \%$ | - | - |
| Employee contributions* |  | $7 \%$ |  |
| $\quad$ Standard rate | - | $0 \%$ | (Irreversible) Choice to decrease |
| $\quad$ Voluntary rate | - | Balanced | Choice of other 14 options |
| Investment options | - | Life and TPD | Choice to change cover |
| Insurance |  |  |  |

Notes: The table presents the key features of the retirement fund we study. Bold indicates the choice dimensions that we model. Recall all UniSuper members make investment choices as both DB and DC plans have a DC component * An additional choice dimension (that we do not model here) is that employee contributions can be made pre- or post-tax. TPD denotes total \& permanent disability.

## UniSuper data

UniSuper administrative records:

- Demographics: age, gender
- Plan type and balance: DB/DC
- Contributions: standard, voluntary
- Portfolio allocation: 15 investment options (risky assets share)
- Job indicators: wage, tenure years, number employers contributing
- Other: supplementary insurance, non-default asset allocation
- 2 waves: Dec. 2010 (wave 10) \& Dec. 2014 (wave 14)
- 9,728 individuals (13,022 obs., 5,328 refresher sample in wave 14 )


## HILDA data

Survey of Household, Income \& Labour Dynamics in Australia (HILDA) data :

- Consumption
- Financial wealth
- Housing (prevalence, wealth, services)
- Demo: marital status, \# children, education, health
- 2 waves: 2010 (wave 10) \& 2014 (wave 14)
- Match 82\% of our full UniSuper sample


## Pension and non-pension wealth characteristics

| Panel A. | \% of Members | \# of Members |
| :--- | :---: | :---: |
| Plan type: |  |  |
| $D B$ | 74.71 | 3,287 |
| DC | 25.30 | 1,113 |
| Is voluntarily contributing | 19.43 | 855 |
| Has supplementary insurance | 10.39 | 457 |
| Is homeowner | 86.80 | 3,819 |

## Pension and non-pension wealth characteristics

| Panel B. | Mean | Median |
| :--- | :---: | :---: |
| Pension wealth (in \$000) | 240.36 | 146.81 |
| Number of employers contributing | 0.97 | 1.00 |
| Number of years contributing | 12.69 | 12.00 |
| Annual wage (estimated, in \$000) | 87.89 | 81.34 |
| (DC) share in risky assets | 0.63 | 0.70 |
| Financial wealth (in \$000) | 434.31 | 326.10 |
| Housing wealth (in \$000) | 840.32 | 660.00 |
| Housing share in total wealth | 0.46 | 0.49 |
| Housing expenses (in \$) | $8,994.39$ | $1,000.00$ |
| Total net wealth (in \$000) | $1,001.60$ | 803.07 |

Reduced form analysis

## Reduced form: main findings

- Females have lower balances than males, and invest slightly more aggressively
- People become homeowners relatively early in their working life, and hold higher housing wealth shares as they get older
- Females and less educated people are more likely to own a home
- Higher earners and more educated people diversify their portfolios more
- Net wealth and the wealth share of own-home invested positively related


## Allocation and home decisions

|  | Risky share | Homeowner | Housing assets share |
| :--- | :--- | :--- | :--- |
| Age | 0.006 | $-0.512^{* * *}$ | $0.018^{* * *}$ |
|  | $(0.003)$ | $(0.083)$ | $(0.003)$ |
| Male | $-0.019^{* *}$ | -0.166 | -0.003 |
|  | $(0.007)$ | $(0.101)$ | $(0.005)$ |
| Low edu. | 0.018 | $2.244^{* * *}$ | $0.066^{* * *}$ |
|  | $(0.013)$ | $(0.239)$ | $(0.012)$ |
| High edu. | 0.011 | 0.111 | $-0.022^{* *}$ |
|  | $(0.008)$ | $(0.151)$ | $(0.007)$ |
| Couple | -0.004 | $0.637^{* * *}$ | $-0.035^{* * *}$ |
|  | $(0.008)$ | $(0.115)$ | $(0.008)$ |
| HH size | 0.001 | $0.492^{* * *}$ | $0.029^{* * *}$ |
|  | $(0.002)$ | $(0.044)$ | $(0.002)$ |
| Good health | 0.001 | -0.076 | $-0.021^{* * *}$ |
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| Model fit | 0.105 | 0.431 | 0.122 |

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## Allocation and home decisions

|  | Risky share | Homeowner | Housing assets share |
| :--- | :--- | :--- | :--- |
| Suppl. insurance | 0.000 | -0.124 | $-0.015^{*}$ |
|  | $(0.009)$ | $(0.149)$ | $(0.007)$ |
| Years of contribu- | 0.001 | $0.031^{* *}$ | $-0.002^{* * *}$ |
| tion | $(0.001)$ | $(0.010)$ | $(0.000)$ |
|  |  | -0.008 | -0.001 |
| Employers | 0.017 | $(0.193)$ | $(0.010)$ |
|  | $(0.011)$ | $0.622^{* *}$ | $-0.053^{* * *}$ |
| Ln annual wage | 0.005 | $(0.195)$ | $(0.008)$ |
|  | $(0.006)$ | -0.433 | $0.131^{* * *}$ |
| Ln net worth | 0.018 | $(0.276)$ | $(0.013)$ |
|  | $(0.011)$ | $0.044^{* * *}$ | $-0.002^{* * *}$ |
| Ln net worth X Age | -0.000 | $(0.007)$ | $(0.000)$ |
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## Structural model

## Model outline

An individual faces the following lifetime dynamics

- starts working at age $t_{0}$
- survives from one year to the next with survival probability $s_{t}$
- retires (and withdraws UniSuper balance) at age $R=65$
- lives to a maximum age $T=100$
- chooses DB/DC in the 1st year (default: DB)


## Model outline

Each year, a surviving individual chooses

- Voluntary contribution rate $v_{t}$ (default: 0\%)
- Risky assets share $r_{t}$ for DC funds (default: balanced 70/30)
- To rent or own home
- To adjust home capital (or keep it constant); if adjusting, decides level of housing stock
- Mortgage balance subject to redraws and collateral constraints
- Liquid savings that earn a risk free rate of return


## Model outline

Each year, a surviving individual

- consumes non-durable goods and enjoys housing services from housing stock or rented home
- faces stochastic
- wage income $w_{t}$
- house and time preferences $\alpha_{t}, \beta_{t}$
- rates of return on pension, housing and mortgage assets


## Within period utility

While alive, within-period utility function:

$$
u\left(C_{t}, S_{t}\right)=\frac{\left[\left(1-\alpha_{t}\right) c_{t}^{\rho}+\alpha_{t} S_{t}^{\rho}\right]^{\frac{1-\gamma}{\rho}}-1}{1-\gamma}
$$

where $S_{t}$ is housing services

- rented at rate $P_{t}^{S}=\phi^{S} P_{t}$ if not homeowner $\left(H_{t}=0\right)$, or
- given by own housing stock $H_{t}$ if homeowner $\left(H_{t}>0\right)$


## Bequest

After death, individual values total bequeathable wealth $B_{t}$

$$
b\left(a_{t}^{B}\right)=\theta \frac{\left(B_{t}+k\right)^{1-\gamma}}{1-\gamma}
$$

While working, she earns an annual wage $y_{t}$

$$
\begin{aligned}
\ln y_{t} & =\lambda_{0}+\sum_{k=1}^{4} \lambda_{k} t^{k}+\sum_{k=1}^{2} \lambda_{4+k} \tau^{k}+\xi_{t} \\
\xi_{t} & =\phi \xi_{t-1}^{\xi}+u_{t}, u_{t} \sim \mathcal{N}\left(0, \sigma_{u}^{2}\right)
\end{aligned}
$$

## Pension plan choice

- 2 pension plan options
- DB plan (default)
$a_{t}^{D B}=\mathrm{DB}$ component +DC component
- DB component:

$$
f_{t}^{A C F}\left(v_{s}\right) \cdot f_{t}^{L S F}(t) \cdot f^{A S F} \cdot \tau \cdot \bar{y}_{t}
$$

- DC component:

$$
\left[\pi_{t} R_{t}^{r}+\left(1-\pi_{t}\right) R_{t}^{s}\right] \cdot\left[a_{t-1}^{D C}+\left(v_{t}+(1-\alpha) v_{E}\right) y_{t}\right]
$$

- DC plan

$$
a_{t}^{D C}=\left[\pi_{t} R_{t}^{r}+\left(1-\pi_{t}\right) R_{t}^{s}\right] \cdot\left[a_{t-1}^{D C}+\left(v_{t}+v_{s}+v_{E}\right) y_{t}\right]
$$

- Switching out of default (DB) is costly

$$
u_{p}=\psi+\exp \left(v_{0}^{p}+v_{1}^{p} \hat{t}+v_{2}^{p} \hat{t}^{2}\right)
$$

## Asset allocation choice

- 5 allocation options (from 15 available investments) with diff risky:safe composition
- Balanced allocation (default)

$$
\ln r_{t}^{d}=r^{d}+\varepsilon_{t}^{d}, \text { with } \varepsilon_{t}^{d} \sim N\left(0, \sigma_{\varepsilon_{t}^{d}}^{2}\right)
$$

- "High risk - High return" allocation

$$
\ln r_{t}^{h}=r^{h}+h \varepsilon_{t}^{d}
$$

- "Low risk - Low return" allocation

$$
\ln r_{t}^{\prime}=r^{\prime}+1 \varepsilon_{t}^{d}
$$

$$
\text { with } r^{h}>r^{d}>r^{\prime} \text { and } h>1, l<1
$$

- Switching out of default (balanced allocation) is costly

$$
u_{\pi_{t}}=\psi+\exp \left(v_{0}^{r}+v_{1}^{r} t+v_{2}^{r} t^{2}+v_{3}^{r} \max \left\{0, \log \left(a_{t}^{D C}\right)\right\}+v_{4}^{r} u_{p}\right)
$$

## Voluntary contribution choice

- 6 voluntary contribution options
- No voluntary contributions, $v_{0}=0 \%$ (default)
- Positive voluntary contribution rate from set $\left\{v_{1}, \ldots, v_{5}\right\}$
- Switching out of default (no voluntary contributions) is costly

$$
u_{v_{t}}=\psi+\exp \left(v_{0}^{v}+v_{2}^{v}\left(t-v_{1}^{v}\right)^{2}+v_{3}^{v} \max \left\{0, \log \left(a_{t}\right)\right\}\right)
$$

## Housing

Housing capital accumulates as:

$$
H_{t+1}=(1-\delta) H_{t}+h_{t}
$$

Traded by paying a transaction cost $\tau_{H} P_{t} H_{t}$
(Real) Housing price $P_{t}$ grows at rate $r_{t}^{h}$ with mean $r^{h}$ and shock $\varepsilon_{t}^{h} \sim N\left(0, \sigma_{\varepsilon_{t}^{h}}^{2}\right)$

## Mortgages

Mortgages can be taken out at rate $r_{t}^{m}=\beta^{m} r_{t}^{s}+\kappa \epsilon_{t}^{d}$

Collateral constraint $m_{t+1} \leq\left(1-\phi^{C}\right) P_{t} H_{t}$

Costless redraw option even without refinancing but with constraints:

- $m_{t} \geq 0$
- $m_{t+1}-\left(1+r_{m}\right) m_{t} \geq \iota$
(No option to default from repaying mortgages)

Financial wealth

Risk free rate of return $r$

- Go back


## Decision making

1st stage: DB vs. DC

$$
V_{t_{0}}\left(X_{t_{0}}\right)=\operatorname{Max}_{D B / D C}\left\{V_{t_{0}}\left(X_{t_{0}} \mid D B\right)+\zeta_{D B}, V_{t_{0}}\left(X_{t_{0}} \mid D C\right)-u_{p}+\zeta_{D C}\right\}
$$

2nd stage, each period $t$ :

$$
\begin{aligned}
\tilde{V}_{t}\left(X_{t}\right)= & \max _{\pi_{t}, v_{t}, c_{t}, h_{t}, S_{t}, m_{t+1}, a_{t+1}} u\left(c_{t}, S_{t}\right)+ \\
& +\beta E_{t}\left[s_{t} V_{t+1}\left(X_{t+1}\right)+\left(1-s_{t}\right) b\left(a_{t+1}+a_{t+1}^{(D B / D C)}\right)\right] \\
& -u_{\pi_{t}} \cdot 1\left\{\pi_{t} \neq \pi^{d}\right\}+\zeta_{\pi_{t}}-u_{v_{t}} \cdot 1\left\{v_{t} \neq 0\right\}+\zeta_{v_{t}}
\end{aligned}
$$

## Solution method

Problem is non-convex, implies standard FOCs not sufficient
Traditionally, use 'pure' numerical optimization tools (i.e., iteratively apply grid search or Newton's method to the value function)

Dimensionality of model makes pure numerical optimization too costly

- 6 exogenous states, 5 endogenous states
- $5 \times 10^{8}$ grid points per period
- with standard methods, computation time 1-2 days / model
- with non-convex method, computation time 30 min / model

We use fast upper envelope scan (FUES) method by Dobrescu and Shanker (2022) to recover optimal solution (high dimensional mixed non-linear integer programming)

## Estimation

Calibrate parameters available in the data/ literature

- Interest rates, redraw and collateral constraints, housing adj. costs, rental rates

Estimate (27) parameters including:

- Preferences (housing, bequest, intertemporal elasticity, time)
- Switching cost parameters

Use SMM: find parameters that generates moments closest to the data
Parallelize Cross Entropy Method on 20,000 CPU cores on AU National Computational Infrastructure; takes approx. 5-10 hours (c.f. 2-3 years with standard iterative methods)

## Structural results

## Simulated profiles

Figure: Mean pension wealth (DB+DC) by cohort (thousands of \$)


## Simulated profiles

Figure: Mean financial wealth by cohort (thousands of \$)


## Simulated profiles

Figure: Mean housing wealth by cohort (thousands of \$)


## Simulated profiles

Figure: Share of members choosing DC plans by cohort


## Simulated profiles

Figure: Mean risky assets share by cohort


## Simulated profiles

Figure: Share of members voluntarily contributing by cohort


## Simulated profiles

Figure: Mean voluntary contributions by cohort (thousands of \$)


## Plan switching costs

Figure: Mean switching costs by cohort (thousands of \$) Goback


## Estimation results

|  | Males |  | Females |  |  |
| ---: | :---: | :---: | :---: | :---: | :---: |
|  |  | Estimates | S.E. | Estimates | S.E. |
| CRRA | $\gamma$ | 3.617 | 0.098 | 3.261 | 0.016 |
| Housing share | $\bar{\alpha}$ | 0.512 | 0.013 | 0.494 | .0144 |
|  | $\rho_{\alpha}$ | 0.817 | 0.029 | 0.797 | 0.041 |
|  | $\sigma_{\alpha \epsilon_{\mathrm{t}}}$ | 0.023 | 0.002 | 0.023 | .001 |
| CES parameter | $\rho$ | 0.244 | 0.023 | 0.326 | 0.024 |
| Bequest | $\ln (\theta)$ | 8.367 | 0.075 | 9.652 | 0.093 |
| Time discount | $\bar{\beta}$ | 0.918 | 0.012 | 0.901 | 0.019 |
|  | $\rho_{\beta}$ | 0.843 | 0.021 | 0.801 | 0.045 |
|  | $\sigma_{\beta \epsilon_{\mathrm{t}}}$ | 0.025 | 0.001 | 0.034 | 0.012 |

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## Counterfactuals

## Counterfactual scenarios

|  | Opting into DC plans | Opting to contribute | Risky assets share | Pension wealth | Nonpension wealth: | Financial wealth | Housing wealth |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
|  | \% of members |  | \% | \% change from baseline |  |  |  |
|  |  |  | Panel A. Males |  |  |  |  |
| Baseline | 35.392 | 21.216 | 59.514 | - | - |  | - |
| No cons. smooth. | 32.169 | 20.009 | 61.241 | -34.764 | -19.325 | -43.457 | -6.339 |
| No bequests | 32.798 | 17.497 | 65.824 | -33.139 | 0.095 | -19.423 | 16.232 |
| No prec. savings | 28.940 | 21.232 | 63.671 | -33.723 | 18.730 | 39.796 | 7.394 |
| No switching costs | 41.185 | 73.098 | 48.711 | 67.946 | 14.850 | -0.046 | 22.866 |
| Higher $R^{r}$ | 42.644 | 23.026 | 61.851 | 24.477 | 9.686 | 9.962 | 9.537 |
| No redraw | 23.967 | 20.887 | 60.434 | -10.597 | 35.382 | 34.423 | -1.592 |

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## Counterfactual scenarios

|  | Opting <br> into DC <br> plans | Opting to contribute | Risky assets share | Pension wealth | Nonpension wealth: | Financial wealth | Housing wealth |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
|  | \% of members |  | \% | \% change from baseline |  |  |  |
| Panel A. Males |  |  |  |  |  |  |  |
| Baseline | 35.392 | 21.216 | 59.514 | - | - | - | - |
| No cons. smooth. | 32.169 | 20.009 | 61.241 | -34.764 | -19.325 | -43.457 | -6.339 |
| No bequests | 32.798 | 17.497 | 65.824 | -33.139 | 0.095 | -19.423 | 16.232 |
| No prec. savings | 28.940 | 21.232 | 63.671 | -33.723 | 18.730 | 39.796 | 7.394 |
| No switching costs | 41.185 | 73.098 | 48.711 | 67.946 | 14.850 | -0.046 | 22.866 |
| Higher $R^{r}$ | 42.644 | 23.026 | 61.851 | 24.477 | 9.686 | 9.962 | 9.537 |
| No redraw | 23.967 | 20.887 | 60.434 | -10.597 | 35.382 | 34.423 | -1.592 |

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|  | \% of members |  | \% | \% change from baseline |  |  |  |
|  |  |  | Panel B. Females |  |  |  |  |
| Baseline | 32.619 | 21.968 | 61.731 | - | - | - | - |
| No cons. smoothing | 29.402 | 21.871 | 64.918 | -24.542 | -44.947 | -49.072 | -40.873 |
| No bequests | 30.040 | 20.996 | 54.329 | -23.242 | 2.355 | -20.567 | 26.459 |
| No prec. savings | 25.042 | 25.450 | 63.690 | -13.588 | 5.017 | 0.033 | 9.941 |
| No switching costs | 35.447 | 55.007 | 52.522 | 55.989 | -0.667 | -6.035 | 4.637 |
| Higher $R^{r}$ | 35.022 | 23.680 | 62.538 | 25.295 | 1.036 | 3.082 | 0.986 |
| No redraw | 23.967 | 19.661 | 62.233 | -15.677 | 15.276 | 27.346 | -10.789 |

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## Saving motives decomposition

Directly isolate the impact of saving motives on lifetime wealth allocation
Examine motives profiles with plan prevalence fixed at its baseline levels

Interpretation: the marginal effect of each saving motive on each major asset class (Gourinchas and Parker, 2002; Cagetti, 2003; Pashchenko and Porapakkarm, 2020)

## Saving motives decomposition

Figure: Additional pension wealth by cohort (thousands of \$)


## Saving motives decomposition

Figure: Additional financial wealth by cohort (thousands of \$)


## Saving motives decomposition

Figure: Additional housing wealth by cohort (thousands of \$)


## So... main findings

1. Consumption smoothing: key role in driving (post-40) pension \& financial wealth, (early) housing wealth
2. Bequests: limited direct role, affect plan choice, financial boost that displaces housing in mid years
3. Precautionary savings: limited role, affect plan choice, drives savings but not directly
4. Housing and pensions act as complements

## Housing-pension complementarity

## Housing adjustment has a fixed cost; individuals accumulate housing early

Housing consumption locked in by decisions during early years
A young homeowner will thus consider both what they wish to consume immediately, and what they anticipate consuming in their later life (and even post-retirement)

With higher pension returns, younger individuals anticipate lower marginal utility of consumption after (close to) retirement, thus increasing housing wealth in earlier years

Conclusion

## Final remarks

- Pension plan structure has a significant impact on overall asset composition
- Policies encouraging retirement savings (with withdraws only available in later life) can boost housing
- Housing not always looking like a plausible 'substitute' for pensions
- Consumption smoothing is key for savings overall and across assets
- Bequest (dis)incentives have little impact on overall savings but affect plan choices
- Mortgage redraws can dampen precautionary saving motives via added liquidity


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    ${ }^{2}$ University of Sydney

