# Effects of Taxes and Safety-Net Pensions on Life-cycle Labor Supply, Savings and Human Capital: The Case of Australia

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### Overview

This paper uses a dynamic structural model to assess the impact of the Australian social security system on labor supply, savings, human capital investment and consumer welfare.

We use the model to do experiments to see if the system could be improved.

In this presentation I will:

- Give the background to the substantive problem
  - Explain how the paper contributes to the literature methodologically
  - Present the model and results

The next presentation will discuss the method for solving the model in detail.



## The Australian Social Security System

The Australian social security system is ranked among the best in the world by Mercer, the OECD, IMF etc.

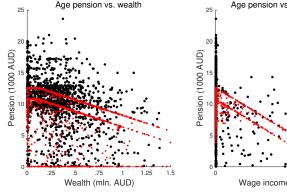
### Two components:

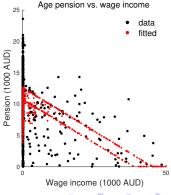
- "Superannuation"
  - Defined contribution pension plan
  - Mandatory employer contributions to private accounts (9.5%)
  - Workers choose among investment options
  - Accessible from age 65 (Age 60 if retired)
  - Avoids fiscal burden on government
- Age Pension
  - $\bullet$  Provides safety net at ages 65 +
  - Benefits do not depend on work history (unlike SS in US)
  - Pure means-tested transfer ("welfare") program

# Age Pension Benefit Rule

#### Estimate Effective Income and Asset Taper Rates

```
benefit<sub>max</sub>
                            10,759.73 + 1,846.92 (when year \geq 2010),
                               (183.96)
                                                  (173.52)
                            \max \left\{ \mathsf{benefit}_{\mathsf{max}} - \mathsf{max} \left[ \, \max\{0.27794 \, \mathsf{income}, 0.00499 (\mathsf{wealth} - 117, 082.60)\}, 0 \right] \right\}
   pension
```







### Age Pension Benefits

We estimate effective taper rates of only:

- 27.8% on Income
- 0.5% on Assets

The low taper rates lead to very poor targeting (75% get some benefits). This means the Age Pension is a large program:

- Income Taxes = \$ 180 bil. (2014)
- Age Pension = \$ 50 bil. (2014)

#### Goal: Use structural model to assess:

- Effects of Age Pension on:
  - Labor supply
  - Asset and human capital accumulation
- Effects of changes in Age Pension rules designed to <u>improve</u> targeting of benefits

### Literature

This paper extends the literature on dynamic life-cycle labor supply models with human capital:

Keane and Wolpin (IER, 2001) was the first paper to structurally estimate a dynamic life-cycle model with both human capital and saving. Imai and Keane (IER, 2004) followed (focusing on how HC affects labor supply elasticities).

In the 2001 paper labor supply was discrete: (FT, PT, 0), while in the 2004 paper it was continuous.

Keane and Wasi (EJ, 2016) was first paper with assets, HC and mixed discrete/continuous hours.

The present paper develops an arguably more realistic model where hours are bunched at several discrete levels. And a better algorithm to handle mixed discrete/continuous choices (hours/savings).



### Literature

Means-tested transfers have potentially important effects on asset and human capital accumulation.

Yet there are very few papers estimating dynamic models with means-tested transfers:

- Keane and Wolpin (IER, 2010) which is basically the "Career Decisions of Young Women"
- Blundell, Costa-Dias, Meghir, Shaw (ECMA, 2016)

These papers do not focus on the targeting issue we emphasize here.

# Our Life-Cycle Labor Supply Model

- Discrete time = Age from 19 to 100 (stochastic survival)
- Annual decisions on:
  - Consumption/Saving (continuous choice)
  - Hours chosen from [ 0, 24, 40, 45, 50, 60 ] per week (discrete choice)
  - Previous Life-cycle labor supply models have not accounted for bunching of hours
- 4 Human capital accumulation
  - Learning-by-doing
- We model Age Pension, Superannuation and Tax Rules
- Observed and unobserved heterogeneity
  - ullet Education o Shifts human capital production function
  - ullet Unobserved types o Shifts skill endowment and tastes for leisure

## Our Life-cycle labor Supply Model

Hours of labor supply  $h_t \in H$  (choice variable)

Human capital:  $K_t = f\left(\sum_{\tau=1}^{t-1} h_{\tau}, \mathsf{age}, \mathsf{education}, \mathsf{type}\right)$ 

Wage: 
$$wage_{t+1} = K_t \cdot R_t \cdot \epsilon_{t+1}^{wage}$$
,

- ullet  $R_t=1$  is rental rate on human capital,
- Wage draw:  $\epsilon_t^{wage} \sim InN(0, \sigma_t^{wage})$
- Timing:  $h_t$  chosen based on  $K_t$ , wage draw revealed at t+1

 $M_t$  = Consumable wealth in the beginning of the period

Consumption  $c_t \leq M_t + a_0$  (credit constraint)

Intertemporal budget constraint

$$M_{t+1} = (M_t - c_t)(1+r) + h_t \cdot wage_{t+1} - Tax_{t+1} + transfers_{t+1}$$

## Our Life-cycle Labor Supply Model

Intertemporal budget constraint (Details on Transfers)

$$\begin{aligned} M_{t+1} &= (M_t - c_t) \left( 1 + r \right) + h_t \cdot wage_{t+1} - Tax_{t+1} + transfers_{t+1} \\ M_{t+1} &= (M_t - c_t) \left( 1 + r \right) + h_t \cdot wage_{t+1} - Tax_{t+1} \\ &+ pens_{t+1} \cdot \mathbb{1}\{t+1 \geq 65\} \\ &+ super_{t+1} \cdot \mathbb{1}\{t+1 = 65\} \\ &+ tr_{t+1} \cdot \mathbb{1}\{t+1 \leq 22\} \end{aligned}$$

#### where:

- pens<sub>t+1</sub> denotes Age Pension benefits,
- $super_{t+1}$  denotes the superannuation payment
- $tr_{t+1}$  denotes transfers from parents to youth

The Pension and Super rules are estimated from data (see below)

## Our Life-cycle Labor Supply Model

- Human Capital Production Function
- Let  $\mathcal{E}_t$  denote the ratio of total work time to maximum work time up through t-1, i.e. "normalized" work experience,  $0 \le \mathcal{E}_t \le 1$

$$\mathcal{E}_t = rac{1}{t \cdot h_{ extit{max}}} \sum_{ au=1}^{t-1} h_{ au}$$

$$K_t = \exp\left(\eta_{0,edu} + \eta_{0,type} + \eta_{1,edu} \cdot t\mathcal{E}_t + \eta_{2,edu} \cdot (t\mathcal{E}_t)^2 + \eta_3 t + \eta_4 t^2\right)$$

where  $t \cdot \mathcal{E}_t$  is total work experience.

 Heterogeneity: education and type specific intercepts in wage function

# Our Life-Cycle Labor Supply Model

• Preferences for Consumption and Bequests

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

$$w(B_t) = b_{scale} \cdot \frac{(B_t + a_0)^{1-\xi} - a_0^{1-\xi}}{1-\xi}$$

- $B_t = M_t c_t$  is bequeathed wealth (if person dies at age t)
- $\zeta > 0$ ,  $\xi > 0$ ,  $b_{scale} > 0$  are parameters to be estimated
- $a_0 = \text{credit constraint (maximum amount of borrowing)}$

## Our Life-cycle Labor Supply Model

• Preferences: Disutility of Work Hours

$$v_t(h_t) = \mathbb{1}\{h_t > 0\} \cdot \kappa_{type}(\tau_{uh}) \cdot \kappa_{age}(t) \cdot \gamma(h_t)$$

 $\gamma = (\gamma^{(1)}, \dots, \gamma^{(5)})$  disutilities of the five discrete hours levels

Type: high 
$$(\kappa_{type} = 1)$$
 or low  $(\kappa_{type} = \kappa_1 > 1)$ 

Age effects:

$$\kappa_{age}(t) = 1 + \kappa_2(t - 40)^2 \cdot \mathbb{1}\{t > 40\} + \kappa_3(t - 25) \cdot \mathbb{1}\{t < 25\}$$

Age effects may proxy for declining health at older ages

## Our Life-Cycle Labor Supply Model

- State vector  $X_t = (M_t, \mathcal{E}_t, \text{education}, \text{type})$
- Bellman Equation

$$V_t(X_t) = \max_{\substack{0 \leq c_t \leq M_t + a_0, \\ h_t \in H_t}} \left\{ \frac{u(c_t) - v_t(h_t, \tau_{uh})}{+\delta_t \beta(\tau_{edu}) E[V_{t+1}(X_{t+1}) | X_t, c_t, h_t]} + (1 - \delta_t) w(M_t - c_t) \right\},$$

Note:  $c_t$  continuous,  $h_t$  discrete

```
	au = (	au_{uh}, 	au_{edu}) types for education and taste of work H_t choice set in period t eta(	au_{edu}) discount factor dependent on education \delta_t survival probability
```



### **HILDA Data**

#### Household, Income and Labor Dynamics in Australia survey (HILDA)

- The primary source of data is the Household, Income and Labor Dynamics in Australia Survey (HILDA).
- Annual waves 2001-2016, Australian national representative sample
- Data on income, wages and labor supply (each year)
- Data on wealth in particular years
- First wave administered to 19,914 people

#### Structural estimation sample:

- Single and married men between age 19 and 89
  - 10,133 individuals, unbalanced panel of 81,197 observations
  - Born 1916 1997

### **HILDA Data**

#### Description of the estimation sample

|                                     | College   | High school | High school | All    |
|-------------------------------------|-----------|-------------|-------------|--------|
|                                     | graduates | graduates   | dropouts    | All    |
| Number of individuals               | 2,391     | 5,254       | 2,488       | 10,133 |
| Number of data points               | 20,207    | 41,965      | 19,025      | 81,197 |
| Average num. of obs. per individual | 8.45      | 7.99        | 7.65        | 8.01   |
| Num. of obs. age 16-30              | 2,828     | 7,458       | 2,110       | 12,396 |
| Num. of obs. age 31-40              | 5,135     | 9,042       | 2,555       | 16,732 |
| Num. of obs. age 41-50              | 4,957     | 9,405       | 3,633       | 17,995 |
| Num. of obs. age 51-60              | 3,873     | 7,405       | 3,532       | 14,810 |
| Num. of obs. age 61-70              | 2,135     | 4,735       | 3,127       | 9,997  |
| Num. of obs. age 71-89              | 1,279     | 3,920       | 4,068       | 9,267  |
| Non-missing wage                    | 75.03%    | 65.77%      | 45.71%      | 63.38% |
| Non-missing wealth                  | 22.68%    | 22.59%      | 22.14%      | 22.51% |
| Non-missing super                   | 20.01%    | 17.66%      | 12.94%      | 17.14% |

## Putting Institutional Settings in the Model

#### Approximate Pension, Super and Tax Rules

- We approximate the rules as functions of variables in our model
- We fit the approximate rules using the HILDA data

#### Age Pension Benefit Rule, 2001-2016

• We use the same equation we presented in the Intro:

```
\begin{array}{lll} \mathsf{benefit}_{\mathsf{max}} & = & 10,759.73 + 1,846.92 (\mathsf{when year} \geq 2010), \\ & & (183.96) & (173.52) \\ \\ \mathsf{pension} & = & \mathsf{max} \left\{ \mathsf{benefit}_{\mathsf{max}} - \mathsf{max} \left[ \, \mathsf{max} \{ 0.27794 \, \mathsf{income}, 0.00499 (\mathsf{wealth} - 117,082.60) \}, 0 \right] \right\} \\ & & \left\{ \mathsf{constant} \left[ \, \mathsf{max} \left\{ 0.27794 \, \mathsf{income}, 0.00499 (\mathsf{wealth} - 117,082.60) \right\}, 0 \right] \right\} \\ & & \left\{ \mathsf{constant} \left[ \, \mathsf{max} \left\{ 0.27794 \, \mathsf{income}, 0.00499 (\mathsf{wealth} - 117,082.60) \right\}, 0 \right] \right\} \\ & & \left\{ \mathsf{constant} \left[ \, \mathsf{constant} \left[ \, \mathsf{constant} \right], 0.27794 \, \mathsf{income}, 0.00499 (\mathsf{wealth} - 117,082.60) \right], 0 \right\} \\ & & \left\{ \mathsf{constant} \left[ \, \mathsf{constant} \right], 0.27794 \, \mathsf{income}, 0.00499 (\mathsf{wealth} - 117,082.60) \right\}, 0 \right\} \\ & & \left\{ \mathsf{constant} \left[ \, \mathsf{constant} \right], 0.27794 \, \mathsf{income}, 0.00499 (\mathsf{wealth} - 117,082.60) \right\}, 0 \right\} \\ & & \left\{ \mathsf{constant} \left[ \, \mathsf{constant} \right], 0.27794 \, \mathsf{income}, 0.00499 (\mathsf{constant} - 117,082.60) \right\}, 0 \right\} \\ & & \left\{ \mathsf{constant} \left[ \, \mathsf{constant} \right], 0.27794 \, \mathsf{income}, 0.00499 (\mathsf{constant} - 117,082.60) \right\}, 0 \right\} \\ & & \left\{ \mathsf{constant} \left[ \, \mathsf{constant} \right], 0.27794 \, \mathsf{constant} \right\} \\ & & \left\{ \mathsf{constant} \left[ \, \mathsf{constant} \right], 0.27794 \, \mathsf{constant} \right\} \\ & \left\{ \mathsf{constant} \left[ \, \mathsf{constant} \right], 0.27794 \, \mathsf{constant} \right\} \\ & \left\{ \mathsf{constant} \left[ \, \mathsf{constant} \right], 0.27794 \, \mathsf{constant} \right\} \\ & \left\{ \mathsf{constant} \left[ \, \mathsf{constant} \right], 0.27794 \, \mathsf{constant} \right\} \\ & \left\{ \mathsf{constant} \left[ \, \mathsf{constant} \right], 0.27794 \, \mathsf{constant} \right\} \\ & \left\{ \mathsf{constant} \left[ \, \mathsf{constant} \right], 0.27794 \, \mathsf{constant} \right\} \\ & \left\{ \mathsf{constant} \left[ \, \mathsf{constant} \right], 0.27794 \, \mathsf{constant} \right\} \\ & \left\{ \mathsf{constant} \left[ \, \mathsf{constant} \right], 0.27794 \, \mathsf{constant} \right\} \\ & \left\{ \mathsf{constant} \left[ \, \mathsf{constant} \right], 0.27794 \, \mathsf{constant} \right\} \\ & \left\{ \mathsf{constant} \left[ \, \mathsf{constant} \right], 0.27794 \, \mathsf{constant} \right\} \\ & \left\{ \mathsf{constant} \left[ \, \mathsf{constant} \right], 0.27994 \, \mathsf{constant} \right\} \\ & \left\{ \mathsf{constant} \left[ \, \mathsf{constant} \right], 0.27994 \, \mathsf{constant} \right\} \\ & \left\{ \mathsf{constant} \left[ \, \mathsf{constant} \right], 0.27994 \, \mathsf{constant} \right\} \\ & \left\{ \mathsf{constant} \left[ \, \mathsf{constant} \right], 0.27994 \, \mathsf{constant} \right\} \\ & \left\{ \mathsf{constant} \left[ \, \mathsf{constant} \right], 0.27994 \, \mathsf{constant} \right\} \\ & \left\{ \mathsf
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## Putting Institutional Settings in the Model

#### Superannuation:

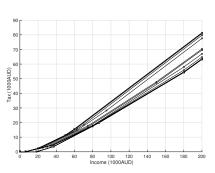
- Superannuation is a function of earnings throughout one's career
  - → Human capital at age 65 is a good proxy for lifetime earnings
  - → Both depend on skill endowment and lifetime hours
- We still need to simplify the rules:
- Disregard the details of retirement income products (e.g. annuities)
  - → Assume super is paid as lump sum at age 65

$$super_t = \rho_0 + \rho_1(\tau_{edu}) \cdot K_t, t = 65$$

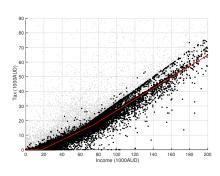
- Not an unrealistic assumption:
  - Market for annuities is very thin,
  - Most people take lump sum payout.

# Putting Institutional Settings in the Model

Income Tax Rule, 2001-2016 Tax rules



#### Tax data



$$\mathsf{tax} = \begin{cases} 0, & \text{if income} < \mathsf{thld}_1 = 17.39184, \\ 0.29907 \cdot (\mathsf{income} - \mathsf{thld}_1), & \text{if } \mathsf{thld}_1 \leq \mathsf{income} < \mathsf{thld}_2, \\ 0.37930 \cdot (\mathsf{income} - \mathsf{thld}_2) + 0.29907 \cdot \mathsf{thld}_1, & \text{if income} \geq \mathsf{thld}_2 = 73.17661, \\ 0.00556) \cdot (\mathsf{income} - \mathsf{thld}_2) + 0.29907 \cdot \mathsf{thld}_1, & \text{if income} \geq \mathsf{thld}_2 = 73.17661, \\ 0.00556) \cdot (\mathsf{income} - \mathsf{thld}_2) + 0.29907 \cdot \mathsf{thld}_1, & \text{if income} \geq \mathsf{thld}_2 = 73.17661, \\ 0.00556) \cdot (\mathsf{income} - \mathsf{thld}_2) + 0.29907 \cdot \mathsf{thld}_2, & \text{if income} \geq \mathsf{thld}_2 = 73.17661, \\ 0.00556) \cdot (\mathsf{income} - \mathsf{thld}_2) + 0.29907 \cdot \mathsf{thld}_2, & \text{if income} \geq \mathsf{thld}_2 = 73.17661, \\ 0.00556) \cdot (\mathsf{income} - \mathsf{thld}_2) + 0.29907 \cdot \mathsf{thld}_2, & \text{if income} \geq \mathsf{thld}_2 = 73.17661, \\ 0.00556) \cdot (\mathsf{income} - \mathsf{thld}_2) + 0.29907 \cdot \mathsf{thld}_2, & \text{if income} \geq \mathsf{thld}_2 = 73.17661, \\ 0.00556) \cdot (\mathsf{income} - \mathsf{thld}_2) + 0.29907 \cdot \mathsf{thld}_2, & \text{if income} \geq \mathsf{thld}_2 = 73.17661, \\ 0.00556) \cdot (\mathsf{income} - \mathsf{thld}_2) + 0.29907 \cdot \mathsf{thld}_2, & \text{if income} \geq \mathsf{thld}_2 = 73.17661, \\ 0.00556) \cdot (\mathsf{income} - \mathsf{thld}_2) + 0.29907 \cdot \mathsf{thld}_2, & \text{if income} \geq \mathsf{thld}_2 = 73.17661, \\ 0.00566) \cdot (\mathsf{income} - \mathsf{thld}_2) + 0.29907 \cdot \mathsf{thld}_2, & \text{if income} \geq \mathsf{thld}_2 = 73.17661, \\ 0.00566) \cdot (\mathsf{income} - \mathsf{thld}_2) + 0.29907 \cdot \mathsf{thld}_2, & \text{if income} \geq \mathsf{thld}_2 = 73.17661, \\ 0.00566) \cdot (\mathsf{income} - \mathsf{thld}_2) + 0.29907 \cdot \mathsf{thld}_2, & \text{if income} \geq \mathsf{thld}_2 = 73.17661, \\ 0.00566) \cdot (\mathsf{income} - \mathsf{thld}_2) + 0.29907 \cdot \mathsf{thld}_2, & \text{if income} \geq \mathsf{thld}_2 = 73.17661, \\ 0.00566) \cdot (\mathsf{income} - \mathsf{thld}_2) + 0.29907 \cdot \mathsf{thld}_2, & \text{if income} \geq \mathsf{thld}_2 = 73.17661, \\ 0.00566) \cdot (\mathsf{income} - \mathsf{thld}_2) + 0.29907 \cdot \mathsf{thld}_2, & \text{income} \geq \mathsf{thld}_2 = 73.17661, \\ 0.00566) \cdot (\mathsf{income} - \mathsf{thld}_2) + 0.29907 \cdot \mathsf{thld}_2, & \text{income} \geq \mathsf{thld}_2 = 73.17661, \\ 0.00566) \cdot (\mathsf{income} - \mathsf{thld}_2) + 0.29907 \cdot \mathsf{thld}_2, & \text{income} \geq \mathsf{thld}_2 = 73.17661, \\ 0.00566) \cdot (\mathsf{thld}_2) + 0.29907 \cdot \mathsf{thld}_2 = 73.17661, \\ 0.00566) \cdot (\mathsf{thld}_2) + 0.29907 \cdot \mathsf{thld}_2 = 73.17661, \\ 0.00566) \cdot (\mathsf{thld$$

### **HILDA Data**

Mapping Observed Hours into 6 Discrete Levels

K-medians cluster analysis Correspondence to HILDA

| $h_t$ | Nobs   | annual | week | Empl FT | Empl PT | Unemp | OLF    |
|-------|--------|--------|------|---------|---------|-------|--------|
| 0     | 26,411 | 0      | 0    | 353     | 1,877   | 2,216 | 21,960 |
| 1     | 6,711  | 1200   | 24   | 1,303   | 5,408   | 0     | 0      |
| 2     | 23,387 | 2000   | 40   | 23,212  | 175     | 0     | 0      |
| 3     | 7,622  | 2250   | 45   | 7,622   | 0       | 0     | 0      |
| 4     | 12,115 | 2500   | 50   | 12,115  | 0       | 0     | 0      |
| 5     | 8,368  | 3000   | 60   | 8,368   | 0       | 0     | 0      |

### Model solution: DC-EGM

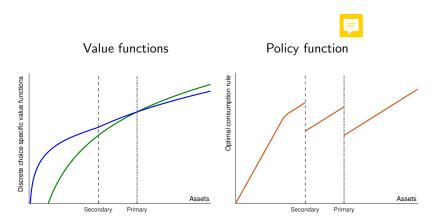


Carroll (2006) *Economics Letters*The method of endogenous gridpoints for solving dynamic stochastic optimization problems.

#### Main idea of the endogenous grids

- Instead of searching for optimal decision in each point of the state space (traditional approaches)
- Look for the state variable (level of assets) where arbitrary chosen decision (consumption → savings) would be optimal (EGM)

### Kinks and discontinuities with discrete-continuous choice



# Primary kinks

- The choice-specific (work/not work) value functions intersect (due to trade-off between income and disutility of work)
- The upper envelope of the value functions has a kink (this is what we call a primary kink)
  ↓
- Oiscrete choice policy is to work on the left of the kink, and to retire on the right of the kink
- Working and retiring have different corresponding optimal consumption policies
- 6 Combined consumption policy has a discontinuity

# Secondary kinks

- Value function in t+1 has a primary kink (because d-specific value functions intersect in t+1)  $\downarrow \downarrow$
- ② In the non-concave region around a primary kink in t+1 the maximand in the Bellman equation has multiple local optima  $\downarrow\downarrow$
- The Euler equation for the corresponding values of wealth has multiple solutions, all solutions are found in EGM
- "Suboptimal" endogenous points have to be dropped: find the point where global maximum shifts from one solution to the other
- Optimal consumption rule in period t has a discontinuity, the value function has a corresponding secondary kink

### Adding extreme value shocks

#### Properties of the full solution

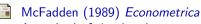
- Value functions are non-concave and have kinks
- Consumption functions have discontinuities
- Oiscontinuities/kinks propagate through time and accumulate

#### Extreme value distributed taste shocks

- Smooth out primary kinks
- Extreme value distribution → closed form expectations for choice probabilities and expectation of the max (logsum)
- Two interchangeable interpretations
  - Structural: unobserved state variables
  - Logit smoothing: to streamline the solution
- Prevent propagation of kinks and discontinuities
- No complete smoothing in general: secondary kinks may persist



### Estimation: Method of Simulated Moments



A method of simulated moments for estimation of discrete response models without numerical integration

- Method of simulated moment estimator
- Diagonal weighting matrix
- Logit smoothed simulator for better numerical performance
- POUNDerS derivative free trust region minimization algorithm
- "Practical optimization using no derivatives for sums of squares"
- POUNDerS is tailored to problems of minimizing a (weighted) sum
  of squared residuals. It works by approximating each moment
  condition as a quadratic function of the model parameters. It is
  derivative free, which is useful because computing derivatives is
  computationally expensive. But it relies on existence of derivatives
  for the quality of the approximation. The algorithm terminates if it
  succeeds in setting the (approximate) derivatives of the moments
  with respect to the parameters to zero (within tolerance).

### Choice of moments to match

|                      | High school |     | Dropouts |     | College |     |
|----------------------|-------------|-----|----------|-----|---------|-----|
| Moments              | Ages        | N   | Ages     | N   | Ages    | N   |
| Work status by age   | 19 - 86     | 67  | 19 - 88  | 70  | 23 - 89 | 64  |
| hours when working   | 19 - 70     | 48  | 19 - 70  | 48  | 23 - 70 | 44  |
| wage when working    | 19 - 70     | 48  | 19 - 70  | 48  | 23 - 70 | 44  |
| variance of wage     | 19 - 70     | 10  | 19 - 70  | 10  | 23 - 70 | 10  |
| skewness of earnings | 19 - 85     | 13  | 19 - 85  | 13  | 23 - 85 | 13  |
| hours = 20           | 19 - 86     | 67  | 19 - 86  | 68  | 23 - 89 | 64  |
| hours = 40           | 19 - 82     | 61  | 19 - 84  | 64  | 23 - 79 | 57  |
| hours = 45           | 19 - 77     | 55  | 19 - 83  | 56  | 23 - 76 | 51  |
| hours = 50           | 19 - 76     | 58  | 19 - 88  | 66  | 23 - 77 | 53  |
| wealth               | 25 - 85     | 13  | 25 - 85  | 13  | 25 - 85 | 13  |
| work to work         | 19 - 70     | 48  | 19 - 70  | 48  | 23 - 70 | 44  |
| nowork to nowork     | 19 - 70     | 48  | 19 - 70  | 48  | 23 - 70 | 44  |
| super                | 65          | 1   | 65       | 1   | 65      | 1   |
| Total                |             | 537 |          | 553 |         | 502 |

# Estimates of the preference parameters

| Parameter      | Description   | Estimate | Std.Err. |
|----------------|---|----------|----------|
| ζ              | CRRA coefficient in consumption                             | 0.79488  | 0.07327  |
| $\gamma_1$     | Disutility of working 1000 hours (20 per week)              | 1.4139   | 0.38508  |
| $\gamma_2$     | Disutility of working 2000 hours (40 per week)              | 2.0088   | 0.59712  |
| $\gamma_3$     | Disutility of working 2250 hours (45 per week)              | 2.9213   | 0.78915  |
| $\gamma_4$     | Disutility of working 2500 hours (50 per week)              | 2.8639   | 0.80946  |
| $\gamma_5$     | Disutility of working 3000 hours (60 per week)              | 3.8775   | 1.05032  |
| $\kappa_1$     | Correction coefficient for low type with disutility of work | 0.50321  | 0.17973  |
| $\kappa_2$     | Quadratic coefficient on age for older workers              | 0.00008  | 0.00004  |
| $\kappa_3$     | Linear coefficient on age for young workers                 | 0.05083  | 0.01554  |
| ξ              | CRRA coefficient in utility of bequest                      | 0.48834  | 0.34766  |
| $b_{scale}$    | Scale multiplicator of the utility of bequest               | 0.68659  | 1.42044  |
| $eta_{\sf cg}$ | Discount factor, college                                    | 0.96963  | 0.00238  |
| $eta_{hs}$     | Discount factor, highschool                                 | 0.96732  | 0.00189  |
| $eta_{dr}$     | Discount factor, dropouts                                   | 0.96806  | 0.00138  |
| $\lambda$      | Scale of EV taste shocks                                    | 0.29950  | 0.08825  |

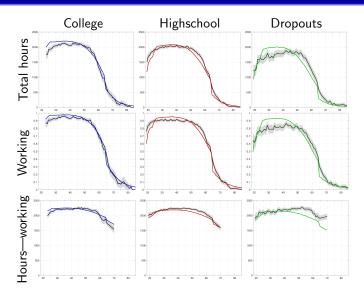
## Human capital accumulation process

| Parameter              | Description                            | Estimate | Std.Err. |
|------------------------|--|----------|----------|
| $\eta_{0, cg}$         | Constant for college                   | 2.78766  | 0.41169  |
| $\eta_{0,hs}$          | Constant for high school               | 2.56761  | 0.36634  |
| $\eta_{0,\mathrm{dr}}$ | Constant for dropouts                  | 2.45647  | 0.33269  |
| $\eta_{0,high}$        | Constant for high type                 | 0.39311  | 0.41893  |
| $\eta_{1,cg}$          | Work experience for college            | 0.03041  | 0.00796  |
| $\eta_{1,hs}$          | Work experience for high school        | 0.02164  | 0.00768  |
| $\eta_{1,dr}$          | Work experience for dropout            | 0.01974  | 0.00682  |
| $\eta_{2,cg}$          | Work experience square for college     | -0.00017 | 0.00021  |
| $\eta_{2,hs}$          | Work experience square for high school | -0.00002 | 0.00018  |
| $\eta_{2,dr}$          | Work experience square for dropout     | 0.00000  | 0.00010  |
| $\eta_3$               | Age (time index)                       | 0.02676  | 0.00280  |
| $\eta_4$               | Age (time index) square                | -0.00076 | 0.00004  |

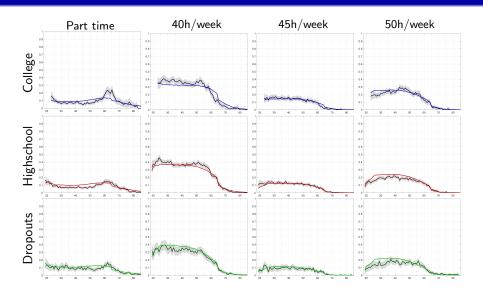
## Estimates of other structural parameters

| Parameter         | Description                                 | Estimate | Std.Err. |
|-------------------|---|----------|----------|
| ς <sub>0</sub>    | St.dev. in shock distribution: constant     | 0.24485  | 0.24055  |
| $\varsigma_1$     | St.dev. in shock distribution: age          | 0.00421  | 0.00935  |
| tr                | Transfer from parents                       | 5.51308  | 1.43804  |
| $ ho_{\sf cg}$    | Superannuation: human capital — college     | 6.30347  | 2.58472  |
| $ ho_{hs}$        | Superannuation: human capital — high school | 5.43473  | 3.30737  |
| $ ho_{dr}$        | Superannuation: human capital — dropouts    | 6.47838  | 3.95647  |
| $\varsigma_{w_0}$ | Initial wealth sigma                        | 1.48960  | 6.69399  |
| $p_{cg}$          | High type proportion — college              | 0.90089  | 0.04952  |
| $p_{hs}$          | High type proportion — high school          | 0.80130  | 0.04366  |
| $p_{\mathrm{dr}}$ | High type proportion — dropout              | 0.69306  | 0.04411  |

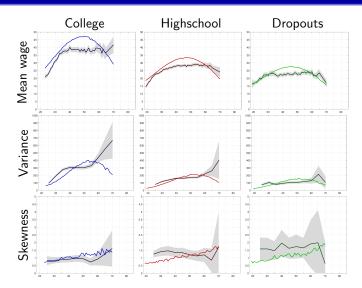
### Goodness of fit: total hours and participation



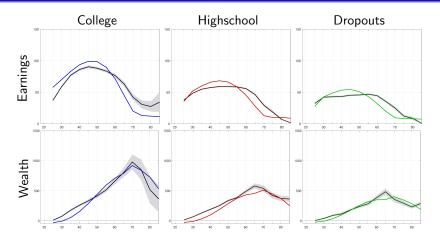
### Goodness of fit: discrete level of hours



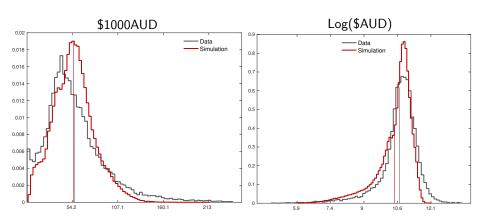
### Goodness of fit: lifecycle wage distribution



### Goodness of fit: earnings and wealth



### Goodness of fit: overall income distribution



# Policy simulations

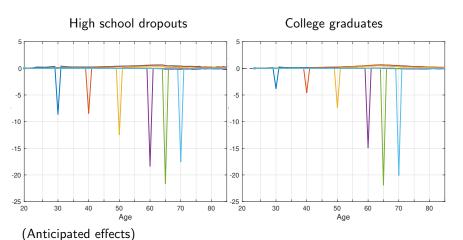
### Policies to be simulated:

- Transitory wage/tax changes
- Permanent wage/tax changes
  - Anticipated and Unanticipated
- Eliminate Age Pension
- Improved Targeting of Age Pension
  - Change income and asset taper rates

We emphasize how labor supply elasticities and policy impacts differ by age and education

### Frisch Elasticities

Transitory 10% wage decrease (tax increase)  $\leadsto$  % change in hours



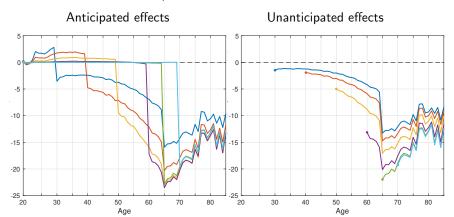
### Frisch elasticities

- Frisch elasticities increase with age:
- For college grads it is 0.4 at age 30 and 2.2 at age 65.
- The increase is greater for the more educated
- Consistent with Imai-Keane (2004) and Keane-Wasi (2016)

# Permanent 10% wage decrease → % change in hours

High school graduates

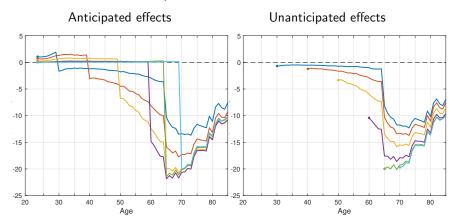
No compensation  $\longrightarrow$  Marshall effects



# Permanent 10% wage decrease → % change in hours

College graduates

No compensation  $\longrightarrow$  Marshall effects



# Permanent 10% wage decrease → hours

- Larger decline in hours if policy is anticipated: labor supply is shifted towards the beginning of life cycle where wage is not yet decreased
- Effect is very different at different points of the life cycle
- Much larger hours decline if wage decrease occurs at older ages
- Elasticities smaller for college grads than HS grads at younger ages
- But catch up at older ages
- Key Point: Effect of HC on labor supply elasticities not changed by hours bunching

# Effects of the age pension

# Simulate the world without Age Pension

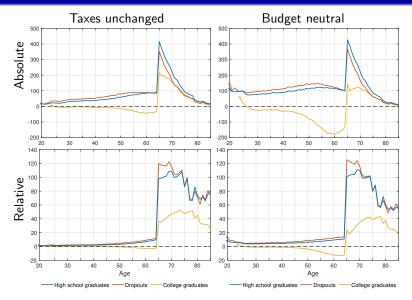
- Cost of program is 1/3 of income tax revenue
- Elimination allows 33% tax cut (if no behavioral response)

## Unchanged taxes vs. Revenue neutral

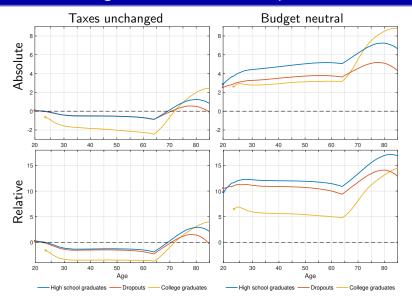
- Elimination of Age Pension generates 5.8% increase in labor supply
- This allows a 37% cut in income tax rates in budget neutral simulation



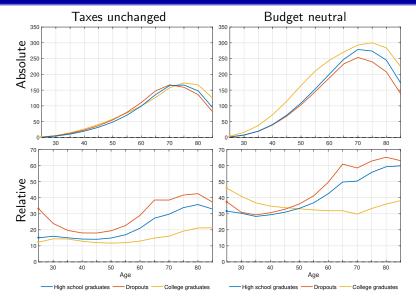
## Elimination of Age Pension → hours



## Elimination of Age Pension → consumption, \$1000 AUD



## Elimination of Age Pension → wealth, \$1000 AUD



# Effects of the age pension

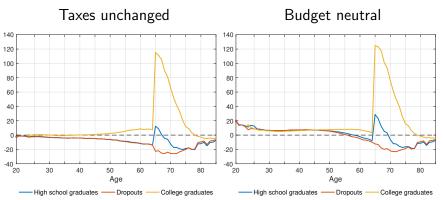
### The world without the age pension (revenue neutral):

- Labor supply increases for dropouts and HS graduates at all ages
- Labor supply decreases for college graduates pre 65 (income effects), but increases greatly at 65+
- Tax rates fall by 37% in budget neutral simulation
- About 90% of workers prefer to live in a world with no age pension and lower taxes
- Only 10% of low skill type individuals experience decrease in welfare
- This result reflects the poor targeting of the Age Pension program and large labor supply distortion it creates

#### The Change in Program Rules that we simulate is:

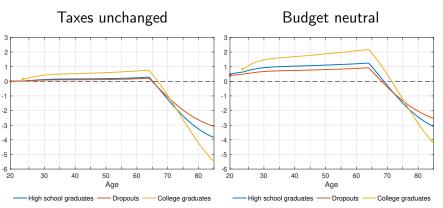
- Double the Income and Asset taper rates.
- Specifically:
  - Double effective income taper rate from 27.7% to 55.5%
  - Double effective asset taper rate from 1/2 cent on the dollar to one cent on the dollar
- In budget neutral simulation we can cut income tax rates by 5.9% i.e., top rate reduced from 37.9% to 35.7%

### Doubling of income/asset tapers → Effects on Hours of Work



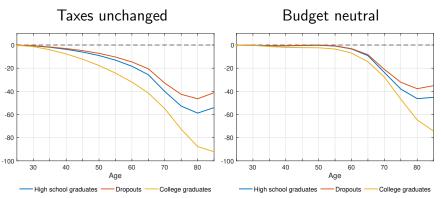
(Note: Change in annual hours)

### Doubling of income/asset tapers → Effects on Consumption



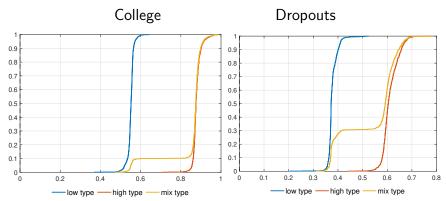
(Note: Change in \$1000 AUD)

### Doubling of income/asset tapers → Effects on Assets



(Note: Change in \$1000 AUD)

### Doubling Tapers + Tax Cut $\rightsquigarrow$ Effects on Utility



(Note: Change in ex-ante utility)

#### Double Taper Rates + Tax cut → Results:

- $\bullet$  At age 65+ labor supply of college grads increases by 20% while that of dropouts falls by 8%
- College grads rely on age pension less while dropouts rely on it more - better targeting
- In budget neutral simulation we cut income tax rates by 5.9% i.e., top rate reduced from 37.9% to 35.7%
  - This causes small increase in labor supply prior to age 65
- All types better off CEVs are \$1.4k, \$1.5k, \$1.7k for dropouts, HS, college types, respectively

#### Results and conclusions

#### Labor supply

- Large variation of labor supply elasticities by age and education:
  - Labor supply elasticities increase with Age
  - Elasticities are smaller for higher education groups

#### Age Pension

- The program has large negative labor supply effects
- The program is expensive (Largest welfare item in budget)
- It is poorly targeted ⇒ Very low effective taper rates
- Doubling of Taper Rates combined with 5.9% tax cut would be Pareto improvement

