### **Subjective Survival Expectations and Annuitization Decisions**

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### Overview

Introduction

Survival Expectations

Model of Annuitization

Estimation

Results

#### Private Pensions and Annuitization

Introduction

- Private defined-contribution (DC) pensions are becoming popular worldwide.
- DC schemes expose retirees to the risk of outliving their savings.
- In the UK. 70% private sector employees hold DC pensions (Cribb et al., 2023).
- Annuities convert pension savings to a regular guaranteed income for life.
- The benchmark model predicts full annuitization is optimal, but annuity uptake remains low worldwide (Davidoff et al., 2005; Pashchenko, 2013; Yaari, 1965).

Model of Annuitization

## Annuity Purchase in the UK

Introduction

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#### Annuity Purchase Rate by Age Group

	63-65	66-69	70-74	75-79	80-84	85-90	All
Number of Observations	120	470	413	239	148	69	1459
Fraction Purchasing Annuity in the Past Year	26.7%	16.8%	17.2%	15.5%	18.2%	14.5%	17.5%

- Sample from the English Longitudinal Study of Ageing (2016, 2018 and 2021)
  - Retirees with available DC savings in 2016
- Low annuitization rate with old-age annuity purchase
  - ⇒ in sharp contrast to Yaari's (1965) benchmark model



Introduction

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- The perceived value of annuities depends critically on subjective length of life.
- Individuals have biased beliefs about longevity (Elder, 2013; Wu et al., 2015).
  - Understate the probability of surviving to younger ages (age 70s)
  - Overstate the probability of surviving to advanced ages (age 85 and beyond)
  - Pessimism dominates
- Survival pessimism is a potential explanation for under-annuitization (O'Dea & Sturrock, 2023).

Model of Annuitization

## Research Questions

Introduction

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1. How do biased survival beliefs distort the timing and magnitude of annuitization?

Model of Annuitization

- 2. What is the welfare cost arising from biased survival beliefs?
- 3. What can be done by the government to mitigate the welfare loss?

## Methodology

Introduction

- Estimate subjective and objective survival models using survey respondents' probabilistic belief elicitation and their actual death records.
- Develop and estimate a dynamic model of annuitization with subjective survival probabilities.
- Conduct counterfactual experiments to study the implications of biased survival beliefs for annuitization decisions and welfare.

## Subjective Survival Expectations

- Sample from the English Longitudinal Study of Ageing (N=1459).
- Question in the survey: What are the chances that you will live to be X or more?

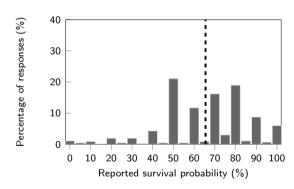
Model of Annuitization

• The target age X depends on the respondent's current age:

Age of the respondent	Target age X		
60-65	75		
66-69	80		
70-74	85		
75-79	90		
80-84	95		
85-89	100		

#### Probabilistic Belief Elicitation

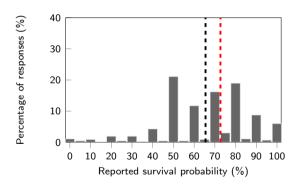
Respondent's age 66-69, target age X = 80



Black dashed lines: average subjective probabilities

#### Probabilistic Belief Flicitation

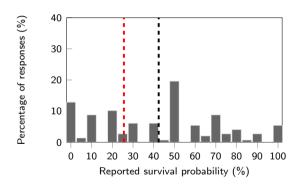
Respondent's age 66-69, target age X = 80



- Black dashed lines: average subjective probabilities
- Red dashed lines: average cohort life table probabilities

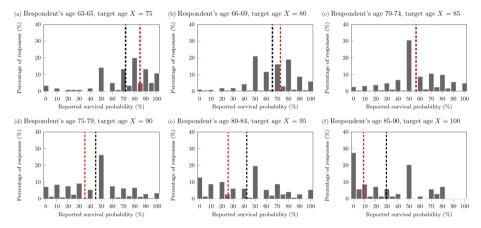
#### Probabilistic Belief Flicitation

Respondent's age 80-84, target age X = 95



- Black dashed lines: average subjective probabilities
- Red dashed lines: average cohort life table probabilities

#### Probabilistic Belief Flicitation



- Black dashed lines: average subjective probabilities
- Red dashed lines: average cohort life table probabilities



## Subjective vs Objective Survival Probabilities

#### Subjective survival probabilities

- Capture individual survival beliefs relevant to decision-making
- Modeled as a function of demographics and an individual random effect
- Estimated using survey respondents' probabilistic belief elicitation

#### Objective survival probabilities

- Capture actual mortality shocks and are relevant only in counterfactual scenarios
- Modeled as a function of the life table, demographics and an individual random effect
- Estimated using survey respondents' actual death records



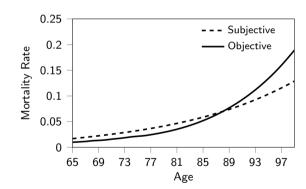
Model Objective



Results

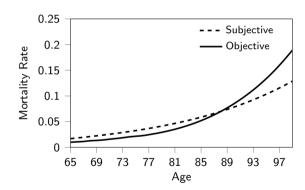
#### Biased Survival Beliefs

#### Retirees with Median Subjective Belief

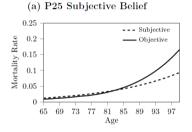


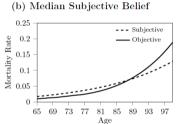
#### Biased Survival Beliefs

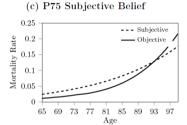
Retirees with Median Subjective Belief



Age 60s and 70s: pessimistic  $\Rightarrow$  80s and beyond: optimistic







Age 60s and 70s: pessimistic  $\Rightarrow$  80s and beyond: optimistic

- Individual retirees derive utility from consumption and leaving bequests.
- Retirees make consumption and annuitization decisions every year.
- ullet Survival probabilities are subjective and heterogeneous across retirees (max age = 100).

Model of Annuitization

• Annuity price depends on annuitant's age and health at purchase.

#### Preferences and Health

- Individuals derive utility from consumption and leaving bequests.
  - Utility from consumption:

$$u(c_{it}) = \frac{c_{it}^{1-\gamma}}{1-\gamma}$$

Utility from leaving bequests depends on assets at death:

$$b(a_{it}) = heta rac{(\kappa + a_{it})^{1-\gamma}}{1-\gamma}$$

• Health status  $h_{it}$  can be either good (0) or bad (1) at each age, and health transitions follow a first-order Markov process.

## Subjective Survival Probabilities

- The subjective probability of surviving to the next period at each age,  $s_{it}$ , depends on age t, health  $h_{it}$ , and an individual survival effect  $\delta_i$ .
- The survival function takes a Gompertz form:

$$s_{it} = e^{-rac{\phi_{it}}{lpha}(e^{lpha(t+1)}-e^{lpha t})}$$

Model of Annuitization

where

$$\phi_{it} = e^{a + bh_{it} + \delta_i}$$

 This is the underlying model that generates the subjective mortality curves introduced previously.

#### Annuities

- One unit of annuity pays one pound every period until death.
- The price of one unit of annuity,  $p_{it}$ , is a function of age and health at purchase.
- Annuity prices are calibrated to the data.
- Equilibrium annuity prices will be calculated in counterfactual cases (will come back to this later).

Model of Annuitization

#### Income and Assets

Annuity accumulation equation:

$$n_{it} = n_{it-1} + \Delta_{it}$$

Model of Annuitization

- n<sub>it</sub>: total annuity income at age t
- $\Delta_{it}$ : the additional annuity income purchased at age t
- Assets accumulation equation:

$$a_{it+1} = (a_{it} + y_i + n_{it} - \Delta_{it}p_{it} - c_{it})(1+r)$$

- $v_i$ : income from public pensions and DB pensions, constant over time
- $a_{it}$ : total assets at age t, with  $a_{it} \geq 0$

#### The Recursive Problem

Value function at age t:

$$\begin{aligned} V_t(a_{it}, n_{it}, h_{it}, \delta_i, y_i) \\ &= \max_{c_{it}, \Delta_{it}} \left\{ u(c_{it}) + \beta s_{it} E_t[V_{t+1}(a_{it+1}, n_{it+1}, h_{it+1}, \delta_i, y_i)] \right. \\ &\left. + \beta (1 - s_{it}) b(a_{it+1}) \right\} \end{aligned}$$

subject to annuity and assets accumulation equations, where

$$E_{t}[V_{t+1}(a_{it+1}, n_{it+1}, h_{it+1}, \delta_{i}, y_{i})] = \sum_{h \in \{0,1\}} Pr(h_{it+1} = h|h_{it}, t) V_{t+1}(a_{it+1}, n_{it+1}, h, \delta_{i}, y_{i})$$

**Fetimation** 

Model of Annuitization

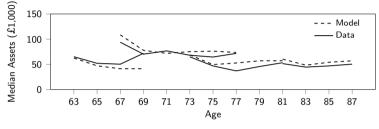
#### First step: estimation outside of the model

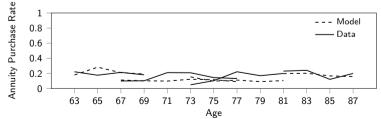
- Health transition matrices
- Subjective survival probabilities
- Annuity prices

## Second step: estimate preference parameters $\Theta = (\beta, \gamma, \theta, \kappa)$

- The Method of Simulated Moments
- Moment conditions: median assets and the fraction of individuals purchasing annuities. by age and birth cohort (38 moments in total)

### Model Fit









## Annuity Price in Counterfactual Cases

• The price of one unit of annuity is a function of age and health:

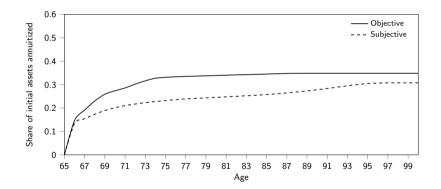
$$p_{it} = \left(1 + au(t, h_{it})
ight)$$
 
$$\sum_{k=t}^{I} \frac{\widehat{S^{an}}(k|t, h_{it})}{(1+r)^{k-t}}$$
 Expected Present Discounted Value

- $\tau(t, h_{it})$ : an annuity load factor
- $\widehat{S^{an}}(k|t,h_{it})$ : the equilibrium annuitant's objective survival probability to age k given age t and health  $h_{it}$  at the time of purchase
- In counterfactual cases,  $\tau(t, h_{it})$  stays unchanged, and a new  $\widehat{S^{an}}(k|t, h_{it})$  is solved through a fixed-point problem.



## Counterfactual: Objective Survival Probabilities

Average cumulative annuitized assets as a percentage of initial assets by different ages



#### Distorted Annuitization

Decision rules -	Share of initial assets annuitized by		
Decision rules	Age 75	Age 85	End of life
Subjective probabilities	23.2%	25.7%	30.8%
Objective probabilities	33.2%	34.5%	34.8%

• Biased survival beliefs reduce annuitization by 4% of retirement-age assets.

#### Distorted Annuitization

Decision rules —	Share of i	nitial assets an	Weighted avg. age of	
	Age 75	Age 85	End of life	annuitization
Subjective probabilities	23.2%	25.7%	30.8%	72.8 years
Objective probabilities	33.2%	34.5%	34.8%	69.6 years

- Biased survival beliefs reduce annuitization by 4% of retirement-age assets.
- Biased survival beliefs delay the average age of annuitization by 3.2 years.

#### The Welfare Cost of Biased Survival Beliefs

- Retirees incur welfare loss due to their decisions deviating from the optimal paths.
- A monetary measure of welfare
  - Assets equivalent: if individuals had based their decisions on objective survival probabilities, how much initial assets they would need to attain the same level of well-being as with subjective survival probabilities and actual initial assets.

Model of Annuitization

Normalized as a percentage of actual initial assets.

#### The Welfare Cost of Biased Survival Beliefs

	Men	Women	All
Mean	98.34%	98.05%	98.22%
25th	97.82%	97.38%	97.62%
Median	99.09%	98.71%	98.89%
75th	99.48%	99.16%	99.36%

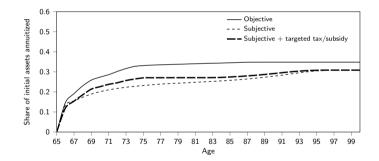
- The average welfare loss is equivalent to 1.8% of retirement-age assets.
- The welfare loss is slightly larger for women.

## Policy Implications: A Quantitative Example

- Subsidize 5% of the premiums for annuity purchases prior to age 75
- Tax by 2% of the premiums for annuity purchases made thereafter

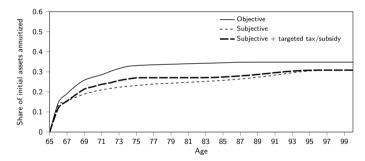
## Policy Implications: A Quantitative Example

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## Policy Implications: A Quantitative Example

- Subsidize 5% of the premiums for annuity purchases prior to age 75
- Tax by 2% of the premiums for annuity purchases made thereafter



- Net costs to the government: -1.28% of total retirement-age assets
- Welfare gains: +1.62% of total retirement-age assets



Results

#### Conclusion

 Retirees typically underestimate their chance of survival during the early years of retirement and overestimate it after their 80s.

Model of Annuitization

- I develop and estimate a dynamic model of annuitization with subjective survival probabilities.
- Counterfactual analysis shows that, on average:
  - Biased survival beliefs reduce annuitized assets by 11.7% and delay the average age of annuitization by 3.2 years.
  - The welfare loss amounts to 1.8% of retirement-age assets.
  - Government subsidies for early annuity purchases by just-retired individuals financed in part by taxing later annuity purchases would improve welfare.

# Thank You for Listening!

## Model of Reporting Survival Beliefs

- Individuals report their subjective probability of surviving to a future target age a
- The subjective probability of surviving to the next period:

$$s_{it} = e^{-rac{\phi_{it}}{lpha}(e^{lpha(t+1)}-e^{lpha t})}$$

where

$$\phi_{it} = e^{a+bh_{it}+\delta_i}$$

• Derive  $S(a|t, h_{it}, \delta_i)$ , the true subjective probability of surviving to a future target age a



## Model of Reporting Survival Beliefs

Self-reported survival probabilities are subject to recall errors:

$$P_{it}^* = S(a|t, h_{it}, \delta_i) + \varepsilon_{it}$$

- $P_{it}^*$ : the recalled subjective survival probability
- $\varepsilon_{it}$ : an i.i.d. recall error
- The latent  $P_{it}^*$  is rounded before being reported. The probability of using a particular rounding rule r is:

$$Pr(R_{it} = r) = Pr(\mu_{r-1} < \delta_i^{rd} + \varepsilon_{it}^{rd} < \mu_r)$$

- $R_{it}$ : a random variable representing rounding rules
- $\mu_r$ :  $\mu_0=-\infty$ ,  $\mu_4=\infty$ , and  $\mu_1,\mu_2,\mu_3$  are model parameters
- $\delta_i^{rd}$ : an unobserved individual rounding effect
- $\varepsilon_{it}^{rd}$ : an i.i.d rounding shock

## Model of Reporting Survival Beliefs

The density function:

$$f(P_{it}|t,h_{it},\delta_i,\delta_i^{rd}) = \sum_{r \in \Omega_{it}} Pr(R_{it} = r|\delta_i^{rd}) * Pr(I_r(P_{it}) \leq P_{it}^* < u_r(P_{it})|t,h_{it},\delta_i)$$

- $P_{it}$ : reported survival probability in the survey
- $\Omega_{it}$ : a set of rounding rules compatible with the reported probability
- $I_r(P_{it})$  and  $u_r(P_{it})$ : lower bound and upper bound of the latent  $P_{it}^*$  given a specific rounding rule r
- Individual effects  $\delta_i$  and  $\delta_i^{rd}$  follow a bivariate normal distribution, and the model is estimated using maximum simulated likelihood



## Model of Objective Survival Probabilities

• The objective mortality rate at age t depends on cohort  $c_i$ , gender  $g_i$ , individual survival effect  $\delta_i$  and age-dependent health status  $h_{it}$ :

$$q_{it}^o = e^{(\psi_0 + \psi_1 h_{it} + \psi_2 \delta_i)} q^{lt}(t, c_i, g_i)$$

where  $q^{lt}(t, c_i, g_i)$  is taken from the cohort life table



## **Annuity Prices**

- The annuity load factor is a linear function of age, health status and their interaction.
- The set of parameters  $\eta$  is estimated according to the following:

$$oldsymbol{\hat{\eta}} = \mathop{\mathsf{argmin}}_{oldsymbol{\eta}} \sum_{(t,h_t) \in \mathbb{V}} \left( p^{ extit{data}}(t,h_t) - \left(1 + au(t,h_t;oldsymbol{\eta})
ight) \sum_{k=t}^T rac{S^{ extit{an}}(k|t,h_t)}{(1+r)^{k-t}} 
ight)^2$$

where  $p^{data}(t, h_t)$  and  $S^{an}(k|t, h_t)$  are taken from the data, and  $\mathbb{V} = \{55, 60, ..., 75\} \times \{0, 1\}$ .

• In counterfactual cases,  $\eta$  stays unchanged, and the new  $S^{an}(k|t,h_t)$  is solved through a fixed-point problem.





## Parameter Estimates

Parameter	Description	Estimate	S.E.
$\beta$	Time discount factor	0.962	0.004
$\gamma$	Coeff. of relative risk aversion	2.050	0.017
heta	Marginal prop. to bequeath	0.847	0.004
$\kappa$	Asset threshold for bequest	749.2	25.1



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