## The Inequality of Lifetime Pension

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**SUDA** 

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## Inequality & population aging

- Inequality research focuses on the working ages
- Older people are not homogeneous
- Less know about inequality in pension income, the major source of income in later life
- Prior work
  - Yearly old-age income
  - Net pension wealth
    - Based on pension plans
    - Strong assumptions on mortality

## The present study

- Most prior studies use a cross-sectional approach
  - Living standards & consumption ability
- We take a cohort approach: Lifetime pension
  - From retirement onset to death
  - Individual experience over the life course
  - How pension systems distribute incomes across members of the same generation?



Individual-level lifetime pensions are determined by lifespan and pre-retirement earnings.

Population-level lifetime pension inequality is determined by the inequalities in lifespan and pre-retirement earnings.

### Between- vs. within-group inequalities

Between-group inequality compares the averages of groups.

- One average, men in the top 20% earn 4 million SEK more than men in the bottom 20% (Shi & Kolk 2021).

Within-group inequality measures the variation across individuals.

- The majority of variation is within-group.

We focus on individual-level inequality in lifetime pension.

Swedish registrations covering the entire population

1918–1939 cohorts, born in Sweden, never migrated after age 50

**Lifetime pension**: accumulated annual pension incomes from age 65 to death. Inflation adjusted. All kinds of pension payments. Bottom coded as 3,000 SEK.

**Earnings**: average yearly earnings over ages 50–59, inflation adjusted. Bottom coded as 3,000 SEK.

Lifespan: Observed age at death + simulated age at death

Control variables: occupation, education, civil status, urban residence

## Simulating of age at death

**Gompertz** relationship:  $log(m(a)) = \alpha + \beta a$ 

#### Step 1: Estimation

Predictors: age, earnings (quintile), cohort, age \* earnings, age \* cohort

- Step 2: Prediction
- Step 3: Adjustment

Mortality forecasts (Statistics Sweden)

Step 4: Simulation

For individuals who survived to 2019



How large is lifetime pension inequality? The Lorenz curve and the Gini coefficient

$$G = \frac{A}{A+B} = 2A$$

 $(A+B=\frac{1}{2})$ 

**Individual-level interpretation** 

Average difference between any two random individuals with respect to the mean



Cumulative share of people from lowest to highest incomes

## How large is lifetime pension inequality?

The Lorenz curve and the Gini coefficient

$$G = \frac{A}{A+B} = 2A$$
$$(A+B=\frac{1}{2})$$

**Individual-level interpretation** 

Average difference between any two random individuals with respect to the mean



# How has lifetime pension inequality changed across cohorts?



What contributed more to cohort changes in lifetime pension inequality?

## **Standardization** (Reweighting)

E.g., what if lifespan/earnings distribution has remained constant since 1918?

1. Apply weights to individuals in population B (later cohort) so that the density of earnings of population B becomes the same as that of population A (earlier cohort).

 $Weight = \frac{density in A}{density in B}$ 

2. Recalculate inequality

#### Standardization based on lifespan distributions



#### Standardization based on earnings distributions



#### Shortcomings:

(1) Only considers
compositional changes in
the independent variable
(2) Not controlling for
other covariates

What explains more inequality for a given cohort?

The partial R<sup>2</sup> to detect relative importance of predictors

The proportion of the variance not explained by other control variables but explained by the main predicting variable *K* 

Partial 
$$R^2 = \frac{R^2 - R_{-K}^2}{1 - R_{-K}^2}$$

- $R^2$ : variance explained by all covariates in the full model
- $R^2_{-K}$ : variance explained by all covariates in the model where variable *K* is removed.

## Partial $R^2$



#### Shortcomings

- (1) Not a usual inequality index for income
- (2) Only tells the relative importance, but not actual contributions, which are more relevant to public policy
- (3) Partial R<sup>2</sup> may drift in either direction on occasions when the covariate actually leads to an increase in total inequality (Zhou 2014)

## Decomposing the Gini coefficient

(Wagstaff, van Doorslaer, and Watanabe, 2003)

An alternative way of calculating Gini:

$$G = \frac{2}{n\mu} \sum_{i=1}^{n} y_i R_i - 1$$
 (1)

Regressing Y on predicting variables:

$$y_i = \alpha + \sum_k \beta_k x_{ki} + \epsilon_i$$
 (2)

Substituting Eq. (2) into Eq (1):

$$G = \sum_{k} \left( \frac{\beta_k \bar{x}_k}{\mu} \right) C_k + \frac{GC\epsilon}{\mu} \quad (3)$$

Contribution Contribution of variable *k* of residuals

## Decomposition



## What is more important for changes across cohorts?

#### Changes between 1918 and 1939

	Fem	ales	Males		
	Contribution	Percentage	Contribution	Percentage	
Lifespan	-0.022	44.2%	-0.063	191.9%	
Earnings	-0.025	49.5%	0.025	-76.1%	
Education	0.002	-3.3%	0.003	-9.7%	
Occupation	-0.008	15.1%	-0.009	27.3%	
Civil status	0.002	-4.7%	0.000	0.8%	
Urban residence	-0.001	2.6%	0.000	1.4%	
Residual	0.002	-3.5%	0.012	-35.5%	
Total	-0.050	100.0%	-0.033	100.0%	

## Summary

- Lifetime pension is more unequal than yearly labor earnings and yearly pension income.
- Within cohorts, variation in lifetime pension is mainly explained by variation in lifespan, and the share is relatively stable across cohorts.
- Across cohorts, lifespan inequality declined over time.
  - For women, this was driven by changes in both lifespan and earnings.
  - For men, lifespan offset the opposite effects of earnings, and is the most important factor
  - Changes in occupational structure also played an important role

	Mean pension at age 80 (1000 SEK)		average % change in income for an individual						
			1 year later		5 year later		10 year later		
	Mean	SD	Mean	SD	Mean	SD	Mean	SD	
Men									
Bottom 20%	125.49	25.13	-0.84	10.67	0.60	6.58	1.52	6.28	
Second 20%	170.52	6.99	0.40	1.74	0.49	5.12	0.35	5.93	
Third 20%	195.05	7.55	0.33	1.75	0.28	3.99	0.10	5.50	
Fourth 20%	228.69	12.31	0.06	2.26	-0.24	5.00	-0.46	6.74	
Top 20%	338.06	145.77	-0.57	4.50	-1.25	7.65	-1.56	9.46	
Total	211.67	97.87	-0.12	5.40	-0.06	5.88	-0.15	7.18	
Women									
Bottom 20%	73.35	10.63	-0.56	68.85	-0.90	12.20	0.72	20.90	
Second 20%	93.80	4.18	-0.55	6.68	-1.97	27.09	-1.99	33.98	
Third 20%	112.12	6.98	-0.06	8.95	-0.26	16.92	0.04	14.86	
Fourth 20%	142.55	10.83	0.06	4.64	0.13	11.20	0.99	16.93	
Top 20%	209.30	61.53	-0.31	4.26	-0.73	19.35	-0.46	11.20	
Total	126.55	55.11	-0.28	30.11	-0.76	18.56	-0.20	21.23	

## Life expectancy and lifespan inequality







