

# Intergenerational Wealth Formation Over the Life-Cycle: Evidence from Danish Wealth Records 1984-2013

Simon Halphen Boserup  
University of Copenhagen

Wojciech Kopczuk  
Columbia University

Claus Thustrup Kreiner  
University of Copenhagen

# Wealth and income mobility in Denmark...

**Our data:** Danish administrative wealth records, linking generations, observed for the full population from 1984-2013

# Wealth and income mobility in Denmark...

**Our data:** Danish administrative wealth records, linking generations, observed for the full population from 1984-2013

- ...in cross-section
  - Robust, nearly linear relationship. Wealth rank correlation of **0.27**
  - Larger than permanent income correlation of **0.20**
  - Similar findings using other transformations of income and wealth

# Wealth and income mobility in Denmark...

**Our data:** Danish administrative wealth records, linking generations, observed for the full population from 1984-2013

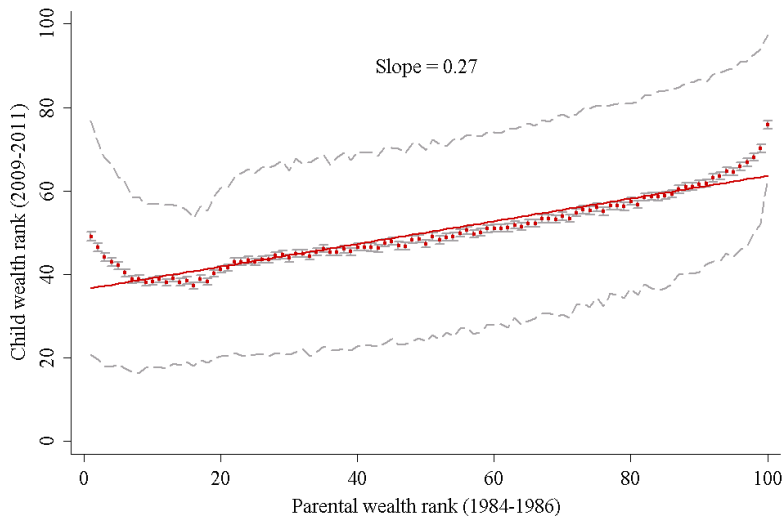
- ...in cross-section
  - Robust, nearly linear relationship. Wealth rank correlation of **0.27**
  - Larger than permanent income correlation of **0.20**
  - Similar findings using other transformations of income and wealth
- ...over the life-cycle
  - U-shaped pattern of wealth correlation
  - Large (**0.35**) at age 20
  - Declining (to **0.17**) until early 30s
  - Then increasing (to **0.27**) in the 40s

# Wealth and income mobility in Denmark...

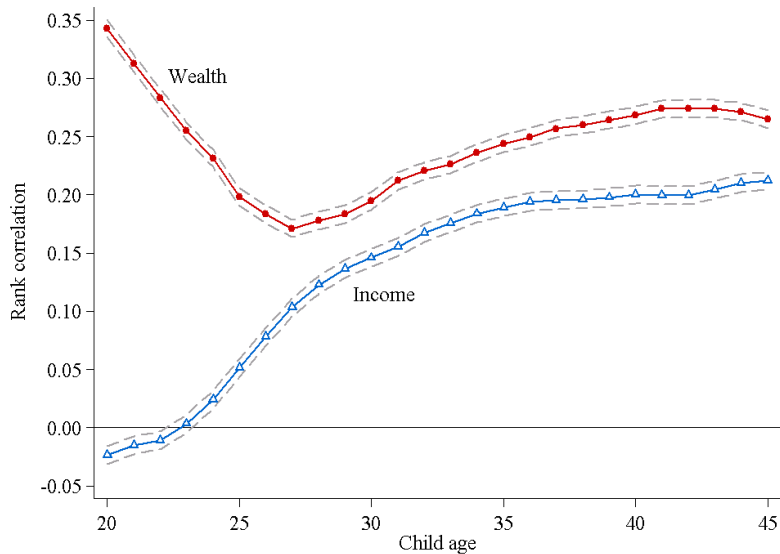
**Our data:** Danish administrative wealth records, linking generations, observed for the full population from 1984-2013

- ...in cross-section
  - Robust, nearly linear relationship. Wealth rank correlation of **0.27**
  - Larger than permanent income correlation of **0.20**
  - Similar findings using other transformations of income and wealth
- ...over the life-cycle
  - U-shaped pattern of wealth correlation
  - Large (**0.35**) at age 20
  - Declining (to **0.17**) until early 30s
  - Then increasing (to **0.27**) in the 40s
- ...after bequests
  - Bequests quantitatively important (1/3 of average wealth on impact)
  - Wealth correlation increases on impact to **0.37**

# Correlation of wealth rank of parents and children



# Wealth and income correlation over life-cycle



# What is the “right” number?

Wealth at a point time is a *fraction* of **lifetime resources**: not all income and transfers yet received, some consumption has already happened.

Income is one component of lifetime resources, transfers are another.

We propose a simple **theoretical framework** that clarifies the relationship between measures of mobility in terms of wealth, income and lifetime-resources



# Lifetime resources

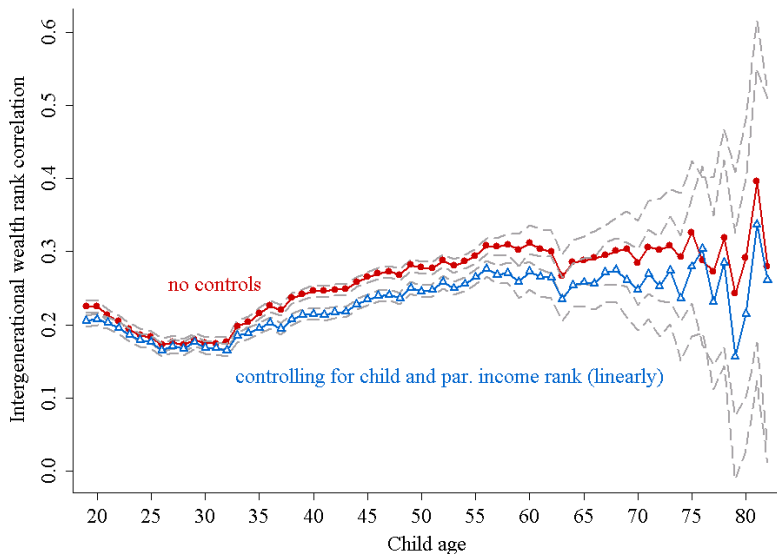
Why lifetime resources: measure of **consumption opportunities**

Correlation of **lifetime resources** may be inferred by (appropriately) estimating wealth correlation when parents and children are **at the same stage of their life-cycles**

We can estimate it in a way consistent with theory when both parents and children are in their **40s** and majority (80%) before bequests: our preferred estimate is **0.25**

We can also estimate this relationship at other ages, though with more empirical issues, and obtain similar results

# Wealth correlation holding parents' and children's age the same



# Lifetime resources: the role of bequests

Why not measure it *after* bequests? Data limitation: we can't observe wealth after bequests for both parents and children (we don't know when grandparents die).

# Lifetime resources: the role of bequests

Why not measure it *after* bequests? Data limitation: we can't observe wealth after bequests for both parents and children (we don't know when grandparents die).

Theory: Correlation of wealth when both parents and children are **at the same stage of their life-cycles** should be **the same at any stage** including pre- and post-bequests.

# Lifetime resources: the role of bequests

Why not measure it *after* bequests? Data limitation: we can't observe wealth after bequests for both parents and children (we don't know when grandparents die).

Theory: Correlation of wealth when both parents and children are **at the same stage of their life-cycles** should be **the same at any stage** including pre- and post-bequests.

How can correlation of **0.25** be reconciled with large post- bequest increase in correlation: bequests are **large relative to wealth** at a point time but they are a **much smaller share of total lifetime resources**

# Lifetime resources: the role of bequests

Why not measure it *after* bequests? Data limitation: we can't observe wealth after bequests for both parents and children (we don't know when grandparents die).

Theory: Correlation of wealth when both parents and children are **at the same stage of their life-cycles** should be **the same at any stage** including pre- and post-bequests.

How can correlation of **0.25** be reconciled with large post- bequest increase in correlation: bequests are **large relative to wealth** at a point time but they are a **much smaller share of total lifetime resources**

What lifetime resources potentially miss: flow of non-consumption benefits from wealth (control, economic power, political influence)

# Wealth information

- Denmark had a wealth tax until 1996
- Since then, asset information used for tax enforcement (cross-checking of wealth changes and income)
- Major categories of assets third party reported by banks, financial institutions, government agencies — deposits, stocks, bonds, value of property, debts and liabilities of many different kinds
- Property value assessed based on detailed information about property and also used for taxation of imputed rent on property
- Assets and debts of non-corporate firms
- Major categories not included: pensions throughout; after 1996: corporate non-publicly traded assets, cars, cash. Anything else that is concealed from tax authorities
- Data break in 1996 (more categories self-reported up until that point, third party reporting increased) but overlap allows to check for consistency

# Sample and timing

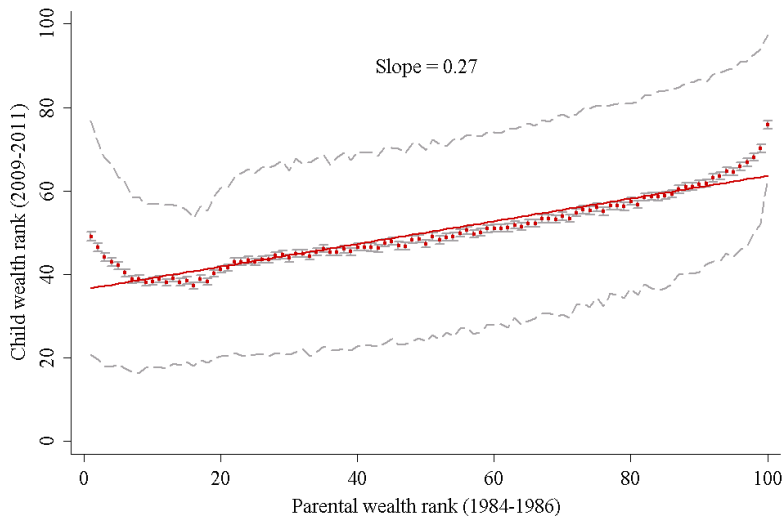
- Parents and children can be linked for children born after 1960 (before 1960 the link is incomplete)
- Wealth observed for 1984-2013
- Main analysis:
  - children who are 45-50 in 2010
  - both parents alive in 1986
  - children's wealth and income measured as average over 2009-2011, parental wealth and income as average over 1984-1986.
- Life-cycle patterns and sensitivity analysis using measurement in other years,
- For bequest analysis: children with one living parent in 2009, compare those with parent who did vs did not die in 2010.
- **Wealth ranking**: Ranks from 0-100 within each age cohort



## Summary statistics — baseline sample

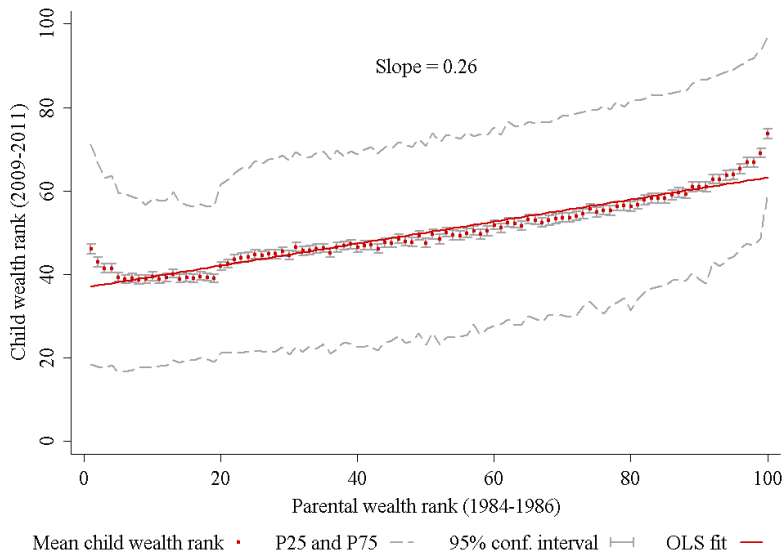
	Children		Parents	
	Mean	SD	Mean	SD
Age	47.2	1.7	47.9	5.1
Income	372,700	344,491	365,804	343,859
Value of assets	1,468,104	4,222,321	1,399,431	3,397,146
Value of liabilities	960,840	2,793,953	757,098	2,325,781
Net wealth	507,264	2,510,350	642,333	2,267,429
Percentiles of wealth				
20th	-132,788		0	
40th	32,386		21,114	
60th	330,869		351,527	
80th	849,631		1,212,174	
Share men	0.51		0.49	
Share married	0.63		0.88	
Share self-employed	0.07		0.17	
Observations	363,857		727,714	

# Correlation of wealth rank of parents and children

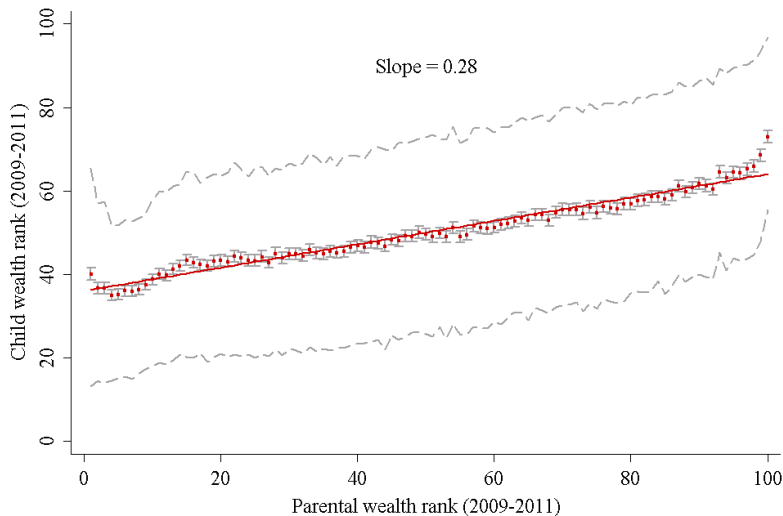


Mean child wealth rank • P25 and P75 - - 95% conf. interval — OLS fit —

# Wealth rank correlation — no self-employed

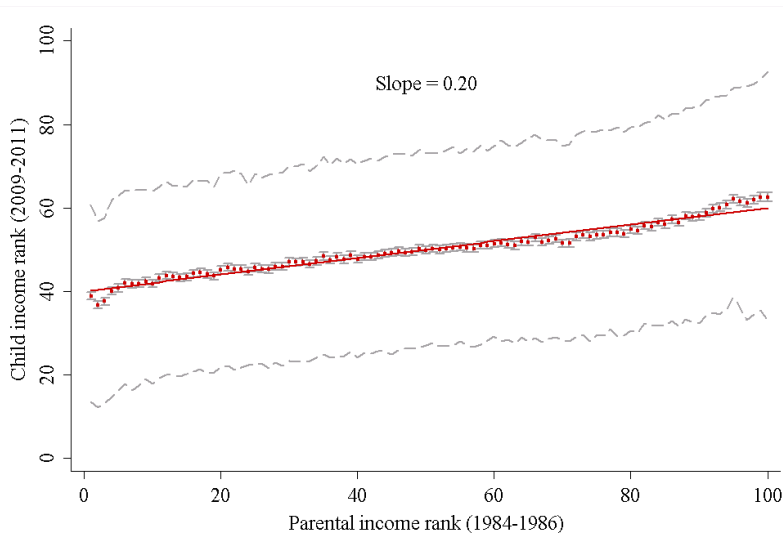


# Wealth rank correlation — parents in 2009-2011



Mean child wealth rank • P25 and P75 -- 95% conf. interval — OLS fit —

# Correlation of income rank of parents and children



# Wealth mobility — estimates

	Child wealth				
	(1)	(2)	(3)	(4)	(5)
	Baseline	Parents alive in 2011	Parental wealth 1997-1999	Age controls	Par. alive, 1997-1999, age controls
<i>A. Rank transformation</i>					
Parental wealth	0.272 (0.002)	0.250 (0.002)	0.305 (0.002)	0.260 (0.002)	0.269 (0.003)
Observations	363,857	157,314	271,600	363,857	156,297
<i>B. Log transformation</i>					
Parental wealth	0.238 (0.003)	0.236 (0.004)	0.256 (0.003)	0.231 (0.003)	0.248 (0.004)
Observations	207,266	92,054	162,444	207,266	94,750
<i>C. IHS transformation</i>					
Parental wealth	0.215 (0.002)	0.191 (0.004)	0.284 (0.003)	0.194 (0.002)	0.230 (0.004)
Observations	363,857	157,314	271,600	363,857	156,297

# What is the “right” number? Framework.

Lifetime resources  $R_g$

$$R_g = Q_{g-1} + Y_g$$

where  $Q_{g-1}$  are lifetime transfers from parents and  $Y_g$  is lifetime income

$$Q_{g-1} = q_{g-1} + b_{g-1}$$

where  $q_{g-1}$  are inter-vivos gifts and  $b_{g-1}$  are bequests.

Lifetime income

$$Y_g = e_{g-1} + u_g$$

where  $e_{g-1}$  is parental investment in human capital of a child

# Intergenerational linkages

Two general channels: transfers and human capital investment

$$Q_{g-1} = \alpha_Q \cdot R_{g-1} \qquad e_{g-1} = \alpha_e \cdot R_{g-1}$$

$\alpha_e$  and  $\alpha_Q$  reduced form, but can micro-founded using  
Cobb-Douglas preferences with joy-of-giving motive

$$\frac{1-\alpha_e-\alpha_Q}{T} \sum_{i=1}^T \ln(C) + \alpha_e \ln(e) + \alpha_Q \ln(Q)$$



# Intergenerational linkages

Two general channels: transfers and human capital investment

$$Q_{g-1} = \alpha_Q \cdot R_{g-1} \qquad e_{g-1} = \alpha_e \cdot R_{g-1}$$

$\alpha_e$  and  $\alpha_Q$  reduced form, but can micro-founded using Cobb-Douglas preferences with joy-of-giving motive

$$\frac{1-\alpha_e-\alpha_Q}{T} \sum_{i=1}^T \ln(C) + \alpha_e \ln(e) + \alpha_Q \ln(Q)$$

Then,

$$R_g = Y_g + Q_{g-1} = e_{g-1} + Q_{g-1} + u_g = (\alpha_e + \alpha_Q) \cdot R_{g-1} + u_g$$

Intergenerational relationship of lifetime resources is measured by

$$\beta_R = \alpha_e + \alpha_Q$$

This is our parameter of interest

$$\begin{aligned}Y_g &= \alpha_e \cdot R_{g-1} + u_g \\Y_{g-1} &= \alpha_e \cdot R_{g-2} + u_{g-1} \\R_{g-1} &= (\alpha_e + \alpha_Q) \cdot R_{g-2} + u_{g-1}\end{aligned}$$

implies that

$$Y_g = (\alpha_e + \alpha_Q) \cdot Y_{g-1} - \alpha_Q \cdot u_{g-1} + u_g$$

In the presence of transfers ( $\alpha_Q \neq 0$ ), permanent income mobility underestimates lifetime resources mobility ( $\alpha_e + \alpha_Q$ ).

# Wealth mobility

One needs to specify when wealth is measured.

# Wealth mobility

One needs to specify when wealth is measured.

Notation: by age  $t$ , the person will have

- received fraction  $\rho^t$  of lifetime income
- received fraction  $\gamma^t$  of lifetime transfers (both inter-vivo and bequests)
- spent fraction  $\zeta^t$  of lifetime resources (on consumption, human capital investments, gifts and bequests)

Wealth at time  $t$ :

$$w_g^t = \rho^t Y_g + \gamma^t Q_{g-1} - \zeta^t R_g$$

so that

$$w_g^t = ((\gamma^t - \zeta^t)\alpha_Q + (\rho^t - \zeta^t)\alpha_e) \cdot R_{g-1} + (\rho^t - \zeta^t)u_g$$

## Wealth mobility (continued)

Analogous to the case of income except for age dynamics

Relationship between child's wealth at  $t$  and parental wealth at  $s$ :

$$w_g^t = (\alpha_e + \alpha_Q) \cdot \zeta_t^s \cdot w_{g-1}^s - v_t^s \cdot u_{g-1} + (\rho^t - \zeta^t) \cdot u_g$$

where

$$\zeta_t^s \equiv \frac{(\gamma^t - \zeta^t)\alpha_Q + (\rho^t - \zeta^t)\alpha_e}{(\gamma^s - \zeta^s)\alpha_Q + (\rho^s - \zeta^s)\alpha_e}$$

and

$$v_t^s \equiv \gamma^t \alpha_Q + \rho^t \alpha_e - \zeta^t (\alpha_e + \alpha_Q) (\rho^s - \zeta^s)$$

## Wealth mobility (continued)

Analogous to the case of income except for age dynamics

Relationship between child's wealth at  $t$  and parental wealth at  $s$ :

$$w_g^t = (\alpha_e + \alpha_Q) \cdot \zeta_t^s \cdot w_{g-1}^s - \nu_t^s \cdot u_{g-1} + (\rho^t - \zeta^t) \cdot u_g$$

where

$$\zeta_t^s \equiv \frac{(\gamma^t - \zeta^t)\alpha_Q + (\rho^t - \zeta^t)\alpha_e}{(\gamma^s - \zeta^s)\alpha_Q + (\rho^s - \zeta^s)\alpha_e}$$

and

$$\nu_t^s \equiv \gamma^t \alpha_Q + \rho^t \alpha_e - \zeta^t (\alpha_e + \alpha_Q) (\rho^s - \zeta^s)$$

Wealth mobility measured at child's age  $t$  and parent's age  $s$  is:

- Different than  $\alpha_e + \alpha_Q$  because of the  $\zeta_t^s$  term
- Biased if  $\nu_t^s \cdot u_{g-1}$  not dealt with

# Addressing the bias

In order to obtain estimate the coefficient on  $w_{g-1}$  (i.e.  $(\alpha_e + \alpha_Q)\zeta_t^s$ ) we need to deal with the presence of  $v_t^s u_{g-1}$

Recall that  $Y_g = (\alpha_e + \alpha_Q)Y_{g-1} - \alpha_Q u_{g-1} + u_g$ , solve for  $u_{g-1}$ , substitute for it in terms of  $Y_g$ ,  $Y_{g-1}$  and  $u_g$  to obtain

$$w_g^t = (\alpha_e + \alpha_Q) \cdot \zeta_t^s \cdot w_{g-1}^s - \frac{v_t^s}{\alpha_Q} \cdot Y_{g-1} - v_t^s \frac{\alpha_Q + \alpha_e}{\alpha_Q} \cdot Y_g + (\rho^t - \zeta^t - \frac{v_t^s}{\alpha_Q}) \cdot u_g$$

# Addressing the bias

In order to obtain estimate the coefficient on  $w_{g-1}$  (i.e.  $(\alpha_e + \alpha_Q)\zeta_t^s$ ) we need to deal with the presence of  $v_t^s u_{g-1}$

Recall that  $Y_g = (\alpha_e + \alpha_Q)Y_{g-1} - \alpha_Q u_{g-1} + u_g$ , solve for  $u_{g-1}$ , substitute for it in terms of  $Y_g$ ,  $Y_{g-1}$  and  $u_g$  to obtain

$$w_g^t = (\alpha_e + \alpha_Q) \cdot \zeta_t^s \cdot w_{g-1}^s - \frac{v_t^s}{\alpha_Q} \cdot Y_{g-1} - v_t^s \frac{\alpha_Q + \alpha_e}{\alpha_Q} \cdot Y_g + (\rho^t - \zeta^t - \frac{v_t^s}{\alpha_Q}) \cdot u_g$$

Addressing the bias: estimate intergenerational mobility while controlling for permanent income of parents and children



# Life-cycle dynamics of wealth mobility

$$\zeta_t^s = \frac{(\gamma^t - \zeta^t)\alpha_Q + (\rho^t - \zeta^t)\alpha_e}{(\gamma^s - \zeta^s)\alpha_Q + (\rho^s - \zeta^s)\alpha_e}$$

Intuition: the exact relationship to parental resources varies over the life-cycle

# Life-cycle dynamics of wealth mobility

$$\zeta_t^s = \frac{(\gamma^t - \zeta^t)\alpha_Q + (\rho^t - \zeta^t)\alpha_e}{(\gamma^s - \zeta^s)\alpha_Q + (\rho^s - \zeta^s)\alpha_e}$$

Intuition: the exact relationship to parental resources varies over the life-cycle

Observations:

- When  $\zeta_t^s = 1$ , we will recover  $\alpha_e + \alpha_Q$

# Life-cycle dynamics of wealth mobility

$$\zeta_t^s = \frac{(\gamma^t - \zeta^t)\alpha_Q + (\rho^t - \zeta^t)\alpha_e}{(\gamma^s - \zeta^s)\alpha_Q + (\rho^s - \zeta^s)\alpha_e}$$

Intuition: the exact relationship to parental resources varies over the life-cycle

Observations:

- When  $\zeta_t^s = 1$ , we will recover  $\alpha_e + \alpha_Q$
- $\zeta_t^s = 1$  when  $t = s$ . More generally: the same stage of life-cycle.

# Life-cycle dynamics of wealth mobility

$$\zeta_t^s = \frac{(\gamma^t - \zeta^t)\alpha_Q + (\rho^t - \zeta^t)\alpha_e}{(\gamma^s - \zeta^s)\alpha_Q + (\rho^s - \zeta^s)\alpha_e}$$

Intuition: the exact relationship to parental resources varies over the life-cycle

Observations:

- When  $\zeta_t^s = 1$ , we will recover  $\alpha_e + \alpha_Q$
- $\zeta_t^s = 1$  when  $t = s$ . More generally: the same stage of life-cycle.
- Bequests:  $\gamma^t \uparrow$  discretely at time  $t$ . Holding parent's measurement constant, interpretation depends on whether parents themselves are observed before or after receiving bequests.

# Life-cycle dynamics of wealth mobility

$$\zeta_t^s = \frac{(\gamma^t - \zeta^t)\alpha_Q + (\rho^t - \zeta^t)\alpha_e}{(\gamma^s - \zeta^s)\alpha_Q + (\rho^s - \zeta^s)\alpha_e}$$

Intuition: the exact relationship to parental resources varies over the life-cycle

Observations:

- When  $\zeta_t^s = 1$ , we will recover  $\alpha_e + \alpha_Q$
- $\zeta_t^s = 1$  when  $t = s$ . More generally: the same stage of life-cycle.
- Bequests:  $\gamma^t \uparrow$  discretely at time  $t$ . Holding parent's measurement constant, interpretation depends on whether parents themselves are observed before or after receiving bequests.
- No inter-vivos gifts  $\gamma^t = 0$ :  $\zeta_t^s < 0$  early on

# Life-cycle dynamics of wealth mobility

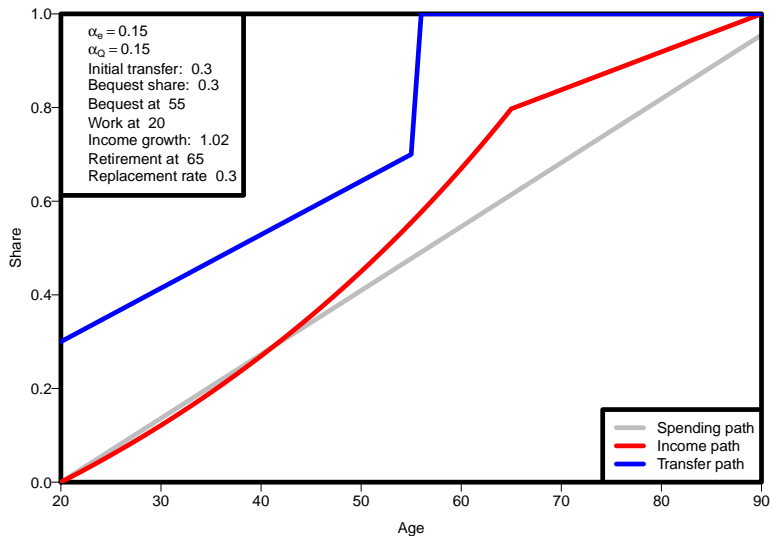
$$\zeta_t^s = \frac{(\gamma^t - \zeta^t)\alpha_Q + (\rho^t - \zeta^t)\alpha_e}{(\gamma^s - \zeta^s)\alpha_Q + (\rho^s - \zeta^s)\alpha_e}$$

Intuition: the exact relationship to parental resources varies over the life-cycle

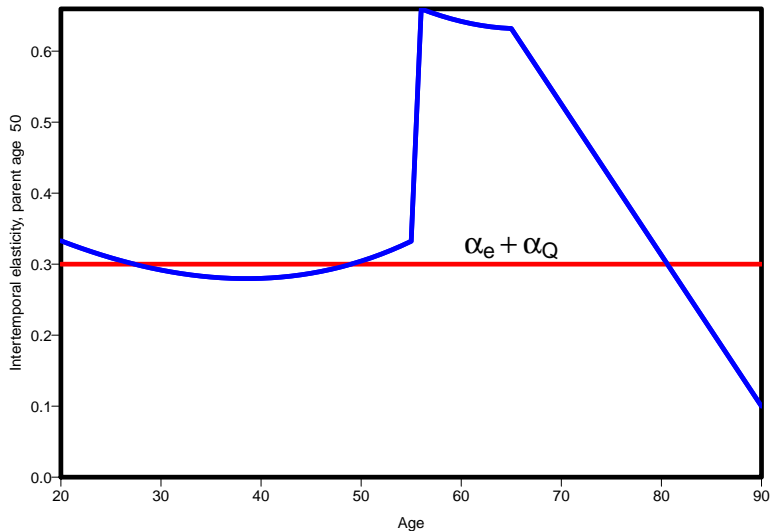
Observations:

- When  $\zeta_t^s = 1$ , we will recover  $\alpha_e + \alpha_Q$
- $\zeta_t^s = 1$  when  $t = s$ . More generally: the same stage of life-cycle.
- Bequests:  $\gamma^t \uparrow$  discretely at time  $t$ . Holding parent's measurement constant, interpretation depends on whether parents themselves are observed before or after receiving bequests.
- No inter-vivos gifts  $\gamma^t = 0$ :  $\zeta_t^s < 0$  early on
- Life-cycle dynamics: hold  $s$  constant, vary  $t$

# Intergenerationality mobility over life-cycle — illustration

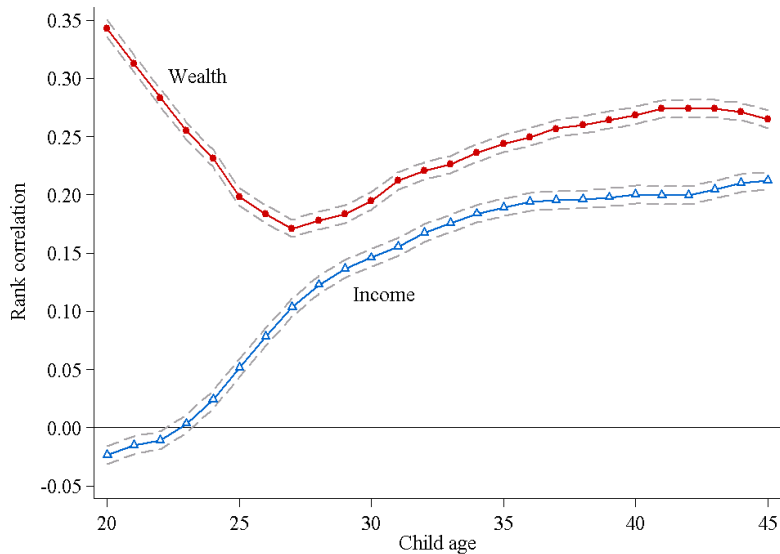


# Intergenerational mobility over life-cycle — illustration

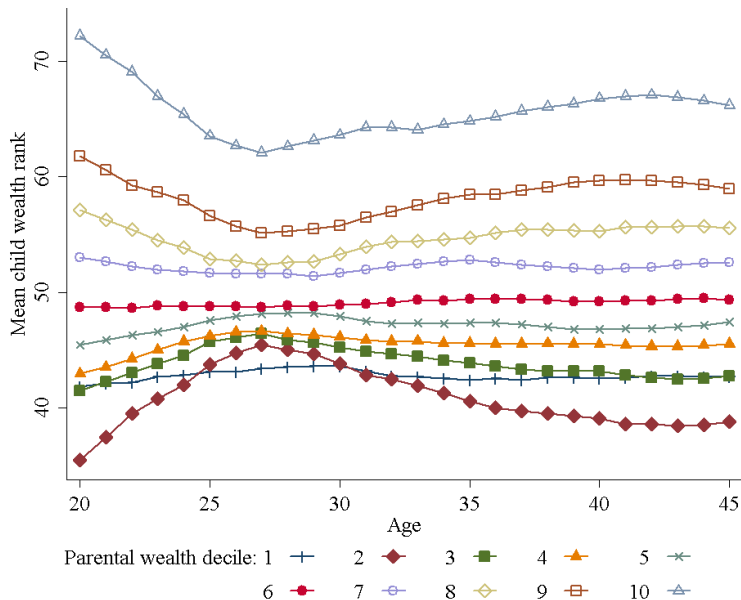




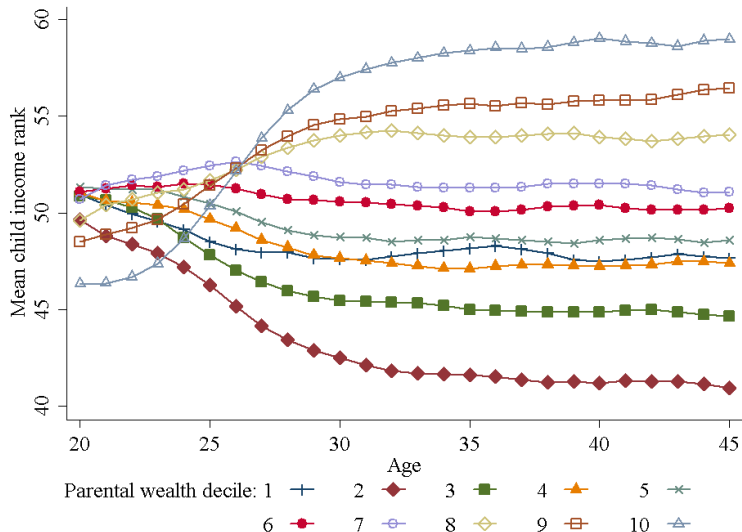
# Wealth and income correlation over life-cycle



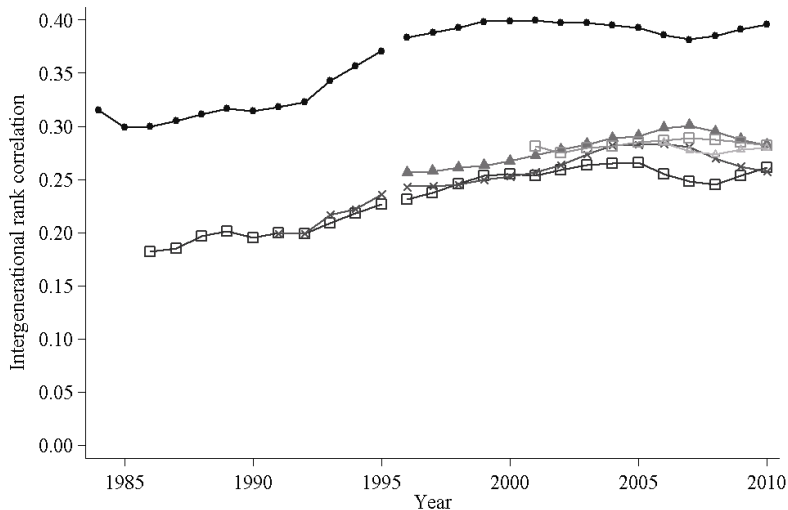
# Wealth correlation over life-cycle by parental wealth decile



# Income correlation over life-cycle by parental wealth decile



# Wealth correlation over life-cycle — over time



Age groups: 18-25 ● 26-30 ◻ 31-35 \* 36-40 ▲ 41-45 ◻ 46-51 ▲

# Summary statistics — bequest sample

	Children (2007–2009)		Parents (1984–1986)	
	Control group	Treatment group	Control group	Treatment group
Mean wealth	650,980	587,172	576,116	558,412
20th percentile	-92,882	-95,734	8,561	8,866
40th percentile	73,392	52,949	247,371	234,737
60th percentile	454,867	414,489	540,218	526,611
80th percentile	1,041,054	992,703	921,644	924,750
Mean income	346,836	335,738	297,496	251,436
20th percentile	204,846	188,503	156,135	89,420
40th percentile	294,833	289,118	243,481	193,533
60th percentile	357,507	350,909	323,777	279,595
80th percentile	450,467	440,436	411,161	378,062
Observations	135,335	5,708	135,335	5,708

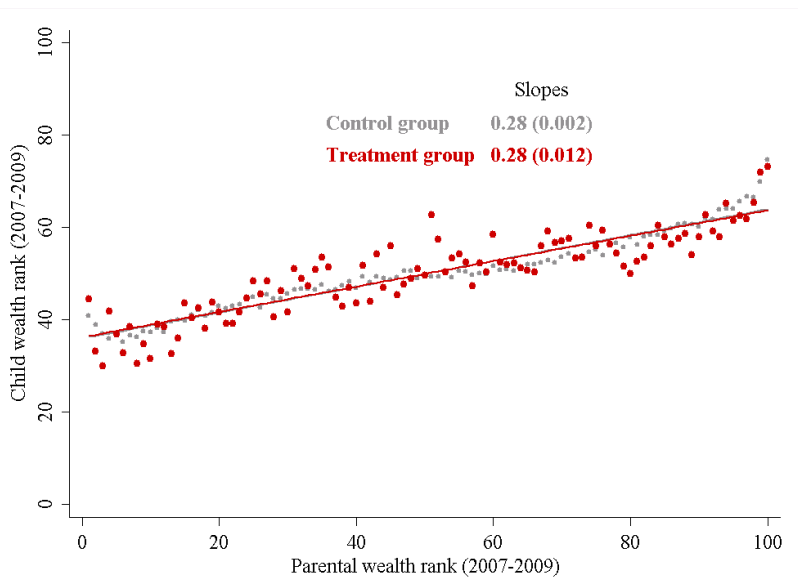
# Wealth rank correlation before bequests



# Wealth rank correlation after bequests

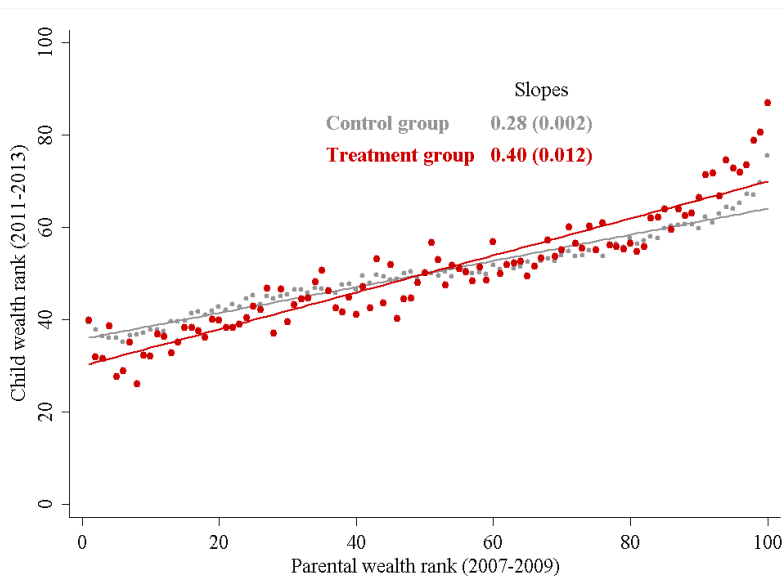


# Rank correlation before bequests — parents in 2009-11





# Rank correlation after bequests — parents in 2009-11



# Summary so far

- Parents and children in their late 40s
  - Nonparametric evidence of wealth correlation — almost linear rank relationship
  - Rank wealth correlation of 0.27, robust
  - Much larger than (“permanent”) income correlation
  - Similar for logs/IHS
- U-shape over life-cycle
  - Large correlation early on — evidence of inter vivos transfers
  - Consistent with life-cycle wealth accumulation dynamics
- Bequests increase intergenerational correlation significantly on impact
- Relationship to lifetime resources? Recall theory:
  - Measure wealth at the same stage of life-cycle
  - Control for permanent income of parents and children

# Rank correlation of wealth and lifetime resources

	(1)	(2)	(3)	(4)
	Child wealth	Child income	Child wealth	Child wealth
Parental wealth rank (1984-1986)	0.272*** (0.002)		0.240*** (0.002)	0.235*** (0.002)
Parental income rank (1984-1986)		0.200*** (0.002)	0.004* (0.002)	
Child income rank (2009-2011)			0.191*** (0.002)	
Child and parent income percentile				X
Observations	363,857	363,857	363,857	363,857
Adj. R-squared	0.074	0.040	0.110	0.114

Standard errors in parentheses

\*  $p < 0.05$ , \*\*  $p < 0.01$ , \*\*\*  $p < 0.001$

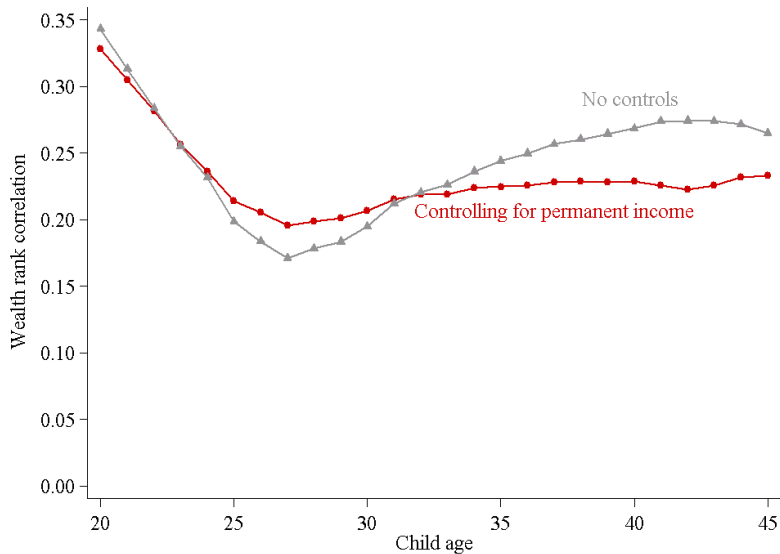
# Correlation of wealth and lifetime resources — log specification

	(1) Child wealth	(2) Child income	(3) Child wealth	(4) Child wealth
Log parental wealth (1984-1986)	0.227*** (0.003)		0.205*** (0.003)	0.184*** (0.003)
Log parental income (1984-1986)		0.107*** (0.003)	0.039*** (0.004)	
Log child income (2009-2011)			0.342*** (0.006)	
Child and parent income percentile dummies				X
Observations	190,145	190,145	190,145	190,145
Adj. R-squared	0.043	0.010	0.084	0.117

Standard errors in parentheses

\*  $p < 0.05$ , \*\*  $p < 0.01$ , \*\*\*  $p < 0.001$

# Wealth correlation over life-cycle, with controls



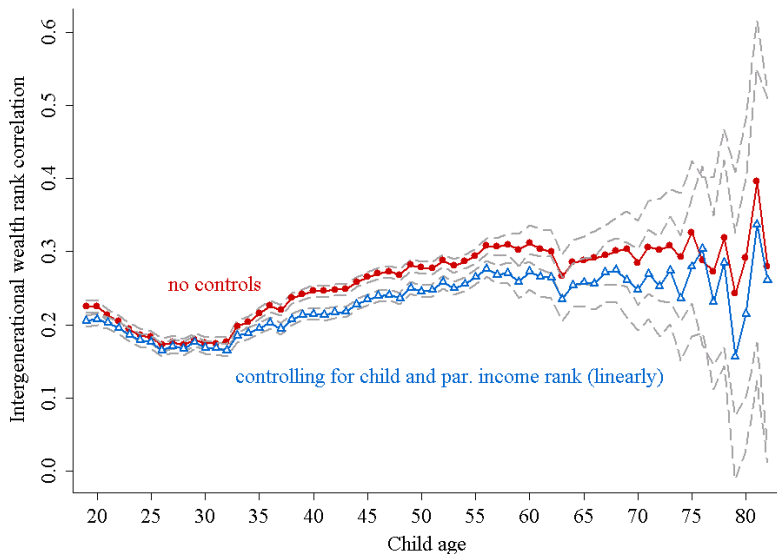
# Rank correlation of wealth before and after bequests

	Child wealth rank			
	Before parental death (2007-2009)		After parental death (2011-2013)	
	Control group	Treatment group	Control group	Treatment group
	<i>A. No income controls</i>			
Intergenerational wealth rank correlation	0.277 (0.003)	0.295 (0.013)	0.273 (0.003)	0.375 (0.012)
	<i>B. Controlling for child and parental income</i>			
Intergenerational wealth rank correlation	0.231 (0.003)	0.256 (0.013)	0.238 (0.003)	0.342 (0.013)
Observations	135,335	5,708	135,335	5,708

# Measuring correlation at the same stage of life-cycle

- Estimate when parents and children are about 45: 0.25
- Estimate for the same group right after parents die: 0.34
- The latter corresponds to parents and children at different stages of life-cycle (children post-bequest, parents — unknown)
- Theory: we should get the same result at any stage of life-cycle
- Problems with implementation at other ages:
  - Children 30 in 2010, parents 30 in 1985 — we can't observe permanent income of children
  - Children 60 in 2010, parents 60 in 1985 — we can't observe permanent income of parents
  - Incomplete data coverage for children born before 1960 (those over age 50 in 2010)
- With this caveat, let's do the best we can: estimate wealth rank correlation measuring children and parental wealth at the same age, while controlling for income at 45-50 or the closest current income that one we can observe

# Wealth correlation holding parents' and children's age the same





# Conclusions

- Baseline wealth rank correlation of 0.27, income correlation of 0.20
- However, there is no single wealth correlation
- Wealth correlation has a U-shape pattern over the life-cycle.
- In particular, it reveals the importance of inter vivos gifts
- Bequests quantitatively large and have large impact on measured wealth correlation
- Appropriately estimated wealth correlation may be used to infer correlation of lifetime resources — that correlation is 0.25 when measured pre-bequests
- However, as far as we can estimate it, the correlation holding the stage of life-cycle constant is quite stable past the age of 35