

Black-White Mortality Crossover Paradox: New Evidence from Social Security Mortality Records

Centre for Economic Demography | Lund University

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December 3, 2024

My research

I combine formal demography and insights from the emerging field of computational data science to study questions in **population health**

Introduction
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Data and methods
oooooooooooooooooooo

Data artifact
oooooo

Frailty
oooooooooooo

Empirical testing
oooooooooooooooooooo

Discussion
oooooooooooo

References

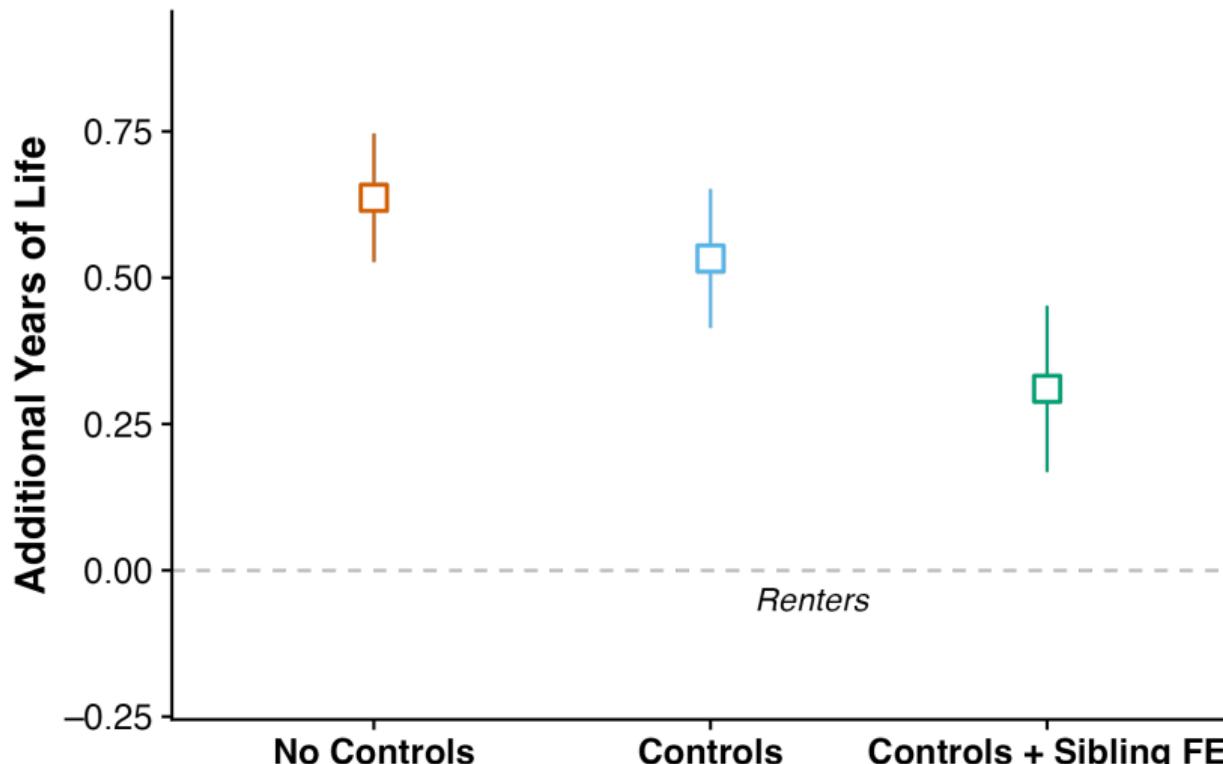
My research

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Mortality dynamics and disparities

- ▶ Mortality estimation from admin data
- ▶ Causal effects of homeownership on longevity
- ▶ Racial disparities in mortality (**today**)

Homeownership benefits of longevity (Breen 2024, *Demography*)



Today's talk

Black-White Mortality Crossover Paradox: New Evidence from Social Security Mortality Records

Black-White Mortality Crossover Paradox: New Evidence from Social Security Mortality Records *

Casey F. Breen †

Draft Version: November 18, 2024

Abstract

Since its original discovery in 1932, the Black-White mortality paradox has been repeatedly documented in the United States. Black Americans experience higher age-specific mortality rates than White Americans throughout most of the life course, but this trend reverses at advanced ages. The leading explanation centers on differential selective mortality. Black Americans who survive higher age-specific mortality risks are highly selected for robustness, resulting in lower mortality rates than White Americans in late life. Using large-scale linked administrative data ($N = 2.3$ million), we confirm a robust crossover at age 85. We document selective mortality dynamics with respect to sociodemographic characteristics as members of our cohort die off, finding modest selection effects that cannot explain the crossover. We conclude that selective mortality related to other unobserved covariates may still play a role, or that there are as-yet unidentified protective factors influencing racial mortality differences at older ages, distinct from those affecting younger ages.

Working paper...

Introduction
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Data and methods
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Data artifact
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Discussion
○○○○○○○○○○○○

References

Black-White differences in mortality in the U.S.

Black-White differences in mortality in the United States are:

- ▶ Huge
- ▶ Historic
- ▶ Ongoing

BRIEF REPORT | SOCIAL SCIENCES | 8



US racial inequality may be as deadly as COVID-19

Elizabeth Wrigley-Field [Authors Info & Affiliations](#)

Edited by Douglas S. Massey, Princeton University, Princeton, NJ, and approved August 4, 2020 (received for review July 13, 2020)

August 24, 2020 | 117 (36) 21854-21856 | <https://doi.org/10.1073/pnas.2014750117>

71,137 | 70



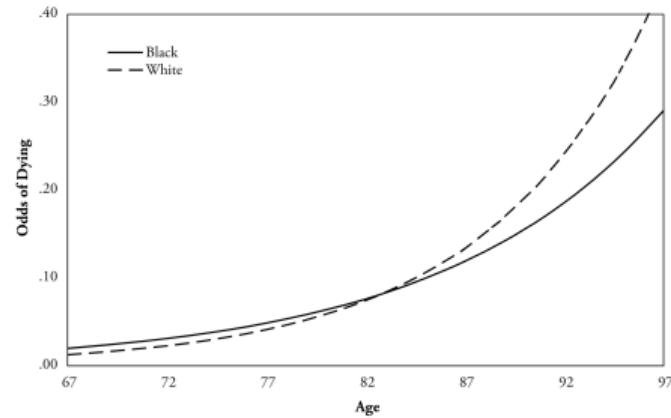
PNAS. Wrigley-Field 2020.

Paradox: Black-White mortality crossover

- ▶ Among oldest-old, Black mortality is lower than White mortality

Paradox: Black-White mortality crossover

- ▶ Among oldest-old, Black mortality is lower than White mortality
- ▶ Black-White mortality crossover is a well-studied demographic **paradox**



Dupre 2006. *Demography*.

Why understanding Black-White crossover is important

1. Fundamental to our understanding of **inequality** over the life course

Why understanding Black-White crossover is important

1. Fundamental to our understanding of **inequality** over the life course
2. Oldest-old is fastest growing age segment in the United States

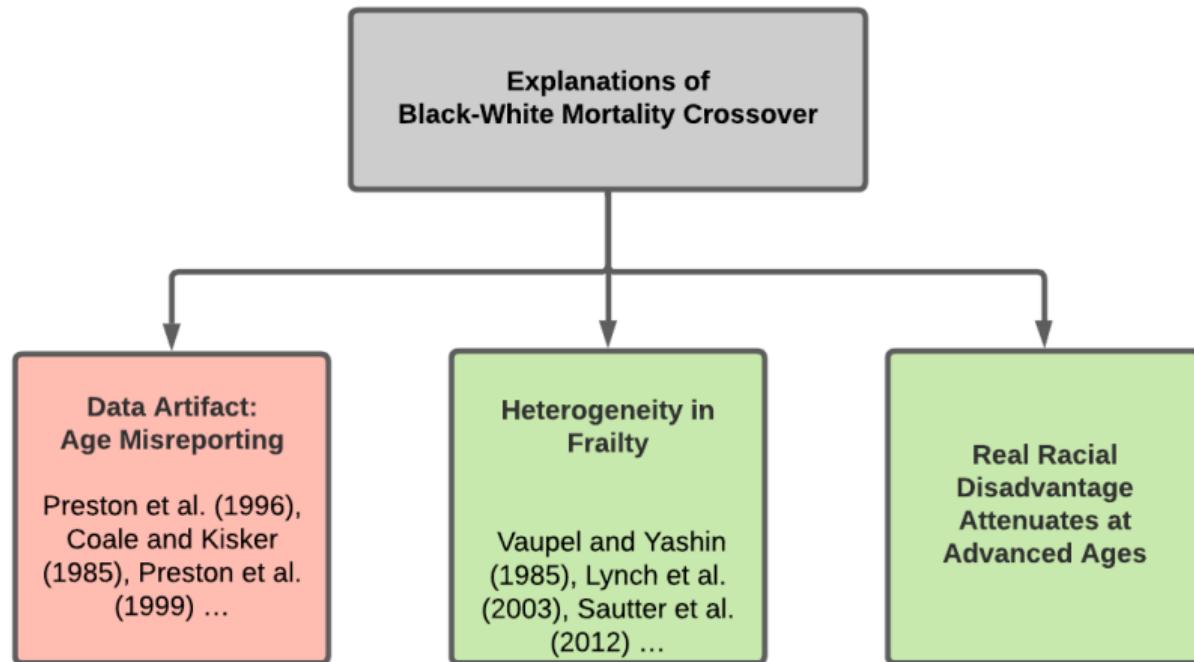
Why understanding Black-White crossover is important

1. Fundamental to our understanding of **inequality** over the life course
2. Oldest-old is fastest growing age segment in the United States
3. Implications for social policy

Black-White crossover repeatedly documented

Data Source	Age of Crossover	Covariates	Age Verification	Citation
Tennessee Vital Statistics	74			Sibley (1930)
Evans County Study	85 (f); 80 (m)			Wing et al. (1985)
Medicare Enrollment	88 (f); 86 (m)			Kestenbaum (1992)
U.S. Death Certificates	90 (f); 85 (m)		✓	Preston (1996)
Medicare Enrollment	85–86			Parnell and Owens (1999)
Survey on Asset and Health Dynamics Among the Oldest Old	81			Johnson (2000)
Berkeley Mortality Database	79–87		✓	Lynch, Brown and Harmsen (2003)
Medicare Enrollment	80–85			Arias (2006)
Established Populations for Epidemiologic Studies of the Elderly	83 (f); 79 (m)	Religious Attendance		Dupre, Franzese and Parrado (2006)
Americans' Changing Lives study	80	Education, Income, Neighborhoods		Yao and Robert (2011)
National Health Interview Survey-Linked Mortality Files	85			Masters (2012)
Established Populations for Epidemiologic Studies of the Elderly	83 (f); 79 (m)			Sautter et al. (2012)
NCHS Multiple Cause-of-Death public-use files	87	Education, Income		Fenelon (2013)
National Longitudinal Mortality Study	85			Şahin and Heiland (2017)

Still no consensus on explanation...



Research questions

1. Is the Black-White mortality crossover a **data artifact**?
2. Does **heterogeneity in frailty** explain the Black-White crossover? Is there really observable late-life mortality selection?

New Data Allows Us to Make Progress

- ▶ Data limitations have hampered efforts to explain crossover
- ▶ Comparative advantage:
 1. Massive sample (1M deaths)
 2. Cohorts
 3. Covariates

scientific **data**

OPEN
DATA DESCRIPTOR
Check for updates

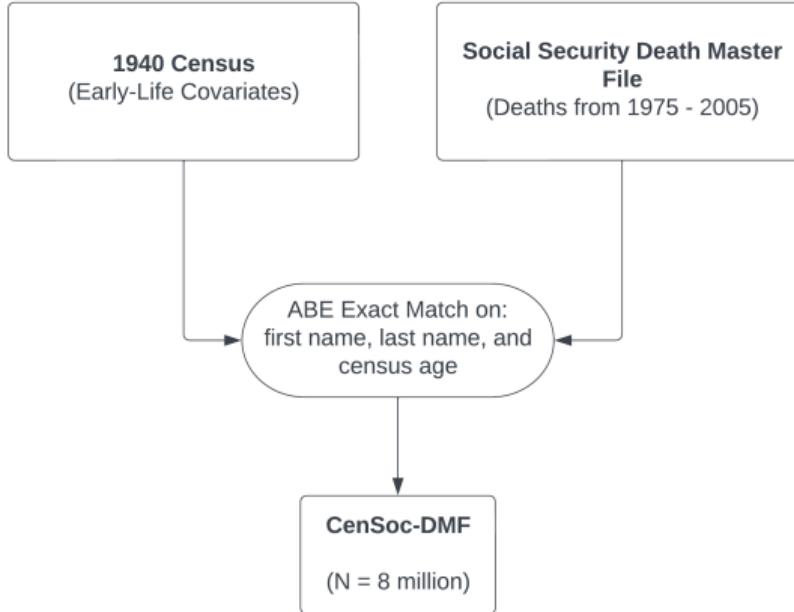
CenSoc: Public Linked Administrative Mortality Records for Individual-level Research

Casey F. Breen^{1,2,3}, Maria Osborne¹ & Joshua R. Goldstein^{1,2,3}

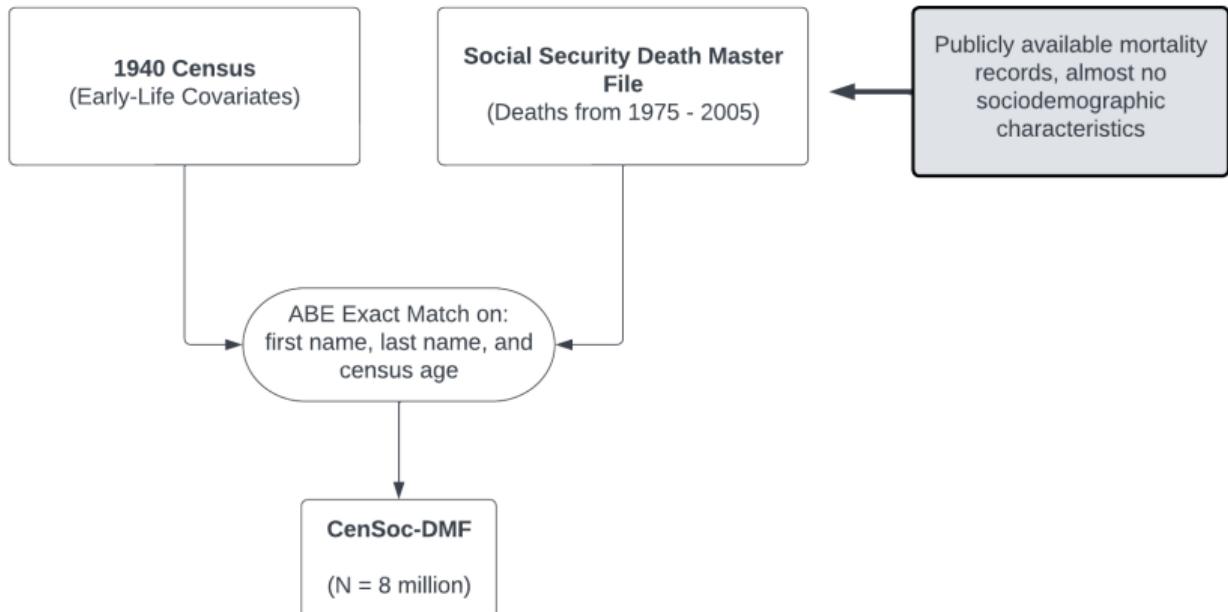
In the United States, much has been learned about the determinants of longevity from survey data and aggregated tabulations. However, the lack of large-scale, individual-level administrative mortality records has proven to be a barrier to further progress. We introduce the CenSoc datasets, which link the complete-count 1940 U.S. Census to Social Security mortality records. These datasets—CenSoc-DMF ($N = 4.7$ million) and CenSoc-Numident ($N = 7.0$ million)—primarily cover deaths among individuals aged 65 and older. The size and richness of CenSoc allows investigators to make new discoveries into geographic, racial, and class-based disparities in old-age mortality in the United States. This article gives an overview of the technical steps taken to construct these datasets, validate them using external aggregate mortality data, and discusses best practices for working with these datasets. The CenSoc datasets are publicly available, enabling new avenues of research into the determinants of mortality disparities in the United States.

Breen, Osborne, Goldstein 2023

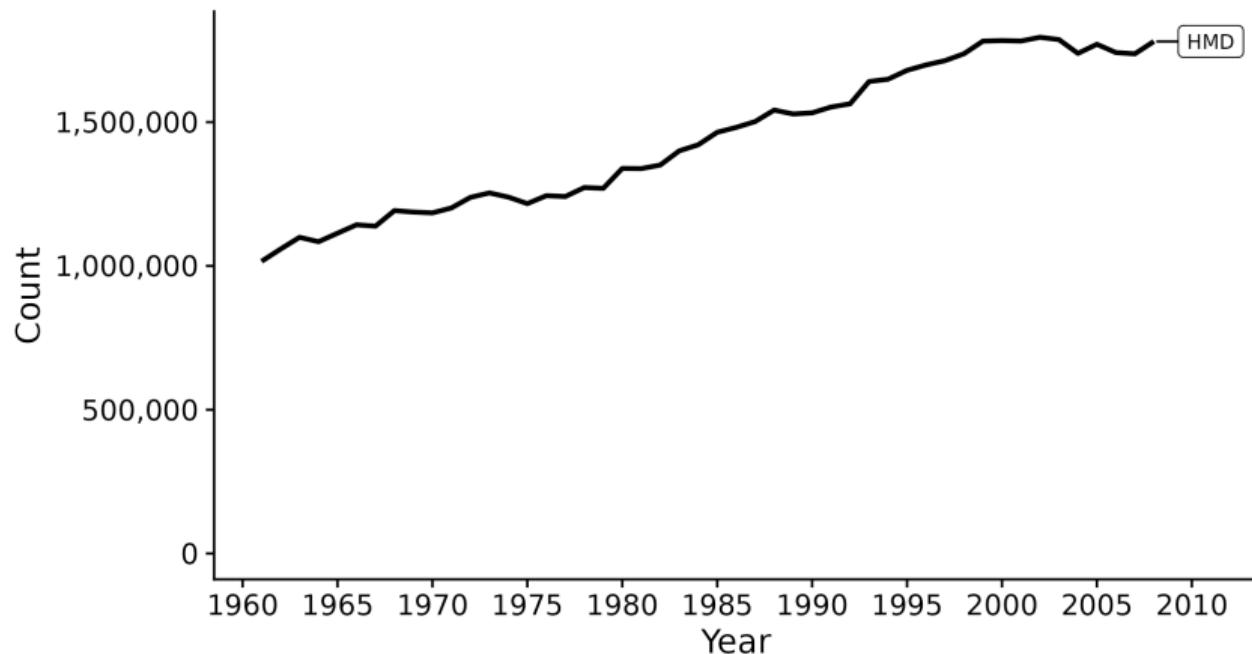
CenSoc-DMF: Linked IPUMS 1940 Census and mortality records



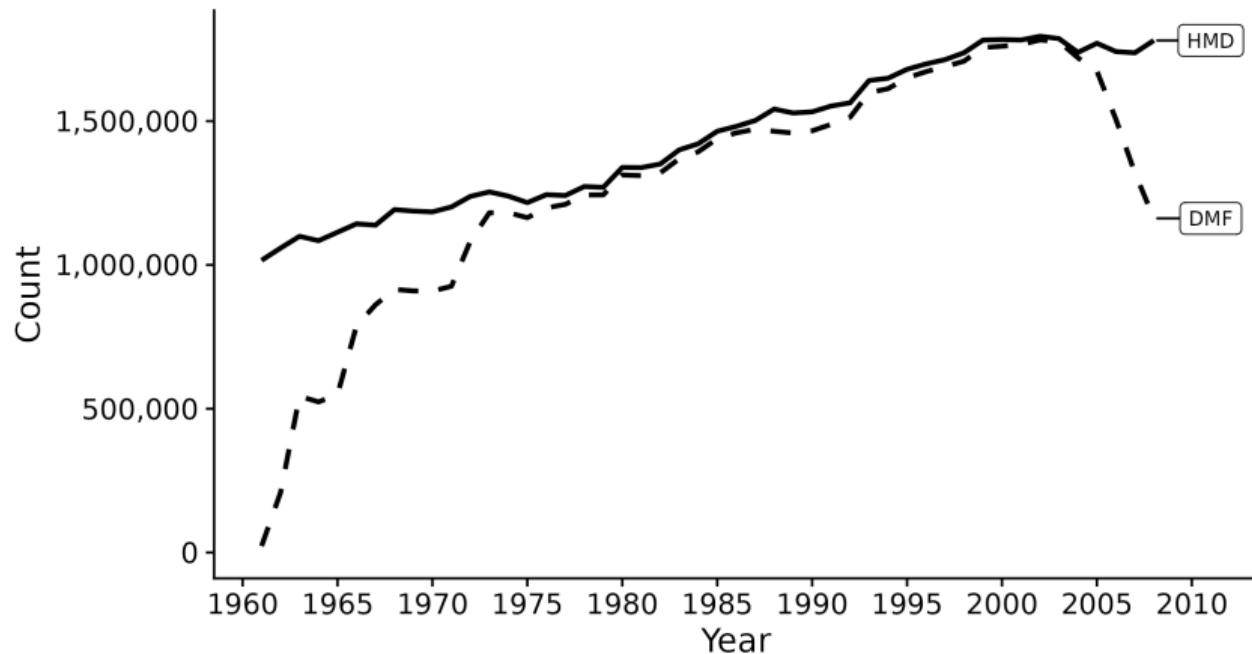
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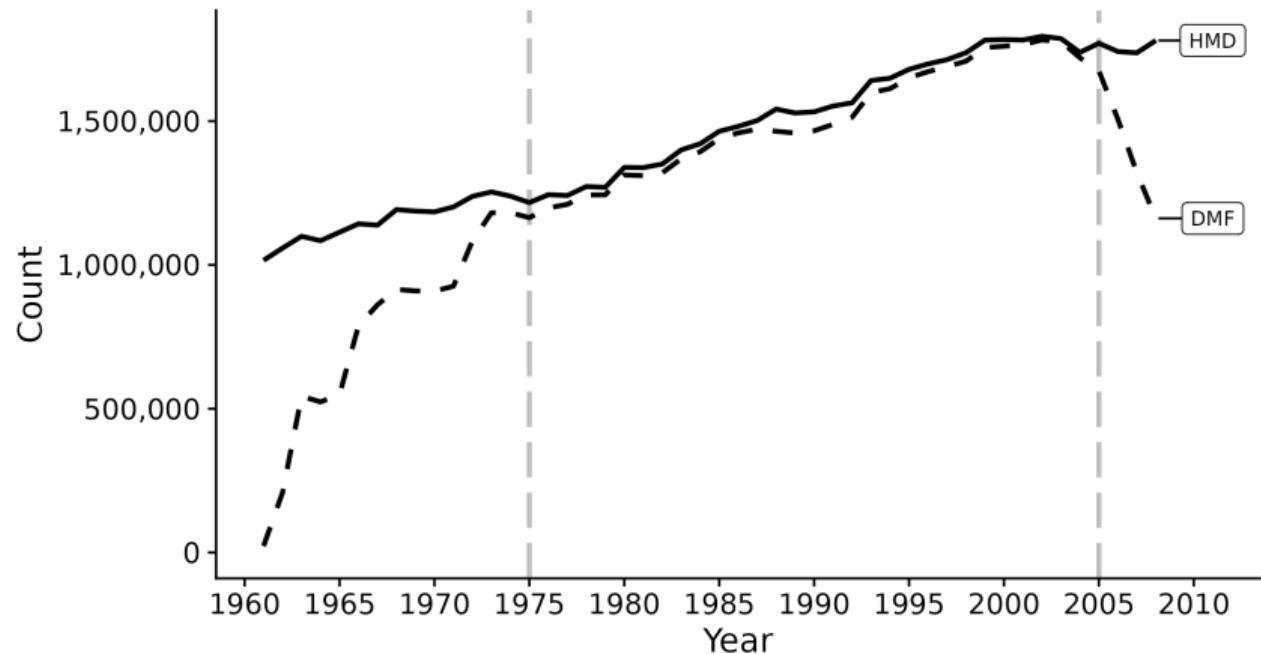
Death Master File (DMF) coverage (65+)



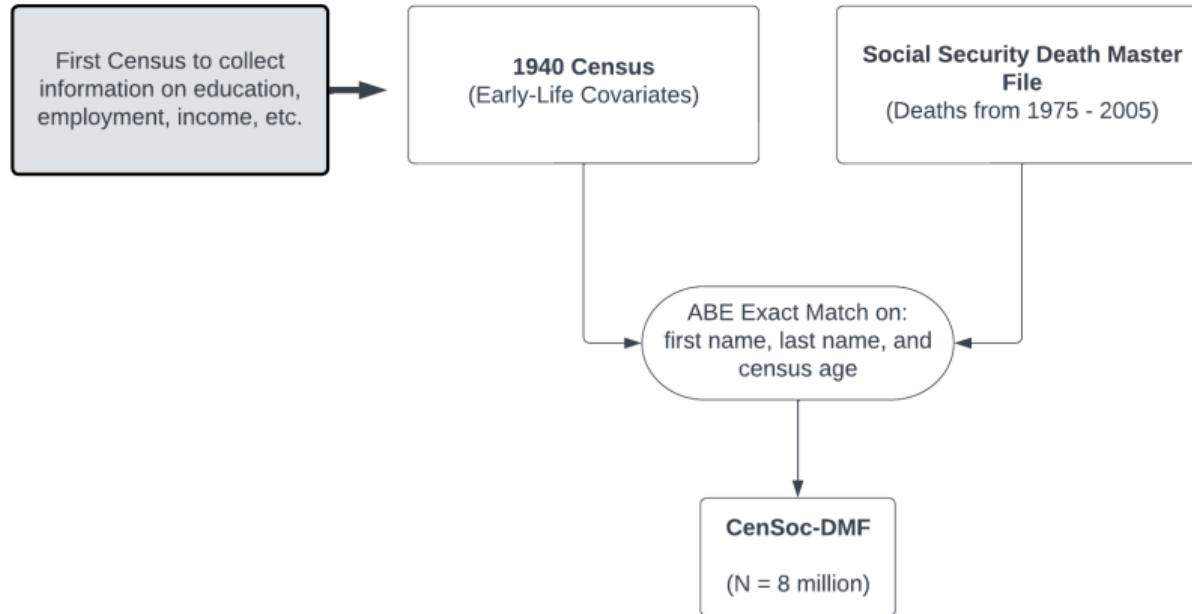
Death Master File (DMF) coverage (65+)



95% death coverage 1975-2005 (65+)



CenSoc-DMF: Linked 1940 Census and mortality records



1940 Census

- ▶ 1940 Census reflected heightened time of social awareness brought about by Great Depression

1940 Census

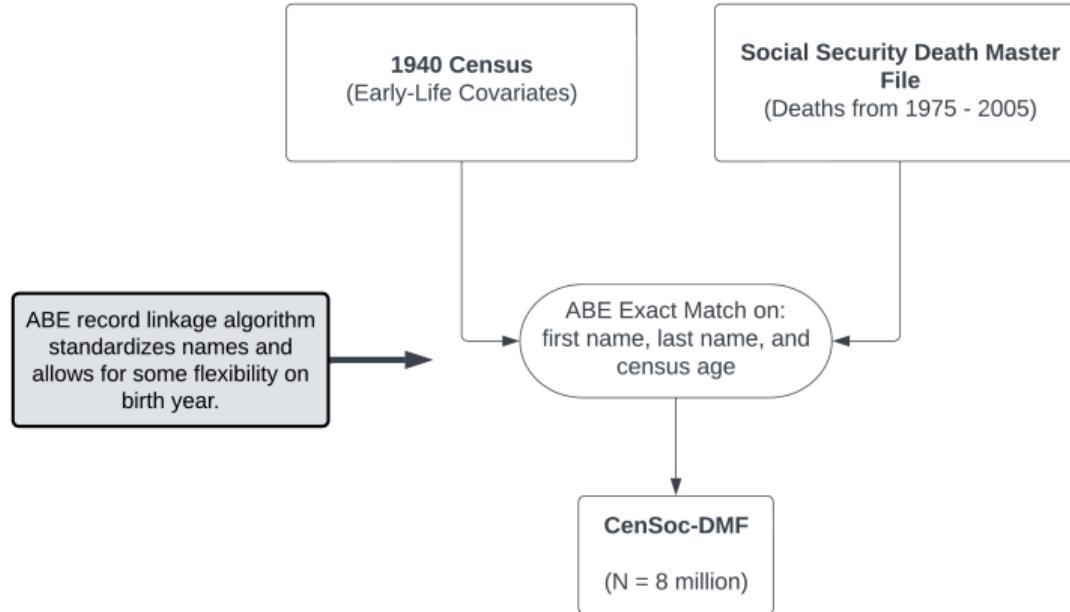
- ▶ 1940 Census reflected heightened time of social awareness brought about by Great Depression
- ▶ First decennial census to include question on educational attainment, wage and salary income, and detailed questions on employment

1940 Census

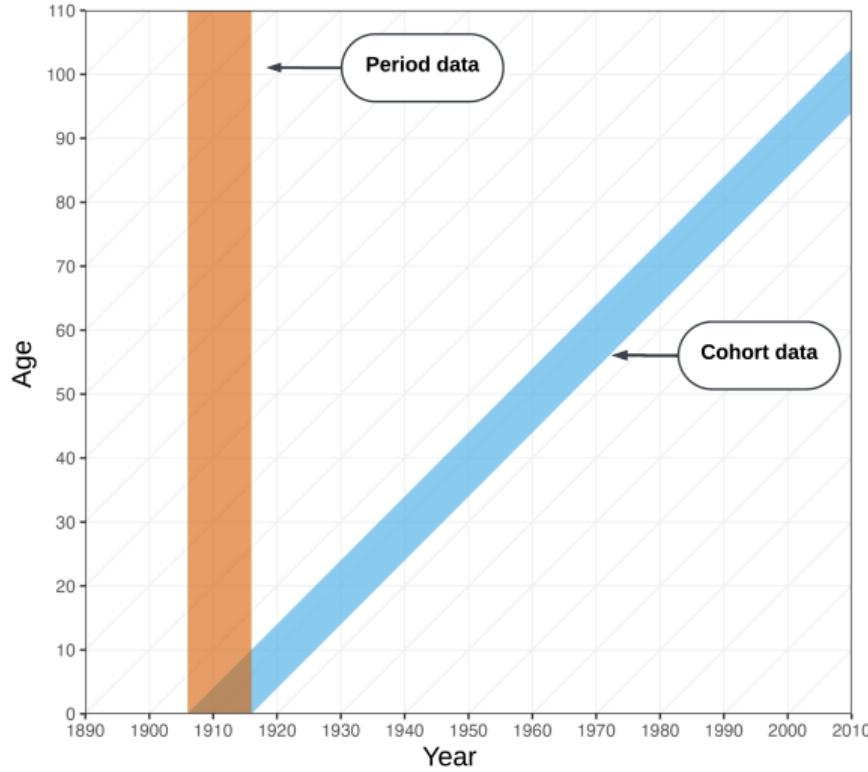
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1940 Census Form

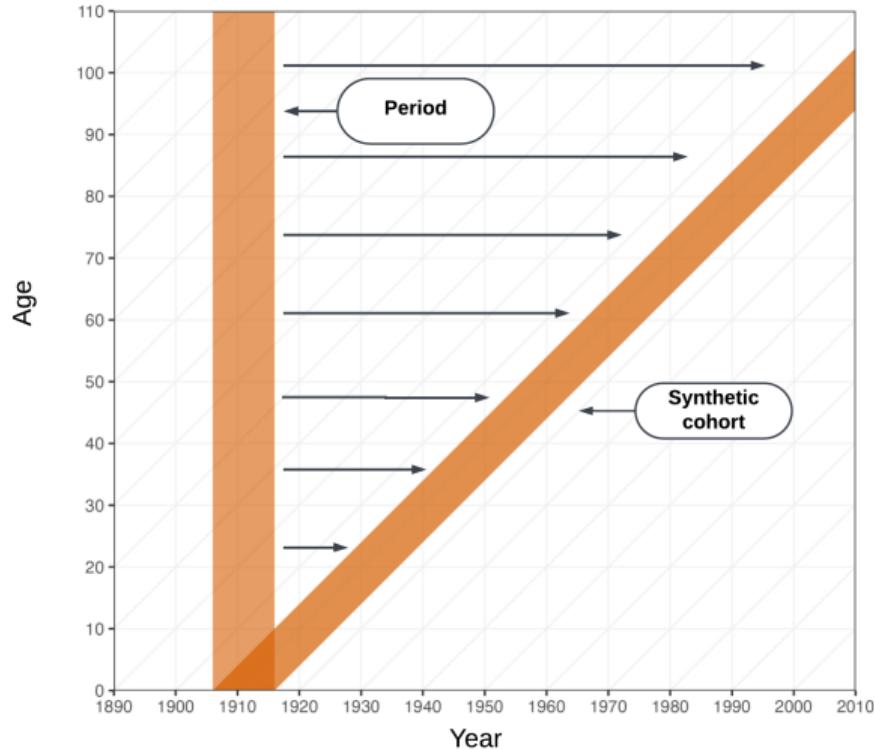
CenSoc-DMF: Linked census and mortality records



Period vs. cohort perspective

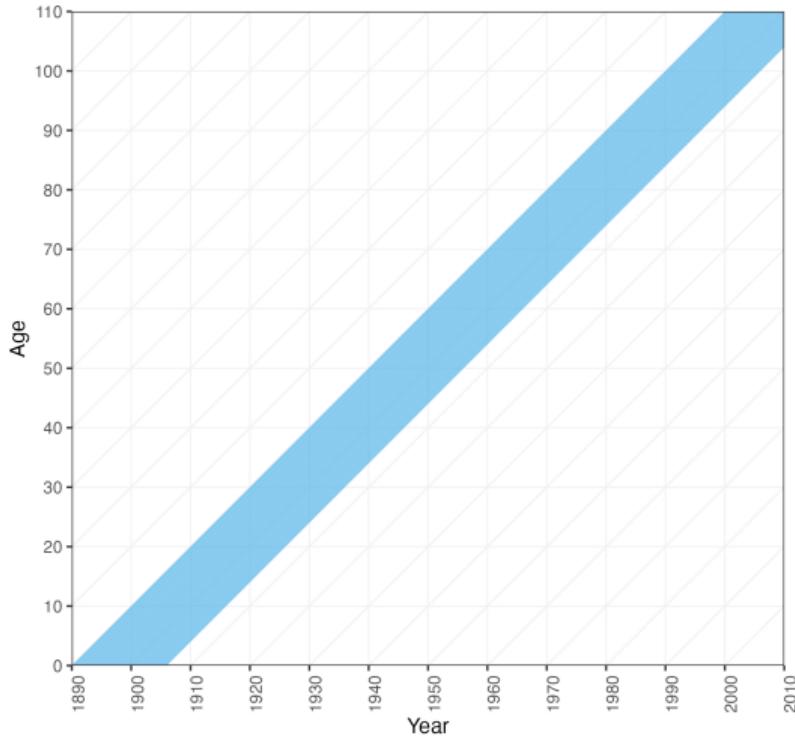


What we're generally restricted to...



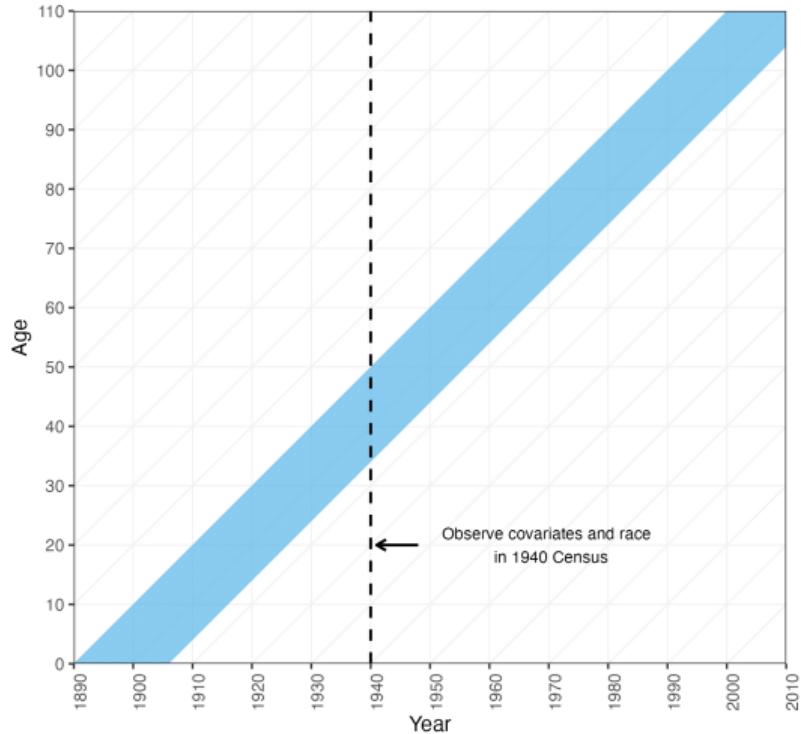
Analytic Sample

- ▶ Birth cohorts of 1890-1905
 - ▶ $N = 900,000$ deaths
- ▶ Sample restrictions
 - ▶ Men only
 - ▶ U.S. born



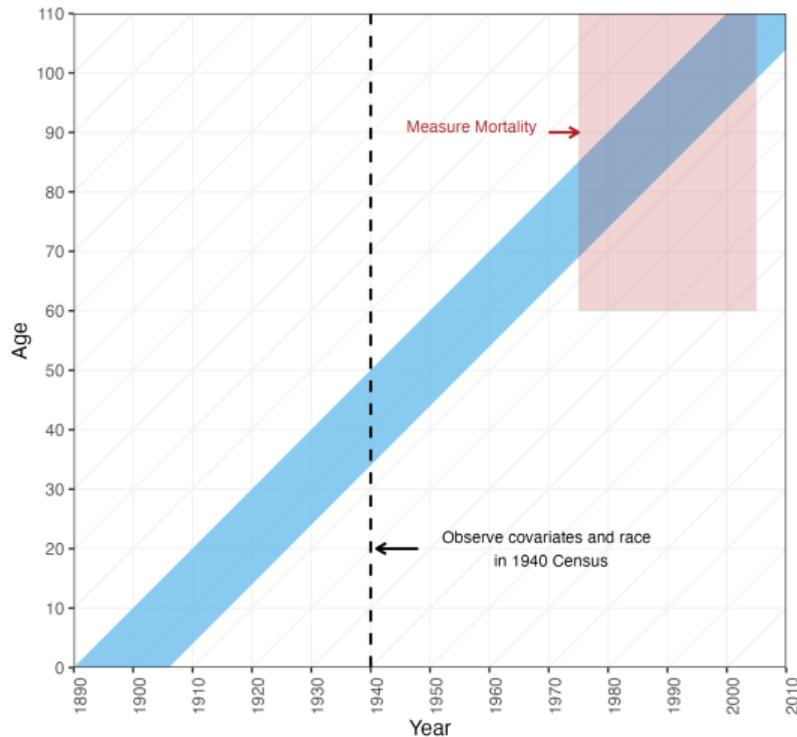
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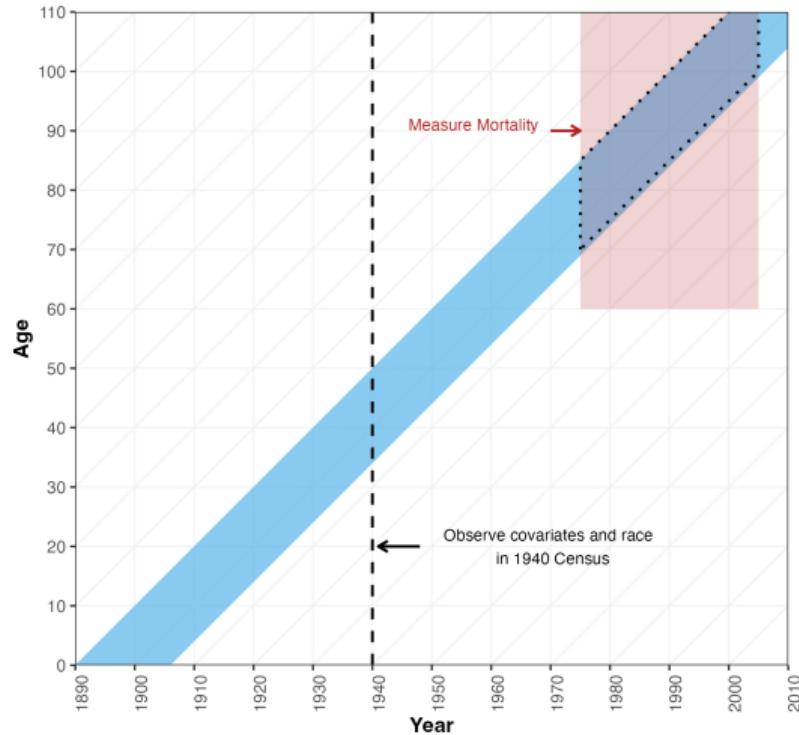
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Birth cohorts of 1890-1905: extinct cohort method

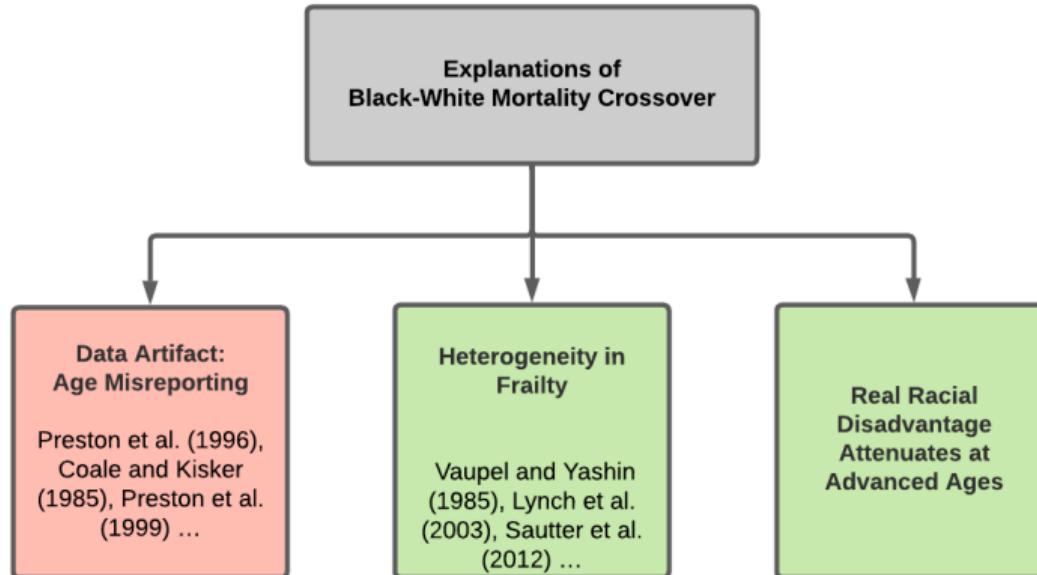
- ▶ Assumes that all members of the cohort have died by a certain year
- ▶ Uses recorded deaths over time to reconstruct the cohort's survival pattern

$$q_x = \frac{d_x}{\sum_x^\infty d_i} = \frac{d_x}{l_x} \quad (1)$$

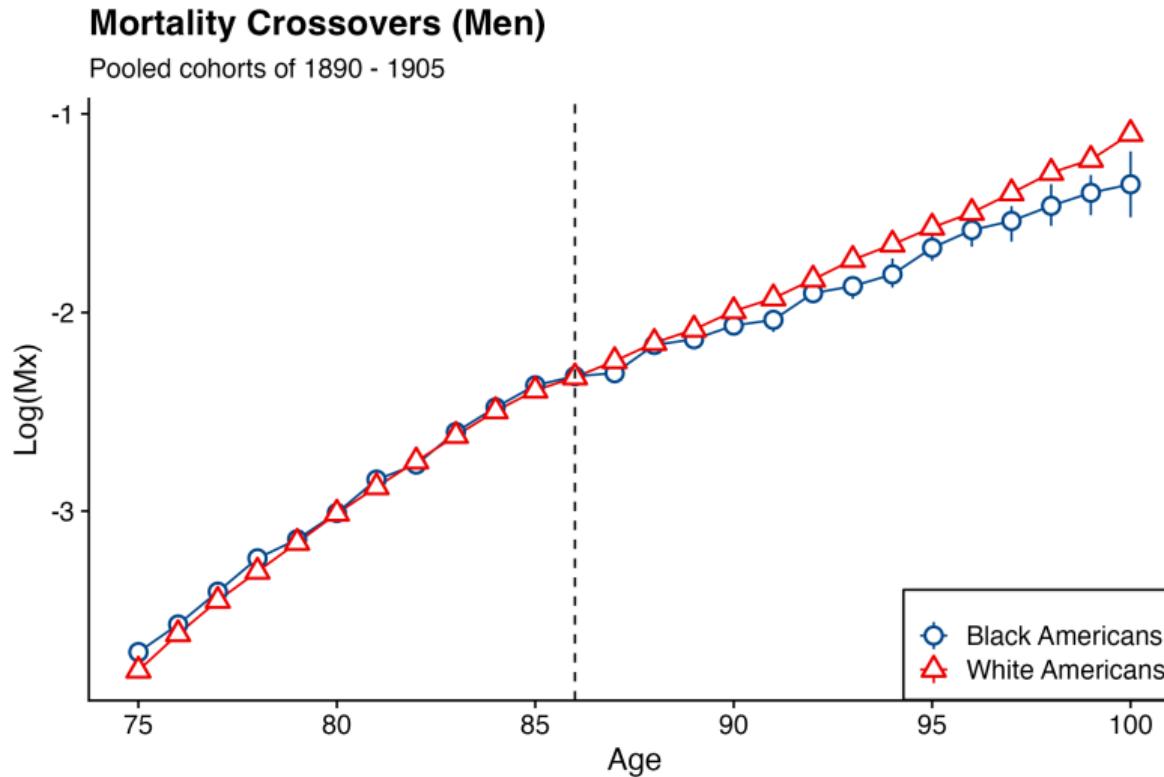
where:

- ▶ q_x is the probability of dying at age x .
- ▶ d_x is number of deaths at age x

Question 1: Is the crossover a data artifact?



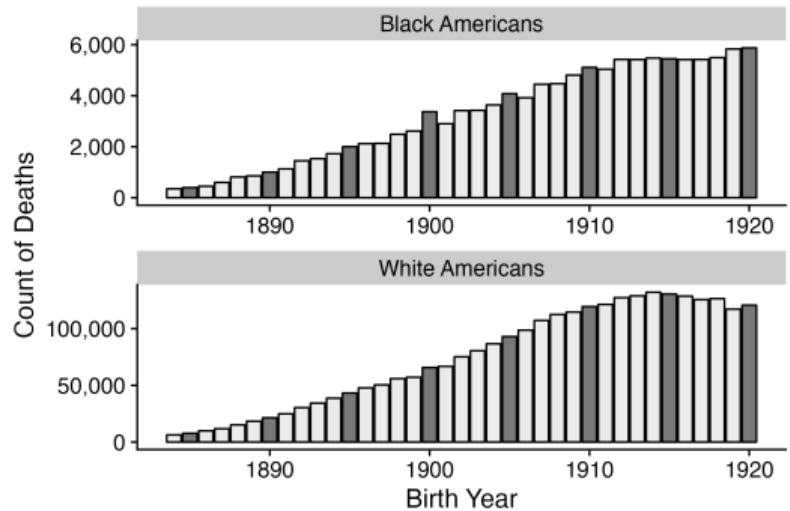
Black-White crossover (extinct cohort method)



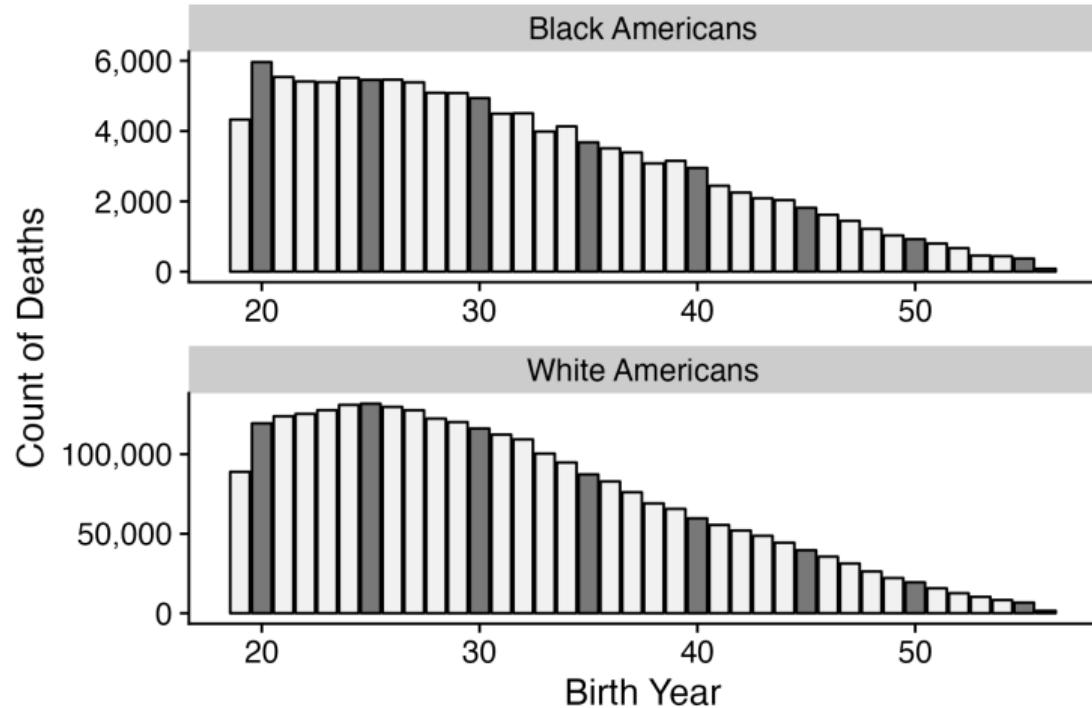
Question 1: Is the crossover a data artifact?

Background: Age of death calculated from date of birth and date of death

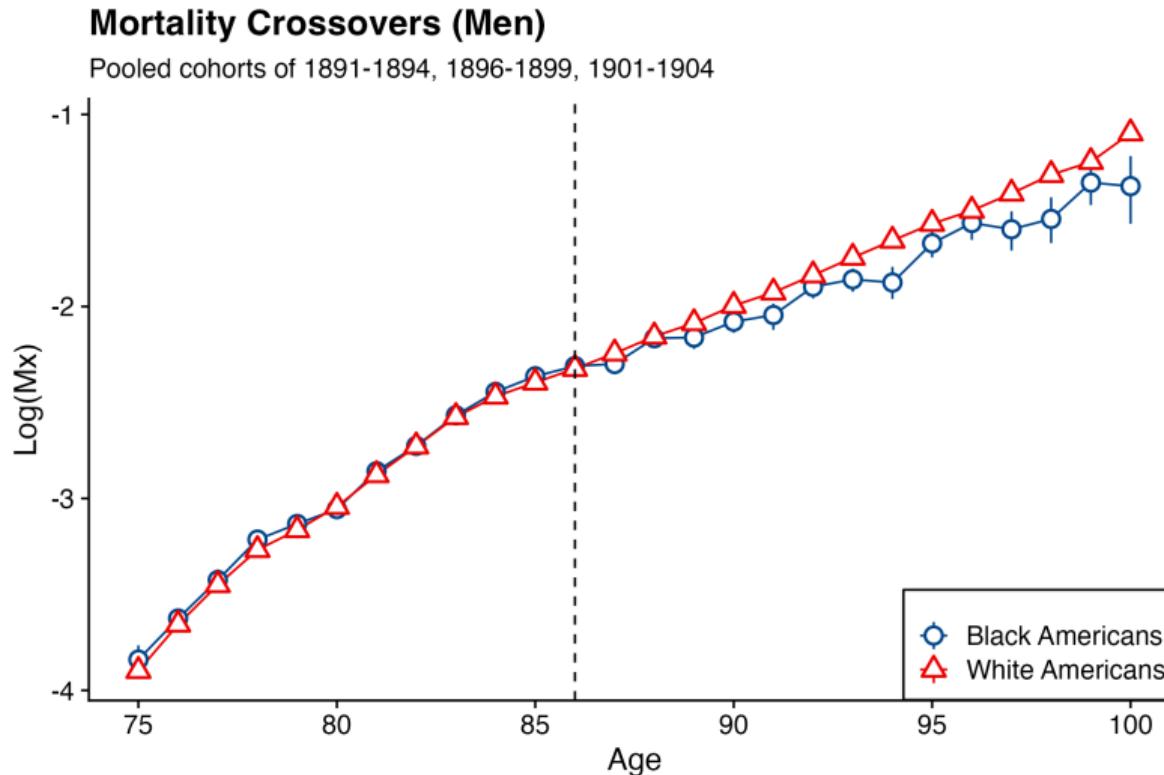
1. Minimal age heaping on birth year...
2. Date of death gets reported immediately (no heaping)
3. Institutional incentive: Social Security wants to accurately track birth date
4. Linkage requires close match on year of birth and Census age



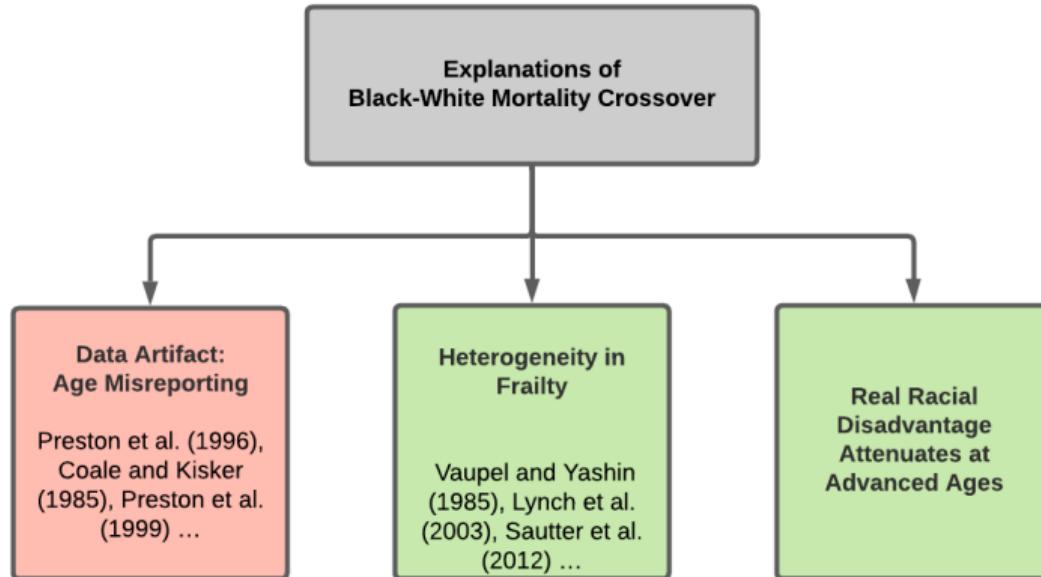
No age heaping in 1940 Census



Black-white crossover (extinct cohort method)



Question 2: Is the crossover driven by heterogeneity in frailty?



Heterogeneity in frailty – overview of approach

- ▶ First, how much **mortality selection** do we actually observe...?
- ▶ Second, does stratifying on heterogeneity uncross the crossover?

HETEROGENEITY'S RUSES: SOME SURPRISING EFFECTS OF SELECTION ON POPULATION DYNAMICS

James W. Vaupel and Anatoli I. Yashin

*Population Program, International Institute for Applied Systems Analysis,
Laxenburg, Austria*

Unpacking the black box of frailty...

- ▶ **Frailty:** an individual's susceptibility to death
 - ▶ Wealth, education, environmental, behavioral, etc.
- ▶ Lots of theorizing on frailty — but less empirical evidence due to data limitations
- ▶ Data-driven investigation of components of frailty that we can observe: sociodemographic characteristics

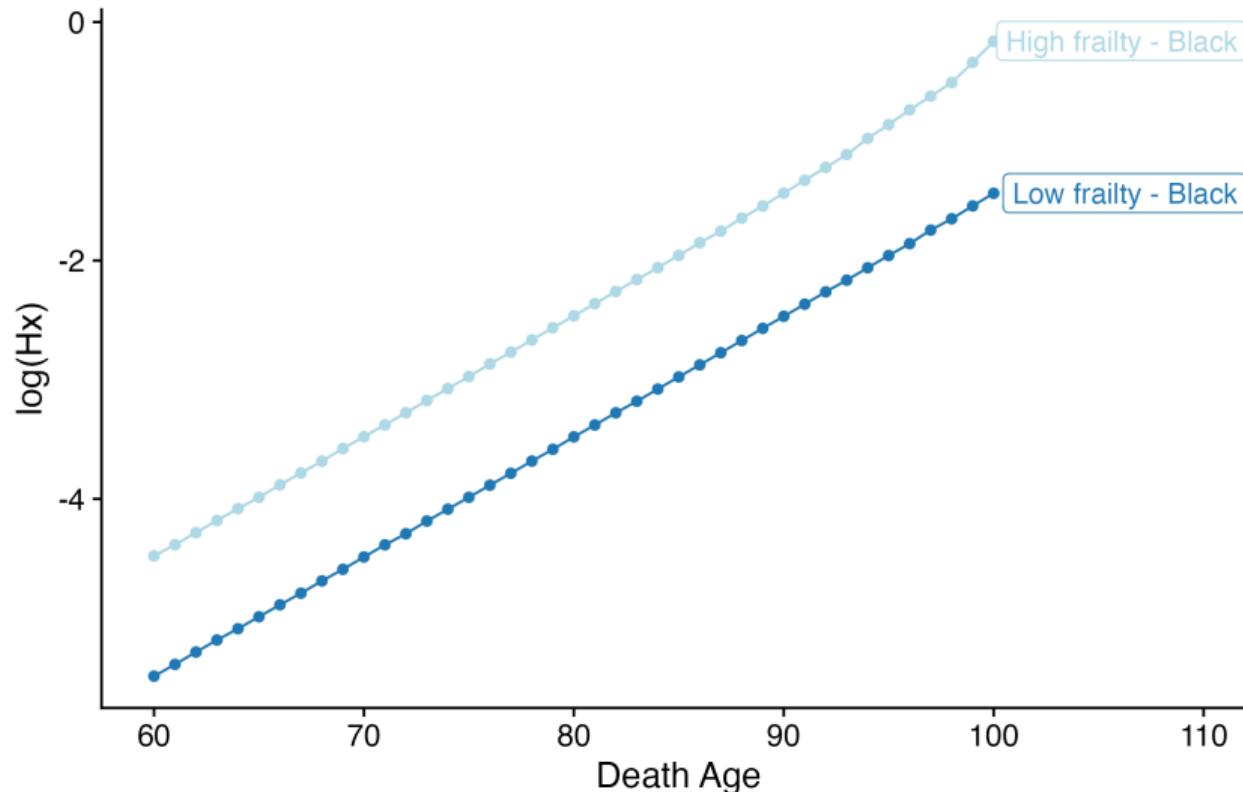
The theory of heterogeneity in frailty

- ▶ To get a crossover, higher initial mortality population must have **higher variance** in frailty

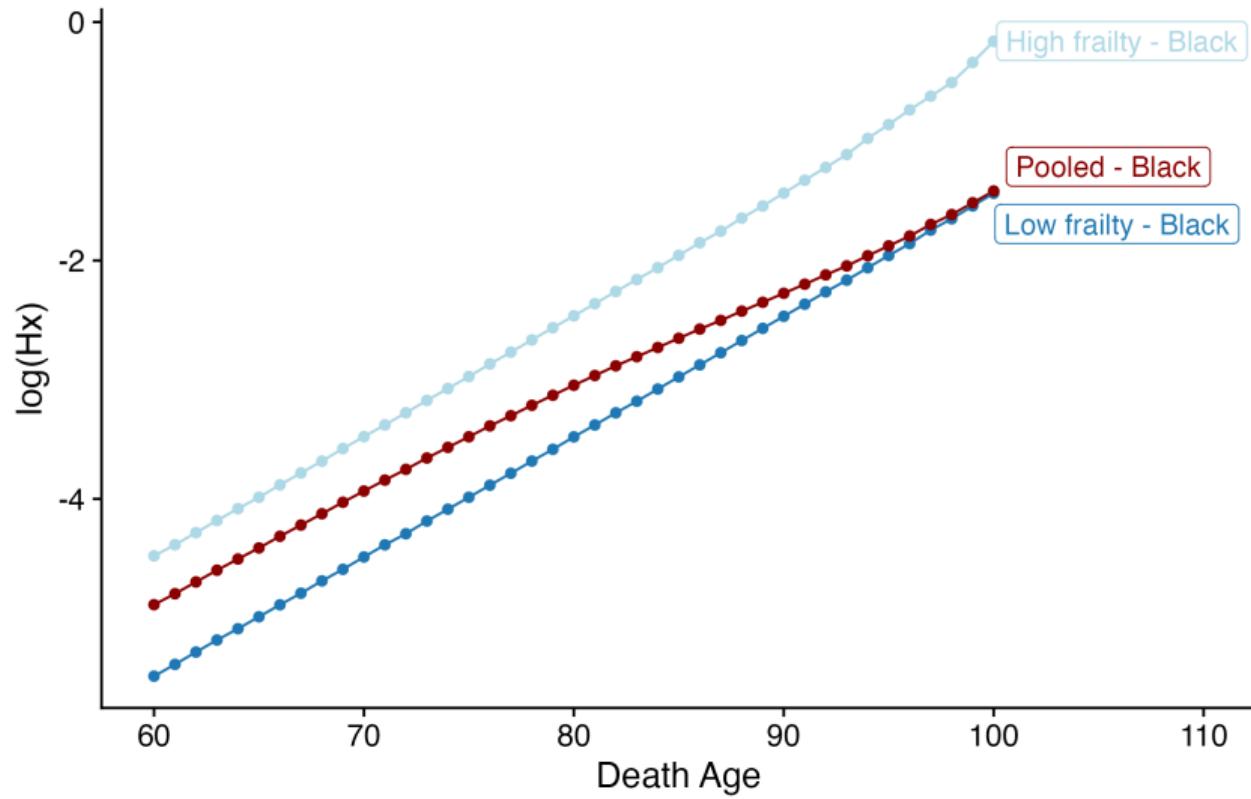
The theory of heterogeneity in frailty

- ▶ To get a crossover, higher initial mortality population must have **higher variance** in frailty
- ▶ As the cohorts age, mortality selection is much stronger for the high mortality, high variance group
- ▶ So much stronger, that eventually the frailty of survivors actually crosses

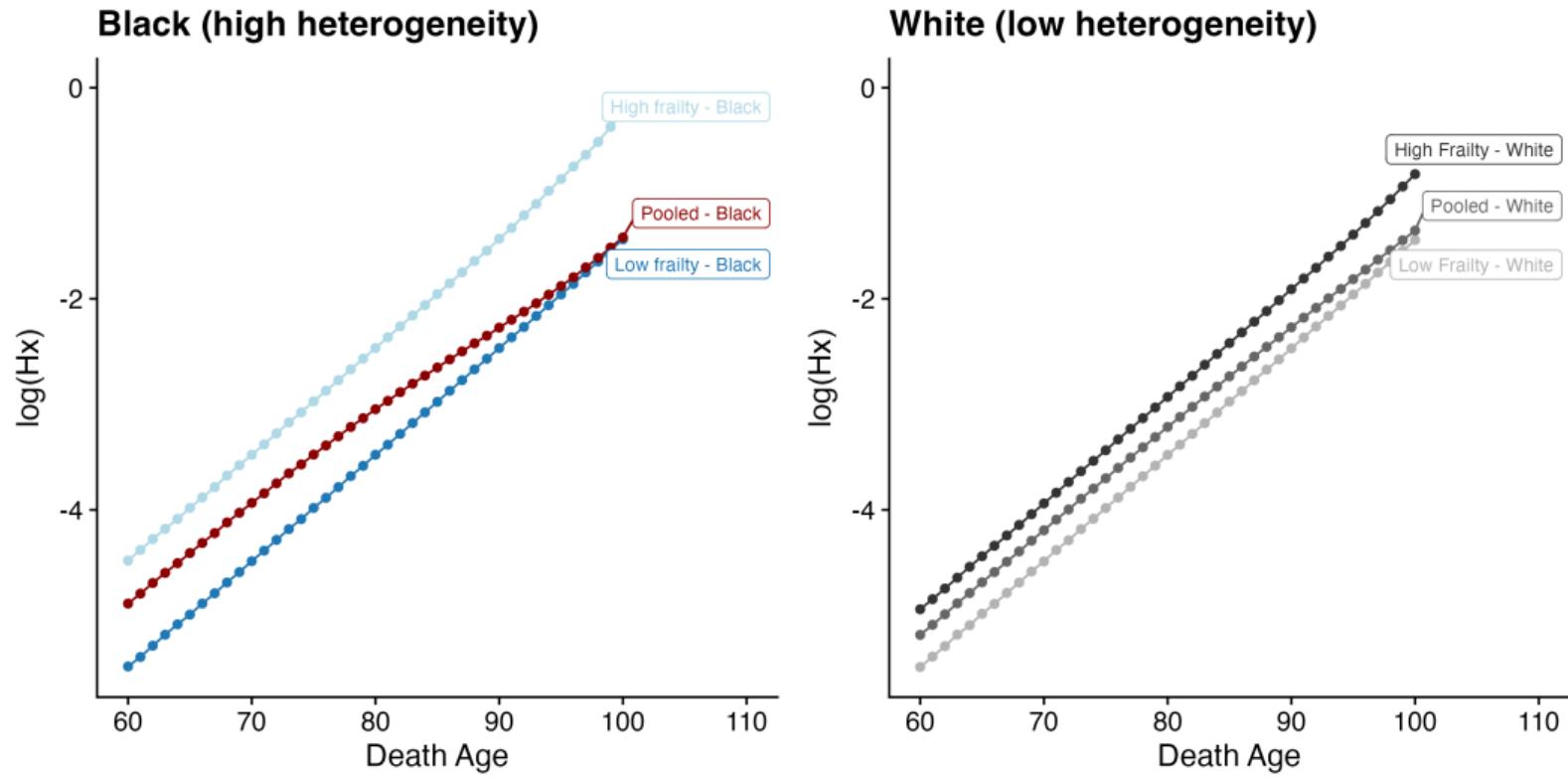
Heterogeneity in frailty (stylized example)



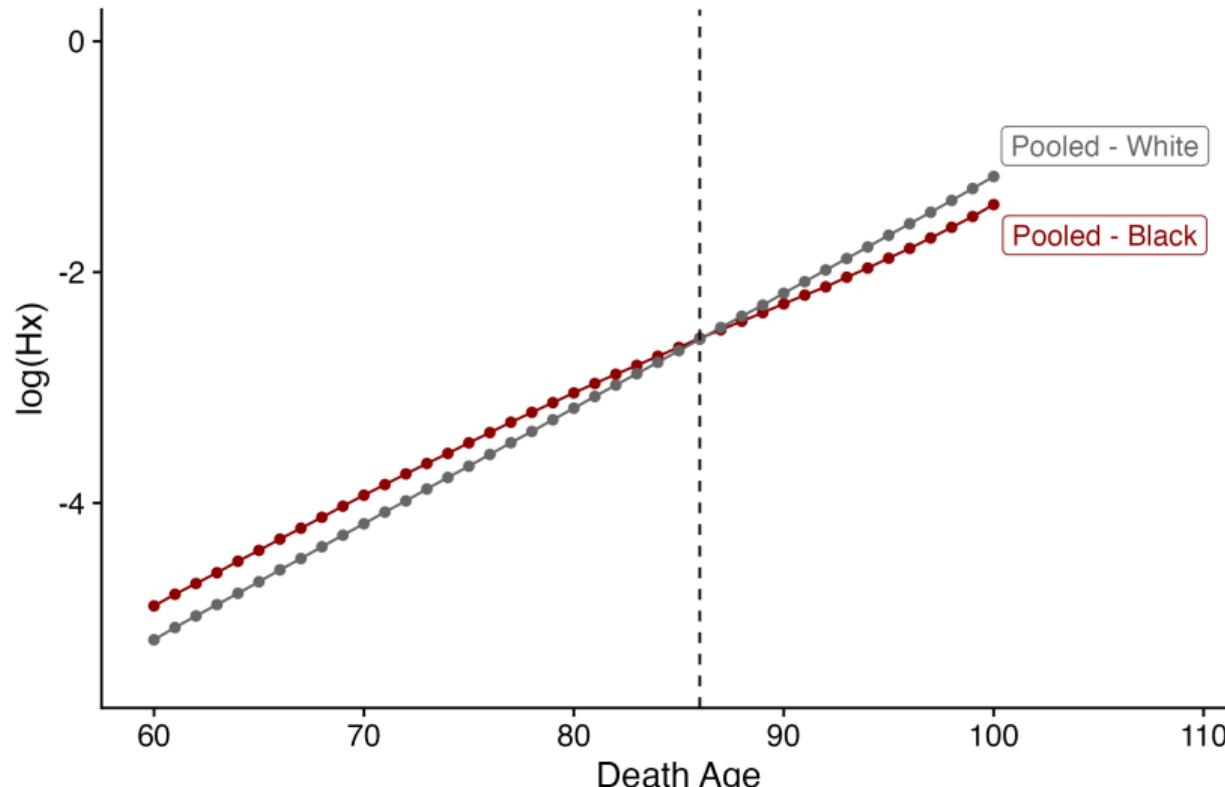
Heterogeneity in frailty (stylized example)



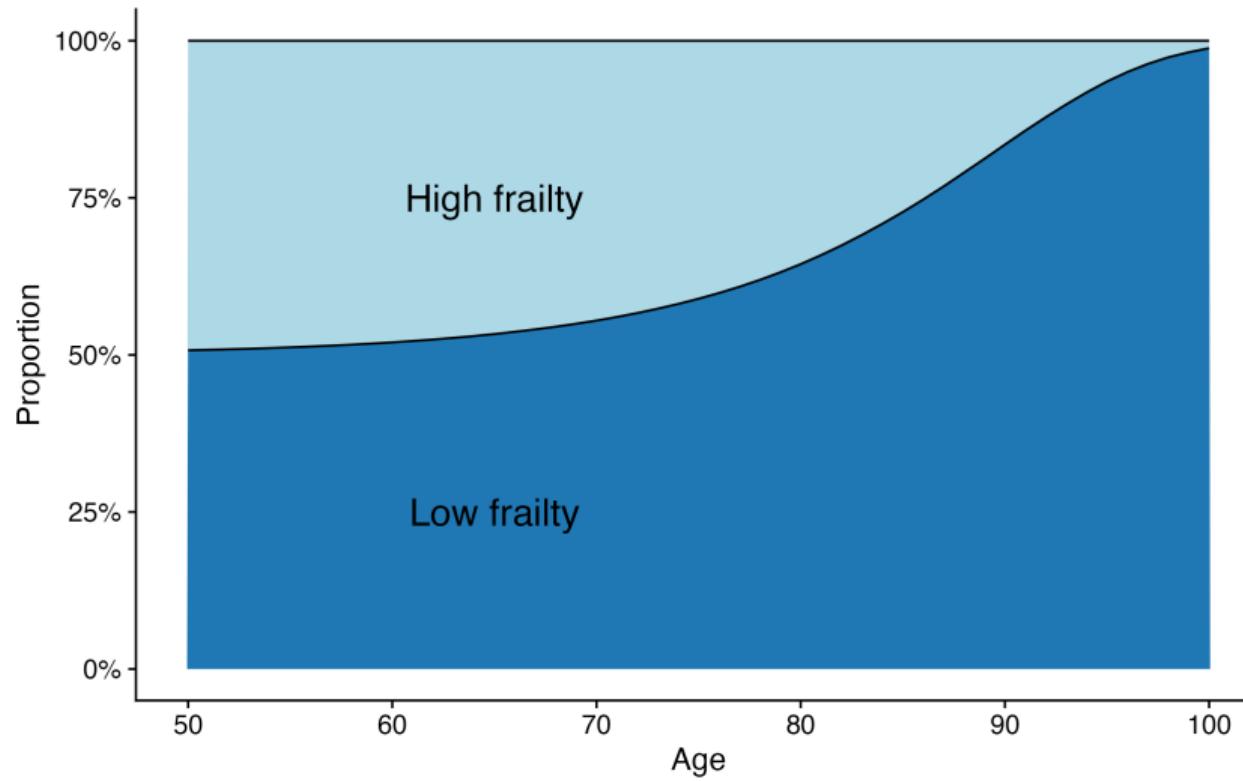
Heterogeneity in frailty (stylized example)



Heterogeneity in frailty (stylized example)



Very dramatic shift in composition of survivors...



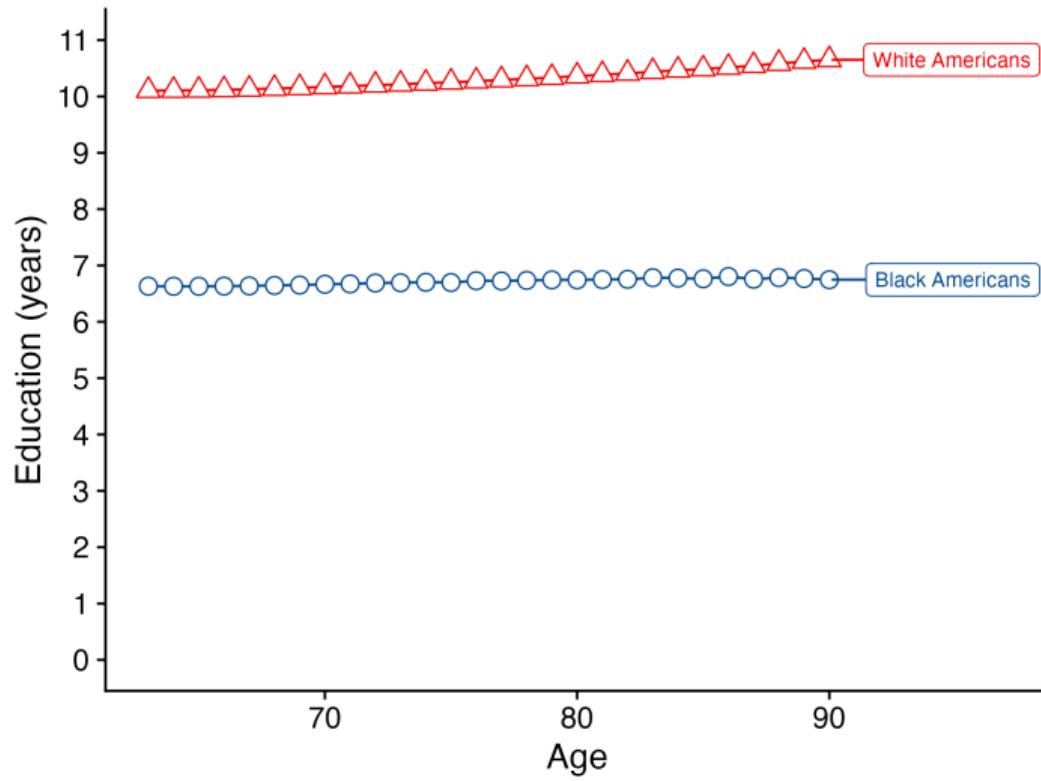
Empirical testing

- ▶ In order for the theory of frailty to explain the Black-White crossover, there must be stronger frailty selection over the life course for Black Americans than for White Americans

Empirical testing

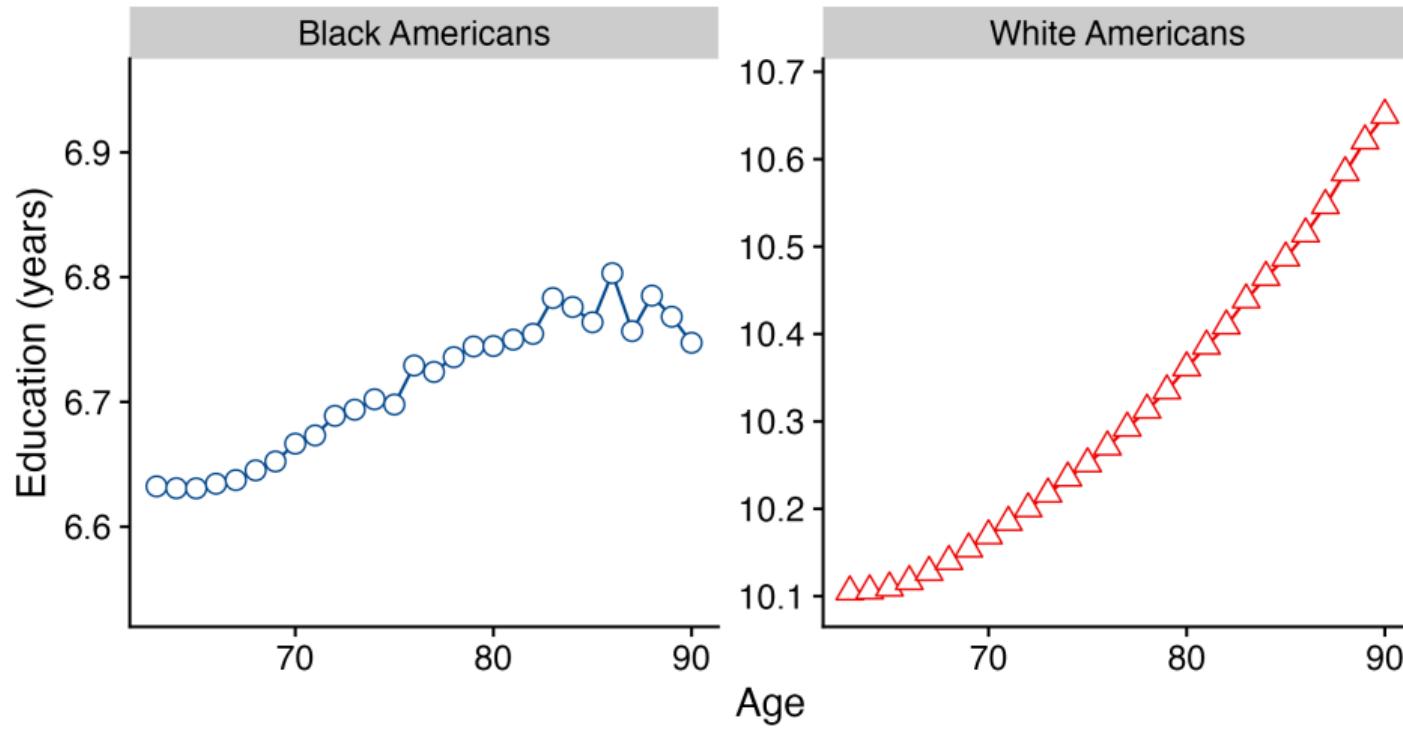
- ▶ In order for the theory of frailty to explain the Black-White crossover, there must be stronger frailty selection over the life course for Black Americans than for White Americans
- ▶ We don't observe frailty but we observe characteristics that comprise part of frailty
 - ▶ Educational attainment
 - ▶ Occupation and income
 - ▶ Wealth

Changing educational composition of survivors

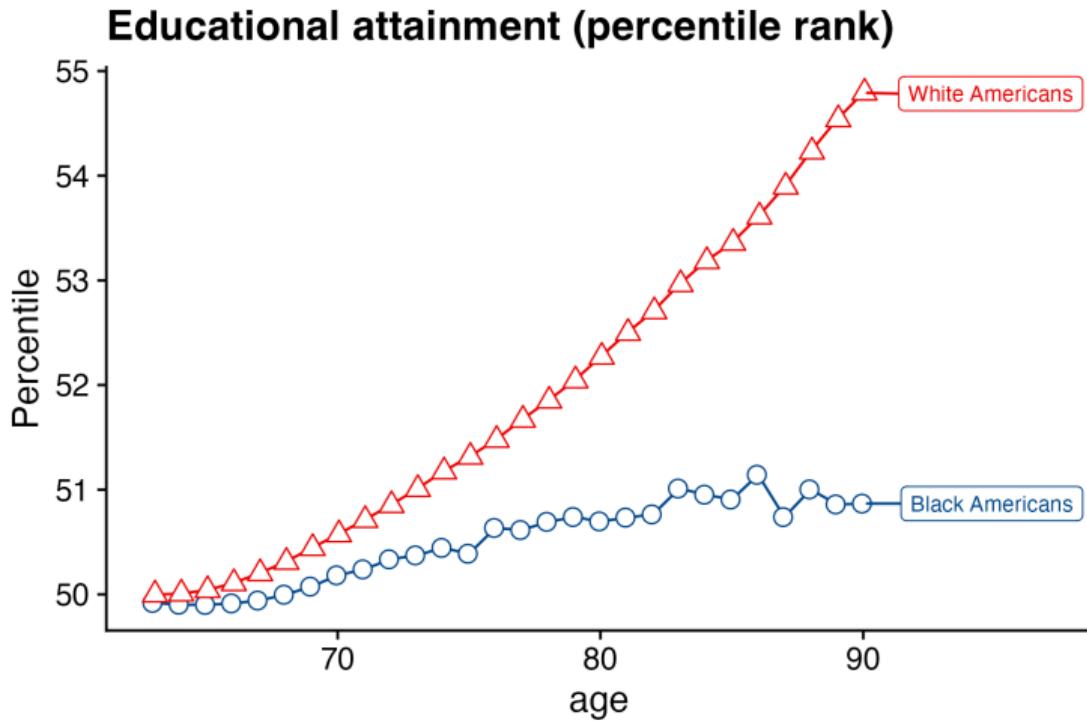


Changing composition of survivors

Educational Attainment

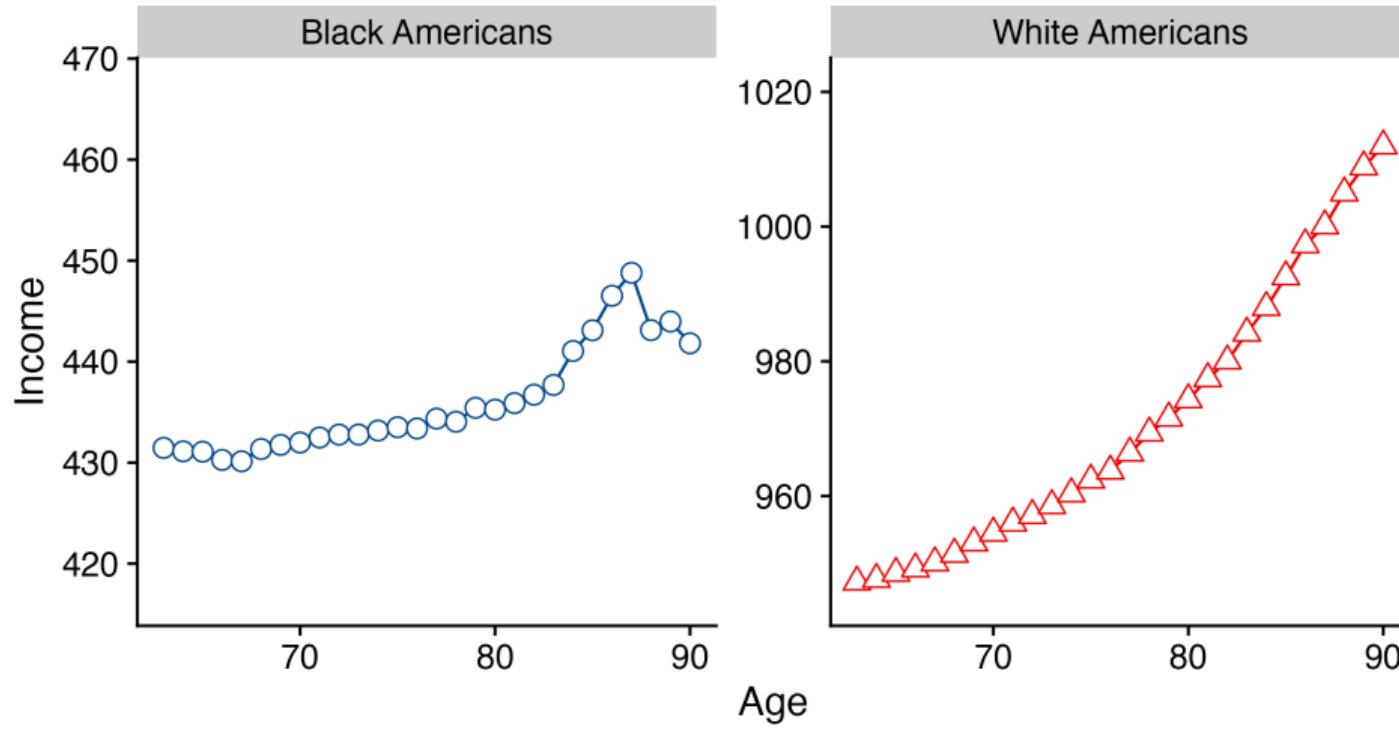


Changing educational composition of survivors (percentile)

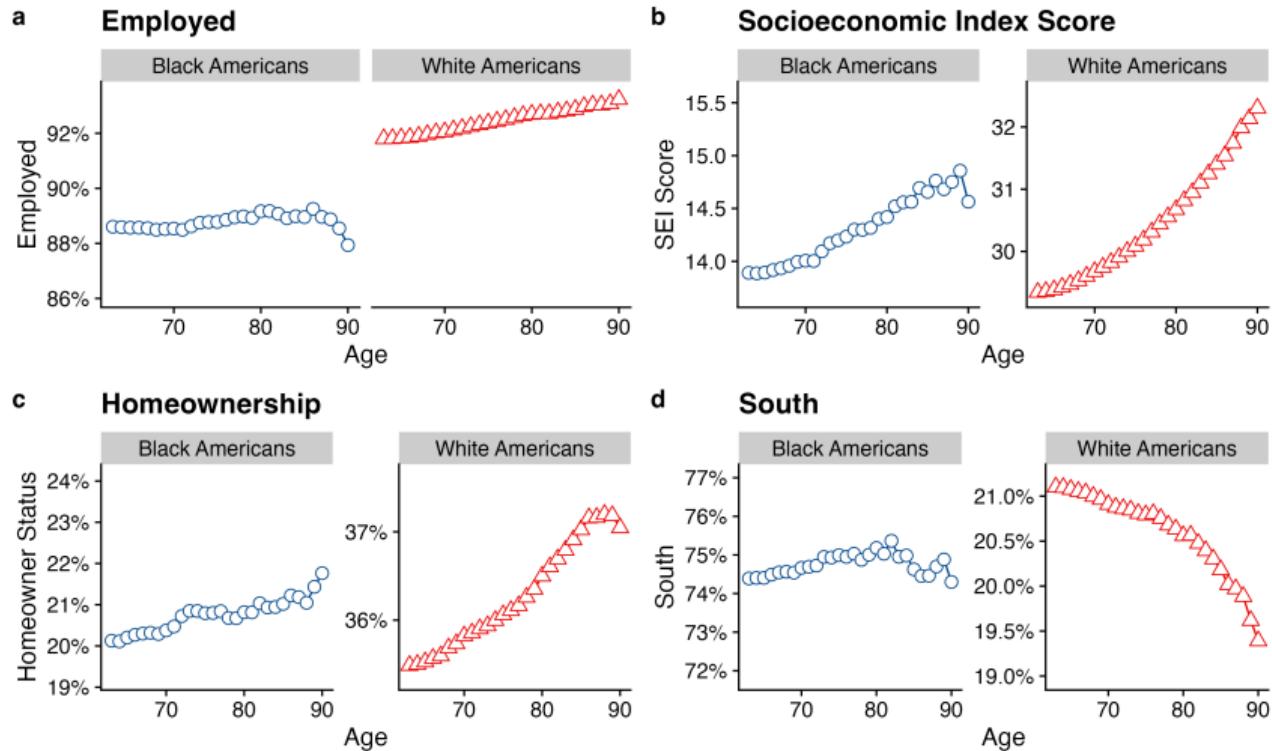


Changing composition of survivors

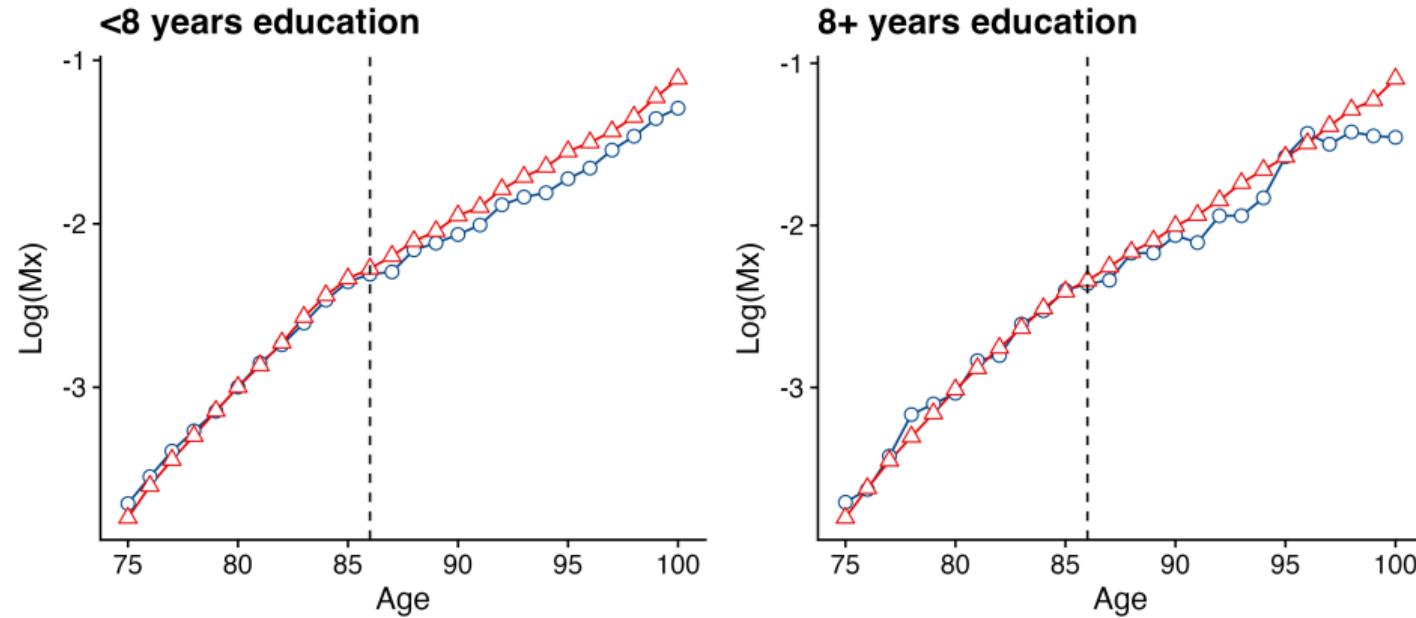
Wage and Salary Income



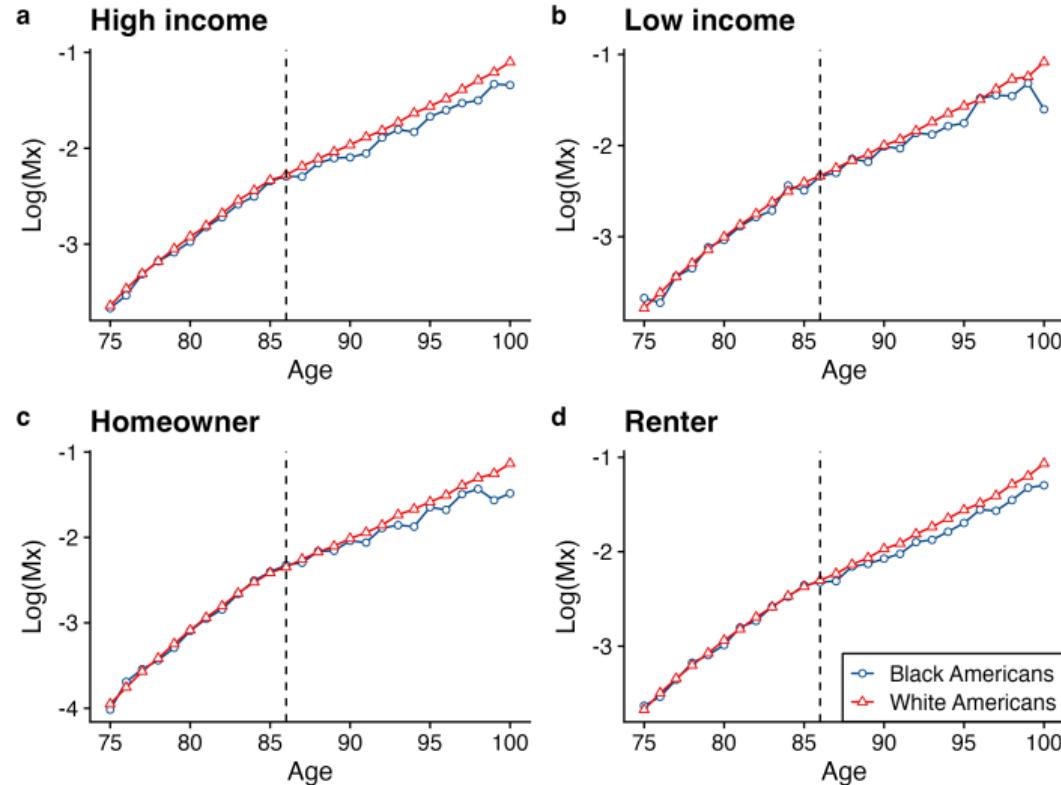
Changing composition of survivors



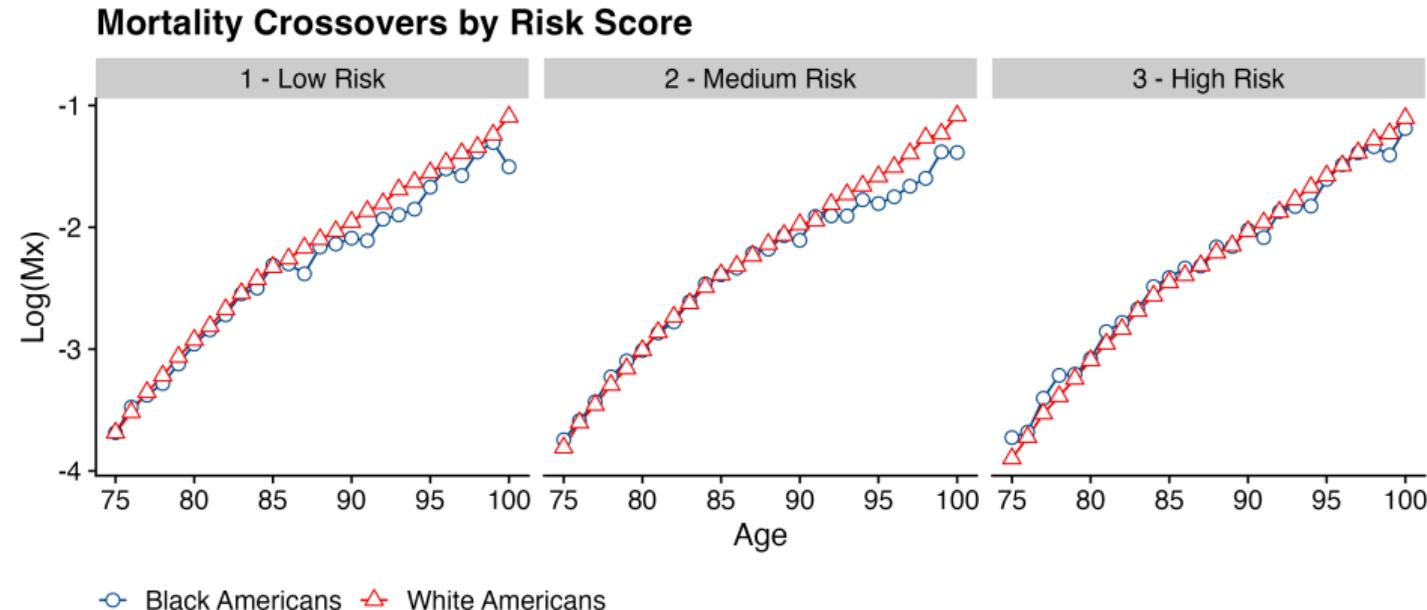
Stratifying by dimensions of frailty



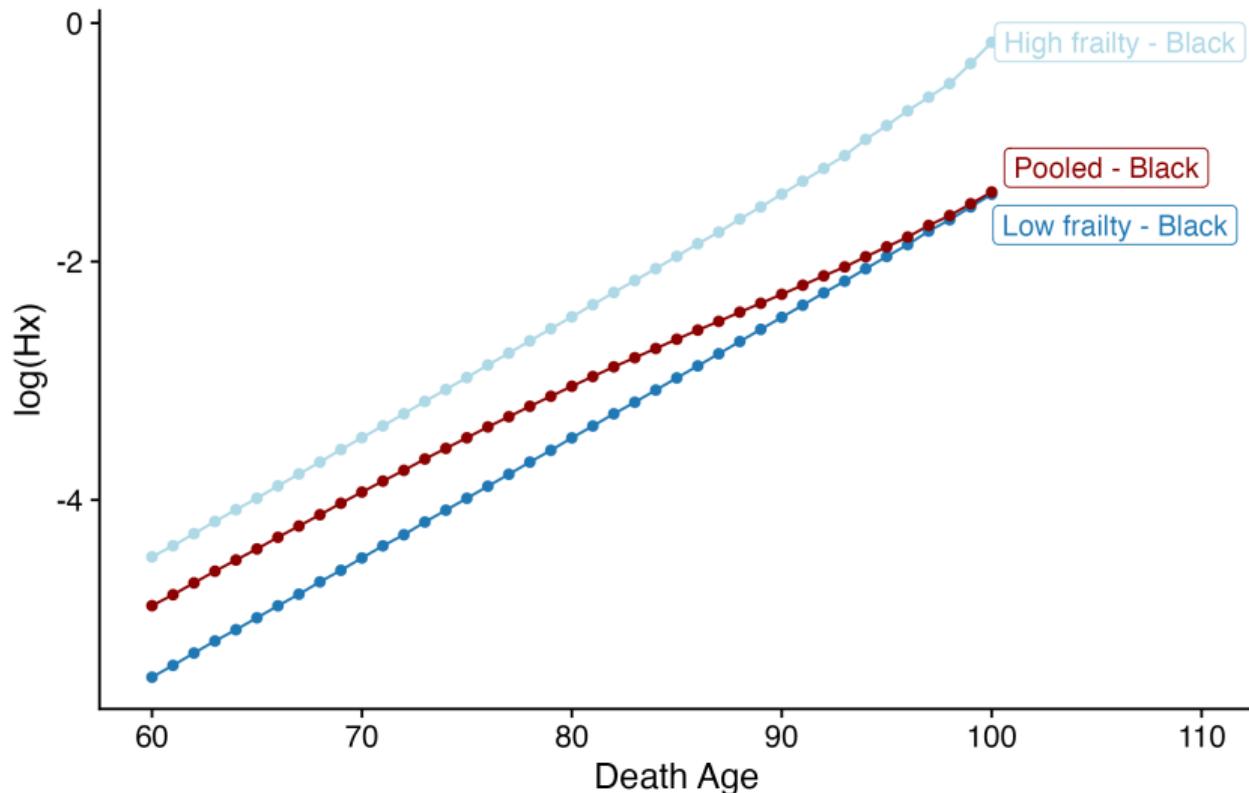
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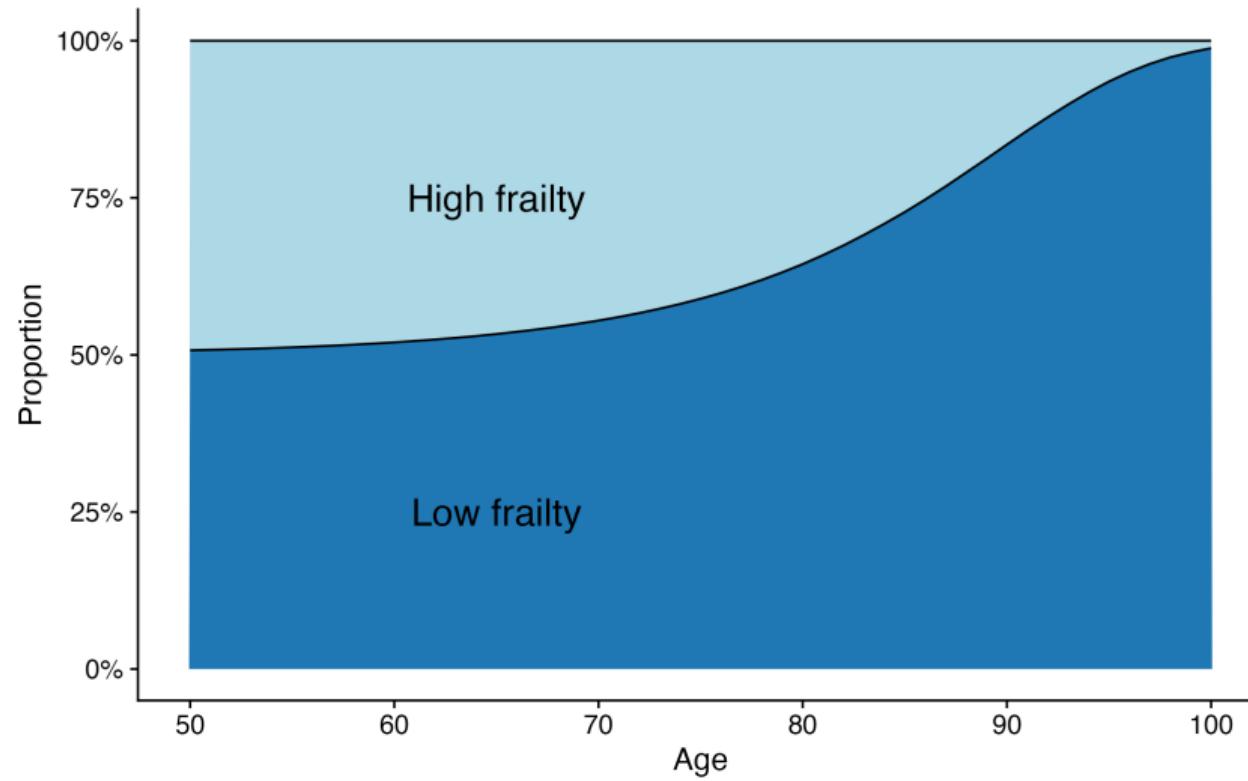
Stratifying on risk score



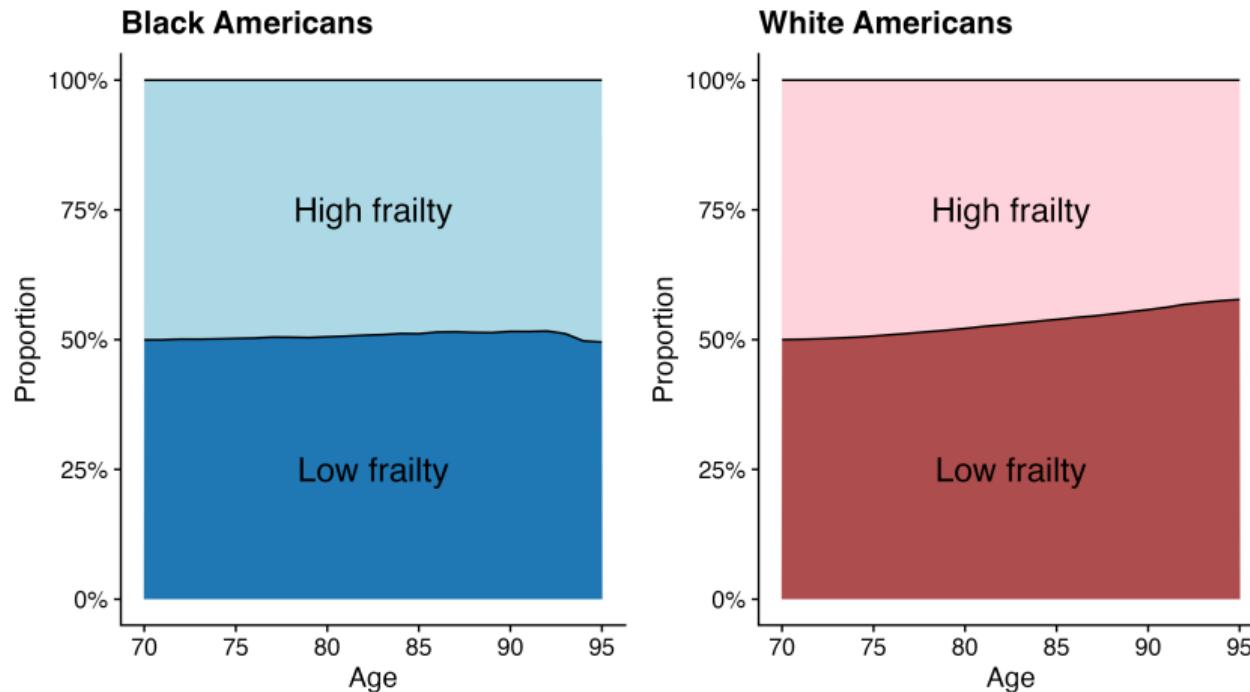
How much selection would we need? (Simulation)



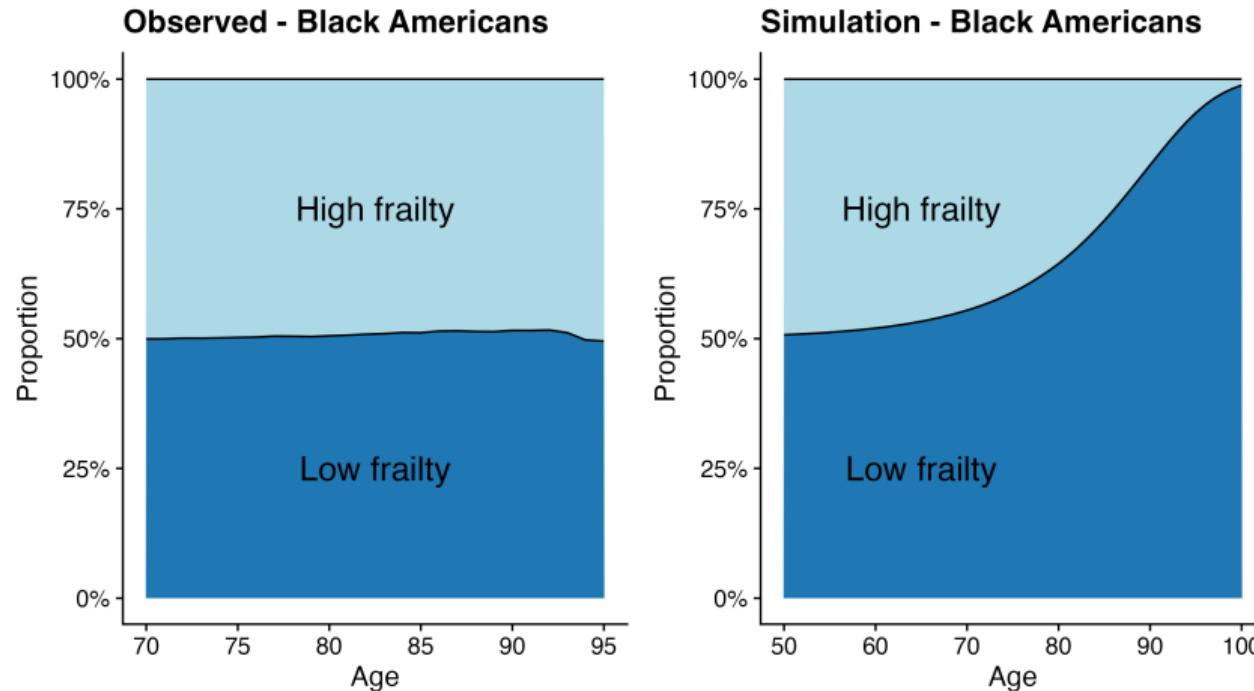
How much selection would we need for Blacks? (Simulation)



How much selection do we actually observe? Very little



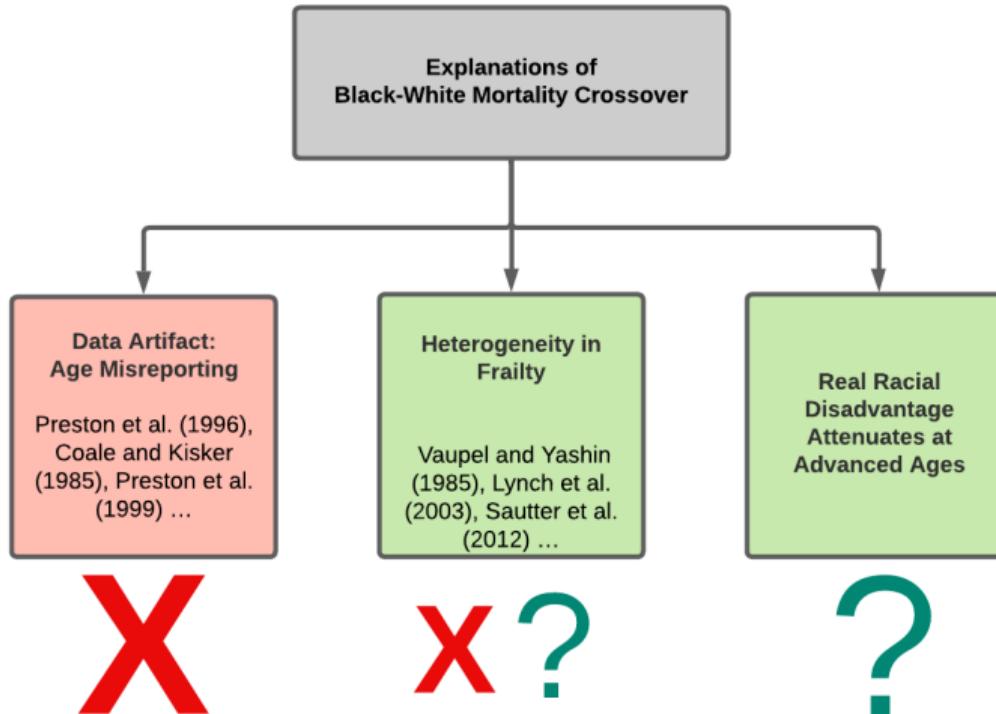
Nowhere near enough for crossover...



No support for heterogeneity in frailty explanation

1. Very little mortality selection
 - ▶ Based on simulation, nowhere near enough selection
2. Mortality selection stronger for White Americans than Black Americans
 - ▶ Cause a widening — not convergence/crossover — of mortality rates

Revisiting explanations...



Speculating on racial disadvantage at most advanced ages...

- ▶ Still backdrop of immense **racial discrimination**
- ▶ Black Americans have higher proximity to kin (**Spring, Crowder, et al. 2023**)
- ▶ Better mental health and strong coping resources for Black Americans

Do Racial Differences in Coping Resources Explain the Black–White Paradox in Mental Health? A Test of Multiple Mechanisms

Patricia Louie¹, Laura Upenieks², Christy L. Erving³, Courtney S. Thomas Tobin⁴

¹University of Washington, Seattle, WA, USA

²Baylor University, Waco, TX, USA

³Vanderbilt University, Nashville, TN, USA

⁴UCLA, Los Angeles, CA, USA

Abstract

A central paradox in the mental health literature is the tendency for black Americans to report similar or better mental health than white Americans despite experiencing greater stress exposure. However, black Americans' higher levels of certain coping resources may explain this finding. Using data from the Nashville Stress and Health Study ($n = 1,186$), we examine whether black Americans have higher levels of self-esteem, social support, religious attendance, and divine control than white Americans and whether these resources, in turn, explain the black–white paradox in mental health. In adjusted models, the black–white paradox holds for depressive symptoms and any *DSM-IV* disorder. Findings indicate that black Americans have higher levels of self-esteem, family social support, and religiosity than white Americans. Causal mediation techniques reveal that self-esteem has the largest effect in explaining black–white differences in depressive symptoms, whereas divine control has the largest effect in explaining differences in disorder.

Conclusions

- ▶ Black-White Crossover is real — *not **data artifact***

Conclusions

- ▶ Black-White Crossover is real — *not data artifact*
- ▶ No support for **heterogeneity in frailty** explanation
 - ▶ Not educational attainment, not income, not wealth, not risk score
 - ▶ However, other dimensions of heterogeneity might be responsible (biomarkers, self-rated health)

Conclusions

- ▶ Black-White Crossover is real — *not **data artifact***
- ▶ No support for **heterogeneity in frailty** explanation
 - ▶ Not educational attainment, not income, not wealth, not risk score
 - ▶ However, other dimensions of heterogeneity might be responsible (biomarkers, self-rated health)
- ▶ Attenuation of disadvantage: **Intriguing**, but need more theoretical and empirical work
- ▶ New explanations are needed (!)

What's next?

Racial **inequality** in health/mortality outcomes

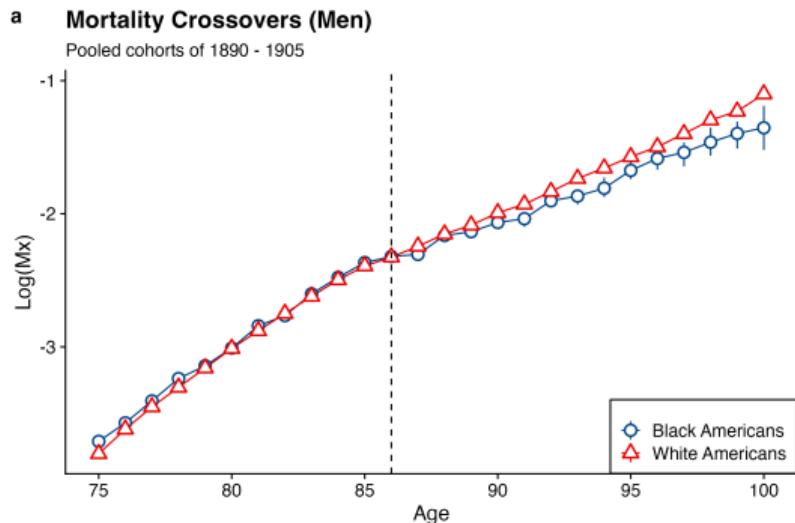
- ▶ Are other health inequalities (i.e., morbidity, dementia) increasing or decreasing at most advanced ages? Gender differences?
- ▶ Investigating selection along other dimensions (height/weight, biomarkers)?
- ▶ More formal demography incorporating sociological theory (e.g., weathering / cumulative disadvantage, dynamic frailty)

Thank you — questions?

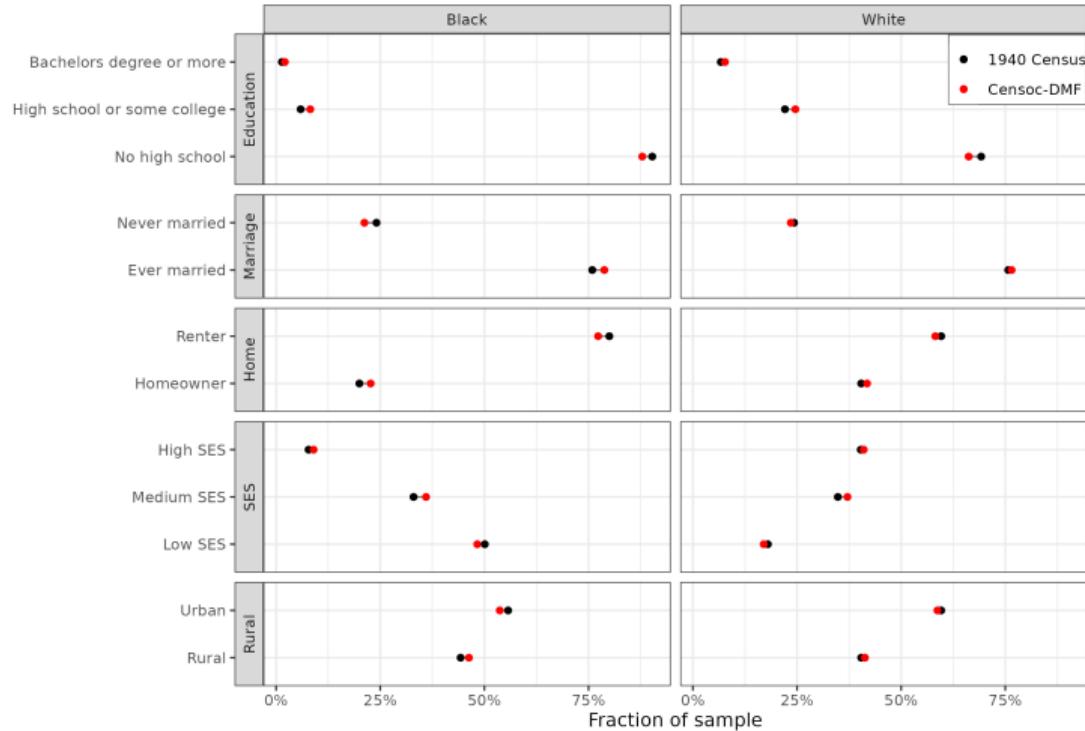
Data: CenSoc.Berkeley.edu

Funding: R01AG058940, R01AG076830

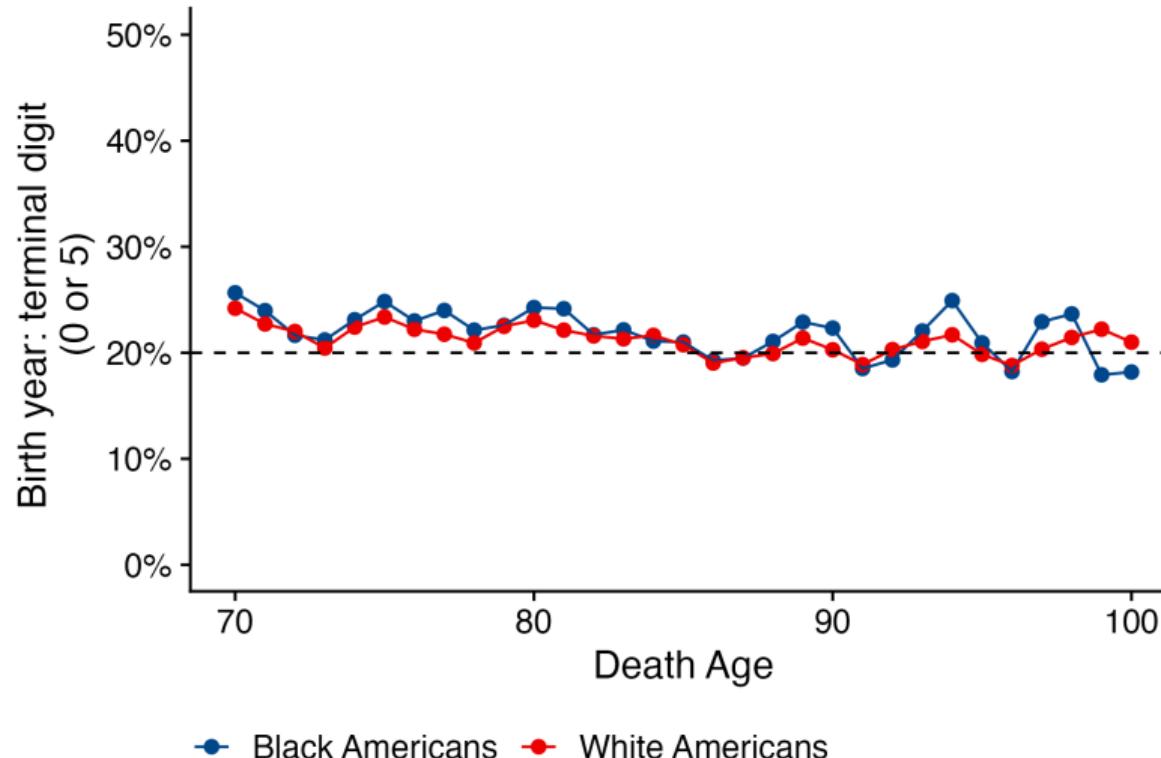
Contact: ✉ casey.breen@demography.ox.ac.uk



Representativeness



Age heaping



Birth cohorts of 1906-1915: Gompertz Hazard Model

$$h(x) = \mathbf{a}e^{\mathbf{b}x} \quad (2)$$

- ▶ $h(x)$ = hazard at age x . “Force of mortality”

Birth cohorts of 1906-1915: Gompertz Hazard Model

$$h(x) = \mathbf{a} e^{\mathbf{b}x} \quad (2)$$

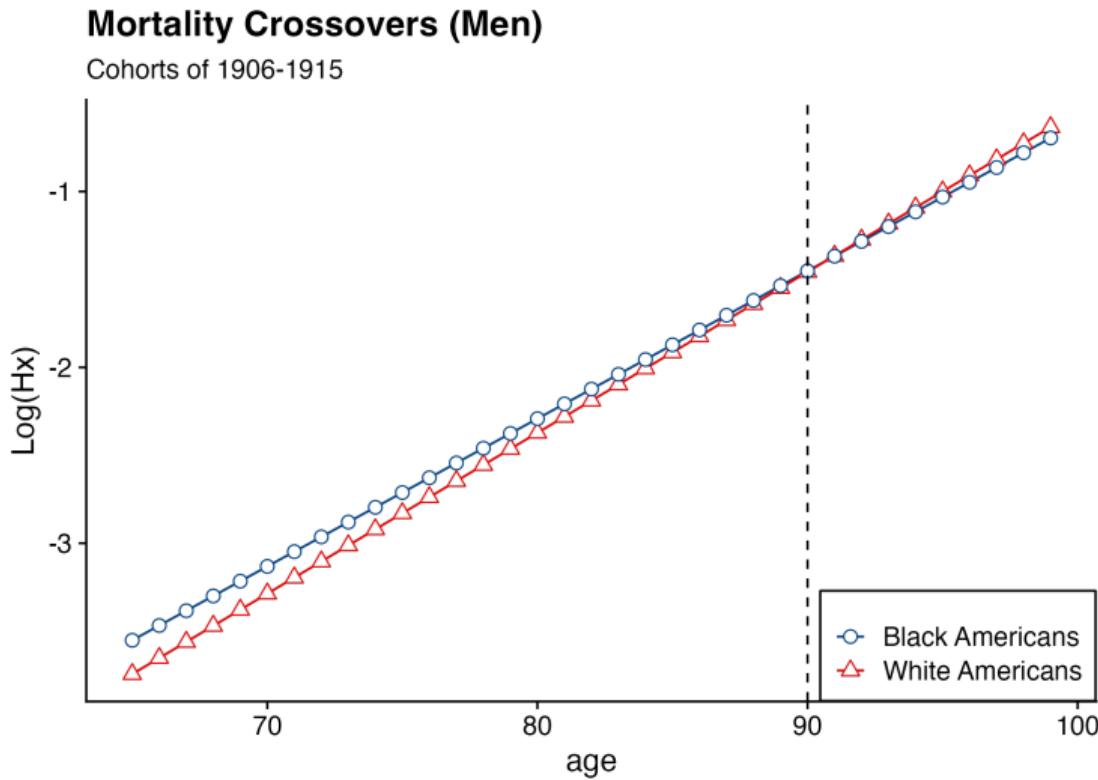
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- ▶ **a is baseline mortality**

Birth cohorts of 1906-1915: Gompertz Hazard Model

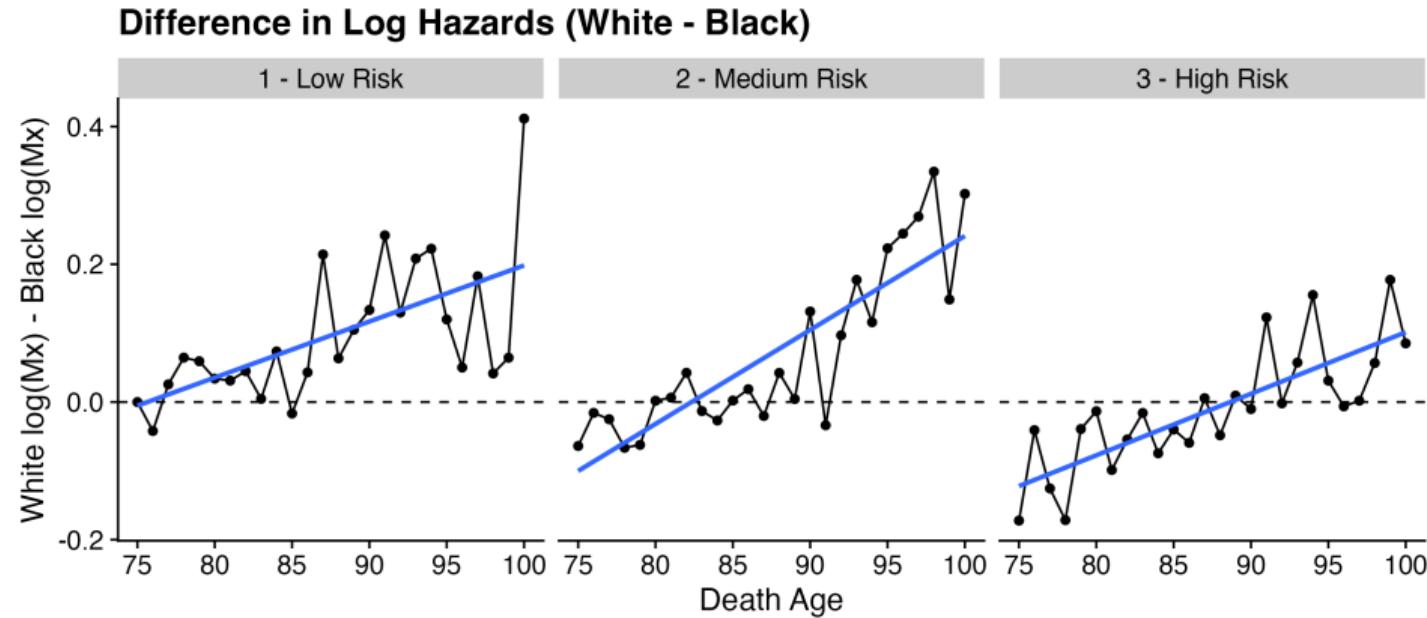
$$h(x) = \mathbf{a} e^{\mathbf{b}x} \quad (2)$$

- ▶ $h(x)$ = hazard at age x . “Force of mortality”
- ▶ **a is baseline mortality**
- ▶ **b is rate of increase of mortality**

Black-white crossover (Gompertz Hazard Model)



Stratifying on risk score



Representativeness of samples

	General Pop		CenSoc-DMF		CenSoc-DMF Siblings	
	No.	%	No.	%	No.	%
Educational Attainment						
<High School	4951782	67.3	608639	64.7	26137	66.7
High School or some college	1783203	24.3	247103	26.3	10133	25.9
Bachelors Degree	339072	4.6	48024	5.1	1664	4.2
Advanced Degree	162122	2.2	24559	2.6	820	2.1
NA	117086	1.6	12091	1.3	441	1.1
Race						
Black	656027	8.9	34159	3.6	278	0.7
Other	27778	0.4	3296	0.4	43	0.1
White	6669460	90.7	902961	96.0	38874	99.2
Marital Status						
Married	7013184	95.4	905924	96.3	38102	97.2
Not married	340081	4.6	34492	3.7	1093	2.8
Homeownership						
Homeowner	1780906	24.2	249379	26.5	11553	29.5
Not Homeowner	5572359	75.8	691037	73.5	27642	70.5
Socioeconomic Status Indicator						
Sei 1-9	1293523	17.6	138209	14.7	5513	14.1
Sei 10-14	1170543	15.9	149673	15.9	7962	20.3
Sei 15-25	1862967	25.3	246484	26.2	10028	25.6
Sei 26+	2776321	37.8	380226	40.4	14745	37.6
NA	249911	3.4	25824	2.7	947	2.4
Rural						
Rural	3183160	43.3	397739	42.3	19754	50.4
Urban	4170105	56.7	542677	57.7	19441	49.6
Frailty						
Empirical testing						

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