### Gompertz 200. Celebrating Two Centuries of Longevity Research

# Fifty Years of Research on the Gompertz Law: Key Insights and Lessons Learned

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#### Our brief self-introduction

#### This year marks the 50th anniversary of our scientific union

- We met as students at the Moscow State University (Chemistry department), Russia, and found a common interest in understanding the mechanisms of human aging, with a hope to find ways for extending healthy life.
- We were inspired by the scientific approach of Nobel laureate Nikolay Semyonov, who demonstrated that the mechanisms of chemical reactions can be studied through the clever quantitative analysis of reaction kinetics over time.



Moscow, March 14, 1975

We decided to apply this approach to studies of aging and mortality by quantitative analysis of mortality kinetics (mortality laws). And the Gompertz law was the most important mortality law.

### Our first publication in Journal of General Biology (1978) on reliability model explaining three empirical mortality laws

> Zh Obshch Biol. 1978 Sep-Oct;39(5):734-42.

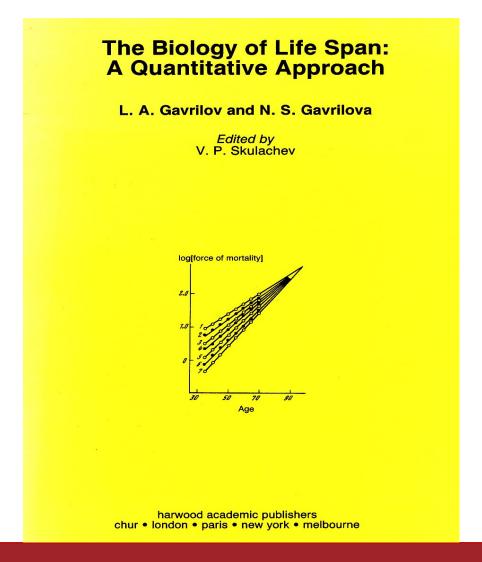
#### [Basic patterns of aging and death in animals from the standpoint of reliability theory]

[Article in Russian]

L A Gavrilov, N S Gavrilova, L S laguzhinskiĭ

PMID: 716614

### This book published in 1991 summarized our earlier studies of the Gompertz law



### The Gompertz Law

Risk of death increases exponentially with age.

$$\mu(x) = R e^{\alpha x}$$

R – intercept coefficient (in semi-log scale)

 $\alpha$  – slope coefficient (in semi-log scale)

x - age

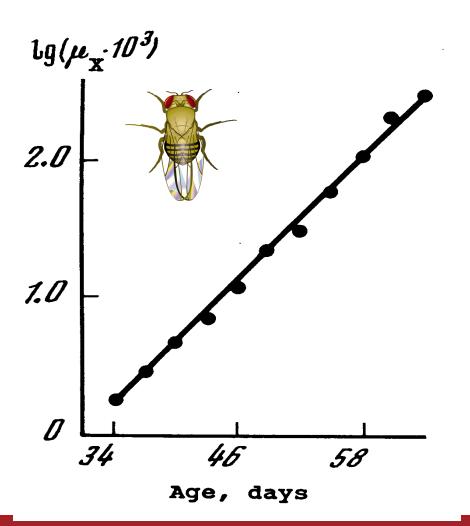
#### Our "Zoo of Death"

### Collection of published life tables for various species

### Collection of human complete life tables

We believe that this collection inspired John Wilmoth to create his Berkeley Mortality Database (later transformed to the Human Mortality Database)

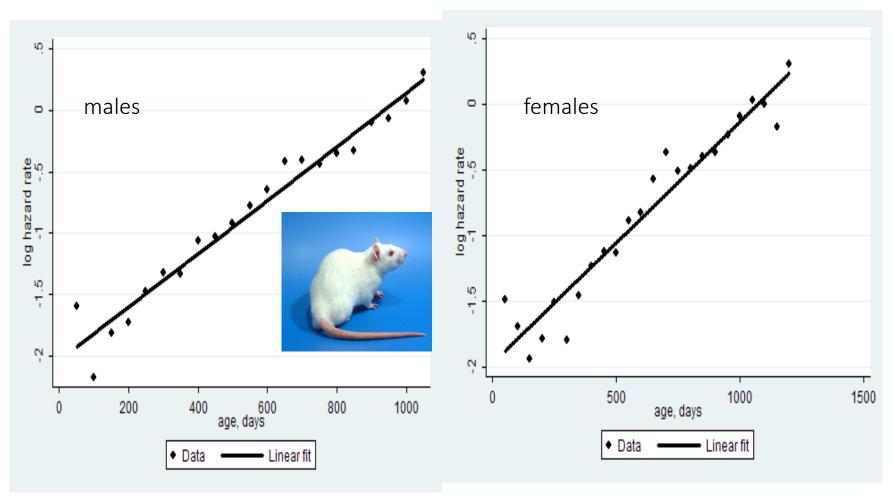
#### **Gompertz Law of Mortality in Fruit Flies**



Based on the life table for 2400 females of *Drosophila melanogaster* published by Hall (1969).

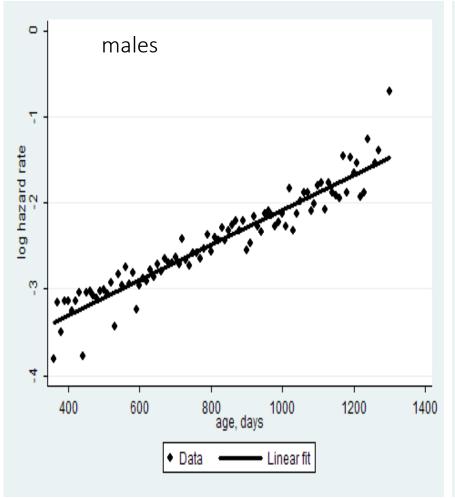
Source: Gavrilov, Gavrilova, "*The Biology of Life Sparl*" 1991

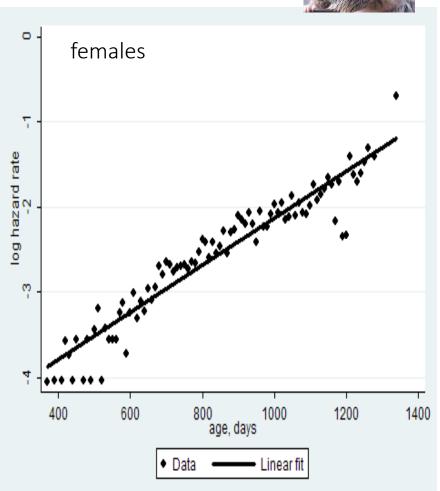
### Mortality of Wistar rats



- Actuarial estimate of hazard rate with 50-day age intervals
- Data source: Weisner, Sheard, 1935

### **Mortality of mice (log scale)**Miller data





Actuarial estimate of hazard rate with 10-day age intervals

### The Gompertz-Makeham Law

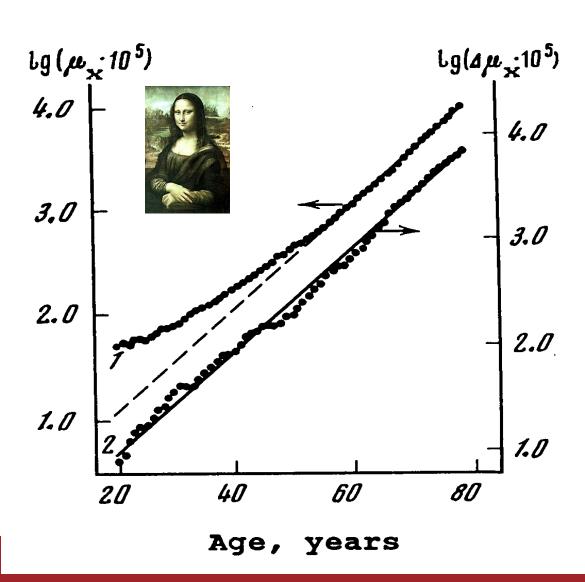
Death rate is a sum of age-independent component (Makeham term) and age-dependent component (Gompertz function), which increases exponentially with age. Important for historical human data.

$$\mu(x) = A + R e^{ax}$$

risk of death

A – Makeham term or background mortality  $R e^{ax}$  – age-dependent mortality; x - age

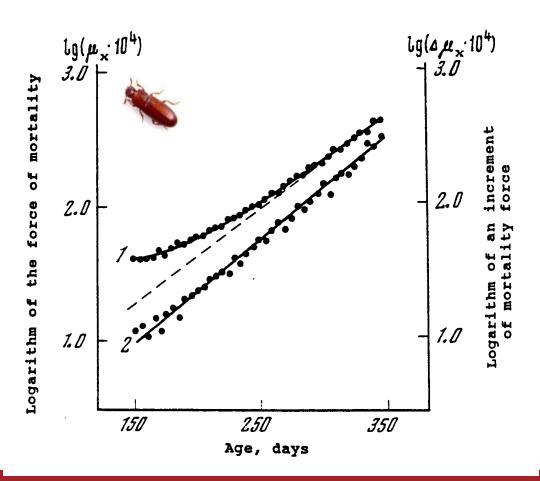
### **Gompertz-Makeham Law of Mortality in Italian Women**



Based on the official Italian period life table for 1964-1967.

Source: Gavrilov, Gavrilova, "*The Biology of Life Span*" 1991

### **Gompertz-Makeham Law of Mortality** in Flour Beetles



Based on the life table for 400 female flour beetles (*Tribolium confusum* Duval). published by Pearl and Miner (1941).

Source: Gavrilov, Gavrilova, "The Biology of Life Spart" 1991

### Comparison of Gompertz law with competing Weibull mortality law

Statistical analysis of 290 human populations and 129 life tables of fruit flies revealed that the Gompertz law describes mortality better than competing Weibull law used to fit failure rates of technical systems (Gavrilov, Gavrilova, 1991).

# The Strehler-Mildvan Correlation (*Science*, 1960): Inverse correlation between the Gompertz parameters

Limitation: Did not take into account the Makeham parameter that leads to spurious correlation.

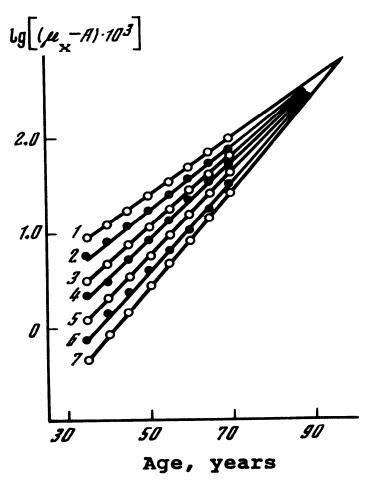
Our simulation study showed that this correlation was caused by varying values of the Makeham term

### The Second Mortality Law: Compensation Law of Mortality (late-life mortality convergence)

In 1978, we described the phenomenon of the compensation effect of mortality, where Gompertz mortality trajectories tend to converge in semi-logarithmic coordinates around age 95.

### **Compensation Law of Mortality**

Convergence of Mortality Rates with Age

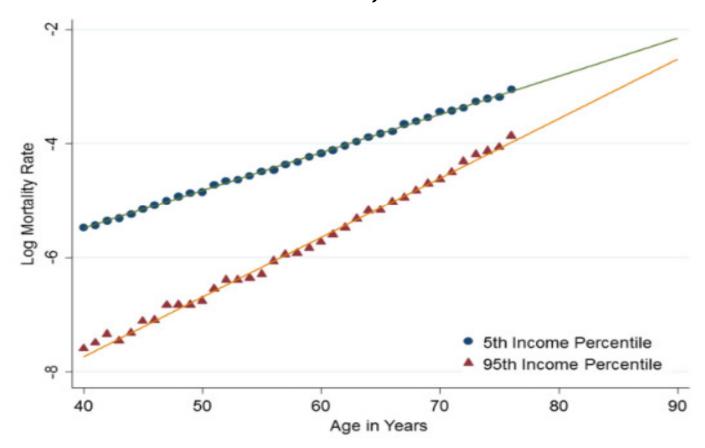


- 1 India, 1941-1950, males
- 2 Turkey, 1950-1951, males
- 3 Kenya, 1969, males
- 4 Northern Ireland, 1950-1952, males
- 5 England and Wales, 1930-1932, females
- 6 Austria, 1959-1961, females
- 7 Norway, 1956-1960, females

Source: Gavrilov, Gavrilova, "The Biology of Life Sparl" 1991

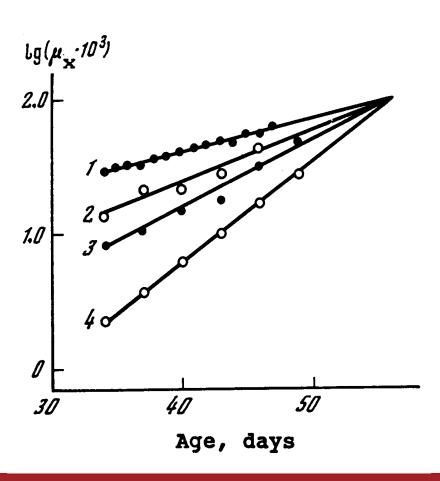
### **Compensation Law of Mortality**

The Association Between Income and mortality of men in the United States, 2001-2014



Source: Chetty et al., JAMA. 2016;315(16):1750-1766. doi:10.1001/jama.2016.4226

### Compensation Law of Mortality in Laboratory *Drosophila*

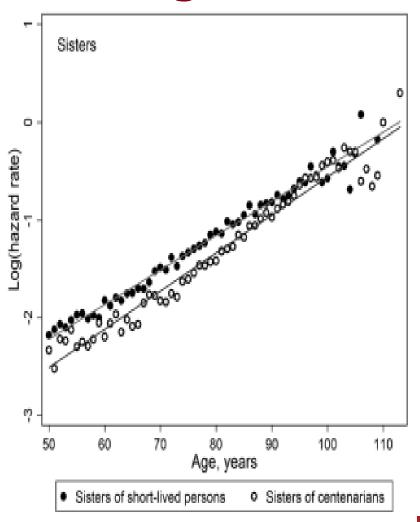


- 1 drosophila of the Old Falmouth, New Falmouth, Sepia and Eagle Point strains (1,000 virgin females)
- 2 drosophila of the Canton-S strain (1,200 males)
- 3 drosophila of the Canton-S strain (1,200 females)
- 4 drosophila of the Canton-S strain (2,400 virgin females)
- Mortality force was calculated for 6-day age intervals.

Source: Gavrilov, Gavrilova,

"The Biology of Life Span" 1991

### Compensation effect of mortality is a challenge to life extension



Even familial longevity does not help to decrease mortality after age 100 years.

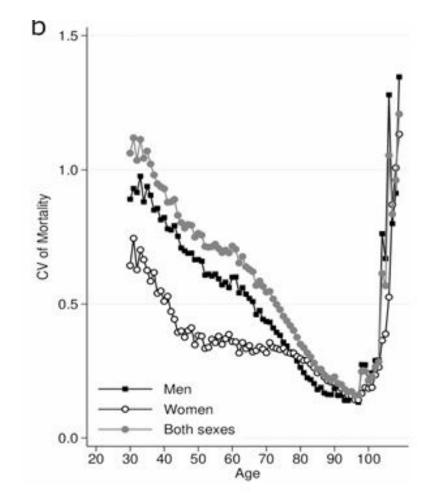
Source: Gavrilova N.S., Gavrilov L.A.

Protective Effects of Familial Longevity
Decrease With Age and Become
Negligible for Centenarians. Journal of
Gerontology – Series A, 2022,
Vol.77(4): 736-743.

Some researchers challenged this finding, suggesting that the effect was merely an artifact of spurious correlation between biased estimates of Gompertz parameters (Tarkhov, 2017).

However, our recent studies confirmed the existence of the compensation effect, with the convergence point aligning with minimal mortality variation.

The age of convergence point called the species-specific lifespan did not change over the last 50 years and is equal to 95-98 years (Gavrilov et al., 1978, Gavrilov, Gavrilova, 2022, Milevsky, 2020)



Mortality data for 44 human populations. Data Source: Human Mortality Database

Source: Gavrilova, Gavrilov,

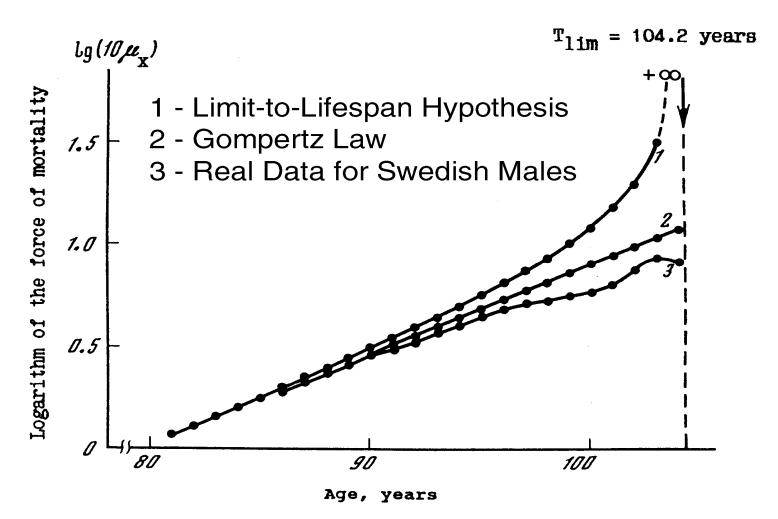
Biogerontology, 2024

### The Third Mortality Law: The Late-Life Mortality Deceleration

(Mortality Leveling-off, Mortality Plateaus)

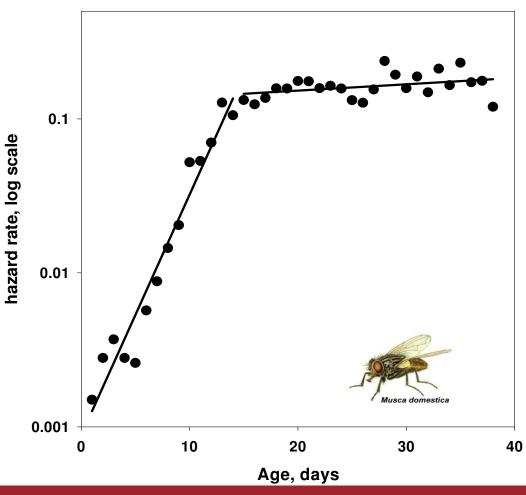
In our 1991 book "The Biology of Life Span", we described the phenomenon of late-life mortality deceleration, where mortality rates deviate downwards from the Gompertz law at very advanced ages.

#### **Testing the "Limit-to-Lifespan" Hypothesis**



Source: Gavrilov L.A., Gavrilova N.S. 1991. The Biology of Life Span

#### Mortality Leveling-Off in House Fly Musca domestica



Based on life table of 4,650 male house flies published by Rockstein & Lieberman, 1959

#### Studies by demographers after 1991

This concept gained significant attention among demographers in the 1990s. Some demographers believed that they can present mortality deceleration as a kind of their discovery. They published articles on mortality deceleration for insects and humans.

They wrote literally the following: "Mortality deceleration came as a surprise, indeed as a shock, to many biologists and gerontologists..." *Between Zeus and the Salmon*, 1997, p.25

This is despite extensive publications by gerontologists G. Sacher and A. Economos on mortality deceleration in the 1960s and 1970s.

Earlier studies by actuaries (Perks, Beard) were not cited either.

We decided to inform the scientific community at the 2003 International Symposium "Living to 100"

### HUMAN BIOLOGY

arecord of research

FEBRUARY, 1939

**VOL. 11** 



No. 1

#### THE BIOSTATISTICS OF SENILITY

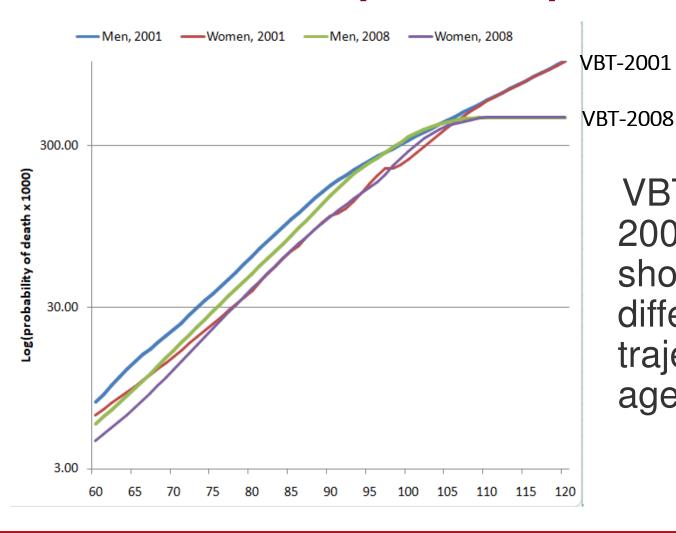
BY MAJOR GREENWOOD AND J. O. IRWIN

"the increase of mortality rate with age advances at a slackening rate, that nearly all, perhaps all, methods of graduation of the type of Gompertz's formula over-state senile mortality."

"... possibility that with advancing age the rate of mortality asymptotes to a finite value."

"... The limiting values of  $q_{\sigma}$  are 0.439 for women and 0.544 for men. Some tests of the ultimate mortalities in non-human experience were not unfavorable."

### Mortality in Valuation Basic Tables (VBT) for Non-Smokers by the Society of Actuaries



VBT tables in 2001 and 2008 show totally different trajectories after age 100 years

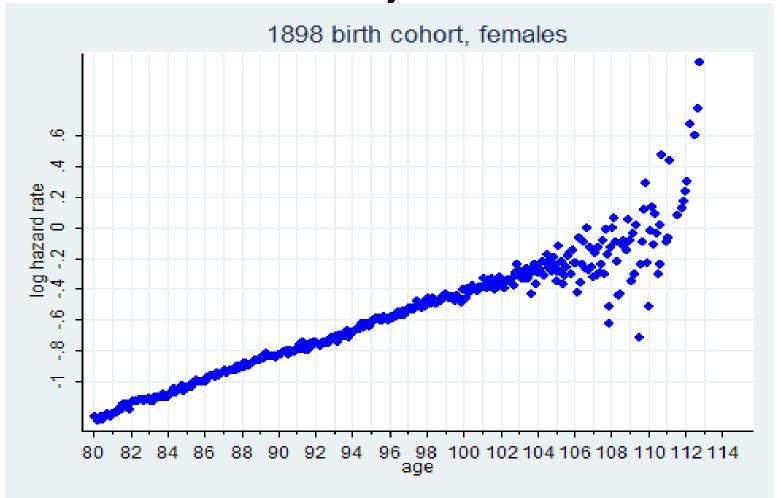
### **Further Developments**

A Study of Extinct Birth Cohorts in the United States (2004)

Data from the Social Security Death Index. In 2004 it was publicly available on website. We collected data using web fetching technique

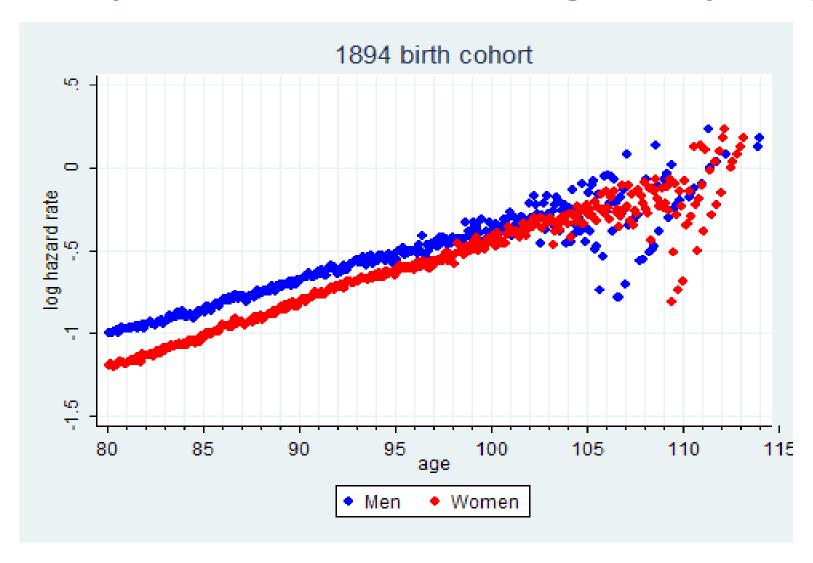
Later the last complete version of SSA Death Master File was officially obtained from the U.S. National Technical Information Service (NTIS)

### Birth cohort mortality, SSA Death Master File (DMF) data Where is Mortality Deceleration?



Nelson-Aalen monthly estimates of hazard rates using Stata 11

#### Mortality of men and women converge at very old age



#### Gompertz model of old-age mortality

Study of 20 single-year extinct U.S. birth cohorts based on the Social Security Administration Death Master File (DMF) found no mortality deceleration up to ages 105-106 years (Gavrilova, Gavrilov, 2011).

However, data quality problems did not allow us to study mortality trajectories after age 107 or 110 years using this source of data.

#### MORTALITY MEASUREMENT AT ADVANCED AGES: A STUDY OF THE SOCIAL SECURITY ADMINISTRATION DEATH MASTER FILE

Leonid A. Gavrilov\* and Natalia S. Gavrilova<sup>†</sup>

#### ABSTRACT

Accurate estimates of mortality at advanced ages are essential to improving forecasts of mortality and the population size of the oldest old age group. However, estimation of hazard rates at extremely old ages poses serious challenges to researchers: (1) The observed mortality deceleration

NORTH AMERICAN ACTUARIAL JOURNAL, VOLUME 15, NUMBER 3

North American Actuarial Journal, 2011, 15(3):432-447

Featured in the Wall Street Journal:

#### THE WALL STREET JOURNAL.

THE NUMBERS GUY | March 2, 2012, 7:00 p.m. ET

Death Gets in the Way of Old-Age Gains



By CARL BIALIK

#### The second studied dataset: U.S. cohort death rates taken from the Human Mortality Database, our 2014 study

Journals of Gerontology: BIOLOGICAL SCIENCES Cite journal as: J Gerontol A Biol Sci Med Sci doi:10.1093/gerona/glu009 © The Author 2014. Published by Oxford University Press on behalf of The Gerontological Society of America.

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### Biodemography of Old-Age Mortality in Humans and Rodents

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The growing number of persons living beyond age 80 underscores the need for accurate measurement of mortality at advanced ages and understanding the old-age mortality trajectories. It is believed that exponential growth of mortality

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### Problem of mortality estimation at older ages

Age misreporting

Study by Preston group found that age misreporting results in spurious mortality deceleration

#### **Hypothesis**

Mortality deceleration at advanced ages among old DMF cohorts (born before 1886) may be caused by poor data quality (age exaggeration) at very advanced ages

If this hypothesis is correct then mortality deceleration at advanced ages should be less expressed for data with better quality

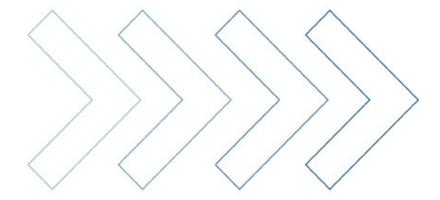
## What is the quality of age reporting in SSA Death Master File across ages and birth cohorts?

Our 2018 study of data quality for five singleyear birth cohorts

Supported by the Society of Actuaries

#### More details are available in a special report by the SOA





## Mortality Analysis of 1898-1902 Birth Cohort



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#### Study Design

Five single-year birth cohorts: 1898, 1899, 1900, 1901, 1902

Direct age validation of DMF samples randomly selected at ages 100, 103, 105 and 109+ years

Sample sizes: 100 records for ages 100-105 years

For age group 109+ years – all records

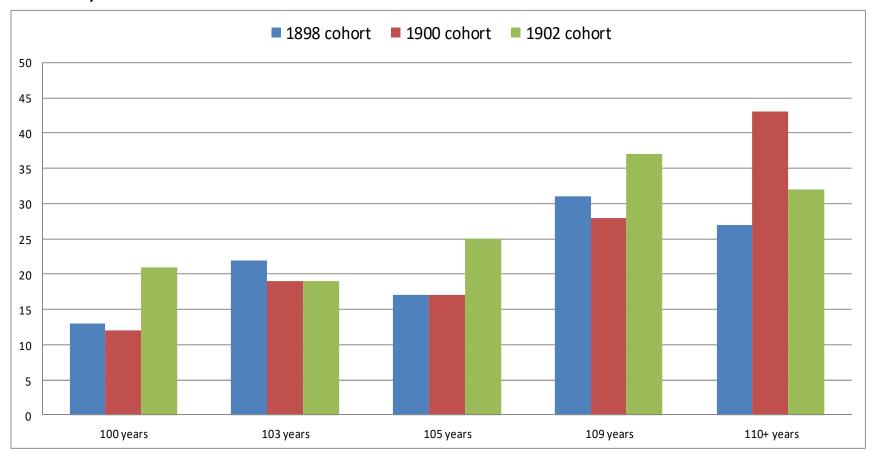
#### Age validation procedure

Age validation was conducted by linkage of DMF records to early historical sources (U.S. censuses, birth and marriage records, draft registration cards).

DMF records were scored according to reliability of age reporting. The scoring system included the following scores:

- 1 several early historical sources agree about birth date
- 2 one early historical sources agrees about birth date
- 3 later sources agree about birth date
- 4 early sources disagree
- 5 foreign-born individual arrived in the U.S. later in life
- 6 not found in any sources

## Percent of records with questionable quality as a function of age. 1898, 1900 and 1902 birth cohorts



Results of age validation study for samples of 100 records, by age group. For ages 109 and 110+ years sample sizes were slightly higher than 100.

#### **Further development**

Direct age validation of all records at ages 105 and over for those born in 1900, our 2019 study



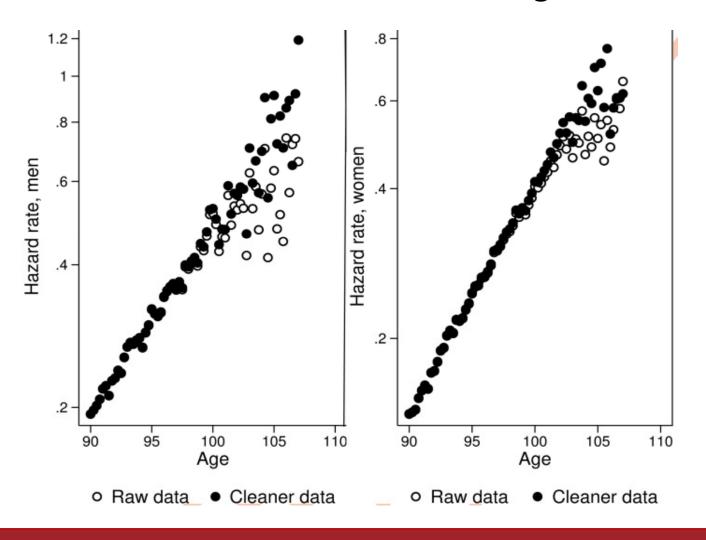
PRIMER

Late-life mortality is underestimated because of data errors

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## Mortality of U.S. men (left) and women (right) born in 1900 before and after data cleaning



Source: Gavrilov, Gavrilova, PLOS Biology, 2019.

Data: 1900 DMF birth cohort cleaned after age 104 years of age using linkage to historical documents

#### **Conclusion:**

# Age misreporting produces spurious mortality deceleration

#### Hypothesis

Mortality deceleration at advanced ages may be caused by poor data quality (age exaggeration) at very advanced ages

If this hypothesis is correct then mortality deceleration should be more prevalent among historically older birth cohorts

## In 2019 we found a new trend in old-age mortality using U.S. cohort data: Transition from mortality deceleration to the Gompertz trajectory

Of General Interest / Viewpoint



Gerontology 2019;65:451–457 DOI: 10.1159/000500141 Received: January 28, 2019 Accepted: April 4, 2019 Published online: May 20, 2019

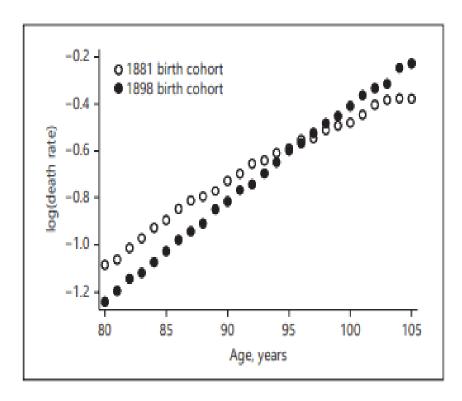
#### New Trend in Old-Age Mortality: Gompertzialization of Mortality Trajectory

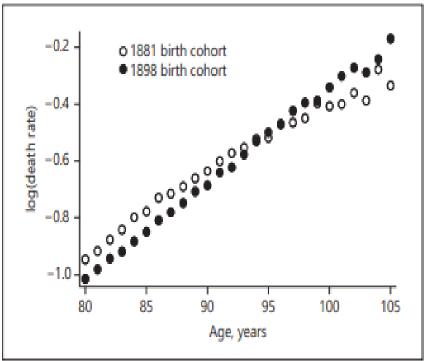
Leonid A. Gavrilov Natalia S. Gavrilova

Academic Research Centers, NORC at the University of Chicago, Chicago, IL, USA

#### **Transition to the Gompertz model**

Mortality of U.S. women (left) and men (right) in earlier and later birth cohorts





Source: Gavrilov, Gavrilova, New Trend in Old-Age Mortality: Gompertzialization of Mortality Trajectory, *Gerontology*, 2019.

#### Is this trend observed in other countries?

- We analyzed mortality for nine countries with relatively large populations in order to have sufficient number of survivors beyond age 100: Australia, Belgium, Canada, France, Italy, Japan, Spain, United Kingdom and USA.
- For all nine studied countries we analyze mortality of 1880-1902 single-year birth cohorts for men and women separately

#### Methods

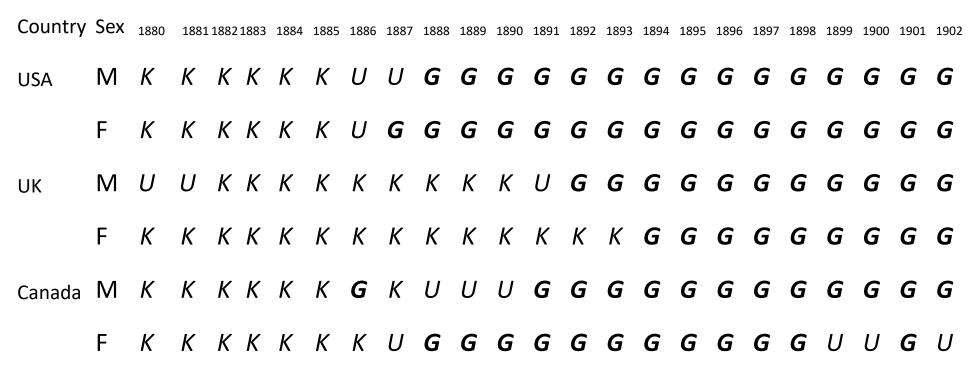
- We fit mortality for two competing models: the Gompertz model and the Kannisto (mortality deceleration) model using weighted non-linear regression method in the age interval 80-105 years (*nlin* procedure in Stata). Values of exposure were used as weights.
- Akaike Information Criterion (AIC) is used to evaluate goodness of fit for the Gompertz and the Kannisto models

#### **Gompertzialization:**

#### Transition from mortality deceleration to the Gompertz model

Best models according to AIC differences for 1880-1902 birth cohorts, by country

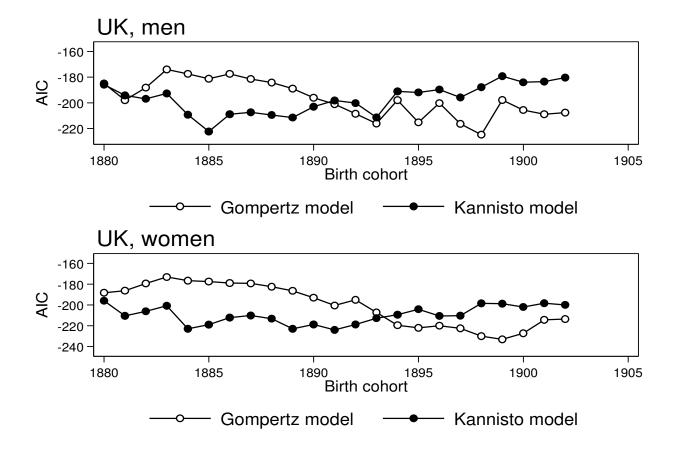
Comparison of Gompertz (G) and Kannisto (K) models. U – uncertain result ( $|\Delta AIC| < 5$ )



## Transition from mortality deceleration to the Gompertz model

1880-1902 UK birth cohorts.

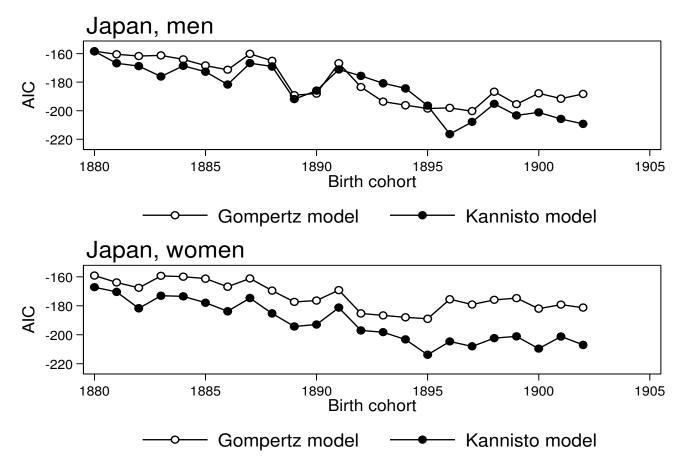
AIC values for fitting Gompertz and Kannisto models



#### No transition to the Gompertz model

1880-1902 Japanese birth cohorts.

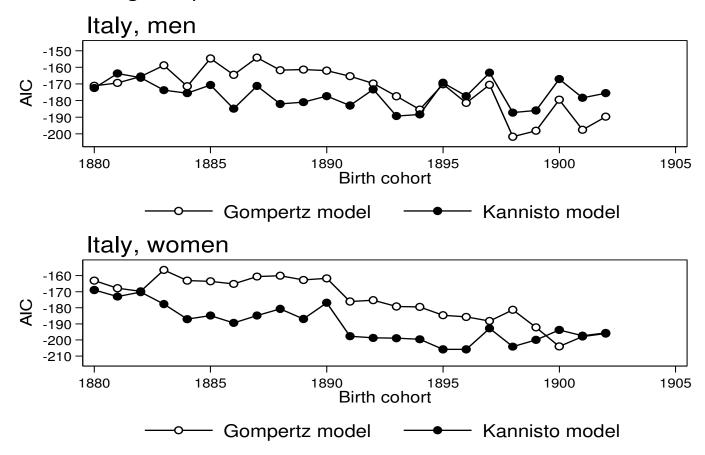
AIC values for fitting Gompertz and Kannisto models



#### Transition to uncertain model in women

1880-1902 Italian birth cohorts.

AIC values for fitting Gompertz and Kannisto models



## Summary of Results (presented at the 2023 SOA Living to 100 Symposium)

Mortality transition pattern	Men	Women
From mortality deceleration to the Gompertz model	Australia, Belgium, Canada, France, Italy, UK, USA	Belgium, UK, USA
From mortality deceleration to uncertain pattern	Spain	Australia, Canada, France, Italy
Mortality deceleration for all studied birth cohorts	Japan	Japan, Spain

#### **Conclusion**

These findings reaffirm the enduring relevance of the Gompertz law as a fundamental tool for describing mortality patterns, even at the most advanced ages.

### Thank you for your attention!



