# Mortality convergence across industrialized countries.

Paris Seminar in Demographic Economics

#### Héctor Pifarré i Arolas (with Hippolyte d'Albis and Loesse Jacques Esso)

Toulouse School of Economics

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#### Question

The question: Has there been convergence in mortality patterns across industrialized countries since 1960?

#### Question

In particular, we study the convergence of the distributions of ages-at-death extracted from the period life tables.

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## Ages-at-death distribution, US 2009



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## Ages-at-death distribution, US and Japan 1960



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## Ages-at-death distribution, US 1960 and 2009



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#### Motivation

- Why do we care?
  - Important for the assessment of *welfare* convergence between countries (Becker et al., 2005).
  - It can be used to improve demographic projections (Li and Lee, 2005).

#### Motivation

Currently, two different approaches:

- Study convergence of certain moments of the distribution: life expectancy, inequality / dispersion (Wilson, 2001 and Peltzman, 2009).
- Assess convergence considering the whole distribution (Edwards and Tuljapurkar, 2005). This is our approach

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#### Roadmap

- Methods: Kullback Leibler divergence
- General trends
  - Western and Eastern countries (and EU)

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- Explaining the trends
- Convergence clubs
- Conclusions

 The problem: to find a measure of dissimilarity between two distributions

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- We use a measure of dissimilarity between distributions, the Kullback-Leibler divergence (KLD) (Kullback and Leibler, 1951; also used in Edwards and Tuljapurkar, 2005)
- ► For two discrete probability distributions, the divergence of P from Q is given by  $KLD(Q || P) = \sum_{i} ln\left(\frac{P_i}{Q_i}\right) P_i$

• where  $P_i$ ,  $Q_i$  are the probability masses in i = 1, ..., N

- Our concept of convergence: any group of countries converges in mortality if the *dissimilarities* across their ages-at-death distributions are reduced
- We compute the sum of KLDs each year from individual distributions to the period's average distribution
  - It is a shortcut to compute the sum of pairwise KLD between all the countries in the sample.

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#### Data

- ▶ We use data from the Human Mortality Database (mortality.org).
- Our full sample has 35 countries (and regions)

Australia, Austria, Belgium, Bulgaria, Belarus, Canada, Switzerland, Czech Republic, East Germany, West Germany Denmark, Spain, Estonia, Finland, Civil France, Northern Ireland, United Kingdom, Scotland, Hungary, Ireland, Iceland, Italy, Japan, Lithuania, Luxemburg, Latvia, Netherlands, Norway, Poland, Portugal, Russia, Slovakia, Sweden, Ukraine, USA

 There has been a clear process of divergence in both mortality at age 0 and adult mortality.



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- However, the overall trend is the result of the interaction of different trends for different groups
- > For example, western and eastern countries have marked differences.

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▶ However, within Western countires, the EU has converged.

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#### Explaining the trends

We study separately western and easter countries to unveil the forces behind the trends in KLD.

Australia, Austria, Belgium, Canada, Switzerland, West Germany, Denmark, Spain, Finland, France, Northern Ireland, Scotland, Ireland, Iceland, UK, Italy, Japan, Luxemburg, Netherlands, Norway, Portugal, Sweden, USA

Bulgary, Belarus, Czech Republic, East Germany, Estonia, Hungary, Latvia, Poland, Russia, Slovakia, Ukraine

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#### Explaining the trends

- ► For normal distributions, it is possible to compute the KLD as a function means and variances (Roberts and Penny, 2002).  $KLD(Q \parallel P) = \frac{1}{2} \ln \left(\frac{\sigma_P^2}{\sigma_Q^2}\right) + \frac{1}{2} \frac{\mu_Q^2 + \mu_P^2 + \sigma_Q - 2\mu_Q \mu_P}{\mu_P^2} - \frac{1}{2}$
- Age-at-death distributions aren't statistically normal, but this allows to interpret the contributions of mean and variance to overall trend.

#### Explaining the trends

- A caveat: the effect of changes in the variance is not straightforward.
- ▶ When comparing two normal distributions (*P* with respect to *Q*), the term  $[\sigma_P^2 \sigma_Q^2] [\mu_Q^2 + \mu_p^2 2\mu_Q] \leq 0$

- determines the sign of  $\frac{\partial KLD}{\partial \sigma_P^2}$ .
- When the means are different, a decrease in the variance may increase the KLD.







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Median absolute deviation, variances age 10

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- We compare the values for the KLD holding constant variances.
- At age 0, convergence has been driven mostly by reductions in infant mortality.
  - The dispersion of life expectancies has slightly decreased and there has been a strong convergence in variances.
- At age 10, the variance has greatly contributed to the dissimilarities.
  - There is increased dispersion in life expectancies and the variance has increased slightly too.

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- At both age 0 and age 10, divergence has been driven increasing disparities in life expectancy
  - Increases in the dispersion of variances have actually contributed negatively to the KLD.

 There exist subgroups of countries that converge (e.g. EU vs rest of capitalist countries).

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Are there any clubs of convergence within the sample of western countries?



Means and variances, age 0 (1960-2007)

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- There are several countries that change drastically their mean and variance coordinates (e.g. Japan, Denmark).
- We move from countries being distributed along the axis where we have low variance and high means to increasing disparities.

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▶ How about for Eastern countries?

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Means and variances, age 10 (1960-2007)

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▶ In the case of Eastern countries, the pattern is reversed.

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### Conclusions and Next Steps

- We have reassessed the mortality convergence hypothesis with a different definition of convergence.
- ➤ We find that although there isn't convergence for the whole sample, there exist subgroups or convergence clubs (e.g. EU).
- Our resultsnegate the basic hypothesis of previous works: there isn't evidence of a common steady state across countries.
- Next steps include investigating the set of variables that defines a convergence club and the stability over time of the clubs.
- In particular, our preliminary analysis seems to indicate a strong effect of political federations.

► Thanks for coming!

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