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Cause-of-Death Mortality: A Study of a Heterogeneous Portfolio Dynamics

Héloïse Labit Hardy

PhD Student, University of Lausanne, Switzerland

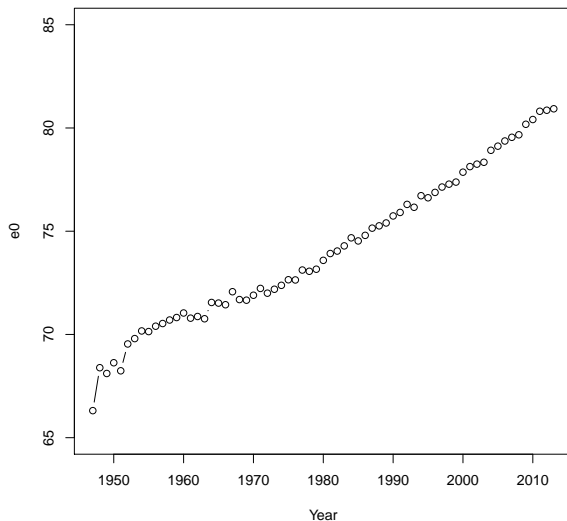
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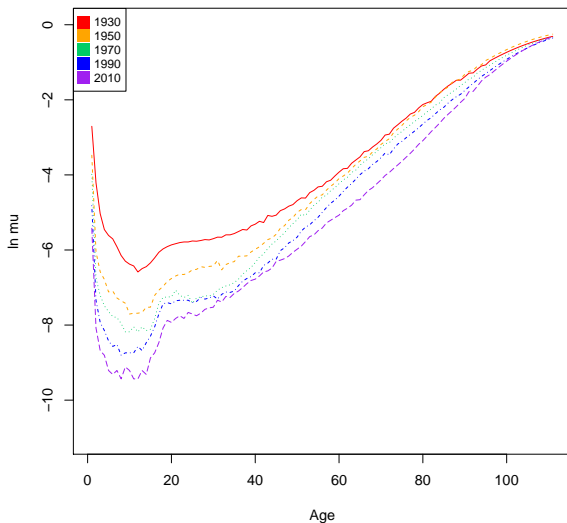
1. Introduction
2. Portfolio dynamics model
3. Application

Life expectancy at birth in England from 1946 to 2013

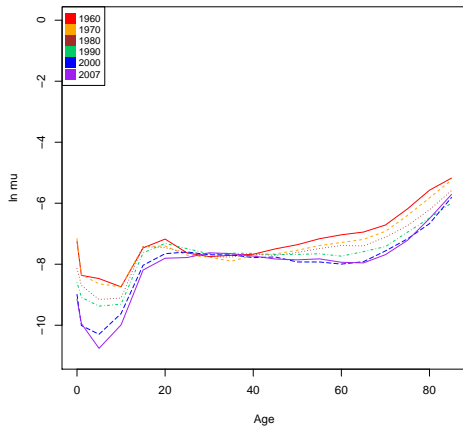
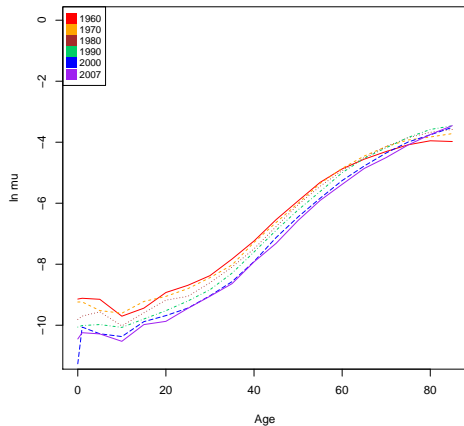


Source : The Human Mortality Database (HMD)

English death rates between 1930 and 2010

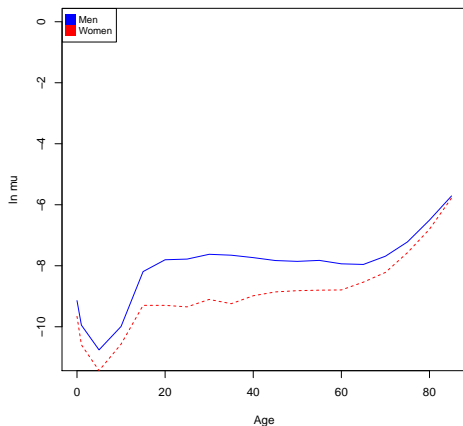


Source : The Human Mortality Database (HMD)

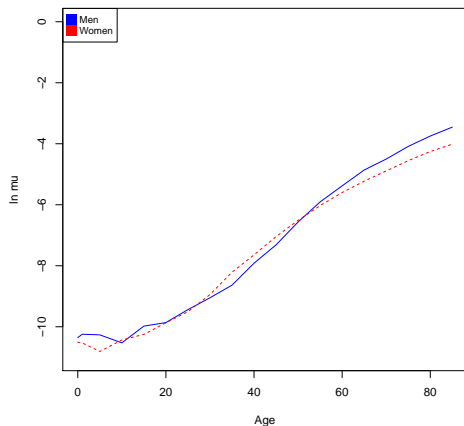
English death rates for males between 1960 and 2007
for external causesEnglish death rates for males between 1960 and 2007
for cancers

Source : The World Health Organization (WHO)

English death rates for external causes in 2007

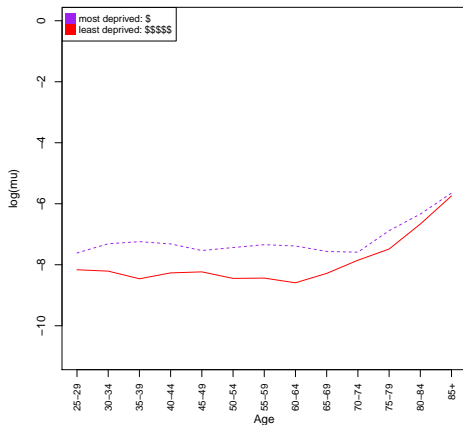


English death rates for cancers in 2007

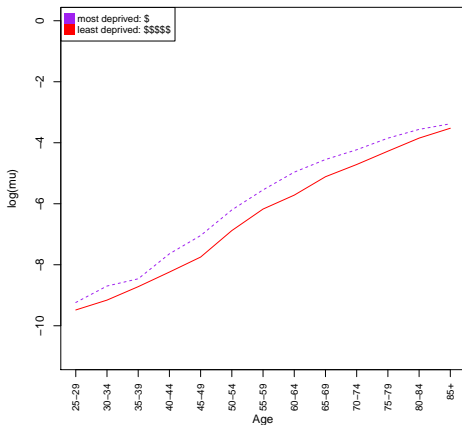


Source : The World Health Organization (WHO)

English death rates for external causes in 2007 (males)



English death rates for cancers in 2007 (males)



Source : The Office for National Statistics (ONS)

Objective

- ▶ What could be impacts of mortality changes following the socio-economic composition ? for an insurance portfolio ?

⇒ Study impacts of changes in cause-of-death mortality on an insurance portfolio composed with different socio-economic category

- ▶ Model portfolio dynamics
 - ▷ By taking into account deaths and arrivals :
 - with cause-of-death rates depending on age, time, gender and socio-economic category
 - ▷ Provide a general framework to address the issue

1. Introduction

2. Portfolio dynamics model

2.1 Closed Portfolio

2.2 Opened Portfolio

3. Application

- ▶ Let us characterized the policyholders by the gender ϵ , the year of birth y and the socio-economic status j :

$$g^\epsilon(t) = \sum_{y_{min}}^{y_{max}} g^\epsilon(y, t) = \sum_{y_{min}}^{y_{max}} \sum_{j=1}^m g_j^\epsilon(y, t)$$

- ▶ $g^\epsilon(t)$ is the total number of policyholders at time t with gender ϵ
 - ▶ $g^\epsilon(y, t)$ is the total number of policyholders at time t with gender ϵ and year of birth y
 - ▶ $g_j^\epsilon(y, t)$ is the total number of policyholders at time t with gender ϵ , year of birth y and socio-economic status j
- ▶ Model the heterogeneous cohort dynamics and the aggregated cohort death rate : $g^\epsilon(y, t)$, $d^\epsilon(y, t)$

- ▶ For a closed portfolio, policyholders in the sub-cohort with socio-economic category j evolve only according to deaths :

$$\frac{dg_j^\epsilon(y, t)}{dt} = g_j^{\prime\epsilon}(y, t) = -\mu_j^\epsilon(y, t)g_j^\epsilon(y, t). \quad (1)$$

- ▶ In this sense, the aggregated cohort dynamics in a closed portfolio is also defined only by deaths :

$$\frac{dg^\epsilon(y, t)}{dt} = g^{\prime\epsilon}(y, t) = -d^\epsilon(y, t)g^\epsilon(y, t) \quad (2)$$

$$\Rightarrow d^\epsilon(y, t) = \frac{\sum_{j=1}^m \mu_j^\epsilon(y, t)g_j^\epsilon(y, t)}{\sum_{j=1}^m g_j^\epsilon(y, t)}$$

- ▶ $g_j^\epsilon(y, t)$: survivors from the initial sub-cohort

- ▶ For an opened portfolio, policyholders in the sub-cohort with socio-economic category j evolve according to deaths, arrivals and cancellations (B_j) :

$$\frac{dg_j^\epsilon(y, t)}{dt} = g_j^{\prime\epsilon}(y, t) = -\mu_j^\epsilon(y, t)g_j^\epsilon(y, t) + B_j^\epsilon(y, t). \quad (3)$$

- ▶ By summing, the aggregated cohort dynamics in an opened portfolio is also defined by deaths, arrivals and cancellations :

$$\frac{dg^\epsilon(y, t)}{dt} = g^{\prime\epsilon}(y, t) = -d(y, t)g^\epsilon(y, t) + B^\epsilon(y, t) \quad (4)$$

$$\Rightarrow d^\epsilon(y, t) = \frac{\sum_{j=1}^m \mu_j^\epsilon(y, t)g_j^\epsilon(y, t)}{\sum_{j=1}^m g_j^\epsilon(y, t)}$$

- ▶ $g_j^\epsilon(y, t)$: survivors from the initial sub-cohort
 + survivors from arrivals

1. Introduction

2. Portfolio dynamics model

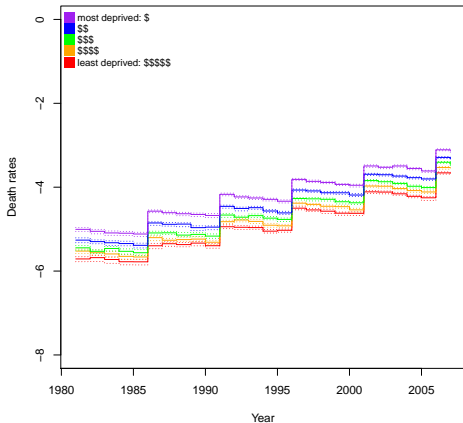
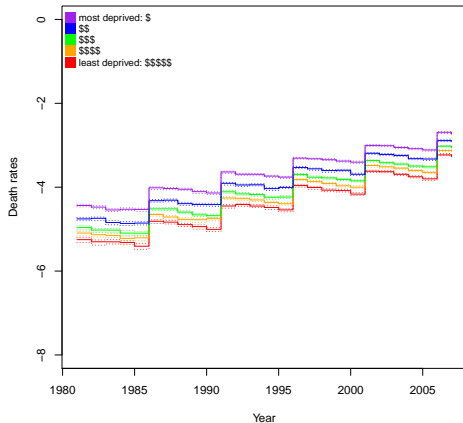
3. Application

3.1 Data

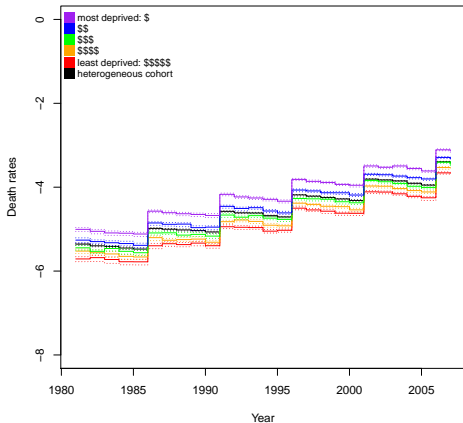
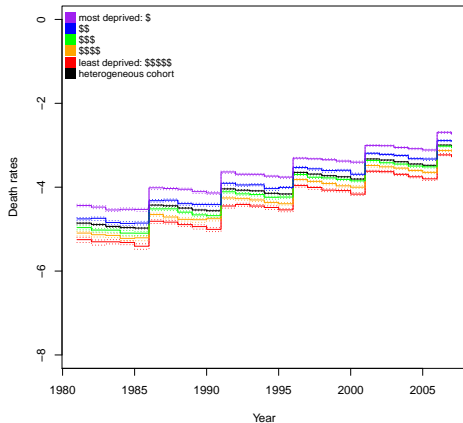
3.2 Closed Portfolio

3.2 Opened Portfolio

English cohort death rates per socio-economic category for age 50 in 1981 with 95% confidence intervals (left for males, right for females)

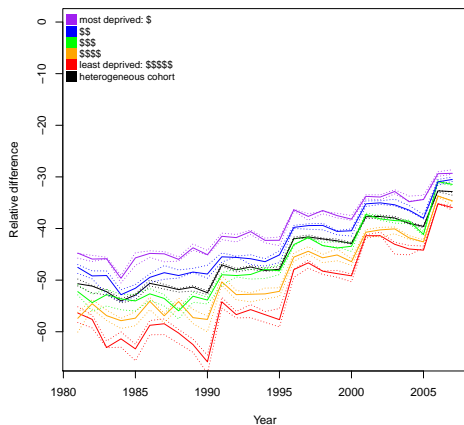
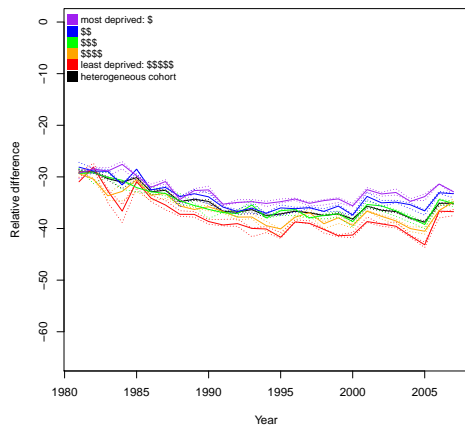


Cohort death rates per socio-economic composition for age 50 in 1981 with 95% confidence intervals (left for males, right for females)



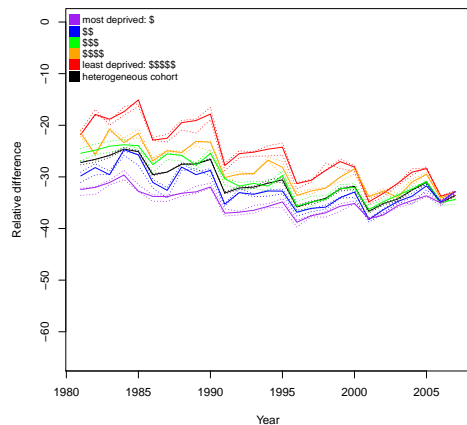
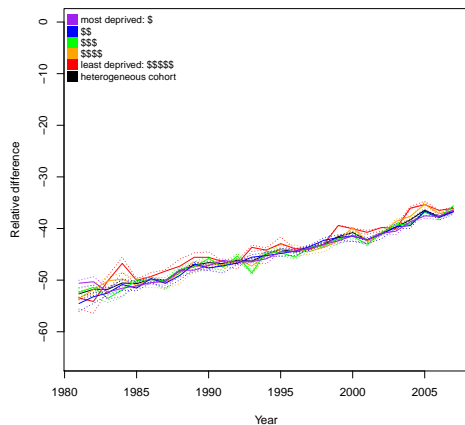
Cancer removal

Relative difference of death rate per socio-economic composition for age 50 in 1981 with 95% confidence intervals (left for males, right for females)

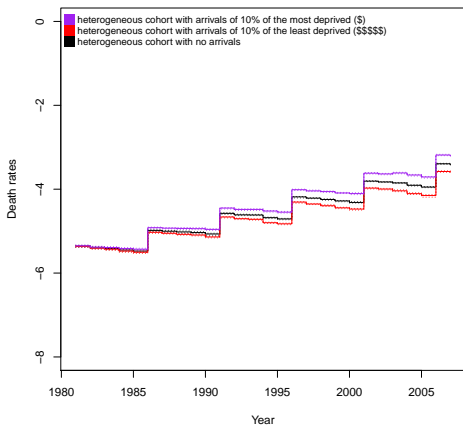
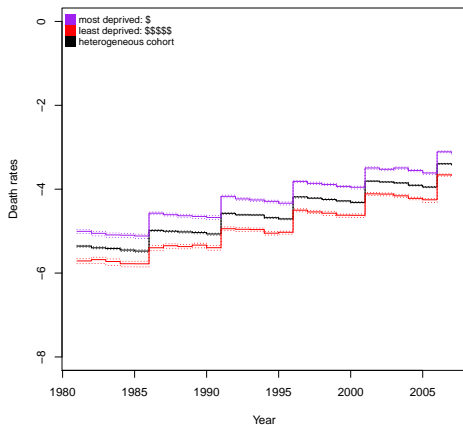


Circulatory diseases removal

Relative difference of death rate per socio-economic composition for age 50 in 1981 with 95% confidence intervals (left for males, right for females)

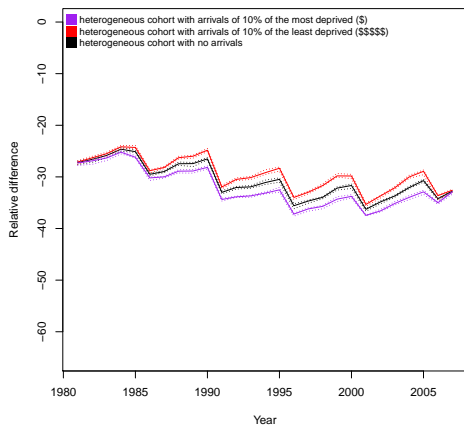
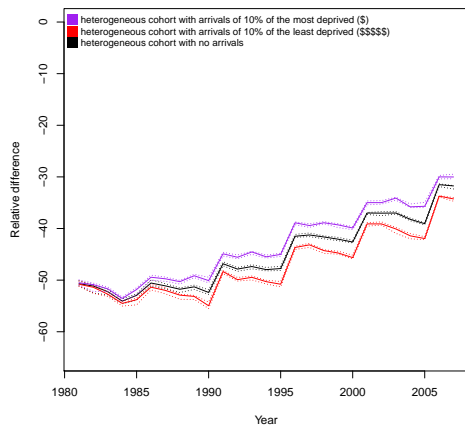


Cohort death rates per socio-economic composition for females of age 50 in 1981 with 95% confidence intervals (left for closed portfolios, right for opened portfolios)



Causes removal

Relative difference of death rate per socio-economic composition for females of age 50 in 1981 with 95% confidence intervals (left for cancer removal, right for circulatory diseases removal)



- ▶ Portfolio dynamics with arrivals and seniority of policyholders :
 - ▷ $g_j^\epsilon(y, t)$ is the sum over all seniorities : $\int_0^{t-t_0} g_j^\epsilon(y, t, u) du$
- $$\Rightarrow d^\epsilon(y, t) = \frac{\sum_{j=1}^m \left(\int_0^{t-t_0} \mu_j^\epsilon(y, t, u) g_j^\epsilon(y, t, u) du \right)}{\sum_{j=1}^m \left(\int_0^{t-t_0} g_j^\epsilon(y, t, u) du \right)}$$
- $g_j^\epsilon(y, t, u)$ depends on the survivors from the initial sub-cohort and survivors from arrivals with different death rates ($\mu_j^\epsilon(y, t, u)$)
- ▶ Application : impacts of cause-of-death mortality changes on a heterogeneous portfolio with medical selection

Concluding remarks

- ▶ With a population dynamics model, we study impacts of cause-of-death changes on a portfolio mortality comprising different socio-economic categories :
 - ▷ for a closed and an opened portfolio
- ⇒ **Following the portfolio structure, cause-of-death mortality changes can have different impacts on the aggregated mortality**
- ▶ To go further
 - ▷ arrivals processes
 - ▷ modeling medical selection
 - ▷ dependence assumptions between causes of death
 - ▷ study aggregated mortality of a population composed with different socio-economic categories

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Mail : Heloise.LabitHardy@unil.ch

thank you!