

# Consistently modeling unisex mortality rates

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## Motivation

- ▶ **European Court of Justice, 2011**

*Different insurance premiums according to gender are prohibited (Gender directive 2004/113EC).*

- ▶ But: Life insurance risk differs by gender (statistically significant).

Motivation, research question, introduction

Consistent mortality models

Numerical examples

Consistency: Lee-Carter mortality model

Reserves: (un)observed heterogeneity

## Research question

**Given:** Two groups with differing mortality risk and mortality model for each group.



- ▶ male/female



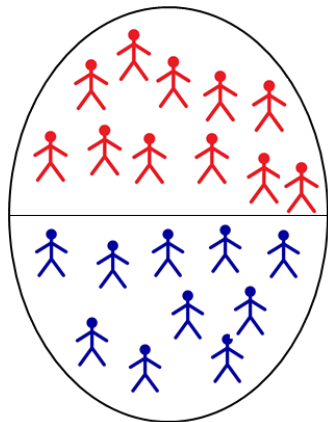
- ▶ smoker/non-smoker

How to create **unisex mortality models** / unisex mortality tables that are **consistent** with a given male/female mortality model?

- ▶ male/female model for risk management.
- ▶ unisex model for premium calculation.

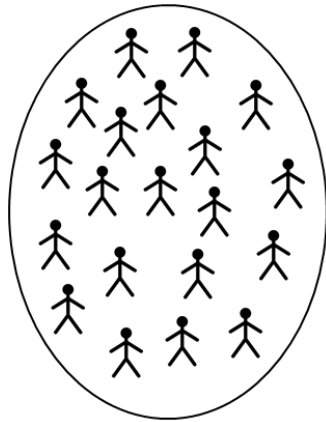
Portfolio at time  $t = 0$ 

female/male portfolio ( $n = 20$ )  
 age  $y$ , survival probability  ${}_T p_y$



$N_0^y = N_0^x = 10$   
 age  $x$ , survival probability  ${}_T p_x$

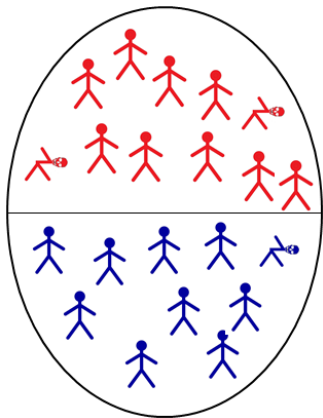
unisex portfolio ( $n = 20$ )  
 age  $z$ , survival probability  ${}_T p_z = ?$



$N_0^z = n = 20$

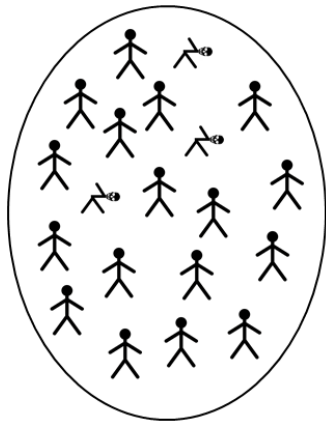
Portfolio at time  $t = T$ 

female/male portfolio ( $n = 20$ )  
age  $y + T$



$N_T^y = 8$ ,  $N_T^x = 9$   
age  $x + T$

unisex portfolio ( $n = 20$ )  
age  $z + T$



$N_T^z = 17$

## Consistency: Example

Consider an annuity portfolio of  $N_0^y$  females and  $N_0^x$  males. Mortality risk is specified by two **Lee-Carter models** with parameters  $(A_t^y, B_t^y, \theta_y, c_y)$  and  $(A_t^x, B_t^x, \theta_x, c_x)$ . This implies a time- $T$ -survival probability

$${}_T p_y := \mathbb{P}(\text{"female survives } T\text{"}) \text{ and } {}_T p_x := \mathbb{P}(\text{"male survives } T\text{"})$$

For a unisex portfolio, this leads to the survival probability:

$${}_T p_z := \frac{N_0^y}{N_0^x + N_0^y} \cdot \mathbb{P}(\text{"female survives } T\text{"}) + \frac{N_0^x}{N_0^x + N_0^y} \cdot \mathbb{P}(\text{"male survives } T\text{"})$$

What is the **consistency error** if we use a unisex **Lee-Carter model** with parameters  $(A_t^z, B_t^z, \theta_z, c_z)$ ?

What happens if the group composition  $(N_0^y, N_0^x)$  is **not** observable?

## Consistency: Deterministic mortality tables

In this talk, 2 consistent unisex mortality models are introduced.

female/male portfolio

unisex portfolio

**Consistency criterion 1** (unobservable)

$$(C1) \text{ survival probability } \hat{\xi}_0 \cdot {}_t p_x + (1 - \hat{\xi}_0) \cdot {}_t p_y = {}_t p_z, \text{ for all } t \in [0, T].$$

( $\hat{\xi}_0$ : initial guess of share of group  $x$ ).



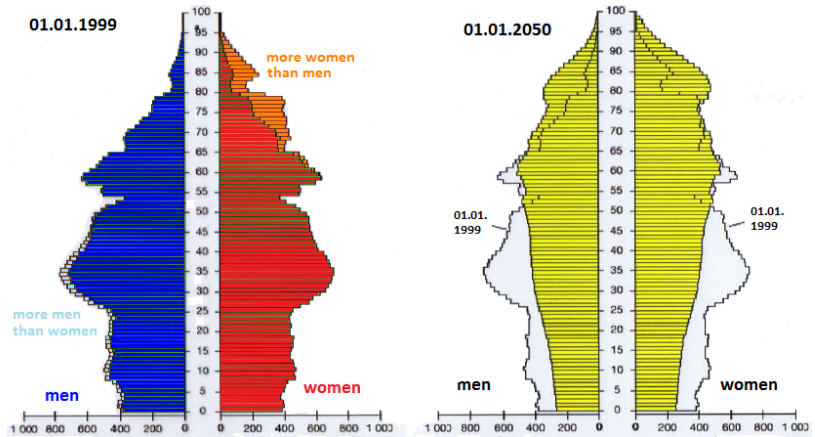
**Consistency criterion 2** (observable)

$$(C1^*) \text{ portfolio members } N_t^x + N_t^y = N_t^z, \text{ for all } t \in [0, T].$$





# Demography in Germany



**M1**

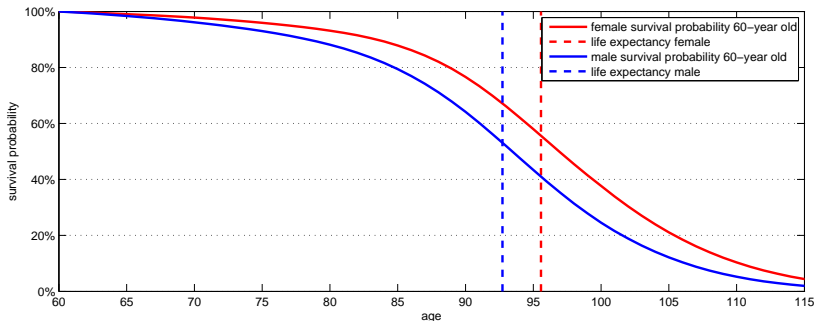
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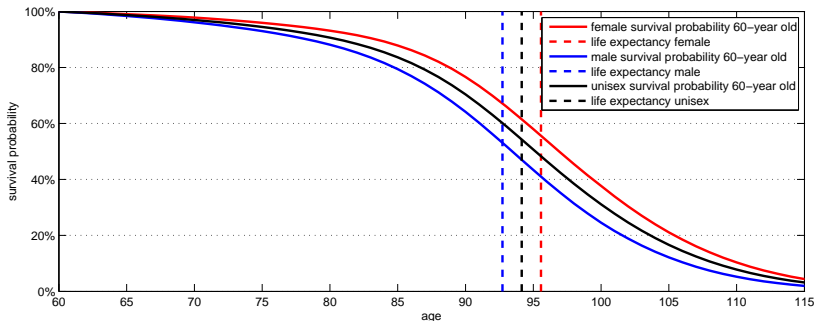
Consistency: Lee-Carter mortality model

Reserves: (un)observed heterogeneity

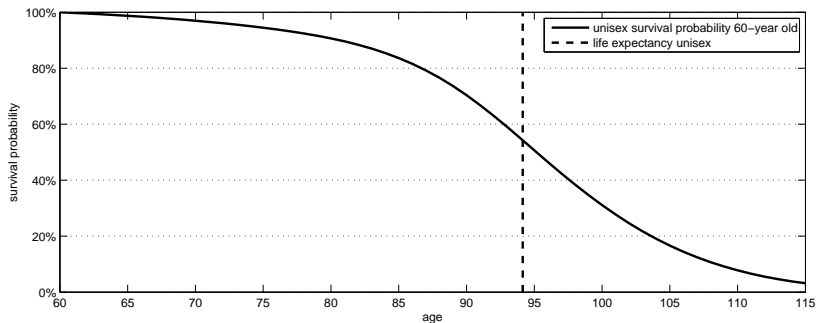
Survival curve  $\{ {}_t p_y \}_{t \in [0, T]}$ ,  $\{ {}_t p_x \}_{t \in [0, T]}$ 

DAV 2004R, annuity table (includes risk margins).

## Survival curve



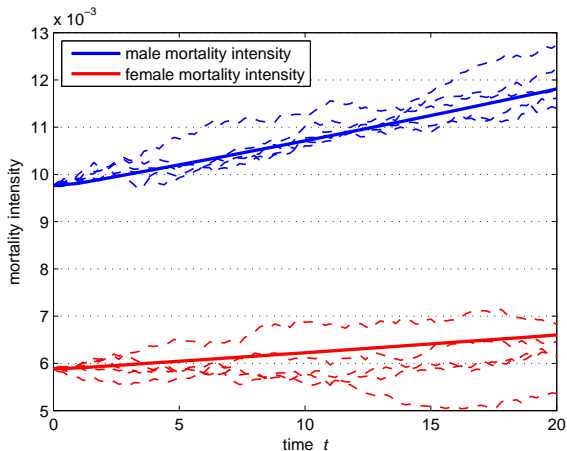
DAV 2004R, annuity table (includes risk margins).

Unisex survival curve  $\{ {}_t p_z \}_{t \in [0, T]}$ 

For an initial share of males  $\xi_0$ , choose:

$${}_t p_z = \xi_0 \cdot {}_t p_x + (1 - \xi_0) \cdot {}_t p_y .$$

## Stochastic mortality rates



Plots  $\{\lambda_t^x\}_{t \in [0,20]}$  (male) and  $\{\lambda_t^y\}_{t \in [0,20]}$  (female).

Survival curves  ${}_t p_x := e^{-\int_0^t \lambda_s^x ds}$ ,  ${}_t p_y := e^{-\int_0^t \lambda_s^y ds}$ .

## Assumption (Mortality model)

For  $i \in \{x, y, z\}$ , we assume that

- ▶ **Given** the survival curve  $\{ {}_t p_i \}_{t \in [0, T]}$ , **individual deaths are independent**. Choose  ${}_t p_i := e^{-\int_0^t \lambda_s^i ds}$ . Number of survivors at time  $t > 0$  is binomially distributed:

$$N_t^i \sim \text{Bin} (N_0^i, {}_t p_i) .$$

- ▶ *Randomness in the survival curve*  $\{ {}_t p_i \}_{t \in [0, T]}$  (**systematic mortality risk**) is conditionally independent of the binomial distribution (**unsystematic mortality risk**).
- ▶ The intensity  $\{ \lambda_t^i \}_{t \geq 0}$  is continuous.

## Definition (Unisex mortality model (unobservable))

For initial share of males  $\hat{\xi}_0$ , define

$$\lambda_t^z := \frac{\hat{\xi}_0 \cdot e^{-\int_0^t \lambda_s^x ds}}{\underbrace{\hat{\xi}_0 \cdot e^{-\int_0^t \lambda_s^x ds} + (1 - \hat{\xi}_0) \cdot e^{-\int_0^t \lambda_s^y ds}}_{\text{time-}t \text{ share of males}}} \cdot \lambda_t^x$$

$$+ \frac{(1 - \hat{\xi}_0) \cdot e^{-\int_0^t \lambda_s^y ds}}{\underbrace{\hat{\xi}_0 \cdot e^{-\int_0^t \lambda_s^x ds} + (1 - \hat{\xi}_0) \cdot e^{-\int_0^t \lambda_s^y ds}}_{\text{time-}t \text{ share of females}}} \cdot \lambda_t^y.$$

We obtain:  $N_T^z \sim \text{Bin} (n, \hat{\xi}_0 \cdot {}_t p_x + (1 - \hat{\xi}_0) \cdot {}_t p_y)$ .

*How to obtain  $\lambda^z$ :* Solve  ${}_t p_z = \hat{\xi}_0 \cdot {}_t p_x + (1 - \hat{\xi}_0) \cdot {}_t p_y$  for  $\lambda_t^z$ .



## Definition (Unisex mortality model (observable))

For initial share of males  $\hat{\xi}_0$ , define

$$\mu_t^z := \underbrace{\frac{N_t^x}{N_t^x + N_t^y}}_{\text{time-}t \text{ share of males}} \cdot \lambda_t^x + \underbrace{\frac{N_t^y}{N_t^x + N_t^y}}_{\text{time-}t \text{ share of females}} \cdot \lambda_t^y. \quad (1)$$

We obtain:  $N_T^{z*} = N_t^x + N_t^y$ , where  $N_t^x \sim \text{Bin}(\xi_0 n, {}_t p_x)$  and  $N_t^y \sim \text{Bin}((1 - \xi_0)n, {}_t p_y)$ .

( $\mu_t^z$  is still the “instantaneous” death probability, but does not define a mortality model).

- ▶ For the observable case, it is necessary, to observe deaths immediately (no reporting delays etc.) and to observe the group membership.



- ▶ For the unobservable case, we do not observe the group membership or deaths immediately.



## Implications for risk management

M2

Unisex portfolio:  $N_T^Z \sim \text{Bin}(N_0^Z, {}_T p_Z)$ , where  
 ${}_T p_Z = \xi_0 \cdot {}_T p_X + (1 - \xi_0) \cdot {}_T p_Y$ .

Female/male portfolio:  $N_T^Y \sim \text{Bin}(N_0^Y, {}_T p_Y)$ ,  $N_T^X \sim \text{Bin}(N_0^X, {}_T p_X)$ .

### Lemma (Prudence of the unisex mortality model (C1))

$$\mathbb{E}[N_T^Z] = \mathbb{E}[N_T^X + N_T^Y], \quad (2)$$

$$\text{Var}(N_T^Z) \geq \text{Var}(N_T^X + N_T^Y). \quad (3)$$

*Proof:* special cases: e.g. Feller [1950].



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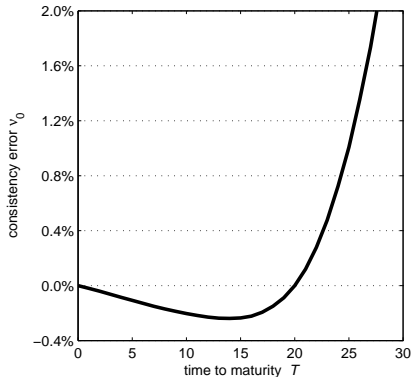
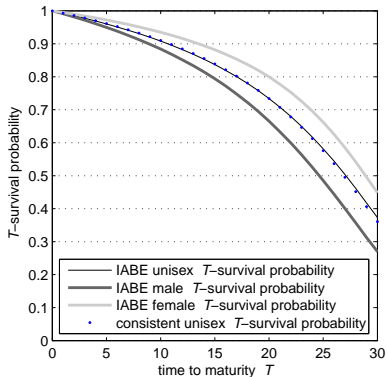
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## Consistency: Lee-Carter mortality model



Parameters: Belgian Actuarial Society, IA|BE (available online).

## Reserves: (un)observed heterogeneity

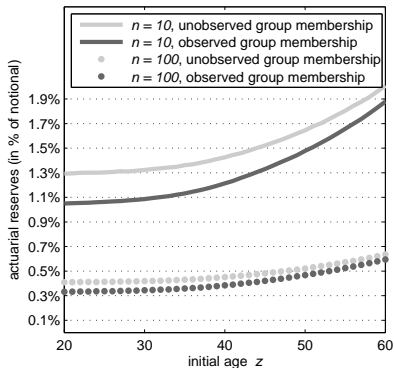
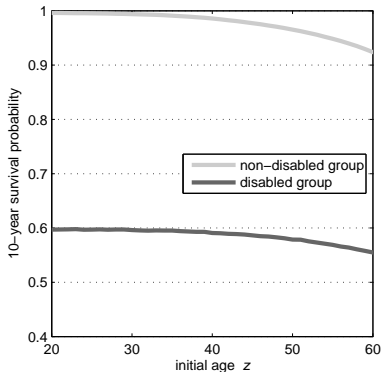
Consider a portfolio of  $n$  pure endowment insurance contracts with **survival benefit**  $S = \text{€}1$  at maturity  $T = 10$ . Risk-free rate  $r = 0\%$ . 10% of the portfolio is disabled with life expectancy:

$${}_T p_z^{\text{disabled}} = 60\% \cdot {}_T p_z.$$

We choose the standard deviation principle and define the **per-contract actuarial reserve** (in % of the contract's nominal €1) as

$$R^j := \frac{1}{n} \cdot \frac{\alpha}{2} \sqrt{\text{Var}(N_{T-}^z)}. \quad (4)$$

## Reserves: (un)observed heterogeneity



Reserves annuity portfolio with 10% disabled persons.

**M2**

## Conclusion

How to create **unisex mortality models** / unisex mortality tables that are **consistent** with a given male/female mortality model?

**M1** Change/stochasticity in male/female mortality rates affects also male/female share in the annuity portfolio (also stochastic!).

**M2** Observed heterogeneity reduces mortality risks (e.g. the portfolio's variance), compare two consistency criteria.



Further interesting aspects: **adverse selection, effect of portfolio size  $n$ .**



## Literature

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