



UiO : Department of Mathematics
University of Oslo

STK4500: Life insurance and finance

Mortality basis Norway

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Spring 2024

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- 2 K2013 mortality basis in Norway
- 3 Sampling random lives from K2013

Norwegian mortality 1846-2022

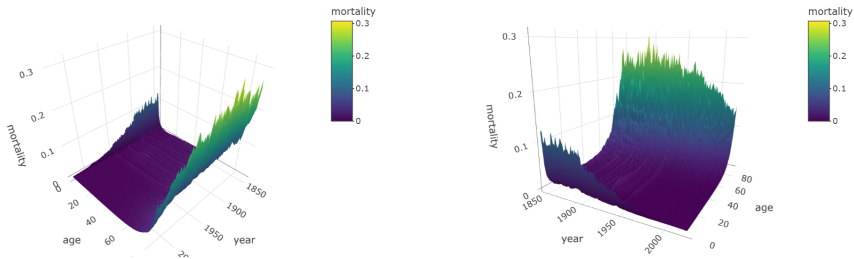


Figure: Historical mortality from 1846 to 2022 for ages ranging from 0 to 90.

Norwegian mortality 1846-2022

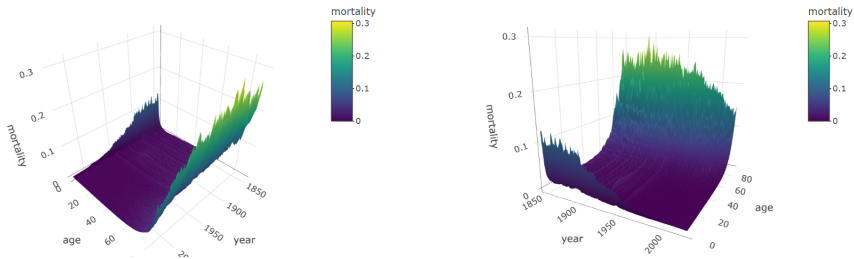


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- Mortality increases with age.

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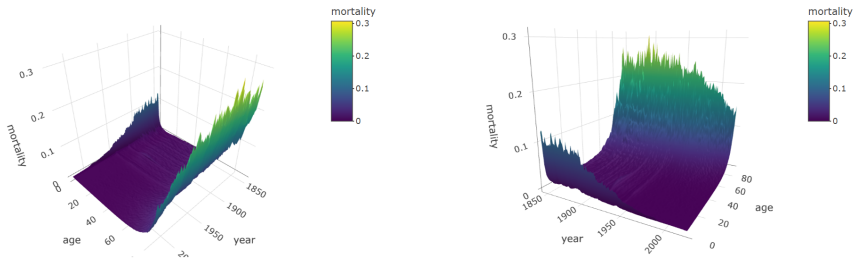


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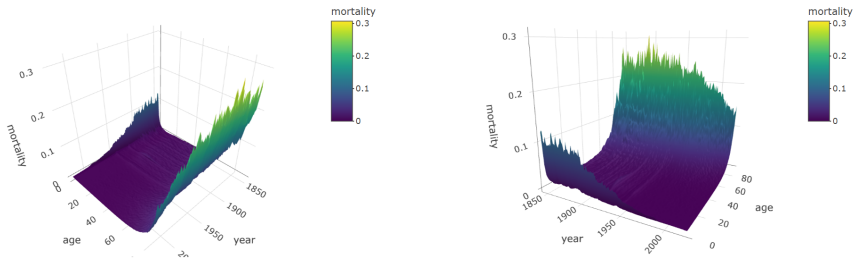


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- Mortality decreases with calendar years.
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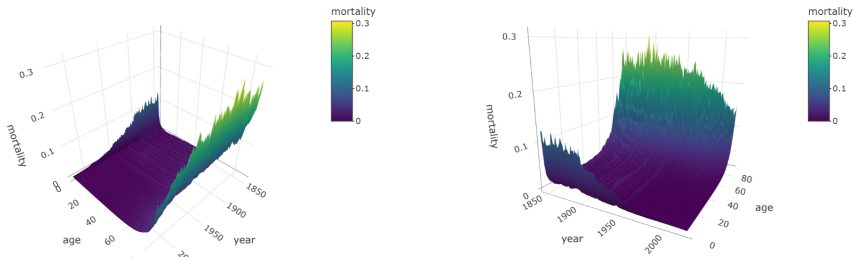


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- Mortality increases with age.
- Mortality decreases with calendar years.
- Infant mortality has decreased drastically with calendar years.
- We can appreciate some "bumps", for example the 1918-1920 flu pandemic (Spanish flu) and 2WW.

Classical mortality model: Lee-Carter

$$\mu(x, t) = \{\text{mortality at age } x \text{ in calendar year } t\}.$$

The Lee-Carter model assumes that

$$\log(\mu(x, t)) = a_x + k_t b_x + \varepsilon(x, t),$$

where

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- 3 k_t and b_x are found using the principal components of the matrix $\log(\mu(x, t)) - a_x$, since the matrix $\mu(t, x)$ has highly correlated entries.
- 4 $\varepsilon(x, t)$ are the residuals. The above method minimizes the squares.

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Equivalent expressions:

$$p_{**}(x, x + s) = \exp \left\{ - \int_x^{x+s} \mu(u, Y - x + u) du \right\},$$

or

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where Y_0 is the birth year.

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Finanstilsynet provides a standard model for $\mu(x, Y).$

To sum up,

$$p_{**}(x+t, x+s) = \exp \left\{ - \int_t^s \mu(x+u, Y+u) du \right\}, \quad t \leq s.$$

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- We go now to <https://www.finanstilsynet.no/nyhetsarkiv/pressemeldinger/2013/nytt-dodelighetsgrunnlag-i-kollektiv-pensjonsforsikring/>

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where t is a calendar year larger than 2013. In the formula above, $w(x)$ is a weight which is given by

$$w(x) = \min \{ 2.671548 - 0.172480x + 0.001485x^2, 0 \}, \quad \text{for males}$$

$$w(x) = \min \{ 1.287968 - 0.101090x + 0.000814x^2, 0 \}, \quad \text{for females.}$$

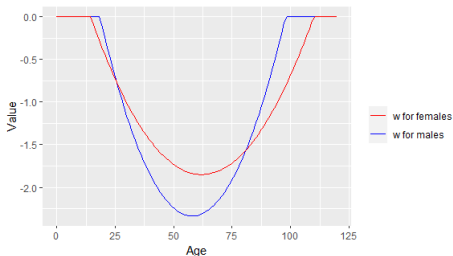


Figure: The function w for females (in blue) and males (in red).

$$\mu_{Kol}(x, t) = \mu_{Kol}(x, 2013) \left(1 + \frac{w(x)}{100} \right)^{t-2013}, \quad (2)$$

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- The higher t gets, the lower $\mu_{Kol}(x, t)$ gets.
- This is only applied to working and pension ages: 16 to 100 for males and 110 for females.

Two types of risk: **longevity** and **mortality**.

Longevity risk	
males	$1000\mu_{Kol}(x, 2013) = 0.189948 + 0.003564 \cdot 10^{0.051x}$
females	$1000\mu_{Kol}(x, 2013) = 0.067109 + 0.002446 \cdot 10^{0.051x}$

Table: Mortality basis from K2013 for longevity risk

Mortality risk	
males	$1000\mu_{Kol}(x, 2013) = 0.241752 + 0.004536 \cdot 10^{0.051x}$
females	$1000\mu_{Kol}(x, 2013) = 0.085411 + 0.003114 \cdot 10^{0.051x}$

Table: Mortality basis from K2013 for mortality risk

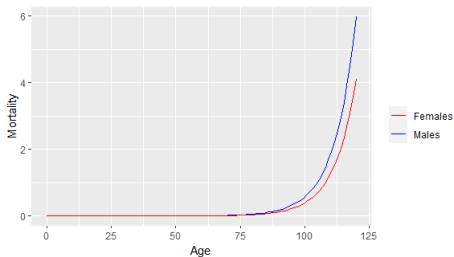


Figure: Mortalities $\mu_{Kol}(x, 2013)$ for both legal genders for calendar year 2013. We observe a lower mortality for females.

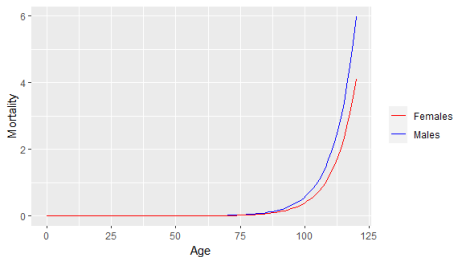


Figure: Mortalities $\mu_{Kol}(x, 2013)$ for both legal genders for calendar year 2013. We observe a lower mortality for females.

Remark

The insurer will usually carry out solvency computations for the two types of risk: longevity and mortality, then look at the differences.

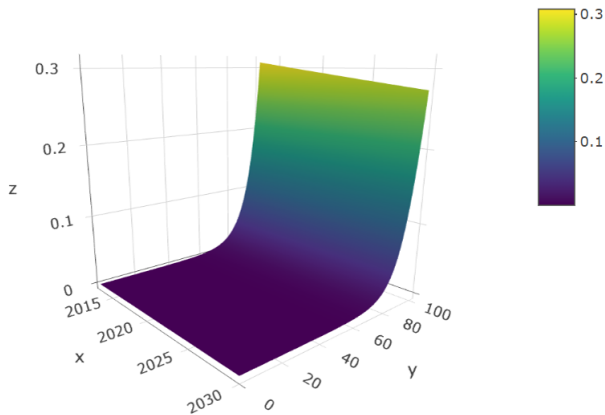


Figure: Surface from K2013 for ages 0 to 100 and years 2013 to 2030 for females.

Year 2024

Choose $t = 2024$ and then use

$$\mu_{Kol}(x, 2024) = \mu_{Kol}(x, 2013) \left(1 + \frac{w(x)}{100} \right)^{11}$$

and for $\mu_{Kol}(x, 2013)$ we would choose the right one by specifying a risk type and a legal gender from the previous slides.

Year 2024

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$$\mu_{Koi}(x, 2024) = \mu_{Koi}(x, 2013) \left(1 + \frac{w(x)}{100} \right)^{11}$$

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Remark

Remember that $t = 2024$ needs to be updated every year!

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Probability of survival of a Norwegian tax payer, i.e.

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R files: *K2013.R* *probabilityK2013.R*

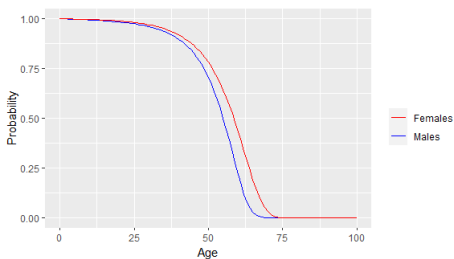


Figure: Survival probabilities for a 30 year old Norwegian tax payer in year $Y = 2024$ for both legal genders.

$$\text{Function: } t \mapsto p_{**}^{30}(0, t) = \exp \left\{ \int_0^t \mu_{Kol}(30 + u, 2024 + u) du \right\}.$$

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$$\mathbb{P}[T_z > t] = p_{**}^z(0, t) = \exp \left\{ \int_0^t \mu_{Koi}(z + u, Y + u) du \right\}.$$

3 Therefore, the distribution of T_z is

$$F_{T_z}(t) = \mathbb{P}[T_z \leq t] = 1 - \mathbb{P}[T_z > t] = 1 - \exp \left\{ \int_0^t \mu_{Koi}(z + u, Y + u) du \right\}.$$

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5 Hence, a random life $t^* \sim T_z$ can be obtained via

$$u^* \sim U \Rightarrow F_{T_z}^{-1}(u^*).$$

Theorem (Generating a random life time)

Let z be the age of an individual in year Y and T_z denote the remaining life time of this individual. Then, we can generate a random value from T_z using the following algorithm:

- 1 *Generate a random value u^* from a uniform distribution on $[0, 1]$.*

Alternatively,

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- 2 Find the value t^* such that

$$\exp \left\{ - \int_0^{t^*} \mu_{Koi}(z + u, Y + u) du \right\} = u^*.$$

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Create a file *lifeK2013.R* that generates random lives based on *K2013.R* and *probabilityK2013.R*

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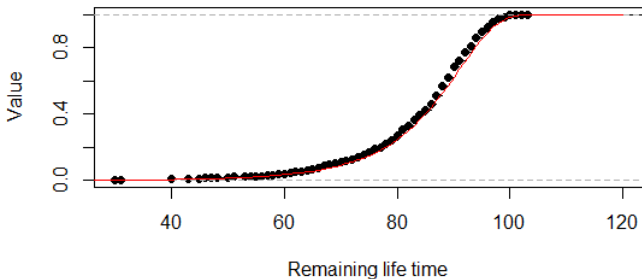


Figure: Comparison of the theoretical distribution of T_z , $z = 30$ in $Y = 2024$ with $R = 0$ (mortality) and $G = 1$ (female). Seed number 1 was used.

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