



Modeling Mortality Trend under Modern Solvency Regimes

**Matthias Börger
Daniel Fleischer
Nikita Kuksin**

August 2011

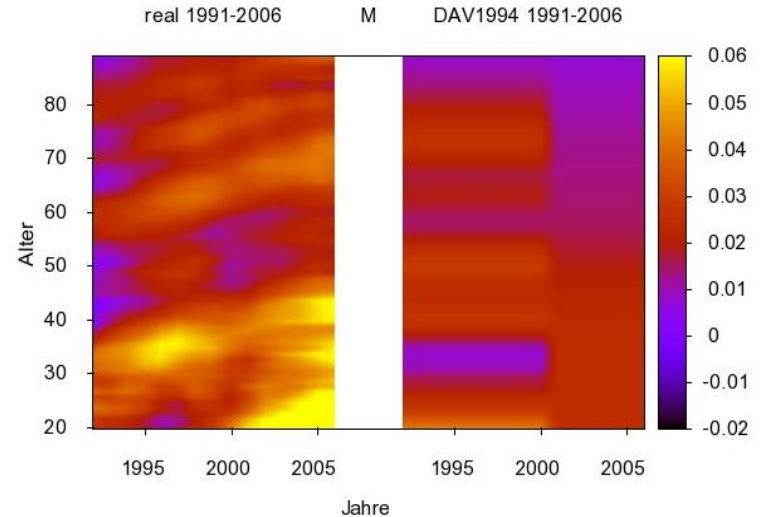
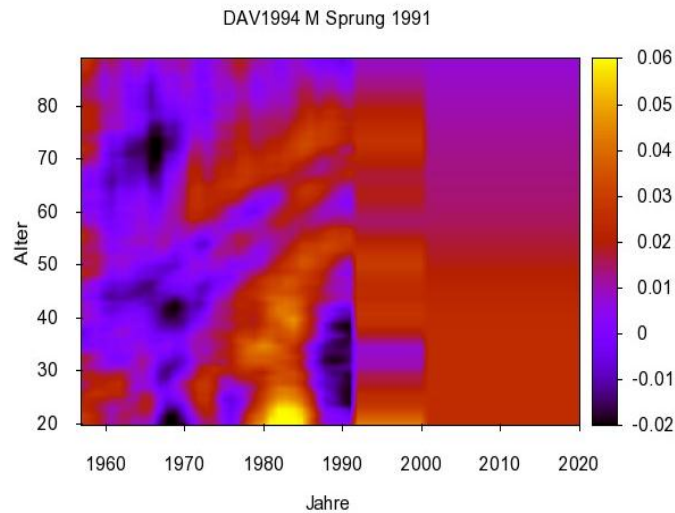
Helmholtzstraße 22
D-89081 Ulm
phone +49 (0) 731/50-31230
fax +49 (0) 731/50-31239
email ifa@ifa-ulm.de



Institut für Finanz- und
Aktuarwissenschaften



What is longevity risk?



→ Longevity risk is the risk of underestimating future mortality improvements

- Trend risk
- Mortality risk has a trend risk and a catastrophe risk component
- Systematic and non-hedgeable risk
 - Explicitly accounted for under Solvency II and the Swiss Solvency Test (SST)

Capital Requirements under Solvency II

- **General concept for Solvency Capital Requirement (SCR) under Solvency II**
 - SCR = 99.5% Value-at-Risk (VaR) of Available Capital over 1 year
 - „Capital necessary to cover losses over next year with at least 99.5% probability“
 - Overall risk is typically split into several modules, individual SCRs are finally aggregated
- **Stochastic mortality model is required for mortality/longevity trend risk under Solvency II**
- **In a 1-year setting, longevity/mortality trend risk consists of two components:**
 - Low/high realized mortality in the one year
 - Decrease/increase in expected future mortality, i.e. changes in the long-term mortality trend

Mortality Trend Model Requirements

- **Goal: Specification and calibration of a mortality model with the following properties**
 - Simultaneous modeling of mortality and longevity risk
 - Exploiting of diversification effects
 - Full age range
 - 20 to 105 in our case
 - Consideration of several populations at the same time
 - Males and females in the same country
 - Populations from different countries
 - Quantification of risk over limited time horizons
 - One-year view of Solvency II and the SST particularly relevant
 - Plausible tail scenarios
 - 99.5% VaR
 - Conservative calibration

Model Specification and Estimation

We model the logit of mortality rates

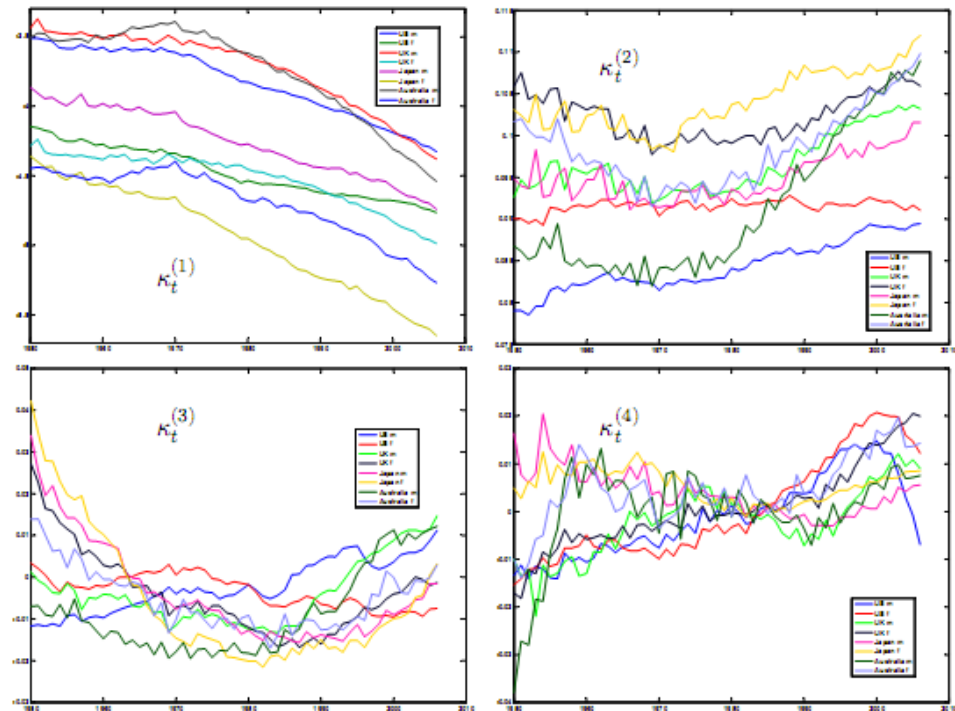
$$\text{logit}(q_{x,t}) = \alpha_x + \kappa_t^{(1)} + \kappa_t^{(2)}(x - x_{center}) + \kappa_t^{(3)}(x_{young} - x)^+ + \kappa_t^{(4)}(x - x_{old})^+ + \gamma_{t-x}$$

▮ $x_{center} = 60$, $x_{young} = 55$, $x_{old} = 85$

▮ $\kappa_t^{(1)}$ describes the general level of mortality, $\kappa_t^{(2)}$ is the slope of the mortality curve, $\kappa_t^{(3)}$ and $\kappa_t^{(4)}$ describe additional effects in young and old age mortality, respectively

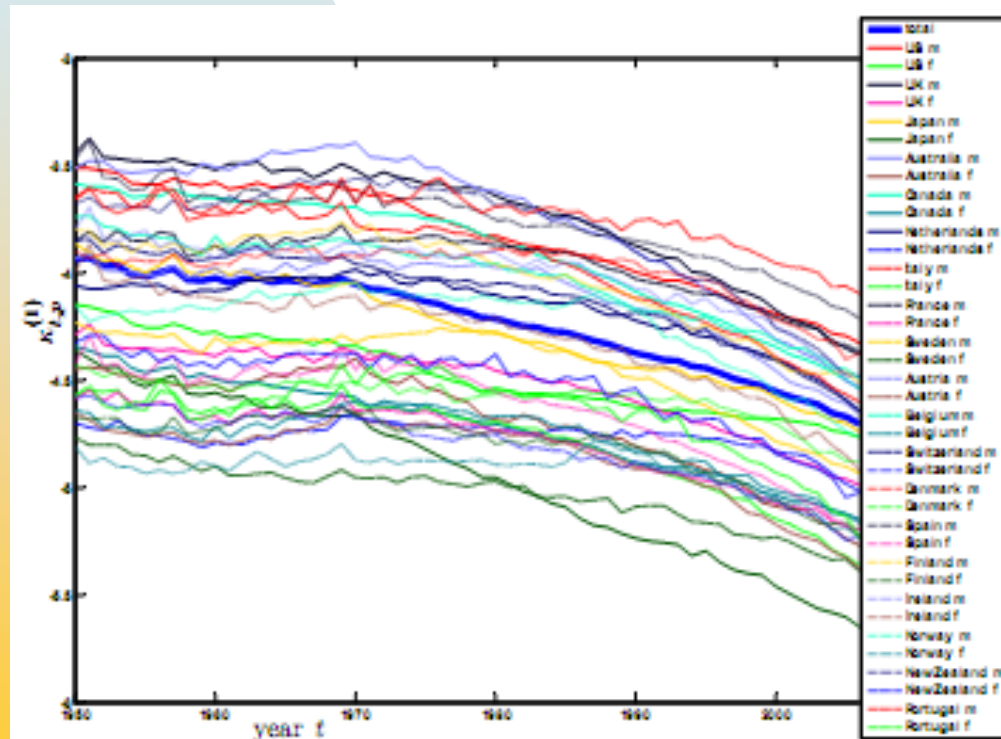
Model estimation via Generalized Linear Model Theory

- ▮ Logit is canonical link function for Binomial distribution
- ▮ Number of deaths is binomially distributed given initial exposures



Multi-Population Setting

- **Important note: Even if one is only interested in a single population considering several populations is worthwhile**
 - Trend uncertainty can be significantly reduced
 - We generally observe smaller SCRs in the multi-population model compared to the single population model



- There is clearly a common trend in $\kappa_t^{(1)}$
- A model for several populations must account for that
- We apply cointegration and an error correction model for deviations from the common trend

Model Simulation

Projection of $\kappa_{t,total}^{(1)}$ for the total population

■ Linear trends with breaks in the historical data

- Commonly used random walk with drift does not allow for such trend breaks
- Trend breaks are particularly important under one-year view (change of best estimate trend)

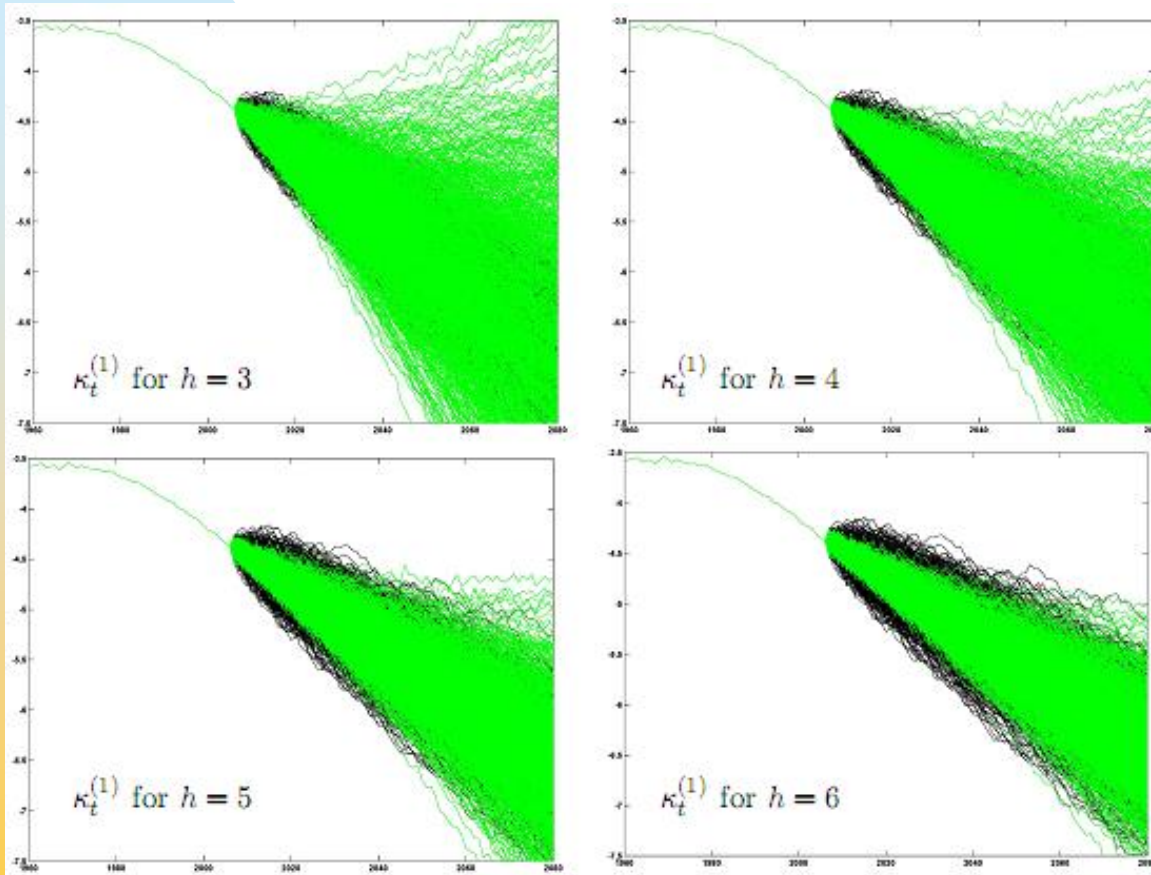
■ Idea: Each year, fit regression line to historical data and forecast future best estimate mortality as $\kappa_{t+1,total}^{(1)} = l_t(t+1) + \varepsilon_{t+1}^{(1)}(\sigma^{(1)} + \bar{\sigma}^{(1)})$

- $\bar{\sigma}^{(1)}$ is a volatility add-on, volatility $\sigma^{(1)}$ may be weighted to stress most recent past
- Implicit „re-calibration“ of the model with respect to the long-term trend
- To stress most recent mortality experience, the regression line is fitted with weights

$$w_s = \left(1 + \frac{1}{h}\right)^{s-t}$$



Model Simulation (ctd.)



- **Weighting parameter h has massive impact**
- **Plausible one-year and run-off scenarios**
- **Each run-off scenario is a combination of one-year scenarios**
- **Disentangling of one-year noise and long-term trend uncertainty**
- **Possibly more plausible confidence bounds than for a random walk with drift**

Model Simulation (ctd.)

Projection of $\kappa_{t,p}^{(1)}$ for individual populations

■ For each individual population we project as

- $\kappa_{t,p}^{(1)} = \kappa_{t,total}^{(1)} + a_p + b_p (\kappa_{t-1,p}^{(1)} - \kappa_{t-1,total}^{(1)}) + \varepsilon_{t,p}$
- b_p denotes the „mean reversion speed“ (absolute value should be smaller than 1)
- $a_p / (1 - b_p)$ is the long-term difference between the total population and population p

■ Different approaches of calibrating the long-term difference

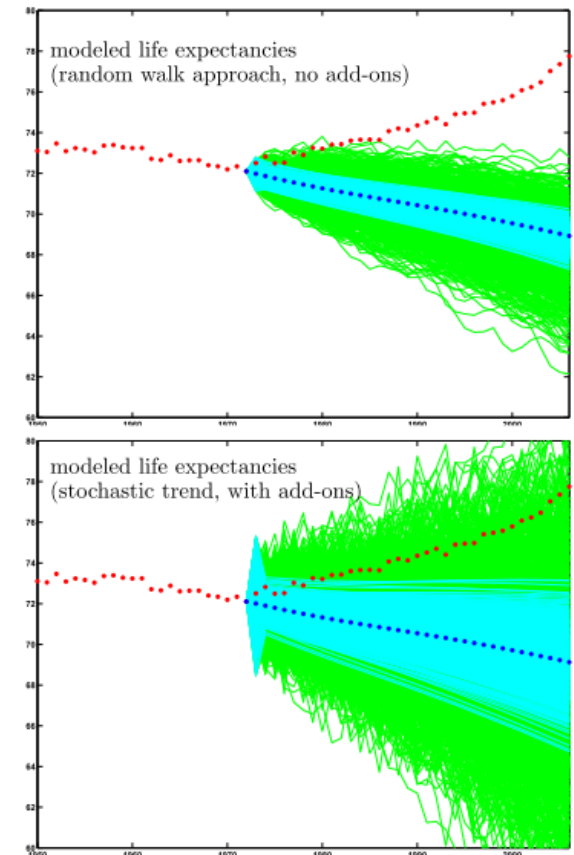
- Fitting of an AR(1) process to historical differences
- Weighted/unweighted average of historical differences
- Extrapolation of most recent differences and leveling off after a couple of years

Model Simulation (ctd.)

- **Projection of $\kappa_t^{(2)}$, $\kappa_t^{(3)}$, and $\kappa_t^{(4)}$ for the individual populations**
 - No substantial trend obvious in the historical data
 - Forecast as correlated 3-dimensional random walk
 - No substantial correlation with $\kappa_t^{(1)}$
 - Volatility add-on $\bar{\sigma}^{(2)}$ for $\kappa_t^{(2)}$
 - The larger the changes in the slope of the mortality, the smaller the correlation between young and old ages
 - Thus the add-on affects diversification between mortality and longevity risk
 - Between populations, increments of $\kappa_t^{(1)}$ and $\kappa_t^{(2)}$ are correlated
 - This also implies slight correlation between the $\kappa_t^{(3)}$ and $\kappa_t^{(4)}$
 - Historical correlations should be checked carefully though and possibly adjusted
- **Projection of γ_{t-x}**
 - Cohort parameters should stay around zero
 - Forecast as imposed stationary AR(1) process
 - Cohort parameters are rather irrelevant for short-term simulations as under Solvency II

Weighting Parameters and Volatility Add-ons

- Parameters $h, \bar{\sigma}^{(1)}$, and $\bar{\sigma}^{(2)}$ have a massive impact on simulation outcomes and thus SCR
- Add-on $\bar{\sigma}^{(1)}$ determines possible severity of short-term events
- Weighting parameter h determines trend changes over one year and width of confidence bounds
- Calibration is difficult but should be conservative
 - Fitting to most severe events/evolutions in the past
 - Example: Rapid increase in Dutch life expectancy gains starting from about 1970
 - Question: At which percentile should such extreme evolutions be observed?
 - Note: The parameters interact with each other even though h depends on $\bar{\sigma}^{(1)}$ only weakly
- Calibration of $\bar{\sigma}^{(2)}$
 - The larger the add-on the smaller the correlation between young and old ages thus limiting diversification
 - Choose $\bar{\sigma}^{(2)}$ such that correlation between ages at the boundaries of the age range is (close to) zero for most populations



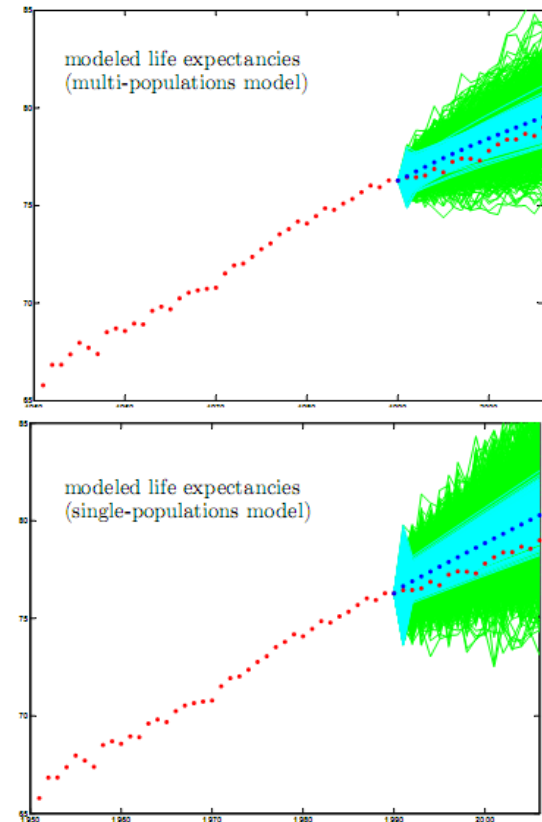
Mortality/Longevity Threat Scenarios

- Available data contains only little information on tail scenarios which we are interested in
- Uncertainty remains whether model outcomes are severe enough
 - Incorporate epidemiological/demographic expert opinion
- **Specification of mortality/longevity threat scenarios**
 - Shock to mortality projection
 - Likely effects of finding of a cure for a certain illness
 - Scenarios which the statistical model cannot generate, e.g., diverging mortality trends between countries/regions
 - ...
- **Application of threat scenarios**
 - Check of model calibration: Adjustment of weighting parameter or volatility add-ons if the model outcomes should cover the threat scenarios but do not
 - Inclusion in SCR computations: SCR as a weighted average of model outcomes and threat scenarios

Summary

■ We have specified and calibrated a mortality model with several appealing properties:

- Full age range
- Variability in simulation outcomes due to 5 stochastic drivers
- Clear interpretation of the model parameters
- Non-trivial correlation structure to allow for simultaneous modeling of mortality and longevity risk
- Stochastic trend modeling spares full re-calibration of the model in each scenario (could be applied in other models as well)
- Plausible outcomes in one-year view and run-off view
- Conservative calibration
- Inclusion of expert opinion
- Multi-population model allowing for diversification effects



Contact Details

Matthias Boerger

Institute of Insurance, Ulm University & Institute for Finance and Actuarial Sciences (ifa), Ulm
Helmholtzstraße 22, 89081 Ulm, Germany

Phone: +49 731 50-31257, Fax: +49 731 50-31239

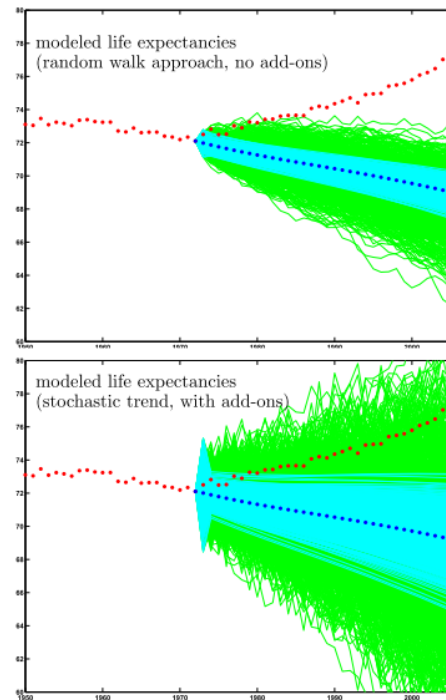
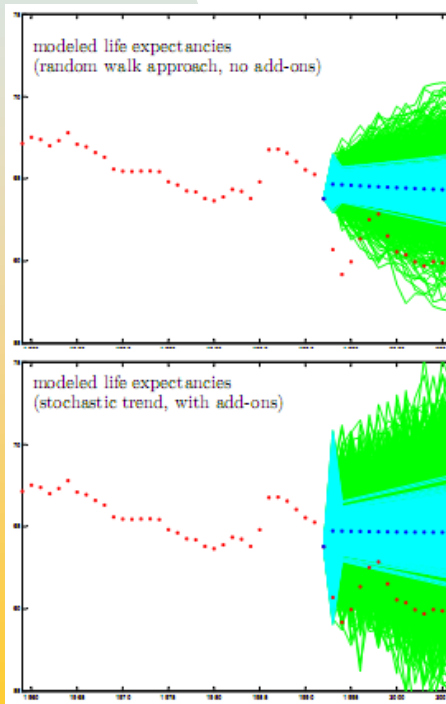
Email: m.boerger@ifa-ulm.de



Appendix

Weighting Parameters and Volatility Add-ons

- Parameters $h, \bar{\sigma}^{(1)}$, and $\bar{\sigma}^{(2)}$ have a massive impact on simulation outcomes and thus SCRs
- Most importantly, $\bar{\sigma}^{(1)}$ determines extreme short-term events, h extreme long-term evolutions
- Calibration is difficult but should be conservative
 - Fitting to most severe events/evolutions in the past
 - Short-term: Drop in life expectancy in Russia at the beginning of the 1990's
 - Long-term: Rapid increase in Dutch life expectancy gains starting from about 1970



Weighting Parameters and Volatility Add-ons (ctd.)

- **Calibration of $\bar{\sigma}^{(1)}$ in the multi-population setting:**
 - Add „non-Western“ countries with data available in the HMD (e.g. Russia)
 - About 50 years of historical data
 - Choose $\bar{\sigma}^{(1)}$ such that most severe event (drop in life expectancy in the 1990's) is seen e.g. at the 98th percentile
- **Calibration of h in the multi-population setting:**
 - Trend break around 1970 is the most significant long-term change in the available data
 - Several years of data required to observe a trend change
 - Choose h such that trend change is observed, e.g., at the 90th or 95th percentile (measure of conservatism)
- **Note: The parameters interact with each other even though h depends on $\bar{\sigma}^{(1)}$ only weakly**
- **Calibration of $\bar{\sigma}^{(2)}$**
 - The larger the add-on the smaller the correlation between young and old ages
 - Thus, diversification between mortality and longevity risk is typically reduced
 - Choose $\bar{\sigma}^{(2)}$ such that correlation between ages at the boundaries of the age range is (close to) zero for most populations