



## Coherent Projections of Age, Period, and Cohort Dependent Mortality Improvements

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**December 2011**

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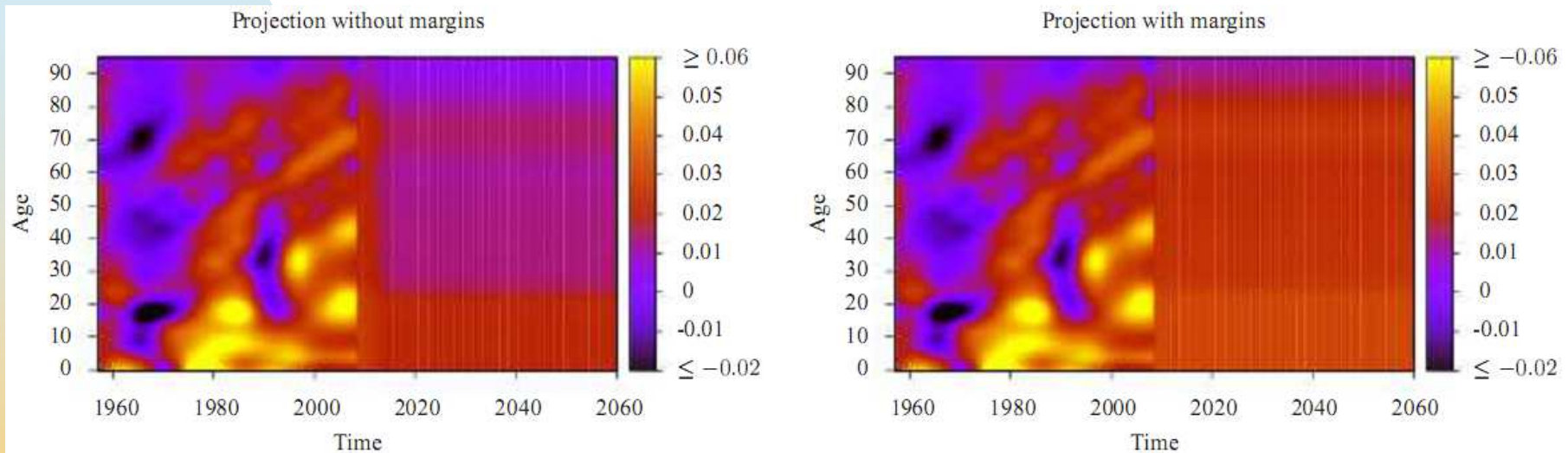
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## Introduction

- Some of the currently used standard projections show significant shortcomings
- Example: standard projection for German annuity business

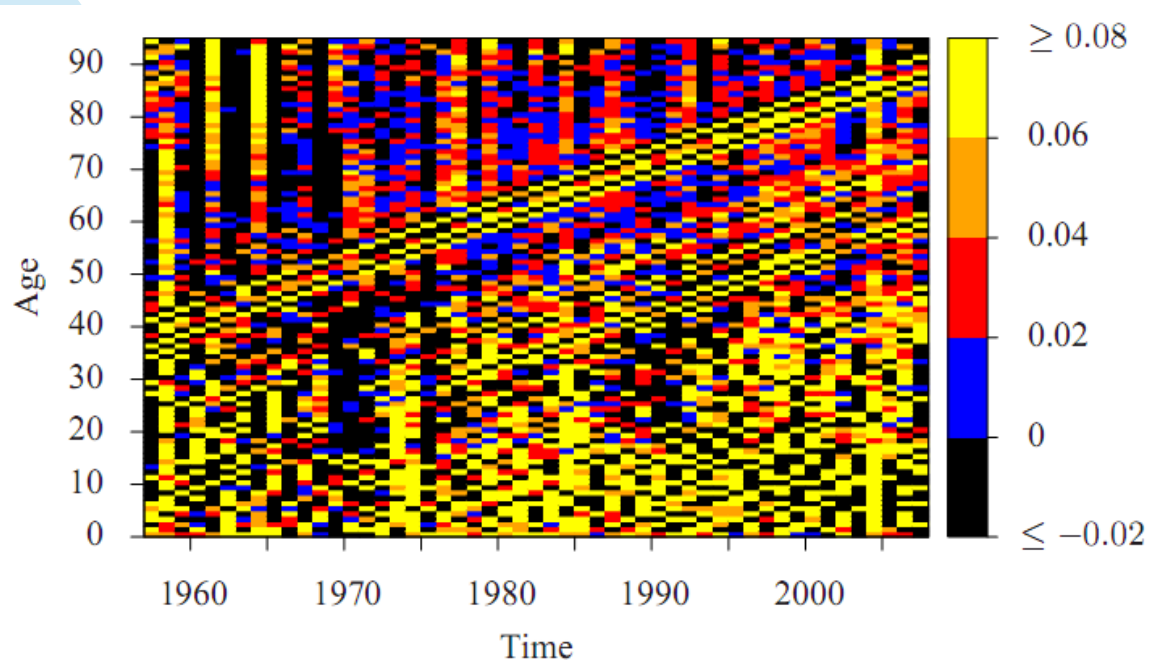


- Structural break between historical and projected improvements
- No cohort effects
- Possibly significant underestimation of future mortality improvements

→ **Space and need for improvement of current projections**

## Model Specification

### Raw historical mortality improvements for German males



- Historical data show period and cohort dependent effects
- Mortality improvements have often been shown to be age dependent as well
- We model one-year mortality improvements according to the APC model:

$$v(x, t) = a_x + p_t + c_{t-x}$$

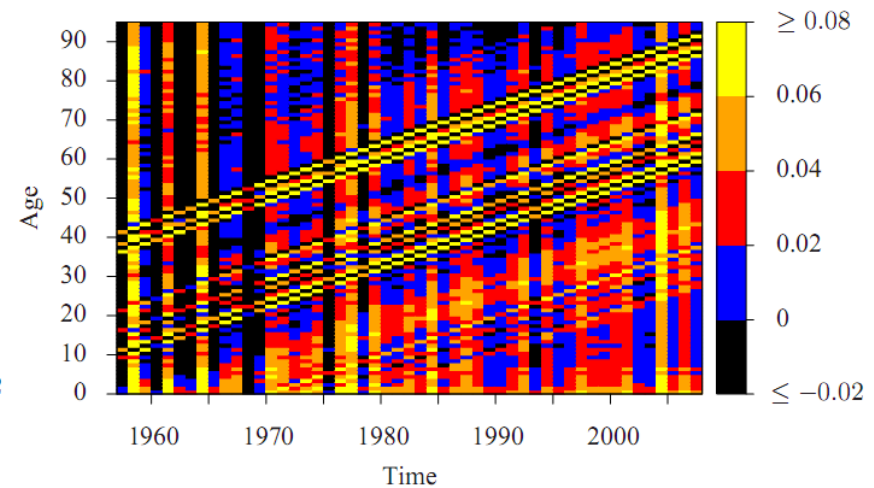
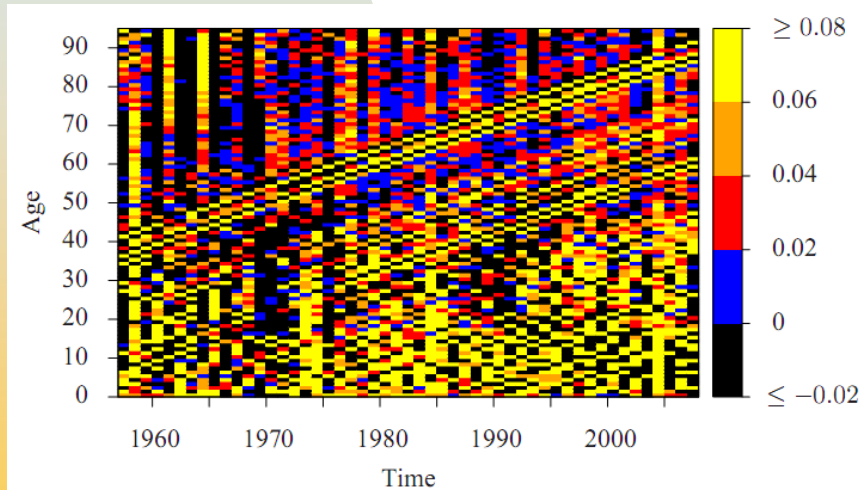
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## Model Constraints

- **Random noise in cohort parameters at the boundaries**
  - Parameters are fitted to only a few data points
  - We set them to their historical average
  - Number of cohort parameters depends on the data set
- **Identifiability problem: APC model calibration is not unique**
  - Period parameters sum up to zero
  - For convenience: Cohort parameters sum up to zero
  - Thus, all “substance” is contained in the age parameters

## Model Estimation

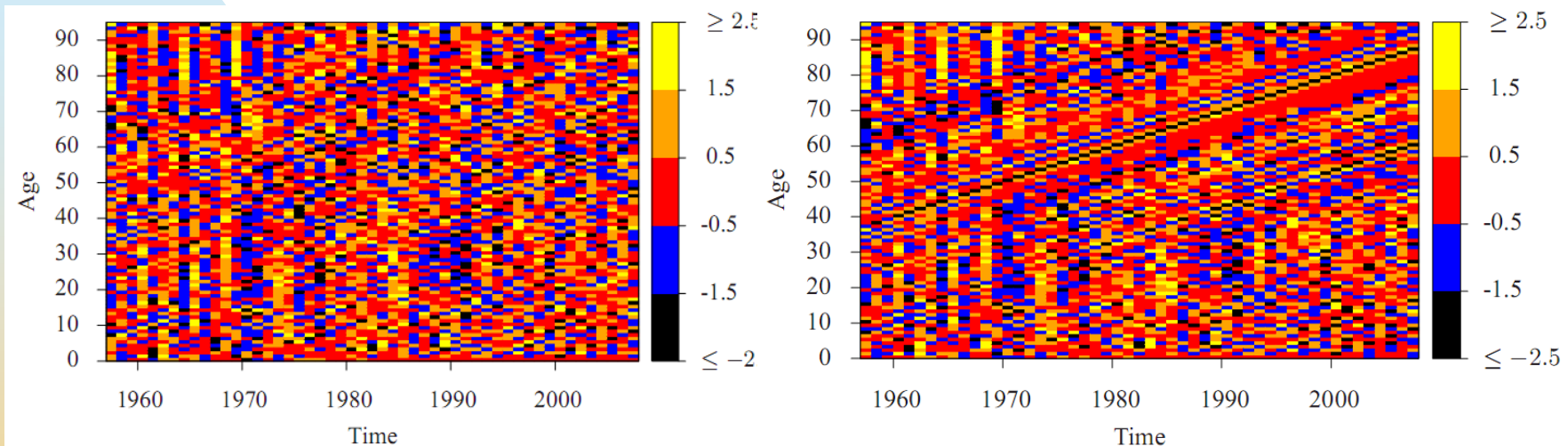
- **Model is fitted in iteratively reweighted least squares**
  - Weighting important due to stronger random fluctuations for young ages in particular
  - As weights we use empirical standard deviations from surrounding cells
  - Iteration is stopped when all model parameters change by less than 0.1%
- **Raw and fitted mortality improvements**



- Very similar in structure
- Model just seems to eliminate random noise

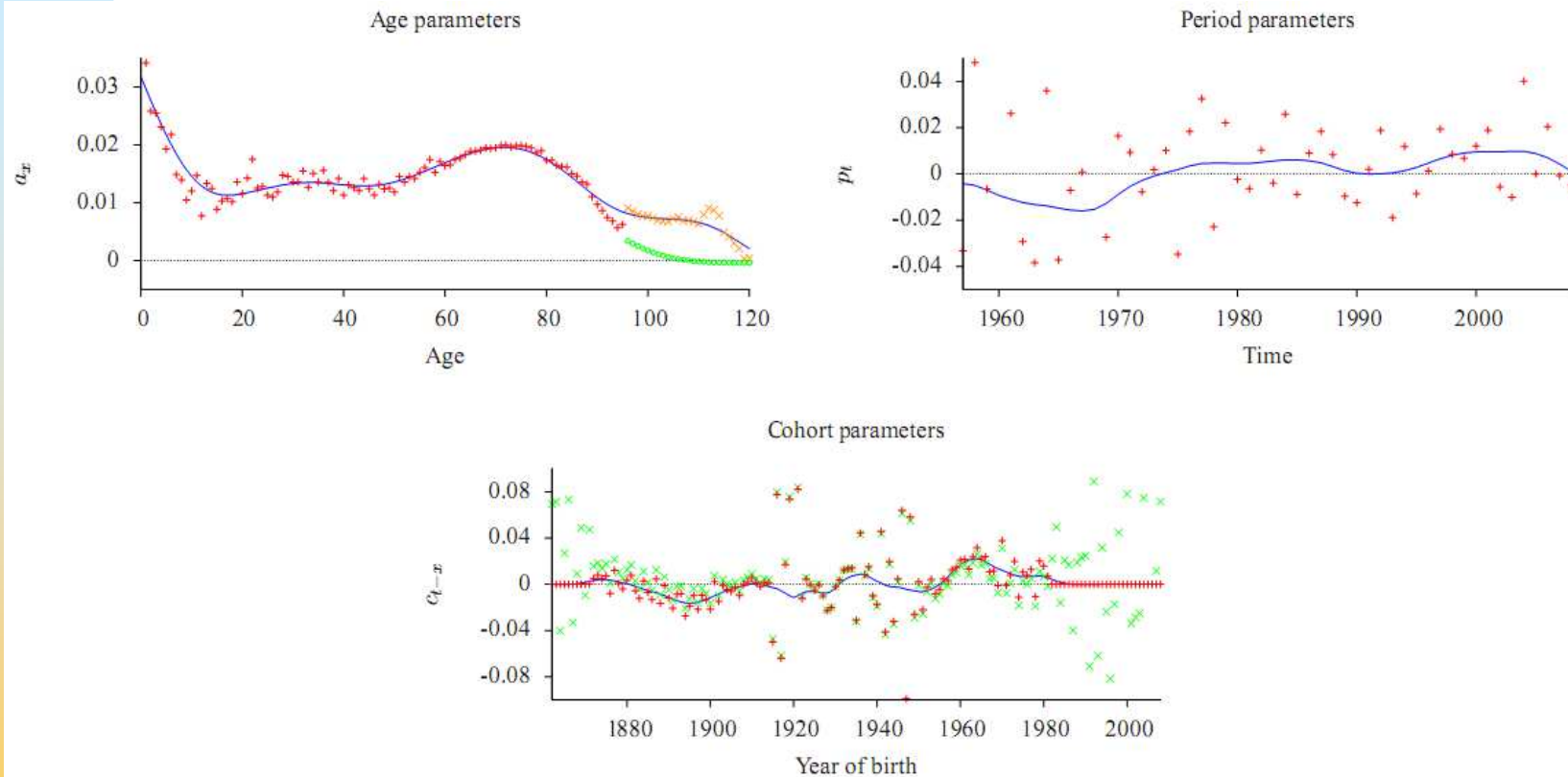
## Model Estimation (ctd.)

### Standardized residuals for full model and model without cohort parameters



- **Residuals contain almost no structure  
→ Model specification seems adequate**
- **Model simplification obviously not feasible**

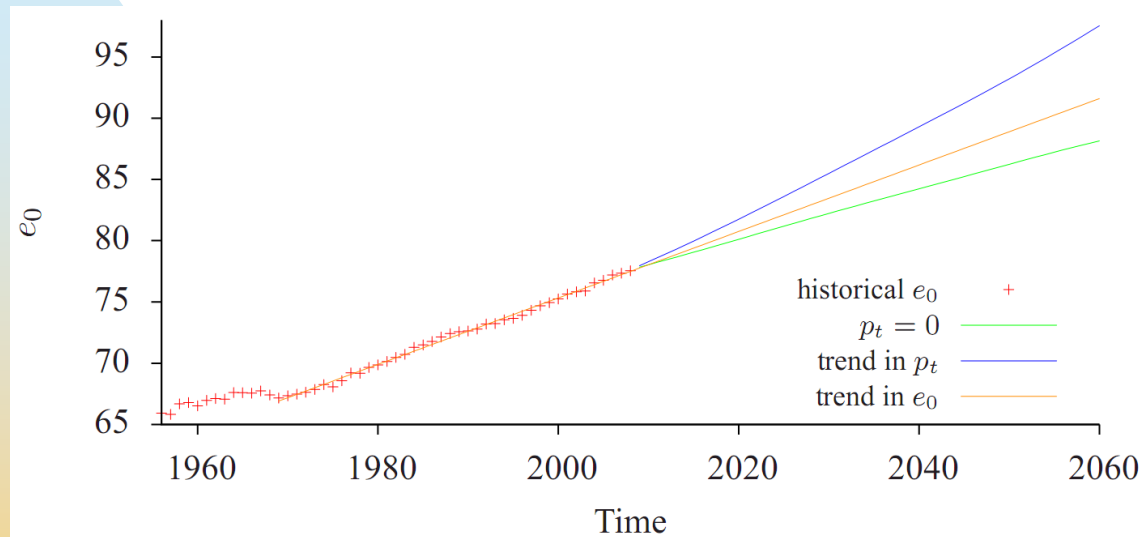
## Estimation Results



- **Age parameters starting from age 96 are based on extrapolated mortality rates**
  - Period-wise (green) and cohort-wise (orange) Kannisto extrapolations
  - Period-wise extrapolations yield negative and thus implausible age parameters
  - We consider age parameters from cohort-wise extrapolations

## Projection

### ■ Projection uncertainty can be massive for individual countries



### ■ Information from other populations can reduce projection uncertainty

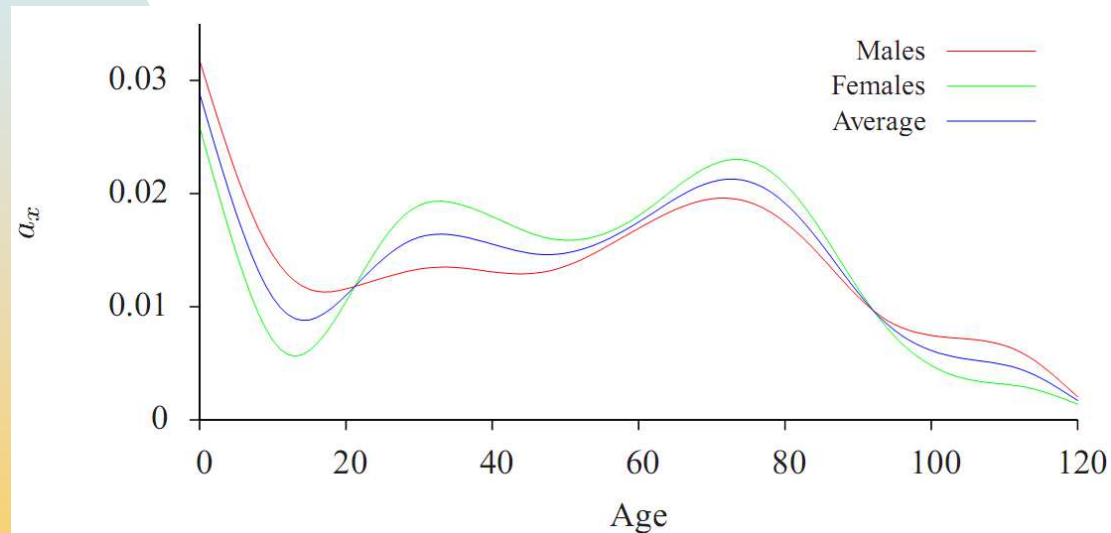
#### ■ Goal: Coherent Projections between

- Males and females in the same country (e.g. Germany)
- Populations in different but related countries (e.g. European countries)



## Projection of Age Parameters

- Different age parameters between males and females lead to diverging mortality rates
- Thus, the age parameters should be equal in the long run
- Projection for both genders according to average of age parameters
  - Appropriate if parameter values are similar for males and females



- Analogous approach may be reasonable for age parameters for populations from different countries

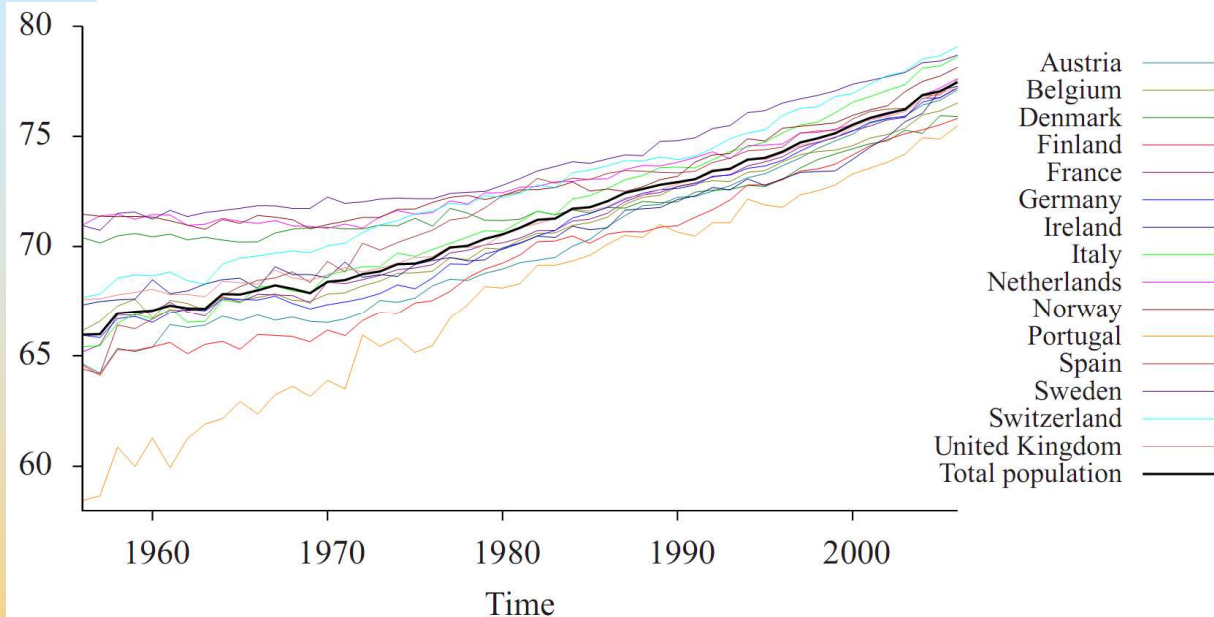
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## Projection of Cohort Parameters

- **Cohort effects are only temporary and thus, do not affect the long-term coherence of mortality projections**
- **Even in the same country, cohort effects for males and females are not necessarily correlated (cf. MacMinn and Weber (2011, Select birth cohorts))**
- **We keep cohort parameters as fitted for each population individually**  
**Parameters for new cohorts are set to their long-term average of zero**

## Projection of Period Parameters

### Common trend in life expectancies in Europe

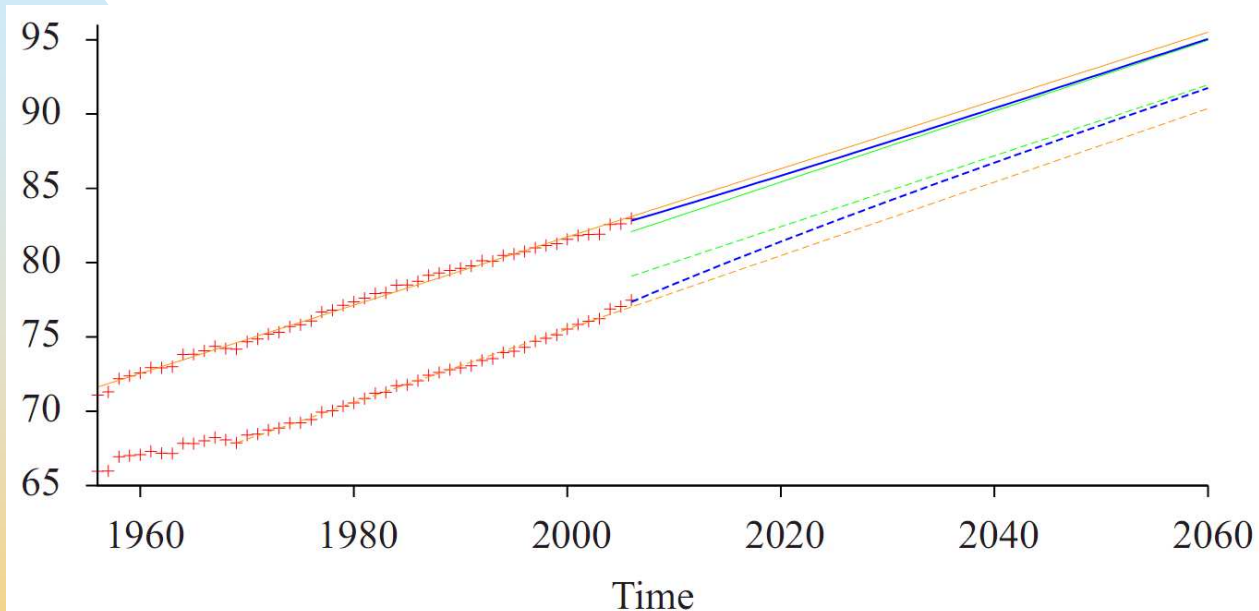


### Projection approach for period parameters:

1. Extrapolate life expectancies for total population (coherent for males and females)
2. Determine life expectancy extrapolation for individual population relative to total population
3. If appropriate: Modification of extrapolations to account for model uncertainty, margins,...
4. Fit period parameters such that these life expectancy extrapolations are met

## Projection of Period Parameters (ctd.)

### Life expectancy extrapolations for male and female total populations



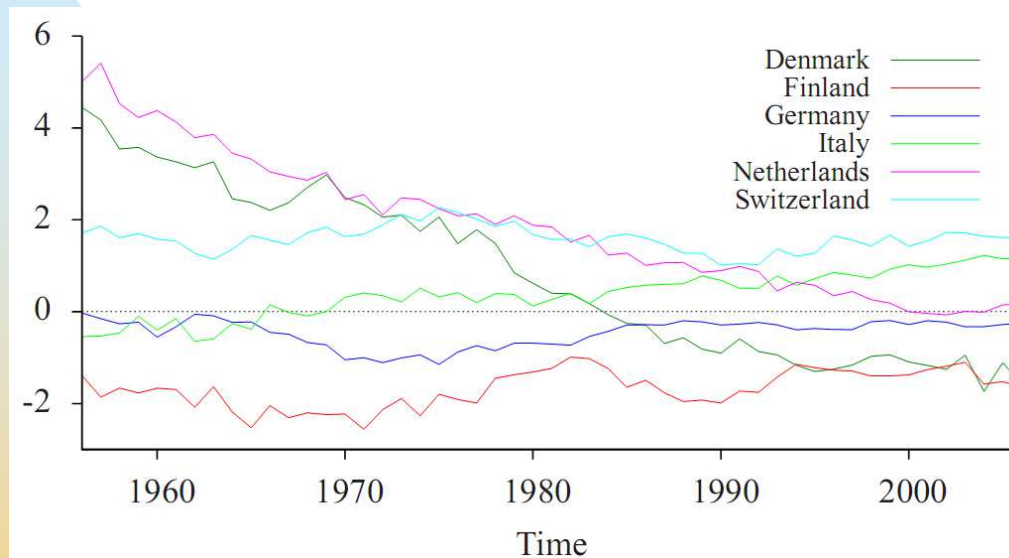
- Long-term trend according to average of linear historical trends for males and females
- Difference in life expectancies has been decreasing since the mid-1990's
  - Extrapolation of this trend in the short run
  - Convergence in lifestyles, e.g. consumption of tobacco/alcohol, employment
  - Luy (2002): Difference in life expectancies between nuns and monks is only about 1 year
- We assume a long-term difference in life expectancies of 3 years

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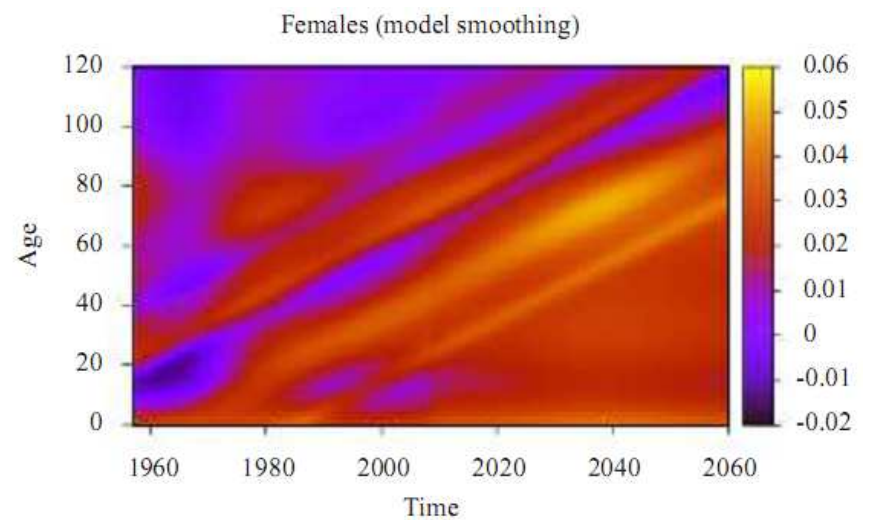
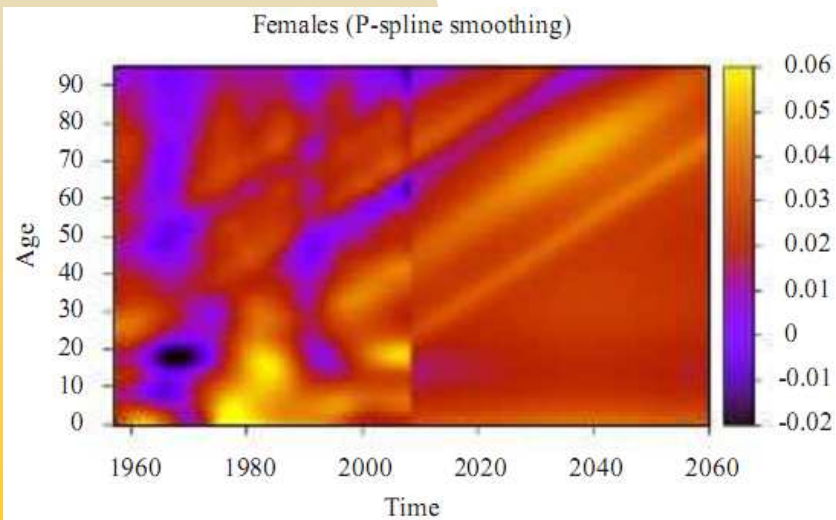
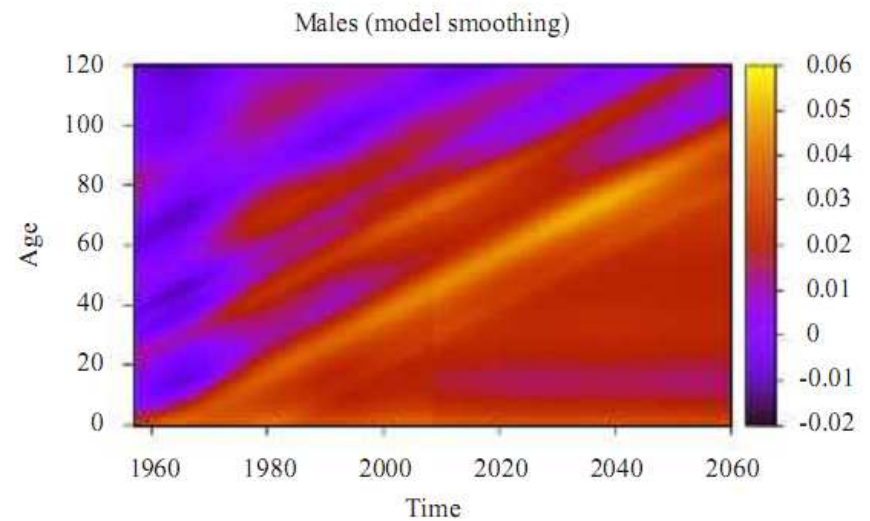
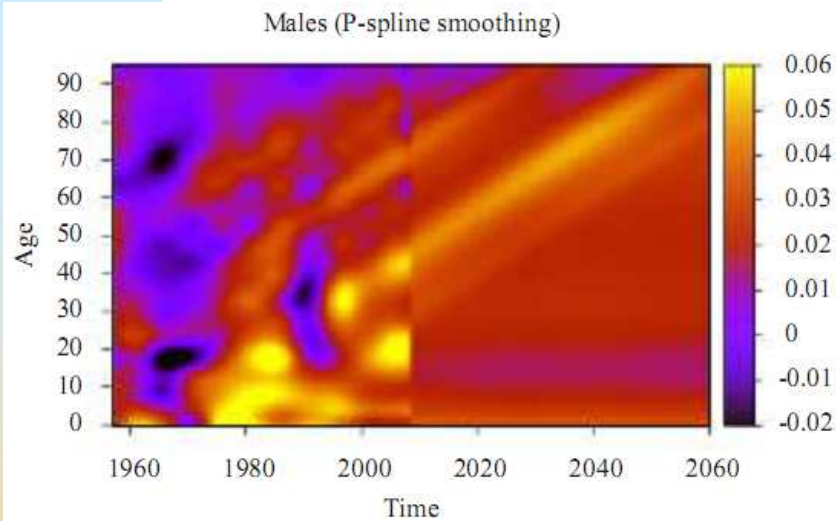
## Projection of Period Parameters (ctd.)

### Differences in life expectancies between male total population and individual populations



- **Extrapolation according to total population not always appropriate, e.g. for Switzerland**
  - Assumption of a higher life expectancy also in the long run
- **Individual life expectancy projections for Italy and Denmark would not be plausible**
  - A leveling-off at about the current life expectancy difference or a convergence to life expectancies of the total population seems more plausible
- **Life expectancy for German males has been about 0.3 years below average recently**
  - Projection of individual life expectancies by downward shift by 0.3 years
  - For females: downward shift by 0.5 years

## Projection for Germany



## Projection for Germany (ctd.)

- **Plausible extrapolation of historical structures, in particular cohort effects**
- **Structural break in the P-spline case is due to different degree of smoothing**
  - Optimal degree of smoothing is unclear
- **Slight structural break in the model smoothing case due to switch to average age parameters**
- **Strong improvements around age 20 in recent years**
  - Model does not detect these as age effects
  - Possibly cohort effects, more observations required
  - Evolution needs to be followed closely over the next years

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## Contact Details

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