IFoA International Research in Mortality

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Actuarial Research Centre

Institute and Faculty of Actuaries



- Background
- Major research programmes
- Stochastic mortality modelling
- Danish population insights
- Ongoing research





ARC: Actuarial Research Centre

- 2016: Institute and Faculty of Actuaries scaled up significantly its programme of funded and commissioned research
- Funding focus: substantial, long-term research problems
- Shorter term research problems: volunteer working parties
- ARC:
 - vehicle for oversight and delivery of commissioned research
 - development of an international, virtual network for actuarial researchers with specific interests in applied actuarial research
- Objectives:
 - Internationally leading research
 - Research with impact

ARC: Actuarial Research Centre (cont.)

Major funded research programmes (2016-2020/21):

- Use of Big Health and Actuarial Data for Understanding Longevity and Morbidity
 - The development of new statistical and actuarial methods in the use of Big Data, in the context of health and wider applications
- Modelling, Measurement and Management of Longevity and Morbidity Risk
 - A new generation of mortality and morbidity models, with a specific focus on the drivers for mortality
- Minimizing longevity and investment risk while optimising future pension plans
 - Future pension products that meet customer needs, balancing stability, performance and cost

ARC: Actuarial Research Centre (cont.)

- Medium-sized commissioned projects:
 - New approaches to economic modelling
 - Behavioural finance
 - Longevity basis risk
 - "legacy project", phase II
 - International team (Macquarie and Waterloo)
 - Collaborative funding: Life and Longevity Markets Association (LLMA)
 - Multipopulation mortality modelling
 - Financial applications, especially longevity risk hedging





• 17 May 2017

Modelling, Measurement and Management of Longevity and Morbidity Risk

• 13 June 2017

Use of Big Health and Actuarial Data for understanding Longevity and Morbidity

• 14 June 2017

Minimising Longevity and Investment Risk while optimising Future Pension Plans

• All at both 09.00 and 17.00 UK time

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Big Health Actuarial Data

- Professor Elena Kulinskaya, University of East Anglia, UK
- Development of novel statistical and actuarial methods for key factors affecting mortality
- Use of "big data"
- E.g. The Health Information Network (THIN)
 - General practitioner records
 - $_{\bullet} \sim$ 12 million patient records
 - \bullet 1987 present
- New insights
 - e.g. linking treatments to outcomes

Big Health Actuarial Data (cont.)

- Early success:
 - New England Medical Journal: Sprint Challenge
 - Does medication to reduce blood pressure increase survivorship?
 - NEMJ (2016) \Rightarrow yes
 - ARC research (2017) \Rightarrow maybe no
- Plans: impact of
 - lifestyle choices
 - ${\scriptstyle \bullet}$ medical conditions and/or
 - interventions





Modelling, Measurement and Management of Longevity and Morbidity Risk

Heriot-Watt University, UK; led by Andrew Cairns

- WP1: New/improved models for modelling longevity
- WP2: Underlying drivers of mortality
- WP3: Management of longevity risk
- WP4: Modelling morbidity risk for critical illness insurance



Modelling, Measurement and Management of Longevity and Morbidity Risk

International in its outlook

- Sponsors
 - Institute and Faculty of Actuaries
 - Society of Actuaries
 - Canadian Institute of Actuaries
- Research team: UK, Denmark, USA
- Research problems
- Data





Big Data and Multi-Population Modelling

Datasets:

- National datasets: Human Mortality Database
- Sub-populations: (what and why)
 - Different socio-economic groups
 - Typical pension plan or life insurer data
 - Sub-populations modelled alongside national population
 - Further road testing of stochastic models
- Big data
 - Danish national register database
 - UK: The Health Information Network (THIN)
 - US: CDC deaths







Danish Data

Many potential covariates

- ${\scriptstyle \bullet}$ Income and wealth \rightarrow affluence
- Educational attainment
- Marital status, occupation, health information, cause of death, ...
- Much richer dataset than other countries e.g. UK
- UK: mortality by occupation group only
- Denmark: compare
 - Mortality by affluence
 - Mortality by occupation group
 - $\bullet\,\Rightarrow$ potential inferences about UK mortality by affluence



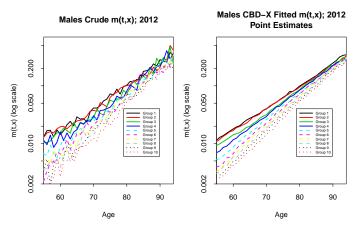
Other Data Sources

- Other national databases with socio-economic detail
- Large pension plans
- Insurer portfolios
- Industry data
- Suggestions are very welcome!
- ??? Publishable in aggregate format
- Also cause of death data by socio-economic status





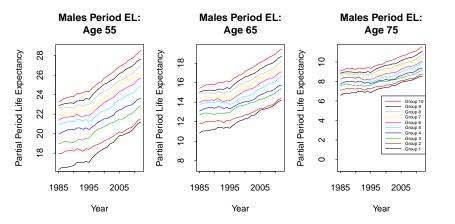
Example: Denmark, Male Death Rates in 2012



- $\bullet~$ National population \rightarrow 10 affluence based subgroups
- Combination of good data/covariate and a good stochastic model
- Consistent picture over 1985-2012



Partial Period Life Expectancy for Groups 1-10





Research Centre Institute and Faculty of Actuaries

Actuarial

Other Predictive Variables

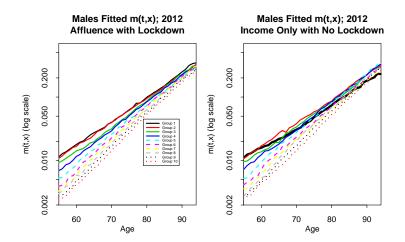
- Choice of predictive variable makes a big difference
- Affluence
- Lockdown at 67
- Income only
- Education

- Life expectancy is a useful headline
- But mortality rates reveal inconsistencies





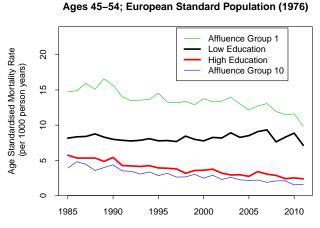
Affluence versus Income







Education as an Alternative Covariate



Year

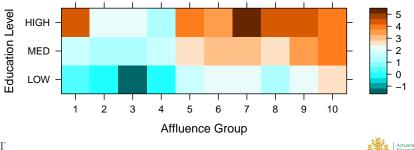
Age Standardised Mortality Rates per 1000



Education as an Alternative Covariate

Dig a bit deeper: Affluence + Education: average ASMR's over 5 years

> Mortality Improvement Rates (%) Period 1987–2009; Age Band 45–54 By Affluence and Education Group

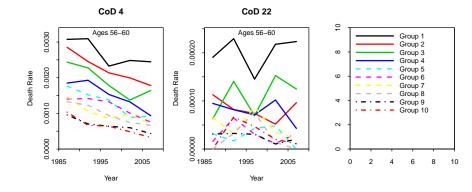




Denmark: Cause of Death Data

- Deaths subdivided into 27+ CoD groups
- Compare affluence groups
- Biggest differences at younger age groups e.g. 51-55
- Causes of death linked to lifestyle
 ⇒ some CoD death rates are up to 20× higher
- Growing gaps: liver diseases; diabetes
- Almost all CoD groups have a strong statistically significant difference

Denmark: Cause of Death Data (cont.)



- $\bullet~5\times5$ ages and years
- CoD4: Lung cancer and related cancers
- CoD22: Diseases of urine, kidney, genital organs and breast glands

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Denmark: Cause of Death Data (cont.)

- Some causes of death should not (???) be linked to lifestyle/affluence/education
- Possible explanations (a very non-expert view)
 - onset is not dependent on lifestyle/affluence/education
 - ${\scriptstyle \bullet}$ BUT less affluent/educated \Rightarrow
 - ??? later diagnosis
 - ??? engage less well with treatment process





Other Lines of Work

Developing new datasets

- More with Danish data
- Pension plan data (various e.g. UK, Canada)
- US: CDC deaths records; + other
- Objective: country-specific suitability of individual stochastic models for specific applications
- Cause of death data: further insights

Other Lines of Work (cont.)

- Multipopulation stochastic mortality models
 - Refining existing models
 - Developing new models
 - Testing out existing and new models on real data
 - Risk management applications

Other Lines of Work (cont.)

- Single population stochastic mortality models
 - New models
 - New flexible and robust approaches to model fitting
 - Wider age ranges
 - Time series model calibration: Flexible approaches to determining central forecast
 - Using stochastic scenarios to select deterministic stress tests and scenarios

Other Lines of Work (cont.)

- Applications
 - ${\scriptstyle \bullet}$ Risk assessment \rightarrow risk management
 - Assessment of longevity hedges
 - Impact!





Thank you!

${\sf Questions}/{\sf Discussion}$

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