

15 June 2018

Agenda

- Background
- The datasets
- The models
- The results

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· Comparing mortality measures

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Background



Older age health dynamics

 Current developing technologies will enable the insurers to track the health of their customers at older age continuously

Objectives of this analysis

- Add evidence to current literature on older age dynamics
- Use English National Dataset to explore the interaction between the burden of disease and mortality in older age
- · Support the debate on the benefits of continuous underwriting





English Longitudinal study of Ageing

- ELSA is a longitudinal survey dataset for the study of:
 - health,
 - economic position, and
 - quality of life among the elderly.
- · It was modelled after the Health and Retirement Study (HRS), a similar longitudinal survey dataset for the United States.

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Wave 5 7/2010 to 6/2011

Cohort 1 Cohort 3

and Cohort 4 continued

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ELSA sampling

ELSA sampling				
	Wave 1	Wave 2	Wave 3	Wave 4
 The technical details of 	\vdash		+	
this study are also	3/2002 to	6/2004 to	5/2006 to	5/2008 to
available at the web site	3/2003 Cohort 1	6/2005	8/2007 Cohort 3	7/2009 Cohort 4
of the Institute of Fiscal	50+ on		50 to 53	50 to 74
Studies	1 March 2002		1 March 2006	1 March 2008
http://www.ifs.org.uk/elsa/	HSE 1998/1999 2001		HSE 2001 to 2004	HSE 2006
				1

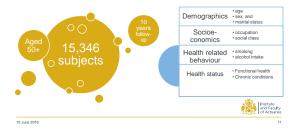


ELSA – reported diagnoses

- Pulmonary diseases (lung disease and asthma)
- Arthritis
- Cancer
- · Neurological (Parkinson's, Alzheimer, dementia and senile)
- Cardiac diseases (Angina, hearth attack, congestive heart failure, heart murmur and abnormal heart rhyme)

Stroke
 Stroke
 Stroke

The analysis sample





The models Hazard model and multi-state actuarial model

Proportional hazard model

 competing risk cox proportional hazard model was estimated using 10 years follow up on mortality between 2002 to 2012

Traditional underwriting	••
Underlying analysis	• • • • • • • • • • • • • • • • • • • •
Continuous underwriting	

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Multi-state actuarial model

- The goal is to estimate age-specific transition probabilities among a sample of English older adults aged 50 to 90 at baseline in 2002
- A time-continuous inhomogeneous Markov chain was adopted
- Generalized linear models (GLM) were adopted for graduating both mortality and disability transition intensities

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Markov process for transition probabilities

- The transition probability P_{ij} from state i to state j after t years from policy issue is defined by

 $- P_{ij}(t, t + \Delta t) = Pr{S(t + \Delta t) = j|S(t) = i}$, t ≥ 0, Δt ≥ 0, i, j ∈ {N, FD, D}

- The instantaneous transition intensities are aged dependent and are assumed to be defined on compact intervals, and are defined by
 - $I_{ij} = \lim_{\Delta t \to 0^+} \frac{P_{ij}(t,t+\Delta t)}{\Delta t}$, $t \ge 0, i \neq j$
- Transition intensities were estimated from the data, the transition probabilities were derived using Kolmogorov differential equations (Haberman and Pitacco 1999)

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Definitions of health states

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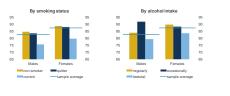
- Reported chorionic diseases were used to define the state (CH).
- Pulmonary disease is used as an example to demonstrate the modelling.
- Moving from the state of healthy (H) to chronically ill (CH) was captured by the change in number of respondents who are diagnosed with the underlying chronic condition in six ELSA interview waves, between 2002 to 2012.
- Follow up on death data were available for the years 2002 to 2012

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Age at death

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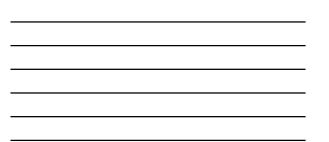




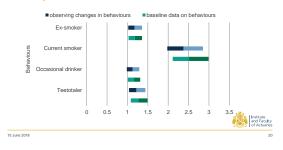
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Mortality hazard ratios - compared with no medical conditions





Mortality hazard ratios - compared with no smokers & regular drinkers



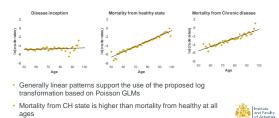
Raw transitions counts and exposure years for pulmonary disease

	i _x = Number of transitions			$e_x = exposure years$		
Age band	$\sigma: H \rightarrow CH$	$\mu:H \rightarrow D$	$\nu:CH \rightarrow D$	in state H	in state CH	
50-54	53	6	8	7,140.1	1,110.8	
55-59	107	57	23	14,648.9	2,549.8	
60-64	114	90	36	13,651.8	2,665.2	
65-69	122	124	55	11,396.9	2,529.6	
70-74	80	176	88	10,244.4	2,319.5	
75-79	85	273	118	8,055.5	1,878.7	
80-84	49	346	118	5,719.3	1,239.0	
85-89	24	363	95	3,295.8	617.1	
90 and over	19	334	72	1,437.6	243.0	
Total	653	1.769	613	75.590.2	15.152.7	

Data from 10 years follow-up period between 2002 and 2012, of ELSA respondents for household residents aged 50 and over



Testing linearity of the regressor η_x



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Poisson GLM: Goodness of fit of the models

k	AIC	BIC	D	Dc	p-value	
σ:H→CH	disease ir	cidence				
1	5.18	-126.98	41.48			
2	5.20	-123.80	40.83	-0.65	0.421	
3	5.22	-120.90	39.36	-1.47	0.334	
µ:H→D	D death from healthy state					
1	6.28	-115.03	53.43			
2	6.16	-118.40	46.23	-7.20	0.007	
3	6.06	-121.25	39.56	-6.67	0.010	
v:CH→D death from chronic illness						
1	5.77	-87.32	81.14			
2	5.78	-85.11	79.52	-1.62	0.203	
3	5.78	-83.07	77.73	-1.79	0.181	

k denotes the number age related parameters.

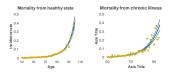
the use of cubic polynomial of age is statistically significant for mortality from healthy state, otherwise first order polynomial is sufficient

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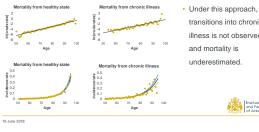
Graduated (smoothed) transition rates



 Not surprisingly mortality from pulmonary disease is higher than mortality from healthy state at all ages



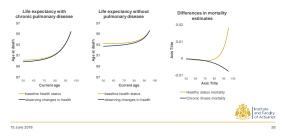
Traditional approach to underwriting



transitions into chronic illness is not observed,

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Comparison of mortality estimates





Summary

- Inequality in health between socioeconomic groups was more prominent when changes in health and disability were allowed in the model
- Taking into account changes in health and disability improves mortality
 prediction
- The accuracy of mortality prediction improves when using continuous underwriting approach
- The current model does not take account for the burden of disease

Future research

- Investigate the inclusion of physical disability and cognitive impairments as measures of the burden of disease
- · Examine interaction between different diseases (comorbidity)
- Use the Cognitive Functioning for Ageing Study (CFAS) as it covers older and more frail respondents
- Examine gender differentials, and other factors that affect mortality hazard
 rates



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