



# Projection mortality including shifts in the age at death distribution, the smoking epidemic, and trends from other countries

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## Shortcomings current (extrapolative) mortality forecasts

- › Not robust
- › Highly dependent on historical period
- › Unrealistically large future differences btwn countries



## In reaction to these shortcomings

- › **Extensions** to the Lee-Carter methodology , e.g. cohort based extension (Renshaw & Haberman 2006)
- › Inclusion of **cohort dimension** (Cairns et al 2011a, Reither et al 2011)
- › Approaches to detect and deal with **structural change** (Booth et al. 2002, Coelho & Nunes 2011, van Berkum et al. 2014)
- › Increased interest in the potential of **including smoking** (and obesity) in mortality forecasting (Pampel 2005, Bongaarts 2006, Wang & Preston 2009, King & Soneij 2011, Preston et al. 2012)(US, micro)
- › **Coherent forecasts** (e.g. Li & Lee, 2005; Cairns et al 2011b; Antonio et al. 2015)



## In addition

- › Projection of **rates of mortality improvement instead of mortality rates** (Haberman & Renshaw 2012; Mitchell et al 2013; Bohk & Rau 2014)
- › Increased attention for **probabilistic** forecasts (Giroso & King 2008, Raftery et al 2013, Bohk & Rau 2014)



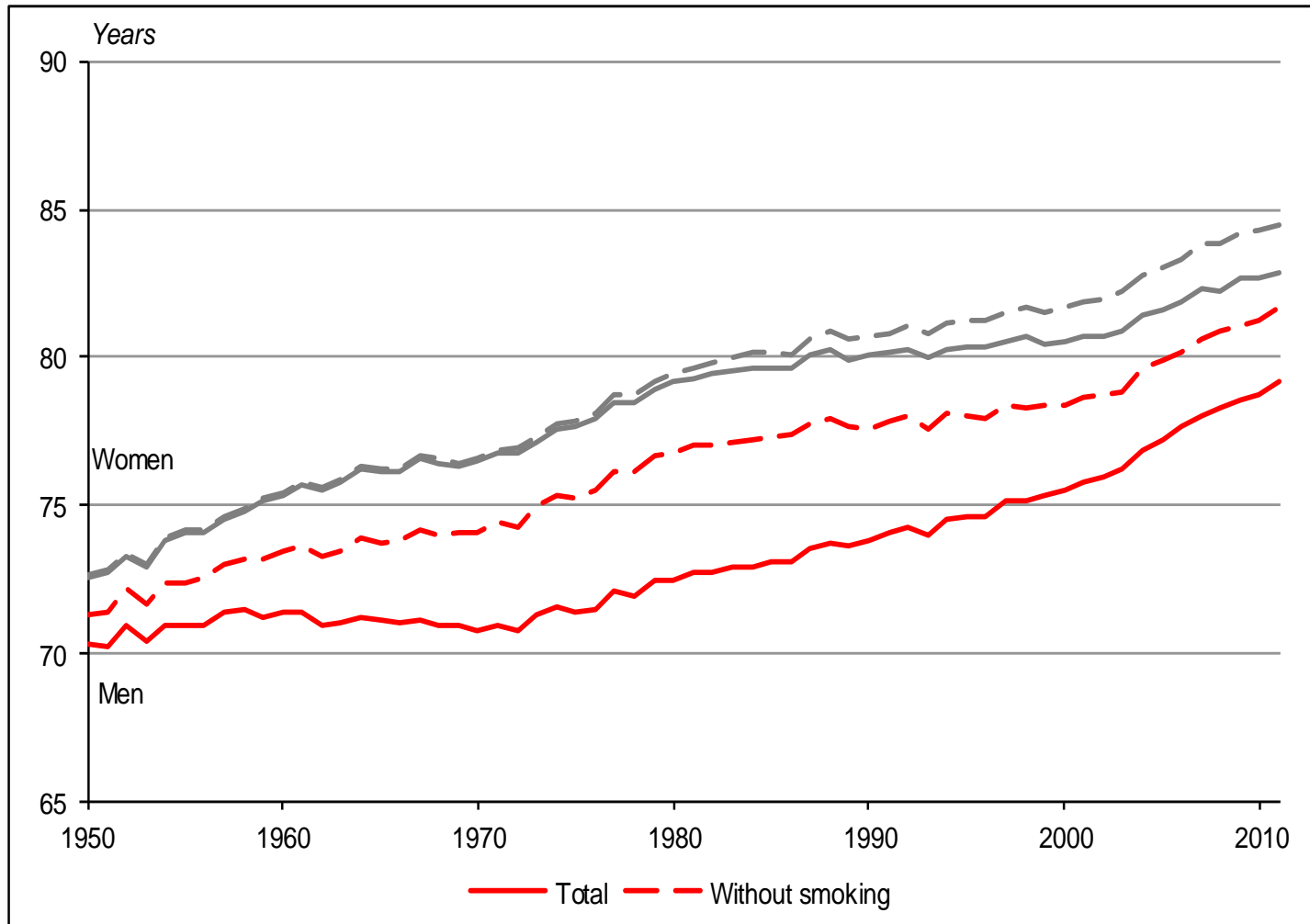
## Janssen et al. Demography (1)

- › Coherent + smoking
- › Identify the most stable long-term mortality trend on which the projection should be based
  - Exclude the effects of important determinants with irregular trends, and predict them separately
  - Include the mortality experience of other – similar – countries and the opposite sex
- › For the Netherlands

See: Janssen et al. 2013, Including the smoking epidemic in internationally coherent mortality projections. *Demography* 50(4), 1341-1362.



# Total life expectancy and life expectancy without smoking, the Netherlands





## Janssen et al. 2013 Demography (2)

Coherent projection non-smoking-attributable mortality rates (Lee-Li)

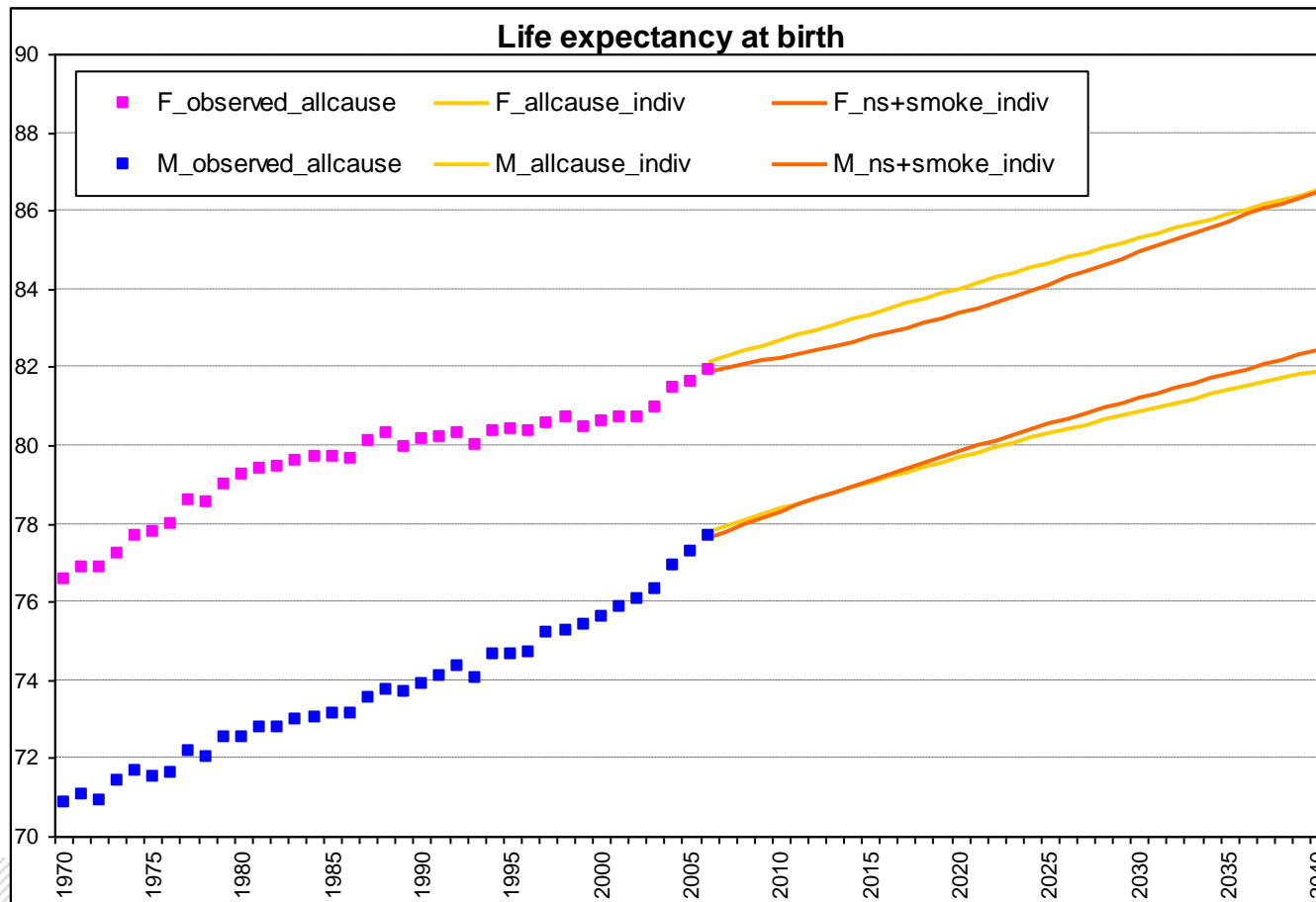
combined with

projection smoking-attributable mortality rates  
(age-period-cohort analyses)

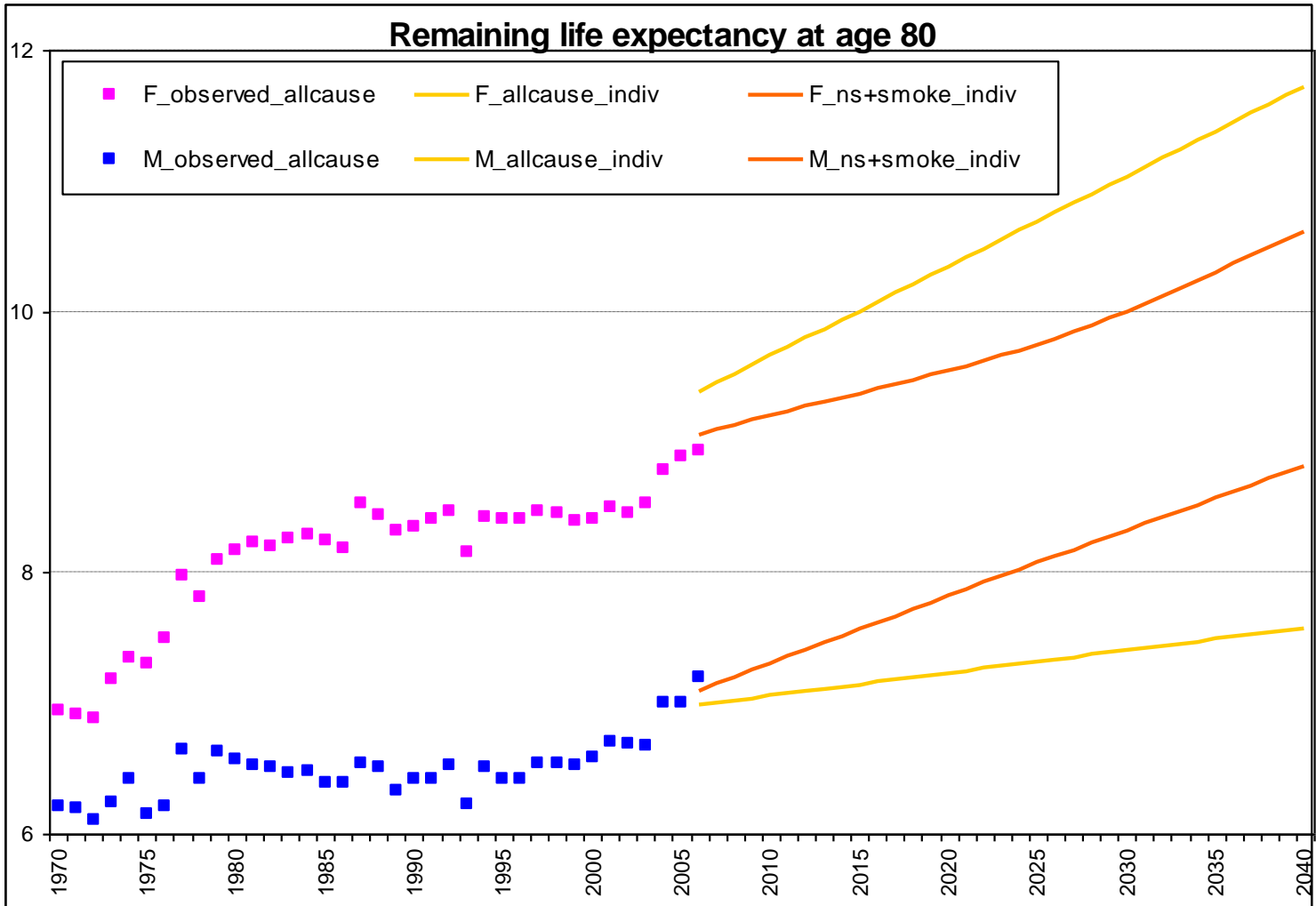
- ⇒ Nonlinearity
- ⇒ Convergence btwn the sexes
- ⇒ Higher life expectancy values
- ⇒ More robust



**Figure 1** Observed and projected life expectancy at birth for the projection of all-cause mortality vs the separate projection of non-smoking-related and smoking-related mortality, by sex, the Netherlands, 1970-2040









**Projected e0 in 2040 by sex, for the different models, the Netherlands**

	All-cause mortality			NS + SM related mortality		
	Males	Females	F-M	Males	Females	F-M
LC	81.89	86.50	4.6	82.42	86.48	4.1
LL M+F*	82.17	86.55	4.4	83.98	85.49	1.5
LL NL+10	83.34	88.34	5.0	84.39	87.88	3.5
LL NL+21	83.68	87.77	4.1	85.04	87.17	2.1
<i>Gains in e0 compared to projected 2006 values</i>						
LC	4.11	4.38		4.80	4.62	
LL M+F*	4.91	3.99		5.89	4.11	
LL NL+10	6.01	6.09		6.98	5.97	
LL NL+21	6.37	5.71		7.55	5.49	
* common model						



## Paradigm shift mortality research

- › From merely examining trends in life expectancy to examining the whole age-at death distribution
- › Compression vs delay



# Changes in age at death distribution

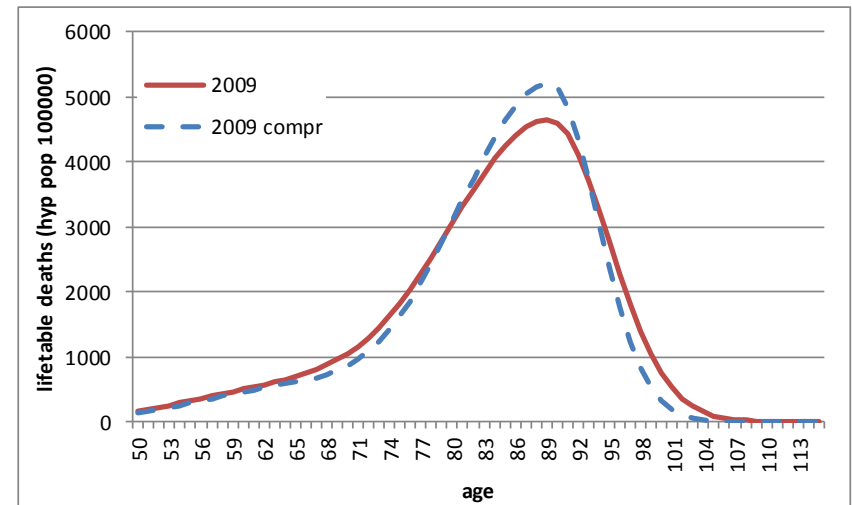
## Compression of mortality scenario (Fries 1980)

- Rectangularization
- declining variability in the age of dying

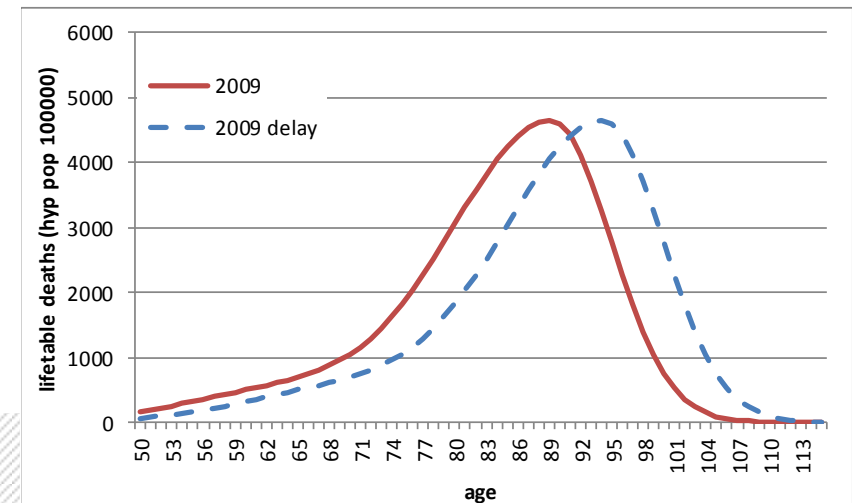
## Shifting mortality regime / mortality delay (e.g. Vaupel 2010)

- Increase in modal age at dying
- No changes in shape

NLF 2009 & hypothetical compression of mortality scenario



NLF 2009 & hypothetical shifting mortality regime



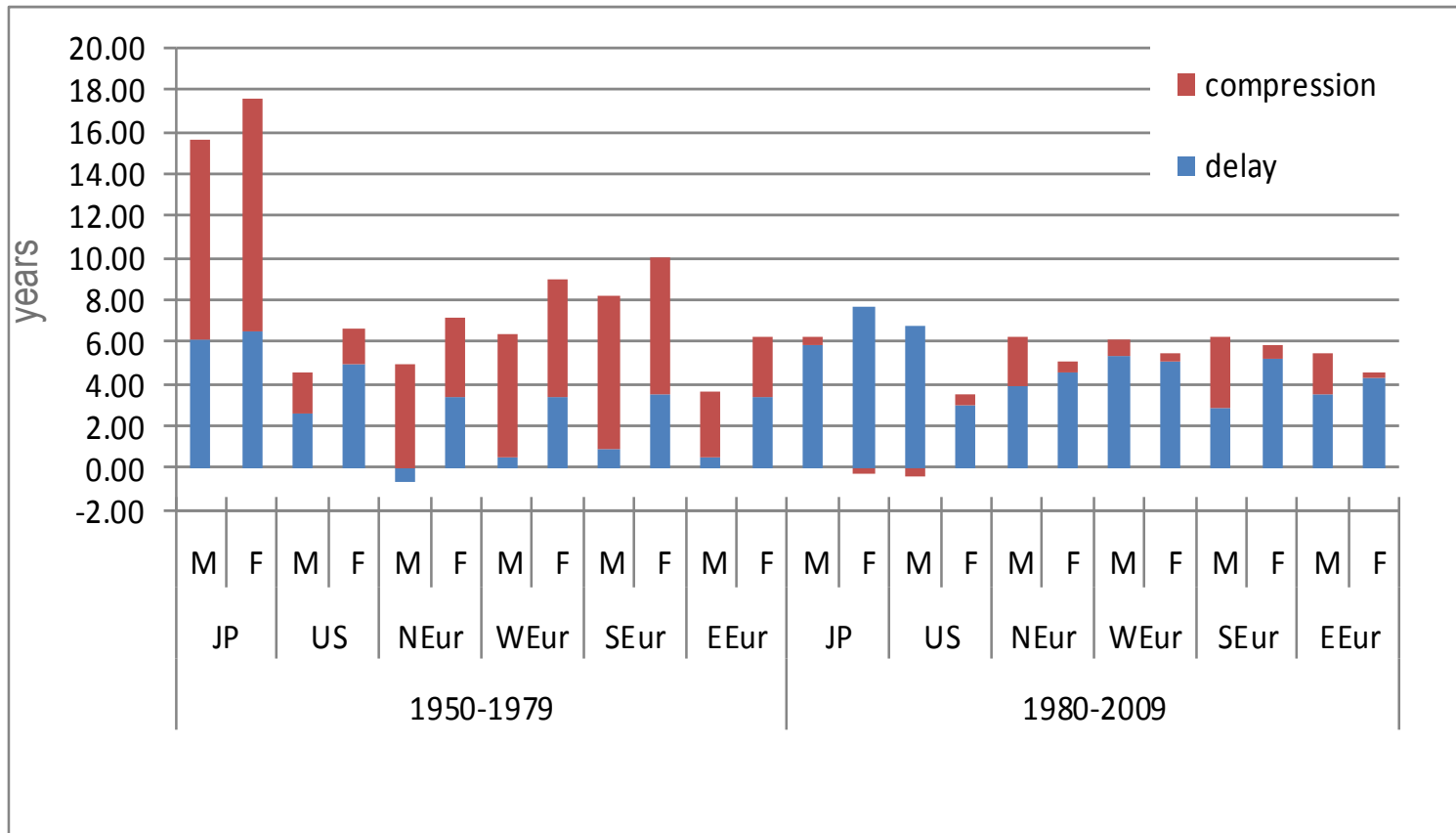


## Importance of delay vs compression

- › Delay: a limit to life exp is unlikely for the near future
- › Past trends:
  - Over time: delay increases in importance
  - Delay more important than compression

# Contribution of delay and compression to change in eo

1950-2009, 24 European countries + JP + USA



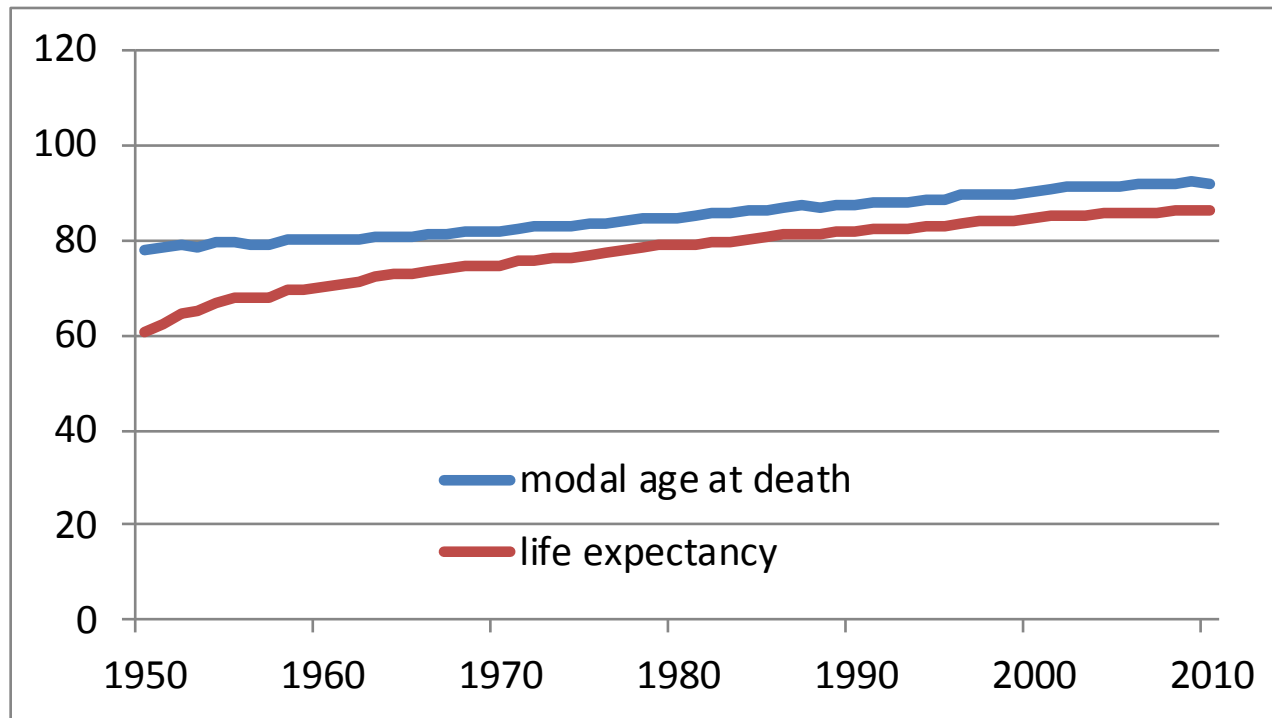


## Importance of delay vs compression

- › Delay: a limit to life exp is unlikely for the near future
- › Past trends:
  - Over time: delay increases in importance
  - Delay more important than compression
- › In some countries trends in modal age at dying run parallel to trends in e0



# Japanese women – M increases parallel with $e_0$







## Importance of delay vs compression

- › Delay: a limit to life exp is unlikely for the near future
- › Past trends:
  - Over time: delay increases in importance
  - Delay more important than compression
- › In some countries trends in modal age at dying run parallel to trends in  $e_0$
- › Mortality projections including age-at-death distribution (Bongaarts 2005; Terblanche 2015) are still scarce (only M, only single populations, do not take into account smoking)



# Objective

- › To estimate future life expectancy for the Netherlands by **simultaneously** taking into account:
  - the effect of smoking
  - the mortality experience of the opposite sex and in other countries
  - developments in mortality delay and compression



## Data & methods

- › NL; 1950-2012; 40+
- › All-cause mortality and population numbers by sex and single year of age (Statistics Netherlands)
- › Applying a mortality model which distinguishes delay and compression to mortality of the total population, mortality of non-smokers, and mortality of smokers
- › Simplified CoDe mortality model (de Beer & Janssen, submitted)
- › Calculation of mortality of nonsmokers (nsm), smokers (smm) =>
  - Smoking-attributable mortality (SAMF)(single year)
  - $q_{nsm} <- q_{all} * (1 - SAMF)$  ;  $q_{smm} <- q_{nsm} * RR_1$
  - Adjusted indirect Peto & Lopez method (Peto et al. 1992; Janssen et al. 2013)
  - Lung-cancer deaths by sex and five-year age groups (WHOSIS)



# Projections

## Individual

- › Projections using the parameters of the CoDe mortality model for non-smokers for NL up to 2050 (only delay; delay & compression)
- › Combine with projection smoking-attributable mortality fractions
- › Comparison with Lee-Carter

## Coherent

- › Trend delay non-smoking France women
- › Comparison with individual forecast

## Up to 2050

1950-2012; 1980-2012



# Simplified CoDe mortality model, 40+

Modelling  $q(x)$  with minimum number of interpretable parameters

$$q(x) = a + I(x \leq x_1) \left[ \frac{b_1 e^{b_1(x-M)}}{1 + \frac{b_1}{g} e^{b_1(x-M)}} \right] + I(x_1 < x \leq x_2) \left[ \frac{b_2 e^{b_2(x-M)}}{1 + \frac{b_2}{g} e^{b_2(x-M)}} + c_1 \right] \\ + I(x > x_2) \left[ \frac{b_3 e^{b_3(x-M)}}{1 + \frac{b_3}{g} e^{b_3(x-M)}} + c_2 \right]$$

background + adult age + middle age + old age

$$x_2 = M; x_1 = M - h$$

$g$  (0.7) and  $h$  (30) time invariant

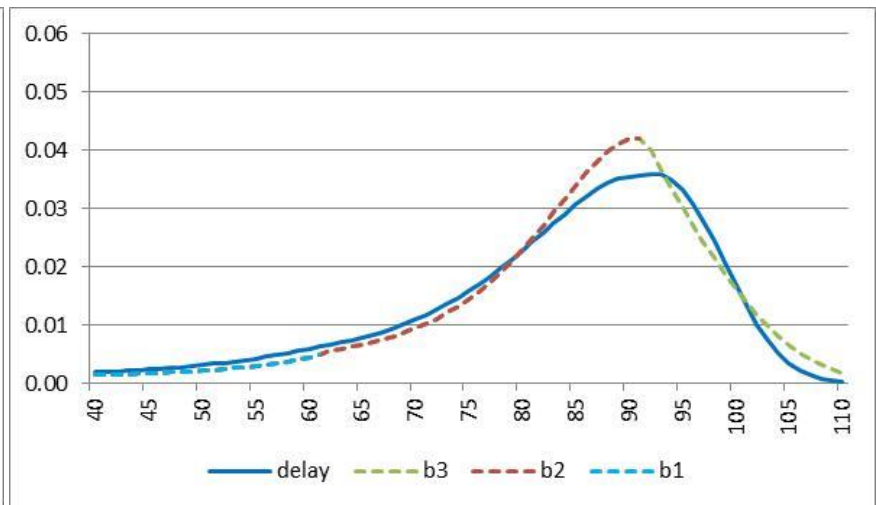
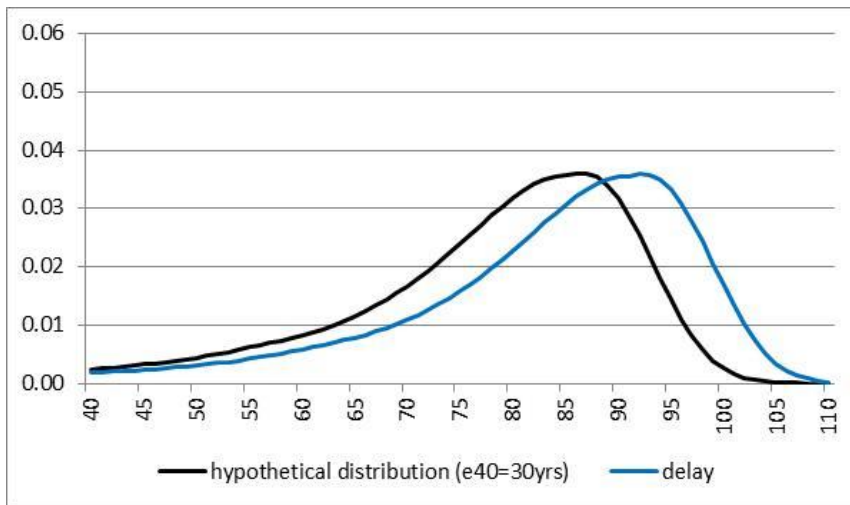
five interpretable time-varying parameters:  $a, b_1, b_2, b_3, M$



# Effects of the parameters of the model

Increase in M that corresponds with 5 yrs increase in  $e_{40}$

Increase in  $b_1$  and  $b_2$ , and decrease in  $b_3$  that all three correspond with a 0.5 yrs increase in  $e_{40}$

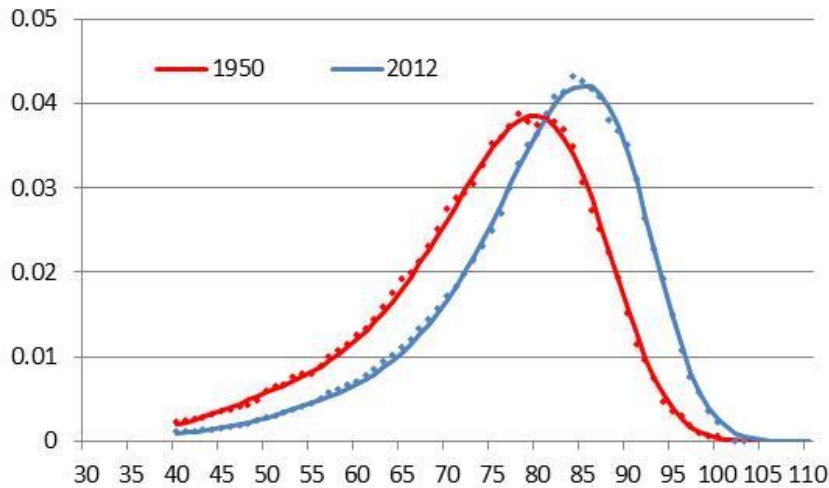




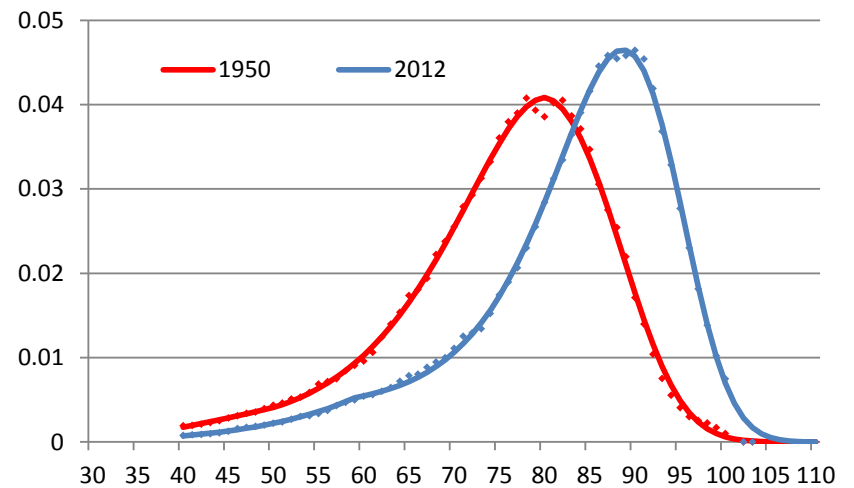
# Results

# Age at death distributions

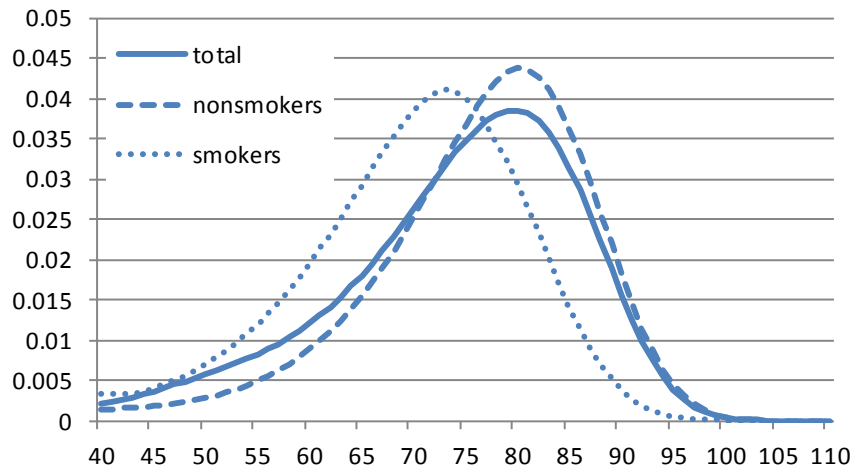
### Age at death distribution - Dutch men



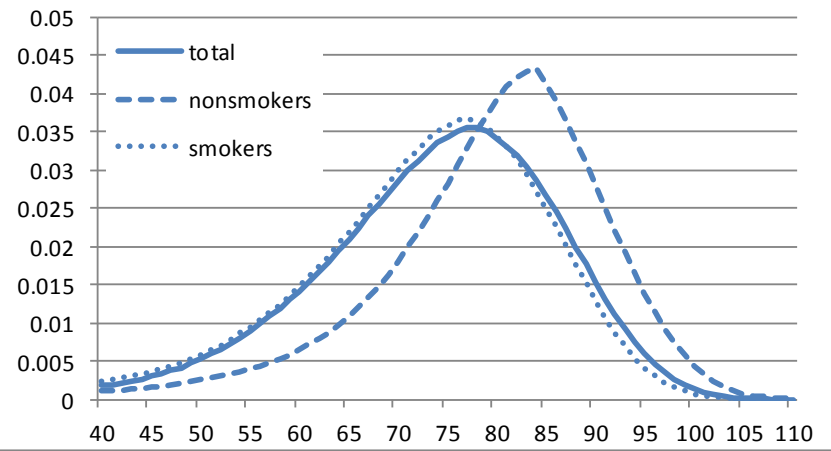
### Age at death distribution - Dutch women



### 1950 - NL - men

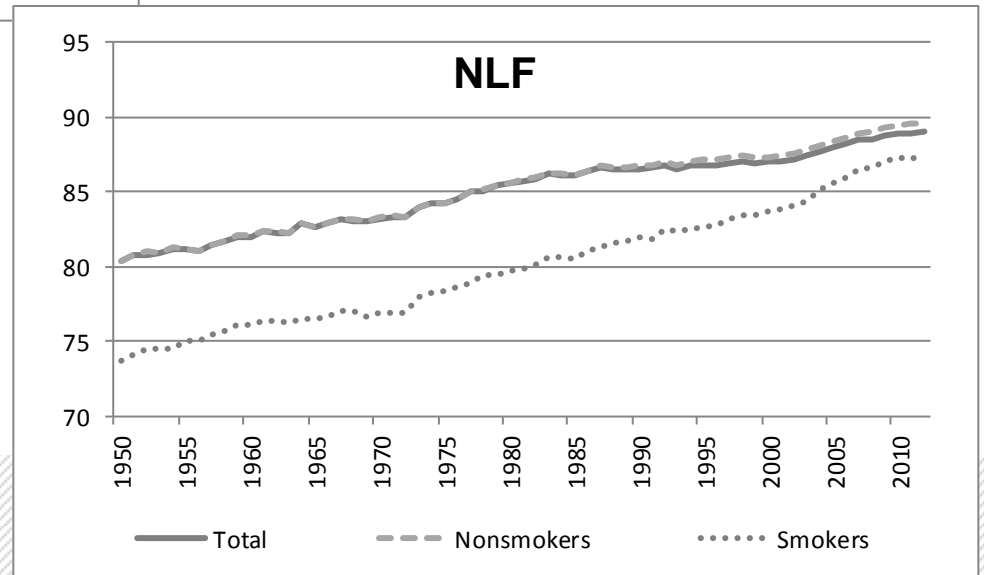
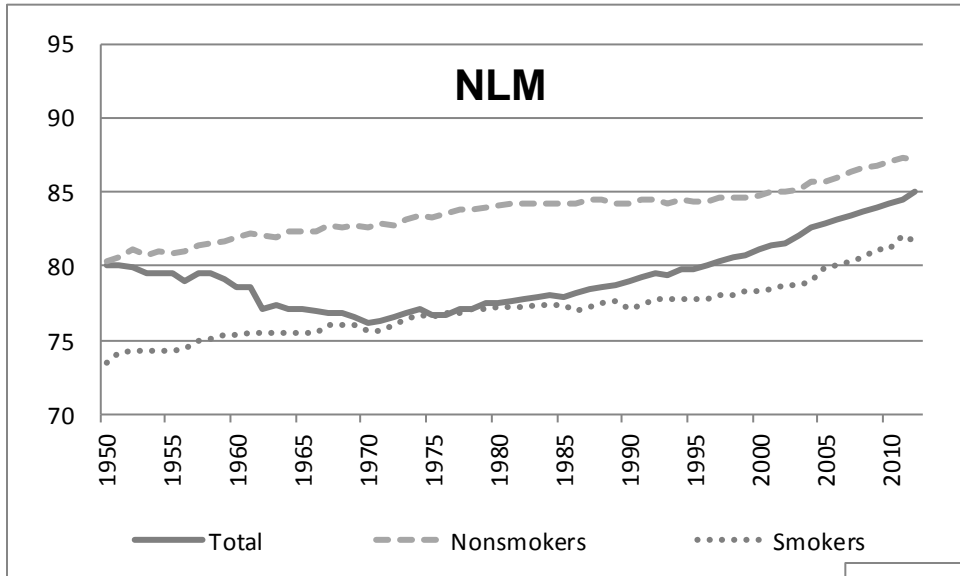


### 1980 - NL - men

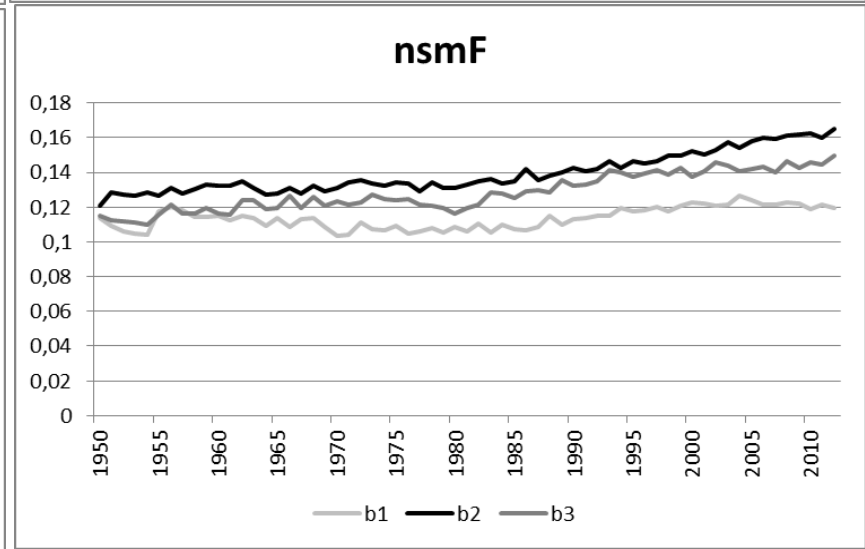
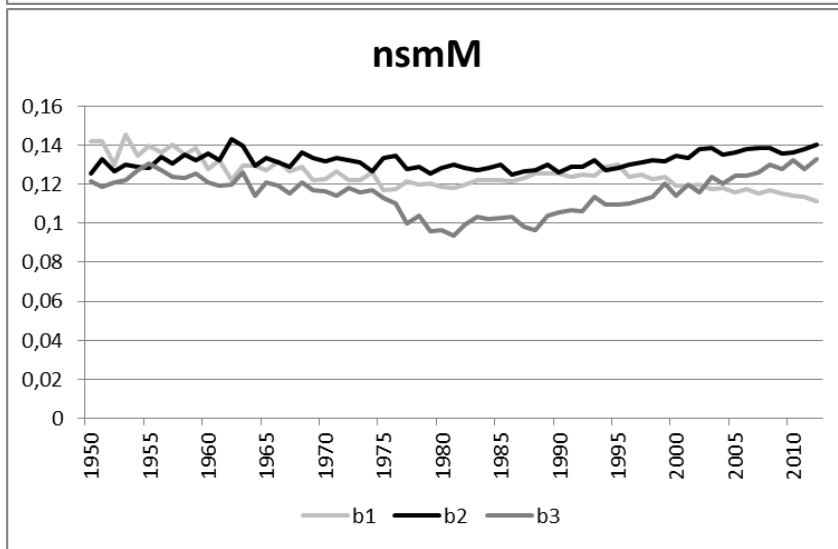
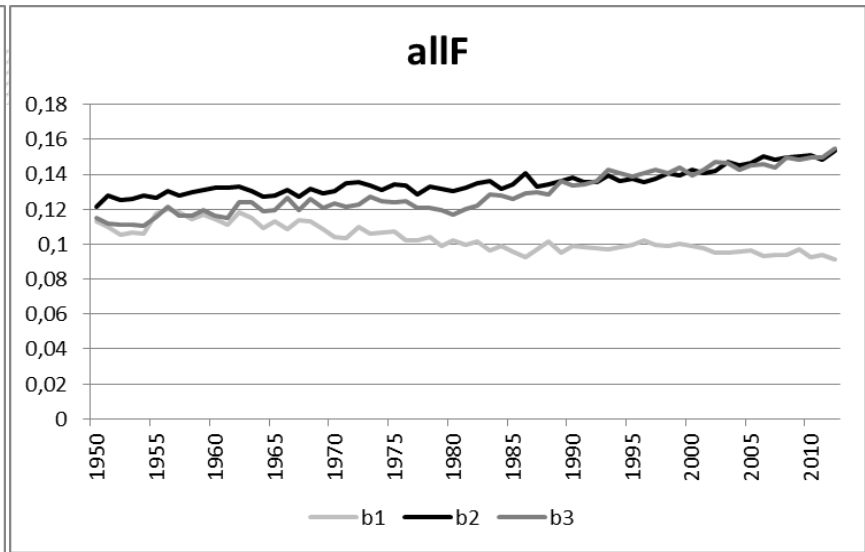
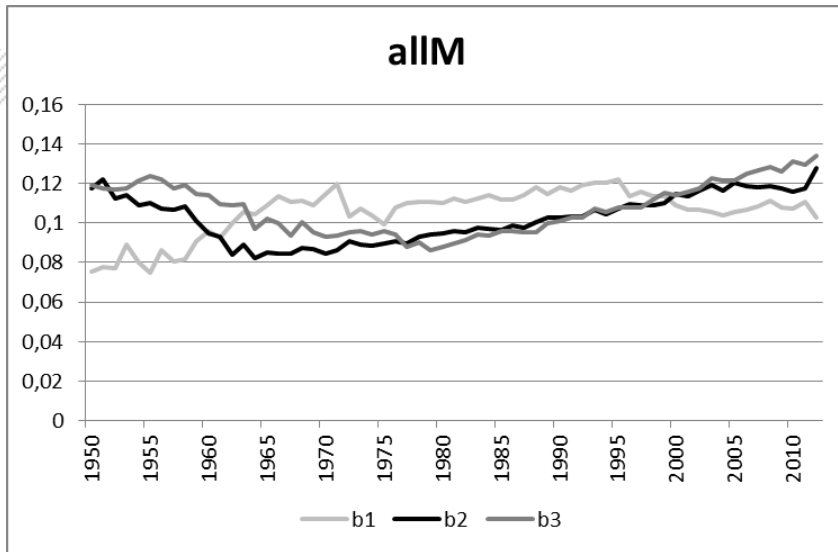




# Model age of death



# Additional parameters



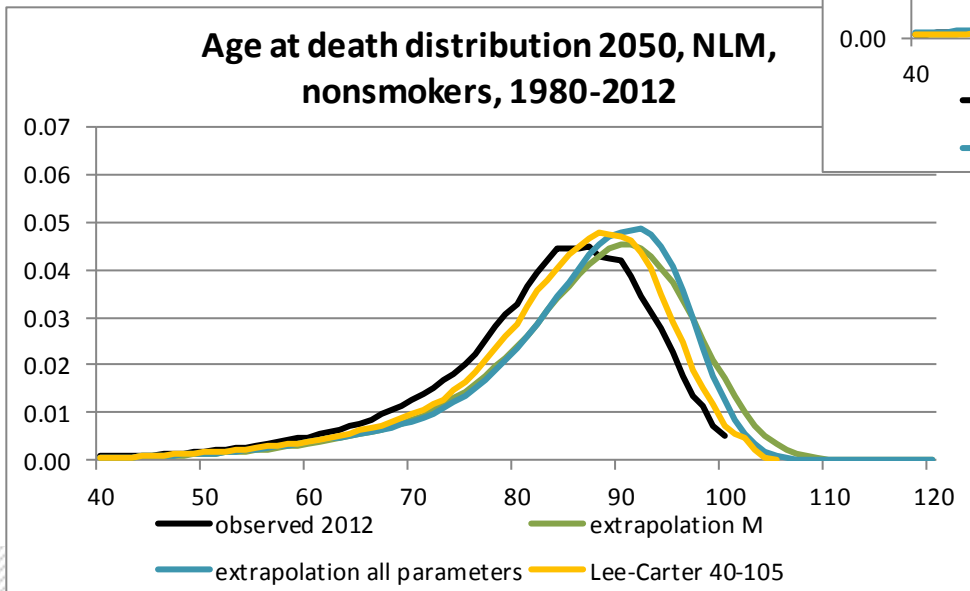
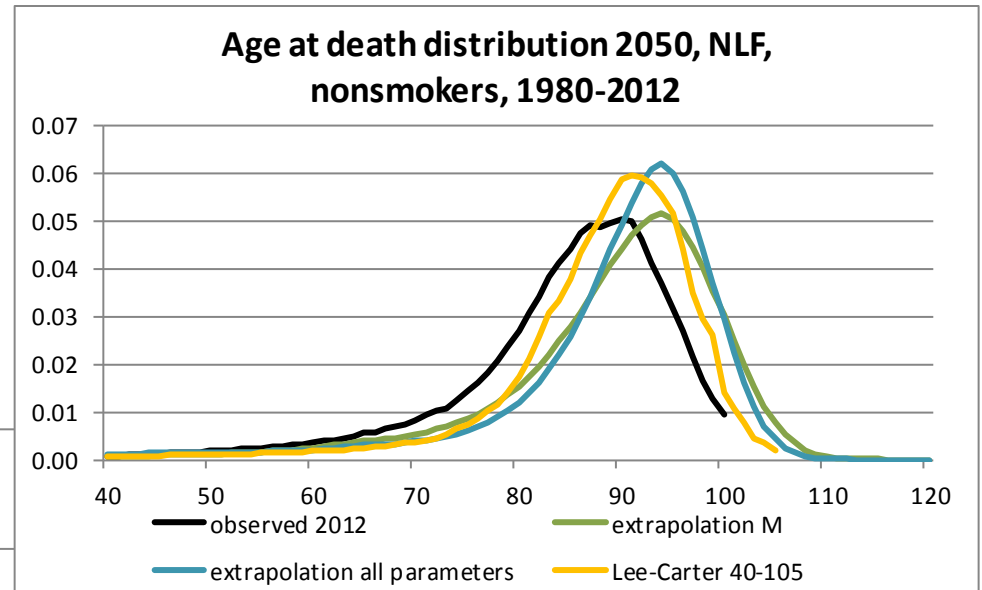


## e40 2050, the Netherlands

	1950-2012		1980-2012	
	men	women	men	women
<b>nonsmokers</b> (e40 2012 = 42.76 (M), 45.15 (F))				
extrapolation M; rest similar to 2012 ns	46.80	50.51	46.37	49.62
extrapolation a, b1, b2, b3, M	46.47	50.58	46.00	50.02
LC 40-100	45.94	49.23	45.07	48.68



# Difference with Lee-Carter





## e40 2050, the Netherlands

	1950-2012		1980-2012	
	men	women	men	women
<b>nonsmokers</b> (e40 2012 = 42.76 (M), 45.15 (F))				
extrapolation M; rest similar to 2012 ns	46.80	50.51	46.37	49.62
extrapolation a, b1, b2, b3, M	46.47	50.58	46.00	50.02
LC 40-100	45.94	49.23	45.07	48.68
<b>total</b> (e40 2012 = 40.22 (M), 43.57 (F))				
extrapolation nonsmokers (M) + SAM (APC)	45.63	48.79	45.20	47.92
extrapolation nonsmokers (all parameters) + SAM (APC)	45.21	48.94	44.87	48.51
LC 40-100	42.69	47.54	44.89	46.39
SAM = smoking-attributable mortality				
APC = age-period-cohort analyses				

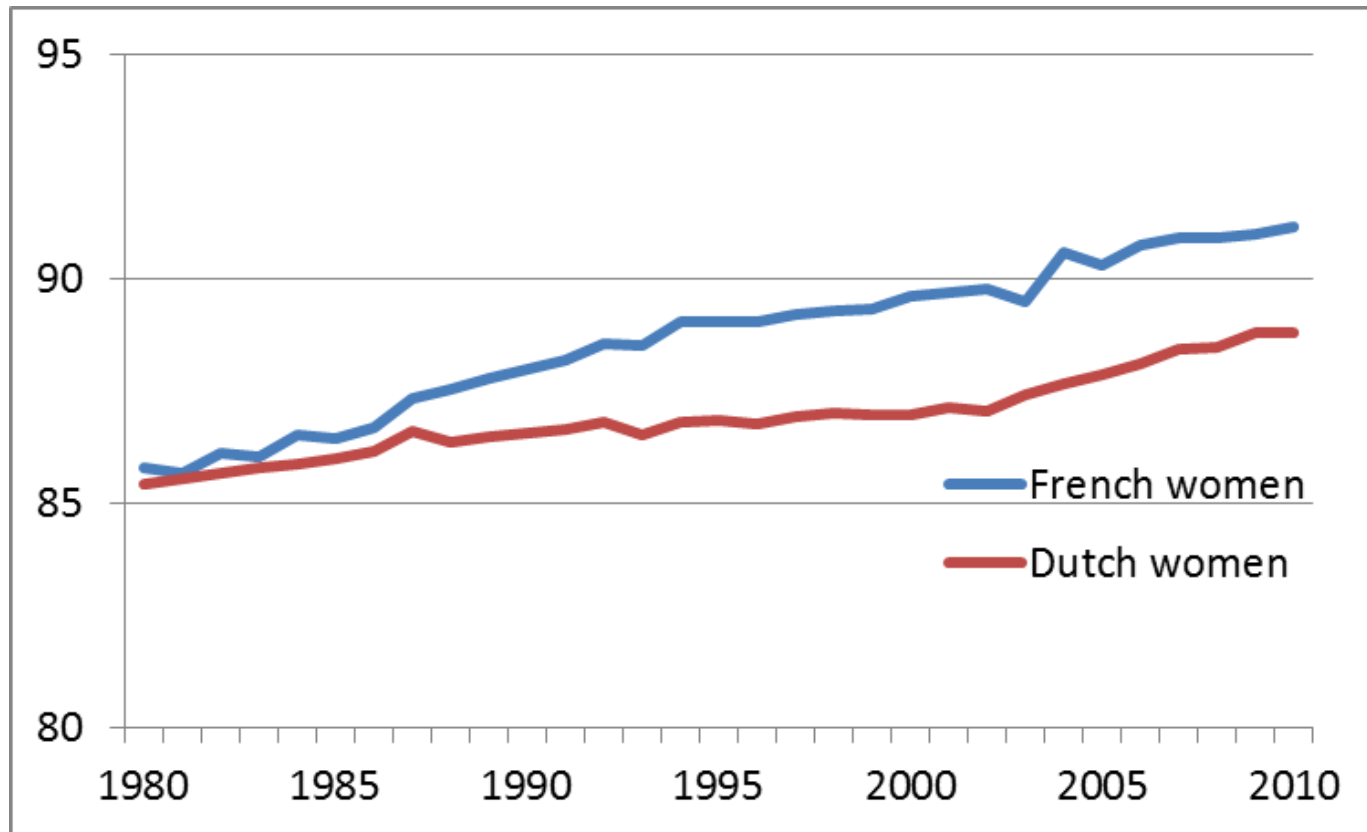


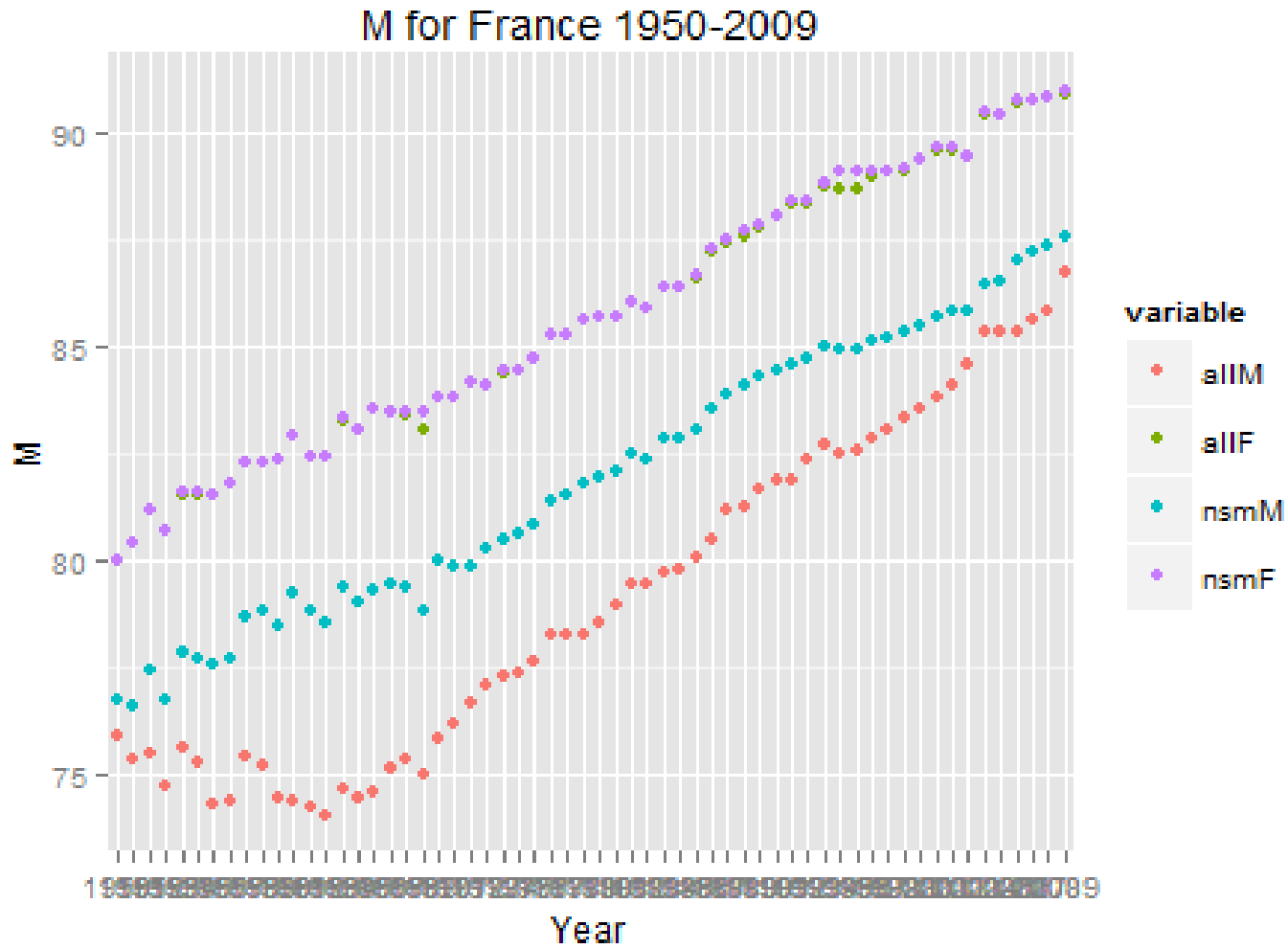
## e40 2050, the Netherlands, coherent forecast

- › Use of development M nsm among France women
- › 1.9 years per decade (M)(equal for 1950-2009, 1980-2009, equal for M & F)



# Modal age at death - Dutch and French women









## e40 2050, the Netherlands, coherent forecast

- › Use of development M nsm among France women
- › 1.9 years per decade (M)(equal for 1950-2009, 1980-2009, equal for M & F)
- › In comparison to e40 2050 for individual forecasts  
M 1950-2012 +3.0; M 1980-2012 +3.4  
F 1950-2012 +1.5 ; F 1980-2012 +2.4



## Summary of results

- › For non-smokers and smokers, mortality delay is more linear than for the total population, and more similar for M and W
- › Extrapolation of mortality delay (and compression) => higher  $e_{40}$  compared to LC, more delay, and more deaths at higher ages
- › Extrapolation of compression parameters resulted in slightly lower  $e_{40}$  for men, and a slightly higher  $e_{40}$  for women
- › Adding projection of SAM => highest difference for women (all-nsm); Separate projection for men 1950-2012 highest effect.
- › Using the development of M among French female nonsmokers resulted in another strong increase in projected  $e_{40}$ , esp. among men



## Conclusion

Projection by means of the modal age at death should – for NL – take into account smoking

LC seems not able to fully capture the (continued) delay



## Future plan

Novel mortality projection technique for Europe:  
 trends in lifestyle-related mortality trends (smoking +  
 obesity + alcohol) + trends in the age-at-death  
 distribution + trends in other countries

Research grant Netherlands Organisation for Scientific  
 Research (NWO) (grant no. 452-13-001)



Thank you for your attention!



[www.futuremortality.com](http://www.futuremortality.com)



## References (1)

- › De Beer, J. & F. Janssen (submitted), A new model to describe the full age pattern of mortality and to assess delay and compression of mortality.
- › Fries, J. F. (1980), Aging, natural death, and the compression of morbidity. *New England Journal of Medicine*, 303(3): 130-5.
- › Janssen, F. & J. De Beer (2016) Projecting future mortality in the Netherlands taking into account mortality delay and smoking. Working paper 18. Joint Eurostat/UNECE Work Session on Demographic Projections.
- › Janssen, F. & J. de Beer (in preparation) Changes in the contribution of mortality delay versus compression before and after the mode to the recent increase in life expectancy
- › Janssen, F., van Wissen, L.J.G. and A.E. Kunst (2013), Including the smoking epidemic in internationally coherent mortality projections. *Demography* 50(4), 1341-1362.
- › Lopez, A. D., Collishaw, N. E., and T. Piha (1994). A descriptive model of the cigarette epidemic in developed countries. *Tobacco Control* 3: 242–247.



## References (2)

- › Oeppen, J. and J.W. Vaupel (2002). Broken limits to life expectancy. *Science* 296(5570): 1029-1031.
- › Stoeldraijer, L., C. van Duin, L.J.G. van Wissen, F. Janssen (2013), Impact of different mortality forecasting methods and explicit assumptions on projected future life expectancy: The case of the Netherlands. *Demographic Research* 29(13): 323-354.
- › Stoeldraijer, L., van Duin, C. and F. Janssen (2013). Bevolkingsprognose 2012-2060: Model en veronderstellingen betreffende de sterfte. [Population forecast 2012-2060: Model and assumptions on mortality] *Bevolkingstrends*: 1-27.
- › Stoeldraijer, L., Bonneux, L., van Duin, C., van Wissen, L.J.G. and F. Janssen (2015) The future of smoking-attributable mortality: the case of England & Wales, Denmark and The Netherlands. *Addiction* 110(2), 336-45.
- › Terblanche, W. (2016) Retrospective Testing of Mortality Forecasting Methods for the Projection of Very Elderly Populations in Australia. *Journal of Forecasting*, doi: [10.1002/for.2404](https://doi.org/10.1002/for.2404).
- › Vaupel, J.W. (2010), Biodemography of human ageing. *Nature* 464(7288): 536-542.