

Webinar for Longevity clients

# Mortality shocks in annuity portfolios

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1. Covid-19
2. Annuity portfolios
3. Non-parametric approach
4. Reporting delays
5. Parametric approach
6. Conclusions



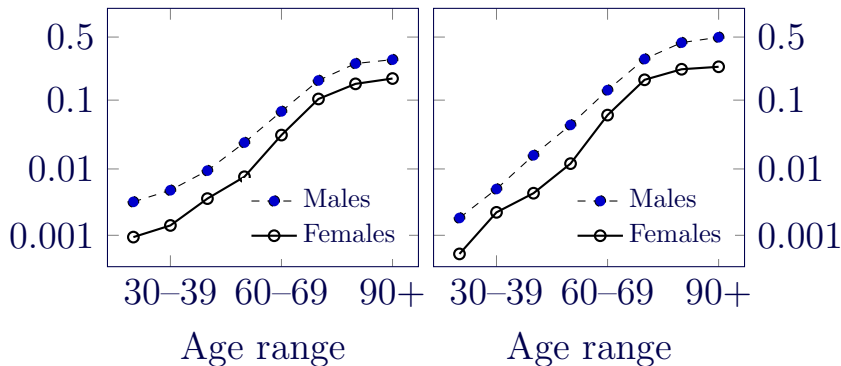
- Covid-19 is the disease caused by the novel SARS-CoV-2 virus<sup>†</sup>.
- Covid-19 can be fatal...

<sup>†</sup>The Novel Coronavirus Pneumonia Emergency Response Epidemiology Team [2020].

Mortality rate by age for confirmed covid-19 infection<sup>‡</sup>. Logit scale.

(a) Spain

(b) Italy



<sup>‡</sup>Own calculations using data from CCAES [2020] and ISS [2020].

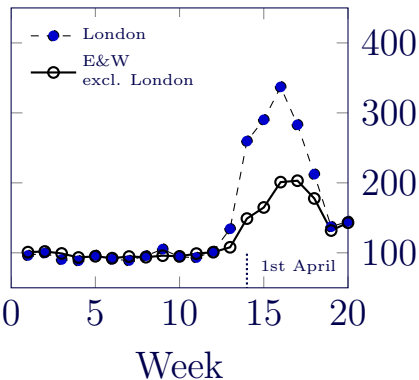
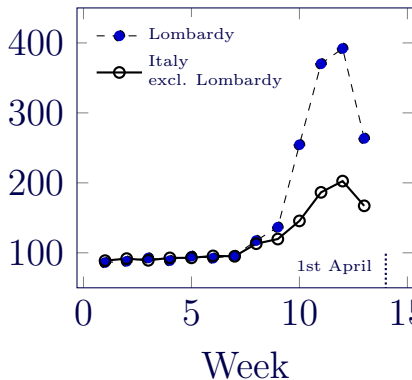
- Covid-19 is the disease caused by the novel SARS-CoV-2 virus<sup>†</sup>.
- Covid-19 can be fatal...  
...and its arrival was obvious in national mortality statistics...

<sup>†</sup>The Novel Coronavirus Pneumonia Emergency Response Epidemiology Team [2020].

Deaths in early 2020 as percentage of average in 2015–2019♣.

(a) Italy

(b) England & Wales



♣ Source: own calculations using data from Istat [2020] and ONS [2020].

Covid-19 mortality shock was:

- Intense.
- Short-term (measured in weeks).
- Very localised.

How might it impact annuity portfolios?



## 2 Annuity portfolios

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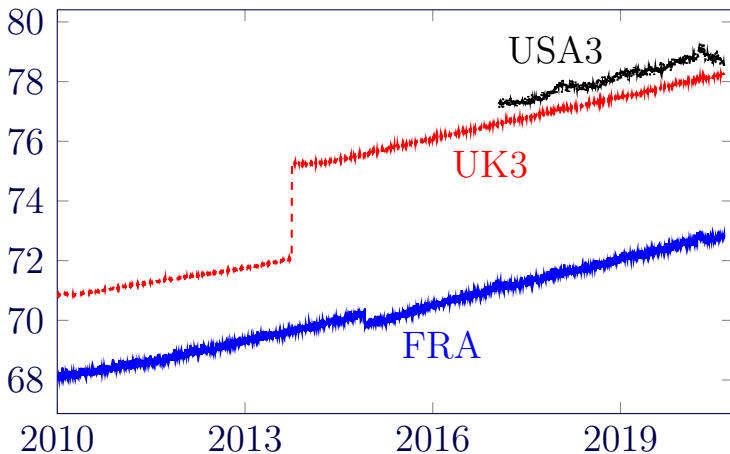
## 2 Annuitant experience data

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Portfolio	Cumulative deaths	In-force 1st April 2020
FRA	47,026	251,330
UK3	109,878	146,269
USA3	145,153	723,762

Data extracted in September 2020. Source: Richards [2021].

Average age of in-force annuitants.



Source: Richards [2021].

# 3 Non-parametric approach

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- $\mu_x$  is the mortality hazard at age  $x$ .
- $\Lambda_x(t) = \int_0^t \mu_{x+s} ds$  is the integrated hazard.
- Normally the above are defined with respect to age,  $x$ .
- What if we define things with respect to time,  $y$ ?

- $\{y + t_i\}$  is the set of distinct dates of death,
- $d_{y+t_i}$  is the number of deaths at date  $y + t_i$ , and
- $l_{y+t_i^-}$  is the number of lives immediately before  $y + t_i$ .

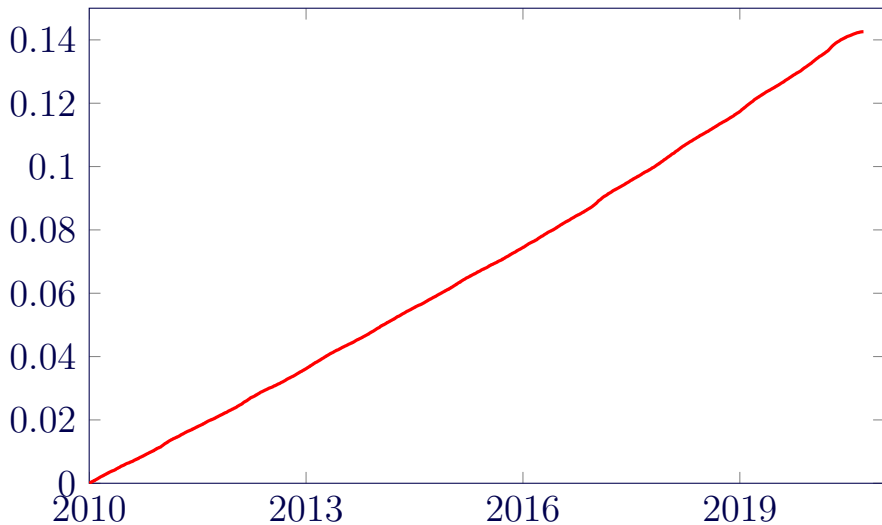
$$\hat{\Lambda}_{y,t} = \sum_{t_i \leq t} \frac{d_{y+t_i}}{l_{y+t_i}^-} \quad (1)$$

$\hat{\Lambda}_{y,t}$  estimates the integrated hazard.

See

<https://www.longevity.co.uk/site/informationmatrix/visualisingcovid19inexperiencedata.html>.

# 3 FRA portfolio, $\hat{\Lambda}_{2010,t}$





- $\hat{\Lambda}_y$  is near-linear (and rather dull).
- What about taking first differences?

First central difference around  $\hat{\Lambda}_{y,t}$ :

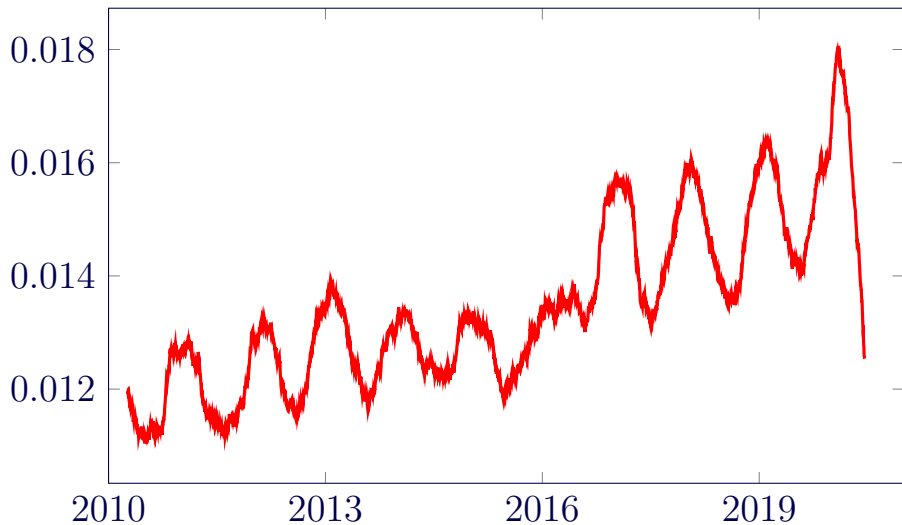
$$\hat{\mu}_{y+t} = \frac{\hat{\Lambda}_{y,t+c/2} - \hat{\Lambda}_{y,t-c/2}}{c} \quad (2)$$

where  $c > 0$  is the bandwidth parameter.

See

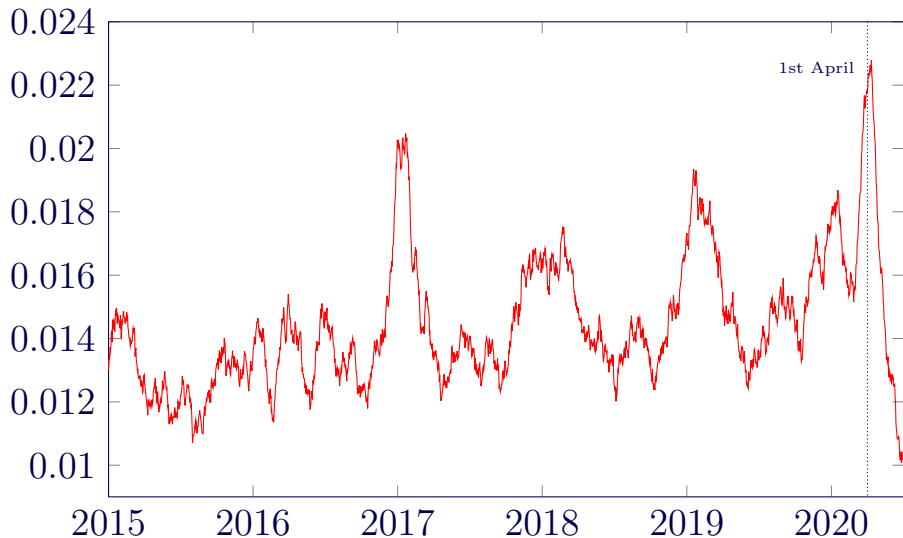
<https://www.longevity.co.uk/site/informationmatrix/visualisingcovid19inexperiencedata.html>.

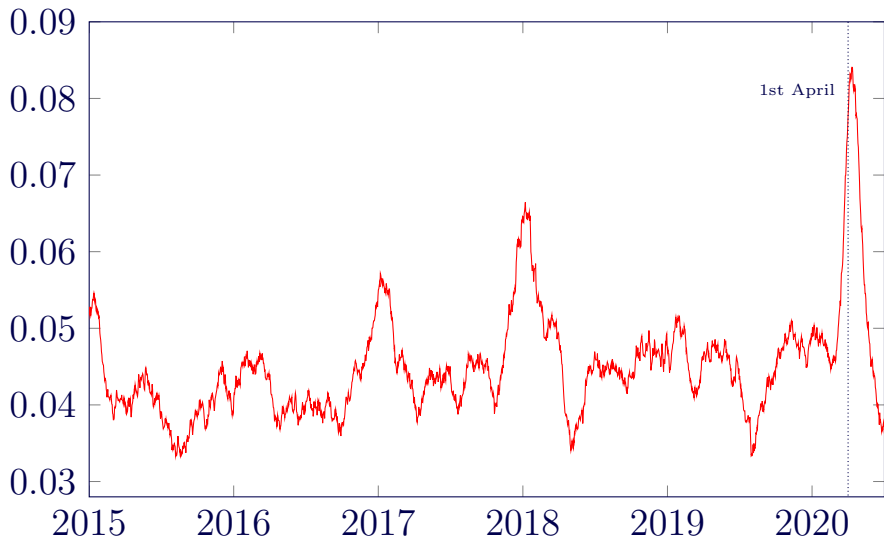
3 FRA,  $\hat{\mu}_{2010,t}$ ,  $c = 0.5$

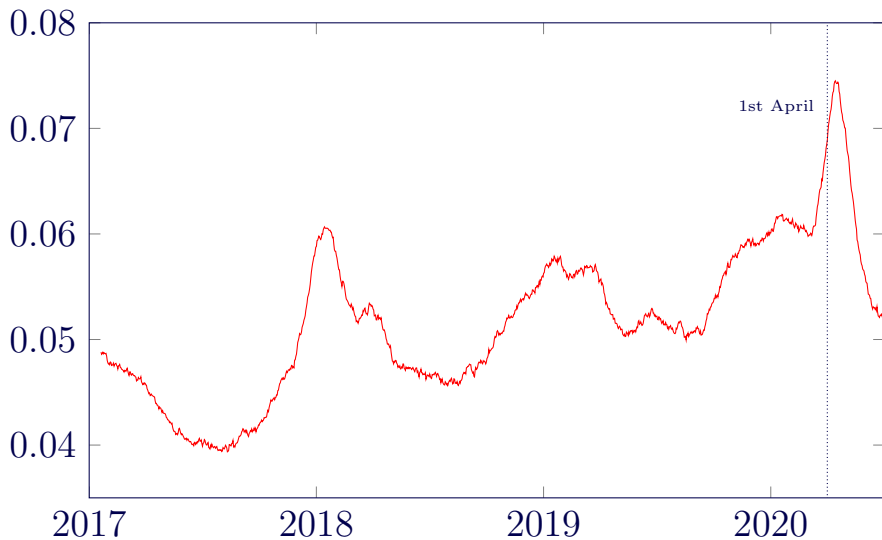


- $\hat{\Lambda}_y$  is near-linear (and rather dull).
- However,  $\hat{\mu}_y$  reveals rich detail of seasonal patterns.
- Can  $\hat{\mu}_y$  reveal the covid-19 shock?

### 3 FRA $\hat{\mu}_{2015+t}$ , $c = 0.2$







Covid-19 shock hit French, UK and US annuity portfolios at the same time, peaking in April 2020.



- Only need:
  - ▶ Date of annuity commencement,
  - ▶ Date of annuity cessation, and
  - ▶ Nature of cessation (death, withdrawal etc).
- No personal data required.
- GDPR, CCPA and PIPEDA do not apply!

## Advantages:

- Reveals seasonal variation.
- Reveals mortality shocks.
- Requires no personal data (GDPR-, CCPA- and PIPEDA-safe).


## Drawbacks:

- Smoothing understates shock.
- Can't separate shock from seasonal effect.
- Doesn't allow for key risk factors like age.
- Not defined for most recent  $c/2$  years.
- Affected by reporting delays.

Generating  $\hat{\Lambda}_y$  and  $\hat{\mu}_y$  in Longevity:

- Run a data audit.
- Set **Download Data Files As** to “Excel”.
- Click on  **Time** icon.

## Configurable Options

Click the  to see help notes for an option.

**Application****Deduplication****Modelling****Rating****Projections**

### Account

### Notifications and Downloads

**Apply XML Transforms**

Apply built-in transforms

**Download Data Files As**

Excel where possible

**Preferred** Download Data Files As

Excel where possible

**Send Alerts For Operations****Send Notifications By**

CSV only

Compressed ZIP File (CSV only)

Compressed ZIP File (Excel where possible)

### 3 Click Time for spreadsheet



## View Reports

To view a report for this operation, click on the report name.

Report Created	Report Name	Report Type
2020-12-12 14:47:35	<a href="#">Data Audit</a>	TEXT

Name	Text
Data Audit	(Audit)

Decrement: DEATH



Data Audit



Input



Time



XML



Pulse

Download:



CSV



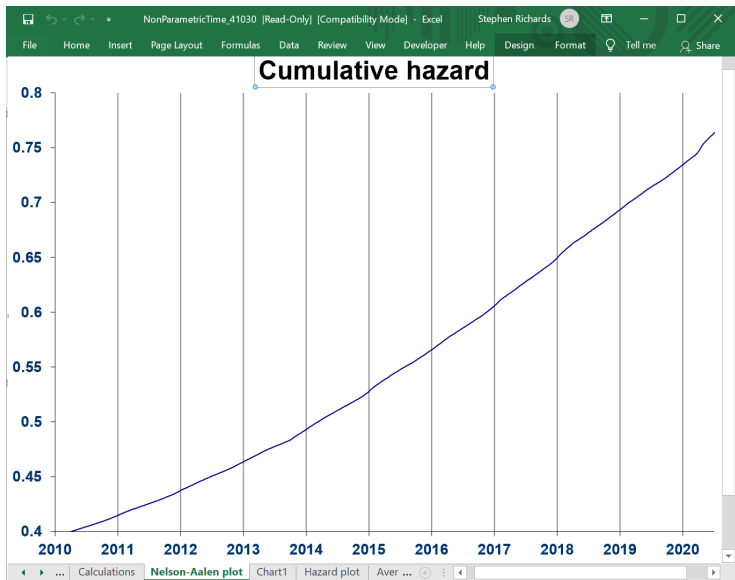
PDF

Non-parametric time estimator(41030) - 360.6 KB

$3 y + t_i, l_{y+t_i^-}$  and  $d_{y+t_i}$

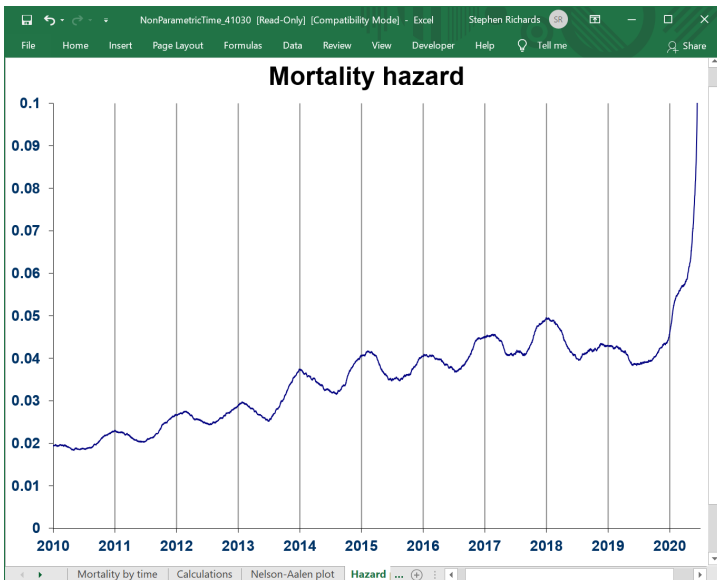
	A	B	C
1	All		
2	Time	Lives	Deaths
3	1944.746	1	0
4	1975.301	1117	1
5	1975.523	1166	1
6	1975.929	1271	1
7	1975.978	1284	1
8	1976.268	1438	1
9	1976.331	1465	1
10	1976.617	1582	1
11	1977.052	1744	1
12	1977.137	1769	1
13	1977.164	1780	1
14	1977.203	1787	1
15	1977.855	2041	1
16	1977.868	2045	1
17	1978.101	2133	1
	Mortality by time		

# 3 Graph of $\hat{\Lambda}_{y+t_i}$





# 3 Graph of $\hat{\mu}_{y+t_i}$



# 4 Reporting delays

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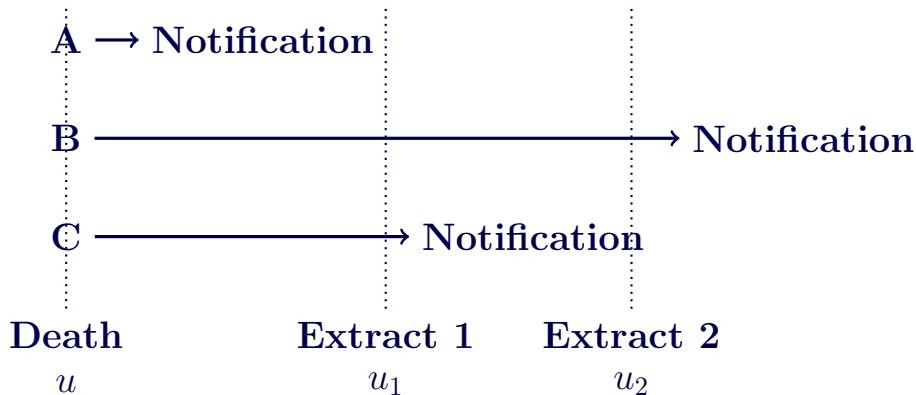
## 4 Reporting delays

Consider same week for UK3 using two extracts:

Date	June 2020 extract:		Sept. 2020 extract:	
	In-force	Deaths	In-force	Deaths
2020-06-11	145,166	6	144,934	18
2020-06-12	145,163	3	144,920	16
2020-06-13	145,168	9	144,918	14
2020-06-14	145,159	1	144,909	7
2020-06-15	145,162	3	144,906	15
2020-06-16	n/a	n/a	144,898	8
2020-06-17	145,168	3	144,902	29

- Assume we have two extracts at time  $u_1$  and  $u_2$  ( $u_1 < u_2$ ).
- Assume a death occurs at time  $u < u_1$ .
- There are three possible reporting types...

## 4 Reporting delays



- Type A deaths reported by time of first extract.
- Type B deaths reported after second extract.  
Unknown to us!
- Type C deaths reported between extracts.

- Types B and C are occurred-but-not-reported (OBNR).
- Similar term IBNR (incurred-but-not-reported) refers to general insurance claims.
- The distinction was made by Lawless [1994].

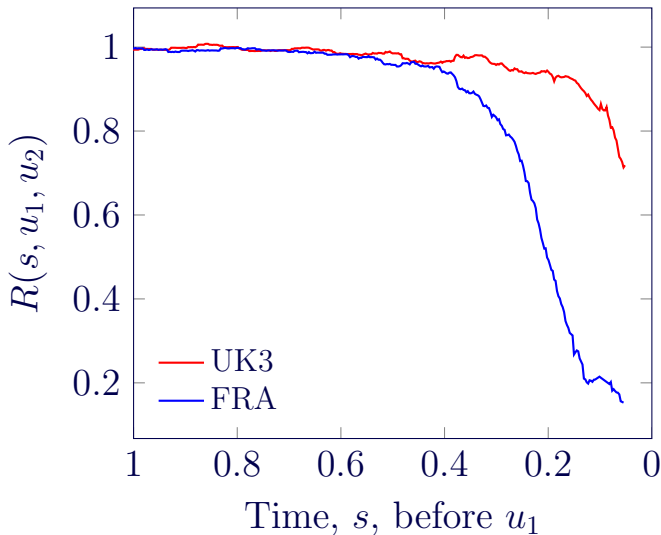
Calculate ratio of  $\hat{\mu}_y$  estimates using two extracts:

$$R(s, u_1, u_2) = \frac{\hat{\mu}_{u_1-s} \text{ using extract at time } u_1}{\hat{\mu}_{u_1-s} \text{ using extract at time } u_2} \quad (3)$$

OBNR impact negligible when  $R$  is close to 1.



## 4 Impact of reporting delays



- OBNR affects most recent mortality estimates.
- Most impact within 0.25 years of extract.
- Minimal impact 0.75 or more years before extract.

See <https://www.longevity.co.uk/site/informationmatrix/reportingdelays.html>.

# 5 Parametric approach

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Look again at the ratio measuring the impact of OBNR:

$$R(s, u_1, u_2) = \frac{\hat{\mu}_{u_1-s} \text{ using extract at time } u_1}{\hat{\mu}_{u_1-s} \text{ using extract at time } u_2} \quad (4)$$

We can re-word this as follows:

$$\rho = \frac{\text{OBNR} - \text{affected } \hat{\mu}_y}{\text{Underlying } \hat{\mu}_y} \quad (5)$$

We can re-arrange as follows:

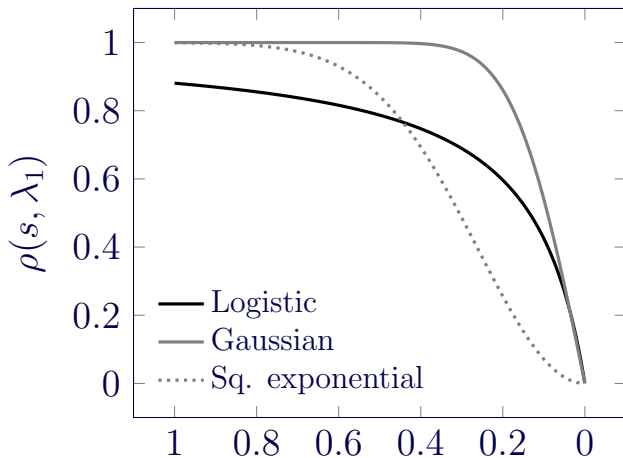
$$\text{OBNR-affected } \hat{\mu}_y = \text{Underlying } \hat{\mu}_y \times \rho$$

Model for OBNR-affected mortality,  $\mu_{x,y}^{OBNR}$ :

$$\mu_{x,y}^{OBNR} = \mu_{x,y}^* \rho(u_1 - y, \lambda_1) \quad (6)$$

- $\mu_{x,y}^{OBNR}$  is reported mortality,
- $\mu_{x,y}^*$  is actual mortality experienced,
- $\rho(s, \lambda_1)$  is scaling factor for OBNR, and
- $\lambda_1$  is the OBNR decay parameter.

## 5 Options for $\rho(s, \lambda_1 = 2)$



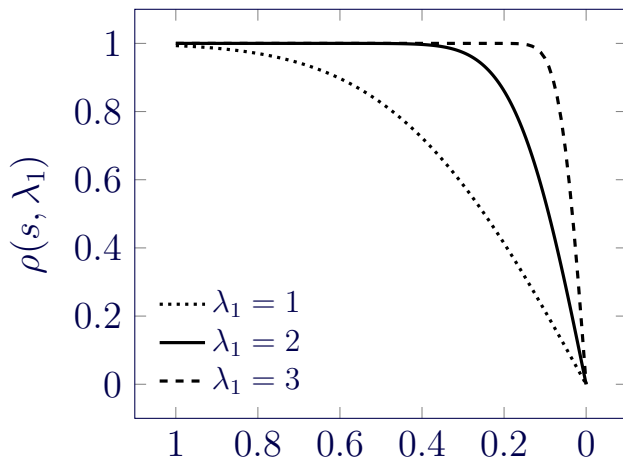
Time,  $s$ , in years before data extract

Details of these and other functions in Richards [2021].



## 5 Role of $\lambda_1$

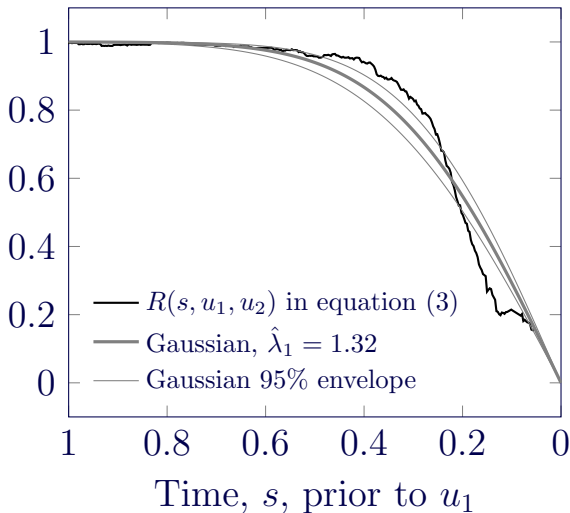
Gaussian OBNR function:



Time,  $s$ , in years before data extract

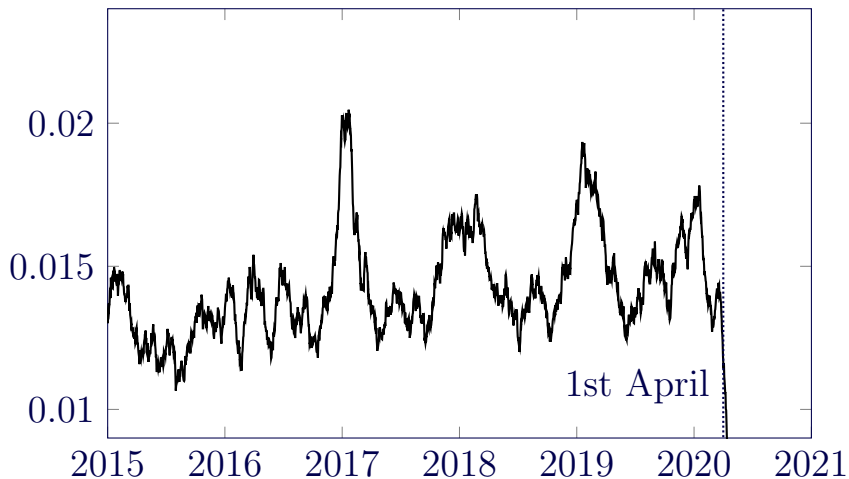
- Can we use a model at time  $u_1$  to predict the unreported deaths by time  $u_2$ ?
- Can we use the OBNR function to adjust for unreported deaths?

# 5 Forecasting OBNR



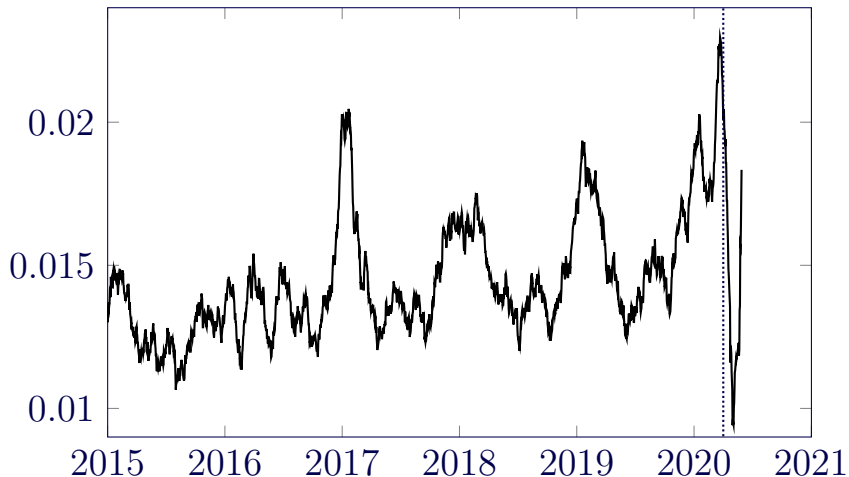
## 5 Adjusting for OBNR

FRA, June extract:



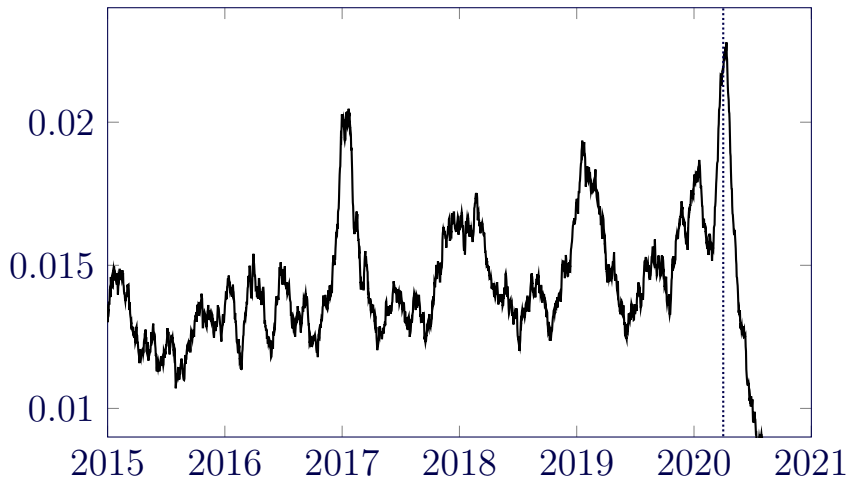
## 5 Adjusting for OBNR

FRA, June extract with Gaussian OBNR adjustment:



# 5 Adjusting for OBNR


FRA, September extract:



Fitting OBNR models in Longevity:

- Set OBNR shape function.
- Select Hermite model.
- Tick OBNR term in model specification.

## Configurable Options

Click the  to see help notes for an option.



**Application**



**Deduplication**



**Modelling**



**Rating**



**Projections**

### Technical



**Hermite x0**

50



**Hermite x1**

110



**Hermite x2**



**Hermite x3**



**Hermite Age-Varying Time Trend**



**Amount Transform Function**



**Amount Response Function**



**OBNR Shape Function**

inverse tangent

exponential

logistic

**Gaussian**

inverse exponential

squared exponential

Gaussian



**Direct Input Usage**

OBNR Shape Function

No direct input



# 5 Tick OBNR model term

## ? Term Groups To Include

	? Term Group	? Fixed Terms	? Optional Terms
Include	<input type="checkbox"/> Selection	SelectionInitial SelectionTerm	<input type="checkbox"/> SelectionGradient
	<input checked="" type="checkbox"/> Season	SeasonalExcess SeasonalPeak	<input type="checkbox"/> SeasonalAge
	<input type="checkbox"/> Amount	AmountTransformParameter AmountUltimate	<input type="checkbox"/> AmountGradientInitial <input type="checkbox"/> AmountGradientUltimate
	<input checked="" type="checkbox"/> OBNR	OBNRdecay	

 Continue Back Cancel

# 6 Conclusions

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- Covid-19 shock detectable in annuity portfolios.
- Shock peaked in April 2020 in France, UK and USA.
- Non-parametric methods are privacy-safe.

- Reporting delays affect most recent experience.
- However, parametric models can allow for delays...  
... and provide forecasts of unreported deaths.

CCAES. Actualización no. 120. Enfermedad por el coronavirus (COVID-19). 29.05.2020. Technical Report 120, Centro de Coordinación de Alertas y Emergencias Sanitarias, May 2020.

ISS. Epidemia COVID-19 Aggiornamento nazionale 16 giugno 2020 — ore 11:00. Technical report, Istituto Superiore de Sanità, 2020.

Istat. Total deaths per age class, week of demographic event and municipality of residence at the time of death. Technical report, Istituto Nazionale di Statistica, 2020. URL <https://www.istat.it/en/archivio/240106>.

- J. F. Lawless. Adjustments for reporting delays and the prediction of occurred but not reported events. *Canadian Journal of Statistics*, 22(1):15–31, 1994. doi: <https://doi.org/10.2307/3315826.n1>.
- ONS. Deaths registered weekly in England & Wales. Technical report, 2020. URL <https://www.ons.gov.uk/peoplepopulationandcommunity/birthsdeathsandmarriages/deaths/datasets/weeklyprovisionalfiguresondeathsregisteredinen>
- S. J. Richards. Mortality shocks and reporting delays in portfolio data. *Longevity Ltd*, 2021.

The Novel Coronavirus Pneumonia Emergency Response Epidemiology Team. The epidemiological characteristics of an outbreak of 2019 novel coronavirus diseases (COVID-19) — China, 2020. *China CDC Weekly*, 2:113, 2020. ISSN 2096-7071. URL <http://weekly.chinacdc.cn//article/id/e53946e2-c6c4-41e9-9a9b-fea8db1a8f51>.

More on longevity risk at [www.longevity.co.uk](http://www.longevity.co.uk)

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