Москва, Высшая Школа Экономики, 24 октября 2023 г.

Мониторинг и прогноз ожидаемой смертности на основе данных оперативной статистики

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Современная демография



Forecasting Models



Data

	Rates	Age-at-death distribution	Rates of change	Summary measures
Parametric	Cairn et al. (2006) Alai et al. (2018)	Janseen, DeBeer (2016)	Haberman, Renshaw (2012)	Raftery et al. (2013)
Principal components	Lee & Carter (1992) Li & Lee (2005) Li at al. (2019)	Oeppen (2008) Bergeron-Boucher et al. (2017) Kjærgaard et al.(2019)	Mitchell et al.(2013) Bohk & Rau(2017)	
Relational	De Beer(2012)	Basellini & Camarda(2019)		Torri & Vaupel(2012)
Non-parametric	Currieet al.(2004) Camarda (2019)			

Short-tern forecasting and nowcasting

Nowcasting is the prediction of the very recent past, the present, and the very near future state of selected indicators.

Problems:

Data

- Methods
- Attention to short-term risk factors!

using data on weekly deaths. Although tailored on weekly deaths data from the Statistical

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THE PREPRINT SERVER FOR HEALTH SCIENCES		Advanced Search		
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Early estimation of life expectancy using weekly deaths data	Posted August 17, 2023.			
Giampaolo Lanzieri	Download PDF	Email		
doi: https://doi.org/10.1101/2023.08.11.23293993	Print/Save Options	Anare Share		
This article is a preprint and has not been peer-reviewed [what does this mean?]. It	Author Declarations	Citation Tools		
quide clinical practice.	Supplementary Material			
	Data/Code			
	Revision Summary			
Abstract Full Text Info/History Metrics Preview PDF				
Abstract This paper proposes a simple method to obtain early estimates of life expectancy at any age	COVID-19 SARS-Co medRxiv and bioRx	V-2 preprints from		

Subject Area https://www.medrxiv.org/content/10.1101/2023.08.11.23293993v2.full.pdf+h... of the method is applicable to any timely data

Seasonality

Seasonality in mortality: first publications

Seasonal distribution of deaths. Belgium, 1830s

Women

 \mathbf{Men}



Source: Quetelet, 1838; from Rau, R. 2006

Randomized short-term risk factors: epidemics, heatwaves, economic crises, etc.

Key indicators of epidemics

Spread of the disease:

How many are infected in the population? How it evolves in time?

Lethality:

How many of those infected will die? How it depends on age and sex?

Mortality:

How many deaths will appear in the population due to the disease outbreak? How will it affect mortality and life expectancy trends?



"Deaths With" vs. usual Cause-of-death

Influenza deaths in England, 2016-2017 season



Source: Danilova, Shkolnikov, Jdanov. HSE Webinar: COVID-19: Quantification

Excess mortality

Total number of deaths. France, 2000-2021



Source: STMF series, Human Mortality Database, 2021

Excess mortality

Excess deaths = Observed deaths – Expected deaths

All available years — Reference level — Target year

Excess mortality Mortality deficit

Total number of deaths. France, 2000-2021 20,000 18,000 16,000 2003 2020 number of deaths 14,000 12,000 10,000 8,000 1 5 9 13 17 49 53 21 3 Week of death





Source: STMF series, Human Mortality Database, 2021

What to compare?



Russia, females



What should be the baseline when calculating excess mortality?

Notes. Baselines: aretro – alternative retrospective baseline; wy - within-year baseline; r1 – conventional retrospective baseline (week-specific averages); r2 – conventional retrospective baseline (week-specific averages + trend).

Source: Shkolnikov, V. M.; et al.: What should be the baseline when calculating excess mortality? New approaches suggest that we have underestimated the impact of the COVID-19 pandemic and previous winter peaks. *SSM-Population Health* 18:101118, 1–13. (2022)

Age-standardized vs. crude excess death



Age-standardized vs. crude excess death



Annual vs. monthly vs. weekly statistics

Annual

- + Standard tabulation
- + Easy interpretation
- Big delay in publication
- Do not reflect short-term fluctuations (e.g. due to epidemic)

Monthly

- + Standard tabulation
- + Short delay
- Short term-fluctuations are smoothed
- Data privacy issues

Weekly

- + Trace short-term fluctuations (e.g. epidemics)
- + Minimal delay
- Requires well developed statistical system
- Methodological challenges

Expected mortality: methods

- Extrapolation (e.g. average, weekly-specific trends, annual trend with weekly effects, ...) of observed indicator (death counts, CDR, SDR, ...). Works with weekly/monthly data
- Bayesian approach. Models total number of deaths or by age group. Works with weekly/monthly data
- "Standard" demographic forecast of mortality surface. Works with annual data

Methodology for annual estimates of excess mortality

- Whenever possible, we use available annual estimates
- Using the available data series from 2005, we employed the Lee-Carter model to estimate expected LE and YLL in 2020
- We use the forecasted population exposures and observed weekly death counts to calculate observed death rates if annual estimates are not available
- Excess death were calculated as the difference between expected and observed number of deaths



Details in Islam N., Jdanov D., et al. (2021)



Method	Period	Excess deaths, thsd.	%
Week-specific average, total deaths	2015-19	290	15%
	2010-19	218	12%
Week-specific trend, total deaths	2015-19	344	19%
	2010-19	346	19%
Bayesian (age-specific)	2015-19	382	21%
	2010-19	318	17%
Lee-Carter (age-specific)	2005-19	366	20%



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Data

Euromomo

Weekly mortality data for 24 countries; launched in 2011 (work started in 2008)

— Pooled deaths 📃 Normal range ----- Baseline ----- Substantial increase 📂 Corrected for delay in registration

All ages



Before the COVID-19 pandemic, EuroMOMO received no more than a few hundred visitors per month, most of whom were researchers and data enthusiasts. During the first weeks of the pandemic, it gets an increase of 2000%, that is 3 million visitors per month.

STMF@HMD: Short-term Mortality Fluctuations

- The Short-term Mortality Fluctuations STMF database (STMF) is a new part of the Human Mortality Database launched in May 2020.
- It provides data for scientific analysis of all- cause mortality fluctuations by weeks within calendar years. Our decision to establish this new data resource was primarily in response to the COVID-19 pandemic of 2019-21.
- However, being able to look at short-term mortality fluctuations is becoming increasingly important because of the growing importance of seasonal/temporary mortality fluctuations that are driven by temperature extremes, seasonal patterns of influenza and other disasters.

Covid-19 Is Speeding Up How Deaths Are Recorded

Daniel Michaels Jan. 23, 2021 5:30 am ET **THE WALL STREET JOURNAL**.

> Source: Johns Hopkins CSSE (deaths); the organizations (ways to register deaths)









Short-Term Mortality Fluctuation data series what DATA PROVIDES THE STMF?

Ready

- 1. Weekly original death counts (*csv*)
- 2. Weekly death counts & rates in standard age groups (*Excel*)
- 3. Pooled file with weekly death counts & rates in standard age groups (*csv*)

Weekly revision of all preliminary data & additional new data

www.mortality.org

	A	В	С	D	E	F	G	Н	1	J	К	L	М	N	0	Р	Q
1	Denm	nark															
2					Death o	counts					Death rate	25					Quality
З	Coun	Year	Weel	Sex	0-14	15-64	65-74	75-84	85+	Total	0-14	15-64	65-74	75-84	85+	Total	Split
4	DNK	2007	1	m	2	143	100	176	115	536	0.000201	0.004087	0.023597	0.079891	0.187783	0.010305	0
5	DNK	2007	1	f	1	102	89	186	259	637	0.000105	0.002970	0.019190	0.060034	0.179901	0.012016	0
6	DNK	2007	1	ь	3	245	189	362	374	1173	0.000154	0.003533	0.021294	0.068286	0.182253	0.011169	0
- 7	DNK	2007	2	m	3	124	127	171	138	563	0.000301	0.003544	0.029969	0.077621	0.225340	0.010825	0
8	DNK	2007	2	f	2	77	94	202	271	646	0.000211	0.002242	0.020268	0.065199	0.188236	0.012186	0
9	DNK	2007	2	b	5	201	221	373	409	1209	0.000257	0.002899	0.024900	0.070361	0.199309	0.011512	0
10	DNK	2007	3	m	3	144	102	166	107	522	0.000301	0.004115	0.024069	0.075352	0.174720	0.010036	0
11	DNK	2007	3	f	2	80	86	142	231	541	0.000211	0.002329	0.018543	0.045833	0.160452	0.010205	0
12	DNK	2007	3	ь	5	224	188	308	338	1063	0.000257	0.003230	0.021182	0.058100	0.164710	0.010122	0
13	DNK	2007	4	m	1	109	115	143	101	469	0.000100	0.003115	0.027137	0.064911	0.164922	0.009017	0
14	DNK	2007	4	f	1	73	89	151	239	553	0.000105	0.002125	0.019190	0.048738	0.166009	0.010432	0
15	DNK	2007	4	ь	2	182	204	294	340	1022	0.000103	0.002625	0.022984	0.055459	0.165685	0.009731	0
16	DNK	2007	5	m	8	130	117	174	120	549	0.000803	0.003715	0.027609	0.078983	0.195947	0.010555	0
17	DNK	2007	5	f	3	77	91	164	226	561	0.000316	0.002242	0.019621	0.052933	0.156979	0.010583	0
18	DNK	2007	5	b	11	207	208	338	346	1110	0.000565	0.002985	0.023435	0.063759	0.168608	0.010569	0
19	DNK	2007	6	m	3	160	97	164	131	555	0.000301	0.004572	0.022889	0.074444	0.213909	0.010671	0
20	DNK	2007	6	f	3	90	73	153	238	557	0.000316	0.002620	0.015740	0.049383	0.165314	0.010507	0
21	DNK	2007	6	ь	6	250	170	317	369	1112	0.000308	0.003605	0.019154	0.059797	0.179816	0.010588	0
22	DNK	2007	7	m	3	111	114	166	130	524	0.000301	0.003172	0.026901	0.075352	0.212276	0.010075	0
23	DNK	2007	7	f	3	98	103	162	229	595	0.000316	0.002853	0.022209	0.052288	0.159063	0.011224	0
24	DNK	2007	7	ь	6	209	217	328	359	1119	0.000308	0.003014	0.024449	0.061872	0.174943	0.010655	0
25	DNK	2007	8	m	2	149	132	188	135	606	0.000201	0.004258	0.031149	0.085338	0.220441	0.011651	0
26	DNK	2007	8	f	4	97	99	192	258	650	0.000422	0.002824	0.021346	0.061971	0.179206	0.012261	0
27	DNK	2007	8	b	6	246	231	380	393	1256	0.000308	0.003548	0.026027	0.071681	0.191512	0.011959	0
28	DNK	2007	9	m	3	142	126	200	154	625	0.000301	0.004058	0.029733	0.090785	0.251466	0.012017	0
29	DNK	2007	9	f	3	101	69	183	275	631	0.000316	0.002940	0.014878	0.059066	0.191014	0.011903	0
	4	•		Des	criptio	n	AUS2	Al	л	BEL	BGR	CAN	CHE	CHL	CZE	DEUTN	P C



Short-Term Mortality Fluctuation data series what DATA PROVIDES THE STMF?

- 1. Weekly original death counts (*csv*)
- 2. Weekly death counts & rates in standard age groups (*Excel*)
- 3. Pooled file with weekly death counts & rates in standard age groups (*csv*)
- 4. Description of data Formats and Methods
- 5. Metadata

Weekly revision of all preliminary data & additional new data

www.mortality.org

	ENGLAND and WALES
	Last update: 28.04.2021
1.	Coverage
	The data series includes the whole population of England and Wales: All death events registered in England and Wales among its residents, residents of other UK countries or non-UK visitors are included.
2.	Time coverage: 2.1. First day: 01.01.2010 (week 1, 2010) 2.2. Last day: 16.04.2021 (week 15, 2021) 2.3. Frequency of updates by data provider: weekly
3.	 Original data on deaths 3.1. Death date date of registration 3.2. Time units: 7-day weeks. 3.3. First and last days in week: Saturday-Friday 3.4. First and last weeks in year: First week of a year is a full week completed from days of the previous year. Last week of a year is a full 7-days week lasting until the last Friday of a year. The remaining days are added to the first week of the next year. Week 53 is present in exceptional years (2015 and eventually 2020) and they also include 7 days. 3.5. Age groups: 2000–2019: 0, 1-14, 15-44, 45-64, 65-74, 75-84, 85+, total; 2020: 5-year age groups with age group below one and open age interval 85+, total 3.6. Sex: male, female, both sexes 3.7. Data restrictions and modifications: none 3.8. Data delays and corrections: 2020 and 2021 data are provisional, and therefore it may be revised every week and corrected.
4. 5.	 Output data: aggregated from detailed original age groups Information on the data source and data provider 5.1. Data provider: Office for National Statistics (ONS) 5.2. Original copyright: © Crown copyright 2020; data may be reproduced free of charge in any format or medium, under the terms of the Open Government License. 5.3. Date of last update: April 27, 2021 5.4. Link to the datasets: https://www.ons.gov.uk/ (accessed every Tuesday since 21.04.2020)

COVID-19 Death Counts, E&W

Deaths by Date of Reporting vs. Date of Death





Short-Term Mortality Fluctuation data series what data provides the STMF?

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- 5. Metadata
- 6. Toolkit to visualize excess mortality (6 methods)



Short-Term Mortality Fluctuation data series WHAT DATA PROVIDES THE STMF?

https://mpidr.shinyapps.io/stmortality/



Spatial inequality: Germany

Week-specific age-standardized excess death rates during the Covid-19 pandemic across federal states of Germany (per 100,000) Source: Kolobova, Jdanov, Jasilionis, et al. (2021)



