# Methods

Overview

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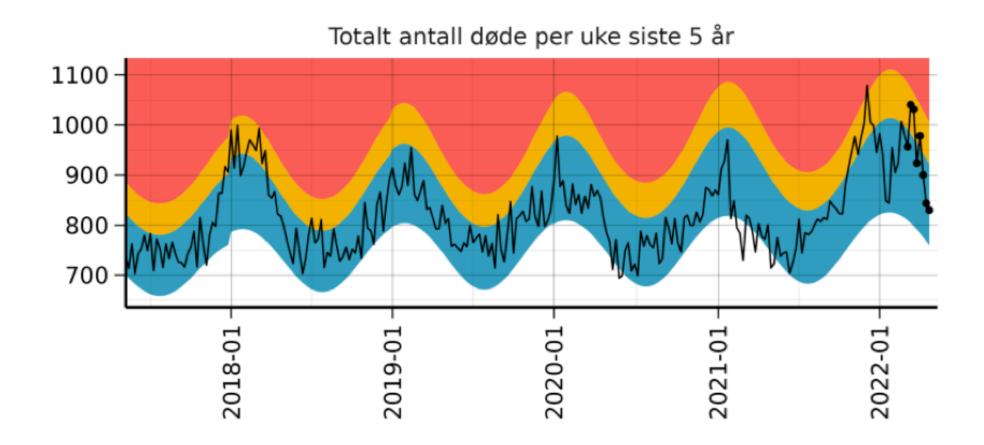
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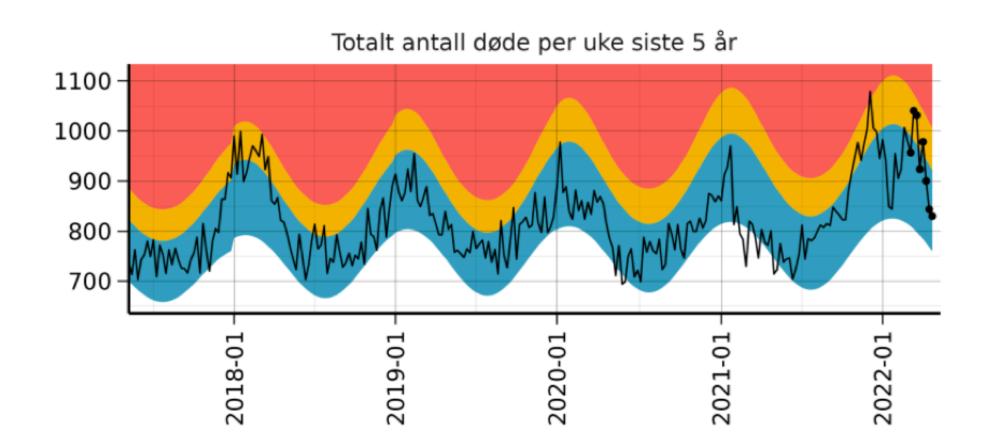
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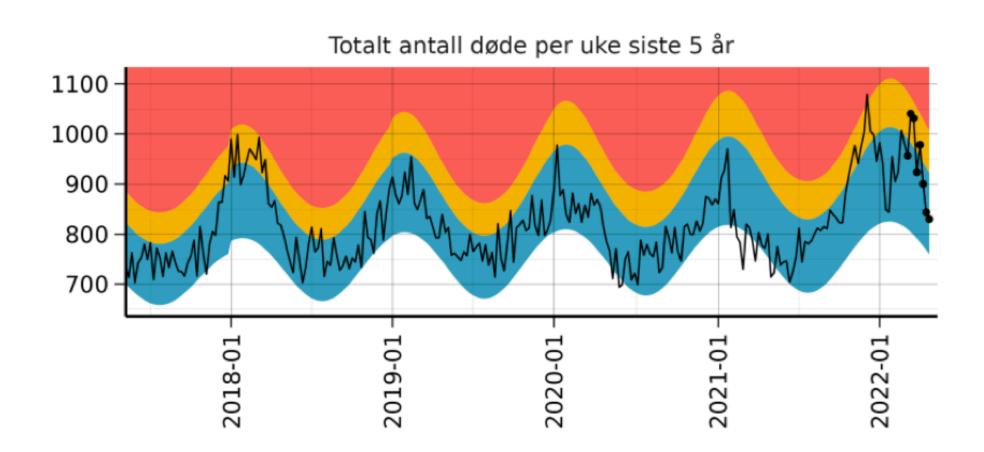


"Actual deaths" vs "reported/registered deaths"

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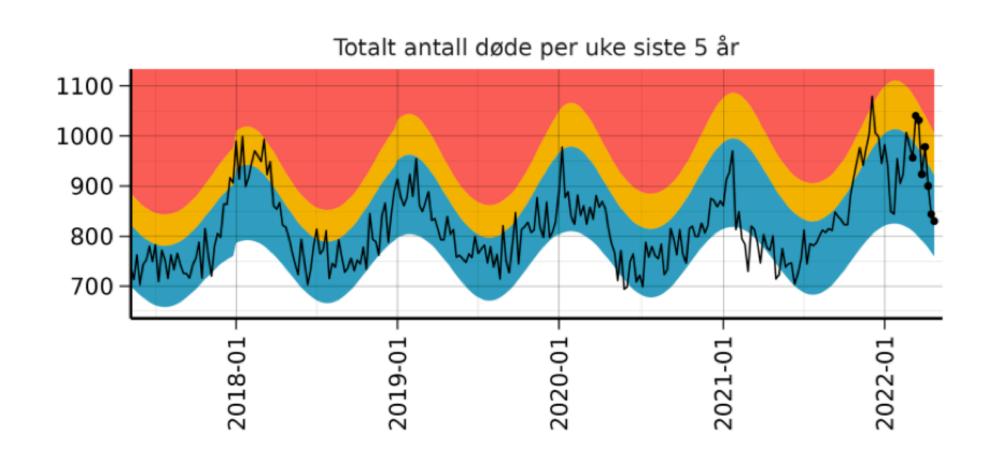
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- Reporting delay
  - paper based / electronic reporting
  - cause of death examination

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- Need to **train** and **validate** model on different parts of data

### Baseline estimation, excess reporting

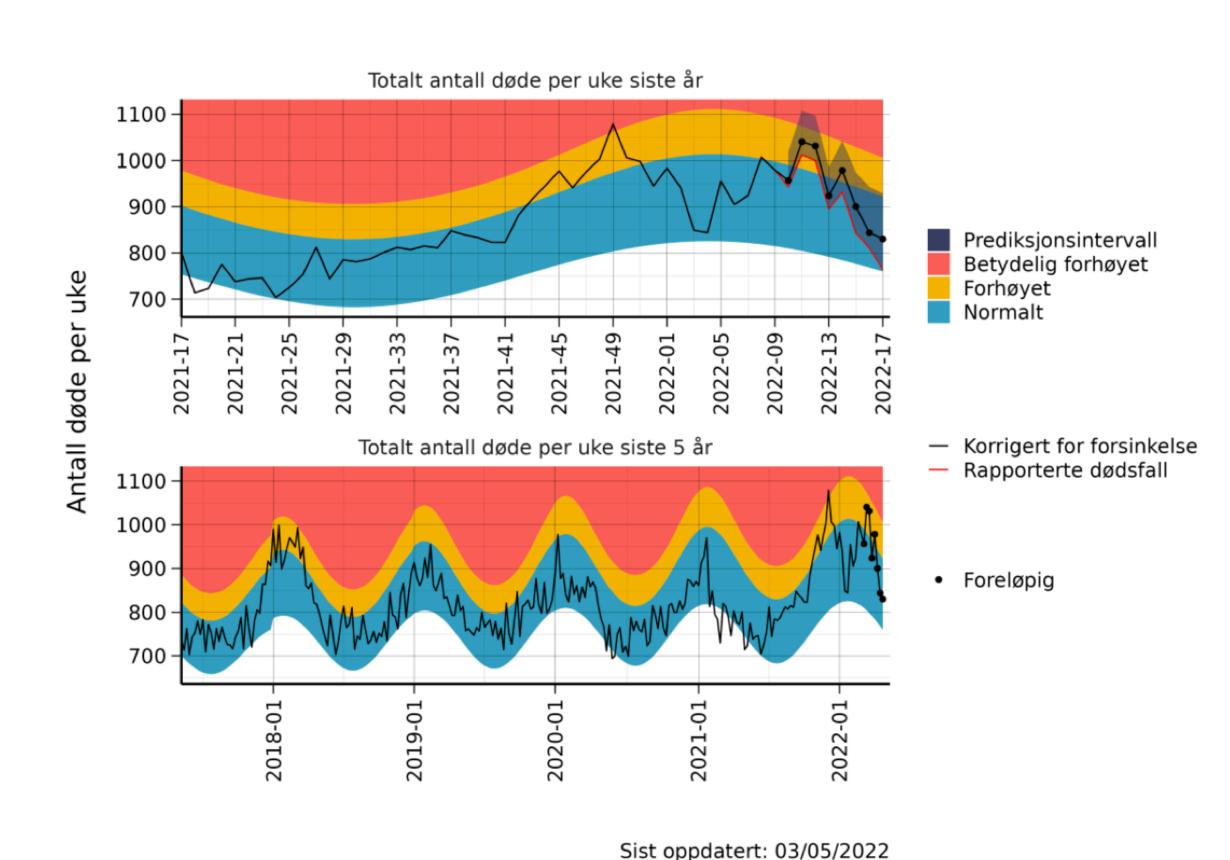
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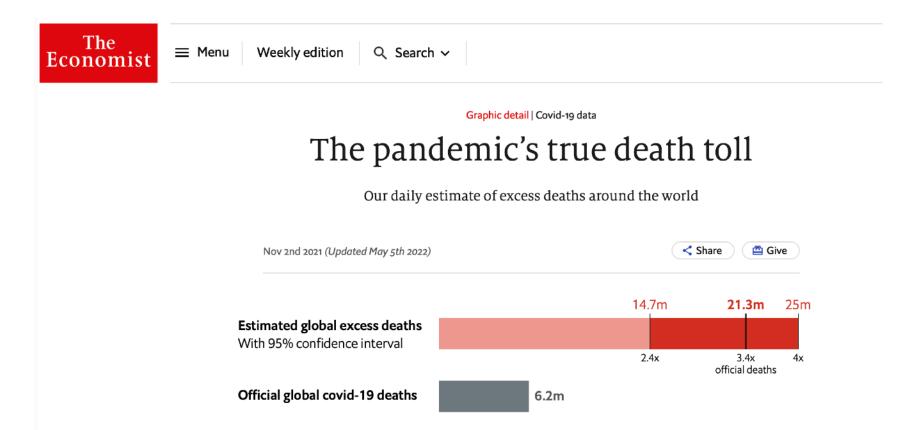
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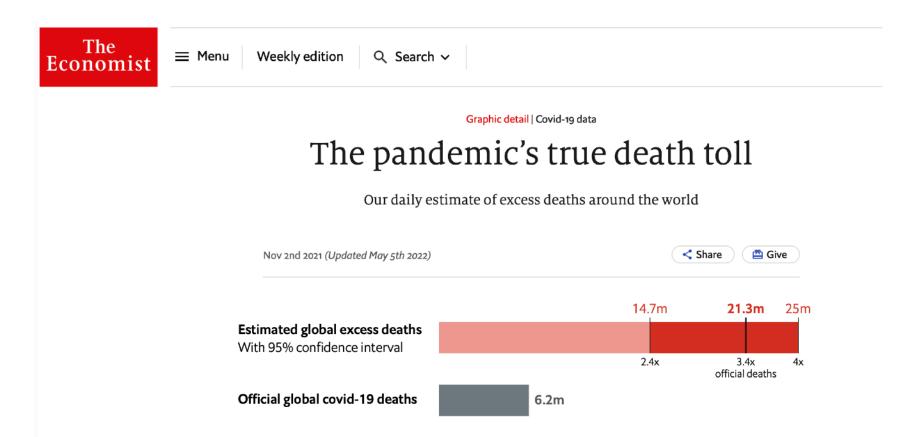
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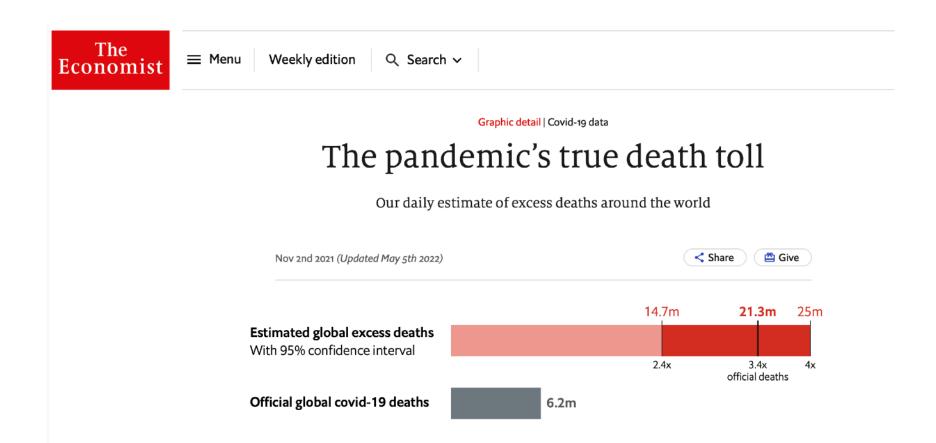
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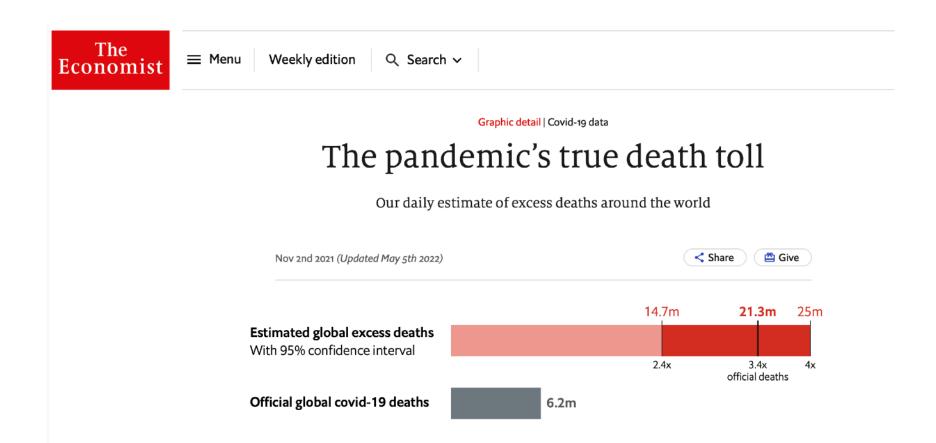


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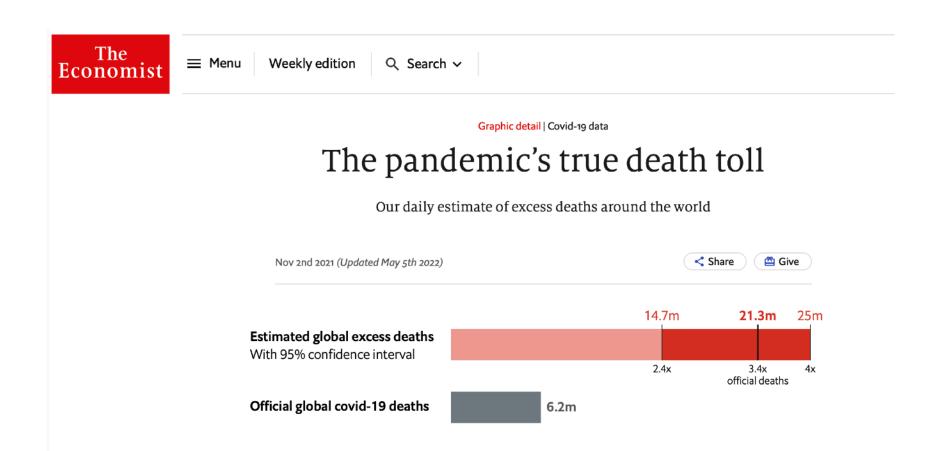


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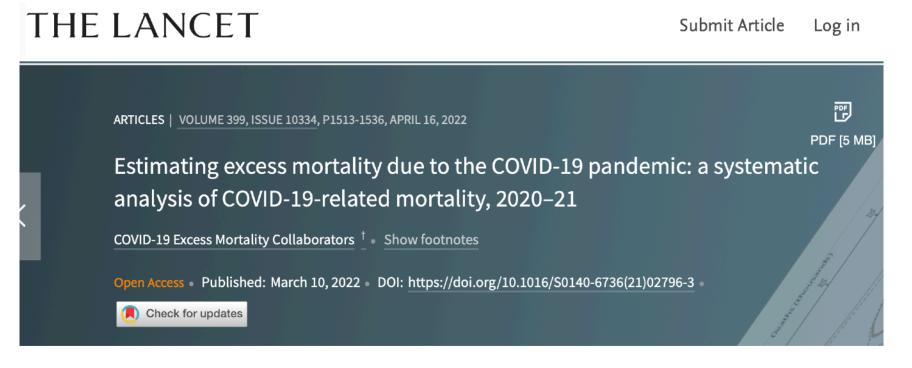




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  - · e.g. 1 excess deaths in one week, vs high level of 'normal' deaths in one month

# Normomo with Sykdomspulsen

#### Data and processing

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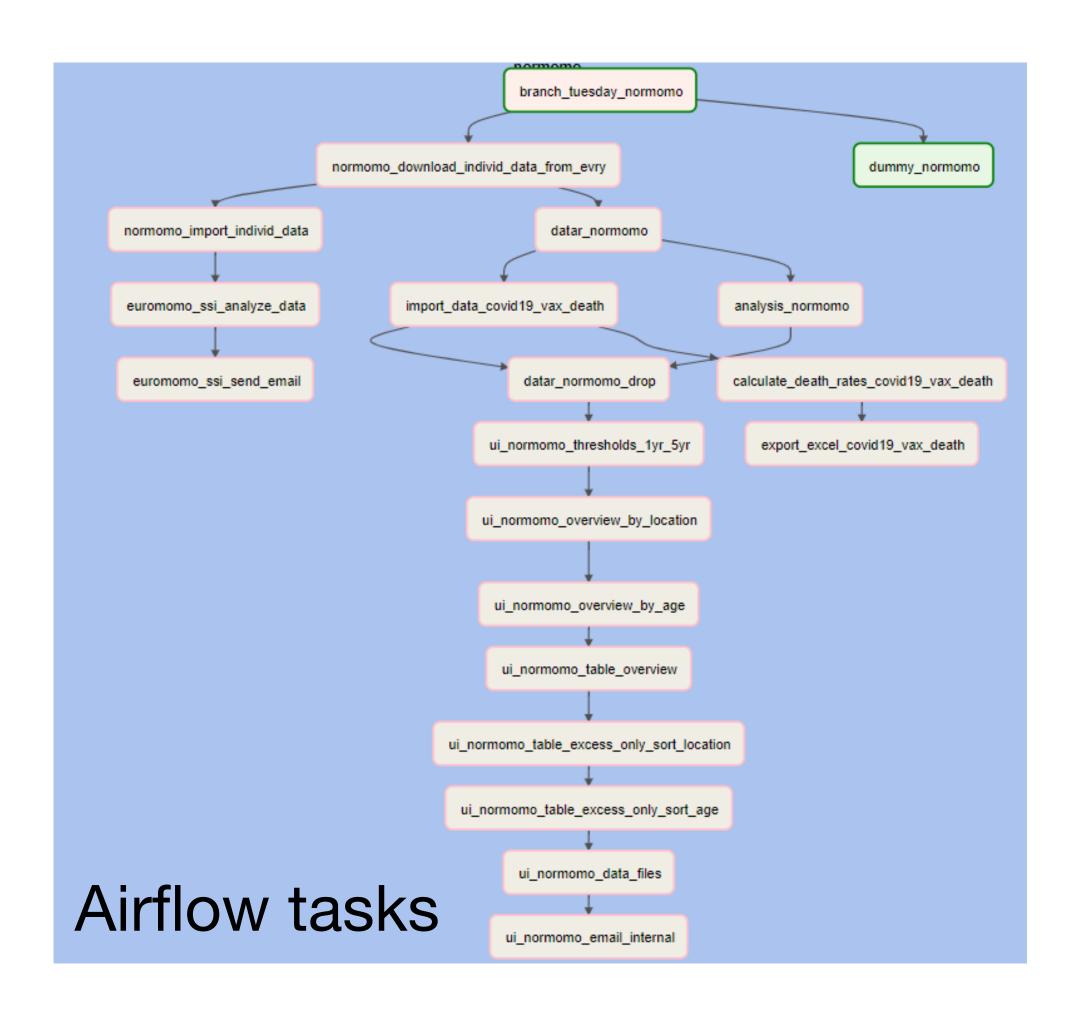
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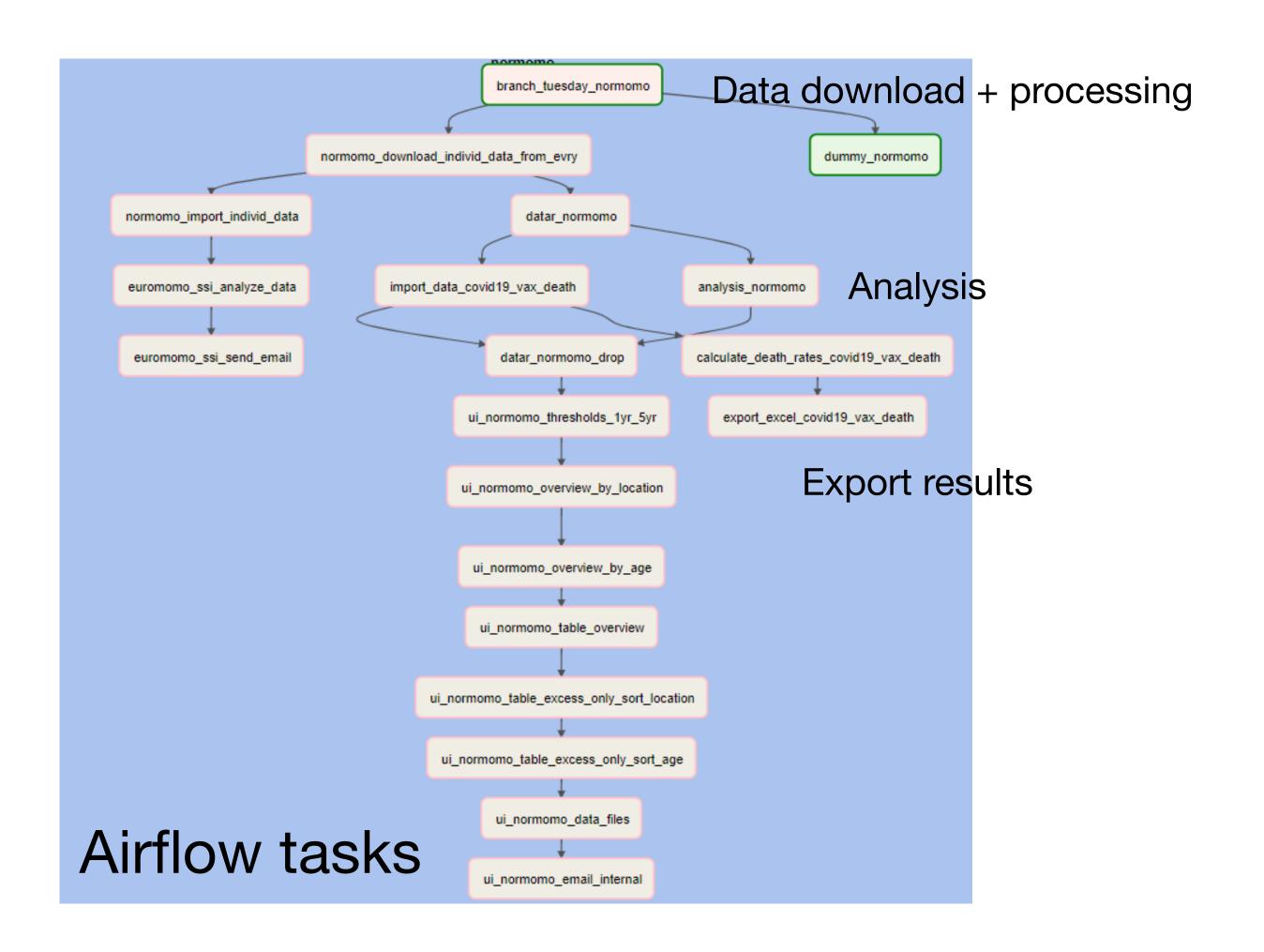
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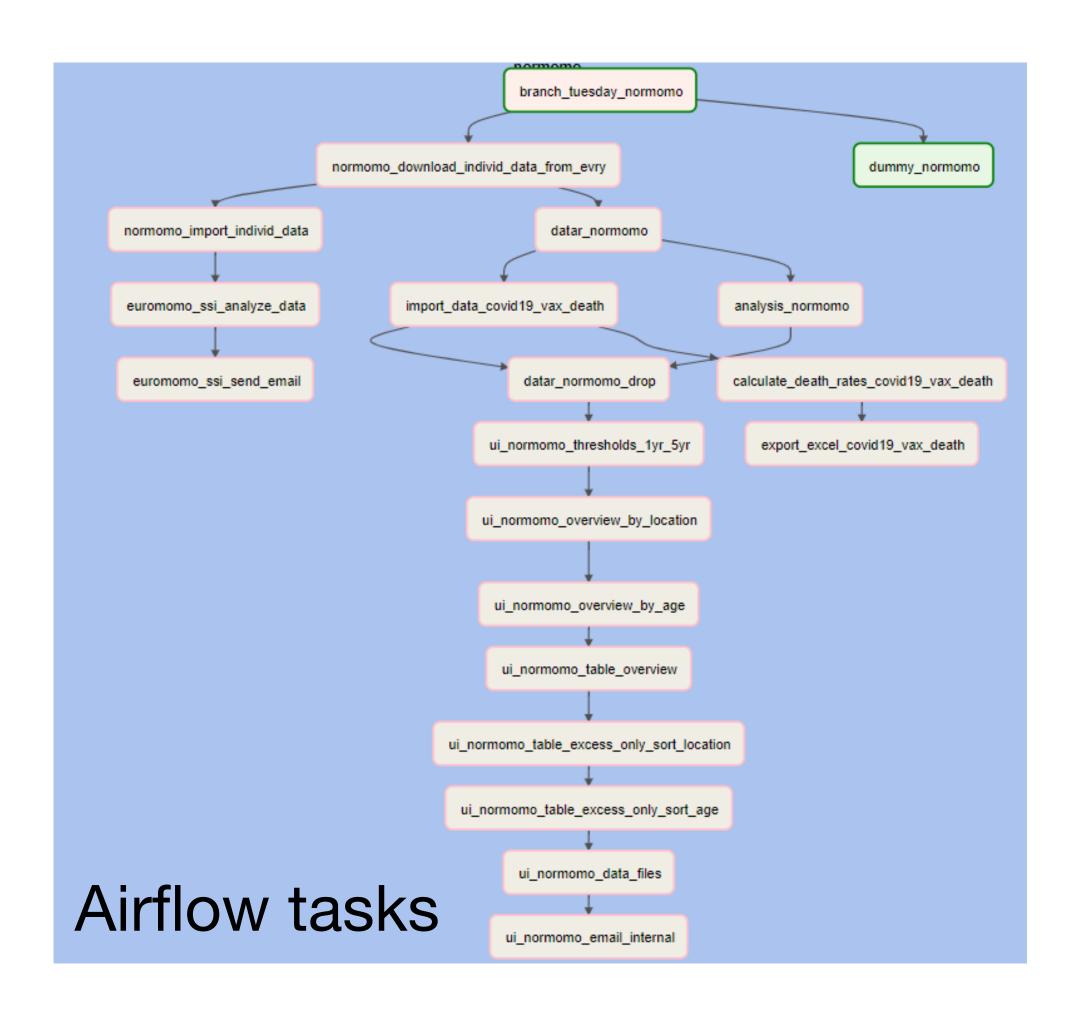
#### From data to reports



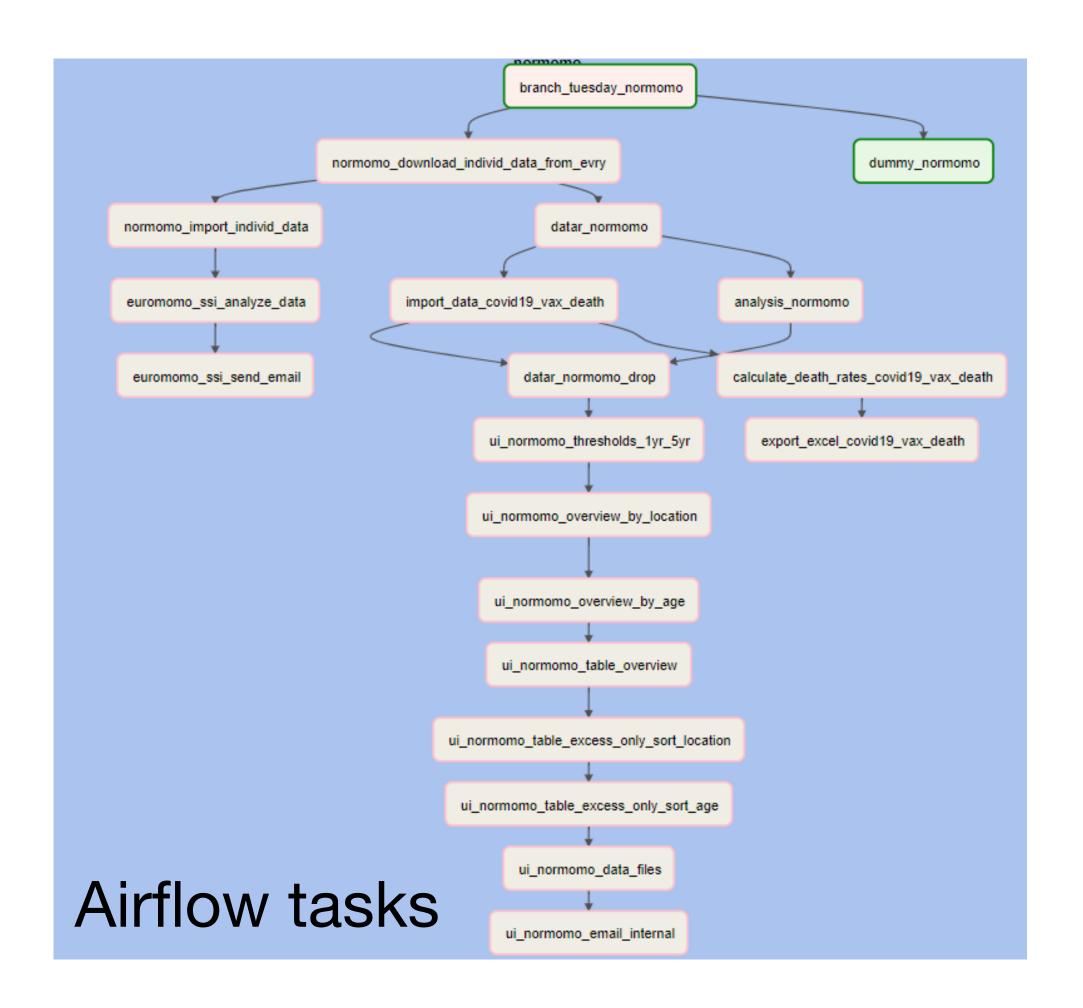
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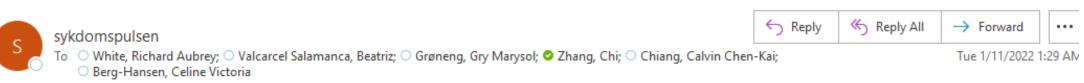


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#### Email (internal)

Resultater fra NorMOMO 2022-01-11



Resultater fra overvåkingssystemet for dødelighet (NorMOMO) er tilgjengelig på N:/sykdomspulsen\_normomo\_restricted\_output/2022-01-11 (tilgangsbegrenset)

Her er nye resultater fra overvåkingssystemet for generell dødelighet i Norge (NorMOMO).

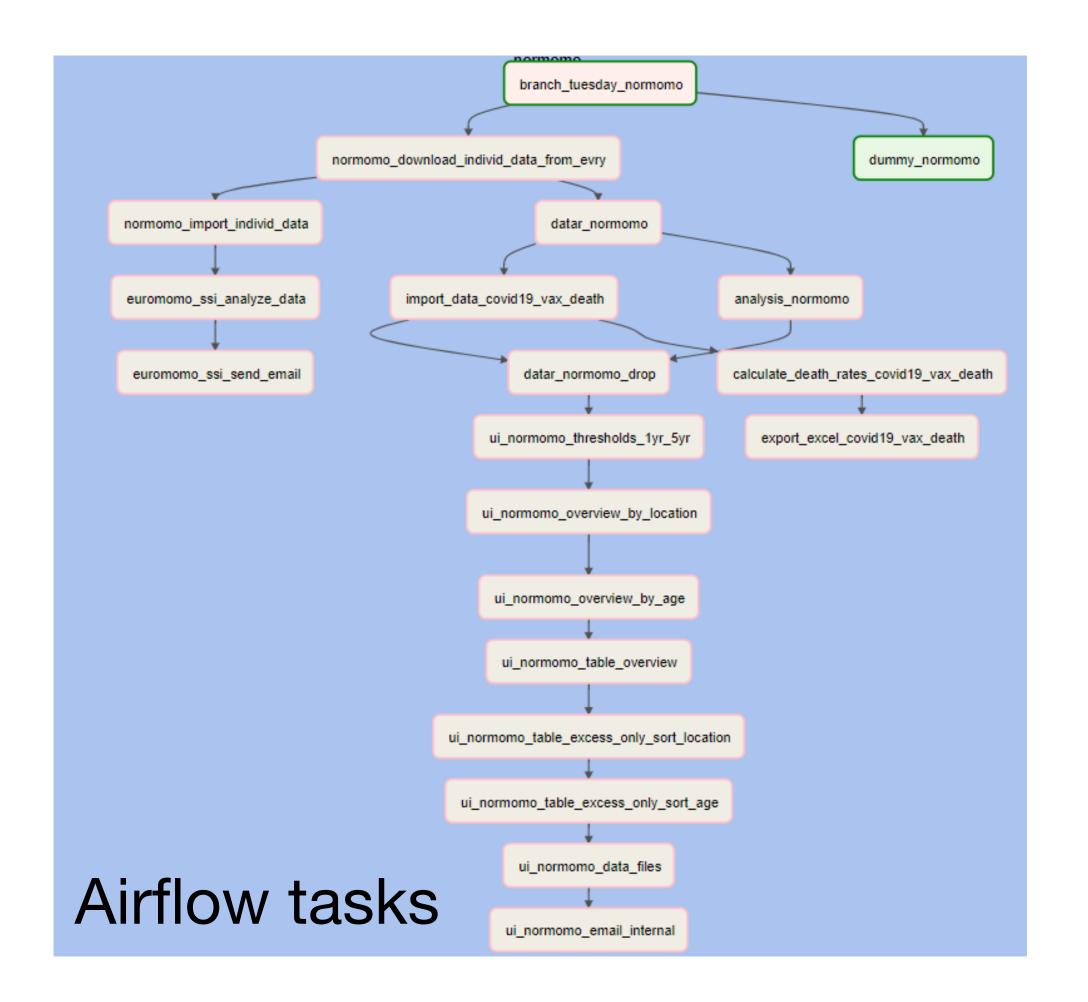
NorMOMO er basert på ukentlig oppdaterte anonyme data fra Folkeregisteret og analyseres ved bruk av EuroMOMO-modellen.

Under følger en oppsummering av forrige ukes resultater. Resultatene er til intern bruk, må tolkes med varsomhet og kan justeres noe grunnet forsinkelse i rapporteringen av dødsfall.

Tabell 1. Antall registrerte dødsfall de 8 og 4 siste ukene og nivå av dødelighet.

		1	Antall dødsfall	l		Dødelighetsnivå		
Alder	År-uke	Registrert <sup>1</sup>	$Korrigert^2$	Z-score <sup>3</sup>	Overdødelighet <sup>4</sup>	Normalt <sup>5</sup>	Forhøyet	Betydelig forhøyet
	2022-01	827	892	-0,51	0	823 - 1006	1006 - 1101	>1101
Totalt	2021-52	883	888	-0,50	0	820 - 1000	1000 - 1093	>1093
	2021-51	936	957	1,19	0	815 - 993	993 - 1084	>1084
	2021-50	973	1.02e+03	2,82	37	810 - 984	984 - 1074	>1074
	2021-49	1043	1.1e+03	4,74	122	804 - 974	974 - 1062	>1062
	2021-48	969	998	2,82	35	797 - 964	964 - 1049	>1049
	2021-47	960	982	2,72	30	790 - 953	953 - 1036	>1036
	2021-46	921	934	1,82	0	782 - 941	941 - 1023	>1023

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#### [euromomo input] [Norway] [2022 1]



Please find attached the current week's results.

Sincerely,

Norway

Email (to Euromomo)

### References and links



- Normomo (FHI) <a href="https://www.fhi.no/sv/influensa/influensaovervaking/overvakingssystem-for-dodelighet-eu/">https://www.fhi.no/sv/influensa/influensaovervaking/overvakingssystem-for-dodelighet-eu/</a>
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- Euromomo https://www.euromomo.eu
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- Economist https://www.economist.com/graphic-detail/coronavirus-excess-deaths-estimates
- · World Mortality Dataset <a href="https://ourworldindata.org/covid-excess-mortality">https://ourworldindata.org/covid-excess-mortality</a>