

# The role of human insight in forecasting the COVID-19 epidemic

- Results from Germany, Poland (and Europe) -



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# Outline

- 1) Overview and aims
- 2) The models
- 3) Results
- 4) Current and future work



# Overview and aims

# Overview

- Submissions to the German / Polish Forecast Hub
- October 10 2020 - March 1 2021
- 3 Models submitted:
  - a. Crowd forecast
  - b. A model based on the renewal equation
  - c. A convolution model
- continued submission to ECDC Hub

# Aims

- Provide value to the Forecast Hub
- Disentangle the role of human influence:
  1. a completely untuned model based in epidemiological theory
  2. a completely tuned model with no theory
  3. an ensemble of semi-tuned models

# The models

# The renewal equation model

- based on the R package EpiNow2
- future cases  
= weighted sum of past cases \*  $R_t$
- Estimates  $R_t$  (using a gaussian process) and then just predicts a constant  $R_t$  into the future

# The convolution model

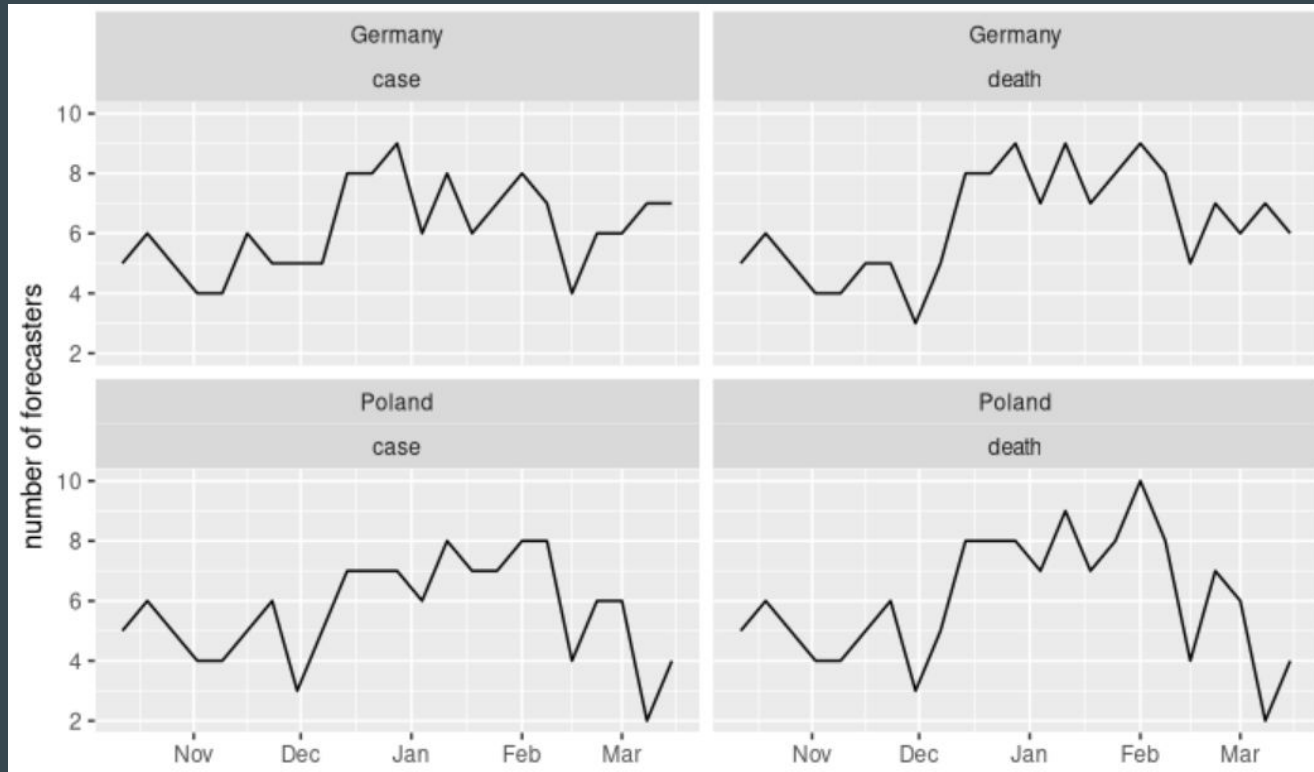
- only death forecasts
- models deaths as a convolution of cases with a delay distribution and a scaling parameter



# The crowd forecasts

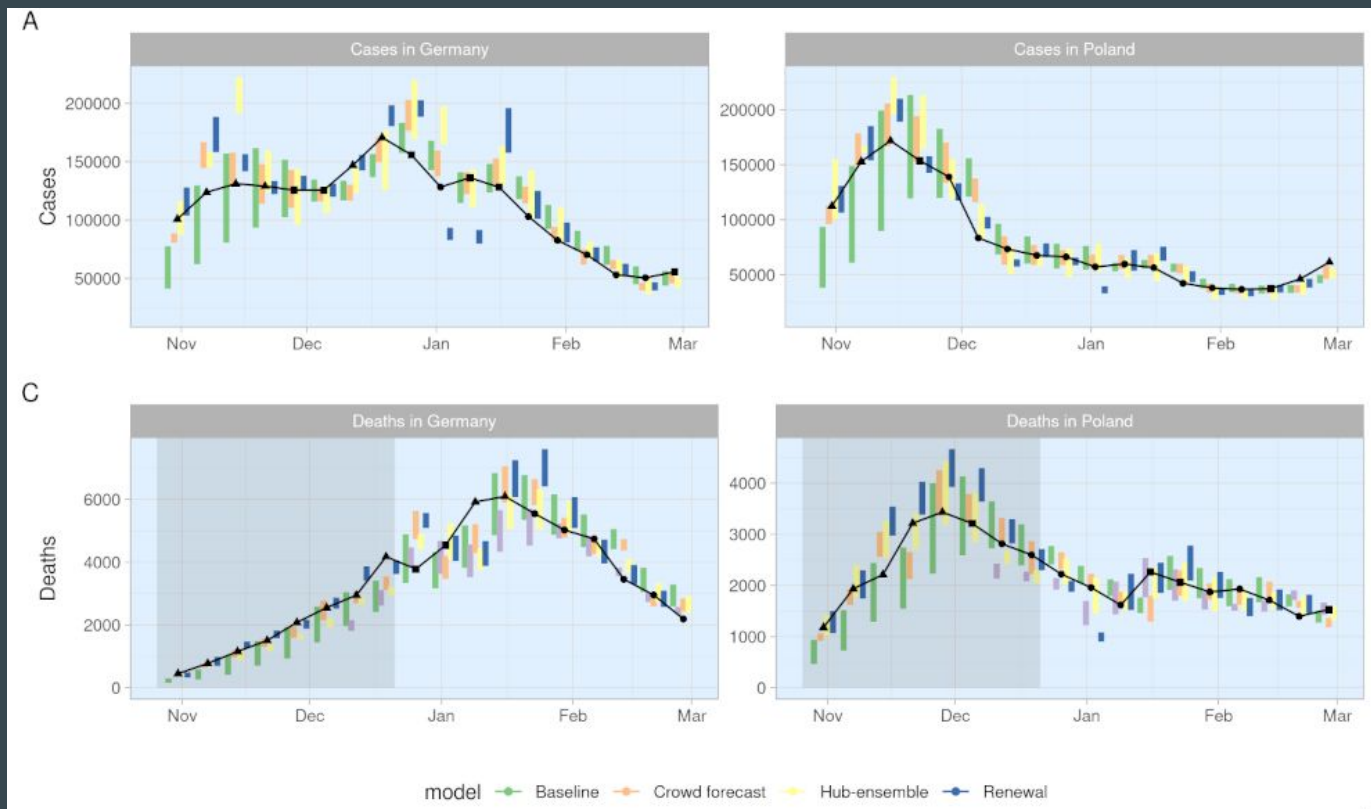
- R shiny app
- Data stored in a google sheet
- [app.crowdforecastr.org](http://app.crowdforecastr.org)

# Number of forecasts



# Results

# Observed values and 2 week ahead predictions



# Evaluation metrics

**WIS = sharpness + overprediction  
+ underprediction**

## **Calibration**

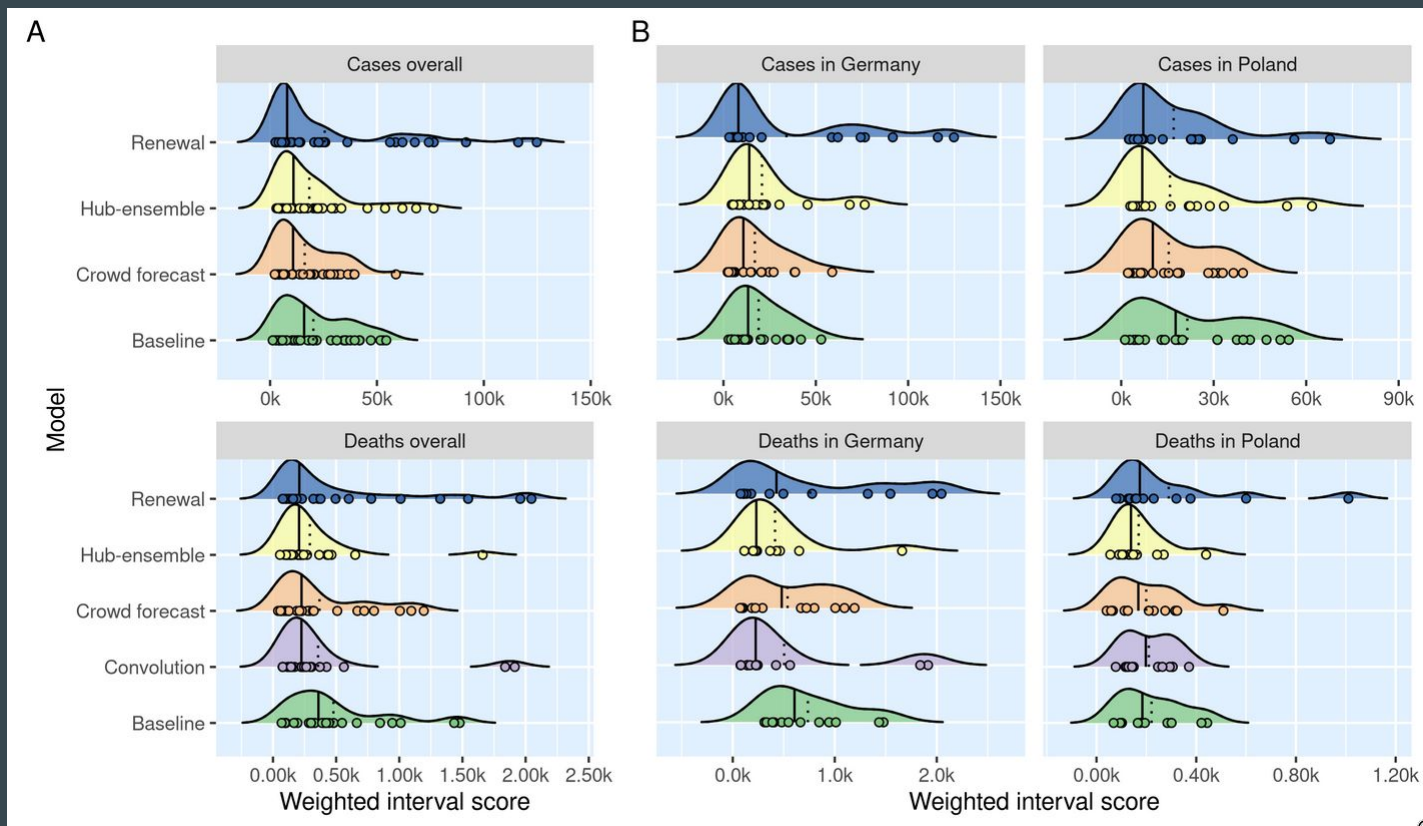
- bias (between -1 and 1)
- coverage

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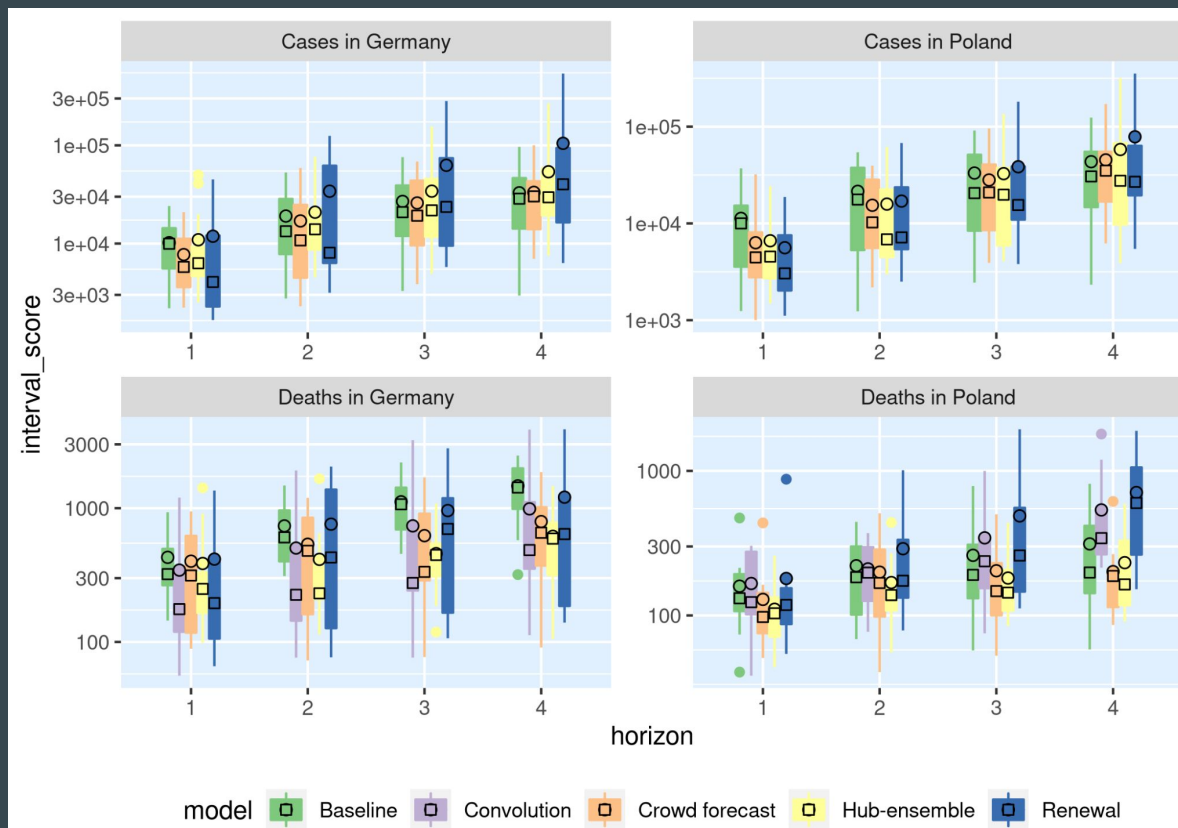
# Aggregate results (2 weeks ahead)

	Model	WIS	WIS - rel.	WIS - median	WIS - sd	Sharpness	Underpred.	Overpred.	Bias	Abs. error	50%-Cov.	90%-Cov.
<b>Cases</b>												
2 wk ahead	Baseline	20200	1.00	14400	19600	4750.0	10000.0	5490.0	-0.06	28400	0.31	0.55
	Crowd forecast	16200	0.80	8330	16600	3660.0	5930.0	6600.0	-0.01	23300	0.36	0.55
	Hub-ensemble	18300	0.91	9940	21900	6140.0	3800.0	8410.0	-0.03	26800	0.43	0.64
	Renewal	25600	1.26	9020	33800	5420.0	5920.0	14200.0	0.17	34600	0.43	0.67
<b>Deaths</b>												
2 wk ahead	Baseline	479	1.00	317	488	123.0	122.0	233.0	0.23	735	0.17	0.67
	Convolution	357	0.74	176	573	104.0	204.0	48.8	-0.10	565	0.33	0.79
	Crowd forecast	368	0.77	164	442	107.0	102.0	160.0	0.14	576	0.38	0.75
	Hub-ensemble	292	0.61	168	385	132.0	108.0	51.9	0.01	429	0.62	0.96
	Renewal	524	1.10	206	671	155.0	133.0	236.0	-0.02	750	0.50	0.71

# Distribution of weighted interval scores (2 weeks ahead)



# Scores for different forecast horizons

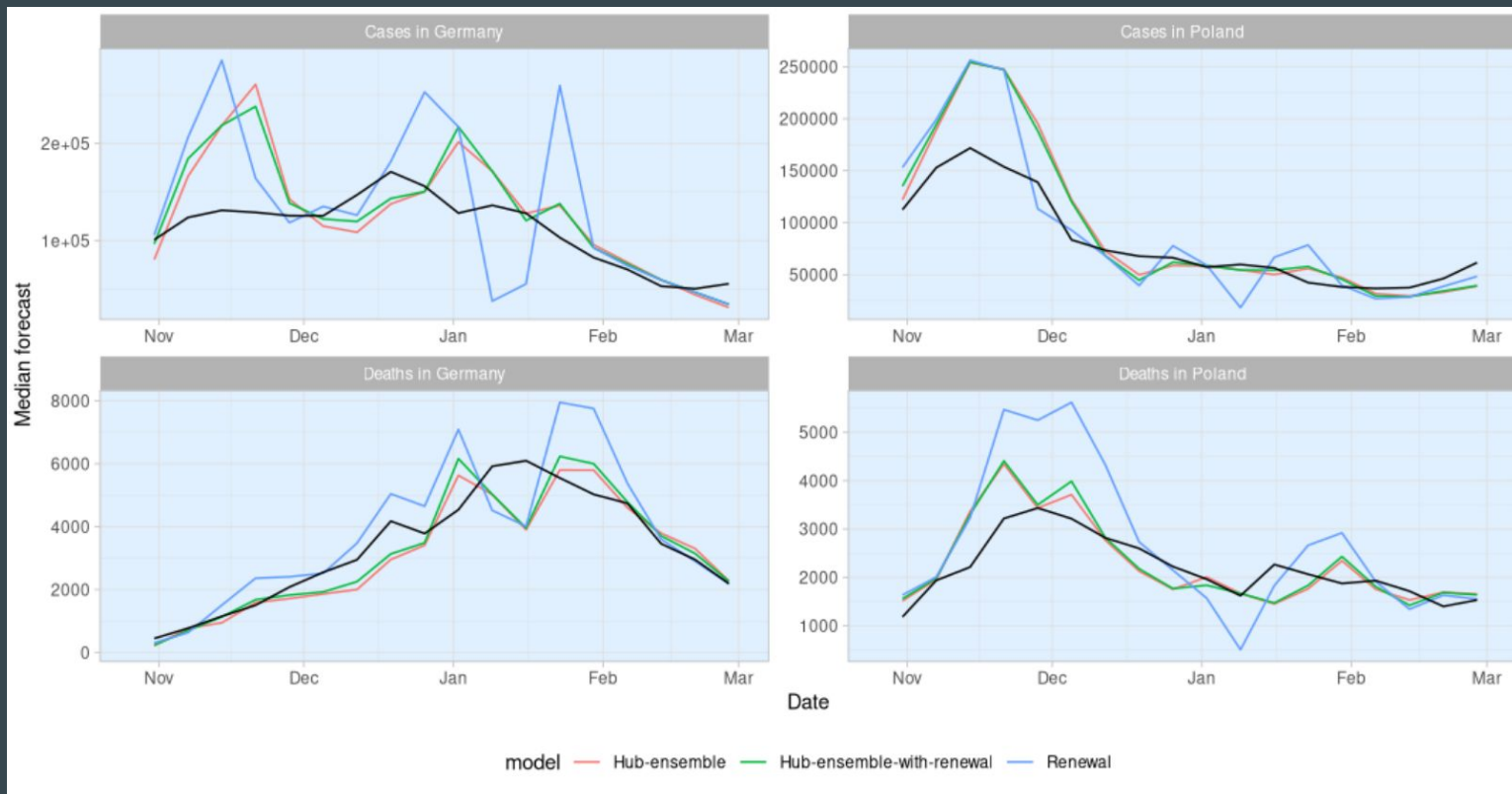




# Contribution to the Hub ensemble (2 weeks ahead)

	Model	WIS	WIS - median	WIS - sd	Sharpness	Underpred.	Overpred.	Bias	Abs. error	50%-Cov.	90%-Cov.
<b>Cases</b>											
2 wk ahead	Hub-ensemble	18300	9940	21900	6140.0	3800.0	8410.0	-0.03	26800	0.43	0.64
	Hub-ensemble-all	16500	8490	19600	5450.0	3290.0	7710.0	0.02	24300	0.43	0.69
	Hub-ensemble-with-crowd	16900	9250	19600	5230.0	4310.0	7370.0	0.00	24600	0.38	0.64
	Hub-ensemble-with-renewal	17500	9250	21400	5830.0	2880.0	8770.0	0.00	25500	0.45	0.71
<b>Deaths</b>											
2 wk ahead	Hub-ensemble	292	168	385	132.0	108.0	51.9	0.01	429	0.62	0.96
	Hub-ensemble-all	296	151	398	125.0	91.0	80.2	0.05	486	0.58	0.92
	Hub-ensemble-with-crowd	303	161	392	122.0	106.0	74.6	0.03	499	0.58	0.92
	Hub-ensemble-with-renewal	296	144	397	128.0	97.1	71.2	-0.01	462	0.67	0.92

# Contribution to the Hub ensemble median (2 weeks ahead)



# Takeaways

- Ensembles are stable, but rarely brilliant
- Even 'bad' models can make a positive contribution
- humans are
  - good at predicting cases
  - worse at deaths
  - overconfident

# Current and future work

# Crowd Rt forecasts

- humans forecast  $R_t$
- renewal equation maps  $R_t$  to cases and deaths
- [rt-app.crowdforecastr.org](https://rt-app.crowdforecastr.org)

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# ECDC Hub

- regular submissions to the hub
- few participants in many countries



# UK COVID-19 Crowd Forecasting Challenge

- 12 weeks
- started May 24th
- users can use both apps

**Tell your friends about it!**

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# **UK Covid-19 Crowd Forecasting Challenge**

**May 24th - August 16th 2021**

**Use your insights to make a real difference! Anyone is welcome to join.**

**To participate, submit your weekly forecast between Sunday 12am and Monday 8pm UK Time.**

- 1. prize: 100 GBP**
- 2. prize: 50 GBP**
- 3. prize: 25 GBP**

**more information: [crowdfocast.org](https://crowdfocast.org)**



# UK crowdforecasting challenge - Rt vs. non-Rt

## Leaderboard

[CSV](#)[Excel](#)Search: 

	forecaster	interval score (lower = better)	ranking
1	anonymous_Stingray	0.19	1
2	seb (Rt)	0.27	2
3	seabbs (Rt)	0.28	3
4	EpiExpert-ensemble	0.33	4
5	Layperson_21 (Rt)	0.35	5
6	habakuk (Rt)	0.38	6
7	anonymous_Rail	0.39	7
8	curlykale	0.44	8
9	aurelwu	0.44	9
10	aen	0.47	10

**Thank you for your attention**