

Probabilistic ensemble forecasting of Australian COVID-19 cases

Rob J Hyndman

robjhyndman.com/covidtalk



MONASH University

Australian Health Protection Principal Committee

The **Australian Health Protection Principal Committee** is the key decision-making committee for national health emergencies. It comprises all state and territory Chief Health Officers and is chaired by the Australian Chief Medical Officer.

COVID-19 forecasting group

- | | | |
|-----------------|------------------------|-------------------|
| ■ Peter Dawson | ■ Jodie McVernon | ■ Joshua V Ross |
| ■ Nick Golding | ■ Pablo Montero-Manso | ■ Gerry Ryan |
| ■ Rob J Hyndman | ■ Robert Moss | ■ Freya M Shearer |
| ■ Dennis Liu | ■ Mitchell O'Hara-Wild | ■ Tobin South |
| ■ James M McCaw | ■ David J Price | ■ Ruarai Tobin |

Data sources

- Case-level data of all positive COVID-19 tests: onset and detection times.
- Daily population mobility data from Google, Apple & Facebook
- Weekly non-household contact surveys
- Weekly behavioural surveys
- Daily case data from ?? countries via the Johns Hopkins COVID-19 repository

Case numbers

```
localcases %>% filter(state=="VIC", date >= "2020-07-01")
```

```
## # A tsibble: 353 x 3 [1D]
```

```
## # Key:           state [1]
```

```
##   date      state      n
```

```
##   <date>    <chr> <dbl>
```

```
## 1 2020-07-01 VIC      116
```

```
## 2 2020-07-02 VIC      113
```

```
## 3 2020-07-03 VIC      161
```

```
## 4 2020-07-04 VIC      161
```

```
## 5 2020-07-05 VIC      156
```

```
## 6 2020-07-06 VIC      237
```

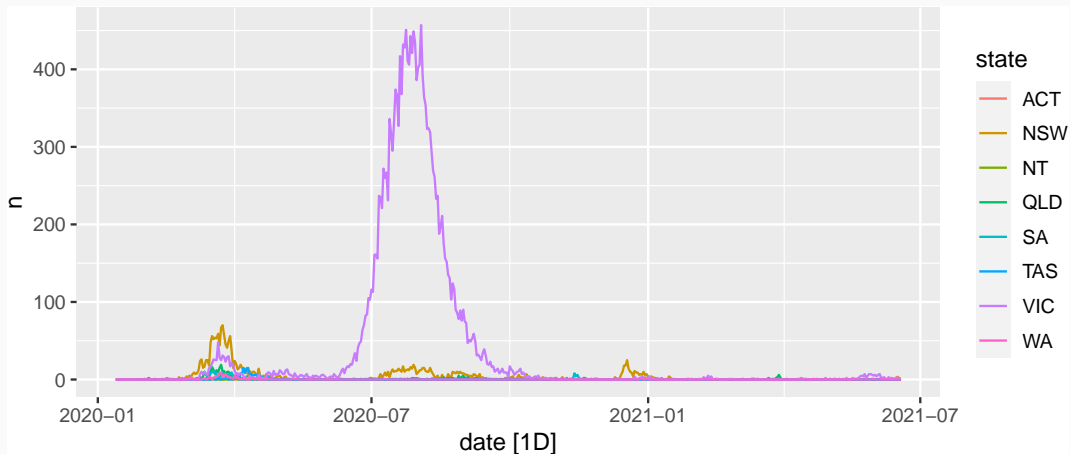
```
## 7 2020-07-07 VIC      235
```

```
## 8 2020-07-08 VIC      221
```

```
## 9 2020-07-09 VIC      272
```

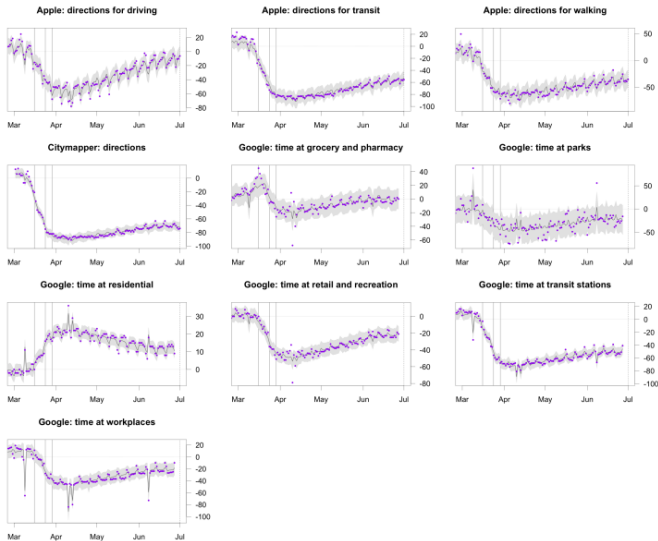
Case numbers

```
localcases %>% autoplot(n)
```

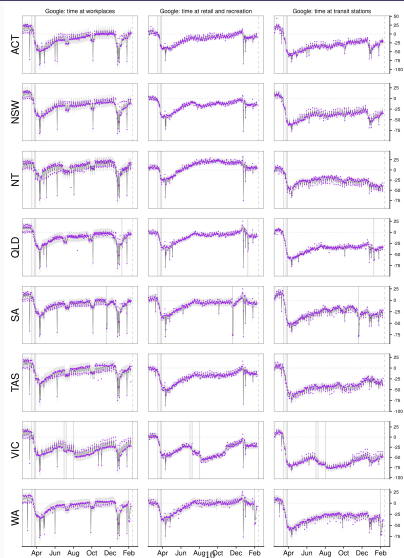


Mobility data

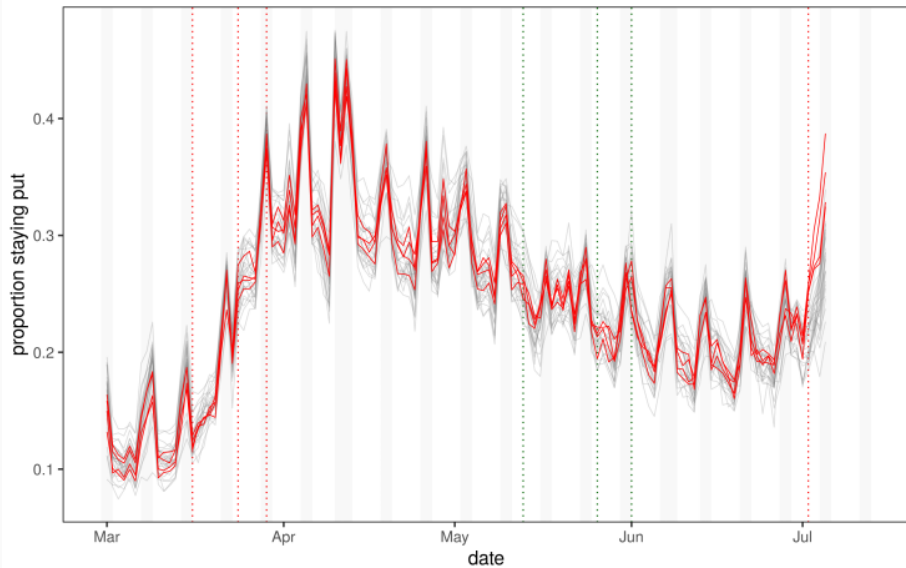
Victoria - data and model fit up to July 01



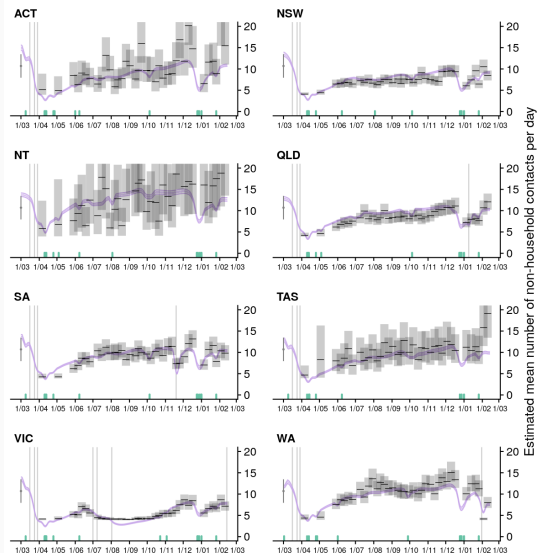
Mobility data



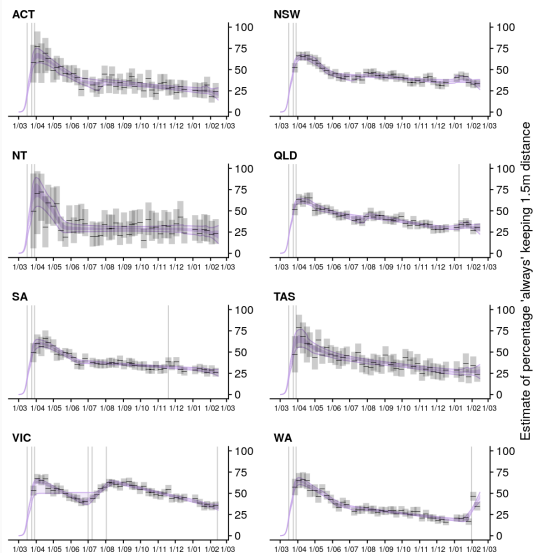
Mobility data



Survey data



Survey data



We use case-level data of all Australian positive COVID cases, along with nationwide surveys and mobility data from Google, Facebook and Apple. Three separate models have been built: (1) a stochastic susceptible-exposed-infectious-recovered (SEIIR) compartmental model; (2) a stochastic epidemic model; and (3) a global autoregressive model based on public case data from 31 countries. These are then combined into a mixture ensemble to generate probabilistic forecasts of daily cases which are provided to the Australian governments each week. I will discuss the ensemble forecasting aspects of this work and how we evaluate the results.

Thanks!



More information

- Slides and papers: **robjhyndman.com**
- Packages: **tidyverts.org**
- Forecasting textbook using fable package:
OTexts.com/fpp3

Find me at ...

 @robjhyndman

 @robjhyndman

 robjhyndman.com

 rob.hyndman@monash.edu