## Ebola Forecasting - Error Analysis

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### Data Input and Cleaning

#### **Outbreak Dataset**

```
rm(list=ls())
true <- read.csv("/Volumes/GoogleDrive/.shortcut-targets-by-id/15UGkfREtfqH3LdfHmCsSpFJ5SrTnSeyt/ebola/
source("outbreak_vis.R") #script with functions
## -- Attaching packages -----
## v ggplot2 3.3.2
                      v purrr
                                 0.3.4
## v tibble 3.0.1 v dplyr
                                1.0.0
## v tidyr 1.1.0 v stringr 1.4.0
## v readr
           1.3.1
                      v forcats 0.5.0
## -- Conflicts -----
## x dplyr::filter() masks stats::filter()
                    masks stats::lag()
## x dplyr::lag()
## Attaching package: 'lubridate'
## The following objects are masked from 'package:base':
##
##
       date, intersect, setdiff, union
rgx \leftarrow "\d{1,2}\\d{1,2}\\d{4}" #date structure regex
true <- true[str_detect(true$Date, rgx),] #omits rows without a date
colnames(true) <- c("date", "cases")</pre>
true$date <- mdy(true$date)</pre>
true$cases[is.na(true$cases)] <- 0</pre>
true <- true %>% mutate(total = cumsum(cases))
last_date <- true$date[length(true$date)]</pre>
last_case <- true$total[length(true$total)]</pre>
```

#### **Hawkes Projections Dataset**

```
hproj <- read.csv("/Volumes/GoogleDrive/.shortcut-targets-by-id/1LaD1nL_0A0posW2fr2XDcs6BLHVBC-jA/2019 :
hproj <- hproj %>% select(date_last_case, pred.7, pred.14, pred.21)
hproj$date_last_case <- mdy(hproj$date_last_case)
dates <- as.character(hproj$date_last_case)
preds <- t(hproj %>% select(pred.7,pred.14,pred.21))
```

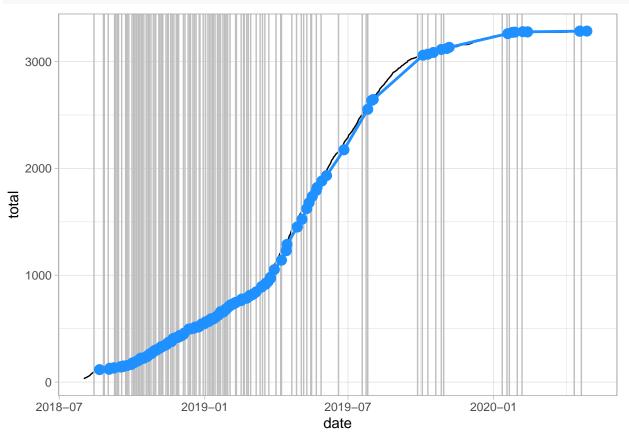
## Hawkes Complete Outbreak Analysis

### 7-Day Forecast Analysis

```
mod <- single_forecast(dates, preds, days = 7, res = TRUE)</pre>
head(mod$results, 10)
##
      prior.date prior.total forecast.date actual.total forecast.total resids
## 1
      2018-08-14
                           95
                                 2018-08-21
                                                      106
                                                                      117
                                                                              -11
## 2
      2018-08-26
                          113
                                 2018-09-02
                                                      128
                                                                      120
                                                                               8
                                                                      130
                                                                               -2
## 3
      2018-08-27
                          115
                                 2018-09-03
                                                      128
      2018-09-01
                          126
                                 2018-09-08
                                                      132
                                                                      131
                                                                               1
      2018-09-01
                          126
                                 2018-09-08
                                                      132
                                                                      133
                                                                               -1
## 5
## 6
      2018-09-01
                          126
                                 2018-09-08
                                                      132
                                                                      134
                                                                               -2
## 7
      2018-09-10
                          136
                                 2018-09-17
                                                      148
                                                                      143
                                                                               5
      2018-09-09
                          134
                                 2018-09-16
                                                      147
                                                                      143
## 9
      2018-09-10
                          136
                                 2018-09-17
                                                      148
                                                                      143
                                                                                5
## 10 2018-09-10
                          136
                                 2018-09-17
                                                      148
                                                                      144
mod$rmse
```

## RMSE ## 1 27.83955

mod\$plot

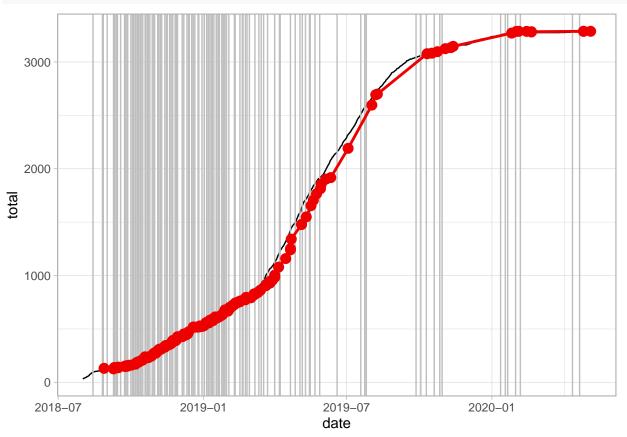


#### 14-Day Forecast Analysis

```
mod <- single_forecast(dates, preds, days = 14, res = TRUE)</pre>
results <- mod$results
head(mod$results, 10)
##
      prior.date prior.total forecast.date actual.total forecast.total resids
## 1
     2018-08-14
                           95
                                 2018-08-28
                                                      122
                                                                   131.0
                                                                            -9.0
## 2
     2018-08-26
                          113
                                 2018-09-09
                                                      134
                                                                   126.0
                                                                             8.0
      2018-08-27
                                 2018-09-10
                                                      136
                                                                   139.0
                                                                           -3.0
## 3
                          115
      2018-09-01
                          126
                                 2018-09-15
                                                      145
                                                                   137.0
                                                                             8.0
## 4
## 5
     2018-09-01
                          126
                                 2018-09-15
                                                      145
                                                                   139.0
                                                                             6.0
## 6
     2018-09-01
                          126
                                 2018-09-15
                                                      145
                                                                   142.5
                                                                             2.5
## 7
      2018-09-10
                                                                   149.0
                          136
                                 2018-09-24
                                                      167
                                                                            18.0
## 8 2018-09-09
                          134
                                 2018-09-23
                                                      159
                                                                   150.0
                                                                             9.0
## 9 2018-09-10
                          136
                                 2018-09-24
                                                                   150.0
                                                      167
                                                                            17.0
## 10 2018-09-10
                                                                   152.0
                          136
                                 2018-09-24
                                                      167
                                                                            15.0
mod$rmse
```

## RMSE ## 1 58.68716

#### mod\$plot



### 21-Day Forecast Analysis

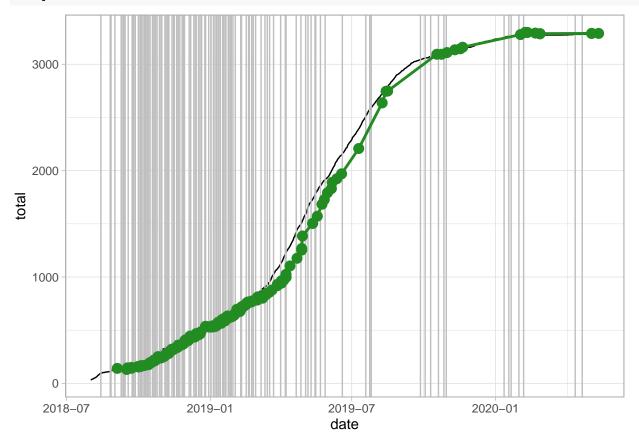
```
mod <- single_forecast(dates, preds, days = 21, res = TRUE)
head(mod$results, 10)</pre>
```

##		prior.date	prior.total	forecast.date	actual.total	forecast.total	resids
##	1	2018-08-14	95	2018-09-04	128	141	-13
##	2	2018-08-26	113	2018-09-16	147	131	16
##	3	2018-08-27	115	2018-09-17	148	146	2
##	4	2018-09-01	126	2018-09-22	158	142	16
##	5	2018-09-01	126	2018-09-22	158	146	12
##	6	2018-09-01	126	2018-09-22	158	150	8
##	7	2018-09-10	136	2018-10-01	190	156	34
##	8	2018-09-09	134	2018-09-30	187	157	30
##	9	2018-09-10	136	2018-10-01	190	156	34
##	10	2018-09-10	136	2018-10-01	190	159	31

mod\$rmse

## RMSE ## 1 88.41671

mod\$plot



# Hawkes Partial Outbreak Analysis

After analyzing the entire model, we then refine our analysis to a select number of forecasts.