5301_project_2

HB

2024-03-03

Introduction

This document reviews **COVID19 Data Report** based on a dataset retrieved from Johns Hopkins University data repository. The purpose of this document is to review the Covid19 data and produce educational visuals and models. The general trend of change in the number of cases and deaths are analysed throughout 2020-2023 followed by a deep dive into the states of Washington and California. Finally, the relationship between the population is analyzed to create a prediction model.

Requirements

The following libraries are used in this module: tidyverse, zoo, dplyr, ggplot2,

Importing the Data

To keep this analysis reproducible, data is directly imported into the environment from the source repository. Since this dataset covers a lot of details. It needs to go through filtering and conditioning before analysis. In the next few steps the dataset is prepared in a more plot friendly format. Here is a sample of unfiltered data of US cases:

```
url_in <- "https://raw.githubusercontent.com/CSSEGISandData/COVID-19/master/csse_covid_19_data/csse_cov
file_names <- c("time_series_covid19_confirmed_US.csv",</pre>
                 "time_series_covid19_deaths_US.csv")
urls <- str_c(url_in, file_names)</pre>
US_cases <- read_csv(urls[1])</pre>
US_deaths <- read_csv(urls[2])</pre>
head(US_cases,5)
## # A tibble: 5 x 1,154
##
          UID iso2
                     iso3
                            code3
                                  FIPS Admin2
                                                 Province_State Country_Region
                                                                                    Lat
##
```

```
<dbl> <chr> <dbl> <dbl> <chr>
                                                               <chr>>
                                                                               <dbl>
                                                <chr>
## 1 84001001 US
                    USA
                             840
                                  1001 Autauga Alabama
                                                               US
                                                                                32.5
## 2 84001003 US
                                                               US
                    USA
                             840
                                  1003 Baldwin Alabama
                                                                                30.7
## 3 84001005 US
                    USA
                             840
                                  1005 Barbour Alabama
                                                               US
                                                                                31.9
                                                               US
## 4 84001007 US
                    USA
                             840
                                  1007 Bibb
                                                Alabama
                                                                                33.0
## 5 84001009 US
                    USA
                                  1009 Blount
                                                               US
                                                                                34.0
                             840
                                               Alabama
## # i 1,145 more variables: Long_ <dbl>, Combined_Key <chr>, '1/22/20' <dbl>,
       '1/23/20' <dbl>, '1/24/20' <dbl>, '1/25/20' <dbl>, '1/26/20' <dbl>,
## #
       '1/27/20' <dbl>, '1/28/20' <dbl>, '1/29/20' <dbl>, '1/30/20' <dbl>,
## #
```

```
## # '1/31/20' <dbl>, '2/1/20' <dbl>, '2/2/20' <dbl>, '2/3/20' <dbl>,
## # '2/4/20' <dbl>, '2/5/20' <dbl>, '2/6/20' <dbl>, '2/7/20' <dbl>,
## # '2/8/20' <dbl>, '2/9/20' <dbl>, '2/10/20' <dbl>, '2/11/20' <dbl>,
## # '2/12/20' <dbl>, '2/13/20' <dbl>, '2/14/20' <dbl>, '2/15/20' <dbl>, ...
```

As shown above, the raw data is not much plot friendly, thus to get a cleaner data the following steps are done: - Removing unnecessary columns "Lat" and "Long" - Pivoting the date columns - Merging overall cases along with the number of deaths - Removing data for dates with zero cases to keep the focus on the more valuable data Here is a snapshot of the cleaned US cases and death data:

```
##
  # A tibble: 5 x 6
##
     Admin2 Province_State date
                                          cases Population deaths
##
     <chr>
              <chr>>
                                           <dbl>
                                                       <dbl>
                                                              <dbl>
                              <date>
## 1 Autauga Alabama
                              2020-03-24
                                                       55869
                                                                   0
                                               1
## 2 Autauga Alabama
                              2020-03-25
                                               5
                                                       55869
                                                                   0
## 3 Autauga Alabama
                              2020-03-26
                                               6
                                                      55869
                                                                   0
## 4 Autauga Alabama
                              2020-03-27
                                               6
                                                       55869
                                                                   0
## 5 Autauga Alabama
                              2020-03-28
                                               6
                                                       55869
                                                                   0
##
                         Province_State
       Admin2
                                                   date
                                                                         cases
##
    Length: 3468325
                         Length: 3468325
                                                      :2020-01-22
                                                                                    1
                                              Min.
                                                                     Min.
##
    Class : character
                         Class : character
                                              1st Qu.:2020-12-27
                                                                     1st Qu.:
                                                                                  690
##
    Mode :character
                         Mode : character
                                              Median :2021-09-20
                                                                     Median:
                                                                                 2852
##
                                              Mean
                                                      :2021-09-19
                                                                     Mean
                                                                                15502
                                              3rd Qu.:2022-06-15
##
                                                                     3rd Qu.:
                                                                                 9347
                                                                     Max.
##
                                              Max.
                                                      :2023-03-09
                                                                             :3710586
##
      Population
                             deaths
##
    Min.
                    0
                         Min.
                                      0.0
##
    1st Qu.:
                10953
                         1st Qu.:
                                     10.0
                26234
##
    Median:
                         Median :
                                     47.0
##
               104571
                                :
                                    205.4
    Mean
            :
                         Mean
##
    3rd Qu.:
                67997
                         3rd Qu.:
                                    137.0
    Max.
            :10039107
                         Max.
                                 :35545.0
```

Check Data Validity

Looking at the summary for the US_all_clean, it is surprisingly shown that the minimum number of deaths are negative on the US data set. Therefore a filer is applied to remove the invalid chunk of data. Checking the summary as shown below:

```
##
       Admin2
                         Province_State
                                                    date
                                                                          cases
##
    Length: 3420617
                         Length: 3420617
                                              Min.
                                                      :2020-01-22
                                                                     Min.
                                                                                     1
##
    Class : character
                         Class : character
                                              1st Qu.:2020-12-27
                                                                     1st Qu.:
                                                                                   699
##
    Mode :character
                         Mode :character
                                              Median :2021-09-20
                                                                     Median:
                                                                                  2863
##
                                              Mean
                                                      :2021-09-19
                                                                     Mean
                                                                                15563
##
                                              3rd Qu.:2022-06-15
                                                                     3rd Qu.:
                                                                                  9347
##
                                              Max.
                                                      :2023-03-09
                                                                             :3710586
                                                                     Max.
##
      Population
                             deaths
                   86
##
    Min.
                         Min.
                                      0.0
                         1st Qu.:
##
    1st Qu.:
                11663
                                     10.0
                26794
                                     47.0
##
    Median:
                         Median:
##
    Mean
               106029
                         Mean
                                    204.3
            :
##
    3rd Qu.:
                69761
                         3rd Qu.:
                                    138.0
    Max.
            :10039107
                                 :35545.0
##
                         Max.
```

When looking at the number of cases and deaths an important reference is the population on which this data has been retrieved. Thus comparing data without knowing the population is not valid. Fortunately the population data was already included in US deaths.

At this point the data is imported, cleaned, and validated. Therefore it is ready for analysis and modeling.

Analyzing the US cases and Death

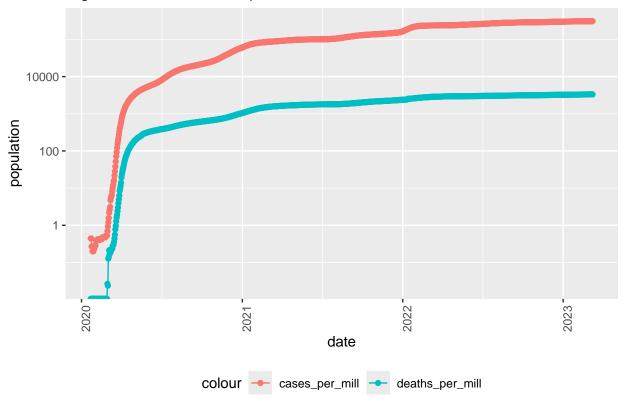
As mentioned before, to have a valid comparison among the number of cases or number of death between different areas, those numbers need to be unified based on the population. This can be done by looking at cases per million population as shown below.

```
US_by_state <- US_all_clean %>%
    group_by(Province_State, date) %>%
    summarize(cases= sum(cases), deaths= sum(deaths), Population= sum(Population)) %>%
    mutate(deaths_per_mill= deaths* 1000000 / Population) %>%
    mutate(cases_per_mill= cases* 1000000 / Population) %>%
    ungroup()
head(US_by_state,5)
## # A tibble: 5 x 7
##
    Province_State date
                                cases deaths Population deaths_per_mill
                                       <dbl>
##
     <chr>>
                    <date>
                                <dbl>
                                                  <dbl>
                                                                   <dbl>
                    2020-03-11
## 1 Alabama
                                    3
                                                 534756
                                                                       0
                                           0
                                                                       0
## 2 Alabama
                    2020-03-12
                                    4
                                           0
                                                 907665
## 3 Alabama
                    2020-03-13
                                    8
                                           0
                                                1647447
                                                                       0
## 4 Alabama
                    2020-03-14
                                   15
                                           0
                                                1647447
                                                                       0
## 5 Alabama
                    2020-03-15
                                   28
                                           0
                                                                       0
                                                2252925
## # i 1 more variable: cases_per_mill <dbl>
US_totals <- US_all_clean %>%
    group_by(date) %>%
    summarize(cases= sum(cases), deaths= sum(deaths), Population= sum(Population)) %>%
    mutate(deaths_per_mill= deaths * 1000000 / Population) %>%
    mutate(cases_per_mill= cases* 1000000 / Population) %>%
    select(date,cases,deaths, cases_per_mill, deaths_per_mill, Population) %>%
    ungroup()
head(US_totals,5)
## # A tibble: 5 x 6
                cases deaths cases_per_mill deaths_per_mill Population
     date
##
     <date>
                <dbl>
                       <dbl>
                                       <dbl>
                                                       <dbl>
                                                                   <dbl>
## 1 2020-01-22
                    1
                           0
                                       0.444
                                                           0
                                                                 2252782
## 2 2020-01-23
                    1
                           0
                                       0.444
                                                            0
                                                                 2252782
## 3 2020-01-24
                    2
                           0
                                       0.270
                                                            0
                                                                 7403015
## 4 2020-01-25
                    2
                           0
                                       0.270
                                                           0
                                                                 7403015
## 5 2020-01-26
                                       0.199
                                                                25103228
US totals %>%
    filter(cases_per_mill > 0) %>%
    ggplot(aes(x = date, y= cases per mill)) +
```

geom_line(aes(color= "cases_per_mill")) +

```
geom_point(aes(color= "cases_per_mill")) +
geom_line(aes(y= deaths_per_mill, color= "deaths_per_mill")) +
geom_point(aes(y= deaths_per_mill, color= "deaths_per_mill")) +
scale_y_log10() +
theme(legend.position = "bottom", axis.text.x = element_text(angle = 90)) +
labs(title = "Figure 1 - COVID19 Reporded Cases and Deaths in US", y= "population")
```

Figure 1 - COVID19 Reporded Cases and Deaths in US



As shown in figure 1, the total number of cases and deaths in US can simply be viewed over the tears. The main observation here is the big spike of the the growing number of cases during 2020 which plateaus by end of 2022. This could indicate the some measures that were implemented in US have been successful in controlling the increasing spread.

Looking more closely into the state of Washington and California:

```
wa_cases <- US_by_state %>%
    filter(Province_State == "Washington")
ca_cases <- US_by_state %>%
    filter(Province_State == "California")
wa_ca <- wa_cases %>%
    left_join(ca_cases,by=c("date"))%>%
    rename(WA_deaths_per_mill = `deaths_per_mill.x`, WA_cases_per_mill = `cases_per_mill.x`)%>%
    rename(CA_deaths_per_mill = `deaths_per_mill.y`, CA_cases_per_mill = `cases_per_mill.y`)
wa_ca

## # A tibble: 1,143 x 13
## Province_State.x date cases.x deaths.x Population.x WA_deaths_per_mill
```

```
<chr>
                                   <dbl>
                                            <dbl>
                                                         <dbl>
                                                                            <dbl>
##
                       <date>
## 1 Washington
                       2020-01-22
                                       1
                                                0
                                                       2252782
                                                                                0
## 2 Washington
                                       1
                                                0
                                                       2252782
                                                                                0
                      2020-01-23
## 3 Washington
                      2020-01-24
                                       1
                                                0
                                                       2252782
                                                                                0
## 4 Washington
                       2020-01-25
                                       1
                                                0
                                                       2252782
                                                                                0
## 5 Washington
                      2020-01-26
                                       1
                                                0
                                                       2252782
                                                                                0
## 6 Washington
                      2020-01-27
                                       1
                                                0
                                                       2252782
                                                                                0
## 7 Washington
                      2020-01-28
                                       1
                                                0
                                                       2252782
                                                                                0
## 8 Washington
                       2020-01-29
                                       1
                                                0
                                                       2252782
                                                                                0
## 9 Washington
                       2020-01-30
                                       1
                                                0
                                                       2252782
                                                                                0
## 10 Washington
                       2020-01-31
                                       1
                                                0
                                                       2252782
                                                                                0
## # i 1,133 more rows
## # i 7 more variables: WA_cases_per_mill <dbl>, Province_State.y <chr>,
       cases.y <dbl>, deaths.y <dbl>, Population.y <dbl>,
## #
      CA_deaths_per_mill <dbl>, CA_cases_per_mill <dbl>
```

```
wa_ca %>%
    ggplot(aes(x = date, y= WA_cases_per_mill)) +
    geom_line(aes(color= "WA_cases_per_mill")) +
    geom_point(aes(color= "WA_cases_per_mill")) +
    geom_line(aes(y= WA_deaths_per_mill, color= "WA_deaths_per_mill")) +
    geom_point(aes(y= WA_deaths_per_mill, color= "WA_deaths_per_mill")) +
    geom_line(aes(y= CA_cases_per_mill, color= "CA_cases_per_mill")) +
    geom_point(aes(y= CA_cases_per_mill, color= "CA_deaths_per_mill")) +
    geom_line(aes(y= CA_deaths_per_mill, color= "CA_deaths_per_mill")) +
    geom_point(aes(y= CA_deaths_per_mill, color= "CA_deaths_per_mill")) +
    scale_y_log10() +
    theme(legend.position = "bottom", axis.text.x = element_text(angle = 90)) +
    labs(title = "Figure 2 - COVID19 Reporded Cases and Deaths in WA and CA", y= "population")
```

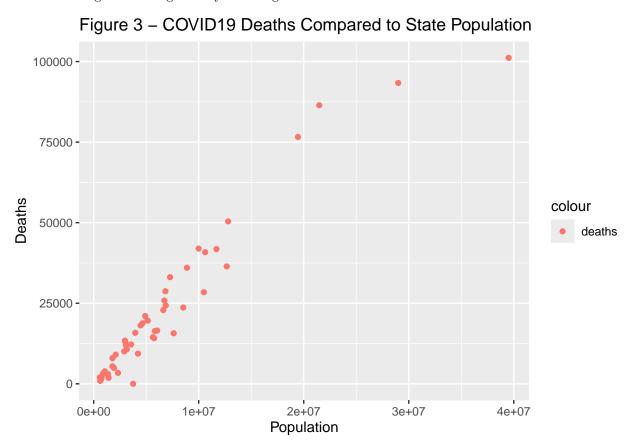
10000 - 100

Figure 2 - COVID19 Reporded Cases and Deaths in WA and CA

Figure 2 compares the number of cases and deaths in states of California and Washington. It can be shown that both states are following a similar trend similar to the overall US cases. However, it can be pointed that Washington had a more gradual increase. This can be later studied based on the different measured deployed in each state.

Modeling the relationship between the total death and the population of states

First visualizing the existing data by summing all the death for each state



As shown in figure 3, there is a linear relation between the population of each state and the total number of deaths. Thus a linear model is created to predict the number of deaths based on any population.

```
mod <- lm(deaths ~ Population, data = state_max)
summary(mod)</pre>
```

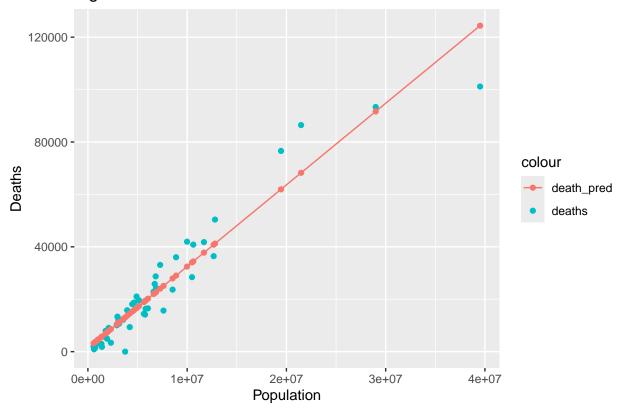
```
##
## lm(formula = deaths ~ Population, data = state_max)
##
## Residuals:
##
       Min
                       Median
                                    3Q
                                            Max
                  1Q
                                        18213.9
##
  -23227.3 -2754.7
                       -638.4
                                2759.5
##
## Coefficients:
##
                Estimate Std. Error t value Pr(>|t|)
  (Intercept) 1.374e+03
                         1.191e+03
                                      1.153
                                               0.254
                                     25.203
## Population 3.113e-03 1.235e-04
                                              <2e-16 ***
##
## Signif. codes: 0 '*** 0.001 '** 0.01 '* 0.05 '.' 0.1 ' 1
## Residual standard error: 6445 on 50 degrees of freedom
```

```
## Multiple R-squared: 0.927, Adjusted R-squared: 0.9256
## F-statistic: 635.2 on 1 and 50 DF, p-value: < 2.2e-16
state_max <- state_max %>% mutate(death_pred = predict(mod))
head(state_max,5)
## # A tibble: 5 x 5
    Province_State
##
                      cases deaths Population death_pred
##
     <chr>
                      <dbl> <dbl>
                                         <dbl>
                                                   <dbl>
## 1 Alabama
                    1644533 21032
                                      4903185
                                                   16639.
## 2 Alaska
                     307649
                              1486
                                       728809
                                                   3643.
## 3 Arizona
                    2443514 33102
                                      7278717
                                                   24035.
## 4 Arkansas
                     973278 13020
                                      3017804
                                                   10769.
## 5 California
                                     39512223
                                                  124386.
                   12125315 101159
state max %>%
    ggplot(aes(x = Population, y= deaths)) +
    geom_point(aes(color= "deaths")) +
   geom_point(aes(y= death_pred, color= "death_pred")) +
```

Figure 4 – COVID19 Death Prediction Model

labs(title = "Figure 4 - COVID19 Death Prediction Model", y= "Deaths")

geom_line(aes(y= death_pred, color= "death_pred")) +



Conclusion

By looking through the overall cases across US, figure 1 illustrated the general trend of number of cases followed by number of deaths. Further, by looking into the states of California and Washington a similar behavior was observed but in addition to the main trend, each state seems to have handled the Covid-19 experience differently at the start. Since Washington had a more gradual increase in both number of cases and deaths, the root cause can be studied as a potential successful measure for preventing such a disease in future. Finally, figure 4 has shown a prediction model for number of deaths based on the population. This model could be used to estimate any other population based on the prediction line.