Lets Talk About COVID

Introduction

Four best friends hanging out in a living room. Three boxes of pizza, freshly delivered from Papa Johns. Two heated debates on who gets to play the infamous Mario. And 1 Nintendo Switch loaded with one of our favorite games: Mario Party. We hit our die and finish our first minigame (I won of course). All of the sudden, our cellphones begin to ring. Texts, news articles, and app feeds drown our phones with something we never heard before: COVID. Once we realized it wasn't insomnia alerting us about our cookies, we put down our phones and continued playing until one of us (sadly not me) became victorious. At that time, none of us knew it; that would be our last time together for months.

COVID interrupted most of our lives for the past year and a half. Schools, jobs, family events, and even concerts shifted to an online presence. Governments worked frantically to develop the best policies. Scientists worked day and night to find a cure. And for some reason, toilet paper became a luxury item in the United States. Regardless, COVID has changed lives on the global scale. Throughout this data, we will review how COVID is trending and where we should focus so we can go back to a 'normal' life.

Packages

First, we will need the **tidverse** and **lubridate** packages to carry out our analysis.

```
library(tidyverse)
                                                  ----- tidyverse 1.3.0 --
## -- Attaching packages -----
## v ggplot2 3.3.3
                     v purrr
                               0.3.4
## v tibble 3.1.0
                     v dplyr
                               1.0.5
## v tidyr
                     v stringr 1.4.0
## v readr
            1.4.0
                     v forcats 0.5.1
## -- Conflicts ----- tidyverse conflicts() --
## x dplyr::filter() masks stats::filter()
## x dplyr::lag()
                   masks stats::lag()
library(lubridate)
## Attaching package: 'lubridate'
## The following objects are masked from 'package:base':
##
##
      date, intersect, setdiff, union
```

Data

We will be using four csv files from the The New York Times Company* Github. The New York Times Company is an American mass media company that produces a daily newspaper (*The New York Times*), located in New York City. This newspaper circulates both domestically and internationally. The goal of the company is to deliver as much unbiased news information as possible. Using their data, we will load the following datasets:

- time series covid19 confirmed global.csv
 - Total amount of Covid Cases globally
- time_series_covid19_deaths_global.csv
 - Total amount of COVID-related deaths
- time_series_covid19_confirmed_US.csv
 - Total amount of COVID cases in the U.S.
- time series covid19 deaths US.csv
 - Total amount of COVID-related deaths in the U.S.

These datasets contains the number of daily cases from January 22, 2020 until current date (In this case August 10, 2021).

Data Cleaning

us_cases <- read_csv(urls[3])
us_deaths <- read_csv(urls[4])</pre>

Lets take a quick look at the global_cases and global_deaths datasets.

```
global_cases
```

```
## # A tibble: 279 x 573
##
      'Province/State'
                        'Country/Region'
                                                  Long '1/22/20' '1/23/20' '1/24/20'
                                           Lat
##
      <chr>
                        <chr>
                                          <dbl>
                                                 <dbl>
                                                           <dbl>
                                                                     <dbl>
                                                                                <dbl>
##
  1 <NA>
                        Afghanistan
                                           33.9 67.7
                                                               0
                                                                         0
                                                                                    0
## 2 <NA>
                        Albania
                                          41.2 20.2
                                                               0
                                                                         0
                                                                                    0
## 3 <NA>
                                          28.0
                                                               0
                                                                                    0
                        Algeria
                                                  1.66
                                                                         0
## 4 <NA>
                        Andorra
                                          42.5
                                                  1.52
                                                               0
                                                                         0
                                                                                    0
                                                               0
                                                                         0
                                                                                    0
## 5 <NA>
                        Angola
                                          -11.2 17.9
## 6 <NA>
                                                               0
                                                                         0
                                                                                    0
                        Antigua and Bar~ 17.1 -61.8
## 7 <NA>
                        Argentina
                                          -38.4 -63.6
                                                               0
                                                                         0
                                                                                    0
                                                               0
                                                                         0
                                                                                    0
## 8 <NA>
                        Armenia
                                          40.1 45.0
  9 Australian Capit~ Australia
                                          -35.5 149.
                                                                         0
                                                                                    0
                                                               0
## 10 New South Wales
                        Australia
                                          -33.9 151.
## # ... with 269 more rows, and 566 more variables: 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>,
## #
       2/16/20 <dbl>, 2/17/20 <dbl>, 2/18/20 <dbl>, 2/19/20 <dbl>, 2/20/20 <dbl>,
## #
       2/21/20 <dbl>, 2/22/20 <dbl>, 2/23/20 <dbl>, 2/24/20 <dbl>, 2/25/20 <dbl>,
       2/26/20 <dbl>, 2/27/20 <dbl>, 2/28/20 <dbl>, 2/29/20 <dbl>, 3/1/20 <dbl>,
## #
## #
       3/2/20 <dbl>, 3/3/20 <dbl>, 3/4/20 <dbl>, 3/5/20 <dbl>, 3/6/20 <dbl>,
       3/7/20 <dbl>, 3/8/20 <dbl>, 3/9/20 <dbl>, 3/10/20 <dbl>, 3/11/20 <dbl>,
## #
       3/12/20 <dbl>, 3/13/20 <dbl>, 3/14/20 <dbl>, 3/15/20 <dbl>, 3/16/20 <dbl>,
       3/17/20 <dbl>, 3/18/20 <dbl>, 3/19/20 <dbl>, 3/20/20 <dbl>, 3/21/20 <dbl>,
## #
## #
       3/22/20 <dbl>, 3/23/20 <dbl>, 3/24/20 <dbl>, 3/25/20 <dbl>, 3/26/20 <dbl>,
## #
       3/27/20 <dbl>, 3/28/20 <dbl>, 3/29/20 <dbl>, 3/30/20 <dbl>, 3/31/20 <dbl>,
       4/1/20 <dbl>, 4/2/20 <dbl>, 4/3/20 <dbl>, 4/4/20 <dbl>, 4/5/20 <dbl>,
       4/6/20 <dbl>, 4/7/20 <dbl>, 4/8/20 <dbl>, 4/9/20 <dbl>, 4/10/20 <dbl>,
## #
## #
       4/11/20 <dbl>, 4/12/20 <dbl>, 4/13/20 <dbl>, 4/14/20 <dbl>, 4/15/20 <dbl>,
## #
       4/16/20 <dbl>, 4/17/20 <dbl>, 4/18/20 <dbl>, 4/19/20 <dbl>, 4/20/20 <dbl>,
## #
       4/21/20 <dbl>, 4/22/20 <dbl>, 4/23/20 <dbl>, 4/24/20 <dbl>, 4/25/20 <dbl>,
## #
       4/26/20 <dbl>, 4/27/20 <dbl>, 4/28/20 <dbl>, 4/29/20 <dbl>, 4/30/20 <dbl>,
       5/1/20 <dbl>, 5/2/20 <dbl>, 5/3/20 <dbl>, ...
## #
```

global_deaths

```
## # A tibble: 279 x 573
                                                  Long '1/22/20' '1/23/20' '1/24/20'
##
      'Province/State'
                         'Country/Region'
                                            Lat
##
      <chr>
                         <chr>
                                          <dbl>
                                                 <dbl>
                                                            <dbl>
                                                                      <dbl>
                                                                                 <dbl>
##
                         Afghanistan
                                                 67.7
   1 <NA>
                                           33.9
                                                                0
                                                                          0
                                                                                     0
##
    2 <NA>
                        Albania
                                           41.2
                                                 20.2
                                                                0
                                                                          0
                                                                                     0
##
                                                                                     0
    3 <NA>
                        Algeria
                                           28.0
                                                  1.66
                                                                0
                                                                          0
##
    4 <NA>
                        Andorra
                                           42.5
                                                  1.52
                                                                0
                                                                          0
                                                                                    0
##
    5 <NA>
                        Angola
                                          -11.2
                                                 17.9
                                                                0
                                                                          0
                                                                                     0
##
    6 <NA>
                        Antigua and Bar~
                                          17.1 -61.8
                                                                0
                                                                          0
                                                                                    0
##
                                                                0
                                                                          0
                                                                                     0
   7 <NA>
                        Argentina
                                          -38.4 -63.6
##
   8 <NA>
                        Armenia
                                           40.1 45.0
                                                                0
                                                                          0
                                                                                    0
##
    9 Australian Capit~ Australia
                                          -35.5 149.
                                                                0
                                                                          0
                                                                                     0
## 10 New South Wales
                                          -33.9 151.
                        Australia
                                                                0
                                                                                     0
    ... with 269 more rows, and 566 more variables: 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>,
## #
       2/16/20 <dbl>, 2/17/20 <dbl>, 2/18/20 <dbl>, 2/19/20 <dbl>, 2/20/20 <dbl>,
       2/21/20 <dbl>, 2/22/20 <dbl>, 2/23/20 <dbl>, 2/24/20 <dbl>, 2/25/20 <dbl>,
## #
## #
       2/26/20 <dbl>, 2/27/20 <dbl>, 2/28/20 <dbl>, 2/29/20 <dbl>, 3/1/20 <dbl>,
## #
       3/2/20 <dbl>, 3/3/20 <dbl>, 3/4/20 <dbl>, 3/5/20 <dbl>, 3/6/20 <dbl>,
       3/7/20 <dbl>, 3/8/20 <dbl>, 3/9/20 <dbl>, 3/10/20 <dbl>, 3/11/20 <dbl>,
## #
## #
       3/12/20 <dbl>, 3/13/20 <dbl>, 3/14/20 <dbl>, 3/15/20 <dbl>, 3/16/20 <dbl>,
       3/17/20 <dbl>, 3/18/20 <dbl>, 3/19/20 <dbl>, 3/20/20 <dbl>, 3/21/20 <dbl>,
## #
## #
       3/22/20 <dbl>, 3/23/20 <dbl>, 3/24/20 <dbl>, 3/25/20 <dbl>, 3/26/20 <dbl>,
## #
       3/27/20 <dbl>, 3/28/20 <dbl>, 3/29/20 <dbl>, 3/30/20 <dbl>, 3/31/20 <dbl>,
## #
       4/1/20 <dbl>, 4/2/20 <dbl>, 4/3/20 <dbl>, 4/4/20 <dbl>, 4/5/20 <dbl>,
## #
       4/6/20 <dbl>, 4/7/20 <dbl>, 4/8/20 <dbl>, 4/9/20 <dbl>, 4/10/20 <dbl>,
       4/11/20 <dbl>, 4/12/20 <dbl>, 4/13/20 <dbl>, 4/14/20 <dbl>, 4/15/20 <dbl>,
## #
       4/16/20 <dbl>, 4/17/20 <dbl>, 4/18/20 <dbl>, 4/19/20 <dbl>, 4/20/20 <dbl>,
## #
## #
       4/21/20 <dbl>, 4/22/20 <dbl>, 4/23/20 <dbl>, 4/24/20 <dbl>, 4/25/20 <dbl>,
       4/26/20 <dbl>, 4/27/20 <dbl>, 4/28/20 <dbl>, 4/29/20 <dbl>, 4/30/20 <dbl>,
       5/1/20 <dbl>, 5/2/20 <dbl>, 5/3/20 <dbl>, ...
## #
```

Looking at the datasets, we need to do some cleaning. First, we will put each date in one column called 'date'. This way, each date per country will represent an observation. Also, we do not need the Latitude and Longitude for our analysis, so we will drop them.

Next, we need to combine global_deaths and global_cases so the cases and deaths are in one dataset. Also, we see our date is currently a character data type. We will need to use the *lubridate* package to convert the date column to a date object.

Joining, by = c("Province/State", "Country/Region", "date")

summary(global)

```
##
   Province_State
                        Country_Region
                                                 date
                                                                      cases
   Length: 158751
                        Length: 158751
                                           Min.
                                                   :2020-01-22
                                                                 Min.
   Class : character
                        Class :character
                                           1st Qu.:2020-06-12
                                                                               121
##
                                                                 1st Qu.:
   Mode :character
                       Mode :character
                                           Median :2020-11-01
##
                                                                 Median:
                                                                              1924
##
                                           Mean
                                                   :2020-11-01
                                                                 Mean
                                                                            253230
##
                                            3rd Qu.:2021-03-23
                                                                  3rd Qu.:
                                                                             42662
                                                   :2021-08-12
##
                                           Max.
                                                                 Max.
                                                                         :36306724
##
        deaths
##
                 0
   Min.
          :
   1st Qu.:
                 1
##
   Median:
                29
   Mean
##
             5962
##
    3rd Qu.:
               736
##
    Max.
           :619093
```

Looking at the data, we can see the cases are heavily, positively skewed; the could mean there are a lot of rows with 0. So, we want to filter those out. After the filter, our minimum case is 1. Now lets view the see if the maximum number of cases listed is an outlier.

```
global <- global %>% filter(cases > 0)
summary(global)
```

```
Province_State
                         Country_Region
                                                    date
                                                                          cases
##
    Length: 142753
                         Length: 142753
                                              Min.
                                                      :2020-01-22
                                                                     Min.
                                                                                      1
    Class : character
                                                                     1st Qu.:
##
                         Class : character
                                              1st Qu.:2020-07-13
                                                                                    323
                                                                                   3636
##
    Mode :character
                                :character
                                              Median :2020-11-25
                                                                     Median:
                         Mode
##
                                              Mean
                                                      :2020-11-22
                                                                     Mean
                                                                                281609
                                              3rd Qu.:2021-04-05
##
                                                                     3rd Qu.:
                                                                                  61204
##
                                              Max.
                                                      :2021-08-12
                                                                     Max.
                                                                             :36306724
##
        deaths
##
    Min.
                  0
##
    1st Qu.:
                  3
##
    Median :
                 58
               6630
##
    Mean
##
    3rd Qu.:
               1027
##
    Max.
            :619093
```

As we can see, there are multiple cases close to 36055002. So, we don't have to worry about this data point being an outlier.

global %>% filter(cases > 35000000)

```
# A tibble: 12 x 5
##
##
      Province_State Country_Region date
                                                     cases deaths
##
      <chr>
                      <chr>>
                                      <date>
                                                     <dbl>
                                                             <dbl>
##
    1 <NA>
                      US
                                      2021-08-01 35003417 613292
    2 <NA>
##
                      US
                                      2021-08-02 35131393 613743
##
    3 <NA>
                      US
                                      2021-08-03 35237950 614321
##
    4 <NA>
                      US
                                      2021-08-04 35330664 614811
                                      2021-08-05 35440488 615346
##
    5 <NA>
                      US
##
    6 <NA>
                      US
                                      2021-08-06 35695469 616493
##
    7
      <NA>
                      US
                                      2021-08-07 35739551 616718
##
    8 <NA>
                      US
                                      2021-08-08 35763785 616829
##
    9 <NA>
                      US
                                      2021-08-09 35948131 617321
## 10 <NA>
                      US
                                      2021-08-10 36055002 618137
## 11 <NA>
                                      2021-08-11 36190179 618479
                      US
## 12 <NA>
                      US
                                      2021-08-12 36306724 619093
```

Now we want to take a look at the US cases. When looking at the dataset we can see some weird codes and data types. We need to pivot the dates, while keeping Admin2, Province/State, Country/Region and Lat/Long. We also need to convert *date* to a date object. We can do the same for us_deaths as it follows a similar format as us_cases.

us_cases

```
## # A tibble: 3,342 x 580
##
                                                    Province_State Country_Region
            UID iso2
                      iso3
                             code3
                                    FIPS Admin2
                                                                                       Lat
##
          <dbl> <chr>
                      <chr>>
                             <dbl>
                                   <dbl> <chr>
                                                    <chr>>
                                                                     <chr>
                                                                                     <dbl>
    1 84001001 US
                                                                     US
                                                                                      32.5
##
                       USA
                               840
                                     1001 Autauga
                                                    Alabama
##
    2 84001003 US
                       USA
                               840
                                     1003 Baldwin
                                                    Alabama
                                                                    US
                                                                                      30.7
##
    3 84001005 US
                       USA
                               840
                                     1005 Barbour
                                                    Alabama
                                                                    US
                                                                                      31.9
    4 84001007 US
                       USA
                               840
                                     1007 Bibb
                                                    Alabama
                                                                                      33.0
##
                                                                     US
##
    5 84001009 US
                       USA
                               840
                                     1009 Blount
                                                    Alabama
                                                                    US
                                                                                      34.0
##
    6 84001011 US
                       USA
                               840
                                     1011 Bullock
                                                    Alabama
                                                                                      32.1
                                                                     US
##
    7 84001013 US
                       USA
                               840
                                     1013 Butler
                                                    Alabama
                                                                    US
                                                                                      31.8
    8 84001015 US
                                     1015 Calhoun
                                                                                      33.8
                       USA
                               840
                                                   Alabama
                                                                    US
                                     1017 Chambers Alabama
##
    9 84001017 US
                      USA
                               840
                                                                    US
                                                                                      32.9
```

```
## 10 84001019 US
                     USA
                             840 1019 Cherokee Alabama
                                                                                34.2
## # ... with 3,332 more rows, and 571 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>, 2/16/20 <dbl>, 2/17/20 <dbl>, 2/18/20 <dbl>,
## #
## #
       2/19/20 <dbl>, 2/20/20 <dbl>, 2/21/20 <dbl>, 2/22/20 <dbl>, 2/23/20 <dbl>,
## #
       2/24/20 <dbl>, 2/25/20 <dbl>, 2/26/20 <dbl>, 2/27/20 <dbl>, 2/28/20 <dbl>,
       2/29/20 <dbl>, 3/1/20 <dbl>, 3/2/20 <dbl>, 3/3/20 <dbl>, 3/4/20 <dbl>,
       3/5/20 <dbl>, 3/6/20 <dbl>, 3/7/20 <dbl>, 3/8/20 <dbl>, 3/9/20 <dbl>,
## #
## #
       3/10/20 <dbl>, 3/11/20 <dbl>, 3/12/20 <dbl>, 3/13/20 <dbl>, 3/14/20 <dbl>,
## #
       3/15/20 <dbl>, 3/16/20 <dbl>, 3/17/20 <dbl>, 3/18/20 <dbl>, 3/19/20 <dbl>,
## #
       3/20/20 <dbl>, 3/21/20 <dbl>, 3/22/20 <dbl>, 3/23/20 <dbl>, 3/24/20 <dbl>,
## #
       3/25/20 <dbl>, 3/26/20 <dbl>, 3/27/20 <dbl>, 3/28/20 <dbl>, 3/29/20 <dbl>,
## #
       3/30/20 <dbl>, 3/31/20 <dbl>, 4/1/20 <dbl>, 4/2/20 <dbl>, 4/3/20 <dbl>,
## #
       4/4/20 <dbl>, 4/5/20 <dbl>, 4/6/20 <dbl>, 4/7/20 <dbl>, 4/8/20 <dbl>,
## #
       4/9/20 <dbl>, 4/10/20 <dbl>, 4/11/20 <dbl>, 4/12/20 <dbl>, 4/13/20 <dbl>,
## #
       4/14/20 <dbl>, 4/15/20 <dbl>, 4/16/20 <dbl>, 4/17/20 <dbl>, 4/18/20 <dbl>,
## #
       4/19/20 <dbl>, 4/20/20 <dbl>, 4/21/20 <dbl>, 4/22/20 <dbl>, 4/23/20 <dbl>,
       4/24/20 <dbl>, 4/25/20 <dbl>, 4/26/20 <dbl>, 4/27/20 <dbl>, 4/28/20 <dbl>,
## #
us_cases <- us_cases %>%
  pivot_longer(cols = -(UID:Combined_Key),
               names_to = "date",
               values to = "cases") %>%
  select(Admin2:cases) %>%
  mutate(date = mdy(date)) %>%
  select(-c(Lat, Long_))
us deaths <- us deaths %>%
  pivot longer(cols = -(UID:Population),
               names_to = "date",
               values_to = "deaths") %>%
  select(Admin2:deaths) %>%
  mutate(date = mdy(date)) %>%
  select(-c(Lat, Long_))
   We will join the two US datasets.
US <- us_cases %>%
full_join(us_deaths)
## Joining, by = c("Admin2", "Province State", "Country Region", "Combined Key", "date")
US
## # A tibble: 1,901,598 x 8
##
      Admin2 Province_State Country_Region Combined_Key date
                                                                    cases Population
##
      <chr> <chr>
                            <chr>>
                                           <chr>>
                                                         <date>
                                                                    <dbl>
                                                                               <dbl>
## 1 Autau~ Alabama
                                           Autauga, Al~ 2020-01-22
                                                                               55869
                            US
                                                                        0
```

```
2 Autau~ Alabama
                             US
                                            Autauga, Al~ 2020-01-23
                                                                                 55869
## 3 Autau~ Alabama
                             US
                                            Autauga, Al~ 2020-01-24
                                                                         0
                                                                                 55869
## 4 Autau~ Alabama
                             US
                                            Autauga, Al~ 2020-01-25
                                                                         0
                                                                                 55869
                             US
## 5 Autau~ Alabama
                                            Autauga, Al~ 2020-01-26
                                                                         0
                                                                                 55869
   6 Autau~ Alabama
                             US
                                            Autauga, Al~ 2020-01-27
                                                                         0
                                                                                 55869
                             US
                                            Autauga, Al~ 2020-01-28
                                                                         0
##
  7 Autau~ Alabama
                                                                                 55869
## 8 Autau~ Alabama
                             US
                                            Autauga, Al~ 2020-01-29
                                                                         0
                                                                                 55869
## 9 Autau~ Alabama
                             US
                                            Autauga, Al~ 2020-01-30
                                                                         0
                                                                                 55869
## 10 Autau~ Alabama
                             US
                                            Autauga, Al~ 2020-01-31
                                                                          0
                                                                                 55869
## # ... with 1,901,588 more rows, and 1 more variable: deaths \langle dbl \rangle
```

We need to combine the state and country_region variables of the global_dataset to create a key. This will allow some comparative analysis of the different countries. Also, we need to add the population of these countries to the final dataset.

We will use this csv to get the population for the different countries.

```
uid_lookup_url <- paste0("https://raw.githubusercontent.com/CSSEGISandData/",</pre>
"COVID-19/master/csse_covid_19_data/UID_ISO_FIPS_LookUp_Table.csv")
uid <- read csv(uid lookup url) %>%
  select(-c(Lat, Long_, Combined_Key, code3, iso2, iso3, Admin2))
##
## -- Column specification -----
## cols(
##
    UID = col_double(),
     iso2 = col_character(),
##
     iso3 = col_character(),
##
##
     code3 = col_double(),
    FIPS = col_character();
##
##
     Admin2 = col_character(),
    Province_State = col_character(),
##
##
    Country_Region = col_character(),
##
    Lat = col_double(),
##
    Long_ = col_double(),
##
     Combined_Key = col_character(),
##
    Population = col_double()
```

Here we'll add the uid csv to global dataset to add the population as a column.

)

```
## # A tibble: 142,753 x 7
##
      Province_State Country_Region date
                                                cases deaths Population Combined_Key
                                                       <dbl>
##
                     <chr>
                                     <date>
                                                <dbl>
                                                                   <dbl> <chr>
    1 <NA>
##
                     Afghanistan
                                     2020-02-24
                                                            Λ
                                                                38928341 Afghanistan
                                                    1
##
    2 <NA>
                     Afghanistan
                                     2020-02-25
                                                    1
                                                            0
                                                                38928341 Afghanistan
                     Afghanistan
                                                            0
                                                                38928341 Afghanistan
##
   3 <NA>
                                     2020-02-26
                                                    1
                     Afghanistan
                                                                38928341 Afghanistan
##
   4 <NA>
                                     2020-02-27
                                                    1
                                                            0
   5 <NA>
                                                                38928341 Afghanistan
##
                     Afghanistan
                                     2020-02-28
                                                    1
                                                           0
##
    6 <NA>
                     Afghanistan
                                     2020-02-29
                                                    1
                                                           0
                                                                38928341 Afghanistan
                                                           0
##
  7 <NA>
                     Afghanistan
                                     2020-03-01
                                                    1
                                                                38928341 Afghanistan
   8 <NA>
                     Afghanistan
                                     2020-03-02
                                                    1
                                                           0
                                                                38928341 Afghanistan
## 9 <NA>
                     Afghanistan
                                                    2
                                                           0
                                                                38928341 Afghanistan
                                     2020-03-03
## 10 <NA>
                     Afghanistan
                                     2020-03-04
                                                            0
                                                                38928341 Afghanistan
## # ... with 142,743 more rows
```

Visualization and Analysis

First, we'll create a data set that will have the number of cases and deaths by state. Also, we will create the **deaths_per_mil** variable to use for comparative analysis.

```
us_by_state <- US %>%
  group_by(Province_State, Country_Region, date) %>%
  summarize(cases = sum(cases), deaths = sum(deaths),
  Population = sum(Population)) %>%
  mutate(deaths_per_mill = deaths * 1000000 / Population) %>%
  select(Province_State, Country_Region, date, cases, deaths, deaths_per_mill,
  Population) %>%
  ungroup()
```

'summarise()' has grouped output by 'Province_State', 'Country_Region'. You can override using the '

```
us_by_state
## # A tibble: 33,002 x 7
      Province_State Country_Region date
##
                                                  cases deaths deaths_per_mill
                                                         <dbl>
                                                                           <dbl>
##
      <chr>
                      <chr>>
                                                  <dbl>
                                      <date>
    1 Alabama
                      US
                                      2020-01-22
                                                      0
                                                                               0
##
   2 Alabama
                      US
                                                      0
                                                              0
                                                                               0
##
                                      2020-01-23
  3 Alabama
                      US
                                      2020-01-24
                                                      0
                                                              0
                                                                               0
##
  4 Alabama
                      US
                                      2020-01-25
                                                      0
                                                              0
                                                                               0
##
   5 Alabama
                      US
                                      2020-01-26
                                                      0
                                                              0
                                                                               0
   6 Alabama
                                                              0
                                                                               0
##
                      US
                                      2020-01-27
                                                      0
##
   7 Alabama
                      US
                                      2020-01-28
                                                      0
                                                              0
                                                                               0
##
   8 Alabama
                      US
                                      2020-01-29
                                                      0
                                                              0
                                                                               0
##
  9 Alabama
                      US
                                      2020-01-30
                                                      0
                                                              0
                                                                               0
## 10 Alabama
                      US
                                      2020-01-31
                                                      0
                                                                               0
## # ... with 32,992 more rows, and 1 more variable: Population <dbl>
```

Next we can view the total amount of cases and deaths for the US. We can see at the beginning of 2020 the first cases of COVID came to the US.

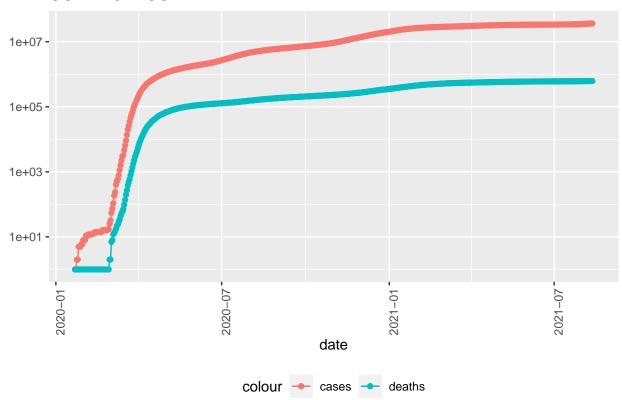
```
us_totals <- us_by_state %>%
group_by(Country_Region, date) %>%
```

'summarise()' has grouped output by 'Country_Region'. You can override using the '.groups' argument.

```
##
      Country Region date
                                cases deaths deaths per mill Population
##
      <chr>
                                <dbl>
                                       <dbl>
                                                        <dbl>
                                                                   <dbl>
                     <date>
                                                      0.00300 332875137
##
   1 US
                     2020-01-22
                                    1
                                           1
##
   2 US
                     2020-01-23
                                    1
                                           1
                                                      0.00300 332875137
##
   3 US
                     2020-01-24
                                    2
                                           1
                                                      0.00300 332875137
##
   4 US
                     2020-01-25
                                    2
                                           1
                                                      0.00300 332875137
##
   5 US
                     2020-01-26
                                    5
                                           1
                                                      0.00300 332875137
##
   6 US
                     2020-01-27
                                    5
                                           1
                                                      0.00300 332875137
##
   7 US
                     2020-01-28
                                    5
                                           1
                                                      0.00300 332875137
##
  8 US
                     2020-01-29
                                    6
                                                      0.00300 332875137
                                           1
## 9 US
                     2020-01-30
                                    6
                                           1
                                                      0.00300 332875137
                                                      0.00300 332875137
## 10 US
                     2020-01-31
                                    8
                                           1
## # ... with 559 more rows
```

Next, lets visualize the total amount of cases and deaths in the United States since the beginning of COVID. We can see the number of cases increases, substantially, from the beginning to end of 2021. Since, there was a slight increase until March; then the amount of cases have been stagnant. During this time the US lifted their restrictions and the cases didn't drastically increase. This could be due to the effects of the vaccine. More people were returning back to normal lives without causing much effect on the population.

COVID19 in US

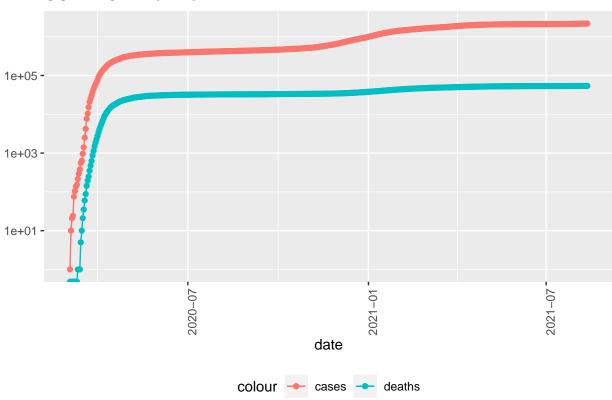


Next, lets look at New York. This will help us get a glimpse of what is happening at the state level. At first glance, it seems that the number of COVID cases have leveled off. Is this true?

Warning: Transformation introduced infinite values in continuous y-axis

Warning: Transformation introduced infinite values in continuous y-axis

COVID19 in New York



Analyzing the Data

As the numbers get larger, the total amount of cases loses its meaning. At first, fifty new COVID cases seemed like a lot. However, once we reached 500,000 cases, it's hard to tell the change on a daily bass. Lets add variables to represent the daily, new amount of cases and deaths.

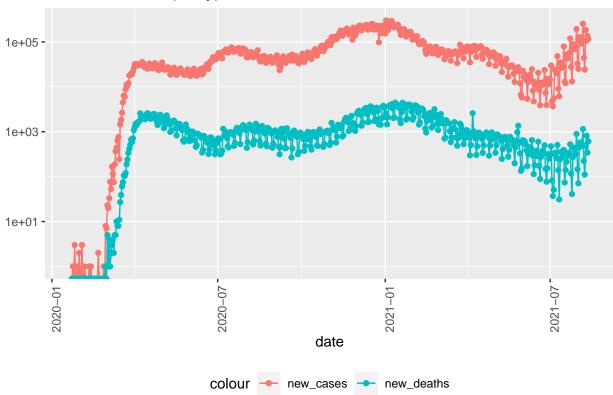
```
## # A tibble: 33,002 x 9
      Province_State Country_Region date
##
                                                   cases deaths deaths_per_mill
                                                          <dbl>
##
      <chr>
                      <chr>
                                       <date>
                                                   <dbl>
                                                                            <dbl>
                      US
##
    1 Alabama
                                       2020-01-22
                                                       0
                                                               0
                                                                                0
##
    2 Alabama
                      US
                                       2020-01-23
                                                       0
                                                               0
                                                                                0
##
    3 Alabama
                      US
                                       2020-01-24
                                                       0
                                                               0
                                                                                0
                      US
                                       2020-01-25
                                                       0
                                                               0
##
    4 Alabama
                                                                                0
##
    5 Alabama
                      US
                                       2020-01-26
                                                       0
    6 Alabama
                      US
                                       2020-01-27
                                                       0
                                                               0
                                                                                0
##
##
    7 Alabama
                      US
                                       2020-01-28
                                                               0
                                                               0
##
    8 Alabama
                      US
                                       2020-01-29
                                                       0
                                                                                0
    9 Alabama
                      US
                                       2020-01-30
                                                       0
                                                               0
                                                                                0
## 10 Alabama
                      US
                                       2020-01-31
                                                       0
                                                               0
                                                                                0
```

```
## # ... with 32,992 more rows, and 3 more variables: Population <dbl>,
## # new_cases <dbl>, new_deaths <dbl>
```

Now, lets visualize the amount of new cases per day. We can see that there was a decrease after March. Again, this is when many American citizens began receiving the COVID vaccine. However, with the new Delta variant, we can see a rise in July 2021. In fact, the amount is close to the highest daily amount since January 2021 - the peak of COVID cases.

```
## Warning: Transformation introduced infinite values in continuous y-axis
## Warning: Transformation introduced infinite values in continuous y-axis
## Warning: Transformation introduced infinite values in continuous y-axis
## Warning: Transformation introduced infinite values in continuous y-axis
## Warning: Removed 1 row(s) containing missing values (geom_path).
## Warning: Removed 1 rows containing missing values (geom_point).
## Warning: Removed 1 rows containing missing values (geom_point).
## Warning: Removed 1 rows containing missing values (geom_point).
```

COVID19 in US (Daily)



Which states are handling COVID the best? Which are handling it the worst? We'll see the 10 states with smallest/largest deaths per thousand. Looking at the first table, we can see the states with the least deaths per thousand. Most of these states are areas that are rural or tourist attractions. Are Hawaii and the Virgin Islands doing better due to the drop in tourist activity? On the other hand, Alaska and Utah are large states with a smaller population; citizens are more spread out and may not come in contact as often.

```
## # A tibble: 10 x 6
##
      deaths_per_thou cases_per_thou Province_State
                                                               deaths
                                                                        cases population
##
                 <dbl>
                                 <dbl> <chr>
                                                                <dbl>
                                                                        <dbl>
                                                                                   <dbl>
##
    1
                0.0363
                                  3.32 Northern Mariana Isl~
                                                                    2
                                                                          183
                                                                                   55144
    2
                0.382
                                 47.5 Virgin Islands
                                                                         5093
                                                                                  107268
##
                                                                   41
                0.386
                                 34.2 Hawaii
                                                                       48397
                                                                                 1415872
##
    3
                                                                  546
                                       Vermont
                0.423
                                 41.5
                                                                                  623989
##
                                                                  264
                                                                        25883
##
    5
                0.544
                                107.
                                       Alaska
                                                                       79485
                                                                                  740995
                                                                  403
                                       Maine
##
    6
                0.672
                                 53.7
                                                                  903
                                                                       72119
                                                                                 1344212
##
    7
                0.694
                                 56.1 Oregon
                                                                 2928 236698
                                                                                 4217737
```

##	8	0.706	41.5	Puerto Rico	2651	155709	3754939
##	9	0.786	138.	Utah	2521	443488	3205958
##	10	0.816	66.2	Washington	6215	504132	7614893

Compared to the states with the lower amounts of deaths per thousands, the states with the higher amount of cases have a larger population. Congested areas may have more occurrences of contact with others; this may cause more cases/deaths. When comparing these states, we need to question how these cases/deaths recorded? Also, we need to consider factors that may cause a difference that isn't recorded. One factor could be health care quality or citizens' access to health care.

```
us_state_totals %>%
slice_max(deaths_per_thou, n=10) %>%
select(deaths_per_thou, cases_per_thou, everything())
```

```
## # A tibble: 10 x 6
                                                                  cases population
##
      deaths_per_thou cases_per_thou Province_State deaths
##
                 <dbl>
                                 <dbl> <chr>
                                                         <dbl>
                                                                  <dbl>
                                                                              <dbl>
##
                  3.00
                                  119. New Jersey
                                                         26672 1055252
                                                                            8882190
    1
##
    2
                  2.77
                                  113. New York
                                                         53828 2192224
                                                                          19453561
##
    3
                  2.63
                                  106. Massachusetts
                                                         18131
                                                                733188
                                                                            6892503
##
    4
                  2.60
                                  126. Mississippi
                                                          7730
                                                                 376124
                                                                            2976149
    5
                  2.59
                                                          2744
##
                                  148. Rhode Island
                                                                 157188
                                                                            1059361
    6
                  2.53
                                  131. Arizona
                                                         18412
                                                                 955767
                                                                            7278717
##
##
    7
                  2.47
                                  131. Louisiana
                                                         11462
                                                                 607228
                                                                            4648794
##
    8
                  2.39
                                  127. Alabama
                                                         11724
                                                                 623919
                                                                            4903185
                  2.33
                                  101. Connecticut
##
    9
                                                          8307
                                                                            3565287
                                                                 361294
                                  143. South Dakota
## 10
                  2.32
                                                          2053
                                                                 126611
                                                                             884659
```

COVID by Political Party

Although COVID has taken another recent surge, the United States political parties are still divided on what actions we should take. Republicans believe the country should operate as normal and the disease will either go away, or become something we adapt to. On the other hand, Democrats believe we should take as much precaution as possible; also, Democrats have a stronger push for national vaccination requirements. Lets take a look and see if the polarizing views affect the political parties differently. First, we'll create vectors consisting of members of the political parties. We're defining each state's political party as who they voted for in the 2020 presidential election. We discovered this from:

https://www.archives.gov/electoral-college/2020. Guam, Puerto Rico, The Virgin Islands nor The Northern Mariana Islands voted in the U.S. election; therefore, we will remove their cases. and not include them in this part of the analysis.

Next, we need to create the 'party' column so we can label each state's political party with how they voted in the 2020 presidential election.

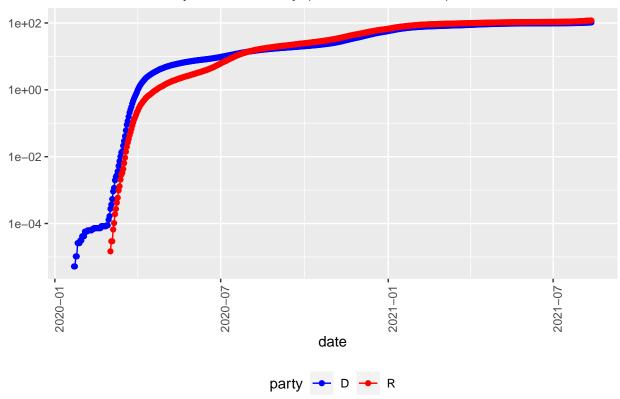
```
us_by_party <- us_by_state %>%
    filter(us_by_state Province_State != "Guam" &
        us_by_state Province_State != "Puerto Rico" &
        us_by_state Province_State != "Virgin Islands" &
        us_by_state Province_State != "Northern Mariana Islands") %>%
    group_by(Province_State) %>%
    mutate(party = ifelse(Province_State %in% republican, 'R', 'D')) %>%
    group_by(party, date) %>%
    summarise(cases = sum(cases),
        deaths = sum(deaths),
        population = sum(Population),
        cases_per_thou = 1000 * cases / population,
        deaths_per_thou = 1000 * deaths / population) %>%
    mutate(new_cases = cases - lag(cases), new_deaths = deaths - lag(deaths))
```

'summarise()' has grouped output by 'party'. You can override using the '.groups' argument.

```
us_by_party
## # A tibble: 1,138 x 9
## # Groups:
               party [2]
                       cases deaths population cases_per_thou deaths_per_thou
##
     party date
##
      <chr> <date>
                       <dbl>
                              <dbl>
                                         <dbl>
                                                         <dbl>
                                                                         <dbl>
##
   1 D
            2020-01-22
                           1
                                  0 192661280
                                                   0.0000519
                                                                             0
##
  2 D
            2020-01-23
                                  0 192661280
                                                   0.00000519
                                                                             0
                                                                             0
##
  3 D
            2020-01-24
                           2
                                  0 192661280
                                                   0.0000104
##
   4 D
            2020-01-25
                           2
                                  0 192661280
                                                   0.0000104
                                                                             0
                                  0 192661280
                                                                             0
## 5 D
            2020-01-26
                           5
                                                   0.0000260
## 6 D
            2020-01-27
                           5
                                  0 192661280
                                                   0.0000260
                                                                             0
## 7 D
                                  0 192661280
                                                   0.0000260
                                                                             0
            2020-01-28
                           5
            2020-01-29
                                  0 192661280
                                                   0.0000311
                                                                             0
## 8 D
                           6
                                                                             0
## 9 D
            2020-01-30
                                  0 192661280
                                                   0.0000311
            2020-01-31
                           8
                                  0 192661280
                                                   0.0000415
                                                                             0
## # ... with 1,128 more rows, and 2 more variables: new_cases <dbl>,
## #
     new_deaths <dbl>
```

First, let's view how COVID surged in each party. We can see the democratic party suffered from COVID a bit earlier than the republican party; however, it seems both became stagnant around January 2021.

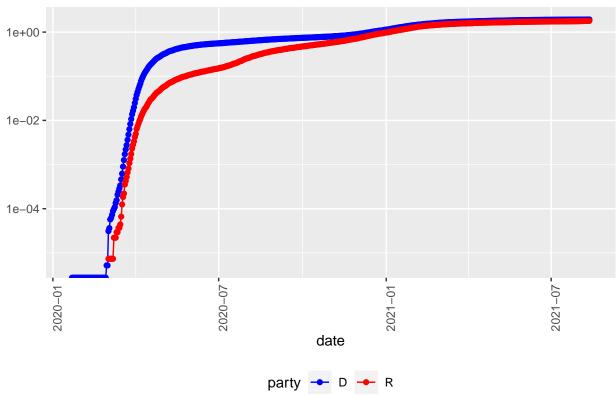




Similar to the number of cases, states in the democratic party suffered from more deaths than the republican party early on; however, the number of cases seemed to even out towards the end.

- ## Warning: Transformation introduced infinite values in continuous y-axis
- ## Warning: Transformation introduced infinite values in continuous y-axis



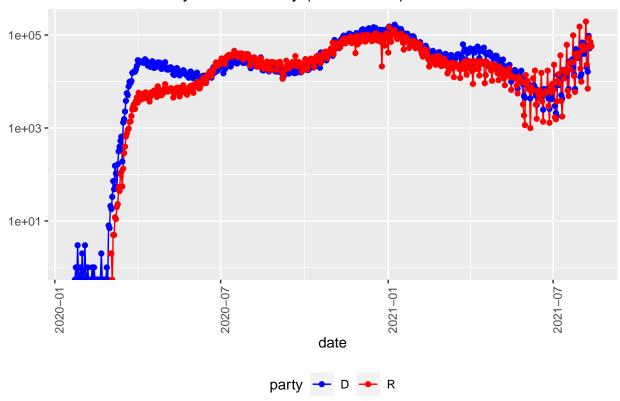


As we know, a look at the overall amount of cases is not a good measurement of how COVID is affecting the country. Next we're looking at the number of new cases each day. As we can see, after July of 2020, the amount of new COVID cases seem to be the same.

```
## Warning: Transformation introduced infinite values in continuous y-axis
```

- ## Warning: Transformation introduced infinite values in continuous y-axis
- ## Warning: Removed 1 row(s) containing missing values (geom_path).
- ## Warning: Removed 1 rows containing missing values (geom_point).

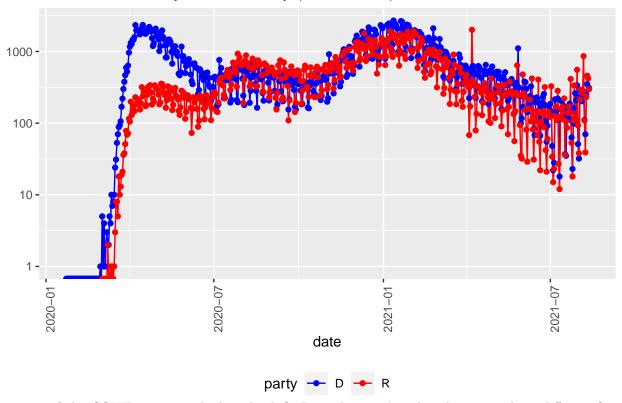
COVID19 in US by Political Party (New Cases)



Similar to the number of new cases, the number of daily new deaths has been identical between political parties (other than between March 2020 - July 2020).

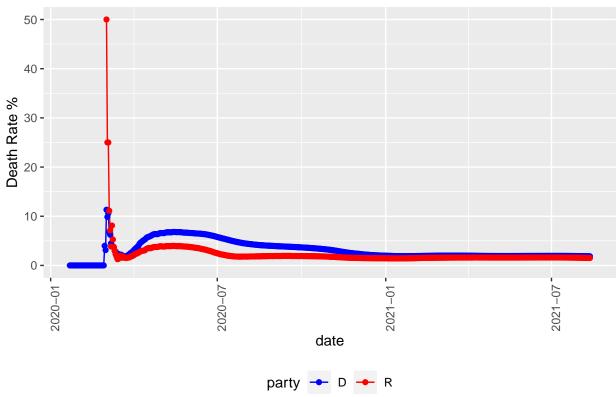
- ## Warning in self\$trans\$transform(x): NaNs produced
- ## Warning: Transformation introduced infinite values in continuous y-axis
- ## Warning in self\$trans\$transform(x): NaNs produced
- ## Warning: Transformation introduced infinite values in continuous y-axis
- ## Warning: Removed 1 row(s) containing missing values (geom_path).
- ## Warning: Removed 2 rows containing missing values (geom_point).

COVID19 in US by Political Party (Death Rate)



How many of the COVID cases resulted in deaths? Does the state's political party make a difference? First, lets create a variable called "Death Rate" which will be the number of deaths divided by the number of cases. As we can see, there seems to be an outlier around March 2020. Let's take a closer look at these cases.





These dates are from the beginning of COVID when there weren't many cases. Let's recreate the plot while ignoring these outliers.

```
us_by_party %>% filter(death_rate > 10 & death_rate != Inf) %>%
  select(c("party", "date", "cases", "deaths", "death_rate"))
## # A tibble: 6 x 5
## # Groups:
               party [2]
                       cases deaths death_rate
##
     party date
     <chr> <date>
##
                       <dbl>
                              <dbl>
                                          <dbl>
           2020-03-02
                                           11.3
## 1 D
                          53
                                  6
## 2 D
           2020-03-04
                         104
                                           10.6
                                 11
                                           50
## 3 R
           2020-03-02
                           2
                                  1
## 4 R
           2020-03-03
                                   1
                                           25
## 5 R
           2020-03-04
                           4
                                   1
                                           25
## 6 R
           2020-03-05
                           9
                                   1
                                           11.1
```

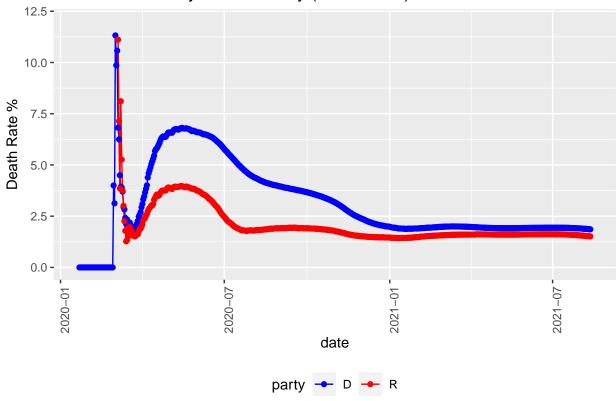
Looking at the graph again, it seems the death rate has become rather consistent. Since there's a large amount of total cases, maybe it would help to define death rate as the number of new_deaths divided by the number of new_cases.

```
us_by_party_rate_plot + ylim(0, 12)

## Warning: Removed 3 row(s) containing missing values (geom_path).

## Warning: Removed 3 rows containing missing values (geom_point).
```

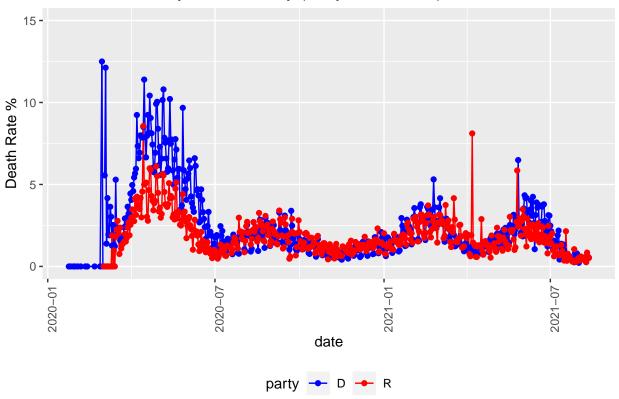
COVID19 in US by Political Party (Death Rate)



Disregarding the three outliers in March of 2020, we can see the death rate of new cases has fluctuated between 0 and 5%, for the most part. In fact, this past month (July 2021) has had a period of lowest death rates since COVID began. Similar to the other cases between COVID data, there isn't much of a difference between political parties. Maybe the United States push for vaccines have helped?

Warning: Removed 3 rows containing missing values (geom_point).

COVID19 in US by Political Party (Daily Death Rate)



Modeling Data

After analyzing the data, we would like to build linear model to help predict the number of cases in the future. In other words, we would like to predict the number of deaths per thousand, given the number of cases. Looking at the model, it is telling us that we can get the number of deaths per thousand if we subtract .018 from .016 * cases per thousand.

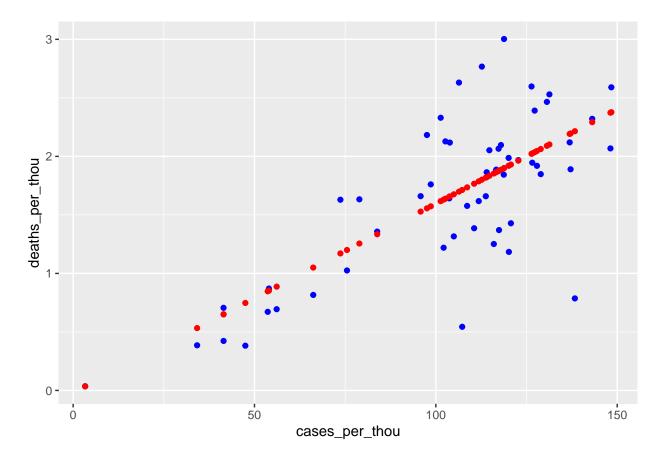
```
mod <- lm(deaths_per_thou ~ cases_per_thou, data = us_state_totals)</pre>
summary(mod)
##
## Call:
## lm(formula = deaths_per_thou ~ cases_per_thou, data = us_state_totals)
##
## Residuals:
##
                  1Q
                       Median
                                    3Q
  -1.42858 -0.22114 0.00205 0.21564
                                        1.10333
##
##
##
  Coefficients:
##
                  Estimate Std. Error t value Pr(>|t|)
                              0.21890
                                      -0.089
                                                  0.93
## (Intercept)
                  -0.01938
  cases_per_thou 0.01615
                              0.00203
                                        7.958 1.31e-10 ***
##
## Signif. codes:
                   0 '*** 0.001 '** 0.01 '* 0.05 '.' 0.1 ' 1
##
## Residual standard error: 0.4701 on 53 degrees of freedom
## Multiple R-squared: 0.5444, Adjusted R-squared: 0.5358
```

```
## F-statistic: 63.33 on 1 and 53 DF, p-value: 1.306e-10
```

Here we can compare the actual predictions of deaths compared to the actual values. We can see, other than Alaska, Connecticut, and the District of Columbia, our predictions are close.

```
## # A tibble: 10 x 4
##
      Province State
                            cases_per_thou deaths_per_thou pred
      <chr>
                                      <dbl>
                                                       <dbl> <dbl>
##
                                                       2.39
                                                              2.04
##
   1 Alabama
                                      127.
    2 Alaska
##
                                      107.
                                                       0.544
                                                              1.71
    3 Arizona
                                                       2.53
                                                              2.10
##
                                      131.
##
    4 Arkansas
                                      137.
                                                       2.12
                                                              2.19
##
   5 California
                                      104.
                                                       1.64
                                                              1.66
                                                              1.63
##
   6 Colorado
                                      102.
                                                       1.22
##
    7 Connecticut
                                      101.
                                                       2.33
                                                              1.62
##
    8 Delaware
                                      117.
                                                       1.89
                                                              1.86
## 9 District of Columbia
                                       73.7
                                                       1.63
                                                              1.17
## 10 Florida
                                      129.
                                                       1.85
                                                              2.06
```

Let's plot these predictions with our real data. We can see our prediction (in red) follows the same trend as the real COVID data (in blue). The model makes an exact prediction for some and it's largely off for some. It would be great to look further to see which factors are causing this issues.



Conclusion

When viewing this data, it is important to consider potential bias. First, using different variables could lead to different results. For example, implementing population density could have made a difference in our predictions. The closer in contact people are with COVID, the more likely they are to develop symptoms. Also, I chose not include the outliers in the Death Rate plots. Removing them helped us view the difference in the smaller data points. If I wouldn't have removed the outliers, the view of the graph would have made it seem as if the death_rates didn't change. Third, I have my own opinions bout COVID; therefore, I made choices to review different factors than others might have. For example, I chose to look at the differences between political parties when I could have viewed the differences between regions; or, I could have studied the data on a global scale.

Overall, it seems COVID is not disappearing any time soon. In fact, it seems that we're having another surge. However, just because we are still having COVID cases, doesn't mean we are experiencing deaths as much as we have in the past. This could be because of government policy, citizen interactions, vaccine development or other potential factors. Although the U.S. political parties have opposing viewpoints, these opinions don't create different experiences with COVID. Regardless, we should keep developing strategies so we can all go back to our normal lives, while being safe. After all, I still haven't gotten my rematch of Mario Party!

```
utils::sessionInfo()
```

```
## R version 4.0.4 (2021-02-15)
## Platform: x86_64-apple-darwin17.0 (64-bit)
## Running under: macOS Big Sur 10.16
##
## Matrix products: default
```

```
/Library/Frameworks/R.framework/Versions/4.0/Resources/lib/libRblas.dylib
## LAPACK: /Library/Frameworks/R.framework/Versions/4.0/Resources/lib/libRlapack.dylib
##
## locale:
## [1] en_US.UTF-8/en_US.UTF-8/en_US.UTF-8/C/en_US.UTF-8/en_US.UTF-8
## attached base packages:
## [1] stats
                 graphics grDevices utils
                                               datasets methods
                                                                    base
##
## other attached packages:
   [1] lubridate_1.7.10 forcats_0.5.1
                                          stringr_1.4.0
                                                            dplyr_1.0.5
   [5] purrr_0.3.4
                         readr_1.4.0
                                          tidyr_1.1.3
                                                            tibble_3.1.0
  [9] ggplot2_3.3.3
                         tidyverse_1.3.0
##
##
## loaded via a namespace (and not attached):
## [1] tidyselect_1.1.0 xfun_0.24
                                            haven_2.3.1
                                                               colorspace_2.0-0
## [5] vctrs_0.3.6
                          generics_0.1.0
                                            htmltools_0.5.1.1 yaml_2.2.1
                                            pillar_1.5.1
## [9] utf8 1.2.1
                          rlang 0.4.10
                                                               glue 1.4.2
## [13] withr_2.4.1
                          DBI_1.1.1
                                            dbplyr_2.1.0
                                                               modelr_0.1.8
## [17] readxl 1.3.1
                          lifecycle_1.0.0
                                            munsell 0.5.0
                                                               gtable_0.3.0
## [21] cellranger_1.1.0 rvest_1.0.0
                                            evaluate_0.14
                                                               labeling_0.4.2
## [25] knitr_1.31
                          curl_4.3
                                            fansi 0.4.2
                                                               highr 0.8
## [29] broom_0.7.5
                          Rcpp_1.0.6
                                            scales_1.1.1
                                                               backports_1.2.1
## [33] jsonlite 1.7.2
                          farver 2.1.0
                                            fs 1.5.0
                                                               hms 1.0.0
## [37] digest_0.6.27
                          stringi_1.5.3
                                                               cli_2.3.1
                                            grid_4.0.4
## [41] tools 4.0.4
                          magrittr_2.0.1
                                            crayon_1.4.1
                                                               pkgconfig_2.0.3
## [45] ellipsis_0.3.1
                          xml2_1.3.2
                                            reprex_1.0.0
                                                               assertthat_0.2.1
## [49] rmarkdown_2.7
                          httr_1.4.2
                                            rstudioapi_0.13
                                                               R6_2.5.0
## [53] compiler_4.0.4
```