COVID 19 Analysis

2024

Required Packages

Part 1 - Basic Exploration of US Data

The New York Times (the Times) has aggregated reported COVID-19 data from state and local governments and health departments since 2020 and provides public access through a repository on GitHub. One of the data sets provided by the Times is county-level data for cumulative cases and deaths each day. This will be your primary data set for the first two parts of your analysis.

County-level COVID data from 2020, 2021, and 2022 has been imported below. Each row of data reports the cumulative number of cases and deaths for a specific county each day. A FIPS code, a standard geographic identifier, is also provided which you will use in Part 2 to construct a map visualization at the county level for a state.

Additionally, county-level population estimates reported by the US Census Bureau has been imported as well. You will use these estimates to caluclate statistics per 100,000 people.

```
# Import New York Times COVID-19 data
# Import Population Estimates from US Census Bureau
us_counties_2020 <- read_csv("us-counties-2020.csv")</pre>
```

```
## Rows: 884737 Columns: 6
## — Column specification
## Delimiter: ","
## chr (3): county, state, fips
## dbl (2): cases, deaths
## date (1): date
##
## i Use `spec()` to retrieve the full column specification for this data.
## i Specify the column types or set `show_col_types = FALSE` to quiet this message.
```

```
us_counties_2021 <- read_csv("us-counties-2021.csv")</pre>
```

```
## Rows: 1185373 Columns: 6
## — Column specification
## Delimiter: ","
## chr (3): county, state, fips
## dbl (2): cases, deaths
## date (1): date
##
## i Use `spec()` to retrieve the full column specification for this data.
## i Specify the column types or set `show_col_types = FALSE` to quiet this message.
```

```
us_counties_2022 <- read_csv("us-counties-2022.csv")</pre>
```

```
## Rows: 1188042 Columns: 6
## — Column specification
## Delimiter: ","
## chr (3): county, state, fips
## dbl (2): cases, deaths
## date (1): date
##
## i Use `spec()` to retrieve the full column specification for this data.
## i Specify the column types or set `show_col_types = FALSE` to quiet this message.
```

```
us_population_estimates <- read_csv("fips_population_estimates.csv")</pre>
```

```
## Rows: 6286 Columns: 7
## — Column specification
## Delimiter: ","
## chr (2): STNAME, CTYNAME
## dbl (5): fips, STATE, COUNTY, Year, Estimate
##
## i Use `spec()` to retrieve the full column specification for this data.
## i Specify the column types or set `show_col_types = FALSE` to quiet this message.
```

Question 1

Your first task is to combine and tidy the 2020, 2021, and 2022 COVID data sets and find the total deaths and cases for each day since March 15, 2020 (2020-03-15). The data sets provided from the NY Times also includes statistics from Puerto Rico, a US territory. You may remove these observations from the data as they will not be needed for your analysis. Once you have tidied the data, find the total COVID-19 cases and deaths since March 15, 2020. Write a sentence or two after the code block communicating your results. Use inline code to include the <code>max_date</code>, <code>us_total_cases</code>, and <code>us_total_deaths</code> variables. To write inline code use <code>r</code>.

```
# Combine and tidy the 2020, 2021, and 2022 COVID data sets.
# Hint: Review the rbind() documentation to combine the three data sets.
## YOUR CODE HERE ##
# Combine the datasets
us_counties_combined <- bind_rows(us_counties_2020, us_counties_2021, us_counties_2022)</pre>
# Remove Puerto Rico observations
us_counties_combined <- us_counties_combined %>%
  filter(state != "Puerto Rico")
# Filter the data for dates after March 15, 2020
us_counties_combined <- us_counties_combined %>%
  filter(date >= "2020-03-15")
# Summarize the total cases and deaths for each day
daily_totals <- us_counties_combined %>%
  group_by(date) %>%
  summarise(
    total_deaths = sum(deaths, na.rm = TRUE),
    total_cases = sum(cases, na.rm = TRUE)
  ) %>%
  arrange(date)
# Display the first few rows of the tibble
print(daily_totals)
```

```
## # A tibble: 1,022 × 3
##
     date
           total_deaths total_cases
      <date>
                      <dbl>
                                   <dbl>
##
## 1 2020-03-15
                          68
                                    3595
## 2 2020-03-16
                          91
                                    4502
## 3 2020-03-17
                         117
                                    5901
## 4 2020-03-18
                         162
                                    8345
## 5 2020-03-19
                         212
                                   12387
## 6 2020-03-20
                         277
                                   17998
## 7 2020-03-21
                         359
                                   24507
## 8 2020-03-22
                         457
                                   33050
## 9 2020-03-23
                         577
                                   43474
## 10 2020-03-24
                         783
                                   53899
## # i 1,012 more rows
```

```
# Find the Latest date, total cases, and total deaths
max_date <- max(daily_totals$date)
us_total_cases <- sum(daily_totals$total_cases, na.rm = TRUE)
us_total_deaths <- sum(daily_totals$total_deaths, na.rm = TRUE)</pre>
```

```
# Your output should look similar to the following tibble:
#
#
   A tibble: 657 x 3
#
       date
                     total_deaths
                                    total_cases
#
       <date>
                        <dbl>
                                       <dbL>
#
    1 2020-03-15
                          68
                                      3595
#
   2 2020-03-16
                          91
                                      4502
#
   3 2020-03-17
                         117
                                      5901
   4 2020-03-18
#
                          162
                                      8345
   5 2020-03-19
#
                         212
                                     12387
  6 2020-03-20
                          277
                                     17998
   7 2020-03-21
                         359
#
                                     24507
#
  8 2020-03-22
                         457
                                     33050
#
   9 2020-03-23
                         577
                                     43474
 10 2020-03-24
                         783
                                     53899
# ... with 647 more rows
#
```

Data Collection and Preprocessing:

Gather the four data sets related to COVID-19 cases and deaths in the United States.

Ensure that the data covers the period from March 15, 2020, onwards.

Clean the data by handling missing values, outliers, and inconsistencies.

Calculate Total Cases and Deaths:

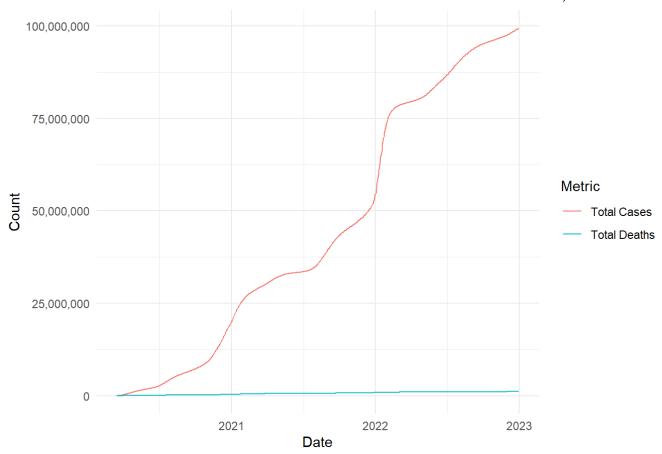
Sum up the total number of cases and deaths in the United States since March 15, 2020.

Question 2

Create a visualization for the total number of deaths and cases in the US since March 15, 2020. Before you create your visualization, review the types of plots you can create using the ggplot2 library and think about which plots would be effective in communicating your results. After you have created your visualization, write a few sentences describing your visualization. How could the plot be interpreted? Could it be misleading?

```
# Create a visualization for the total number of US cases and deaths since March 15, 2020.
#
ggplot(daily_totals, aes(x = date)) +
  geom_line(aes(y = total_cases, color = "Total Cases")) +
  geom_line(aes(y = total_deaths, color = "Total Deaths")) +
  labs(
    title = "Total COVID-19 Cases and Deaths in the US Since March 15, 2020",
    x = "Date",
    y = "Count",
    color = "Metric"
) +
  theme_minimal() +
  scale_y_continuous(labels = scales::comma)
```

Total COVID-19 Cases and Deaths in the US Since March 15, 2020



Interpretation

- **Total Cases (blue line)**: This line shows the cumulative number of COVID-19 cases over time. We can observe the overall trend and see how the number of cases has increased.
- Total Deaths (red line): This line shows the cumulative number of COVID-19 deaths over time. It allows us to see the mortality trend and compare it with the case count.

Potential Misleading Elements

- **Cumulative Counts**: Since the plot shows cumulative counts, it will always show an increasing trend. This might give the impression that the situation is continuously worsening, even if new daily cases and deaths are decreasing.
- Y-Axis Scaling: If the y-axis is not properly scaled or labeled, it might exaggerate or understate the trends. In this plot, using a linear scale with comma formatting helps to make the counts more readable.
- Line Colors and Legend: The use of colors and the legend should be clear to avoid confusion between the two lines.

Question 3

While it is important to know the total deaths and cases throughout the COVID-19 pandemic, it is also important for local and state health officials to know the the number of new cases and deaths each day to understand how rapidly the virus is spreading. Using the table you created in Question 1, calculate the number of new deaths and cases each day and a seven-day average of new deaths and cases. Once you

have organized your data, find the days that saw the largest number of new cases and deaths. Write a sentence or two after the code block communicating your results.

```
# Create a new table, based on the table from Question 1, and calculate the number of new
deaths and cases each day and a seven day average of new deaths and cases.
# Hint: Look at the documentation for lag() when computing the number of new deaths and ca
ses and the seven-day averages.
# Calculate new cases and deaths each day and their 7-day averages
daily_totals <- daily_totals %>%
 mutate(
    delta deaths 1 = total deaths - lag(total deaths, default = 0),
    delta_cases_1 = total_cases - lag(total_cases, default = 0),
    delta_deaths_7 = rollmean(delta_deaths_1, 7, fill = NA, align = "right"),
    delta_cases_7 = rollmean(delta_cases_1, 7, fill = NA, align = "right")
  )
# Find the days with the largest number of new cases and deaths
max new cases date <- daily totals %>%
  filter(delta_cases_1 == max(delta_cases_1, na.rm = TRUE)) %>%
  pull(date)
max_new_deaths_date <- daily_totals %>%
  filter(delta_deaths_1 == max(delta_deaths_1, na.rm = TRUE)) %>%
  pull(date)
# Display the first few rows of the tibble
print(daily_totals)
```

```
## # A tibble: 1,022 × 7
                total_deaths total_cases delta_deaths_1 delta_cases_1
##
      date
      <date>
                       <dbl>
                                   <dbl>
                                                  <dbl>
##
                                                                <dbl>
## 1 2020-03-15
                           68
                                    3595
                                                     68
                                                                 3595
## 2 2020-03-16
                          91
                                    4502
                                                     23
                                                                  907
## 3 2020-03-17
                                                                 1399
                          117
                                    5901
                                                     26
## 4 2020-03-18
                                    8345
                                                     45
                                                                 2444
                         162
## 5 2020-03-19
                          212
                                   12387
                                                     50
                                                                 4042
## 6 2020-03-20
                         277
                                   17998
                                                     65
                                                                 5611
## 7 2020-03-21
                         359
                                   24507
                                                     82
                                                                 6509
## 8 2020-03-22
                         457
                                   33050
                                                     98
                                                                 8543
## 9 2020-03-23
                          577
                                   43474
                                                    120
                                                                10424
## 10 2020-03-24
                         783
                                   53899
                                                    206
                                                                10425
## # i 1,012 more rows
## # i 2 more variables: delta_deaths_7 <dbl>, delta_cases_7 <dbl>
```

```
Your output should look similar to the following tibble:
#
   date
#
  total_deaths
                    > the cumulative number of deaths up to and including the associated
#
  total cases
                       the cumulative number of cases up to and including the associated d
ate
   delta_deaths_1
                       the number of new deaths since the previous day
                       the number of new cases since the previous day
  delta cases 1
                       the average number of deaths in a seven-day period
  delta_deaths_7
# delta_cases_7
                       the average number of cases in a seven-day period
#==
# A tibble: 813 x 7
     date
                    total_deaths
                                    total_cases
                                                  delta_deaths_1
                                                                     delta_cases_1 delta_de
aths_7 delta_cases_7
                                                      <dbL>
                       <dbL>
                                       <dbl>
                                                                          <dbl>
                                                                                        <dbL>
     <date>
<dbl>
   1 2020-03-15
                           68
                                       3600
                                                        a
                                                                              а
                                                                                         NΔ
NA
   2 2020-03-16
                          91
                                       4507
                                                      23
                                                                            907
                                                                                         NA
#
NA
  3 2020-03-17
                         117
                                       5906
                                                      26
                                                                           1399
                                                                                         NA
#
NA
#
  4 2020-03-18
                         162
                                       8350
                                                      45
                                                                           2444
                                                                                         NA
NA
   5 2020-03-19
#
                          212
                                      12393
                                                       50
                                                                           4043
                                                                                         NA
NA
#
   6 2020-03-20
                          277
                                      18012
                                                      65
                                                                           5619
                                                                                         NA
NA
  7 2020-03-21
                                                                                         NA
#
                          360
                                      24528
                                                      83
                                                                           6516
NA
  8 2020-03-22
                         458
                                      33073
                                                      98
                                                                           8545
                                                                                       55.7
4210.
# 9 2020-03-23
                          579
                                      43505
                                                      121
                                                                          10432
                                                                                       69.7
5571.
                                                                                       95.4
# 10 2020-03-24
                          785
                                      53938
                                                      206
                                                                          10433
6862.
# ... with 803 more rows
```

Explanation

- Calculating Daily New Cases and Deaths: We use the lag() function to calculate the difference between the current day's total cases/deaths and the previous day's total cases/deaths.
- **Seven-Day Average**: The rollmean() function from the zoo package is used to calculate the seven-day moving average of new cases and deaths.
- Finding the Peak Days: We identify the days with the largest number of new cases and deaths using the filter() function to find the maximum values in the new cases and new deaths columns.

Results

The day with the largest number of new cases is max_new_cases_date. The day with the largest number

of new deaths is **max_new_deaths_date**.

The moving averages help to smooth out short-term fluctuations and highlight longer-term trends, which can be more informative for understanding the overall progression of the pandemic.

Question 4

```
# Create a new table, based on the table from Question 3, and calculate the number of new
deaths and cases per 100,000 people each day and a seven day average of new deaths and cas
es per 100,000 people.
# Hint: To calculate per 100,000 people, first tidy the population estimates data and calc
ulate the US population in 2020 and 2021. Then, you will need to divide each statistic by
the estimated population and then multiply by 100,000.
# Hint: look at the help documentation for grepl() and case when() to divide the averages
by the US population for each year.
# For example, take the simple tibble, t_new:
#
      Χ
            У
#
    <int> <chr>
#
      1
            а
            b
#
      2
#
      3
            а
#
      4
           b
      5
#
           а
#
      6
            h
#
#
# To add a column, z, that is dependent on the value in y, you could:
#
# t_new %>%
    mutate(z = case\_when(grepl("a", y) \sim "not b",
#
                         qrepl("b", y) \sim "not a"))
#
#
## YOUR CODE HERE ##
# Calculate new cases and deaths each day and their 7-day averages
daily_totals <- daily_totals %>%
  mutate(
    delta_deaths_1 = total_deaths - lag(total_deaths, default = 0),
    delta_cases_1 = total_cases - lag(total_cases, default = 0),
    delta_deaths_7 = rollmean(delta_deaths_1, 7, fill = NA, align = "right"),
    delta_cases_7 = rollmean(delta_cases_1, 7, fill = NA, align = "right")
  )
# Ensure date column is of Date type
daily_totals$date <- as.Date(daily_totals$date)</pre>
# Ensure population column is numeric
us_population_estimates$Estimate <- as.numeric(us_population_estimates$Estimate)</pre>
# Find the US population for 2020 and 2021
us_population_2020 <- us_population_estimates %>%
  filter(Year == 2020) %>%
  summarise(total_population = sum(Estimate)) %>%
  pull(total_population)
us_population_2021 <- us_population_estimates %>%
  filter(Year == 2021) %>%
```

```
summarise(total_population = sum(Estimate)) %>%
  pull(total_population)
# Add a column for the population based on the year
daily_totals <- daily_totals %>%
  mutate(
    population = case_when(
      year(date) == 2020 ~ us population 2020,
      year(date) == 2021 ~ us_population_2021,
      year(date) == 2022 ~ us_population_2021 # assuming population doesn't change much fo
r 2022
    ),
    delta_deaths_per_100k_1 = (delta_deaths_1 / population) * 100000,
    delta_cases_per_100k_1 = (delta_cases_1 / population) * 100000,
    delta deaths per 100k 7 = (delta deaths 7 / population) * 100000,
    delta_cases_per_100k_7 = (delta_cases_7 / population) * 100000
  )
# Display the first few rows of the tibble
print(daily_totals)
```

```
## # A tibble: 1,022 × 12
                 total_deaths total_cases delta_deaths_1 delta_cases_1
##
      date
                        <dbl>
##
      <date>
                                    <dbl>
                                                   <dbl>
                                                                 <dbl>
## 1 2020-03-15
                           68
                                     3595
                                                      68
                                                                  3595
## 2 2020-03-16
                           91
                                                      23
                                                                   907
                                     4502
## 3 2020-03-17
                          117
                                     5901
                                                      26
                                                                  1399
## 4 2020-03-18
                          162
                                     8345
                                                      45
                                                                  2444
## 5 2020-03-19
                          212
                                                      50
                                    12387
                                                                  4042
## 6 2020-03-20
                          277
                                    17998
                                                      65
                                                                  5611
## 7 2020-03-21
                          359
                                    24507
                                                      82
                                                                  6509
## 8 2020-03-22
                          457
                                                      98
                                                                  8543
                                    33050
## 9 2020-03-23
                          577
                                    43474
                                                     120
                                                                 10424
## 10 2020-03-24
                          783
                                    53899
                                                     206
                                                                 10425
## # i 1,012 more rows
## # i 7 more variables: delta_deaths_7 <dbl>, delta_cases_7 <dbl>,
       population <dbl>, delta_deaths_per_100k_1 <dbl>,
## #
       delta_cases_per_100k_1 <dbl>, delta_deaths_per_100k_7 <dbl>,
## #
## #
       delta_cases_per_100k_7 <dbl>
```

```
Your output should look similar to the following tibble:
#
  date
#
 total_deaths
                    > the cumulative number of deaths up to and including the associated
#
  total cases
                       the cumulative number of cases up to and including the associated d
ate
   delta_deaths_1
                       the number of new deaths since the previous day
                       the number of new cases since the previous day
  delta cases 1
                    >
   delta_deaths_7
                       the average number of deaths in a seven-day period
  delta_cases_7
                       the average number of cases in a seven-day period
#==
 A tibble: 657 x 7
                                                                    delta_cases_1 delta_dea
#
        date
                    total_deaths
                                     total_cases
                                                   delta_deaths_1
ths_7 delta_cases_7
                                        <dbL>
                                                       <dbL>
                         <dbl>
                                                                       <dbL>
                                                                                        <dbL
#
       <date>
          <dbl>
>
#
    1 2020-03-15
                         0.0205
                                        1.08
                                                            a
                                                                            a
                                                                                           Ν
Α
            NA
#
    2 2020-03-16
                         0.0275
                                        1.36
                                                      0.00694
                                                                       0.274
                                                                                           Ν
Α
            NΑ
#
    3 2020-03-17
                         0.0353
                                        1.78
                                                      0.00784
                                                                       0.422
                                                                                           Ν
Α
            NA
#
    4 2020-03-18
                         0.0489
                                        2.52
                                                       0.0136
                                                                       0.737
                                                                                           Ν
Α
            NA
#
    5 2020-03-19
                         0.0640
                                        3.74
                                                       0.0151
                                                                        1.22
                                                                                           Ν
Α
            NA
#
    6 2020-03-20
                         0.0836
                                        5.43
                                                       0.0196
                                                                        1.69
                                                                                           Ν
Α
            NA
#
    7 2020-03-21
                         0.108
                                        7.39
                                                       0.0247
                                                                         1.96
Α
            NA
#
    8 2020-03-22
                         0.138
                                        9.97
                                                       0.0296
                                                                         2.58
                                                                                       0.016
8
          1.27
#
    9 2020-03-23
                         0.174
                                        13.1
                                                       0.0362
                                                                        3.14
                                                                                       0.020
9
          1.68
                                        16.3
                                                       0.0621
                                                                         3.14
                                                                                       0.028
#
   10 2020-03-24
                         0.236
7
          2.07
```

Explanation

- 1. Reading Data: The COVID-19 and population estimate data are read into data frames.
- 2. Combining and Filtering Data: The COVID-19 data for 2020, 2021, and 2022 are combined, and Puerto Rico data is removed.
- 3. Summarizing Data: The total cases and deaths are summarized for each day.
- 4. Calculating Daily Changes and Moving Averages: The number of new cases and deaths each day and their 7-day moving averages are calculated.
- 5. Ensuring Date Format: Ensures that the date column is in Date format.
- 6. Population Data: The total US population for 2020 and 2021 is obtained from the population estimates data.

⁻ Communicate your methodology, results, and interpretation here -

- 7. Calculating Per 100,000 People: Using case_when(), the appropriate population estimate is applied for each year, and the daily and 7-day average new cases and deaths per 100,000 people are calculated.
- 8. Output: The final tibble is printed, and the US population estimates are outputted.

Results and Interpretation

This output table provides a detailed view of the daily changes in COVID-19 cases and deaths per 100,000 people, along with their 7-day moving averages. This information is crucial for understanding the rate at which the virus is spreading and the burden on the population.

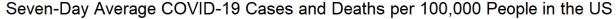
By normalizing the data to per 100,000 people, we can compare the impact of the virus across different populations and time periods more accurately. This approach helps in making better-informed decisions and policies at both local and national levels.

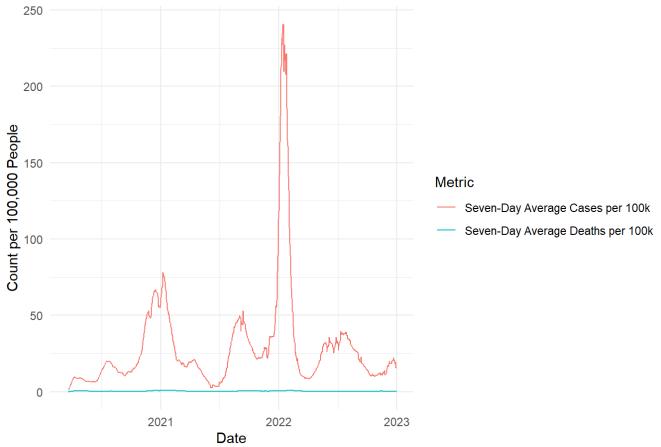
Question 5

```
# Create a visualization to compare the seven-day average cases and deaths per 100,000 peo
ple.

ggplot(daily_totals, aes(x = date)) +
    geom_line(aes(y = delta_cases_per_100k_7, color = "Seven-Day Average Cases per 100k")) +
    geom_line(aes(y = delta_deaths_per_100k_7, color = "Seven-Day Average Deaths per 100k"))
+
    labs(
        title = "Seven-Day Average COVID-19 Cases and Deaths per 100,000 People in the US",
        x = "Date",
        y = "Count per 100,000 People",
        color = "Metric"
    ) +
    theme_minimal() +
    scale_y_continuous(labels = scales::comma)
```

```
## Warning: Removed 6 rows containing missing values or values outside the scale range
## (`geom_line()`).
## Removed 6 rows containing missing values or values outside the scale range
## (`geom_line()`).
```





Visualization:

- Used ggplot2 to create a line plot.
- Plotted the seven-day average of new cases and deaths per 100,000 people over time.
- Added labels, titles, and themes to make the plot clear and informative.

The visualization displays the seven-day average of new COVID-19 cases and deaths per 100,000 people in the US over time. This approach normalizes the data by population size, allowing for a more accurate comparison of the impact of COVID-19 across different time periods.

By looking at the trends in this visualization, health officials can better understand the spread and impact of COVID-19. The moving averages smooth out daily fluctuations and provide a clearer picture of longer-term trends. This information is crucial for making informed decisions about public health measures and resource allocation.