

Final_Part_2

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Statement of Question of Interest:

Which out of the three states: California, Texas, and New York had the overall worst experience with handling covid?

Get the current data

The source we are getting the data from is from the center for Systems Science and Engineering (CSSE) at Johns Hopkins University. The data sources they used are scattered across the country based on county, and state health department. I am deciding to bring in both the US and Global datasets just for referencial purposes.

```
url_in_1 <- "https://raw.githubusercontent.com/CSSEGISandData/COVID-19/master/csse_covid_19_data/csse_covid_19_data"
url_in_2 <- "https://raw.githubusercontent.com/CSSEGISandData/COVID-19/master/csse_covid_19_data/csse_covid_19_data"
url_in_3 <- "https://raw.githubusercontent.com/CSSEGISandData/COVID-19/master/csse_covid_19_data/csse_covid_19_data"
url_in_4 <- "https://raw.githubusercontent.com/CSSEGISandData/COVID-19/master/csse_covid_19_data/csse_covid_19_data"
```

Read in the data set and show summary

```
covid_us_deaths <- read_csv(url_in_1)
```

```
## Parsed with column specification:
## cols(
##   .default = col_double(),
##   iso2 = col_character(),
##   iso3 = col_character(),
##   Admin2 = col_character(),
##   Province_State = col_character(),
##   Country_Region = col_character(),
##   Combined_Key = col_character()
## )
```

```
## See spec(...) for full column specifications.
```

```
covid_global_deaths <- read_csv(url_in_2)
```

```
## Parsed with column specification:
## cols(
##   .default = col_double(),
##   'Province/State' = col_character(),
##   'Country/Region' = col_character()
## )
## See spec(...) for full column specifications.
```

```
covid_us_cases <- read_csv(url_in_3)
```

```
## Parsed with column specification:
## cols(
##   .default = col_double(),
##   iso2 = col_character(),
##   iso3 = col_character(),
##   Admin2 = col_character(),
##   Province_State = col_character(),
##   Country_Region = col_character(),
##   Combined_Key = col_character()
## )
## See spec(...) for full column specifications.
```

```
covid_global_cases <- read_csv(url_in_4)
```

```
## Parsed with column specification:
## cols(
##   .default = col_double(),
##   'Province/State' = col_character(),
##   'Country/Region' = col_character()
## )
## See spec(...) for full column specifications.
```

View the first couple rows of the tables

```
head(covid_us_deaths)
```

```
## # A tibble: 6 x 681
##   UID iso2 iso3 code3 FIPS Admin2 Province_State Country_Region Lat
##   <dbl> <chr> <chr> <dbl> <dbl> <chr> <chr> <chr> <dbl>
## 1 8.40e7 US USA 840 1001 Autau~ Alabama US 32.5
## 2 8.40e7 US USA 840 1003 Baldw~ Alabama US 30.7
## 3 8.40e7 US USA 840 1005 Barbo~ Alabama US 31.9
## 4 8.40e7 US USA 840 1007 Bibb Alabama US 33.0
## 5 8.40e7 US USA 840 1009 Blount Alabama US 34.0
## 6 8.40e7 US USA 840 1011 Bullo~ Alabama US 32.1
## # ... with 672 more variables: Long_ <dbl>, Combined_Key <chr>,
## # Population <dbl>, '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>, ...
```

```
head(covid_global_deaths)
```

```
## # A tibble: 6 x 673
##   'Province/State' 'Country/Region'   Lat   Long '1/22/20' '1/23/20' '1/24/20'
##   <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>             Algeria          28.0   1.66        0        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
## # ... with 666 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>, ...
```

```
head(covid_us_cases)
```

```
## # A tibble: 6 x 680
##   UID iso2 iso3 code3 FIPS Admin2 Province_State Country_Region Lat
##   <dbl> <chr> <chr> <dbl> <dbl> <chr> <chr> <chr> <dbl>
## 1 8.40e7 US USA 840 1001 Autau~ Alabama US 32.5
## 2 8.40e7 US USA 840 1003 Baldw~ Alabama US 30.7
## 3 8.40e7 US USA 840 1005 Barbo~ Alabama US 31.9
## 4 8.40e7 US USA 840 1007 Bibb Alabama US 33.0
## 5 8.40e7 US USA 840 1009 Blount Alabama US 34.0
## 6 8.40e7 US USA 840 1011 Bullo~ Alabama US 32.1
## # ... with 671 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>, ...
```

```
head(covid_global_cases)
```

```
## # A tibble: 6 x 673
##   'Province/State' 'Country/Region' Lat Long '1/22/20' '1/23/20' '1/24/20'
##   <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> Algeria 28.0 1.66 0 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
## # ... with 666 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>, ...
```

Clean the data

```
covid_gd_cleaned <- covid_global_deaths %>%
  pivot_longer(cols = -c('Province/State', 'Country/Region', Lat, Long),
    names_to = "date",
    values_to = "deaths") %>%
  mutate(date = mdy(date)) %>%
  select(-c(Lat, Long)) %>%
  rename(Province_State = 'Province/State',
    Country_Region = 'Country/Region')

covid_gc_cleaned <- covid_global_cases %>%
  pivot_longer(cols = -c('Province/State', 'Country/Region', Lat, Long),
    names_to = "date",
    values_to = "cases") %>%
  mutate(date = mdy(date)) %>%
  select(-c(Lat, Long)) %>%
  rename(Province_State = 'Province/State',
    Country_Region = 'Country/Region')

covid_gd_cleaned$Country_Region <- factor(covid_gd_cleaned$Country_Region)
covid_gd_cleaned$Province_State <- factor(covid_gd_cleaned$Province_State)
```

```

covid_gc_cleaned$Country_Region <- factor(covid_gc_cleaned$Country_Region)
covid_gc_cleaned$Province_State <- factor(covid_gc_cleaned$Province_State)

covid_usd_cleaned <- covid_us_deaths %>%
  pivot_longer(cols = -c(Province_State, Country_Region, UID, iso2, iso3, code3, FIPS, Admin2, Lat, Long),
               names_to = "date",
               values_to = "deaths") %>%
  mutate(date = mdy(date)) %>%
  select(-c(UID, iso2, iso3, code3, FIPS, Admin2, Lat, Long_))

covid_usc_cleaned <- covid_us_cases %>%
  pivot_longer(cols = -c(Province_State, Country_Region, UID, iso2, iso3, code3, FIPS, Admin2, Lat, Long),
               names_to = "date",
               values_to = "cases") %>%
  mutate(date = mdy(date)) %>%
  select(-c(UID, iso2, iso3, code3, FIPS, Admin2, Lat, Long_))

covid_usd_cleaned$Province_State <- factor(covid_usd_cleaned$Province_State)
covid_usc_cleaned$Province_State <- factor(covid_usc_cleaned$Province_State)

summary(covid_gd_cleaned)

```

```

##           Province_State           Country_Region
## Alberta                : 669   China                : 22746
## Anguilla                : 669   Canada                : 10704
## Anhui                   : 669   France                : 8028
## Aruba                   : 669   United Kingdom: 8028
## Australian Capital Territory: 669   Australia        : 5352
## (Other)                  : 54858   Netherlands      : 3345
## NA's                     :129117   (Other)           :129117
##      date              deaths
## Min.   :2020-01-22   Min.    :    0
## 1st Qu.:2020-07-07   1st Qu.:    1
## Median :2020-12-21   Median :   47
## Mean   :2020-12-21   Mean    : 7601
## 3rd Qu.:2021-06-06   3rd Qu.: 1134
## Max.   :2021-11-20   Max.    :771013
##

```

```
summary(covid_usd_cleaned)
```

```

## Province_State Country_Region Combined_Key Population
## Texas      : 171264 Length:2235798 Length:2235798 Min.    :    0
## Georgia   : 107709 Class :character Class :character 1st Qu.:  9917
## Virginia  : 90315  Mode  :character Mode  :character Median : 24892
## Kentucky  : 81618                                     Mean  : 99604
## Missouri  : 78942                                     3rd Qu.: 64979
## Kansas    : 71583                                     Max.   :10039107
## (Other)   :1634367

```

```
##      date      deaths
## Min.   :2020-01-22 Min.   : 0.0
## 1st Qu.:2020-07-07 1st Qu.: 0.0
## Median :2020-12-21 Median : 13.0
## Mean   :2020-12-21 Mean   : 106.7
## 3rd Qu.:2021-06-06 3rd Qu.: 60.0
## Max.   :2021-11-20 Max.   :26999.0
##
```

```
summary(covid_gc_cleaned)
```

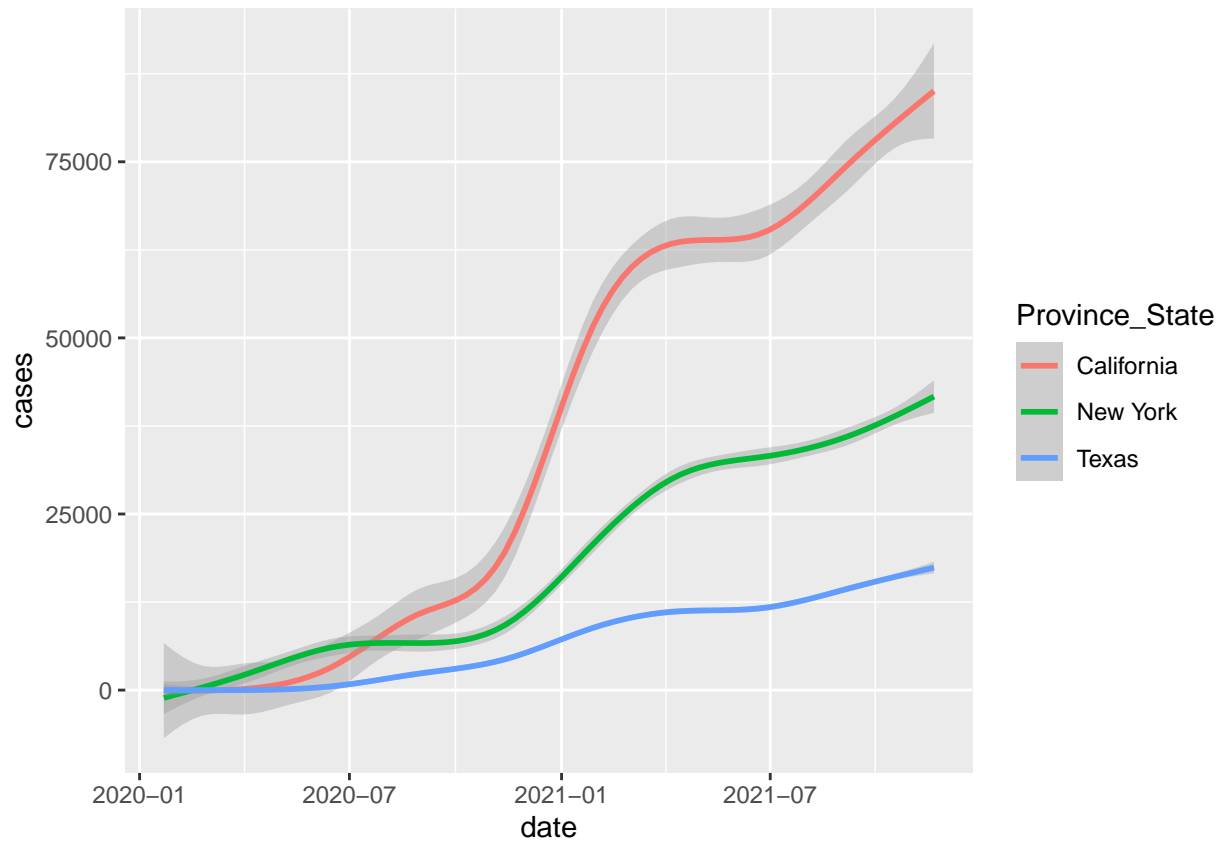
```
##      Province_State      Country_Region
## Alberta           : 669 China           : 22746
## Anguilla          : 669 Canada          : 10704
## Anhui             : 669 France          : 8028
## Aruba             : 669 United Kingdom: 8028
## Australian Capital Territory: 669 Australia : 5352
## (Other)           : 54858 Netherlands : 3345
## NA's              :129117 (Other)     :129117
##      date      cases
## Min.   :2020-01-22 Min.   : 0
## 1st Qu.:2020-07-07 1st Qu.: 170
## Median :2020-12-21 Median : 3016
## Mean   :2020-12-21 Mean   : 339796
## 3rd Qu.:2021-06-06 3rd Qu.: 66890
## Max.   :2021-11-20 Max.   :47701872
##
```

```
summary(covid_usc_cleaned)
```

```
## Province_State Country_Region Combined_Key      date
## Texas      : 171264 Length:2235798 Length:2235798 Min.   :2020-01-22
## Georgia    : 107709 Class :character Class :character 1st Qu.:2020-07-07
## Virginia   : 90315 Mode  :character Mode  :character Median :2020-12-21
## Kentucky   : 81618                                     Mean  :2020-12-21
## Missouri   : 78942                                     3rd Qu.:2021-06-06
## Kansas     : 71583                                     Max.   :2021-11-20
## (Other)    :1634367
##      cases
## Min.   : 0
## 1st Qu.: 47
## Median : 771
## Mean   : 5780
## 3rd Qu.: 3215
## Max.   :1518732
##
```

```
ggplot(subset(covid_usc_cleaned, Province_State %in% c("California", "Texas", "New York")),
  aes(x = date, y = cases)) +
  labs(title = "Cases in 3 of the Biggest States in the US") +
  geom_smooth(aes(y = cases, color = Province_State))
```

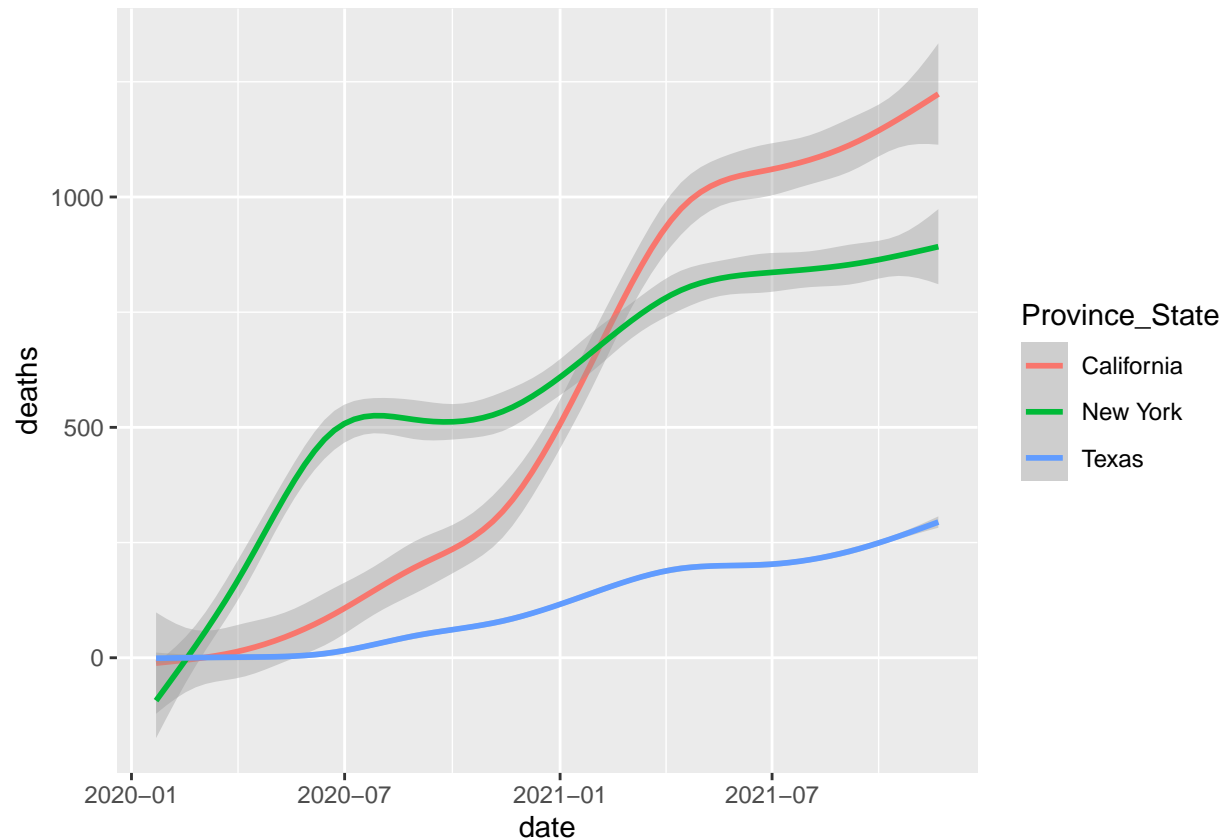
```
## 'geom_smooth()' using method = 'gam' and formula 'y ~ s(x, bs = "cs")'
```



Observation: The number of cases in California reflects the large population number that California has. According to the data there was a very big spike in cases in California near November 2020 to April 2021. This is interesting because according to the graph, Texas and New York also spiked but not nearly as much. Once again, I am assuming this is due to the population density of California.

```
ggplot(subset(covid_usd_cleaned, Province_State %in% c("California", "Texas", "New York")),
  aes(x = date, y = deaths)) +
  geom_smooth(aes(y = deaths, color = Province_State))
```

'geom_smooth()' using method = 'gam' and formula 'y ~ s(x, bs = "cs")'



Observation: According to the dataset, it looks like New York spiked in covid related deaths early on from January 2020 to July 2020. Whereas California also was rising in deaths, but right around the same time frame the covid cases spiked in California, the deaths also did. Texas seems to be constantly rising in covid deaths.

Creating a model

If you are trying to run this, it will take a while. It is not broken.

```
lm_cstates = lm(cases~Province_State, data = covid_usc_cleaned)
lm_dstates = lm(deaths~Province_State, data = covid_usd_cleaned)
```

```
summary(lm_cstates)
```

```
##
## Call:
## lm(formula = cases ~ Province_State, data = covid_usc_cleaned)
##
## Residuals:
##      Min       1Q   Median       3Q      Max
## -36742  -4730   -2199   -561  1481990
##
## Coefficients:
##              Estimate Std. Error t value Pr(>|t|)
## (Intercept)    4874.1     122.9   39.648  < 2e-16 ***
```

## Province_StateAlaska	-3570.1	216.1	-16.518	< 2e-16	***
## Province_StateAmerican Samoa	-4873.9	1028.6	-4.739	2.15e-06	***
## Province_StateArizona	25352.5	276.5	91.690	< 2e-16	***
## Province_StateArkansas	-2135.1	169.3	-12.613	< 2e-16	***
## Province_StateCalifornia	31867.9	180.3	176.790	< 2e-16	***
## Province_StateColorado	-334.6	175.8	-1.903	0.05701	.
## Province_StateConnecticut	13928.8	345.5	40.311	< 2e-16	***
## Province_StateDelaware	7104.8	472.9	15.023	< 2e-16	***
## Province_StateDiamond Princess	-4829.2	1028.6	-4.695	2.66e-06	***
## Province_StateDistrict of Columbia	4907.9	602.3	8.149	3.66e-16	***
## Province_StateFlorida	15989.8	173.9	91.971	< 2e-16	***
## Province_StateGeorgia	-670.7	146.9	-4.565	5.00e-06	***
## Province_StateGrand Princess	-4780.8	1028.6	-4.648	3.35e-06	***
## Province_StateGuam	910.7	1028.6	0.885	0.37593	
## Province_StateHawaii	-1232.3	405.1	-3.042	0.00235	**
## Province_StateIdaho	-2371.5	194.4	-12.200	< 2e-16	***
## Province_StateIllinois	2744.3	158.6	17.308	< 2e-16	***
## Province_StateIndiana	-311.7	161.9	-1.925	0.05421	.
## Province_StateIowa	-2697.3	159.5	-16.912	< 2e-16	***
## Province_StateKansas	-3135.0	157.7	-19.883	< 2e-16	***
## Province_StateKentucky	-2662.4	153.8	-17.308	< 2e-16	***
## Province_StateLouisiana	-143.9	175.8	-0.818	0.41326	
## Province_StateMaine	-2956.6	270.3	-10.939	< 2e-16	***
## Province_StateMaryland	5225.0	235.0	22.235	< 2e-16	***
## Province_StateMassachusetts	18039.2	276.5	65.240	< 2e-16	***
## Province_StateMichigan	1063.0	164.6	6.458	1.06e-10	***
## Province_StateMinnesota	-1111.3	163.8	-6.785	1.16e-11	***
## Province_StateMississippi	-2453.3	165.9	-14.787	< 2e-16	***
## Province_StateMissouri	-1760.7	154.8	-11.377	< 2e-16	***
## Province_StateMontana	-3743.6	181.9	-20.579	< 2e-16	***
## Province_StateNebraska	-3505.0	161.5	-21.700	< 2e-16	***
## Province_StateNevada	5301.0	264.6	20.036	< 2e-16	***
## Province_StateNew Hampshire	-614.1	319.4	-1.923	0.05452	.
## Province_StateNew Jersey	19571.4	245.9	79.600	< 2e-16	***
## Province_StateNew Mexico	-1534.0	211.9	-7.239	4.53e-13	***
## Province_StateNew York	13425.4	177.2	75.755	< 2e-16	***
## Province_StateNorth Carolina	803.5	159.2	5.048	4.47e-07	***
## Province_StateNorth Dakota	-3690.8	184.6	-19.995	< 2e-16	***
## Province_StateNorthern Mariana Islands	-4755.1	1028.6	-4.623	3.78e-06	***
## Province_StateOhio	2001.1	163.4	12.247	< 2e-16	***
## Province_StateOklahoma	-1509.3	168.3	-8.970	< 2e-16	***
## Province_StateOregon	-1701.3	206.3	-8.247	< 2e-16	***
## Province_StatePennsylvania	4484.5	173.9	25.794	< 2e-16	***
## Province_StatePuerto Rico	-3939.7	167.8	-23.482	< 2e-16	***
## Province_StateRhode Island	6951.1	405.1	17.160	< 2e-16	***
## Province_StateSouth Carolina	2393.6	191.9	12.471	< 2e-16	***
## Province_StateSouth Dakota	-3816.6	174.5	-21.872	< 2e-16	***
## Province_StateTennessee	444.9	160.8	2.767	0.00566	**
## Province_StateTexas	2000.1	138.5	14.439	< 2e-16	***
## Province_StateUtah	1492.8	208.1	7.174	7.28e-13	***
## Province_StateVermont	-4088.0	283.4	-14.427	< 2e-16	***
## Province_StateVirgin Islands	-2488.2	1028.6	-2.419	0.01556	*
## Province_StateVirginia	-2045.8	151.1	-13.537	< 2e-16	***
## Province_StateWashington	1451.9	201.4	7.210	5.59e-13	***

```
## Province_StateWest Virginia      -3283.3      182.8 -17.963 < 2e-16 ***
## Province_StateWisconsin           428.6       170.9   2.508 0.01214 *
## Province_StateWyoming             -3411.6      238.4 -14.312 < 2e-16 ***
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
##
## Residual standard error: 26410 on 2235740 degrees of freedom
## Multiple R-squared:  0.05388,    Adjusted R-squared:  0.05386
## F-statistic: 2234 on 57 and 2235740 DF,  p-value: < 2.2e-16
```

```
summary(lm_dstates)
```

```
##
## Call:
## lm(formula = deaths ~ Province_State, data = covid_usd_cleaned)
##
## Residuals:
##      Min       1Q   Median       3Q      Max
## -791.5   -73.5   -30.5    -5.0  26443.8
##
## Coefficients:
##              Estimate Std. Error t value Pr(>|t|)
## (Intercept)      90.7742     2.3697   38.307 < 2e-16 ***
## Province_StateAlaska    -84.1583     4.1661  -20.201 < 2e-16 ***
## Province_StateAmerican Samoa  -90.7742    19.8260  -4.579 4.68e-06 ***
## Province_StateArizona    497.7551     5.3298   93.391 < 2e-16 ***
## Province_StateArkansas   -46.3072     3.2630  -14.192 < 2e-16 ***
## Province_StateCalifornia  464.3964     3.4746  133.655 < 2e-16 ***
## Province_StateColorado   -29.4583     3.3891   -8.692 < 2e-16 ***
## Province_StateConnecticut  466.5182     6.6604   70.044 < 2e-16 ***
## Province_StateDelaware    119.5711     9.1163   13.116 < 2e-16 ***
## Province_StateDiamond Princess -90.7742    19.8260  -4.579 4.68e-06 ***
## Province_StateDistrict of Columbia 158.6114    11.6089   13.663 < 2e-16 ***
## Province_StateFlorida    243.3815     3.3512   72.625 < 2e-16 ***
## Province_StateGeorgia    -14.7161     2.8323   -5.196 2.04e-07 ***
## Province_StateGrand Princess  -88.1031    19.8260  -4.444 8.84e-06 ***
## Province_StateGuam        -0.6651    19.8260  -0.034 0.973238
## Province_StateHawaii     -46.3316     7.8081   -5.934 2.96e-09 ***
## Province_StateIdaho      -63.2876     3.7468  -16.891 < 2e-16 ***
## Province_StateIllinois     56.5771     3.0563   18.512 < 2e-16 ***
## Province_StateIndiana     -4.6790     3.1204   -1.499 0.133751
## Province_StateIowa       -57.2958     3.0743  -18.637 < 2e-16 ***
## Province_StateKansas     -64.9211     3.0391  -21.362 < 2e-16 ***
## Province_StateKentucky    -60.6754     2.9650  -20.464 < 2e-16 ***
## Province_StateLouisiana    17.7354     3.3891    5.233 1.67e-07 ***
## Province_StateMaine      -65.2367     5.2097  -12.522 < 2e-16 ***
## Province_StateMaryland    131.7196     4.5296   29.080 < 2e-16 ***
## Province_StateMassachusetts  598.8963     5.3298  112.368 < 2e-16 ***
## Province_StateMichigan     50.3333     3.1731   15.862 < 2e-16 ***
## Province_StateMinnesota   -41.3378     3.1573  -13.093 < 2e-16 ***
## Province_StateMississippi -36.4426     3.1981  -11.395 < 2e-16 ***
## Province_StateMissouri    -44.2219     2.9831  -14.824 < 2e-16 ***
## Province_StateMontana     -75.3972     3.5065  -21.502 < 2e-16 ***
## Province_StateNebraska    -76.9741     3.1135  -24.723 < 2e-16 ***
```

```
## Province_StateNevada      81.1543      5.0998  15.913 < 2e-16 ***
## Province_StateNew Hampshire -24.8536      6.1565  -4.037 5.42e-05 ***
## Province_StateNew Jersey   700.6805      4.7393 147.844 < 2e-16 ***
## Province_StateNew Mexico   -23.6415      4.0848  -5.788 7.14e-09 ***
## Province_StateNew York     496.2788      3.4160 145.280 < 2e-16 ***
## Province_StateNorth Carolina -17.1221      3.0682  -5.581 2.40e-08 ***
## Province_StateNorth Dakota  -74.6990      3.5581 -20.994 < 2e-16 ***
## Province_StateNorthern Mariana Islands -88.9357    19.8260  -4.486 7.26e-06 ***
## Province_StateOhio         38.8824      3.1497  12.345 < 2e-16 ***
## Province_StateOklahoma     -44.3003      3.2434 -13.659 < 2e-16 ***
## Province_StateOregon       -49.2842      3.9764 -12.394 < 2e-16 ***
## Province_StatePennsylvania 138.5926      3.3512  41.356 < 2e-16 ***
## Province_StatePuerto Rico  -73.1961      3.2340 -22.634 < 2e-16 ***
## Province_StateRhode Island 152.0018      7.8081  19.467 < 2e-16 ***
## Province_StateSouth Carolina 28.5584      3.6996   7.719 1.17e-14 ***
## Province_StateSouth Dakota -74.6708      3.3635 -22.200 < 2e-16 ***
## Province_StateTennessee    -19.4082      3.0999  -6.261 3.83e-10 ***
## Province_StateTexas        25.7133      2.6700   9.631 < 2e-16 ***
## Province_StateUtah         -55.4792      4.0109 -13.832 < 2e-16 ***
## Province_StateVermont      -81.4756      5.4618 -14.917 < 2e-16 ***
## Province_StateVirgin Islands -65.9566    19.8260  -3.327 0.000879 ***
## Province_StateVirginia     -45.0107      2.9130 -15.452 < 2e-16 ***
## Province_StateWashington   -1.9098      3.8814  -0.492 0.622698
## Province_StateWest Virginia -63.7281      3.5232 -18.088 < 2e-16 ***
## Province_StateWisconsin     -30.7793      3.2941  -9.344 < 2e-16 ***
## Province_StateWyoming      -74.1984      4.5949 -16.148 < 2e-16 ***
```

```
## ---
```

```
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
```

```
##
```

```
## Residual standard error: 509.1 on 2235740 degrees of freedom
```

```
## Multiple R-squared:  0.06946,    Adjusted R-squared:  0.06944
```

```
## F-statistic: 2928 on 57 and 2235740 DF,  p-value: < 2.2e-16
```

```
covid_us <- covid_usd_cleaned %>% inner_join(covid_usc_cleaned, by=c("Province_State", "date", "Country_Region"))
head(covid_us)
```

```
## # A tibble: 6 x 7
```

```
##   Province_State Country_Region Combined_Key Population date      deaths cases
##   <fct>          <chr>          <chr>      <dbl> <date>      <dbl> <dbl>
## 1 Alabama      US      Autauga, Ala~ 55869 2020-01-22      0      0
## 2 Alabama      US      Autauga, Ala~ 55869 2020-01-23      0      0
## 3 Alabama      US      Autauga, Ala~ 55869 2020-01-24      0      0
## 4 Alabama      US      Autauga, Ala~ 55869 2020-01-25      0      0
## 5 Alabama      US      Autauga, Ala~ 55869 2020-01-26      0      0
## 6 Alabama      US      Autauga, Ala~ 55869 2020-01-27      0      0
```

```
max(covid_us$cases[covid_us$Province_State == 'California']) / max(covid_us$Population[covid_us$Province_State == 'California'])
```

```
## [1] 0.1512816
```

```
max(covid_us$cases[covid_us$Province_State == 'Texas']) / max(covid_us$Population[covid_us$Province_State == 'Texas'])
```

```
## [1] 0.123865
```

```
max(covid_us$cases[covid_us$Province_State == 'New York']) / max(covid_us$Population[covid_us$Province_State == 'New York'])
```

```
## [1] 0.1347371
```

```
max(covid_us$deaths[covid_us$Province_State == 'California']) / max(covid_us$cases[covid_us$Province_State == 'California'])
```

```
## [1] 0.01777733
```

```
max(covid_us$deaths[covid_us$Province_State == 'Texas']) / max(covid_us$cases[covid_us$Province_State == 'Texas'])
```

```
## [1] 0.01621915
```

```
max(covid_us$deaths[covid_us$Province_State == 'New York']) / max(covid_us$cases[covid_us$Province_State == 'New York'])
```

```
## [1] 0.03170935
```

Analysis and bias:

According to the data, there seems to be somewhat of a correlation between state and covid cases/deaths. The r-squared value of both the models are around 0.05, which is not the best for a model, but it does give us some insight into if population or just the state in general handled covid well or not. Instead, I will use a simple statistic to find the percentage of cases based on the maximum population. California has a 15% covid case rate, Texas has a 12% covid case rate, and New York has a 13% covid case rate. However when we look at the mortality rates of individuals who are infected with covid, we see that California has a 1.7% rate of death based on the covid case rate. What's interesting here is that New York has the highest out of the 3, but it also has a smaller case rate than California.

There is definitely some bias that is involved because I am assuming that handling of covid is directly correlated with covid cases and deaths in the state. We do not know if the data has people that were from out of state that acquired covid, or died in a state with covid. In conclusion, the data points to Texas actually having a pretty decent covid case and death rate, which is something I personally would not have guessed. It seems like more dense populations are infected with covid at a higher rate.