NYPD Shooting Incident Data Report

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OUTLINE

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- □ Modeling
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Background





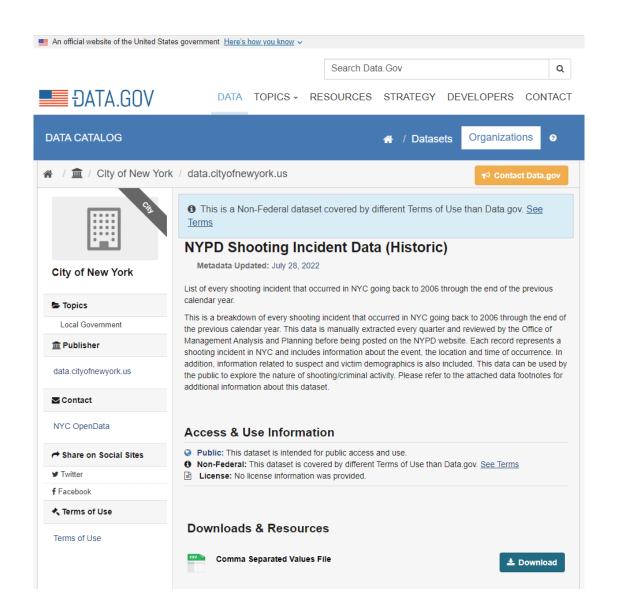








Importing Data



I start by reading NYPD Shooting
Incident Data (Historic) from the csv
file which is
downloaded from this website:
https://catalog.data.gov/dataset/nypdshooting-incident-data-historic.

Code:

Get historic data in the csv file
url_in <"https://data.cityofnewyork.us/api/views/833yfsy8/rows.csv?accessType=DOWNLOAD

Let's read in the data and see what we have.

```
> NYPD
# A tibble: 25,596 x 19
       INCIDENT_KEY OCCUR...1 OCCUR...2
                                                                                            PRECI... JURIS... LOCAT... STATI... PERP... PERP... VIC_A... VIC_SEX VIC_R... X_COO... Y_COO... Latit... VIC_SEX VIC_R... X_COO... X_COO... VIC_SEX VIC_R... X_COO... X_COO...
                         <db1> <chr>
                                                          <time>
                                                                              <chr>
                                                                                                  <db1>
                                                                                                                     <db1> <chr>
                                                                                                                                                       <7g7>
                                                                                                                                                                          <chr>
                                                                                                                                                                                              <chr>>
                                                                                                                                                                                                                 <chr>>
                                                                                                                                                                                                                                    <chr>
                                                                                                                                                                                                                                                                           <chr>>
                                                                                                                                                                                                                                                                                                    <db7>
                                                                                                                                                                                                                                                                                                                      <db7>
                                                                                                                                                                                                                                                                                                                                           <db7>
                 24050482 08/27/... 05:35
                                                                              BRONX
                                                                                                        52
                                                                                                                              0 NA
                                                                                                                                                       TRUE
                                                                                                                                                                                                                                    25-44
                                                                                                                                                                                                                                                                            BLACK ...
                                                                                                                                                                                                                                                                                               1.02e6 255919.
                                                                                                                                                                                                                                                                                                                                             40.9
                                                                                                                                                                          NA
                                                                                                                                                                                             NA
                                                                                                                                                                                                                 NA
                                                                                                                                                                                                                                                                                                1.03e6 186095
                                                                                                                                                                                                                                                                                                                                            40.7
                 77673979 03/11/... 12:03
                                                                              QUEE...
                                                                                                      106
                                                                                                                              0 NA
                                                                                                                                                       FALSE
                                                                                                                                                                                                                                    65+
                                                                                                                                                                                                                                                                           WHITE
                                                                                                                                                                                                                                                                                                1.01e6 243050
              226950018 04/14/... 21:08
                                                                              BRONX
                                                                                                        42
                                                                                                                              0 COMMER... TRUE
                                                                                                                                                                                                                                    18-24
                                                                                                                                                                                                                                                                           BLACK
                                                                                                                                                                                                                                                                                                                                             40.8
                                                                                                                                                                                                                                                                                                1.02e6 256046
              237<u>710</u>987 12/10/... 19:30
                                                                              BRONX
                                                                                                                              0 NA
                                                                                                                                                      FALSE
                                                                                                                                                                          NA
                                                                                                                                                                                                                                    25-44
                                                                                                                                                                                                                                                                           BLACK
                                                                                                                                                                                                                                                                                                                                             40.9
              224701998 02/22/... 00:18
                                                                                                                                                                                                                                    25-44
                                                                                                                                                                                                                                                                           BLACK ... 1.01e6 254690
                                                                                                                                                                                                                                                                                                                                             40.9
                                                                              MANH...
                                                                                                         34
                                                                                                                              0 NA
                                                                                                                                                      FALSE
                                                                                                                                                                          NA
              225295736 03/07/... 06:15
                                                                              BR00...
                                                                                                                              0 NA
                                                                                                                                                      TRUE
                                                                                                                                                                          25-44
                                                                                                                                                                                                                 BLACK ... 25-44
                                                                                                                                                                                                                                                                           WHITE ... 1.02e6 187865
                                                                                                                                                                                                                                                                                                                                             40.7
              231190175 07/21/... 00:40
                                                                             MANH...
                                                                                                        32
                                                                                                                              0 NA
                                                                                                                                                      FALSE
                                                                                                                                                                          25-44
                                                                                                                                                                                                                 BLACK
                                                                                                                                                                                                                                    25-44
                                                                                                                                                                                                                                                                           BLACK
                                                                                                                                                                                                                                                                                                 9.98e5 235038
                                                                                                                                                                                                                                                                                                                                             40.8
                                                                                                                                                                                                                                    18-24
              233429421 09/11/... 20:20
                                                                             MANH...
                                                                                                        26
                                                                                                                              2 MULTI ... FALSE
                                                                                                                                                                          NA
                                                                                                                                                                                                                                                                           BLACK
                                                                                                                                                                                                                                                                                                 9.96e5 <u>235</u>674
                                                                                                                                                                                                                                                                                                                                             40.8
              227950661 05/09/... 02:50
                                                                                                        41
                                                                                                                              2 MULTI ... TRUE
                                                                                                                                                                          25-44
                                                                                                                                                                                                                                    25-44
                                                                                                                                                                                                                                                                           BLACK ... 1.01e6 240068
                                                                                                                                                                                                                                                                                                                                             40.8
                                                                              BRONX
                                                                                                                                                                                                                 BLACK
                                                                                                         67
                                                                                                                                                                                                                                    18-24
              227344198 04/23/... 13:25
                                                                              BR00...
                                                                                                                              0 NA
                                                                                                                                                       FALSE
                                                                                                                                                                          NA
                                                                                                                                                                                                                NA
                                                                                                                                                                                                                                                                           BLACK
                                                                                                                                                                                                                                                                                                1.00e6 180307
                                                                                                                                                                                                                                                                                                                                             40.7
        with 25,586 more rows, 2 more variables: Longitude <dbl>, Lon_Lat <chr>, and abbreviated variable names 'OCCUR_DATE, 'OCCUR_TIME,
          *PRECINCT, 4JURISDICTION_CODE, 5LOCATION_DESC, 6STATISTICAL_MURDER_FLAG, 7PERP_AGE_GROUP, $PERP_SEX, 9PERP_RACE, *VIC_AGE_GROUP,
         *VIC_RACE, *X_COORD_CD, *Y_COORD_CD, *Latitude
# i Use `print(n = ...)` to see more rows, and `colnames()` to see all variable names
>
```

Code:

library(tidyverse)
NYPD <- read_csv(url_in)

Tidying and Transforming

After looking at the NYPD, I would like to tidy the dataset, I don't need several columns for the analysis, like INCIDENT_KEY, etc. So I get rid of these.

```
> NYPD_summary1
# A tibble: 25,596 x 10
   OCCUR_DATE OCCUR_TIME BORO
                                    STATISTICAL_MURDER_FLAG PERP_AGE_GROUP PERP_SEX PERP_RACE
                                                                                                     VIC_AGE_GROUP VIC_SEX VIC_RACE
                                    <7q7>
              <time>
                                                             <chr>
                                                                                                     <chr>
                                                                                                                            <chr>>
   <chr>>
                          <chr>>
                                                                             <chr>
                                                                                      <chr>
                                                                                                                    <chr>>
 1 08/27/2006 05:35
                                                                                                     25-44
                         BRONX
                                    TRUE
                                                             NA
                                                                            NA
                                                                                     NA
                                                                                                                            BLACK HISPANIC
 2 03/11/2011 12:03
                                                                                                     65+
                         OUEENS
                                    FALSE
                                                             NA
                                                                                     NA
                                                                                                                            WHITE
3 04/14/2021 21:08
                                                                                                     18-24
                         BRONX
                                    TRUE
                                                             NA
                                                                                                                            BLACK
                                                                                                     25-44
4 12/10/2021 19:30
                         BRONX
                                    FALSE
                                                             NA
                                                                            NA
                                                                                     NA
                                                                                                                            BLACK
 5 02/22/2021 00:18
                                                                                                     25-44
                         MANHATTAN FALSE
                                                                                                                            BLACK HISPANIC
6 03/07/2021 06:15
                                                             25-44
                                                                                      BLACK HISPANIC 25-44
                         BROOKLYN TRUE
                                                                                                                            WHITE HISPANIC
7 07/21/2021 00:40
                         MANHATTAN FALSE
                                                             25-44
                                                                                                     25-44
                                                                                      BLACK
                                                                                                                            BLACK
8 09/11/2021 20:20
                                                                                                     18-24
                         MANHATTAN FALSE
                                                             NA
                                                                            NA
                                                                                     NA
                                                                                                                            BLACK
9 05/09/2021 02:50
                                                             25-44
                                                                                                     25-44
                                                                                                                            BLACK HISPANIC
                         BRONX
                                    TRUE
                                                                                      BLACK
10 04/23/2021 13:25
                                                                                                     18-24
                         BROOKLYN FALSE
                                                                                     NA
                                                                                                                            BLACK
# ... with 25,586 more rows
# i Use `print(n = ...)` to see more rows
```

```
NYPD_summary1 = subset(NYPD, select = -c(INCIDENT_KEY, PRECINCT, JURISDICTION_CODE, LOCATION_DESC, X_COORD_CD, Y_COORD_CD, Latitude, Longitude, Lon_Lat))
```

And then I rename OCCUR_DATE and OCCUR_TIME to be more R friendly, and change date types to display.

```
> NYPD_summary2
# A tibble: 25,596 x 10
   DATE
              TIME
                     BORO
                                STATISTICAL_MURDER_FLAG PERP_AGE_GROUP PERP_SEX PERP_RACE
                                                                                                 VIC_AGE_GROUP VIC_SEX VIC_RACE
                                <7q7>
                                                         <chr>
   <date>
               <time> <chr>
                                                                                  <chr>
                                                                                                  <chr>
                                                                                                                        <chr>
 1 2006-08-27 05:35
                     BRONX
                                                                                  NA
                                                                                                  25-44
                                                                                                                        BLACK HISPANIC
                                TRUE
                                                         NA
 2 2011-03-11 12:03
                     QUEENS
                                FALSE
                                                                                  NA
                                                                                                  65+
                                                                                                                        WHITE
                                                         NA
 3 2021-04-14 21:08
                     BRONX
                                TRUE
                                                         NA
                                                                                  NA
                                                                                                 18-24
                                                                                                                        BLACK
 4 2021-12-10 19:30
                     BRONX
                                FALSE
                                                         NA
                                                                                                 25-44
                                                                                                                        BLACK
 5 2021-02-22 00:18
                     MANHATTAN FALSE
                                                                                                 25-44
                                                                                                                        BLACK HISPANIC
                                                         NA
 6 2021-03-07 06:15
                     BROOKLYN
                                                         25-44
                                                                                  BLACK HISPANIC 25-44
                                                                                                                        WHITE HISPANIC
7 2021-07-21 00:40
                     MANHATTAN FALSE
                                                         25-44
                                                                                  BLACK
                                                                                                 25-44
                                                                                                                        BLACK
 8 2021-09-11 20:20
                     MANHATTAN FALSE
                                                                                                 18-24
                                                         NA
                                                                                                                        BLACK
                                                                                                 25-44
 9 2021-05-09 02:50
                                                         25-44
                                                                                                                        BLACK HISPANIC
                     BRONX
                                TRUE
                                                                                  BLACK
10 2021-04-23 13:25 BROOKLYN FALSE
                                                                                                 18-24
                                                         NA
                                                                                                                        BLACK
# ... with 25,586 more rows
# i Use `print(n = ...)` to see more rows
```

```
library(lubridate)
NYPD_summary2 <- NYPD_summary1 %>%
rename(DATE = `OCCUR_DATE`,
TIME = `OCCUR_TIME`) %>%
mutate(DATE = mdy(DATE))
```

Furthermore, I find there are many missing data which shows "NA", I remove all the rows containing "NA".

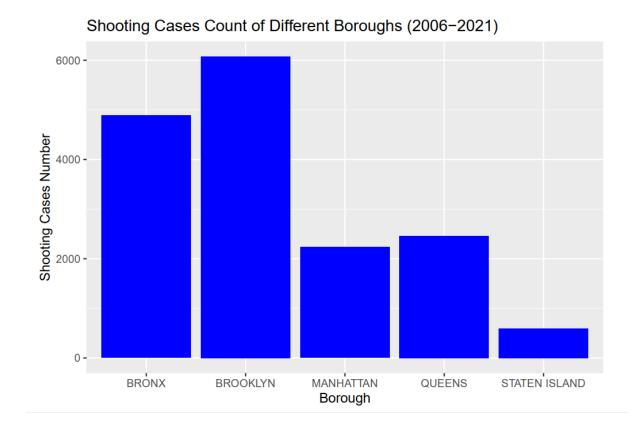
```
> NYPD_summary
# A tibble: 16,252 x 11
   DATE
              TIME
                      BORO
                                STATISTICAL_MURDER_FLAG PERP_AGE_GROUP PERP_SEX PERP_RACE
                                                                                                  VIC_AGE_GROUP VIC_SEX VIC_RACE
   <date>
               <time> <chr>
                                                                                                   <chr>
                                                                                                                 <chr>
                                                                                                                          <chr>>
                                < 7q7 >
                                                          <chr>
                                                                         <chr>>
                                                                                   <chr>>
 1 2021-03-07 06:15
                                                         25-44
                                                                                   BLACK HISPANIC 25-44
                      BROOKLYN
                                TRUE
                                                                                                                         WHITE HISPANIC
 2 2021-07-21 00:40
                     MANHATTAN FALSE
                                                         25-44
                                                                                  BLACK
                                                                                                  25-44
                                                                                                                         BLACK
 3 2021-05-09 02:50
                      BRONX
                                TRUE
                                                         25-44
                                                                                   BLACK
                                                                                                  25-44
                                                                                                                         BLACK HISPANIC
                                                         25-44
 4 2021-06-16 23:22
                      BRONX
                                TRUE
                                                                                  BLACK
                                                                                                  25-44
                                                                                                                         BLACK
 5 2021-01-12 22:12
                      BROOKLYN
                                FALSE
                                                         18-24
                                                                                   BLACK
                                                                                                  18-24
                                                                                                                         BLACK
 6 2021-09-04 20:18
                                                                                                                         ASIAN / PACIFIC IS...
                     MANHATTAN FALSE
                                                         18-24
                                                                                  WHITE HISPANIC 18-24
 7 2021-06-16 23:22
                                                                                  WHITE HISPANIC 25-44
                      BRONX
                                FALSE
                                                         18-24
                                                                                                                         BLACK
 8 2021-09-29 12:50
                      BRONX
                                FALSE
                                                         18-24
                                                                                  BLACK
                                                                                                  <18
                                                                                                                         BLACK HISPANIC
 9 2021-03-10 07:30 MANHATTAN FALSE
                                                         25-44
                                                                                  BLACK
                                                                                                  18-24
                                                                                                                         BLACK
10 2021-08-13 01:00 QUEENS
                                                         18-24
                                                                                   BLACK
                                                                                                  18-24
                                                                                                                         BLACK
                                TRUE
# ... with 16,242 more rows
# i Use `print(n = ...)` to see more rows
```

Code:

NYPD_summary <- NYPD_summary2 %>% na.omit(NYPD_summary)

Visualizing

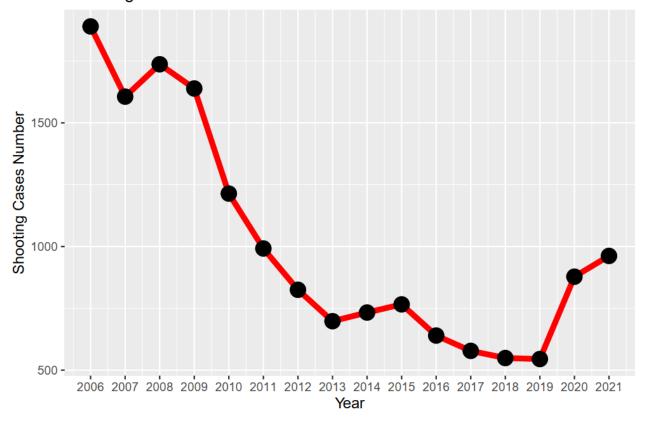
Generate a new table "Different_boroughs" by counting shooting cases from 2006 to 2021 of different boroughs in New York. Visualizing the by a bar plot.



```
library(dplyr)
Different_boroughs <- NYPD_summary %>%
group_by(BORO) %>% summarise(count_nums = n())
library(ggplot2)
ggplot(Different_boroughs, aes(x=BORO,
y=count_nums)) +
geom_bar(stat="identity", fill ="blue") +
labs(x="Borough", y="Shooting Cases Number")+
ggtitle("Shooting Cases Count of Different Boroughs
(2006-2021)")
```

Generate another new table "Cases_Per_Year" based on the total shooting cases counting by each year from 2006 to 2021 in New York. Visualizing the data by a line plot.

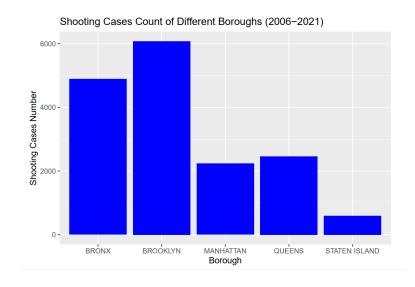
Shooting Cases Count of of Each Year in New York



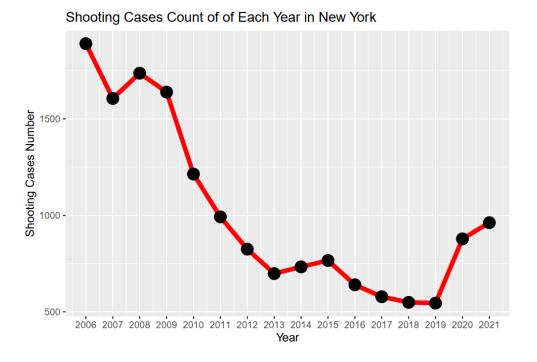
```
NYPD_summary$Year <-
as.numeric(format(NYPD_summary$DATE, "%Y"))
Cases_Per_Year <- NYPD_summary %>% group_by(Year)
%>% summarise(count_nums = n())
ggplot(Cases_Per_Year, aes(x=Year,y=count_nums))+
geom_line(color="red", size=2)+
geom_point(shape=21, color="black", fill="black", size=5)+
labs(x="Year", y="Shooting Cases Number")+
scale_x_continuous(breaks=seq(from = 2006, to = 2021, by = 1))+
ggtitle("Shooting Cases Count of of Each Year in New York")
```

Analysis

According to the bar plot, the total maximum cases borough is Brooklyn, the number is 6074. And the total minimum cases borough is Staten Island, the number is 591. If we look at the map of New York below, we will find the area of Brooklyn and Staten Island is about the same, but the total cases of the former is almost 10 times as the latter. That's interesting, maybe one of the reason is that Brooklyn is close to the city center and there are downtowns, and Staten Island is just at the suburb, far from the crowd area.





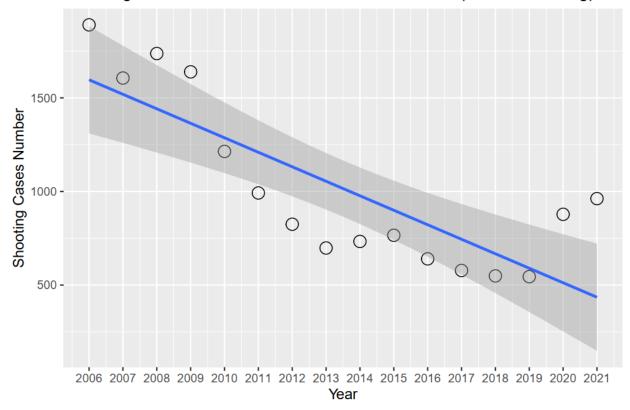


Based on the line plot, the total maximum cases year is 2006, the number is 1890. And the total minimum cases year is 2019, the number is 545. Since 2006, the cases number are mainly decreasing with the year until 2019, but then has an obvious increase in 2020 and 2021. There are several question worthy deep investigation. Why did the cases has a period peak in 2008, due to the financial crisis that year? Why did the shooting cases increase in recent two years? Does that has any relation to the COVID-19 pandemic? If so, with the ending of pandemic, can we predict that the decay trend (from 2006 to 2019) will continue by tracking the case number after 2022?

Modeling

Modeling the plot above with a linear fashion.

Shooting Cases Count of of Each Year in New York (Linear modeling)



```
ggplot(Cases_Per_Year, aes(x=Year,y=count_nums)) +
geom_point(shape=21, color="black", size=4) +
stat_smooth(method = lm)+
labs(x="Year", y="Shooting Cases Number")+
scale_x_continuous(breaks=seq(from = 2006, to = 2021, by =
1))+
ggtitle("Shooting Cases Count of Each Year in New York
(Linear modeling)")
```

Conclusion and Bias

If we review the bar plot of, we can draw a conclusion that Brooklyn is the most dangerous borough in New York because it has the biggest number, and Staten Island is the safest borough. To my personal feeling, downtown area are always the heaven of all kinds of crime. But that maybe has some bias, we should consider the population of each borough, and then we can compare cases number based on per thousand people. If we have that data, maybe we can get another picture and tell a different story.

From a 15 years observation window, we found that Shooting Cases are decreasing year by year except for recent two year, we can draw a conclusion that it becomes safer now in New York comparing with the past. Is this kind of decrease a long term trend? I hope so and but it maybe my personal bias. I expect that the gun violence will reduce and the city around us will be a better and safer place in the future. But I need more data after 2022 to support this optimistic expectation.