

# NYPD shooting

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## Objective and dataset

### Dataset

List of all the shooting that occurs in New York city from 2006 to 2022. Published by New York city. 27000 rows and 21 columns.

### Objective

Yearly trends about shooting incidents in New York city. Time of day incidence occurrence. Day of week incidence occurring.

## Preparation

### R packages

```
library(dplyr)
```

```
## Warning: package 'dplyr' was built under R version 4.1.3
```

```
##
```

```
## Attaching package: 'dplyr'
```

```
## The following objects are masked from 'package:stats':
```

```
##
```

```
## filter, lag
```

```
## The following objects are masked from 'package:base':
```

```
##
```

```
## intersect, setdiff, setequal, union
```

```
library(ggplot2)
```

```
library(forcats)
```

```
## Warning: package 'forcats' was built under R version 4.1.3
```

```
library(tidyverse)
```

```
## Warning: package 'tidyverse' was built under R version 4.1.3
```

```
## Warning: package 'tibble' was built under R version 4.1.3
```

```
## Warning: package 'tidyr' was built under R version 4.1.3
```

```
## Warning: package 'readr' was built under R version 4.1.3
```

```
## Warning: package 'purrr' was built under R version 4.1.3
```

```
## Warning: package 'lubridate' was built under R version 4.1.3
```

```
## -- Attaching core tidyverse packages ----- tidyverse 2.0.0 --
```

```
## v lubridate 1.9.2      v stringr  1.5.1
```

```
## v purrr      1.0.1      v tibble  3.2.1
```

```
## v readr      2.1.4      v tidyr   1.3.0
```

```
## -- Conflicts ----- tidyverse_conflicts() --
```

```
## x dplyr::filter() masks stats::filter()
```

```
## x dplyr::lag()     masks stats::lag()
```

```
## i Use the conflicted package (<http://conflicted.r-lib.org/>) to force all conflicts to become errors
```

```
library(lubridate)
```

## Data import

From: [https://catalog.data.gov/dataset?q=NYPD+shooting+incident&sort=views\\_\\_recent+desc&ext\\_location=&ext\\_bbox=&ext\\_prev\\_extent=](https://catalog.data.gov/dataset?q=NYPD+shooting+incident&sort=views__recent+desc&ext_location=&ext_bbox=&ext_prev_extent=)

```
url <- c('https://data.cityofnewyork.us/api/views/833y-fsy8/rows.csv?accessType=DOWNLOAD')
shooting <- read_csv(url)
```

```
## Rows: 28562 Columns: 21-- Column specification -----
```

```
## Delimiter: ","
```

```
## chr  (12): OCCUR_DATE, BORO, LOC_OF_OCCUR_DESC, LOC_CLASSFCTN_DESC, LOCATION...
```

```
## dbl  (7): INCIDENT_KEY, PRECINCT, JURISDICTION_CODE, X_COORD_CD, Y_COORD_CD...
```

```
## lgl  (1): STATISTICAL_MURDER_FLAG
```

```
## time (1): OCCUR_TIME
```

```
## 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.
```

## Exploration and tidying of data

### Exploration

#### Summary

```
summary(shooting)
```

```
## INCIDENT_KEY      OCCUR_DATE      OCCUR_TIME      BORO
## Min.   : 9953245   Length:28562    Length:28562    Length:28562
## 1st Qu.: 65439914  Class :character Class1:hms      Class :character
## Median : 92711254  Mode  :character Class2:difftime Mode  :character
## Mean   :127405824          Mode  :numeric
## 3rd Qu.:203131993
## Max.   :279758069
##
## LOC_OF_OCCUR_DESC  PRECINCT      JURISDICTION_CODE LOC_CLASSFCTN_DESC
## Length:28562      Min.   : 1.0    Min.   :0.0000    Length:28562
## Class :character  1st Qu.: 44.0   1st Qu.:0.0000    Class :character
## Mode  :character  Median : 67.0   Median :0.0000    Mode  :character
##                  Mean  : 65.5   Mean  :0.3219
##                  3rd Qu.: 81.0   3rd Qu.:0.0000
##                  Max.   :123.0   Max.   :2.0000
##                  NA's    :2
## LOCATION_DESC      STATISTICAL_MURDER_FLAG PERP_AGE_GROUP
## Length:28562      Mode :logical    Length:28562
## Class :character  FALSE:23036      Class :character
## Mode  :character  TRUE :5526       Mode  :character
##
##
##
## PERP_SEX           PERP_RACE           VIC_AGE_GROUP           VIC_SEX
## Length:28562      Length:28562      Length:28562      Length:28562
## Class :character  Class :character  Class :character  Class :character
## Mode  :character  Mode  :character  Mode  :character  Mode  :character
##
##
##
## VIC_RACE           X_COORD_CD           Y_COORD_CD           Latitude
## Length:28562      Min.   : 914928   Min.   :125757   Min.   :40.51
## Class :character  1st Qu.:1000068   1st Qu.:182912   1st Qu.:40.67
## Mode  :character  Median :1007772   Median :194901   Median :40.70
##                  Mean  :1009424   Mean  :208380   Mean  :40.74
##                  3rd Qu.:1016807   3rd Qu.:239814   3rd Qu.:40.82
##                  Max.   :1066815   Max.   :271128   Max.   :40.91
##                  NA's    :59
## Longitude         Lon_Lat
## Min.   : -74.25    Length:28562
## 1st Qu.: -73.94    Class :character
## Median : -73.92    Mode  :character
## Mean   : -73.91
## 3rd Qu.: -73.88
## Max.   : -73.70
## NA's    :59
```

Sample data

```
head(shooting, n=5)
```

```
## # A tibble: 5 x 21
##   INCIDENT_KEY OCCUR_DATE OCCUR_TIME BORO      LOC_OF_OCCUR_DESC PRECINCT
##   <dbl> <chr>      <time>      <chr>      <chr>      <dbl>
## 1    244608249 05/05/2022 00:10    MANHATTAN  INSIDE      14
## 2    247542571 07/04/2022 22:20    BRONX      OUTSIDE     48
## 3     84967535 05/27/2012 19:35    QUEENS     <NA>       103
## 4    202853370 09/24/2019 21:00    BRONX      <NA>       42
## 5     27078636 02/25/2007 21:00    BROOKLYN   <NA>       83
## # i 15 more variables: JURISDICTION_CODE <dbl>, LOC_CLASSFCTN_DESC <chr>,
## #   LOCATION_DESC <chr>, STATISTICAL_MURDER_FLAG <lgl>, PERP_AGE_GROUP <chr>,
## #   PERP_SEX <chr>, PERP_RACE <chr>, VIC_AGE_GROUP <chr>, VIC_SEX <chr>,
## #   VIC_RACE <chr>, X_COORD_CD <dbl>, Y_COORD_CD <dbl>, Latitude <dbl>,
## #   Longitude <dbl>, Lon_Lat <chr>
```

## Tidying

```
shooting_tidy <- shooting %>% select(-c(X_COORD_CD,Y_COORD_CD,Longitude,Longitude,Longitude))
```

**Removal of unnecessary information** removal of perpetrator info that are unuseful for our analysis

```
shooting_tidy <- shooting_tidy %>%
  select(-c(PERP_AGE_GROUP,PERP_SEX,PERP_RACE)) %>%
  select(-c(LOCATION_DESC,JURISDICTION_CODE,LOCATION_DESC))
```

converting date to date format

```
shooting_tidy$OCCUR_DATE <- as.Date(shooting_tidy$OCCUR_DATE,
                                     format = "%m/%d/%Y")
```

## Data analysis

### Day of shooting incidents

Will be studied the relation between day of occurrence of incidence against number of occurrence of incidence. A new variable will be created “day of week”.

```
shooting_dayofweek <- shooting_tidy %>%
  mutate(day_of_week = wday(OCCUR_DATE, week_start = 1))
```

Aggregate of shooting on the different days of the week will be calculated.

```
shooting_dayofweek_agg <- shooting_dayofweek %>% group_by(day_of_week) %>%
  summarize(count = n())
```

## Trends of shooting per years

Will be analyzed if there is any yearly trends in shooting incidents. Year of occurrence will be derived.

```
shooting_year <- shooting_tidy %>% mutate(year = year(OCCUR_DATE))
```

total account for year and gender will be calculated.

```
shooting_year_agg <- shooting_year %>%  
  group_by(victim_gender = VIC_SEX, year = year(OCCUR_DATE)) %>%  
  summarize(count = n())
```

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

## incidence by time of the day

Will be analyzed shooting incidence occurrence by time of the day, a new column will be created related to time of the day of the shooting.

```
shooting_hour <- shooting_tidy %>%  
  mutate(hour = format(as.POSIXct(OCCUR_TIME, format="%H:%M:%S"), "%H"))
```

Now the sum of shooting by hour of the day.

```
shooting_hour_agg <- shooting_hour %>% group_by(hour) %>%  
  summarize(count = n())
```

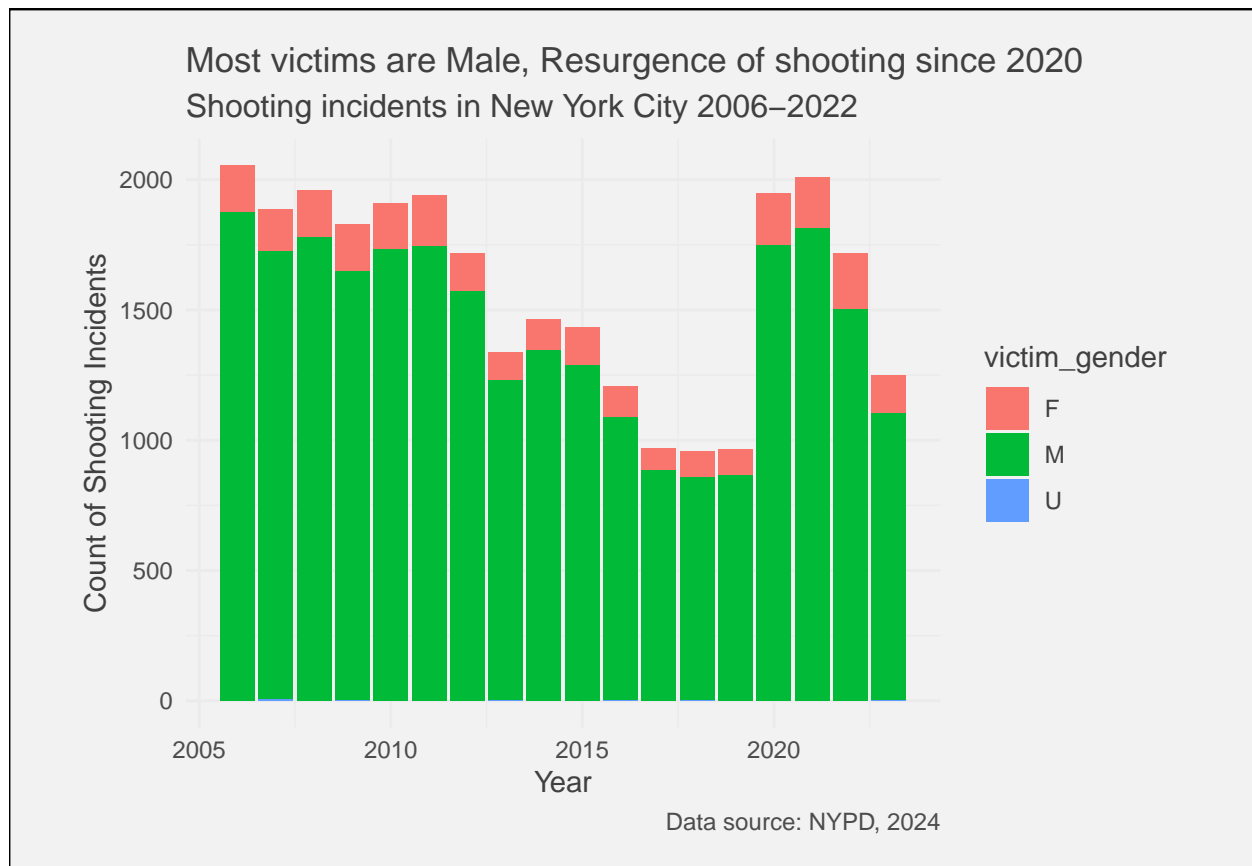
## Visualisation of data

### theme for visualisation

```
theme_shooting <- function() {theme_minimal() +  
  theme(text = element_text(color="gray25"),  
        plot.subtitle = element_text(size = 12),  
        plot.caption = element_text(color = "gray30"),  
        plot.background = element_rect(fill = "gray95"),  
        plot.margin = unit(c(5, 10, 5, 10), units = "mm"))}
```

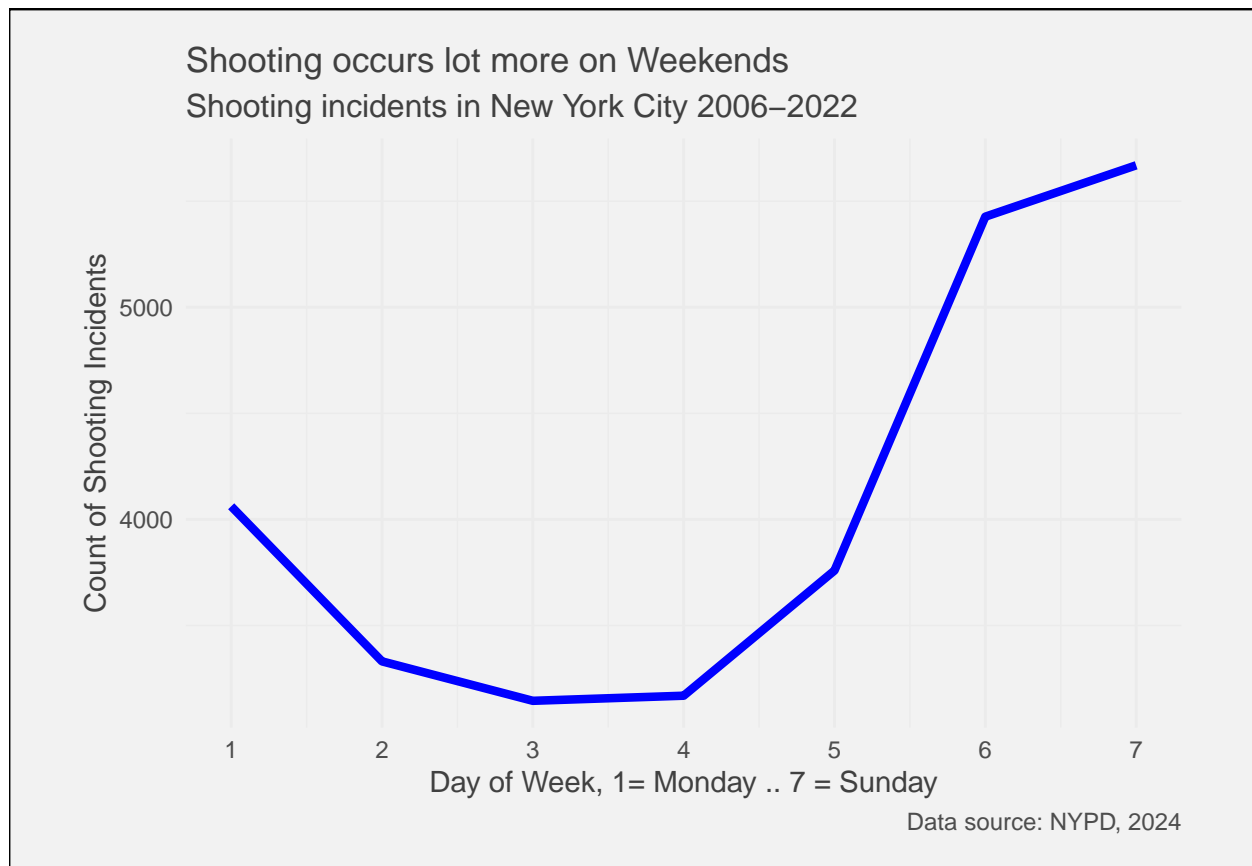
### historical trend by years and by gender

```
ggplot(data = shooting_year_agg, aes(x = year, y = count, fill=victim_gender))+  
  geom_bar(stat = "identity") +  
  labs(x = "Year", y = "Count of Shooting Incidents",  
       title = "Most victims are Male, Resurgence of shooting since 2020",  
       subtitle = "Shooting incidents in New York City 2006-2022",  
       caption = "Data source: NYPD, 2024") + theme_shooting()
```



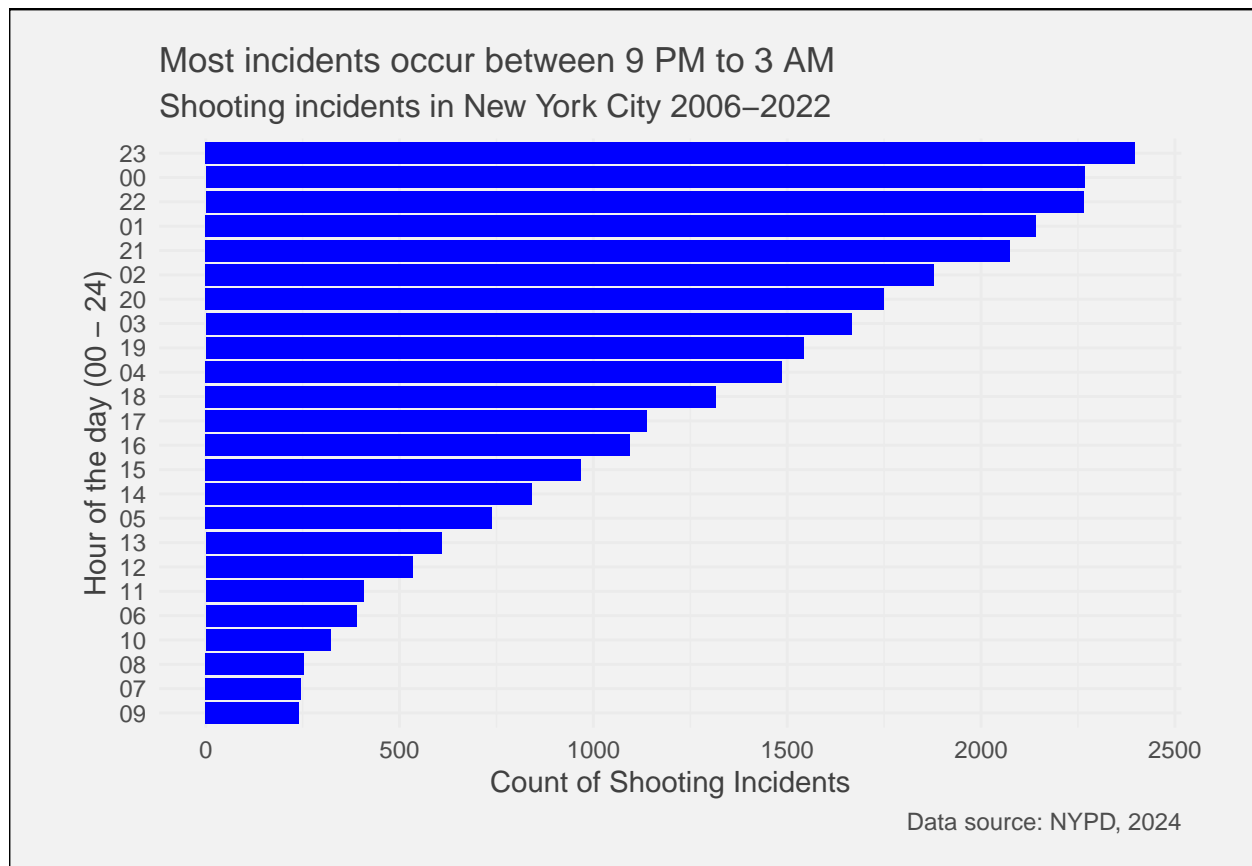
day of occurrence of shooting

```
ggplot(data = shooting_dayofweek_agg, aes(x = day_of_week, y = count)) +
  geom_line(color = "blue", size = 1.5) +
  scale_x_continuous(breaks = shooting_dayofweek_agg$day_of_week,
                    labels = shooting_dayofweek_agg$day_of_week) +
  labs(x = "Day of Week, 1= Monday .. 7 = Sunday",
       y = "Count of Shooting Incidents", title = "Shooting occurs lot more on Weekends",
       subtitle = "Shooting incidents in New York City 2006-2022",
       caption = "Data source: NYPD, 2024") + theme_shooting()
```



shooting by hour of the day

```
ggplot(data = shooting_hour_agg, aes(x = reorder(hour, count), y = count)) +  
  geom_bar(stat = "identity", fill = "blue") +  
  labs(x = "Hour of the day (00 - 24)",  
       y = "Count of Shooting Incidents",  
       title = "Most incidents occur between 9 PM to 3 AM",  
       subtitle = "Shooting incidents in New York City 2006-2022",  
       caption = "Data source: NYPD, 2024") + theme_shooting() + coord_flip()
```



## Model: day of occurrence of shooting

### week-end variable

This is a variable that assess if shooting occurred on week-end vs normal day of the week.

```
shooting_dow_agg <- mutate(shooting_dayofweek_agg,
  is_weekendd = ifelse(shooting_dayofweek_agg$day_of_week < 6, 0, 1))
```

### Creating a linear model

to predict relationship between is\_weekend and count of shooting incidents

```
shooting_model <- lm(is_weekendd ~ count, data=shooting_dow_agg)
```

the model

```
shooting_model
```

```
##
## Call:
## lm(formula = is_weekendd ~ count, data = shooting_dow_agg)
##
```



```
## Coefficients:
## (Intercept)      count
## -1.4998657      0.0004376
```

performance of the model

```
summary(shooting_model)
```

```
##
## Call:
## lm(formula = is_weekendd ~ count, data = shooting_dow_agg)
##
## Residuals:
##      1      2      3      4      5      6      7
## -0.27771  0.04218  0.12358  0.11307 -0.14512  0.12495  0.01905
##
## Coefficients:
##              Estimate Std. Error t value Pr(>|t|)
## (Intercept) -1.500e+00  2.749e-01  -5.455  0.00281 **
## count        4.376e-04  6.552e-05   6.679  0.00114 **
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
##
## Residual standard error: 0.1697 on 5 degrees of freedom
## Multiple R-squared:  0.8992, Adjusted R-squared:  0.879
## F-statistic: 44.61 on 1 and 5 DF,  p-value: 0.001137
```

Discussing the model

The `p_value` of the model is approximately 0.0011 well below 0.05 which gives validity to the model. There is a significant relationship between number of shooting incidents and day of week.

### comparing linear model to actual shooting incidents

```
shooting_dow_agg <- shooting_dow_agg %>% mutate(pred = predict(shooting_model))
```

### model performance

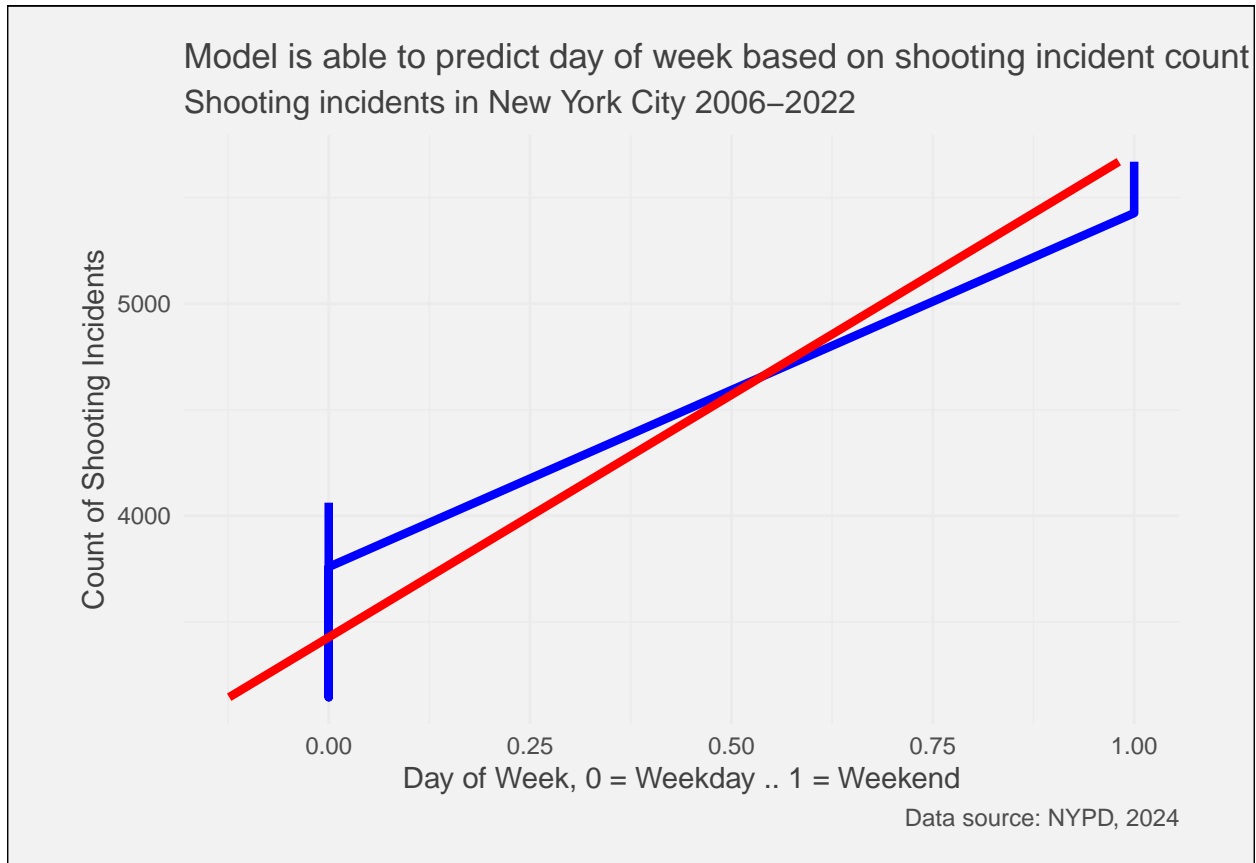
```
ggplot(data = shooting_dow_agg) + geom_line(color = "blue",
                                             size = 1.5, aes(x = shooting_dow_agg$is_weekendd, y = shooting_dow_agg$count)) +
  geom_line(color = "red", size = 1.5, aes(x = shooting_dow_agg$pred,
                                             y = shooting_dow_agg$count)) +
  labs(x = "Day of Week, 0 = Weekday .. 1 = Weekend",
       y = "Count of Shooting Incidents",
       title = "Model is able to predict day of week based on shooting incident count",
       subtitle = "Shooting incidents in New York City 2006-2022",
       caption = "Data source: NYPD, 2024") + theme_shooting()
```

```
## Warning: Use of 'shooting_dow_agg$is_weekendd' is discouraged. Use 'is_weekendd'
## instead.
```

```
## Warning: Use of 'shooting_dow_agg$count' is discouraged. Use 'count' instead.
```

```
## Warning: Use of 'shooting_dow_agg$pred' is discouraged. Use 'pred' instead.
```

```
## Warning: Use of 'shooting_dow_agg$count' is discouraged. Use 'count' instead.
```



## data bias

Information in this data set are provided by NYPD, so it only register data that were reported to the police. If there was a lot of shooting incidents that were not reported to the police, a bias could exist.

If shooting incidents were not registered at the actual time of occurrence but only at a rounding time, a bias could occur as in this study we are considering the time of occurrence specifically.

## conclusion

According to this study it appears that most of the shooting significantly occurred on week-end. It appears that activity of population increase in week-end and so the occurrence of shooting incidents.

Most victims are males. It appears in this study that more than 80% of victims are males. Males are more likely to be involved in violent activities.

Violence and shooting incidences has significantly increased from 2020 till now as clarified by this study, reasons for that are not known but it might be related to the COVID 19 pandemic.