

NYPDShooting

TP

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In this data report, I will import the NYPD Shooting Incident data, visualize and analyze that data, build a model, and identify different biases.

Question of interest

For this data set, I'm especially curious about the relationship between murder status and victims. Who are the most vulnerable during shooting incidents in New York based on this data set based on victims' gender, age, and race?

Importing Data

The data is downloaded from NYPD OpenData. The data file is in csv format.

```
url_in <- "https://data.cityofnewyork.us/api/views/833y-fsy8/rows.csv?accessType=DOWNLOAD"
```

```
shooting_cases <- read_csv(url_in)
head(shooting_cases)
```

```
## # A tibble: 6 x 19
##   INCIDENT_KEY OCCUR_DATE OCCUR_TIME BORO      PRECINCT JURISDICTION_CODE
##   <dbl> <chr>      <time>    <chr>      <dbl>      <dbl>
## 1    24050482 08/27/2006 05:35    BRONX        52          0
## 2    77673979 03/11/2011 12:03    QUEENS       106          0
## 3    203350417 10/06/2019 01:09    BROOKLYN     77          0
## 4    80584527 09/04/2011 03:35    BRONX        40          0
## 5    90843766 05/27/2013 21:16    QUEENS       100          0
## 6    92393427 09/01/2013 04:17    BROOKLYN     67          0
## # ... with 13 more variables: 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>
```

```
summary(shooting_cases)
```

```
##   INCIDENT_KEY      OCCUR_DATE      OCCUR_TIME      BORO
## Min.   : 9953245 Length:23585 Length:23585 Length:23585
## 1st Qu.: 55322804 Class :character Class1:hms    Class :character
## Median : 83435362 Mode  :character Class2:difftime Mode  :character
## Mean   :102280741          Mode :numeric
## 3rd Qu.:150911774
## Max.   :230611229
```

```
##
##      PRECINCT      JURISDICTION_CODE LOCATION_DESC      STATISTICAL_MURDER_FLAG
## Min.   : 1.00    Min.   :0.000      Length:23585      Mode :logical
## 1st Qu.: 44.00    1st Qu.:0.000      Class :character  FALSE:19085
## Median : 69.00    Median :0.000      Mode  :character  TRUE :4500
## Mean   : 66.21    Mean   :0.333
## 3rd Qu.: 81.00    3rd Qu.:0.000
## Max.   :123.00    Max.   :2.000
##                NA's   :2
## PERP_AGE_GROUP    PERP_SEX          PERP_RACE          VIC_AGE_GROUP
## Length:23585      Length:23585      Length:23585      Length:23585
## Class :character  Class :character  Class :character  Class :character
## Mode  :character  Mode  :character  Mode  :character  Mode  :character
##
##
##
##      VIC_SEX          VIC_RACE          X_COORD_CD          Y_COORD_CD
## Length:23585      Length:23585      Min.   : 914928      Min.   :125757
## Class :character  Class :character  1st Qu.: 999925      1st Qu.:182539
## Mode  :character  Mode  :character  Median :1007654      Median :193470
##                                     Mean   :1009379      Mean   :207300
##                                     3rd Qu.:1016782      3rd Qu.:239163
##                                     Max.   :1066815      Max.   :271128
##
##      Latitude      Longitude      Lon_Lat
## Min.   :40.51      Min.   : -74.25      Length:23585
## 1st Qu.:40.67      1st Qu.: -73.94      Class :character
## Median :40.70      Median : -73.92      Mode  :character
## Mean   :40.74      Mean   : -73.91
## 3rd Qu.:40.82      3rd Qu.: -73.88
## Max.   :40.91      Max.   : -73.70
##
##
```

There are 23,585 incidents reported in the data set. Each incident is associated with a incident key. The date, time, location, shooters' information (age, race, gender), victims' information (age, race, gender), precinct, jurisdiction code, statistical murder flag, x coordination, y coordination, latitude, longitude, lon_lat of each incident were reported. In total, there are 19 data features in the data set.

There are missing data in LOCATION_DESC, PERP_AGE_GROUP, PERP_SEX, PERP_RACE. The missing data in LOCATION_DESC may be due to the locations of the incidents are not classified in the system and the missing shooters' information may be due to the fact that the shooters have not caught or died during the incidents.

```
shooting_cases <- shooting_cases %>%
  select(-c(PRECINCT, LOCATION_DESC, PERP_AGE_GROUP, PERP_SEX, JURISDICTION_CODE,
            PERP_RACE, X_COORD_CD, Y_COORD_CD, Latitude, Longitude, Lon_Lat)) %>%
  mutate(OCCUR_DATE = mdy(OCCUR_DATE))
shooting_cases
```

```
## # A tibble: 23,585 x 8
##   INCIDENT_KEY OCCUR_DATE OCCUR_TIME BORO      STATISTICAL_MURDER~ VIC_AGE_GROUP
##   <dbl> <date>      <time> <chr>      <lgl>              <chr>
## 1 24050482 2006-08-27 05:35 BRONX      TRUE               25-44
## 2 77673979 2011-03-11 12:03 QUEENS     FALSE              65+
## 3 203350417 2019-10-06 01:09 BROOKLYN   FALSE              18-24
```

```
## 4      80584527 2011-09-04 03:35      BRONX      FALSE      <18
## 5      90843766 2013-05-27 21:16      QUEENS      FALSE      18-24
## 6      92393427 2013-09-01 04:17      BROOKLYN FALSE      <18
## 7      73057167 2010-06-05 21:16      BROOKLYN FALSE      <18
## 8      211362213 2020-03-20 21:27      BROOKLYN FALSE      25-44
## 9      137564752 2014-07-04 00:25      QUEENS      FALSE      18-24
## 10     147024011 2015-10-18 01:33      QUEENS      FALSE      18-24
## # ... with 23,575 more rows, and 2 more variables: VIC_SEX <chr>,
## #   VIC_RACE <chr>
```

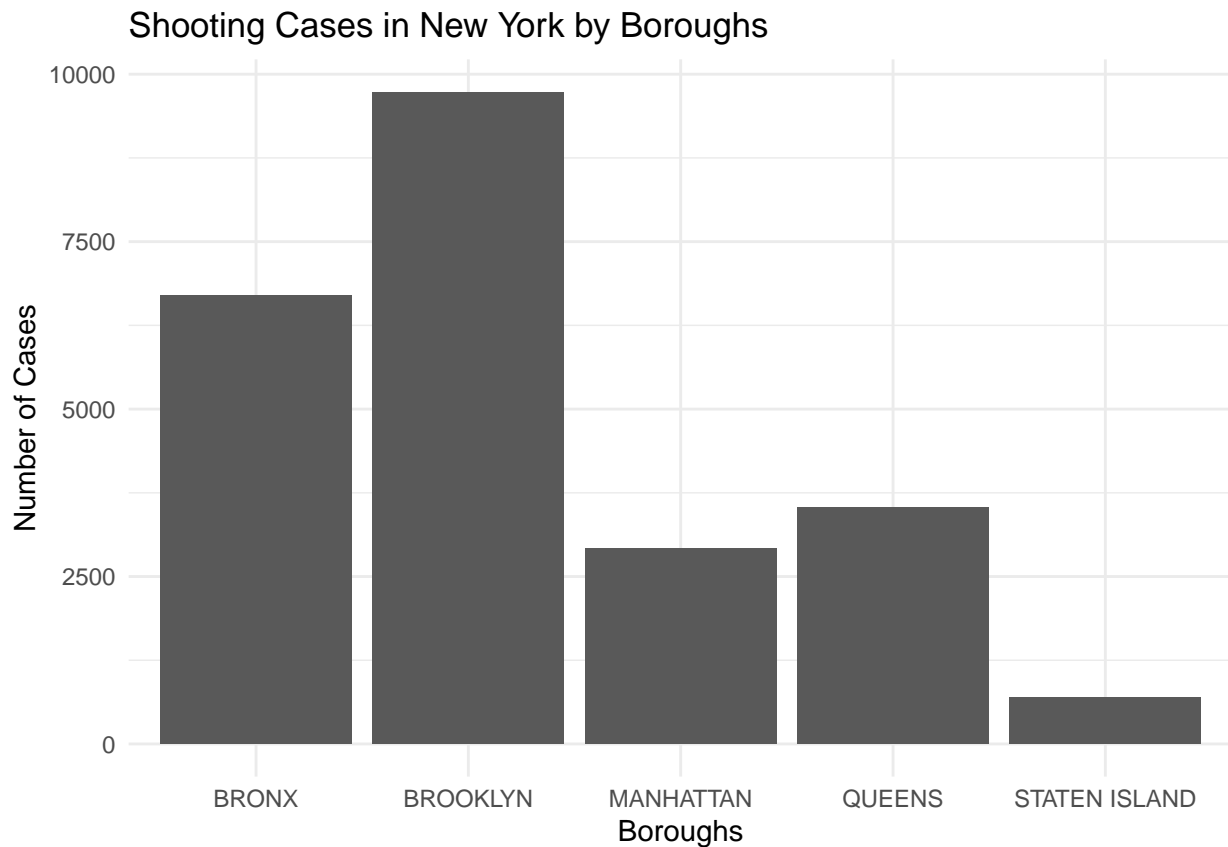
```
summary(shooting_cases)
```

```
## INCIDENT_KEY      OCCUR_DATE      OCCUR_TIME      BORO
## Min. : 9953245    Min. :2006-01-01    Length:23585      Length:23585
## 1st Qu.: 55322804 1st Qu.:2008-12-31    Class1:hms        Class :character
## Median : 83435362 Median :2012-02-27    Class2:difftime    Mode  :character
## Mean : 102280741   Mean : 2012-10-05    Mode :numeric
## 3rd Qu.:150911774 3rd Qu.:2016-03-02
## Max. : 230611229   Max. : 2020-12-31
## STATISTICAL_MURDER_FLAG VIC_AGE_GROUP      VIC_SEX
## Mode :logical          Length:23585      Length:23585
## FALSE:19085             Class :character    Class :character
## TRUE :4500              Mode :character     Mode :character
##
##
##
## VIC_RACE
## Length:23585
## Class :character
## Mode :character
##
##
##
```

Visualization and Analysis

```
# Visualization and analysis 1: Where has the most and the least number of shooting cases in New York
shooting_case_plot <- ggplot(shooting_cases, aes(x = BORO)) + geom_bar() +
  labs(title = "Shooting Cases in New York by Boroughs", x = "Boroughs", y = "Number of Cases") +
  theme_minimal()

shooting_case_plot
```



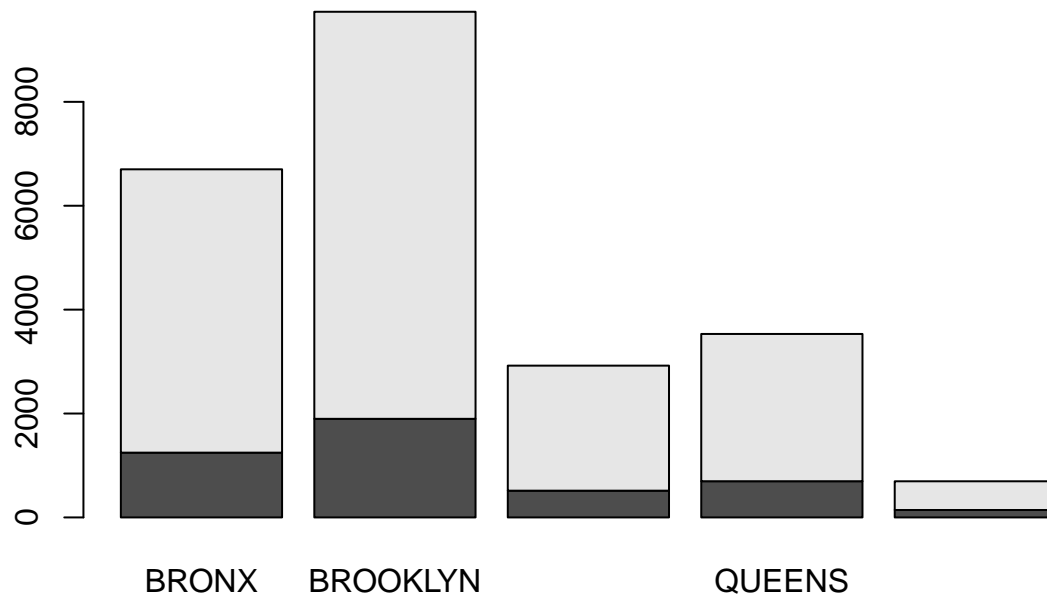
Analysis: From the plot above, we can see that Brooklyn has the highest number of shooting incidents (about 9000 cases) and Staten Island has the lowest number of incidents (about 600 cases).

```
murder_boolean <- shooting_cases$STATISTICAL_MURDER_FLAG
murders <- filter(shooting_cases, murder_boolean=='TRUE')
murder_by_boro <- table(t(murders$BORO))
not_murder<-filter(shooting_cases, murder_boolean=='FALSE')
not_murder_by_boro <- table(t(not_murder$BORO))
combined_murder_notMurder <- rbind(murder_by_boro, not_murder_by_boro)

table(shooting_cases$BORO, shooting_cases$STATISTICAL_MURDER_FLAG)
```

```
##
##          FALSE TRUE
##  BRONX       5454 1247
##  BROOKLYN    7836 1898
##  MANHATTAN   2407  515
##  QUEENS      2835  697
##  STATEN ISLAND 553  143
```

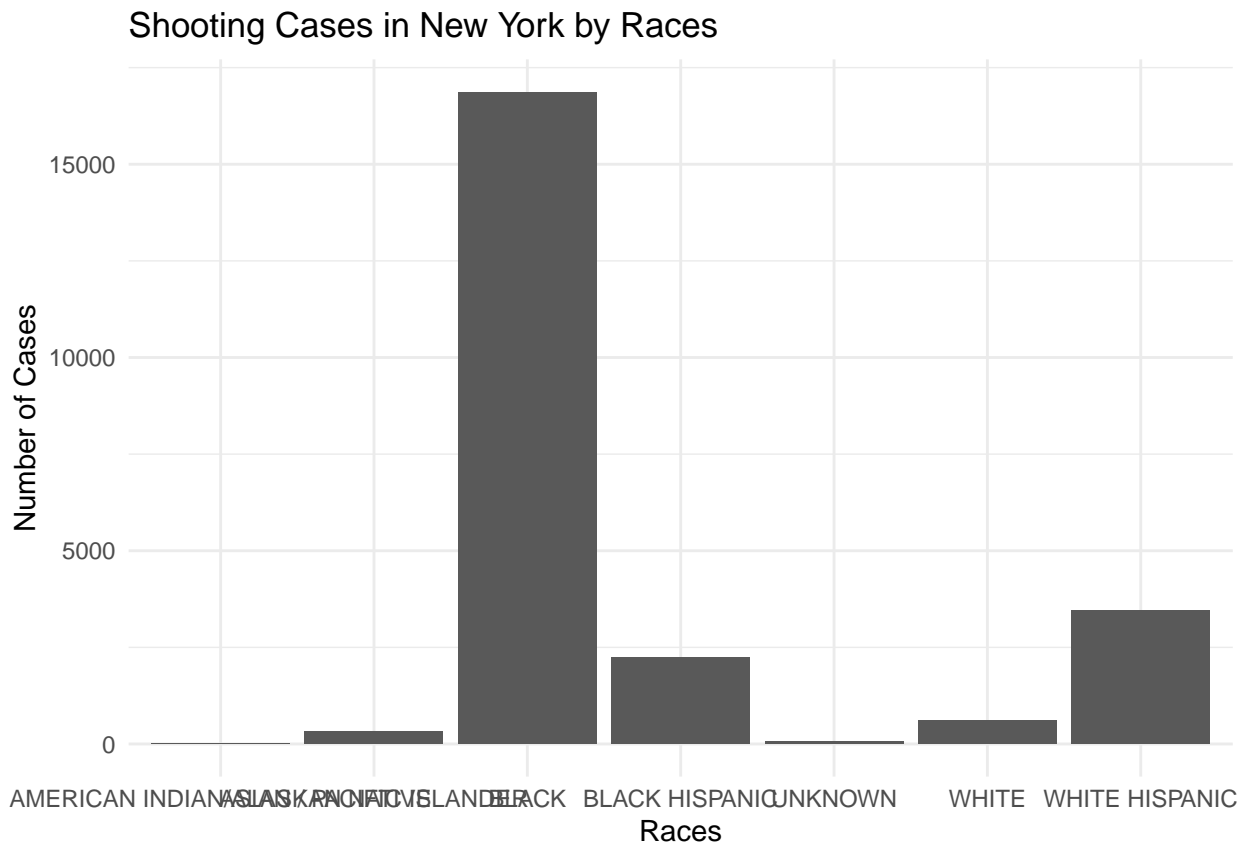
```
barplot(combined_murder_notMurder)
```



Analysis: From the table and plot above, we can see that murder cases (darker part) take a small part of total shooting cases (lighter part).

```
# Visualize race of victims
shooting_case_race_plot <- ggplot(shooting_cases, aes(x = VIC_RACE)) + geom_bar() +
  labs(title = "Shooting Cases in New York by Races", x = "Races", y = "Number of Cases") +
  theme_minimal()

shooting_case_race_plot
```

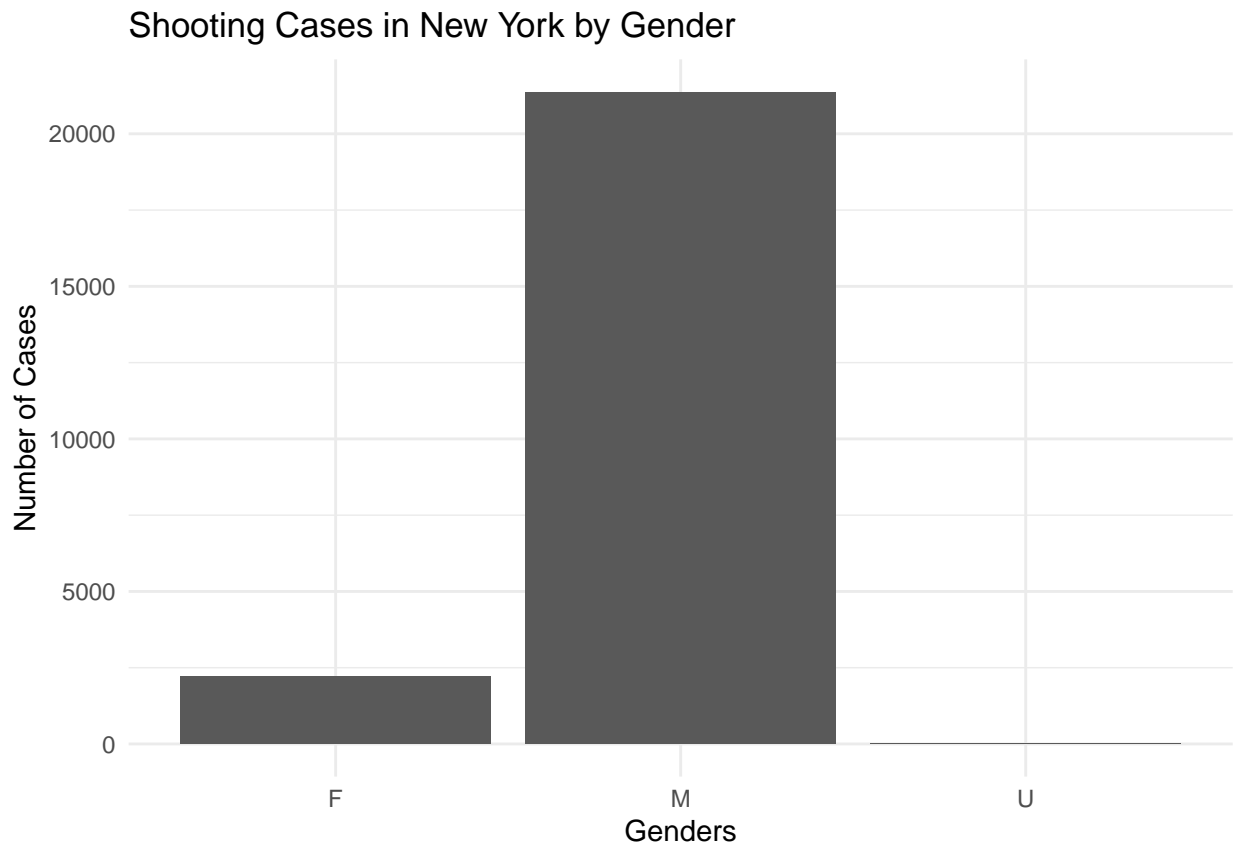


Analysis: From the plot above, we can see that the victims are mainly Black with more than half of the total cases. The second highest is White Hispanic. Pacific Islanders and American Indian/Alaskans make up a small number of cases.

This raises the question of why Black people make up so many cases of shooting. Does Black have the highest number of population in New York? Do the shootings usually happen where Black people live?

```
# Visualize genders of victims
shooting_case_gender_plot <- ggplot(shooting_cases, aes(x = VIC_SEX)) + geom_bar() +
  labs(title = "Shooting Cases in New York by Gender", x = "Genders", y = "Number of Cases") +
  theme_minimal()

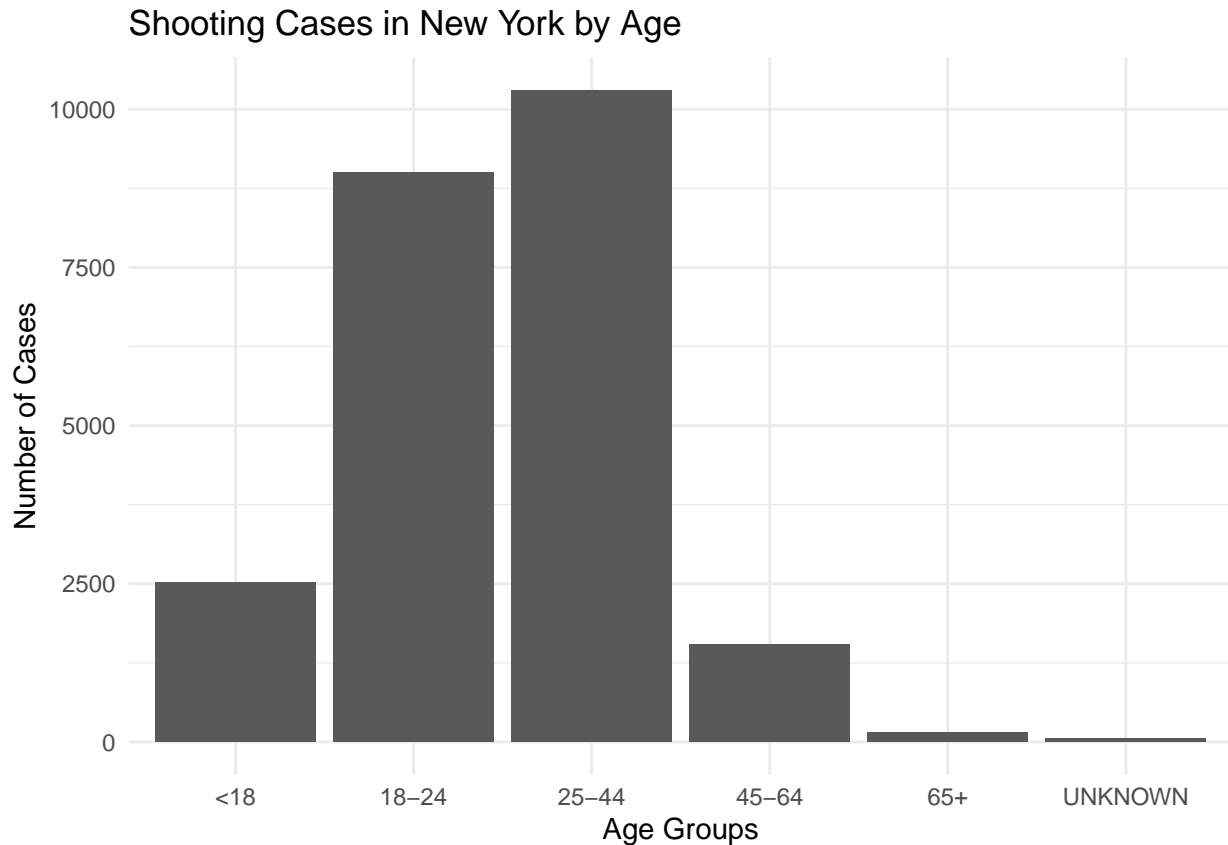
shooting_case_gender_plot
```



Analysis: From the gender plot above, we can see that about 90% of victims are male and about 10% of victims are female. Unknown gender makes up a very small number.

```
# Visualize age groups of victims
shooting_case_age_plot <- ggplot(shooting_cases, aes(x = VIC_AGE_GROUP)) + geom_bar() +
  labs(title = "Shooting Cases in New York by Age", x = "Age Groups", y = "Number of Cases") +
  theme_minimal()

shooting_case_age_plot
```



Analysis: Top two victim age groups are 18-24 and 25-44. A very small number of victims are older than 65.

Model

In this logistic regression model, the independent variables will be VIC_AGE_GROUP, VIC_SEX, VIC_RACE, and dependent variable will be STATISTICAL_MURDER_FLAG. I will to see if the age, gender, and race of the victims affect the murder status.

```
mod <- glm(STATISTICAL_MURDER_FLAG ~ VIC_AGE_GROUP + VIC_SEX + VIC_RACE, data = shooting_cases, family=
summary(mod)
```

```
##
## Call:
## glm(formula = STATISTICAL_MURDER_FLAG ~ VIC_AGE_GROUP + VIC_SEX +
##     VIC_RACE, family = "binomial", data = shooting_cases)
##
## Deviance Residuals:
##      Min       1Q   Median       3Q      Max
## -1.0338  -0.6972  -0.5931  -0.5190   2.3350
##
## Coefficients:
##              Estimate Std. Error z value Pr(>|z|)
## (Intercept)  -12.90709   107.58066  -0.120  0.90450
## VIC_AGE_GROUP18-24    0.28840    0.06647   4.339 1.43e-05 ***
## VIC_AGE_GROUP25-44    0.64643    0.06460  10.006 < 2e-16 ***
## VIC_AGE_GROUP45-64    0.79971    0.08446   9.468 < 2e-16 ***
```



```
## VIC_AGE_GROUP65+          1.16279    0.18224    6.381 1.76e-10 ***
## VIC_AGE_GROUPUNKNOWN      0.92970    0.31915    2.913 0.00358 **
## VIC_SEXM                   -0.02251    0.05725   -0.393 0.69417
## VIC_SEXU                   -0.58048    1.08474   -0.535 0.59256
## VIC_RACEASIAN / PACIFIC ISLANDER 11.28270 107.58071    0.105 0.91647
## VIC_RACEBLACK              10.99264 107.58064    0.102 0.91861
## VIC_RACEBLACK HISPANIC      10.78012 107.58065    0.100 0.92018
## VIC_RACEUNKNOWN            10.27115 107.58146    0.095 0.92394
## VIC_RACEWHITE              11.39679 107.58068    0.106 0.91563
## VIC_RACEWHITE HISPANIC      11.12689 107.58065    0.103 0.91762
## ---
## Signif. codes:  0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
##
## (Dispersion parameter for binomial family taken to be 1)
##
##    Null deviance: 22990  on 23584  degrees of freedom
## Residual deviance: 22706  on 23571  degrees of freedom
## AIC: 22734
##
## Number of Fisher Scoring iterations: 11
```

The model summary shows that victims in younger ages (< 25 years old) are more likely to survive after the shooting. The probability of surviving is decreasing as the ages get increased. And victims in older ages (65+) are less likely to survive.

Conclusion and Bias

The data set shows us that Brooklyn has the highest number of shooting incidents and Staten Island has the lowest number of incidents in New York. Victims are mainly Black and male, between the age of 18-44. The model shows that victims' ages affect the murder status or surviving rate. There is potential for biases occurring here in the data set and model. The given data set are highly specific in one area of New York which is Brooklyn and the victim are mainly Black. The data set is highly imbalanced.

```
sessionInfo()
```