



**NYU**

**TANDON SCHOOL  
OF ENGINEERING**

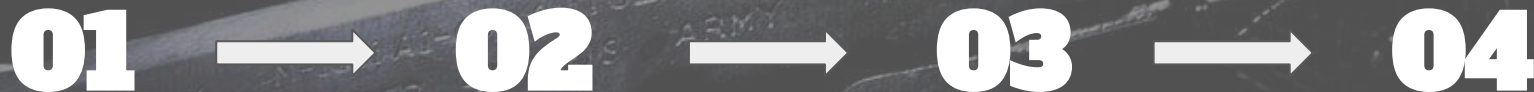
# **New York City Gun Violence Analysis**

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# ETA PIPELINE



## ARTICULATION OF PROBLEM STATEMENT

To Analyse the Gun Violation incidents in NYC based on various factors and bring out useful insights.

## COLLECTION OF DESIRED DATA

Importing two main datasets from NYC Opendata and Kaggle.  
Analysing and Aggregating them.

## DESIGNING MODEL BASED ON ALGORITHM

Clustering the gun violence incidents using K-Means (Top Down) and Agglomerative Clustering (Bottom Up)

## FURTHER ANALYSIS AND CONCLUSION

Further Analysis using additional data and getting useful insights using NYC census tract files. Also, concluding the research.

# DATA ENGINEERING

# Datasets used

- NYC Census tract shapefiles. Source -  
<https://data.cityofnewyork.us/City-Government/2010-Census-Tracts/fxpq-c8ku>
- Kaggle Dataset - Gun violence in USA : Each data point with respect to perpetrator (1 tuple denote = 1 incident).  
<https://www.kaggle.com/duttadebadri/gun-violence-in-usa-insights-forecast>
- NYC Open data - NYPD Shooting Incident Data : Each data point with respect to victim (multiple tuples denote = 1 incident).  
<https://data.cityofnewyork.us/Public-Safety/NYPD-Shooting-Incident-Data-Historic-/833y-fsy8>

'Date' (further splitted into 'day', 'month', 'year', 'day of week'), 'city\_or\_county', ('n\_killed'+ 'n\_injured'), 'latitude', 'longitude', 'victims\_age\_group', 'participant\_gender'

(TOTAL - 10 VARIABLES)



'OCCUR\_DATE (further splitted into 'day', 'month', 'year', 'day of week'), 'OCCUR\_TIME', 'BORO', 'Latitude', 'Longitude', 'Lon\_Lat', PERP\_SEX, VIC\_AGE\_GROUP

(TOTAL - 11 VARIABLES)

Kaggle Dataset

'incident\_id', 'date', 'state', 'city\_or\_county', 'address', 'n\_killed', 'n\_injured', 'incident\_url', 'source\_url', 'incident\_url\_fields\_missing', 'congressional\_district', 'gun\_stolen', 'gun\_type', 'incident\_characteristics', 'latitude', 'location\_description', 'longitude', 'n\_guns\_involved', 'notes', 'participant\_age', 'victims\_age\_group', 'participant\_gender', 'participant\_name', 'participant\_relationship', 'participant\_status', 'participant\_type', 'sources', 'state\_house\_district', 'State\_senate\_district'

(TOTAL- 29 VARIABLES)

NYC Open Dataset

'INCIDENT\_KEY', 'OCCUR\_DATE', 'OCCUR\_TIME', 'BORO', 'PRECINCT', 'JURISDICTION\_CODE', 'LOCATION\_DESC', 'STATISTICAL\_MURDER\_FLAG', 'PERP\_AGE\_GROUP', 'PERP\_SEX', 'PERP\_RACE', 'VIC\_AGE\_GROUP', 'VIC\_SEX', 'VIC\_RACE', 'X\_COORD\_CD', 'Y\_COORD\_CD', 'Latitude', 'Longitude', 'Lon\_Lat'

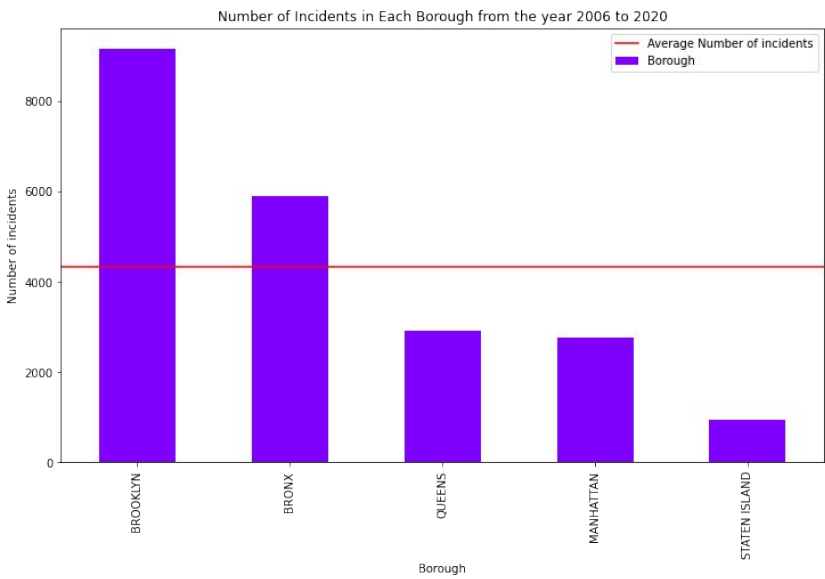
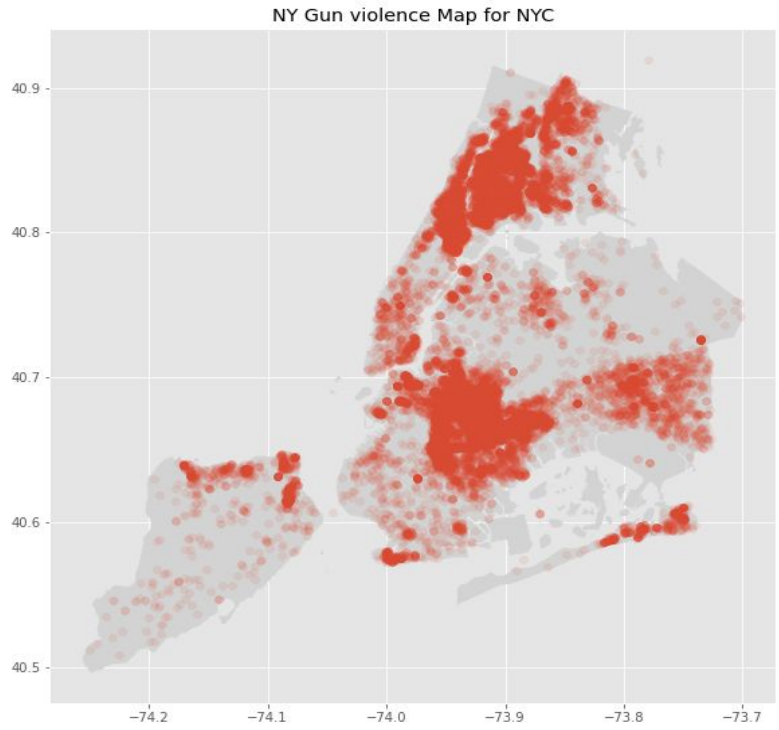
(TOTAL- 19 VARIABLES)

# Data aggregation strategy :

- Combined the tuples in the dataset-2 to convert it into 1 incident = 1 tuple format.
  - Latitudes and Longitudes alone were useless as there can be incidents occurring at same place at multiple times.
  - Used Date and Time along with Latitudes and Longitudes to club tuples into one incident.
  - 'VIC\_AGE\_GROUP' column contained list in every tuple denoting every individual's age group in that incident.
- Vertically joined both the datasets, totally getting around 18466 incidents from the year 2006 to 2020.
- Removed the Null values with respect to Latitudes and Longitudes.



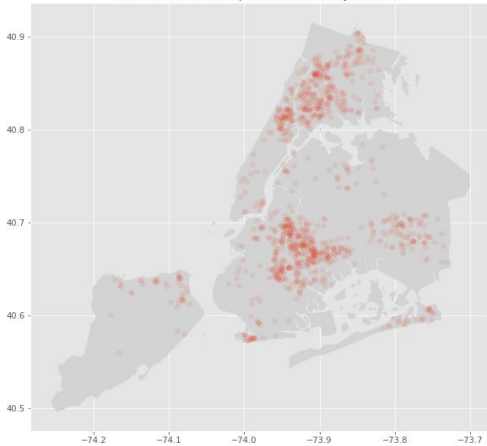
# DATA-ANALYSIS



**! Brooklyn having the max average crime rate !**



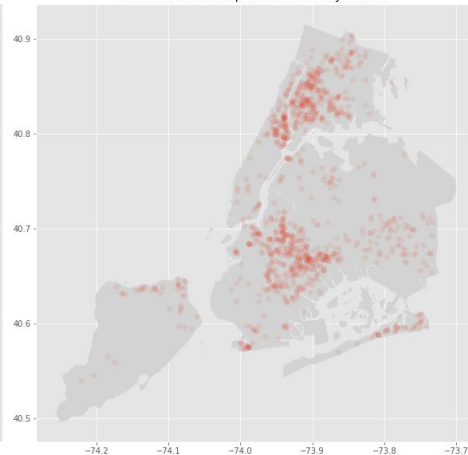
NY Gun violence Map for NYC for the year:2013



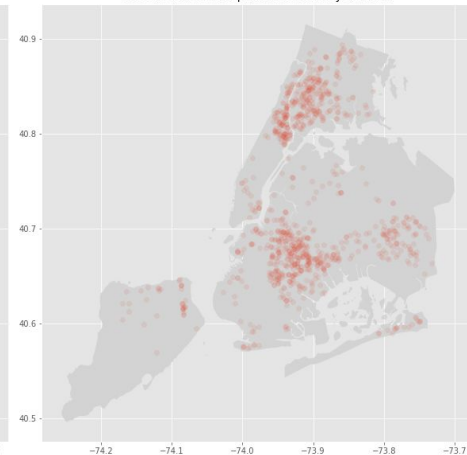
NY Gun violence Map for NYC for the year:2014



NY Gun violence Map for NYC for the year:2015



NY Gun violence Map for NYC for the year:2016



## GUN VIOLENCE MAPS FROM THE YEAR 2013-2020

NY Gun violence Map for NYC for the year:2017



NY Gun violence Map for NYC for the year:2018



NY Gun violence Map for NYC for the year:2019

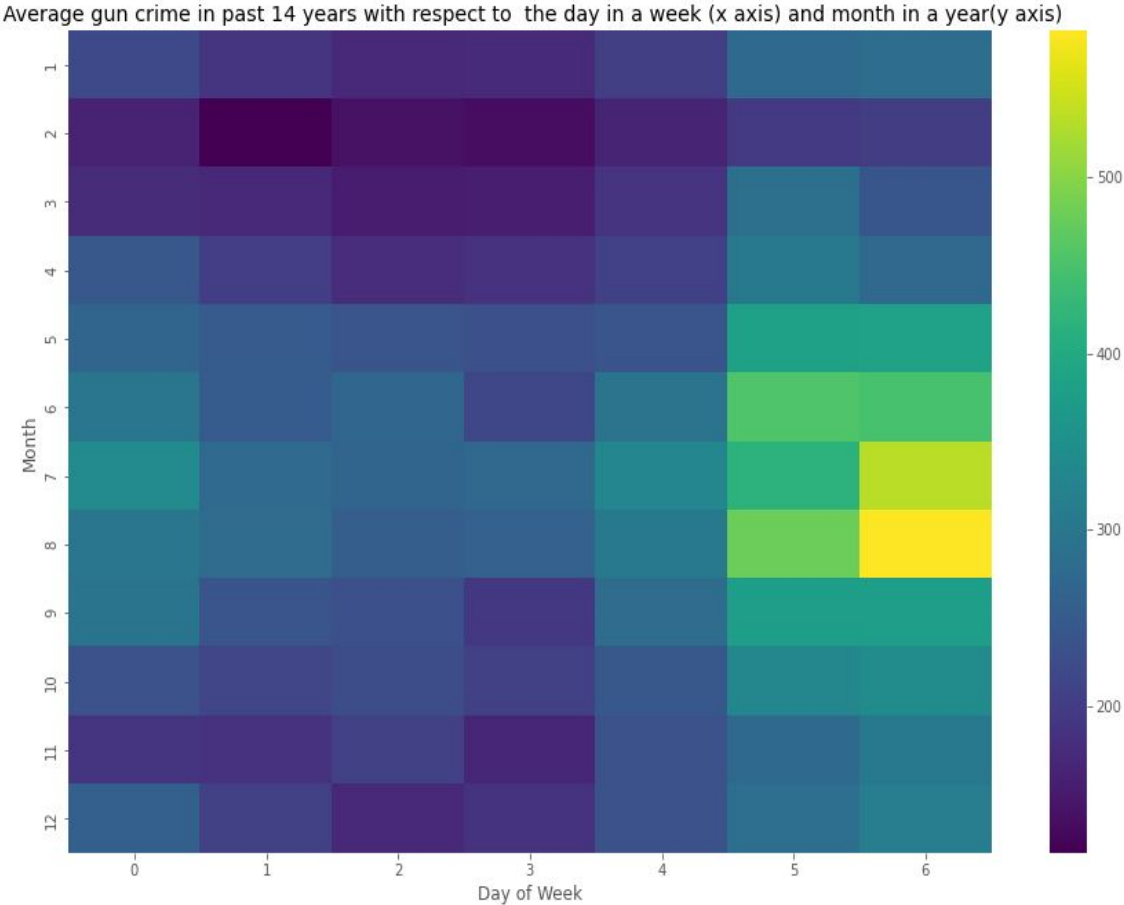


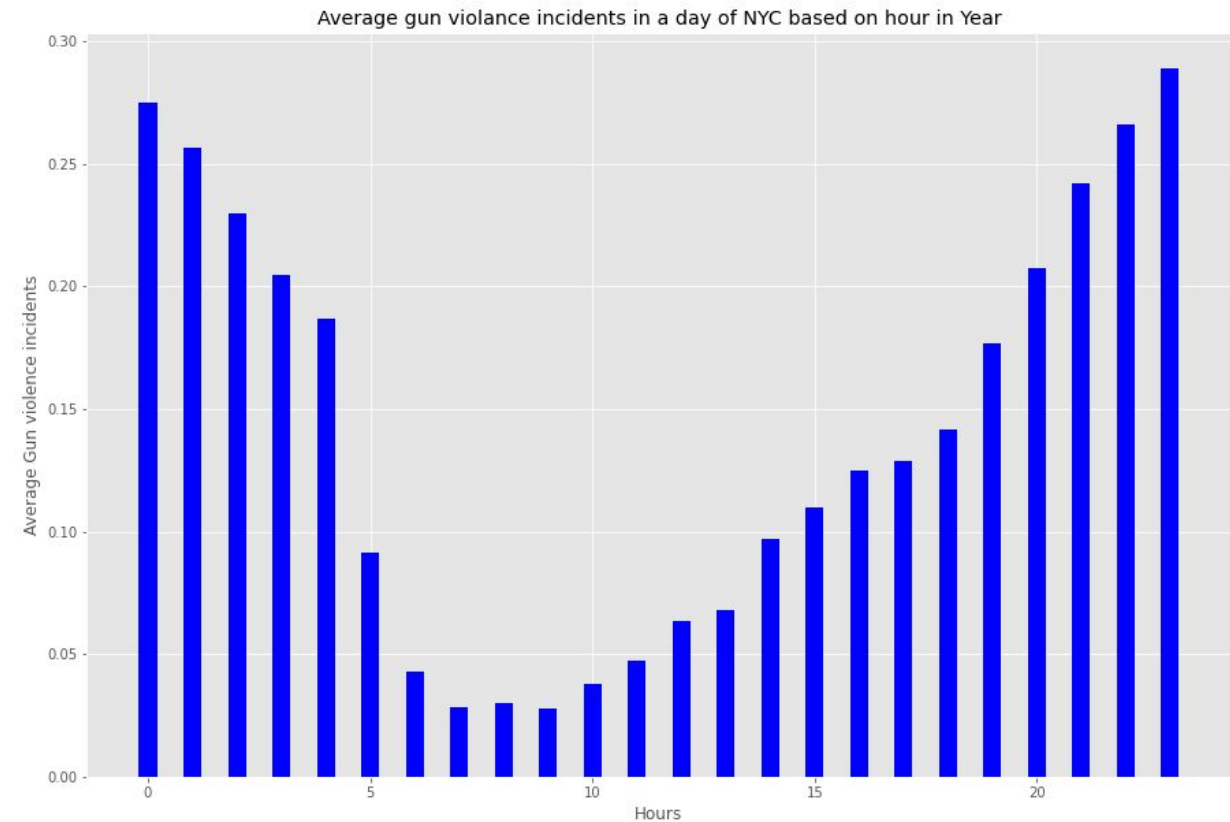
NY Gun violence Map for NYC for the year:2020



**Max violence  
during Summer-  
Fall weekends!!**

Can we attribute weather (in turn,  
population density on roads) to  
this aspect?

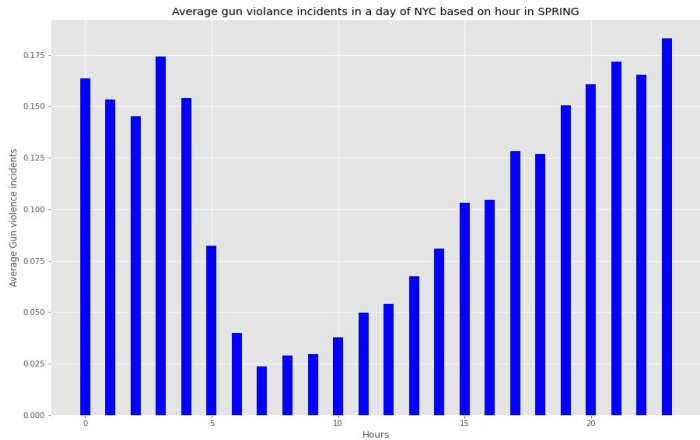




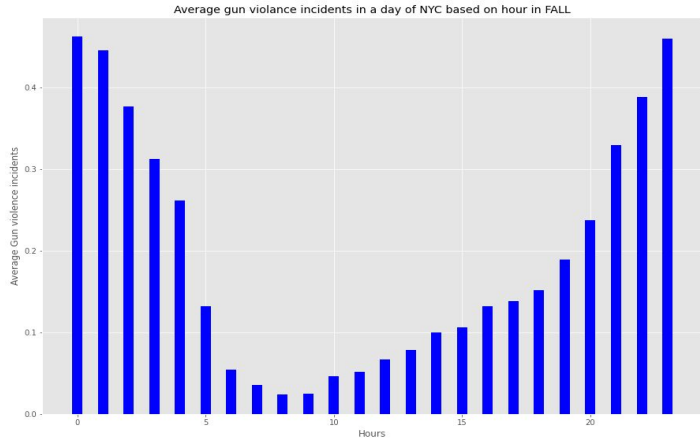
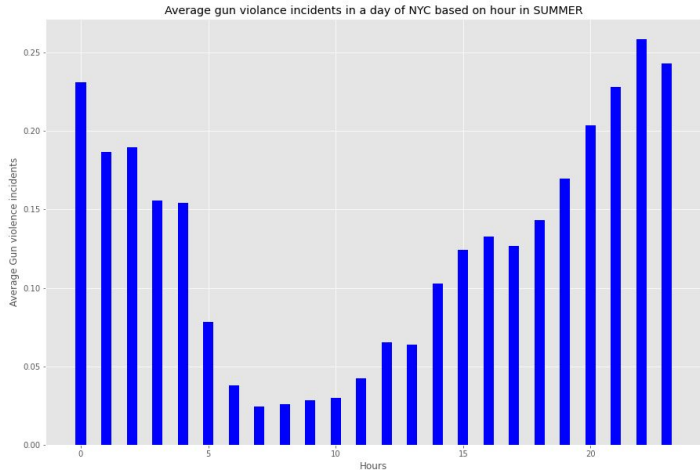
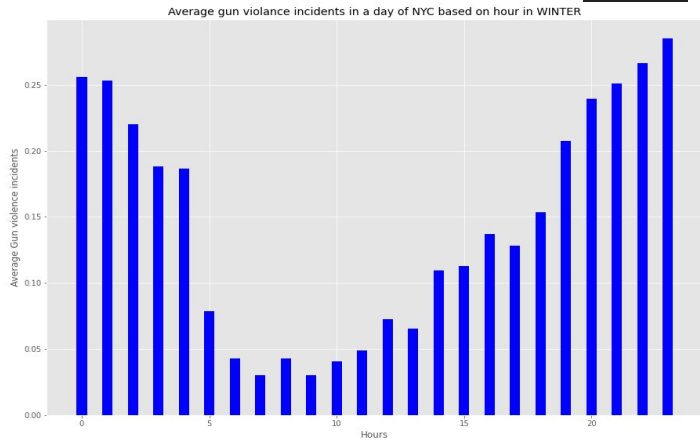
**The chances of Gun violence at night in NYC is approximately 7 times more than day time!**

DATA CONSIDERED : NYC OPEN DATA (2013-2020)

SPRING



WINTER



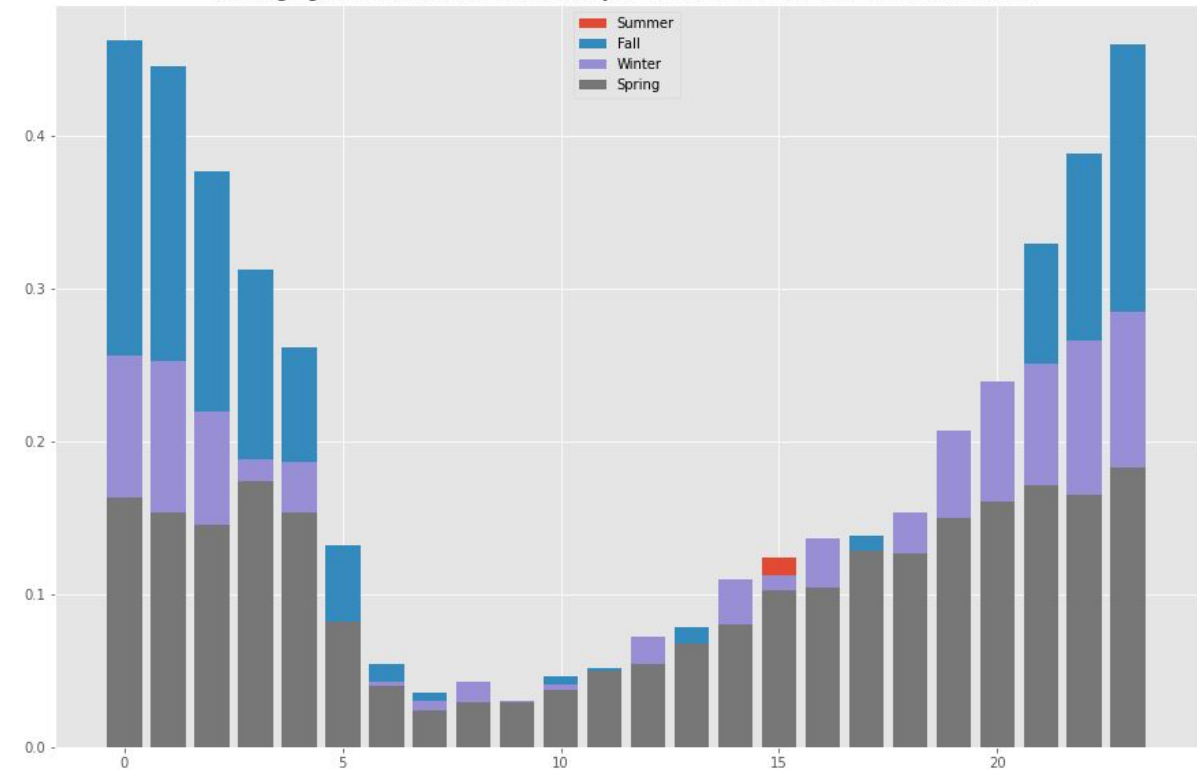
SUMMER

FALL



NYU

Average gun violence incidents in a day of NYC based on hour in different seasons

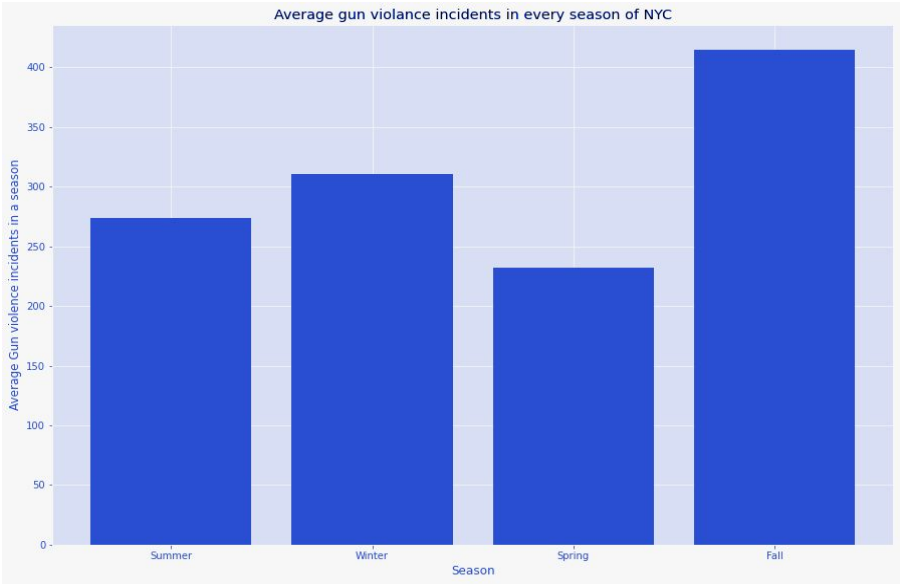


**To be precise, Fall weekend nights are shady!**

DATA CONSIDERED : NYC OPEN DATA (2013-2020)

55%

More gun violence in Fall than Spring season!



# Certainly, pandemic has worsened the gun violence rate. Is unemployment the reason?

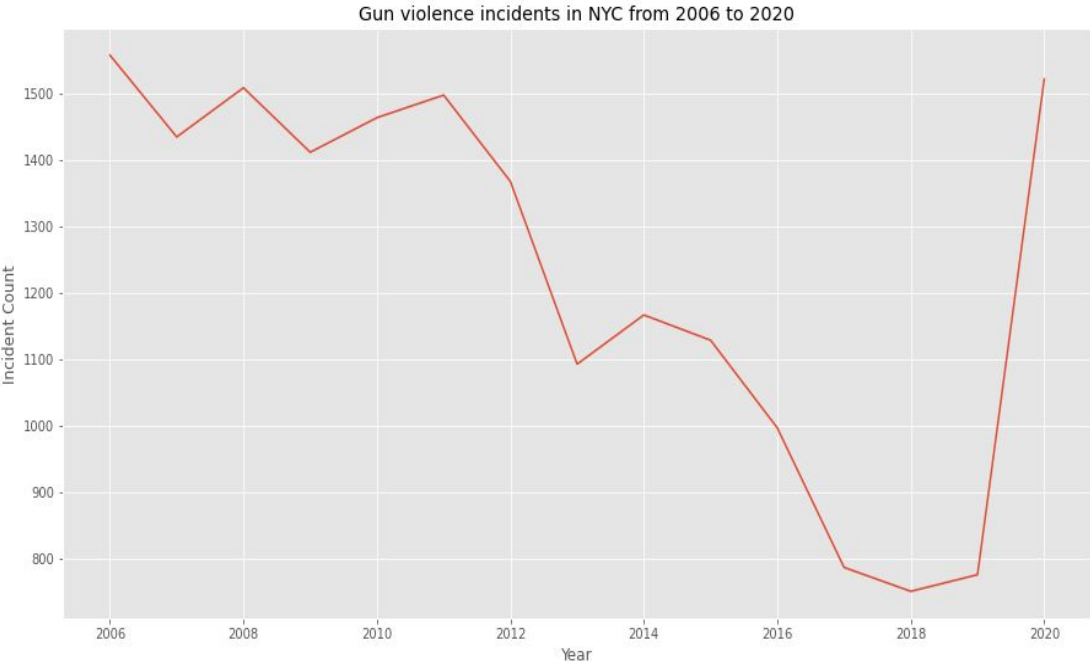
New York City + Add to myFT

## New Yorkers fear return of ‘bad old days’ after shootings surge

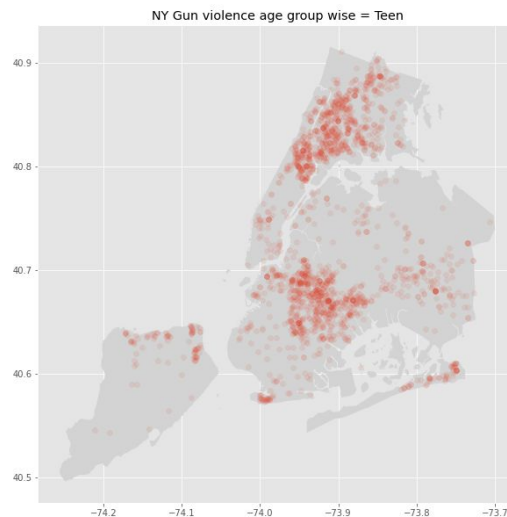
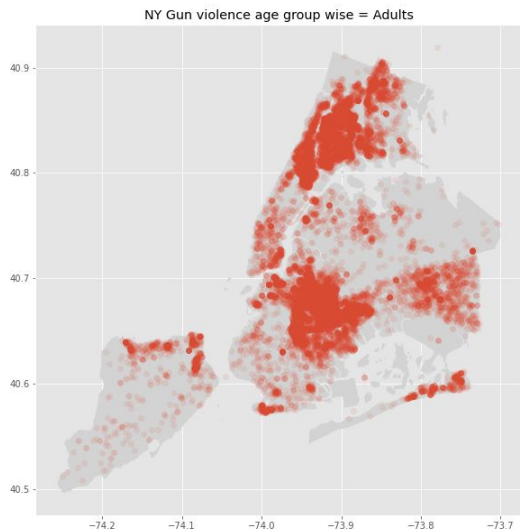
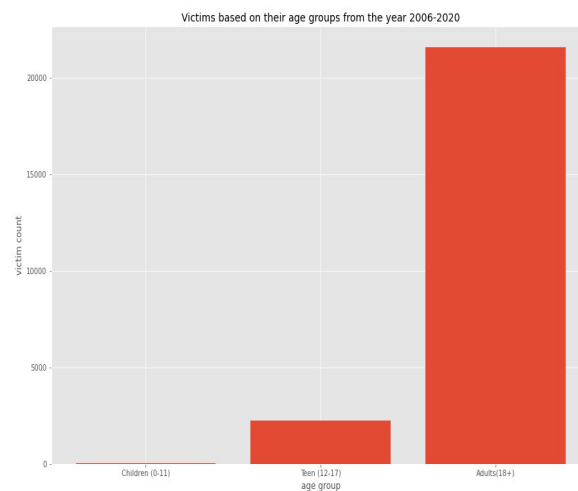
City is rattled by rising tide of violence following a long period of relative peace



A police officer stands near the scene of an afternoon shooting that left one person dead on July 7 in Brooklyn © Spencer Platt/Getty



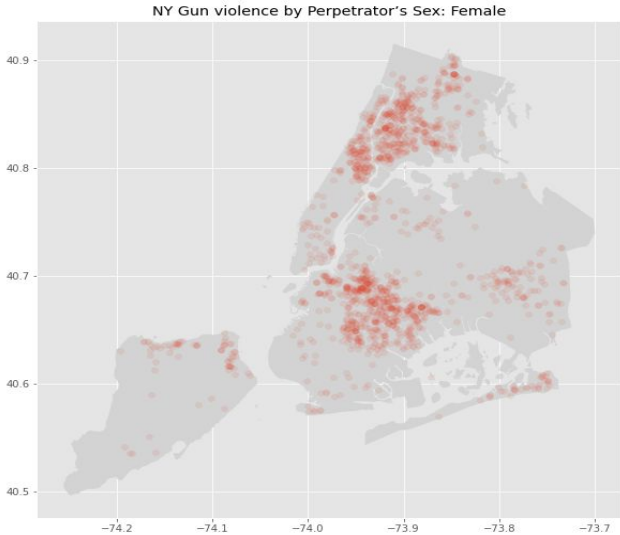
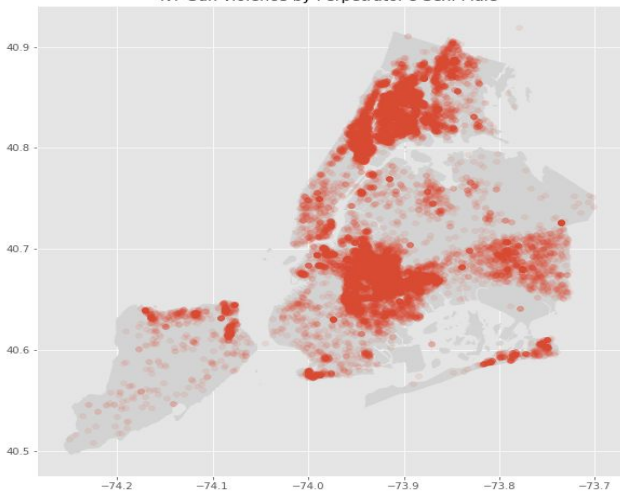
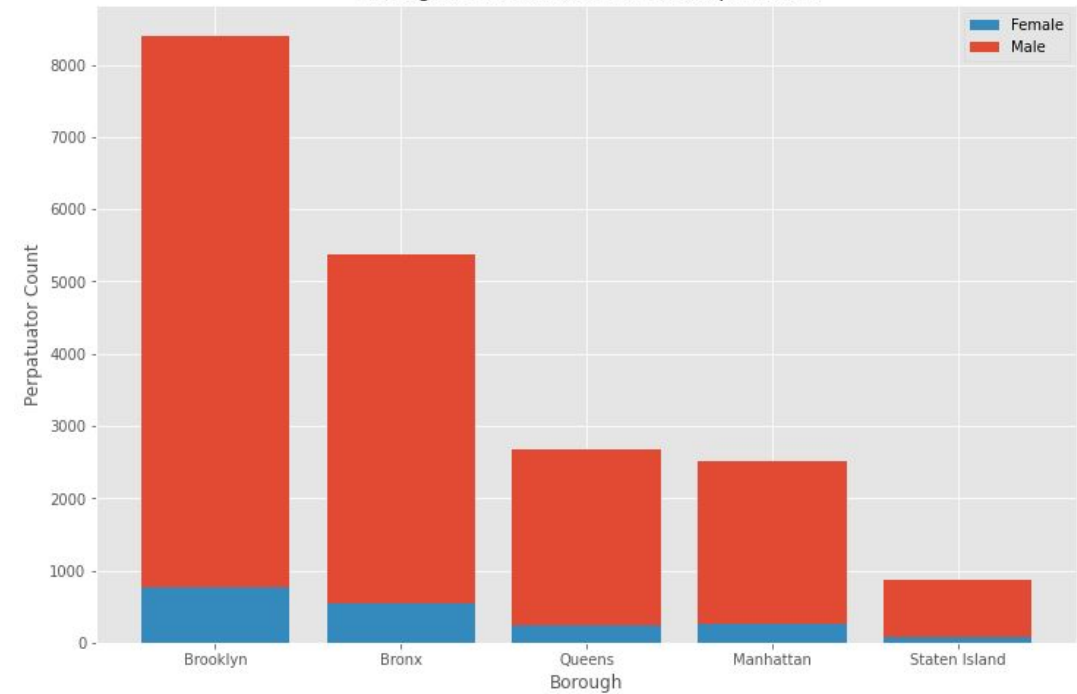
**It is alarming that even Teenagers (age - 12-17) and Children (age <12) are the victims of the gun violence at NYC!!**





# Perpetrator's Analysis (Gender Wise):

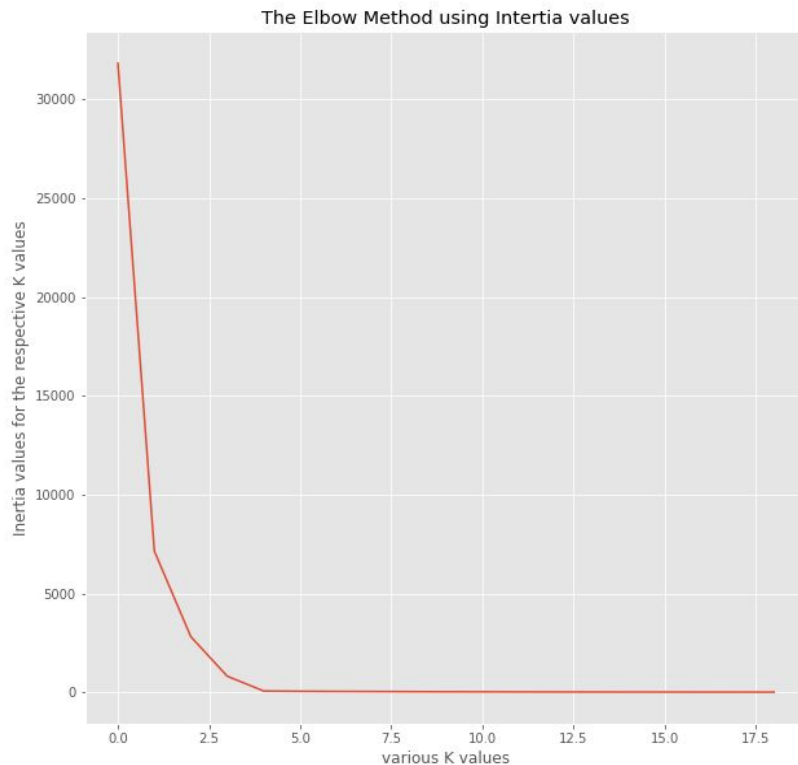
Borough Wise count of women Perpetrators



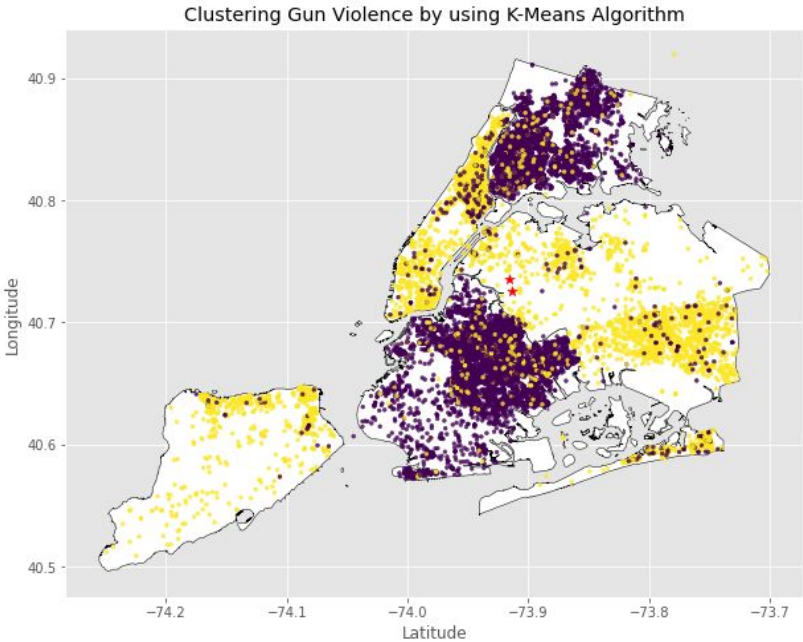
# **GEOSPATIAL-CLUSTERING ANALYSIS**

# How did we negotiate number of clusters?

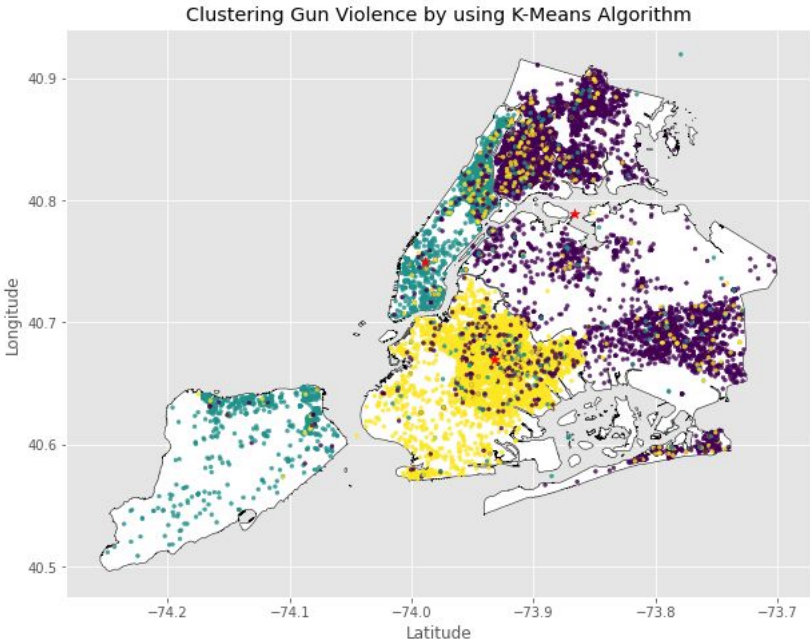
- Used Elbow method for deciding the number of clusters.
- As the Elbow is somewhere around 2.3. So, we will consider  $K=2$  as well as  $K=3$ .
- Must be fun! Let's do the clustering!



# What do the K-Mean clusters have to say?..

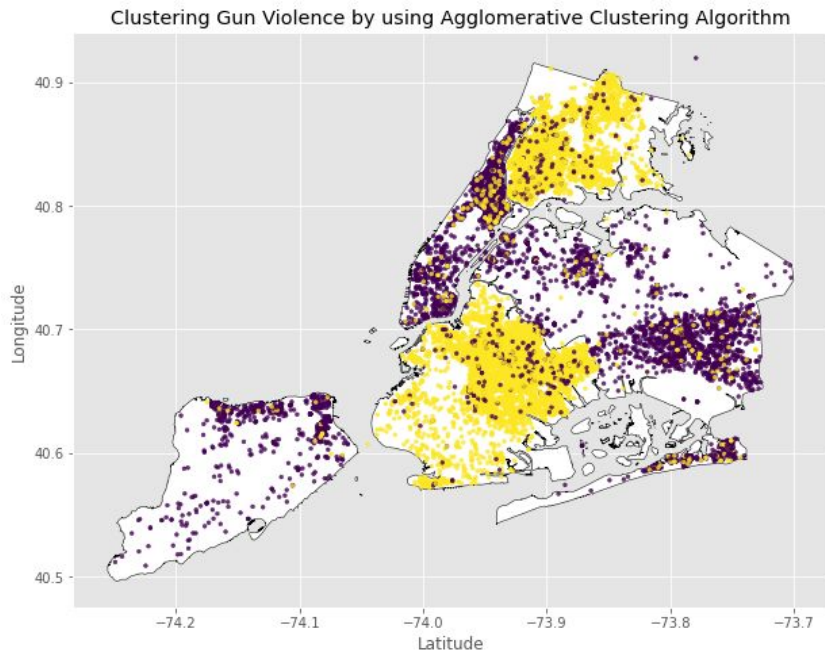


**K=2**

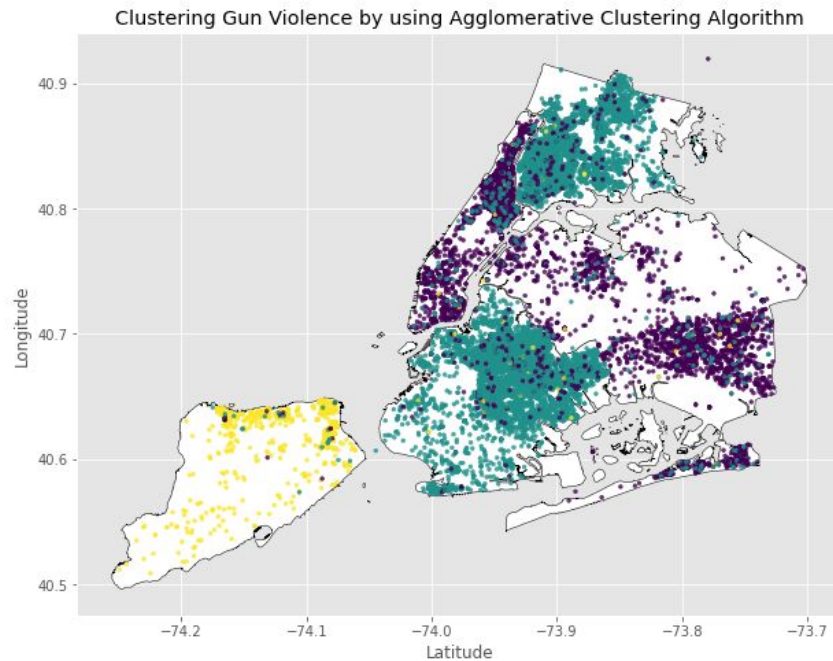


**K=3**

# What do the Agglomerative clusters have to say?..

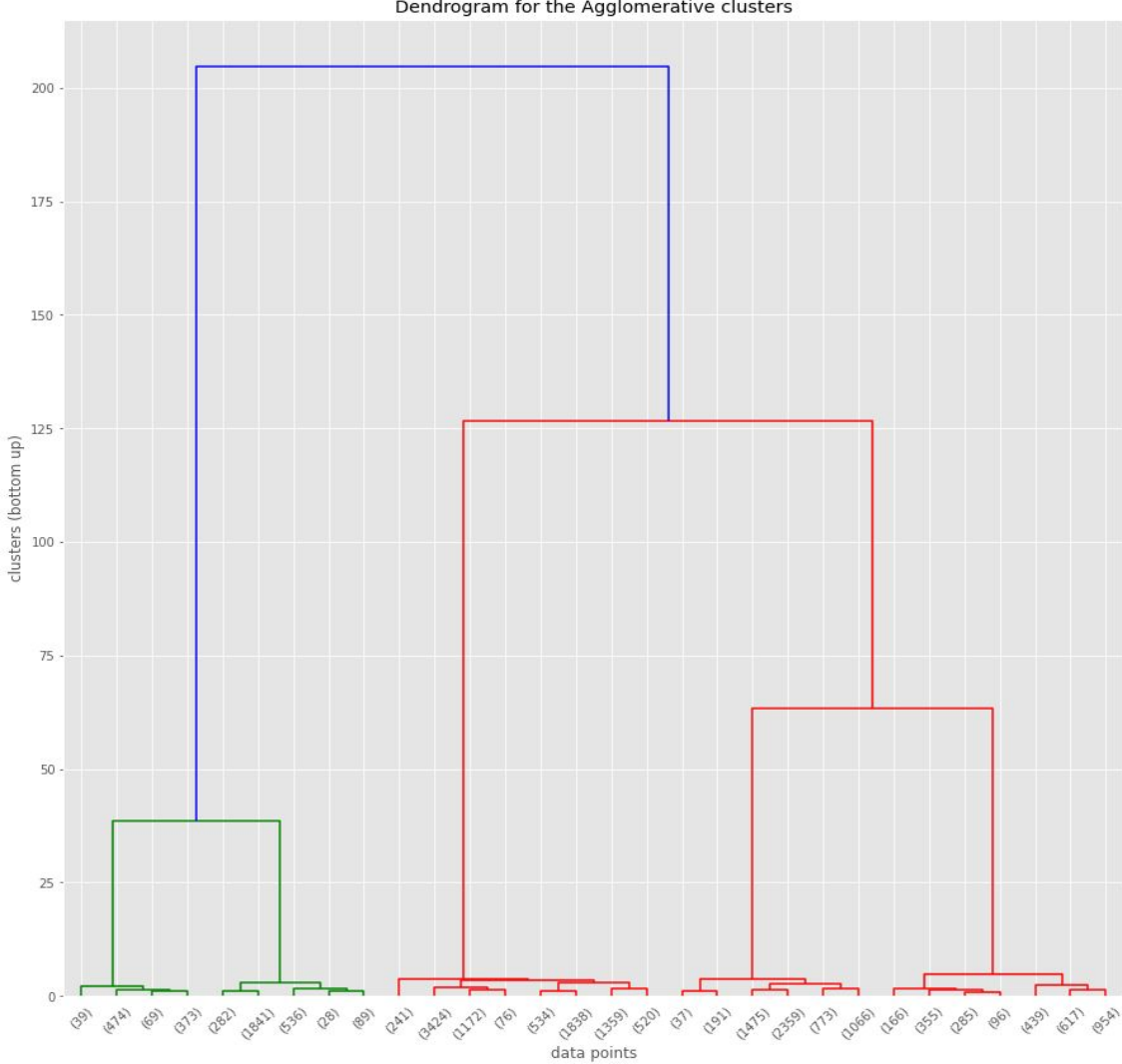


**K=2**



**K=3**

# The Dendrogram that Speaks..



# CONCLUSION



“

We lose eight children and teenagers to gun violence every day. If a mysterious virus suddenly started killing eight of our children every day, America would mobilize teams of doctors and public health officials. We would move heaven and earth until we found a way to protect our children. But not with gun violence.”

– **Elizabeth Warren** (famous American politician and former law professor)



**Thank you!**