



# CIS5200 Term Project Tutorial



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## Lab Tutorial

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## Data Analysis using Spark (NYC-Parking Ticket)

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### Objectives

In this hands-on lab, you will learn how to:

- Uploaded the dataset for New York Parking system
- Data cleaning using Hive
- HiveQL commands to perform the analysis
- Visualization in Power BI, Tableau and 3D map

## Platform Spec

- Oracle Big Data Compute Edition
- CPU Speed: 2195.084
- # of CPU cores: 4 cores, 1 Socket
- # of nodes: 5 nodes
- Total Memory Size: 32GB

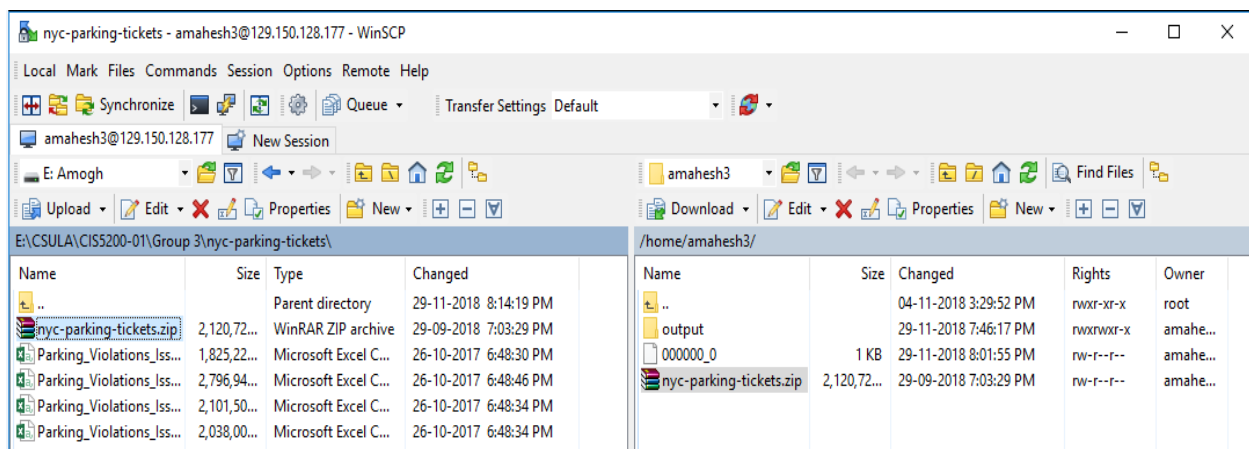
## INTRODUCTION

The NYC Department of Finance collects data on every parking ticket issued in NYC (~10M per year!). The Department of Finance is responsible for collecting and processing payments for all parking tickets and camera violations. This dataset gives an insight on ticket resolution and to guide policymakers. This project will illustrate the usage of Hadoop, MapReduce, HiveQL to generate data, Microsoft PowerBI and 3D map to visualize data.

## Step 1: Data Upload to server

Server IP: 129.150.129.67

- Dataset **nyc-parking-tickets.zip** of size 2GB has been uploaded to the server through WinSCP



- Use the command **unzip nyc-parking-tickets.zip** to extract the files as a csv format.

```
-bash-4.1$ ls
000000_0 nyc-parking-tickets.zip output
-bash-4.1$ unzip nyc-parking-tickets.zip
Archive: nyc-parking-tickets.zip
  inflating: Parking_Violations_Issued_-_Fiscal_Year_2014_August_2013_June_2014_.csv
  inflating: Parking_Violations_Issued_-_Fiscal_Year_2017.csv
  inflating: Parking_Violations_Issued_-_Fiscal_Year_2016.csv
  inflating: Parking_Violations_Issued_-_Fiscal_Year_2015.csv
-bash-4.1$ ls
000000_0          Parking_Violations_Issued_-_Fiscal_Year_2014_August_2013_June_2014_.csv  Parking_Violations_Issued_-_Fiscal_Year_2017.csv
nyc-parking-tickets.zip  Parking_Violations_Issued_-_Fiscal_Year_2015.csv
output                Parking_Violations_Issued_-_Fiscal_Year_2016.csv
```

## Step 2: Uploading data to HDFS

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- Use this command to upload the data from the Linux server to HDFS

```
hdfs dfs -put Parking_Violations_Issued_-_Fiscal_Year_2014.csv
hdfs dfs -put Parking_Violations_Issued_-_Fiscal_Year_2015.csv
hdfs dfs -put Parking_Violations_Issued_-_Fiscal_Year_2016.csv
hdfs dfs -put Parking_Violations_Issued_-_Fiscal_Year_2017.csv
```

```
-bash-4.1$ hdfs dfs -put Parking_Violations_Issued_-_Fiscal_Year_2014.csv
-bash-4.1$ hdfs dfs -put Parking_Violations_Issued_-_Fiscal_Year_2015.csv
-bash-4.1$ hdfs dfs -put Parking_Violations_Issued_-_Fiscal_Year_2016.csv
-bash-4.1$ hdfs dfs -put Parking_Violations_Issued_-_Fiscal_Year_2017.csv
```

- Create folders using **mkdir** command, Change the permission for the file using below command to get full access to the file,

```
Hdfs dfs -chmod -R o+w Group3/master 2014
Hdfs dfs -chmod -R o+w Group3/master 2015
Hdfs dfs -chmod -R o+w Group3/master 2016
Hdfs dfs -chmod -R o+w Group3/master 2017
```

```

-bash-4.1$ hdfs dfs -mkdir Group3/master2014
-bash-4.1$ hdfs dfs -chmod -R o+w Group3/master2014/
-bash-4.1$ hdfs dfs -mv Group3/Parking_Violations_Issued_-_Fiscal_Year_2014.csv Group3/master2014/
-bash-4.1$ hdfs dfs -chmod -R o+w Group3/master2014/
-bash-4.1$ hdfs dfs -mkdir Group3/master2015
-bash-4.1$ hdfs dfs -chmod -R o+w Group3/master2015/
-bash-4.1$ hdfs dfs -mv Group3/Parking_Violations_Issued_-_Fiscal_Year_2015.csv Group3/master2015/
-bash-4.1$ hdfs dfs -mkdir Group3/master2016
-bash-4.1$ hdfs dfs -chmod -R o+w Group3/master2016/
-bash-4.1$ hdfs dfs -mv Group3/Parking_Violations_Issued_-_Fiscal_Year_2016.csv Group3/master2016/
-bash-4.1$ hdfs dfs -chmod -R o+w Group3/master2016/
-bash-4.1$ hdfs dfs -mkdir Group3/master2017
-bash-4.1$ hdfs dfs -chmod -R o+w Group3/master2017/
-bash-4.1$ hdfs dfs -mv Group3/Parking_Violations_Issued_-_Fiscal_Year_2017.csv Group3/master2017/
-bash-4.1$ hdfs dfs -chmod -R o+w Group3/master2017/

```

## Step 3: Connecting server to HIVE

- Use the command **beeline** to connect with to Hive

```

!connect jdbc:hive2://cis5200-bdcsce-4.compute-
08214094.oraclecloud.internal:2181,cis5200-bdcsce-2.compute-
608214094.oraclecloud.internal:2181,cis5200-bdcsce-3.compute-
608214094.oraclecloud.internal:2181/;serviceDiscoveryMode=zooKeeper;zooKeeperN
amespace=hiveserver2?tez.queue.name=interactive bdcsce_admin

```

```

-bash-4.1$ beeline
WARNING: Use "yarn jar" to launch YARN applications.
Beeline version 1.2.1000.2.4.2.0-258 by Apache Hive
beeline> !connect jdbc:hive2://cis5200-bdcsce-4.compute-608214094.oraclecloud.internal:2181,cis5200-bdcsce-2.com
pute-608214094.oraclecloud.internal:2181,cis5200-bdcsce-3.compute-608214094.oraclecloud.internal:2181/;serviceDi
scoveryMode=zooKeeper;zooKeeperNamespace=hiveserver2?tez.queue.name=interactive bdcsce_admin
Connecting to jdbc:hive2://cis5200-bdcsce-4.compute-608214094.oraclecloud.internal:2181,cis5200-bdcsce-2.compute
-608214094.oraclecloud.internal:2181,cis5200-bdcsce-3.compute-608214094.oraclecloud.internal:2181/;serviceDiscov
eryMode=zooKeeper;zooKeeperNamespace=hiveserver2?tez.queue.name=interactive
Enter password for jdbc:hive2://cis5200-bdcsce-4.compute-608214094.oraclecloud.internal:2181,cis5200-bdcsce-2.co
mpute-608214094.oraclecloud.internal:2181,cis5200-bdcsce-3.compute-608214094.oraclecloud.internal:2181/;serviceD
iscoveryMode=zooKeeper;zooKeeperNamespace=hiveserver2?tez.queue.name=interactive:
Connected to: Apache Hive (version 1.2.1000.2.4.2.0-258)
Driver: Hive JDBC (version 1.2.1000.2.4.2.0-258)
Transaction isolation: TRANSACTION_REPEATABLE_READ
0: jdbc:hive2://cis5200-bdcsce-4.compute-6082>

```

## Step 4: Creating Database

---

- Use the command to create database,

```
Create database group3;
```

- To view the newly created database use,

```
Show databases;
```

```
0: jdbc:hive2://cis5200-bdcsce-4.compute-6082> show databases;
+-----+-----+
| database_name |
+-----+-----+
| abugari3      |
| acan019      |
| achan97      |
| ali31        |
| aliu38       |
| amahesh3     |
| asolank5     |
| atasgao      |
| baseball_salaries
| baseball_salaries_dpaz6
| bseto        |
| bwonse       |
| clopel51     |
| default      |
| dha          |
| dmanato      |
| dnayak       |
| dpakhal      |
| group3       |
| hahab36     |
```

## Step 5: Creating Tables in Database

---

- To Create External table, use below command,

```
CREATE EXTERNAL TABLE IF NOT EXISTS NYC_parking2015(Summons_Number
BIGINT,Plate_ID STRING,Registration_State STRING,Plate_Type
STRING,Issue_Date STRING,Violation_Code BIGINT,Vehicle_Body_Type
STRING,Vehicle_Make STRING,Issuing_Agency STRING,Street_Code1
BIGINT,Street_Code2 BIGINT,Street_Code3
BIGINT,Vehicle_Expiration_Date BIGINT,Violation_Location
STRING,Violation_Precinct BIGINT,Issuer_Precinct BIGINT,Issuer_Code
BIGINT,Issuer_Command STRING,Issuer_Squad STRING,Violation_Time
STRING,Time_First_Observed STRING,Violation_County
STRING,Violation_In_Front_Of_Or_Opposite STRING,House_number
BIGINT,Street_Name STRING,Intersecting_Street
STRING,Date_First_Observed BIGINT,Law_Section BIGINT,Sub_Division
STRING,Violation_Legal_Code STRING,Days_Parking_In_Effect
STRING,From_Hours_In_Effect STRING,To_Hours_In_Effect
STRING,Vehicle_Color STRING,Unregistered_Vehicle
STRING,Vehicle_Year BIGINT,Meter_number BIGINT,Feet_From_Curb
BIGINT,Violation_Post_Code STRING,Violation_Description
STRING,No_Standing_or_Stopping_Violation STRING,Hydrant_Violation
STRING,Double_Parking_Violation STRING,Latitude BIGINT,Longitude
BIGINT,Community_Board BIGINT,Community_Council
BIGINT,Census_Tract BIGINT,BIN BIGINT,BBL BIGINT,NTA STRING)
ROW FORMAT DELIMITED FIELDS TERMINATED BY ','
STORED AS TEXTFILE LOCATION '/user/amahesh3/Group3/master2014'
TBLPROPERTIES ('skip.header.line.count'='1');
```

**NOTE:** Use the same create table query for the other 3 years.

## Step 6: Dataset cleaning in Hive

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As the New York City parking ticket dataset has more number of unwanted data like blank cells and irrelevant data it needs to be filtered out and saved as new files: Clean\_nyc2014, Clean\_nyc2015, Clean\_nyc2016, Clean\_nyc2017 in the path [/user/amahesh3/ Group3/](#)

- Use the below command to clean the dataset,

```
CREATE TABLE clean_nyc2014
ROW FORMAT DELIMITED FIELDS TERMINATED BY ','
STORED AS TEXTFILE LOCATION
'/user/amahesh3/Group3/master2014/clean_nyc2014'
AS
SELECT
    summons_number,plate_id,registration_state,plate_type,issue_date
    ,violation_code,vehicle_body_type,vehicle_make,issuing_agency,st
    reet_code1,street_code2,street_code3,vehicle_expiration_date,iss
    uer_code,issuer_command,violation_time,time_first_observed,viola
    tion_county,violation_in_front_of_or_opposite,house_number,stree
    t_name,date_first_observed,vehicle_color,vehicle_year,meter_numb
    er,violation_description from nyc_parking2015
where
    registration_state != 99 OR plate_id != 999 OR vehicle_make != '
    ' OR street_code1 != 0 OR street_code2 != 0 OR street_code3 != 0
    OR issuer_code != 0 OR time_first_observed != ' ' OR
    violation_county != ' ' OR violation_in_front_of_or_opposite !=
    ' ' OR house_number != ' ' OR vehicle_color != ' ' OR
    vehicle_year != 0 OR meter_number != ' ' OR
    violation_description != ' ';
```

**NOTE:** Use the same create table query for the other 3 years.

- Use the command to view all the tables in the database,

**Show tables;**

```
0: jdbc:hive2://cis5200-bdcsce-4.compute-6082> use group3;
No rows affected (0.159 seconds)
0: jdbc:hive2://cis5200-bdcsce-4.compute-6082> show tables;
+-----+
| tab_name |
+-----+
| clean_nyc2014 |
| clean_nyc2015 |
| clean_nyc2016 |
| clean_nyc2017 |
| nyc_parking2014 |
| nyc_parking2015 |
| nyc_parking2016 |
| nyc_parking2017 |
+-----+
8 rows selected (0.177 seconds)
0: jdbc:hive2://cis5200-bdcsce-4.compute-6082> █
```



## Step 7: Creating Hive Queries to Analyze Data

The following Hive queries analyses the New York city parking tickets for the following year **2014**.

1. Query to analyse the Total number of Violated Parking tickets which has been recorded during in the year 2014

```
CREATE TABLE tickets_count_2014
ROW FORMAT DELIMITED FIELDS TERMINATED BY ','
STORED AS TEXTFILE LOCATION
/user/amahesh3/Group3/master2014/clean_nyc2014/tickets_count_2014'
AS
select count(summons_number) as number_of_violations from clean_nyc2014;
```

```
INFO : Map 1: 41/41 Reducer 2: 0(+1)/1
INFO : Map 1: 41/41 Reducer 2: 1/1
+-----+-----+
| number_of_violations |
+-----+-----+
| 9100280 |
+-----+-----+
1 row selected (21.474 seconds)
```

2. Query to find out top 10 registration state of the vehicle which has done Parking violation NYC in 2014.

```
CREATE TABLE vehicle_registered_state2014
ROW FORMAT DELIMITED FIELDS TERMINATED BY ','
STORED AS TEXTFILE LOCATION
/user/amahesh3/Group3/master2014/clean_nyc2014/vehicle_registered_state2014'
AS
select registration_state, count(registration_state) as number_of_vehicle_registered from
clean_nyc2014 group by registration_state order by number_of_vehicle_registered desc
limit 10 ;
```

```
+-----+-----+
| registration_state | number_of_vehicle_registered |
+-----+-----+
| NY | 7029787 |
| NJ | 878653 |
| PA | 225757 |
| CT | 136970 |
| FL | 111883 |
| MA | 78648 |
| VA | 60950 |
| MD | 50404 |
| IN | 49126 |
| NC | 47113 |
+-----+-----+
10 rows selected (16.342 seconds)
```

3. Query to find out top 10 violations in NYC based on the vehicle body types in the year 2014.

```
CREATE TABLE violations_vehicle_type2014
ROW FORMAT DELIMITED FIELDS TERMINATED BY ','
STORED AS TEXTFILE LOCATION
'/user/amahesh3/Group3/master2014/clean_nyc2014/violations_vehicle_type2014'
AS
select vehicle_body_type, count(vehicle_body_type) as number_of_vehicles from
clean_nyc2014 where vehicle_body_type != "" group by vehicle_body_type order by
number_of_vehicles desc limit 10;
```

```
0: jdbc:hive2://cis5200-bdcsce-4.compute-6082> select * from violations_vehicle_type2014;
+-----+-----+
| violations_vehicle_type2014.vehicle_body_type | violations_vehicle_type2014.number_of_vehicles |
+-----+-----+
| SUBN | 2797673 |
| 4DSD | 2513564 |
| VAN | 1384386 |
| DELV | 730517 |
| SDN | 441801 |
| 2DSD | 255200 |
| PICK | 226119 |
| UTIL | 78454 |
| REFG | 64904 |
| TRAC | 62699 |
+-----+-----+
10 rows selected (0.076 seconds)
```

4. Query to find out top 10 vehicle which has violated the parking law of New York city frequently in the following years,

```
CREATE TABLE tickets_for_plate_id2014
ROW FORMAT DELIMITED FIELDS TERMINATED BY ','
STORED AS TEXTFILE LOCATION
'/user/amahesh3/Group3/master2014/clean_nyc2014/tickets_for_plate_id2014'
AS
select plate_id , vehicle_body_type, vehicle_make, count(plate_id) as tickets_received
from clean_nyc2015 where plate_id != "BLANKPLATE" group by plate_id ,
vehicle_make, vehicle_body_type order by tickets_received desc limit 10 ;
```

plate_id	vehicle_body_type	vehicle_make	tickets_received
62901JM	DELV	INTER	958
92979JE	DELV	INTER	864
47603MD	DELV	PETER	846
75225JW	DELV	FRUEH	842
62627JM	DELV	INTER	768
68092JZ	DELV	HINO	767
17442JE	DELV	INTER	760
63098JM	VAN	GMC	735
17744MD	DELV	PETER	709
49781MA	DELV	KENWO	676

10 rows selected (34.641 seconds)

5. Query to find out Number of tickets recorded during public holidays in NYC

```
CREATE TABLE tickets_on_public_holidays2014
ROW FORMAT DELIMITED FIELDS TERMINATED BY ','
STORED AS TEXTFILE LOCATION
'/user/amahesh3/Group3/master2014/clean_nyc2014/tickets_on_public_holidays2014'
AS
select issue_date, count(issue_date) as number_of_violations from clean_nyc2014 where
issue_date in ( "12/25/2014" , "01/01/2014", "07/04/2014", "09/03/2014", "11/28/2014")
group by issue_date limit 10;
```

issue_date	number_of_violations
11/28/2014	8
01/01/2014	5114
12/25/2014	2
09/03/2014	21
07/04/2014	10

5 rows selected (22.79 seconds)

6. Query to find out top 5 dates which got recorded with maximum number of tickets in year 2014.

```
CREATE TABLE date_high_tickets2014
ROW FORMAT DELIMITED FIELDS TERMINATED BY ','
STORED AS TEXTFILE LOCATION
'/user/amahesh3/Group3/master2014/clean_nyc2014/date_high_tickets2014'
AS
select issue_date, count(issue_date) as number_of_violations from clean_nyc2014 group by
issue_date order by number_of_violations desc limit 5;
```

issue_date	number_of_violations
11/29/2013	46023
10/03/2013	41359
10/08/2013	41103
10/01/2013	40664
03/06/2014	40639

5 rows selected (23.221 seconds)

7. Query to find out top 5 vehicle brand received highest number of tickets in 2014.

```
CREATE TABLE violation_wrt_vehicle_make2014
ROW FORMAT DELIMITED FIELDS TERMINATED BY ','
STORED AS TEXTFILE LOCATION
'/user/amahesh3/Group3/master2014/clean_nyc2014/violation_wrt_vehicle_make2014'
AS
select vehicle_make, count (vehicle_make ) as number_of_violations from clean_nyc2014 group
by vehicle_make order by number_of_violations desc limit 5;
```

vehicle_make	number_of_violations
FORD	1248618
TOYOT	878781
HONDA	810453
CHEVR	743552
NISSA	655271

5 rows selected (17.51 seconds)

8. Query to find out which street in New York city has got the greatest number of tickets.

```
CREATE TABLE most_violated_location2014
ROW FORMAT DELIMITED FIELDS TERMINATED BY ','
STORED AS TEXTFILE LOCATION
'/user/amahesh3/Group3/master2014/clean_nyc2014/most_violated_location2014'
AS
select
violation_in_front_of_or_opposite,house_number,street_name,violation_county,count(house
_number) as number_of_violations_nearby from clean_nyc2014 group by
violation_in_front_of_or_opposite,house_number,street_name,violation_county order by
number_of_violations_nearby desc limit 10;
```

violation_in_front_of_or_opposite	house_number	street_name	violation_county	number_of_violations_nearby
F	2655	Richmond Ave	R	2091
O	365	Bridge St	K	1932
F	448	W 16th St	NY	1728
F	16	E 58th St	NY	1515
F	55	E 59th St	NY	1421
F	99	Warren St	NY	1369
O	1330	1st Ave	NY	1357
F	1546	2nd Ave	NY	1353
F	20	Pine St	NY	1343
F	12	E 49th St	NY	1340

10 rows selected (25.514 seconds)

9. Street which has a least number of parking tickets recorded in 2014.

```
CREATE TABLE least_violated_location2014
ROW FORMAT DELIMITED FIELDS TERMINATED BY ','
STORED AS TEXTFILE LOCATION
'/user/amahesh3/Group3/master2014/clean_nyc2014/least_violated_location2014'
AS
select street_name,violation_county,count(street_name) as number_of_violations_nearby
from clean_nyc2014 where street_name != " AND violation_county != " group by
street_name,violation_county order by number_of_violations_nearby asc limit 10;
```

street_name	violation_county	number_of_violations_nearby
"24 ST	R	1
ZULLETTE	BX	1
"C/O S	K	1
"S/S 129TH ST 5	NY	1
"W/S/O 4 ST	Q	1
02 FLB	Q	1
0414 ELKE8L	NY	1
`EAST 21 STREET	K	1
1 AVE	BX	1
1 CJO GBMUTF46 HON	K	1

10 rows selected (18.933 seconds)

10. Query to find the top 5 most occurred type of violation.

```
CREATE TABLE tickets_description_2014
ROW FORMAT DELIMITED FIELDS TERMINATED BY ','
STORED AS TEXTFILE LOCATION
'/user/amahesh3/Group3/master2014/clean_nyc2014/tickets_description_2014'
AS
select violation_description, count (violation_description) as
number_of_violation from clean_nyc2014 where violation_description !=
'' group by violation_description order by number_of_violation desc
limit 5;
```

violation_description	number_of_violation
38-Failure to Display Muni Rec	1230031
21-No Parking (street clean)	1086664
14-No Standing	753551
37-Expired Muni Meter	731685
FAILURE TO STOP AT RED LIGHT	433192

5 rows selected (17.325 seconds)

## Step 8: Exporting data from HIVE

---

Use the below command to export the table from HDFS to Linux server,

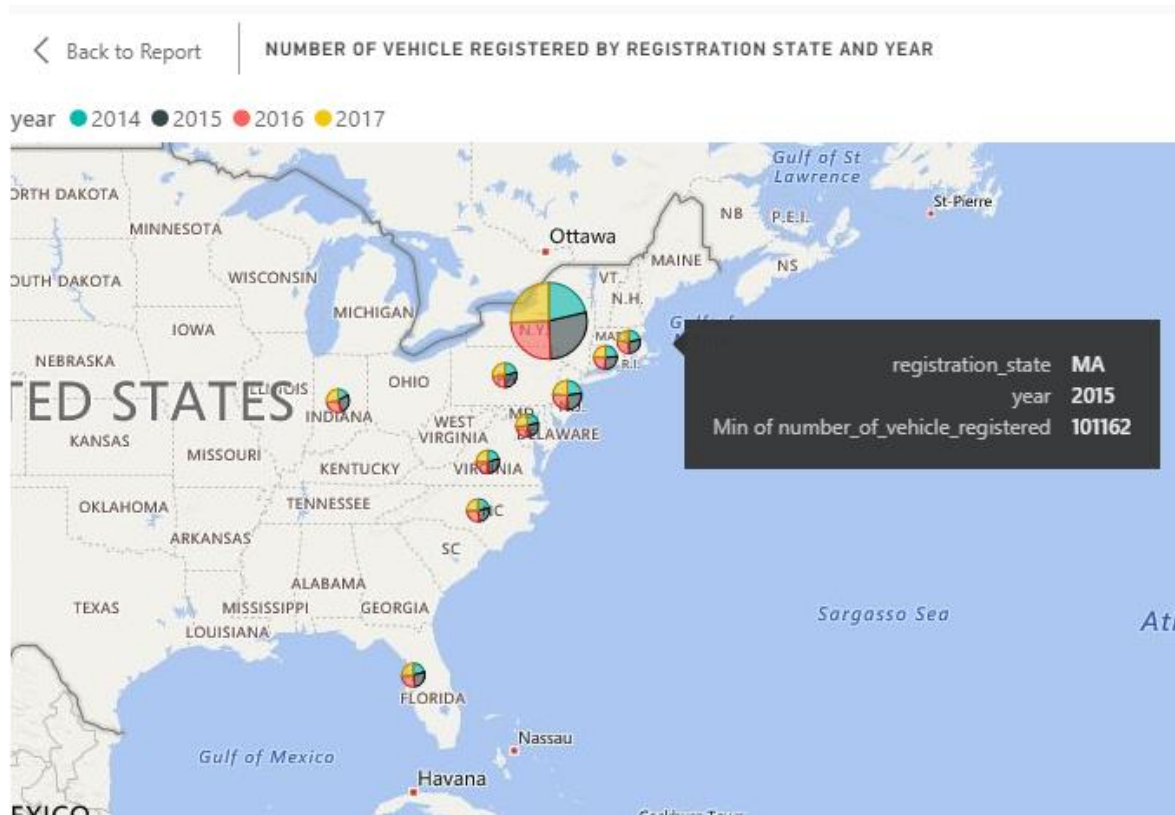
```
-bash-4.1$ hdfs dfs -get Group3/master2015/clean_nyc2015/least_violated_location2015/000000_0
-bash-4.1$
```

Open Windows power shell. Use the command showed below to export the data to the base machine in the form of .csv format

```
PS E:\CSULA\CIS5200-01\Group 3\output> pscp -pw amahesh3 amahesh3@129.150.129.67:/home/amahesh3/000000_0 least_violated_
location2015.csv
least_violated_location20 | 0 kB | 0.2 kB/s | ETA: 00:00:00 | 100%
PS E:\CSULA\CIS5200-01\Group 3\output>
```

## Step 9: Data Visualization using PowerBI, Tableau and 3D map

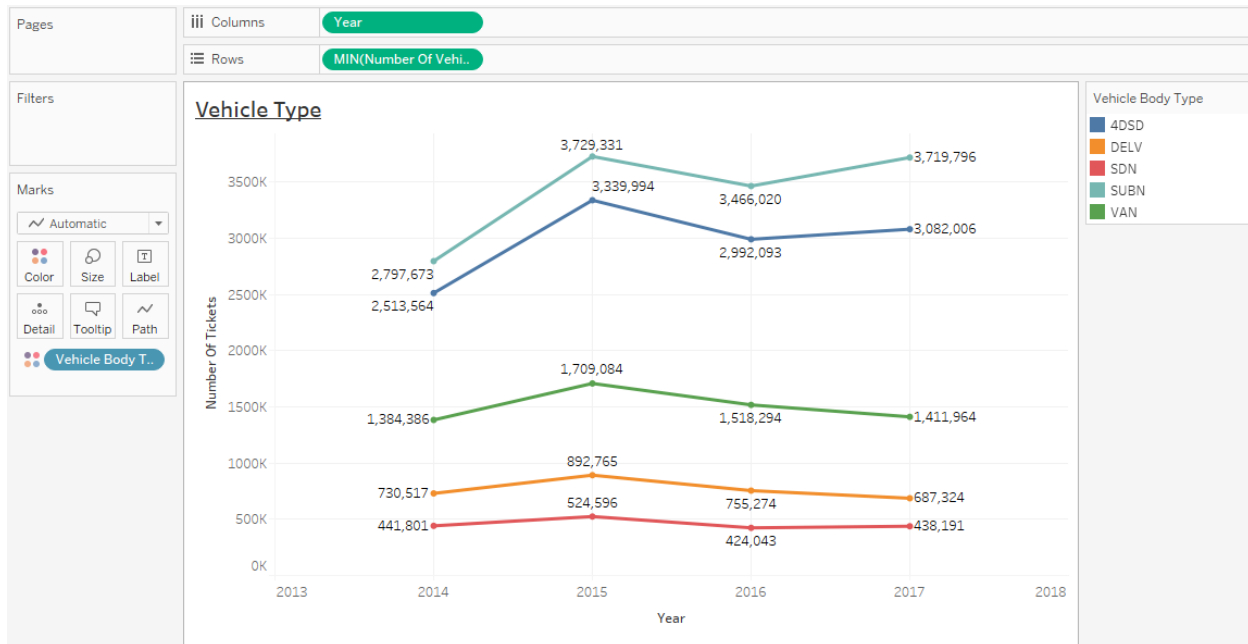
1. Open your PowerBI and upload the **vehicle\_registered\_state.csv** file.



Select registration\_state as Location, year as Legend and size as number\_of\_violations. With this visualization we get to know how many violations are made by which registered state plate.

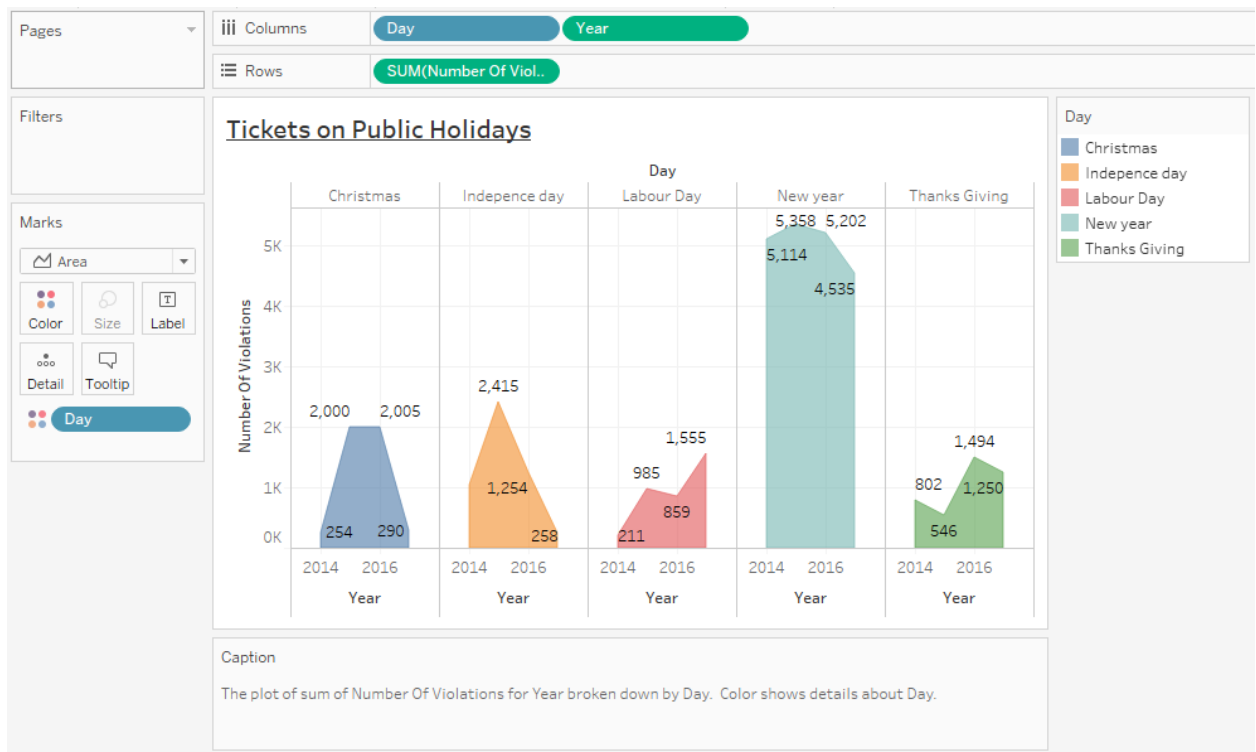


2. Open your Tableau to connect your server. You need to select **Text File** to open the file **violations\_vehicle\_type.csv**



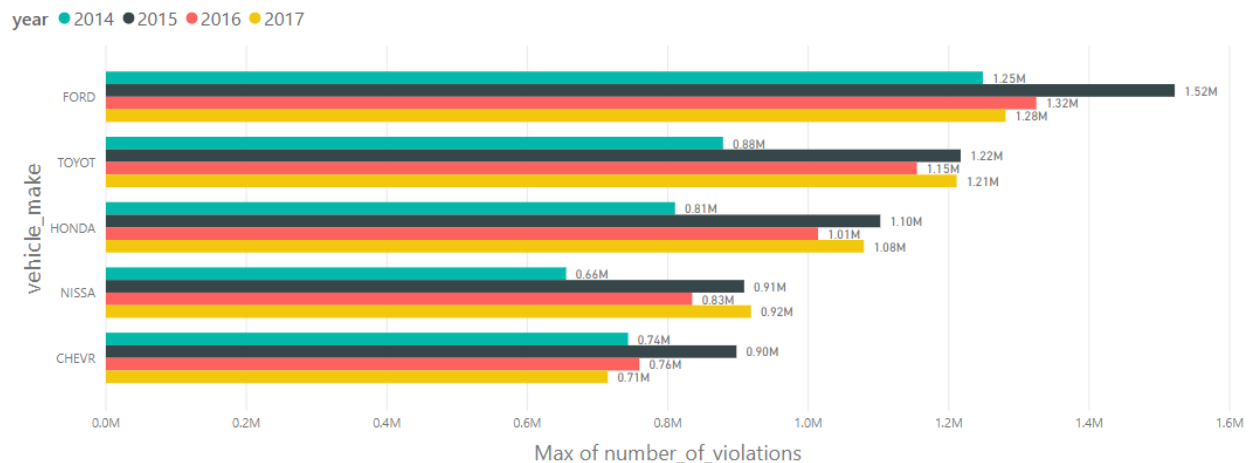
Select Year in Columns, number\_of\_vehicles in rows and vehicle\_body\_type in Legends. With this visualization we get to know which type of vehicle is getting more number of violation tickets.

- Open your Tableau to connect your server. You need to select **Text File** to open the file **tickets\_on\_public\_holidays.csv**



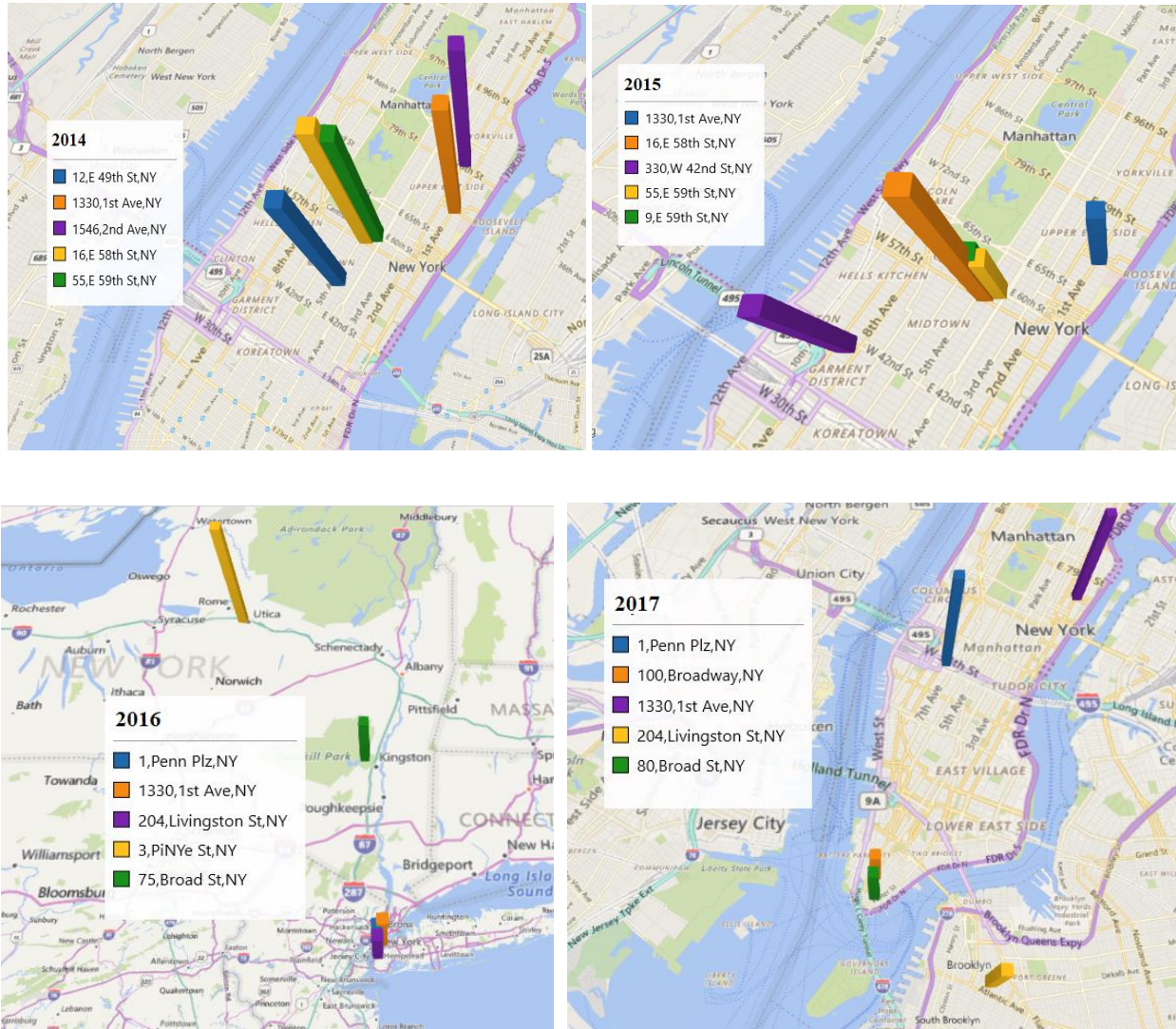
Select Year and Day in column, number of violations in rows and day as legends. The plot shows on which public holiday a greater number of violations were there.

- Open your PowerBI and upload the **violation\_wrt\_vehicle\_make.csv** file.



This plot depicts in all the 4 years which make of vehicle made a greater number of violations.

- Convert **most\_violated\_location2014.csv**, **most\_violated\_location2015.csv**, **most\_violated\_location2016.csv** and **most\_violated\_location2017.csv** to xlsx format.  
Then go to insert -> 3D map. Select location as address and value as number of violations.

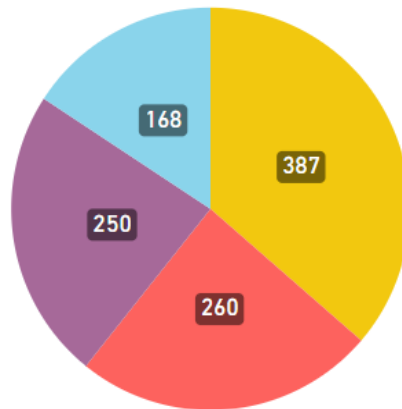


In this map we get to know at which location a greater number of violations has occurred.

- Open your PowerBI and upload the **vehicle\_count\_expired.csv**.

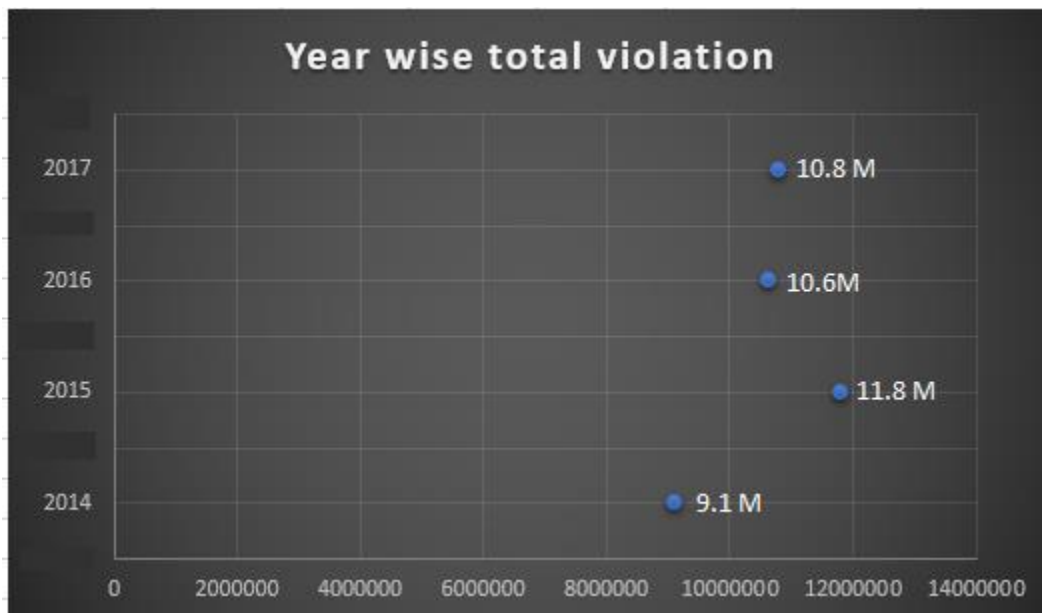
**Vehicle Validity Expired before year 2000**

year ● 2017 ● 2016 ● 2015 ● 2014

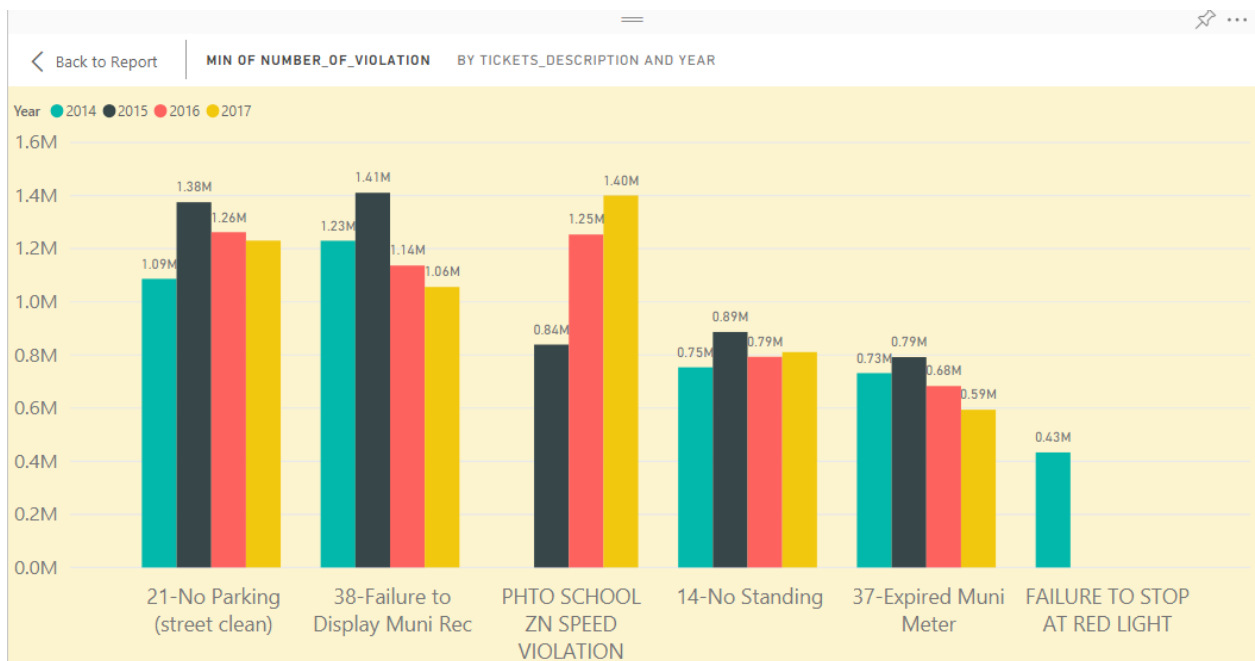


The pie chart shows in which year how many numbers of vehicles have expiration date before 2000.

- This graph shows how many total violations have taken place.

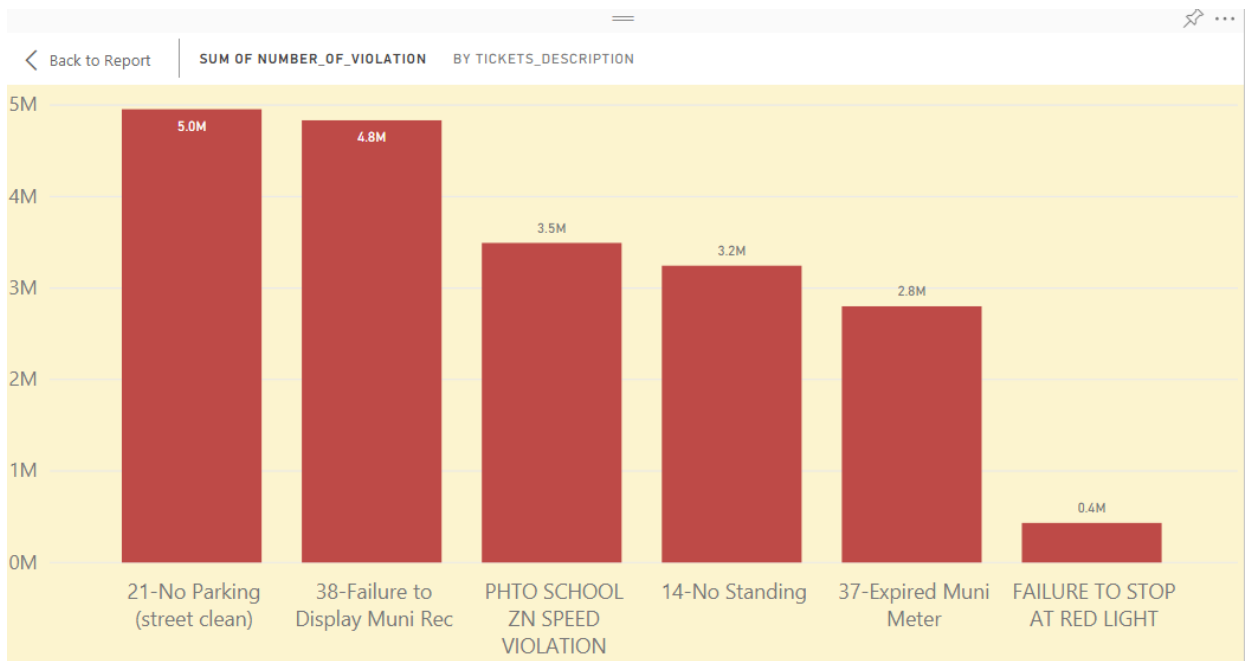


8. Upload **ticket\_description.csv** to PowerBI and choose number\_of\_violations as values, violation\_description as axis and year as legend.



This bar chart shows in which year which type of violation has occurred frequently.

9. With the same report, number\_of\_violations as values and violation\_description as axis.



This chart shows which kind of violation has occurred the greatest number of times in all the four years.

## References

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<https://github.com/amoghmahesh/hiveanalysisnycparkingticket>

<https://www.kaggle.com/new-york-city/nyc-parking-tickets>

[http://www.nyc.gov/html/dof/html/pdf/faq/stars\\_codes.pdf](http://www.nyc.gov/html/dof/html/pdf/faq/stars_codes.pdf)

<https://www.kaggle.com/donyoe/exploring-42-3m-nyc-parking-tickets/notebook>

<https://www1.nyc.gov/site/finance/vehicles/services-violation-codes.page>