

Customer Service Requests Analysis

```
#libraries imported
```

```
import numpy as np
import pandas as pd
import datetime as dt
from datetime import timedelta
import matplotlib.pyplot as plt
import seaborn as sns
%matplotlib inline
from scipy.integrate import quad
from scipy.stats import norm
```

```
#read path of dataset file
```

```
df_311 = pd.read_csv('C:\\Users\\SandipG\\Desktop\\Python
Programs\\311_Service_Requests_from_2010_to_Present.csv')
```

```
E:\\Programs\\Anaconda3\\lib\\site-
packages\\IPython\\core\\interactiveshell.py:3058: DtypeWarning: Columns (48,49)
have mixed types. Specify dtype option on import or set low_memory=False.
  interactivity=interactivity, compiler=compiler, result=result)
```

```
#check if the dataset file is accessed correctly
```

```
df_311.shape
(300698, 53)
```

```
# Data Ingestion to display all 53 columns
```

```
df = pd.read_csv("C:\\Users\\SandipG\\Desktop\\Python
Programs\\311_Service_Requests_from_2010_to_Present.csv")
```

```
pd.set_option('display.max_columns',None)
E:\\Programs\\Anaconda3\\lib\\site-
packages\\IPython\\core\\interactiveshell.py:3058: DtypeWarning: Columns (48,49)
have mixed types. Specify dtype option on import or set low_memory=False.
  interactivity=interactivity, compiler=compiler, result=result)
```

```
# Converting dates
```

```
df['Created Date'] = df['Created Date'].astype('datetime64[ns]')
df['Closed Date'] = df['Closed Date'].astype('datetime64[ns]')
df['Resolution Action Updated Date'] = df['Resolution Action Updated Date'].astype('datetime64[ns]')
```

```
#New feature created Request_Closing_Time
```

```
df['Request_Closing_Time']=df['Closed Date']-df['Created Date']
```

```
#New feature created Month &
```

```
count = 0
```

```
#Create an empty list called "month"
```

```
month=[]
```

```
# for all the rows in 'Created Date' (calculated by len(df)) extract month and append to "month"
list
```

```
while count < len(df):
    month.append(df['Created Date'][count].month)
    count = count+1
```

```
# create a new month column
```

```
df['Month'] = month
```

```
#new feature created Minute
```

```
minutes=[]
```

```
# calculate duration by finding diffrence btween 'Closed Date' and Created Date
# Create new column called "Duration_Minutes"
```

```
df['Duration_Minutes'] = df['Closed Date'] - df['Created Date']
```

```
for x in df['Duration_Minutes']:
    minutes.append(x.seconds / 60)
```

```
df['Duration_Minutes'] = minutes
```

```
# Preparing Data
```

```
df['Agency'].value_counts()
```

```
NYPD      300698
Name: Agency, dtype: int64
```

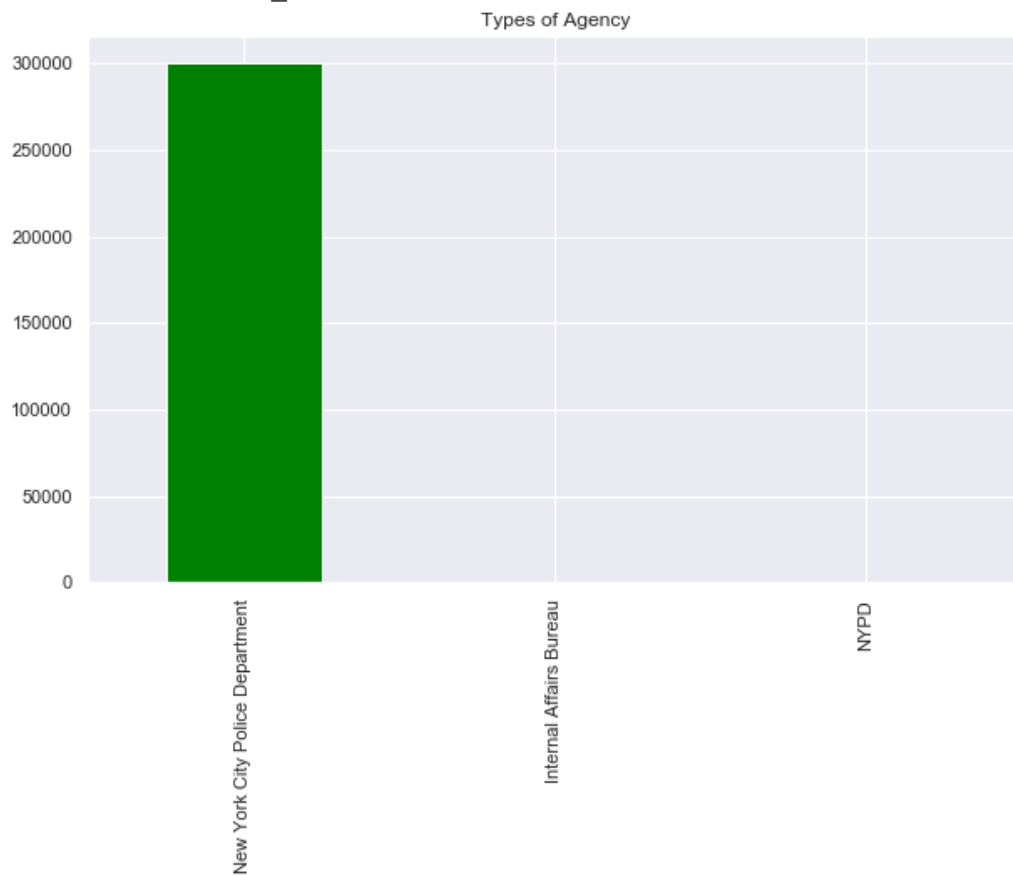
```
# Data Profiling of 'Agency Name' feature.
```

```
(df['Agency Name'].value_counts()).head().plot(kind = 'bar', figsize= (10,6), title='Types of Agency',color='green')
```

```
# Please Note:
```

```
# There are only 2 types of agency's viz New York Police Dept and Internal Affairs Bureau and
# Majority of complaints come from New York Police Dept.
```

```
<matplotlib.axes._subplots.AxesSubplot at 0x270f52a8b08>
```



```
# Data Profiling of 'Complaint Type' feature.
```

```
df['Complaint Type'].value_counts()
(df['Complaint Type'].value_counts()).head().plot(kind = 'bar', figsize= (10,6), title='Maximum Occuring
Complaints(top 5)',color='cyan')
```

```
# Data Profiling of 'Agency Name' feature.
```

```
(df['Agency Name'].value_counts()).head().plot(kind = 'bar', figsize= (10,6), title='Types of Agency',color='cyan')
```

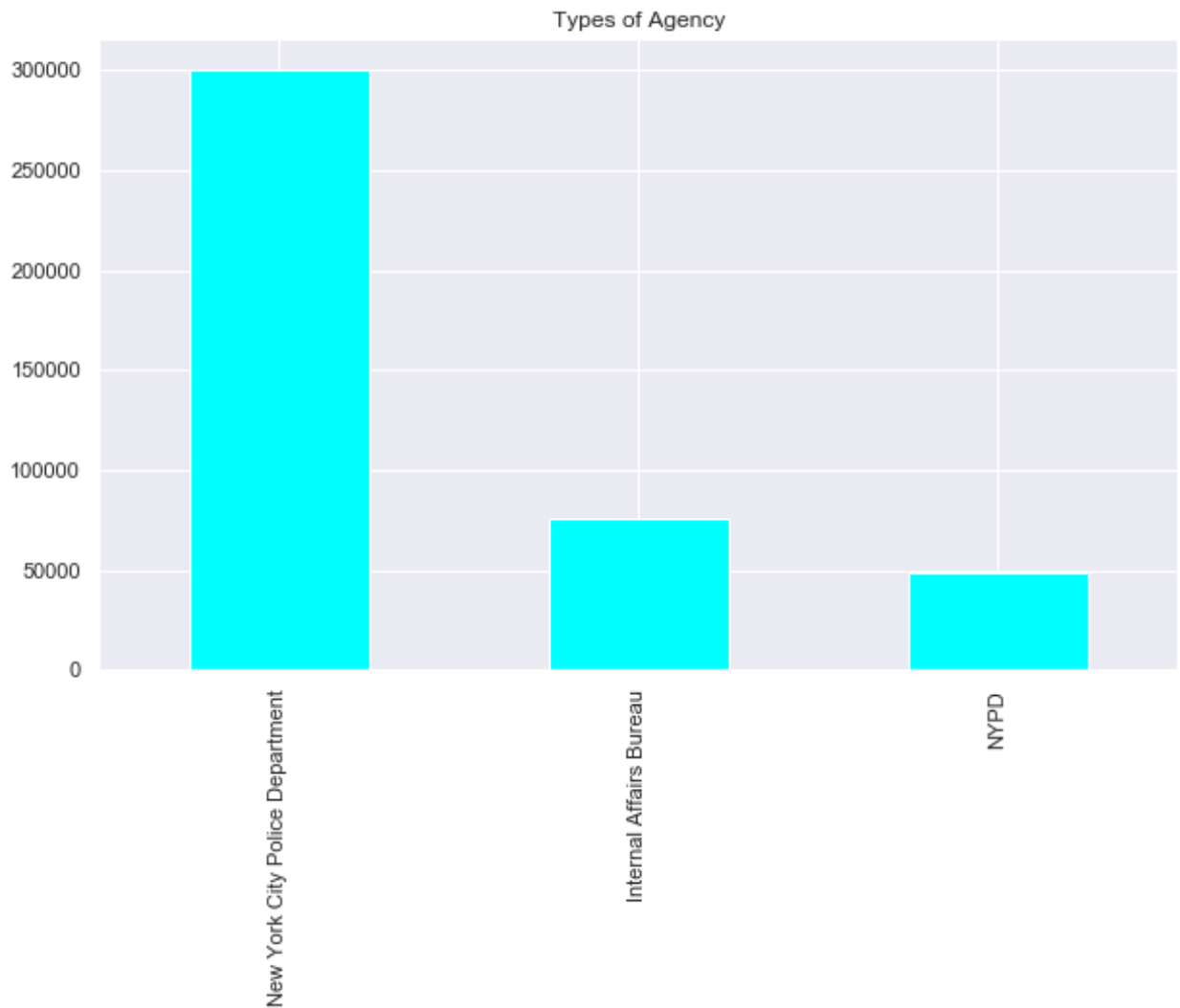
Please Note:

There are only 2 types of agency's viz New York Police Dept and Internal Affairs Bureau and

Majority of complaints come from New York Police Dept.

The major complaint type are Blocked Driveway , Illegal Parking,Noise - Street/Sidewalk ,
Noise - Commercial and Derelict Vehicle

```
<matplotlib.axes._subplots.AxesSubplot at 0x270e0dd5e48>
```



```
df['Complaint Type'].value_counts()
```

Blocked Driveway	77044
Illegal Parking	75361
Noise - Street/Sidewalk	48612
Noise - Commercial	35577

Derelict Vehicle 17718
Noise - Vehicle 17083
Animal Abuse 7778
Traffic 4498
Homeless Encampment 4416
Noise - Park 4042
Vending 3802
Drinking 1280
Noise - House of Worship 931
Posting Advertisement 650
Urinating in Public 592
Bike/Roller/Skate Chronic 427
Panhandling 307
Disorderly Youth 286
Illegal Fireworks 168
Graffiti 113
Agency Issues 6
Squeegee 4
Ferry Complaint 2
Animal in a Park 1
Name: Complaint Type, dtype: int64

df.head()

	Unique Key	Created Date	Closed Date	Agency	Agency Name	Complaint Type	Description	Location Type	Incident Zip	Incident Address	Street Name	Cross Street 1	Cross Street 2	Intersection Street 1	Intersection Street 2	Address Type	City	Landmark	Facility Type
0	32310363	2015-12-31 23:59:45	2016-01-01 00:55:00	NYPD	New York City Police Department	Noise - Street/Sidewalk	Loud Music/Party	Street/Sidewalk	10034.0	71 VERMILYEA AVE NUE	VERMILYEA AVE NUE	ACADEMY STREET	WEST 204 STREET	NaN	NaN	ADDRESS	NEW YORK	NaN	Precinct
1	32309934	2015-12-31	2016-01-01	NYPD	New York City	Blocked Driveway	No Access	Street/Sidewalk	11105.0	27-0723 AVE NUE	23 AVE NUE	27 STREET	28 STREET	NaN	NaN	ADDRESS	ASTORIA	NaN	Precinct

	Unique Key	Created Date	Closed Date	Agency	Agency Name	Complaint Type	Descriptor	Location Type	Incident Zip	Incident Address	Street Name	Cross Street 1	Cross Street 2	Intersection Street 1	Intersection Street 2	Address Type	City	Landmark	Facility Type
		23:59:44	01:26:00		Police Department														
2	32309159	2015-12-31 23:59:29	2016-01-01 04:51:00	NYD	New York City Police Department	Blocked Driveway	No Access	Street/Sidewalk	104580	2897 VAL ENTI NE AVE NUE	VAL ENTI NE AVE NUE	EAST 198 STREET	EAST 199 STREET	NaN	NaN	ADDRESS	BROOKLYN	NaN	Precinct
3	32305098	2015-12-31 23:57:46	2016-01-01 07:43:00	NYD	New York City Police Department	Illegal Parking	Commercial Overnight Parking	Street/Sidewalk	104610	2940 BAILEY AVE NUE	BAILEY AVE NUE	EDISON AVE NUE	B STREET	NaN	NaN	ADDRESS	BROOKLYN	NaN	Precinct
4	32306529	2015-12-31 23:56:58	2016-01-01 03:24:00	NYD	New York City Police Department	Illegal Parking	Blocked Sidewalk	Street/Sidewalk	113730	87-14 57 ROAD	57 ROAD	SEABURY STREET	HOFMAN DRIVE	NaN	NaN	ADDRESS	ELMHURST	NaN	Precinct

df.info()

```

<class 'pandas.core.frame.DataFrame'>
RangeIndex: 300698 entries, 0 to 300697
Data columns (total 56 columns):
Unique Key                300698 non-null int64
Created Date              300698 non-null datetime64[ns]
Closed Date              298534 non-null datetime64[ns]
Agency                  300698 non-null object
Agency Name             300698 non-null object
Complaint Type           300698 non-null object
Descriptor               294784 non-null object
Location Type            300567 non-null object
Incident Zip             298083 non-null float64
Incident Address         256288 non-null object
Street Name              256288 non-null object
Cross Street 1           251419 non-null object
Cross Street 2           250919 non-null object
Intersection Street 1    43858 non-null object
Intersection Street 2    43362 non-null object
Address Type             297883 non-null object
City                     298084 non-null object
Landmark                 349 non-null object
Facility Type            298527 non-null object
Status                   300698 non-null object
Due Date                 300695 non-null object
Resolution Description    300698 non-null object
Resolution Action Updated Date 298511 non-null datetime64[ns]
Community Board          300698 non-null object
Borough                  300698 non-null object
X Coordinate (State Plane) 297158 non-null float64
Y Coordinate (State Plane) 297158 non-null float64
Park Facility Name       300698 non-null object
Park Borough             300698 non-null object
School Name              300698 non-null object
School Number            300698 non-null object
School Region            300697 non-null object
School Code              300697 non-null object
School Phone Number      300698 non-null object
School Address           300698 non-null object
School City              300698 non-null object
School State             300698 non-null object
School Zip               300697 non-null object
School Not Found         300698 non-null object
School or Citywide Complaint 0 non-null float64

```

```

Vehicle Type          0 non-null float64
Taxi Company Borough  0 non-null float64
Taxi Pick Up Location 0 non-null float64
Bridge Highway Name   243 non-null object
Bridge Highway Direction 243 non-null object
Road Ramp             213 non-null object
Bridge Highway Segment 213 non-null object
Garage Lot Name       0 non-null float64
Ferry Direction       1 non-null object
Ferry Terminal Name   2 non-null object
Latitude              297158 non-null float64
Longitude             297158 non-null float64
Location              297158 non-null object
Request_Closing_Time  298534 non-null timedelta64[ns]
Month                 300698 non-null int64
Duration_Minutes      298534 non-null float64
dtypes: datetime64[ns](3), float64(11), int64(2), object(39),
timedelta64[ns](1)
memory usage: 128.5+ MB

```

```

(df['Complaint Type'].value_counts()).tail().plot(kind = 'bar', figsize= (10,6), title='Minimum Occuring Complaints
(bottom 5)',color='green')

```

Please Note:

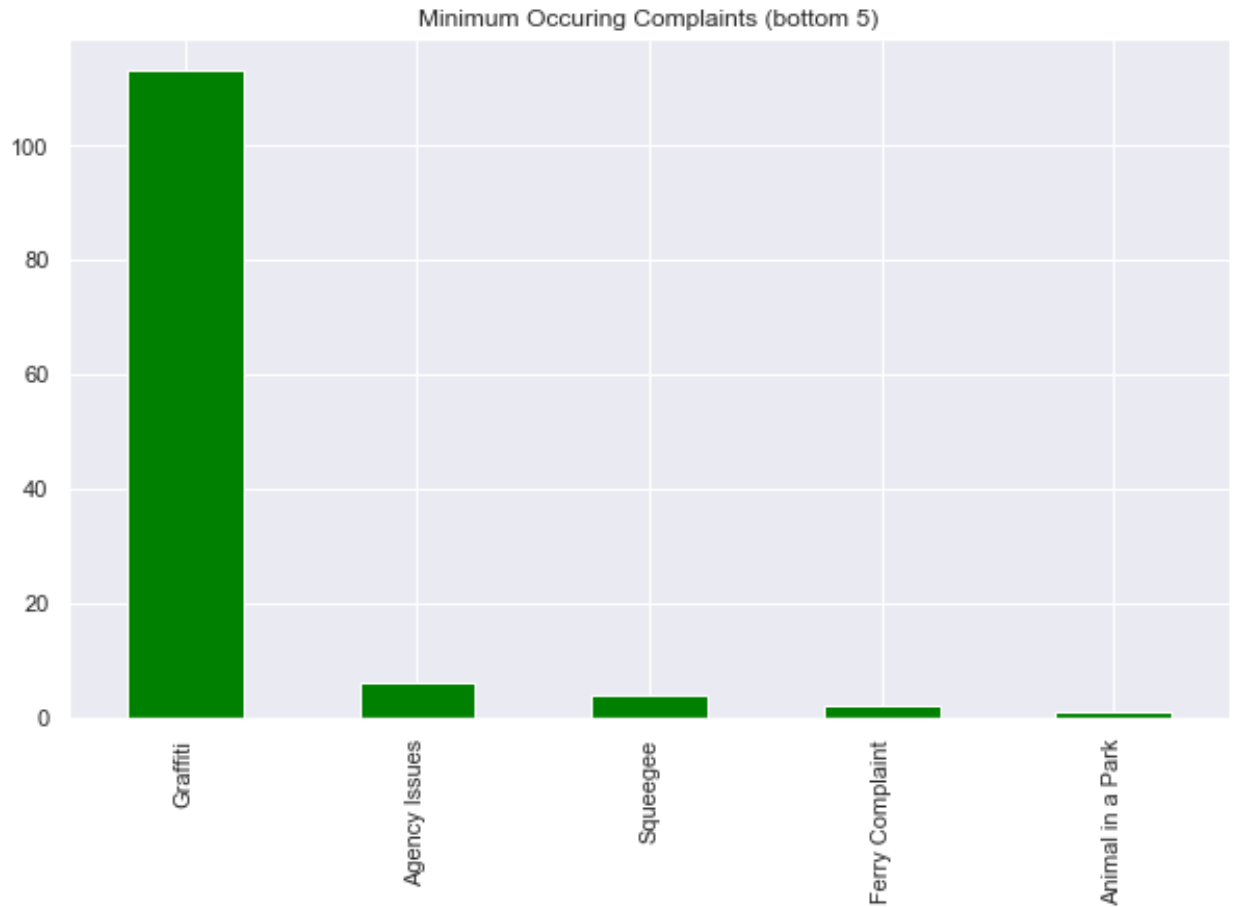
The occurrence of the following complaint type are less:

```

# Illegal Fireworks      168
# Graffiti              113
# Agency Issues           6
# Squeegee               4
# Ferry Complaint         2
# Animal in a Park        1

```

<matplotlib.axes._subplots.AxesSubplot at 0x270f4717a48>



Data Profiling of 'Descriptor' feature.

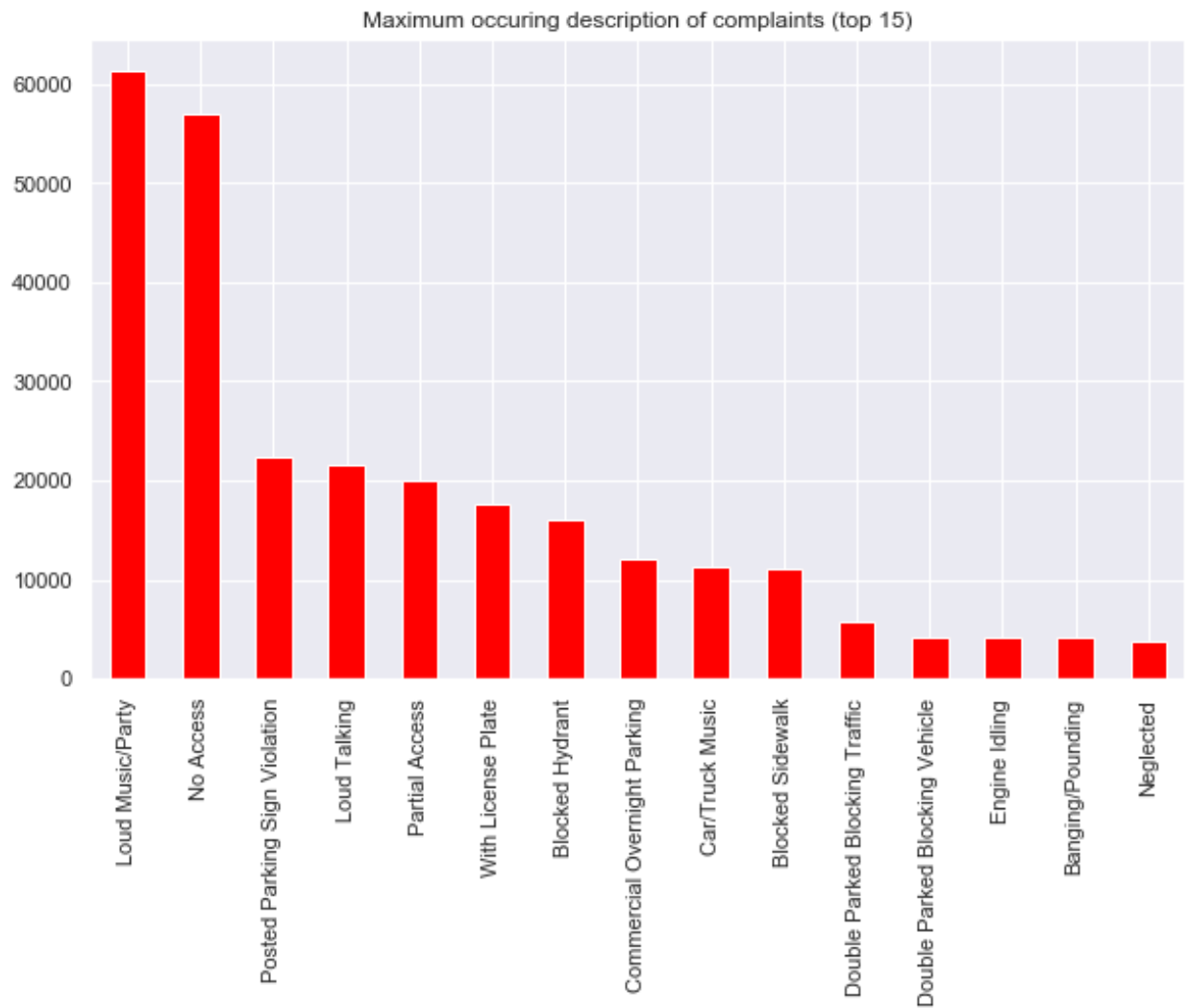
```
df['Descriptor'].value_counts()
(df['Descriptor'].value_counts()).head(15).plot(kind = 'bar', figsize= (10,6), title='Maximum occuring description of
complaints (top 15)',color='red')
```

Please Note:

Major complaint types are for the following description:

# Loud Music/Party	61430
# No Access	56976
# Posted Parking Sign Violation	22440
# Loud Talking	21584
# Partial Access	20068
# With License Plate	17718
# Blocked Hydrant	16081
# Commercial Overnight Parking	12189
# Car/Truck Music	11273
# Blocked Sidewalk	11121
# Double Parked Blocking Traffic	5731

<matplotlib.axes._subplots.AxesSubplot at 0x270f46ff788>



```
df['Descriptor'].value_counts()
```

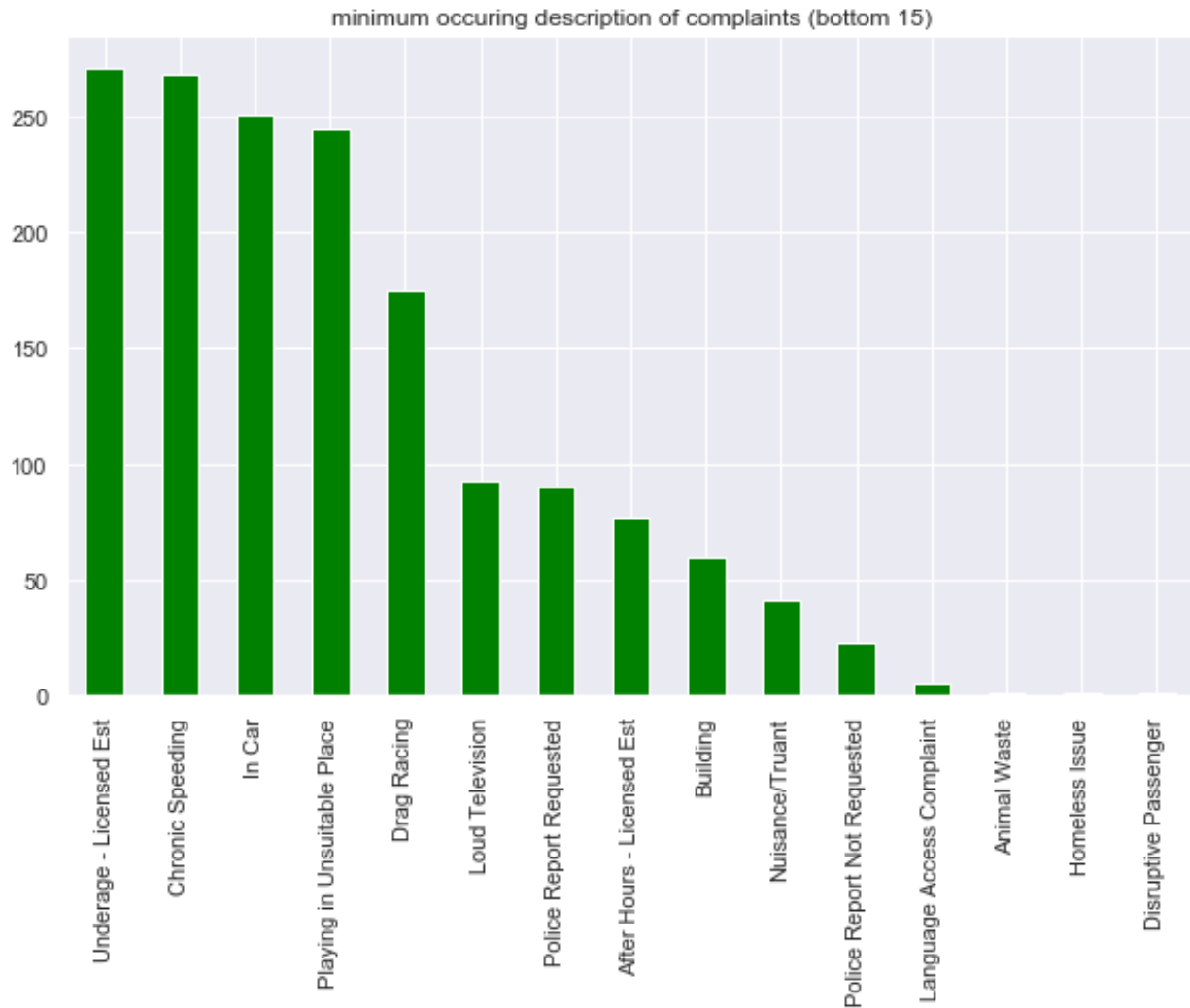
Loud Music/Party	61430
No Access	56976
Posted Parking Sign Violation	22440
Loud Talking	21584
Partial Access	20068
With License Plate	17718
Blocked Hydrant	16081
Commercial Overnight Parking	12189
Car/Truck Music	11273
Blocked Sidewalk	11121
Double Parked Blocking Traffic	5731
Double Parked Blocking Vehicle	4211
Engine Idling	4189

Banging/Pounding	4165
Neglected	3787
Car/Truck Horn	3511
Congestion/Gridlock	2761
In Prohibited Area	2025
Other (complaint details)	1969
Unlicensed	1777
Overnight Commercial Storage	1757
Unauthorized Bus Layover	1367
Truck Route Violation	1014
In Public	932
Tortured	854
Vehicle	590
Chained	535
Detached Trailer	464
No Shelter	382
Chronic Stoplight Violation	280
Underage - Licensed Est	271
Chronic Speeding	268
In Car	251
Playing in Unsuitable Place	245
Drag Racing	175
Loud Television	93
Police Report Requested	90
After Hours - Licensed Est	77
Building	60
Nuisance/Truant	41
Police Report Not Requested	23
Language Access Complaint	6
Animal Waste	1
Homeless Issue	1
Disruptive Passenger	1

Name: Descriptor, dtype: int64

```
(df['Descriptor'].value_counts()).tail(15).plot(kind = 'bar', figsize= (10,6), title='minimum occuring description of complaints (bottom 15)',color='green')
```

```
<matplotlib.axes._subplots.AxesSubplot at 0x270b5b87f88>
```



Location Type

Data Profiling of 'Location Type' feature.

```
df['Location Type'].value_counts()
```

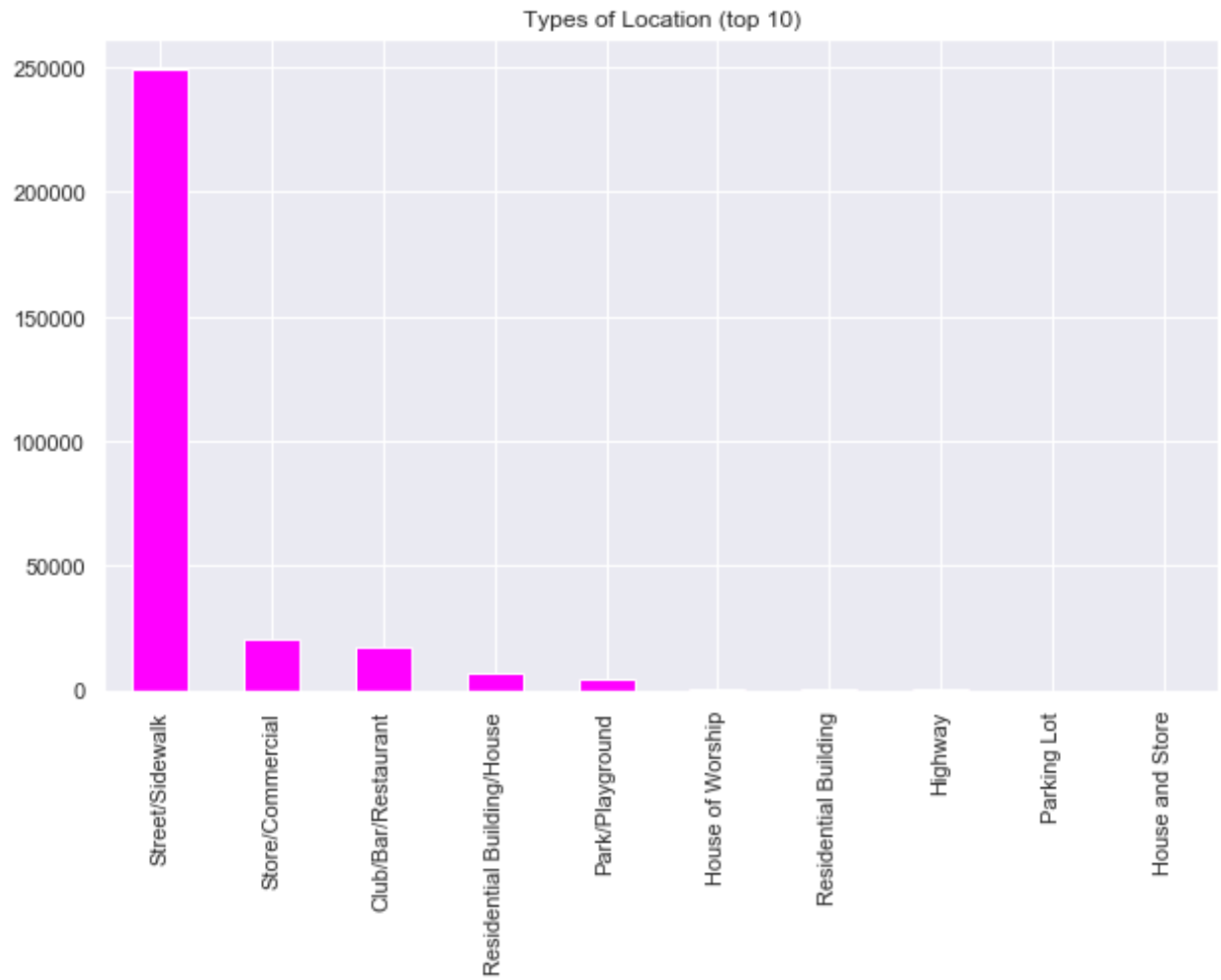
```
(df['Location Type'].value_counts()).head(10).plot(kind = 'bar', figsize=(10,6), title='Types of Location (top 10)',color='magenta')
```

Please Note:

Major complaints have come from the following location type:

```
# Street/Sidewalk      249299
# Store/Commercial     20381
# Club/Bar/Restaurant  17360
# Residential Building/House 6960
# Park/Playground      4773#
```

```
<matplotlib.axes._subplots.AxesSubplot at 0x270e3e71b08>
```

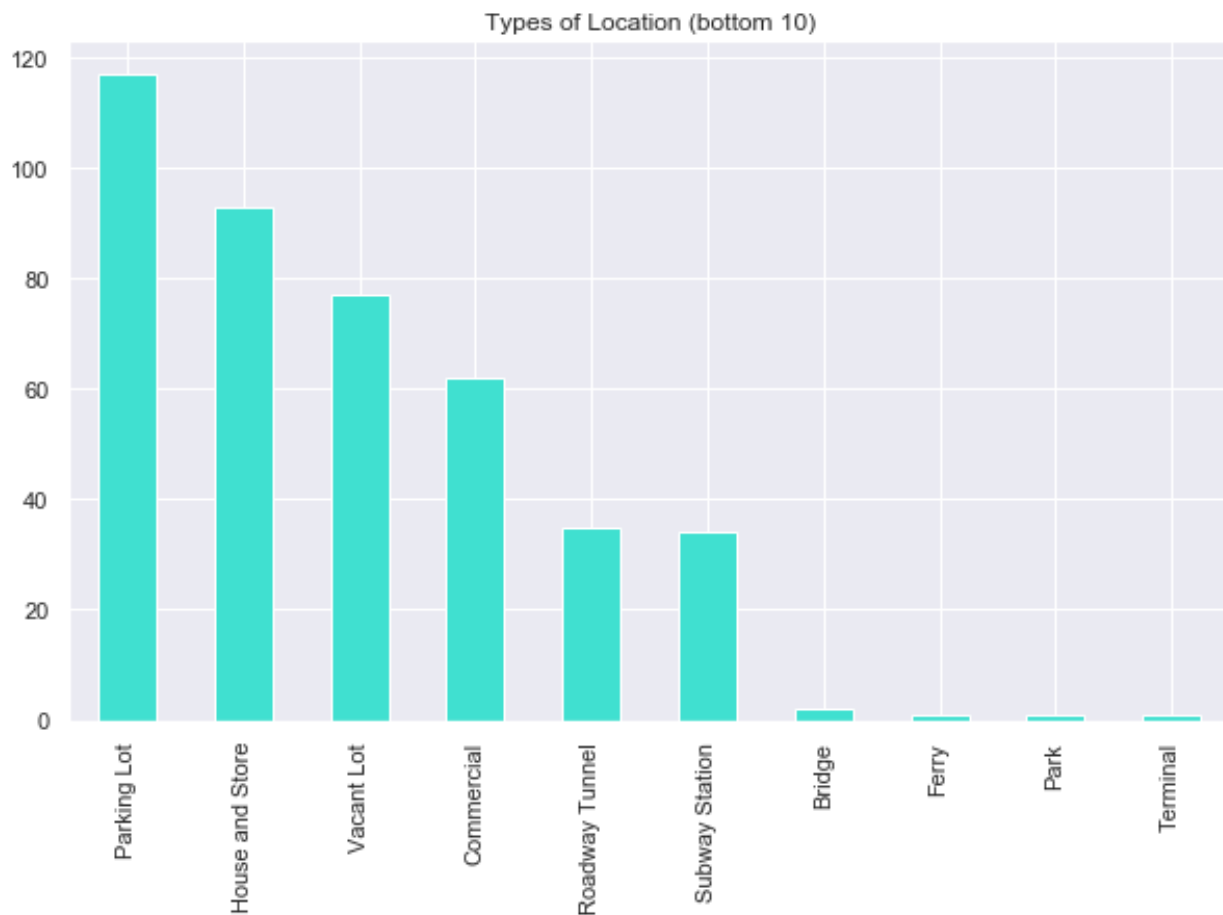


```
df['Location Type'].value_counts()
Street/Sidewalk          249299
Store/Commercial          20381
Club/Bar/Restaurant       17360
Residential Building/House  6960
Park/Playground           4773
House of Worship           929
Residential Building        227
Highway                     215
Parking Lot                 117
House and Store              93
Vacant Lot                   77
Commercial                   62
Roadway Tunnel               35
Subway Station               34
Bridge                       2
Ferry                        1
```

```
Park 1
Terminal 1
Name: Location Type, dtype: int64
```

```
(df['Location Type'].value_counts()).tail(10).plot(kind = 'bar', figsize= (10,6), title='Types of Location (bottom 10)',color='turquoise')
```

```
<matplotlib.axes._subplots.AxesSubplot at 0x270e2819488>
```



```
# Incident Zip
```

```
## Data Profiling of 'Incident Zip ' feature.
```

```
df['Incident Zip'].value_counts().head(20)
```

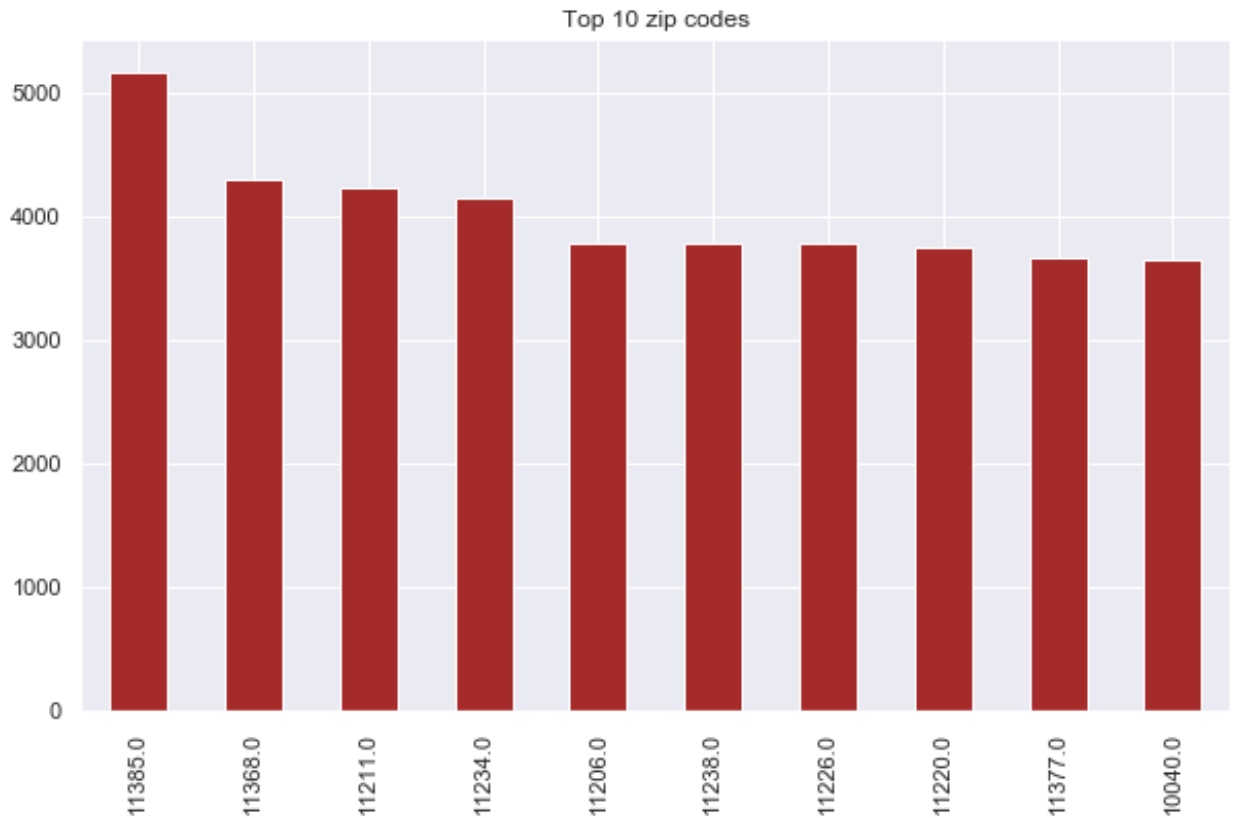
```
(df['Incident Zip'].value_counts()).head(10).plot(kind = 'bar', figsize= (10,6), title='Top 10 zip codes',color='brown')
```

```
# Please Note:
```

```
# a lot of complaints have come from the following zip code : 11385
```

```
# followed by zip code : 11368tur
```

```
<matplotlib.axes._subplots.AxesSubplot at 0x270bb993088>
```



```
# Incident Address
```

```
# Data Profiling of 'Descriptor' feature.
```

```
(df['Incident Address'].value_counts()).head(10)
```

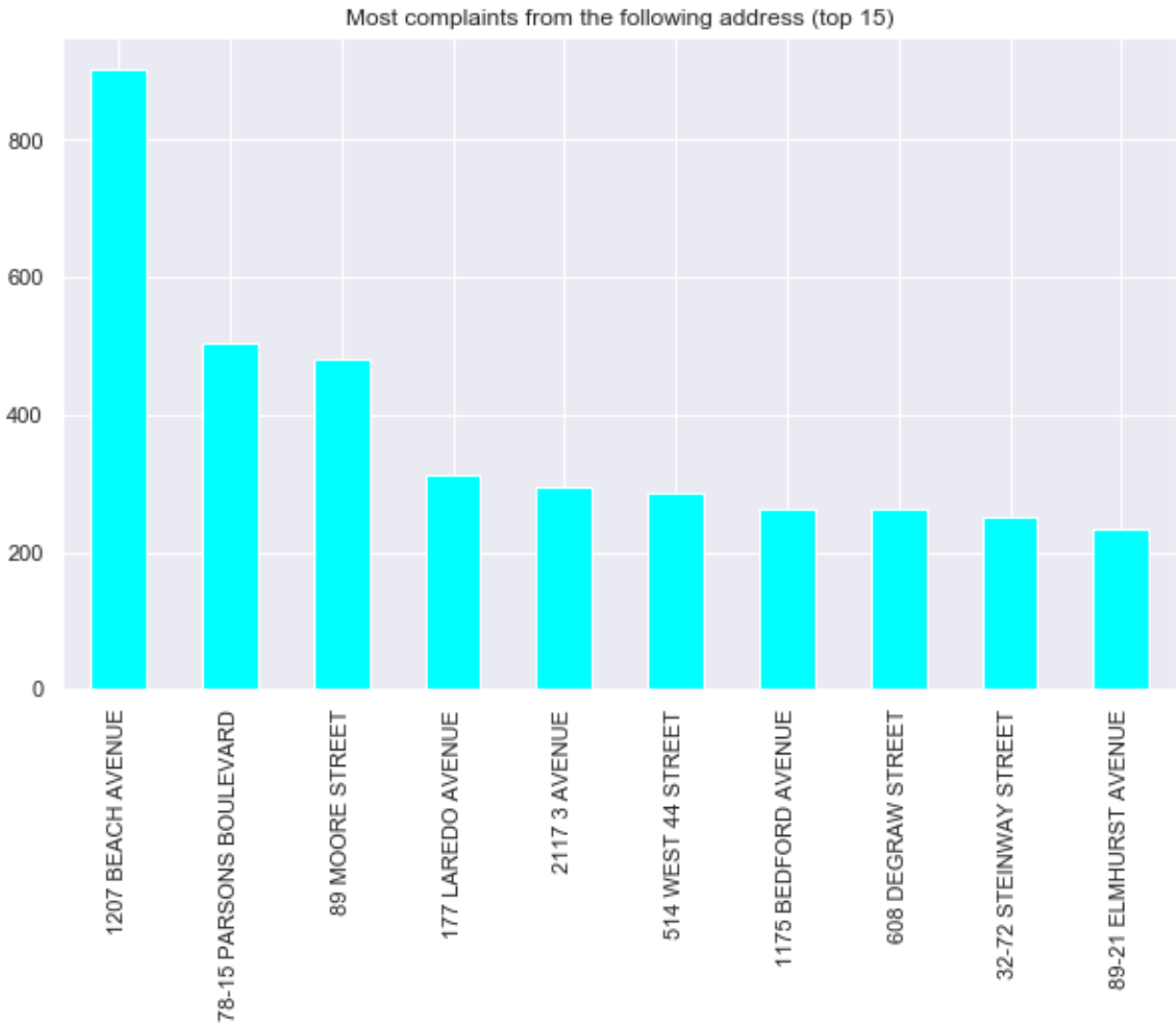
```
(df['Incident Address'].value_counts()).head(10).plot(kind = 'bar', figsize= (10,6), title='Most complaints from the following address (top 15)',color='cyan')
```

```
# Please Note:
```

```
# Repeated complaints have come from the following address.
```

```
# 1207 BEACH AVENUE          904
# 78-15 PARSONS BOULEVARD    505
# 89 MOORE STREET           480
# 177 LAREDO AVENUE         311
# 2117 3 AVENUE             295
# 514 WEST 44 STREET        287
# 1175 BEDFORD AVENUE       264
# 608 DEGRAW STREET         263
# 32-72 STEINWAY STREET     251
# 89-21 ELMHURST AVENUE    234
```

```
<matplotlib.axes._subplots.AxesSubplot at 0x270c7a34ac8>
```



Data Profiling of 'City' feature.

```
df['City'].value_counts()
```

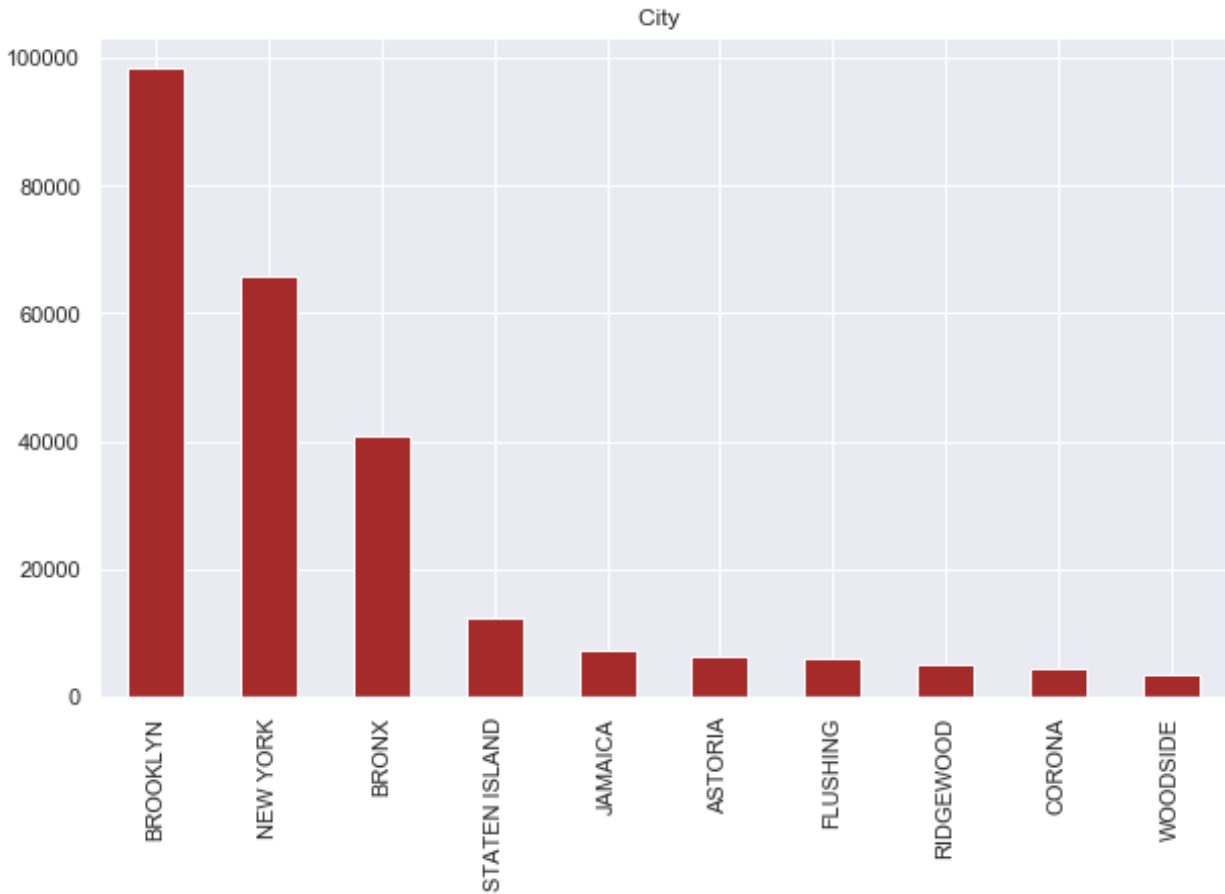
```
(df['City'].value_counts()).head(10).plot(kind = 'bar', figsize= (10,6), title='City ',color='brown')
```

Please Note:

Major complaints have come from Brooklyn,New York and Bronx.

# BROOKLYN	98307
# NEW YORK	65994
# BRONX	40702
# STATEN ISLAND	12343
# JAMAICA	7296

```
<matplotlib.axes._subplots.AxesSubplot at 0x270c79f1208>
```

Status

```
df['Status'].value_counts()
```

Please Note:

298471 complaints have been closed.

1439 complaints are still open.

786 complaints are assigned to other department.

2 complaints are getting drafted.

```
Closed      298471
Open         1439
Assigned      786
Draft          2
Name: Status, dtype: int64
```

Data profiling for 'Request_Closing_Time' column.

```
df['Request_Closing_Time'].describe()
```

please Note:

#1) the minimum time taken to close a complaint or to (attend and close) is 1 hour.

#2) the maximum time taken to close a complaint or to (attend and close) is 24 days 16 hours and 52 minutes.

```
mean      0 days 04:18:51.832782
std       0 days 06:05:22.141833
min              0 days 00:01:00
25%              0 days 01:16:33
50%      0 days 02:42:55.500000
75%              0 days 05:21:00
max              24 days 16:52:22
Name: Request_Closing_Time, dtype: object
```

```
# df['Request_Closing_Time']
```

```
df['Request_Closing_Time'].value_counts().head()
```

```
(df['Request_Closing_Time'].value_counts()).head(10).plot(kind = 'bar', figsize= (10,6), title='City ',color='green')
```

it basically gives top 5 complaints which were closed in minimum time.

Please Note:

492 complaints were closed in 36 minutes.

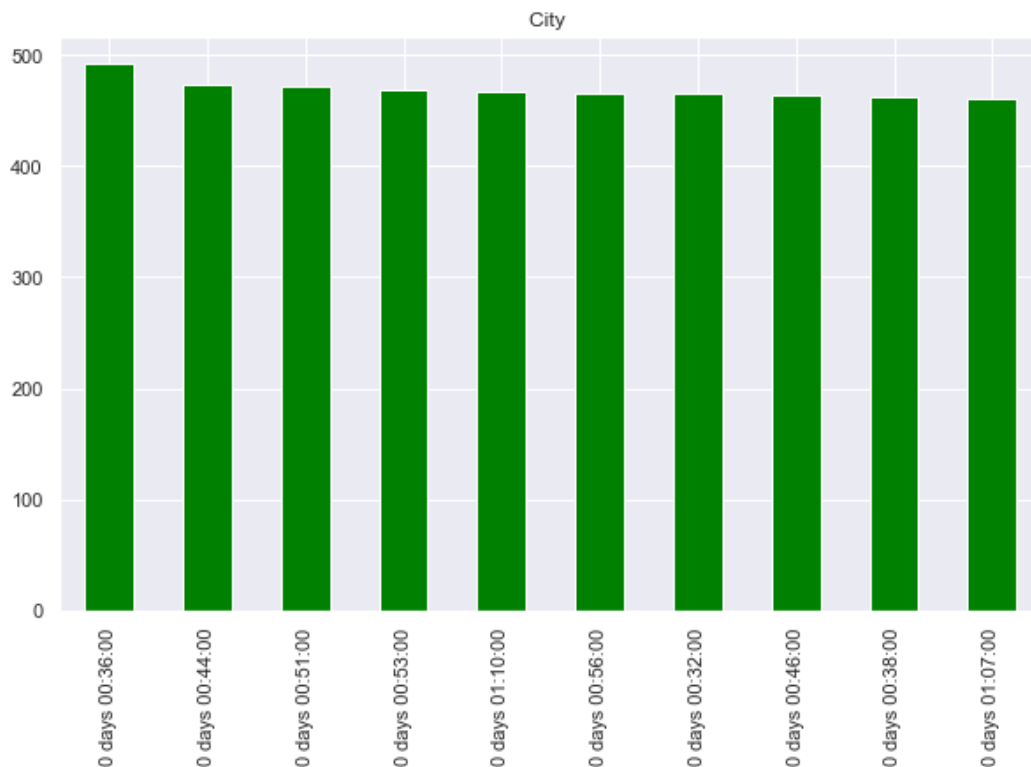
473 complaints were closed in 44 minutes.

472 complaints were closed in 51 minutes.

468 complaints were closed in 53 minutes.

467 complaints were closed in 1hr 10 minutes.

```
<matplotlib.axes._subplots.AxesSubplot at 0x270f3d49948>
```



```
df['Month'].value_counts()
(df['Month'].value_counts()).head(10).plot(kind = 'bar', figsize= (10,6), title='City ',color='blue')
```

Please Note:

Major complaints are in the months of May 2015. followed by sept 2015

In March the complaints are less because the data collected is from 29 March 2015 , we do not have date for the entire month.

5 (May) 36437

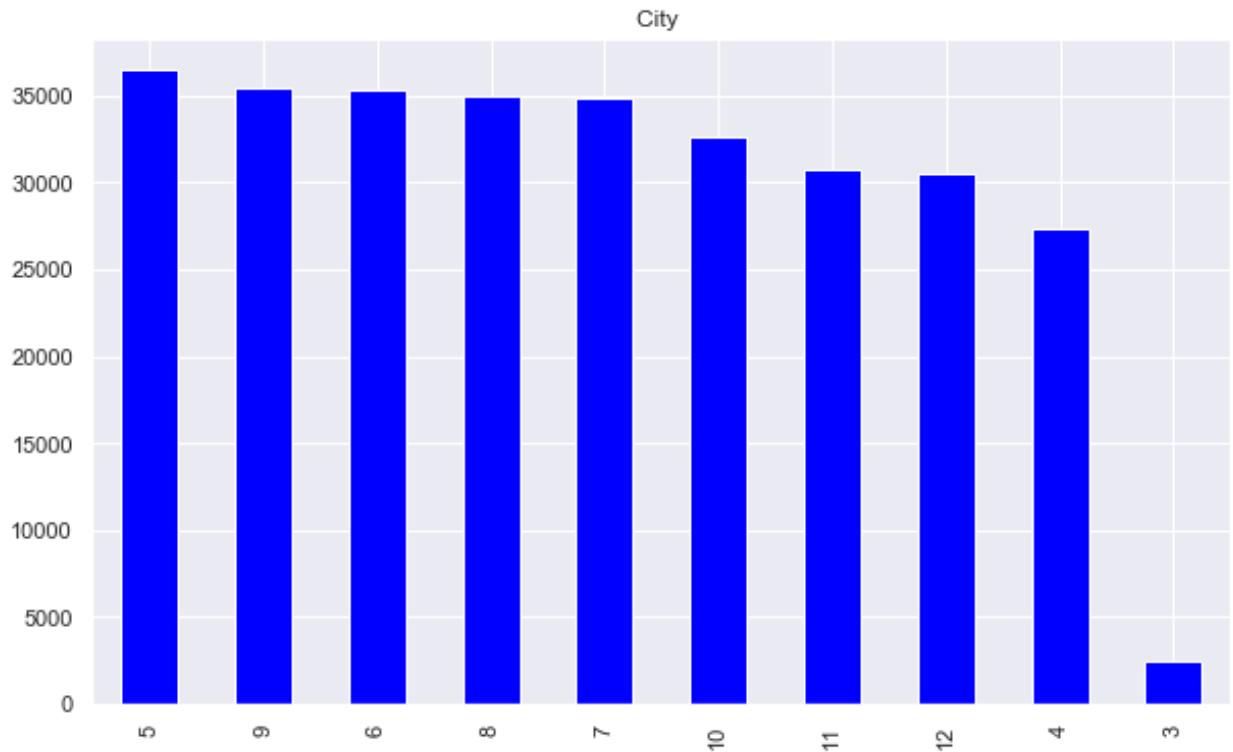
9 (Sept) 35427

6 (June) 35315

8 (Aug) 34956

7 (July) 34888

<matplotlib.axes._subplots.AxesSubplot at 0x270e0a5db08>



```
df['Duration_Minutes'].value_counts().head(20)
```

36.0 492

44.0 476

51.0 474

53.0 471

70.0 469

32.0 467

46.0 467

56.0 466

```

67.0    463
38.0    463
42.0    462
35.0    461
47.0    459
39.0    459
43.0    458
55.0    456
52.0    456
40.0    455
60.0    454
54.0    451

```

```
Name: Duration_Minutes, dtype: int64
```

```
df[['Duration_Minutes','Request_Closing_Time']].describe()
```

	Duration_Minutes	Request_Closing_Time
count	298534.000000	298534
mean	235.763797	0 days 04:18:51.832782
std	231.619407	0 days 06:05:22.141833
min	0.000000	0 days 00:01:00
25%	76.000000	0 days 01:16:33
50%	161.300000	0 days 02:42:55.500000
75%	316.000000	0 days 05:21:00
max	1439.916667	24 days 16:52:22

```
# these are the least occuring complaint types in the below mentioned months.
```

```
df.groupby("Month")['Complaint Type'].agg("min")
```

```
Month
```

```

3    Animal Abuse
4    Agency Issues
5    Agency Issues
6    Agency Issues

```

```

7      Agency Issues
8      Animal Abuse
9      Animal Abuse
10     Animal Abuse
11     Animal Abuse
12     Animal Abuse
Name: Complaint Type, dtype: object

```

these are the maximum occurring complaint types in the below mentioned months

```

df.groupby("Month")["Complaint Type"].agg("max")
Month
3      Vending
4      Vending
5      Vending
6      Vending
7      Vending
8      Vending
9      Vending
10     Vending
11     Vending
12     Vending
Name: Complaint Type, dtype: object

```

```

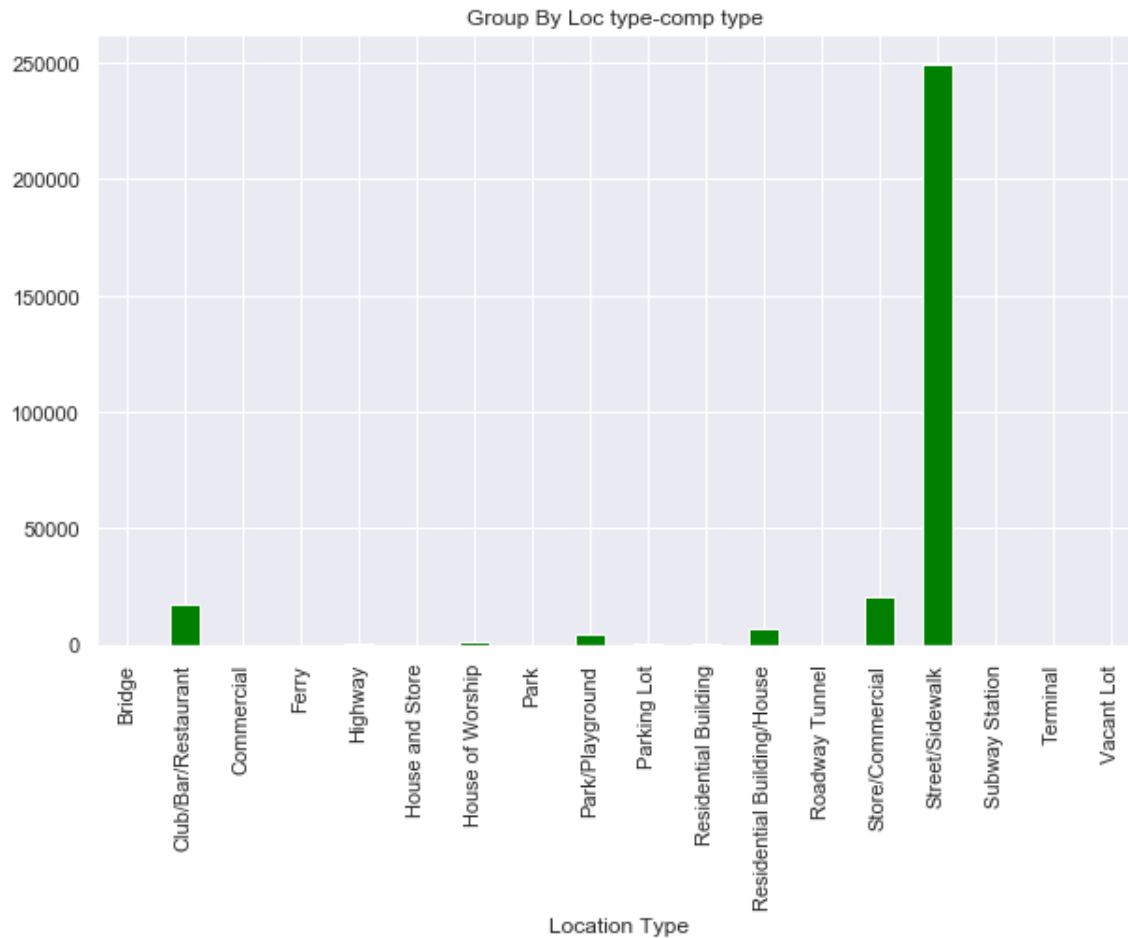
df.groupby('Location Type')['Complaint Type'].agg("count")
(df.groupby('Location Type')['Complaint Type'].agg("count")).head(20).plot(kind = 'bar', figsize=(10,6),
title='Group By Loc type-comp type ',color='green')

```

Please Note

A majority of complaints have come from location type 'Street/Sidewalk' (249299 complaints),
followed by Store/commercial (20381 complaints)

<matplotlib.axes._subplots.AxesSubplot at 0x270f33a2908>



```
df.groupby('Location Type')['Complaint Type'].agg("max")
```

Please Note:

According to the location type these are the maximum occurring complaints received.

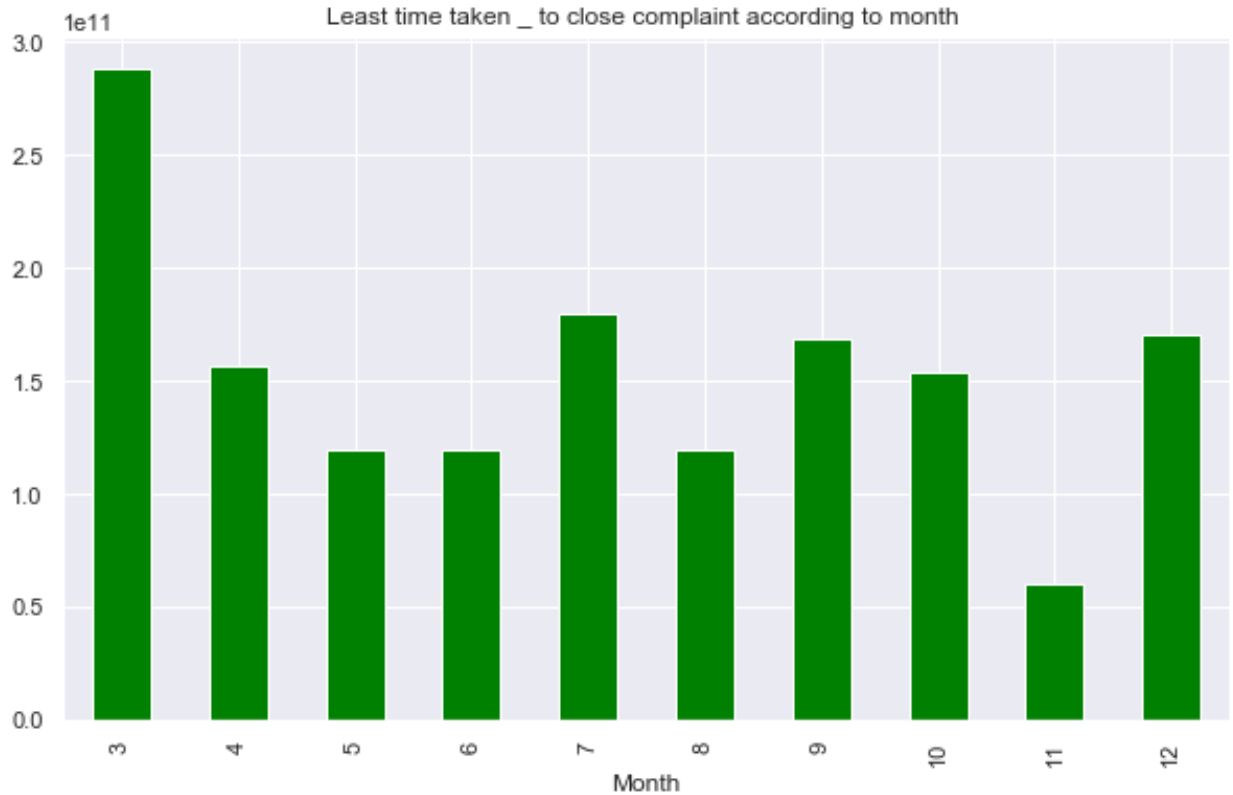
# Bridge	Homeless Encampment
# Club/Bar/Restaurant	Urinating in Public
# Commercial	Animal Abuse
# Ferry	Ferry Complaint
# Highway	Traffic
# House and Store	Animal Abuse
# House of Worship	Noise - House of Worship
# Park	Animal in a Park
# Park/Playground	Vending
# Parking Lot	Posting Advertisement
# Residential Building	Animal Abuse
# Residential Building/House	Vending
# Roadway Tunnel	Traffic
# Store/Commercial	Vending

```
# Street/Sidewalk      Vending
Location Type
Bridge                Homeless Encampment
Club/Bar/Restaurant   Urinating in Public
Commercial            Animal Abuse
Ferry                Ferry Complaint
Highway              Traffic
House and Store       Animal Abuse
House of Worship      Noise - House of Worship
Park                 Animal in a Park
Park/Playground       Vending
Parking Lot           Posting Advertisement
Residential Building   Animal Abuse
Residential Building/House Vending
Roadway Tunnel         Traffic
Store/Commercial       Vending
Street/Sidewalk        Vending
Subway Station         Urinating in Public
Terminal              Ferry Complaint
Vacant Lot             Derelict Vehicle
Name: Complaint Type, dtype: object
```

```
# To Find out according to particular Month what is the least time taken to close the complaint.
df.groupby("Month")["Request_Closing_Time"].agg("min")
(df.groupby("Month")["Request_Closing_Time"].agg("min")).head(10).plot(kind = 'bar', figsize=(10,6), title='Least
time taken _ to close complaint according to month ',color='green')
```

```
# Please Note:
# In March 2015 the least time taken the close a given complaint is 4 hrs 48 min.
# In April 2015 the least time taken the close a given complaint is 2hrs 37 min. and so on for
other
```

```
<matplotlib.axes._subplots.AxesSubplot at 0x270ee8db488>
```



```
df.groupby("Month")["Request_Closing_Time"].agg("max")
```

```
Month
3      2 days 08:23:14
4     14 days 00:50:05
5     24 days 16:52:22
6      4 days 01:10:41
7      4 days 09:50:00
8      4 days 12:09:00
9      3 days 23:37:21
10     5 days 21:09:56
11     7 days 01:06:48
12    24 days 01:21:36
Name: Request_Closing_Time, dtype: timedelta64[ns]
```

#complaint types on the average “Request_closing_time in minutes”.

```
df.groupby("Complaint Type")["Duration_Minutes"].agg("max")
Complaint Type
Agency Issues      623.000000
Animal Abuse      1439.133333
Animal in a Park    50.083333
```


Bike/Roller/Skate Chronic	1079.916667
Blocked Driveway	1439.883333
Derelict Vehicle	1439.800000
Disorderly Youth	1236.116667
Drinking	1378.000000
Ferry Complaint	NaN
Graffiti	1344.000000
Homeless Encampment	1411.000000
Illegal Fireworks	915.000000
Illegal Parking	1439.000000
Noise - Commercial	1435.266667
Noise - House of Worship	1294.000000
Noise - Park	1398.000000
Noise - Street/Sidewalk	1439.916667
Noise - Vehicle	1437.000000
Panhandling	1223.683333
Posting Advertisement	934.000000
Squeegee	407.200000
Traffic	1386.033333
Urinating in Public	1348.000000
Vending	1430.000000

Name: Duration_Minutes, dtype: float64

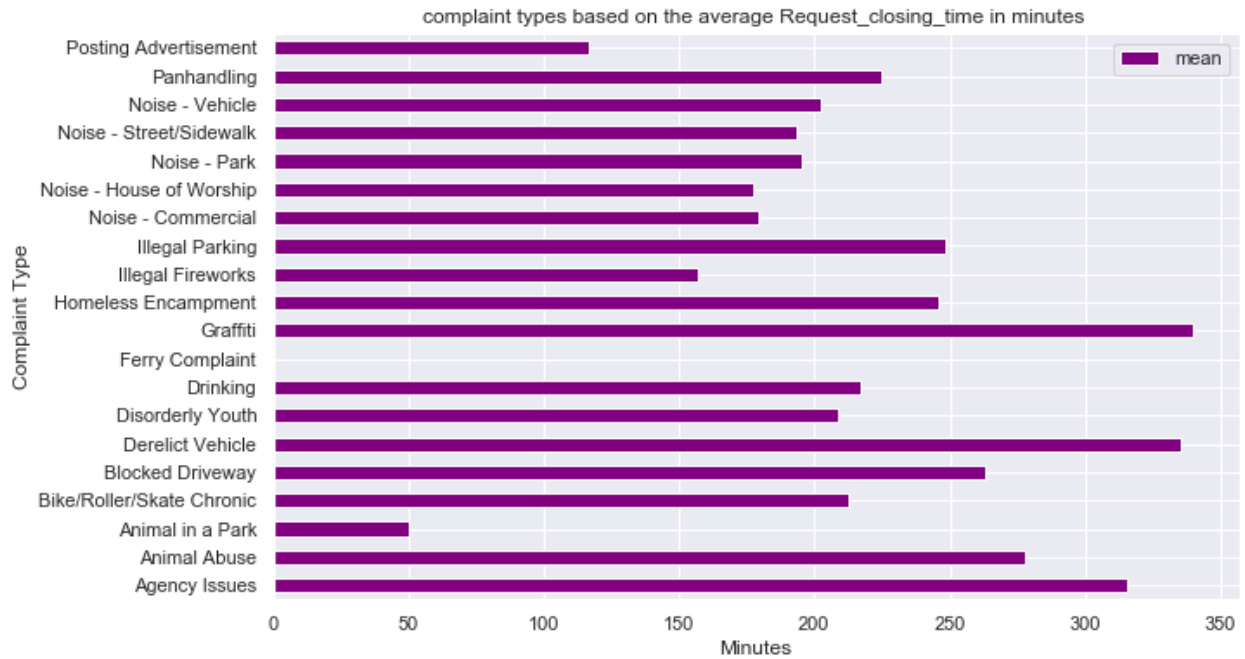
```
df.groupby("Complaint Type")["Duration_Minutes"].agg("mean")
(df.groupby("Complaint Type")["Duration_Minutes"].agg(["mean"])).head(20).plot(kind = 'barh',figsize= (10,6),
title='complaint types based on the average Request_closing_time in minutes ',color='purple')
plt.ylabel('Complaint Type')
plt.xlabel('Minutes')
```

Please Note:

This tells us the "avg" time taken in minutes to close a particular complaint type.

# Agency Issues	315.619444
# Animal Abuse	277.573208
# Animal in a Park	50.083333
# Bike/Roller/Skate Chronic	212.402830
# Blocked Driveway	263.082093
# Derelict Vehicle	335.330298
# Disorderly Youth	208.480070
# Drinking	217.027621

Text(0.5, 0, 'Minutes')



```
df.groupby(["Location Type", 'Complaint Type'])['Duration_Minutes'].agg(["mean", 'max'])
```

		mean	max
Location Type	Complaint Type		
Bridge	Homeless Encampment	229.158333	281.000000
	Drinking	241.187078	1378.000000
	Noise - Commercial	173.489104	1435.266667
	Urinating in Public	269.485714	1348.000000
Commercial	Animal Abuse	274.114516	1139.000000
...
Street/Sidewalk	Vending	227.460780	1430.000000
Subway Station	Animal Abuse	182.136364	472.016667
	Urinating in Public	69.127778	278.800000

		mean	max
Location Type	Complaint Type		
Terminal	Ferry Complaint	NaN	NaN
Vacant Lot	Derelict Vehicle	242.721212	907.900000

71 rows x 2 columns

```
df.groupby(["Location Type", 'Complaint Type'])['Duration_Minutes'].agg(["mean", 'max'])
```

```
(df.groupby(["Location Type", 'Complaint Type'])['Duration_Minutes'].agg(["mean"])).head(
(20)).plot(figsize=(10,6),color=['blue'])
(df.groupby(["Location Type", 'Complaint Type'])['Duration_Minutes'].agg(["max"])).head(
(20)).plot(figsize=(10,6),color=['green'])
```

Please Note:

This table tells us the "AVG time and maximum time " taken to close a particular complaint type at particular location.

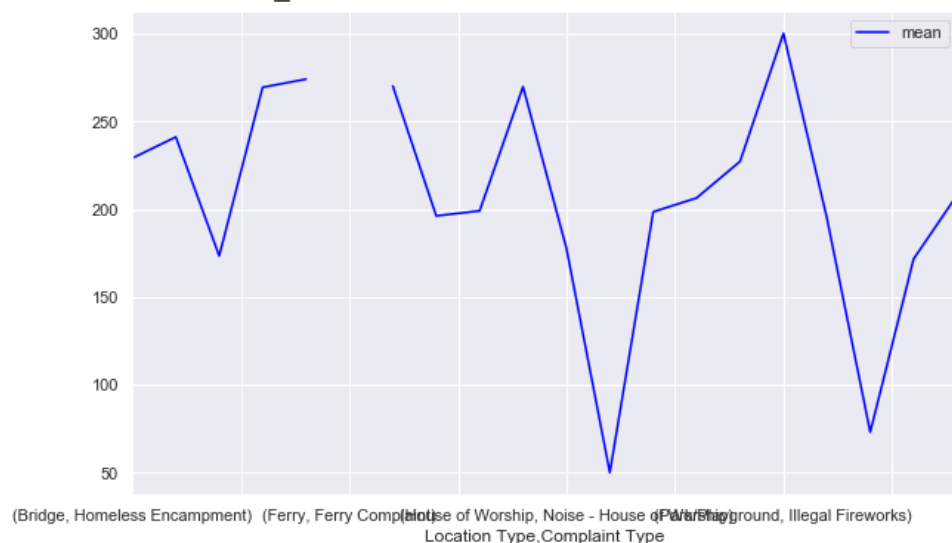
For e.g:

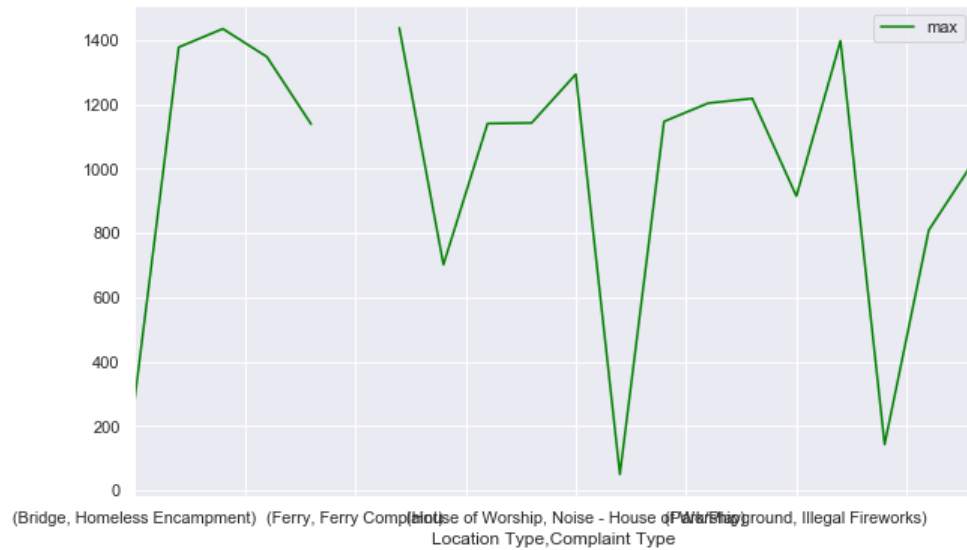
Under location type "Bridge" and complaint type " Homeless Encampment" the average time taken to close the complaint is 229 min

maximum time taken is 281 minutes.

Complaint Type 'Graffiti' has highest average of 434 minutes to close the complaint for the location store/commercial.

<matplotlib.axes._subplots.AxesSubplot at 0x270e2732548>





```
df.groupby(['Complaint Type'])['Duration_Minutes'].agg(["mean"])
```

Please Note:

The average time taken to close a particular Complaint type is as follows:

agency Issues

315.619444

Animal Abuse

277.573208

Animal in a Park

50.083333

Bike/Roller/Skate Chronic

212.402830

Blocked Driveway

263.082093

Derelict Vehicle

335.330298

Disorderly Youth

208.480070

Complaint Type	mean
Agency Issues	315.619444
Animal Abuse	277.573208
Animal in a Park	50.083333
Bike/Roller/Skate Chronic	212.402830
Blocked Driveway	263.082093
Derelict Vehicle	335.330298
Disorderly Youth	208.480070
Drinking	217.027621
Ferry Complaint	NaN
Graffiti	339.871534
Homeless Encampment	245.955948
Illegal Fireworks	157.096925
Illegal Parking	248.584628
Noise - Commercial	179.473576
Noise - House of Worship	177.647417
Noise - Park	195.335148
Noise - Street/Sidewalk	193.294691
Noise - Vehicle	202.573797

Complaint Type	mean
Agency Issues	315.619444
Animal Abuse	277.573208
Panhandling	224.595574
Posting Advertisement	116.325977
Squeegee	242.737500
Traffic	191.867486
Urinating in Public	205.437697
Vending	228.313382

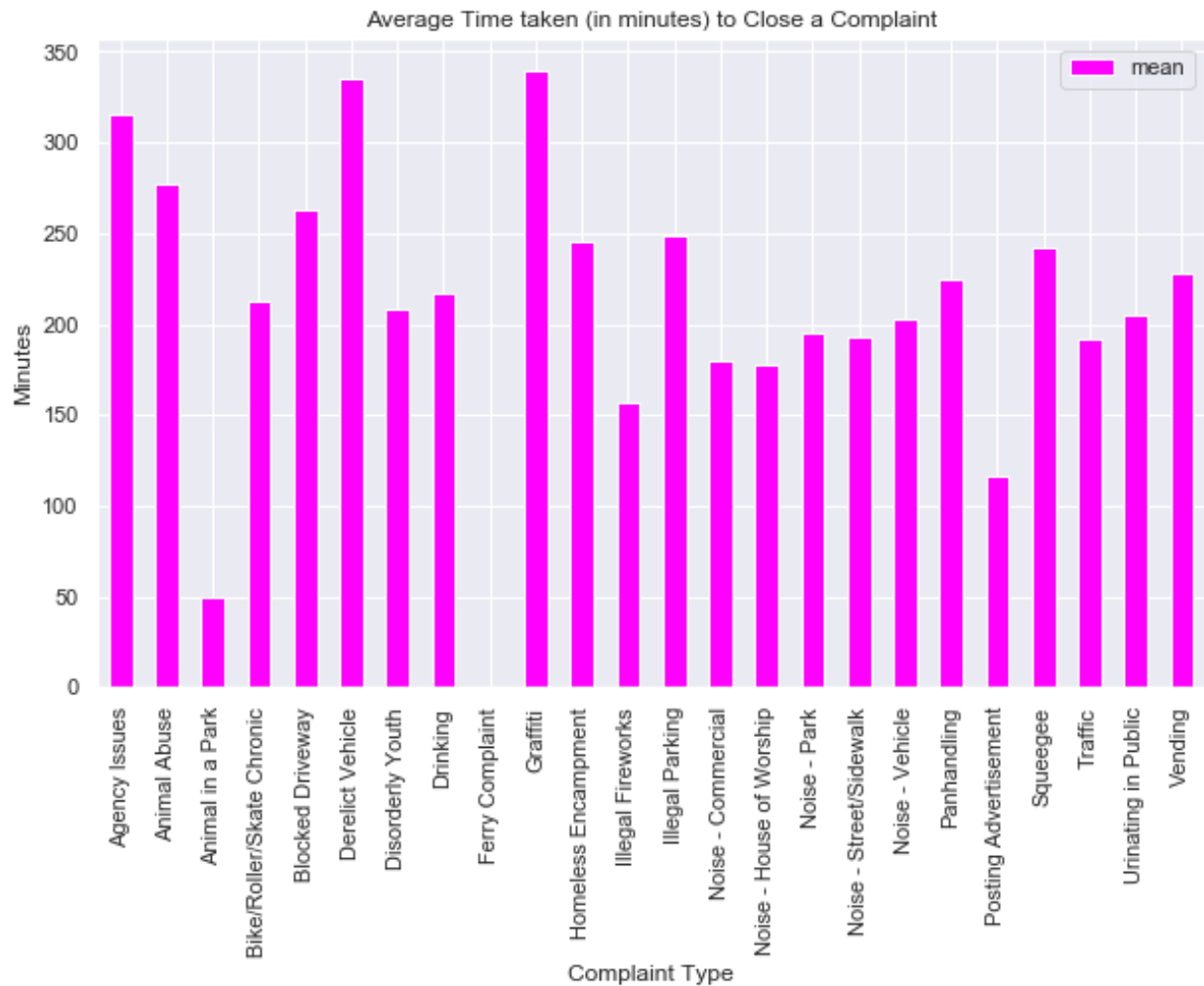
```
df.groupby(['Complaint Type'])['Duration_Minutes'].agg(['mean']).plot(kind = 'bar',figsize = (10,6),color=
'magenta')
```

```
plt.xlabel('Complaint Type')
```

```
plt.ylabel('Minutes')
```

```
plt.title('Average Time taken (in minutes) to Close a Complaint')
```

```
Text(0.5, 1.0, 'Average Time taken (in minutes) to Close a Complaint')
```



```
df.groupby(['Month'])['Duration_Minutes'].agg(["mean"])
```

Please Note:

This tells us the average time taken (in minutes) to close a particular complaint in the particular months.

```
# 3
```

```
# 214.345828
```

```
# 4
```

```
# 207.810550
```

```
# 5
```

```
# 218.354513
```

```
# 6
```

233.716719

7

238.769073

8

245.543672

9

247.157852

10

243.121011

11

241.428750

12

244.20099

Month	mean
3	214.345828
4	207.810550
5	218.354513
6	233.716719
7	238.769073
8	245.543672
9	247.157852
10	243.121011
11	241.428750

Month	mean
-------	------

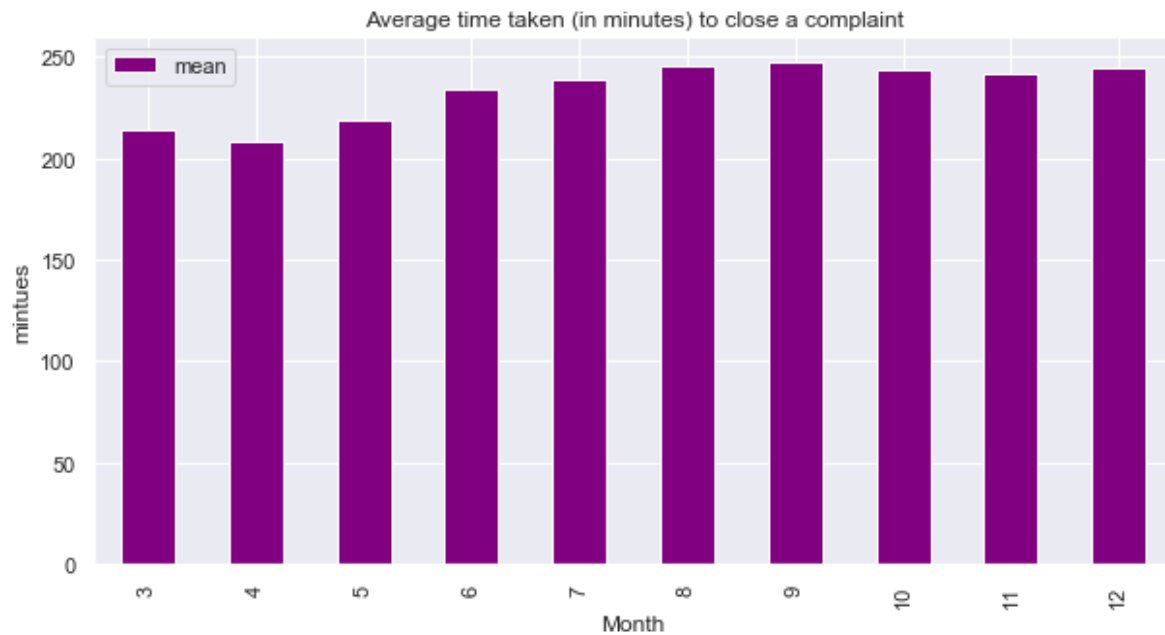
12	244.200998
----	------------

```
(df.groupby(['Month'])['Duration_Minutes'].agg(["mean"])).plot(kind = 'bar',figsize = (10,5),color= 'purple')
```

```
plt.ylabel('mintues')
```

```
plt.title('Average time taken (in minutes) to close a complaint')
```

```
Text(0.5, 1.0, 'Average time taken (in minutes) to close a complaint')
```



```
df.groupby(['Month'])['Duration_Minutes'].agg(["max"])
```

```
# Please Note:
```

```
# The maximum time taken ( in minutes) to complete a given complaint in the Month of March is 1409 minutes.
```

```
# The maximum time taken ( in minutes) to complete a given complaint in the Month of April is 1424 minutes and so on.
```

Month	max
-------	-----

3	1409.083333
---	-------------

4	1424.150000
---	-------------

5	1438.000000
---	-------------

Month	max
6	1439.883333
7	1439.300000
8	1439.916667
9	1439.133333
10	1438.850000
11	1439.800000
12	1439.683333

#Question 1: whether the average response time across complaint types is similar or not (overall)

#Choosing the features for the above Problem.

#Complaint Type, Request Closing Time and Duration Minutes are the features choosen for solving the above problem

assigning the selected features to a new variable.

dropping all the NaN values in the rows.

```
dfnew= df[['Complaint Type','Request_Closing_Time','Duration_Minutes']]
```

```
dfnew_after_drop=dfnew.dropna(axis=0, inplace=False)
```

```
dfnew_after_drop.info()
```

```
<class 'pandas.core.frame.DataFrame'>
```

```
Int64Index: 298534 entries, 0 to 300697
```

```
Data columns (total 3 columns):
```

```
Complaint Type          298534 non-null object
```

```
Request_Closing_Time    298534 non-null timedelta64[ns]
```

```
Duration_Minutes        298534 non-null float64
```

```
dtypes: float64(1), object(1), timedelta64[ns](1)
```

```
memory usage: 9.1+ MB
```

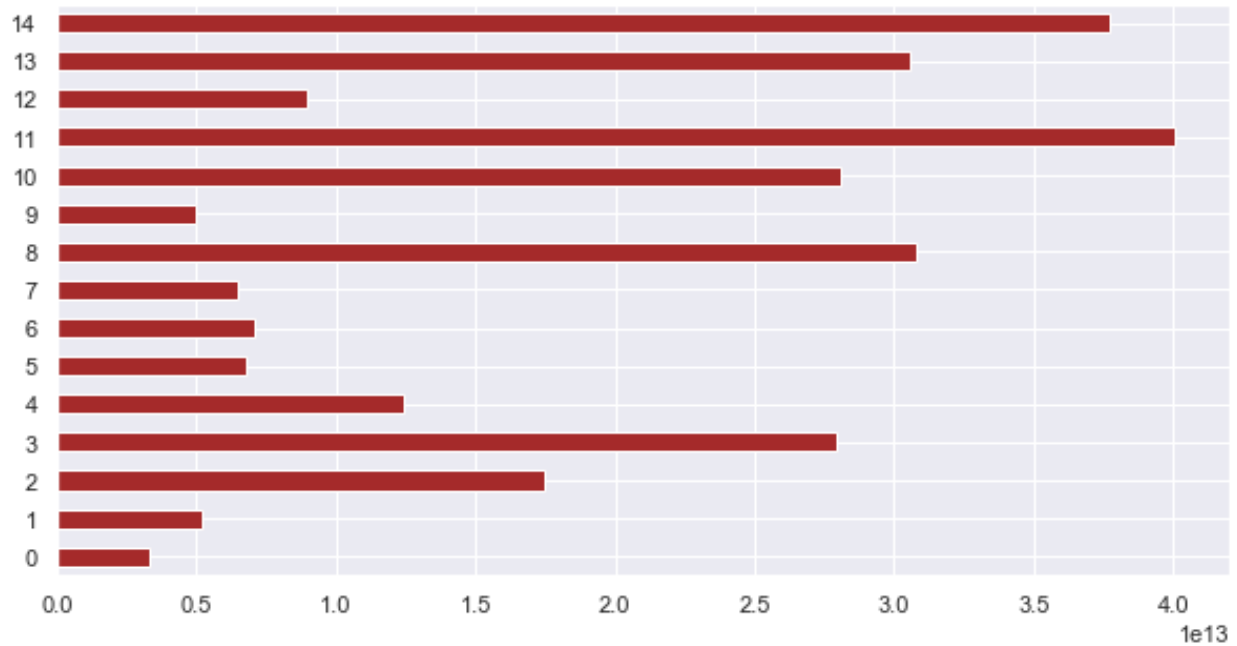
```
dfnew_after_drop.isna().sum()
```

```
Complaint Type          0
```

```
Request_Closing_Time    0
Duration_Minutes        0
dtype: int64
```

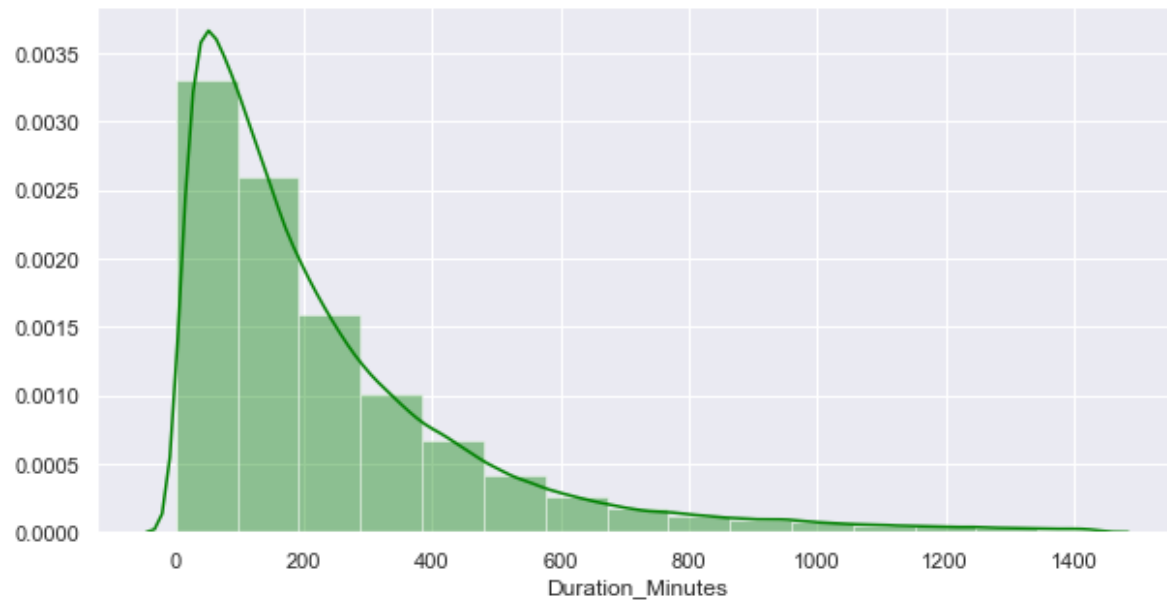
```
dfnew_after_drop['Request_Closing_Time'].head(15).plot(kind = 'barh',figsize = (10,5),color = 'brown')
```

```
<matplotlib.axes._subplots.AxesSubplot at 0x270f3935cc8>
```



```
sns.set(rc={'figure.figsize':(10,5)})
```

```
sns.distplot(dfnew_after_drop['Duration_Minutes'],rug = False,hist=True,kde = True,color='green',bins = 15)
```

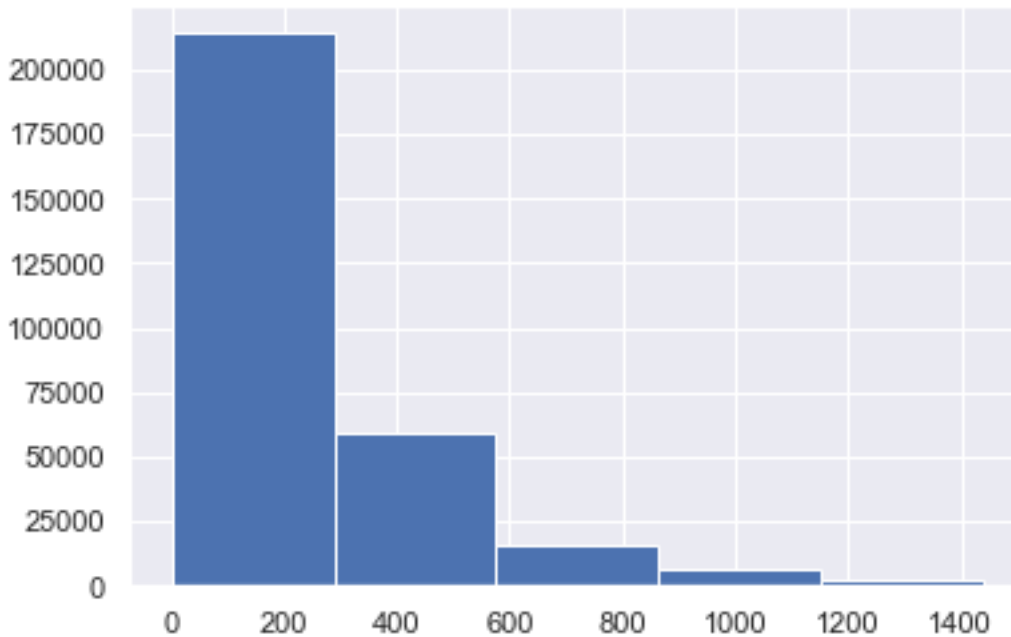


Please Note:

As this distribution is right skewed, there are lot of outliers.

majority of the data falls between 0 to 400 minutes.

```
<matplotlib.axes._subplots.AxesSubplot at 0x270854ac448>
```



```
dfnew_after_drop['Duration_Minutes'].hist(bins=5)
```

```
<matplotlib.axes._subplots.AxesSubplot at 0x270852e5508>
```

Please Note:

When we have factors with more than 2 levels we use '2 'T' TEST

The features chosen for the '2t TEST' are 'Location_Type' and 'Duration_Minutes' and 'Request_Closing_Time'

-Null Hypothesis (H0)-- the average response time across the complaint types is similar --H0 is accepted (Fail to reject Null Hypothesis)

-Alternate Hypothesis (H1) ---the average response time across the complaint types is NOT similar (different) ---H0(Null Hypothesis) is rejected

```
df['Complaint_Type'].value_counts()
```

Blocked Driveway	77044
Illegal Parking	75361
Noise - Street/Sidewalk	48612
Noise - Commercial	35577
Derelict Vehicle	17718
Noise - Vehicle	17083
Animal Abuse	7778
Traffic	4498

Homeless Encampment	4416
Noise - Park	4042
Vending	3802
Drinking	1280
Noise - House of Worship	931
Posting Advertisement	650
Urinating in Public	592
Bike/Roller/Skate Chronic	427
Panhandling	307
Disorderly Youth	286
Illegal Fireworks	168
Graffiti	113
Agency Issues	6
Squeegee	4
Ferry Complaint	2
Animal in a Park	1

Name: Complaint Type, dtype: int64

```
df[['Duration_Minutes', 'Request_Closing_Time']].describe()
```

	Duration_Minutes	Request_Closing_Time
count	298534.000000	298534
mean	235.763797	0 days 04:18:51.832782
std	231.619407	0 days 06:05:22.141833
min	0.000000	0 days 00:01:00
25%	76.000000	0 days 01:16:33
50%	161.300000	0 days 02:42:55.500000
75%	316.000000	0 days 05:21:00
max	1439.916667	24 days 16:52:22

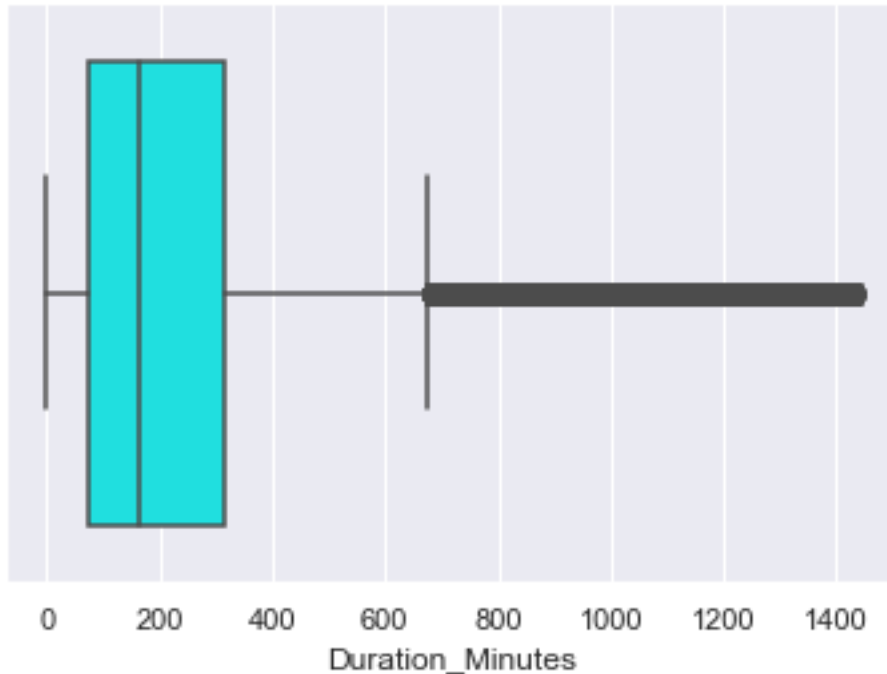
```
import statsmodels.api as sm
from statsmodels.formula.api import ols
sns.boxplot('Duration_Minutes', data= df, color='cyan' )
```

Please Note:

There are lot of outliers

the mean of duration minutes is around 180 minutes

<matplotlib.axes._subplots.AxesSubplot at 0x270ee9939c8>



#dfnew_after_drop Request_Closing_Time Duration_Minutes Location Type

```
dfnew_after_drop[dfnew_after_drop['Complaint Type']=='Blocked Driveway']['Request_Closing_Time'].mean()
```

Request_Closing_Time 04:44:27.258638

dtype: timedelta64[ns]

#dfnew_after_drop Request_Closing_Time Duration_Minutes Location Type

```
dfnew_after_drop[dfnew_after_drop['Complaint Type']=='Illegal Parking']['Request_Closing_Time'].mean()
```

Request_Closing_Time 04:30:04.145454

dtype: timedelta64[ns]

from scipy import stats

```
dfnew_after_drop['Complaint Type'].value_counts()
```

Blocked Driveway 76810

Illegal Parking 74532

Noise - Street/Sidewalk 48076

Noise - Commercial 35247

Derelict Vehicle	17588
Noise - Vehicle	17033
Animal Abuse	7768
Traffic	4496
Homeless Encampment	4416
Noise - Park	4022
Vending	3795
Drinking	1275
Noise - House of Worship	929
Posting Advertisement	648
Urinating in Public	592
Bike/Roller/Skate Chronic	424
Panhandling	305
Disorderly Youth	286
Illegal Fireworks	168
Graffiti	113
Agency Issues	6
Squeegee	4
Animal in a Park	1

Name: Complaint Type, dtype: int64

```
# CREATE blocked_driveway_duration_minutes, illegal_parking_duration_minutes
# 'Blocked Driveway',Illegal Parking and Noise - Street/Sidewalk are taken as these are the
most repeated complaint types.
```

```
blocked_driveway_duration_minutes = dfnew_after_drop[dfnew_after_drop['Complaint Type']=='Blocked
Driveway']['Duration_Minutes']
illegal_parking_duration_minutes = dfnew_after_drop[dfnew_after_drop['Complaint Type']=='Illegal
Parking']['Duration_Minutes']
noise_street_sidewalk_duration_minutes = dfnew_after_drop[dfnew_after_drop['Complaint Type']=='Noise -
Street/Sidewalk']['Duration_Minutes']

stats.ttest_ind(blocked_driveway_duration_minutes, illegal_parking_duration_minutes)
Ttest_indResult(statistic=11.878368607446648, pvalue=1.5852726168784882e-32)

stats.ttest_ind(illegal_parking_duration_minutes,noise_street_sidewalk_duration_minutes)
Ttest_indResult(statistic=42.5796940247014, pvalue=0.0)
```

Please Note:

-The P value = 1.585272616878488e-32 i.e (10^{-32}). [blocked_driveway_duration_minutes, illegal_parking_duration_minutes] as the p-value is less than 0.05 , the null hypothesis is rejected.-The average response time across the complaint types is NOT similar (it is different).it is distributed -blocked_driveway_duration_minutes, illegal_parking_duration_minutes

-The P value = 0.0 i.e (10^{-308}).

[illegal_parking_duration_minutes,noise_street_sidewalk_duration_minutes]

The p-value is less than 0.05 , the null hypothesis is rejected. the average response time across the complaint types is NOT similar (different).it is distributed -

illegal_parking_duration_minutes,noise_street_sidewalk_duration_minutes

Question 2:

Are the type of complaint or service requested and location related ?

-Null Hypothesis (H0)-- The **type** of complaint **or** service requested **and** locations are related to each other.

-H0 **is** accepted (Fail to reject Null Hypothesis)

-Alternate Hypothesis (H1) ---The **type** of complaint **or** service requested **and** locations are NOT related to each other. -H0(Null Hypothesis) **is** rejected

#Preparing Data

df.info()

```
<class 'pandas.core.frame.DataFrame'>
```

RangeIndex: 300698 entries, 0 to 300697

Data columns (total 56 columns):

Unique Key	300698 non-null int64
Created Date	300698 non-null datetime64[ns]
Closed Date	298534 non-null datetime64[ns]
Agency	300698 non-null object
Agency Name	300698 non-null object
Complaint Type	300698 non-null object
Descriptor	294784 non-null object
Location Type	300567 non-null object
Incident Zip	298083 non-null float64
Incident Address	256288 non-null object
Street Name	256288 non-null object
Cross Street 1	251419 non-null object
Cross Street 2	250919 non-null object
Intersection Street 1	43858 non-null object
Intersection Street 2	43362 non-null object
Address Type	297883 non-null object
City	298084 non-null object
Landmark	349 non-null object
Facility Type	298527 non-null object
Status	300698 non-null object
Due Date	300695 non-null object
Resolution Description	300698 non-null object
Resolution Action Updated Date	298511 non-null datetime64[ns]


```

Community Board          300698 non-null object
Borough                  300698 non-null object
X Coordinate (State Plane) 297158 non-null float64
Y Coordinate (State Plane) 297158 non-null float64
Park Facility Name       300698 non-null object
Park Borough             300698 non-null object
School Name              300698 non-null object
School Number            300698 non-null object
School Region            300697 non-null object
School Code              300697 non-null object
School Phone Number      300698 non-null object
School Address           300698 non-null object
School City              300698 non-null object
School State             300698 non-null object
School Zip               300697 non-null object
School Not Found         300698 non-null object
School or Citywide Complaint 0 non-null float64
Vehicle Type             0 non-null float64
Taxi Company Borough     0 non-null float64
Taxi Pick Up Location    0 non-null float64
Bridge Highway Name      243 non-null object
Bridge Highway Direction 243 non-null object
Road Ramp                213 non-null object
Bridge Highway Segment   213 non-null object
Garage Lot Name          0 non-null float64
Ferry Direction          1 non-null object
Ferry Terminal Name      2 non-null object
Latitude                 297158 non-null float64
Longitude                297158 non-null float64
Location                 297158 non-null object
Request_Closing_Time     298534 non-null timedelta64[ns]
Month                    300698 non-null int64
Duration_Minutes         298534 non-null float64
dtypes: datetime64[ns] (3), float64 (11), int64 (2), object (39),
timedelta64[ns] (1)
memory usage: 128.5+ MB

```

```

dfnew_1 = df[['Complaint Type', 'Latitude', 'Longitude']]
dfnew_1.isna().sum()
Complaint Type      0
Latitude            3540
Longitude           3540
dtype: int64

```

```
dfnew_after_drop_1=dfnew_1.dropna(axis=0, inplace=False)
```

```
# A new feature is created 'Location' as its from a dataframe object type and cannot be converted to int or float
```

```
dfnew_after_drop_1['Location'] = list(zip(dfnew_after_drop_1.Latitude,dfnew_after_drop_1.Longitude))
```

```
E:\Programs\Anaconda3\lib\site-packages\ipykernel_launcher.py:2:
```

```
SettingWithCopyWarning:
```

```
A value is trying to be set on a copy of a slice from a DataFrame.
```

```
Try using .loc[row_indexer,col_indexer] = value instead
```

See the caveats in the documentation: http://pandas.pydata.org/pandas-docs/stable/user_guide/indexing.html#returning-a-view-versus-a-copy

```
dfnew_after_drop_1.head()
```

	Complaint Type	Latitude	Longitude	Location
0	Noise - Street/Sidewalk	40.865682	-73.923501	(40.86568154, -73.92350096)
1	Blocked Driveway	40.775945	-73.915094	(40.77594531, -73.91509394)
2	Blocked Driveway	40.870325	-73.888525	(40.87032452, -73.88852464)
3	Illegal Parking	40.835994	-73.828379	(40.83599405, -73.82837940000002)
4	Illegal Parking	40.733060	-73.874170	(40.73305962, -73.87416976)

```
dfnew_after_drop_1.isna().sum()
```

```
Complaint Type    0
```

```
Latitude          0
```

```
Longitude         0
```

```
Location          0
```

```
dtype: int64
```

```
dfnew_after_drop_1.info()
```

```
<class 'pandas.core.frame.DataFrame'>
```

```
Int64Index: 297158 entries, 0 to 300697
```

```
Data columns (total 4 columns):
```

```
Complaint Type    297158 non-null object
```

```
Latitude          297158 non-null float64
```

```
Longitude         297158 non-null float64
```

```
Location          297158 non-null object
dtypes: float64(2), object(2)
memory usage: 11.3+ MB
```

```
dfnew_after_drop_1['Complaint Type'].value_counts()
```

```
Blocked Driveway          76723
Illegal Parking           74066
Noise - Street/Sidewalk   47793
Noise - Commercial        35176
Derelict Vehicle          17519
Noise - Vehicle           16873
Animal Abuse              7747
Traffic                   4475
Homeless Encampment       4367
Noise - Park              3929
Vending                   3776
Drinking                  1271
Noise - House of Worship   922
Posting Advertisement      649
Urinating in Public        592
Bike/Roller/Skate Chronic  414
Panhandling                301
Disorderly Youth           285
Illegal Fireworks          163
Graffiti                  113
Squeegee                   4
Name: Complaint Type, dtype: int64
```

```
dfnew_after_drop_1.info()
<class 'pandas.core.frame.DataFrame'>
Int64Index: 297158 entries, 0 to 300697
Data columns (total 4 columns):
Complaint Type    297158 non-null object
Latitude          297158 non-null float64
Longitude         297158 non-null float64
Location          297158 non-null object
dtypes: float64(2), object(2)
memory usage: 11.3+ MB
```

On combining latitude and longitude results into object type & can't be converted to float hence 'location' variable is ignored

```
dfnew_after_drop_1['Complaint Type'].value_counts()
```

Blocked Driveway	76723
Illegal Parking	74066
Noise - Street/Sidewalk	47793
Noise - Commercial	35176
Derelict Vehicle	17519
Noise - Vehicle	16873
Animal Abuse	7747
Traffic	4475
Homeless Encampment	4367
Noise - Park	3929
Vending	3776
Drinking	1271
Noise - House of Worship	922
Posting Advertisement	649
Urinating in Public	592
Bike/Roller/Skate Chronic	414
Panhandling	301
Disorderly Youth	285
Illegal Fireworks	163
Graffiti	113
Squeegee	4

Name: Complaint Type, dtype: int64

```
dfnew_after_drop_1[dfnew_after_drop_1['Complaint Type']=='Blocked Driveway'] [['Location']].mode()
```

Location

```
0   (40.76150067, -73.81339940000001)
```

```
dfnew_after_drop_1[dfnew_after_drop_1['Complaint Type']=='Blocked Driveway'] [['Location']].head()
```

Location

```
1   (40.77594531, -73.91509394)
```

```
2   (40.87032452, -73.88852464)
```

```
7   (40.83750263, -73.90290517)
```

```
9   (40.62379307, -73.9995389)
```

```
10  (40.75259967, -73.89336321)
```

```
# creating blocked_driveway_location, illegal_parking_location
# 'Blocked Driveway ',Illegal Parking and Noise - Street/Sidewalk. as taken as these are the most
repeated complaint types.
```

```
blocked_driveway = dfnew_after_drop_1[dfnew_after_drop_1['Complaint Type']=='Blocked
Driveway'][['Latitude','Longitude']]
illegal_parking = dfnew_after_drop_1[dfnew_after_drop_1['Complaint Type']=='Illegal
Parking'][['Latitude','Longitude']]
noise_street_sidewalk = dfnew_after_drop_1[dfnew_after_drop_1['Complaint Type']=='Noise -
Street/Sidewalk'][['Latitude','Longitude']]
```

```
stats.ttest_ind(blocked_driveway,illegal_parking)
```

```
Ttest_indResult(statistic=array([20.72505512, 71.36519054]),
pvalue=array([2.79800334e-95, 0.00000000e+00]))
```

```
stats.ttest_ind(illegal_parking,noise_street_sidewalk)
```

```
Ttest_indResult(statistic=array([-117.76704045, 8.70740178]),
pvalue=array([0.00000000e+00, 3.14703712e-18]))
```

Please Note:

-The P value =([2.79800334e-95, 0.00000000e+00]), i.e (10^{-95} , 0).

[blocked driveway location, illegal parking location]

the p-value is less than 0.05 , the null hypothesis is rejected. The type of complaint or service requested and locations are NOT related to each other. It is distributed - blocked_driveway_location,illegal_parking_location.

-The P value =([0.00000000e+00, 3.14703712e-18]), i.e (0, 10^{-18}).

[illegal parking location,noise street sidewalk location]

-The p-value is less than 0.05 , the null hypothesis is rejected. -The type of complaint or service requested and locations are NOT related to each other. It is distributed - illegal_parking_location,noise_street_sidewalk_location.

<End of document>