Customer Service Requests Analysis 311

In [1]: ▶ import pandas as pd import numpy as np

%matplotlib inline

import matplotlib.pyplot as plt import seaborn as sns

Q-1. Import a 311 NYC service request.

In [2]: M df = pd.read_csv('311_Service_Requests_from_2010_to_Present.csv')

C:\Users\comac 12\anaconda3\lib\site-packages\IPython\core\interactiveshell.py:3071: DtypeWarning: Columns (48,49) have mixed types.Specif y dtype option on import or set low_memory=False.

has_raised = await self.run_ast_nodes(code_ast.body, cell_name,

In [3]: ► df.head()

Out[3]:

	Unique Key	Created Date	Closed Date	Agency	Agency Name	Complaint Type	Descriptor	Location Type	Incident Zip	Incident Address	 Bridge Highway Name	Bridge Highway Direction	Road Ramp	Bridge Highway Segment	Garage Lot Name	C
0	32310363	12/31/2015 11:59:45 PM	01-01- 16 0:55	NYPD	New York City Police Department	Noise - Street/Sidewalk	Loud Music/Party	Street/Sidewalk	10034.0	71 VERMILYEA AVENUE	 NaN	NaN	NaN	NaN	NaN	_
1	32309934	12/31/2015 11:59:44 PM	01-01- 16 1:26	NYPD	New York City Police Department	Blocked Driveway	No Access	Street/Sidewalk	11105.0	27-07 23 AVENUE	 NaN	NaN	NaN	NaN	NaN	
2	32309159	12/31/2015 11:59:29 PM	01-01- 16 4:51	NYPD	New York City Police Department	Blocked Driveway	No Access	Street/Sidewalk	10458.0	2897 VALENTINE AVENUE	 NaN	NaN	NaN	NaN	NaN	
3	32305098	12/31/2015 11:57:46 PM	01-01- 16 7:43	NYPD	New York City Police Department	Illegal Parking	Commercial Overnight Parking	Street/Sidewalk	10461.0	2940 BAISLEY AVENUE	 NaN	NaN	NaN	NaN	NaN	
4	32306529	12/31/2015 11:56:58 PM	01-01- 16 3:24	NYPD	New York City Police Department	Illegal Parking	Blocked Sidewalk	Street/Sidewalk	11373.0	87-14 57 ROAD	 NaN	NaN	NaN	NaN	NaN	

5 rows × 53 columns

In [5]: ► df.info()

<class 'pandas.core.frame.DataFrame'> RangeIndex: 300698 entries, 0 to 300697 Data columns (total 53 columns): # Column Non-Null Count Dtype Unique Key 0 300698 non-null int64 Created Date 300698 non-null object Closed Date 298534 non-null object 2 3 Agency 300698 non-null object Agency Name 300698 non-null object 300698 non-null object Complaint Type 294784 non-null object Descriptor 300567 non-null object Location Type 7 8 Incident Zip 298083 non-null float64 Incident Address 256288 non-null object 10 Street Name 256288 non-null object 11 Cross Street 1 251419 non-null object 250919 non-null object 12 Cross Street 2 13 Intersection Street 1 43858 non-null 14 Intersection Street 2 43362 non-null object 297883 non-null object 15 Address Type 16 298084 non-null City object 17 Landmark 349 non-null object 18 Facility Type 298527 non-null object 300698 non-null 19 Status object 20 Due Date 300695 non-null object 21 Resolution Description 300698 non-null object Resolution Action Updated Date 22 298511 non-null object Community Board 23 300698 non-null object 24 Borough 300698 non-null object X Coordinate (State Plane) 297158 non-null float64 25 Y Coordinate (State Plane) 297158 non-null float64 300698 non-null Park Facility Name obiect Park Borough 300698 non-null object 29 School Name 300698 non-null object 30 School Number 300698 non-null object 300697 non-null object 31 School Region 32 School Code 300697 non-null object 33 School Phone Number 300698 non-null 300698 non-null object 34 School Address 35 School City 300698 non-null object 36 School State 300698 non-null object 37 School Zip 300697 non-null object 38 School Not Found 300698 non-null object 39 School or Citywide Complaint 0 non-null float64 float64 40 Vehicle Type 0 non-null 41 Taxi Company Borough 0 non-null float64 float64 42 Taxi Pick Up Location 0 non-null 43 Bridge Highway Name 243 non-null object 243 non-null 44 Bridge Highway Direction object 213 non-null object 45 Road Ramp Bridge Highway Segment 213 non-null object 46 47 Garage Lot Name float64 0 non-null 1 non-null 48 Ferry Direction object 49 Ferry Terminal Name 2 non-null object 50 Latitude 297158 non-null float64 51 Longitude 297158 non-null float64 52 Location 297158 non-null object dtypes: float64(10), int64(1), object(42)

memory usage: 121.6+ MB

```
Out[4]: Unique Key
                                                0.000000
            Created Date
                                                0.000000
            Closed Date
                                                0.719659
                                                0.000000
            Agency
            Agency Name
                                                0.000000
            Complaint Type
                                                0.000000
            Descriptor
                                                1.966757
            Location Type
                                                0.043565
                                                0.869643
            Incident Zip
            Incident Address
                                               14.768971
            Street Name
                                               14.768971
            Cross Street 1
                                               16.388203
            Cross Street 2
                                               16.554483
            Intersection Street 1
                                               85.414602
                                               85.579552
            Intersection Street 2
            Address Type
                                                0.936155
                                                0.869311
            City
            Landmark
                                               99.883937
            Facility Type
                                                0.721987
                                                0.000000
            Status
            Due Date
                                                0.000998
                                                0.000000
            Resolution Description
            Resolution Action Updated Date
                                                0.727308
                                                0.000000
            Community Board
            Borough
                                                0.000000
            X Coordinate (State Plane)
                                                1.177261
            Y Coordinate (State Plane)
                                                1.177261
            Park Facility Name
                                                0.000000
            Park Borough
                                                0.000000
            School Name
                                                0.000000
            School Number
                                                0.000000
            School Region
                                                0.000333
                                                0.000333
            School Code
                                                0.000000
            School Phone Number
            School Address
                                                0.000000
            School City
                                                0.000000
            School State
                                                0.000000
            School Zip
                                                0.000333
            School Not Found
                                                0.000000
            School or Citywide Complaint
                                              100.000000
            Vehicle Type
                                              100.000000
                                              100.000000
            Taxi Company Borough
            Taxi Pick Up Location
                                              100.000000
                                               99.919188
            Bridge Highway Name
                                               99.919188
            Bridge Highway Direction
            Road Ramp
                                               99.929165
            Bridge Highway Segment
                                               99.929165
            Garage Lot Name
                                              100.000000
                                               99.999667
            Ferry Direction
                                               99.999335
            Ferry Terminal Name
                                                1.177261
            Latitude
            Longitude
                                                1.177261
            Location
                                                1.177261
            dtype: float64
        Data Cleaning with Null Values
In [6]: ▶ #Dropping columns with more than 30% null values:
            df.drop(labels=['Intersection Street 1',
                                 'Intersection Street 2',
                                 'Landmark',
                                 'Vehicle Type',
                                 'School or Citywide Complaint',
                                 'Taxi Company Borough',
                                 'Taxi Pick Up Location',
                                 'Bridge Highway Name',
                                 'Bridge Highway Direction',
                                 'Road Ramp',
                                 'Bridge Highway Segment',
                                 'Garage Lot Name',
                                 'Ferry Direction',
                                 'Ferry Terminal Name'
                                 ],axis=1, inplace=True)
In [7]: 🔰 # percentage of missing values greater than 5% and less than 30%: Replacing values with mode
            df['Incident Address'].fillna(value=df['Incident Address'].mode()[0],inplace=True)
            df['Street Name'].fillna(value=df['Street Name'].mode()[0],inplace=True)
            df['Cross Street 1'].fillna(value=df['Cross Street 1'].mode()[0],inplace=True)
                'Cross Street 2'1.fillna(value=df['Cross Street 2'].mode()[0],inplace=True)
In [9]: ▶ #percentage of missing value in column is less than 5%, so dropping rows:
            ['Closed Date', 'Descriptor', 'Location Type', 'Incident Zip', 'Adddress Type', 'City', 'Facility Type', 'Due Date',
             'Resolution Action updated Date','X Coordinate (State Plane)','Y Coordinate (State Plane)','School Region',
             'School Code','School Zip','Latitude','Longitude','Location']
            df.dropna(inplace=True)
```

```
In [10]: ► df.info()
            <class 'pandas.core.frame.DataFrame'>
            Int64Index: 290881 entries, 0 to 300697
            Data columns (total 39 columns):
                                                Non-Null Count
             # Column
                                                                Dtype
             0
                                               290881 non-null int64
                Unique Kev
                 Created Date
             1
                                               290881 non-null object
                 Closed Date
                                                290881 non-null object
             3
                 Agency
                                               290881 non-null object
                 Agency Name
                                               290881 non-null object
                 Complaint Type
                                               290881 non-null object
             5
                 Descriptor
                                               290881 non-null object
                 Location Type
                                               290881 non-null object
                                               290881 non-null float64
             8
                Incident Zip
             9
                 Incident Address
                                               290881 non-null object
             10 Street Name
                                               290881 non-null object
             11 Cross Street 1
                                               290881 non-null object
             12 Cross Street 2
                                               290881 non-null object
             13 Address Type
                                               290881 non-null object
             14 City
                                               290881 non-null object
                                               290881 non-null object
             15 Facility Type
             16 Status
                                               290881 non-null object
             17 Due Date
                                                290881 non-null object
                                                290881 non-null object
             18 Resolution Description
             19
                Resolution Action Updated Date 290881 non-null object
             20 Community Board
                                               290881 non-null object
             21 Borough
                                                290881 non-null object
             22 X Coordinate (State Plane)
                                                290881 non-null float64
             23 Y Coordinate (State Plane)
                                                290881 non-null float64
             24 Park Facility Name
                                                290881 non-null object
                                                290881 non-null object
             25 Park Borough
             26 School Name
                                               290881 non-null object
             27 School Number
                                               290881 non-null object
                                               290881 non-null object
             28 School Region
             29
                                               290881 non-null object
                School Code
             30 School Phone Number
                                               290881 non-null object
             31 School Address
                                               290881 non-null object
             32 School City
                                               290881 non-null object
                                               290881 non-null object
             33 School State
             34 School Zip
                                               290881 non-null object
             35 School Not Found
                                                290881 non-null object
             36 Latitude
                                               290881 non-null float64
             37 Longitude
                                                290881 non-null float64
             38 Location
                                               290881 non-null object
            dtypes: float64(5), int64(1), object(33)
            memory usage: 88.8+ MB
In [11]: ▶ df.shape
   Out[11]: (290881, 39)
In [12]: ► df.isnull().sum()
         Q-2. Convert the columns 'Created Date' and Closed Date' to datetime datatype
In [13]: 🔰 # convert the columns 'Created Date' and Closed Date' to datetime datatype.
            df['Created Date'] = pd.to_datetime(df['Created Date'])
            df['Closed Date'] = pd.to_datetime(df['Closed Date'])
         create a new column 'Request_Closing_Time' as the time elapsed between request creation and request
         closing.
In [16]: ► df.keys()
   Out[16]: Index(['Unique Key', 'Created Date', 'Closed Date', 'Agency', 'Agency Name',
                   'Complaint Type', 'Descriptor', 'Location Type', 'Incident Zip',
                                                    'Cross Street 1',
                    Incident Address ,
                                     'Street Name',
                                                                      'Cross Street 2',
                   'Address Type', 'City', 'Facility Type', 'Status', 'Due Date',
                   'Resolution Description', 'Resolution Action Updated Date',
                   'Community Board', 'Borough', 'X Coordinate (State Plane)',
'Y Coordinate (State Plane)', 'Park Facility Name', 'Park Borough',
'School Name', 'School Number', 'School Region', 'School Code',
                   'School Phone Number', 'School Address', 'School City', 'School State',
                   'School Zip', 'School Not Found', 'Latitude', 'Longitude', 'Location',
                   'Request_Closing_Time'],
                  dtype='object')
In [17]: M df['Request_Closing_Time']
```

In [18]: ► df['Agency Name'].unique()

In [19]: | df['Agency Name'].value_counts()

Out[19]: New York City Police Department

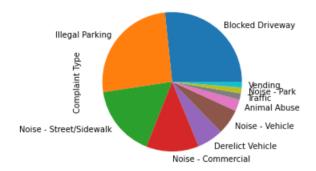
Name: Agency Name, dtype: int64

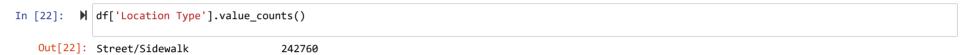
Out[18]: array(['New York City Police Department'], dtype=object)

290881

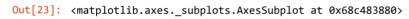
In [20]: df['Complaint Type'].value_counts() Out[20]: Blocked Driveway 76675 Illegal Parking 74020 Noise - Street/Sidewalk 47745 Noise - Commercial 35144 Derelict Vehicle 17496 Noise - Vehicle 16867 Animal Abuse 7743 Traffic 4256 Noise - Park 3927 Vending 3773 Drinking 1270 Noise - House of Worship 920 Posting Advertisement 647 285 Disorderly Youth Graffiti 113 Name: Complaint Type, dtype: int64

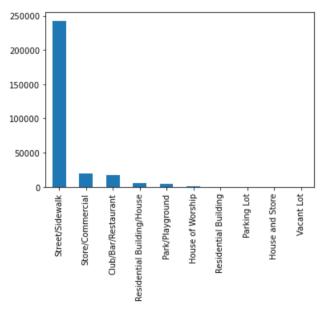
Out[21]: <matplotlib.axes._subplots.AxesSubplot at 0x68a06c4f0>





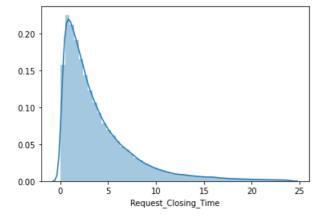
Store/Commercial 19425 Club/Bar/Restaurant 17172 Residential Building/House 5752 Park/Playground 4246 House of Worship 920 Residential Building 226 Parking Lot 116 House and Store 93 77 Vacant Lot Commercial 62 Subway Station 22 5 Roadway Tunnel Highway Name: Location Type, dtype: int64





In [24]: N sns.distplot(df['Request_Closing_Time'])

Out[24]: <matplotlib.axes._subplots.AxesSubplot at 0x68c50e9d0>



```
In [25]: M df['Request_Closing_Time'].describe()
   Out[25]: count
                      290881.000000
                           3.925422
             mean
                           3.857343
             std
                           0.000000
             min
             25%
                           1.266667
                           2.684722
             50%
                           5.257500
             75%
                          23.998611
             max
             Name: Request_Closing_Time, dtype: float64
```

Q-3. Major insights/patterns with 4 major conclusions:

1) Top 5 "location type" having maximum complaints

- Street/Sidewalk
- Store/Commercial
- Club/Bar/Restaurant
- Residential Building/House
- Park/Playground

2) Top 5 "complaint type" received

- Street/Sidewalk
- Store/Commercial
- Club/Bar/Restaurant
- Residential Building/House
- Park/Playground
- 3) Out of the 3 Agencies, maximum complaints falls under the New York City Police Department
- 4) The mean/average time to resolve the complaints is 3.92

Highway

House of Worship

House and Store

Park/Playground

Parking Lot

Residential Building

Location Type

Residential Building/House

Roadway Tunnel

Store/Commercial

Q.4. 'Request_Closing_Time', grouping them for different locations.

```
In [32]: M df_Loc_hours = df[['Location Type', 'Request_Closing_Time']]
        In [33]:
In [36]: ► df_Request_Closing_Time_Loc.head()
   Out[36]:
                          Request_Closing_Time
               Location Type
           Club/Bar/Restaurant
                                  2.913868
                                  4.568575
                 Commercial
                   Highway
                                  6.781389
                                   4.497133
             House and Store
             House of Worship
                                   2.964972
        df1 = df_Request_Closing_Time_Loc.reset_index()
In [39]:
In [40]: ► df1.keys()
   Out[40]: Index(['Location Type', 'Request_Closing_Time'], dtype='object')
df_Request_Closing_Time_Loc.plot(kind='bar',ax=ax)
   Out[41]: <matplotlib.axes._subplots.AxesSubplot at 0x68cbe7940>
                                                          Request_Closing_Time
```

Street/Sidewalk

Subway Station

Vacant Lot

```
In [43]: M df_Loc_Request_Closing_Time = df_Loc_complaint_hours.groupby(by=['Location Type','Complaint Type']).mean()
```

Out[44]: Request_Closing_Time

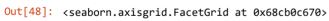
		Request_Olosing_Time
Location Type	Complaint Type	
Street/Sidewalk	Posting Advertisement	1.777614
Parking Lot	Posting Advertisement	2.115754
Store/Commercial	Posting Advertisement	2.369167
Store/Commercial	Disorderly Youth	2.839479
Club/Bar/Restaurant	Noise - Commercial	2.889850
House of Worship	Noise - House of Worship	2.964972
Subway Station	Animal Abuse	3.035606
Store/Commercial	Noise - Commercial	3.066891
Oten at/O: Janualla	Traffic	3.202763
Street/Sidewalk	Noise - Street/Sidewalk	3.217912
Park/Playground	Noise - Park	3.243770
Store/Commercial	Drinking	3.252596
	Animal Abuse	3.266972
Park/Playground	Drinking	3.356238
	Disorderly Youth	3.368008
Street/Sidewalk	Noise - Vehicle	3.383090
	Drinking	3.408078
Park/Playground	Vending	3.474647
	Drinking	3.595236
Residential Building/House	Posting Advertisement	3.600509
Highway	Traffic	3.687778
Street/Sidewalk	Vending	3.786017
Residential Building/House	Disorderly Youth	3.854477
Store/Commercial	Vending	3.862727
Club/Bar/Restaurant	Drinking	4.019785
Vacant Lot	Derelict Vehicle	4.045354
Residential Building/House	Vending	4.077681
Street/Sidewalk	Illegal Parking	4.132335
Store/Commercial	Animal Abuse	4.141185
	Animal Abuse	4.241630
Street/Sidewalk	Blocked Driveway	4.382400
Residential Building	Animal Abuse	4.401292
Parking Lot	Animal Abuse	4.445872
House and Store	Animal Abuse	4.497133
Commercial	Animal Abuse	4.568575
	Animal Abuse	4.848593
Residential Building/House	Graffiti	5.021657
Store/Commercial	Graffiti	5.560642
	Derelict Vehicle	5.588368
Street/Sidewalk	Graffiti	7.237522
Roadway Tunnel	Derelict Vehicle	8.364167
Highway	Derelict Vehicle	8.843796
		3.010100

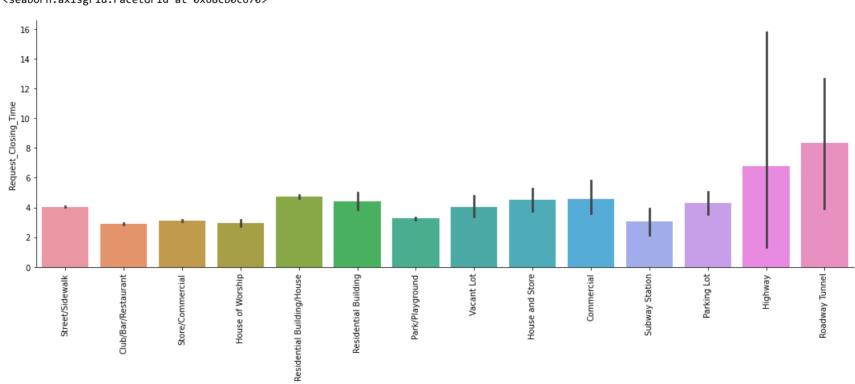
Out I	[/5]	•
out	[די	•

	index	Location Type	Complaint Type	Request_Closing_Time
0	37	Street/Sidewalk	Posting Advertisement	1.777614
1	12	Parking Lot	Posting Advertisement	2.115754
2	26	Store/Commercial	Posting Advertisement	2.369167
3	22	Store/Commercial	Disorderly Youth	2.839479
4	1	Club/Bar/Restaurant	Noise - Commercial	2.889850
5	6	House of Worship	Noise - House of Worship	2.964972
6	40	Subway Station	Animal Abuse	3.035606
7	25	Store/Commercial	Noise - Commercial	3.066891
8	38	Street/Sidewalk	Traffic	3.202763
9	35	Street/Sidewalk	Noise - Street/Sidewalk	3.217912
10	9	Park/Playground	Noise - Park	3.243770
11	23	Store/Commercial	Drinking	3.252596
12	7	Park/Playground	Animal Abuse	3.266972
13	8	Park/Playground	Drinking	3.356238
14	31	Street/Sidewalk	Disorderly Youth	3.368008
15	36	Street/Sidewalk	Noise - Vehicle	3.383090
16	32	Street/Sidewalk	Drinking	3.408078
17	10	Park/Playground	Vending	3.474647
18	16	Residential Building/House	Drinking	3.595236
19	18	Residential Building/House	Posting Advertisement	3.600509
20	4	Highway	Traffic	3.687778
21	39	Street/Sidewalk	Vending	3.786017
22	15	Residential Building/House	Disorderly Youth	3.854477
23	27	Store/Commercial	Vending	3.862727
24	0	Club/Bar/Restaurant	Drinking	4.019785
25	41	Vacant Lot	Derelict Vehicle	4.045354
26	19	Residential Building/House	Vending	4.077681
27	34	Street/Sidewalk	Illegal Parking	4.132335
28	21	Store/Commercial	Animal Abuse	4.141185
29	28	Street/Sidewalk	Animal Abuse	4.241630
30	29	Street/Sidewalk	Blocked Driveway	4.382400
31	13	Residential Building	Animal Abuse	4.401292
32	11	Parking Lot	Animal Abuse	4.445872
33	5	House and Store	Animal Abuse	4.497133
34	2	Commercial	Animal Abuse	4.568575
35	14	Residential Building/House	Animal Abuse	4.848593
36	17	Residential Building/House	Graffiti	5.021657
37	24	Store/Commercial	Graffiti	5.560642
38	30	Street/Sidewalk	Derelict Vehicle	5.588368
39	33	Street/Sidewalk	Graffiti	7.237522
40	20	Roadway Tunnel	Derelict Vehicle	8.364167
41	3	Highway	Derelict Vehicle	8.843796

```
In [46]: ► df2.keys()
```

Out[46]: Index(['Location Type', 'Complaint Type', 'Request_Closing_Time'], dtype='object')





Location Type

• H0: Average response time across complaint types is not similar

Q-5-I. Average response time across complaint types is similar or not

```
Hypothesis Testing:
```

```
if p-val >0.05
         · HA: Average response time across complaint types is similar
          if p-val < 0.05
In [70]: ► from scipy import stats
In [71]:
        M df['Complaint Type'].value_counts().head()
          Top5_Complaints_type = df['Complaint Type'].value_counts().head()
In [72]: ▶ Top5_Complaints_type_names = Top5_Complaints_type.index
In [73]: ▶ | Top5_Complaints_type_names
   dtype='object')
In [74]: M data = df.loc[df['Complaint Type'].isin(Top5_Complaints_type_names),['Complaint Type', 'Request_Closing_Time']]
          data.head()
   Out[74]:
                 Complaint Type Request_Closing_Time
           0 Noise - Street/Sidewalk
                Blocked Driveway
                                    1.437778
           2
                Blocked Driveway
                                    4.858611
           3
                  Illegal Parking
                                    7.753889
                  Illegal Parking
                                    3.450556
d1.head()
   Out[75]: 1
               1.437778
               4.858611
               1.798611
          9
               1.383889
          10
               7.800556
          Name: Request_Closing_Time, dtype: float64
In [76]: M d2 = df[df['Complaint Type'] == Top5_Complaints_type_names[1]].Request_Closing_Time
          d2.head()
   Out[76]: 3
              7.753889
              3.450556
              1.891667
          5
          6
              1.957778
             8.550556
          Name: Request_Closing_Time, dtype: float64
d3.head()
   Out[77]: 0
               0.920833
               2.482500
          12
               0.784722
          19
               0.491111
               1.495556
          54
          Name: Request_Closing_Time, dtype: float64
In [78]: M | d4 = df[df['Complaint Type'] == Top5_Complaints_type_names[3]].Request_Closing_Time
          d4.head()
   Out[78]: 17
               0.852222
               2.933611
          18
               1.261667
          22
          29
               2.499722
          30
              1.985833
          Name: Request_Closing_Time, dtype: float64
d5.head()
   Out[79]: 14
                10.489722
                 3,950278
          151
          255
                 1.364722
          256
                 4.133056
          295
                 0.753333
          Name: Request_Closing_Time, dtype: float64
Out[80]: F_onewayResult(statistic=2080.3676275129005, pvalue=0.0)
```

Q-5-II. Relation between complaint or service request and location

Hypothesis Testing:

H0: complaints are not depends on location
 if p-val >0.05

• HA: complaints are depends on location

if p-val <0.05

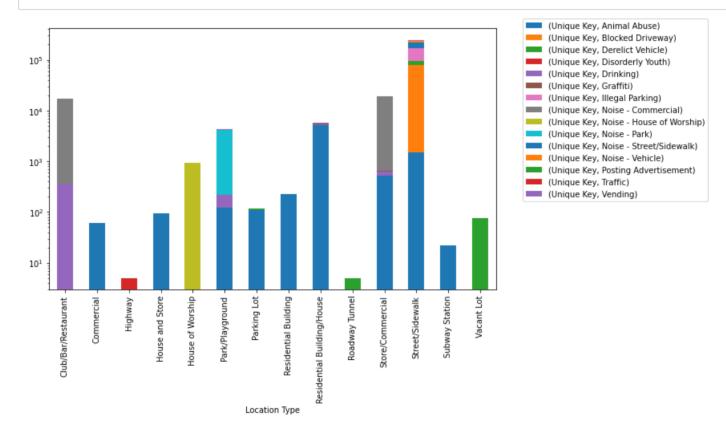
In [81]: M df['Location Type'].value_counts().head(3)

Out[81]: Street/Sidewalk 242760 Store/Commercial 19425 Club/Bar/Restaurant 17172 Name: Location Type, dtype: int64

Out[82]: Blocked Driveway 76675 Illegal Parking 74020 Name: Complaint Type, dtype: int64

In [84]: M group_count = group.count()

In [85]: | group_un = group_count.unstack() #.reset_index()



In [87]: | from scipy.stats import chi2_contingency

In [88]: M pd.crosstab(df['Location Type'],df['Complaint Type'], margins=True)

Out[88]: Noise -Animal Blocked Derelict Disorderly Abuse Driveway Vehicle Youth Drinking Graffiti Noise - Noise - Posting Street/Sidewalk Vehicle Advertisement Illegal Noise House Complaint Type Traffic Vendin Parking Commercial Park Worship Location Type Club/Bar/Restaurant Commercial Highway **House and Store House of Worship** Park/Playground Parking Lot **Residential Building** Residential **Building/House Roadway Tunnel** Store/Commercial Street/Sidewalk **Subway Station Vacant Lot** ΑII

```
In [89]: N ch2,p_value,dof,exp_freq = stats.chi2_contingency(pd.crosstab(df['Location Type'],df['Complaint Type'], margins=True))
    print(ch2)
    print(p_value)
    print(dof)
1036031.2859946301
0.0
210
```

Here we can observe that p-value is less than 0.05, so we reject the null hypothesis and accept the alternate hypothesis. Hence we can say that complaints and location are related.

Regards:

Anu Verma

In []: ▶