311 customer service

April 11, 2023

1 NYC Service Requests

1.0.1 You've been asked to perform data analysis of service request (311) calls from New York City. You've also been asked to utilize data wrangling techniques to understand the pattern in the data and visualize the major types of complaints.

```
[1]: # import dependencies
     import numpy as np
     import pandas as pd
     import matplotlib.pyplot as plt
     %matplotlib inline
     import seaborn as sns
     from matplotlib.pyplot import figure
     import scipy.stats as stats
[2]: df=pd.read_csv("311_Service_Requests_from_2010_to_Present.csv", __
      →low_memory=False)
[3]: # first 5 rows to visualize
     df.head()
[3]:
       Unique Key
                              Created Date
                                                       Closed Date Agency
          32310363
                   12/31/2015 11:59:45 PM 01/01/2016 12:55:15 AM
                                                                     NYPD
          32309934 12/31/2015 11:59:44 PM 01/01/2016 01:26:57 AM
                                                                     NYPD
     1
     2
         32309159 12/31/2015 11:59:29 PM 01/01/2016 04:51:03 AM
                                                                     NYPD
     3
          32305098 12/31/2015 11:57:46 PM 01/01/2016 07:43:13 AM
                                                                     NYPD
          32306529 12/31/2015 11:56:58 PM 01/01/2016 03:24:42 AM
                                                                     NYPD
                            Agency Name
                                                  Complaint Type \
     O New York City Police Department
                                        Noise - Street/Sidewalk
     1 New York City Police Department
                                                Blocked Driveway
     2 New York City Police Department
                                                Blocked Driveway
     3 New York City Police Department
                                                 Illegal Parking
     4 New York City Police Department
                                                 Illegal Parking
                                        Location Type Incident Zip
                          Descriptor
     0
                    Loud Music/Party Street/Sidewalk
                                                            10034.0
```

```
2
                           No Access Street/Sidewalk
                                                             10458.0
     3
        Commercial Overnight Parking Street/Sidewalk
                                                             10461.0
                    Blocked Sidewalk Street/Sidewalk
     4
                                                             11373.0
             Incident Address
                              ... Bridge Highway Name Bridge Highway Direction
          71 VERMILYEA AVENUE
                                                  NaN
     0
                                                                            NaN
              27-07 23 AVENUE
                                                  NaN
     1
                                                                           NaN
     2
       2897 VALENTINE AVENUE ...
                                                  NaN
                                                                           NaN
     3
          2940 BAISLEY AVENUE ...
                                                  NaN
                                                                           NaN
     4
                87-14 57 ROAD
                                                  NaN
                                                                           NaN
       Road Ramp Bridge Highway Segment Garage Lot Name Ferry Direction
     0
             NaN
                                    NaN
                                                     NaN
                                                                     NaN
     1
             NaN
                                    NaN
                                                     NaN
                                                                     NaN
     2
                                                     NaN
             NaN
                                    NaN
                                                                     NaN
     3
                                                     NaN
                                                                     NaN
             NaN
                                    NaN
     4
             NaN
                                    NaN
                                                     NaN
                                                                     NaN
       Ferry Terminal Name
                             Latitude Longitude
     0
                       NaN 40.865682 -73.923501
     1
                       NaN 40.775945 -73.915094
     2
                       NaN 40.870325 -73.888525
     3
                            40.835994 -73.828379
                       NaN
     4
                       NaN 40.733060 -73.874170
                                        Location
     0
         (40.86568153633767, -73.92350095571744)
       (40.775945312321085, -73.91509393898605)
     1
       (40.870324522111424, -73.88852464418646)
         (40.83599404683083, -73.82837939584206)
     3
     4 (40.733059618956815, -73.87416975810375)
     [5 rows x 53 columns]
[4]: # reload in the data and change date columns to datetime
     df=pd.read_csv("311_Service_Requests_from_2010_to_Present.csv", parse_dates =__
      →['Created Date','Closed Date','Due Date'], infer_datetime_format = True, _
      →low_memory=False)
[5]: # checking new date columns
     df.head()
[5]:
        Unique Key
                          Created Date
                                                Closed Date Agency \
          32310363 2015-12-31 23:59:45 2016-01-01 00:55:15
                                                              NYPD
     1
          32309934 2015-12-31 23:59:44 2016-01-01 01:26:57
                                                              NYPD
          32309159 2015-12-31 23:59:29 2016-01-01 04:51:03
                                                              NYPD
```

No Access Street/Sidewalk

11105.0

1

```
3
     32305098 2015-12-31 23:57:46 2016-01-01 07:43:13
                                                          NYPD
4
     32306529 2015-12-31 23:56:58 2016-01-01 03:24:42
                                                          NYPD
                       Agency Name
                                              Complaint Type
   New York City Police Department
                                    Noise - Street/Sidewalk
  New York City Police Department
                                            Blocked Driveway
  New York City Police Department
                                            Blocked Driveway
   New York City Police Department
                                             Illegal Parking
  New York City Police Department
                                             Illegal Parking
                     Descriptor
                                    Location Type
                                                  Incident Zip
0
               Loud Music/Party Street/Sidewalk
                                                         10034.0
1
                      No Access
                                  Street/Sidewalk
                                                         11105.0
2
                      No Access
                                  Street/Sidewalk
                                                         10458.0
   Commercial Overnight Parking Street/Sidewalk
3
                                                         10461.0
               Blocked Sidewalk Street/Sidewalk
                                                         11373.0
                          ... Bridge Highway Name Bridge Highway Direction
        Incident Address
0
     71 VERMILYEA AVENUE
                                             NaN
                                                                       NaN
         27-07 23 AVENUE
                                             NaN
                                                                       NaN
1
2
   2897 VALENTINE AVENUE
                                             NaN
                                                                       NaN
     2940 BAISLEY AVENUE
                                             NaN
3
                                                                       NaN
           87-14 57 ROAD
                                             NaN
                                                                       NaN
  Road Ramp Bridge Highway Segment Garage Lot Name Ferry Direction
0
        NaN
                                NaN
                                                NaN
                                                                 NaN
                                                NaN
                                                                 NaN
1
        NaN
                                NaN
2
        NaN
                                NaN
                                                NaN
                                                                 NaN
3
        NaN
                                NaN
                                                NaN
                                                                 NaN
4
        NaN
                                NaN
                                                NaN
                                                                 NaN
  Ferry Terminal Name
                        Latitude Longitude
                       40.865682 -73.923501
0
                  NaN
1
                  {\tt NaN}
                       40.775945 -73.915094
2
                  NaN
                       40.870325 -73.888525
3
                  NaN
                       40.835994 -73.828379
4
                       40.733060 -73.874170
                  NaN
                                    Location
0
    (40.86568153633767, -73.92350095571744)
   (40.775945312321085, -73.91509393898605)
  (40.870324522111424, -73.88852464418646)
    (40.83599404683083, -73.82837939584206)
  (40.733059618956815, -73.87416975810375)
```

3

[5 rows x 53 columns]

[6]: #info and column names df.info()

<class 'pandas.core.frame.DataFrame'>
RangeIndex: 364558 entries, 0 to 364557

Data columns (total 53 columns):

Data	columns (cotal 33 columns).		
#	Column	Non-Null Count	Dtype
0	Unique Key	364558 non-null	 int64
1	Created Date	364558 non-null	
2	Closed Date	362177 non-null	
3	Agency	364558 non-null	
4	Agency Name	364558 non-null	-
5	Complaint Type	364558 non-null	•
6	Descriptor	358057 non-null	<u> </u>
7	Location Type	364425 non-null	<u> </u>
8	Incident Zip	361560 non-null	<u> </u>
9	Incident Address	312859 non-null	object
10	Street Name	312859 non-null	object
11	Cross Street 1	307370 non-null	object
12	Cross Street 2	306753 non-null	object
13	Intersection Street 1	51120 non-null	object
14	Intersection Street 2	50512 non-null	object
15	Address Type	361306 non-null	object
16	City	361561 non-null	object
17	Landmark	375 non-null	object
18	Facility Type	362169 non-null	object
19	Status	364558 non-null	object
20	Due Date	364555 non-null	datetime64[ns]
21	Resolution Description	364558 non-null	object
22	Resolution Action Updated Date	362156 non-null	object
23	Community Board	364558 non-null	object
24	Borough	364558 non-null	object
25	X Coordinate (State Plane)	360528 non-null	
26	Y Coordinate (State Plane)	360528 non-null	
	Park Facility Name	364558 non-null	· ·
	Park Borough	364558 non-null	•
29	School Name	364558 non-null	•
30	School Number	364558 non-null	•
31	School Region	364557 non-null	J
32	School Code	364557 non-null	· ·
33	School Phone Number	364558 non-null	J
34	School Address	364558 non-null	object
35	School City	364558 non-null	•
36	School State	364558 non-null	•
37	School Zip	364557 non-null	•
38	School Not Found	364558 non-null	object

```
39 School or Citywide Complaint
                                     0 non-null
                                                      float64
 40 Vehicle Type
                                     0 non-null
                                                      float64
 41 Taxi Company Borough
                                     0 non-null
                                                      float64
 42 Taxi Pick Up Location
                                     0 non-null
                                                      float64
 43 Bridge Highway Name
                                     297 non-null
                                                      object
 44 Bridge Highway Direction
                                     297 non-null
                                                      object
 45 Road Ramp
                                     262 non-null
                                                      object
 46 Bridge Highway Segment
                                     262 non-null
                                                      object
 47 Garage Lot Name
                                     0 non-null
                                                      float64
 48 Ferry Direction
                                     1 non-null
                                                      object
 49 Ferry Terminal Name
                                     2 non-null
                                                      object
 50 Latitude
                                     360528 non-null float64
 51 Longitude
                                     360528 non-null float64
 52 Location
                                     360528 non-null
                                                      object
dtypes: datetime64[ns](3), float64(10), int64(1), object(39)
memory usage: 147.4+ MB
```

[7]: # size/shape of data

df.shape

[7]: (364558, 53)

1.1 Missing value treatment

[8]: # checking missing/null values
df.isnull().sum().sort_values(ascending=False)

[8]: Taxi Company Borough 364558 Taxi Pick Up Location 364558 School or Citywide Complaint 364558 Garage Lot Name 364558 Vehicle Type 364558 Ferry Direction 364557 Ferry Terminal Name 364556 Bridge Highway Segment 364296 Road Ramp 364296 Bridge Highway Name 364261 Bridge Highway Direction 364261 Landmark 364183 Intersection Street 2 314046 Intersection Street 1 313438 Cross Street 2 57805 Cross Street 1 57188 Incident Address 51699 Street Name 51699 Descriptor 6501

Location	4030
Longitude	4030
X Coordinate (State Plane)	4030
Y Coordinate (State Plane)	4030
Latitude	4030
	3252
Address Type	2998
Incident Zip	2990
City Recolution Action Undeted Date	2402
Resolution Action Updated Date	
Facility Type	2389
Closed Date	2381
Location Type	133
Due Date	3
School Code	1
School Region	1
School Zip	1
School Name	0
Complaint Type	0
Agency Name	0
Agency	0
Created Date	0
School Not Found	0
School Phone Number	0
School State	0
School City	0
School Address	0
Park Borough	0
Status	0
Resolution Description	0
Community Board	0
Borough	0
School Number	0
Park Facility Name	0
Unique Key	0
dtype: int64	

[9]: # % of missing values
df.isnull().sum().sort_values(ascending=False)*100/364558

[9]:	Taxi Company Borough	100.000000
	Taxi Pick Up Location	100.000000
	School or Citywide Complaint	100.000000
	Garage Lot Name	100.000000
	Vehicle Type	100.000000
	Ferry Direction	99.999726
	Ferry Terminal Name	99.999451
	Bridge Highway Segment	99.928132

Road Ramp	99.928132
Bridge Highway Name	99.918531
Bridge Highway Direction	99.918531
Landmark	99.897136
Intersection Street 2	86.144317
Intersection Street 1	85.977540
Cross Street 2	15.856187
Cross Street 1	15.686941
Incident Address	14.181283
Street Name	14.181283
Descriptor	1.783255
Location	1.105448
Longitude	1.105448
X Coordinate (State Plane)	1.105448
Y Coordinate (State Plane)	1.105448
Latitude	1.105448
Address Type	0.892039
Incident Zip	0.822366
City	0.822091
Resolution Action Updated Date	0.658880
Facility Type	0.655314
Closed Date	0.653120
Location Type	0.036483
Due Date	0.000823
School Code	0.000274
School Region	0.000274
School Zip	0.000274
School Name	0.000000
Complaint Type	0.000000
Agency Name	0.000000
Agency	0.000000
Created Date	0.000000
School Not Found	0.000000
School Phone Number	0.000000
School State	0.000000
School City	0.000000
School Address	0.000000
Park Borough	0.000000
Status	0.000000
Resolution Description	0.000000
Community Board	0.000000
Borough	0.000000
School Number	0.000000
Park Facility Name	0.000000
Unique Key	0.000000
dtype: float64	3.00000
40, po. 1104001	

```
[10]: df2=pd.DataFrame(df.columns.to_list()).set_index(0)
df2
```

[10]: Empty DataFrame

Columns: []

Index: [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, 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, School or Citywide Complaint, Vehicle Type, 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, Latitude, Longitude, Location]

```
[11]: df2=df2[df.isnull().sum()*100/364558 < 80 ].reset_index() df2
```

```
[11]:
                                         0
      0
                               Unique Key
      1
                             Created Date
      2
                              Closed Date
      3
                                    Agency
      4
                              Agency Name
      5
                           Complaint Type
      6
                               Descriptor
      7
                            Location Type
      8
                             Incident Zip
                         Incident Address
      9
      10
                              Street Name
      11
                           Cross Street 1
      12
                           Cross Street 2
      13
                             Address Type
      14
                                      City
      15
                            Facility Type
      16
                                    Status
      17
                                 Due Date
      18
                  Resolution Description
      19
          Resolution Action Updated Date
      20
                          Community Board
      21
                                   Borough
      22
              X Coordinate (State Plane)
      23
              Y Coordinate (State Plane)
      24
                       Park Facility Name
```

```
25
                            Park Borough
      26
                             School Name
      27
                           School Number
      28
                           School Region
      29
                             School Code
      30
                     School Phone Number
      31
                          School Address
      32
                             School City
      33
                            School State
      34
                               School Zip
      35
                        School Not Found
      36
                                Latitude
      37
                                Longitude
      38
                                Location
[12]: # school has a lot of unspecified values
      df3=df[df2[0].to_list()]
      df3
[12]:
              Unique Key
                                 Created Date
                                                      Closed Date Agency
                32310363 2015-12-31 23:59:45 2016-01-01 00:55:15
                                                                     NYPD
                32309934 2015-12-31 23:59:44 2016-01-01 01:26:57
                                                                     NYPD
      1
      2
                32309159 2015-12-31 23:59:29 2016-01-01 04:51:03
                                                                     NYPD
      3
                32305098 2015-12-31 23:57:46 2016-01-01 07:43:13
                                                                     NYPD
                32306529 2015-12-31 23:56:58 2016-01-01 03:24:42
      4
                                                                     NYPD
                29609918 2015-01-01 00:04:44 2015-01-01 10:22:31
      364553
                                                                     NYPD
      364554
                29608392 2015-01-01 00:04:28 2015-01-01 02:25:02
                                                                     NYPD
                29607589 2015-01-01 00:01:30 2015-01-01 00:20:33
                                                                     NYPD
      364555
                29610889 2015-01-01 00:01:29 2015-01-01 02:42:22
      364556
                                                                     NYPD
      364557
                29611816 2015-01-01 00:00:50 2015-01-01 02:47:50
                                                                     NYPD
                                   Agency Name
                                                         Complaint Type \
      0
              New York City Police Department
                                                Noise - Street/Sidewalk
      1
              New York City Police Department
                                                       Blocked Driveway
              New York City Police Department
                                                       Blocked Driveway
      3
              New York City Police Department
                                                        Illegal Parking
              New York City Police Department
                                                        Illegal Parking
      364553 New York City Police Department
                                                        Illegal Parking
             New York City Police Department
      364554
                                                        Noise - Vehicle
              New York City Police Department
                                                Noise - Street/Sidewalk
      364555
      364556
              New York City Police Department
                                                       Blocked Driveway
      364557
              New York City Police Department
                                                       Blocked Driveway
                                 Descriptor
                                               Location Type Incident Zip
      0
                          Loud Music/Party Street/Sidewalk
                                                                    10034.0
```

```
1
                            No Access
                                       Street/Sidewalk
                                                              11105.0
2
                            No Access
                                       Street/Sidewalk
                                                               10458.0
3
        Commercial Overnight Parking
                                       Street/Sidewalk
                                                               10461.0
4
                     Blocked Sidewalk
                                       Street/Sidewalk
                                                               11373.0
364553
                     Blocked Hydrant
                                       Street/Sidewalk
                                                              11421.0
364554
                       Car/Truck Horn
                                       Street/Sidewalk
                                                              10468.0
364555
                    Loud Music/Party
                                       Street/Sidewalk
                                                              10031.0
                            No Access
                                       Street/Sidewalk
                                                               10466.0
364556
                            No Access
                                       Street/Sidewalk
364557
                                                               11420.0
             Incident Address
                                   School Code School Phone Number
0
          71 VERMILYEA AVENUE
                                   Unspecified
                                                        Unspecified
1
              27-07 23 AVENUE
                                   Unspecified
                                                        Unspecified
2
        2897 VALENTINE AVENUE
                                   Unspecified
                                                        Unspecified
          2940 BAISLEY AVENUE
3
                                   Unspecified
                                                        Unspecified
4
                                   Unspecified
                                                        Unspecified
                87-14 57 ROAD
364553
                84-25 85 ROAD
                                   Unspecified
                                                        Unspecified
364554
         2555 SEDGWICK AVENUE
                                   Unspecified
                                                        Unspecified
364555
          508 WEST 139 STREET
                                   Unspecified
                                                        Unspecified
                                   Unspecified
364556
          931 EAST 226 STREET
                                                        Unspecified
                                   Unspecified
364557
            123-19 135 STREET
                                                        Unspecified
       School Address
                        School City School State
                                                    School Zip School Not Found
0
          Unspecified
                        Unspecified
                                     Unspecified
                                                   Unspecified
                                     Unspecified
1
          Unspecified
                        Unspecified
                                                   Unspecified
                                                                               N
2
          Unspecified
                        Unspecified
                                     Unspecified
                                                   Unspecified
                                                                               N
3
          Unspecified
                        Unspecified
                                     Unspecified
                                                   Unspecified
                                                                               N
4
                        Unspecified
                                     Unspecified
                                                   Unspecified
                                                                               N
          Unspecified
364553
                                     Unspecified
                                                   Unspecified
          Unspecified
                        Unspecified
                                                                               N
364554
          Unspecified
                        Unspecified
                                     Unspecified
                                                   Unspecified
                                                                               N
364555
          Unspecified
                        Unspecified
                                     Unspecified
                                                   Unspecified
                                                                               N
364556
          Unspecified
                        Unspecified
                                     Unspecified
                                                   Unspecified
                                                                               N
364557
          Unspecified
                        Unspecified
                                     Unspecified
                                                   Unspecified
                                                                               N
         Latitude Longitude
                                                                Location
                                (40.86568153633767, -73.92350095571744)
0
        40.865682 -73.923501
1
                               (40.775945312321085, -73.91509393898605)
        40.775945 -73.915094
2
                               (40.870324522111424, -73.88852464418646)
        40.870325 -73.888525
        40.835994 -73.828379
3
                                (40.83599404683083, -73.82837939584206)
4
                               (40.733059618956815, -73.87416975810375)
        40.733060 -73.874170
364553
        40.695145 -73.860949
                                (40.69514470265117, -73.86094888534394)
                                (40.86782963689454, -73.90717786644662)
364554
        40.867830 -73.907178
364555
        40.821647 -73.950873
                               (40.821646626438095, -73.95087342885292)
```

```
364556 40.886361 -73.853290 (40.88636077906953, -73.85329048666742)
364557 40.674212 -73.803585 (40.674211762243935, -73.80358548685278)
```

[364558 rows x 39 columns]

[13]: #confirming that df3 has dropped all the categories with more than 80% missing →values
df3.isnull().sum().sort_values(ascending=False)*100/364558

[13]:	Cross Street 2	15.856187
	Cross Street 1	15.686941
	Incident Address	14.181283
	Street Name	14.181283
	Descriptor	1.783255
	Location	1.105448
	Y Coordinate (State Plane)	1.105448
	Latitude	1.105448
	Longitude	1.105448
	X Coordinate (State Plane)	1.105448
	Address Type	0.892039
	Incident Zip	0.822366
	City	0.822091
	Resolution Action Updated Date	0.658880
	Facility Type	0.655314
	Closed Date	0.653120
	Location Type	0.036483
	Due Date	0.000823
	School Region	0.000274
	School Code	0.000274
	School Zip	0.000274
	Park Facility Name	0.000000
	School State	0.000000
	Created Date	0.000000
	Agency	0.000000
	Agency Name	0.000000
	Complaint Type	0.000000
	School Not Found	0.000000
	School Phone Number	0.000000
	School City	0.000000
	School Address	0.000000
	Park Borough	0.000000
	Status	0.000000
	Resolution Description	0.000000
	School Number	0.000000
	Community Board	0.000000
	Borough	0.000000
	School Name	0.000000

Unique Key 0.000000

dtype: float64

[14]: df3.shape

[14]: (364558, 39)

[15]: #columns went from 53 to 39 after removing nulls df3.info()

<class 'pandas.core.frame.DataFrame'>
RangeIndex: 364558 entries, 0 to 364557
Data columns (total 39 columns):

#	Column	Non-Null Count	Dtype
0	Unique Key	364558 non-null	int64
1	Created Date	364558 non-null	
2	Closed Date	362177 non-null	datetime64[ns]
3	Agency	364558 non-null	object
4	Agency Name	364558 non-null	object
5	Complaint Type	364558 non-null	object
6	Descriptor	358057 non-null	object
7	Location Type	364425 non-null	object
8	Incident Zip	361560 non-null	float64
9	Incident Address	312859 non-null	object
10	Street Name	312859 non-null	object
11	Cross Street 1	307370 non-null	object
12	Cross Street 2	306753 non-null	object
13	Address Type	361306 non-null	object
14	City	361561 non-null	object
15	Facility Type	362169 non-null	object
16	Status	364558 non-null	object
17	Due Date	364555 non-null	datetime64[ns]
18	Resolution Description	364558 non-null	object
19	Resolution Action Updated Date	362156 non-null	object
20	Community Board	364558 non-null	object
21	Borough	364558 non-null	object
22	X Coordinate (State Plane)	360528 non-null	float64
23	Y Coordinate (State Plane)	360528 non-null	float64
24	Park Facility Name	364558 non-null	object
25	Park Borough	364558 non-null	object
26	School Name	364558 non-null	object
27	School Number	364558 non-null	object
28	School Region	364557 non-null	object
29	School Code	364557 non-null	object
30	School Phone Number	364558 non-null	object
31	School Address	364558 non-null	object

```
32 School City
                                          364558 non-null object
      33 School State
                                          364558 non-null object
      34 School Zip
                                          364557 non-null object
      35 School Not Found
                                          364558 non-null object
      36 Latitude
                                          360528 non-null float64
      37 Longitude
                                          360528 non-null float64
      38 Location
                                          360528 non-null object
     dtypes: datetime64[ns](3), float64(5), int64(1), object(30)
     memory usage: 108.5+ MB
[16]: # all of school code are unspecified
      df3['School Code'].value_counts()
[16]: Unspecified
                     364557
     Name: School Code, dtype: int64
[17]: # all but one of school name are unspecified
      df3['School Name'].value_counts()
[17]: Unspecified
                                         364557
     Alley Pond Park - Nature Center
                                             1
     Name: School Name, dtype: int64
[18]: df3[df3['School Name'] != 'Unspecified']
             Unique Key
[18]:
                               Created Date
                                                     Closed Date Agency \
      283132
                30427220 2015-04-18 09:44:55 2015-05-02 10:35:29
                                                                   NYPD
                                  Agency Name
                                                Complaint Type
                                                                  Descriptor \
      283132 New York City Police Department Animal in a Park Animal Waste
            Location Type Incident Zip Incident Address ... School Code \
      283132
                     Park
                                     NaN
                                                                     NaN
                                                      NaN ...
                                                                School Address \
            School Phone Number
      283132
                     7182176034 Grand Central Parkway, near the soccer field
             School City School State School Zip School Not Found Latitude \
      283132
                 QUEENS
                                  NY
                                             {\tt NaN}
                                                                       NaN
            Longitude Location
                  \mathtt{NaN}
      283132
                           NaN
      [1 rows x 39 columns]
[19]: | # remove all school related columns if they have 'unspecified'
```

```
→find('School')<0]</pre>
      removed_school_list
[19]: ['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',
       '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',
       'Latitude',
       'Longitude',
       'Location']
[20]: # made new dataset without any 'School' related columns
      pd.set_option('display.max_columns', None)
      df4=df3[removed_school_list]
      df4.head(10)
[20]:
         Unique Key
                           Created Date
                                                 Closed Date Agency \
           32310363 2015-12-31 23:59:45 2016-01-01 00:55:15
                                                                NYPD
      1
           32309934 2015-12-31 23:59:44 2016-01-01 01:26:57
                                                                NYPD
           32309159 2015-12-31 23:59:29 2016-01-01 04:51:03
      2
                                                                NYPD
      3
           32305098 2015-12-31 23:57:46 2016-01-01 07:43:13
                                                                NYPD
           32306529 2015-12-31 23:56:58 2016-01-01 03:24:42
      4
                                                                NYPD
           32306554 2015-12-31 23:56:30 2016-01-01 01:50:11
      5
                                                                NYPD
           32306559 2015-12-31 23:55:32 2016-01-01 01:53:54
                                                                NYPD
```

removed_school_list = [col for col in df3.columns.to_list() if col.

```
7
     32307009 2015-12-31 23:54:05 2016-01-01 01:42:54
                                                          NYPD
8
     32308581 2015-12-31 23:53:58 2016-01-01 08:27:32
                                                          NYPD
9
     32308391 2015-12-31 23:53:58 2016-01-01 01:17:40
                                                          NYPD
                        Agency Name
                                               Complaint Type
   New York City Police Department
                                     Noise - Street/Sidewalk
   New York City Police Department
                                             Blocked Driveway
1
   New York City Police Department
                                             Blocked Driveway
   New York City Police Department
                                              Illegal Parking
   New York City Police Department
                                              Illegal Parking
   New York City Police Department
                                             Illegal Parking
   New York City Police Department
                                             Illegal Parking
7
   New York City Police Department
                                             Blocked Driveway
   New York City Police Department
                                             Illegal Parking
   New York City Police Department
                                             Blocked Driveway
                       Descriptor
                                     Location Type
                                                     Incident Zip
0
                Loud Music/Party
                                   Street/Sidewalk
                                                          10034.0
1
                        No Access
                                   Street/Sidewalk
                                                          11105.0
2
                        No Access
                                   Street/Sidewalk
                                                          10458.0
3
    Commercial Overnight Parking
                                   Street/Sidewalk
                                                          10461.0
4
                Blocked Sidewalk
                                   Street/Sidewalk
                                                          11373.0
   Posted Parking Sign Violation
                                  Street/Sidewalk
                                                          11215.0
5
                 Blocked Hydrant
6
                                   Street/Sidewalk
                                                          10032.0
7
                        No Access
                                   Street/Sidewalk
                                                          10457.0
8
   Posted Parking Sign Violation
                                   Street/Sidewalk
                                                          11415.0
                                   Street/Sidewalk
                        No Access
                                                          11219.0
                                     Street Name
           Incident Address
                                                      Cross Street 1
0
        71 VERMILYEA AVENUE
                                VERMILYEA AVENUE
                                                      ACADEMY STREET
            27-07 23 AVENUE
                                                           27 STREET
1
                                       23 AVENUE
2
                                VALENTINE AVENUE
      2897 VALENTINE AVENUE
                                                     EAST 198 STREET
3
        2940 BAISLEY AVENUE
                                  BAISLEY AVENUE
                                                       EDISON AVENUE
4
              87-14 57 ROAD
                                         57 ROAD
                                                      SEABURY STREET
5
              260 21 STREET
                                       21 STREET
                                                            5 AVENUE
6
        524 WEST 169 STREET
                                 WEST 169 STREET
                                                    AMSTERDAM AVENUE
7
        501 EAST 171 STREET
                                 EAST 171 STREET
                                                   WASHINGTON AVENUE
   83-44 LEFFERTS BOULEVARD
                              LEFFERTS BOULEVARD
                                                                BEND
9
             1408 66 STREET
                                       66 STREET
                                                           14 AVENUE
                                             City Facility Type
                                                                 Status
       Cross Street 2 Address Type
0
      WEST 204 STREET
                            ADDRESS
                                        NEW YORK
                                                       Precinct
                                                                 Closed
            28 STREET
                            ADDRESS
                                         ASTORIA
                                                       Precinct Closed
1
2
      EAST 199 STREET
                            ADDRESS
                                           BRONX
                                                       Precinct Closed
3
             B STREET
                            ADDRESS
                                            BRONX
                                                       Precinct Closed
4
        HOFFMAN DRIVE
                                                       Precinct Closed
                            ADDRESS
                                        ELMHURST
5
             6 AVENUE
                            ADDRESS
                                        BROOKLYN
                                                       Precinct Closed
```

```
6
       AUDUBON AVENUE
                            ADDRESS
                                        NEW YORK
                                                       Precinct
                                                                Closed
7
             3 AVENUE
                            ADDRESS
                                            BRONX
                                                                 Closed
                                                       Precinct
8
                 BEND
                            ADDRESS
                                     KEW GARDENS
                                                       Precinct
                                                                 Closed
   NEW UTRECHT AVENUE
                            ADDRESS
                                        BROOKLYN
                                                       Precinct
                                                                 Closed
             Due Date
                                                    Resolution Description \
0 2016-01-01 07:59:45
                       The Police Department responded and upon arriv...
                       The Police Department responded to the complai...
1 2016-01-01 07:59:44
2 2016-01-01 07:59:29
                        The Police Department responded and upon arriv...
3 2016-01-01 07:57:46
                        The Police Department responded to the complai...
4 2016-01-01 07:56:58
                       The Police Department responded and upon arriv...
5 2016-01-01 07:56:30
                       The Police Department responded and upon arriv...
6 2016-01-01 07:55:32
                       The Police Department issued a summons in resp...
7 2016-01-01 07:54:05
                        The Police Department responded to the complai...
8 2016-01-01 07:53:58
                       The Police Department responded to the complai...
9 2016-01-01 07:53:58
                       The Police Department responded and upon arriv...
  Resolution Action Updated Date Community Board
                                                      Borough
0
          01/01/2016 12:55:15 AM
                                     12 MANHATTAN
                                                    MANHATTAN
1
          01/01/2016 01:26:57 AM
                                        01 QUEENS
                                                       QUEENS
2
          01/01/2016 04:51:03 AM
                                         07 BRONX
                                                        BRONX
3
          01/01/2016 07:43:13 AM
                                         10 BRONX
                                                        BRONX
4
          01/01/2016 03:24:42 AM
                                        04 QUEENS
                                                       QUEENS
5
          01/01/2016 01:50:11 AM
                                      07 BROOKLYN
                                                     BROOKLYN
6
          01/01/2016 01:53:54 AM
                                     12 MANHATTAN
                                                    MANHATTAN
7
          01/01/2016 01:42:54 AM
                                         03 BRONX
                                                        BRONX
8
          01/01/2016 08:27:32 AM
                                        09 QUEENS
                                                       QUEENS
9
          01/01/2016 01:17:40 AM
                                      11 BROOKLYN
                                                     BROOKLYN
   X Coordinate (State Plane)
                                Y Coordinate (State Plane) Park Facility Name
0
                     1005409.0
                                                                    Unspecified
                                                   254678.0
                                                   221986.0
1
                     1007766.0
                                                                    Unspecified
2
                     1015081.0
                                                   256380.0
                                                                    Unspecified
3
                     1031740.0
                                                   243899.0
                                                                    Unspecified
4
                                                                    Unspecified
                     1019123.0
                                                   206375.0
5
                      986312.0
                                                   180032.0
                                                                    Unspecified
6
                                                                    Unspecified
                     1001578.0
                                                   245627.0
7
                     1011117.0
                                                   244417.0
                                                                    Unspecified
8
                     1030662.0
                                                   196163.0
                                                                    Unspecified
9
                                                                    Unspecified
                      984378.0
                                                   166541.0
  Park Borough
                 Latitude Longitude
                                                                         Location
0
     MANHATTAN
                40.865682 -73.923501
                                         (40.86568153633767, -73.92350095571744)
1
        QUEENS
                40.775945 -73.915094
                                        (40.775945312321085, -73.91509393898605)
2
         BRONX
                40.870325 -73.888525
                                        (40.870324522111424, -73.88852464418646)
                                         (40.83599404683083, -73.82837939584206)
3
         BRONX
                40.835994 -73.828379
4
        QUEENS
                40.733060 -73.874170
                                        (40.733059618956815, -73.87416975810375)
```

```
5 BROOKLYN 40.660823 -73.992568 (40.66082272389114, -73.99256786342693)
6 MANHATTAN 40.840848 -73.937375 (40.840847591440415, -73.9373750864581)
7 BRONX 40.837503 -73.902905 (40.83750262540012, -73.90290517326568)
8 QUEENS 40.704977 -73.832605 (40.704977164399935, -73.8326047502584)
9 BROOKLYN 40.623793 -73.999539 (40.623793065806524, -73.99953890121567)
```

[21]: # remaining 29 columns df4.info()

<class 'pandas.core.frame.DataFrame'>
RangeIndex: 364558 entries, 0 to 364557
Data columns (total 29 columns):

Column Non-Null Count Dtype ___ ----_____ ____ 0 Unique Key 364558 non-null int64 1 Created Date 364558 non-null datetime64[ns] 2 Closed Date 362177 non-null datetime64[ns] 3 364558 non-null object Agency 4 Agency Name 364558 non-null object 5 Complaint Type 364558 non-null object Descriptor 6 358057 non-null object 7 Location Type 364425 non-null object Incident Zip 361560 non-null float64 9 Incident Address 312859 non-null object 10 Street Name 312859 non-null object 11 Cross Street 1 307370 non-null object Cross Street 2 12 306753 non-null object 13 Address Type 361306 non-null object 14 City 361561 non-null object 15 Facility Type 362169 non-null object 16 Status 364558 non-null object 17 Due Date 364555 non-null datetime64[ns] 18 Resolution Description 364558 non-null object Resolution Action Updated Date 362156 non-null object Community Board 20 364558 non-null object 21 Borough 364558 non-null object 22 X Coordinate (State Plane) 360528 non-null float64 23 Y Coordinate (State Plane) 360528 non-null float64 24 Park Facility Name 364558 non-null object 25 Park Borough 364558 non-null object 26 Latitude 360528 non-null float64 27 Longitude 360528 non-null float64 360528 non-null 28 Location object dtypes: datetime64[ns](3), float64(5), int64(1), object(20) memory usage: 80.7+ MB

17

```
df5 = df4.drop(columns = ['Community Board'])
      df5
[22]:
              Unique Key
                                Created Date
                                                      Closed Date Agency
                32310363 2015-12-31 23:59:45 2016-01-01 00:55:15
                                                                    NYPD
      1
                32309934 2015-12-31 23:59:44 2016-01-01 01:26:57
                                                                    NYPD
      2
                32309159 2015-12-31 23:59:29 2016-01-01 04:51:03
                                                                    NYPD
                32305098 2015-12-31 23:57:46 2016-01-01 07:43:13
      3
                                                                    NYPD
                32306529 2015-12-31 23:56:58 2016-01-01 03:24:42
                                                                    NYPD
      364553
                29609918 2015-01-01 00:04:44 2015-01-01 10:22:31
                                                                    NYPD
                29608392 2015-01-01 00:04:28 2015-01-01 02:25:02
                                                                    NYPD
      364554
                29607589 2015-01-01 00:01:30 2015-01-01 00:20:33
      364555
                                                                    NYPD
      364556
                29610889 2015-01-01 00:01:29 2015-01-01 02:42:22
                                                                    NYPD
                29611816 2015-01-01 00:00:50 2015-01-01 02:47:50
      364557
                                                                    NYPD
                                                         Complaint Type \
                                  Agency Name
      0
              New York City Police Department
                                                Noise - Street/Sidewalk
      1
              New York City Police Department
                                                       Blocked Driveway
              New York City Police Department
      2
                                                       Blocked Driveway
              New York City Police Department
      3
                                                        Illegal Parking
              New York City Police Department
                                                        Illegal Parking
      364553 New York City Police Department
                                                        Illegal Parking
      364554 New York City Police Department
                                                        Noise - Vehicle
             New York City Police Department
                                                Noise - Street/Sidewalk
      364555
             New York City Police Department
                                                       Blocked Driveway
      364557 New York City Police Department
                                                       Blocked Driveway
                                               Location Type
                                                             Incident Zip
                                Descriptor
                          Loud Music/Party
      0
                                             Street/Sidewalk
                                                                   10034.0
      1
                                 No Access
                                             Street/Sidewalk
                                                                   11105.0
      2
                                 No Access
                                             Street/Sidewalk
                                                                   10458.0
      3
              Commercial Overnight Parking
                                             Street/Sidewalk
                                                                   10461.0
      4
                          Blocked Sidewalk
                                             Street/Sidewalk
                                                                   11373.0
      364553
                           Blocked Hydrant
                                             Street/Sidewalk
                                                                   11421.0
      364554
                            Car/Truck Horn
                                             Street/Sidewalk
                                                                   10468.0
                          Loud Music/Party
                                             Street/Sidewalk
                                                                   10031.0
      364555
      364556
                                 No Access
                                             Street/Sidewalk
                                                                   10466.0
      364557
                                 No Access
                                             Street/Sidewalk
                                                                   11420.0
                   Incident Address
                                           Street Name
                                                            Cross Street 1
      0
                71 VERMILYEA AVENUE
                                     VERMILYEA AVENUE
                                                            ACADEMY STREET
      1
                    27-07 23 AVENUE
                                             23 AVENUE
                                                                 27 STREET
              2897 VALENTINE AVENUE VALENTINE AVENUE
                                                           EAST 198 STREET
```

[22]: # Borough and community board have similar values so drop 'community board'

### ST-14 57 ROAD \$7 ROAD \$2 ROAD \$3 ROA	3	2940 BAISLEY AVEN		EDISON AVENUE	
364553	4	87-14 57 RO	AD 57 ROAD	SEABURY STREET	
364555 368 3		%4-25 85 RO	 AD 85 ROAD		
364555 SOB WEST 139 STREET SAST 129 STREET EAST 129 STREET BRONXWOOD AVENUE BRONXWOOD AVENUE BRONXWOOD AVENUE BRONXWOOD AVENUE BRONXWOOD AVENUE STREET STREET STREET BRONXWOOD AVENUE Closed					
364556 931 EAST 226 STREET 135 STREET BRONXWOOD AVENUE 123-19 135 STREET 135 STREET ROCKAWAY BOULEVARD					
Cross Street 2 Address Type					
Cross Street 2 Address Type					
O					
1		Cross Street 2 Add	ress Type	City Facility Type St	tatus \
BAST 199 STREET ADDRESS BRONX Precinct Closed ADDRESS BRONX ADDRESS BRONX Precinct Closed ADDRESS BRONX ADDRESS ADDRESS BRONX Precinct Closed ADDRESS BRONX Precinct Closed ADDRESS BRONX ADDRESS BRONX Precinct Closed ADDRESS BRONX ADDRESS BRONX Precinct Closed ADDRESS BRONX Precinct Closed ADDRESS ADDRESS BRONX ADDRESS ADDRESS BRONX ADDRESS ADDRESS ADDRESS BRONX ADDRESS	0	WEST 204 STREET	ADDRESS NE	CW YORK Precinct C	Losed
B STREET ADDRESS BRONX Precinct Closed	1	28 STREET	ADDRESS A	STORIA Precinct C	Losed
## HOFFMAN DRIVE ADDRESS ELMHURST Precinct Closed			ADDRESS	BRONX Precinct Cl	Losed
	3	B STREET			
364553 85 STREET ADDRESS WOODHAVEN Precinct Closed 364554 BEND ADDRESS BRONX Precinct Closed 364555 HAMILTON PLACE ADDRESS NEW YORK Precinct Closed 364556 PAULDING AVENUE ADDRESS BRONX Precinct Closed 364557 SUTTER AVENUE ADDRESS SOUTH OZONE PARK Precinct Closed ADDRESS SOUTH OZONE PARK Precinct Closed Closed ADDRESS SOUTH OZONE PARK Precinct Closed ADDRESS SOUTH OZONE PARK Precinct Closed	4	HOFFMAN DRIVE	ADDRESS EL	MHURST Precinct C	Losed
Second		 O.E. GERRERE			
364555					
ADDRESS BRONX Precinct Closed ADDRESS SOUTH OZONE PARK Precinct Closed Precinct P					
Due Date					
Due Date Date Date Date Date Date Date Date					
0 2016-01-01 07:59:45 The Police Department responded and upon arriv 1 2016-01-01 07:59:44 The Police Department responded to the complai 2 2016-01-01 07:59:29 The Police Department responded and upon arriv 3 2016-01-01 07:57:46 The Police Department responded and upon arriv 4 2016-01-01 07:56:58 The Police Department responded to the complai	304001	DOTTER AVENUE	ADDICED DOUTH OZON	I TAIM TIGETHER OF	Lobea
0 2016-01-01 07:59:45 The Police Department responded and upon arriv 1 2016-01-01 07:59:44 The Police Department responded to the complai 2 2016-01-01 07:59:29 The Police Department responded and upon arriv 3 2016-01-01 07:57:46 The Police Department responded to the complai 4 2016-01-01 07:56:58 The Police Department responded and upon arriv		Due Date		Resolution Descri	iption \
1 2016-01-01 07:59:44 The Police Department responded to the complai 2 2016-01-01 07:59:29 The Police Department responded and upon arriv 3 2016-01-01 07:57:46 The Police Department responded to the complai 4 2016-01-01 07:56:58 The Police Department responded and upon arriv	0	2016-01-01 07:59:45	The Police Departmen		-
3 2016-01-01 07:57:46 The Police Department responded to the complai 4 2016-01-01 07:56:58 The Police Department responded and upon arriv 364553 2015-01-01 08:04:44 The Police Department responded to the complai 364554 2015-01-01 08:04:28 The Police Department responded to the complai 364555 2015-01-01 08:01:30 The Police Department responded to the complai 364556 2015-01-01 08:01:29 The Police Department responded and upon arriv 364557 2015-01-01 08:00:50 The Police Department responded to the complai Resolution Action Updated Date Department responded to the complai 0 01/01/2016 12:55:15 AM MANHATTAN 1005409.0 1 01/01/2016 01:26:57 AM QUEENS 1007766.0 2 01/01/2016 04:51:03 AM BRONX 1015081.0 3 01/01/2016 07:43:13 AM BRONX 1031740.0 4 01/01/2016 03:24:42 AM QUEENS 1019123.0 364553 01/01/2015 10:22:31 AM QUEENS 102809.0 364554 01/01/2015 02:25:02 AM BRONX 1009923.0 364555 01/01/2015 12:20:33 AM MANHATTAN 997847.0 364556 01/01/2015 02:42:22 AM	1	2016-01-01 07:59:44	_		
4 2016-01-01 07:56:58 The Police Department responded and upon arriv	2	2016-01-01 07:59:29	The Police Departmen	it responded and upon ari	civ
	3	2016-01-01 07:57:46	The Police Departmen	it responded to the compl	lai…
364554 2015-01-01 08:04:28 The Police Department responded to the complai 364555 2015-01-01 08:01:30 The Police Department responded to the complai 364556 2015-01-01 08:01:29 The Police Department responded and upon arriv 364557 2015-01-01 08:00:50 The Police Department responded to the complai Resolution Action Updated Date Borough X Coordinate (State Plane) \ 0 01/01/2016 12:55:15 AM MANHATTAN 1005409.0 1 01/01/2016 01:26:57 AM QUEENS 1007766.0 2 01/01/2016 04:51:03 AM BRONX 1015081.0 3 01/01/2016 07:43:13 AM BRONX 1031740.0 4 01/01/2016 03:24:42 AM QUEENS 1019123.0 364553 01/01/2015 10:22:31 AM QUEENS 1022809.0 364554 01/01/2015 02:25:02 AM BRONX 1009923.0 364555 01/01/2015 12:20:33 AM MANHATTAN 997847.0 364556 01/01/2015 02:42:22 AM BRONX 1024816.0	4	2016-01-01 07:56:58	The Police Departmen	it responded and upon arm	civ…
364554 2015-01-01 08:04:28 The Police Department responded to the complai 364555 2015-01-01 08:01:30 The Police Department responded to the complai 364556 2015-01-01 08:01:29 The Police Department responded and upon arriv 364557 2015-01-01 08:00:50 The Police Department responded to the complai Resolution Action Updated Date Borough X Coordinate (State Plane) \ 0 01/01/2016 12:55:15 AM MANHATTAN 1005409.0 1 01/01/2016 01:26:57 AM QUEENS 1007766.0 2 01/01/2016 04:51:03 AM BRONX 1015081.0 3 01/01/2016 07:43:13 AM BRONX 1031740.0 4 01/01/2016 03:24:42 AM QUEENS 1019123.0 364553 01/01/2015 10:22:31 AM QUEENS 1022809.0 364554 01/01/2015 02:25:02 AM BRONX 1009923.0 364555 01/01/2015 12:20:33 AM MANHATTAN 997847.0 364556 01/01/2015 02:42:22 AM BRONX 1024816.0	•••	•••		•••	
364555 2015-01-01 08:01:30 The Police Department responded to the complai 364556 2015-01-01 08:01:29 The Police Department responded and upon arriv 364557 2015-01-01 08:00:50 The Police Department responded to the complai Resolution Action Updated Date Borough X Coordinate (State Plane) \ 0 01/01/2016 12:55:15 AM MANHATTAN 1005409.0 1 01/01/2016 01:26:57 AM QUEENS 1007766.0 2 01/01/2016 04:51:03 AM BRONX 1015081.0 3 01/01/2016 07:43:13 AM BRONX 1031740.0 4 01/01/2016 03:24:42 AM QUEENS 1019123.0 364553 01/01/2015 10:22:31 AM QUEENS 1022809.0 364554 01/01/2015 02:25:02 AM BRONX 1009923.0 364555 01/01/2015 12:20:33 AM MANHATTAN 997847.0 364556 01/01/2015 02:42:22 AM BRONX 1024816.0			_		
364556 2015-01-01 08:01:29 The Police Department responded and upon arriv 364557 2015-01-01 08:00:50 The Police Department responded to the complai Resolution Action Updated Date Borough X Coordinate (State Plane) \ 0 01/01/2016 12:55:15 AM MANHATTAN 1005409.0 1 01/01/2016 01:26:57 AM QUEENS 1007766.0 2 01/01/2016 04:51:03 AM BRONX 1015081.0 3 01/01/2016 07:43:13 AM BRONX 1031740.0 4 01/01/2016 03:24:42 AM QUEENS 1019123.0			_		
Resolution Action Updated Date Borough X Coordinate (State Plane) \ 0 01/01/2016 12:55:15 AM MANHATTAN 1005409.0 1 01/01/2016 01:26:57 AM QUEENS 1007766.0 2 01/01/2016 04:51:03 AM BRONX 1015081.0 3 01/01/2016 07:43:13 AM BRONX 1031740.0 4 01/01/2016 03:24:42 AM QUEENS 1019123.0 364553 01/01/2015 10:22:31 AM QUEENS 1022809.0 364554 01/01/2015 02:25:02 AM BRONX 1009923.0 364555 01/01/2015 12:20:33 AM MANHATTAN 997847.0 364556 01/01/2015 02:42:22 AM BRONX 1024816.0			-		
Resolution Action Updated Date Borough X Coordinate (State Plane) \ 0 01/01/2016 12:55:15 AM MANHATTAN 1005409.0 1 01/01/2016 01:26:57 AM QUEENS 1007766.0 2 01/01/2016 04:51:03 AM BRONX 1015081.0 3 01/01/2016 07:43:13 AM BRONX 1031740.0 4 01/01/2016 03:24:42 AM QUEENS 1019123.0 364553 01/01/2015 10:22:31 AM QUEENS 1022809.0 364554 01/01/2015 02:25:02 AM BRONX 1009923.0 364555 01/01/2015 12:20:33 AM MANHATTAN 997847.0 364556 01/01/2015 02:42:22 AM BRONX 1024816.0			•		
0 01/01/2016 12:55:15 AM MANHATTAN 1005409.0 1 01/01/2016 01:26:57 AM QUEENS 1007766.0 2 01/01/2016 04:51:03 AM BRONX 1015081.0 3 01/01/2016 07:43:13 AM BRONX 1031740.0 4 01/01/2016 03:24:42 AM QUEENS 1019123.0 364553 01/01/2015 10:22:31 AM QUEENS 1022809.0 364554 01/01/2015 02:25:02 AM BRONX 1009923.0 364555 01/01/2015 12:20:33 AM MANHATTAN 997847.0 364556 01/01/2015 02:42:22 AM BRONX 1024816.0	364557	2015-01-01 08:00:50	ine Police Departmen	it responded to the compl	La1
0 01/01/2016 12:55:15 AM MANHATTAN 1005409.0 1 01/01/2016 01:26:57 AM QUEENS 1007766.0 2 01/01/2016 04:51:03 AM BRONX 1015081.0 3 01/01/2016 07:43:13 AM BRONX 1031740.0 4 01/01/2016 03:24:42 AM QUEENS 1019123.0 364553 01/01/2015 10:22:31 AM QUEENS 1022809.0 364554 01/01/2015 02:25:02 AM BRONX 1009923.0 364555 01/01/2015 12:20:33 AM MANHATTAN 997847.0 364556 01/01/2015 02:42:22 AM BRONX 1024816.0		Resolution Action Up	dated Date Borough	X Coordinate (State P	lane) \
1 01/01/2016 01:26:57 AM QUEENS 1007766.0 2 01/01/2016 04:51:03 AM BRONX 1015081.0 3 01/01/2016 07:43:13 AM BRONX 1031740.0 4 01/01/2016 03:24:42 AM QUEENS 1019123.0 364553 01/01/2015 10:22:31 AM QUEENS 1022809.0 364554 01/01/2015 02:25:02 AM BRONX 1009923.0 364555 01/01/2015 12:20:33 AM MANHATTAN 997847.0 364556 01/01/2015 02:42:22 AM BRONX 1024816.0	0	-	•		
2 01/01/2016 04:51:03 AM BRONX 1015081.0 3 01/01/2016 07:43:13 AM BRONX 1031740.0 4 01/01/2016 03:24:42 AM QUEENS 1019123.0 364553 01/01/2015 10:22:31 AM QUEENS 1022809.0 364554 01/01/2015 02:25:02 AM BRONX 1009923.0 364555 01/01/2015 12:20:33 AM MANHATTAN 997847.0 364556 01/01/2015 02:42:22 AM BRONX 1024816.0					
3 01/01/2016 07:43:13 AM BRONX 1031740.0 4 01/01/2016 03:24:42 AM QUEENS 1019123.0 364553 01/01/2015 10:22:31 AM QUEENS 1022809.0 364554 01/01/2015 02:25:02 AM BRONX 1009923.0 364555 01/01/2015 12:20:33 AM MANHATTAN 997847.0 364556 01/01/2015 02:42:22 AM BRONX 1024816.0					
364553 01/01/2015 10:22:31 AM QUEENS 1022809.0 364554 01/01/2015 02:25:02 AM BRONX 1009923.0 364555 01/01/2015 12:20:33 AM MANHATTAN 997847.0 364556 01/01/2015 02:42:22 AM BRONX 1024816.0	4	01/01/2016 0	3:24:42 AM QUEENS	10193	123.0
364554 01/01/2015 02:25:02 AM BRONX 1009923.0 364555 01/01/2015 12:20:33 AM MANHATTAN 997847.0 364556 01/01/2015 02:42:22 AM BRONX 1024816.0	•••			•••	
364555 01/01/2015 12:20:33 AM MANHATTAN 997847.0 364556 01/01/2015 02:42:22 AM BRONX 1024816.0	364553	01/01/2015 1	0:22:31 AM QUEENS	10228	309.0
364556 01/01/2015 02:42:22 AM BRONX 1024816.0	364554	01/01/2015 0	2:25:02 AM BRONX	10099	923.0
	364555			9978	347.0
364557 01/01/2015 02:47:50 AM QUEENS 1038733.0					
	364557	01/01/2015 0	2:47:50 AM QUEENS	10387	733.0
	364554 364555	01/01/2015 0 01/01/2015 1	2:25:02 AM BRONX 2:20:33 AM MANHATTAN	10099 1 9978	923.0 347.0
	364557	01/01/2015 0	2:47:50 AM QUEENS	10387	733.0

```
0
                                 254678.0
                                                 Unspecified
                                                                 MANHATTAN
                                                                            40.865682
                                                 Unspecified
      1
                                 221986.0
                                                                    QUEENS
                                                                            40.775945
      2
                                                 Unspecified
                                                                            40.870325
                                 256380.0
                                                                     BRONX
      3
                                                 Unspecified
                                                                     BRONX
                                                                            40.835994
                                 243899.0
                                                                            40.733060
      4
                                                 Unspecified
                                                                    QUEENS
                                 206375.0
                                    •••
                                                                    QUEENS
      364553
                                 192567.0
                                                 Unspecified
                                                                            40.695145
                                                 Unspecified
                                                                     BRONX
                                                                            40.867830
      364554
                                 255465.0
                                                 Unspecified
      364555
                                 238629.0
                                                                 MANHATTAN
                                                                            40.821647
                                                 Unspecified
      364556
                                 262237.0
                                                                     BRONX
                                                                            40.886361
      364557
                                 184971.0
                                                 Unspecified
                                                                    QUEENS
                                                                            40.674212
              Longitude
                                                          Location
                          (40.86568153633767, -73.92350095571744)
      0
             -73.923501
                         (40.775945312321085, -73.91509393898605)
      1
             -73.915094
      2
                          (40.870324522111424, -73.88852464418646)
             -73.888525
                          (40.83599404683083, -73.82837939584206)
      3
             -73.828379
             -73.874170
                         (40.733059618956815, -73.87416975810375)
                          (40.69514470265117, -73.86094888534394)
      364553 -73.860949
      364554 -73.907178
                          (40.86782963689454, -73.90717786644662)
                          (40.821646626438095, -73.95087342885292)
      364555 -73.950873
      364556 -73.853290
                           (40.88636077906953, -73.85329048666742)
      364557 -73.803585
                         (40.674211762243935, -73.80358548685278)
      [364558 rows x 28 columns]
[23]: # creating new column as time elapsed between request creation and closing (tou
       → show how fast the response time is)
      df5['Closing Time'] = df5['Closed Date'] - df5['Created Date'] #calculating_
       → time taken
[24]: df5.head()
[24]:
         Unique Key
                           Created Date
                                                 Closed Date Agency \
           32310363 2015-12-31 23:59:45 2016-01-01 00:55:15
                                                                NYPD
           32309934 2015-12-31 23:59:44 2016-01-01 01:26:57
      1
                                                                NYPD
      2
           32309159 2015-12-31 23:59:29 2016-01-01 04:51:03
                                                                NYPD
           32305098 2015-12-31 23:57:46 2016-01-01 07:43:13
      3
                                                                NYPD
      4
           32306529 2015-12-31 23:56:58 2016-01-01 03:24:42
                                                                NYPD
                             Agency Name
                                                    Complaint Type
      O New York City Police Department
                                          Noise - Street/Sidewalk
      1 New York City Police Department
                                                  Blocked Driveway
      2 New York City Police Department
                                                  Blocked Driveway
```

Y Coordinate (State Plane) Park Facility Name Park Borough

Latitude

```
3 New York City Police Department
                                             Illegal Parking
4 New York City Police Department
                                             Illegal Parking
                     Descriptor
                                    Location Type
                                                   Incident Zip
0
               Loud Music/Party
                                 Street/Sidewalk
                                                        10034.0
1
                      No Access
                                 Street/Sidewalk
                                                         11105.0
2
                      No Access
                                 Street/Sidewalk
                                                        10458.0
3
  Commercial Overnight Parking
                                 Street/Sidewalk
                                                        10461.0
               Blocked Sidewalk Street/Sidewalk
4
                                                         11373.0
        Incident Address
                                Street Name
                                              Cross Street 1
                                                                Cross Street 2
0
     71 VERMILYEA AVENUE
                         VERMILYEA AVENUE
                                              ACADEMY STREET
                                                              WEST 204 STREET
1
         27-07 23 AVENUE
                                  23 AVENUE
                                                   27 STREET
                                                                     28 STREET
2
  2897 VALENTINE AVENUE
                         VALENTINE AVENUE
                                             EAST 198 STREET
                                                               EAST 199 STREET
3
     2940 BAISLEY AVENUE
                            BAISLEY AVENUE
                                               EDISON AVENUE
                                                                      B STREET
4
           87-14 57 ROAD
                                    57 ROAD
                                              SEABURY STREET
                                                                 HOFFMAN DRIVE
  Address Type
                    City Facility Type
                                         Status
                                                            Due Date
       ADDRESS
0
                NEW YORK
                               Precinct Closed 2016-01-01 07:59:45
       ADDRESS
                 ASTORIA
                               Precinct Closed 2016-01-01 07:59:44
1
2
                              Precinct Closed 2016-01-01 07:59:29
       ADDRESS
                   BRONX
                              Precinct Closed 2016-01-01 07:57:46
3
       ADDRESS
                   BRONX
       ADDRESS
               ELMHURST
                              Precinct Closed 2016-01-01 07:56:58
                              Resolution Description \
 The Police Department responded and upon arriv...
1 The Police Department responded to the complai...
2 The Police Department responded and upon arriv...
3 The Police Department responded to the complai...
4 The Police Department responded and upon arriv...
  Resolution Action Updated Date
                                             X Coordinate (State Plane)
                                     Borough
          01/01/2016 12:55:15 AM
                                                                1005409.0
0
                                   MANHATTAN
1
          01/01/2016 01:26:57 AM
                                      QUEENS
                                                                1007766.0
2
          01/01/2016 04:51:03 AM
                                       BRONX
                                                                1015081.0
3
          01/01/2016 07:43:13 AM
                                       BRONX
                                                                1031740.0
          01/01/2016 03:24:42 AM
                                      QUEENS
                                                                1019123.0
  Y Coordinate (State Plane) Park Facility Name Park Borough
                                                                  Latitude
0
                                      Unspecified
                                                     MANHATTAN
                                                                40.865682
                     254678.0
                                      Unspecified
1
                     221986.0
                                                        QUEENS
                                                                 40.775945
2
                     256380.0
                                      Unspecified
                                                         BRONX
                                                                 40.870325
3
                                      Unspecified
                                                         BRONX
                     243899.0
                                                                 40.835994
4
                     206375.0
                                      Unspecified
                                                        QUEENS
                                                                 40.733060
  Longitude
                                               Location
                                                            Closing Time
0 -73.923501
               (40.86568153633767, -73.92350095571744) 0 days 00:55:30
```

```
1 -73.915094 (40.775945312321085, -73.91509393898605) 0 days 01:27:13
     2 -73.888525 (40.870324522111424, -73.88852464418646) 0 days 04:51:34
     3 -73.828379
                   (40.83599404683083, -73.82837939584206) 0 days 07:45:27
     4 -73.874170 (40.733059618956815, -73.87416975810375) 0 days 03:27:44
[25]: df5['Time Bin'] = pd.cut(df5['Closing Time'], 100)#
[26]: df5.info()
     <class 'pandas.core.frame.DataFrame'>
     RangeIndex: 364558 entries, 0 to 364557
     Data columns (total 30 columns):
          Column
                                          Non-Null Count
                                                          Dtype
         ____
                                          _____
      0
          Unique Key
                                          364558 non-null int64
      1
          Created Date
                                          364558 non-null datetime64[ns]
      2
          Closed Date
                                          362177 non-null datetime64[ns]
      3
          Agency
                                          364558 non-null object
      4
          Agency Name
                                         364558 non-null object
      5
          Complaint Type
                                          364558 non-null object
      6
          Descriptor
                                          358057 non-null object
      7
          Location Type
                                          364425 non-null object
      8
          Incident Zip
                                         361560 non-null float64
      9
          Incident Address
                                         312859 non-null object
      10 Street Name
                                         312859 non-null object
      11 Cross Street 1
                                         307370 non-null object
      12 Cross Street 2
                                         306753 non-null object
      13 Address Type
                                          361306 non-null object
      14 City
                                          361561 non-null object
      15 Facility Type
                                          362169 non-null object
      16 Status
                                          364558 non-null object
      17 Due Date
                                          364555 non-null datetime64[ns]
      18 Resolution Description
                                          364558 non-null object
         Resolution Action Updated Date
                                         362156 non-null object
      20 Borough
                                          364558 non-null object
      21 X Coordinate (State Plane)
                                          360528 non-null float64
      22 Y Coordinate (State Plane)
                                          360528 non-null float64
      23 Park Facility Name
                                          364558 non-null object
      24 Park Borough
                                          364558 non-null object
      25 Latitude
                                          360528 non-null float64
      26 Longitude
                                          360528 non-null float64
      27 Location
                                          360528 non-null object
      28 Closing Time
                                          362177 non-null timedelta64[ns]
      29 Time Bin
                                          362177 non-null category
     dtypes: category(1), datetime64[ns](3), float64(5), int64(1), object(19),
```

timedelta64[ns](1)
memory usage: 81.0+ MB

```
[27]: df5['Closing Time Sec'] = df5['Closing Time'].apply(lambda x:x.seconds)
[28]: df5['Closing Time Sec']
[28]: 0
                 3330.0
                 5233.0
      1
      2
                17494.0
      3
                27927.0
      4
                12464.0
      364553
                37067.0
      364554
                8434.0
      364555
                 1143.0
                 9653.0
      364556
      364557
                10020.0
      Name: Closing Time Sec, Length: 364558, dtype: float64
[29]: df5.info()
     <class 'pandas.core.frame.DataFrame'>
     RangeIndex: 364558 entries, 0 to 364557
     Data columns (total 31 columns):
      #
          Column
                                          Non-Null Count
                                                            Dtype
     ___
                                           _____
                                                            ____
      0
          Unique Key
                                          364558 non-null int64
          Created Date
                                          364558 non-null datetime64[ns]
      1
      2
          Closed Date
                                          362177 non-null datetime64[ns]
      3
                                          364558 non-null object
          Agency
      4
          Agency Name
                                          364558 non-null object
      5
          Complaint Type
                                          364558 non-null object
      6
          Descriptor
                                          358057 non-null object
      7
          Location Type
                                          364425 non-null object
          Incident Zip
                                          361560 non-null float64
          Incident Address
                                          312859 non-null object
      10 Street Name
                                          312859 non-null object
      11 Cross Street 1
                                          307370 non-null object
      12 Cross Street 2
                                          306753 non-null object
      13
         Address Type
                                          361306 non-null object
      14 City
                                          361561 non-null object
      15 Facility Type
                                          362169 non-null object
          Status
      16
                                          364558 non-null object
      17
          Due Date
                                          364555 non-null
                                                           datetime64[ns]
```

364558 non-null

360528 non-null

362156 non-null object

364558 non-null object

360528 non-null float64

object

float64

Resolution Description

22 Y Coordinate (State Plane)

X Coordinate (State Plane)

Borough

20

21

Resolution Action Updated Date

```
23 Park Facility Name
                                    364558 non-null object
 24 Park Borough
                                    364558 non-null object
                                    360528 non-null float64
 25 Latitude
 26 Longitude
                                    360528 non-null float64
    Location
                                    360528 non-null object
 27
                                    362177 non-null timedelta64[ns]
 28
    Closing Time
    Time Bin
29
                                    362177 non-null category
30 Closing Time Sec
                                    362177 non-null float64
dtypes: category(1), datetime64[ns](3), float64(6), int64(1), object(19),
timedelta64[ns](1)
```

timedelta64[ns](1)
memory usage: 83.8+ MB

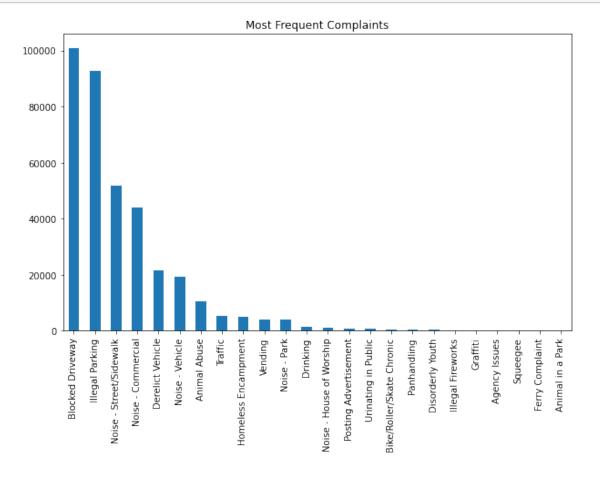
1.2 Finding major types of complaints

```
[30]: # bar graph of count vs. complaint types

df5['Complaint Type'].value_counts().plot(kind='bar',figsize=(10,6),title='Most

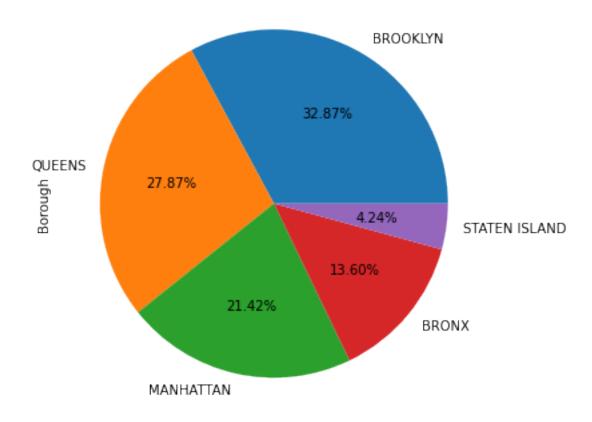
→Frequent Complaints')

plt.show()
```



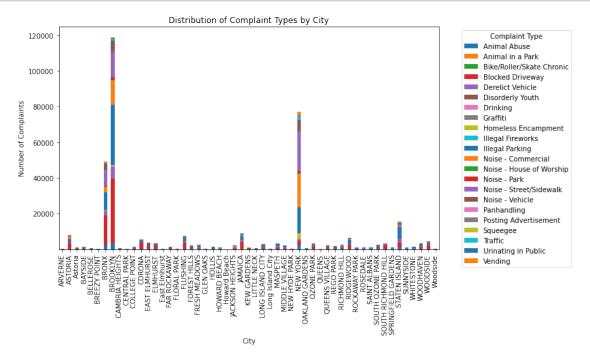
```
[31]: # showing top 10 most amount of complaints with blocked driveway and illegal
      →parking as the most by a lot
      df5['Complaint Type'].value_counts().head(10)
[31]: Blocked Driveway
                                 100881
      Illegal Parking
                                  92679
     Noise - Street/Sidewalk
                                  51692
     Noise - Commercial
                                  44109
     Derelict Vehicle
                                  21661
     Noise - Vehicle
                                  19352
     Animal Abuse
                                  10541
     Traffic
                                   5198
     Homeless Encampment
                                   4879
     Vending
                                   4192
     Name: Complaint Type, dtype: int64
[32]: # Showing how many complaints per Borough but some are unspecified
      df5['Borough'].value_counts()
[32]: BROOKLYN
                       118864
      QUEENS
                       100766
     MANHATTAN
                        77462
     BRONX
                        49169
     STATEN ISLAND
                        15339
     Unspecified
                         2958
      Name: Borough, dtype: int64
[33]: # removing unspecified complaints
      df5.replace('Unspecified',np.NaN,inplace=True)
      df5=df5.dropna(how='all')
[34]: # confirming unspecified are removed
      df5['Borough'].value_counts()
[34]: BROOKLYN
                       118864
      QUEENS
                       100766
     MANHATTAN
                        77462
     BR.ONX
                        49169
     STATEN ISLAND
                        15339
     Name: Borough, dtype: int64
[35]: # pie plot showing Borough wise percentage of complaints and that Brooklynu
      → followed by Queens have the most
      df5['Borough'].value_counts().plot(kind='pie',autopct='%.
      →2f\%', figsize=(10,6), title='Complaints Per Borough')
      plt.show()
```

Complaints Per Borough

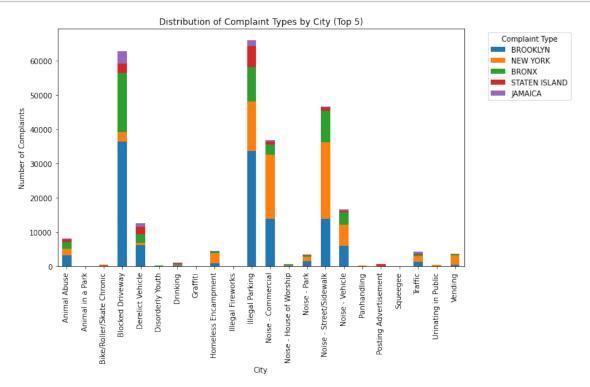


1.3 Visualize the major types of complaints in each city

```
plt.xlabel('City')
plt.ylabel('Number of Complaints')
plt.title('Distribution of Complaint Types by City')
plt.legend(title='Complaint Type', bbox_to_anchor=(1.05, 1), loc='upper left')
plt.show()
```



```
plt.title('Distribution of Complaint Types by City (Top 5)')
plt.legend(title='Complaint Type', bbox_to_anchor=(1.05, 1), loc='upper left')
plt.show()
```

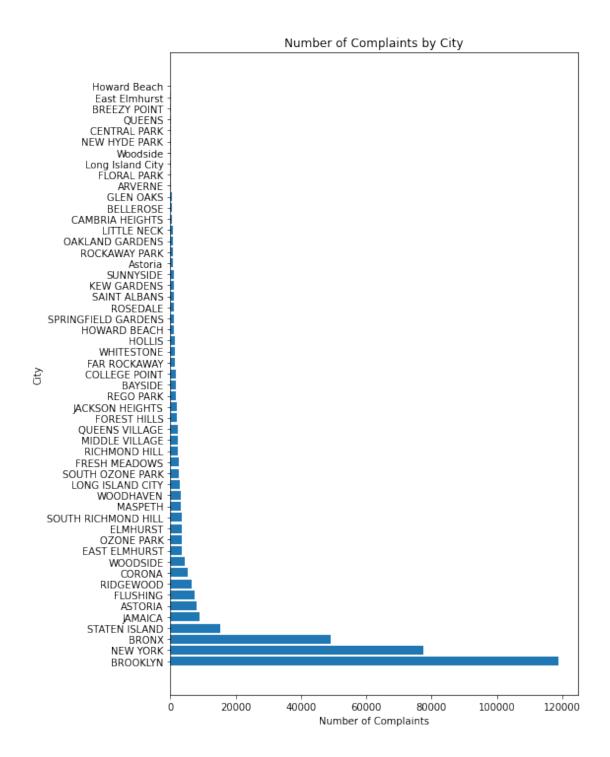


```
[38]: # Get the value counts for each city
    city_counts = df['City'].value_counts()

# Create a horizontal bar chart
    plt.figure(figsize=(8, 10))
    plt.barh(city_counts.index, city_counts.values)

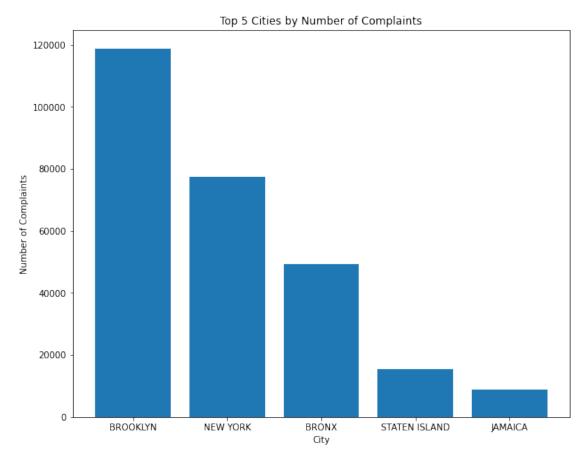
# Add labels and titles to the plot
    plt.xlabel('Number of Complaints')
    plt.ylabel('City')
    plt.title('Number of Complaints by City')

# Adjust the padding between subplots to prevent overlapping labels
    plt.tight_layout()
    plt.show()
```



```
[39]: # get the frequency of complaints by city
complaint_freq = df5['City'].value_counts()

# create a bar plot of the complaint frequencies
fig, ax = plt.subplots(figsize=(10, 8))
```

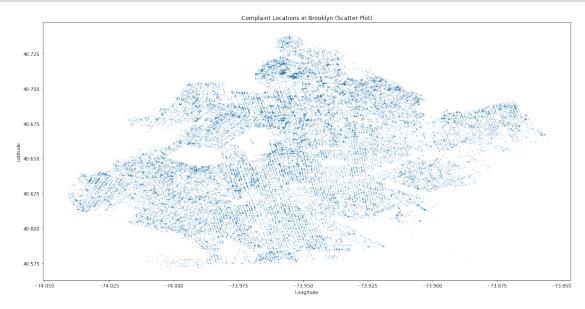


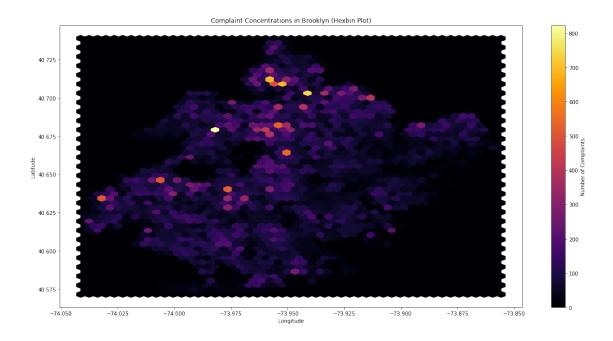
```
[40]: # select only the rows of df5 where the borough is 'BROOKLYN'
brooklyn_data = df5[df5['Borough'] == 'BROOKLYN']

# scatter plot of complaint locations in Brooklyn
fig, ax = plt.subplots(figsize=(20,10))
ax.scatter(brooklyn_data['Longitude'], brooklyn_data['Latitude'], s=1, alpha=0.

→1)
```

```
# Add labels and titles to the plot
ax.set_xlabel('Longitude')
ax.set_ylabel('Latitude')
ax.set_title('Complaint Locations in Brooklyn (Scatter Plot)')
plt.show()
# Create a hexbin plot of complaint concentrations in Brooklyn
fig, ax = plt.subplots(figsize=(20,10))
hb = ax.hexbin(brooklyn_data['Longitude'], brooklyn_data['Latitude'],
# Add a colorbar and labels and titles to the plot
cb = plt.colorbar(hb, ax=ax)
cb.set_label('Number of Complaints')
ax.set_xlabel('Longitude')
ax.set_ylabel('Latitude')
ax.set_title('Complaint Concentrations in Brooklyn (Hexbin Plot)')
plt.show()
```





1.4 Identify significant variables by performing a statistical analysis using p-values and chi-square values

```
[41]: # create contingency table of the variables we want to test
    cont_table = pd.crosstab(df5['Complaint Type'], df5['Borough'])

[42]: # chi-square test of independence to calculate the p-value and chi-square value
    chi2, p, dof, expected = stats.chi2_contingency(cont_table)

[43]: # print out the p-value and chi-square value
    print("p-value:", p)
    print("chi-square:", chi2)
```

p-value: 0.0

chi-square: 93431.06106800103

- -Null Hypothesis: ${
 m H0}$ there is NO significant relation between type of complaint and location
- -Alternate Hypothesis: Ha there IS significant relation between type of complaint and location

- 1.5 Results
- 1.5.1 p-value 0.00 < 0.05
- 1.5.2 -REJECT null hypothesis
- 1.5.3 -complaint type and location ARE related

[]: