Oakland Crime Statistics 2011 to 2016

In [9]:

```
import pandas as pd
import matplotlib.pyplot as plt
from scipy.spatial.distance import pdist
from math import ceil
import numpy as np
%matplotlib inline

data1 = pd.read_csv("records-for-2011.csv",encoding="utf-8")
data2 = pd.read_csv("records-for-2012.csv",encoding="utf-8")
data3 = pd.read_csv("records-for-2013.csv",encoding="utf-8")
data4 = pd.read_csv("records-for-2014.csv",encoding="utf-8")
data5 = pd.read_csv("records-for-2015.csv",encoding="utf-8")
data6 = pd.read_csv("records-for-2016.csv",encoding="utf-8")
data_all_crime = [data1, data2, data3, data4, data5, data6]
data1.head(5)
```

Out[9]:

	Agency	Create Time	Location	Area Id	Beat	Priority	Incident Type Id	Incident Type Description	Event
0	ОР	2011-01- 01T00:00:00.000	ST&SAN PABLO AV	1.0	06X	1.0	PDOA	POSSIBLE DEAD PERSON	LOP11010
1	OP	2011-01- 01T00:01:11.000	ST&HANNAH ST	1.0	07X	1.0	415GS	415 GUNSHOTS	LOP11010
2	ОР	2011-01- 01T00:01:25.000	ST&MARKET ST	1.0	10Y	2.0	415GS	415 GUNSHOTS	LOP11010
3	ОР	2011-01- 01T00:01:35.000	PRENTISS ST	2.0	21Y	2.0	415GS	415 GUNSHOTS	LOP11010
4	ОР	2011-01- 01T00:02:10.000	AV&FOOTHILL BLVD	2.0	20X	1.0	415GS	415 GUNSHOTS	LOP11010

观察数据集可以发现,该犯罪统计的数据集内没有严格意义上的数值属性,所以对于非数值属性的五数概括以及 数据直方图、盒图等可视化没有意义

下面进行标称属性频数计算

In [10]:

data2.head(5)

Out[10]:

	Agency	Create Time	Area Id	Beat	Priority	Incident Type Id	Incident Type Description	Event Number	С
0	OP	2012-01- 01T00:00:25.000	2.0	32Y	2.0	415GS	415 GUNSHOTS	LOP120101000004	01T0
1	ОР	2012-01- 01T00:00:27.000	2.0	30Y	2.0	415GS	415 GUNSHOTS	LOP120101000003	01T0
2	ОР	2012-01- 01T00:00:48.000	1.0	06X	2.0	949	SUSPICIOUS VEHICLE	LOP120101000005	01T0
3	ОР	2012-01- 01T00:00:58.000	2.0	35X	2.0	415GS	415 GUNSHOTS	LOP120101000008	01T0
4	OP	2012-01- 01T00:01:14.000	1.0	02Y	2.0	415GS	415 GUNSHOTS	LOP120101000007	01T0

In [11]:

data3.head(5)

Out[11]:

	Agency	Create Time	Location	Area Id	Beat	Priority	Incident Type Id	Incident Type Description	Eve
0	ОР	2013-01- 01T00:00:00.000	D ST	2.0	33X	1.0	415GS	415 GUNSHOTS	LOP130
1	ОР	2013-01- 01T00:00:05.000	ARTHUR ST	2.0	30X	2.0	415GS	415 GUNSHOTS	LOP130
2	ОР	2013-01- 01T00:00:50.000	BRIDGE AV	2.0	23X	1.0	243E	BATTERY ON CO- HABITA	LOP13(
3	ОР	2013-01- 01T00:02:16.000	AV&BROOKDALE AV	2.0	29X	2.0	415GS	415 GUNSHOTS	LOP13(
4	OP	2013-01- 01T00:02:47.000	AV&SAN LEANDRO ST	2.0	26Y	2.0	415GS	415 GUNSHOTS	LOP13(

In [12]:

data4.head(5)

Out[12]:

	Agency	Create Time	Area Id	Beat	Priority	Incident Type Id	Incident Type Description	Event Number	Cl
0	OP	2014-01- 01T00:00:00.000	1.0	02X	2	415GS	415 GUNSHOTS	LOP140101000001	01T03
1	ОР	2014-01- 01T00:00:00.000	2.0	26Y	2	415GS	415 GUNSHOTS	LOP140101000002	01T02
2	ОР	2014-01- 01T00:00:00.000	2.0	30Y	2	415GS	415 GUNSHOTS	LOP140101000004	01T00
3	ОР	2014-01- 01T00:00:00.000	2.0	30Y	2	415GS	415 GUNSHOTS	LOP140101000005	01T02
4	OP	2014-01- 01T00:01:04.000	2.0	35X	2	CODE7	SUBJECT ARMED WITH W	LOP140101000010	01T05

In [13]:

data5.head(5)

Out[13]:

	Agency	Create Time	Location	Area Id	Beat	Priority	Incident Type Id	Incident Type Description	Event
0	ОР	2015-01- 01T00:01:59.000	S ELMHURST AV	P3	31Y	2	415	DISTURBING THE PEACE	LOP15010
1	ОР	2015-01- 01T00:02:02.000	AV&D ST	P3	32X	2	415GS	415 GUNSHOTS	LOP15010
2	ОР	2015-01- 01T00:02:06.000	BANCROFT AV	P3	30Y	2	933R	ALARM- RINGER	LOP15010
3	ОР	2015-01- 01T00:03:16.000	MACARTHUR BLVD	P3	30Y	2	415GS	415 GUNSHOTS	LOP15010
4	ОР	2015-01- 01T00:03:45.000	ST&ADELINE ST	P1	02X	2	415GS	415 GUNSHOTS	LOP15010

In [14]:

data6.head(5)

Out[14]:

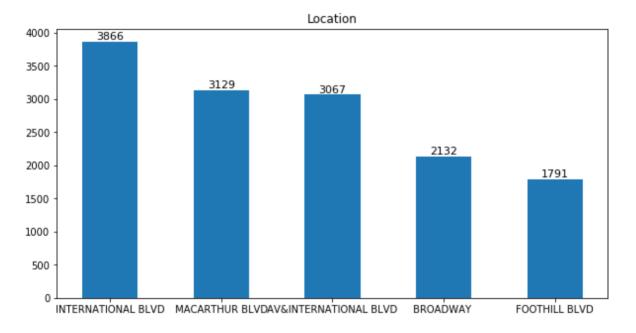
	Agency	Create Time	Location	Area Id	Beat	Priority	Incident Type Id	Incident Type Description	Even
0	ОР	2016-01- 01T00:00:57.000	ST&MARKET ST	P1	05X	2.0	415GS	415 GUNSHOTS	LOP1601
1	ОР	2016-01- 01T00:01:25.000	AV&HAMILTON ST	P3	26Y	2.0	415GS	415 GUNSHOTS	LOP1601
2	ОР	2016-01- 01T00:01:43.000	ST&CHESTNUT ST	P1	02X	2.0	415GS	415 GUNSHOTS	LOP1601
3	ОР	2016-01- 01T00:01:48.000	WALLACE ST	P2	18Y	2.0	415GS	415 GUNSHOTS	LOP1601
4	OP	2016-01- 01T00:02:05.000	90TH AV	P3	34X	2.0	415GS	415 GUNSHOTS	LOP1601

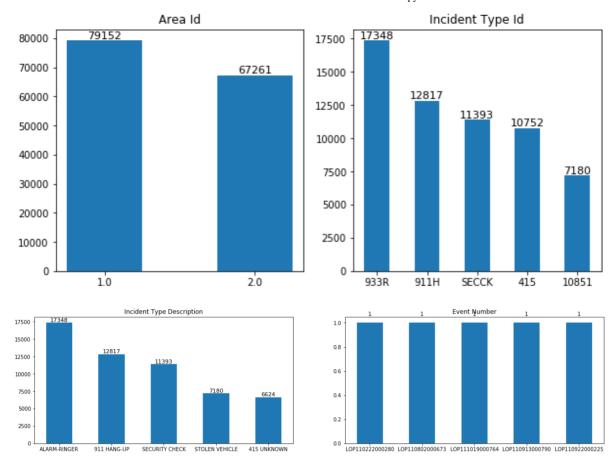
In [17]:

```
#2011年犯罪数据频数计算
year=2011
data1 number=data1
data1 number=data1 number.dropna(axis=0,how='all')
print("\nrecords-for-" + str(year)+".csv的频数聚合分析:")
data1 location g=[]
data1 location=data1 number["Location"].value counts(sort=True)
data1 location=data1 location.head(5)
data1 location name=data1 location.index.tolist()
data1 location num=data1 location.values
data1 area=data1 number["Area Id"].value counts(sort=True)
data1 area=data1 area.head(2)
data1 area name=data1 area.index.tolist()
data1 area num=data1 area.values
data1_id=data1_number["Incident Type Id"].value_counts(sort=True)
data1 id=data1 id.head(5)
data1 id name=data1 id.index.tolist()
data1 id num=data1 id.values
datal_Description=datal_number["Incident Type Description"].value_counts(sort=True)
data1 Description=data1 Description.head(5)
data1 Description name=data1 Description.index.tolist()
data1 Description num=data1 Description.values
data1 Event=data1 number["Event Number"].value counts(sort=True)
data1 Event=data1 Event.head(5)
data1 Event name=data1 Event.index.tolist()
data1 Event num=data1 Event.values
index=np.arange(5)
index_id=np.arange(2)
plt.figure(figsize=(10, 5))
plt.bar(index,data1 location num, 0.5, label="num")
plt.xticks(index,data1_location_name)
for a,b in zip(index,data1 location num):
    plt.text(a, b+0.05, '%.0f' % b, ha='center', va= 'bottom', fontsize=11)
plt.title("Location")
plt.figure(figsize=(10,10))
ax1 = plt.subplot(2,2,1)
ax2 = plt.subplot(2,2,2)
plt.sca(ax1)
plt.bar(index id,data1 area num, 0.5, label="num")
plt.xticks(index id,data1 area name)
for a,b in zip(index_id,data1_area_num):
    plt.text(a, b+0.05, '%.0f' % b, ha='center', va= 'bottom', fontsize=11)
plt.title("Area Id")
plt.sca(ax2)
plt.bar(index,data1_id_num, 0.5, label="num")
plt.xticks(index,data1 id name)
for a,b in zip(index,data1_id_num):
    plt.text(a, b+0.05, '%.0f' % b, ha='center', va= 'bottom', fontsize=11)
plt.title("Incident Type Id")
```

```
plt.figure(figsize=(20,10))
ax3 = plt.subplot(2,2,1)
ax4 = plt.subplot(2,2,2)
plt.sca(ax3)
plt.bar(index,data1 Description num, 0.5, label="num")
plt.xticks(index,data1 Description name)
for a,b in zip(index,data1 Description num):
    plt.text(a, b+0.05, '%.0f' % b, ha='center', va= 'bottom', fontsize=11)
plt.title("Incident Type Description")
plt.sca(ax4)
plt.bar(index,data1 Event num, 0.5, label="num")
plt.xticks(index,data1 Event name)
for a,b in zip(index,data1 Event num):
    plt.text(a, b+0.05, '%.0f' % b, ha='center', va= 'bottom', fontsize=11)
plt.title("Event Number")
plt.show()
```

records-for-2011.csv的频数聚合分析:



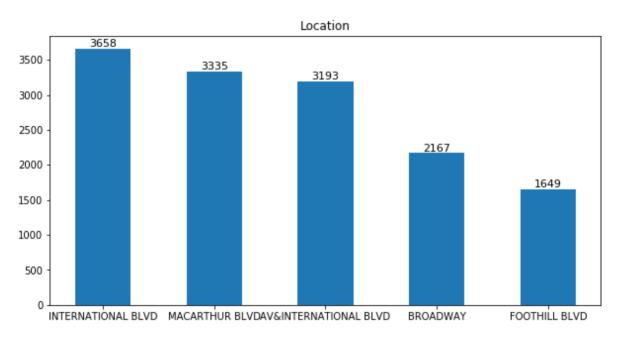


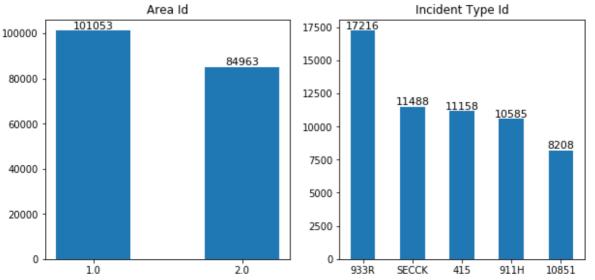
In [18]:

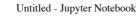
```
#2012年犯罪数据频数计算
year=2012
data1 number=data2
data1 number=data1 number.dropna(axis=0,how='all')
print("\nrecords-for-" + str(year)+".csv的频数聚合分析:")
data1 location g=[]
data1 location=data1 number["Location 1"].value counts(sort=True)
data1 location=data1 location.head(5)
data1 location name=data1 location.index.tolist()
data1 location num=data1 location.values
for data_g in data1_location_name:
    data1 location g.append(data g.split('"')[3])
data1 location name=data1 location g
data1 area=data1 number["Area Id"].value counts(sort=True)
data1 area=data1 area.head(2)
data1 area name=data1 area.index.tolist()
data1 area num=data1 area.values
datal id=datal number["Incident Type Id"].value counts(sort=True)
data1 id=data1 id.head(5)
data1_id_name=data1_id.index.tolist()
data1 id num=data1 id.values
datal Description=datal number["Incident Type Description"].value counts(sort=True)
data1 Description=data1 Description.head(5)
data1 Description name=data1 Description.index.tolist()
datal Description num=datal Description.values
data1 Event=data1 number["Event Number"].value counts(sort=True)
data1 Event=data1 Event.head(5)
data1 Event name=data1 Event.index.tolist()
data1_Event_num=data1_Event.values
index=np.arange(5)
index id=np.arange(2)
plt.figure(figsize=(10, 5))
plt.bar(index,data1 location num, 0.5, label="num")
plt.xticks(index,data1_location name)
for a,b in zip(index,data1 location num):
    plt.text(a, b+0.05, '%.0f' % b, ha='center', va= 'bottom',fontsize=11)
plt.title("Location")
plt.figure(figsize=(10,10))
ax1 = plt.subplot(2,2,1)
ax2 = plt.subplot(2,2,2)
plt.sca(ax1)
plt.bar(index_id,data1_area_num, 0.5, label="num")
plt.xticks(index_id,data1_area_name)
for a,b in zip(index id,data1 area num):
    plt.text(a, b+0.05, '%.0f' % b, ha='center', va= 'bottom', fontsize=11)
plt.title("Area Id")
plt.sca(ax2)
plt.bar(index,data1 id num, 0.5, label="num")
plt.xticks(index,data1 id name)
```

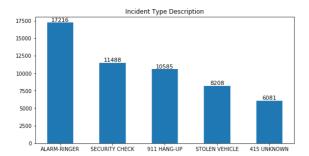
```
for a,b in zip(index,data1 id num):
    plt.text(a, b+0.05, '%.0f' % b, ha='center', va= 'bottom', fontsize=11)
plt.title("Incident Type Id")
plt.figure(figsize=(20,10))
ax3 = plt.subplot(2,2,1)
ax4 = plt.subplot(2,2,2)
plt.sca(ax3)
plt.bar(index,data1 Description num, 0.5, label="num")
plt.xticks(index,data1 Description name)
for a,b in zip(index,datal_Description_num):
    plt.text(a, b+0.05, '%.0f' % b, ha='center', va= 'bottom', fontsize=11)
plt.title("Incident Type Description")
plt.sca(ax4)
plt.bar(index,data1 Event num, 0.5, label="num")
plt.xticks(index,data1_Event_name)
for a,b in zip(index,data1 Event num):
    plt.text(a, b+0.05, '%.0f' % b, ha='center', va= 'bottom', fontsize=11)
plt.title("Event Number")
plt.show()
```

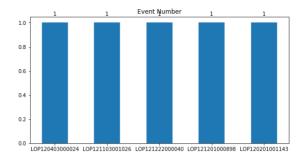
records-for-2012.csv的频数聚合分析:









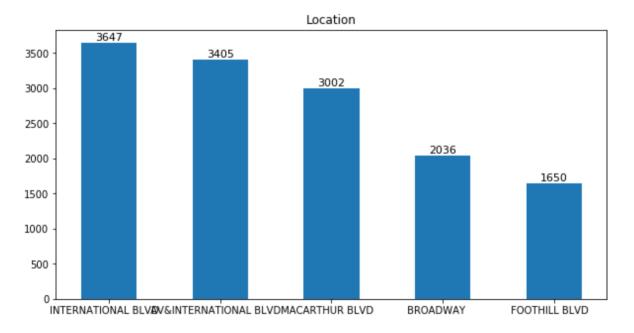


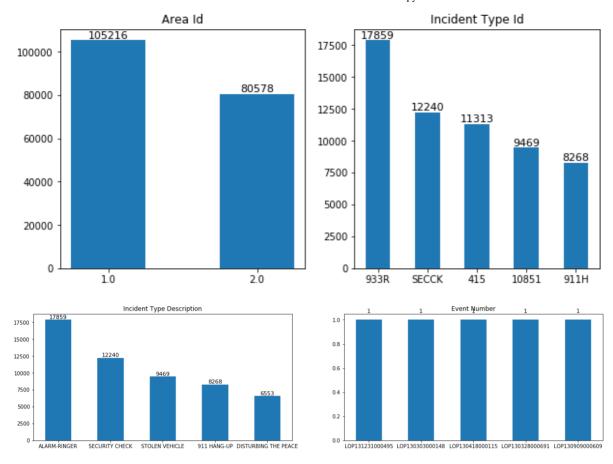
In [19]:

```
#2013年犯罪数据频数计算
year=2013
data1 number=data3
data1 number=data1 number.dropna(axis=0,how='all')
print("\nrecords-for-" + str(year)+".csv的频数聚合分析:")
data1 location g=[]
data1 location=data1 number["Location "].value counts(sort=True)
data1 location=data1 location.head(5)
data1 location name=data1 location.index.tolist()
data1 location num=data1 location.values
data1 area=data1 number["Area Id"].value counts(sort=True)
data1 area=data1 area.head(2)
data1 area name=data1 area.index.tolist()
data1 area num=data1 area.values
data1_id=data1_number["Incident Type Id"].value_counts(sort=True)
data1 id=data1 id.head(5)
data1 id name=data1 id.index.tolist()
data1 id num=data1 id.values
datal_Description=datal_number["Incident Type Description"].value_counts(sort=True)
data1 Description=data1 Description.head(5)
data1 Description name=data1 Description.index.tolist()
data1 Description num=data1 Description.values
data1 Event=data1 number["Event Number"].value counts(sort=True)
data1 Event=data1 Event.head(5)
data1 Event name=data1 Event.index.tolist()
data1 Event num=data1 Event.values
index=np.arange(5)
index_id=np.arange(2)
plt.figure(figsize=(10, 5))
plt.bar(index,data1 location num, 0.5, label="num")
plt.xticks(index,data1_location_name)
for a,b in zip(index,data1 location num):
    plt.text(a, b+0.05, '%.0f' % b, ha='center', va= 'bottom', fontsize=11)
plt.title("Location")
plt.figure(figsize=(10,10))
ax1 = plt.subplot(2,2,1)
ax2 = plt.subplot(2,2,2)
plt.sca(ax1)
plt.bar(index id,data1 area num, 0.5, label="num")
plt.xticks(index id,data1 area name)
for a,b in zip(index_id,data1_area_num):
    plt.text(a, b+0.05, '%.0f' % b, ha='center', va= 'bottom', fontsize=11)
plt.title("Area Id")
plt.sca(ax2)
plt.bar(index,data1_id_num, 0.5, label="num")
plt.xticks(index,data1 id name)
for a,b in zip(index,data1_id_num):
    plt.text(a, b+0.05, '%.0f' % b, ha='center', va= 'bottom', fontsize=11)
plt.title("Incident Type Id")
```

```
plt.figure(figsize=(20,10))
ax3 = plt.subplot(2,2,1)
ax4 = plt.subplot(2,2,2)
plt.sca(ax3)
plt.bar(index,data1 Description num, 0.5, label="num")
plt.xticks(index,data1 Description name)
for a,b in zip(index,data1 Description num):
    plt.text(a, b+0.05, '%.0f' % b, ha='center', va= 'bottom', fontsize=11)
plt.title("Incident Type Description")
plt.sca(ax4)
plt.bar(index,data1 Event num, 0.5, label="num")
plt.xticks(index,data1 Event name)
for a,b in zip(index,data1 Event num):
    plt.text(a, b+0.05, '%.0f' % b, ha='center', va= 'bottom', fontsize=11)
plt.title("Event Number")
plt.show()
```

records-for-2013.csv的频数聚合分析:



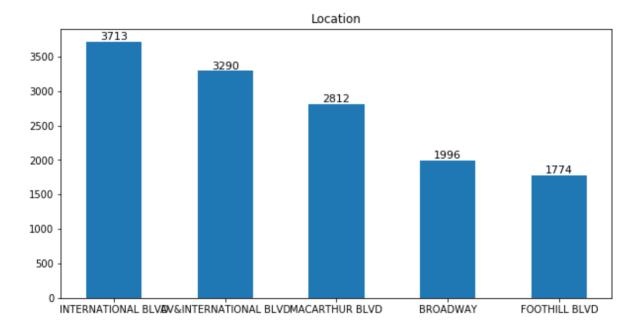


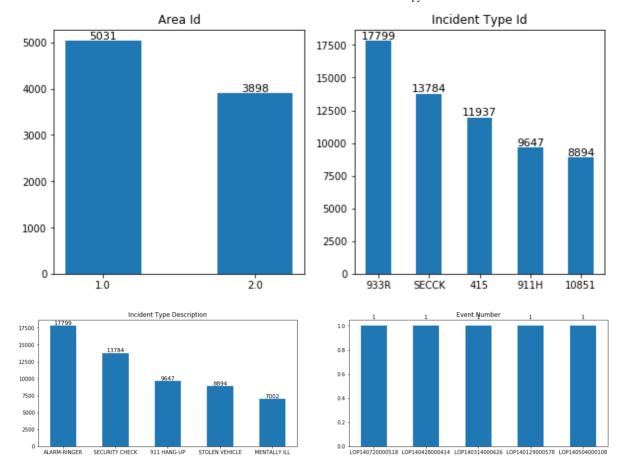
In [20]:

```
#2014年犯罪数据频数计算
year=2014
data1 number=data4
data1 number=data1 number.dropna(axis=0,how='all')
print("\nrecords-for-" + str(year)+".csv的频数聚合分析:")
data1 location g=[]
data1 location=data1 number["Location 1"].value counts(sort=True)
data1 location=data1 location.head(5)
data1 location name=data1 location.index.tolist()
data1 location num=data1 location.values
for data_g in data1_location_name:
    data1 location g.append(data g.split('"')[3])
data1 location name=data1 location g
data1 area=data1 number["Area Id"].value counts(sort=True)
data1 area=data1 area.head(2)
data1 area name=data1 area.index.tolist()
data1 area num=data1 area.values
datal id=datal number["Incident Type Id"].value counts(sort=True)
data1 id=data1 id.head(5)
data1_id_name=data1_id.index.tolist()
data1 id num=data1 id.values
datal Description=datal number["Incident Type Description"].value counts(sort=True)
data1 Description=data1 Description.head(5)
data1 Description name=data1 Description.index.tolist()
datal Description num=datal Description.values
data1 Event=data1 number["Event Number"].value counts(sort=True)
data1 Event=data1 Event.head(5)
data1 Event name=data1 Event.index.tolist()
data1_Event_num=data1_Event.values
index=np.arange(5)
index id=np.arange(2)
plt.figure(figsize=(10, 5))
plt.bar(index,data1 location num, 0.5, label="num")
plt.xticks(index,data1_location name)
for a,b in zip(index,data1 location num):
    plt.text(a, b+0.05, '%.0f' % b, ha='center', va= 'bottom',fontsize=11)
plt.title("Location")
plt.figure(figsize=(10,10))
ax1 = plt.subplot(2,2,1)
ax2 = plt.subplot(2,2,2)
plt.sca(ax1)
plt.bar(index_id,data1_area_num, 0.5, label="num")
plt.xticks(index_id,data1_area_name)
for a,b in zip(index id,data1 area num):
    plt.text(a, b+0.05, '%.0f' % b, ha='center', va= 'bottom', fontsize=11)
plt.title("Area Id")
plt.sca(ax2)
plt.bar(index,data1 id num, 0.5, label="num")
plt.xticks(index,data1 id name)
```

```
for a,b in zip(index,data1 id num):
    plt.text(a, b+0.05, '%.0f' % b, ha='center', va= 'bottom', fontsize=11)
plt.title("Incident Type Id")
plt.figure(figsize=(20,10))
ax3 = plt.subplot(2,2,1)
ax4 = plt.subplot(2,2,2)
plt.sca(ax3)
plt.bar(index,data1 Description num, 0.5, label="num")
plt.xticks(index,data1 Description name)
for a,b in zip(index,data1 Description num):
    plt.text(a, b+0.05, '%.0f' % b, ha='center', va= 'bottom', fontsize=11)
plt.title("Incident Type Description")
plt.sca(ax4)
plt.bar(index,data1_Event_num, 0.5, label="num")
plt.xticks(index,data1_Event_name)
for a,b in zip(index,data1 Event num):
    plt.text(a, b+0.05, '%.0f' % b, ha='center', va= 'bottom', fontsize=11)
plt.title("Event Number")
plt.show()
```

records-for-2014.csv的频数聚合分析:



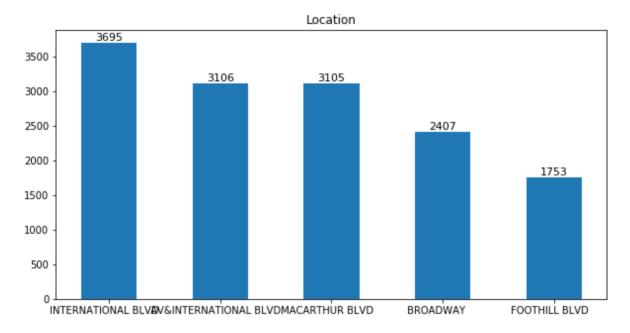


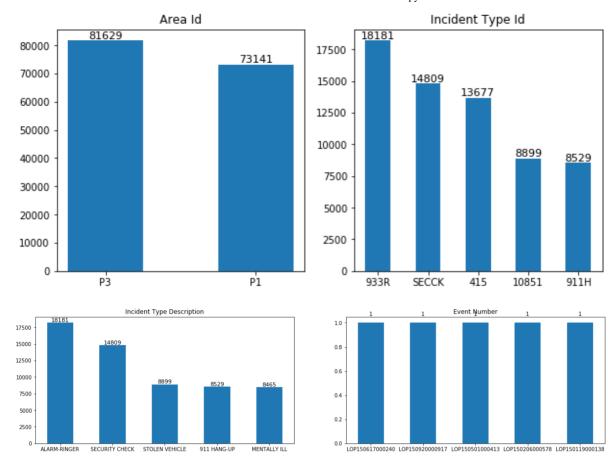
In [21]:

```
#2015年犯罪数据频数计算
year=2015
data1 number=data5
data1 number=data1 number.dropna(axis=0,how='all')
print("\nrecords-for-" + str(year)+".csv的频数聚合分析:")
data1 location g=[]
data1 location=data1 number["Location"].value counts(sort=True)
data1 location=data1 location.head(5)
data1 location name=data1 location.index.tolist()
data1 location num=data1 location.values
data1 area=data1 number["Area Id"].value counts(sort=True)
data1 area=data1 area.head(2)
data1 area name=data1 area.index.tolist()
data1 area num=data1 area.values
data1_id=data1_number["Incident Type Id"].value_counts(sort=True)
data1 id=data1 id.head(5)
data1 id name=data1 id.index.tolist()
data1 id num=data1 id.values
datal_Description=datal_number["Incident Type Description"].value_counts(sort=True)
data1 Description=data1 Description.head(5)
data1 Description name=data1 Description.index.tolist()
data1 Description num=data1 Description.values
data1 Event=data1 number["Event Number"].value counts(sort=True)
data1 Event=data1 Event.head(5)
data1 Event name=data1 Event.index.tolist()
data1 Event num=data1 Event.values
index=np.arange(5)
index_id=np.arange(2)
plt.figure(figsize=(10, 5))
plt.bar(index,data1 location num, 0.5, label="num")
plt.xticks(index,data1_location_name)
for a,b in zip(index,data1 location num):
    plt.text(a, b+0.05, '%.0f' % b, ha='center', va= 'bottom', fontsize=11)
plt.title("Location")
plt.figure(figsize=(10,10))
ax1 = plt.subplot(2,2,1)
ax2 = plt.subplot(2,2,2)
plt.sca(ax1)
plt.bar(index id,data1 area num, 0.5, label="num")
plt.xticks(index id,data1 area name)
for a,b in zip(index_id,data1_area_num):
    plt.text(a, b+0.05, '%.0f' % b, ha='center', va= 'bottom', fontsize=11)
plt.title("Area Id")
plt.sca(ax2)
plt.bar(index,data1_id_num, 0.5, label="num")
plt.xticks(index,data1 id name)
for a,b in zip(index,data1_id_num):
    plt.text(a, b+0.05, '%.0f' % b, ha='center', va= 'bottom', fontsize=11)
plt.title("Incident Type Id")
```

```
plt.figure(figsize=(20,10))
ax3 = plt.subplot(2,2,1)
ax4 = plt.subplot(2,2,2)
plt.sca(ax3)
plt.bar(index,data1 Description num, 0.5, label="num")
plt.xticks(index,data1 Description name)
for a,b in zip(index,data1 Description num):
    plt.text(a, b+0.05, '%.0f' % b, ha='center', va= 'bottom', fontsize=11)
plt.title("Incident Type Description")
plt.sca(ax4)
plt.bar(index,data1 Event num, 0.5, label="num")
plt.xticks(index,data1 Event name)
for a,b in zip(index,data1 Event num):
    plt.text(a, b+0.05, '%.0f' % b, ha='center', va= 'bottom', fontsize=11)
plt.title("Event Number")
plt.show()
```

records-for-2015.csv的频数聚合分析:



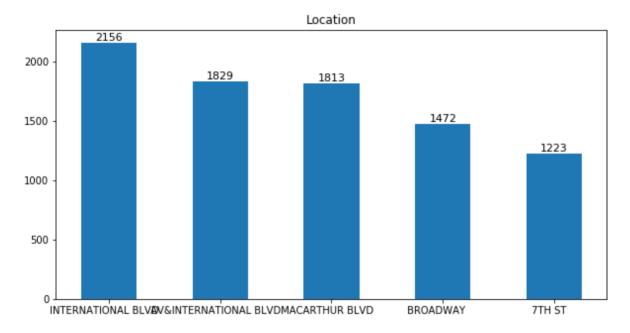


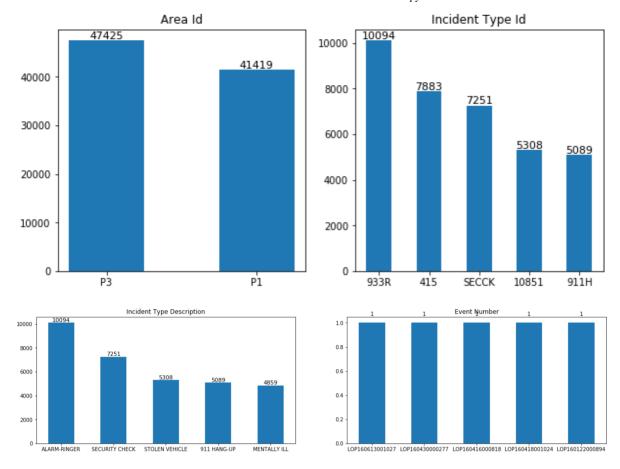
In [22]:

```
#2016年犯罪数据频数计算
year=2016
data1 number=data6
data1 number=data1 number.dropna(axis=0,how='all')
print("\nrecords-for-" + str(year)+".csv的频数聚合分析:")
data1 location g=[]
data1 location=data1 number["Location"].value counts(sort=True)
data1 location=data1 location.head(5)
data1 location name=data1 location.index.tolist()
data1 location num=data1 location.values
data1 area=data1 number["Area Id"].value counts(sort=True)
data1 area=data1 area.head(2)
data1 area name=data1 area.index.tolist()
data1 area num=data1 area.values
data1_id=data1_number["Incident Type Id"].value_counts(sort=True)
data1 id=data1 id.head(5)
data1 id name=data1 id.index.tolist()
data1 id num=data1 id.values
datal_Description=datal_number["Incident Type Description"].value_counts(sort=True)
data1 Description=data1 Description.head(5)
data1 Description name=data1 Description.index.tolist()
data1 Description num=data1 Description.values
data1 Event=data1 number["Event Number"].value counts(sort=True)
data1 Event=data1 Event.head(5)
data1 Event name=data1 Event.index.tolist()
data1 Event num=data1 Event.values
index=np.arange(5)
index_id=np.arange(2)
plt.figure(figsize=(10, 5))
plt.bar(index,data1 location num, 0.5, label="num")
plt.xticks(index,data1_location_name)
for a,b in zip(index,data1 location num):
    plt.text(a, b+0.05, '%.0f' % b, ha='center', va= 'bottom', fontsize=11)
plt.title("Location")
plt.figure(figsize=(10,10))
ax1 = plt.subplot(2,2,1)
ax2 = plt.subplot(2,2,2)
plt.sca(ax1)
plt.bar(index id,data1 area num, 0.5, label="num")
plt.xticks(index id,data1 area name)
for a,b in zip(index_id,data1_area_num):
    plt.text(a, b+0.05, '%.0f' % b, ha='center', va= 'bottom', fontsize=11)
plt.title("Area Id")
plt.sca(ax2)
plt.bar(index,data1_id_num, 0.5, label="num")
plt.xticks(index,data1 id name)
for a,b in zip(index,data1_id_num):
    plt.text(a, b+0.05, '%.0f' % b, ha='center', va= 'bottom', fontsize=11)
plt.title("Incident Type Id")
```

```
plt.figure(figsize=(20,10))
ax3 = plt.subplot(2,2,1)
ax4 = plt.subplot(2,2,2)
plt.sca(ax3)
plt.bar(index,data1 Description num, 0.5, label="num")
plt.xticks(index,data1 Description name)
for a,b in zip(index,data1 Description num):
    plt.text(a, b+0.05, '%.0f' % b, ha='center', va= 'bottom', fontsize=11)
plt.title("Incident Type Description")
plt.sca(ax4)
plt.bar(index,data1 Event num, 0.5, label="num")
plt.xticks(index,data1 Event name)
for a,b in zip(index,data1 Event num):
    plt.text(a, b+0.05, '%.0f' % b, ha='center', va= 'bottom', fontsize=11)
plt.title("Event Number")
plt.show()
```

records-for-2016.csv的频数聚合分析:





数据缺失处理

In [23]:

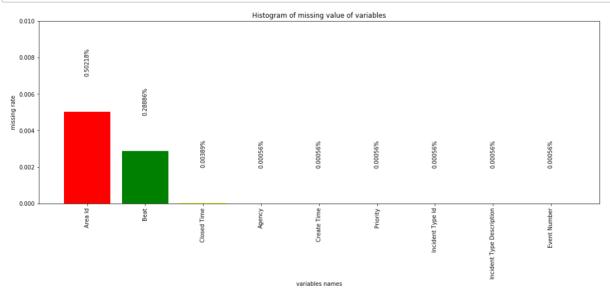
```
#以2011年数据为例
# 判断各变量中是否存在缺失值
data1.isnull().any(axis = 0)
# 各变量中缺失值的数量
data1.isnull().sum(axis = 0)
# 各变量中缺失值的比例
data1.isnull().sum(axis = 0)/data1.shape[0]
```

Out[23]:

Agency	0.000006
Create Time	0.000006
Location	0.000000
Area Id	0.005022
Beat	0.002889
Priority	0.000006
Incident Type Id	0.000006
Incident Type Description	0.000006
Event Number	0.000006
Closed Time	0.000039
dtype: float64	

In [31]:

```
# 统计缺失值数量
missing=data1.isnull().sum().reset index().rename(columns={0:'missNum'})
# 计算缺失比例
missing['missRate']=missing['missNum']/data1.shape[0]
# 按照缺失率排序显示
miss analy=missing[missing.missRate>0].sort values(by='missRate',ascending=False)
# miss analy 存储的是每个变量缺失情况的数据框
import matplotlib.pyplot as plt
import pylab as pl
fig = plt.figure(figsize=(18,6))
plt.bar(np.arange(miss_analy.shape[0]), list(miss_analy.missRate.values), align = 'c
    ,color=['red','green','yellow','steelblue'])
plt.title('Histogram of missing value of variables')
plt.xlabel('variables names')
plt.ylabel('missing rate')
#添加x轴标签,并旋转90度
plt.xticks(np.arange(miss analy.shape[0]),list(miss analy['index']))
pl.xticks(rotation=90)
# 添加数值显示
for x,y in enumerate(list(miss analy.missRate.values)):
   plt.text(x,y+0.002,'\{:.05\%\}'.format(y), ha='center', rotation=90)
plt.ylim([0,0.01])
plt.show()
```



In [32]:

```
#剔除空属性值
print("\n剔除空属性值: ")
year=2011
for data in data all crime:
    print(str(year)+":的犯罪记录情况如下")
    data_id=data[["Incident Type Id", "Priority", "Area Id", "Beat", "Incident Type Desc
    data id=data id.dropna(axis=0,how='any')
                                                 #剔除空属性值
    data id=data id[["Incident Type Id", "Priority"]]
    data_pl=data_id[data_id["Priority"].isin([1])]
    data p1=data p1["Incident Type Id"].value counts(sort=True)
    data_id2=data[["Incident Type Id", "Priority", "Area Id", "Beat", "Incident Type Des
    data id2=data id2.dropna(axis=0,how='all')
                                                   #剔除全空
    data id2=data id2[["Incident Type Id", "Priority"]]
    data p2=data id2[data id2["Priority"].isin([1])]
    data p2=data p2["Incident Type Id"].value counts(sort=True)
    data pl=data pl.head(10)
    crime type1=data p1.index.tolist()
    crime num1=data p1.values
    data p2=data p2.head(10)
    crime type2=data p2.index.tolist()
    crime num2=data p2.values
    plt.figure(figsize=(12,12))
    ax1 = plt.subplot(2,2,1)
    ax2 = plt.subplot(2,2,2)
    plt.sca(ax1)
    plt.pie(crime num2, labels=crime type2, autopct='%1.1f%%', shadow="true")#绘制饼图
    plt.title("Year"+str(year)+" Priority:1 Before delete NaN")
    plt.sca(ax2)
    plt.pie(crime num1, labels=crime type1, autopct='%1.1f%%', shadow="true")#绘制饼图
    plt.title("Year"+str(year)+" Priority:1 After delete NaN")
    plt.show()
    year+=1
    211
                                            211
               16.0%
                                                        16.1%
                             242
                                                                     242
                      16.9%
                                                              16.9%
 245
                                         245
                       4.0%
                                                                4.0%
                               601R
                                                                       601R
                       5.5%
                                                               5.5%
                                                  9.7%
         9.8%
                     7.0%
                                                             71%
                              929
                                                                      929
                  8.6%
                                                          8.6%
                                           901A
   901A
                           459
                                                                   459
           943
                                                   943
                     CODE7
                                                             CODE7
```

2012:的犯罪记录情况如下

Year2012 Priority:1 Before delete NaN

Year2012 Priority:1 After delete NaN

243E

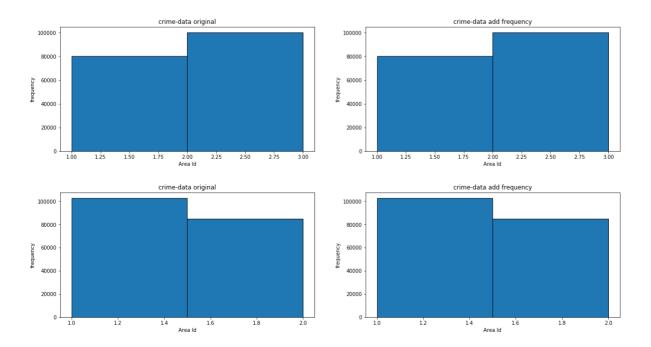
In [36]:

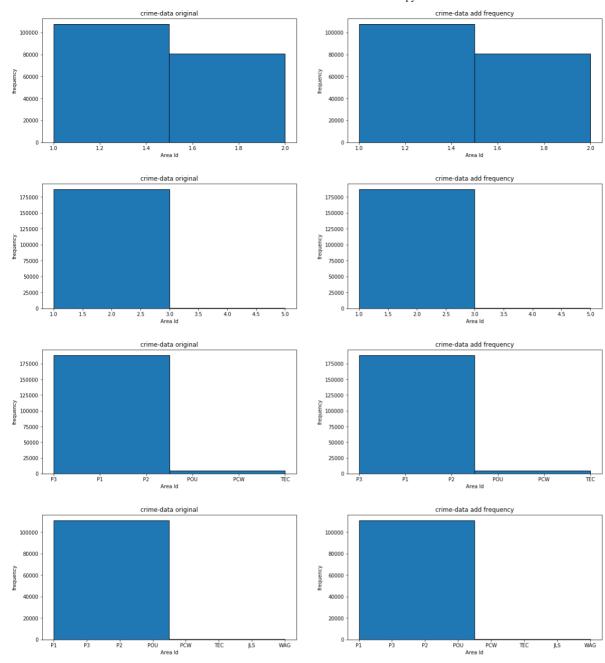
```
#用最高频率值填补缺失值
print("\n用最高频率值填补缺失值:")
year=2011
for data in data all crime:
    print(str(year)+":的犯罪片区情况如下")
    #用最高频率值来填补缺失值
   df=data
   areal=df['Area Id'].dropna()
   df.fillna(value = {'Area Id': df['Area Id'].mode()[0], # 使用区域的众数替换缺失区域
    }, inplace = True )
   area2=df['Area Id']
   plt.figure(figsize=(20,10))
   ax1=plt.subplot(2,2,1)
   ax2=plt.subplot(2,2,2)
   plt.sca(ax1)
                            edgecolor = 'black', histtype='bar', align='mid', orier
   plt.hist(area1, bins=2,
   plt.xlabel("Area Id")
   plt.ylabel("frequency")
   plt.title("crime-data original")
   plt.sca(ax2)
                            edgecolor = 'black', histtype='bar', align='mid', orier
   plt.hist(area2, bins=2,
   plt.xlabel("Area Id")
   plt.ylabel("frequency")
   plt.title("crime-data add frequency")
   year+=1
```

用最高频率值填补缺失值:

2011:的犯罪片区情况如下 2012:的犯罪片区情况如下 2013:的犯罪片区情况如下 2014:的犯罪片区情况如下 2015:的犯罪片区情况如下

2016:的犯罪片区情况如下





由于无其他标准意义上的数值属性,因此不讨论属性相关性以及对象相似性填充填充