Notebook

May 4, 2019

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1 Safe eating in San Francisco

This notebook is intended to help decide where to have dinner in San Francisco, safely. The data used for this are: 1. Foursquare API 2. SF Police Department Incident Reports: 2018 to Present

The final product of the notebook is an interactive map of SF, with districts colored by crime rate and markers showing restaurants, as well as sample crimes in the vicinity.

1.1 Crime dataset exploration

The dataset published by the SFPD includes important information regarding the incident (e.g. category) as well as its location. Most of the data in the 34 columns of this dataset (shown in table 1.1) will be useless for the purpose of this notebook, so only Police District, Latitude, Longitude and Incident Category will be retained, as illustrated in table 1.2.

Table 1.1: Top 5 rows of the original SFPD crimes dataset

Table 1.2: Top 5 rows, only relevant columns

	Police District	Latitude	Longitude	Incident Category
0	Southern	37.784908	-122.404795	Other Miscellaneous
1	Central	37.786410	-122.408036	Lost Property
2	Mission	37.756834	-122.406699	Assault
3	Southern	37.784007	-122.404865	Larceny Theft
4	Central	NaN	NaN	Larceny Theft

Some of the incidents reported are not relevant or to vague to include in the analysis, so they will be dropped. Incidents from categories Gambling, Liquor Laws, Vehicle Impounded, Vehicle Misplaced, Case Closure, Other, Miscellaneous Investigation, Recovered Vehicle, Non-Criminal, Other Miscellaneous amount to 36124 and after filtering the dataset is left with 158729 incidents. Table ?? shows number of incidents per category, also visualized in figure 1.2. Figure 1.1 shows the incident numbers per district and figure 1.3 as well as table ?? show that information combined.

	Incident Category	Count
0	<u> </u>	
0	Human Trafficking, Commercial Sex Acts	5
1	Weapons Offence	6
2	Homicide	30
3	Suspicious	32
4	Motor Vehicle Theft?	37
5	Rape	56
6	Drug Violation	61
7	Suicide	81
8	Human Trafficking (A), Commercial Sex Acts	85
9	Courtesy Report	131
10	Fire Report	189
11	Vandalism	235
12	Embezzlement	236
13	Family Offense	255
14	Juvenile Offenses	263
15	Traffic Collision	354
16	Sex Offense	402
17	Arson	453

18	Prostitution	569	
19	Civil Sidewalks	640	
20	Forgery And Counterfeiting	882	
21	Stolen Property	1037	
22	Weapons Offense	1047	
23	Weapons Carrying Etc	1082	
24	Other Offenses	1360	
25	Traffic Violation Arrest	2721	
26	Disorderly Conduct	3430	
27	Suspicious Occ	3578	
28	Offences Against The Family And Children	3886	
29	Missing Person	4648	
30	Robbery	4718	
31	Drug Offense	5361	
32	Fraud	5628	
33	Lost Property	6590	
34	Motor Vehicle Theft	6820	
35	Warrant	7423	
36	Burglary	9077	
37	Malicious Mischief	11589	
38	Assault	11813	
39	Larceny Theft	61902	

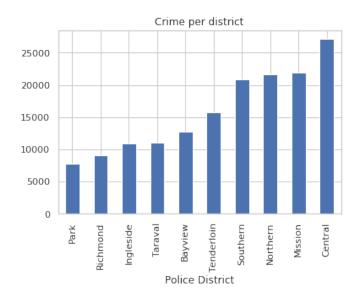


Figure 1.1: Number of crimes per district

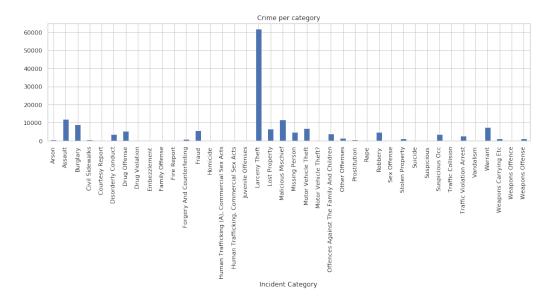


Figure 1.2: Crime per category

	Incident Category	Police District	count
C	Larceny Theft	Central	14091
1	Larceny Theft	Northern	11128
2	Larceny Theft	Southern	8234
3	Larceny Theft	Mission	7334
4	Larceny Theft	Richmond	4533
5	Larceny Theft	Taraval	3866
6	Larceny Theft	Tenderloin	3734
7	Larceny Theft	Bayview	3487
8	B Larceny Theft	Ingleside	2792
9	Larceny Theft	Park	2703

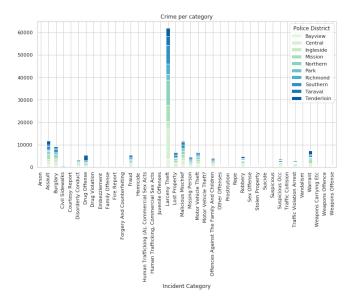
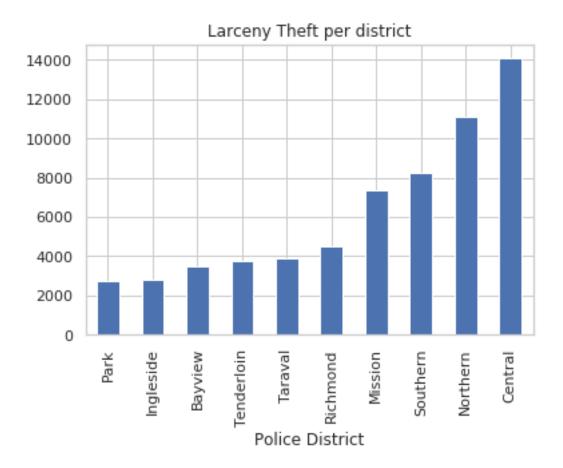


Figure 1.3: Number of crimes per category and district



1.2 Crime dataset summary

Most important information regarding crime rate per category and district is shown in table 1.3.

Table 1.3: Incident count grouped by category and district.

Police District Incident Category	Bayview	Central	Ingleside	Mission	Northern	Park	Richmond	Southern	Taraval	Tenderloin
Arson	73.0	65.0	44.0	60.0	37.0	12.0	24.0	60.0	22.0	56.0
Assault	1311.0	1363.0	944.0	2054.0	1253.0	430.0	363.0	1586.0	694.0	1815.0
Burglary	833.0	1590.0	857.0	910.0	1358.0	491.0	449.0	1407.0	753.0	429.0
Civil Sidewalks	NaN	15.0	NaN	168.0	3.0	437.0	8.0	6.0	NaN	3.0
Courtesy Report	17.0	20.0	11.0	16.0	9.0	6.0	12.0	15.0	12.0	13.0
Disorderly Conduct	375.0	420.0	337.0	608.0	378.0	115.0	161.0	422.0	291.0	323.0
Drug Offense	188.0	375.0	216.0	791.0	347.0	181.0	85.0	664.0	112.0	2402.0
Drug Violation	8.0	3.0	9.0	8.0	2.0	1.0	NaN	8.0	NaN	22.0
Embezzlement	28.0	37.0	10.0	28.0	19.0	7.0	15.0	41.0	16.0	35.0
Family Offense	67.0	13.0	27.0	40.0	19.0	6.0	20.0	18.0	29.0	16.0
Fire Report	38.0	19.0	26.0	27.0	11.0	8.0	9.0	24.0	16.0	11.0
Forgery And Counterfeiting	57.0	156.0	69.0	143.0	113.0	34.0	49.0	136.0	58.0	67.0
Fraud	360.0	973.0	464.0	601.0	760.0	262.0	396.0	693.0	750.0	369.0
Homicide	6.0	3.0	1.0	6.0	2.0	NaN	1.0	3.0	4.0	4.0
Human Trafficking (A), Commercial Sex Acts	1.0	13.0	1.0	10.0	3.0	NaN	NaN	34.0	20.0	3.0
Human Trafficking, Commercial Sex Acts	NaN	NaN	1.0	1.0	NaN	NaN	NaN	3.0	NaN	NaN
Iuvenile Offenses	12.0	1.0	17.0	10.0	11.0	26.0	15.0	7.0	158.0	6.0
Larceny Theft	3487.0	14091.0	2792.0	7334.0	11128.0	2703.0	4533.0	8234.0	3866.0	3734.0
Lost Property	285.0	1461.0	314.0	939.0	793.0	235.0	373.0	1032.0	464.0	694.0
Malicious Mischief	1275.0	1915.0	983.0	1540.0	1512.0	565.0	682.0	1570.0	828.0	719.0
Missing Person	392.0	327.0	420.0	580.0	436.0	642.0	223.0	582.0	661.0	385.0
Motor Vehicle Theft	1118.0	658.0	833.0	956.0	741.0	388.0	403.0	828.0	632.0	263.0
Motor Vehicle Theft?	4.0	5.0	7.0	7.0	3.0	1.0	1.0	3.0	4.0	2.0
Offences Against The Family And Children	466.0	364.0	472.0	539.0	456.0	141.0	200.0	412.0	380.0	456.0
Other Offenses	97.0	140.0	100.0	201.0	104.0	154.0	76.0	178.0	65.0	245.0
Prostitution	NaN	117.0	2.0	284.0	8.0	NaN	NaN	65.0	46.0	47.0
Rape	4.0	2.0	3.0	12.0	6.0	2.0	2.0	16.0	3.0	6.0
Robbery	523.0	801.0	496.0	685.0	548.0	104.0	143.0	486.0	213.0	719.0
Sex Offense	25.0	38.0	29.0	64.0	55.0	17.0	9.0	91.0	28.0	46.0
Stolen Property	97.0	207.0	75.0	141.0	150.0	28.0	49.0	125.0	52.0	113.0
Suicide	5.0	9.0	7.0	8.0	13.0	4.0	10.0	12.0	8.0	5.0
Suspicious	1.0	4.0	NaN	1.0	1.0	1.0	5.0	18.0	1.0	NaN
Suspicious Occ	413.0	501.0	315.0	450.0	275.0	146.0	292.0	529.0	249.0	408.0
Traffic Collision	55.0	39.0	46.0	53.0	41.0	16.0	29.0	31.0	26.0	18.0
Traffic Violation Arrest	160.0	258.0	342.0	693.0	186.0	115.0	162.0	317.0	181.0	307.0
Vandalism	19.0	27.0	17.0	42.0	36.0	17.0	14.0	29.0	23.0	11.0
Warrant	553.0	890.0	411.0	1462.0	651.0	349.0	184.0	943.0	251.0	1729.0
Weapons Carrying Etc	178.0	113.0	139.0	199.0	83.0	12.0	26.0	93.0	58.0	181.0
Weapons Offence	NaN	2.0	NaN	2.0	NaN	NaN	NaN	NaN	1.0	1.0
Weapons Offense	172.0	96.0	119.0	203.0	80.0	35.0	41.0	134.0	54.0	113.0

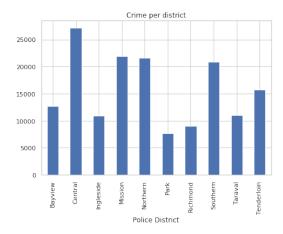
2 Venues dataset exploration

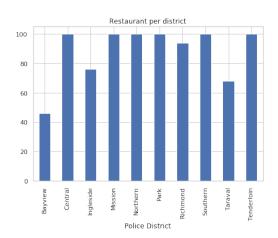
For each of the districts in the SFPD dataset a single incident was randomly selected in order to get its latitude and longitude, which the serve to query the Foursquare API. Again the full dataset consist 31 columns, of which only several (['venue.location.lat','venue.location.lng','venue.name']) will be useful for the purpose of this analysis, other columns will be dropped, as well as locations with NaN coordinates. At the time of writing of this report - the venue dataset consisted of 884 restaurants.

	Police District	venue.location.lat	venue.location.lng	venue.name
0	Bayview	37.730525	-122.372998	Archimedes Banya
1	Bayview	37.726812	-122.382880	The San Francisco Mead Company
2	Bayview	37.738468	-122.380874	Speakeasy Ales & Lagers
3	Bayview	37.734826	-122.390764	Radio Africa & Kitchen
4	Bayview	37.736240	-122.390361	TATO

	Police District	venue.location.lat	venue.location.lng	venue.name
95	Tenderloin	37.782672	-122.410272	Brannan Food Trucks
96	Tenderloin	37.782005	-122.404512	InterContinental San Francisco
97	Tenderloin	37.787279	-122.400036	The Bird
98	Tenderloin	37.783437	-122.400884	Yerba Buena Gardens Play Circle
99	Tenderloin	37.782651	-122.410302	The Warfield Theatre

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GeoJSON file downloaded!

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