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Global Pattern Analysis of Crime Data in Seattle in 2010

The distribution of crime incidence across Seattle for graffiti, assault and credit card fraud all seems to be clustered, particularly around downtown (*maps 1,2,3*). The following inferential statistics suggest that rather than being random, these patterns are a product of spatial processes. They focus on the presence or absence of each of these types of crimes, rather than attributes; this analyses looks at the *count* of each type of crime across the city.

Moran's I

This tools analysis patterns at a global scale, assessing the correlation among nearby locations. In this case, the Moran's I tool returns very high positive z-scores (some as high as +10) and very low p-values (the majority expressing 99% confidence) when analyzing the distribution of all three types of crime (tables 1,3,5).

This confirms that there is clustering and that this clustering is not the result of chance, consequently rejecting the null hypothesis of complete spatial randomness. These results encourage the investigation of the spatial processes driving these clusterings.

Getis-Ord General G

This tool measures the degrees of clustering for high or low values, which in this case, is comparing high/low counts of crime incidence in the given neighborhoods.

Like the previous tool, it returns high positive z-scores and low p-values, in this case indicating that the distribution of high values is more clustered than it would be expected – in other words, some areas have more incidence of crimes than it would be expected if this patterns were random -, and that the level of confidence that these patterns are not random is high, respectively.

Incremental Spatial Auto Correlation

This tool assessed how clustering patterns are distributed based on distance. The distance band used for the analysis here was one mile, with increments of one mile (incremental analysis 1,2,3).

Credit card fraud is the outlier here, as both assault and graffiti incidents are more continuous, and tapper off gradually as one moves away from the city core. Credit card fraud on the other hand, drops sharply on the first mile, and then almost completely rebounds on the second. This reveals that at two miles, the spatial processes operating these clusters are more intense. This is somewhat expected when looking at the data points distribution before the analysis, as they seem to be more evenly distributed, and some intense cluster appear in north Seattle.

Conclusions

All crimes happen more often around the city core, with assault being overwhelmingly more prevalent in Downtown, Belltown and Capitol Hill – although high incidences are seem south of the city core as well.

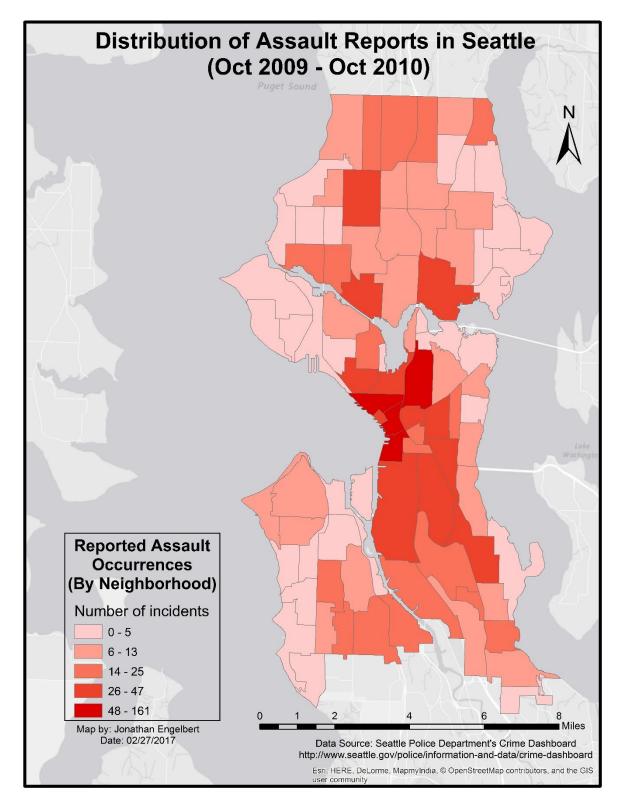
Most reported graffiti offenses occurred in the Capitol Hill area, but the overall pattern of clustering around it is very similar. Credit Card Fraud seems to be a bit more evenly distributed across the same areas as other crimes, with a few clusters occurring away from each other, around the city core, and in north Seattle.

Notes on standardization and validity of results

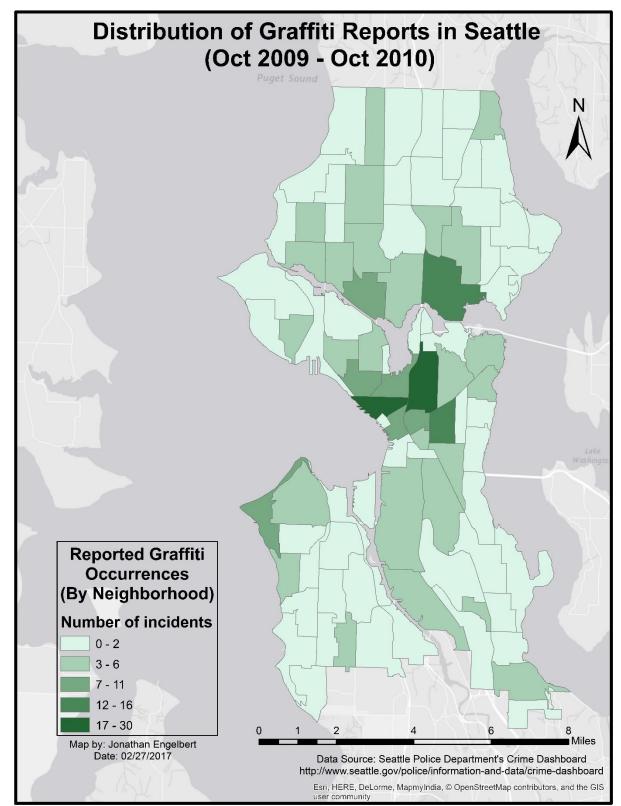
Because we are assuming we have a complete set of all reported crime incidents, we may also confidently draw assumptions regarding clustering; the maps show that there is a clustering of crime incidence for all three types in the city core. Also, because the data is assumed to be complete, we do not need to standardize by rows for example; we are confident that the data collected is complete and not the result of a bias data collection.

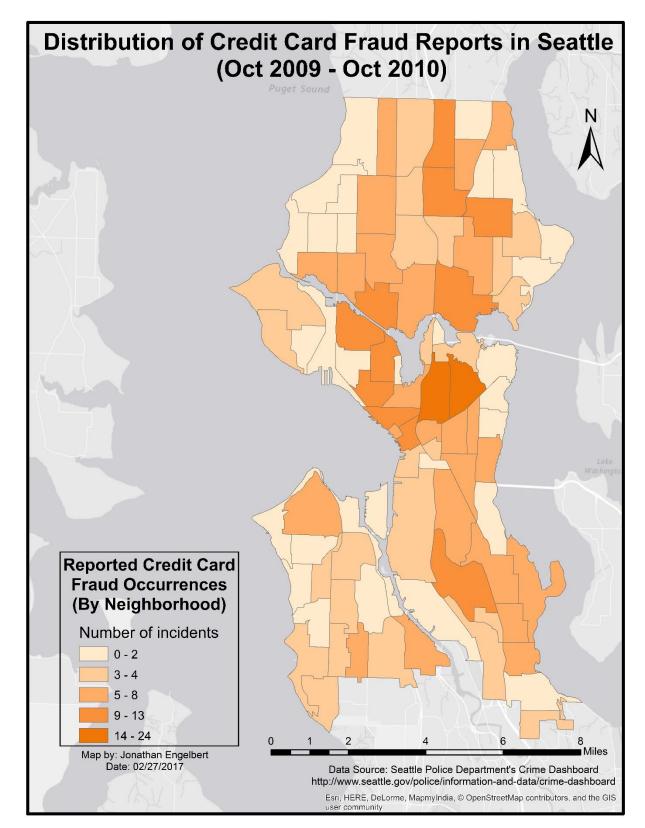
Finally, the distance band used for the analysis – that of one mile - resulted in some features having no neighbors, which could potentially invalidate the analysis.

Map #1



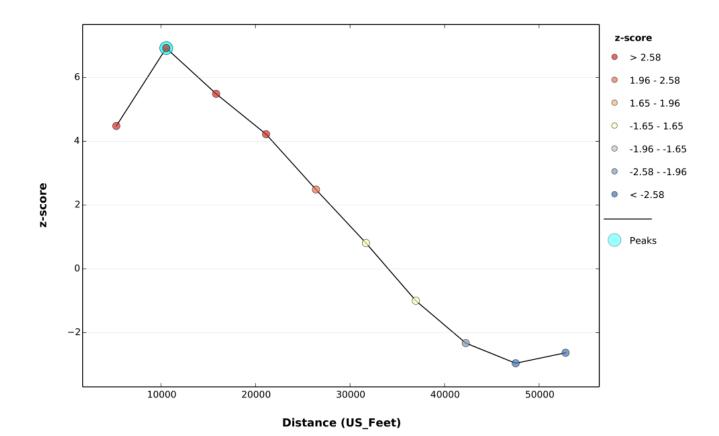
Map #2





Incremental Analysis

Incremental Analysis #1: Assault



Spatial Autocorrelation by Distance

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Distance	Moran's Index	Expected Index	Variance	z-score	p-value	
5280.00*	0.409689	-0.011905	0.008861	4.478795	0.00008	
10560.00	0.294141	-0.011236	0.001948	6.919105	0.000000	
15840.00	0.149843	-0.011236	0.000862	5.485184	0.000000	
21120.00	0.080104	-0.011236	0.000469	4.219857	0.000024	
26400.00	0.029723	-0.011236	0.000272	2.485599	0.012933	
31680.00	-0.000864	-0.011236	0.000163	0.811195	0.417254	
36960.00	-0.021437	-0.011236	0.000104	-0.998741	0.317920	
42240.00	-0.030849	-0.011236	0.000071	-2.325928	0.020022	
47520.00	-0.031725	-0.011236	0.000048	-2.957839	0.003098	
52800.00	-0.026346	-0.011236	0.000033	-2.628692	0.008571	

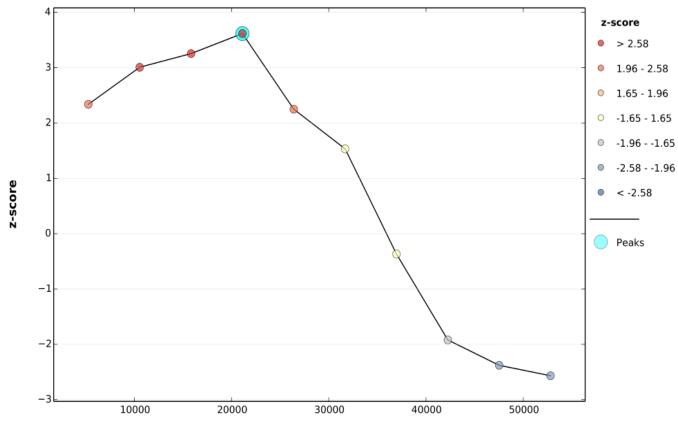
Global Moran's I Summary by Distance

First Peak (Distance, Value): 10560.00, 6.919105

Max Peak (Distance, Value): 10560.00, 6.919105

Distance measured in US_Feet

* At least one distance increment resulted in features with no neighbors which may invalidate the significance of the corresponding results.



Spatial Autocorrelation by Distance

Distance (US_Feet)

Distance	Moran's Index	Expected Index	Variance	z-score	p-value	
5280.00*	0.209850	-0.011905	0.008990	2.338859	0.019343	
10560.00	0.123250	-0.011236	0.001999	3.008102	0.002629	
15840.00	0.085603	-0.011236	0.000885	3.255479	0.001132	
21120.00	0.068066	-0.011236	0.000481	3.617276	0.000298	
26400.00	0.026316	-0.011236	0.000279	2.250110	0.024442	
31680.00	0.008620	-0.011236	0.000168	1.533557	0.125139	
36960.00	-0.015043	-0.011236	0.000107	-0.368125	0.712780	
42240.00	-0.027626	-0.011236	0.000073	-1.920599	0.054782	
47520.00	-0.027912	-0.011236	0.000049	-2.379364	0.017343	
52800.00	-0.026171	-0.011236	0.000034	-2.568036	0.010228	

Global Moran's I Summary by Distance

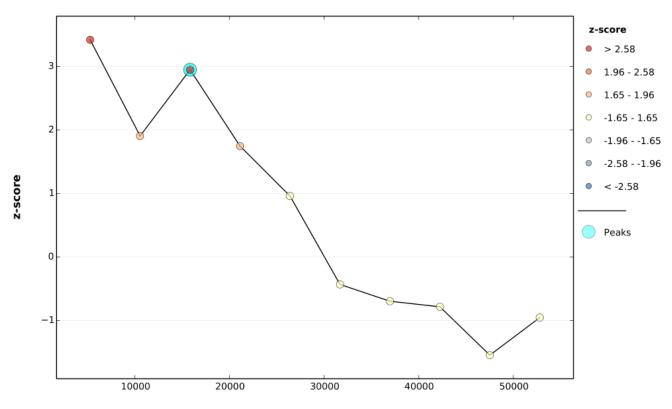
First Peak (Distance, Value): 21120.00, 3.617276

Max Peak (Distance, Value): 21120.00, 3.617276

Distance measured in US_Feet

* At least one distance increment resulted in features with no neighbors which may invalidate the significance of the corresponding results.

Spatial Autocorrelation by Distance



Distance (US_Feet)

Distance	Moran's Index	Expected Index	Variance	z-score	p-value	
5280.00*	0.329774	-0.011905	0.009982	3.419816	0.000627	
10560.00	0.078021	-0.011236	0.002193	1.906187	0.056626	
15840.00	0.080598	-0.011236	0.000970	2.947981	0.003199	
21120.00	0.028845	-0.011236	0.000527	1.746370	0.080747	
26400.00	0.005536	-0.011236	0.000305	0.960215	0.336947	
31680.00	-0.017080	-0.011236	0.000184	-0.431349	0.666215	
36960.00	-0.018763	-0.011236	0.000117	-0.696241	0.486278	
42240.00	-0.018223	-0.011236	0.000079	-0.784172	0.432939	
47520.00	-0.022531	-0.011236	0.000053	-1.544892	0.122372	
52800.00	-0.017021	-0.011236	0.000037	-0.953719	0.340226	
26400.00 31680.00 36960.00 42240.00 47520.00	0.005536 -0.017080 -0.018763 -0.018223 -0.022531	-0.011236 -0.011236 -0.011236 -0.011236 -0.011236	0.000305 0.000184 0.000117 0.000079 0.000053	0.960215 -0.431349 -0.696241 -0.784172 -1.544892	0.336947 0.666215 0.486278 0.432939 0.122372	

Global Moran's I Summary by Distance

First Peak (Distance, Value): 15840.00, 2.947981

Max Peak (Distance, Value): 15840.00, 2.947981

Distance measured in US_Feet

* At least one distance increment resulted in features with no neighbors which may invalidate the significance of the corresponding results.

Moran's And Getis-Ord Results

Table 1

Assault	Moran's I	Z score	P-value	Dispersed, Random
				or Clustered
contiguity edges only	0.5134	8.4489	0.0001	Clustered
contiguity edges and corners	0.4874	8.2858	0.0001	Clustered
Inverse distance	0.1235	10.4030	0.0001	Clustered
Inverse distance squared	0.4185	10.4914	0.0001	Clustered

Table 2

General G	Z score	P-value	Clustering of
			High or Low
0.1162	8.6383	0.0001	High clustering
0.1189	8.2199	0.0001	High clustering
0.0000	9.1724	0.0001	High clustering
0.0000	8.8959	0.0001	High clustering
	0.1162 0.1189 0.0000	0.1162 8.6383 0.1189 8.2199 0.0000 9.1724	0.1162 8.6383 0.0001 0.1189 8.2199 0.0001 0.0000 9.1724 0.0001

Table3

Graffiti	Moran's I	Z score	P-value	Dispersed, Random
				or Clustered
contiguity edges only	0.4282	6.9871	0.0001	Clustered
contiguity edges and corners	0.4053	6.8349	0.0001	Clustered
Inverse distance	0.2846	3.7409	0.0002	Clustered
Inverse distance squared	0.2708	3.0053	0.0026	Clustered

Table 4

Graffiti	General G	Z score	P-value	Clustering of		
				High or Low		
contiguity edges only	0.1167	7.6275	0.0001	High clustering		
contiguity edges and						
corners	0.1177	7.0711	0.0001	High clustering		
Inverse distance	0.0000	4.2790	0.0001	High clustering		
Inverse distance squared	0.0000	3.5489	0.0001	High clustering		
able 5						

Dispersed, Random **Credit Card Fraud** Moran's I P-value Z score or Clustered Clustered contiguity edges only 0.2324 3.7000 0.0001 contiguity edges and corners 0.2149 3.5440 0.0003 Clustered Inverse distance 0.2694 0.0006 Clustered 3.3924 Inverse distance squared 0.3212 3.3860 0.0007 Clustered

Table 6

Credit Card Fraud	General G	Z score	P-value	Clustering of
				High or Low
contiguity edges only	0.0690	4.9877	0.0001	High clustering
contiguity edges and				
corners	0.0717	4.6370	0.0001	High clustering
Inverse distance	0.0000	3.0781	0.0020	High clustering
Inverse distance squared	0.0000	2.5757	7.0000	High clustering