

# Crime Hot-spots Forecasting

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# Overview

This is National Institute of Justice's (NIJ) Real-Time Crime Forecasting Challenge, which hopes to provide researchers and the federal government with a better understanding of the potential for crime forecasting in Portland, Oregon.

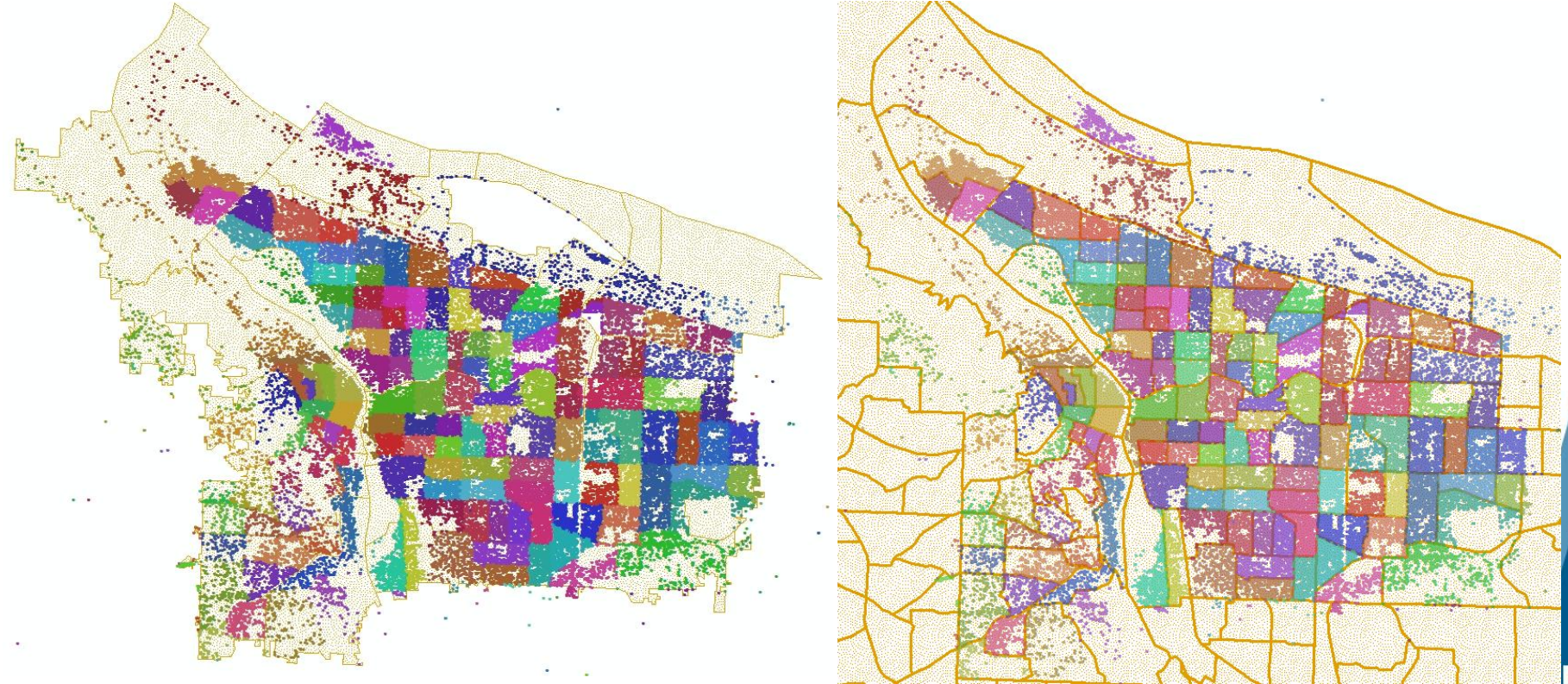
Website: <http://www.nij.gov/funding/Pages/fy16-crime-forecasting-challenge.aspx>



# Calls-for-service (CFS) records (2013)

CATEGORY	CALL GROUPS	final_case_type	CASE DESC	<del>occ_date</del>	<del>x_coordinate</del>	<del>y_coordinate</del>	<del>census_tract</del>
STREET CRIMES	DISORDER	DISTP	DISTURBANCE - PRIORITY	1/18/2013	7649793	662388	100
STREET CRIMES	DISORDER	DISTP	DISTURBANCE - PRIORITY	1/5/2013	7651202	661479	100
STREET CRIMES	DISORDER	DISTP	DISTURBANCE - PRIORITY	1/28/2013	7647818	663182	100
STREET CRIMES	DISORDER	DISTP	DISTURBANCE - PRIORITY	2/2/2013	7649298	661246	100
STREET CRIMES	DISORDER	DISTP	DISTURBANCE - PRIORITY	1/13/2013	7650935	661746	100
STREET CRIMES	DISORDER	DISTP	DISTURBANCE - PRIORITY	2/17/2013	7650248	660907	100
STREET CRIMES	DISORDER	DISTP	DISTURBANCE - PRIORITY	1/30/2013	7650289	662464	100
STREET CRIMES	DISORDER	DISTP	DISTURBANCE - PRIORITY	3/13/2013	7650182	664208	100
STREET CRIMES	DISORDER	DISTP	DISTURBANCE - PRIORITY	2/16/2013	7649859	665351	100
STREET CRIMES	DISORDER	DISTP	DISTURBANCE - PRIORITY	3/2/2013	7649894	664127	100
STREET CRIMES	DISORDER	DISTP	DISTURBANCE - PRIORITY	3/29/2013	7649298	661246	100
STREET CRIMES	DISORDER	DISTP	DISTURBANCE - PRIORITY	4/27/2013	7647366	665494	100
STREET CRIMES	DISORDER	DISTP	DISTURBANCE - PRIORITY	4/27/2013	7648668	662094	100
STREET CRIMES	DISORDER	DISTP	DISTURBANCE - PRIORITY	5/2/2013	7650785	661371	100
STREET CRIMES	DISORDER	DISTP	DISTURBANCE - PRIORITY	5/12/2013	7647366	665494	100
STREET CRIMES	DISORDER	DISTP	DISTURBANCE - PRIORITY	5/31/2013	7650022	663852	100
STREET CRIMES	DISORDER	DISTP	DISTURBANCE - PRIORITY	6/1/2013	7648386	663997	100
STREET CRIMES	DISORDER	DISTP	DISTURBANCE - PRIORITY	5/27/2013	7648851	662894	100

# Calls-for-service (CFS) records (2013)



2013 Data for the Month of Jan to Dec



# Submission of hot spot map

**Table 2: Requirements for Entries**

Requirement	Description of Requirement
Required files	.dbf .prj .shp .shx .sbx .sbn
Projection of files	NAD_1983_HARN_StatePlane_Oregon_North_FIPS_3601_Feet_Intl
Required variables	Unique ID for each cell A binary variable (1 – hot spot, 0 – not) Area for each cell measured in square feet to 4 decimal places
Cell shape	Any shape
Individual cell area*	62,500 ft <sup>2</sup> – 360,000 ft <sup>2</sup>
Total forecasted area	0.25 mi <sup>2</sup> – .75 mi <sup>2</sup>

\*Cells forming the outer boundary of the study area (Portland Police Districts, [see file in Section X.](#)) must be trimmed so that the total area of all cells equals 147.71 square miles (+/-0.02 square miles). The area of each interior cell must be equal to one another.

# Judging Criteria

## - Prediction Accuracy Index (PAI)

$$\frac{\left(\frac{n}{N}\right) * 100}{\left(\frac{a}{A}\right) * 100} = \frac{HitRate}{AreaPercentage} = \text{Prediction Accuracy Index} \quad (1)$$

where  $n$  is the number of crimes in areas where crimes are predicted to occur (e.g. hotspots),  $N$  the number of crimes in study area,  $a$  the area (e.g. km<sup>2</sup>) of areas where crimes are predicted to occur (e.g. area of hotspots), and  $A$  the area (e.g. km<sup>2</sup>) of the study area.

### Reference:

- Chainey, S., Thompson, L., & Uhlig, S. (2008). The Utility of Hotspot Mapping for Predicting Spatial Patterns of Crime. *Security*(21), 4-28.

# Judging Criteria

## - Predictive Efficiency Index\* (PEI\*)

- The  $PEI^*$  will measure the efficiency of the forecast with the following equation:

$$PEI^* = \frac{PAI}{PAI^*}$$

- Where  $PEI^*$  equals the maximum obtainable PAI value for the amount of area forecasted,  $a$ . As such:

$$PEI^* = \frac{n}{n^*}$$

- Where  $n^*$  equals the maximum obtainable  $n$  for the amount of area forecasted,  $a$ .

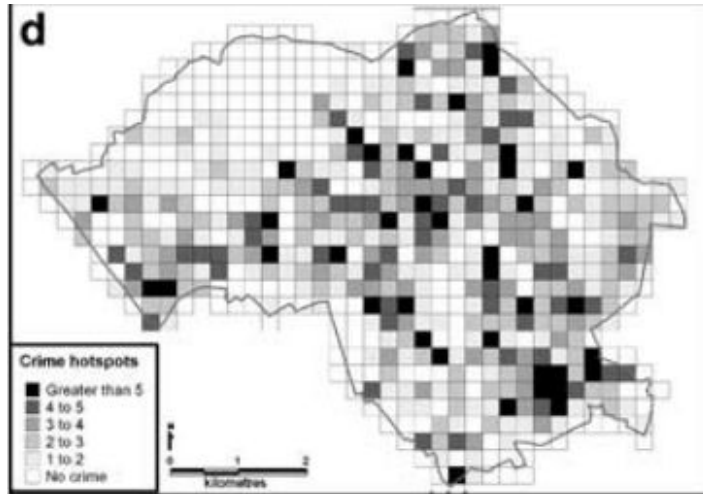
### Reference:

- Hunt, J. (2016). Do Crime Hot Spots Move? Exploring the Effects of the Modifiable Areal Unit Problem and Modifiable Temporal Unit Problem on Crime Hot Spot Stability. Archived with ProQuest Dissertations & Theses.

# Requirements for final submission

**We will have to submit one shape file, with required variables**

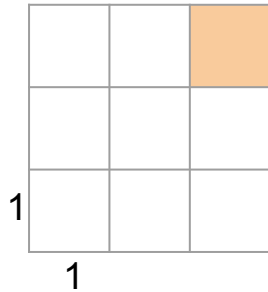
- **unique ID for each cell**
- **A binary variable( 1 - hot spot , 0 - not)**
- **Area for each cell measured in sq.ft**





# Evaluation (1 hot spot)

Hot spot map



1 week (3/1-3/7) evaluation

2	3	6
1	0	7
2	5	1

$$PAI = (6/27) / (1/9) = 2$$

$$PEI^* = 6 / 7$$

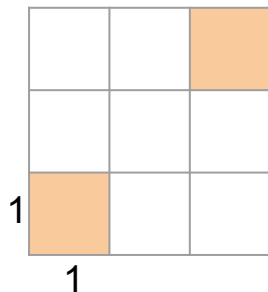
$$PAI = \frac{\left(\frac{n}{N}\right) * 100}{\left(\frac{a}{A}\right) * 100} = \frac{HitRate}{AreaPercentage} = \text{Prediction Accuracy Index}$$

$$PEI^* = \frac{n}{n^*}$$

- Where  $n^*$  equals the maximum obtainable  $n$  for the amount of area forecasted,  $a$ .

# Evaluation (2 hot spots)

Hot spot map



1 week (3/1-3/7) evaluation

2	3	6
1	0	7
2	5	1

$$PAI = (8/27) / (2/9) = 16/3$$

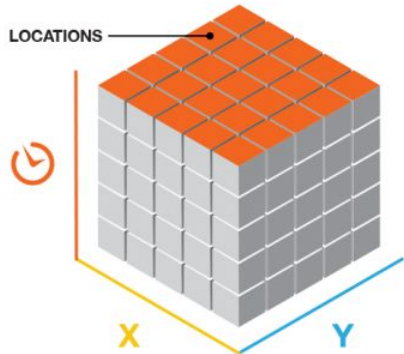
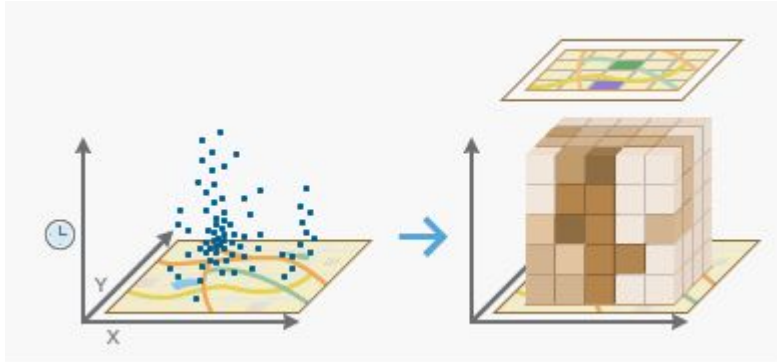
$$PEI^* = 8 / (6+7) = 8/13$$

$$PAI = \frac{\left(\frac{n}{N}\right) * 100}{\left(\frac{a}{A}\right) * 100} = \frac{HitRate}{AreaPercentage} = \text{Prediction Accuracy Index}$$

$$PEI^* = \frac{n}{n^*}$$

- Where  $n^*$  equals the maximum obtainable  $n$  for the amount of area forecasted,  $a$ .

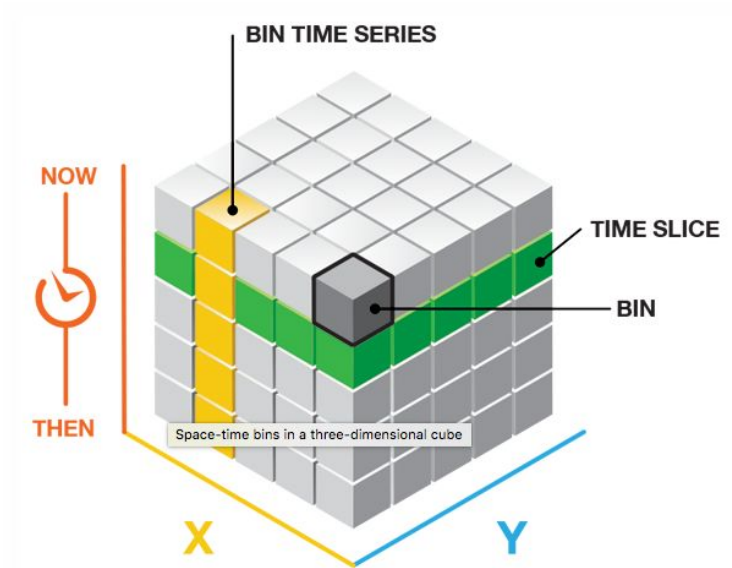
# Space time cube



A LOCATION  
OVER TIME

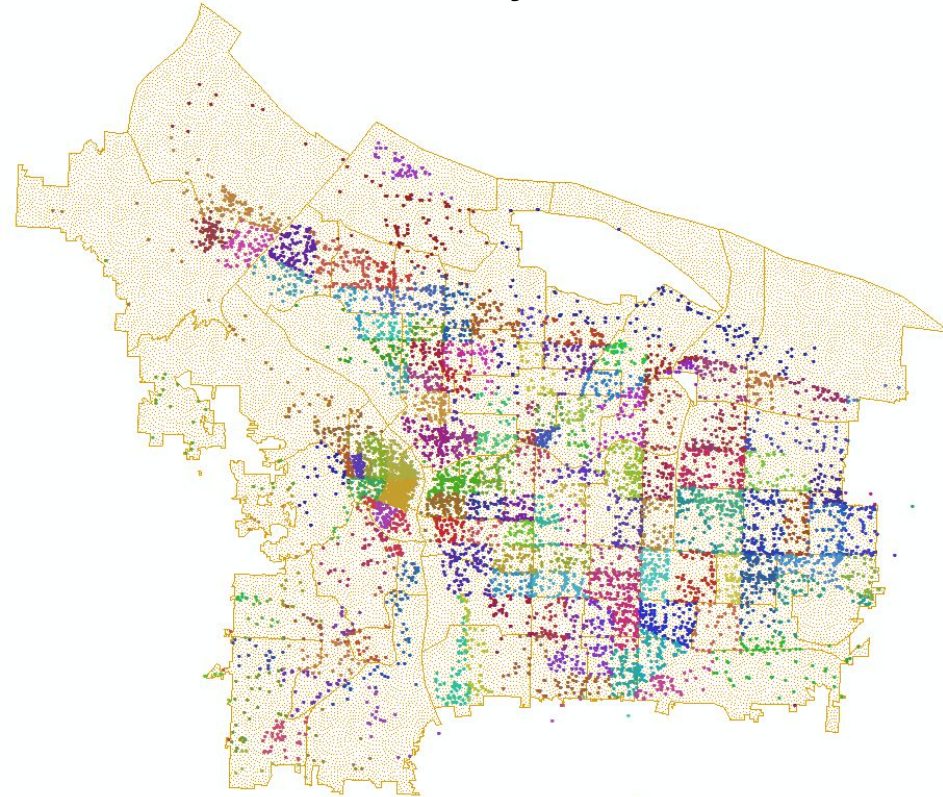


Each bin includes multiple features

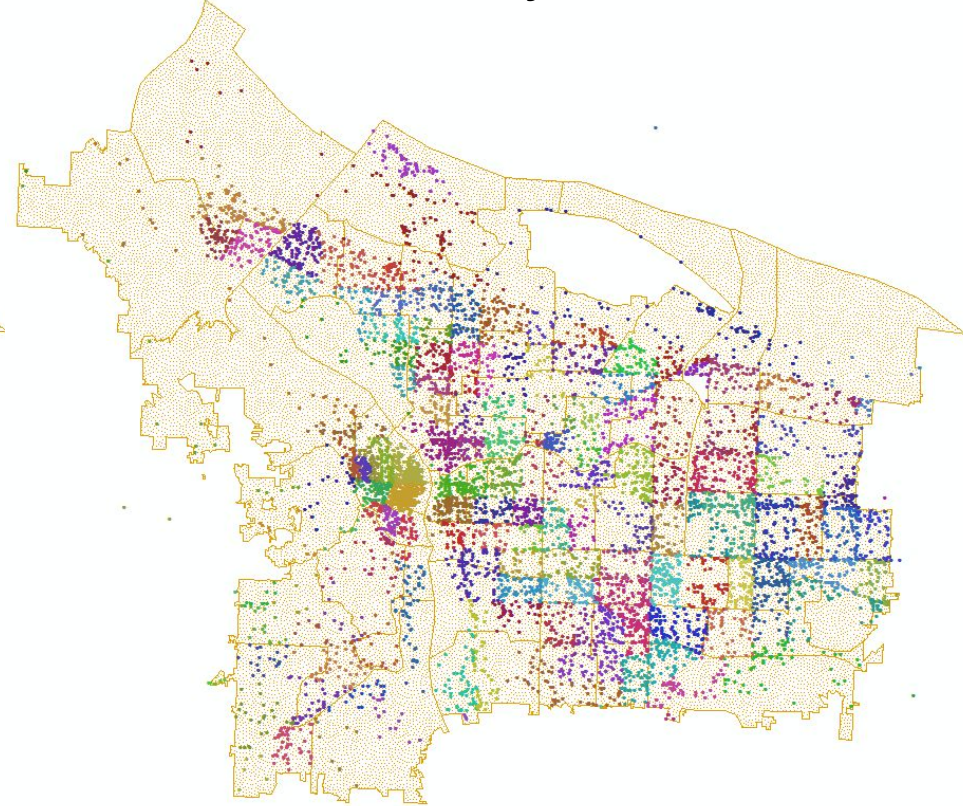


# Crimes In 2013

January



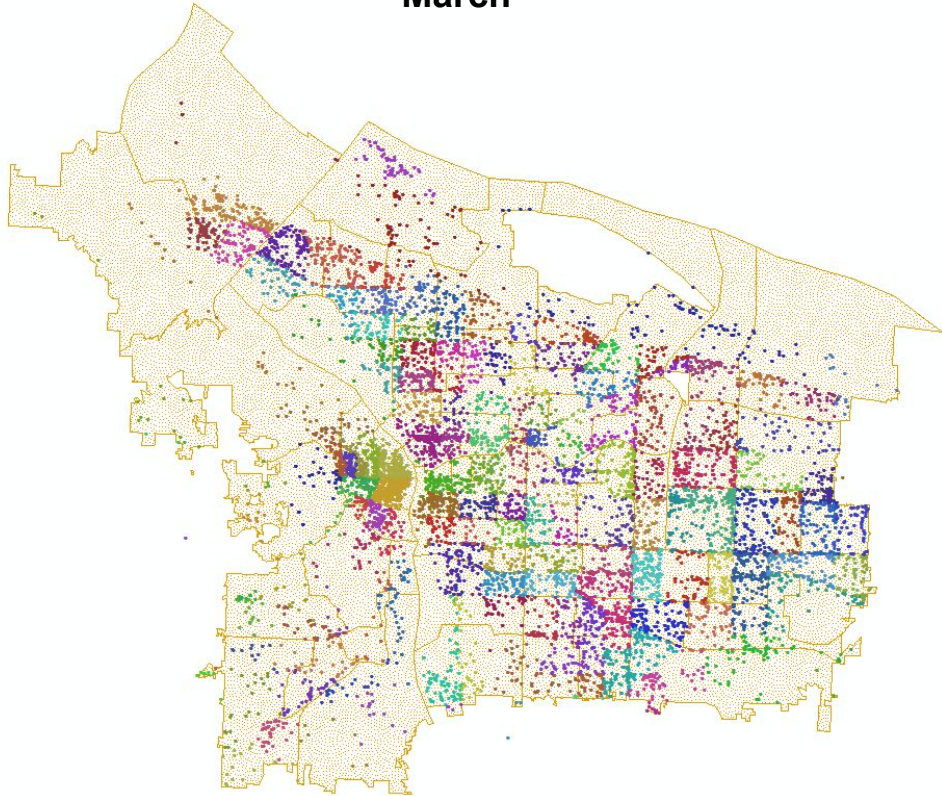
February



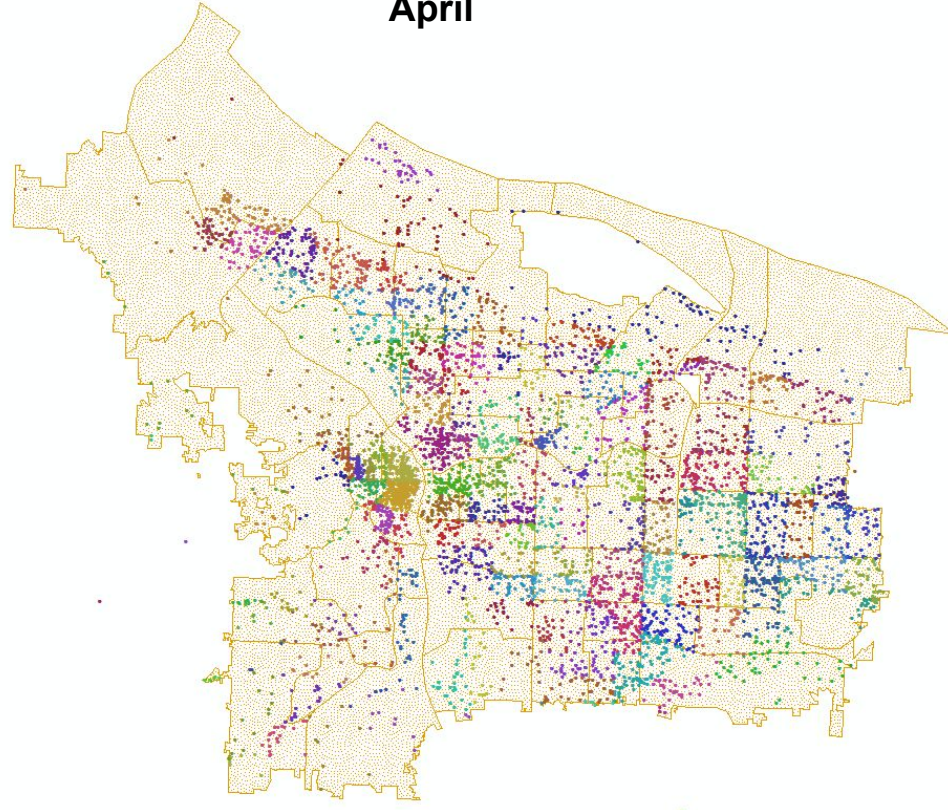


# Crimes In 2013

March



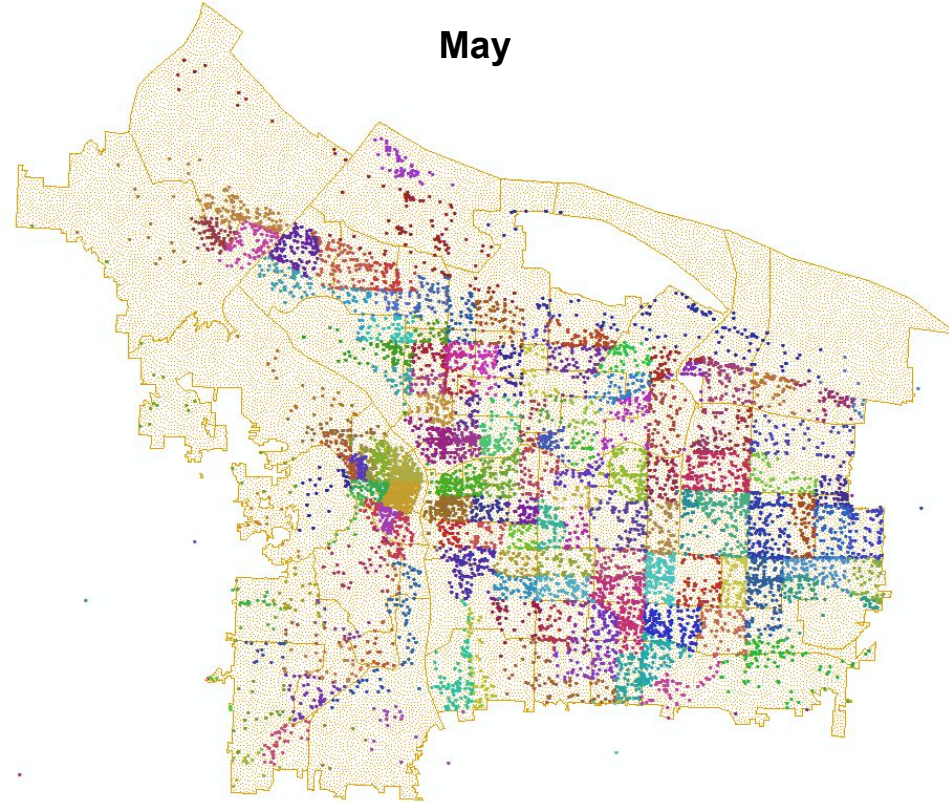
April



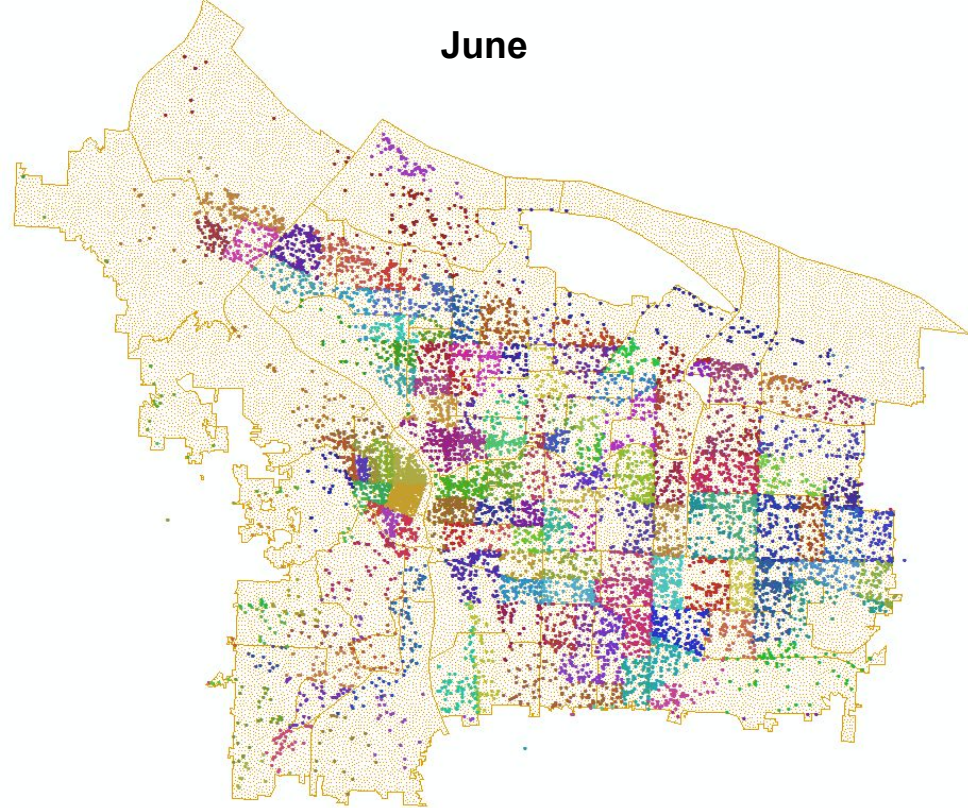


# Crimes In 2013

May



June



# Thank You!