



**Kelly Appleton** 

**Jake Lombardo** 

**Chris Pegoli** 



### Agenda

- Problem Description
  - Company and Client Information
  - Our Task
- Data Exploration
  - > Data Set
- Data Preprocessing
- Data Mining
  - Techniques / Algorithms / Models
- Algorithm / Model
  - > Performance & Results
- Conclusions
  - Lessons Learned





### **Problem Description**



**BREAKING NEWS TEAM COVERAGE** 

### TWO OFFICERS SHOT; ONE KILLED

ROCHESTER

BREAKING NEWS

MAN SERIOUSLY HURT IN SHOOTING

HUDSON AVE. ROCHESTER

MAN SHOT OUTSIDE DELI; NO SUSPECTS IN CUSTODY NORTH GOODMAN STREET & SHORT STREET, ROCHESTER

Intario

MANHUNT UNDERWAY AFTER SHOOTING AT A BACKYARD PARTY IN ROCHESTER, NY

NY GOV ANDREW CUOMO ANNOUNCES STATE WILL HONOR LIFE AND

MURDER ARREST

WABASH STREET, ROCHESTER - AUGUST 4, 2020 BREAKING OVERNIGHT

BREAKING NEWS

NEW AT 11

MASS SHOOTING LEAVES ONE DEAD, THREE INJURED

DSON AVE & RIDGE RD, ROCHESTER

**BREAKING NEWS** 

16-YEAR-OLD VICTIM OF 14TH HOMICIDE THIS YEAR CLIFFORD AVE AND ARBUTUS ST. ROCHESTER

CONTINUING COVERAGE

3 KILLED. 4 INJURED IN DRIVE-BY

BREAKING NEWS

MAN SHOT OVERNIGHT

JEFFERSON AVE, ROCHESTER

**BREAKING NEWS** 

RPD NAME VICTIMS IN DOUBLE HOMICIDE

DRIVING PARK AVENUE, ROCHESTER

BREAKING NEWS

MAN SHOT, TAKEN TO HOSPITAL

LYELL AVE AND WHITNEY ST, ROCHESTER

TRIPLE SHOOTING INVESTIGATION UNDERWAY

DEWEY AVE, ROCHESTER



### **Problem Description**

- About our company
- Our Client
  - Rochester Police Department (RPD)
  - > Scruff McGruff, police chief
- Rochester, NY is riddled with crime
  - Focus on shootings and homicides
- Our Task:
  - > Analyze data & find trends to help the RPD & McGruff reduce crime in Rochester
  - > Findings will be used for:
    - Decision-making on spending
    - Resource allocation
    - Management of personnel
    - Patrolling
    - And more!









### RPD Open Data Portal

Data	Start Here	Featured Maps	Explore and Download	Codebook
Crime  Violent and Property Crime	ılı	<ul><li>Public Crime Map</li><li>Neighborhood History Map</li></ul>	₹.	
Homicides  Murder and Non-Negligent Manslaughter	ılı	Incident Locations	Ŷ	
Shootings  • Fatal and Non-Fatal Shootings	ılı	<b>X</b> No Map	₹,	
Sex Offenders  1 Level 2 & 3 Offenders from NYS Registry	ılı	Sex Offenders by Location	₹.	
Boundaries Geographic Outlines of Police Boundaries	ılı	Sections and Patrol Beats	₹.	×
Personnel  Sworn and Civilian Roster	ılı	<b>X</b> No Map	₹.	



Statute Attempted

Larceny Type

Location Type

Geo Beat

Geo Section

Geo Section Num

Weapon Description

•	Cr	i	m	Δ

- 2011 Present
- 37 attributes

|--|

Address StreetFull

Address City

Address State

Patrol Beat

Patrol Section

Case Status

Statute Section

Statute Degree

Statute Category

Statute Description

Statute Text

Date or Time Statute Crime Category

Statute Subsection

Date or Time Statute Title

Date or Time Statute Class

Text

Number

Text

Text

Text

Number

Number

Number

Number

Number

Number

Text

Text

Text

Geocode Street

Occurred From Date Year

Occurred From Date Month

Occurred From Timestamp

Occurred Through Date Year

Occurred Through Time

Reported Date Year

Reported Date Month

Reported Timestamp

Reported Time

Occurred Through Date Month

Occurred Through Timestamp

Occurred From Time

Text

Text

Text

Text

Text

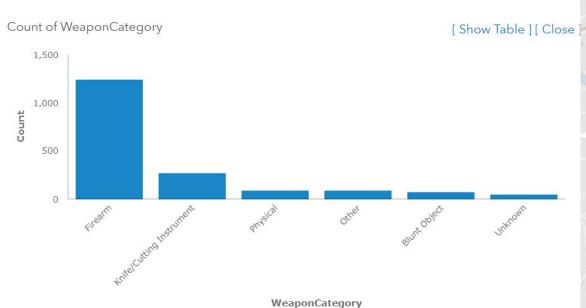
Text

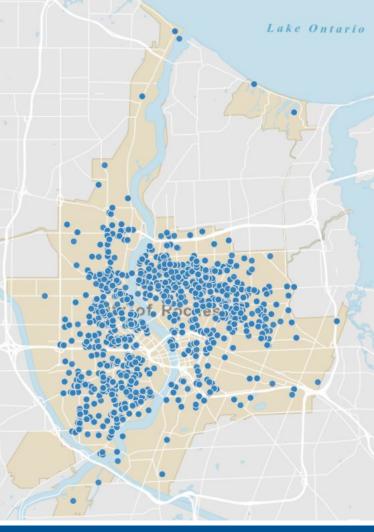
Number

Case Number



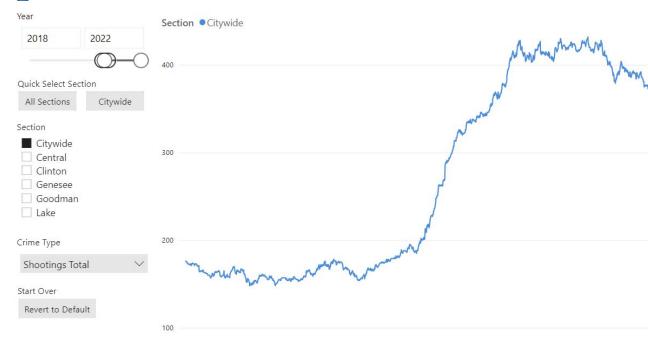
- Homicides
  - > 2000 Present
  - 29 attributes

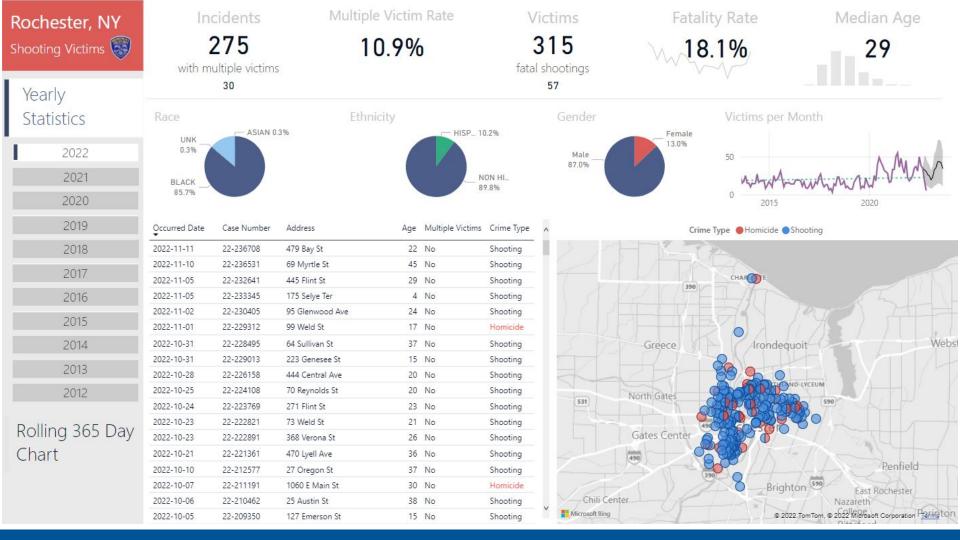






- Shootings
  - 2012 Present
  - > 15 attributes

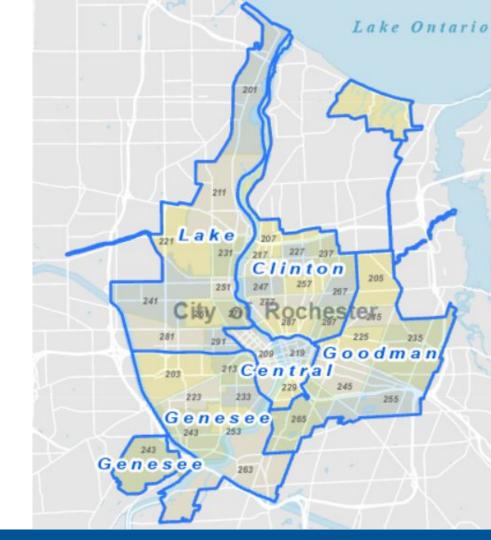






#### Boundaries

- Central
- Clinton
- > Genesee
- > Goodman
- > Lake





### **Data Preprocessing**

- What data do we want to analyze?
  - Data set selection
  - Attribute selection
  - Year range
    - **2018 Oct 12, 2022**
- Eliminate attributes
  - Duplicated
  - > Redundant
  - > Inaccurate
- Ignore values
  - ➤ "Unknown"
- Fixed Formatting Errors
  - ➤ PersonAgeBand 5-14, May 14 in Excel

- Discretization
  - Day of Week
  - > Season
  - ➤ Gun?
- No missing values or outliers



### **Data Preprocessing**

#### Crime

- OccurredFrom\_Date\_Year
- OccurredFrom\_Date\_Month
- ➤ DayOfWeek
- > Season
- Statute\_Text
- > Section
- ➤ Gun?

#### Homicides

- OccurredMonth
- OccurredYear
- DayOfWeek
- > Section
- WeaponCategory
- Season

#### Shootings

- DayOfWeek
- Occurred\_Month
- Season
- Occurred Year
- Multiple\_Shooting
- Victim Age
- Victim\_Age\_Band
- ➤ Homicide?

\* Even after trimming the attributes, ignored attributes like OccurredYear when Clustering in Weka



# Data Mining Techniques / Algorithms / Models

- Count / Frequency
- Visualization
  - > Attribute X vs Attribute Y
  - ➤ Bar graphs
- K-means Clustering
  - Attribute selection
    - What to ignore
  - K value



## **Data Mining**Crime

Instances: 40547

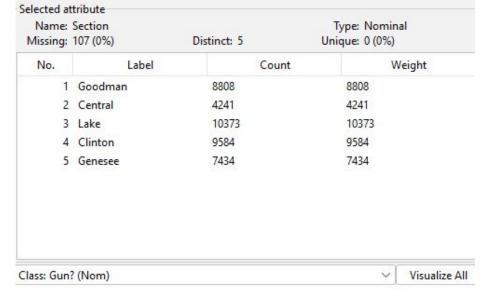
*	Gun?	Count	Freq.
	Yes	3215	7.9%

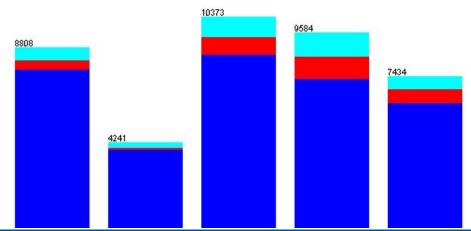
> No 3735 9.2%

Unknown 33597 82.9%



- ❖ Aqua = No Gun
- Red = Gun
- Blue = Unknown
- Most crimes in Lake
  - > Runner-up: Clinton
- More crimes (reported) involving a gun in Clinton

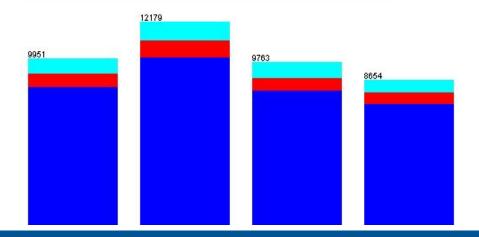






- ❖ Aqua = No Gun
- Red = Gun
- Blue = Unknown
- More crime in Summer
- More crime in August
  - > Not represented here

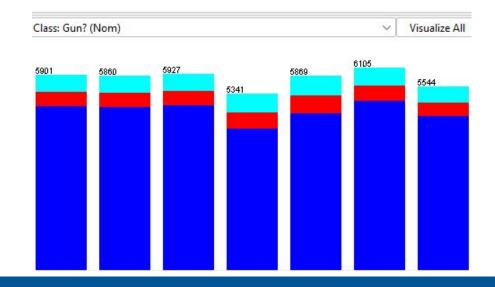
Name: Missing:		Distinct: 4	Type: Nomina Unique: 0 (0%)	al
No.	Label	Count	V	/eight
1	Autumn	9951	9951	
2	Summer	12179	12179	
3	Spring	9763	9763	
4	Winter	8654	8654	
lass: Gun	? (Nom)		~	Visualize All





- ❖ Aqua = No Gun
- Red = Gun
- Blue = Unknown
- Most crimes occur on Fridays
- All days are very close in numbers
- The least amount of crime occurs on Sundays
  - Interesting because the second most shootings occur on Sunday and the most homicides occur on Sunday

Name: Missing:	DayOfWeek 0 (0%)	Distinct: 7	ĺ	Type: Nominal Unique: 0 (0%)
No.	Label		Count	Weight
1	Wed	5901		5901
2	Tue	5860		5860
3	Mon	5927		5927
4	Sun	5341		5341
5	Sat	5869		5869
6	Fri	6105		6105
7	Thu	5544		5544





# Data Mining Shootings

Instances: 1170

Homicide?	Count	Freq.
-----------	-------	-------

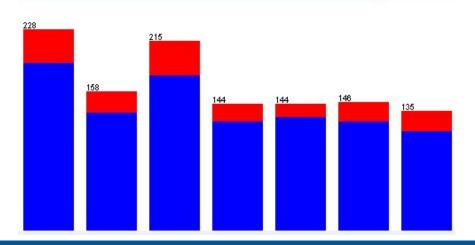
> Yes 181 15.5%

➤ No 989 84.5%



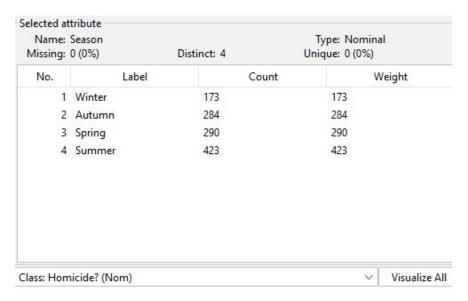
- Red = Homicide (death)
- ❖ Blue = Not Homicide
- Most shootings, regardless of death, occur on Saturday
  - Runner-up: Sunday
- More shootings in June, followed by July
  - Not represented here

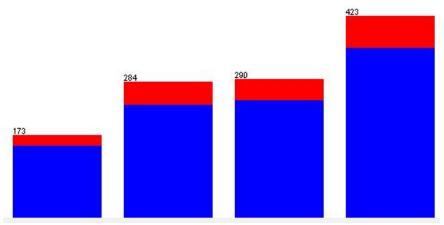
Aissing:	DayOfWeek 0 (0%)	Distinct: 7	Type: Nominal Unique: 0 (0%)
No.	Label	Count	Weight
1	Sat	228	228
2	Wed	158	158
3	Sun	215	215
4	Mon	144	144
5	Tue	144	144
6	Fri	146	146
7	Thu	135	135





- Red = Homicide (death)
- Blue = Not Homicide
- Most shootings occur in the Summer
- Section was not available in Shootings dataset
  - Addresses provided
  - > Latitude & Longitude







# **Data Mining**Homicides

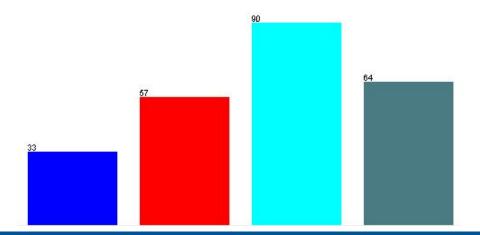
Instances: 244

*	We	apon Category	Count	Freq.
		Firearm	188	77.0%
		Knife / Cutting Instrument	32	13.1%
		Other	24	9.8%



- Most homicides occur in the Summer
- Most homicides occur in June
  - Not represented here

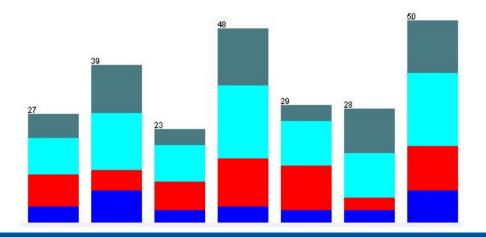
Name: Missing:		Distinct: 4	Type: Nomii Unique: 0 (0%)	
No.	Label	Co	ount	Weight
1	Winter	33	33	
2	Spring	57	57	
3	Summer	90	90	
4	Autumn	64	64	
	on (Nom)		~	Visualize A





- Green(ish) = Autumn
- Aqua = Summer
- Red = Spring
- ❖ Blue = Winter
- Most homicides occur on Sundays
  - Runner-up (very close): Saturdays

lissing:	DayOfWeek 0 (0%)	Distinct: 7	Type: No Unique: 0 (0	
No.	Label	Co	ount	Weight
1	Mon	27	27	
2	Fri	39	39	
3	Tue	23	23	
4	Sat	48	48	
5	Wed	29	29	
6	Thu	28	28	
7	Sun	50	50	

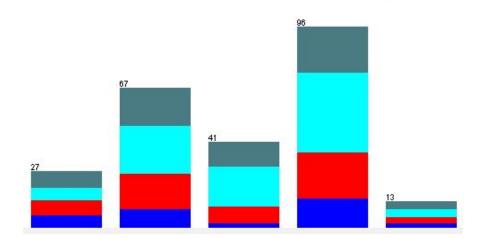




- Green(ish) = Autumn
- ❖ Aqua = Summer
- Red = Spring
- ❖ Blue = Winter
- Most homicides occur in Clinton



lissing:	0 (0%)	Distinct: 5	Type: No Unique: 0 (0	
No.	Label	Cor	unt	Weight
1	Goodman	27	27	
2	Lake	67	67	
3	Genesee	41	41	
4	Clinton	96	96	
5	Central	13	13	





- Clustering
  - K Simple Means
    - $\mathbf{K} = 2, 3, 5, 7$
- Crime
  - Ignored Year
  - ➤ Removed "unknown" from Gun?
- Attributes
  - > 6
  - Month, Day of Week, Season, Statute, Section, Gun?



#### **❖** Crime, K = 2

```
Number of iterations: 4
Within cluster sum of squared errors: 17953.218462718156

Initial starting points (random):
Cluster 0: 2, Thu, Winter, Larceny, Goodman, No
Cluster 1: 5, Sat, Spring, Robbery, Lake, Yes
```

Final cluster centroids:					
		(	Cluster#		
Attribute	Full Data		0		1
	(6950.0)		(3457.0)	(	(3493.0)
OccurredFrom_Date_Month	6.5931	 :	5.4839		7.6908
DayOfWeek	Sat		Thu		Sat
Season	Summer		Spring		Summer
Statute_Text	Aggravated Assault	Aggravated	Assault	Aggravated	Assault
Section	Clinton		Clinton		Lake
Gun?	No		No		Yes

Clustered		Instances		
0	345	57	(	50%)
1	349	93	(	50%)



#### **♦** Crime, K = 3

```
Number of iterations: 4
Within cluster sum of squared errors: 16565.834243917765
Initial starting points (random):
Cluster 0: 2,Thu,Winter,Larceny,Goodman,No
Cluster 1: 5,Sat,Spring,Robbery,Lake,Yes
```

Cluster 2: 6, Sun, Summer, 'Aggravated Assault', Genesee, No

#### Final cluster centroids:

		Cluster#		
Attribute	Full Data	0	1	2
	(6950.0)	(1741.0)	(2278.0)	(2931.0)
OccurredFrom_Date_Month	6.5931	4.6295	6.4899	7.8396
DayOfWeek	Sat	Thu	Sat	Sun
Season	Summer	Winter	Spring	Summer
Statute_Text	Aggravated Assault A	ggravated Assault	Robbery Ag	ggravated Assault
Section	Clinton	Goodman	Lake	Clinton
Gun?	No	No	Yes	No

Clus	tered In	151	tances
0	1741	(	25%)
1	2278	(	33%)
2	2931	(	42%)



### **Algorithm / Model**

### **Performance & Results**

#### Crime. K = 5

Number of iterations: 6 Within cluster sum of squared errors: 14762.427893485758 Initial starting points (random): Cluster 0: 2, Thu, Winter, Larceny, Goodman, No Cluster 1: 5, Sat, Spring, Robbery, Lake, Yes Cluster 2: 6, Sun, Summer, 'Aggravated Assault', Genesee, No Cluster 3: 12, Sat, Winter, Robbery, Lake, Yes Cluster 4: 2, Sat, Winter, 'Aggravated Assault', Clinton, Yes

Clus	tered Ir	131	tance:
0	1367	(	20%)
1	1204	(	17%)
2	1475	(	21%)
3	1252	(	18%)
4	1652	(	24%)

LIHAT	cruster	centrolus

Final cluster centroids:						
		Cluster#				
Attribute	Full Data	0	1	2	3	4
	(6950.0)	(1367.0)	(1204.0)	(1475.0)	(1252.0)	(1652.0)
OccurredFrom_Date_Month	6.5931	4.8149	3.3978	7.6983	10.0256	6.8051
DayOfWeek	Sat	Thu	Sat	Sun	Sat	Sat
Season	Summer	Winter	Spring	Summer	Autumn	Summer
Statute_Text	Aggravated Assault Aggra	avated Assault	Robbery Aggra	avated Assault	Robbery Aggra	avated Assault
Section	Clinton	Goodman	Lake	Genesee	Lake	Clinton
Gun?	No	No	Yes	No	Yes	Yes



#### **❖** Crime, K = 7

```
Number of iterations: 4
Within cluster sum of squared errors: 13472.33224127969
Initial starting points (random):
Cluster 0: 2, Thu, Winter, Larceny, Goodman, No
Cluster 1: 5, Sat, Spring, Robbery, Lake, Yes
Cluster 2: 6, Sun, Summer, 'Aggravated Assault', Genesee, No
Cluster 3: 12, Sat, Winter, Robbery, Lake, Yes
Cluster 4: 2, Sat, Winter, 'Aggravated Assault', Clinton, Yes
Cluster 5: 1, Sat, Winter, 'Aggravated Assault', Lake, No
Cluster 6: 6, Fri, Summer, 'Aggravated Assault', Lake, Yes
```

0	584	(	8%)
1	763	(	11%)
2	1790	(	26%)
3	893	(	13%)
4	804	(	12%)
5	1143	(	16%)
6	973	(	14%)

	Cluster#						
Full Data	0	1	2	3	4	5	6
(6950.0)	(584.0)	(763.0)	(1790.0)	(893.0)	(804.0)	(1143.0)	(973.0)
6.5931	5.9606	3.557	7.3849	10.0269	6.1704	4.4917	7.5632
Sat	Thu	Sat	Sun	Sat	Sat	Sat	Fri
Summer	Winter	Spring	Summer	Autumn	Winter	Winter	Summer
Aggravated Assault	Robbery	Robbery Aggra	avated Assault	Robbery Aggra	vated Assault Aggra	avated Assault Aggra	vated Assault
Clinton	Goodman	Lake	Clinton	Lake	Clinton	Lake	Lake
No	No	Yes	No	Yes	Yes	No	Yes
	(6950.0)  6.5931 Sat Summer Aggravated Assault Clinton	Full Data 0 (6950.0) (584.0)  6.5931 5.9606 Sat Thu Summer Winter Aggravated Assault Robbery Clinton Goodman	Full Data 0 1 (6950.0) (584.0) (763.0)  6.5931 5.9606 3.557 Sat Thu Sat Summer Winter Spring Aggravated Assault Robbery Robbery Aggra Clinton Goodman Lake	Full Data 0 1 2 (6950.0) (584.0) (763.0) (1790.0)  6.5931 5.9606 3.557 7.3849 Sat Thu Sat Sun Summer Winter Spring Summer Aggravated Assault Robbery Robbery Aggravated Assault Clinton Goodman Lake Clinton	Full Data 0 1 2 3 (6950.0) (584.0) (763.0) (1790.0) (893.0)  6.5931 5.9606 3.557 7.3849 10.0269 Sat Thu Sat Sun Sat Sun Sat Summer Autumn Aggravated Assault Robbery Robbery Aggravated Assault Robbery Aggravated Clinton Goodman Lake Clinton Lake	Full Data 0 1 2 3 4 (6950.0) (584.0) (763.0) (1790.0) (893.0) (804.0)  6.5931 5.9606 3.557 7.3849 10.0269 6.1704 Sat Thu Sat Sun Sat Sat Summer Winter Spring Summer Autumn Winter Aggravated Assault Robbery Robbery Aggravated Assault Robbery Aggravated Assault Aggravated Assault Clinton Goodman Lake Clinton	Full Data 0 1 2 3 4 5 (6950.0) (584.0) (763.0) (1790.0) (893.0) (804.0) (1143.0)  6.5931 5.9606 3.557 7.3849 10.0269 6.1704 4.4917 Sat Thu Sat Sun Sat Sat Sat Summer Winter Spring Summer Autumn Winter Winter  Aggravated Assault Robbery Robbery Aggravated Assault Robbery Aggravated Assault Aggravat



- Clustering
  - K Simple Means
    - $\mathbf{K} = 2, 3, 5, 7$
- Shooting
  - Ignored Year, Victim Age, Victim Age Band
- Attributes
  - > 5
  - Day of Week, Month, Season, Multiple Shooting, Homicide?



#### $\Rightarrow$ Shooting, K = 2

```
Number of iterations: 3
Within cluster sum of squared errors: 1704.3043507294788
Initial starting points (random):
Cluster 0: Sat,11,Autumn,No,No
Cluster 1: Tue,6,Summer,No,No
```

Final cluster centr	oids:		
		Cluster#	
Attribute	Full Data	0	1
	(1170.0)	(442.0)	(728.0)
DayOfWeek	Sat	Sat	Sun
Occurred_Month	6.788	8.9321	5.4863
Season	Summer	Autumn	Summer
Multiple_Shooting	No	No	No
Homicide?	No	No	No

Clust	ered In	131	tances
0	442	(	38%)
1	728	(	62%)



#### Shooting, K = 3

```
Number of iterations: 4
Within cluster sum of squared errors: 1587.5501189616261
Initial starting points (random):
Cluster 0: Sat,11,Autumn,No,No
Cluster 1: Tue,6,Summer,No,No
Cluster 2: Sun,9,Autumn,Yes,No
```

Final cluster centr	oids:			
		Cluster#		
Attribute	Full Data	0	1	2
	(1170.0)	(420.0)	(627.0)	(123.0)
DayOfWeek	Sat	Sat	Sun	Sun
Occurred_Month	6.788	8.9571	5.4817	6.0407
Season	Summer	Autumn	Summer	Summer
Multiple_Shooting	No	No	No	Yes
Homicide?	No	No	No	No

red Ir	131	tances
420	(	36%)
627	(	54%)
123	(	11%)
	420 627	420 ( 627 ( 123 (



#### Shooting, K = 5

```
Number of iterations: 7
Within cluster sum of squared errors: 1313.258582506489

Initial starting points (random):

Cluster 0: Sat,11,Autumn,No,No
Cluster 1: Tue,6,Summer,No,No
Cluster 2: Sun,9,Autumn,Yes,No
Cluster 3: Tue,10,Autumn,No,Yes
Cluster 4: Thu,8,Summer,No,No
```

Final cluster centr	coids:					
		Cluster#				
Attribute	Full Data	0	1	2	3	4
	(1170.0)	(314.0)	(281.0)	(83.0)	(89.0)	(403.0)
DayOfWeek	Sat	Sat	Tue	Sun	Sun	Sat
Occurred_Month	6.788	10.2261	3.7153	5.0964	5.9888	6.7767
Season	Summer	Autumn	Spring	Spring	Spring	Summer
Multiple_Shooting	No	No	No	Yes	No	No
Homicide?	No	No	No	No	Yes	No

Clust	ered In	131	tances
0	314	(	27%)
1	281	(	24%)
2	83	(	7%)
3	89	(	8%)
4	403	(	34%)



#### $\Rightarrow$ Shooting, K = 7

Final cluster centroids:

## Algorithm / Model Performance & Results

```
Number of iterations: 8
Within cluster sum of squared errors: 1151.5799517879584

Initial starting points (random):

Cluster 0: Sat,11,Autumn,No,No
Cluster 1: Tue,6,Summer,No,No
Cluster 2: Sun,9,Autumn,Yes,No
Cluster 3: Tue,10,Autumn,No,Yes
Cluster 4: Thu,8,Summer,No,No
Cluster 5: Sun,2,Winter,No,No
Cluster 6: Tue,12,Winter,No,No
```

		Cluster#							Clus	tered Instances
Attribute	Full Data	0	1	2	3	4	5	6		
	(1170.0)	(229.0)	(163.0)	(280.0)	(83.0)	(239.0)	(108.0)	(68.0)	0	229 ( 20%)
									1	163 ( 14%)
DayOfWeek	Sat	Sat	Tue	Sun	Sat	Sun	Sun	Tue	2	280 ( 24%)
Occurred_Month	6.788	9.9214	6.2945	4.1893	8.2892	7.3473	2.9907	10.3529	3	83 ( 7%)
Season	Summer	Autumn	Summer	Spring	Autumn	Summer	Winter	Winter	4	239 ( 20%)
Multiple_Shooting	No	No	No	No	No	No	No	No	5	108 ( 9%)
Homicide?	No	No	No	No	Yes	No	No	No	6	68 ( 6%)



- Clustering
  - K Simple Means
    - $\blacksquare$  K = 2, 3, 5, 7
- Homicides
  - Ignored Year
- Attributes
  - > 5
  - Day of Week, Month, Season, Section, Weapon Category



#### ♦ Homicide, K = 2

```
Number of iterations: 3
Within cluster sum of squared errors: 488.9957126184171
Initial starting points (random):
Cluster 0: 11, Sat, Lake, Firearm, Autumn
Cluster 1: 3, Sat, Clinton, Firearm, Spring
```

Cluster# 0 (115.0)	1
	_
(115.0)	(120.0)
	(129.0)
8.4087	5.1008
Sun	Sat
Lake	Clinton
Firearm	Firearm
Autumn	Spring
	8.4087 Sun Lake Firearm

Clus	tered :	[n:	stances
0	115	(	47%)
1	129	(	53%)



#### ❖ Homicide, K = 3

```
Number of iterations: 5
Within cluster sum of squared errors: 417.09234254959324
```

#### Initial starting points (random):

Cluster 0: 11, Sat, Lake, Firearm, Autumn Cluster 1: 3, Sat, Clinton, Firearm, Spring

Cluster 2: 10, Mon, Clinton, Knife/CuttingInstrument, Autumn

Final cluster centroids:				
		Cluster#		
Attribute	Full Data	0	1	2
	(244.0)	(84.0)	(73.0)	(87.0)
OccurredMonth	6.6598	8.8095	4.0274	6.7931
DayOfWeek	Sun	Sun	Sat	Fri
Section	Clinton	Lake	Clinton	Clinton
WeaponCategory	Firearm	Firearm	Firearm	Firearm
Season	Summer	Autumn	Spring	Summer

Clust	ered I	ns	stances
0	84	(	34%)
1	73	(	30%)
2	87	(	36%)



#### $\Leftrightarrow$ Homicide, K = 5

```
Number of iterations: 5
Within cluster sum of squared errors: 389.7705360636493

Initial starting points (random):

Cluster 0: 11, Sat, Lake, Firearm, Autumn
Cluster 1: 3, Sat, Clinton, Firearm, Spring
Cluster 2: 10, Mon, Clinton, Knife/CuttingInstrument, Autumn
Cluster 3: 1, Fri, Central, Other, Winter
Cluster 4: 7, Fri, Lake, Knife/CuttingInstrument, Summer
```

Clust	ered 1	ns	stances
0	68	(	28%)
1	60	(	25%)
2	17	(	7%)
3	17	(	7%)
4	82	(	34%)

	Cluster#				
Full Data	0	1	2	3	4
(244.0)	(68.0)	(60.0)	(17.0)	(17.0)	(82.0)
6.6598	9.2794	3.95	7.8824	2.9412	6.9878
Sun	Sat	Sat	Mon	Fri	Fri
Clinton	Lake	Clinton	Clinton	Goodman	Clinton
Firearm	Firearm	Firearm Knife/C	uttingInstrument	Other	Firearm
Summer	Autumn	Spring	Autumn	Winter	Summer
	(244.0) 6.6598 Sun Clinton Firearm	(244.0) (68.0)  6.6598 9.2794  Sun Sat  Clinton Lake  Firearm Firearm	Full Data 0 1 (244.0) (68.0) (60.0)  6.6598 9.2794 3.95 Sun Sat Sat Clinton Lake Clinton Firearm Firearm Firearm Knife/C	Full Data 0 1 2 (244.0) (68.0) (60.0) (17.0)  6.6598 9.2794 3.95 7.8824 Sun Sat Sat Mon Clinton Lake Clinton Clinton Firearm Firearm Firearm Knife/CuttingInstrument	Full Data 0 1 2 3 (244.0) (68.0) (60.0) (17.0) (17.0)  6.6598 9.2794 3.95 7.8824 2.9412 Sun Sat Sat Mon Fri Clinton Lake Clinton Clinton Goodman Firearm Firearm Knife/CuttingInstrument Other



#### ❖ Homicide, K = 7

```
Number of iterations: 6
Within cluster sum of squared errors: 344.56333543345727
Initial starting points (random):
Cluster 0: 11, Sat, Lake, Firearm, Autumn
Cluster 1: 3, Sat, Clinton, Firearm, Spring
Cluster 2: 10, Mon, Clinton, Knife/CuttingInstrument, Autumn
Cluster 3: 1, Fri, Central, Other, Winter
Cluster 4: 7, Fri, Lake, Knife/CuttingInstrument, Summer
Cluster 5: 4, Mon, Clinton, Other, Spring
Cluster 6: 3, Wed, Lake, Other, Spring
```

Clust	erea 1	n	stances
0	45	(	18%)
1	33	(	14%)
2	21	(	9%)
3	24	(	10%)
4	35	(	14%)
5	59	(	24%)
6	27	(	11%)

Final cluster centroids:																	
Attribute	Full Data (244.0)	Cluster# 0 (45.0)	1 (33.0)	2 (21.0)	3 (24.0)	4 (35.0)	5 (59.0)	6 (27.0)									
									OccurredMonth	6.6598	9.9778	4.2727	8.6667	3.5	7.3714	6.7797	4.1111
									DayOfWeek	Sun	Sat	Sat	Thu	Fri	Fri	Mon	Wed
Section	Clinton	Lake	Clinton	Clinton	Goodman	Lake	Clinton	Lake									
WeaponCategory	Firearm	Firearm	Firearm Knife/CuttingInstrument		Firearm	Firearm	Firearm	Firearm									
Season	Summer	Autumn	Spring	Autumn	Winter	Summer	Summer	Spring									



## **Conclusions Lessons Learned**

- Maybe shouldn't live here...
- Problem solution
  - ➤ More personnel / patrols in the Summer, on weekends, in sections of Clinton & Lake
- Questions raised
  - Section size vs infrastructure
  - Legal vs illegal guns
  - Rochester vs other cities (especially those in different climates)
  - ➤ Time of day/night of occurrence
- Importance of each data mining step
  - Preprocessing
- Importance of data visualization
- Difference between working with discrete vs continuous values