



# ANALYSIS & MODELING OF 911 CALLS ASSIGNED TO SAN FRANCISCO FIRE DEPARTMENT (SFFD)

DS-SF-30 Final Project Presentation  
Nikita Attiguppe Dasharath

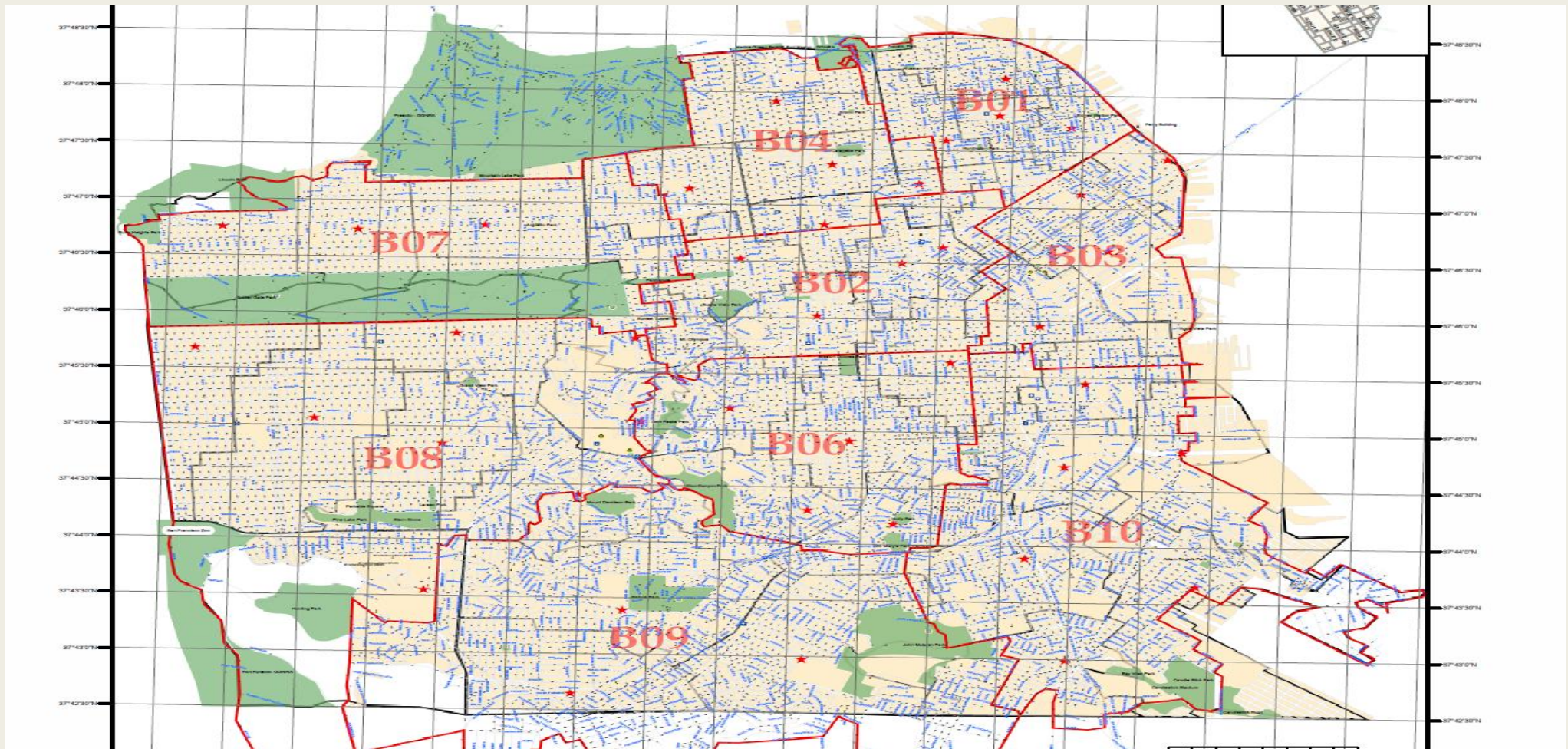


# TABLE OF CONTENT

Outline	Slide 3
Summary	Slide 4
Number of Calls per hour	Slide 5
Geocoding	Slide 6
Modeling	Slide 7
Results	Slide 8
Conclusion	Slide 9
References	Slide 10
Next Steps	Slide 11

# OUTLINE

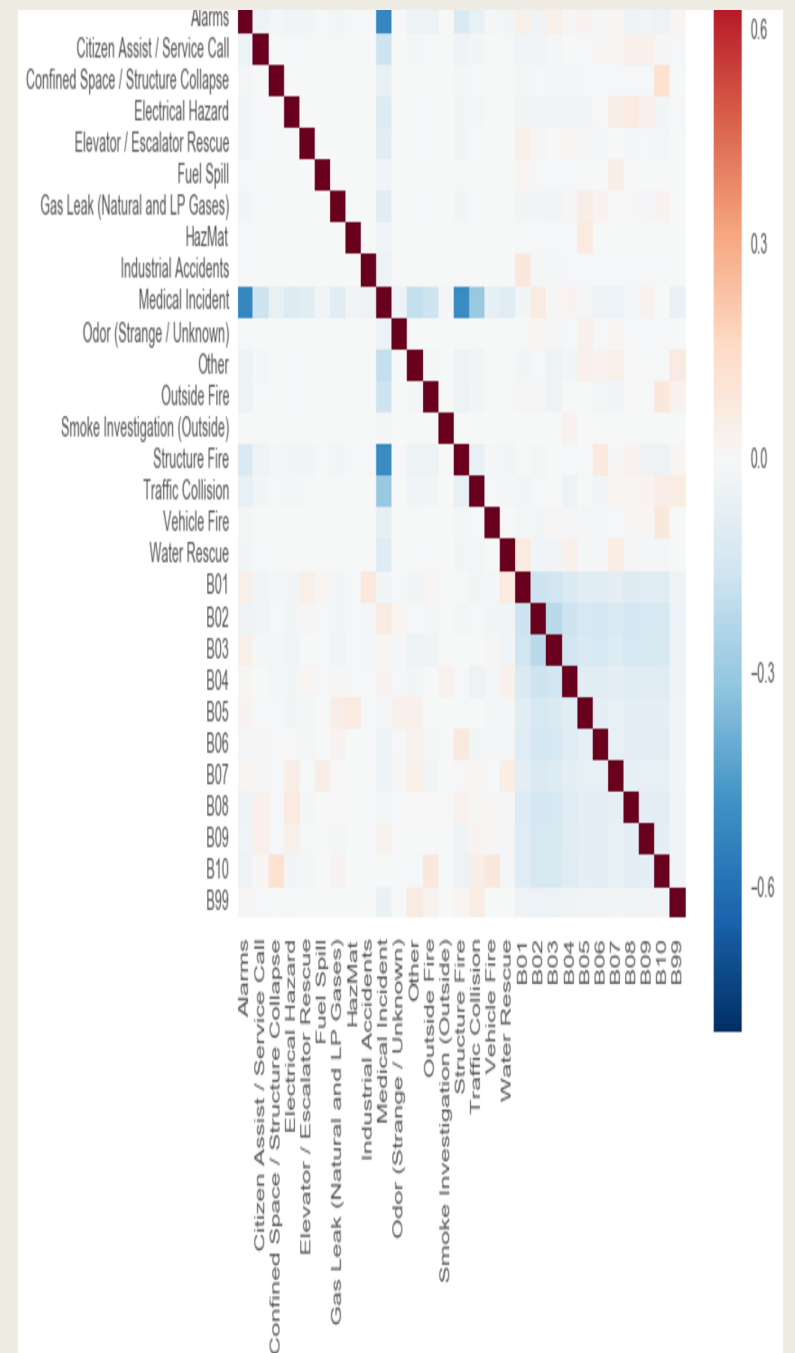
- Figure below shows the location of Fire engines and Battalion boundaries in San Francisco
- [Image source: <https://data.sfgov.org>]



# SUMMARY

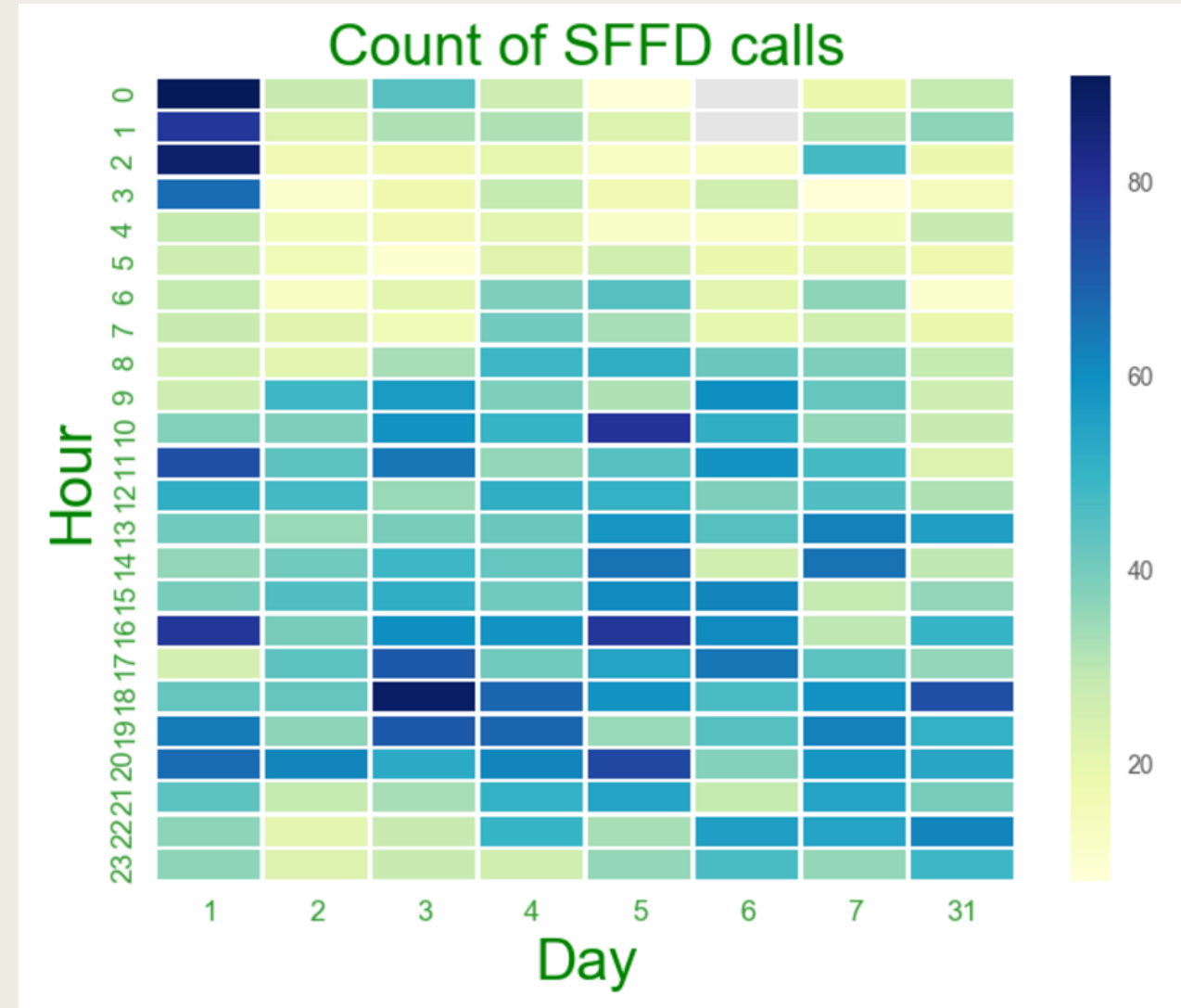
- Goal of the project is to determine the type, time and frequency of calls assigned to SFFD
- [Data source: <https://data.sfgov.org>]
- Time period: Dec 31, 2016 to Jan 7, 2017
- First figure on the right shows the features in the data set
- Second figure on the right shows the correlation between various types of calls and batalions

Call Number  
 Unit ID  
 Incident Number  
 Call Type  
 Call Date  
 Watch Date  
 Received DtTm  
 Entry DtTm  
 Dispatch DtTm  
 Response DtTm  
 On Scene DtTm  
 Transport DtTm  
 Hospital DtTm  
 Call Final Disposition  
 Available DtTm  
 Address  
 City  
 Zipcode of Incident  
 Battalion  
 Station Area  
 Box  
 Original Priority  
 Priority  
 Final Priority  
 ALS Unit  
 Call Type Group  
 Number of Alarms  
 Unit Type  
 Unit sequence in call dispatch  
 Fire Prevention District  
 Supervisor District  
 Neighborhood District  
 Location  
 RowID



# NUMBER OF CALLS PER HOUR

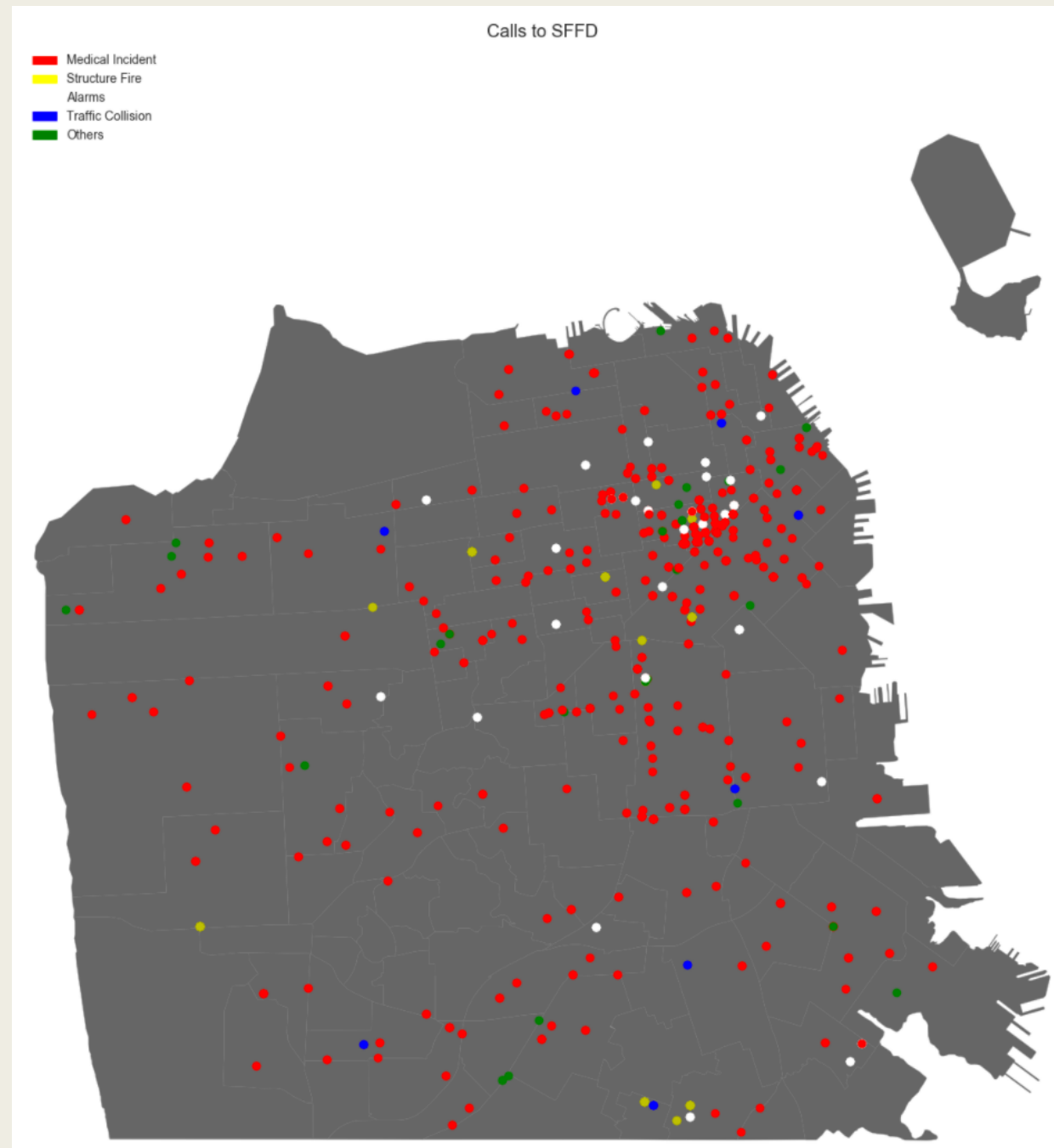
- X-axis shows the day
- Y-axis shows the hour
- January 1<sup>st</sup> had the maximum calls in the first week of January 2017
- Majority of the calls were between 12am – 4am and 5pm – 6pm on January 1st
- Dec 31, 2016 and January 2<sup>nd</sup> 2017 had the least number of calls in the first week of January.





# GEOCODING

- Converted String Addresses to Latitude-Longitude using pygeocoder library
- Figure shows the map of San Francisco and its neighborhood boundaries
- Colored dots on the map are the majority types of calls assigned to SFFD
- Map shows calls for January 1<sup>st</sup> 2017
- 72% of calls are Medical Incidents
- 50% of calls are from only four neighborhoods : Tenderloin, SoMa, Mission and Financial District/SB



# MODELING

- Linear Regression and Regularization models for Box and Battalion have around 75.5% accuracy
- Logistic Regression model for Medical Incidents and Battalion have around 69% accuracy

Confusion Matrix

True Class	0.0	1.0
Hypothesized Class		
0.0	40	2333
1.0	29	5302

OLS Regression Results

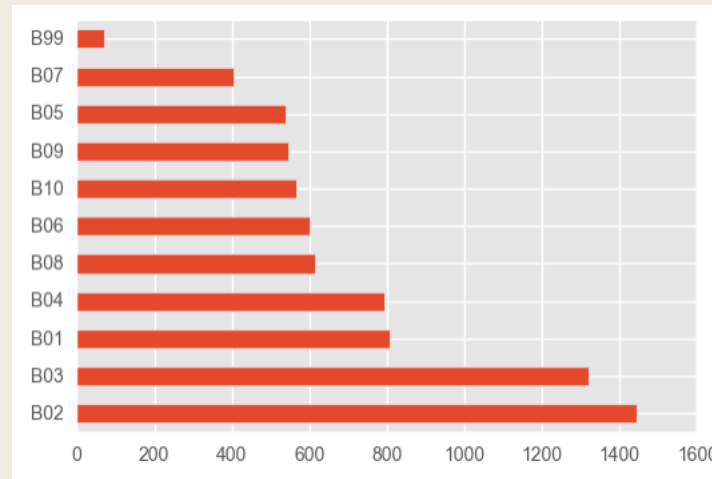
<b>Dep. Variable:</b>	Box	<b>R-squared:</b>	0.755
<b>Model:</b>	OLS	<b>Adj. R-squared:</b>	0.755
<b>Method:</b>	Least Squares	<b>F-statistic:</b>	2369.
<b>Date:</b>	Tue, 21 Feb 2017	<b>Prob (F-statistic):</b>	0.00
<b>Time:</b>	12:51:12	<b>Log-Likelihood:</b>	-65233.
<b>No. Observations:</b>	7704	<b>AIC:</b>	1.305e+05
<b>Df Residuals:</b>	7693	<b>BIC:</b>	1.306e+05
<b>Df Model:</b>	10		
<b>Covariance Type:</b>	nonrobust		

	coef	std err	t	P> t	[95.0% Conf. Int.]
<b>B01</b>	1410.5198	40.527	34.804	0.000	1331.075 1489.965
<b>B02</b>	3224.8947	30.316	106.376	0.000	3165.467 3284.322
<b>B03</b>	1997.3649	31.696	63.017	0.000	1935.232 2059.497
<b>B04</b>	2892.2544	40.883	70.744	0.000	2812.112 2972.396
<b>B05</b>	4380.3296	49.713	88.113	0.000	4282.879 4477.780
<b>B06</b>	5380.2907	46.952	114.591	0.000	5288.252 5472.330
<b>B07</b>	6639.5866	57.314	115.845	0.000	6527.235 6751.938
<b>B08</b>	7682.5896	46.491	165.249	0.000	7591.454 7773.725
<b>B09</b>	7089.1927	49.346	143.662	0.000	6992.460 7185.925
<b>B10</b>	5529.7403	48.422	114.198	0.000	5434.819 5624.661
<b>B99</b>	4062.4638	138.685	29.293	0.000	3790.603 4334.324

<b>Omnibus:</b>	1710.125	<b>Durbin-Watson:</b>	0.935
<b>Prob(Omnibus):</b>	0.000	<b>Jarque-Bera (JB):</b>	6987.085
<b>Skew:</b>	-1.044	<b>Prob(JB):</b>	0.00
<b>Kurtosis:</b>	7.172	<b>Cond. No.</b>	4.57

# RESULTS

- Time based analysis of the calls assigned to San Francisco Fire Department showed increase in calls during holidays such as New Years Eve. It also showed less number of calls from 5am in the morning till noon
- Majority of the calls are assigned to four battalions (B02, B03, B01, B04) where there are more incidents as compared to other neighborhoods.





# CONCLUSION

- Classification of call frequency based on neighborhood and time of the day describe the calls to San Francisco Fire Department.
- Although Medical Incidents are the most common type of calls assigned to SFFD, predicting such incidents using Battalion has an accuracy of only 70%. Analysis with few years of call data could improve the accuracy.
- Integrating call data with neighborhood data would help improvise the models.

# REFERENCES

- General Assembly course material
- <http://stackoverflow.com/>
- <https://www.kaggle.com>
- [pandas.pydata.org](http://pandas.pydata.org)
- [seaborn.pydata.org](http://seaborn.pydata.org)
- <https://github.com/sfroid/sfcoord2nbh>
- [http://sensitivecities.com/so-youd-like-to-make-a-map-using-python-EN.html#.WKy\\_6BIrKR](http://sensitivecities.com/so-youd-like-to-make-a-map-using-python-EN.html#.WKy_6BIrKR)

# NEXT STEPS

- Incorporate more San Francisco Fire Department call Data
- Analysis of Response times of calls for call type and severity of the incidents