



NEXT PROFITABLE SHARE STATION-

ANALYZING THE CITI BIKE SHARE USAGE IN NYC

INTRODUCTION

- ▶ **GOAL:** Using New York City 2015 (5-year estimate) census data to analyze the next most profitable location to add a bike share station.
- ▶ **APPROACH:** Merge the 3 datasets together, determine the distance within the boroughs and the stations. Using the stations closest to the boroughs to create a models.
- ▶ **RESULT:** Using the Gradient Regression Boost, Queens has the highest profitable possible stations.

CITI BIKE SHARE IS THE NATIONS LARGEST BIKE SHARE PROGRAM

- ▶ 12,000 bikes and 750 stations within Manhattan, Brooklyn, Queens and Jersey City.
- ▶ Designed for quick, convenient , and affordable trips
- ▶ Have Annual Member or Day Passes
- ▶ One year of bike share is cheaper than two monthly subway passes
- ▶ Can be more convenient than owning your own bike (no locks, no storage needed)

SCOPE

- ▶ Analyze bike usage in the five boroughs based off of census data
- ▶ Using NY Census Data predict the next most profitable location to add a bike share station.
- ▶ Linear Regression, Random Forest Regression, Gradient Boosting Regressor, PLSRegression



DATA:

- Data Set 1: from Kaggle-<https://www.kaggle.com/muonneutrino/new-york-city-census-data>
- Data Set 2: from Citi Bike Share- <https://www.citibikenyc.com/system-data>

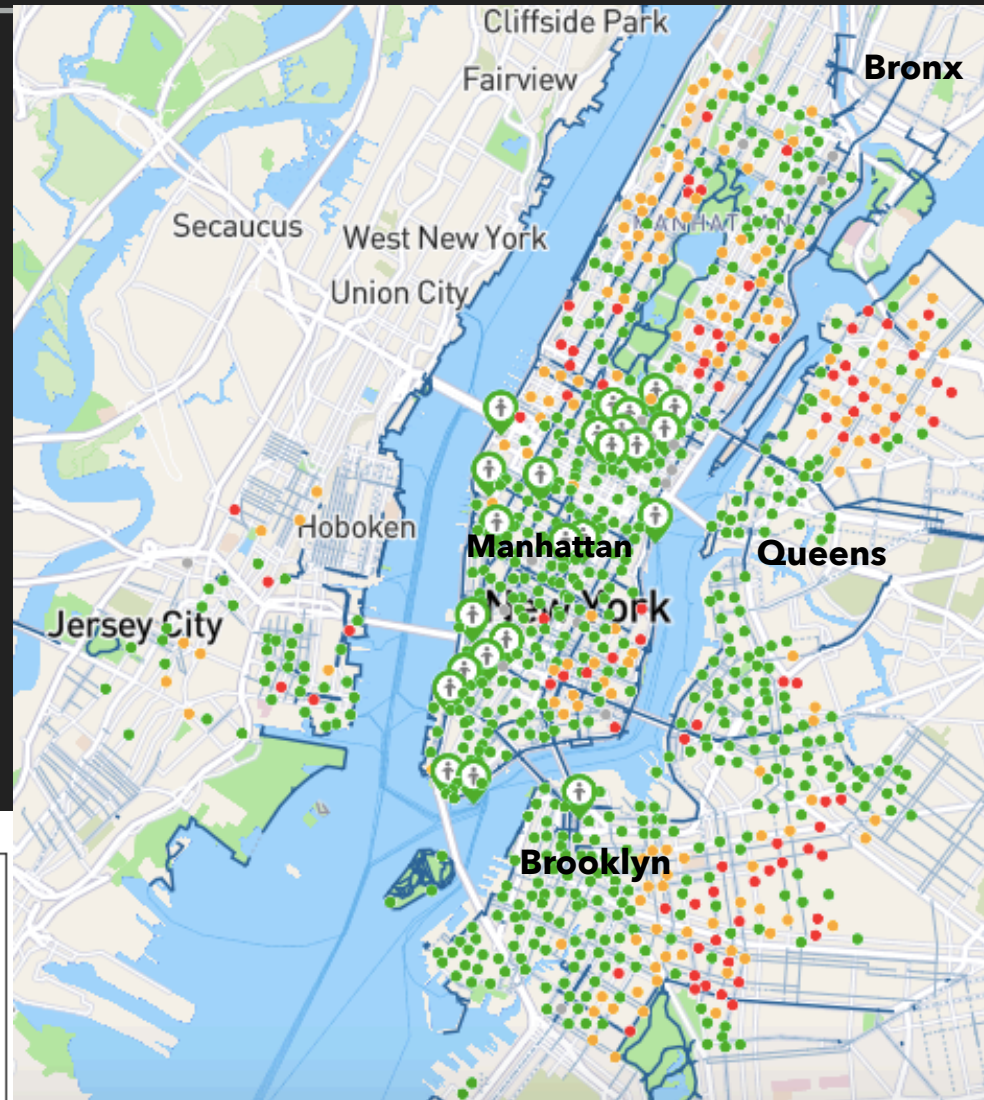
Two Datasets

Merged:

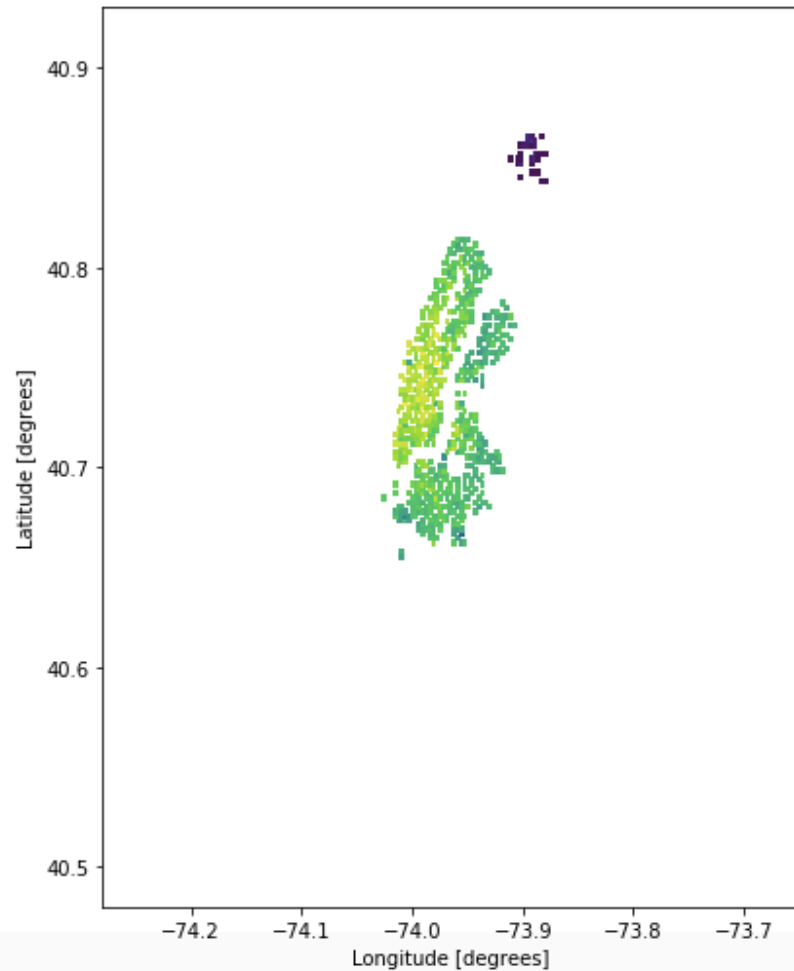
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Borough	object
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Women	int64
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Citizen	int64
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Professional	float64
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Office	float64
Construction	float64
Production	float64
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Carpool	float64
Transit	float64
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Longitude	float64
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State	object
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SHARE STATIONS- MAP OF NYC

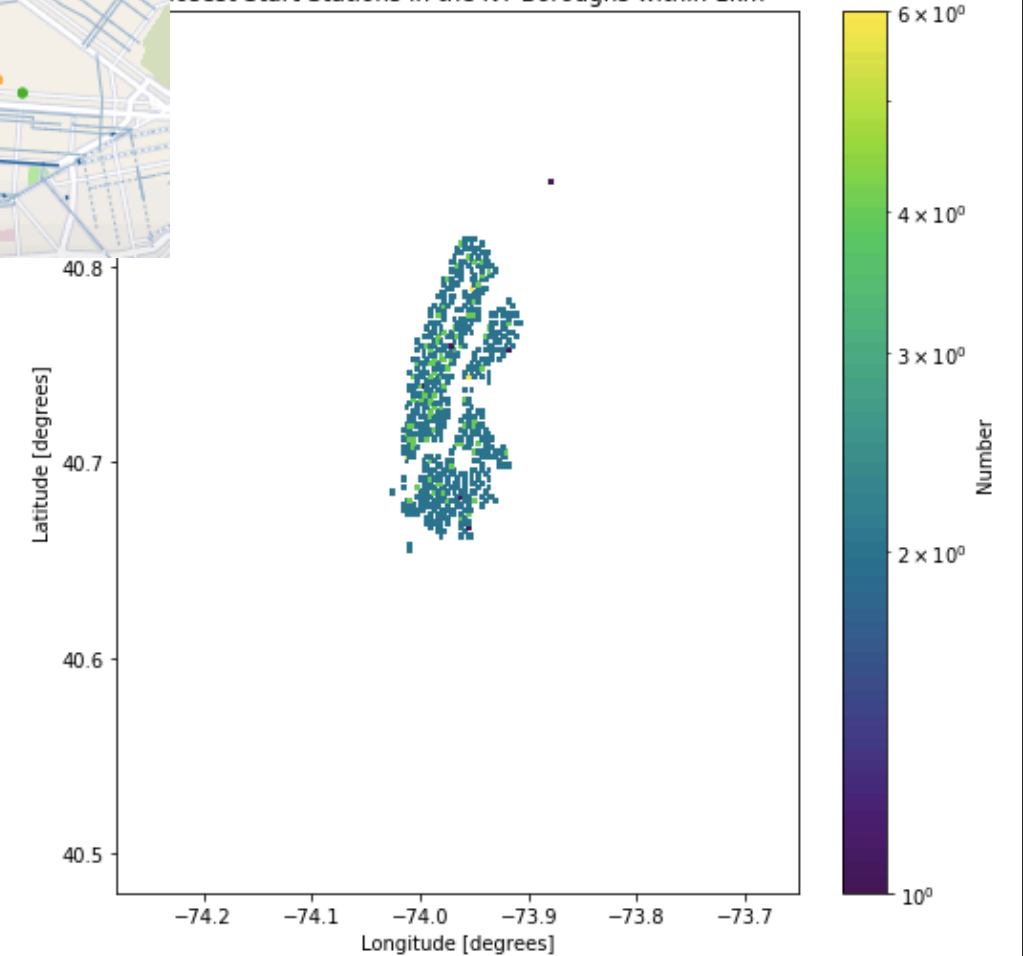
There are no bike share stations in the Bronx or Staten Island



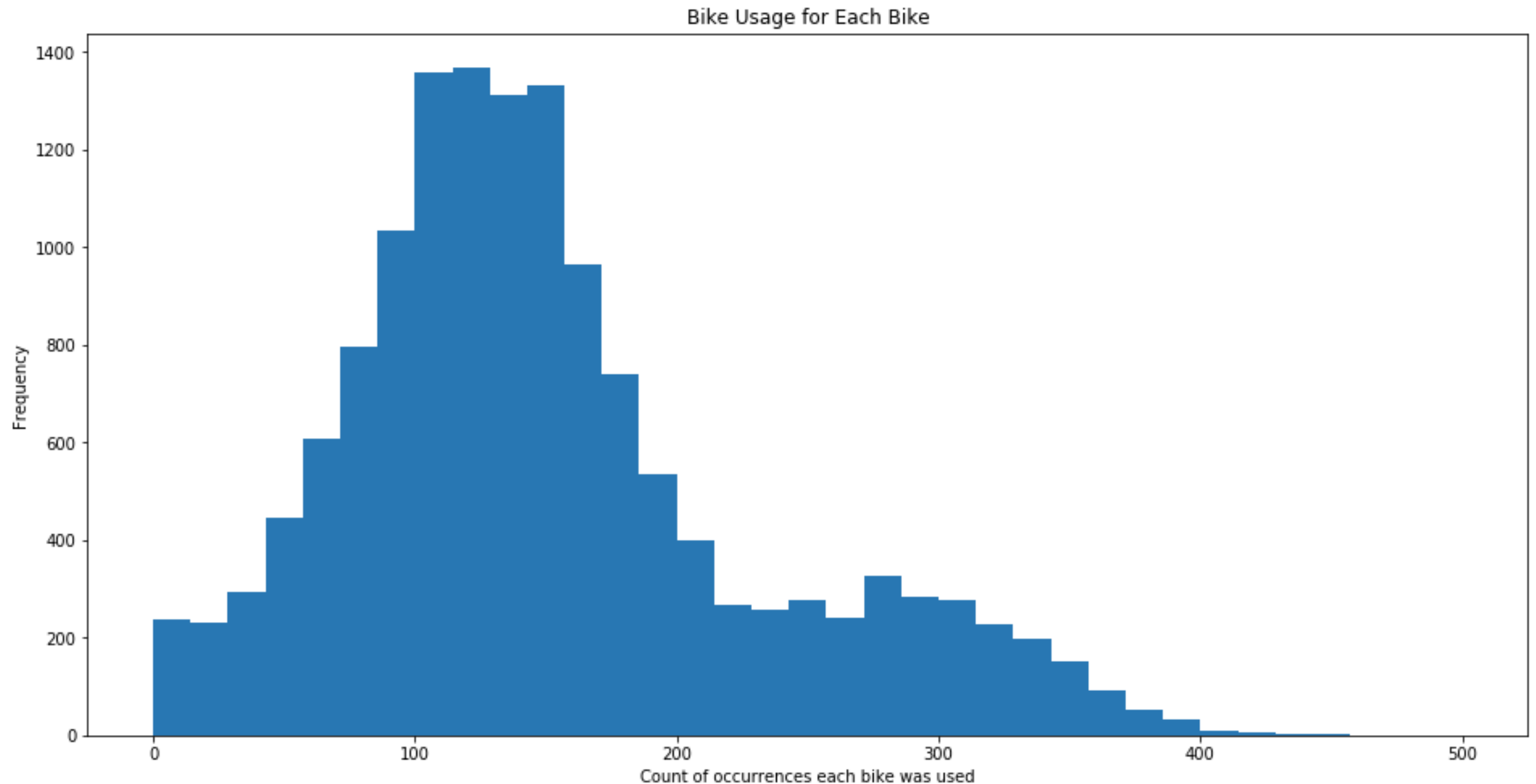
Start Station



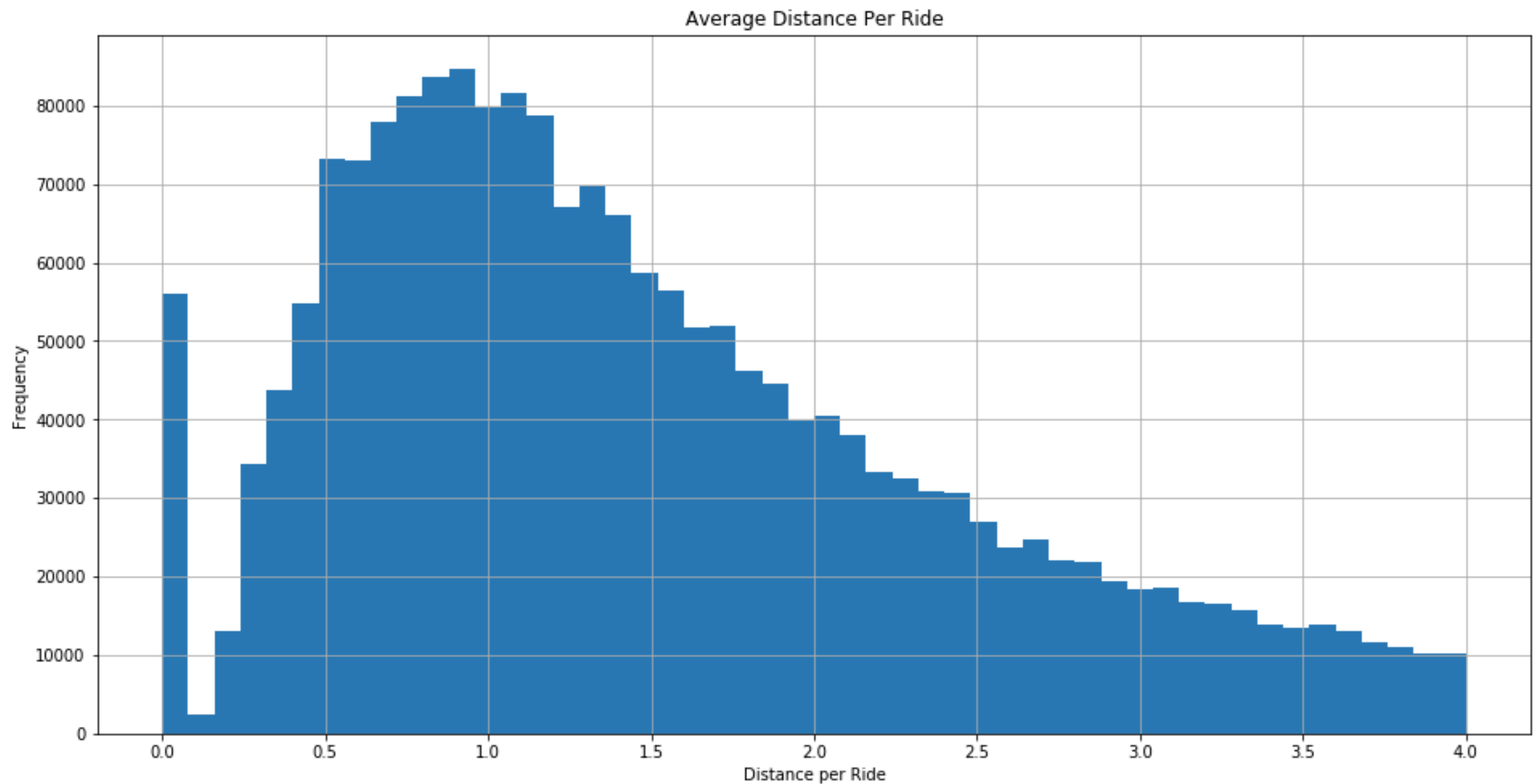
Closest Start Stations in the NY Boroughs within 1km



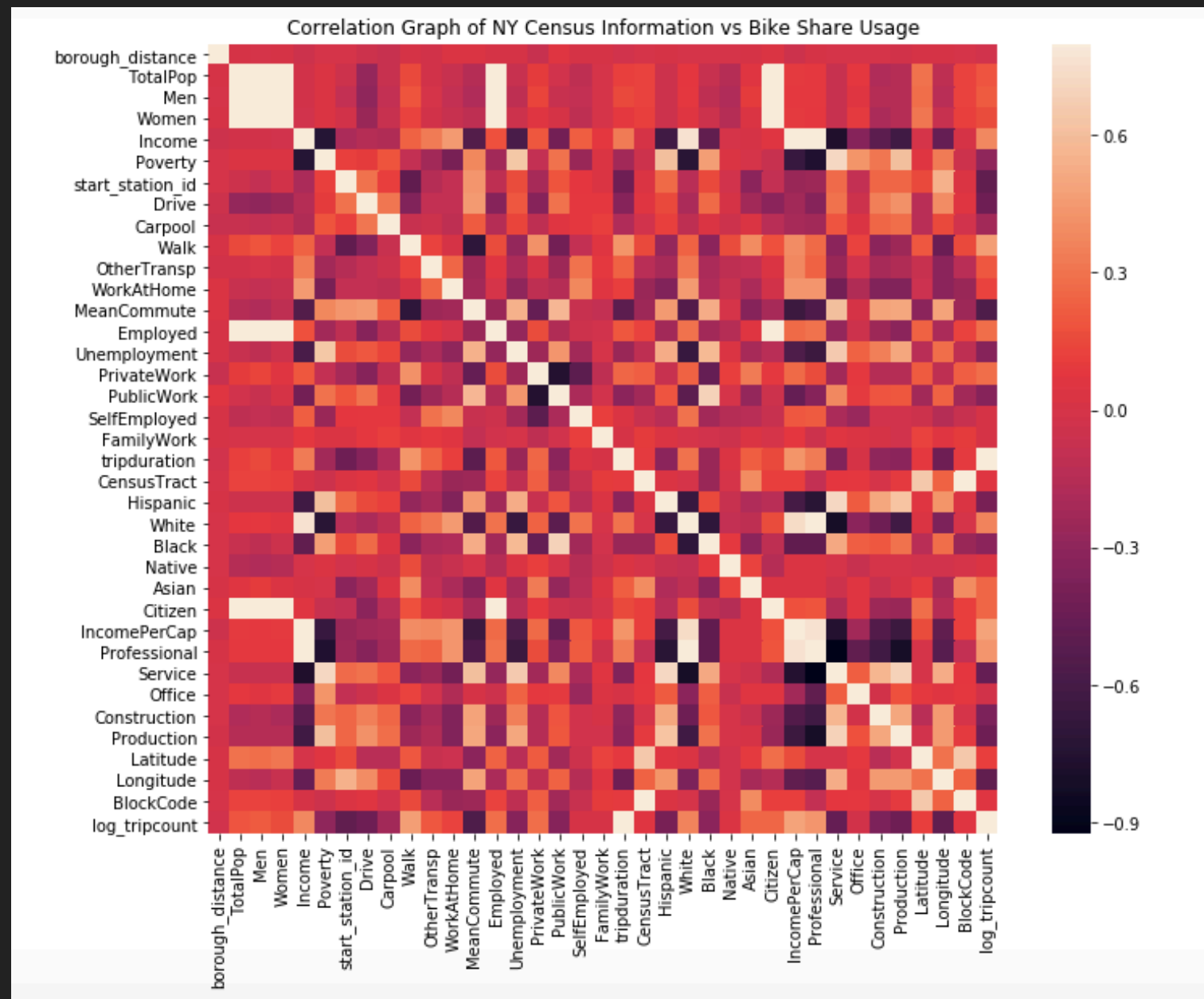
There are 14356 bikes and each has been used on average 152 times.



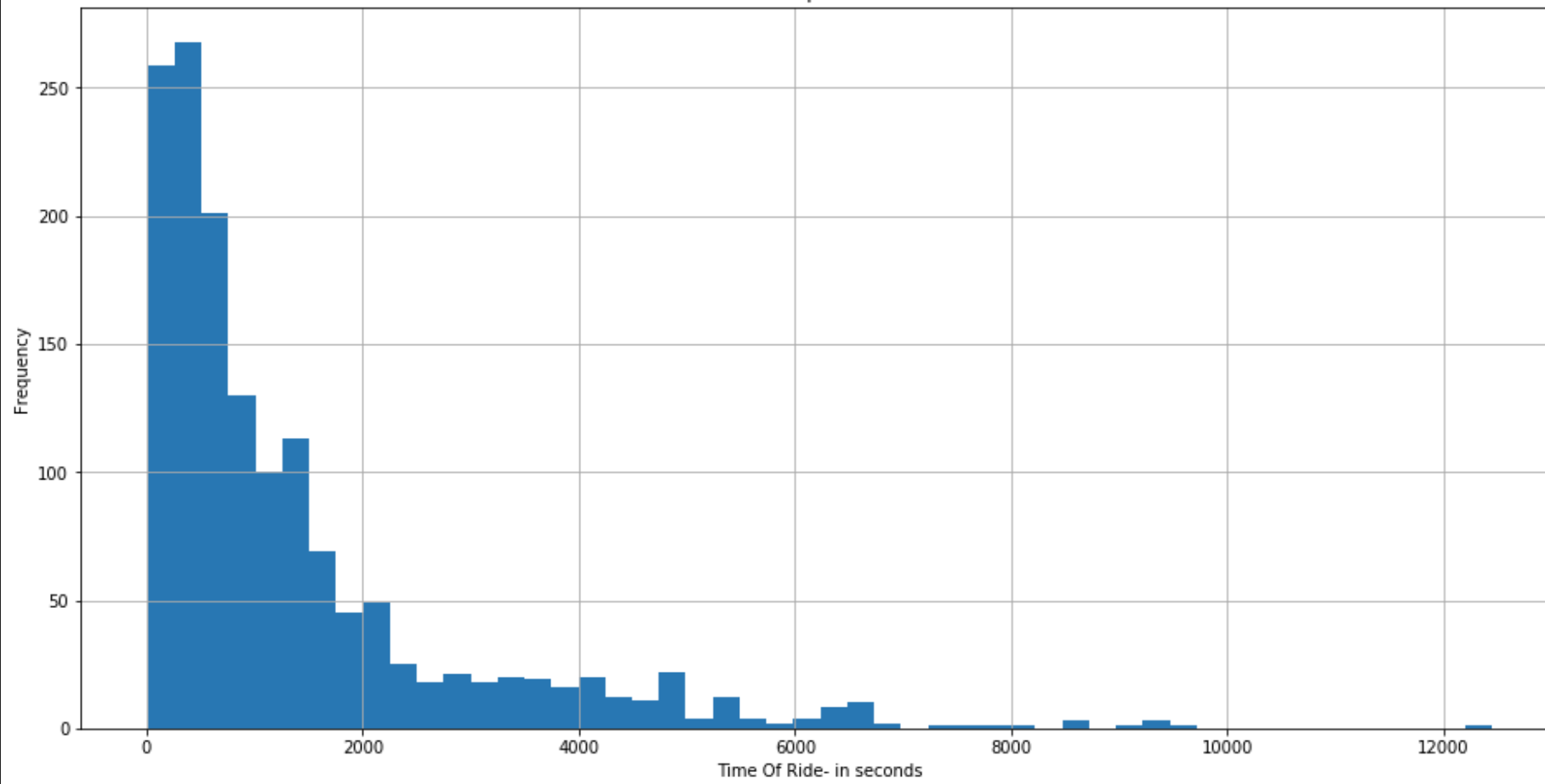
The average ride is slightly under 2km, likely riding from one station to another station



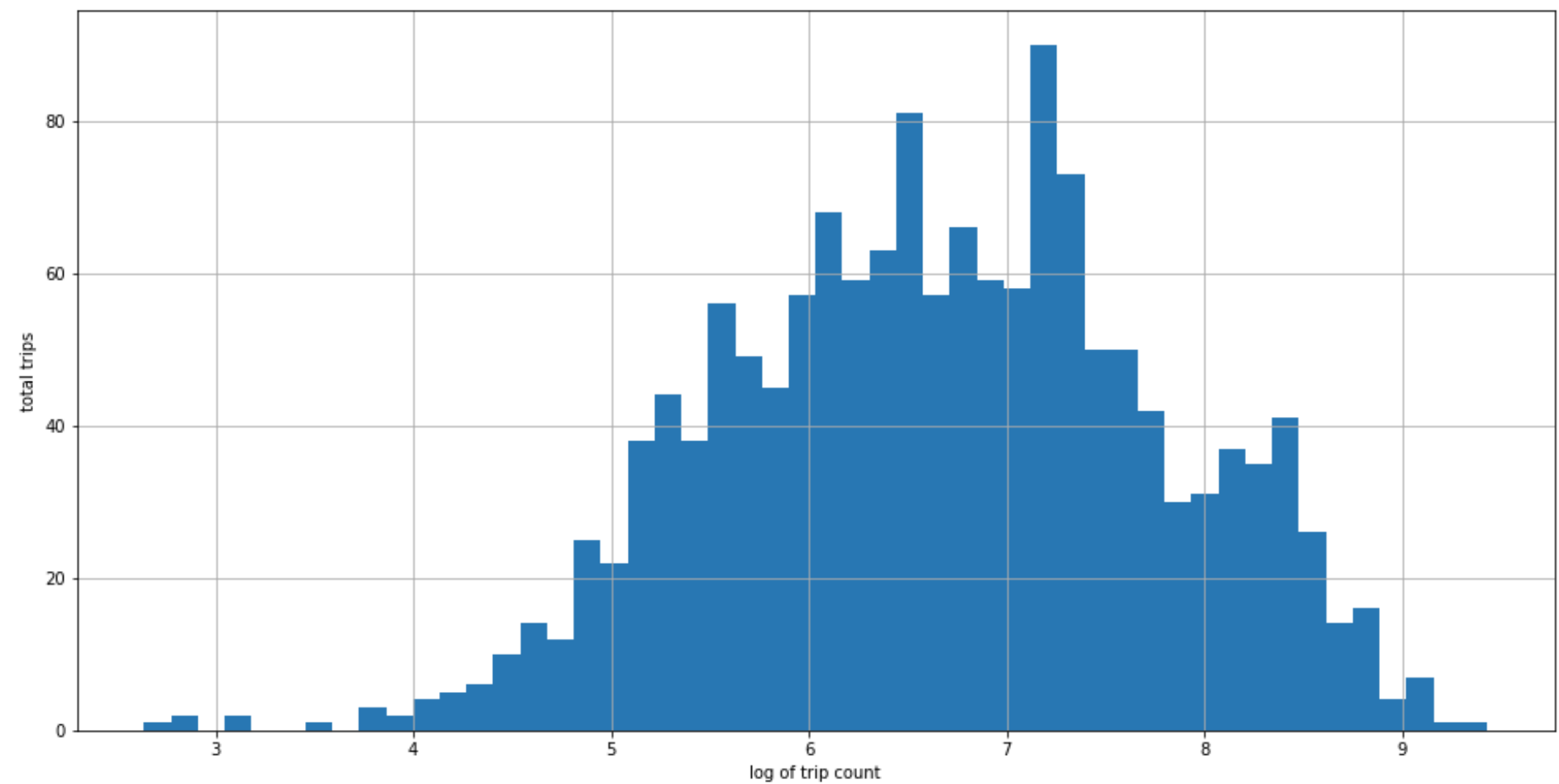
Showing high correlation with Income, Walking, Employed, Professional, Total Population, and Men



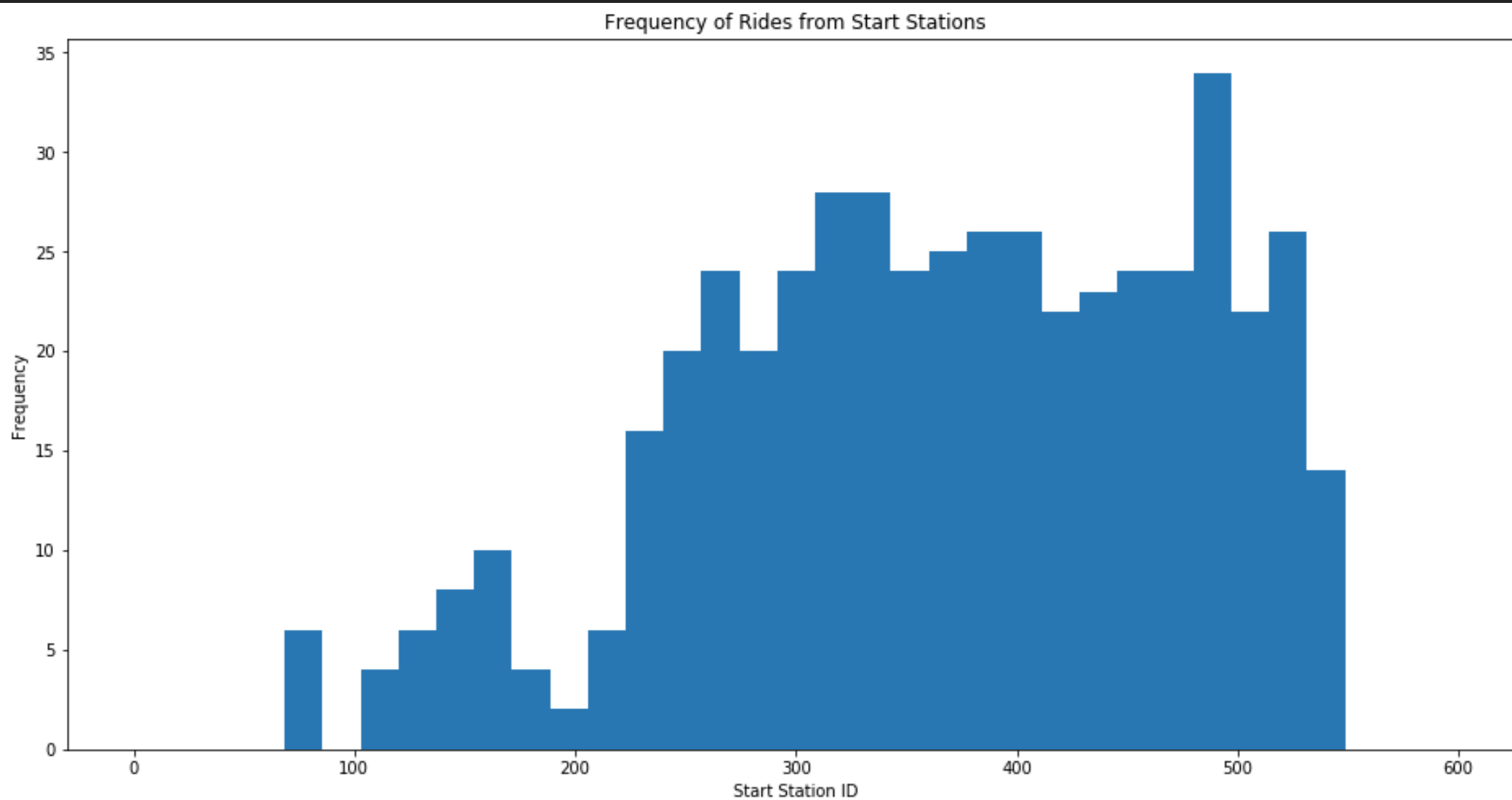
Ride Trip Duration



Uneven data shown here
so I chose to use the log
function to normalize the
data for use within my
models.

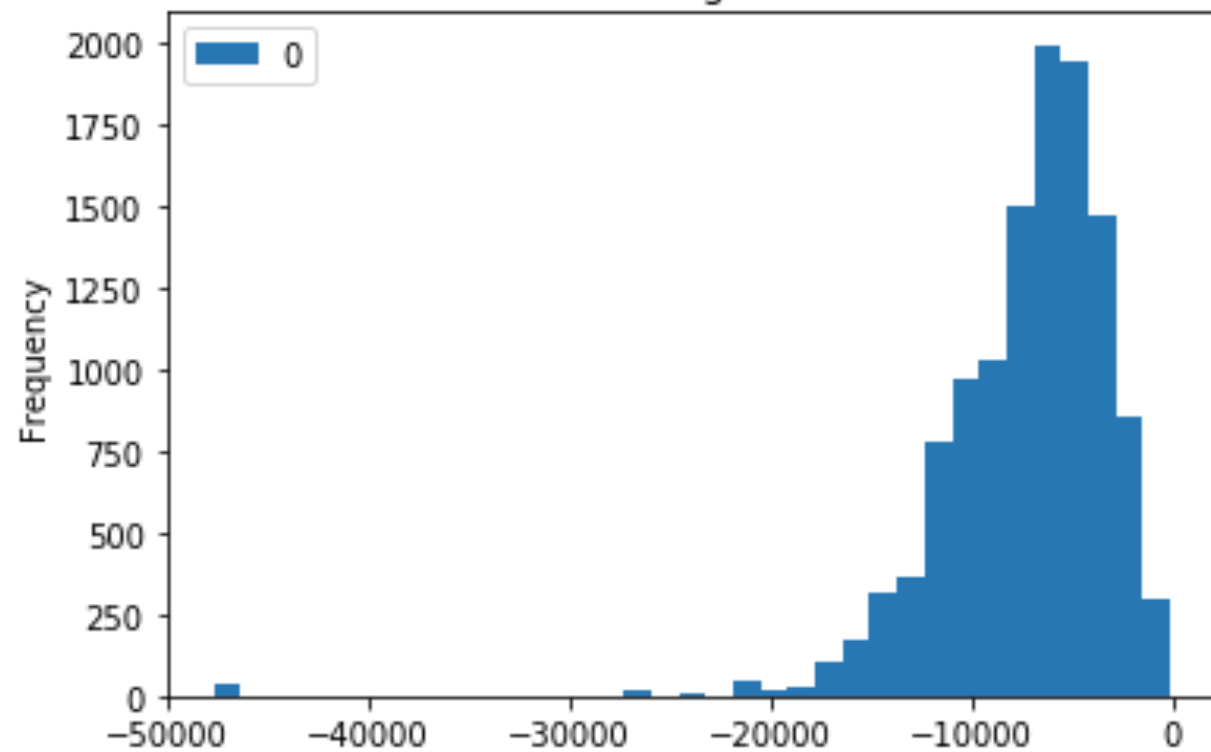


The number of rides that occur from each of the bike stations, showing the most use out of the Station ID's 300 to 500, which are mostly all in Manhattan.



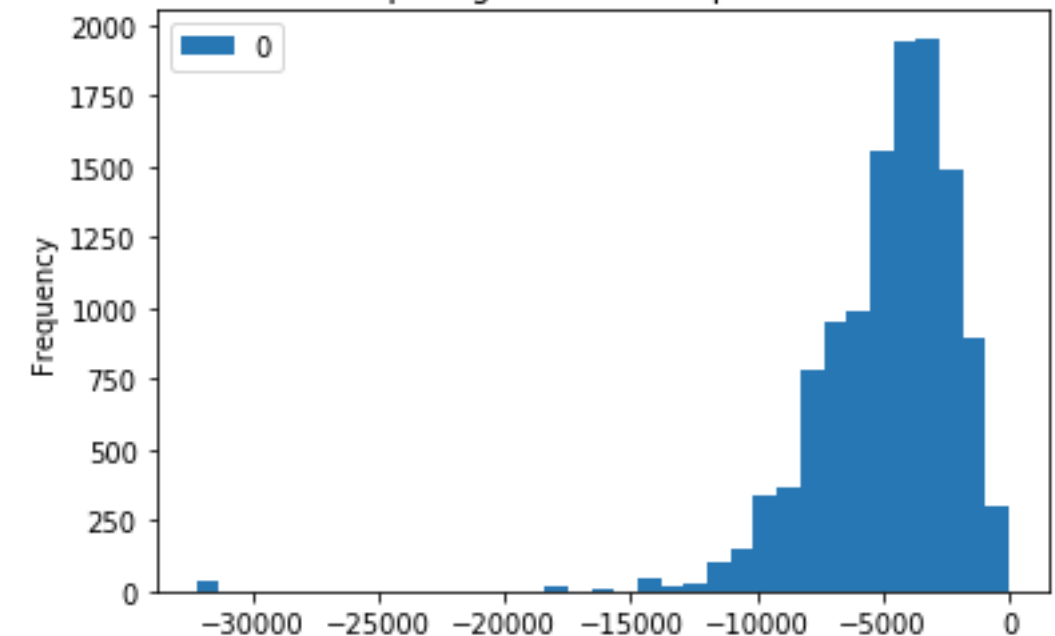
Used both Linear Regression and R-squared Linear Regression/R-square PLSR models to try and predict the most beneficial location for additional stations, however for both charts it came up negative. This could be because of using the log for the trip durations, however it did showed a 49% accuracy.

Linear Regression

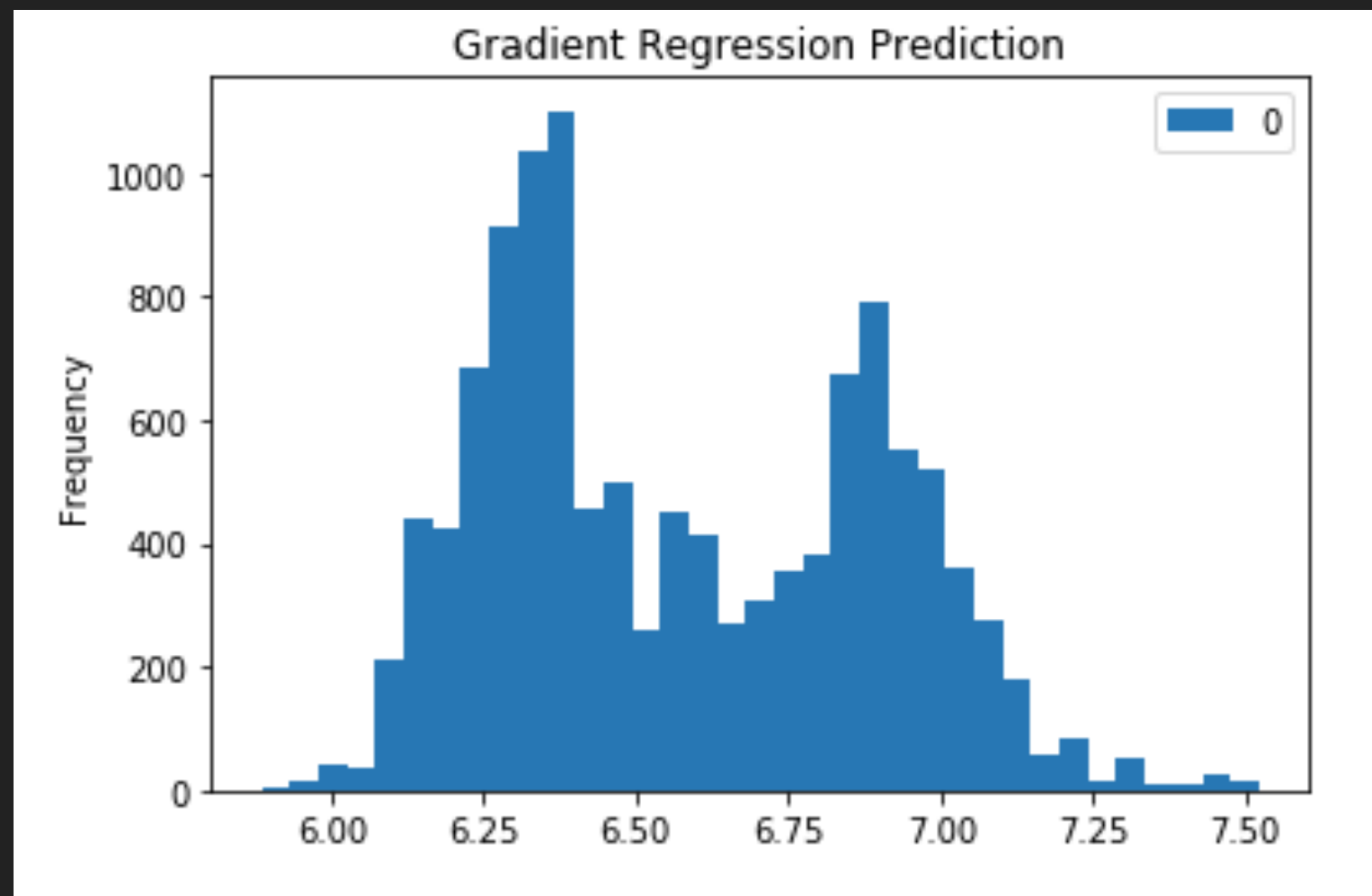


R-squared regression: 0.4910456463578624
R-squared PLSR: 0.48806498687104904

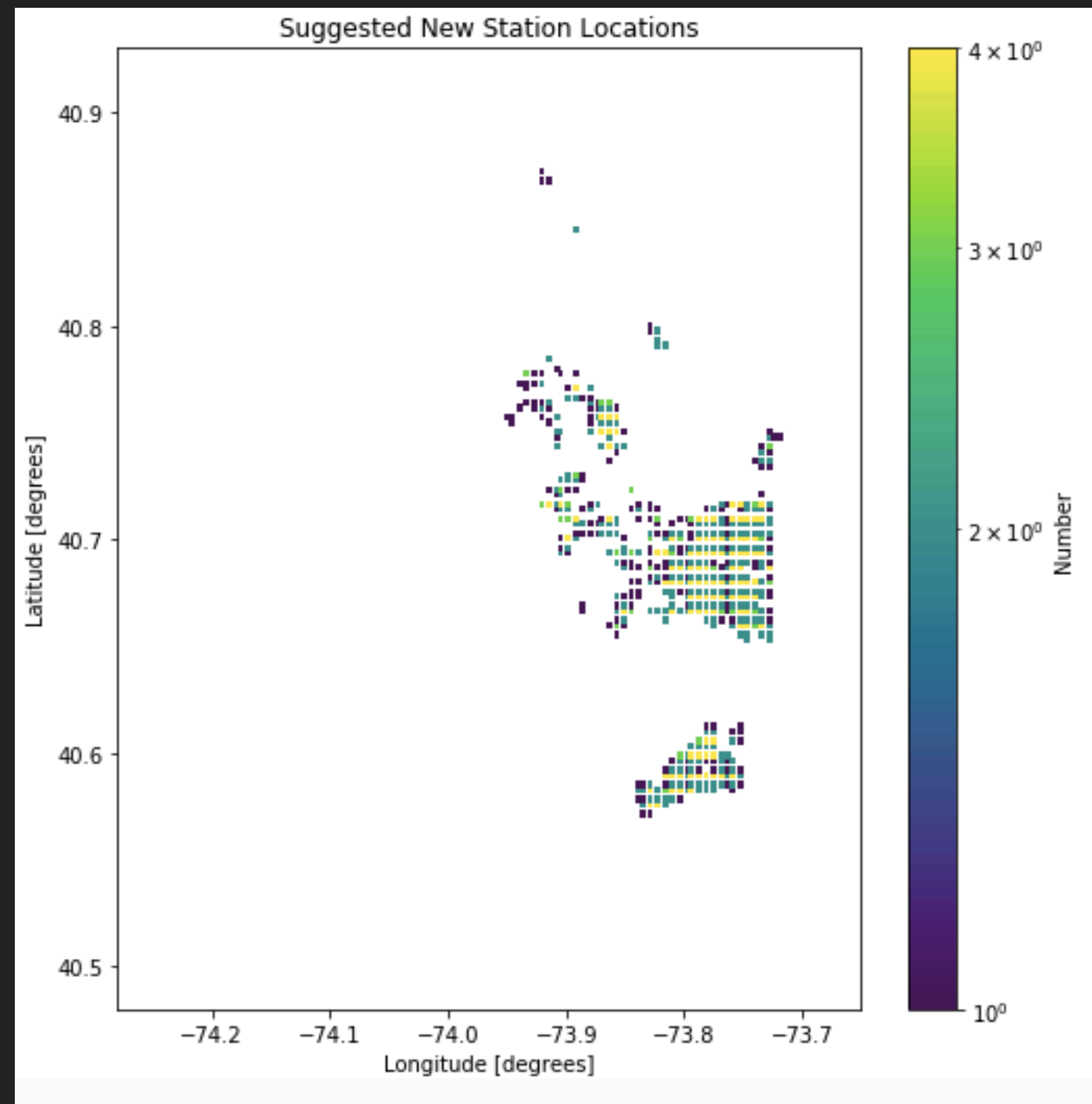
Comparing LR and PLSR predictions



Gradient Regression proved to be the most effective prediction model for this data. With this histogram it shows the ride frequency, remembering that it is raised to the 6th from the log function. The right side of the tail is showing that there is room for growth in those boroughs, looking at about 7.25 for growth options.

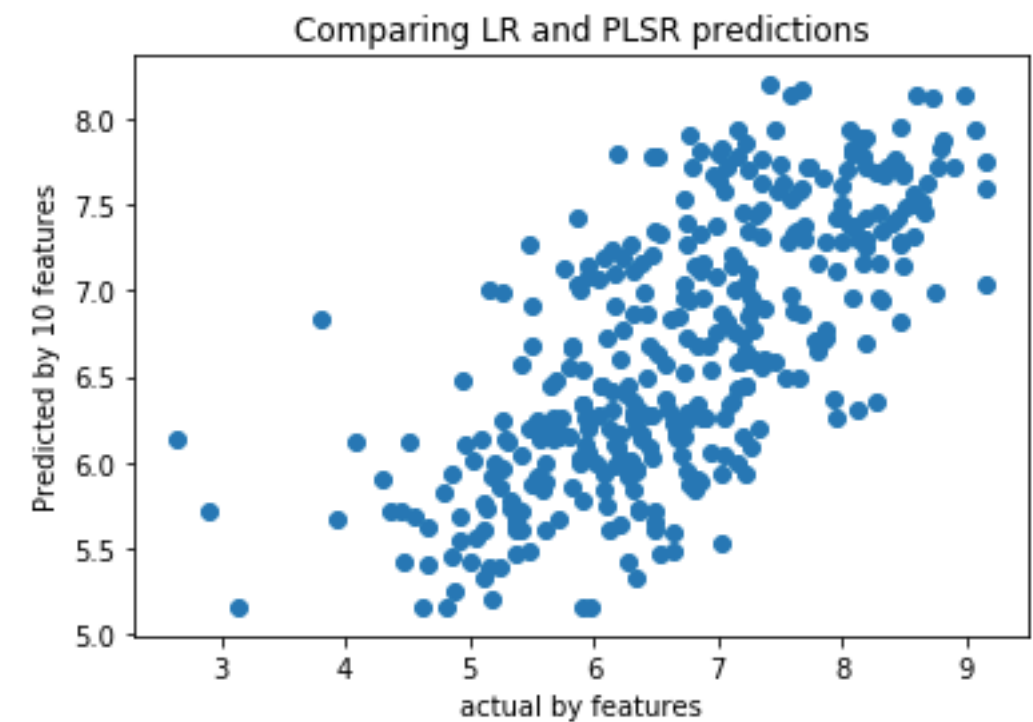


Looking at the NY Census data (including income, gender, transportation preference, work type, etc) using the location based off of latitude and longitude with a gradient regression 7.25 or higher. This map shows that all the stations will fall into the Queens Borough. The yellow dots are the locations to start with out of the 128 new suggested locations within the borough that would be the most profitable stations to start with and then add onto.



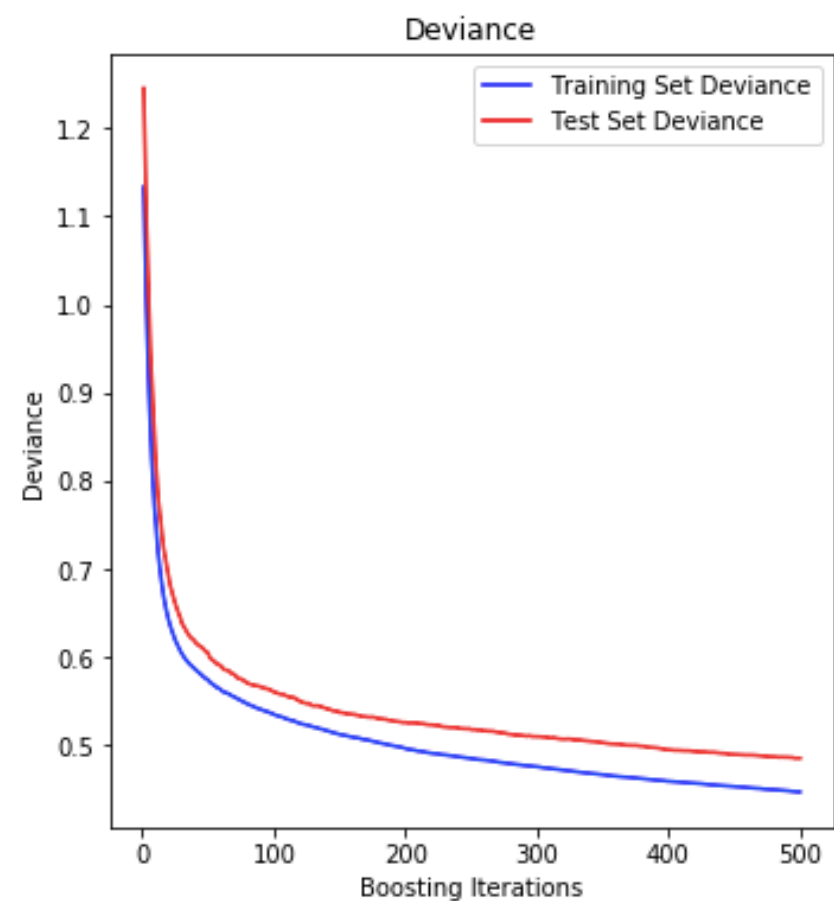
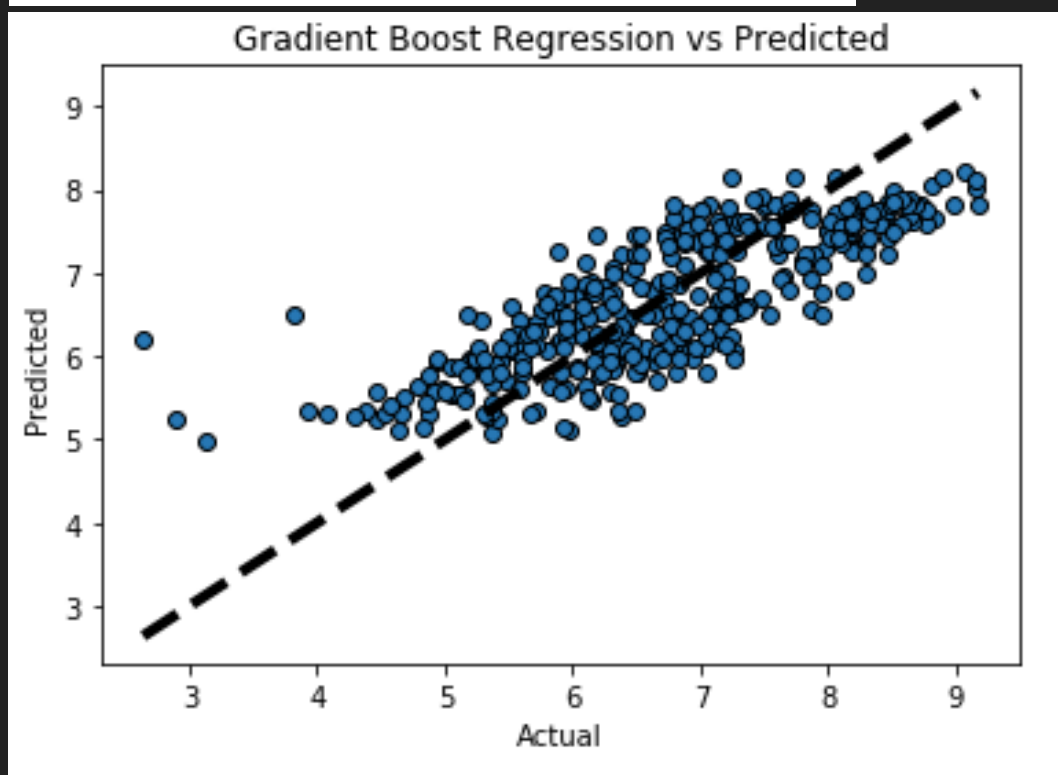
LINEAR REGRESSION & PARTIAL LEAST SQUARE REGRESSION

R-squared regression: 0.46817270419122187
R-squared PLSR: 0.46817270419122187



GRADIENT BOOST REGRESSION

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R2 sq: 0.616899545603221  
Mean squared error: 0.50  
Test Variance score: 0.62
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TEXT

RANDOM FOREST