

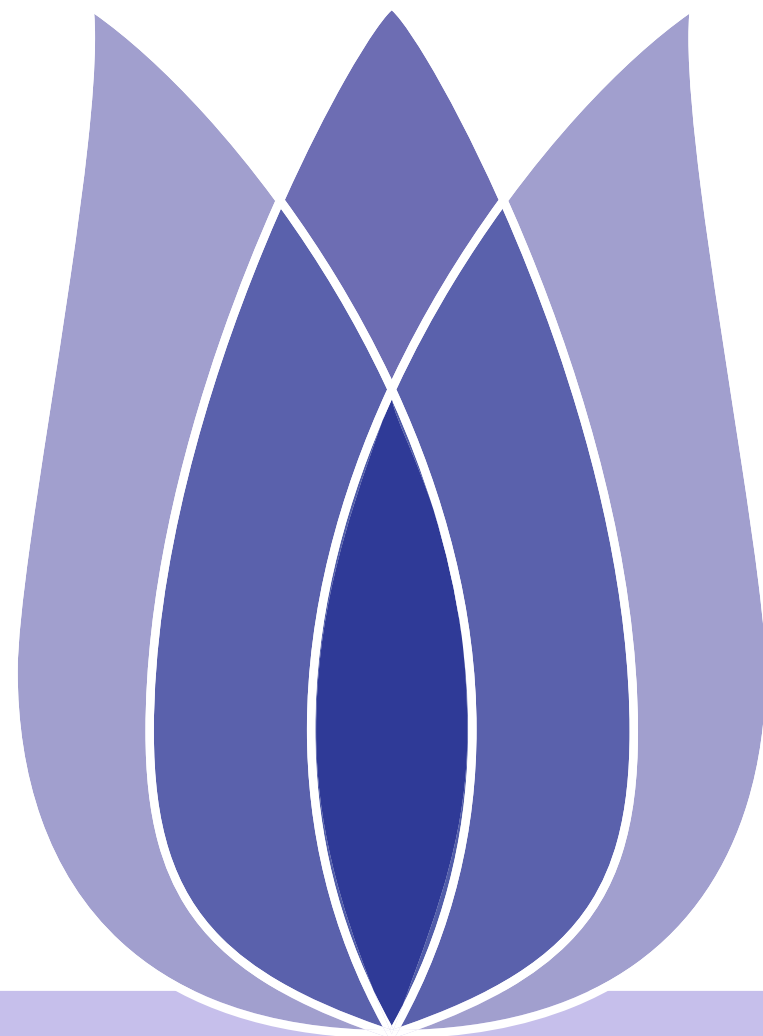
New York City Taxi Trip Duration

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Computer Science And Technology

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Data Fields for This Project

Intro

- **id, vendor_id, store_and_fwd_flag, passenger_count**
- **pickup_datetime, dropoff_datetime**
- **pickup_longitude, pickup_latitude, dropoff_longitude, dropoff_latitude**
- **trip_duration**



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Data Analysis



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train:

```
<class 'pandas.core.frame.DataFrame'>
Index: 1458644 entries, id2875421 to id1209952
Data columns (total 10 columns):
#   Column                Non-Null Count  Dtype
---  -
0   vendor_id             1458644 non-null int64
1   pickup_datetime       1458644 non-null object
2   dropoff_datetime      1458644 non-null object
3   passenger_count        1458644 non-null int64
4   pickup_longitude      1458644 non-null float64
5   pickup_latitude       1458644 non-null float64
6   dropoff_longitude     1458644 non-null float64
7   dropoff_latitude      1458644 non-null float64
8   store_and_fwd_flag    1458644 non-null object
9   trip_duration         1458644 non-null int64
dtypes: float64(4), int64(3), object(3)
memory usage: 122.4+ MB
```

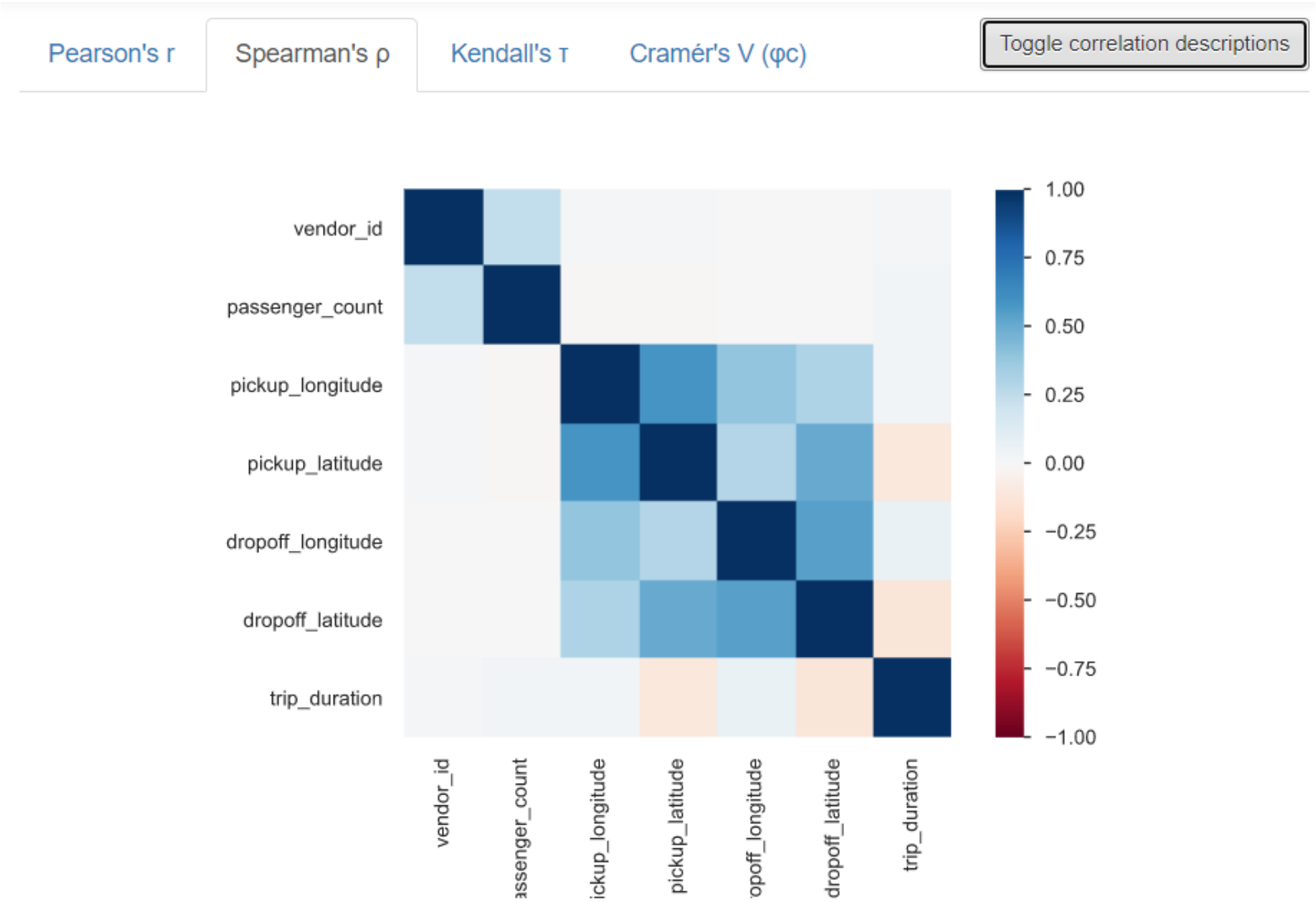
test:

```
<class 'pandas.core.frame.DataFrame'>
Index: 625134 entries, id3004672 to id0621643
Data columns (total 8 columns):
#   Column                Non-Null Count  Dtype
---  -
0   vendor_id             625134 non-null int64
1   pickup_datetime       625134 non-null object
2   passenger_count        625134 non-null int64
3   pickup_longitude      625134 non-null float64
4   pickup_latitude       625134 non-null float64
5   dropoff_longitude     625134 non-null float64
6   dropoff_latitude      625134 non-null float64
7   store_and_fwd_flag    625134 non-null object
dtypes: float64(4), int64(2), object(2)
memory usage: 42.9+ MB
```



Spearman Correlation

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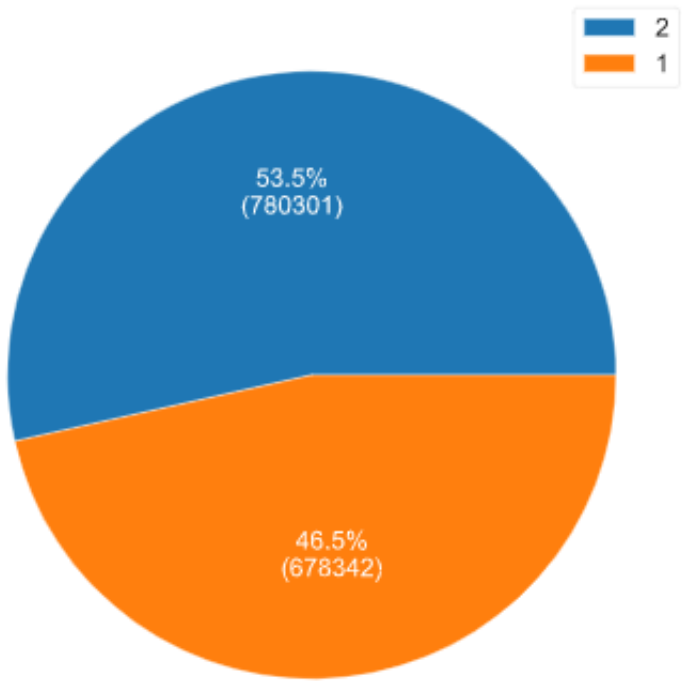




Simple Attributes

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- id:Determine the uniqueness of id
- vendor_id:
 - ◆



- ◆ Convert int64 into string



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■ store_and_fwd_flag:

■

Value	Count	Frequency (%)
False	1450599	99.4%
True	8045	0.6%

■ passenger_count:

■

```
1    1033540
2     210318
5      78088
3      59896
6      48333
4      28404
0           60
7           3
9            1
8            1
Name: passenger_count, dtype: int64
```



Complex Attributes

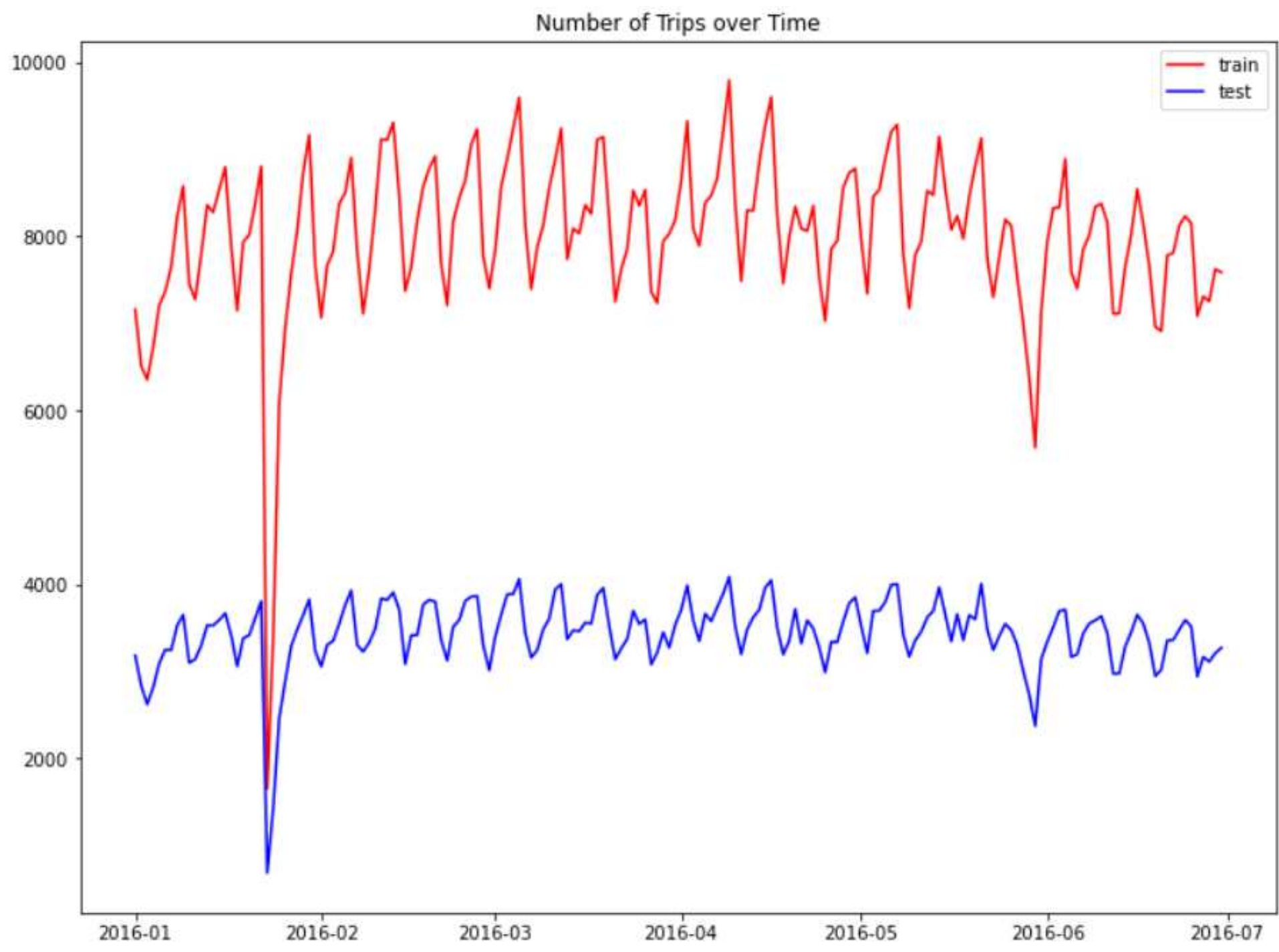
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- dropoff_datetime:
 - ◆ Only exist in test.csv
 - ◆ check `dropoff_datetime-pickup_datetime == trip_duration`
 - ◆ drop



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- pickup_datetime:
 - ◆





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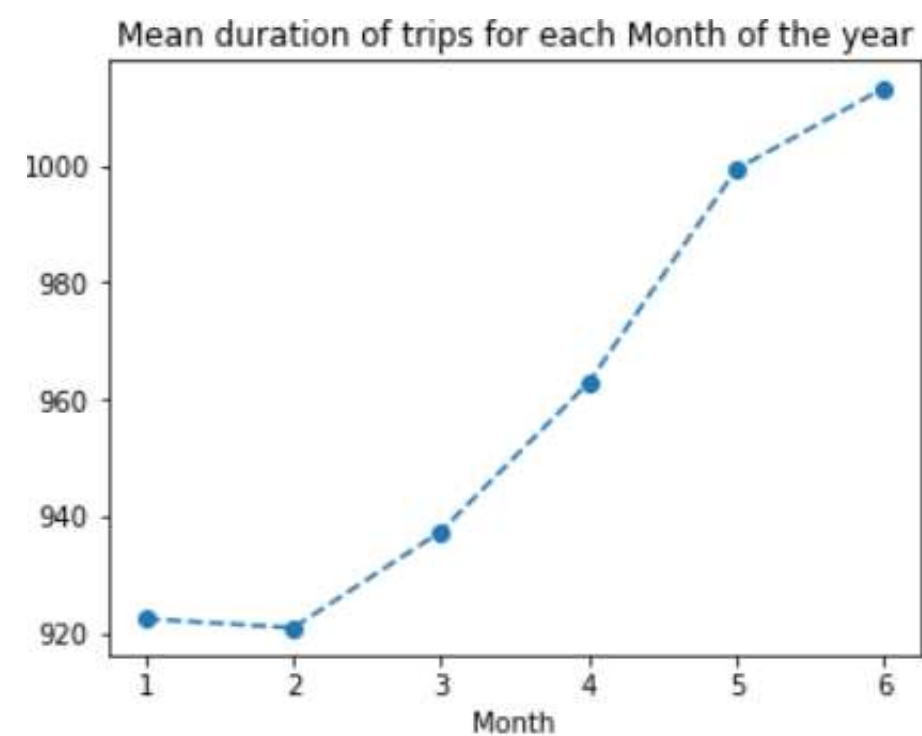
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- pickup_datetime:
 - ◆ Divide it into year, month, day, hour
 - ◆ The year is all 2016,so drop
 - ◆



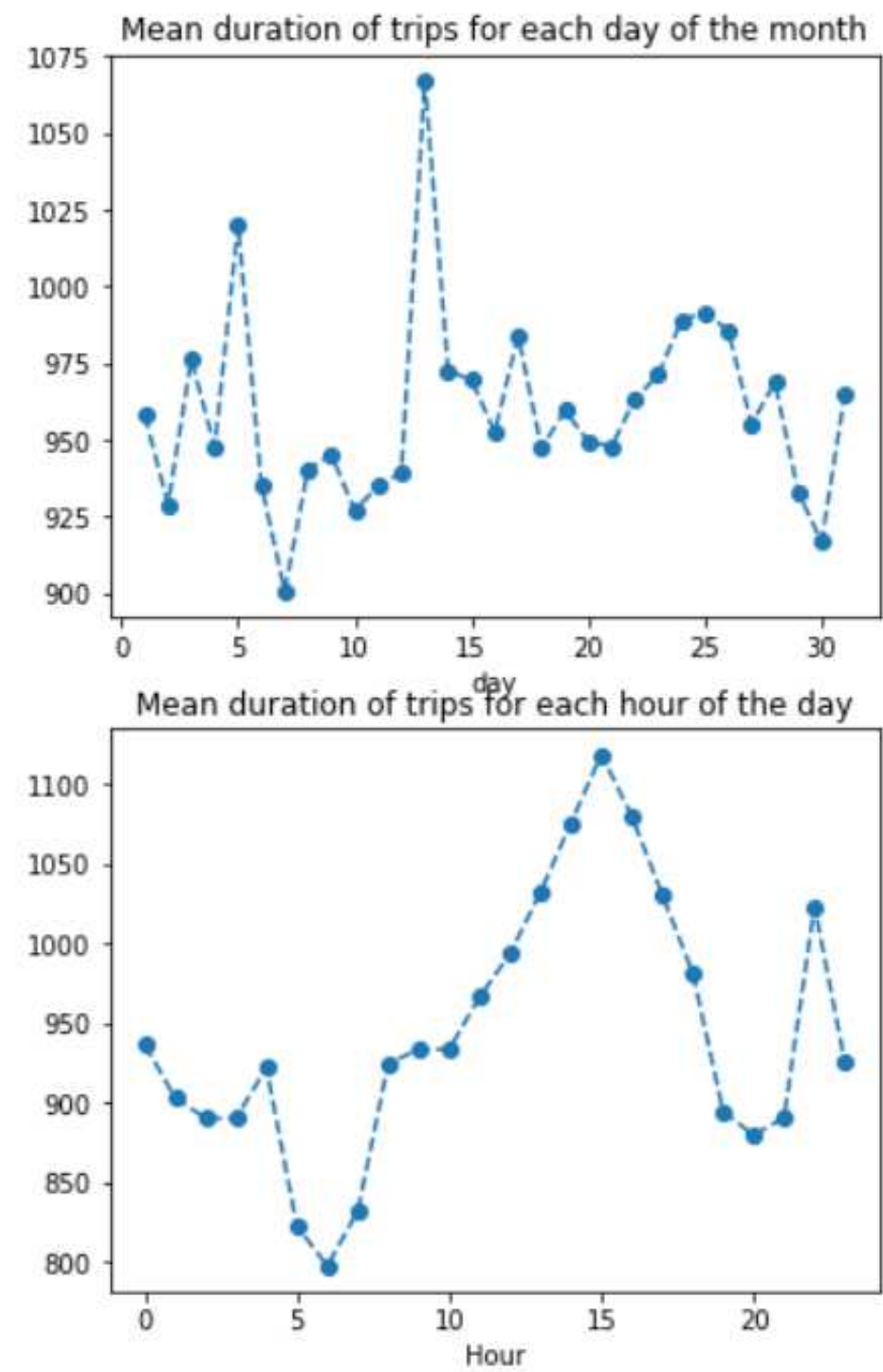
- ◆ Since only six monthes in train and test(1,2,3,4,5,6),convert the type of month into string for one-hot encoding.





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■ pickup_datetime: ◆

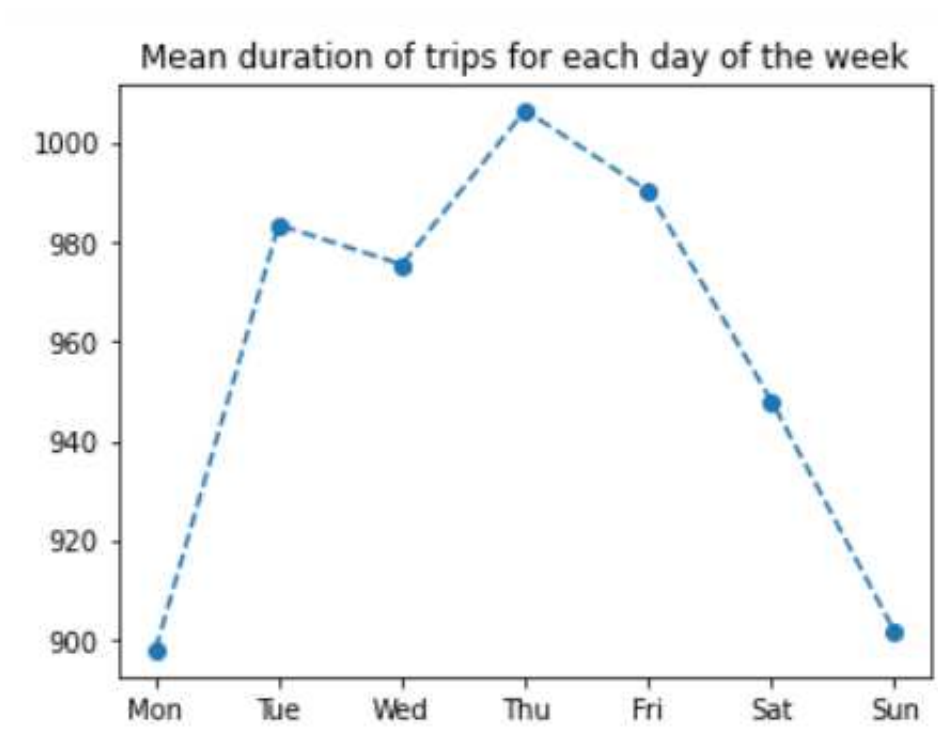


- It can be seen from the figure that the day of the month will affect the taxi trip turation.
- However,if we use one-hot enconding directly,it will cause the disaster of dimensionality.
- In term of the trip turation,we divide it into three categories.
- a:5,13 b:7,30 c:other
- The same process for the hour.
- x:0.1.2.3.4.8.9.10.19.20.21.23
- y:11.12.13.17.18.22
- z:14.15.16
- w:5,6,7



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- pickup_datetime:
 - ◆ Derive weekday from the date.
 - ◆

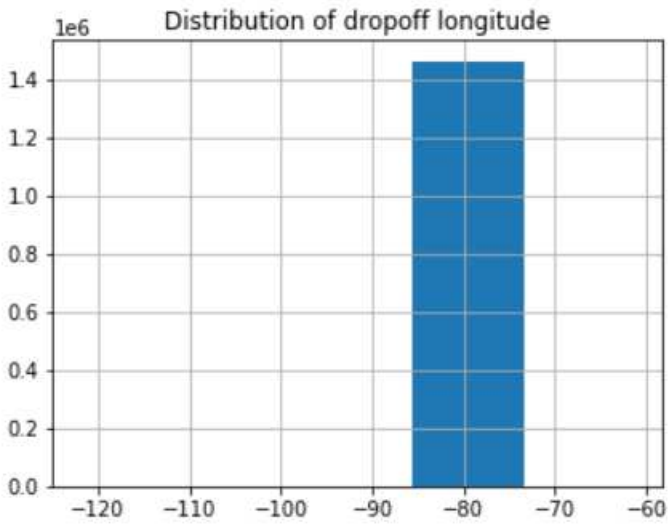
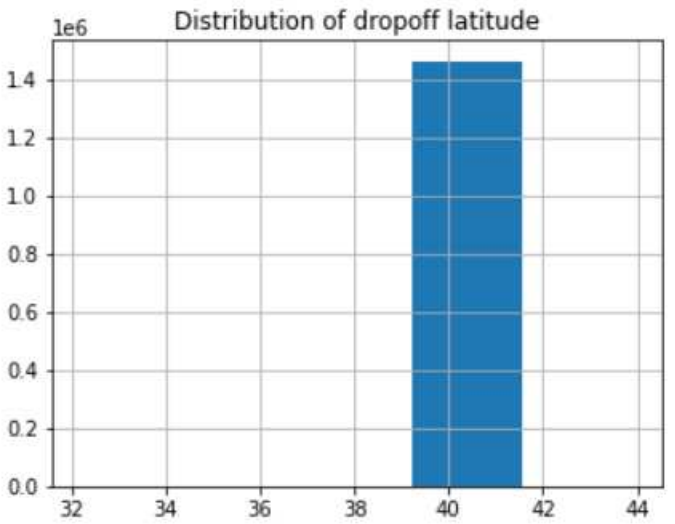
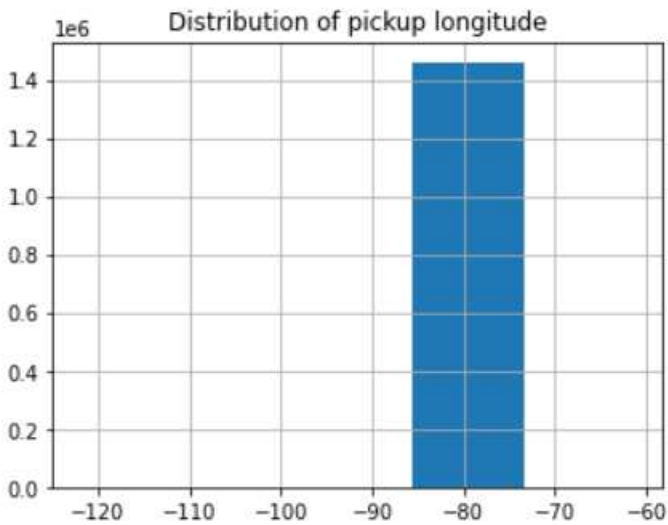
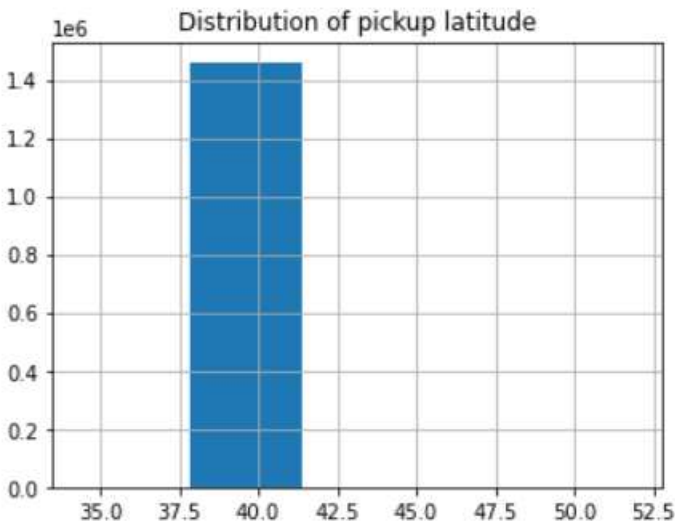


- ◆ Obviously,weekday affects the trip duration,so we add the attribute for the data.



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- latitude, longitude:
 - ◆ duration = distance / speed
 - ◆





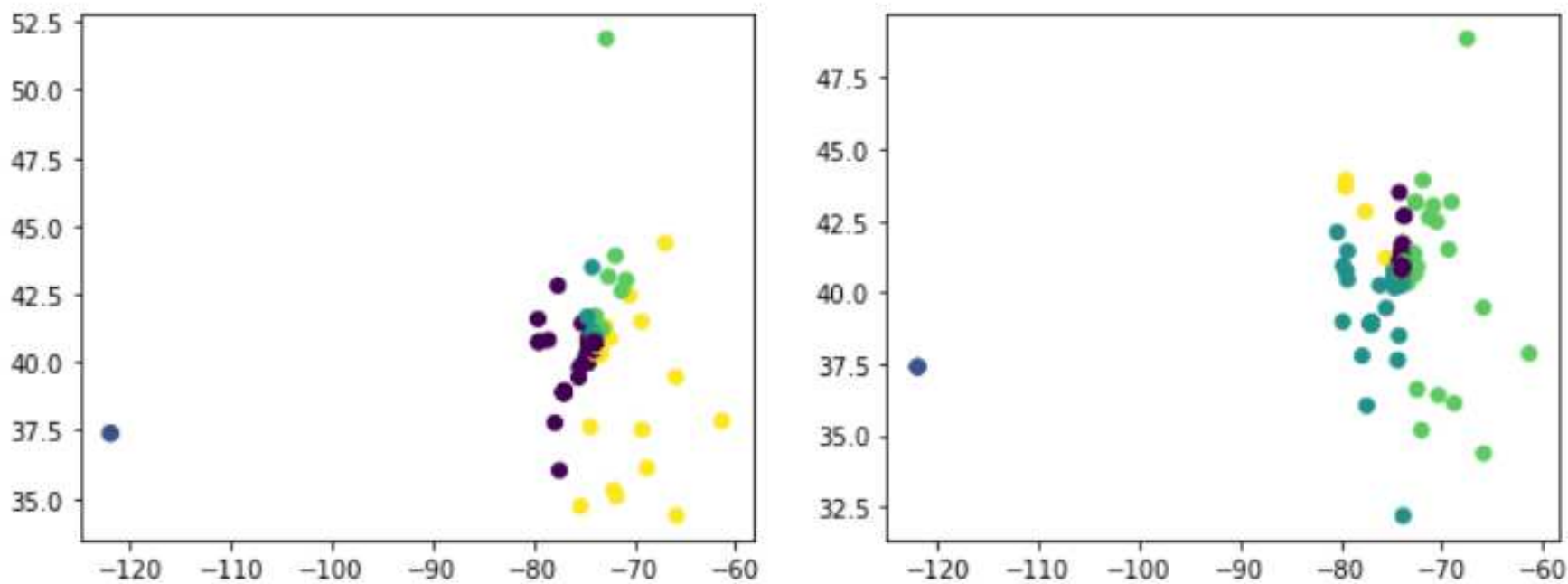
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- distance:
 - ◆ Euclidean distance
 - ◆ Manhattan distance



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- speed:
 - ◆ In term of pickup_latitude,pickup_longitude,dropoff_longitude,drop_latitude,divide data into 5 clusters by KMeans
 - ◆



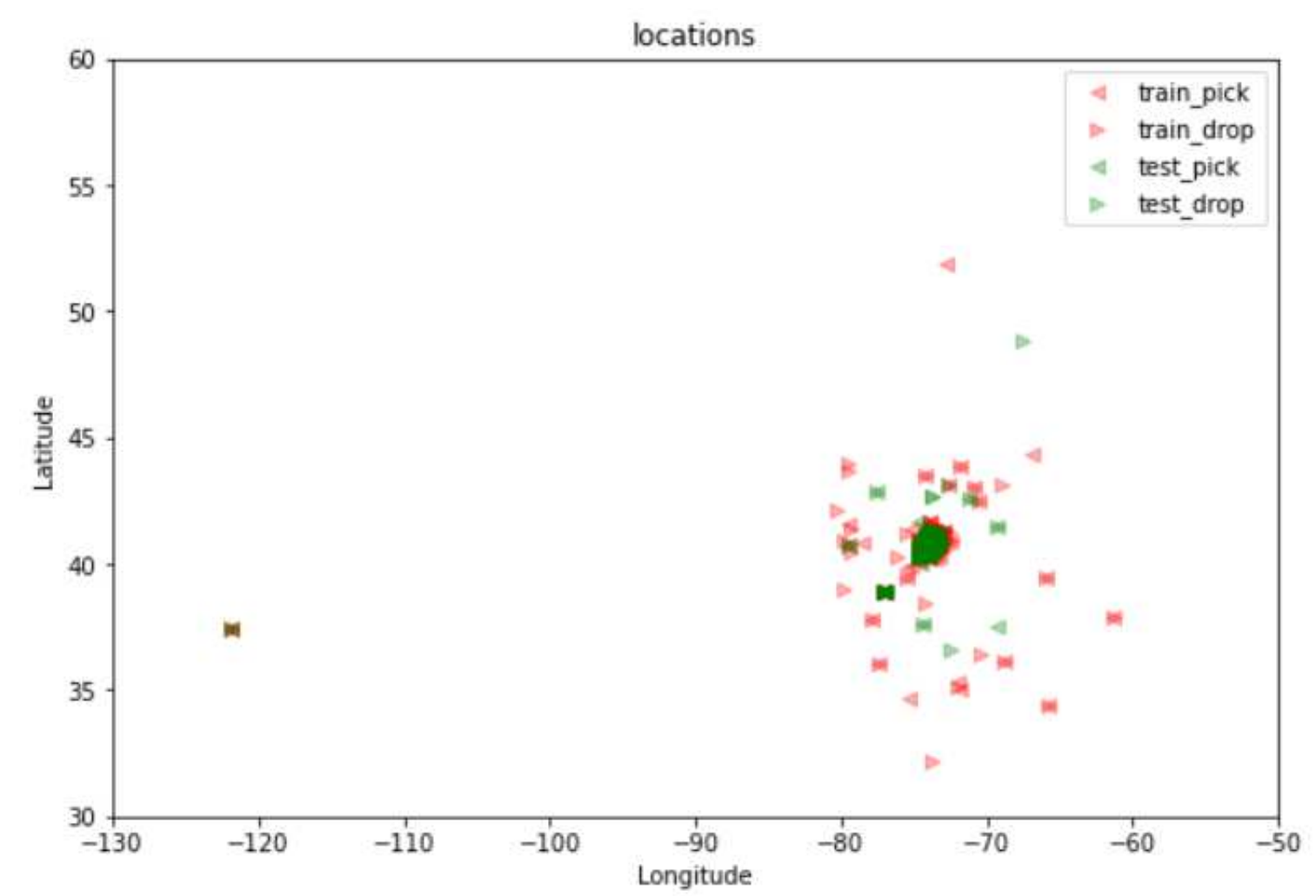
- ◆ Direction



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■ outliers:

◆



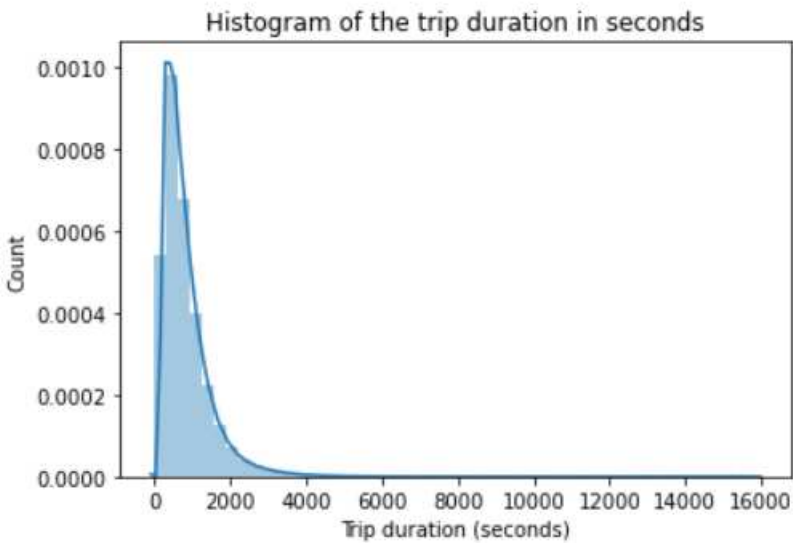
- ◆ From Google, we know New York City longitude vary from -74.03 to -73.75, and latitude vary from 40.63 to 40.85.
- ◆ In term of this, we drop outliers



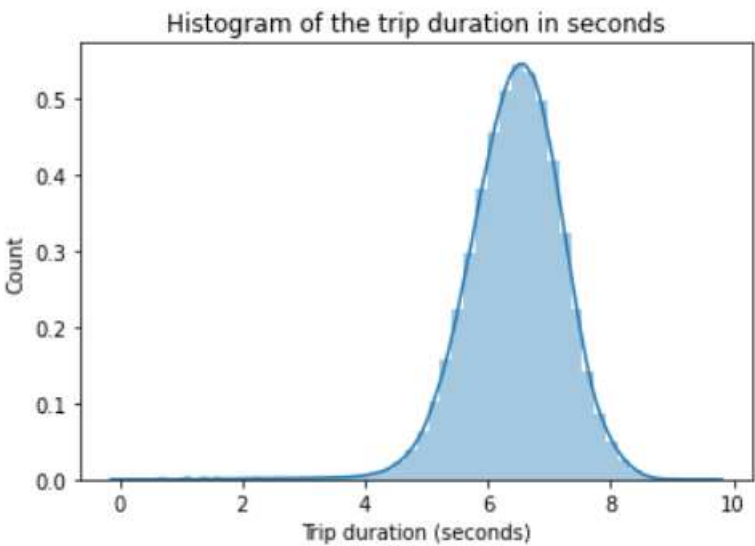
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■ trip_duration:



- ◆ Through power conversion, it is more like Gaussian distribution.
- ◆





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■ outliers:

- ◆ Trip duration varies from 1 second to 3526282 second, and there are some outliers.
- ◆ We keep the trip duration between $\text{mean} - 3 * \text{std}$ and $\text{mean} + 3 * \text{std}$. (approximately 99%)



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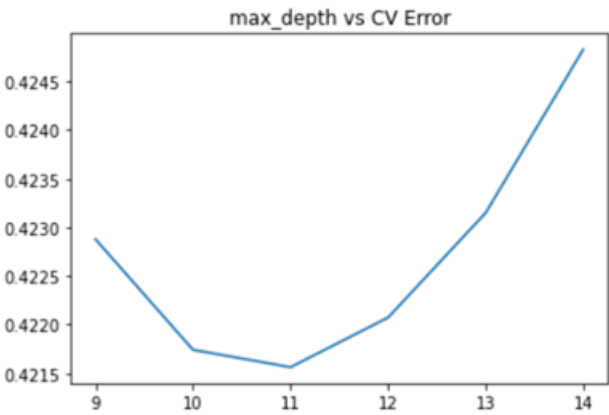
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- Models:
 - ◆ Ridge
 - ◆ Bagging
 - ◆ Boosting
 - ◆ RandomForest
 - ◆ Lightgbm
 - ◆ Xgboost

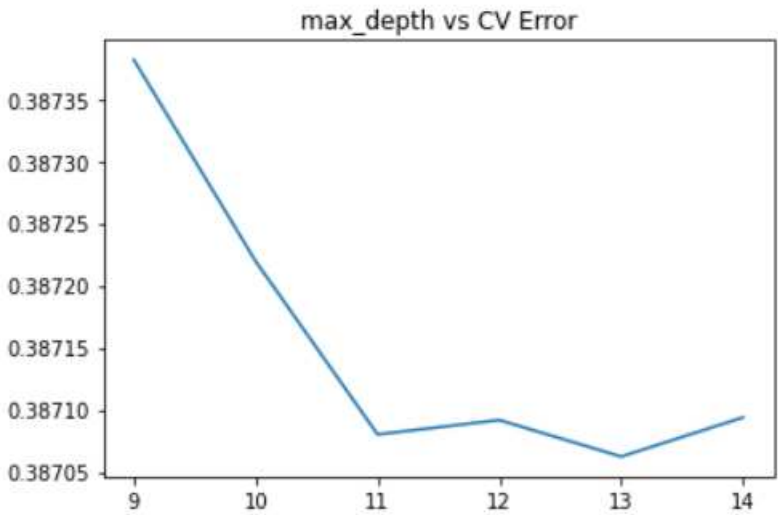


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■ Xgboost



■ Lightgbm





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results.csv	0.59486	0.59596	<input type="checkbox"/>
9 days ago by Daylight Dream			
add submission details			



results.csv	0.42527	0.42716	<input type="checkbox"/>
a day ago by Daylight Dream			
add submission details			



results.csv	0.40978	0.41166	<input type="checkbox"/>
4 hours ago by Daylight Dream			
change XGB			



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