Assignment No 7 - ML-1

October 8, 2024

#Predict the price of the Uber ride from a given pickup point to the agreed drop-off location. Perform following tasks:

- 1. Pre-process the dataset.
- 2. Identify outliers.
- 3. Check the correlation.
- 4. Implement linear regression and random forest regression models.
- 5. Evaluate the models and compare their respective scores like R2, RMSE, etc. Dataset link: https://www.kaggle.com/datasets/yasserh/uber-fares-dataset

```
[11]: #Importing the required libraries
      import pandas as pd
      import numpy as np
      import seaborn as sns
      import matplotlib.pyplot as plt
[12]: #importing the dataset
```

```
df = pd.read_csv("/home/pc13/Downloads/uber.csv")
```

1.1 1. Pre-process the dataset.

```
[4]: df.head()
        Unnamed: 0
[4]:
                                                    fare_amount
                                               key
          24238194
                      2015-05-07 19:52:06.0000003
                                                            7.5
     0
                      2009-07-17 20:04:56.0000002
                                                            7.7
     1
          27835199
                                                           12.9
     2
          44984355
                     2009-08-24 21:45:00.00000061
     3
          25894730
                      2009-06-26 08:22:21.0000001
                                                            5.3
          17610152 2014-08-28 17:47:00.000000188
                                                           16.0
                pickup_datetime
                                 pickup_longitude
                                                    pickup_latitude
       2015-05-07 19:52:06 UTC
                                        -73.999817
                                                          40.738354
     1 2009-07-17 20:04:56 UTC
                                        -73.994355
                                                          40.728225
     2 2009-08-24 21:45:00 UTC
                                        -74.005043
                                                          40.740770
     3 2009-06-26 08:22:21 UTC
                                        -73.976124
                                                          40.790844
     4 2014-08-28 17:47:00 UTC
                                        -73.925023
                                                          40.744085
```

```
0
               -73.999512
                                  40.723217
     1
               -73.994710
                                  40.750325
                                                            1
     2
               -73.962565
                                  40.772647
                                                            1
     3
               -73.965316
                                  40.803349
                                                            3
               -73.973082
                                  40.761247
                                                           5
[5]: df.info() #To get the required information of the dataset
    <class 'pandas.core.frame.DataFrame'>
    RangeIndex: 200000 entries, 0 to 199999
    Data columns (total 9 columns):
         Column
                            Non-Null Count
                                              Dtype
         ____
                            _____
                                              ____
     0
         Unnamed: 0
                            200000 non-null int64
     1
                            200000 non-null object
         key
     2
                            200000 non-null float64
         fare_amount
     3
         pickup_datetime
                            200000 non-null object
         pickup_longitude
     4
                            200000 non-null float64
     5
         pickup_latitude
                            200000 non-null float64
         dropoff longitude
                            199999 non-null float64
     6
     7
         dropoff_latitude
                            199999 non-null float64
         passenger_count
                            200000 non-null
                                             int64
    dtypes: float64(5), int64(2), object(2)
    memory usage: 13.7+ MB
[6]: df.columns #TO get number of columns in the dataset
[6]: Index(['Unnamed: 0', 'key', 'fare_amount', 'pickup_datetime',
            'pickup_longitude', 'pickup_latitude', 'dropoff_longitude',
            'dropoff_latitude', 'passenger_count'],
           dtype='object')
[7]: df = df.drop(['Unnamed: 0', 'key'], axis= 1) #To drop unnamed column as it_
      ⇒isn't required
[8]: df.head()
[8]:
                                              pickup_longitude pickup_latitude \
        fare_amount
                             pickup_datetime
     0
                     2015-05-07 19:52:06 UTC
                                                    -73.999817
                7.5
                                                                       40.738354
     1
                7.7 2009-07-17 20:04:56 UTC
                                                    -73.994355
                                                                       40.728225
     2
               12.9
                     2009-08-24 21:45:00 UTC
                                                    -74.005043
                                                                       40.740770
     3
                     2009-06-26 08:22:21 UTC
                                                    -73.976124
                                                                       40.790844
     4
               16.0
                    2014-08-28 17:47:00 UTC
                                                    -73.925023
                                                                       40.744085
        dropoff_longitude dropoff_latitude passenger_count
     0
               -73.999512
                                  40.723217
                                                            1
```

dropoff_latitude passenger_count

dropoff_longitude

```
1
                -73.994710
                                    40.750325
                                                             1
      2
                -73.962565
                                    40.772647
                                                              1
      3
                -73.965316
                                    40.803349
                                                              3
      4
                                                             5
                -73.973082
                                    40.761247
 [9]: df.shape #To get the total (Rows, Columns)
 [9]: (200000, 7)
[10]: df.dtypes #To get the type of each column
[10]: fare amount
                           float64
      pickup_datetime
                            object
      pickup_longitude
                           float64
      pickup_latitude
                           float64
      dropoff_longitude
                           float64
      dropoff_latitude
                           float64
      passenger_count
                              int64
      dtype: object
 []: df.info()
     <class 'pandas.core.frame.DataFrame'>
     RangeIndex: 200000 entries, 0 to 199999
     Data columns (total 7 columns):
          Column
                              Non-Null Count
                                               Dtype
                              _____
          _____
      0
          fare_amount
                              200000 non-null
                                               float64
      1
          pickup_datetime
                              200000 non-null
                                               object
      2
          pickup_longitude
                              200000 non-null
                                               float64
      3
                              200000 non-null
                                               float64
          pickup_latitude
      4
          dropoff_longitude
                              199999 non-null
                                               float64
                              199999 non-null
          dropoff_latitude
                                               float64
          passenger_count
                              200000 non-null
                                               int64
     dtypes: float64(5), int64(1), object(1)
     memory usage: 10.7+ MB
 []: df.describe() #To get statistics of each columns
 []:
                            pickup_longitude
                                              pickup_latitude
                                                                dropoff_longitude \
               fare_amount
             200000.000000
                                200000.000000
                                                 200000.000000
                                                                     199999.000000
      count
                 11.359955
                                   -72.527638
                                                     39.935885
                                                                        -72.525292
     mean
      std
                  9.901776
                                    11.437787
                                                      7.720539
                                                                         13.117408
     min
                -52.000000
                                 -1340.648410
                                                    -74.015515
                                                                      -3356.666300
      25%
                  6.000000
                                   -73.992065
                                                     40.734796
                                                                        -73.991407
      50%
                  8.500000
                                   -73.981823
                                                                        -73.980093
                                                     40.752592
```

40.767158

-73.963658

-73.967154

75%

12,500000

```
dropoff_latitude
                               passenger_count
               199999.000000
                                 200000.000000
     count
                   39.923890
                                      1.684535
    mean
     std
                    6.794829
                                      1.385997
    min
                 -881.985513
                                      0.00000
     25%
                   40.733823
                                      1.000000
     50%
                   40.753042
                                      1.000000
     75%
                   40.768001
                                      2.000000
                  872.697628
                                    208.000000
     max
    1.1.1 Filling Missing values
[]: df.isnull().sum()
[]: fare_amount
                           0
     pickup_datetime
                           0
    pickup_longitude
                           0
    pickup_latitude
                           0
     dropoff_longitude
                           1
     dropoff_latitude
                           1
     passenger_count
                           0
     dtype: int64
[]: df['dropoff latitude'].fillna(value=df['dropoff latitude'].mean(),inplace = []
     df['dropoff_longitude'].fillna(value=df['dropoff_longitude'].median(),inplace =__
      →True)
[]: df['dropoff_latitude']
[]: 0
               40.723217
     1
               40.750325
     2
               40.772647
               40.803349
     3
     4
               40.761247
     199995
               40.740297
     199996
               40.739620
     199997
               40.692588
     199998
               40.695415
     199999
               40.768793
     Name: dropoff_latitude, Length: 200000, dtype: float64
[]: df.head(10)
```

57.418457

1644.421482

1153.572603

499.000000

max

```
[]:
                              pickup_datetime
        fare_amount
                                               pickup_longitude pickup_latitude \
                     2015-05-07 19:52:06 UTC
                                                      -73.999817
                                                                         40.738354
                7.5
                     2009-07-17 20:04:56 UTC
     1
                7.7
                                                      -73.994355
                                                                         40.728225
     2
               12.9
                     2009-08-24 21:45:00 UTC
                                                      -74.005043
                                                                         40.740770
     3
                5.3
                     2009-06-26 08:22:21 UTC
                                                      -73.976124
                                                                         40.790844
     4
               16.0
                     2014-08-28 17:47:00 UTC
                                                      -73.925023
                                                                         40.744085
     5
                4.9
                     2011-02-12 02:27:09 UTC
                                                      -73.969019
                                                                         40.755910
               24.5
     6
                     2014-10-12 07:04:00 UTC
                                                      -73.961447
                                                                         40.693965
     7
                2.5
                     2012-12-11 13:52:00 UTC
                                                        0.000000
                                                                          0.000000
                     2012-02-17 09:32:00 UTC
                                                      -73.975187
     8
                9.7
                                                                         40.745767
     9
               12.5
                     2012-03-29 19:06:00 UTC
                                                      -74.001065
                                                                         40.741787
        dropoff_longitude
                            dropoff_latitude
                                              passenger_count
     0
               -73.999512
                                   40.723217
     1
               -73.994710
                                   40.750325
                                                             1
     2
               -73.962565
                                   40.772647
                                                             1
     3
               -73.965316
                                   40.803349
                                                             3
     4
               -73.973082
                                   40.761247
                                                             5
     5
               -73.969019
                                   40.755910
                                                             1
     6
                                                             5
               -73.871195
                                   40.774297
     7
                 0.000000
                                                             1
                                    0.000000
     8
               -74.002720
                                   40.743537
                                                             1
     9
               -73.963040
                                                             1
                                   40.775012
[]: df.isnull().sum()
[]: fare_amount
                           0
     pickup_datetime
                           0
     pickup_longitude
                           0
     pickup_latitude
                           0
     dropoff longitude
                           0
     dropoff_latitude
                           0
     passenger_count
                           0
     dtype: int64
[]: df.dtypes
[]: fare amount
                           float64
     pickup_datetime
                            object
     pickup_longitude
                           float64
     pickup_latitude
                           float64
     dropoff_longitude
                           float64
     dropoff_latitude
                           float64
     passenger_count
                             int64
     dtype: object
```

1.1.2 Column pickup_datetime is in wrong format (Object). Convert it to DateTime Format

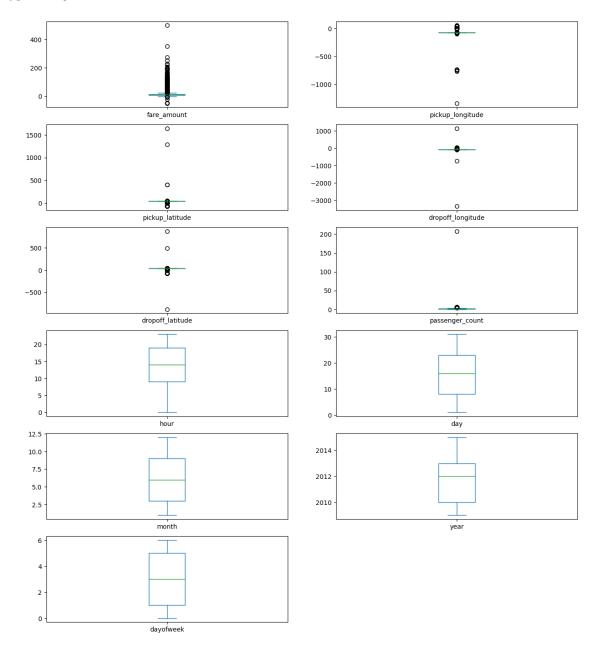
```
[]: df.pickup_datetime = pd.to_datetime(df.pickup_datetime,)
[]: df.dtypes
[]: fare_amount
                                       float64
    pickup_datetime
                          datetime64[ns, UTC]
    pickup_longitude
                                       float64
                                       float64
     pickup_latitude
     dropoff_longitude
                                       float64
     dropoff_latitude
                                       float64
     passenger_count
                                         int64
     dtype: object
    1.1.3 To segregate each time of date and time
[]: df= df.assign(hour = df.pickup_datetime.dt.hour,
                  day= df.pickup_datetime.dt.day,
                  month = df.pickup datetime.dt.month,
                  year = df.pickup_datetime.dt.year,
                  dayofweek = df.pickup_datetime.dt.dayofweek)
[]: df.head()
[]:
        fare_amount
                               pickup_datetime
                                               pickup_longitude pickup_latitude
     0
                7.5 2015-05-07 19:52:06+00:00
                                                       -73.999817
                                                                         40.738354
     1
                7.7 2009-07-17 20:04:56+00:00
                                                       -73.994355
                                                                         40.728225
     2
               12.9 2009-08-24 21:45:00+00:00
                                                      -74.005043
                                                                         40.740770
                5.3 2009-06-26 08:22:21+00:00
     3
                                                      -73.976124
                                                                         40.790844
     4
               16.0 2014-08-28 17:47:00+00:00
                                                      -73.925023
                                                                         40.744085
        dropoff_longitude
                           dropoff_latitude
                                             passenger_count
                                                                hour
                                                                      day
                                                                           month
               -73.999512
     0
                                   40.723217
                                                                  19
                                                                        7
                                                                               5
               -73.994710
                                   40.750325
                                                             1
                                                                  20
                                                                       17
                                                                               7
     1
     2
               -73.962565
                                   40.772647
                                                             1
                                                                  21
                                                                       24
                                                                               8
     3
                                                             3
                                                                               6
               -73.965316
                                   40.803349
                                                                   8
                                                                       26
     4
               -73.973082
                                   40.761247
                                                             5
                                                                       28
                                                                               8
                                                                  17
        year
              dayofweek
      2015
                      3
     1 2009
                      4
     2 2009
                      0
     3 2009
                      4
     4 2014
                      3
```

```
[]:
[]: # drop the column 'pickup daetime' using drop()
     # 'axis = 1' drops the specified column
     df = df.drop('pickup_datetime',axis=1)
[]: df.head()
[]:
        fare_amount
                     pickup_longitude
                                       pickup_latitude
                                                         dropoff_longitude
                7.5
     0
                           -73.999817
                                              40.738354
                                                                 -73.999512
     1
                7.7
                           -73.994355
                                              40.728225
                                                                 -73.994710
               12.9
     2
                           -74.005043
                                              40.740770
                                                                 -73.962565
     3
                5.3
                           -73.976124
                                              40.790844
                                                                 -73.965316
     4
               16.0
                           -73.925023
                                              40.744085
                                                                 -73.973082
        dropoff_latitude
                          passenger_count
                                           hour
                                                  day
                                                       month year
                                                                     dayofweek
     0
               40.723217
                                              19
                                                    7
                                                            5
                                                               2015
                                                                             4
     1
               40.750325
                                         1
                                              20
                                                   17
                                                            7 2009
     2
               40.772647
                                         1
                                              21
                                                              2009
                                                                             0
                                                   24
     3
               40.803349
                                         3
                                               8
                                                   26
                                                            6 2009
                                                                             4
     4
               40.761247
                                         5
                                              17
                                                   28
                                                               2014
                                                                             3
[]: df.dtypes
[]: fare amount
                          float64
     pickup_longitude
                           float64
     pickup_latitude
                          float64
     dropoff_longitude
                          float64
     dropoff_latitude
                          float64
     passenger_count
                             int64
                             int64
    hour
                             int64
     day
                             int64
     month
                             int64
     vear
     dayofweek
                             int64
     dtype: object
         Checking outliers and filling them
[]: df.plot(kind = "box", subplots = True, layout = (7,2), figsize=(15,20)) #Boxplot
      →to check the outliers
[]: fare_amount
                              Axes(0.125,0.786098;0.352273x0.0939024)
     pickup_longitude
                          Axes(0.547727,0.786098;0.352273x0.0939024)
     pickup_latitude
                              Axes(0.125,0.673415;0.352273x0.0939024)
     dropoff_longitude
                          Axes(0.547727,0.673415;0.352273x0.0939024)
```

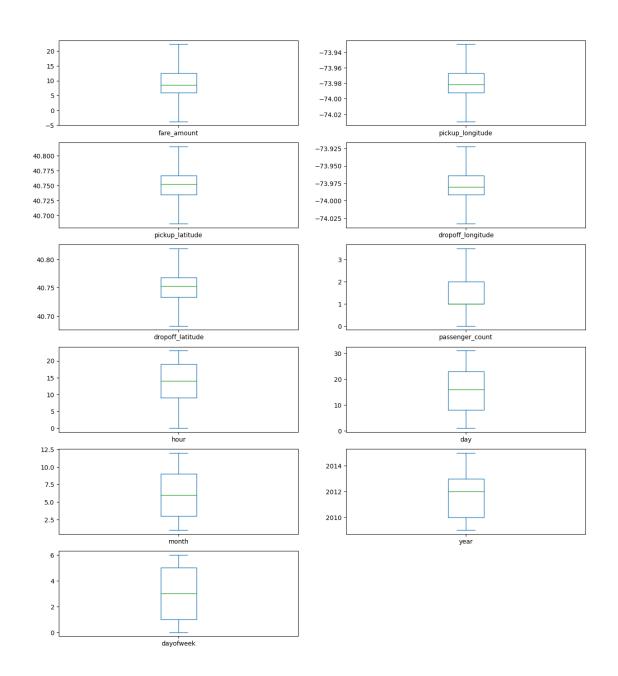
dropoff_latitude
passenger_count
hour
day
month
year
dayofweek

Axes(0.125,0.560732;0.352273x0.0939024) Axes(0.547727,0.560732;0.352273x0.0939024) Axes(0.125,0.448049;0.352273x0.0939024) Axes(0.547727,0.448049;0.352273x0.0939024) Axes(0.125,0.335366;0.352273x0.0939024) Axes(0.547727,0.335366;0.352273x0.0939024) Axes(0.125,0.222683;0.352273x0.0939024)

dtype: object



```
[]: #Using the InterQuartile Range to fill the values
     def remove_outlier(df1 , col):
         Q1 = df1[col].quantile(0.25)
         Q3 = df1[col].quantile(0.75)
         IQR = Q3 - Q1
         lower_whisker = Q1-1.5*IQR
         upper whisker = Q3+1.5*IQR
         df[col] = np.clip(df1[col] , lower_whisker , upper_whisker)
         return df1
     def treat_outliers_all(df1 , col_list):
         for c in col_list:
             df1 = remove_outlier(df , c)
         return df1
[]: df = treat_outliers_all(df , df.iloc[: , 0::])
[]: df.plot(kind = "box", subplots = True, layout = (7,2), figsize=(15,20)) #Boxplot
      ⇔shows that dataset is free from outliers
[]: fare_amount
                             Axes(0.125,0.786098;0.352273x0.0939024)
    pickup_longitude
                          Axes(0.547727,0.786098;0.352273x0.0939024)
    pickup_latitude
                             Axes(0.125,0.673415;0.352273x0.0939024)
     dropoff_longitude
                          Axes(0.547727,0.673415;0.352273x0.0939024)
     dropoff_latitude
                             Axes(0.125,0.560732;0.352273x0.0939024)
                          Axes(0.547727,0.560732;0.352273x0.0939024)
    passenger_count
                             Axes(0.125,0.448049;0.352273x0.0939024)
    hour
     day
                          Axes(0.547727,0.448049;0.352273x0.0939024)
    month
                             Axes(0.125,0.335366;0.352273x0.0939024)
                          Axes(0.547727,0.335366;0.352273x0.0939024)
    year
     dayofweek
                             Axes(0.125,0.222683;0.352273x0.0939024)
     dtype: object
```



[]: #!pip install haversine

```
loc1=(lati1,long1)
             loc2=(lati2,long2)
             c = hs.haversine(loc1,loc2)
             travel_dist.append(c)
     print(travel_dist)
     df['dist_travel_km'] = travel_dist
     df.head()
    Collecting haversine
      Downloading haversine-2.8.0-py2.py3-none-any.whl (7.7 kB)
    Installing collected packages: haversine
    Successfully installed haversine-2.8.0
    IOPub data rate exceeded.
    The notebook server will temporarily stop sending output
    to the client in order to avoid crashing it.
    To change this limit, set the config variable
    `--NotebookApp.iopub_data_rate_limit`.
    Current values:
    NotebookApp.iopub_data_rate_limit=1000000.0 (bytes/sec)
    NotebookApp.rate_limit_window=3.0 (secs)
[]:
        fare_amount pickup_longitude pickup_latitude dropoff_longitude \
     0
                7.5
                           -73.999817
                                             40.738354
                                                                -73.999512
                7.7
                                                                -73.994710
     1
                           -73.994355
                                             40.728225
     2
               12.9
                           -74.005043
                                             40.740770
                                                                -73.962565
     3
                5.3
                           -73.976124
                                             40.790844
                                                                -73.965316
     4
               16.0
                           -73.929786
                                             40.744085
                                                                -73.973082
        dropoff_latitude passenger_count hour
                                                 day
                                                      month year
                                                                    dayofweek
     0
               40.723217
                                                           5
                                                             2015
                                      1.0
                                             19
                                                                            3
     1
               40.750325
                                      1.0
                                             20
                                                  17
                                                          7 2009
                                                                            4
     2
                                                                            0
               40.772647
                                      1.0
                                             21
                                                  24
                                                           8 2009
     3
                                      3.0
                                                           6 2009
                                                                            4
               40.803349
                                              8
                                                  26
               40.761247
                                      3.5
                                             17
                                                  28
                                                           8 2014
                                                                            3
        dist_travel_km
     0
              1.683325
     1
              2.457593
     2
              5.036384
     3
              1.661686
              4.116088
[]: travel dist
```

- []: [1.6833250775073447,
 - 2.4575932783467835,
 - 5.036384146783453,
 - 1.661685753650294,
 - 4.1160881895779955,
 - 0.0,
 - 9.529776771411873,
 - 0.7719995370784762,
 - 2.3327142314177545,
 - 4.889423641655177,
 - 2.2508607308770285,
 - 0.7719995370784762,
 - 0.3022521108558365,
 - 3.5812557740132496,
 - 1.3099517093917648,
 - 1.716279792276335,
 - 0.7299665570466272,
 - 2.515953547298386,
 - 1.790321726187665,
 - 1.0347050399795192,
 - 2.4902472008677727,
 - 0.9594701844599927,
 - 1.2613897673437817,
 - 1.7517650017211177,
 - 6.1932445014761095,

 - 2.736192584061414,
 - 0.7232537124105735,
 - 3.229443537425455,
 - 1.4295172964395384,
 - 2.233699311547041,
 - 11.081439278313375,
 - 1.8950491608266506,
 - 1.9049353402365328,
 - 3.1821178242889583,
 - 4.467427177611096,
 - 2.9230236888626995,
 - 1.200213842045202,
 - 2.635790807404098,
 - 2.253613903554444,
 - 9.186987668633932,
 - 4.826533532872274,
 - 1.2502926870845612,
 - 0.7984742276755328,
 - 0.840396152683202,
 - 0.38519924001701444,
 - 2.434346176233359,
 - 3.127909533264099,

- 3.7346507724526368,
- 0.0,
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- 4.588853209670556,
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- 3.436540345098955, 0.9312765398652313,
- 0.6826715332999583,
- 0.0020715552999565
- 1.70332048812373,
- 4.8486555695047695,
- 1.5513312701575195,

- 0.6974908980076775,
- 1.8224928357945687,
- 2.8553297299716744,
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- 11.048627280431589,
- 1.2713293208229537,
- 3.331561741870138,
- 3.9625167343368672,
- 1.5497326059200096,
- 3.321773821369834,
- 2.2364969655721434,
- 3.809148114825199,
- 3.0454453670685764,
- 3.4492974348802976,
- 2.0277384242189176,
- 2.9290610134344797,
- 2.3443416255896694,
- 1.8585713607209204,
- 0.6093896212130627,
- 0.8047490492658376,
- 3.304256051582717,
- 0.9185079416078408,
- 3.5363177950907168,
- 3.0186548581069483,
- 1.2879034431578669,
- 0.31016035126772595.
- 9.589430316816125,
- 2.839134060354311,
- 0.0,
- 4.839891625106934,
- 6.884989589419282,
- 1.6212933234712446,
- 1.3404013731030586,
- 3.075714506482144,
- 4.067888171759627,
- 5.429864131246641,
- 2.479076237927193,
- 9.859757843462774,
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- 1.125851875869708,
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- 1.350391816480814,
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- 1.033316530682402,
- 5.578543275221338,
- 5.774863362904877,
- 2.090677676851702,
- 5.602092869892499.
- 4.426859137077277,
- 2.832460756471197,
- 2.0247851919397766,
- 4.0752079081654164,
- 1.6933716363352969,
- 1.7685964798353426,
- 3.2966683584597067,
- 0.6330598672139752,
- 0.6128430173625699,
- 0.9372042554319255,
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- 6.406606504026187,
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- 6.689555776387006,
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- 2.731224317059544,

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- 7.80644373034564,
- 6.354719284049434,
- 1.4245655213651893,
- 1.6023858287615176,
- 2.2352804497202703,
- 2.9886067281847546,
- 2.1394393129097398,
- 3.530043089623396,
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- 0.9090491377711108,
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- 4.586366881261418,
- 2.1023665139757393,
- 4.534256429097138,
- 1.3904209472479547,
- 0.7571467452313818,
- 5.136243742344894,
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- 3.6287690778314197,
- 0.29093105264477015,
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- 1.824288691023579,
- 4.459290972461384,
- 2.0840566460800054.
- 2.0040500400000054
- 1.5748103638724262,
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- 1.433951899799339,
- 1.2418717726238544,
- 2.2232635821474296,
- 2.74312403285971,
- 1.396495653062777,
- 0.7533563429767167,
- 1.918366338563976,
- 3.276090734545401,

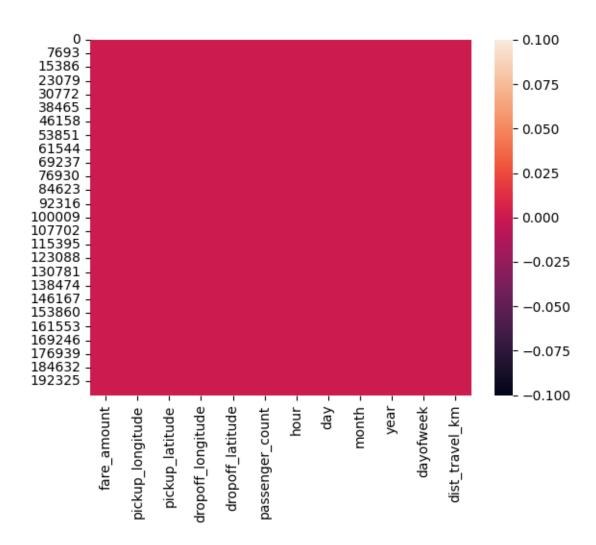
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- 1.1815959751383016,
- 1.75364153968604,
- 0.7402785252804821,
- 2.4152364904704666,
- 0.958111361314147,
- 1.3539310414657006,
- 3.2411526012417027,
- 4.66093964473386,
- 0.6784269362697066,
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- 1.5729504646537178,
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- 1.0194462591538884,
- 0.2673044885838518,
- 1.4923319965749529,
- 1.7413080398998093,
- 1.4677377563732839,
- 2.114199690018914,
- 6.300863261137619,
- 5.398460357329391,
- 4.857843833938755,
- 4.410081739428757,
- 1.984787243886089,
- 1.1980500351934138,
- 7.397915631399255,
- 5.046197411642443,
- 0.9298059679606306,
- 4.708010402865085,
- 0.36597878731840056,
- 3.8098111050268852,
- 8.715214331333861,
- 4.755259017839335,
- 2.101033210408425,
- 1.7796155439711778,
- 1.2416116683275618,
- 1.9655005971330346,
- 0.044975441822248746,
- 0.68184564424943,
- 1.7351825105424725,
- 0.7426908936122262,
- 4.94680694085774,
- 1.2615669163699652,
- 2.3497105174371966,

- 7.26529266859538,
- 5.460809036483912,
- 6.818246737854603,
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- 2.3763138233998538,
- 1.2398187111762753,
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- 3.8766178679922474,
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- 1.5771435499248874,
- 1.4710299431608118.
- 2.2043613706362843,
- 4.014265396642929,
- 2.444316628523308,
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- 3.209033024155447,
- 6.1923121478466925,
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- 1.7046039223136809,
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- 1.153296505750822,
- 10.225242339322417,
- 1.9894121213893767,
- 3.512904476068075,
- 3.792825880046498,
- 2.956198730866217,
- 2.229959454641979,
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- 8.469000313782255,
- 1.7229164226352438,
- 0.3499243531594926,
- 5.0716600856411285,
- 4.088464938992787,
- 5.908508133967225,
- ----
- 2.9518125984276957,
- 1.9424496727134426,
- 1.1476506080296858,
- 1.4214939464842302,
- 3.24626798590751,
- 1.4854335767232132,
- 0.7914244945415305,
- 8.823221045719995,
- 0.7748849127532341,
- 0.574224053339419,

- 1.5572587259249049,
- 5.417481197925349,
- 1.9910491217540927,
- 0.8163556242359274,
- 2.735692293927604,
- 2.1836766349334704,
- 1.6379171357573095,
- 6.610539990722355,
- 0.84176399432555,
- 3.8236706667296887,
- 7.131694041260707,
- 3.0733435903123745,
- 0.8890510578085677,
- 4.271729805094748,
- 4.721744721434179,
- 2.663716247771879,
- 1.0980991988116056,
- 3.8046520760400804,
- 2.4475734097926733,
- 3.689529829970618,
- 1.341043427245331,
- 0.6398617286820958,
- 1.5215388206847715,
- 0 5000050000001007
- 2.5993959286001367,
- 2.3379833439380504,
- 2.27566569572684,
- 9.03067787232202,
- 0.6661168931067618,
- 2.2536868002308568,
- 1.02463767282862,
- 3.1742910627896994,
- 1.344639742223829,
- 4.493648352494523,
- 3.8806438419065334,
- 2.7676433882404505,
- 1.7570889810476737,
- 2.9112630931231327,
- 1.1944836627488047,
- 1.9954416277497475,
- 1.3414797805465732,
- 3.0115765585384358,
- 5.119835556459173,
- 1.3890144546952996,
- 1.971155434455477,
- 7.360919160254177,
- 8.168851795768553,
- 1.8998668113230914,

```
2.7330975056713473,
      0.3046672682119567,
      2.3681857721120796,
      7.736758887641531,
      5.5952430670051205,
      2.3364752879742516,
      0.7200963018558747,
      4.356159432256988,
      1.7001217778094833,
      2.368860127883199,
      2.568767296328695,
      1.1259514789242318,
      3.2279354198279515,
      ...]
[]: #Uber doesn't travel over 130 kms so minimize the distance
     df= df.loc[(df.dist_travel_km >= 1) | (df.dist_travel_km <= 130)]</pre>
     print("Remaining observastions in the dataset:", df.shape)
    Remaining observastions in the dataset: (200000, 12)
[]: #Finding inccorect latitude (Less than or greater than 90) and longitude_
     ⇔(greater than or less than 180)
     incorrect_coordinates = df.loc[(df.pickup_latitude > 90) | (df.pickup_latitude <__
      →-90) |
                                         (df.dropoff_latitude > 90) | (df.
      →dropoff_latitude < -90) |
                                         (df.pickup_longitude > 180) | (df.
      ⇒pickup_longitude < -180) |
                                         (df.dropoff longitude > 180) | (df.
      →dropoff_longitude < -180)
                                         ]
[]: incorrect_coordinates
[]: Empty DataFrame
     Columns: [fare_amount, pickup_longitude, pickup_latitude, dropoff_longitude,
     dropoff_latitude, passenger_count, hour, day, month, year, dayofweek,
     dist_travel_km]
     Index: []
[]: df.drop(incorrect_coordinates, inplace = True, errors = 'ignore')
[]: df.head()
[]:
        fare_amount pickup_longitude pickup_latitude dropoff_longitude \
                           -73.999817
                                                                -73.999512
                7.5
                                             40.738354
```

```
7.7
                            -73.994355
                                                                 -73.994710
     1
                                              40.728225
     2
               12.9
                            -74.005043
                                              40.740770
                                                                 -73.962565
     3
                5.3
                            -73.976124
                                              40.790844
                                                                 -73.965316
     4
               16.0
                            -73.929786
                                              40.744085
                                                                 -73.973082
        dropoff_latitude
                                                                     dayofweek
                          passenger_count hour
                                                  day
                                                       month year
     0
               40.723217
                                                               2015
                                       1.0
                                              19
                                                    7
                                                            5
                                                                              3
     1
               40.750325
                                       1.0
                                              20
                                                    17
                                                            7 2009
                                                                              4
     2
               40.772647
                                       1.0
                                                            8 2009
                                                                              0
                                              21
                                                    24
     3
               40.803349
                                       3.0
                                               8
                                                    26
                                                            6 2009
                                                                              4
     4
               40.761247
                                       3.5
                                              17
                                                               2014
                                                                              3
                                                    28
        dist_travel_km
     0
              1.683325
     1
              2.457593
     2
              5.036384
     3
              1.661686
     4
              4.116088
[]: df.isnull().sum()
[]: fare_amount
                           0
    pickup_longitude
                           0
     pickup_latitude
                           0
     dropoff_longitude
                           0
                           0
     dropoff_latitude
                           0
     passenger_count
                           0
    hour
                           0
     day
    month
                           0
                           0
     year
                           0
     dayofweek
     dist_travel_km
                           0
     dtype: int64
[]: sns.heatmap(df.isnull()) #Free for null values
[ ]: <Axes: >
```



[]: corr = df.corr() #Function to find the correlation

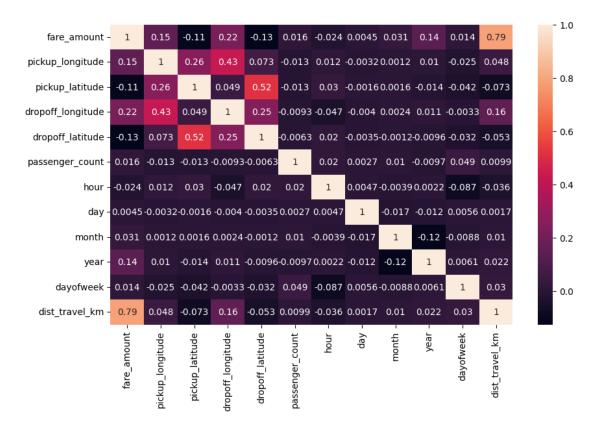
[]: corr

[]:	fare_amount	<pre>pickup_longitude</pre>	<pre>pickup_latitude</pre>
fare_amount	1.000000	0.154069	-0.110842
pickup_longitude	0.154069	1.000000	0.259497
pickup_latitude	-0.110842	0.259497	1.000000
dropoff_longitude	0.218675	0.425619	0.048889
dropoff_latitude	-0.125898	0.073290	0.515714
passenger_count	0.015778	-0.013213	-0.012889
hour	-0.023623	0.011579	0.029681
day	0.004534	-0.003204	-0.001553
month	0.030817	0.001169	0.001562
year	0.141277	0.010198	-0.014243
dayofweek	0.013652	-0.024652	-0.042310
•	*	****	*

```
dist_travel_km
                           0.786385
                                              0.048446
                                                              -0.073362
                        dropoff_longitude
                                           dropoff_latitude
                                                              passenger_count
     fare_amount
                                 0.218675
                                                   -0.125898
                                                                     0.015778
     pickup_longitude
                                 0.425619
                                                    0.073290
                                                                    -0.013213
     pickup_latitude
                                 0.048889
                                                    0.515714
                                                                    -0.012889
     dropoff_longitude
                                                    0.245667
                                                                    -0.009303
                                  1.000000
     dropoff_latitude
                                 0.245667
                                                    1.000000
                                                                    -0.006308
     passenger count
                                                   -0.006308
                                                                     1.000000
                                -0.009303
    hour
                                -0.046558
                                                    0.019783
                                                                     0.020274
     day
                                -0.004007
                                                   -0.003479
                                                                     0.002712
    month
                                 0.002391
                                                   -0.001193
                                                                     0.010351
     year
                                 0.011346
                                                   -0.009603
                                                                    -0.009749
     dayofweek
                                -0.003336
                                                   -0.031919
                                                                     0.048550
     dist_travel_km
                                 0.155191
                                                   -0.052701
                                                                     0.009884
                                                                 dayofweek
                            hour
                                        day
                                                month
                                                           year
     fare_amount
                       -0.023623 0.004534
                                                                  0.013652
                                            0.030817
                                                       0.141277
     pickup_longitude
                        0.011579 -0.003204
                                            0.001169 0.010198
                                                                 -0.024652
                        0.029681 -0.001553
                                            0.001562 -0.014243
                                                                 -0.042310
     pickup_latitude
     dropoff_longitude -0.046558 -0.004007
                                            0.002391 0.011346
                                                                 -0.003336
     dropoff_latitude
                        0.019783 -0.003479 -0.001193 -0.009603
                                                                 -0.031919
     passenger_count
                        0.020274 0.002712
                                            0.010351 -0.009749
                                                                  0.048550
    hour
                        1.000000 0.004677 -0.003926 0.002156
                                                                -0.086947
     day
                        0.004677 1.000000 -0.017360 -0.012170
                                                                  0.005617
     month
                       -0.003926 -0.017360
                                            1.000000 -0.115859
                                                                 -0.008786
     year
                        0.002156 -0.012170 -0.115859 1.000000
                                                                  0.006113
                                  0.005617 -0.008786 0.006113
     dayofweek
                       -0.086947
                                                                  1.000000
     dist_travel_km
                       -0.035708 0.001709 0.010050 0.022294
                                                                  0.030382
                        dist_travel_km
                              0.786385
     fare_amount
     pickup_longitude
                              0.048446
     pickup_latitude
                             -0.073362
     dropoff_longitude
                              0.155191
     dropoff_latitude
                             -0.052701
     passenger_count
                              0.009884
    hour
                             -0.035708
     day
                              0.001709
     month
                              0.010050
     year
                              0.022294
     dayofweek
                              0.030382
     dist_travel_km
                              1.000000
[]: fig,axis = plt.subplots(figsize = (10,6))
     sns.heatmap(df.corr(),annot = True) #Correlation Heatmap (Light values means
```

⇔highly correlated)

[]: <Axes: >



link text### Dividing the dataset into feature and target values

```
[]: x = \( \text{ df[['pickup_longitude', 'pickup_latitude', 'dropoff_longitude', 'dropoff_latitude', 'passenger_\)
[]: y = df['fare_amount']
```

1.2.1 Dividing the dataset into training and testing dataset

```
[]: from sklearn.model_selection import train_test_split
    X_train, X_test, y_train, y_test = train_test_split(x, y, test_size = 0.20)
[]: X_train
```

```
[]:
             pickup_longitude pickup_latitude dropoff_longitude
     157695
                    -73.989162
                                                         -73.963910
                                       40.774402
     138060
                    -73.976410
                                       40.763250
                                                         -73.974850
                    -73.979125
                                      40.767502
     154745
                                                         -73.975640
     46559
                    -73.949280
                                      40.781178
                                                         -73.995903
     46288
                    -73.968557
                                      40.761720
                                                         -73.980340
```

```
86479
               -73.988541
                                  40.737064
                                                     -74.001640
175709
               -73.961227
                                  40.770820
                                                     -73.965755
                                                     -73.994744
90215
               -73.977798
                                  40.789196
177725
               -74.006920
                                  40.729010
                                                     -73.952205
               -74.002592
                                  40.747009
                                                     -73.986591
171840
        dropoff_latitude passenger_count
                                             hour
                                                    day
                                                         month
                                                                 year
                                                                       dayofweek \
                                                                 2010
157695
                40.806314
                                                              4
                                        1.0
                                                20
                                                      1
138060
                40.753368
                                        1.0
                                                15
                                                     25
                                                              6
                                                                 2011
                                                                                5
                                                                                5
                40.781337
                                        1.0
                                                12
                                                      8
                                                             12
                                                                 2012
154745
46559
                40.723438
                                        3.5
                                                15
                                                     14
                                                              3
                                                                 2015
                                                                                5
46288
                40.740283
                                        1.0
                                                20
                                                     23
                                                              7
                                                                 2012
                                                                                0
                                        ... ...
                                                     •••
86479
                40.726208
                                                                 2015
                                                                                5
                                        3.5
                                                     10
                                                12
                                                              1
                                                                                6
175709
                40.764065
                                        3.0
                                                12
                                                      4
                                                              1
                                                                 2009
                                                                                5
90215
                40.750306
                                        1.0
                                                 8
                                                     16
                                                              3
                                                                 2013
                                                                                2
177725
                40.784377
                                        1.0
                                                 0
                                                     20
                                                                 2013
                                                             11
                                                                                0
                                                             12
171840
                40.740498
                                        1.0
                                                13
                                                     30
                                                                 2013
        dist_travel_km
157695
              4.136531
138060
               1.106658
               1.566124
154745
46559
               7.526228
46288
               2.582080
86479
               1.635753
175709
              0.842375
90215
              4.553762
              7.690388
177725
               1.530130
171840
```

[160000 rows x 11 columns]

[]: X_test

[]:		<pre>pickup_longitude</pre>	<pre>pickup_latitude</pre>	<pre>dropoff_longitude</pre>	\
27	952	-73.978792	40.736315	-73.975704	
19	3032	-74.004529	40.753718	-74.004529	
17	1813	-73.969090	40.797722	-73.963737	
10	2534	-73.963525	40.711047	-73.975850	
16	4693	-73.981447	40.741292	-73.998290	
		***	***	***	
10	0480	-73.995567	40.726507	-73.981867	
17	9674	-73.986132	40.760803	-73.955890	
17	9836	-73.985319	40.727517	-73.972175	

```
16945
                    -73.929786
                                       40.768318
                                                           -73.931804
                                                           -73.999237
     143499
                    -74.002419
                                       40.733700
             dropoff_latitude
                                passenger_count
                                                   hour
                                                          day
                                                              month
                                                                      year
                                                                             dayofweek \
     27952
                     40.753726
                                                     13
                                                            2
                                                                   4
                                                                       2014
                                                                                      2
                                              1.0
                     40.753718
                                                           24
                                                                      2010
                                                                                      2
     193032
                                              1.0
                                                     18
                                                                  11
                     40.776917
                                              1.0
                                                     18
                                                            7
                                                                  10
                                                                      2014
                                                                                      1
     171813
                                                                                      6
     102534
                     40.781695
                                              2.0
                                                      4
                                                           10
                                                                   3
                                                                      2013
                                              2.0
                                                            2
                                                                                      3
     164693
                     40.754300
                                                     12
                                                                   1
                                                                       2014
                                              ... ...
                                                                                      2
                                              3.5
                                                           29
                                                                      2013
     100480
                     40.729350
                                                     12
                                                                   5
     179674
                     40.764217
                                              1.0
                                                     17
                                                           23
                                                                   3
                                                                      2010
                                                                                      1
     179836
                     40.747370
                                              1.0
                                                     16
                                                            4
                                                                   1
                                                                      2014
                                                                                      5
     16945
                     40.766520
                                              1.0
                                                      3
                                                           15
                                                                  12
                                                                      2012
                                                                                      5
     143499
                     40.744091
                                              3.5
                                                      0
                                                                                      3
                                                            1
                                                                   1
                                                                      2015
             dist_travel_km
     27952
                    1.953417
     193032
                    0.00000
     171813
                    2.356902
     102534
                    7.924028
     164693
                    2.026156
     100480
                    1.196938
                    2.575166
     179674
     179836
                    2.469756
     16945
                    0.262386
     143499
                    1.186137
     [40000 rows x 11 columns]
[]: y_train
                 9.70
[]: 157695
                 5.30
     138060
     154745
                 8.00
     46559
                22.25
     46288
                 6.50
                •••
     86479
                10.00
     175709
                 4.10
                12.50
     90215
     177725
                21.50
     171840
                 6.00
     Name: fare_amount, Length: 160000, dtype: float64
[ ]: y_test
```

```
[]: 27952
               9.50
     193032
               5.70
     171813
               10.50
     102534
               22.25
     164693
               8.00
     100480
               6.50
                9.30
     179674
     179836
               7.00
                5.50
     16945
     143499
                5.50
     Name: fare_amount, Length: 40000, dtype: float64
    1.2.2 Linear Regression
[]: from sklearn.linear_model import LinearRegression
     regression = LinearRegression()
[]: regression.fit(X_train,y_train)
[]: LinearRegression()
[]: regression.intercept_ #To find the linear intercept
[]: 3683.630887451561
[]: regression.coef_ #To find the linear coeeficient
[]: array([2.54340686e+01, -7.57923589e+00, 2.02667021e+01, -1.80328583e+01,
            7.19258624e-02, 6.40579214e-03, 3.69636670e-03, 5.89888832e-02,
            3.70474390e-01, -3.44173390e-02, 1.84433879e+00])
[]: prediction = regression.predict(X_test) #To predict the target values
[]: print(prediction)
    [ 9.21725408  3.28832288  10.00595244  ... 10.00276185  7.37297707
      7.16977415]
[]: y_test
[]: 27952
                9.50
               5.70
     193032
     171813
               10.50
               22.25
     102534
               8.00
     164693
```

```
5.50
    16945
    143499
              5.50
    Name: fare_amount, Length: 40000, dtype: float64
   1.2.3 Metrics Evaluation using R2, Mean Squared Error, Root Mean Squared Error
[]: from sklearn.metrics import r2_score
[]: r2_score(y_test,prediction)
[]: 0.664995440543817
[]: from sklearn.metrics import mean_squared_error
   MSE = mean_squared_error(y_test,prediction)
[ ]: MSE
[]: 9.830495516036072
[]: RMSE = np.sqrt(MSE)
[]: RMSE
[]: 3.1631357043785315
   1.2.4 Random Forest Regression
[]: from sklearn.ensemble import RandomForestRegressor
strees you want to build before making the prediction
[]: rf.fit(X_train,y_train)
[ ]: RandomForestRegressor(n_estimators=50)
[ ]: y_pred = rf.predict(X_test)
[]: y_pred
[]: array([10.155, 8.863, 10.03, ..., 9.75, 6.516, 6.485])
```

6.50

9.30

100480 179674

179836

1.2.5 Metrics evaluatin for Random Forest

```
[]: R2_Random = r2_score(y_test,y_pred)

[]: R2_Random
[]: 0.8000142586249277

[]: MSE_Random = mean_squared_error(y_test,y_pred)

[]: MSE_Random
[]: 5.868454259399225

[]: RMSE_Random = np.sqrt(MSE_Random)

[]: RMSE_Random
```