```
In [1]: # Import pandas, numpy, matplotlib, seaborn libraries
          import pandas as pd
          from pandas.api.types import is_numeric_dtype
          import datetime
          import pickle
          # path = './RandomForest/'
          path = ''
          Make Predictions on Test Data
 In [2]: def predictRandomForest(rf, test_features):
               try:
                   # Use the forest's predict method on the test data
                   predictions = rf.predict(test_features).tolist()
                   return predictions
              except Exeption as e:
                   print("Error in predictRandomForest", e)
          Get dateRange dataframe for prediction
 In [3]: # ML Models needs time parameters for input [i.e. test_features] in specific format :
          # dateInput = [date hour minute year month1 month2 month3 .. month12]
          # get_TimeInputs() generates a dataframe congruent with ML model input format for next 5 hours by 30 minute interval
          w.r.t. datetimeIn
          # DayOfWeek is optionally included in returned dataframe. It is required for getBike() function.
          def get_TimeInputs(ts = datetime.datetime.now(), dayOfWeek = False, tStampRet = False, perHrs = 5, intervals = 30):
              try:
                   tStampRetVal=[]
                   data_entry_timestamp_In = ts
                   ts = pd.DataFrame([ts], columns = ['ts'])
                   data_entry_timestamp_In = pd.Timestamp(data_entry_timestamp_In)
                   data_entry_timestamp = data_entry_timestamp_In
                   # Logic to find nearest value divisible by 10
                   minutes = data_entry_timestamp_In.minute
                   minutes = minutes + (30-(minutes%30))
                   data_entry_timestamp = data_entry_timestamp.replace(minute = minutes) if (minutes != 60)\
                                              else data_entry_timestamp.round('H')
                    # obtain datetime range spacing 30 minutes for next "perHrs" hours by spacing of "intervals" minutes per ho
          ur
                   dateRange = pd.DataFrame(pd.date_range(data_entry_timestamp, periods=perHrs*int(60/intervals), freq= str(int
          ervals)+'min'), columns = ['ts'])
                   dateRange = pd.concat([ts, dateRange]).reset_index(drop = True)
                   dateRange['ts'] = pd.to_datetime(dateRange['ts'])
                   # Sort datetime into dataframe
                   dateRange['date'] = dateRange.ts.dt.day
                   dateRange['hour'] = dateRange.ts.dt.hour
                   dateRange['minute'] = dateRange.ts.dt.minute
                   dateRange['year'] = dateRange.ts.dt.year
                   dateRange['month'] = dateRange.ts.dt.month
                   dateRange['dayOfWeek'] = dateRange.ts.dt.weekday
                   # prepare onhot encodes for year and month
                   mask = dateRange.year == 2020
                   column_name = 'year'
                   dateRange.loc[mask, column_name] = 1
                   # Models is trained with month data onehot encoded for all 12 months; hence similar data
                   # is introduced inorganically dataframe
                   for m in range(1,13):
                       mask = dateRange.month == m
                       column_name = 'month'+str(m)
                       dateRange[column_name] = 0
                       dateRange.loc[mask, column_name] = 1
                   dateRange = dateRange.drop(['month'], axis=1)
                   if dayOfWeek:
                       for d in range(7):
                            mask = dateRange.dayOfWeek == d
                            column_name = 'dayOfWeek'+str(d)
                            dateRange[column_name] = 0
                           dateRange.loc[mask, column_name] = 1
                   dateRange = dateRange.drop(['dayOfWeek'], axis=1)
                   if tStampRet:
                       tStampRetVal = dateRange.ts.dt.strftime("%I:%M %p")
                   dateRange = dateRange.drop(['ts'], axis=1)
                   return dateRange, tStampRetVal
               except Exeption as e:
                   print("Error in get_TimeInputs", e)
 In [4]: get_TimeInputs()
 Out[4]: (
               date hour minute year month1 month2 month3 month4 month5
                                                                                       month6 \
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           2 16 18
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           8
           10
           [])
          Weather prediction
          Support function which returns dataframe containing weather parameters for coming 5 hours by space of 30 minutes
 In [5]: |# Dataframe of all default targetCols are returned when getWeather() is called by getBike().
          # Dataframe of All targetCols is used as input to ML model for predicting station availability
          def getWeather(datetimeIn = datetime.datetime.now(), targetCols = ['main_temp', 'main_feels_like', 'main_pressure', 'm
          ain_humidity', \
                             'main_temp_min', 'main_temp_max', 'wind_speed', 'wind_deg'],tStampReturn = False):
              try:
                   test_features, tStampRetVal = get_TimeInputs(datetimeIn, tStampRet = tStampReturn)
                   result = pd.DataFrame()
                   for targetC in targetCols:
                       # load the model
                       filename = path + targetC+'.pkl'
                       rfWeatherModel_loaded = pickle.load(open(filename, 'rb'))
                       predictions = predictRandomForest(rfWeatherModel_loaded, test_features)
                       result[targetC] = predictions
                   for col in result.columns:
                       if not is_numeric_dtype(result[col]):
                            result[col] = result[col].astype('category')
                            result[col] = result[col].astype('int')
                   return result, tStampRetVal
               except Exeption as e:
                   print("Error in getWeather", e)
 In [6]: getWeather()
 Out[6]: (
               main_temp main_feels_like main_pressure main_humidity main_temp_min \
                                                       1015
                                          1
                                                       1015
                                                                          75
                                                                                           7
           1
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           10
               main_temp_max wind_speed wind_deg
           0
           1
                                                  219
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           3
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           8
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                                                  212
                                                  212 ,
           [])
          Get future bike station parameters
          Function which returns array of station parameters for next 5 hours by 30 minute interval w.r.t. datetimeIn
 In [7]: # Function which returns array of station parameters for next 5 hours by 30 minute interval w.r.t. datetimeIn
          def getBike(station = 42, datetimeIn = datetime.datetime.now(), targetC = "bikes"):
               try:
                   targetCols = {'bikes' : 'available_bikes', "stands" : 'available_bike_stands'}
                   # datetimeIn = datetime.datetime.fromtimestamp(datetimeIn)
                   weatherFeatures, tStampRetVal = getWeather(datetimeIn)
                   bikeFeatures, tStampRetVal = get_TimeInputs(ts = datetimeIn, dayOfWeek = True, tStampRet= True)
                   test_features = weatherFeatures.join(bikeFeatures).values.tolist()
                   result = pd.DataFrame()
                   # load the model
                   filename = path + 'stn'+str(station)+"_"+targetCols[targetC]+'.pkl'
                   rfWeatherModel_loaded = pickle.load(open(filename, 'rb'))
                   # Predict station availability for all input timestamps and predicted weather parameters
                   predictions = predictRandomForest(rfWeatherModel_loaded, test_features)
                   result[targetCols[targetC]] = predictions
                   # Cast results as integer values
                   result = result.astype(int)
                   return [result[targetCols[targetC]].values.tolist(),list(tStampRetVal)]
              except Exeption as e:
                   print("Error in getBike", e)
 In [8]: getBike()
 Out[8]: [[24, 24, 16, 17, 18, 19, 19, 19, 19, 19, 19],
           ['05:16 PM',
             '05:30 PM',
            '06:00 PM',
             '06:30 PM'
             '07:00 PM'
            '07:30 PM'
            '08:00 PM'
             '08:30 PM'
             '09:00 PM'
             '09:30 PM',
             '10:00 PM']]
          Support function which returns requested weather predictions as a list of lists
 In [9]: def retWeather(datetimeIn = datetime.datetime.now(), targetCols =['main_temp']):
               try:
                   result = []
                   # datetimeIn = datetime.datetime.fromtimestamp(datetimeIn)
                   weatherFeatures,tStampRet = getWeather(datetimeIn = datetimeIn, targetCols = targetCols, tStampReturn = True)
                   for col in weatherFeatures.columns:
                       result.append(weatherFeatures[col].values.tolist())
                   result.append(tStampRet.values.tolist())
                   return result
              except Exeption as e:
                   print("Error in retWeather", e)
In [10]: retWeather()
Out[10]: [[8, 8, 8, 8, 8, 8, 8, 8, 7, 8, 8],
           ['05:16 PM',
             '05:30 PM'
             '06:00 PM'
             '06:30 PM'
             '07:00 PM'
             '07:30 PM'
             '08:00 PM'
            '08:30 PM'
             '09:00 PM'
             '09:30 PM'
             '10:00 PM']]
          Get future parameters for bike station and weather
          Driver function retBikeWeather() returns list of lists consisting:
          [[Bikes Soruce], [main weather Source], [main temperature Source], [Bike_stands Destination], [main weather Destination], [main_temperature
          Destination]]
In [11]: # Driver function retBikeWeather() returns list of lists consisting:
          # [[Bikes Soruce], [main weather Source], [main temperature Source], \
          # [Bike_stands Destination], [main weather Destination], [main_temperature Destination]]
          def retBikeWeather(stations = [42,43], datetimeIP = [datetime.datetime.now(), datetime.datetime.now()], targetC = [
          "bikes", "stands"]):
              try:
                   result = []
                   # datetimeIn = datetime.datetime.fromtimestamp(datetimeIn)
                   for (station, datetimeIn, targetC) in zip(stations, datetimeIP, targetC):
                       bData = getBike(station = station, datetimeIn = datetimeIn, targetC = targetC)
                       result.append(bData)
                       wData = retWeather(datetimeIn = datetimeIn, targetCols =['weather_main'])
                       result.append(wData)
                       tData = retWeather(datetimeIn = datetimeIn, targetCols =['main_temp'])
                       result.append(tData)
                   return result
              except Exeption as e:
                   print("Error in retBikeWeather", e)
In [12]: retBikeWeather(stations = [41,41], datetimeIP = [datetime.datetime.now(), datetime.datetime.now()], targetC = ["bike"
          s", "stands"])
['05:16 PM',
              '05:30 PM',
              '06:00 PM',
              '06:30 PM'
              '07:00 PM'
              '07:30 PM'
              '08:00 PM',
              '08:30 PM',
              '09:00 PM',
              '09:30 PM',
              '10:00 PM']],
           [['Clouds',
              'Clouds',
              'Clouds',
              'Clouds',
              'Clouds',
              'Clouds',
              'Clouds',
              'Rain',
              'Clouds'
              'Clouds',
              'Clouds']
             ['05:16 PM'
              '05:30 PM',
              '06:00 PM',
              '06:30 PM',
              '07:00 PM',
              '07:30 PM'
              '08:00 PM'
              '08:30 PM'
              '09:00 PM'
              '09:30 PM'
              '10:00 PM']],
           [[8, 8, 8, 8, 8, 8, 8, 8, 7, 8, 8],
             ['05:16 PM',
              '05:30 PM',
             '06:00 PM'
              '06:30 PM'
              '07:00 PM',
              '07:30 PM',
              '08:00 PM',
              '08:30 PM',
              '09:00 PM',
              '09:30 PM'
              '10:00 PM']],
           [[1, 1, 1, 1, 1, 1, 1, 1, 1, 1, 1],
             ['05:16 PM',
              '05:30 PM',
              '06:00 PM',
              '06:30 PM',
              '07:00 PM',
              '07:30 PM',
              '08:00 PM',
              '08:30 PM',
              '09:00 PM',
              '09:30 PM',
              '10:00 PM']],
           [['Clouds',
              'Clouds',
             'Clouds',
             'Clouds',
              'Clouds',
              'Clouds',
              'Clouds',
              'Rain',
              'Clouds',
              'Clouds',
              'Clouds'],
             ['05:16 PM'
              '05:30 PM',
              '06:00 PM',
              '06:30 PM',
              '07:00 PM',
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              '08:00 PM',
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'08:30 PM',
'09:00 PM',
'09:30 PM',
'10:00 PM']],

['05:16 PM',
'05:30 PM',
'06:00 PM',
'06:30 PM',
'07:00 PM',
'07:30 PM',
'08:00 PM',
'08:30 PM',
'09:00 PM',
'10:00 PM']]]

[[8, 8, 8, 8, 8, 8, 8, 8, 7, 8, 8],

Visualization of predicted data