In [1]: ▶

```
import warnings
 2
    warnings.filterwarnings("ignore")
 3
    import numpy as np
 4
   import pandas as pd
 5
    import statsmodels.api as sm
    from scipy import stats
 7
    from sklearn.preprocessing import MinMaxScaler
    from sklearn.metrics import mean_squared_error
    from sklearn.model_selection import train_test_split
 9
    from sklearn.externals import ioblib
    from math import sqrt
11
12
13
    from random import randint
    from keras.models import Sequential
14
   from keras.models import load_model
15
16
   from keras. Layers import Dense
17
   from keras.layers import LSTM
18 from keras.layers import GRU
19
    from keras.callbacks import EarlyStopping
20
    from keras import initializers
21
    from matplotlib import pyplot
22
   from datetime import datetime
23
    from matplotlib import pyplot as plt
24
   import plotly.offline as py
25
    import plotly.graph_objs as go
26
    import apscheduler
27
    from apscheduler.scheduler import Scheduler
28
    import ison
29
    import pymongo
30
    from pymongo import MongoClient
31
32
    from datetime import date
33
    from datetime import datetime
34
    from datetime import timedelta
35
    py.init_notebook_mode(connected=True)
36
    %matplotlib inline
37
38
    # Start the scheduler
39
    sched = Scheduler()
40
    sched.start()
41
42
    def create_lookback(dataset, look_back=1):
43
        X, Y = [], []
        for i in range(len(dataset) - look_back):
44
45
            a = dataset[i:(i + look_back), 0]
46
            X.append(a)
47
            Y.append(dataset[i + look_back, 0])
48
        return np.array(X), np.array(Y)
49
50
    def mean_predict1(price_open,price_open1):
51
        global initial_mean
52
        global initial_mean1
53
        global initial_mean_scalar
54
        global initial_mean_scalar1
55
        global X_test
56
        global X_test1
57
        initial_mean=np.array(price_open)
58
        initial_mean1=np.array(price_open1)
59
        initial_mean_scalar=scaler.transform(initial_mean)
```

```
60
         initial_mean_scalar1=scaler.transform(initial_mean1)
61
         X_test = initial_mean_scalar
62
         X_test1=initial_mean_scalar1
63
        X_{\text{test}} = \text{np.reshape}(X_{\text{test}}, (\text{len}(X_{\text{test}}), 1, X_{\text{test.shape}}[1]))
64
         X_test1=np.reshape(X_test1,(len(X_test1),1,X_test1.shape[1]))
65
        print(X_test)
        print(X_test1)
66
67
         global final_mean
68
         global final_mean1
69
70
         mean = model.predict(X_test, verbose=1)
         for i in range(n-1):
71
72
             X_test= mean
73
             X_test = np.reshape(X_test, (len(X_test), 1, X_test.shape[1]))
74
             yhat = model.predict(X_test, verbose=1)
75
             mean=yhat
         final_mean=scaler.inverse_transform(mean)
76
77
         mean1= model.predict(X_test1, verbose=1)
78
         for i in range(n-1):
79
             X_test1= mean1
80
             X_{\text{test1}} = \text{np.reshape}(X_{\text{test1}}, (\text{len}(X_{\text{test1}}), 1, X_{\text{test1.shape}}[1]))
81
             yhat1 = model.predict(X_test1, verbose=1)
82
             mean 1=yhat 1
83
         final_mean1=scaler.inverse_transform(mean1)
         movement = (final_mean-final_mean1)/price_open
84
85
         print(movement)
         global H_pred_movement
86
87
88
         if (movement> 0.0005) :
89
             H_pred_movement='Rise'
90
91
         elif (movement < -0.0005):
92
             H_pred_movement='Fall'
93
94
         elif (abs(movement) <= 0.0005):
95
             H_pred_movement='Steady'
96
97
         else:
             print('invalid value')
98
```

Using TensorFlow backend.

In [2]: ▶

```
#def job_function_total():
 2 | Client=MongoClient(host=
                                   , por t≤
   DB_name=Client['BINANCE']
 4 | Collection_15MIN = DB_name['BTC_USD_15MIN']
   Client.BINANCE.authenticate("voteAdmin", "voteAdmin")
 5
    data = pd.DataFrame(list(Collection_15MIN.find()))
 7
    data.drop_duplicates(subset="time_period_start", keep="last",inplace=True)
    data=data.tail(1000)
 9
    #data=data.tail(2000)
10
       # print(len(data))
11
        #data=data[-15000:]
12
        #data["price_close"] = data["price_close"].astype(float)
13
    data["price_open"]=data["price_open"].astype(float)
14
        #data["price_high"]=data["price_high"].astype(float)
15
16
        #data["price_low"]=data["price_low"].astype(float)
        #data["mean_price"]= (data['price_close']+data['price_high']+data['price_low']+data['price_
17
18
    data.isnull().values.any()
    del data['time_period_end']
19
20
    del data['volume_traded']
21
    del data['_id']
    del data['price_close']
22
    del data['price_high']
23
24
    del data['price_low']
25
        #de | data['price_open']
26 | del data['time_period_start']
27
    del data['time_period_kr']
28
    a=round(len(data)*0.9)
29
   alobal train
30 | train=data[:a]
31
   global test
   |test=data[a:]
33 | working_data = [train,test]
34 | working_data = pd.concat(working_data)
35
   training_set = train.values
36
   training_set = np.reshape(training_set, (len(training_set),1))
37
    test_set = test.values
38
    test_set = np.reshape(test_set, (len(test_set),1))
39
        #scale datasets
40
   global scaler
41
    scaler = MinMaxScaler()
42
    training_set = scaler.fit_transform(training_set)
43
    test_set = scaler.transform(test_set)
44
        #print(test_set)
45
46
        # create datasets which are suitable for time series forecasting
47
    look_back = 1
    X_train, Y_train = create_lookback(training_set, look_back)
48
49
    X_test, Y_test = create_lookback(test_set, look_back)
50
51
        # reshape datasets so that they will be ok for the requirements of the LSTM model in Keras
52
    X_train = np.reshape(X_train, (len(X_train), 1, X_train.shape[1]))
53
   X_{\text{test}} = \text{np.reshape}(X_{\text{test}}, (\text{len}(X_{\text{test}}), 1, X_{\text{test.shape}}[1]))
54
55
        # initialize sequential model, add 2 stacked LSTM layers and densely connected output neuro
56
    from keras.layers import Dropout, Flatten, Dense, Activation, Reshape, LeakyReLU
57
    from keras.layers import Conv1D, Conv2D
58
    from keras.layers.normalization import BatchNormalization
59
    global model
```

```
60
 61
 62
     model = Sequential()
    model.add(LSTM(526, return_sequences=True, input_shape=(X_train.shape[1], X_train.shape[2]), ad
 63
    model.add(LSTM(526))
 64
    model.add(Dropout(0.2))
 65
 66
     model.add(Dense(1))
 67
     model.add(LeakyReLU())
 68
     1.1.1
 69
 70
 71
    model = Sequential()
 72
     model.add(LSTM(526, return_sequences=True,input_shape=(X_train.shape[1], X_train.shape[2])))
 73
     model.add(LSTM(526))
 74
     model.add(Dense(1))
 75
 76
 77
 78
         # compile and fit the model
 79
     model.compile(loss='mean_squared_error', optimizer='adam')
    history=model.fit(X_train, Y_train, epochs=100,batch_size=180,shuffle=False,
80
 81
                 validation_data=(X_test, Y_test),
 82
                 callbacks = [EarlyStopping(monitor='val_loss', min_delta=5e-5, patience=20, verbose
     model.save('Ewha007_BTC.sav')
83
     model = load_model('Ewha007_BTC.sav')
 84
85
     model._make_predict_function()
86
87
     trace1 = go.Scatter(
         x = np.arange(0, len(history.history['loss']), 1),
 88
 89
         y = history.history['loss'],
 90
         mode = 'lines',
         name = 'Train loss',
 91
         line = dict(color=('rgb(66, 244, 155)'), width=2, dash='dash')
 92
 93
 94
     trace2 = go.Scatter(
         x = np.arange(0, len(history.history['val_loss']), 1),
95
 96
         y = history.history['val_loss'],
         mode = 'lines',
 97
         name = 'Test loss',
98
         line = dict(color=(rgb(244, 146, 65))), width=2)
99
100
    )
101
102
     data = [trace1, trace2]
103
     layout = dict(title = 'Train and Test Loss during training',
                   xaxis = dict(title = 'Epoch number'), yaxis = dict(title = 'Loss'))
104
105
     fig = dict(data=data, layout=layout)
106
     py.iplot(fig, filename='training_process')
107
108
     # add one additional data point to align shapes of the predictions and true labels
109
    X_test = np.append(X_test, scaler.transform(working_data.iloc[-1][0]))
     X_{\text{test}} = \text{np.reshape}(X_{\text{test}}, (\text{len}(X_{\text{test}}), 1, 1))
110
111
112
     # get predictions and then make some transformations to be able to calculate RMSE properly in U
113
    prediction = model.predict(X_test)
     prediction_inverse = scaler.inverse_transform(prediction.reshape(-1, 1))
114
115
    Y_test_inverse = scaler.inverse_transform(Y_test.reshape(-1, 1))
116
    prediction2_inverse = np.array(prediction_inverse[:,0][1:])
117
    Y_test2_inverse = np.array(Y_test_inverse[:,0])
118
119
     trace1 = go.Scatter(
         x = np.arange(0, len(prediction2_inverse), 1),
120
```

```
121
        y = prediction2_inverse,
122
        mode = 'lines',
123
        name = 'Predicted labels',
         line = dict(color=('rgb(244, 146, 65)'), width=2)
124
125
126
    trace2 = go.Scatter(
127
        x = np.arange(0, len(Y_test2_inverse), 1),
128
        y = Y_test2_inverse,
129
        mode = 'lines',
        name = 'True labels',
130
         line = dict(color=('rgb(66, 244, 155)'), width=2)
131
132
133
134
    data = [trace1, trace2]
135
    layout = dict(title = 'BITCOIN Comparison of true prices (on the test dataset) with prices our
                  xaxis = dict(title = 'Minute'), yaxis = dict(title = 'Price, USD'))
136
137
    fig = dict(data=data, layout=layout)
    py.iplot(fig, filename='results_demonstrating')
138
139
140
141
    #sched.add_cron_job(job_function_total, hour='0,2,4,6,8,10,12,14,16,18,20,22',minute=30,second=
```

```
Train on 899 samples, validate on 99 samples
Epoch 1/100
899/899 [======] - 3s 3ms/step - loss: 0.3341 - val_loss:
0.3233
Epoch 2/100
899/899 [===
                       =======] - Os 67us/step - loss: 0.1897 - val_loss:
0.1327
Epoch 3/100
899/899 [===
                       =======] - Os 62us/step - loss: 0.0454 - val_loss:
0.0036
Epoch 4/100
                        =======] - Os 63us/step - loss: 0.0184 - val_loss:
899/899 [==:
0.0299
Epoch 5/100
                  -----] - Os 58us/step - loss: 0.0445 - val_loss:
899/899 [=====
0.0089
Epoch 6/100
899/899 [====
                   0.0034
```

In [3]: ▶

```
1
    def result():
 2
         pred_hr=datetime.now() - timedelta(hours = 3)
 3
         global result2_time
 4
         result2_time=str(pred_hr.strftime('%Y-\m-\mathbb{\text{d}} \mathbb{\text{W}:\mathbb{\text{M}:\mathbb{\text{M}:\mathbb{\text{M}:\mathbb{\text{S}'}}}))
 5
    sched.add_cron_job(result, hour='0,2,4,6,8,10,12,14,16,18,20,22')
 6
 7
    def result3():
 8
         pred_hr=datetime.now() - timedelta(hours = 3)
 9
         global result3_time
10
         result3_time=str(pred_hr.strftime('%Y-%m-%d %H:%M:%S'))
11
    sched.add_cron_job(result3, hour='1,3,5,7,9,11,13,15,17,19,21,23', minute=45)
12
13
    def result4():
14
        pred_hr=datetime.now() - timedelta(hours = 1)
15
         global result4_time
16
         result4_time=str(pred_hr.strftime('%Y-\m-\mathbb{\text{d}} \mathbb{\text{W}:\mathbb{\text{M}:\mathbb{\text{S}'}}))
17
    sched.add_cron_job(result4, hour='0,2,4,6,8,10,12,14,16,18,20,22')
18
19
    def result5():
20
         pred_hr=datetime.now() - timedelta(hours = 1)
21
         global result5_time
22
         result5_time=str(pred_hr.strftime('%Y-\m-\mathbb{\text{d}} \mathbb{\text{M}:\mathbb{\text{M}:\mathbb{\text{N}}}'))
23
    sched.add_cron_job(result5, hour='1,3,5,7,9,11,13,15,17,19,21,23', minute=45)
24
25
    def job_function():
26
         Client=MongoClient(host="", port="
27
         DB_name=Client['BINANCE']
28
         data=DB_name.BTC_USD_15MIN
         Client.BINANCE.authenticate("voteAdmin", "voteAdmin")
29
30
         data= pd.DataFrame(list(data.find()))
31
         data0=data[data.time_period_start==result4_time][-1:]
32
         print(data0.shape[0])
33
         if (data0.shape[0]==0):
34
             data0=data[data.time_period_start==result5_time][-1:]
35
             data0["price_open"]=data0["price_close"]
36
         else:
37
             data0=data0
38
         print(data0)
         data1=data[data.time_period_start==result2_time][-1:]
39
40
         print(data1.shape[0])
         if (data1.shape[0]==0):
41
42
             data1=data[data.time_period_start==result3_time][-1:]
43
             data1["price_open"]=data1["price_close"]
44
         else:
45
             data1=data1
46
         print(data1)
         #data1=pd.DataFrame(data.iloc[[-9]])
47
         data0["price_open"]=data0["price_open"].astype(float)
48
         data1["price_open"]=data1["price_open"].astype(float)
49
50
         price_open0=np.array(data0["price_open"])
51
         price_open1=np.array(data1["price_open"])
52
         price_open0=price_open0.reshape(-1,1)
53
         price_open1=price_open1.reshape(-1,1)
54
         mean_predict1(price_open0,price_open1)
55
    sched.add_cron_job(job_function, hour='0,2,4,6,8,10,12,14,16,18,20,22',minute=16)
56
57
    def time_function():
58
         pred_hr=datetime.now() + timedelta(hours = 2)
59
         global prediction_time
```

```
prediction_time=str(pred_hr.strftime('%Y-%m-%d %H:%M:%S'))
60
61
    sched.add_cron_job(time_function, hour='0,2,4,6,8,10,12,14,16,18,20,22')
62
63
    def json_function():
64
        global BTC_upload_result
       BTC_upload_result=[{'H_nick_name': 'BTC_Ewha007', 'H_model_name': 'Ewha007', 'H_Model_descr
65
                            'H_pred_time':prediction_time, 'H_server_name': 'prediction-herobots003'
66
67
                            'H_pred_movement': H_pred_movement}]
    sched.add_cron_job(json_function, hour='0,2,4,6,8,10,12,14,16,18,20,22', minute=17)
68
69
70
    def upload_result():
        Client=MongoClient(host=", port=
71
72
       DB_name=Client["Ewha007"]
73
       Collection_A=DB_name.BTC_results
74
       Client.Ewha007.authenticate("Ewha", "Ewha34")
75
        Collection_A.insert_many(BTC_upload_result)
76
       Client.close()
77
78
    #insert BTC json files to Collection_A
    sched.add_cron_job(upload_result,hour='0,2,4,6,8,10,12,14,16,18,20,22', minute=18)
```

Out[3]:

<Job (name=upload_result, trigger=<CronTrigger (hour='0,2,4,6,8,10,12,14,16,18,20,2
2', minute='18')>)>