## jx1021\_Jiangguangyu\_Xue\_Final Project 7831

## July 9, 2019

```
In [1]: import json
        import datetime as dt
        import urllib.request
        import pandas as pd
        import numpy as np
        from sqlalchemy import Column, Integer, Float, String
        from sqlalchemy import create_engine
        from sqlalchemy import MetaData
        from sqlalchemy import Table
        from sqlalchemy import inspect
        from sqlalchemy import select
        from sqlalchemy import ForeignKey
In [2]: requestURL = "https://eodhistoricaldata.com/api/eod/"
        myEodKey = "5ba84ea974ab42.45160048"
        startDate = dt.datetime(2017,12,31)
        endDate = dt.datetime(2019,5,3)
In [27]: stock_list = pd.read_csv("PairTrading_demo.csv")
In [28]: stock_list.head()
Out[28]: Stock1 Stock2
         O AAPL
                  HPQ
             APC
         1
                     CHK
         2
             CVX
                     MOX
         3
             DAL
                     UAL
                     V7.
In [29]: stock1 = []
         for stock in stock_list["Stock1"]:
             if stock not in stock1:
                 stock1.append(stock)
         stock2 = []
         for stock in stock_list["Stock2"]:
             if stock not in stock2:
                 stock2.append(stock)
```

```
In [30]: def get_daily_data(symbol, start=startDate, end=endDate, requestType=requestURL, apiK
             symbolURL = str(symbol) + ".US?"
             startURL = "from=" + str(start)
             endURL = "to=" + str(end)
             apiKeyURL = "api_token=" + myEodKey
             completeURL = requestURL + symbolURL + startURL + '&' + endURL + '&' + apiKeyURL +
             print(completeURL)
             with urllib.request.urlopen(completeURL) as req:
                 data = json.load(req)
                 return data
In [31]: def create_pair1_table(name, metadata, engine):
                 tables = metadata.tables.keys()
                 if name not in tables:
                         table = Table(name, metadata,
                                                  Column('symbol_1', String(50), primary_key=Tr
                                                  Column('date', String(50), primary_key=True,
                                                  Column('open_1', Float, nullable=False),
                                                  Column('high_1', Float, nullable=False),
                                                  Column('low_1', Float, nullable=False),
                                                  Column('close_1', Float, nullable=False),
                             Column('adjusted_close_1', Float, nullable=False),
                                                  Column('volume_1', Integer, nullable=False))
                         table.create(engine)
                         return table
         def create_pair2_table(name, metadata, engine):
                 tables = metadata.tables.keys()
                 if name not in tables:
                         table = Table(name, metadata,
                                                  Column('symbol_2', String(50), primary_key=Tr
                                                  Column('date', String(50), primary_key=True,
                                                  Column('open_2', Float, nullable=False),
                                                  Column('high_2', Float, nullable=False),
                                                  Column('low_2', Float, nullable=False),
                                                  Column('close_2', Float, nullable=False),
                                                  Column('adjusted_close_2', Float, nullable=Fa
                                                  Column('volume_2', Integer, nullable=False))
                         table.create(engine)
                         return table
         def populate_stock1_data(tickers, metadata, engine, table_name):
             conn = engine.connect()
             table = metadata.tables[table_name]
             for ticker in tickers:
                 stock = get_daily_data(ticker)
```

```
#print(k, v)
                     trading_date = stock_data['date']
                     trading_open = stock_data['open']
                     trading_high = stock_data['high']
                     trading_low = stock_data['low']
                     trading_close = stock_data['close']
                     trading_adjusted_close = stock_data['adjusted_close']
                     trading_volume = stock_data['volume']
                     insert_st = table.insert().values(symbol_1=ticker, date=trading_date,
                                                  open_1 = trading_open, high_1 = trading_high,
                                                  close_1 = trading_close, adjusted_close_1 = t
                                volume_1 = trading_volume)
                     conn.execute(insert_st)
         def populate_stock2_data(tickers, metadata, engine, table_name):
             conn = engine.connect()
             table = metadata.tables[table_name]
             for ticker in tickers:
                 stock = get_daily_data(ticker)
                 #print(stock)
                 for stock_data in stock:
                     #print(k, v)
                     trading_date = stock_data['date']
                     trading_open = stock_data['open']
                     trading_high = stock_data['high']
                     trading_low = stock_data['low']
                     trading_close = stock_data['close']
                     trading_adjusted_close = stock_data['adjusted_close']
                     trading_volume = stock_data['volume']
                     insert_st = table.insert().values(symbol_2=ticker, date=trading_date,
                                                  open_2 = trading_open, high_2 = trading_high,
                                                  close_2 = trading_close, adjusted_close_2 = tr
                                volume_2 = trading_volume)
                     conn.execute(insert_st)
In [32]: def create_PairPrices_table(name, metadata, engine):
                 tables = metadata.tables.keys()
                 if name not in tables:
                         table = Table(name, metadata,
                                                  Column('symbol_1', String(50), ForeignKey("Pai:
                                                  Column('symbol_2',String(50),ForeignKey("Pair")
                                                  Column('date', String(50), primary_key=True,
                                                  Column('open_1', Float, nullable=False),
                                                  Column('close_1', Float, nullable=False),
                                                  Column('open_2', Float, nullable=False),
                                                  Column('close_2', Float, nullable=False))
                                         3
```

#print(stock)

for stock\_data in stock:

```
return table
         def populate_PairsPrices_data(stock_list, metadata, engine, table_name,stock1_table,s
             conn = engine.connect()
             table = metadata.tables[table_name]
             for row in np.array(stock_list):
                 ticker_1 =row[0]
                 ticker_2 =row[1]
                 s = select([stock1_table.c.date,stock1_table.c.open_1,stock1_table.c.close_1]
                 result = conn.execute(s)
                 res_1 = result.fetchall()
                 s = select([stock2_table.c.open_2,stock2_table.c.close_2]).where(stock2_table
                 result = conn.execute(s)
                 res_2 = result.fetchall()
                 for i,item in enumerate(res_1):
                     insert_st = table.insert().values(symbol_1=ticker_1, symbol_2=ticker_2,
                                                        date = res_1[i][0] , open_1 = res_1[i][
                                                        open_2 = res_2[i][0],close_2 = res_2[i]
                     conn.execute(insert_st)
In [33]: def create_Pairs_table(name, metadata, engine):
                 tables = metadata.tables.keys()
                 if name not in tables:
                         table = Table(name, metadata,
                                                  Column('symbol_1',String(50), primary_key=True
                                                  Column('symbol_2',String(50), primary_key=True
                                                  Column('volatility', Float, nullable=False),
                                                  Column('profit_loss', Float, nullable=False))
                         table.create(engine)
                 return table
         def populate_Pairs_data(stock_list, metadata, engine, table_name,stock1_table,stock2_
             conn = engine.connect()
             table = metadata.tables[table_name]
             for row in np.array(stock_list):
                 ticker_1 =row[0]
                 ticker_2 =row[1]
                 s = select([stock1_table.c.close_1]).where(stock1_table.c.symbol_1==ticker_1)
```

table.create(engine)

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result = conn.execute(s)
                 close_1 = result.fetchall()
                 close_1 = np.array(close_1).flatten()
                 s = select([stock2_table.c.close_2]).where(stock2_table.c.symbol_2==ticker_2)
                 result = conn.execute(s)
                 close_2 = result.fetchall()
                 close_2 = np.array(close_2).flatten()
                 volatility = np.std(close_1/close_2)
                 insert_st = table.insert().values(symbol_1=ticker_1, symbol_2=ticker_2,
                                                       volatility = volatility,profit_loss = 0.0
                 conn.execute(insert_st)
         #def populate_Pairs_data(tickers, metadata, engine, table_name):
In [34]:
         def create_Trades_table(name, metadata, engine):
                 tables = metadata.tables.keys()
                 if name not in tables:
                          table = Table(name, metadata,
                                                   Column('symbol_1',String(50), primary_key=True
                              Column('symbol_2',String(50), primary_key=True, nullable=False),
                                                   Column('date', String(50), primary_key=True,
                                                   Column('profit_loss_d', Float, nullable=False
                          table.create(engine)
                 return table
In [35]: def populate_Trades_data(tickers, metadata, engine, table_name, Pairs_table, stock1_table)
             conn = engine.connect()
             table = metadata.tables[table_name]
             s = select([Pairs_table.c.volatility])
             result = conn.execute(s)
             volatility = result.fetchall()
             volatility = np.array(volatility).flatten()
             s = select([stock1_table.c.date]).where(stock1_table.c.symbol_1=="AAPL").where(stock1_table.c.symbol_1=="AAPL").
             result = conn.execute(s)
             dates= result.fetchall()
```

```
dates = np.array(dates).flatten()
for i,row in enumerate(np.array(stock_list)):
   ticker_1 =row[0]
    ticker_2 =row[1]
    s = select([stock1_table.c.open_1,stock1_table.c.close_1]).where(stock1_table
    result = conn.execute(s)
    result = result.fetchall()
    open_1,close_1 = np.array(result).transpose()
    s = select([stock2_table.c.open_2,stock2_table.c.close_2]).where(stock2_table
    result = conn.execute(s)
    result = result.fetchall()
    open_2,close_2 = np.array(result).transpose()
    condition = close_1[:-1]/close_2[:-1]-open_1[1:]/open_2[1:]-k*volatility[i]
    PnL_sum = 0
    for j,date in enumerate(dates):
        if j ==0:
            continue
        if (condition[j-1]>0):
            n1 = -10000
        if (condition [j-1]<0):
            n1 = 10000
        n2 = - np.floor(n1*(open_1[j]/open_2[j]))
        PnL = n1*(close_1[j]-open_1[j]) + n2*(close_2[j]-open_2[j])
        insert_st = table.insert().values(symbol_1=ticker_1, symbol_2=ticker_2,
                                        date = date,profit_loss_d = PnL)
        conn.execute(insert_st)
        PnL_sum += PnL
    print(PnL)
    table_2 = metadata.tables["Pairs_table"]
    stmt = table_2.update().values(profit_loss = PnL_sum).where(table_2.c.symbol_
    conn.execute(stmt)
```

```
conn = engine.connect()
            table = metadata.tables[table_name]
            delete_st = table.delete()
            conn.execute(delete_st)
        def execute_sql_statement(sql_st, engine):
            result = engine.execute(sql_st)
            return result
        def build_pair_trading_model():
            return 0
In [36]: metadata = MetaData()
        engine = create_engine('sqlite:///:memory:')
        conn = engine.connect()
In [37]: stock1_table = create_pair1_table("Pair1Stocks", metadata, engine)
In [38]: populate_stock1_data(stock1, metadata, engine, "Pair1Stocks")
https://eodhistoricaldata.com/api/eod/AAPL.US?from=2017-12-31 00:00:00&to=2019-05-03 00:00:00&
https://eodhistoricaldata.com/api/eod/APC.US?from=2017-12-31 00:00:00&to=2019-05-03 00:00:00&a
https://eodhistoricaldata.com/api/eod/CVX.US?from=2017-12-31 00:00:00&to=2019-05-03 00:00:00&a
https://eodhistoricaldata.com/api/eod/DAL.US?from=2017-12-31 00:00:00&to=2019-05-03 00:00:00&a
https://eodhistoricaldata.com/api/eod/T.US?from=2017-12-31 00:00:00&to=2019-05-03 00:00:00&api
In [39]: stock2_table = create_pair2_table("Pair2Stocks", metadata, engine)
        populate_stock2_data(stock2, metadata, engine, "Pair2Stocks")
https://eodhistoricaldata.com/api/eod/HPQ.US?from=2017-12-31 00:00:00&to=2019-05-03 00:00:00&a
https://eodhistoricaldata.com/api/eod/CHK.US?from=2017-12-31 00:00:00&to=2019-05-03 00:00:00&a
https://eodhistoricaldata.com/api/eod/UAL.US?from=2017-12-31 00:00:00&to=2019-05-03 00:00:00&a
https://eodhistoricaldata.com/api/eod/VZ.US?from=2017-12-31 00:00:00&to=2019-05-03 00:00:00&ap
In [40]: PairPrices_table = create_PairPrices_table("PairPrices", metadata, engine)
        populate_PairsPrices_data(stock_list, metadata, engine, "PairPrices", stock1_table, sto
In [41]: Pairs_table = create_Pairs_table("Pairs_table", metadata, engine)#volatility,PnL
        populate_Pairs_data(stock_list, metadata, engine, "Pairs_table", stock1_table, stock2_te
In [42]: k = 1
        Trades_table = create_Trades_table("Trades_table", metadata, engine)
In [43]: populate_Trades_data(stock_list, metadata, engine, "Trades_table", Pairs_table, stock1_table
```

```
16020.079999999703
43120.8299999975
-19448.22000000004
8801.2999999996
-27739.320000000316
In [44]: s=select([Pairs_table])
         result = conn.execute(s)
         result.fetchall()
Out[44]: [('AAPL', 'HPQ', 0.5553570579532815, -29696.490000000478),
          ('APC', 'CHK', 2.777387301509632, -111562.48000000039),
          ('CVX', 'XOM', 0.053188692413880884, 20660.009999999307),
          ('DAL', 'UAL', 0.07489218195313094, -66522.47999999927),
          ('T', 'VZ', 0.07777551601082226, 147149.81999999922)]
In [56]: s=select([stock1_table]).where(stock1_table.c.open_1>0)
         result = conn.execute(s)
         q = result.fetchall()
In [57]: np.array(q).shape
Out[57]: (1680, 8)
In [46]: conn = engine.connect()
         s = select([stock1_table.c.open_1,stock1_table.c.close_1]).where(stock1_table.c.symbol
         result = conn.execute(s)
         result= result.fetchall()
         open_1_d1 =result[0][0]
         close_1_d1 = result[0][1]
In [47]: def real_time_trading():
             print("Real time trade start:")
             print("Please enter parameter k:")
             k = float(input())
             #input the tickers for the pair
             print("Please input ticker for the first stock of the pair:")
             ticker_1 = input()
             print("Please enter a open price for it")
             open_1_d2 = float(input())
             print("Please enter a close price for it")
             close_1_d2 = float(input())
             print("Please input ticker for the second stock of the pair:")
             ticker_2 = input()
             print("Please enter a open price for it")
```

```
open_2_d2 = float(input())
print("Please enter a close price for it")
close_2_d2 = float(input())
print("Which day you want to choose as yesterday?(Please enter as yyyy-mm-dd)")
date 2 = input()
conn = engine.connect()
#qet selected date open and close prices
s = select([stock1_table.c.open_1,stock1_table.c.close_1]).where(stock1_table.c.s
result = conn.execute(s)
result= result.fetchall()
open_1_d1 =result[0][0]
close_1_d1 = result[0][1]
s = select([stock2_table.c.open_2,stock2_table.c.close_2]).where(stock2_table.c.s
result = conn.execute(s)
result = result.fetchall()
open_2_d1 = result[0][0]
close_2_d1 = result[0][1]
s=select([Pairs_table.c.volatility]).where(Pairs_table.c.symbol_1 == ticker_1).who
result = conn.execute(s)
volatility = result.fetchall()
volatility = volatility[0][0]
if((close_1_d1/close_2_d1 - open_1_d2/open_2_d2)>= (k * volatility)):
    N1 = -10000
    print("")
    print("We accomplish result shown below:")
    print("Short this pair")
    print("Historical volatility:{}".format(volatility))
    print("Short {s1} of 10000 shares".format(s1 = ticker 1,s2 = N1))
    N2 = -np.floor(N1 * (open_1_d2/open_2_d2))
    print("long {s1} of {s2} shares".format(s1 =ticker_2 ,s2 = N2))
    PnL = N1 * (close_1_d2 - open_1_d2) + N2 * (close_2_d2 - open_2_d2)
    print("Overall PnL :{}".format(PnL))
else:
    N1 = 10000
    print("")
    print("We accomplish result shown below:")
    print("Long this pair")
    print("Historical volatility:{}".format(volatility))
```

```
print("Long {s1} of 10000 shares".format(s1 = ticker_1,s2 = N1))
N2 = -N1 * (open_1_d2/open_2_d2)
print("short {s1} of {s2} shares".format(s1 = ticker_2 ,s2 = N2))
PnL = N1 * (close_1_d2 - open_1_d2) + N2 * (close_2_d2 - open_2_d2)
print("Overall PnL :{}".format(PnL))
return 12138
```

```
In [48]: real_time_trading()
Real time trade start:
Please enter parameter k:
Please input ticker for the first stock of the pair:
AAPL
Please enter a open price for it
160
Please enter a close price for it
Please input ticker for the second stock of the pair:
HPQ
Please enter a open price for it
20
Please enter a close price for it
Which day you want to choose as yesterday? (Please enter as yyyy-mm-dd)
2018-12-31
We accomplish result shown below:
Long this pair
Historical volatility:0.5553570579532815
Long AAPL of 10000 shares
short HPQ of -80000.0 shares
Overall PnL :-70000.0
```

Out [48]: 12138