

```
1 # IE598 Project - Joseph Loss
2 #
3 # tmp_hft_model.py
4 # Modification of original hft_model file to suit needs
5 #
6 # THIS IS A WORK IN PROGRESS FILE - T HERE MAY BE (AND LIKELY IS) SEVERAL BUGS
7 #
8 import datetime as dt
9 import sys
10 import threading
11 import time
12
13 import numpy as np
14 import pandas as pd
15 from ib.opt import ibConnection, Connection
16 from ibapi.wrapper import EWrapper
17
18 import ib_data_types as datatype
19 from chart import Chart
20 from ib_util import IBUtil
21 from contract_data import ContractData
22 from strategy_parameters import StrategyParameters
23
24
25 # from ibapi import client, wrapper, common, ticktype, message, utils, reader
26
27 class HFTModel:
28
29     def __init__(self,
30                 host = 'localhost',
31                 port = 4002,
32                 # port = 7497,
33                 client_id = 1, is_use_gateway = True,
34                 evaluation_time_secs = 20,
35                 resample_interval_secs = '30s',
36                 moving_window_period = dt.timedelta(seconds = 90)):
37
38         self.moving_window_period = moving_window_period
39         self.chart = Chart()
40         self.ib_util = IBUtil()
41
42         # Store parameters for this model
43         self.strategy_params = StrategyParameters(evaluation_time_secs, resample_interval_sec:
44
45         self.stocks_data = { } # Dictionary storing StockData objects.
46         self.symbols = None # List of current symbols
47         self.account_code = ""
48         self.prices = None # Store Last prices in a DataFrame
49         self.trade_qty = 100
50         self.order_id = 4751
51         self.lock = threading.Lock()
52
53         # Use ibConnection() for TWS, or create connection for API Gateway
54         self.conn = ibConnection() if is_use_gateway else Connection.create(host = host, port
client_id)
```

```
55     self.__register_data_handlers(self.__on_tick_event, self.__event_handler)
56
57
58     statistics_params = (
59         ('m', 0.564), # slope
60         ('b', 5.597244), # intercept
61         ('std', 1.355027),
62         ('avg', 0.5),
63         ('muti', 1), # muti*std+avg
64         ('size', 1000)
65     )
66
67
68     def __perform_trade_logic(self):
69         volatility_ratio = self.strategy_params.get_volatility_ratio()
70
71         is_up_trend, is_down_trend = volatility_ratio > 1.0, volatility_ratio < 1.0
72         is_overbought, is_oversold = self.__is_overbought_or_oversold()
73
74         # Our final trade signals
75         is_buy_signal, is_sell_signal = (is_up_trend and is_oversold), (is_down_trend and is_
76
77         # Use account position details
78         symbol_a = self.symbols[0]
79         position = self.stocks_data[symbol_a].position
80
81         is_position_closed, is_short, is_long = (position == 0), (position < 0), (position > 0)
82
83         upnl, rpnl = self.__calculate_pnls()
84
85         # Display to terminal dynamically
86         signal_text = "BUY" if is_buy_signal else "SELL" if is_sell_signal else "NONE"
87         console_output = '\r[%s] signal=%s, position=%s UPnL=%s RPnL=%s\r' % (dt.datetime.now
position, upnl, rpnl)
88         sys.stdout.write(console_output)
89         sys.stdout.flush()
90
91         # Buy/Sell Signals:
92         if is_position_closed and is_sell_signal:
93             print("=====")
94             print("OPEN SHORT POSIITON: SELL A BUY B")
95             print("=====")
96             self.__place_spread_order(-self.trade_qty)
97
98         elif is_position_closed and is_buy_signal:
99             print("=====")
100             print("OPEN LONG POSIITON: BUY A SELL B")
101             print("=====")
102             self.__place_spread_order(self.trade_qty)
103
104         elif is_short and is_buy_signal:
105             print("=====")
106             print("CLOSE SHORT POSITION: BUY A SELL B")
107             print("=====")
108             self.__place_spread_order(self.trade_qty)
```

```
109
110     elif is_long and is_sell_signal:
111         print("=====")
112         print("CLOSE LONG POSITION: SELL A BUY B")
113         print("=====")
114         self.__place_spread_order(-self.trade_qty)
115
116
117     def __recalculate_strategy_parameters_at_interval(self):
118         """
119         Consider re-evaluation of parameters on:
120         - regime shifts
121         - structural breaks
122         """
123         if self.strategy_params.is_evaluation_time_elapsed():
124             self.__calculate_strategy_params()
125             self.strategy_params.set_new_evaluation_time()
126             print('[%s] === Beta re-evaluated ===' % dt.datetime.now())
127
128
129     def __calculate_strategy_params(self):
130         """
131         Here, we are calculating beta and volatility ratio
132         for our signal indicators.
133
134         Consider calculating other statistics here:
135         - stddevs of errs
136         - correlations
137         - co-integration
138         """
139         [symbol_a, symbol_b] = self.symbols
140         filled_prices = self.prices.fillna(method = 'ffill')
141         resampled = filled_prices.resample(self.strategy_params.resample_interval_secs).ffill
142
143         mean = np.mean(resampled)
144         beta = mean[symbol_a] / mean[symbol_b]
145
146         # self.symbols[symbol_b]
147
148         stddevs = np.std(resampled.pct_change().dropna())
149         volatility_ratio = stddevs[symbol_a] / stddevs[symbol_b]
150         # import random
151         # volatility_ratio = random.normalvariate(0,1)
152
153         self.strategy_params.add_indicators(beta, volatility_ratio)
154
155
156     def __register_data_handlers(self,
157                                tick_event_handler,
158                                universal_event_handler):
159         self.conn.registerAll(universal_event_handler)
160         self.conn.unregister(universal_event_handler,
161                              EWrapper.tickSize,
162                              EWrapper.tickPrice,
163                              EWrapper.tickString,
```

```
164         EWrapper.tickGeneric,
165         EWrapper.tickOptionComputation)
166     self.conn.register(tick_event_handler,
167                       EWrapper.tickPrice,
168                       EWrapper.tickSize)
169
170
171     def __init_stocks_data(self, symbols):
172         self.symbols = symbols
173         self.prices = pd.DataFrame(columns = symbols) # Init price storage
174         for stock_symbol in symbols:
175             contract = self.ib_util.create_stock_contract(stock_symbol)
176             self.stocks_data[stock_symbol] = ContractData(contract)
177
178
179     # Request Streaming Market Data
180     def __request_streaming_data(self, ib_conn):
181         for index, (key, stock_data) in enumerate(self.stocks_data.items()):
182             ib_conn.reqMktData(index,
183                               stock_data.contract,
184                               datatype.GENERIC_TICKS_NONE,
185                               datatype.SNAPSHOT_NONE)
186             time.sleep(1)
187
188     #
189     -----
190     # Requesting Bid/Ask Tick Data:
191     # This is proving extremely difficult to implement; work in progress.
192
193     #     def __request_bidask_data(self, ib_conn):
194     #         for index, (key, stock_data) in enumerate(self.stocks_data.items()):
195     #             client.EClient.reqTickByTickData(self, index, stock_data.contract, "BidAsk",
196     #                                             time.sleep(1))
197
198     # Stream account updates
199     ib_conn.reqAccountUpdates(True, self.account_code)
200
201     # Request Historical Data
202     def __request_historical_data(self, ib_conn):
203         self.lock.acquire()
204         try:
205             for index, (key, stock_data) in enumerate(
206                 self.stocks_data.items()):
207                 stock_data.is_storing_data = True
208                 ib_conn.reqHistoricalData(
209                     index,
210                     stock_data.contract,
211                     time.strftime(datatype.DATE_TIME_FORMAT),
212                     datatype.DURATION_1_HR,
213                     datatype.BAR_SIZE_5_SEC,
214                     datatype.WHAT_TO_SHOW_TRADES,
215                     datatype.RTH_ALL,
216                     datatype.DATEFORMAT_STRING)
217                 time.sleep(1)
```

```
218         finally:
219             self.lock.release()
220
221
222     def __wait_for_download_completion(self):
223         is_waiting = True
224         while is_waiting:
225             is_waiting = False
226             self.lock.acquire()
227             try:
228                 for symbol in self.stocks_data.keys():
229                     if self.stocks_data[symbol].is_storing_data:
230                         is_waiting = True
231             finally:
232                 self.lock.release()
233             if is_waiting:
234                 time.sleep(1)
235
236
237     def __place_spread_order(self, qty):
238         [symbol_a, symbol_b] = self.symbols
239         self.__send_order(symbol_a, qty)
240         self.__send_order(symbol_b, -qty)
241
242
243     def __send_order(self, symbol, qty):
244         stock_data = self.stocks_data[symbol]
245         order = self.ib_util.create_stock_order(abs(qty), qty > 0)
246         self.conn.placeOrder(self.__generate_order_id(),
247                               stock_data.contract,
248                               order)
249         stock_data.add_to_position(qty)
250
251
252     def __generate_order_id(self):
253         next_order_id = self.order_id
254         self.order_id += 1
255         return next_order_id
256
257
258     def __on_portfolio_update(self, msg):
259         for key, stock_data in self.stocks_data.items():
260             if stock_data.contract.m_symbol == msg.contract.m_symbol:
261                 stock_data.update_position(msg.position,
262                                           msg.marketPrice,
263                                           msg.marketValue,
264                                           msg.averageCost,
265                                           msg.unrealizedPNL,
266                                           msg.realizedPNL,
267                                           msg.accountName)
268
269         return
270
271
272     # -----
273     # Overbought / Oversold Trading Signal
```

```

273 # This code is necessary to run the original trade logic above.
274 # I commented it out so I could create my own strategy.
275
276 def __is_overbought_or_oversold(self):
277     [symbol_a, symbol_b] = self.symbols
278     # leg_a_last_price = np.mean(self.prices[symbol_a].values[-25:])
279     # leg_b_last_price = np.mean(self.prices[symbol_b].values[-25:])
280
281
282     # Limit Loss, we will not trade unless  $-(2*std + 0.5) \leq (BP-m*RSDA-b) \leq (2*std + 0$ 
283     if (((self.prices[symbol_a].values[0] - self.statistics_params.m *
284           self.prices[symbol_b].values[0] - self.statistics_params.b) <=
285         (2 * self.statistics_params.std * self.statistics_params.muti + self.statistics_
286          ((self.prices[symbol_a].values[0] - self.statistics_params.m *
287            self.prices[symbol_b].values[0] - self.statistics_params.b) >=
288          -(2 * self.statistics_params.std * self.statistics_params.muti + self.statis
289
290         # Buy  $BP-m * RSDA-b > 1*std + 0.5$ 
291         if ((self.self.prices[symbol_a].values[0] - self.statistics_params.m *
self.self.prices[symbol_b].values[
292             0] - self.statistics_params.b) > (self.statistics_params.std * self.statistic:
self.statistics_params.avg)):
293             self.log('SELL PORTFOLIO,SELL{},BUY{}'.format(self.self.prices[symbol_a].valu
self.self.prices[symbol_b].values[0]))
294             # Keep track of the created order to avoid a 2nd order
295             self.order = self.sell(self.datas[0], size = self.statistics_params.size)
296             self.order = self.buy(self.datas[1], size = int(self.statistics_params.m *
self.statistics_params.size))
297
298         #  $BP-m*RSDA-b < -(1*std + 0.5)$ 
299         elif ((self.self.prices[symbol_a].values[0] - self.statistics_params.m *
self.self.prices[symbol_b].values[
300             0] - self.statistics_params.b) < -(self.statistics_params.std * self.statisti
self.statistics_params.avg)):
301             self.log('BUY PORTFOLIO,BUY{},SELL{}'.format(self.self.prices[symbol_a].value:
self.self.prices[symbol_b].values[0]))
302             # Keep track of the created order to avoid a 2nd order
303             self.order = self.buy(self.datas[0], size = self.statistics_params.size)
304             self.order = self.sell(self.datas[1], size = int(self.statistics_params.m *
self.statistics_params.size))
305
306         # this part is not exactly what I want but till now it is fine
307         else:
308             # if the price is too high we need to buy our portfolio back incase of risk(buy BI
309             if ((self.self.prices[symbol_a].values[0] - self.statistics_params.m *
self.self.prices[symbol_b].values[
310                 0] - self.statistics_params.b) >= (
311                 2 * self.statistics_params.std * self.statistics_params.muti + self.stati:
312                 self.log('CLOSE THE SELL LIMIT LOSS,BUY{},SELL{}'.format(self.self.prices[syml
313                                     self.self.prices[syml
314                 # Keep track of the created order to avoid a 2nd order
315                 self.order = self.buy(self.datas[0], size = self.statistics_params.size)
316                 self.order = self.sell(self.datas[1], size = int(self.statistics_params.m *
self.statistics_params.size))
317
318             # if the price is too low we need to sell our portfolio back incase of risk(sell I

```

```

319         elif ((self.self.prices[symbol_a].values[0] - self.statistics_params.m *
self.self.prices[symbol_b].values[
320             0] - self.statistics_params.b) <= -(
321                 2 * self.statistics_params.std * self.statistics_params.muti + self.stati:
322                 self.log('CLOSE THE BUY LIMIT LOSS,SELL{},BUY{}'.format(self.self.prices[symb
self.self.prices[symb
323
324                 # Keep track of the created order to avoid a 2nd order
325                 self.order = self.sell(self.datas[0], size = self.statistics_params.size)
326                 self.order = self.buy(self.datas[1], size = int(self.statistics_params.m *
self.statistics_params.size))
327
328         else:
329             # SELL
330             #  $-0.5 < BP-m*RSDA-b < 0.5$ 
331             if (((self.self.prices[symbol_a].values[0] - self.statistics_params.m *
self.self.prices[symbol_b].values[
332                 0] - self.statistics_params.b) < self.statistics_params.avg) and
333                 ((self.self.prices[symbol_a].values[0] - self.statistics_params.m *
self.self.prices[symbol_b].values[
334                 0] - self.statistics_params.b) > -self.statistics_params.avg)):
335
336                 # comes from higher portfolio value
337                 if ((self.self.prices[symbol_a].values[0] - self.statistics_params.m *
self.self.prices[symbol_b].values[
338                 0] - self.statistics_params.b) > 0):
339                     self.log('CLOSE THE SELL,BUY{},SELL{}'.format(self.self.prices[symbol
self.self.prices[symbol
340
341                     # Keep track of the created order to avoid a 2nd order
342                     self.order = self.buy(self.datas[0], size = self.statistics_params.si:
343                     self.order = self.sell(self.datas[1], size = int(self.statistics_param
self.statistics_params.size))
344
345                 # comes from lower portfolio value
346             else:
347                 self.log(
348                 'CLOSE THE BUY,SELL{},BUY{}'.format(self.self.prices[symbol_a].va:
self.self.prices[symbol_b].values[0]))
349                 # Keep track of the created order to avoid a 2nd order
350                 self.order = self.sell(self.datas[0], size = self.statistics_params.s:
351                 self.order = self.buy(self.datas[1], size = int(self.statistics_param:
self.statistics_params.size))
352
353
354             # expected_leg_a_price = leg_b_last_price * self.strategy_params.get_beta()
355             #
356             # is_overbought = leg_a_last_price < expected_leg_a_price # Cheaper than expected
357             # is_oversold = leg_a_last_price > expected_leg_a_price # Higher than expected
358             # return is_overbought, is_oversold
359
360
361     def __calculate_pnls(self):
362         upnl, rpnl = 0, 0
363         for key, stock_data in self.stocks_data.items():
364             upnl += stock_data.unrealized_pnl
365             rpnl += stock_data.realized_pnl
366         return upnl, rpnl

```

```
367
368
369 def __event_handler(self, msg):
370     if msg.typeName == datatype.MSG_TYPE_HISTORICAL_DATA:
371         self.__on_historical_data(msg)
372
373     elif msg.typeName == datatype.MSG_TYPE_UPDATE_PORTFOLIO:
374         self.__on_portfolio_update(msg)
375
376     elif msg.typeName == datatype.MSG_TYPE_MANAGED_ACCOUNTS:
377         self.account_code = msg.accountsList
378
379     elif msg.typeName == datatype.MSG_TYPE_NEXT_ORDER_ID:
380         self.order_id = msg.orderId
381     else:
382         print(msg)
383
384
385 def __on_historical_data(self, msg):
386     print(msg)
387     ticker_index = msg.reqId
388     if msg.WAP == -1:
389         self.__on_historical_data_completed(ticker_index)
390     else:
391         self.__add_historical_data(ticker_index, msg)
392
393
394 def __on_historical_data_completed(self, ticker_index):
395     self.lock.acquire()
396     try:
397         symbol = self.symbols[ticker_index]
398         self.stocks_data[symbol].is_storing_data = False
399     finally:
400         self.lock.release()
401
402
403 def __add_historical_data(self, ticker_index, msg):
404     timestamp = dt.datetime.strptime(msg.date, datatype.DATE_TIME_FORMAT)
405     self.__add_market_data(ticker_index, timestamp, msg.close)
406
407
408 def __on_tick_event(self, msg):
409     ticker_id = msg.tickerId
410     field_type = msg.field
411
412     # Store information from last traded price
413     if field_type == datatype.FIELD_LAST_PRICE:
414         last_price = msg.price
415         self.__add_market_data(ticker_id, dt.datetime.now(), last_price)
416         self.__trim_data_series()
417
418     # Post-bootstrap - make trading decisions
419     if self.strategy_params.is_bootstrap_completed():
420         self.__recalculate_strategy_parameters_at_interval()
421         self.__perform_trade_logic()
```



```
422         self.__update_charts()
423
424
425     def __add_market_data(self, ticker_index, timestamp, price):
426         symbol = self.symbols[ticker_index]
427         self.prices.loc[timestamp, symbol] = float(price)
428         self.prices = self.prices.fillna(method = 'ffill') # Clear NaN values
429         self.prices.sort_index(inplace = True)
430
431
432     def __update_charts(self):
433         if len(self.prices) > 0 and len(self.strategy_params.indicators) > 0:
434             self.chart.display_chart(self.prices,
435                                     self.strategy_params.indicators)
436
437
438     def __trim_data_series(self):
439         cutoff_timestamp = dt.datetime.now() - self.moving_window_period
440         self.prices = self.prices[self.prices.index >= cutoff_timestamp]
441         self.strategy_params.trim_indicators_series(cutoff_timestamp)
442
443
444     @staticmethod
445     def __print_elapsed_time(start_time):
446         elapsed_time = time.time() - start_time
447         print("Completed in %.3f seconds." % elapsed_time)
448
449
450     def __cancel_market_data_request(self):
451         for i, symbol in enumerate(self.symbols):
452             self.conn.cancelMktData(i)
453             time.sleep(1)
454
455
456     def start(self, symbols, trade_qty):
457         print("IB PairsTrading Algo model started.")
458         self.trade_qty = trade_qty
459
460         self.conn.connect() # Get IB connection object
461         self.__init_stocks_data(symbols)
462         self.__request_streaming_data(self.conn)
463
464         print("Bootstrapping the model...")
465         start_time = time.time()
466         self.__request_historical_data(self.conn)
467         self.__wait_for_download_completion()
468         self.strategy_params.set_bootstrap_completed()
469         self.__print_elapsed_time(start_time)
470
471         print("Calculating strategy parameters...")
472         start_time = time.time()
473         self.__calculate_strategy_params()
474         self.__print_elapsed_time(start_time)
475
476         print("Trading started.")
```

```
477     try:
478         self.__update_charts()
479
480     while True:
481         self.__recalculate_strategy_parameters_at_interval()
482         self.__perform_trade_logic()
483         self.__update_charts()
484         self.__calculate_pnls()
485         time.sleep(1)
486
487
488     except Exception as e:
489         print("Exception:", e)
490         print("Cancelling...", )
491         self.__cancel_market_data_request()
492
493         print("Disconnecting...")
494         self.conn.disconnect()
495         time.sleep(1)
496
497         print("Disconnected.")
498
```