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Quick start-up

Completed start-up

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Possible improvements

Improvements in predictive models, using multi-dimensional

Review the way ground true is obtained

Add news sentiment indicator

Add balance sheets

<u>List of suggested improvements:</u>

Indicator names:

INTRODUCTION

The stock market is moved by technical indicators, there are several types of volatility, cycle volume, candlesticks, supports, resistances, moving averages...

An excellent site to see all the stock market technical indicators is webull https://app.webull.com/trade?source=seo-google-home.

Image: webull with Stochastic, MACD and RSI indicators



On the stock market graphs have been invented EVERY possible way to predict the stock market, with mixed results, making clear the difficulty of predicting human behavior.

These indicators indicate where to buy and sell, there are many beliefs about them (we mean in beliefs, because if they always worked we would all be rich).

Any technical indicator can be obtained by means of programmable mathematical operations.

Three examples:

RSI or Relative Strength Index is an oscillator that reflects relative strength Greater than 70 overbought, indicates that it will go down.

Less than 70 oversold, indicates that it will go higher

MACD is the acronym for Moving Average Convergence / Divergence. The MACD in the stock market is used to measure the robustness of the price movement. Through the crossing of the line of this indicator and the moving average

It operates on the basis of the crossovers between these two lines Or it is operated when both exceed zero.

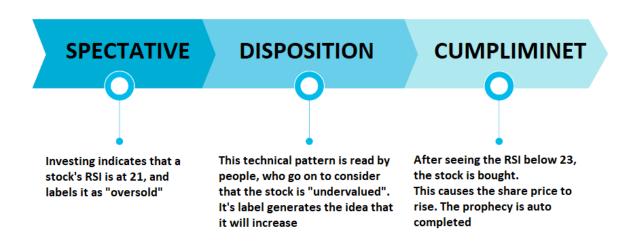
Candlestick: Morning Star The morning star pattern is considered a hopeful sign in a bearish market trend.



These indicators are present in refuted and popular websites like investing.com to be analyzed by the market https://es.investing.com/equities/apple-computer-inc-technical

It is extremely difficult to predict the price of any stock. Inflation, wars, populism, all this conditions affect the economy, and it becomes difficult, if not impossible to predict what Vladimir Putin will do tomorrow.

Here enters the self-fulfilling prophecy principle of explained is, at first, a "false" definition of the situation, which awakens a new behavior that makes the original false conception of the situation become "true". Example:



OBJECTIVE

Understanding the principle of self-fulfilling prophecy, it is possible to obtain the pattern of the same, by means of the massive collection of technical patterns, their calculation and the study of their patterns.

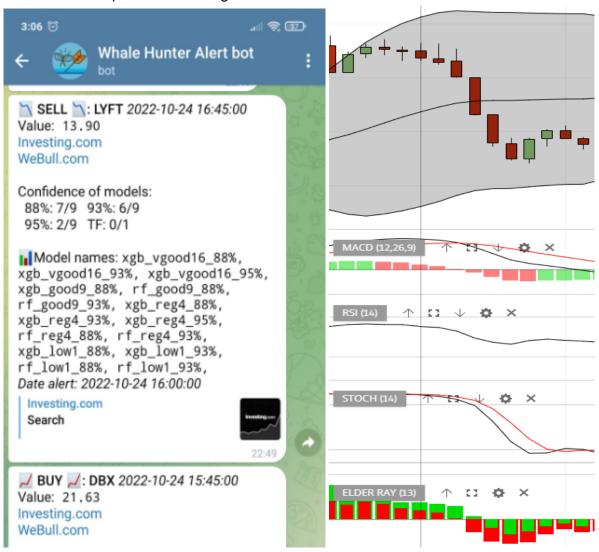
For this, techniques such as big data will be used through Pandas Python libraries, machine learning through Sklearn, XGB and neural networks through the open google Tensor Flow library.

The result will be displayed in a simple and friendly way through alerts on mobile or computer.

Example of a real-time alert via telegram bot https://t.me/Whale_Hunter_Alertbot

The machine learning models Sklearn, XGB and Tensor Flow, by means of the learning of the last months detect the point of <u>sale</u>. To detect this point of sale a series of indicators have been taken into account: <code>olap_VMAP</code>, <code>ma_SMA_50</code>, <code>ichi_senkou_a</code>, <code>olap_BBAND_dif</code>, <code>mtum_MACD_ext</code>, <code>olap_BBAND_MIDDLE</code>, <code>mtum_MACD_ext</code>, <code>olap_BBAND_MIDDLE</code>, <code>clap_BBAND_MIDDLE</code>, <code>clap_BBAND_MIDDL</code>

The image shows: MACD, RSI, Stochastic and Balance of power (Elder Ray)
The alert is sent on the vertical line, during the next 4 periods the stock decreases by 2.4%.
Each candlestick period in the image indicates 15 minutes.



OPERATION

1.1 Data collection

Collect data to train the model

```
yhoo generate big all csv.py
```

The closing data is obtained through yahoo API finance, and hundreds of technical patterns are calculated using the pandas_ta and talib libraries.

```
yhoo history stock.get SCALA csv stocks history Download list()
```

The model to be able to train in detecting points of purchase and sale, creates the column <code>buy_seel_point</code> has value of: 0, -100, 100. These are detected according to the maximum changes, (positive 100, negative -100) in the history of the last months, this point will be with which the training is trained, also called the *ground* true.

Value will be assigned in <code>buy_seel_point</code> if the increase or decrease of the stock is greater than 2.5% in a period of 3 hours, using the <code>get buy sell points Roll</code> function.

Once the historical data of the stock has been obtained and all the technical indicators have been calculated, a total of 1068, files of type <code>AAPL_stock_history_MONTH_3_AD.csv</code> are generated.

Example of the file with the first eight indicators:

```
Date buy sell point Open High Low Close Volume per Close Per Close
```

This data collection is customizable, you can obtain and train models of any Nasdaq stock, for other indicators or crypto-assets, it is also possible by making small changes.

Through the Option_Historical class it is possible to create historical data files: annual, monthly and daily.

```
class Option_Historical(Enum): YEARS_3 = 1, MONTH_3 = 2,
MONTH 3 AD = 3, DAY 6 = 4, DAY 1 = 5
```

The files \d_price_maxAAPL_min_max_stock_MONTH_3.csv are generated, which store the max and min value of each column, to be read in Model_predictions_Nrows.py_for a quick fit_scaler() (this is the "cleaning" process that the data requires before entering the AI training models). This operation is of vital importance for a correct optimization in reading data in real time.

1.2 Types of indicators

During the generation of the data collection file of point 1

AAPL_stock_history_MONTH_3_AD.csv 1068 technical indicators are calculated, which are divided into subtypes, based on **prefixes** in the name.

List of prefixes and an example of the name of one of them.

```
Overlap: olap_
```

Momentum: mtum

Volatility: vola

Cycle patterns: cycl_

• Candlestick patterns: cdl_

```
cdl_RICKSHAWMAN, cdl_RISEFALL3METHODS,
cdl SEPARATINGLINES
```

Statistics: sti

Moving averages: ma_

```
ma_SMA_100, ma_WMA_10, ma_DEMA_20, ma_EMA_100,
ma KAMA 10,
```

• Trend: **tend_** and **ti_**

```
tend_renko_TR, tend_renko_brick, ti_acc_dist,
ti_chaikin_10_3
```

Resistors and support suffixes: _s3, _s2, _s1, _pp, _r1, _r2, _r3

```
fibo_s3, fibo_s2, fibo_s1, fibo_pp, fibo_r1, fibo_r2,
fibo_r3, fibo_r2, fibo_r3
demark s1, demark pp, demark r1
```

Intersection point with resistance or support: pcrh_.

```
pcrh demark s1, pcrh demark pp, pcrh demark r1
```

Intersection point with moving average or of moving averages between them: mcrh_.

```
mcrh_SMA_20_TRIMA_50, mcrh_SMA_20_WMA_50,
mcrh_SMA_20_DEMA_100
```

Indicators of changes in the stock index, nasdaq: NQ_.

```
NQ SMA 20, NQ SMA 100
```

Note: To see the 1068 indicators used go to the attached sheets at the end of the document.

2 Indicator filtering

Execute to find out which columns are relevant for the model output Feature selection create json.py

```
It is necessary to know which of the hundreds of columns of technical data, is valid to train
the neural model, and which are just noise. This will be done through correlations and
Random Forest models.
```

Answer the question:

Which columns are most relevant for buy or sell points?

Generate the *best_selection* files, which are a raking of the best technical data to train the model, it is intended to go from 1068 columns to about 120.

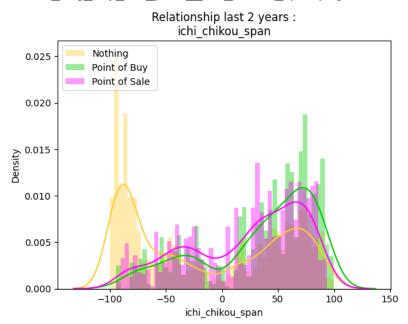
For example, for the Amazon stock, point-of-purchase detection, in the period June to October 2022, the most valuable indicators are:

- Senkuo of the Ichimoku Cloud
- Chaikin Volatility
- On-balance volume

Example of plots_relations/best_selection_AMNZ_pos.json file

```
"index": {
    "12": [
        "ichi_chilou_span"
],
    "10": [
        "volu_Chaikin_AD"
],
    "9": [
        "volu_OBV"
],
```

Plots with the 3 best technical data are printed in the folder *plots_relations/plot*. Example name: *TWLO_neg_buy_sell_point_ichi_chikou_span.png*



3 Training TensorFlow, XGB and Sklearn models

Model_creation_models_for_a_stock.py

this requires the selection of better columns from point #2 There are four types of predictive algorithms, AI models:

- Gradient Boosting consists of a set of individual decision trees, trained sequentially, so that each new tree tries to improve on the errors of the previous trees. Sklearn Library
- Random Forest Random forests are an ensemble learning method for classification, regression, and other tasks that operates by constructing a multitude of decision trees at training time. Sklearn Library
- **XGBoost** is an optimized distributed gradient boosting library designed to be highly efficient, flexible and portable. It implements machine learning algorithms under the Gradient Boosting framework. XGBoost Library
- TensorFlow TF is an open source library for machine learning across a range of tasks, and developed by Google to meet their needs for systems capable of building and training neural networks to detect and decipher patterns and correlations, analogous to the learning and reasoning used by humans. TensorFlow Library

There are POS (buy) or NEG (sell) models and there is a BOTH model (BOTH is discarded, since prediction models are binary, they only accept 2 positions, true or false). This point generates prediction models <code>.sav</code> for XGB and Sklearn. <code>.h5</code> for Tensor Flow. Naming Examples: <code>XGboost_U_neg_vgood16_s28.sav</code> and <code>TF_AMZN_pos_low1_s128.h5</code>

Format of the names:

- Type of AI you train with can be:
 - O XGboost, TF, TF64, GradientBoost and RandomForest
- Stock ticker AMZN for amazon, AAPL for Apple ...
- Detects points of purchase or sale pos or neg
- How many indicators have been used in the learning, can be of 4 types depending on the relevance given by point #2 Indicator filtering. This ranking is organized in the MODEL TYPE COLM class,
 - o vgood16 the best 16 indicators
 - o good9 the best 32 indicators
 - o reg4 the best 64 indicators
 - low1 the best 128 indicators
- Only for TF models. Depending on the density of the neurons used, defined in the class a_manage_stocks_dict. MODEL_TF_DENSE_TYPE_ONE_DIMENSI can take value: s28 s64 and s128

These combinations imply that for each stock 5 types of IA are created, each in pos and neg, plus for each combination the 4 technical indicator configurations are added. This generates 40 IA models, which will be selected in point: #4 to evaluate the QUALITY of those models.

Each time an AI template is generated, a log file is generated: TF_balance_TF_AAPL_pos_reg4.h5_accuracy_87.6%__loss_2.74__epochs_10[160].csv It contains the accuracy and loss data of the model, as well as the model training records.

4.1 Assessing the QUALITY of these models

```
Model creation scoring.py
```

To make a prediction with the Als, new data is collected and the technical indicators with which it has been trained are calculated according to the *best_selection* files.

When the .h5 and .sav models are queried:

Is this a point of sale?

These answer a number that can vary between 0.1 and 4

The higher the number the more likely it is to be a correct buy/sell point.

Each model has a rating scale on which it is considered point of sale. For some models with a rating of more than 0.4 will be enough (usually the xgboost), while for others require more than 1.5 (usually the TF).

How do you know what the threshold score is for each model?

The Model_creation_scoring.py class generates the threshold score *threshold* files, which tell which threshold point is considered the buy-sell point.

Each AI model will have its own type file:

Models/Scoring/AAPL_neg__when_model_ok_threshold.csv

For each action in #3 train the TF, XGB and Sklearn models, 40 Al models are generated. This class evaluates and selects the most accurate models so that only the most accurate ones will be executed in real time (usually between 4 and 8 are selected).

```
Models/Scoring/AAPL_neg__groupby_buy_sell_point_000.json
"list_good_params": [
    "r_rf_AFRM_pos_low1_",
    "r_TF64_AFRM_pos_vgood16_",
    "r_TF64_AFRM_pos_good9_",
    "r TF AFRM pos reg4 "
```

4.2 Evaluating those real BENEFITS of models

```
Model predictions N eval profits.py
```

Answer the question:

],

If you leave it running for N days, how much hypothetical money do you make?

Note: this should be run on data that has not been used in the training model, preferably

Models/eval Profits/ AAPL neg ALL stock 20221021 20221014.csv

5.1 Making predictions for the past week

```
Model predictions Nrows.py
```

You can make predictions with the real-time data of the stock.

Through the function call every 10-12min, download the real-time stock data through the yahoo financial API.

```
df compare, df sell = get RealTime buy seel points()
```

This run generates the log file *d_result/prediction_results_N_rows.csv*

This file and the notifications (telegram and mail) contain information about each prediction that has been made. It contains the following columns:

- Date: date of the prediction
- Stock: stock
- buy_sell: can be either NEG or POS, depending on whether it is a buy or sell transaction.
- Close: This is the scaled value of the close value (not the actual value).
- Volume: This is the scaled value of the Volume (not the actual value).
- 88%: Fractional format (5/6) How many models have predicted a valid operating point above 88%? Five of the six analyzed
- 93%: Fractional format (5/6), number of models above 93%.
- 95%: Fractional format (5/6), number of models above 95%.
- TF: Fractional format (5/6), number of models above 93%, whose prediction has been made with Tensor Flow models.
- Models_names: name of the models that have tested positive, with the hit % (88%, 93%, 95%) as suffix

Registration example

```
2022-11-07 16:00:00 MELI NEG -51.8 -85.80 5/6 0/6 0/6 0/6 1/2 TF_reg4_s128_88%, rf_good9_88%, rf_low1_88%, rf_reg4_88%, rf_vgood16 88%,
```

To be considered a valid prediction to trade, it must have <u>at least</u> half of the fraction score in the 93% and TF columns.

More than half of the models have predicted with a score above 93% which is a good point for trading

5.2 Sending real-time alerts

```
predict POOL enque Thread.py multithreading glued 2s per action
```

It is possible to run it without configuring telegram point 5.2, in that case no alerts will be sent in telegram, but if the results were recorded in real time in: d_result/prediction_real_time.csv

There is the possibility to send alerts of purchase and sale of the share, to telegram or mail. the multiple AI trained models are evaluated, and only those greater than 96% probability (as previously trained) are reported.

Every 15 minutes, **all** necessary indicators are calculated in real time for each action and evaluated in the Al models.

The alert indicates which models are detecting the correct buy and sell points at which to execute the transaction.

These buy and sell alerts expire in, plus or minus 7 minutes, given the volatility of the market.

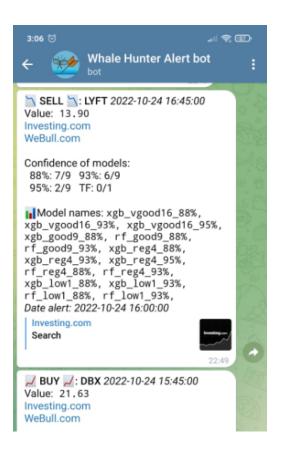
Also attached is the price at which it was detected, the time, and links to news websites.

Note: financial news should always prevail over technical indicators.

What is displayed in DEBUG alert, is the information from

d_result/prediction_results_N_rows.csv of the Item: 5 make predictions of the last week Test

To understand the complete information of the alert see Point 5.1 Making predictions of the last week.



Quick start-up

Install requirements

pip install -r requirements.txt

Run_Utils/API_alphavantage_get_old_history.py
Run_yhoo_generate_big_all_csv.py

```
Run_Model_creation_models_for_a_stock.py
Run_Model_creation_scoring.py
Run_Model_predictions Nrows.py Optional, last week predictions
```

Real time forecasts:

Run_Utils/Volume_WeBull_get_tikcers.py | Ignore in case of using default configuration | Configure bot token see point 5.2 Configuring chatID and tokens in Telegram | Run_predict POOL inque Thread.py

It is possible to run it without configuring telegram point **5.2**, in that case no alerts will be sent in telegram, but if the results were recorded in real time in: d_result/prediction_real_time.csv

Completed start-up

(Running times are estimated for an intel i3 and 8GB of RAM)

- **0.0**The interpreter with which the tutorial has been made is python 3.8, IDE Pycharm, caution with the compatibility between versions of the library pandas and python For example: today do not use python 3.10, as it is incompatible with pandashttps://stackoverflow.com/questions/69586701/unable-to-install-pandas-for-python
- **0.1** Download and install requirements, the project is powerful and demanding in terms of libraries.

```
pip install -r requirements.txt
```

- **0.2** Search all files for the string **DOCU**. this allows to watch all files that are executable from the startup tutorial easily
- **0.3** In the file <code>a_manage_stocks_dict.py</code> all the configurations are stored, look at the document and know where it is.

In it there is the dictionary DICT COMPANYS

It contains the IDs (GameStops quotes with the ID: GME) of the companies to analyze. You can customize and create a class from the **nasdaq** tikers, by default the key @Folo3 will be used which will analyze these 39 companies.

"@FOLO3:

```
["UPST", "MELI", "TWLO", "RIVN", "SNOW", "LYFT", "ADBE", "UBER", "ZI", "QCOM", "PYPL", "SPOT", "RUN", "GTLB", "MDB", "NVDA", "AMD" ADSK", "ADSK", "AMZN", "CRWD", "NVST", "HUBS", "EPAM", "PINS", "TTD", "SNAP", "APPS", "ASAN", "AFRM", "DOCN", "ETSY", "DDOG", "SHOP", "NIO", "U", "GME", "RBLX", "CRSR"],
```

If a faster execution is desired, it is recommended to delete items from the list and leave three

1 Historical data collection

1.0 (Recommended) alphavantage API

The API yfinance, if you want price to price intervals in 15min intervals is limited to 2 months, to get more time data up to 2 years back (more data better predictive models) use the free version of the API https://www.alphavantage.co/documentation/

Run_Utils/API alphavantage_get_old_history.py

The class is customizable: action intervals, months to ask, and ID action.

Note: being the free version, there is a portrait between request and request, to get a single 2 years history it takes 2-3 minutes per action.

Once executed, the folder: <code>d_price/RAW_alpha</code> will be filled with historical OHLCV .csv of share prices. These files will be read in the next step. Example name:

```
alpha GOOG 15min 20221031 20201112.csv
```

Check that one has been generated for each action in *d_price/RAW_alpha*.

1.1 The OHLCV history of the stock must be generated.

As well as the history of technical patterns. It takes +-1 minute per share to calculate all technical patterns.

```
Run yhoo generate big all csv.py
```

Once executed the folder: *d_price* will be filled with historical OHLCV .csv of share prices. Three types of files are generated (Example of name type for action: AMD):

- AMD_SCALA_stock_stock_history_MONTH_3_AD.csv with all technical patterns calculated and applied a fit scaler(-100, 100), i.e. the stock prices are scaled (size: 30-90mb)
- *d_price/min_max/AMD_min_max_stock_MONTH_3_AD.csv* with scaling keys (size: 2-7kb)
- AMD_stock_history_MONTH_3_AD.csv the pure history of the OHLCVs (size: 2-7mb)

Note: MONTH_3_AD means 3 months of API yfinance plus the history collected from alphavantage. Point 1.0

Check that one has been generated for each action.

2 Filtering technical indicators

It is necessary to separate the technical indicators which are related to buy or sell points and which are noise. 20 seconds per share

```
Run Model creation scoring.py
```

Three files are generated for each action in the folder: *plots_relations*, relations for purchase "pos", relations for sale "neg" and relations for both "both".

plots_relations/best_selection_AMD_both.json

These files contain a ranking of which technical indicator is best for each stock.

Check that three .json have been generated for each action in *plots relations* .

3 Generate TensorFlow, XGB and Sklearn model training

Train the models, for each action 36 different models are trained. 15 minutes per share.

Run Model creation models for a stock.py

The following files are generated for each action:

Models/Sklearn smote folder:

- XGboost_AMD_yyy_xxx_.sav
- RandomForest_AMD_yyy_xxx_.sav
- XGboost AMD yyy xxx .sav

Models/TF_balance folder:

- TF_AMD_yyy_xxx_zzz.h5
- TF_AMD_yyy_xxx_zzz.h5_accuracy_71.08%__loss_0.59__epochs_10[160].c sv

xxx can take value vgood16 good9 reg4 and low1

yyy can take value "pos" and "neg".

zzz can take value s28 s64 and s128

Check that all combinations of files exposed by each action have been generated in the /Models subfolders.

4 Evaluate quality of predictive models

From the 36 models created for each OHLCV history of each stock, only the best ones will be run in real time, in order to select and evaluate those best ones.

Run Model creation scoring.py

In the *Models/Scoring* folder

AMD_yyy__groupby_buy_sell_point_000.json

AMD yyy when model ok threshold.csv

Check that two have been generated for each action.

5 Predictions

5.0 make predictions of the last week Optional Test

Run Model predictions Nrows.py

This run generates the log file *d_result/prediction_results_N_rows.csv*

Generates a sample file with predictions for the last week, data obtained with yfinance.

Check that records exist

5.1 Getting OHLCV data in real time

In case you want to predict actions in the @FOLO3 list, ignore this point.

It is difficult to get real time OHLCV, especially volume (yfinance gives real time volume, but this is not a correct value and after 1-2 hours it changes, making it unfeasible to use yfinance for real time predictions).

To get correct volumes in real time, queries are made to webull, for each stock every 2.5 minutes, a webull ID is required, the default ones @FOLO3 are cached and downloaded in a_manage_stocks_dict.py. DICT_WEBULL_ID

But if you want to use actions outside the list @FOLO3

```
In Utils/Volume_WeBull_get_tikcers.py
```

Change the example list:

```
list stocks = ["NEWS", "STOCKS", "WEBULL", "IDs"]
```

By the nasdag ticker, of the webull ID you want to get.

```
Run Utils/Volume WeBull get tikcers.py
```

Once executed it will show a list on screen, that must be added in a manage stocks dict.py.DICT WEBULL ID

```
"MELI" : 913323000,
"TWLO" : 913254000,
```

5.2 Setting up chatIDs and tokens in Telegram

You have to get the telegram token and create a channel.

You can get the token by following the tutorial:

https://www.siteguarding.com/en/how-to-get-telegram-bot-api-token

With the token update the variable of ztelegram send message handle.py

```
#Get from telegram
TOKEN = "00000000xxxxxxx"
```

Once the token has been obtained, the chatld of the users and administrator must be obtained.

Users only receive purchase and startup sale alerts, while the administrator receives alerts from users as well as possible problems.

To get the chatld of each user run <code>ztelegram_send_message_UptateUser.py</code> and then write any message to the bot, the chadID appears both in the console and in the user's chadID

```
[>>> BOT] Message Send on 2022-11-08 22:30:31:31
          Text: You "User nickname " send me:
"Hello world"
ChatId: "5058733760".
          From: Bot name
          Message ID: 915
          CHAT ID: 500000760
```

Pick up CHAT ID: 500000760

With the chatId of the desired users, add them to the LIST_PEOPLE_IDS_CHAT list. in ztelegram send message handle.py

5.3 Sending real-time alerts Telegram

It is possible to run it without configuring telegram, in that case no alerts will be sent in telegram, but the results will be recorded in real time in: d_result/prediction_real_time.csv It will be reported in console via:

```
is_token_telegram_configurated() - Results will be recorded in real
time, but no alert will be sent on telegram. File:
d_result/prediction_real_time.csv
is_token_telegram_configurated() - There is no value for the
telegram TOKEN, telegram is required to telegram one
```

The criteria to send alert or not is defined in the method

ztelegram_send_message.will_send_alert(). If more than half of the models have a score greater than 93% or the TF models have a score greater than 93%, an alert is sent to the consumer users.

Run predict POOL inque Thread.py

In this class there are 2 types of threads

- Producer, constantly asks for OHLCV data, once it is obtained, it enters it into a queue.
- Consumer (2 threads running simultaneously) are pulling OHLCV data from the queue, calculating technical parameters, making model predictions, registering them in <code>zTelegram_Registers.csv</code>, and if they meet the requirements they are sent by telegram.

Possible improvements

Improvements in predictive models, using multi-dimensional

Improvements in TF predictive models using tensors (multiple matrices over time) and non-matrices (mono temporal, current design).

```
In the class Model TF definitions. Model Definition.py
```

Through it, the model configurations, density, number of neurons, etc. are obtained. There are two methods:

- get_dicts_models_One_dimension() is currently used and generates TF model configurations for arrays.
- get_dicts_models_multi_dimension() is not in use, it is set to give multiple model configurations using tensors.

There is the Utils.Utils_model_predict.df_to_df_multidimension_array (dataframe, BACHT_SIZE_LOOKBACK) method, which transforms 2-dimensional df [columns, rows] to 3-dimensional df [columns, files, BACHT_SIZE_LOOKBACK].

BACHT_SIZE_LOOKBACK means how many records in the past tense are added to the df, the number is configurable and default value is eight.

To start the development must be to call the method with BACHT_SIZE_LOOKBACK with an integer value, the method will return a multidimensional df [columns, files,

```
BACHT_SIZE_LOOKBACK ], with which to feed the TF models.

Utils_model_predict.scaler_split_TF_onbalance(df, label name=Y TARGET, BACHT SIZE LOOKBACK=8)
```

Improvement: Once these multidimensional arrays are returned, models are obtained with get_dicts_models_multi_dimension(), it is not possible to train a model and make a prediction with multidimensional arrays.

Review the way ground true is obtained

Before training the models the intervals (of 15min) are classified as buy point 100 or 101, sell point -100 or .-101 or no trade point 0, these values are entered in the column $Y_{TARGET} =$ 'buy sell point' through the method

```
Utils.Utils_buy_sell_points.get_buy_sell_points_Roll().
```

The variation is calculated with respect to the following 12 windows (15min * 12 = 3 hours), and from there the 8% points of greatest rise and greatest fall are obtained, and these points are assigned values other than 0.

To obtain the Y_TARGET there are 2 methods that are responsible for the strategy to follow once you buy and sell, in case of loss will opt for Stop Loss.

```
rolling get sell price POS() and rolling get sell price NEG()
```

Optional improvement: the current system decides by percentages, i.e. the 16% highest rises and falls (8% each) are ground true. I.e. there are rises or falls greater than 3% that can be left out if the stock is very volatile.

Add news sentiment indicator

You get the news for each stock with

 ${\tt news_get_data_NUTS.get_news_sentiment_data()} \ \ \textbf{this method gets all the} \\ associated news from: INVESTING.com, YAHOO.com and FINVIZ.COM. \\$

(it uses investpy API, which recently october 2022 has started to fail, probably due to investing.com blocking https://github.com/alvarobartt/investpy)

Once these news items are obtained, the method

news_sentiment_va_and_txtBlod.get_sentiment_predictorS() proceeds to evaluate and score from -100 negative to 100 positive, using 4 models. It is convenient to introduce more news pages

The models are downloaded from the internet, either via AI models or libraries, you can find the references in:

```
news_sentiment_flair.get_sentiment_flair
news_sentiment_t5.get_sentiment_t5
news_sentiment_t5.get_sentiment_t5Be
get_sentiment_textBlod
```

Run news get data NUTS.get json news sentimet()

A .csv and .json file is generated, with action date the four models, the score and the news collected Example: <u>d_sentiment/stock_news_DATE_MELI.csv</u>

```
Date Ticker news_va news_fl news_t5 news_t5e news_t5be news_txtBlod Headline

2021-03-01 MELI 95.312 77.039 100.0 92.15 6.733 S&P 500 Earnings Increase As Yields Soar

The earnings per share (EPS) for all S&P 500 companies combined increased to $174.19 last week. The forward EPS

2019-09-05 MELI -82.026 -99.99 -100.0 -96.232 -12.56 MercadoLibre (MELI) Down 12% Since Last Earnings Report:

Can It Rebound? It has been about a month since the last earnings report for MercadoLibre (NASDAQ:MELI). Sha
```

Improvement: Once the sentiment-news score file is obtained, introduce it in the predictive models together with the technical indicators, it must be done in real time.

Add balance sheets

Economic balances can be added easily using the yahoo API https://github.com/ranaroussi/yfinance

```
# show financials
msft.financials
msft.quarterly financials
```

These balances are updated every quarter.

You can get the dates of publication of results in yahoo API

```
# show next event (earnings, etc)
msft.calendar
# show all earnings dates
msft.earnings dates
```

List of suggested improvements:

Allow to analyze stocks outside the nasdaq, change in :

```
yhoo_history_stock.__select_dowload_time_config()
Utils/API_alphavantage_get_old_history.py
```

Redirect remaining print() to Logger.logr.debug()

Translate through https://www.deepl.com/ the possible remaining messages in Spanish to English.

The plots generated in the *plots relations/plot* folder by

Change the operation of the bot, that is enough to send the command start , and remove the case of execution of $\operatorname{ztelegram_send_message_UptateUser.py}$ described in point: 5.2

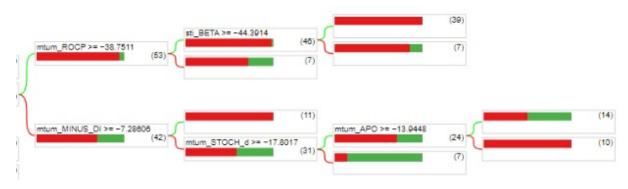
Send real time email alert

Revise Stock prediction fail LSTM
LSTM time series + stock price prediction = FAI
https://www.kaggle.com/code/carlmcbrideellis/lstm-time-series-stock-price-prediction-fail

Find the explanation of what indicators and values the AI model takes, to predict what it predicts and give a small explanation-schema, for example random forest models if you can print the sequence that makes the prediction.

(green buy, red do not trade)

https://stackoverflow.com/questions/40155128/plot-trees-for-a-random-forest-in-python-with-scikit-learn



Indicator names:

```
buy_sell_point
                             Open
                                       High
                                                          Close
                                                                     Volume
                                                                              per Close per Volume
         per_preMarket
                             olap_BBAND_UPPER
                                                 olap BBAND MIDDLE
                                                                     olap BBAND LOWER
                                                                                        olap_BBAND_UPPER_crash
                             olap_BBAND dif
                                                 olap_HT_TRENDLINE
olap BBAND LOWER crash
                                                                     olap MIDPOINT
                                                                                        olap MIDPRICE
                                                                                                            olap SAR
olap SAREXT
                  mtum ADX mtum ADXR mtum APO mtum AROON down
                                                                     mtum AROON up
                                                                                        mtum AROONOSC
                                                                                                            mtum BOP
mtum_CCI mtum_CMO mtum_DX
                             mtum_MACD mtum_MACD_signal mtum_MACD_list
mtum_MACD_ext_signal
                             mtum_MACD_ext_list    mtum_MACD_ext_crash    mtum_MACD_fix
                                                                                        mtum_MACD_fix_signal
mtum MACD_fix_list mtum_MACD_fix_crash mtum_MFI mtum_MINUS_DI mtum
mtum_PLUS_DM mtum_PPO mtum_ROC mtum_ROCP mtum_ROCR mtum_ROCR100
                                                                    mtum_MINUS_DM
                                                                                        mtum_MOM mtum_PLUS_DI
                                                                            mtum RSI mtum STOCH k
                                                                                                            mtum STOCH d
         mtum_STOCH_kd
                             mtum_STOCH_crash mtum_STOCH_Fa_k mtum_STOCH_Fa_d
                                                                                        mtum_STOCH_Fa_kd
mtum_STOCH_Fa_crash mtum_STOCH_RSI_k mtum_STOCH_RSI_d mtum_STOCH_RSI_kd mtum_STOCH_RSI_crash
mtum_ULTOSC
                  mtum_WILLIAMS_R
                                       volu_Chaikin_AD
                                                          volu_Chaikin_ADOSC volu_OBV vola_ATR vola_NATR vola_TRANGE
                                            cycl_PHASOR_inph cycl_PHASOR_quad
         cycl DCPERIOD -
                             cvcl DCPHASE
                                                                                        cycl SINE sine
                                                                                                            cvcl SINE lead
         cycl HT TRENDMODE
                             cdl 2CROWS
                                                 cdl 3BLACKCROWS
                                                                     cdl 3INSIDE
                                                                                        cdl 3LINESTRIKE
                                                                                                            cdl 30UTSIDE
         cdl 3STARSINSOUTH
                             cdl_3WHITESOLDIERS cdl_ABANDONEDBABY cdl_ADVANCEBLOCK
                                                                                        cdl BELTHOLD
         cdl_CLOSINGMARUBOZU cdl_CONCEALBABYSWALL
                                                          cdl_COUNTERATTACK cdl_DARKCLOUDCOVER cdl_DOJI cdl_DOJISTAR
         cdl_DRAGONFLYDOJI cdl_ENGULFING cdl_EVENINGDOJISTAR cdl_EVENINGSTAR
                                                                                       cdl GAPSIDESIDEWHITE
                                    cdl_HANGINGMAN
cdl GRAVESTONEDOJI cdl HAMMER
                                                          cdl HARAMI
                                                                            cdl HARAMICROSS
                                                                                                  cdl HIGHWAVE
                   cdl_HIKKAKEMOD
                                                          cdl IDENTICAL3CROWS cdl INNECK
                                                                                                  cdl_INVERTEDHAMMER
                                       cdl HOMINGPIGEON
cdl HIKKAKE
                   cdl_KICKINGBYLENGTH cdl_LADDERBOTTOM
                                                           cdl_LONGLEGGEDDOJI cdl_LONGLINE
cdl KICKING
                                                                                                  cdl MARUBOZU
cdl_MATCHINGLOW
                   cdl_MATHOLD cdl_MORNINGDOJISTAR cdl_MORNINGSTAR cdl_ONNECK
                                                                                                  cdl_PIERCING
         HAMMAN cdl_RISEFALL3METHODS cdl_SEPARATINGLINES cdl_SHOOTINGSTAR
cdl_STALLEDPATTERN cdl_STICKSANDWICH cdl_TAKURI cdl_TASUKIGAP
cdl RICKSHAWMAN
                                                                                       cdl SHORTLINE
                                                                                                            cdl SPINNINGTOP
                                                                                        cdl THRUSTING
                                                                                                            cdl TRISTAR
                             cdl UNIQUE3RIVER
                                                                                                            sti LINEARREG
          sti_LINEARREG_ANGLE sti_LINEARREG_INTERCEPT
                                                          sti_LINEARREG_SLOPE sti_STDDEV
                                                                                                            sti VAR
ma_DEMA_5 ma_EMA_5 ma_KAMA_5 ma_SMA_5 ma_T3_5 ma_TEMA_5 ma_TRIMA_5 ma_WMA_5 ma_DEMA_10
                                                                                                            ma_EMA_10
                                                       ma_TRIMA_10
                   ma_SMA_10 ma_T3_10 ma_TEMA_10
ma KAMA 10
                                                                              ma WMA 10 ma DEMA 20
                                                                                                            ma EMA 20
ma_KAMA_20
                   ma_SMA_20 ma_T3_20 ma_TEMA_20
                                                          ma_TRIMA_20
                                                                              ma_WMA_20 ma_DEMA_50
                                                                                                            ma_EMA_50
ma_KAMA_50
                   ma_SMA_50 ma_T3_50 ma_TEMA_50
                                                           ma_TRIMA_50
                                                                              ma_WMA_50 ma_DEMA_100
                                                                                                            ma_EMA_100
         ma_KAMA_100
                             ma_SMA_100
                                               ma_T3_100 ma_TEMA_100
                                                                              ma_TRIMA_100
                                                                                                 ma_WMA_100
         trad_s2 trad_s1 trad_pp trad_r1 trad_r2 trad_r3 clas_s3 clas_s2 clas_r3 fibo_s3 fibo_s2 fibo_s1 fibo_pp fibo_r1 fibo_r2 fibo_r3
trad_s3
                                                                               clas_s2 clas_s1
                                                                                                  clas_pp
                                                                                                            clas r1
clas r2
                                                                                        wood_s3
                                                                                                  wood s2
                                                                                                            wood s1
                             wood_r3 demark_s1 demark_pp demark_r1 cama_s3
                   wood r2
                                                                               cama s2
wood pp
         wood r1
                                                                                        cama s1
                                                                                                  cama pp
                                                                                                            cama r1
                   ti_acc_dist
                                                          ti_choppiness_14
                                       ti chaikin 10 3
                                                                               ti_coppock_14_11_10 ti_donchian_lower_20
         ti_donchian_center_20
                                       ti_donchian_upper_20
                                                                   ti_ease_of_movement_14
                                                                                                 ti_force_index_13
                          ti_kelt_20_upper ti_mass_index_9_25 ti_supertrend_20 ti_vortex_neg_14 cycl_EBSW_40_10 mtum_AO_5_34
ti_hma_20 ti_kelt_20_lower
                                                                                        ti vortex pos 5
                                                                                                            ti vortex neg 5
                                                                                        mtum_BIAS_SMA_26
                                                                                                            mtum AR 26
         ti vortex pos 14
         mtum_BR_26
                             mtum_CFO_9
                                                 mtum_CG_10
                                                                    mtum_CTI_12
                                                                                        mtum_DMP_14
                                                                                                            mtum_DMN_14
                             mtum_BULLP_13
                                                                     mtum_FISHERT_9_1
                                                                                        mtum_FISHERTs_9_1
         mtum ER 10
                                                 mtum_BEARP_13
                  mtum K 9 3 mtum D 9 3 mtum J 9 3 mtum J mtum PVOh 12 26 9 mtum PVOS 12 26 9 mtum QQE 14 5 4236 RSIMA
                                                                                                 mtum_PSL_12
mtum_INERTIA_20_14 mtum_K_9_3
                                                                             mtum_PGO_14
                                                                                        mtum_QQE1_14_5_4236
mtum PVO 12 26 9
mtum_QQEs_14_5_4236 mtum_RSX_14
                                                                  mtum_STC_10_12_26_05
                          mtum_SMIs_5_20_5
                                               mtum_SMIo_5_20_5
                                                                     olap_ALMA_10_60_085 olap_HWMA_02_01_01 olap_JMA_7_0
         mtum_SMI_5_20_5
                                                                                                            olap_VMAP
         olap_MCGD_10
                             olap_PWMA_10
                                                 olap_SINWMA_14
                                                                     olap_SSF_10_2
                                                                                        olap_SWMA_10
olap_VWMA_10
                  perf_CUMLOGRET_1 perf_CUMPCTRET_1 perf_z_30_1
                                                                              perf_ha
                                                                                        sti_ENTP_10
                                                                                                            sti KURT 30
                                                          sti_TOS_STDEVALL_U_1
sti_TOS_STDEVALL_U_3
         sti_TOS_STDEVALL_LR sti_TOS_STDEVALL_L 1
                                                                                        sti_TOS_STDEVALL L 2
                                                                                        sti_ZS_30 tend_LDECAY_5
                            sti TOS STDEVALL L 3
sti_TOS_STDEVALL_U_2
                   tend_PSARs_002_02
                                      tend_PSARaf_002_02 tend_PSARr_002_02
                                                                              tend_VHF_28
tend_PSAR1_002_02
                                                                                                 vola_HWM vola_HWU
vola_HWL vola_KCLe_20_2
                                                                                   vola_THERMO_20_2_05
                             vola_KCBe_20_2
                                               vola_KCUe_20_2 vola_RVI_14
vola_THERMOma_20_2_05
                             vola_THERMO1_20_2_05
                                                           vola_THERMOs_20_2_05
                                                                                        vola TRUERANGE 1
                                                                                                           vola UI 14
                                               volu_PVI_1 volu_PVOL volu_PVR volu_PVT mtum_murrey_math
tend_hl tend_ll tend_lh tend_hh_crash tend_hl_crash
         volu EFI 13
                             volu NVI 1
                  mtum_td_seq_sig tend_hh
mtum td seq
tend 11 crash
                   tend_lh_crash
                                       ichi_tenkan_sen
                                                           ichi_kijun_sen
                                                                               ichi senkou a
ichi_isin_cloud ichi_crash tend_renko_change pcrh_trad_s3
                                       ichi_chikou_span
                                                          tend_renko_TR
                                                                               tend_renko_ATR
                                                                                                  tend_renko_brick
                                       pcrh trad s2
                                                          pcrh trad s1
                                                                              pcrh trad pp
                                                                                                  pcrh trad r1
pcrh trad r2
                   porh trad r3
                                      pcrh_clas_s3
                                                          pcrh clas s2
                                                                              pcrh clas s1
                                                                                                  pcrh clas pp
```

```
pcrh_clas_r1
                                                                                    pcrh_clas_r2
pcrh_fibo_r1
                                                                                                                                                                                                                                                                  pcrh_fibo_s3
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pcrh_fibo_pp
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                                                                                                                                                                        pcrh_wood_r1
                                                                                                                                                                                                                                                                  pcrh_wood_r2
                                                                                                                                                                                                                                                                                                                                                        pcrh_wood_r3
                                                                                                                                                                                                                                                                                                                                                                                                                                               pcrh demark s1
pcrh wood s1
                                                                                     pcrh_wood_pp
pcrh_demark_pp
                                                                                      pcrh_demark_r1
                                                                                                                                                                            pcrh_cama_s3
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pcrh cama r1
                                                                                    pcrh_cama_r2
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merh DEMA 5 SMA 10 merh DEMA 5 T3 10 merh DEMA 5 TEMA 10 merh DEMA 5 TRIMA 10 merh DEMA 5 WMA 10 merh DEMA 5 TRIMA 20 merh DEMA 5 TRIMA 5 Merh DEMA 5 TRIMA 5 Merh DEMA 5 TRIMA 5 Merh DEMA 5 TRIMA 50 merh DEMA 5 TRIMA 50
mcrh DEMA 5 TEMA 100 mcrh DEMA 5 TRIMA 100 m
 mcrh_EMA_5_SMA_50 mcrh_EMA_5_T3_50
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mcrh_EMA_5_EMA_100 mcrh_EMA_5_KAMA_100 mcrh_EMA_5_SMA_100 mcrh_EMA_5_T3_100 mcrh_EMA_5_TEMA_100 mcrh_EMA_5_TRIMA_100
mcrh EMA 5 WMA 100 mcrh EMA 5 ti h20 mcrh KAMA 5 DEMA 10 mcrh KAMA 5 EMA 10 mcrh KAMA 5 KAMA 10 mcrh KAMA 5 TEMA 10 mcrh KAMA 5 DEMA 20 mcrh KAMA 5 EMA 20 mcrh KAMA 5 TEMA 20 mcrh KAMA 5
 mcrh_KAMA_5_TRIMA_20
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morh KAMA 5 SMA 50 morh KAMA 5 T3 50 morh KAMA 5 TEMA 50 morh KAMA 5 TRIMA 50
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mcrh_KAMA_5_DEMA_100
                                                                                                                              mcrh_KAMA_5_EMA_100 mcrh_KAMA_5_KAMA_100
                                                                                                                                                                                                                                                                                                                                                      mcrh KAMA 5 SMA 100 mcrh KAMA 5 T3 100
mcrh_KAMA_5_TEMA_100
                                                                                                                                 mcrh_KAMA_5_TRIMA_100
                                                                                                                                                                                                                                                                 mcrh_KAMA_5_WMA_100 mcrh_KAMA_5_ti_h20 mcrh_SMA_5_DEMA_10
morh_SMA_5_EMA_10 morh_SMA_5_KAMA_10 morh_SMA_5_SMA_10
morh_SMA_5_WMA_10 morh_SMA_5_DEMA_20 morh_SMA_5_EMA_20
                                                                                                                                                                                                                                                           mcrh_SMA_5_T3_10 mcrh_SMA_5_TEMA_10 mcrh_SMA_5_TRIMA_10
                                                                                                                                                                                                                                                                 mcrh_SMA_5_KAMA_20 mcrh_SMA_5_SMA_20 mcrh_SMA_5_T3_20
mcrh SMA 5 TEMA 20 mcrh SMA 5 TRIMA 20 mcrh SMA 5 WMA 20 mcrh SMA 5 DEMA 50 mcrh SMA 5 EMA 50 mcrh SMA 5 KAMA 50 mcrh SMA 5 SMA 50 mcrh SMA 5 TRIMA 50 mcrh SMA 5 TRIMA 50 mcrh SMA 5 MA 50 mcrh SMA 5 DEMA 100
mcrh_SMA_5_EMA_100 mcrh_SMA_5_KAMA_100 mcrh_SMA_5_SMA_100 mcrh_SMA_5_T3_100 mcrh_SMA_5_TEMA_100 mcrh_SMA_5_TRIMA_100
                                                                                                                                                                                                                                                                                                                                                                                                 mcrh_T3_5_KAMA_10
                                           mcrh SMA 5 WMA 100 mcrh SMA 5 ti h20 mcrh T3 5 DEMA 10 mcrh T3 5 EMA 10

        mcrh
        T3
        5
        T5
        T5
mcrh_T3_5_SMA_10
mcrh T3 5 EMA 20
mcrh_T3_5_WMA_20
mcrh T3 5 TEMA 50 mcrh T3 5 TRIMA 50 mcrh T3 5 WMA 50 mcrh T3 5 DEMA 100 mcrh T3 5 EMA 100 mcrh T3 5 TRIMA 50 mcrh T3 5 TEMA 100 mcrh T3 5 TRIMA 100 mcrh TEMA 5 DEMA 10 mcrh TEMA 5 DEMA 10 mcrh TEMA 5 TEMA 10 mcrh TE
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mcrh TEMA 5 TRIMA 10 mcrh TEMA 5 WMA 10 mcrh TEMA 5 DEMA 20 mcrh TEMA 5 EMA 20 mcrh TEMA 5 KAMA 20 mcrh TEMA 5 TEMA 5 TEMA 20 mcrh TEMA 5 WMA 20
morh_TEMA_5_DEMA_50 morh_TEMA_5_EMA_50 morh_TEMA_5_KAMA_50 morh_TEMA_5_SMA_50 morh_TEMA_5_T3_50 morh_TEMA_5_TEMA_50
                                                                                                                                                                                                                                                                                                                                               mcrh_TEMA_5_EMA_100 mcrh_TEMA_5_KAMA_100
                                       15 TRIMA 50 mcrh TEMA 5 WMA 50 mcrh TEMA 5 DEMA 100 mcrh TEMA 5 SMA 100 mcrh TEMA 5 TEMA 100 mcrh TEMA 5 TEMA 100
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morh TRIMA 5 TRIMA 10 morh TRIMA
mcrh_TEMA_5_WMA_100 mcrh_TEMA_5_ti_h20 mcrh_TRIMA_5_DEMA_10
 mcrh_TRIMA_5_SMA_10_mcrh_TRIMA_5_T3_10_mcrh_TRIMA_5_TEMA_10
 mcrh_TRIMA_5_DEMA_20 mcrh_TRIMA_5_EMA_20 mcrh_TRIMA_5_KAMA_20
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mcrh_TRIMA_5_TEMA_20
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                                                                                                    th TRIMA 5 KAMA 50 mcrh TRIMA 5 SMA 50 mcrh TRIMA 5 TA 50 mcrh TRIMA 5 TEMA 50 mcrh TRIMA 5 MA 50 mcrh TRIMA 5 DEMA 100 mcrh TRIMA 5 EMA 100
mcrh_TRIMA_5_EMA_50 mcrh_TRIMA_5_KAMA_50
mcrh_TRIMA_5_TRIMA_50
mcrh_TRIMA_5_KAMA_100
                                                                                                                                 mcrh_TRIMA_5_SMA_100 mcrh_TRIMA_5_T3_100 mcrh_TRIMA_5_TEMA_100
mcrh_TRIMA_5_TRIMA_100
                                                                                                                                 mcrh_TRIMA_5_WMA_100
                                                                                                                                                                                                                                                                  mcrh_TRIMA_5_ti_h20 mcrh_WMA_5_DEMA_10 mcrh_WMA_5_EMA_10
mcrh WMA 5 KAMA 10 mcrh WMA 5 SMA 10 mcrh WMA 5 SMA 10 mcrh WMA 5 T3 10 mcrh WMA 5 TEMA 10 mcrh WMA 5 TRIMA 10 mcrh WMA 5 WMA 10 mcrh WMA 5 DEMA 20 mcrh WMA 5 EMA 20 mcrh WMA 5 KAMA 20 mcrh WMA 5 TRIMA 20 mcrh WMA 5 TRIMA 20 mcrh WMA 5 TRIMA 20 mcrh WMA 5 TEMA 20 mcrh WMA 5 TRIMA 20 mcrh WMA 5 TRIMA 20 mcrh WMA 5 TRIMA 30 mcrh WMA 5 TEMA 30 mcrh WMA 5 TRIMA 30 mcrh WMA 5 TEMA 30 mcrh WMA 5 TRIMA 30 mcrh WMA 5 TEMA 30 mcrh WMA 5 TRIMA 30 mcrh WMA 5 TEMA 30 mcrh WMA 5 TRIMA 30 mcrh WMA 5 TEMA 30 mcrh WMA 5 TEMA 30 mcrh WMA 5 TRIMA 30 mcrh WMA 5 TEMA 30 mcrh WMA 5 TEMA 30 mcrh WMA 5 TRIMA 30 mcrh WMA 5 TEMA 30 mcrh W
 mcrh wMa 5 KAMA 100 mcrh wMa 5 SMA 100 mcrh wMa 5 SMA 100 mcrh wMa 5 T3 100 mcrh wMa 5 TEMA 100 mcrh wMa 5 TRIMA 10 mcrh wMa 10 mcrh wMa 5 TRIMA 10 mcrh wMa 5 TRIMA 10 mcrh wMa 20 mcrh wMa 10 mcrh wMa 10 mcrh wMa 10 mcrh wMa 10 mcrh wMa 20 mcrh wMa 10 mcrh wMa 5 TRIMA 10 mcrh wMa 5 TRIMA 100 mcrh wMa 10 mcrh wMa 10 mcrh wMa 5 TRIMA 100 mcrh wMa 10 mcrh wMa 10 mcrh wMa 5 TRIMA 100 mcrh wMa 5 TRIMA 100 mcrh wMa 10 mcr
                                                                                                                                                                                                                                                                                                                                                                                                                                   mcrh DEMA 10 WMA 20
                                                                                                             mcrh_DEMA_10_EMA_50 mcrh_DEMA_10_KAMA_50

        mcrh DEMA
        10 TRIMA
        50
        mcrh DEMA
        10 WMA
        50 mcrh DEMA
        10 DEMA

 mcrh_DEMA_10_TEMA_50
                                                                                                        mcrh_DEMA_10_KAMA_100
mcrh_DEMA_10_EMA_100
                                                                                                                                                                                                                                                                                                                                                                                                  mcrh_DEMA_10_T3_100
mcrh DEMA 10 TEMA 100 mcrh DEMA 10 TRIMA 100 mcrh DEMA 10 TRIMA 100 mcrh DEMA 10 TEMA 10 ti h20
mcrh EMA 10 DEMA 20 mcrh EMA 10 EMA 20 mcrh EMA 10 MMA 20 mcrh EMA 10 DEMA 20 mcrh EMA 10 TRIMA 20
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mcrh EMA 10 SMA 50 mcrh EMA 10 T3 50 mcrh EMA 10 TEMA 50 mcrh EMA 10 TRIMA 50
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mcrh EMA 10 DEMA 100 mcrh EMA 10 EMA 10 mcrh EMA 10 KAMA 100 mcrh EMA 10 SMA 100 mcrh EMA 10 T3 100 mcrh EMA 10 TEMA 100 mcrh EMA 100 mc
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mcrh_KAMA_10_DEMA_100 mcrh_KAMA_10_EMA_100 mc
mcrh_KAMA_10_KAMA_50
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mcrh_KAMA_10_SMA_100
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mcrh_SMA_10_TRIMA_50
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 mcrh_TEMA_10_KAMA_20
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 mcrh_TEMA_10_ti_h20 mcrh_TRIMA_10_DEMA_20
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mcrh_TRIMA_10_SMA_20
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mcrh_TRIMA_10_T3_100
mcrh_TRIMA_10_SMA_100
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mcrh TRIMA 10 WMA 100
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mcrh DEMA 20 DEMA 100
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 mcrh_EMA_20_WMA_100 mcrh_KAMA_20_DEMA_50
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mcrh WMA 20 DEMA 100
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        50 ti h20

mcrh DEMA 50 EMA 100
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 mcrh_SMA_50_TEMA_100
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mcrh_TRIMA_50_EMA_100
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mcrh_WMA_50_TEMA_100
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                            mcrh_EMA_100_ti_h20 mcrh_KAMA_100_ti_h20
                            mcrh_TRIMA_100_ti_h20
                                                                                                          mcrh_WMA_100_ti_h20 NQ_Close NQ_Volume NQ_per_Close
NQ_SMA_20 NQ_SMA_100
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