# **INTRODUCTION TO ANALYTICS**



ALY6000, WINTER 2022

Module 6 Project – Data Analysis

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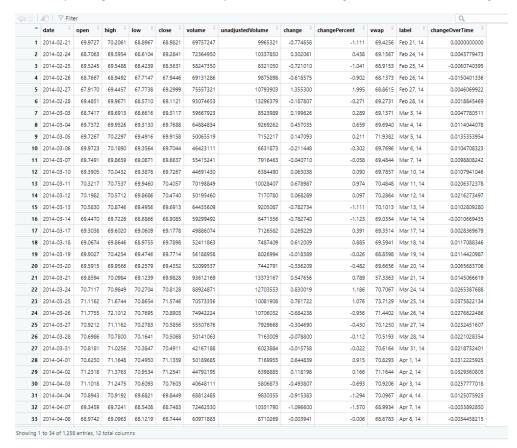
Date: 02/18/2022

### Introduction:

In this report, as per the requirements analyzing the impact of big data in capital market which will look into the deep understanding about the variable available in dataset. This dataset is about the investment analysis in stock market which any investor seeks before investing in capital market. How analysis makes difference before investing in stock market? In this part of the report detailed information about the Apple stock. The Dataset we are using has 1258 observation and 12 variables from 2014 to 2019. Given dataset has open, high, low, close, volume, unadjusted volume, change, change in percent, vwap, label, and change overtime which will help in analyzing the stock price movement, trend, patterns, "BUY" or "SELL" signal.

## Details about the dataset: AAPL (Apple Stock)

After importing the dataset in R to present the data to get the results from the given variables.



```
> AAPL <- read.csv("C:\\Abhinav _ NEU BOSTON\\ALY6000 Submission\\ALY6000-Final\\Module 6 Week 6\\AAPL.csv")
> AAPL
                         high
                                  low
                                                  volume unadjustedvolume
         date
                 open
                                         close
                                                                             change changePercent
                                                                                                      vwap
                                                                                                                label
   2014-02-21 69.9727 70.2061 68.8967 68.9821
                                                                  9965321 -0.774858
                                                                                           -1.111 69.4256 Feb 21, 14
   2014-02-24 68.7063 69.5954 68.6104 69.2841
                                                72364950
                                                                           0.302061
                                                                                             0.438 69.1567 Feb 24.
   2014-02-25 69.5245 69.5488 68.4239 68.5631
                                                58247350
                                                                  8321050 -0.721010
                                                                                            -1.041 68.9153 Feb 25, 14
   2014-02-26 68.7667 68.9492 67.7147
                                      67 9446
                                                69131286
                                                                  9875898 -0.618575
                                                                                           -0.902 68.1373 Feb 26,
   2014-02-27 67.9170 69.4457 67.7738 69.2999
                                                                                            1.995 68.8615 Feb 27,
                                                75557321
                                                                 10793903
                                                                          1.355300
   2014-02-28 69.4851 69.9671 68.5710 69.1121
                                                93074653
                                                                 13296379
                                                                          -0.187807
                                                                                           -0.271 69.2731 Feb 28.
   2014-03-03 68.7417 69.6913 68.6616 69.3117
                                                59667923
                                                                  8523989
                                                                           0.199626
                                                                                            0.289 69.1371
                                                                                                            Mar
   2014-03-04 69.7372 69.9526 69.3130 69.7688
                                                                  9269262
                                                                           0.457035
                                                                                            0.659 69.6940
                                                                                                            Mar 4, 14
   2014-03-05 69.7267 70.2297 69.4916 69.9158
                                                                           0.147093
                                                50065519
                                                                  7152217
                                                                                            0.211 71.9382
                                                                                                            Mar 5.
10 2014-03-06 69.9723 70.1890 69.3564 69.7044
                                                46423111
                                                                  6631873 -0.211448
                                                                                           -0.302 69.7696
                                                                                                            Mar 6,
                                                                                                           Mar 7,
11 2014-03-07 69,7491 69,8659 69,0871 69,6637
                                                55415241
                                                                  7916463 -0.040710
                                                                                           -0.058 69.4844
                                                                                                                   14
   2014-03-10 69.3905 70.0432 69.3878 69.7267
                                                                                            0.090 69.7857 Mar 10.
                                                44691430
                                                                  6384490
                                                                           0.063038
                                                                                                                   14
13 2014-03-11 70.3217 70.7537 69.9460 70.4057
                                                                                            0.974 70.4848 Mar 11,
                                                70198849
                                                                 10028407
                                                                           0.678987
  2014-03-12 70.1982 70.5712 69.8686 70.4740
                                                50195460
                                                                  7170780
                                                                           0.068289
                                                                                            0.097 70.2864 Mar 12,
15 2014-03-13 70.5830 70.8746 69.4956 69.6913
                                                                                            -1.111 70.1013 Mar 13, 14
                                                64435609
                                                                  9205087 -0.782734
16 2014-03-14 69.4470 69.7228 68.6866 68.9085
                                                59299492
                                                                  8471356 -0.782740
                                                                                            -1.123 69.0354 Mar 14,
17 2014-03-17 69.3038 69.6020 69.0609 69.1778
                                                49886074
                                                                  7126582
                                                                           0.269229
                                                                                            0.391 69.3514 Mar 17.
                                                                                                                   14
18 2014-03-18 69.0674 69.8646 68.9755 69.7898
                                                52411863
                                                                  7487409 0.612009
                                                                                            0.885 69.5941 Mar 18. 14
19 2014-03-19 69.9027 70.4254 69.4746 69.7714
                                                56188958
                                                                  8026994 -0.018389
                                                                                           -0.026 68.8598 Mar 19. 14
```

#### Head() & Tail(): Read the first 6 and last 6 rows of the dataset.

```
> head(aap1)
date open high low close volume
1 2014-02-21 69.9727 70.2061 68.8967 68.9821 69757247
                                                     volume unadjustedvolume
                                                                                   change changePercent
                                                                                                                          label changeOverTime
                                                                                                   -1.111 69.4256 Feb 21, 14
                                                                       9965321 -0.774858
                                                                                                                                    0.000000000
  2014-02-24 68.7063 69.5954 68.6104 69.2841
                                                  72364950
                                                                      10337850
                                                                                 0.302061
                                                                                                    0.438 69.1567 Feb 24, 14
 2014-02-25 69.5245 69.5488 68.4239 68.5631
2014-02-26 68.7667 68.9492 67.7147 67.9446
                                                  58247350
                                                                       8321050 -0.721010
                                                                                                   -1.041 68.9153 Feb 25, 14
                                                                                                                                   -0.006074039
                                                                                                   -0.902 68.1373 Feb
                                                                                                                                   -0.015040134
                                                  69131286
                                                                       9875898 -0.618575
                                                                                                                        26, 14
5 2014-02-27 67, 9170 69, 4457 67, 7738 69, 2999 75557321
                                                                     10793903
                                                                                1.355300
                                                                                                    1.995 68.8615 Feb 27. 14
                                                                                                                                    0.004606992
6 2014-02-28 69.4851 69.9671 68.5710 69.1121 93074653
                                                                     13296379 -0.187807
                                                                                                   -0.271 69.2731 Feb 28. 14
                                                                                                                                   0.001884547
                                                      volume unadiustedvolume change changePercent
            date
                    open
                              hiah
                                       low
                                            close
                                                                                                                    label changeOverTime
1253 2019-02-12 170.10 171.0000 169.70 170.89 22283523
                                                                                                  0.862 170.3732 Feb 12
                                                                       22283523
1254 2019-02-13 171.39 172.4800 169.92 170.18 22490233
                                                                       22490233
                                                                                  -0.71
                                                                                                 -0.415 171.0037 Feb 13
                                                                                                                                  1.467017
1255 2019-02-14 169.71 171.2615 169.38 170.80 21835747
                                                                                                                                  1.476005
1256 2019-02-15 171.25 171.7000 169.75 170.42 24626814 1257 2019-02-19 169.71 171.4400 169.49 170.93 18972826
                                                                       24626814
                                                                                 -0.38
                                                                                                 -0.222 170.4848 Feb 15
                                                                                                                                  1.470496
                                                                       18972826
                                                                                   0.51
                                                                                                  0.299 170.5200 Feb 19
1258 2019-02-20 171.19 173.3200 170.99 172.03 26114362
                                                                       26114362
                                                                                                  0.644 172.2129 Feb 20
                                                                                                                                  1.493835
```

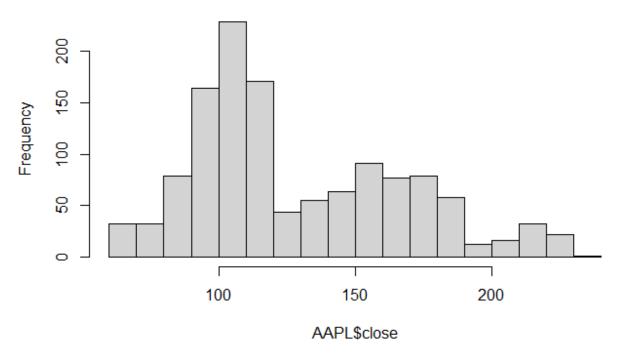
In the below analysis, we have used str() command to discover the data dictionary.

```
'data.frame':
                           70 68.7 69.5 68.8 67.9 ...
                           70.2 69.6 69.5 68.9 69.4 ...
68.9 68.6 68.4 67.7 67.8 ...
$ high
                     num
$ 1 ow
                     num
                           69 69.3 68.6 67.9 69.3 ..
 $ close
                     num
                           69757247 72364950 58247350 69131286 75557321 93074653 59667923 64884834 50065519 46423111 ...
  volume
$ unadjustedvolume:
                     int
                           9965321 10337850 8321050 9875898 10793903 13296379 8523989 9269262 7152217 6631873 ...
  change
                     num -0.775 0.302 -0.721 -0.619 1.355 ...
num -1.111 0.438 -1.041 -0.902 1.995 ...
$ changePercent
                           69.4 69.2 68.9 68.1 68.9 ...
"Feb 21, 14" "Feb 24, 14" "Feb 25, 14" "Feb 26, 14" ...
                     num
  vwap
  label
                     chr
$ changeOverTime
                   : num 0 0.00438 -0.00607 -0.01504 0.00461 ...
```

Observed while looking at the dataset closing price helps investors to analysis the sentiment of the stock over the period.

For descriptive analysis below is the histogram shows that maximum data points are placed on the left side of the graph at price \$100 that's why this is a Right skewed histogram. The frequency of observation is higher on the left side and lesser on the right side is known as the positive skewed.

## Histogram of AAPL\$close



## > hist(AAPL\$close) > |

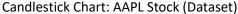
Summarize the data in a table: mentioned in data length is 1258, minimum value, maximum value, median, mean, quartile. If we look at the close price in the summary 1<sup>st</sup> Quartile is around \$100 and 3<sup>rd</sup> Quartile has values as \$156.85. Also looking at the histogram attached above we can see the data is right or positively skewed which signifies that most of the time the price of the Apple stock price is between the range or 1<sup>st</sup> and 3<sup>rd</sup> quartile. This could be a good range to buy an apple stock, specifically near the median value of \$115.

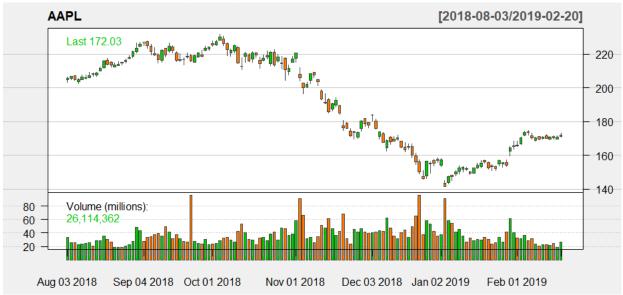
```
> summary(aapl)
                        #Summary of Dataset
                              open
: 67.92
                                                                         low
: 67.15
                                                                                             close
: 67.94
     date
                                                    high
                                                                                                                  volume
 Length:1258
                                              мin.
                                                      : 68.44
                                                                  Min.
                                                                                                                      : 11475922
                                                                                        Min.
                                                                                                             Min.
                        1st Qu.:100.61
Median :115.90
                                             1st Qu.:101.52
Median :116.48
                                                                  1st Qu.: 99.59
Median :114.75
                                                                                        1st Qu.:100.57
Median :115.85
                                                                                                             1st Qu.: 26281928
Median : 35903155
 Class :character
 Mode :character
                                 :128.60
                                              Mean
                                                      :129.72
                                                                   Mean
                                                                            :127.48
                        3rd Qu.:156.82
                                              3rd Qu.:158.31
                                                                   3rd Qu.:155.19
                                                                                        3rd Ou.:156.85
                                                                                                             3rd Ou.:
                                                                                                                        50315110
                                                                                                :230.28
                                 :229.00
                                             мах.
                                                      :231.66
                                                                  мах.
                                                                           :228.00
                                                                                        мах.
                                                                                                                      :189978082
                              change
                                                  changePercent
 unadjustedVolume
                                                                                vwap
                                                                                                   label
                                                                                                                       changeOverTime
Min. : 5704942
1st Qu.: 24473327
Median : 33610520
                                  :-15.66280
                          Min.
                                                  Min.
                                                           :-9.96100
                                                                          Min.
                                                                                                Length:1258
                                                                                                                       Min.
                                                                                                                                :-0.01504
                                                  1st Qu.:-0.60350
Median : 0.06150
                                                                          1st Qu.:100.61
Median :115.74
                         1st Qu.: -0.72542
Median : 0.06888
                                                                                               Class :character
                                                                                                                       1st Qu.: 0.45796
                                                                                                                       Median : 0.67945
                                                                                               Mode
                                                                                                      :character
                                     0.08130
1.04183
         : 37793995
                          Mean
                                                   Mean
                                                           : 0.08362
                                                                          Mean
                                                                                   :128.63
                                                                                                                       Mean
                                                                                                                                : 0.86462
 3rd Qu.: 46737829
                                                                                                                       3rd Qu.: 1.27374
                          3rd Qu.:
                                                   3rd Qu.: 0.85725
                                                                          3rd Qu.:156.55
         :189846255
                                  : 11.08440
                                                   мах.
                                                             8.19800
                                                                                                                                : 2.33819
```

Below observation tells about the movement of the stock price from 2014 to 2019 which is between (67.94-230.2754) in stock market range gives the signal for the breakout and break down price of the stock.

```
> range(AAPL$close)
[1] 67.9446 230.2754
```

Using the descriptive statistics and summarizing the data now we are going to plot a candlestick chart most frequently used in the stock market which will help in analyzing the patterns and trend of the stocks. It allows us to get profitable trades and decision while placing trades. With the help of dataset variable such as open, high, low, close with volume (shows the trades executed on each candle) able to plot candlestick in R. For this analysis, to show the clear analysis from "2018-08-03 to 2019-02-20". Each candle form with open, high, low, close price of the stock.





**Note:** In the above graph, this candlestick graph has been used to represent the high, low, close, open price of Apple stock over the period. It helps in analyzing the trend of a stock, which determines the stock price movement in the stock market.

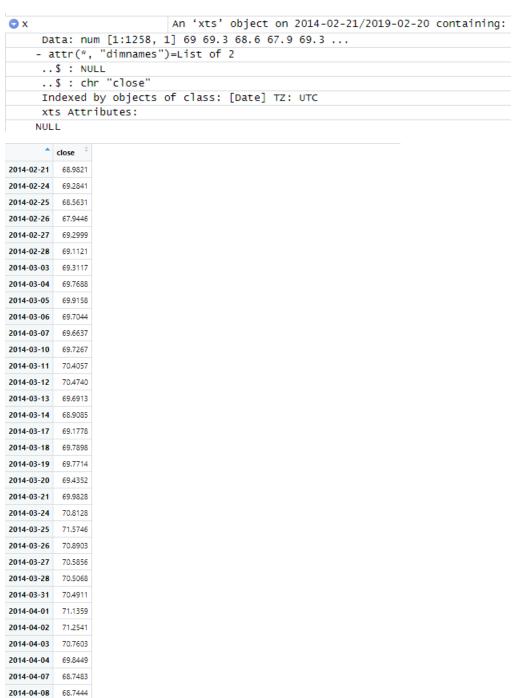
Open price is the starting price, high price is the highest price, low is the lowest price, close is the closing price on the different timeframes. Volume is the number of stocks traded.

Looking from a business personal or an investor's perspective, I would like to find out the price movement of Apple stock. Below are the different ways in which the above descriptive analysis will answer different business questions:

**How does data look like?** - Starting with the data dictionary helped us in finding the different variables present in the dataset along with the different types of data types of respective attributes, it also helped in understating the format of the data present.

Is the data skewed and where is the maximum data point? Here we can see in the histogram that the maximum stock price lies around \$100 which refers in the summary of to the image of the histogram of the Apple dataset

In this task, we have taken only the date and close price of the dataset and removed all other variables to analyze the trend and price of the stock. We are using a close price here which gives us a reference to the previous day's closing price of a stock. It is useful to stipulate the assurance to the investor while assessing the stock price.



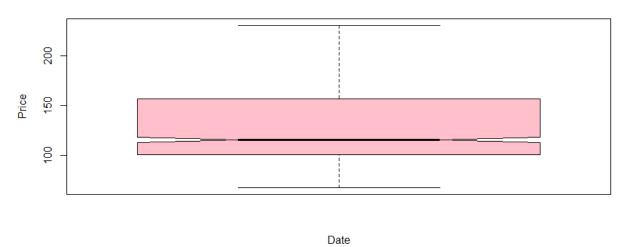
Showing 1 to 34 of 1,258 entries, 1 total columns

|            | close ‡ |
|------------|---------|
| 2044.04.04 |         |
| 2014-04-04 | 69.8449 |
| 2014-04-07 | 68.7483 |
| 2014-04-08 | 68.7444 |
| 2014-04-09 | 69.6479 |
| 2014-04-10 | 68.7496 |
| 2014-04-11 | 68.2414 |
| 2014-04-14 | 68.5132 |
| 2014-04-15 | 68.0247 |
| 2014-04-16 | 68.1626 |
| 2014-04-17 | 68.9414 |
| 2014-04-21 | 69.7596 |
| 2014-04-22 | 69.8290 |
| 2014-04-23 | 68.9164 |
| 2014-04-24 | 74.5663 |
| 2014-04-25 | 75.1140 |
| 2014-04-28 | 78.0230 |
| 2014-04-29 | 77.7918 |
| 2014-04-30 | 77.4976 |
| 2014-05-01 | 77.6802 |
| 2014-05-02 | 77.8246 |
| 2014-05-05 | 78.9252 |
| 2014-05-06 | 78.0650 |
| 2014-05-07 | 77.7918 |
| 2014-05-08 | 77.2831 |
| 2014-05-09 | 76.9614 |
| 2014-05-12 | 77.9193 |
| 2014-05-13 | 78.0415 |
| 2014-05-14 | 78.0560 |
| 2014-05-15 | 77.3922 |
| 2014-05-16 | 78.5344 |
| 2014-05-19 | 79.4650 |
| 2014-05-20 | 79.4807 |
| 2014-05-21 | 79.6910 |
|            |         |

Showing 31 to 64 of 1,258 entries, 1 total columns

**Box Plot for checking Outliers:** In this task created a box plot for Apple stock to find the outliers from the data. As the below box plot represents there is no range of outliers found in the data. We consider this data as clean to moving ahead with new findings from the data. After running the below code in R, it provides the box plot.

#### **Box Plot of AAPL Stock**



The additional question that data is leading me to ask is **How to analyze when to buy or sell a stock?** to overcome this we can a new attribute which can be driven from a closing price of the stock. The attribute is named MACD (Moving average convergence divergence) it is calculated by subtracting EMA(exponential moving average) of different periods. This attribute will act as an Indicator which will help in analyzing whether the stock price is bullish or bearish.



**Adding New Attribute MACD** (Moving Average Convergence and Divergence) to the dataset which indicate the trend and momentum of the stock to the investor, for buy and sell price of the stocks.

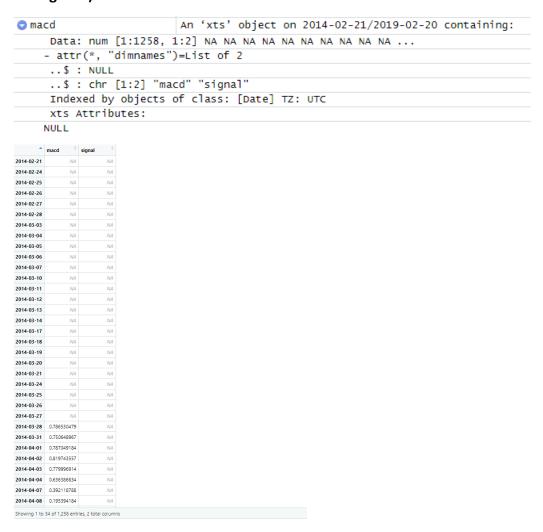
**How do investors take the decision to invest in stock?** This candlestick chart and MACD provide the depth analysis about investing in stock. Analyse the price movement, signal, trend makes easy with uptrend and downtrend of the stock. It helps the investor to make decisions about the investment in stock.

Before investing in the stock market every investor wants to entry at low price and exit on high price. This analysis will help in analysing the stock by using technical indicators which will reduce the risk of losing money in the stock market.

During the research of analyzing the Apple, stock dataset MACD (Moving Average Convergence Divergence)

Here, Using MACD as a new attribute to take better investment decisions in the stock.

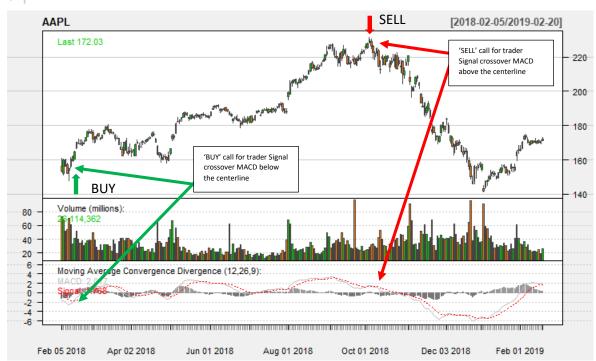
# Finding the results after adding new attribute MACD (Moving Average Convergence Divergence):



|                          | macd <sup>‡</sup> | signal <sup>‡</sup> |
|--------------------------|-------------------|---------------------|
| 2014-04-07               | 0.392118788       | NA                  |
| 2014-04-08               | 0.195394184       | NA                  |
| 2014-04-09               | 0.141857708       | 0.5877474015        |
| 2014-04-10               | -0.004348992      | 0.4693281228        |
| 2014-04-11               | -0.177378556      | 0.3399867870        |
| 2014-04-14               | -0.280121461      | 0.2159651374        |
| 2014-04-15               | -0.413956036      | 0.0899809027        |
| 2014-04-16               | -0.498578351      | -0.0277309481       |
| 2014-04-17               | -0.469376380      | -0.1160600344       |
| 2014-04-21               | -0.346660703      | -0.1621801682       |
| 2014-04-22               | -0.238633853      | -0.1774709052       |
| 2014-04-23               | -0.256459831      | -0.1932686904       |
| 2014-04-24               | 0.380328751       | -0.0785492022       |
| 2014-04-25               | 0.931124630       | 0.1233855642        |
| 2014-04-28               | 1.670682912       | 0.4328450337        |
| 2014-04-29               | 2.194765539       | 0.7852291348        |
| 2014-04-30               | 2.540527913       | 1.1362888904        |
| 2014-05-01               | 2.796640524       | 1.4683592171        |
| 2014-05-02               | 2.976260354       | 1.7699394444        |
| 2014-05-05               | 3.196011873       | 2.0551539301        |
| 2014-05-06               | 3.236354806       | 2.2913941054        |
| 2014-05-07               | 3.199951591       | 2.4731056025        |
| 2014-05-08               | 3.080114633       | 2.5945074086        |
| 2014-05-09               | 2.916698097       | 2.6589455462        |
| 2014-05-12               | 2.854971552       | 2.6981507475        |
| 2014-05-13               | 2.785740118       | 2.7156686215        |
| 2014-05-14               | 2.700335005       | 2.7126018981        |
| 2014-05-15               | 2.533176847       | 2.6767168880        |
| 2014-05-16               | 2.491289226       | 2.6396313557        |
| 2014-05-19               | 2.525029041       | 2.6167108927        |
|                          | 2.522786407       | 2.5979259955        |
| 2014-05-20               |                   |                     |
| 2014-05-20<br>2014-05-21 | 2.512563295       | 2.5808534553        |

Getting a better understanding of the stock through MACD. How MACD will help in analyzing the stock price to increase profitability?

MACD Indicator: After computing a new attribute MACD is a lagging indicator which represents the momentum of the stock price. This helps in analying the bullish and bearish trend of the stock. It is also known as oscillator indicator. In this indicator we use three time series to make MACD effective indicator with 'MACD', 'signal', and MACD 'histogram'. Here, MACD (12,26,9) is the substrating 12 day exponential moving average with 26 day EMA, where as 9 day EMA is signal. MACD moves with the signal when Macd above centerline or also called as zero line and signal crossover it gives the sell signal more over if the macd below the centerline and signal crossover macd will gives the buy signal. Most of the investors using MACD for positional trades for different timeframes like monthly contracts, quaterly, halfyearly to get better profitability.



Here, is the summary of MACD which provide the mean and median. It will help in analysing the direction of the stock while entry and exit in the contract. Most of the time it show the trend of the stock price condition that condition could be breakout or breakdown.

```
> summary(macd)
    Index
                         macd
                                          signal
Min. :2014-02-21
                     Min. :-6.0381
                                     Min. :-5.4253
1st Qu.:2015-05-21
                    1st Qu.:-0.4140
                                     1st Qu.:-0.3965
Median :2016-08-18
Mean :2016-08-19
                    Median : 0.6794
                                      Median: 0.6929
                    Mean : 0.4570
                                      Mean : 0.4523
 3rd Qu.:2017-11-15
                    3rd Qu.: 1.7083
                                     3rd Qu.: 1.6165
Max. :2019-02-20
                                      Max. : 3.6004
                    Max. : 4.0967
                     NA's
                            :25
                                      NA's
                                            :33
< T
```

#### **Summary:**

From the data I adopted for this analysis tell us daily open, low, high, and close price of daily apple stock. As we have taken daily close price of apple stock of the it will provide the analysis for the investor to take positional trades in the stock market. This project will help in understanding the analysis of the stock market to buy and sell contract at a better price. We have used the formula to calculate MACD that will give us the way the signal based on which an investor can design the buy or sell strategies of there portfolio. There are following question I would like to be answered:

- 1. Is this indicator being reliable to invest based on its insights?
- 2. What are better indicators then MACD?
- 3. How can I use other attributes given in the dataset?
- 4. How can I use advanced data analytics so that system gives predicted price to invest?
- 5. How concepts of machine learning and artificial intelligence can be incorporated in this analysis?

## **References:**

## [1]Understanding a Candlestick Chart

Mitchell

https://www.investopedia.com/trading/candlestick-charting-what-is-it/

[2]Moving Average Convergence Divergence (MACD)

Fernando

https://www.investopedia.com/terms/m/macd.asp

[3]5.9 MACD | Techincal Analysis with R (second edition)

This is an introductory textbook that focuses on how to use R to do technical analysis.

https://bookdown.org/kochiuyu/technical-analysis-with-r-second-edition/macd.html