## timeserieslab6-rohramehak-251524

## April 6, 2024

```
[2]: import yfinance as yahooFinance import datetime import pandas as pd import statsmodels.stats.diagnostic
```

IBM Stock Data from yahoo finance

```
[3]: startDate = datetime.datetime(2022, 10, 1)
endDate = datetime.datetime(2022, 12, 15)
data = yahooFinance.Ticker("IBM")
```

```
[5]: ibm_data = data.history(start=startDate, end=endDate) ibm_data
```

```
[5]:
                                                                            Close
                                                                                  \
                                       Open
                                                    High
                                                                 Low
     Date
     2022-10-03 00:00:00-04:00
                                 112.103794
                                              114.016346
                                                          111.581335
                                                                       113.363281
     2022-10-04 00:00:00-04:00
                                 114.566788
                                              117.225707
                                                          114.305555
                                                                       117.085762
     2022-10-05 00:00:00-04:00
                                 116.348728
                                              117.981398
                                                          115.900914
                                                                       117.309669
     2022-10-06 00:00:00-04:00
                                 116.507327
                                              116.899173
                                                          113.605838
                                                                       114.035004
     2022-10-07 00:00:00-04:00
                                 113.353940
                                              113.633829
                                                          110.153907
                                                                       110.853622
     2022-10-10 00:00:00-04:00
                                 111.758597
                                                          109.192973
                                              111.917198
                                                                       109.855370
     2022-10-11 00:00:00-04:00
                                 109.584815
                                              111.236148
                                                          109.099682
                                                                       109.902023
     2022-10-12 00:00:00-04:00
                                 110.088602
                                              110.844293
                                                          109.342236
                                                                       109.687431
     2022-10-13 00:00:00-04:00
                                 108.315992
                                              113.960368
                                                          107.802871
                                                                       113.624504
     2022-10-14 00:00:00-04:00
                                                          111.805241
                                 113.633838
                                              114.324222
                                                                       111.991837
     2022-10-17 00:00:00-04:00
                                 113.633830
                                              114.641415
                                                          113.288634
                                                                       113.372597
     2022-10-18 00:00:00-04:00
                                              115.630357
                                                          113.652492
                                 114.753378
                                                                       114.697403
     2022-10-19 00:00:00-04:00
                                 114.156290
                                              115.630359
                                                          113.811094
                                                                       114.296234
     2022-10-20 00:00:00-04:00
                                 117.785477
                                              120.313789
                                                          116.759229
                                                                       119.698036
     2022-10-21 00:00:00-04:00
                                              122.077076
                                 119.782002
                                                          119.035636
                                                                       121.190758
     2022-10-24 00:00:00-04:00
                                 122.123705
                                              124.185540
                                                          121.144115
                                                                       123.793701
     2022-10-25 00:00:00-04:00
                                 123.149968
                                              124.362811
                                                          122.496903
                                                                       124.017609
     2022-10-26 00:00:00-04:00
                                 124.754656
                                              126.751177
                                                          123.905664
                                                                       125.958160
     2022-10-27 00:00:00-04:00
                                 126.461956
                                              127.254959
                                                          125.435701
                                                                       125.734253
     2022-10-28 00:00:00-04:00
                                 126.471283
                                              129.550035
                                                          126.154082
                                                                       129.223495
                                              129.466078
     2022-10-31 00:00:00-04:00
                                 128.803674
                                                          127.441569
                                                                       129.018250
     2022-11-01 00:00:00-04:00
                                              129.354092
                                 128.980916
                                                          127.534834
                                                                       128.934265
```

2022-11-02	00:00:00-04:00	128.514459	130.772207	127.628156	127.656143
2022-11-03	00:00:00-04:00	127.273619	127.329594	124.987884	125.454361
2022-11-04	00:00:00-04:00	126.555253	128.495800	125.892864	127.777435
2022-11-07	00:00:00-05:00	127.478861	129.400744	127.357572	129.064880
2022-11-08	00:00:00-05:00	129.680643	131.481238	129.419417	130.650909
2022-11-09	00:00:00-05:00	130.235499	131.132370	129.281986	129.706818
2022-11-10	00:00:00-05:00	132.416351	133.464278	130.556516	133.332108
2022-11-11	00:00:00-05:00	133.586997	136.069926	133.077201	135.163605
2022-11-14	00:00:00-05:00	134.653822	137.910888	134.228976	136.136017
2022-11-15	00:00:00-05:00	136.022733	137.986417	134.059050	136.268188
2022-11-16	00:00:00-05:00	136.069921	136.844057	135.956622	136.438110
2022-11-17	00:00:00-05:00	135.390182	138.005267	135.239126	137.920303
2022-11-18	00:00:00-05:00	138.364031	140.016167	137.778707	139.383636
2022-11-21	00:00:00-05:00	139.298683	139.657423	138.260192	138.477325
2022-11-22	00:00:00-05:00	139.345862	140.997998	138.798295	140.761978
2022-11-23	00:00:00-05:00	140.761997	142.045944	140.006732	140.431564
2022-11-25	00:00:00-05:00	139.978416	141.130192	139.817924	140.072815
2022-11-28	00:00:00-05:00	139.704607	139.950076	137.778695	138.005264
2022-11-29	00:00:00-05:00	137.750376	138.939909	137.552114	138.297943
2022-11-30	00:00:00-05:00	138.014723	141.271789	137.523799	140.573166
2022-12-01	00:00:00-05:00	141.592786	141.621107	139.100421	140.818649
2022-12-02	00:00:00-05:00	139.846238	140.818637	139.468598	140.356033
2022-12-05	00:00:00-05:00	139.666864	140.601492	138.590616	139.166504
2022-12-06	00:00:00-05:00	139.062667	139.534706	138.496215	139.251480
2022-12-07	00:00:00-05:00	139.090975	139.817919	138.109126	139.034332
2022-12-08	00:00:00-05:00	139.629093	140.809190	139.128733	139.515808
2022-12-09	00:00:00-05:00	139.157063	140.044499	138.751117	138.826645
2022-12-12	00:00:00-05:00	139.553577	140.865845	138.722784	140.865845
2022-12-13	00:00:00-05:00	141.960968	144.642160	141.564458	142.149796
2022-12-14	00:00:00-05:00	142.055380	143.414854	140.148339	141.479492

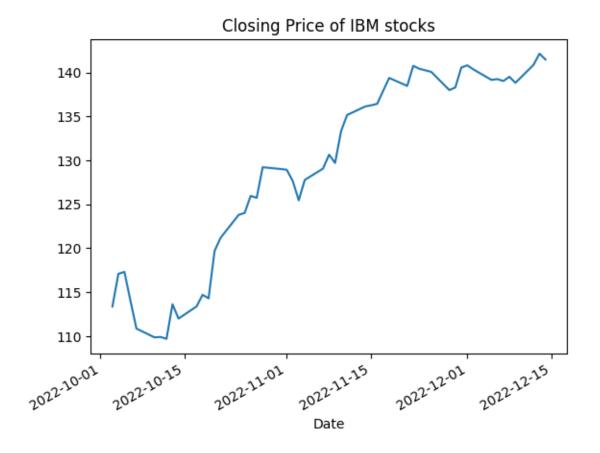
		Volume	Dividends	Stock Splits
Date				_
2022-10-03	00:00:00-04:00	4261700	0.00	0.0
2022-10-04	00:00:00-04:00	4566100	0.00	0.0
2022-10-05	00:00:00-04:00	3212900	0.00	0.0
2022-10-06	00:00:00-04:00	5074600	0.00	0.0
2022-10-07	00:00:00-04:00	4499700	0.00	0.0
2022-10-10	00:00:00-04:00	5990000	0.00	0.0
2022-10-11	00:00:00-04:00	4043100	0.00	0.0
2022-10-12	00:00:00-04:00	3338800	0.00	0.0
2022-10-13	00:00:00-04:00	5837500	0.00	0.0
2022-10-14	00:00:00-04:00	3762400	0.00	0.0
2022-10-17	00:00:00-04:00	5458600	0.00	0.0
2022-10-18	00:00:00-04:00	5120300	0.00	0.0
2022-10-19	00:00:00-04:00	5906600	0.00	0.0
2022-10-20	00:00:00-04:00	13623100	0.00	0.0

```
2022-10-21 00:00:00-04:00
                             7201300
                                            0.00
                                                           0.0
2022-10-24 00:00:00-04:00
                                            0.00
                                                            0.0
                             5610900
2022-10-25 00:00:00-04:00
                             5957600
                                            0.00
                                                            0.0
2022-10-26 00:00:00-04:00
                             5139000
                                            0.00
                                                            0.0
2022-10-27 00:00:00-04:00
                                                           0.0
                             3993200
                                            0.00
2022-10-28 00:00:00-04:00
                                            0.00
                                                           0.0
                             5965500
2022-10-31 00:00:00-04:00
                                                           0.0
                             4915300
                                            0.00
2022-11-01 00:00:00-04:00
                             3590600
                                            0.00
                                                           0.0
2022-11-02 00:00:00-04:00
                             5360500
                                            0.00
                                                           0.0
2022-11-03 00:00:00-04:00
                                                            0.0
                             4442400
                                            0.00
2022-11-04 00:00:00-04:00
                             4178000
                                            0.00
                                                           0.0
2022-11-07 00:00:00-05:00
                             4043100
                                            0.00
                                                           0.0
2022-11-08 00:00:00-05:00
                             5042800
                                            0.00
                                                           0.0
2022-11-09 00:00:00-05:00
                             4720000
                                            1.65
                                                           0.0
2022-11-10 00:00:00-05:00
                             5389000
                                            0.00
                                                            0.0
2022-11-11 00:00:00-05:00
                             5871300
                                            0.00
                                                            0.0
2022-11-14 00:00:00-05:00
                                            0.00
                                                            0.0
                             5293500
2022-11-15 00:00:00-05:00
                                                            0.0
                             4727100
                                            0.00
2022-11-16 00:00:00-05:00
                             3445200
                                            0.00
                                                            0.0
2022-11-17 00:00:00-05:00
                                            0.00
                                                            0.0
                             3954000
2022-11-18 00:00:00-05:00
                             4661700
                                            0.00
                                                            0.0
2022-11-21 00:00:00-05:00
                                                            0.0
                             3476200
                                            0.00
2022-11-22 00:00:00-05:00
                             7062100
                                            0.00
                                                           0.0
2022-11-23 00:00:00-05:00
                             3658200
                                            0.00
                                                           0.0
2022-11-25 00:00:00-05:00
                                                           0.0
                             2075200
                                            0.00
2022-11-28 00:00:00-05:00
                             3538100
                                            0.00
                                                           0.0
2022-11-29 00:00:00-05:00
                             2754700
                                            0.00
                                                           0.0
2022-11-30 00:00:00-05:00
                             6377600
                                            0.00
                                                            0.0
2022-12-01 00:00:00-05:00
                             4495900
                                            0.00
                                                            0.0
2022-12-02 00:00:00-05:00
                             2900000
                                            0.00
                                                           0.0
2022-12-05 00:00:00-05:00
                                                            0.0
                             2784600
                                            0.00
2022-12-06 00:00:00-05:00
                                            0.00
                                                            0.0
                             2847600
                                                            0.0
2022-12-07 00:00:00-05:00
                             3971300
                                            0.00
2022-12-08 00:00:00-05:00
                             2665700
                                            0.00
                                                            0.0
2022-12-09 00:00:00-05:00
                                                            0.0
                             3047600
                                            0.00
2022-12-12 00:00:00-05:00
                             4032800
                                            0.00
                                                            0.0
2022-12-13 00:00:00-05:00
                             8811500
                                            0.00
                                                           0.0
2022-12-14 00:00:00-05:00
                             4205900
                                            0.00
                                                            0.0
```

```
[6]: series_closing = ibm_data["Close"]
```

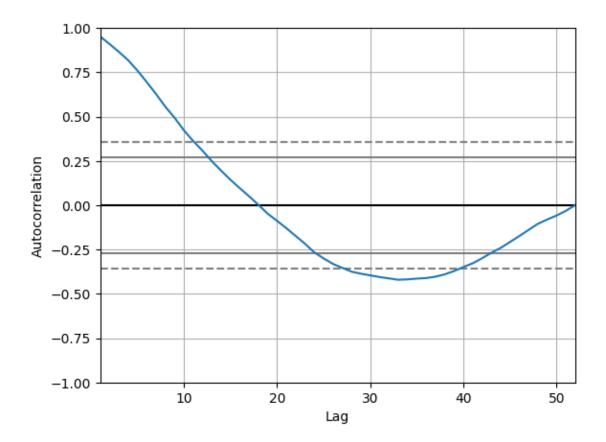
```
[8]: series_closing.plot(title="Closing Price of IBM stocks")
```

<sup>[8]: &</sup>lt;Axes: title={'center': 'Closing Price of IBM stocks'}, xlabel='Date'>



Analysis of Co-relation in the IBM Closing price time series

- [9]: pd.plotting.autocorrelation\_plot(series\_closing)
- [9]: <Axes: xlabel='Lag', ylabel='Autocorrelation'>



LjungBox Test on the Closing Series

```
[10]: dt= statsmodels.stats.diagnostic.acorr_ljungbox(series_closing, lags=None, boxpierce=False, model_df=0, period=None, return_df=True, auto_lag=False) dt
```

```
[10]:
             lb_stat
                         lb_pvalue
           49.951899
                      1.575615e-12
      1
      2
           96.426697
                      1.151354e-21
      3
          139.373919
                      5.157653e-30
          178.569772 1.512453e-37
      4
      5
          213.079518
                      4.509226e-44
          242.559458 1.594377e-49
      6
      7
          267.111828
                      6.282456e-54
          286.822185
                      2.618588e-57
      8
      9
          302.677881
                      7.056830e-60
          314.584594 1.278075e-61
```

```
[11]: from statsmodels.tsa.stattools import adfuller
```

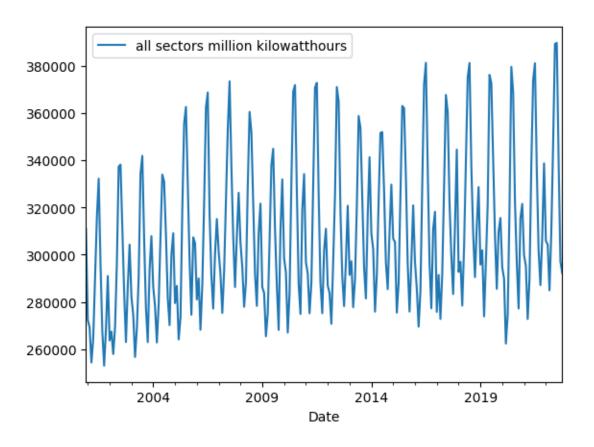
Adfuller Test on the Closing Series

```
[12]: ad_fullter_test_data = adfuller(series_closing)
      ad_fullter_test_data
[12]: (-0.8810826058142052,
       0.7941383383157626,
       0,
       51,
       \{'1\%': -3.5656240522121956,
        '5%': -2.920142229157715,
        '10%': -2.598014675124952},
       147.36694968104985)
     p_value > .05 so it is non stationary
     Differencing the time series
[13]: | ibm_data['diff'] = ibm_data["Close"].diff()
     Performing Adfuller Test on the difference
[14]: ad_fullter_test_data = adfuller(ibm_data['diff'].dropna())
      ad_fullter_test_data
[14]: (-3.4889881968435374,
       0.008274445362623582,
       9,
       41,
       \{'1\%': -3.60098336718852,
        '5%': -2.9351348158036012,
        '10%': -2.6059629803688282},
       147.22173012040238)
     p_val is less that 0.05. series is stationary
     ELECTRICITY TIME SERIES
[15]: from google.colab import drive
      drive.mount('/content/drive')
     Mounted at /content/drive
[16]: data = pd.read_csv('/content/drive/MyDrive/TSA_BDA_2024/Lab4/
       -Retail_sales_of_electricity_United_States_monthly.csv', skiprows=4)
[17]: data.dropna(inplace=True)
      data['DatePart'] = pd.to_datetime(data['Month'], format='%b %Y',__
       ⇔errors='coerce')
      data.rename(columns = {"DatePart" : "Date"}, inplace=True)
      data.set_index("Date", inplace=True)
```

```
data.drop(columns=["Month"], inplace=True)
```

```
[18]: data.plot()
```

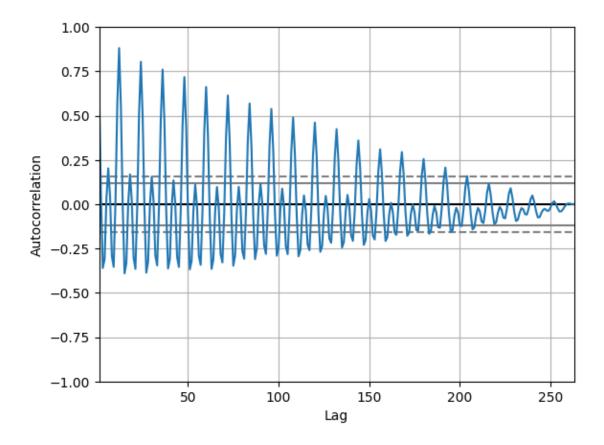
[18]: <Axes: xlabel='Date'>



Autocorelation plot of the "All sectors" time series

```
[19]: pd.plotting.autocorrelation_plot(data['all sectors million kilowatthours'])
```

[19]: <Axes: xlabel='Lag', ylabel='Autocorrelation'>



Differencing the time series with a lag of 12

```
[20]: data['diff'] = data["all sectors million kilowatthours"].diff(12)
```

Adfuller test on the differences time series

```
[21]: ad_fullter_test_data = adfuller(data['diff'].dropna())
ad_fullter_test_data
```

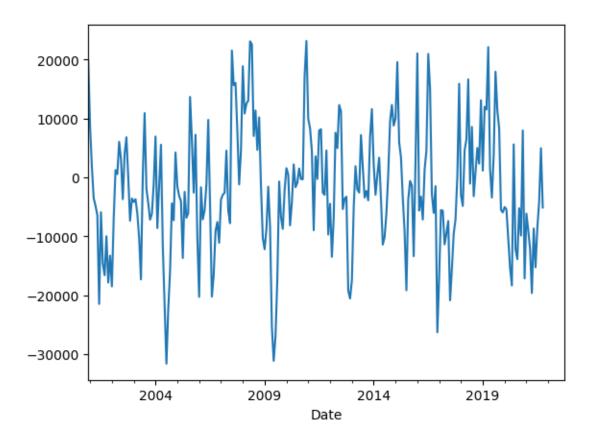
```
[21]: (-4.702498710240669,
8.324793841732234e-05,
12,
238,
{'1%': -3.458128284586202,
'5%': -2.873761835239286,
'10%': -2.5732834559706235},
4881.89911722033)
```

 $p_val < 0.05$  . series is stationary

Plot of the differenced time series :

```
[22]: data['diff'].plot()
```

## [22]: <Axes: xlabel='Date'>



LjungBox test on the differenced Time Series - all sectors data

```
[23]:
             lb_stat
                          lb_pvalue
           90.091768
                       2.273658e-21
      1
      2
          123.728696
                       1.357235e-27
      3
          141.016254
                       2.282085e-30
      4
          148.552069
                       4.158961e-31
      5
          152.256917
                       4.416147e-31
      6
          153.609170
                       1.334273e-30
      7
          153.969932
                       5.948939e-30
      8
          154.033811
                       2.822368e-29
      9
          154.510602
                       1.024277e-28
      10
          155.041854
                      3.413888e-28
```