APPLY ANALYTICS FOR FORECASTING AND INVENTORY PLANNING FOR A LARGE RETAILER.

May 14, 2023

```
[1]: library(dplyr) # data wrangling
     library(lubridate) # date manipulation
     library(forecast) # time series library
     library(MLmetrics) # calculate error
     library(ggplot2) # Beautify the graph
     library(tidyr)  # Tidy the data
library(zoo)  # Order index observations
     library(zoo)
     library(tseries) # adf.test
    Attaching package: 'dplyr'
    The following objects are masked from 'package:stats':
        filter, lag
    The following objects are masked from 'package:base':
        intersect, setdiff, setequal, union
    Loading required package: timechange
    Attaching package: 'lubridate'
    The following objects are masked from 'package:base':
        date, intersect, setdiff, union
    Warning message:
    "package 'forecast' was built under R version 4.2.3"
    Registered S3 method overwritten by 'quantmod':
```

```
method from
as.zoo.data.frame zoo

Warning message:
"package 'MLmetrics' was built under R version 4.2.3"

Attaching package: 'MLmetrics'

The following object is masked from 'package:base':
Recall

Attaching package: 'zoo'

The following objects are masked from 'package:base':
as.Date, as.Date.numeric

Warning message:
"package 'tseries' was built under R version 4.2.3"

[2]: AAPL<-read.csv('AAPL.csv')

[3]: AAPL
```

	Date	Open	High	Low	Close	Adj.Close	Volume
	<chr></chr>	<dbl></dbl>	<dbl></dbl>	<dbl></dbl>	<dbl></dbl>	<dbl></dbl>	<int></int>
-	2014-09-29	100.59	100.69	98.04	99.62	93.51429	142718700
	2014-10-06	99.95	102.38	98.31	100.73	94.55624	280258200
	2014-10-13	101.33	101.78	95.18	97.67	91.68379	358539800
	2014-10-20	98.32	105.49	98.22	105.22	98.77104	358532900
	2014-10-27	104.85	108.04	104.70	108.00	101.38068	220230600
	2014-11-03	108.22	110.30	107.72	109.01	102.32877	199952900
	2014-11-10	109.02	114.19	108.40	114.18	107.64668	205166700
	2014-11-17	114.27	117.57	113.30	116.47	109.80563	233414700
	2014-11-24	116.85	119.75	116.62	118.93	112.12486	181873900
	2014-11-24	118.81	119.25	111.27	115.00	108.41975	266589700
	2014-12-08	114.10	114.85	109.35	109.73	103.45129	259868000
	2014-12-15	110.70	113.24	106.26	111.78	105.38398	328856600
	2014-12-19	112.16	114.52	111.97	113.99	107.46753	119396500
	2014-12-29	113.79	114.77	107.35	109.33	103.07418	152088400
	2015-01-05	108.29	113.25	104.63	112.01	105.60083	283252500
	2015-01-12	112.60	112.80	105.20	105.99	99.92529	303607000
	2015-01-12	107.84	113.75	106.50	112.98	106.51534	198737000
	2015-01-26	113.74	120.00	109.03	117.16	110.45615	465842700
	2015-01-20	118.05	120.50 120.51	116.08	118.93	112.12486	270757300
	2015-02-02	118.55	127.48	118.43	127.08	120.28137	303206800
	2015-02-16	127.49	129.50	126.92	127.50 129.50	120.20197 122.57192	194354900
	2015-02-23	130.02	133.60	126.61	128.46	121.58755	368216200
	2015-03-02	129.25	130.28	125.76	126.60	119.82704	246938500
	2015-03-09	127.96	129.57	121.63	123.59	116.97807	326514100
	2015-03-16	123.88	129.25	122.87	125.90	119.16451	266672900
	2015-03-10	127.12	128.04	122.60	123.25	116.65627	209326300
	2015-03-20	124.05	126.49	123.10	125.25 125.32	118.61552	162031800
	2015-04-06	124.47	128.12	124.33	127.10	120.30030	182207500
	2015-04-13	128.37	128.57	124.46	124.75	118.07602	171186100
A data.frame: 184×7	2015-04-20	125.57	130.63	125.17	130.28	123.31015	207440700
	2010 01 20	120.01	100.00	120111	100.20	120.01010	20,110,00
	2017-09-11	160.500	163.96	157.91	159.88	158.6604	220582600
	2017-09-18	160.110	160.50	150.56	151.89	150.7314	186188500
	2017 - 09 - 25	149.990	154.72	149.16	154.12	152.9444	154856800
	2017-10-02	154.260	155.49	152.46	155.30	154.1154	93784300
	2017-10-09	155.810	158.00	155.10	156.99	155.7925	81304800
	2017-10-16	157.900	160.87	155.02	156.25	155.0581	126051300
	2017-10-23	156.890	163.60	155.27	163.05	161.8063	122403300
	2017-10-30	163.890	174.26	163.72	172.50	171.1842	215177400
	2017-11-06	172.370	176.24	171.72	174.67	173.3376	138425400
	2017-11-13	173.500	174.50	168.38	170.15	169.4591	116459700
	2017-11-20	170.290	175.50	169.56	174.97	174.2595	81009300
	2017-11-27	175.050	175.08	167.16	171.05	170.3554	170098500
	2017-12-04	172.480	172.62	166.46	169.37	168.6823	137481100
	2017-12-11	169.200	174.17	168.79	173.97	173.2636	139147200
	2017-12-18	174.880	177.20	173.25	175.01	174.2994	117632400
	2017-12-25	170.800	171.85	169.22	169.23	168.5428	97163800
	2018-01-01	170.160	175.37	169.26	175.00	174.2894	101168400
	2018-01-08	174.350	177.36	173.00	177.09	176.3709	110197500
	2018-01-15	177.900	180.10	175.07	178.46	177.7354	127571200
	2018-01-22	177.300	179.44	170.06	171.51	170.8136	191574800

[4]: head(AAPL)

```
Volume
                         Date
                                      Open
                                                High
                                                         Low
                                                                  Close
                                                                            Adj.Close
                         < chr >
                                      <dbl>
                                                <dbl>
                                                         <dbl>
                                                                  <dbl>
                                                                            <dbl>
                                                                                        <int>
                     1
                         2014-09-29
                                      100.59
                                                100.69
                                                         98.04
                                                                  99.62
                                                                            93.51429
                                                                                        142718700
                                                102.38
                     2
                         2014-10-06
                                      99.95
                                                         98.31
                                                                  100.73
                                                                            94.55624
                                                                                        280258200
A data.frame: 6 \times 7
                                                101.78
                                                                  97.67
                     3
                         2014-10-13
                                      101.33
                                                         95.18
                                                                            91.68379
                                                                                        358539800
                                      98.32
                         2014-10-20
                                                105.49
                                                         98.22
                                                                  105.22
                                                                            98.77104
                     4
                                                                                        358532900
                         2014-10-27
                                      104.85
                                                108.04
                                                         104.70
                                                                  108.00
                                                                            101.38068
                                                                                        220230600
                         2014-11-03
                                      108.22
                                                110.30
                                                         107.72
                                                                  109.01
                                                                            102.32877
                                                                                        199952900
```

[6]: tail(AAPL)

```
Date
                                Close
                  < date >
                                <dbl>
                  2018-03-24
                                NA
                  2018-03-25
                                NA
A tibble: 6 \times 2
                  2018 - 03 - 26
                                167.78
                  2018-03-27
                                NA
                  2018-03-28
                                NA
                  2018-03-29
                                167.78
```

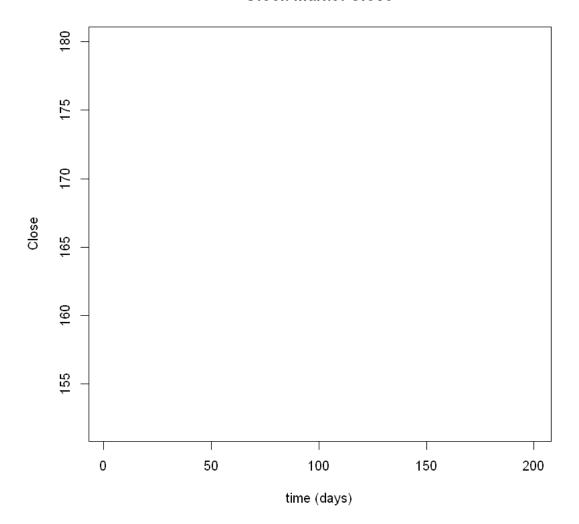
[7]: colSums(is.na(AAPL))

Date 0 Close 1094

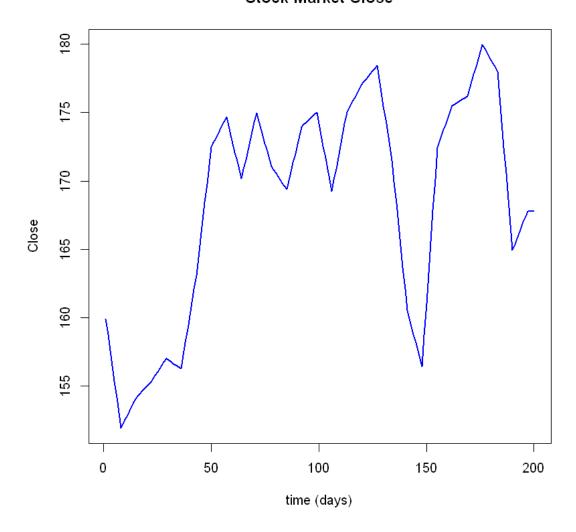
[8]: tail(AAPL\$Close, 200)

 $\begin{array}{c} 1.\ 159.880005\ 2.\ < \text{NA} >\ 3.\ < \text{NA} >\ 4.\ < \text{NA} >\ 5.\ < \text{NA} >\ 6.\ < \text{NA} >\ 7.\ < \text{NA} >\ 8.\ 151.889999\ 9.\ < \text{NA} >\ 10.\ < \text{NA} >\ 11.\ < \text{NA} >\ 12.\ < \text{NA} >\ 13.\ < \text{NA} >\ 14.\ < \text{NA} >\ 15.\ 154.119995\ 16.\ < \text{NA} >\ 17.\ < \text{NA} >\ 18.\ < \text{NA} >\ 19.\ < \text{NA} >\ 20.\ < \text{NA} >\ 21.\ < \text{NA} >\ 22.\ 155.300003\ 23.\ < \text{NA} >\ 24.\ < \text{NA} >\ 25.\ < \text{NA} >\ 26.\ < \text{NA} >\ 27.\ < \text{NA} >\ 28.\ < \text{NA} >\ 29.\ 156.990005\ 30.\ < \text{NA} >\ 31.\ < \text{NA} >\ 32.\ < \text{NA} >\ 33.\ < \text{NA} >\ 34.\ < \text{NA} >\ 35.\ < \text{NA} >\ 36.\ 156.25\ 37.\ < \text{NA} >\ 38.\ < \text{NA} >\ 39.\ < \text{NA} >\ 40.\ < \text{NA} >\ 41.\ < \text{NA} >\ 42.\ < \text{NA} >\ 43.\ 163.050003\ 44.\ < \text{NA} >\ 45.\ < \text{NA} >\ 46.\ < \text{NA} >\ 47.\ < \text{NA} >\ 48.\ < \text{NA} >\ 49.\ < \text{NA}$

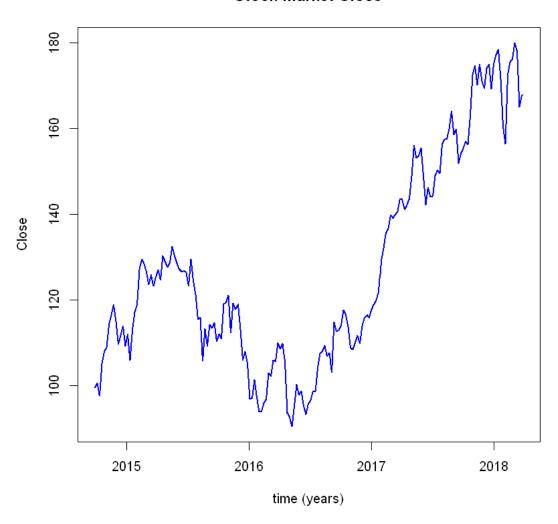
```
121. <NA> 122. <NA> 123. <NA> 124. <NA> 125. <NA> 126. <NA> 126. <NA> 127. 178.460007 128. <NA> 129. <NA> 130. <NA> 131. <NA> 131. <NA> 132. <NA> 133. <NA> 134. 171.509995 135. <NA> 136. <NA> 137. <NA> 138. <NA> 139. <NA> 140. <NA> 141. 160.5 142. <NA> 143. <NA> 144. <NA> 145. <NA> 146. <NA> 147. <NA> 148. 156.410004 149. <NA> 150. <NA> 151. <NA> 151. <NA> 152. <NA> 153. <NA> 154. <NA> 155. 172.42993 156. <NA> 157. <NA> 158. <NA> 159. <NA> 160. <NA> 161. <NA> 162. 175.5 163. <NA> 164. <NA> 165. <NA> 165. <NA> 166. <NA> 167. <NA> 168. <NA> 169. 176.210007 170. <NA> 171. <NA> 172. <NA> 173. <NA> 174. <NA> 175. <NA> 175. <NA> 176. 179.979996 177. <NA> 178. <NA> 179. <NA> 180. <NA> 181. <NA> 182. <NA> 183. 178.020004 184. <NA> 185. <NA> 186. <NA> 187. <NA> 188. <NA> 189. <NA> 190. 164.940002 191. <NA> 192. <NA> 193. <NA> 194. <NA> 195. <NA> 196. <NA> 196. <NA> 197. 167.779999
```



```
[10]: AAPL_new <- mutate(AAPL, Close = na.fill(Close, "extend"))
close_values <- tail(AAPL_new, 200)
plot(close_values$Close, type = "l", col = "blue", lwd = 2, xlab = "time_\( \)
\( \text{days} \) ", ylab = 'Close', main = "Stock Market Close")
```



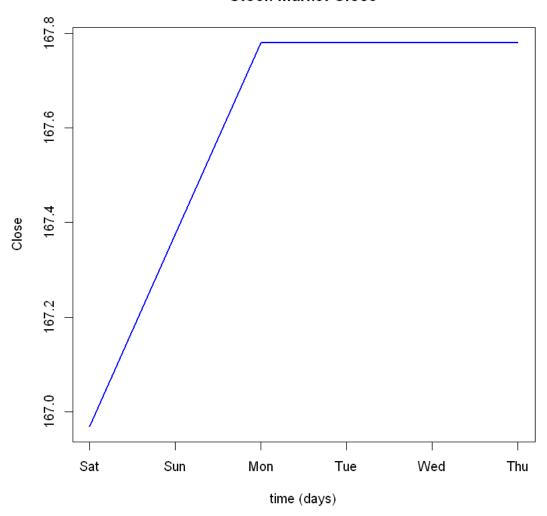
```
[11]: plot(AAPL_new$Date, AAPL_new$Close, type = "l", col = "blue", lwd = 2, xlab = "time (years)", ylab = 'Close', main = "Stock Market Close")
```



```
[12]: tail_values <- tail(AAPL_new)

plot(tail_values$Date, tail_values$Close, type = "l", col = "blue", lwd = 2,__

Axlab = "time (days)", ylab = 'Close', main = "Stock Market Close")
```



```
Close
                   month
                   <date>
                                  <dbl>
                   2014-09-01
                                 99.69929
                   2014 \text{-} 10 \text{-} 01
                                  102.89885
A tibble: 6 \times 2
                   2014-11-01
                                  114.85624
                   2014-12-01
                                 111.79447
                   2015 - 01 - 01
                                  112.36369
                   2015-02-01
                                 126.52184
```

```
[15]: AAPL_ts <- ts( data = APPL_m$Close, start = c(1980,12,01), frequency = 12) class(AAPL_ts)
```

'ts'



```
[17]: AAPL_test <- tail(AAPL_new, 24)
[18]: AAPL_train <- head(AAPL_new, -length(AAPL_test))
[20]: plot(AAPL_train)</pre>
```

