NaiveBayes.R

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```
## Import data
library("quantmod")
## Loading required package: xts
## Loading required package: zoo
##
## Attaching package: 'zoo'
## The following objects are masked from 'package:base':
##
##
       as.Date, as.Date.numeric
## Loading required package: TTR
## Version 0.4-0 included new data defaults. See ?getSymbols.
library("lubridate")
## Warning: package 'lubridate' was built under R version 3.3.3
##
## Attaching package: 'lubridate'
## The following object is masked from 'package:base':
##
##
       date
library("e1071")
library(xts)
## Set the start and end date of the data to be considered
start_Date = as.Date("2010-01-01")
end_Date = as.Date("2017-04-18")
## Get market data for all symbols making up the NASDAQ 100 Index
Nasdaq100_Symbols <- c("MAT","NFLX","AAPL","QCOM","MAR")</pre>
getSymbols(Nasdaq100_Symbols, from = start_Date, to = end_Date)
       As of 0.4-0, 'getSymbols' uses env=parent.frame() and
##
   auto.assign=TRUE by default.
##
##
## This behavior will be phased out in 0.5-0 when the call will
```

```
default to use auto.assign=FALSE. getOption("getSymbols.env") and
    getOptions("getSymbols.auto.assign") are now checked for alternate
defaults
##
    This message is shown once per session and may be disabled by setting
##
    options("getSymbols.warning4.0"=FALSE). See ?getSymbols for more details.
##
              "NFLX" "AAPL" "QCOM" "MAR"
nasdaq100 <- data.frame(as.xts(merge(MAT,NFLX,AAPL,QCOM,MAR)))</pre>
head(nasdaq100)
##
              MAT.Open MAT.High MAT.Low MAT.Close MAT.Volume MAT.Adjusted
## 2010-01-04
                  20.33
                           20.33
                                    19.96
                                              19.99
                                                        2975900
                                                                     14.72519
## 2010-01-05
                  19.90
                           20.06
                                    19.33
                                              19.58
                                                        5206100
                                                                     14.42317
## 2010-01-06
                  19.50
                           19.58
                                    19.19
                                              19.50
                                                        6354900
                                                                     14.36424
                  19.70
                           20.07
                                              20.00
## 2010-01-07
                                    19.64
                                                        9714500
                                                                     14.73256
                  19.91
                                              19.77
## 2010-01-08
                           20.06
                                    19.74
                                                        3362600
                                                                     14.56313
## 2010-01-11
                  19.79
                           19.98
                                    19.66
                                              19.90
                                                        5180500
                                                                     14.65889
##
              NFLX.Open NFLX.High NFLX.Low NFLX.Close NFLX.Volume
                   55.52
                             55.73
                                       52.96
                                                   53.48
## 2010-01-04
                                                            17239600
## 2010-01-05
                   53.57
                             53.60
                                       50.81
                                                   51.51
                                                            23753100
                             53.71
                                                   53.32
## 2010-01-06
                   51.53
                                       50.38
                                                            23290400
## 2010-01-07
                   54.12
                             54.30
                                       52.24
                                                   52.40
                                                             9955400
                             54.20
                                                   53.30
## 2010-01-08
                   52.49
                                       52.26
                                                             8180900
                             53.93
                                       52.70
## 2010-01-11
                   53.62
                                                   53.23
                                                             6783700
##
              NFLX.Adjusted AAPL.Open AAPL.High AAPL.Low AAPL.Close
## 2010-01-04
                    7.640000
                                 213.43
                                           214.50
                                                     212.38
                                                                214.01
## 2010-01-05
                    7.358572
                                 214.60
                                           215.59
                                                     213.25
                                                                214.38
## 2010-01-06
                    7.617143
                                 214.38
                                           215.23
                                                     210.75
                                                                210.97
## 2010-01-07
                    7.485714
                                 211.75
                                           212.00
                                                     209.05
                                                                210.58
                                           212.00
## 2010-01-08
                    7.614286
                                 210.30
                                                     209.06
                                                                211.98
## 2010-01-11
                    7.604286
                                 212.80
                                           213.00
                                                     208.45
                                                                210.11
##
              AAPL.Volume AAPL.Adjusted QCOM.Open QCOM.High QCOM.Low
                                                         47.31
## 2010-01-04
                 123432400
                                 27.72704
                                              46.79
                                                                   46.57
## 2010-01-05
                 150476200
                                 27.77498
                                              47.52
                                                         48.32
                                                                   47.50
## 2010-01-06
                 138040000
                                 27.33318
                                              48.26
                                                         48.43
                                                                   47.38
## 2010-01-07
                 119282800
                                 27.28265
                                              47.75
                                                         49.02
                                                                   47.55
## 2010-01-08
                 111902700
                                 27.46403
                                              49.11
                                                         49.80
                                                                   48.89
                                              49.58
                                                         49.69
                                                                   48.64
## 2010-01-11
                 115557400
                                 27.22176
##
               QCOM.Close QCOM.Volume QCOM.Adjusted MAR.Open MAR.High MAR.Low
## 2010-01-04
                    46.94
                             14570200
                                            39.76652
                                                         27.61
                                                                   27.93
                                                                           27.20
                    48.07
                             24241000
                                            40.72383
                                                         27.57
                                                                   27.92
                                                                           27.37
## 2010-01-05
                    47.60
                                                         27.74
                                                                   28.02
                                                                           27.53
## 2010-01-06
                             22743800
                                            40.32566
## 2010-01-07
                    48.98
                             25266300
                                            41.49476
                                                         27.75
                                                                   28.17
                                                                           27.70
                    49.47
                                                         27.78
                                                                   28.17
                                                                           27.76
## 2010-01-08
                             25938200
                                            41.90988
## 2010-01-11
                    49.29
                             14672400
                                            41.75739
                                                         28.13
                                                                   28.34
                                                                           27.81
##
              MAR.Close MAR.Volume MAR.Adjusted
## 2010-01-04
                   27.63
                            2860300
                                         23.77412
                   27.79
## 2010-01-05
                            2627800
                                         23.91180
```

```
## 2010-01-06
                  27.87
                            2789800
                                        23.98063
                  27.98
## 2010-01-07
                            2560700
                                        24.07528
## 2010-01-08
                  28.04
                            3961000
                                        24.12691
## 2010-01-11
                  27.98
                            2714200
                                         24.07528
## Set outcome variable
outcomeSymbol <- 'AAPL.Close'</pre>
nasdaq100 <- xts(nasdaq100,order.by=as.Date(rownames(nasdaq100)))</pre>
nasdag100 <- as.data.frame(merge(nasdag100,</pre>
lm1=lag(nasdaq100[,outcomeSymbol],-1)))
nasdaq100$outcome <- ifelse(nasdaq100[,paste0(outcomeSymbol,'.1')] >
nasdaq100[,outcomeSymbol], 1, 0)
nasdaq100$date <- as.Date(row.names(nasdaq100))</pre>
nasdaq100 <- nasdaq100[order(as.Date(nasdaq100$date, "%m/%d/%Y"), decreasing</pre>
= TRUE), ]
## Delete the last row from our data frame as it doesn't have an outcome
variable (that is in the future): drop most recent entry as we don't have an
outcome
nasdaq100 <- nasdaq100[2:nrow(nasdaq100),]</pre>
dput(names(nasdaq100)[grep1('MAT',names(nasdaq100))])
## c("MAT.Open", "MAT.High", "MAT.Low", "MAT.Close", "MAT.Volume",
## "MAT.Adjusted")
## Retrieving Apple's daily OHLCV from Yahoo Finance
nasdaq100$wday <- as.POSIX1t(nasdaq100$date)$wday</pre>
## Find the day of the week
head(nasdaq100)
              MAT.Open MAT.High MAT.Low MAT.Close MAT.Volume MAT.Adjusted
##
## 2017-04-17
                 25.09
                           25.27
                                   24.95
                                              25.24
                                                       3134900
                                                                       25.24
                 25.74
                           25.78
## 2017-04-13
                                   25.01
                                              25.01
                                                       4042400
                                                                       25.01
## 2017-04-12
                 25.68
                           25.97
                                   25.62
                                              25.73
                                                       4888700
                                                                       25.73
## 2017-04-11
                 25.39
                                   25.20
                                              25.73
                           25.74
                                                       2669700
                                                                       25.73
## 2017-04-10
                 24.92
                           25.41
                                   24.92
                                              25.39
                                                       3036100
                                                                       25.39
## 2017-04-07
                 25.35
                           25.39
                                   24.88
                                              24.92
                                                       3906400
                                                                       24.92
##
              NFLX.Open NFLX.High NFLX.Low NFLX.Close NFLX.Volume
## 2017-04-17
                 144.43
                            147.32
                                     144.43
                                                 147.25
                                                           14648700
                            144.55
## 2017-04-13
                 144.25
                                     142.76
                                                 142.92
                                                            3621300
## 2017-04-12
                 144.85
                            145.74
                                     143.55
                                                 143.83
                                                            4377200
                            144.54
## 2017-04-11
                 144.28
                                     141.98
                                                 144.35
                                                            4613600
## 2017-04-10
                 143.04
                            144.65
                                     141.21
                                                 143.85
                                                            5760500
## 2017-04-07
                 143.79
                            143.89
                                     142.71
                                                 143.11
                                                            3021100
##
              NFLX.Adjusted AAPL.Open AAPL.High AAPL.Low AAPL.Close
## 2017-04-17
                     147.25
                                141.48
                                           141.88
                                                    140.87
                                                               141.83
## 2017-04-13
                     142.92
                                141.91
                                          142.38
                                                    141.05
                                                               141.05
## 2017-04-12
                     143.83
                                141.60
                                          142.15
                                                    141.01
                                                               141.80
```

```
## 2017-04-11
                      144.35
                                142.94
                                                    140.06
                                           143.35
                                                                141.63
## 2017-04-10
                      143.85
                                143.60
                                           143.88
                                                    142.90
                                                                143.17
## 2017-04-07
                      143.11
                                143.73
                                           144.18
                                                    143.27
                                                                143.34
##
              AAPL. Volume AAPL. Adjusted QCOM. Open QCOM. High QCOM. Low
## 2017-04-17
                 16424000
                                  141.83
                                              52.99
                                                        53.13
                                                                  52.75
## 2017-04-13
                 17652900
                                  141.05
                                              53.13
                                                        53.68
                                                                  52.78
## 2017-04-12
                                              54.64
                                                        54.65
                                                                  53.12
                 20238900
                                  141.80
## 2017-04-11
                  30275300
                                  141.63
                                              56.32
                                                        56.36
                                                                  54.72
                                                                  56.27
## 2017-04-10
                 18473000
                                  143.17
                                              56.43
                                                        56.81
## 2017-04-07
                  16621300
                                  143.34
                                              56.58
                                                        56.60
                                                                  56.19
##
              QCOM.Close QCOM.Volume QCOM.Adjusted MAR.Open MAR.High MAR.Low
                                                                  91.98
## 2017-04-17
                   52.89
                             10316800
                                               52.89
                                                        91.91
                                                                          91.60
## 2017-04-13
                   52.79
                             16971600
                                               52.79
                                                        91.70
                                                                  92.12
                                                                          91.32
## 2017-04-12
                   53.39
                             24731300
                                               53.39
                                                        91.98
                                                                  92.00
                                                                          90.88
## 2017-04-11
                   55.35
                                               55.35
                                                        91.16
                                                                  91.59
                                                                          90.79
                             17291800
## 2017-04-10
                   56.52
                              5917100
                                               56.52
                                                        91.04
                                                                  91.72
                                                                          90.66
## 2017-04-07
                   56.32
                              5226900
                                               56.32
                                                        91.73
                                                                  91.73
                                                                          90.25
##
              MAR.Close MAR.Volume MAR.Adjusted AAPL.Close.1 outcome
## 2017-04-17
                  91.95
                            1284000
                                            91.95
                                                        141.20
## 2017-04-13
                  91.55
                            2240900
                                            91.55
                                                        141.83
                                                                      1
## 2017-04-12
                  91.75
                                            91.75
                                                        141.05
                                                                      0
                            3416300
## 2017-04-11
                  91.40
                            2730400
                                            91.40
                                                        141.80
                                                                      1
                  91.06
## 2017-04-10
                            2126700
                                            91.06
                                                        141.63
                                                                      0
## 2017-04-07
                   91.21
                            2954500
                                            91.21
                                                        143.17
##
                     date wday
## 2017-04-17 2017-04-17
                             1
## 2017-04-13 2017-04-13
                             4
## 2017-04-12 2017-04-12
                             3
## 2017-04-11 2017-04-11
                             2
## 2017-04-10 2017-04-10
                             1
## 2017-04-07 2017-04-07
                             5
PriceDiff <- (nasdaq100$NFLX.Close) - (nasdaq100$NFLX.Open)</pre>
## Find the difference between the close price and open price
TrendClass <- ifelse(PriceDiff>0, "UP", "DOWN")
## Convert to a binary classification. (In our data set, there are no bars
with an exactly 0 price change so, for simplicity sake, we will not address
bars that had the same open and close price.)
D1 <- data.frame(nasdaq100$wday,TrendClass)</pre>
## Create our data set
M1 <- naiveBayes(D1[,1],D1[,2])</pre>
Μ1
```

```
##
## Naive Bayes Classifier for Discrete Predictors
##
## Call:
## naiveBayes.default(x = D1[, 1], y = D1[, 2])
## A-priori probabilities:
## D1[, 2]
                    UP
        DOWN
## 0.5136314 0.4863686
## Conditional probabilities:
##
          Х
## D1[, 2]
               [,1]
                        [,2]
      DOWN 3.022293 1.409144
##
      UP 3.022422 1.388405
##
#Analysis:
MA5 <- EMA(nasdaq100\$NFLX.Open,n = 5)
MA10 <- EMA(nasdaq100\$NFLX.Open,n = 10)
MACross <- MA5 - MA10
MACross <- round(MACross,2)</pre>
# Lets create a new dataset and split it into a training and test set so we
are able to see how well our model does over new data
D2 <- data.frame(nasdaq100$wday,MACross, TrendClass)
D2 \leftarrow D2[-c(1:10),]
# We need to remove the instances where the 10-period moving average is still
being calculated
TrainingData <- D2[1:1216,]</pre>
TestData <- D2[1217:1823,]
MACrossModel <- naiveBayes(TrainingData[,1:2],TrainingData[,3])</pre>
MACrossModel
##
## Naive Bayes Classifier for Discrete Predictors
##
## Call:
## naiveBayes.default(x = TrainingData[, 1:2], y = TrainingData[,
##
       3])
##
## A-priori probabilities:
## TrainingData[, 3]
        DOWN
##
## 0.5065789 0.4934211
## Conditional probabilities:
##
                    nasdaq100.wday
```

```
## TrainingData[, 3] [,1] [,2]
##
               DOWN 3.030844 1.417896
##
               UP 3.013333 1.386733
##
##
                   MACross
## TrainingData[, 3]
                         [,1]
                                   [,2]
               DOWN 0.1139448 10.83784
##
               UP -0.4459833 12.66507
# The Conditional Probability of the EMA Cross, a numeric variable, shows the
mean value for each case ([,1]), and the standard deviation ([,2]). We can
see that the mean difference between the 5-period EMA and 10-period EMA for
long and short trades was 0.54 and - 0.24, respectively.
table(predict(MACrossModel, TestData), TestData[,3], dnn=list('predicted', 'actua')
1'))
##
           actual
## predicted DOWN UP
##
       DOWN 313 287
##
       UP 6 1
```