# **ARIMA**

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#### 15 04 2022

#### **Contents**

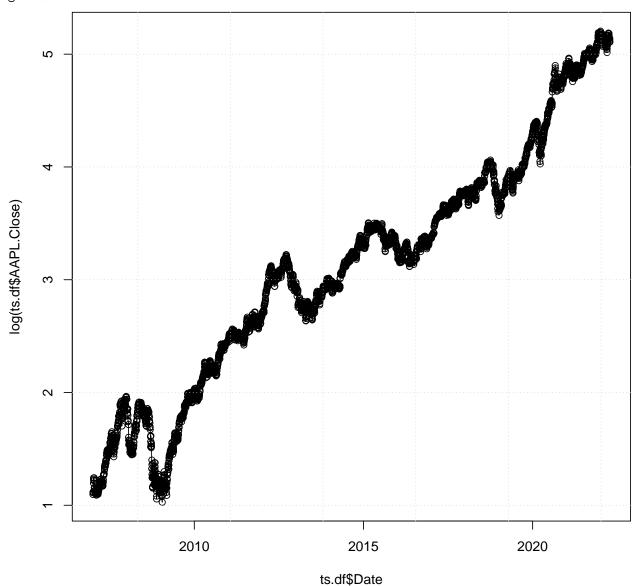
## 0.1 Загрузка данных с yahoo.finance

```
library(quantmod)
##
                  : xts
##
                  : zoo
##
##
            : 'zoo'
##
                    'package:base':
##
       as.Date, as.Date.numeric
##
##
                  : TTR
## Registered S3 method overwritten by 'quantmod':
##
     method
##
     as.zoo.data.frame zoo
quantmod::getSymbols(Symbols = "AAPL")
## 'getSymbols' currently uses auto.assign=TRUE by default, but will
## use auto.assign=FALSE in 0.5-0. You will still be able to use
## 'loadSymbols' to automatically load data. getOption("getSymbols.env")
## and getOption("getSymbols.auto.assign") will still be 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 details.
## [1] "AAPL"
ts.df <- data.frame(get("AAPL"))</pre>
ts.df$Date <- as.Date.character(rownames(ts.df), format = "%Y-%m-%d")
ts.df$Num Date <- as.numeric(ts.df$Date)</pre>
head(ts.df)
              AAPL.Open AAPL.High AAPL.Low AAPL.Close AAPL.Volume AAPL.Adjusted
## 2007-01-03 3.081786 3.092143 2.925000 2.992857 1238319600
                                                                        2.562705
## 2007-01-04 3.001786 3.069643 2.993571
                                             3.059286 847260400
                                                                        2.619588
## 2007-01-05 3.063214 3.078571 3.014286 3.037500 834741600
                                                                        2.600933
```

```
## 2007-01-08 3.070000 3.090357 3.045714
                                             3.052500
                                                        797106800
                                                                       2.613777
## 2007-01-09 3.087500 3.320714 3.041071
                                             3.306071
                                                      3349298400
                                                                       2.830903
## 2007-01-10 3.383929 3.492857 3.337500
                                             3.464286
                                                       2952880000
                                                                       2.966379
##
                    Date Num_Date
## 2007-01-03 2007-01-03
                            13516
## 2007-01-04 2007-01-04
                            13517
## 2007-01-05 2007-01-05
                            13518
## 2007-01-08 2007-01-08
                            13521
## 2007-01-09 2007-01-09
                            13522
## 2007-01-10 2007-01-10
                            13523
```

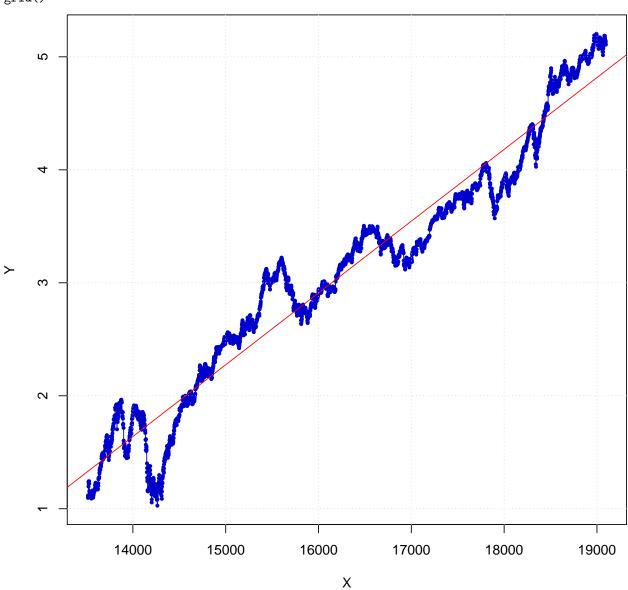
$$x = \int_{-\infty}^{\infty} y \cdot f(x) dy$$

plot(x = ts.df\$Date, y = log(ts.df\$AAPL.Close), type = "o")
grid()



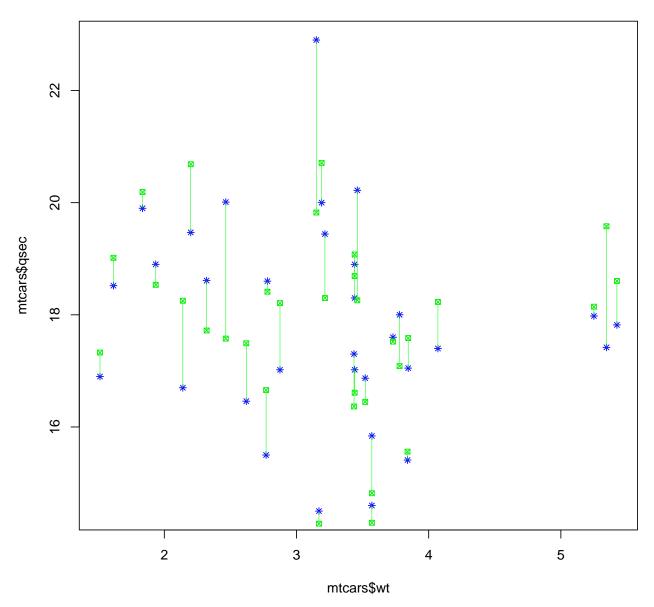
### Вытаскиваю из графика линейный тренд

```
Y <- log(ts.df$AAPL.Close)
X <- ts.df$Num_Date</pre>
model_lm \leftarrow lm(Y \sim X)
model_lm
##
## Call:
## lm(formula = Y ~ X)
##
## Coefficients:
## (Intercept)
                           Х
## -7.2570214
                   0.0006354
plot(X, Y, type = "o", col = "blue3", pch = 19, cex = I(0.5))
abline(a = model_lm$coefficients[1], b = model_lm$coefficients[2], col ="red")
grid()
```



```
 Y\_w\_t \begin{tabular}{ll} \begin{tabular}{l
plot(x = X, y = Y_w_t, col = "purple", type = "o", cex = I(0.5), pch = 19)
                    9.0
                    0.0
                    -0.2
                    4.0-
                    -0.8
                                                                    14000
                                                                                                                              15000
                                                                                                                                                                                        16000
                                                                                                                                                                                                                                                 17000
                                                                                                                                                                                                                                                                                                           18000
                                                                                                                                                                                                                                                                                                                                                                     19000
                                                                                                                                                                                                                 Χ
length(as.matrix(ts.dfAAPL.Close)[1:(1 + 10 + 1), 1])
## [1] 12
sliding_window <- function(numeric_vector, window_elements = 10) {</pre>
        rows_matrix <- length(numeric_vector) - window_elements + 1</pre>
         cols_matrix <- window_elements</pre>
        result_matrix <- matrix(nrow = rows_matrix, ncol = cols_matrix)</pre>
        for (index in 1:rows_matrix) {
                 result_matrix[index, ] <- numeric_vector[index:(index - 1 + window_elements)]</pre>
        }
        return(result_matrix)
```

```
lin_reg <- function(X, y) {</pre>
  X <- cbind(1, as.matrix(X))</pre>
  y <- as.matrix(y)</pre>
  w <- pracma::inv(t(X) %*% X) %*% t(X) %*% y
  fit <- X %*% w
  rownames(w)[1] <- "bias"</pre>
  return(list(parameters = w, fiited = fit))
lin_reg_ridge <- function(X, y, alpha = 0) {</pre>
  X <- cbind(1, as.matrix(X))</pre>
  y <- as.matrix(y)</pre>
  w <- pracma::inv(t(X) %*% X + alpha * diag(1, nrow = ncol(X))) %*% t(X) %*% y</pre>
  fit <- X %*% w
  rownames(w)[1] <- "bias"</pre>
  return(list(parameters = w, fiited = fit))
model <- lin_reg(mtcars[, c(1, 3, 4)], mtcars[, c(5, 6)])</pre>
model_ridge \leftarrow lin_reg_ridge(mtcars[, c(1, 3, 4, 5, 6)], mtcars[, c(7)], alpha = 0.2)
plot(mtcars$wt, mtcars$qsec, col = "blue", cex = I(0.8), pch = 8)
points(mtcars$wt, model_ridge$fiited[, 1], col = "green2", cex = I(0.8), pch = 7)
segments(x0 = mtcars$wt, x1 = mtcars$wt, y0 = mtcars$qsec, y1 = model_ridge$fiited[, 1], col = "green",
```



```
plot(model_ridge$fiited[, 1], mtcars$qsec, col = "blue", cex = I(0.8), pch = 8)
lines(model_ridge$fiited[, 1], model_ridge$fiited[, 1], col = "red", lwd = I(0.6))
segments(x0 = model_ridge$fiited[, 1], x1 = model_ridge$fiited[, 1], y0 = mtcars$qsec, y1 = model_ridge
```

```
22
     20
mtcars$qsec
     8
     16
                     15
                                  16
                                               17
                                                           18
                                                                        19
                                                                                     20
                                           model_ridge$fiited[, 1]
cut_window <- function(data, history = 10, forward = 1) {</pre>
    rows <- nrow(data) - history - forward</pre>
    result_matrix <- matrix(nrow = rows, ncol = history + forward)</pre>
    for (index in 1:rows) {
        result_matrix[index, ] <- data[index:(index - 1 + history + forward), 1]</pre>
    }
    return(result_matrix)
}
his = 40
forwd = 5
data_X <- cut_window(data = as.matrix(ts.df$AAPL.Close), history = his, forward = forwd)</pre>
X <- cbind(1, data_X[,1:his])</pre>
Y <- data_X[,(his+1):(his + forwd)]
w = pracma::pinv(t(X) %*% X) %*% t(X) %*% Y
```

W

```
##
              [,1]
                         [,2]
                                [,3]
                                               [, 4]
                                                           [,5]
   [1,] 0.004733752 0.0103581346 0.018374788 0.025508615 0.0293432450
   [2,] 0.047410917 0.0780981051 0.124656056 0.085129471 0.1691224124
##
   [3,] -0.121224380 -0.1034509719 -0.120805637 -0.032415472 -0.1500155322
   [4,] 0.069956206 -0.0519605553 -0.032062210 -0.051854848 0.0302025740
   [5,] -0.059083511 0.0166504459 -0.096195643 -0.079183246 -0.0977328437
   [6,] 0.049638582 -0.0153528197 0.050063894 -0.059564364 -0.0399145390
   [7,] 0.005618950 0.0523991689 -0.017594916 0.050580830 -0.0612582440
##
  [8,] -0.008398499 -0.0002975257 0.050624625 -0.021607425 0.0488602401
  [9,] -0.018040067 -0.0294054276 -0.026873282 0.028310648 -0.0485794190
## [10,] 0.029492870 0.0127430341 0.003427688 0.002539006 0.0659764730
## [11,] 0.029654719 0.0617468181 0.052738341 0.039960726 0.0296347544
## [12,] 0.003481259 0.0334322870 0.066073307 0.056530401 0.0445439817
## [13,] 0.019036018 0.0185881326 0.041578980 0.077230855 0.0673511479
## [14,] -0.087314174 -0.0679161784 -0.070177234 -0.042887983 -0.0096085230
## [15,] 0.079975161 -0.0028704326 0.026861497 0.015532127 0.0489089881
## [17,] 0.008562191 -0.0030324156 0.070386997 -0.019736592 0.0177595127
## [18,] -0.039553669 -0.0315118597 -0.045117693 0.030998941 -0.0610145731
## [19,] 0.020723483 -0.0156154930 -0.001608569 -0.019939842 0.0618592966
## [20,] -0.024435594 -0.0027521210 -0.035219629 -0.019773005 -0.0539630576
## [21,] 0.096106917 0.0661922281 0.078738060 0.046174067 0.0710574076
## [22,] -0.115754005 -0.0144155032 -0.039804568 -0.027315727 -0.0498417629
## [23,] -0.065804871 -0.1836089846 -0.087117420 -0.106494839 -0.1016845836
## [24,] 0.157281711 0.0955228216 -0.008429023 0.076158003 0.0530599030
## [26,] 0.021555228 -0.0616870484 0.092037546 0.032977575 -0.0641766889
## [27,] -0.033598175 -0.0103225825 -0.091077497 0.062745872 0.0022094732
## [28,] 0.061249812 0.0273873964 0.051880192 -0.031888167 0.1237442558
## [29,] -0.091939876 -0.0312806950 -0.068229490 -0.037941912 -0.1281962487
## [30,] 0.040220126 -0.0511737752 0.010650620 -0.029429354 0.0079002877
## [31,] 0.026430668 0.0669929948 -0.022592128 0.037629514 -0.0038593893
## [33,] 0.070267981 0.0437086850 0.067110516 0.102745110 0.0124021925
## [34,] -0.100663997 -0.0275052489 -0.051347547 -0.025499252 0.0075447661
## [35,] 0.080916867 -0.0234746234 0.044406310 0.019866481 0.0498214250
## [37,] 0.024728066 -0.0304757755 0.055127267 -0.057219169 0.0110883407
## [38,] 0.038461635 0.0624192922 0.007838016 0.092580423 -0.0244423061
## [40,] 0.009238145 -0.0221012902 0.012930358 0.032437496 -0.0261183519
## [41,] 0.979295149 0.9724471741 0.941875392 0.942449339 0.9664831624
```