Best-SubsetSelection.R

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2022-01-04

```
# Subset Selection Methods - Best Subset Selection.
library(ISLR)
names(Hitters)
                   "Hits"
## [1] "AtBat"
                                "HmRun"
                                            "Runs"
                                                        "RBI"
                                                                    "Walks"
## [7] "Years"
                   "CAtBat"
                                "CHits"
                                            "CHmRun"
                                                        "CRuns"
                                                                    "CRBI"
## [13] "CWalks"
                    "League"
                                "Division" "PutOuts"
                                                        "Assists"
                                                                    "Errors"
## [19] "Salary"
                   "NewLeague"
dim(Hitters)
## [1] 322 20
# Removing NA from Hitters
Hitters = na.omit(Hitters)
# Dimensions after removing NA.
dim(Hitters)
## [1] 263 20
# the Regsubsets function is part of the leaps library
library(leaps)
# calling regsubsets
regfit.full = regsubsets(Salary~.,Hitters)
summary(regfit.full)
## Subset selection object
## Call: regsubsets.formula(Salary ~ ., Hitters)
## 19 Variables (and intercept)
```

```
##
               Forced in Forced out
## AtBat
                   FALSE
                               FALSE
## Hits
                   FALSE
                               FALSE
                   FALSE
                               FALSE
## HmRun
## Runs
                   FALSE
                               FALSE
## RBI
                   FALSE
                               FALSE
## Walks
                   FALSE
                               FALSE
## Years
                   FALSE
                               FALSE
## CAtBat
                   FALSE
                               FALSE
## CHits
                   FALSE
                               FALSE
## CHmRun
                   FALSE
                               FALSE
## CRuns
                   FALSE
                               FALSE
## CRBI
                   FALSE
                               FALSE
## CWalks
                   FALSE
                               FALSE
                   FALSE
                               FALSE
## LeagueN
## DivisionW
                   FALSE
                               FALSE
## PutOuts
                   FALSE
                               FALSE
## Assists
                   FALSE
                               FALSE
## Errors
                   FALSE
                               FALSE
## NewLeagueN
                   FALSE
                               FALSE
## 1 subsets of each size up to 8
## Selection Algorithm: exhaustive
##
             AtBat Hits HmRun Runs RBI Walks Years CAtBat CHits CHmRun CRuns CRBI
     (1)""
                   11 11
                               11 11
                                    11 11 11 11
                                               11 11
                                                      11 11
                                                             11 11
                                                                                  "*"
## 1
                   "*"
                                      11
                                                                                  "*"
## 2 (1)""
     (1)""
                   "*"
                               11 11
                                    11 11
                                        11 11
                                                                                  "*"
     (1)""
## 4
                   "*"
                                                                                  "*"
## 5
      (1)"*"
                   "*"
                               11 11
                                               11 11
                                                                           . .
                                                                                  11 🕌 11
## 6
     (1)"*"
                                                                                  11 * 1
                                    " " "*"
                               11 11
     (1)""
                                                                                  11 11
## 7
      (1)"*"
                   "*"
                                    " " "*"
                                                                    11 * 11
                                                                           11 * 11
## 8
##
             CWalks LeagueN DivisionW PutOuts Assists Errors NewLeagueN
      (1)""
                             11 11
                                        11 11
## 1
     (1)""
                    11 11
                             11 11
                                        11 11
## 2
     (1)""
                             11 11
                    11 11
                                        "*"
## 3
     (1)""
                    11 11
                             "*"
                                        "*"
## 4
     (1)""
                    11 11
                             "*"
                                        "*"
## 5
## 6
     (1)""
                    11 11
                             "*"
                                        "*"
      (1)""
                    11 11
                             "*"
                                        "*"
## 7
                             "*"
                                        "*"
## 8 (1) "*"
```

summary(regfit.full)\$which

```
##
     (Intercept) AtBat Hits HmRun Runs
                                        RBI Walks Years CAtBat CHits CHmRun
## 1
           TRUE FALSE FALSE FALSE FALSE FALSE FALSE FALSE
                                                                    FALSE
## 2
           TRUE FALSE
                      TRUE FALSE FALSE FALSE FALSE
                                                       FALSE FALSE
                                                                    FALSE
## 3
           TRUE FALSE
                      TRUE FALSE FALSE FALSE FALSE
                                                        FALSE FALSE
                                                                    FALSE
                      TRUE FALSE FALSE FALSE FALSE
## 4
           TRUE FALSE
                                                        FALSE FALSE
                                                                    FALSE
## 5
           TRUE
                TRUE
                      TRUE FALSE FALSE FALSE FALSE
                                                        FALSE FALSE
                      TRUE FALSE FALSE TRUE FALSE
## 6
           TRUE
                TRUE
                                                        FALSE FALSE
                                                                    FALSE
## 7
           TRUE FALSE
                      TRUE FALSE FALSE FALSE
                                             TRUE FALSE
                                                         TRUE
                                                              TRUE
                                                                     TRUE
## 8
           TRUE
               TRUE
                     TRUE FALSE FALSE FALSE TRUE FALSE FALSE
                                                                     TRUE
           CRBI CWalks LeagueN DivisionW PutOuts Assists Errors NewLeagueN
    CRuns
## 1 FALSE TRUE FALSE
                        FALSE
                                 FALSE
                                         FALSE
                                                FALSE FALSE
                                                                 FALSE
```

```
## 2 FALSE
            TRUE FALSE
                          FALSE
                                     FALSE
                                             FALSE
                                                     FALSE FALSE
                                                                        FALSE
## 3 FALSE
            TRUE
                  FALSE
                                                     FALSE FALSE
                                                                        FALSE
                          FALSE
                                     FALSE
                                              TRUE
## 4 FALSE
            TRUE
                  FALSE
                          FALSE
                                      TRUE
                                              TRUE
                                                     FALSE FALSE
                                                                        FALSE
## 5 FALSE
            TRUE
                  FALSE
                          FALSE
                                      TRUE
                                              TRUE
                                                     FALSE FALSE
                                                                        FALSE
## 6 FALSE
            TRUE
                  FALSE
                          FALSE
                                      TRUE
                                              TRUE
                                                     FALSE
                                                            FALSE
                                                                        FALSE
                                      TRUE
## 7 FALSE FALSE
                  FALSE
                          FALSE
                                              TRUE
                                                     FALSE FALSE
                                                                        FALSE
     TRUE FALSE
## 8
                   TRUE
                          FALSE
                                      TRUE
                                              TRUE
                                                     FALSE FALSE
                                                                        FALSE
```

summary(regfit.full)\$rss

[1] 36179679 30646560 29249297 27970852 27149899 26194904 25906548 25136930

```
# Set number of variables to 19
regfit.full19 = regsubsets(Salary~.,data=Hitters,nvmax=19)
regfit.full19.summary = summary(regfit.full19)
regfit.full19.summary$which
```

```
##
      (Intercept) AtBat
                        Hits HmRun Runs
                                            RBI Walks Years CAtBat CHits CHmRun
## 1
             TRUE FALSE FALSE FALSE FALSE FALSE FALSE
                                                             FALSE FALSE
                                                                          FALSE
## 2
             TRUE FALSE
                        TRUE FALSE FALSE FALSE FALSE
                                                             FALSE FALSE
                                                                          FALSE
## 3
             TRUE FALSE
                       TRUE FALSE FALSE FALSE FALSE
                                                             FALSE FALSE
                                                                          FALSE
## 4
             TRUE FALSE
                        TRUE FALSE FALSE FALSE FALSE
                                                             FALSE FALSE
                                                                          FALSE
             TRUE
## 5
                  TRUE
                         TRUE FALSE FALSE FALSE FALSE
                                                             FALSE FALSE
                                                                          FALSE
## 6
             TRUE
                  TRUE
                        TRUE FALSE FALSE FALSE
                                                 TRUE FALSE
                                                             FALSE FALSE
                                                                          FALSE
## 7
             TRUE FALSE
                        TRUE FALSE FALSE FALSE
                                                 TRUE FALSE
                                                              TRUE
                                                                   TRUE
                                                                           TRUE
## 8
             TRUE
                  TRUE
                        TRUE FALSE FALSE FALSE
                                                 TRUE FALSE
                                                             FALSE FALSE
                                                                           TRUE
## 9
             TRUE
                   TRUE
                        TRUE FALSE FALSE FALSE
                                                 TRUE FALSE
                                                              TRUE FALSE
                                                                          FALSE
## 10
             TRUE
                  TRUE
                        TRUE FALSE FALSE FALSE
                                                 TRUE FALSE
                                                              TRUE FALSE
                                                                          FALSE
## 11
             TRUE
                   TRUE
                         TRUE FALSE FALSE FALSE
                                                 TRUE FALSE
                                                              TRUE FALSE
                                                                          FALSE
                   TRUE
## 12
             TRUE
                        TRUE FALSE
                                     TRUE FALSE
                                                 TRUE FALSE
                                                              TRUE FALSE
                                                                          FALSE
## 13
             TRUE
                   TRUE
                         TRUE FALSE
                                     TRUE FALSE
                                                 TRUE FALSE
                                                              TRUE FALSE
                                                                          FALSE
                  TRUE
                        TRUE TRUE
                                     TRUE FALSE
                                                              TRUE FALSE
## 14
             TRUE
                                                 TRUE FALSE
                                                                          FALSE
                        TRUE
                   TRUE
                              TRUE
                                     TRUE FALSE
## 15
             TRUE
                                                 TRUE FALSE
                                                              TRUE
                                                                    TRUE
                                                                          FALSE
             TRUE
                   TRUE
                         TRUE
                               TRUE
                                     TRUE
                                           TRUE
                                                 TRUE FALSE
                                                              TRUE
                                                                    TRUE
                                                                          FALSE
## 16
                  TRUE
                                     TRUE
## 17
             TRUE
                        TRUE
                               TRUE
                                           TRUE
                                                 TRUE FALSE
                                                              TRUE
                                                                    TRUE
                                                                          FALSE
## 18
             TRUE
                  TRUE
                         TRUE
                              TRUE
                                     TRUE
                                           TRUE
                                                 TRUE
                                                       TRUE
                                                              TRUE
                                                                    TRUE
                                                                          FALSE
## 19
             TRUE TRUE
                         TRUE
                               TRUE
                                     TRUE
                                           TRUE
                                                 TRUE
                                                       TRUE
                                                              TRUE
                                                                    TRUE
                                                                            TRUE
            CRBI CWalks LeagueN DivisionW PutOuts Assists Errors NewLeagueN
##
      CRuns
## 1
     FALSE
            TRUE FALSE
                           FALSE
                                     FALSE
                                             FALSE
                                                     FALSE
                                                           FALSE
                                                                       FALSE
     FALSE
            TRUE FALSE
##
  2
                           FALSE
                                     FALSE
                                             FALSE
                                                     FALSE FALSE
                                                                       FALSE
## 3
     FALSE
            TRUE FALSE
                                              TRUE
                                                     FALSE FALSE
                                                                       FALSE
                           FALSE
                                     FALSE
## 4
     FALSE
            TRUE
                  FALSE
                           FALSE
                                      TRUE
                                              TRUE
                                                     FALSE
                                                            FALSE
                                                                       FALSE
     FALSE
                  FALSE
## 5
            TRUE
                           FALSE
                                      TRUE
                                              TRUE
                                                     FALSE FALSE
                                                                       FALSE
## 6
     FALSE
            TRUE
                  FALSE
                           FALSE
                                      TRUE
                                              TRUE
                                                     FALSE
                                                            FALSE
                                                                       FALSE
## 7
     FALSE FALSE
                                                     FALSE FALSE
                  FALSE
                           FALSE
                                      TRUE
                                              TRUE
                                                                       FALSE
## 8
       TRUE FALSE
                    TRUE
                           FALSE
                                      TRUE
                                              TRUE
                                                     FALSE
                                                            FALSE
                                                                       FALSE
## 9
       TRUE
            TRUE
                    TRUE
                           FALSE
                                      TRUE
                                              TRUE
                                                     FALSE FALSE
                                                                       FALSE
      TRUE
            TRUE
                    TRUE
                           FALSE
                                      TRUE
                                              TRUE
                                                      TRUE FALSE
## 10
                                                                       FALSE
      TRUE
            TRUE
                    TRUE
                                      TRUE
                                              TRUE
                                                      TRUE FALSE
## 11
                            TRUE
                                                                       FALSE
```

```
## 12 TRUE TRUE
                   TRUE
                           TRUE
                                    TRUE
                                                    TRUE FALSE
                                                                     FALSE
                                            TRUE
                           TRUE
## 13 TRUE TRUE
                   TRUE
                                    TRUE
                                            TRUE
                                                    TRUE
                                                           TRUE
                                                                     FALSE
## 14 TRUE TRUE
                   TRUE
                           TRUE
                                    TRUE
                                                    TRUE
                                                           TRUE
                                                                     FALSE
                                            TRUE
## 15 TRUE TRUE
                   TRUE
                           TRUE
                                    TRUE
                                            TRUE
                                                    TRUE
                                                           TRUE
                                                                     FALSE
## 16
      TRUE TRUE
                   TRUE
                           TRUE
                                    TRUE
                                            TRUE
                                                    TRUE
                                                           TRUE
                                                                     FALSE
## 17
     TRUE TRUE
                   TRUE
                           TRUE
                                    TRUE
                                            TRUE
                                                    TRUE
                                                           TRUE
                                                                      TRUE
## 18 TRUE TRUE
                   TRUE
                           TRUE
                                    TRUE
                                            TRUE
                                                    TRUE
                                                           TRUE
                                                                      TRUE
## 19 TRUE TRUE
                                                                      TRUE
                   TRUE
                           TRUE
                                    TRUE
                                            TRUE
                                                    TRUE
                                                           TRUE
```

regfit.full19.summary\$rss

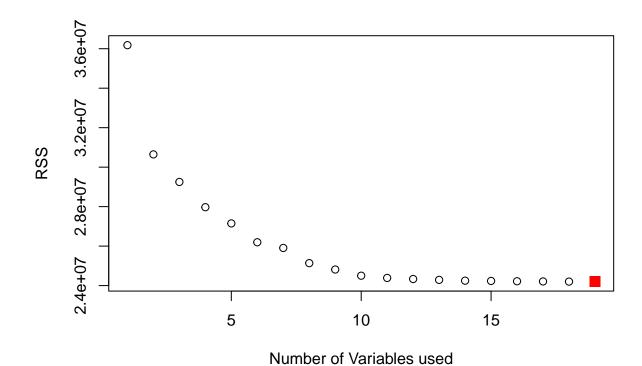
[1] 36179679 30646560 29249297 27970852 27149899 26194904 25906548 25136930 ## [9] 24814051 24500402 24387345 24333232 24289148 24248660 24235177 24219377

plot(regfit.full19.summary\$rss, xlab = "Number of Variables used",ylab="RSS") +

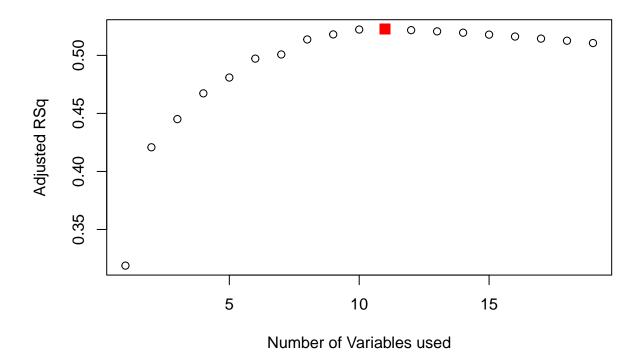
[17] 24209447 24201837 24200700

```
AtBat Hits HmRun Runs RBI Walks Years CAtBat CHits CHmRun CRuns CRBI CWalks LeagueN Division
# 1 (1)
                                     II II II II II II
                                                        11 11
                                                                          11 11
                                                                                                  "*"
                                                                 11 11
                                                                          11 11
                                                                                 11 11
                             11 11
                                     11 11
                                                                                           11 11
                                                                                                   "*"
                                                                                                         11 11
                                                                                                                            11 11
#2 (1)
                                     II II
                                            H = H = H = H
                                                         11 11
                                                                          11 11
                                                                                 II II
                                                                                           11 11
                                                                                                                  11 11
                                                                                                                            II II
#3 (1)
               11 11
                       11 * 11
                             11 11
                                                                                                   11 * 11
#4 (1)
                              11 11
                                     11 11
                                            H H H H
                                                         11 11
                                                                 11 11
                                                                          11 11
                                                                                 11 11
                                                                                           11 11
                                                                                                   11 * 11
                                                                                                                  11 11
               "*"
                              11 11
                                     11 11
                                            H = H = H = H
                                                         11 11
                                                                 11 11
                                                                          11 11
                                                                                 11 11
                                                                                           11 11
                                                                                                   11 4 11
                                                                                                         11 11
                                                                                                                  11 11
#5 (1)
#6 (1)
               "*"
                                     11 11
                                            11 11 11*11
                                                         H = H
                                                                 H = H
                                                                          H = H
                                                                                 H = H
                                                                                           11 11
               H = H
                       "*"
                             11 11
                                     11 11
                                           11 11 11<sub>*</sub>11
                                                         11 11
                                                                          "*"
                                                                                 "*"
                                                                                           11 11
                                                                                                   11 11
                                                                                                         11 11
                                                                                                                  11
                                                                                                                            "*"
#7 (1)
                                                                 "*"
                             11 11
                                     H = H
                                           11 11 11<sub>*</sub>11
                                                         H = H
                                                                 H = H
                                                                          H = H
                                                                                 "*"
                                                                                           "*"
                                                                                                                  11 11
#8 (1)
               "*"
                                                                                                                            "*"
# We can see in #7 instance , CRBI is not choosen even though it was choosen from #1 to #6
# plotting Values
```

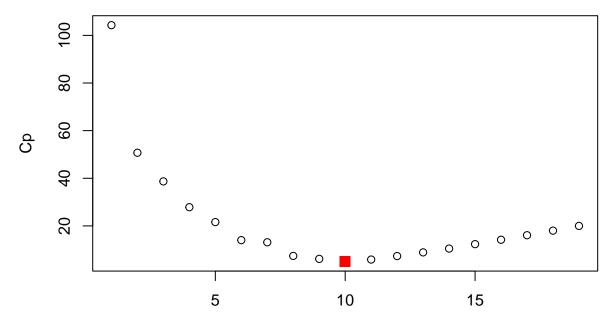
points(which.min(regfit.full19.summary\$rss),min(regfit.full19.summary\$rss),col="red",cex=1.5,pch=15)



```
plot(regfit.full19.summary$adjr2, xlab = "Number of Variables used",ylab="Adjusted RSq") +
points(which.max(regfit.full19.summary$adjr2),max(regfit.full19.summary$adjr2),col="red",cex=1.5,pch=15
```



```
plot(regfit.full19.summary$cp, xlab = "Number of Variables used",ylab="Cp") +
points(which.min(regfit.full19.summary$cp),min(regfit.full19.summary$cp),col="red",cex=1.5,pch=15)
```



Number of Variables used

```
plot(regfit.full19.summary$bic, xlab = "Number of Variables used",ylab="Cp") +
points(which.min(regfit.full19.summary$bic),min(regfit.full19.summary$bic),col="red",cex=1.5,pch=15)
```

