# SubsetSelectionForward-Backward.R

### vijaykalmath

#### 2022-01-04

```
# Subset Selection using Forward and Backware Stepwise Selection.
library(ISLR)
names(Hitters)
## [1] "AtBat"
                   "Hits"
                               "HmRun"
                                           "Runs"
                                                       "RBI"
                                                                   "Walks"
## [7] "Years"
                   "CAtBat"
                               "CHits"
                                           "CHmRun"
                                                       "CRuns"
                                                                   "CRBI"
## [13] "CWalks"
                               "Division" "PutOuts" "Assists"
                   "League"
                                                                   "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 with forward method
regfit.fwd = regsubsets(Salary~.,Hitters,nvmax=19,method="forward")
regfit.fwd.summary = summary(regfit.fwd)
regfit.fwd.summary$which
```

TRUE FALSE FALSE FALSE FALSE FALSE FALSE FALSE FALSE

RBI Walks Years CAtBat CHits CHmRun

(Intercept) AtBat Hits HmRun Runs

##

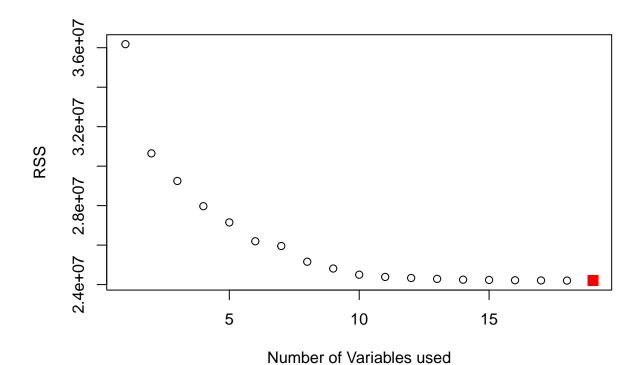
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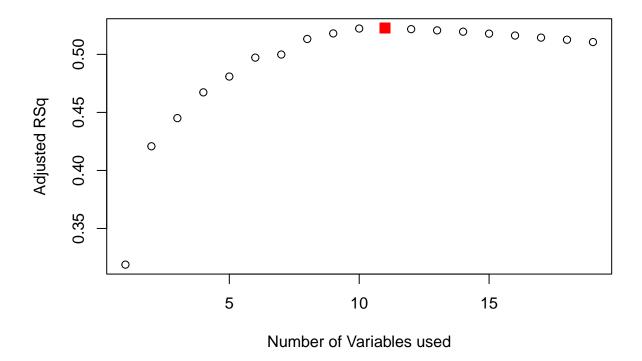
#### regfit.fwd.summary\$rss

```
## [1] 36179679 30646560 29249297 27970852 27149899 26194904 25954217 25159234
## [9] 24814051 24500402 24387345 24333232 24289148 24248660 24235177 24219377
## [17] 24209447 24201837 24200700
```

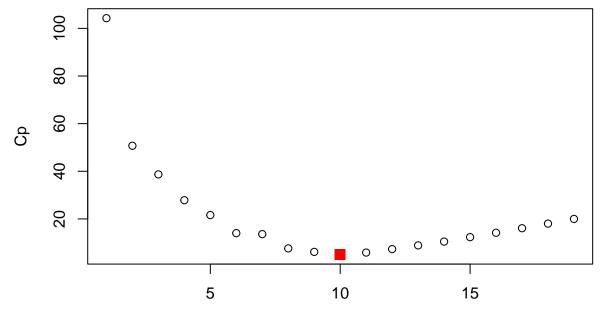
```
plot(regfit.fwd.summary$rss, xlab = "Number of Variables used",ylab="RSS") +
points(which.min(regfit.fwd.summary$rss),min(regfit.fwd.summary$rss),col="red",cex=1.5,pch=15)
```



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

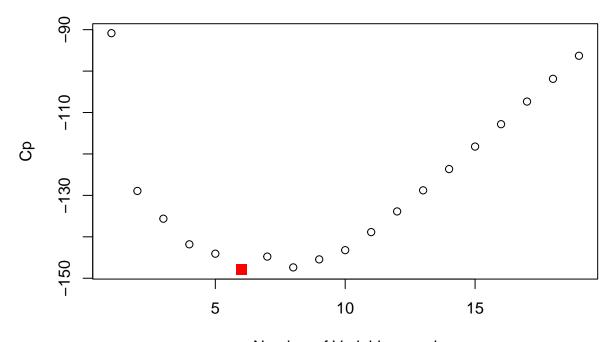


```
plot(regfit.fwd.summary$cp, xlab = "Number of Variables used",ylab="Cp") +
points(which.min(regfit.fwd.summary$cp),min(regfit.fwd.summary$cp),col="red",cex=1.5,pch=15)
```



Number of Variables used

plot(regfit.fwd.summary\$bic, xlab = "Number of Variables used",ylab="Cp") + points(which.min(regfit.fwd



Number of Variables used

```
# Backward Selection

regfit.bckwd = regsubsets(Salary~.,Hitters,nvmax=19,method="backward")

regfit.bckwd.summary = summary(regfit.bckwd)

regfit.bckwd.summary$which
```

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##
      (Intercept) AtBat Hits HmRun Runs
                                            RBI Walks Years CAtBat CHits CHmRun
## 1
            TRUE FALSE FALSE FALSE FALSE FALSE FALSE
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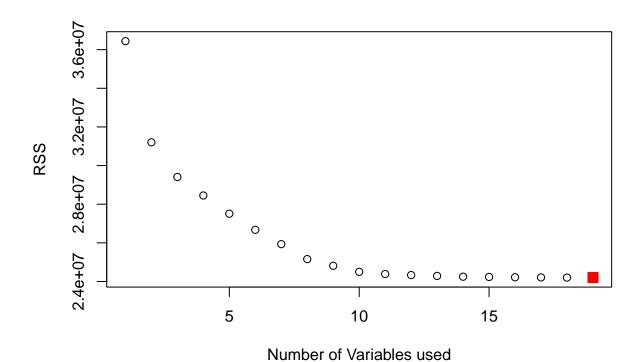
```
regfit.bckwd.summary$rss
```

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

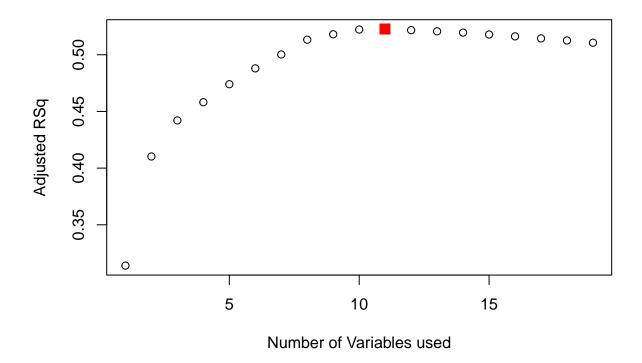
<sup>## [1] 36437951 31203460 29407297 28450807 27509524 26674092 25933487 25159234</sup> 

<sup>## [9] 24814051 24500402 24387345 24333232 24289148 24248660 24235177 24219377</sup> 

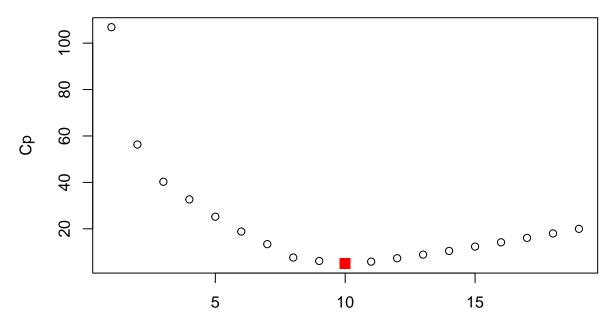
<sup>## [17] 24209447 24201837 24200700</sup> 



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

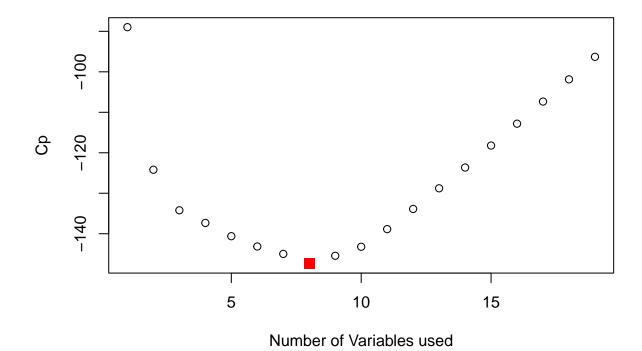


```
plot(regfit.bckwd.summary$cp, xlab = "Number of Variables used",ylab="Cp") +
   points(which.min(regfit.bckwd.summary$cp),min(regfit.bckwd.summary$cp),col="red",cex=1.5,pch=15)
```



Number of Variables used

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



## integer(0)