## Random-Forest-Carseats-sales.R.

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```
library(ISLR)
## Warning: package 'ISLR' was built under R version 4.0.2
data("Carseats")
Data<- Carseats[sample(nrow(Carseats)),]</pre>
attach(Data)
# We introduce the variable High to solve a classification problem as opposed to a regression problem
High <- as.factor(ifelse(Sales >= 8, "YES", "No"))
Data <- data.frame(Data, High)</pre>
Data <- Data[,-1]</pre>
colnames(Data)[11] <- "Target"</pre>
# Random Forest Model
library(randomForest)
## Warning: package 'randomForest' was built under R version 4.0.2
## randomForest 4.6-14
## Type rfNews() to see new features/changes/bug fixes.
rf <- randomForest(Target ~ ., data = Data, mtry = sqrt(ncol(Data) - 1), ntree = 300, proximity = T, im
##
## randomForest(formula = Target ~ ., data = Data, mtry = sqrt(ncol(Data) - 1), ntree = 300, prox
##
                  Type of random forest: classification
                        Number of trees: 300
##
## No. of variables tried at each split: 3
##
##
           OOB estimate of error rate: 19.75%
## Confusion matrix:
       No YES class.error
## No 209 27
                0.1144068
## YES 52 112 0.3170732
importance(rf, type = 2)
               MeanDecreaseGini
## CompPrice
                      22.320119
## Income
                     19.820320
## Advertising
                     23.587966
                     15.477340
## Population
```

```
## Price 43.356971
## ShelveLoc 29.652303
## Age 22.827596
## Education 10.263366
## Urban 2.361034
## US 3.249562
```

# #rf\$proximity rf\$predicted

```
## 207 145 264 191 294 374 302
                                  8 163 242 250 230
                                                      86 328 396 221 185
                                                                           35 188 241
    No YES
           No YES YES
                        No YES YES
                                     No YES
                                              No YES
                                                      No
                                                          No YES YES
                                                                       No
                                                                           No
                                                                               No YES
        70 228 388
                    91 134 368 142 168 298 299
                                                 321 222
                                                          13 292 123 179 194 339
  YES
                         No YES
                                                          No YES
                                                                   No YES YES
        No
            No
                No
                    No
                                 No
                                     No
                                         No
                                              No
                                                  No
                                                      No
                                                                               No
   281
        25
           385
               220
                   394 270 240
                                 58
                                      63
                                          53
                                             341 128 218 323 105 136
                                                                      387
                                                                          183 283
                                                  No
##
    No YES YES YES
                    No
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                                 No
                                     No
                                         No YES
                                                      No YES
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                                                                                    No
                                                   3 320 212
   231 364 219 146
                         67
                             99
                                202
                                     72 200
                                             130
                                                                  126
##
    No YES YES YES
                    No
                         No YES
                                 No
                                     No
                                         No
                                              No YES
                                                      No YES YES
                                                                  YES
                                                                           No
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                                                                                No
                                                                                    No
                                    192
                                         225
                                               9
                                                 356 332 143
       390
            61 290 389
                        338 160
                                 19
                                                               27
                                                                  398
                                                                       66
                                                                            84
                                                                                17
                                                                                    12
    No
        No YES
                No YES
                             No YES YES
                                         No
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                                                                           No
                                                                                   YES
                         No
                                              No
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                                                                       No
                                                                                No
   344 187 166 318 254
                         46 274 162 251
                                         64 215 155 119 131 100 329
                                                                       28
                                                                             5 373
    No YES
            No
                No
                    No
                         No YES
                                 No
                                     No YES
                                             No YES
                                                      No YES
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                                                                           No
                                                                                No
  278 282
            74 289 331 261
                             11
                                 65 171
                                          44 348 253 118 367 210 359
                                                                      102 125
                                                                                50 379
   YES YES YES
                    No YES
                            No YES
                                         No YES
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                Nο
                                     No
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    97 288 208 153 262 137 380 129 205 127 138 276 135
                                                           78
                                                               29 350 386 336 109
            No YES
  YES
        No
                    No
                        No
                             No
                                 No YES YES
                                             No
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                                                      No YES
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                                                                           No
                                                                               No
                                                                                  YES
   246 248 305 149 308 256 372 111
                                     88 361
                                              57 358 108 334 159 355 175 199 237
                                                                                   214
        No YES
                No
                    No YES
                            No YES YES YES YES YES
                                                      No
                                                          No YES
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                                                                           No YES
                79 107 243 252 201 354
    85 378 244
                                         36 371
                                                   6
                                                      32 184
                                                               38 275
                                                                       20 158 195 303
            No
                No
                    No
                        No
                             No
                                 No YES YES YES
                                                 YES
                                                      No
                                                          No
                                                               No YES
                                                                       No YES YES
        No
            71 345 209 139 392 287 342
                                          10 234 189 269 116 267
##
   176 284
                                                                   52 349
                                                                            69
                                                                              178
                                                      No
        No YES
                No YES YES
                             No
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                                     No
                                          No
                                             YES
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   141 326 266 340 197 203 152 311 277 391 148
                                                  82
                                                      18
                                                           26 271 110 133
                                                                           98
                                                                                  312
    No YES
            No YES
                            YES
                                 No
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                                             YES
                                                  No YES YES
                                                             YES YES
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                                                                                No
                                     93 144
   140 204 319 291 245 224 295 399
                                             317 301 260
                                                          31
                                                               94 196 190 286
                                                                              101
        No YES YES
                    No
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                            YES
                                 No
                                     No
                                          No
                                             YES
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                                  4 258
                                             232
  310 307 198 154
                     56 315
                             30
                                          48
                                                  16 393 280 343
                                                                   87 170
                                                                          322
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   YES
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   115 357 233
                22 104 124 236
                                259 313 174
                                              51 122 384 265 120 327 353 235
        No
           YES YES
                    No
                         No
                             No
                                 No
                                     No
                                         No
                                              No YES
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                                                                          YES
                                                                                    No
    62 383 351 132
                    14 381
                             90
                                 60 186
                                         39 309 365 157 366
                                                               81 172 164 227
                                                                               362
                                                                                   304
    No
        No YES
                No YES
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                         75
                             49 335 369 113 103 273
                                                                       33 114
  223 112
            59 377
                   169
                                                      54
                                                           89
                                                               77 297
                                                          No YES YES YES
    No
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            No YES
                    No
                         No
                             No YES YES YES
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   161 257 337 239 173
                        325 296
                                 40
                                       7
                                         41
                                              45 156 324 395 226 306 249 370 285
                                                                                   217
                                 No
                                         No
                                              No YES YES
##
    No
        No
            No
                No YES
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                             No
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                                                                       No YES
                                                                                No
                                                                                    No
   182 263 330 300 376
                         23 268
                                363 180 165 121 347 216 314 397 382
                                                                       96
                                                                          167
                                                                                   213
                                                                           No YES YES
        No YES YES
                    No
                         No
                             No
                                 No
                                     No
                                         No
                                              No
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                                                                       No
   247 360
            37
                83 293 211
                             15
                                375 181 150 229 151 352
                                                           68 206 117
                                                                        2 106
                                                                                21 193
      No YES YES YES No YES
                                 No
                                    No YES No YES YES YES
                                                              No
                                                                  No YES
                                                                           No
## Levels: No YES
```

#### #rf\$votes

library(ROCR)

```
## Warning: package 'ROCR' was built under R version 4.0.2
score <- rf$votes[, 2]</pre>
pred <- prediction(score, Data$Target)</pre>
perf <- performance(pred, "tpr", "fpr")</pre>
plot(perf)
       0.8
 True positive rate
       9.0
       0.4
       0.2
       0.0
              0.0
                              0.2
                                              0.4
                                                              0.6
                                                                              8.0
                                                                                              1.0
                                             False positive rate
# How to find the best cut-off point in ROC curve
```

```
# How to find the best cut-off point in ROC curve
# The performance() function for ROC curve returns
# tpr, fpr and alpha-values (cut-off points). We need
# to write a function that receives these information and
# returns the best cut-off point
# Hence the input argument to the following function is perf

opt.cut <- function(perf){
    # mapply function applies the function FUN to all perf@x.values, perf@y.values,perf@alpha.values
    cut.ind <- mapply(FUN = function(x,y,p){d=(x-0)^2+(y-1)^2 # We compute the distance of all the points
    ind<- which(d==min(d)) # We find the index of the point that is closest to the corner
    c(recall = y[[ind]], specificity = 1-x[[ind]],cutoff = p[[ind]])},perf@x.values, perf@y.values,perf@a
}

BestcutOffPoint <- opt.cut(perf)
BestcutOffPoint

[,1]</pre>
```

0.7926829

## recall

## cutoff

## specificity 0.8347458