# **Curso Livre II**

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# Modulo III

# Carregamento dos packages:

```
install.packages('mlr')
install.packages('mlbench')
install.packages('rpart.plot')
library(mlr)
library(mlbench)
library(rpart.plot)
```

#### Tarefa:

1. Obtenha um conjunto de dados de câncer de mama usando os seguintes comandos (precisa instalar o pacote mlbench):

```
data(BreastCancer, package = "mlbench")
df = BreastCancer
df$Id = NULL
cl = df$Class
indx = sapply(df, is.factor)
df[indx] = lapply(df[indx], function(x) as.numeric(as.character(x)))
df$Class = cl
df$Bare.nuclei = NULL
```

2. Com os dados carregados, separe-os em conjunto de treinamento e de teste e use a biblioteca mlr como vimos:

```
set.seed(0)
trein_index <- sample(1:nrow(df), 0.8 * nrow(df))
test_index <- setdiff(1:nrow(df), trein_index)
trein <- df[trein_index,]
test <- df[test_index,]</pre>
```

3. Crie a tarefa de classificação (a variável alvo é "Class")

```
> taskclf <- makeClassifTask(data=trein, target = 'Class', positive =
'benign')</pre>
```

4. Treine os modelos que vimos na primeira aula (e outros, se desejar)

#### **Decision Tree Classifier**

```
> tree <- makeLearner('classif.rpart', predict.type = 'prob')
> tree_trein <- train(learner = tree, task = taskclf)
> rpart.plot(tree_trein$learner.model, roundint = F)
```

### **K-Nearest Neighbors (KNN)**

```
> knn <- makeLearner('classif.knn')
> knn_trein <- train(learner = knn, task = taskclf)</pre>
```

# **Logistic Regression**

```
> reg_log <- makeLearner('classif.logreg', predict.type = 'prob')
> reg_log_trein <- train(learner = reg_log, task = taskclf)</pre>
```

5. Avalie os modelos treinados usando o conjunto de teste e veja qual teve melhor desempenho

Decision Tree Classifier

```
> tree_predict <- predict(tree_trein, newdata = test)</pre>
> calculateROCMeasures(tree_predict)
           predicted
true
            benign
                      malignant
                      4
                                tpr: 0.96 fnr: 0.04
  benign
            96
  malignant 5
                      35
                               fpr: 0.12 tnr: 0.88
            ppv: 0.95 for: 0.1 lrp: 7.68 acc: 0.94
            fdr: 0.05 npv: 0.9 lrm: 0.05 dor: 168
Abbreviations:
tpr - True positive rate (Sensitivity, Recall)
fpr - False positive rate (Fall-out)
fnr - False negative rate (Miss rate)
tnr - True negative rate (Specificity)
ppv - Positive predictive value (Precision)
for - False omission rate
lrp - Positive likelihood ratio (LR+)
fdr - False discovery rate
npv - Negative predictive value
acc - Accuracy
lrm - Negative likelihood ratio (LR-)
dor - Diagnostic odds ratio
```

ppv (Precision): 0.95

tpr (Recall): 0.96

acc (Acuracy): 0.94

# **K-Nearest Neighbors (KNN)**

```
> knn_predict <- predict(knn_trein, newdata = test)</pre>
> calculateROCMeasures(knn predict)
           predicted
true
            benign
                      malignant
  benign
                      2
                                tpr: 0.98 fnr: 0.02
                      35
  malignant 5
                               fpr: 0.12 tnr: 0.88
            ppv: 0.95 for: 0.05 lrp: 7.84 acc: 0.95
            fdr: 0.05 npv: 0.95 lrm: 0.02 dor: 343
Abbreviations:
tpr - True positive rate (Sensitivity, Recall)
fpr - False positive rate (Fall-out)
fnr - False negative rate (Miss rate)
tnr - True negative rate (Specificity)
ppv - Positive predictive value (Precision)
for - False omission rate
lrp - Positive likelihood ratio (LR+)
fdr - False discovery rate
npv - Negative predictive value
acc - Accuracy
lrm - Negative likelihood ratio (LR-)
dor - Diagnostic odds ratio
> calculateConfusionMatrix(knn_predict)
           predicted
            benign malignant -err.-
true
  benign
                98
                          2
                                  5
                5
                          35
  malignant
                 5
                                  7
                           2
  -err.-
```

ppv (Precision): 0.95

tpr (Recall): 0.98

acc (Acuracy): 0.95

# **Logistic Regression**

```
> reg_log_predict <- predict(reg_log_trein, newdata = test)</pre>
> calculateROCMeasures(reg_log_predict)
          predicted
true
           benign
                     malignant
 benign
           100
                     0
                              tpr: 1 fnr: 0
 malignant 9
                     31
                             fpr: 0.22 tnr: 0.78
           Abbreviations:
tpr - True positive rate (Sensitivity, Recall)
fpr - False positive rate (Fall-out)
fnr - False negative rate (Miss rate)
tnr - True negative rate (Specificity)
ppv - Positive predictive value (Precision)
for - False omission rate
lrp - Positive likelihood ratio (LR+)
fdr - False discovery rate
npv - Negative predictive value
acc - Accuracy
lrm - Negative likelihood ratio (LR-)
dor - Diagnostic odds ratio
> calculateConfusionMatrix(reg_log_predict)
          predicted
true
           benign malignant -err.-
 benign
              100
                        0
                9
                         31
                                9
 malignant
                9
                        0
                                9
  -err.-
```

ppv (Precision): 0.92

tpr (Recall): 1

acc (Acuracy): 0.94

#### Todos:

Modelo\medida	ppv	tpr	acc
DecisionTree	0.95	0.96	0.94
KNN	0.95	0.98	0.95
LogisticReg	0.92	1	0.94