

# Regressão Logística

## Carregar Dados

```
TEBA <- read_excel("TEBA.xlsx")
```

## Separar em treino e teste

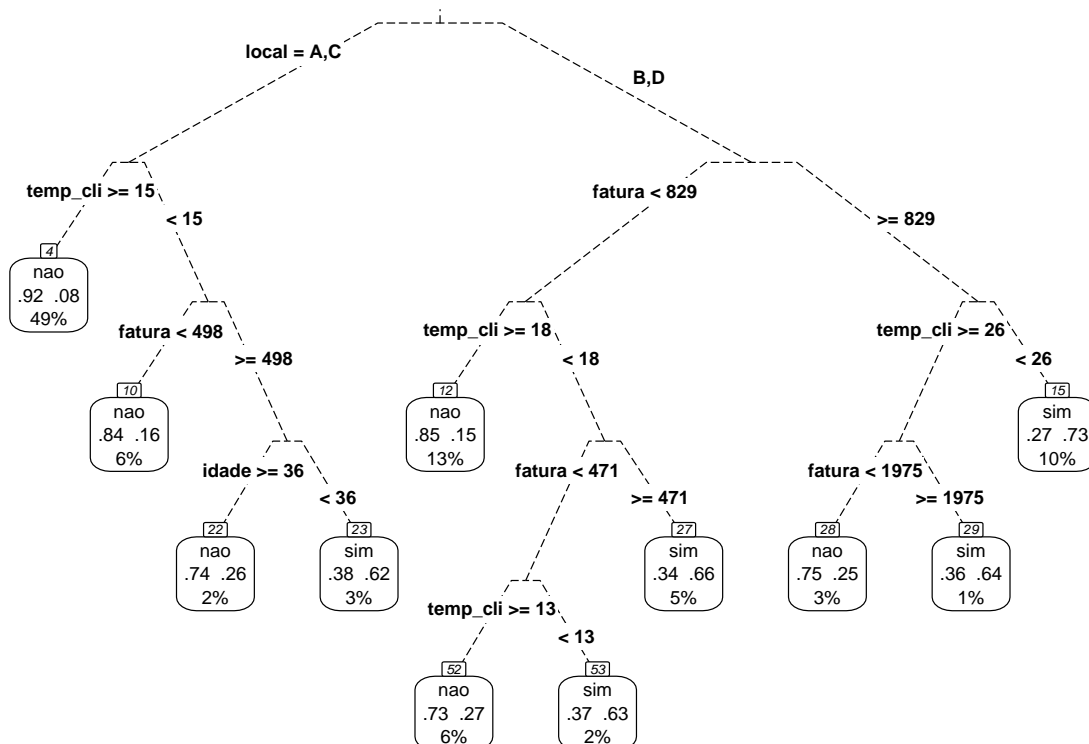
```
set.seed(1234)
index=sample(1:2000,1200)

teba.learn=TEBA[index,]
teba.test=TEBA[-index,]
```

## Criar arvore

```
library(rpart)
library(rpart.plot)

set.seed(93)
ad1=rpart(data=teba.learn, cancel~idade+linhas+temp_cli+renda+fatura+temp_rsd+local+tvocabo+debaut, method="logistic",
prp(ad1, type=3, extra=104, nn=T, fallen.leaves = F, branch.lty = 5)
```

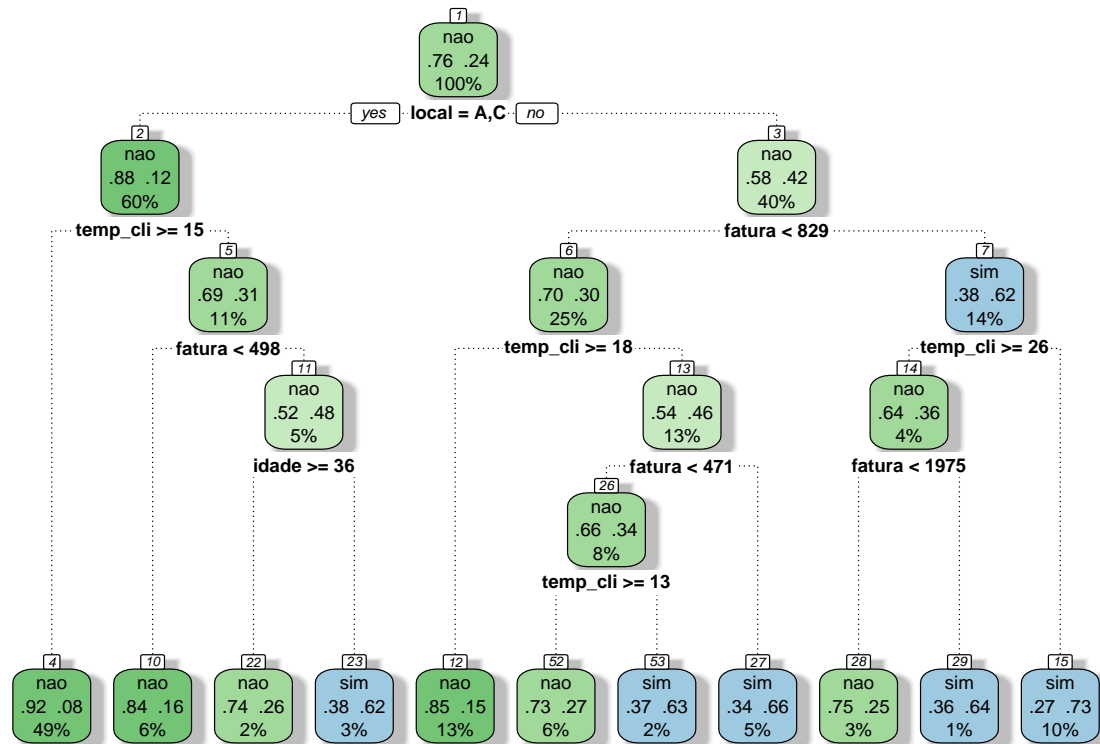


## Visualizacao alternativa

```
library(RColorBrewer)
library(rattle)
```

```
## Rattle: A free graphical interface for data science with R.
## Version 5.2.0 Copyright (c) 2006-2018 Togaware Pty Ltd.
## Type 'rattle()' to shake, rattle, and roll your data.
```

```
fancyRpartPlot(ad1)
```



Rattle 2019-Oct-06 22:03:48 rstudio-user

## Saida crua da arvare

```
ad1
```

```
## n= 1200
##
## node), split, n, loss, yval, (yprob)
##      * denotes terminal node
##
## 1) root 1200 288 nao (0.76000000 0.24000000)
##    2) local=A,C 726 89 nao (0.87741047 0.12258953)
##      4) temp_cli>=14.5 590 47 nao (0.92033898 0.07966102) *
##      5) temp_cli< 14.5 136 42 nao (0.69117647 0.30882353)
##        10) fatura< 497.5 74 12 nao (0.83783784 0.16216216) *
##        11) fatura>=497.5 62 30 nao (0.51612903 0.48387097)
```

```
##      22) idade>=35.5 23    6 nao (0.73913043 0.26086957) *
##      23) idade< 35.5 39   15 sim (0.38461538 0.61538462) *
##    3) local=B,D 474 199 nao (0.58016878 0.41983122)
##      6) fatura< 829 302  92 nao (0.69536424 0.30463576)
##     12) temp_cli>=17.5 151  22 nao (0.85430464 0.14569536) *
##     13) temp_cli< 17.5 151  70 nao (0.53642384 0.46357616)
##     26) fatura< 471 93   32 nao (0.65591398 0.34408602)
##     52) temp_cli>=12.5 74   20 nao (0.72972973 0.27027027) *
##     53) temp_cli< 12.5 19    7 sim (0.36842105 0.63157895) *
##     27) fatura>=471 58   20 sim (0.34482759 0.65517241) *
##    7) fatura>=829 172   65 sim (0.37790698 0.62209302)
##     14) temp_cli>=25.5 50   18 nao (0.64000000 0.36000000)
##     28) fatura< 1975 36    9 nao (0.75000000 0.25000000) *
##     29) fatura>=1975 14    5 sim (0.35714286 0.64285714) *
##     15) temp_cli< 25.5 122  33 sim (0.27049180 0.72950820) *
```

## Classificar individuos da porcao de treino

```
teba.learn$pred.lrn.class=predict(ad1, newdata = teba.learn, type = "class")
table(teba.learn$cancel,teba.learn$pred.lrn.class)
```

```
##
##      nao sim
##    nao 832  80
##    sim 116 172
```

## Analisar a necessidade de podar

É necessario podar quando há decrescimo no valor de error

```
printcp(ad1)
```

```
##
## Classification tree:
## rpart(formula = cancel ~ idade + linhas + temp_cli + renda +
##       fatura + temp_rsd + local + tvcabo + debaut, data = teba.learn,
##       method = "class")
##
## Variables actually used in tree construction:
## [1] fatura  idade  local  temp_cli
##
## Root node error: 288/1200 = 0.24
##
## n= 1200
##
##      CP nsplit rel error  xerror    xstd
## 1 0.072917      0  1.00000 1.00000 0.051370
## 2 0.048611      2  0.85417 0.89931 0.049484
## 3 0.031250      3  0.80556 0.89236 0.049345
## 4 0.017361      5  0.74306 0.89583 0.049414
## 5 0.013889      6  0.72569 0.88542 0.049204
```

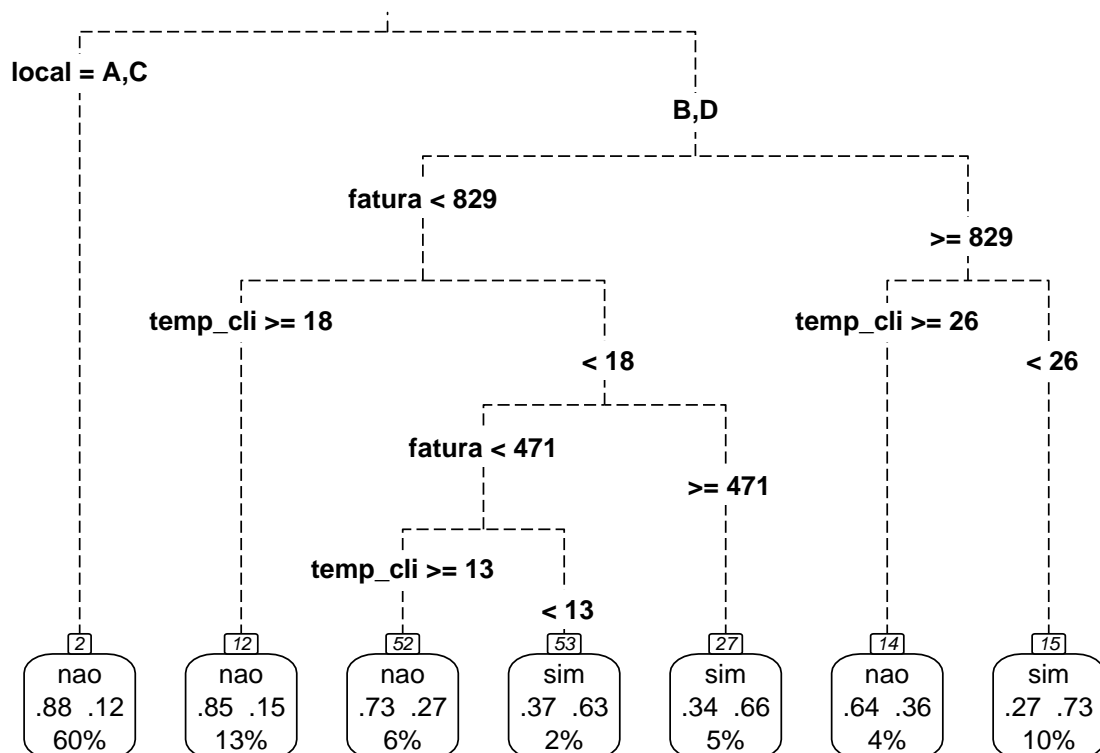
```
## 6 0.010417      7   0.71181 0.89236 0.049345
## 7 0.010000     10   0.68056 0.91319 0.049758
```

## Podar a arvore

```
ad2=prune(ad1,cp=0.015)
ad2
```

```
## n= 1200
##
## node), split, n, loss, yval, (yprob)
##      * denotes terminal node
##
## 1) root 1200 288 nao (0.7600000 0.2400000)
##    2) local=A,C 726  89 nao (0.8774105 0.1225895) *
##    3) local=B,D 474 199 nao (0.5801688 0.4198312)
##      6) fatura< 829 302  92 nao (0.6953642 0.3046358)
##        12) temp_cli>=17.5 151  22 nao (0.8543046 0.1456954) *
##        13) temp_cli< 17.5 151  70 nao (0.5364238 0.4635762)
##          26) fatura< 471 93  32 nao (0.6559140 0.3440860)
##            52) temp_cli>=12.5 74  20 nao (0.7297297 0.2702703) *
##            53) temp_cli< 12.5 19   7 sim (0.3684211 0.6315789) *
##          27) fatura>=471 58  20 sim (0.3448276 0.6551724) *
##      7) fatura>=829 172  65 sim (0.3779070 0.6220930)
##        14) temp_cli>=25.5 50  18 nao (0.6400000 0.3600000) *
##        15) temp_cli< 25.5 122  33 sim (0.2704918 0.7295082) *
```

```
prp(ad2, type=3, extra=104,nn=T, fallen.leaves = T, branch.lty = 5)
```



## Analisar resultado na amostra teste

```
ad2=prune(ad1,cp=0.015)
ad2
```

```
## n= 1200
##
## node), split, n, loss, yval, (yprob)
##      * denotes terminal node
##
## 1) root 1200 288 nao (0.7600000 0.2400000)
##    2) local=A,C 726  89 nao (0.8774105 0.1225895) *
##    3) local=B,D 474 199 nao (0.5801688 0.4198312)
##      6) fatura< 829 302  92 nao (0.6953642 0.3046358)
##        12) temp_cli>=17.5 151  22 nao (0.8543046 0.1456954) *
##        13) temp_cli< 17.5 151  70 nao (0.5364238 0.4635762)
##          26) fatura< 471 93  32 nao (0.6559140 0.3440860)
##            52) temp_cli>=12.5 74  20 nao (0.7297297 0.2702703) *
##            53) temp_cli< 12.5 19  7 sim (0.3684211 0.6315789) *
##          27) fatura>=471 58  20 sim (0.3448276 0.6551724) *
##    7) fatura>=829 172  65 sim (0.3779070 0.6220930)
##      14) temp_cli>=25.5 50  18 nao (0.6400000 0.3600000) *
##      15) temp_cli< 25.5 122  33 sim (0.2704918 0.7295082) *
```

```
prp(ad2, type=3, extra=104,nn=T, fallen.leaves = T, branch.lty = 5)
```

