

```
#Carregamento de bibliotecas
```

```
library(MASS)
```

```
library(class)
```

```
help(biopsy)
```

```
# sumário estatístico
```

```
summary(biopsy)
```

```
# Variáveis com outliers V4, V5, V7, V8, V9
```

```
par(mfrow=c(1,5))
```

```
boxplot(biopsy$V4)
```

```
boxplot(biopsy$V5)
```

```
boxplot(biopsy$V7)
```

```
boxplot(biopsy$V8)
```

```
boxplot(biopsy$V9)
```

```
str(biopsy);
```

```
new_biopsy = biopsy;
```

```
#is.na(biopsy$class);
```

```
#is.na(biopsy$V6);
```

```
# Será substituído pela média da variável
```

```
#new_biopsy[is.na(biopsy$V6),]$V6 <- round(mean(biopsy$V6, na.rm = TRUE), 0);
```

```
# Eliminação de linhas com NA
```

```
new_biopsy <- new_biopsy[complete.cases(new_biopsy),]
```

```

# Eliminação da coluna com NA

new_biopsy <- new_biopsy[, c(2:6, 8:11)]

# is.na(new_biopsy$V6);

# 1/3 de dados de teste
L <- sample(1:nrow(new_biopsy), round(nrow(new_biopsy)/3));
test <- new_biopsy[L, 2:10];
#test <- new_biopsy[L, 1:8];

# Restantes dos dados são de treinamento
train <- new_biopsy[-L, 2:10];
#train <- new_biopsy[-L, 1:8];

# classificação
classe <- factor(new_biopsy[-L, 11]);
#classe <- factor(new_biopsy[-L, 9]);

# Execução com outliers
acc = c(1:100) * 0

for (x in 1:100){
  fit <- knn(train, test, classe, k = 5);
  conf_matrix <- table(fit[1:length(L)], factor(new_biopsy[L, 11]));
  accuracy <- sum(diag(conf_matrix))/sum(conf_matrix) * 100;
  acc[x] = accuracy
  cat('Accuracy: ', accuracy, '% | Exec = ', x)
  print(conf_matrix);
  print('=====');
}

```

```
cat('Mean Accuracy - outliers: ', mean(acc), '%')
```

```
# Execução sem outliers
```

```
#acc = c(1:100) * 0
```

```
#for (x in 1:100){
```

```
# fit <- knn(train, test, classe, k = 2);
```

```
# conf_matrix <- table(fit[1:length(L)], factor(new_biopsy[L, 11]));
```

```
# accuracy <- sum(diag(conf_matrix))/sum(conf_matrix) * 100;
```

```
# acc[x] = accuracy
```

```
# cat('Accuracy: ', accuracy, '% | Exec = ', x)
```

```
# print(conf_matrix);
```

```
# print('=====');
```

```
#}
```

```
#cat('Mean Accuracy - no outliers: ', mean(acc), '%')
```