

# **BIE5782**

Unidade 5:

**ANÁLISE EXPLORATÓRIA**

# Análise Exploratória de Dados (AED)

- ✓ O que é AED?
- ✓ Quem utiliza AED?
- ✓ Objetivos da AED:
  - controle de qualidade dos dados
  - detectar padrões
  - orientar os testes de hipóteses
  - ajudar a interpretar os testes de hipóteses
- ✓ **Apresentação gráfica é muito útil para AED**

**summary() , str() ,  
head() , tail()**

A Primeira Olhada

DEMONSTRAÇÃO NO R

# is.na()

## Teste Lógico para Valores Perdidos

```
> a
[1]  1  2  3  4  5 NA  6  7  8  9 10 NA
> is.na(a)
[1] FALSE FALSE FALSE FALSE FALSE TRUE
[7] FALSE FALSE FALSE FALSE FALSE TRUE
> a[is.na(a)==F]
[1]  1  2  3  4  5  6  7  8  9 10
> a[is.na(a)==T] <- 0
> a
[1]  1  2  3  4  5  0  6  7  8  9 10  0
```

# mean(), median()

## Medidas de Tendência Central

```
> mean( c(0,1,2,3,4,5) )
```

```
[1] 2.5
```

```
> median( c(0,1,2,3,4,5) )
```

```
[1] 2.5
```

```
> mean( c(0,1,2,3,4,100) )
```

```
[1] 18.33333
```

```
> median( c(0,1,2,3,4,100) )
```

```
[1] 2.5
```

`mean(trim=)`, `mean()`,  
`median()`, `quantile()`

Média (normal e truncada) mediana,  
quantis: o pacote básico.

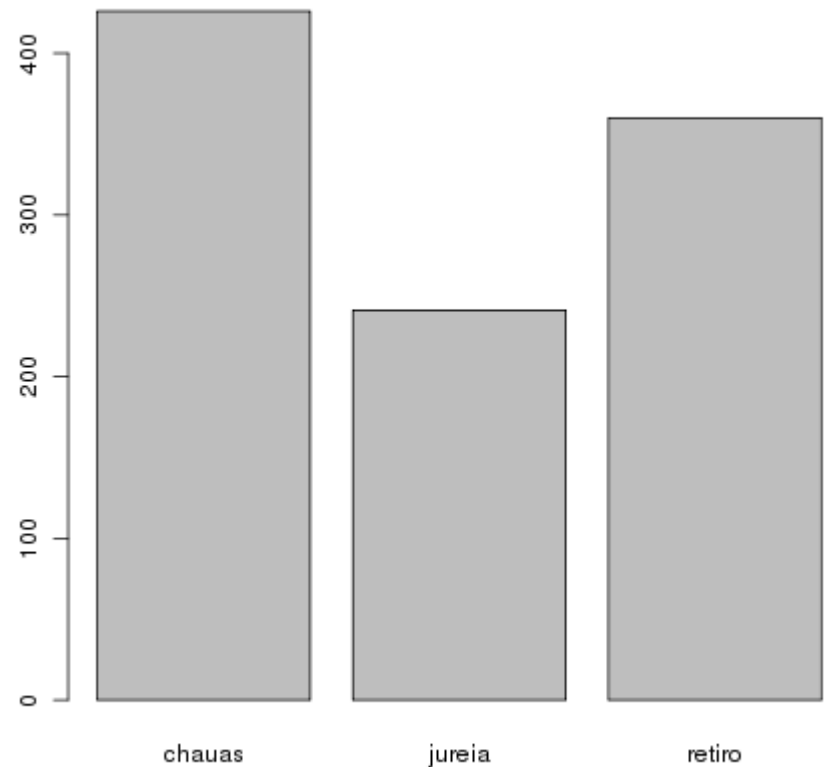
DEMONSTRAÇÃO NO R

# `table()`, `barplot()`

## Contagens de Fatores

```
> table(caixeta$local)
```

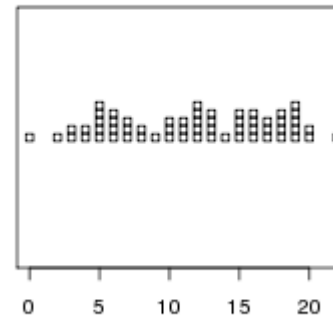
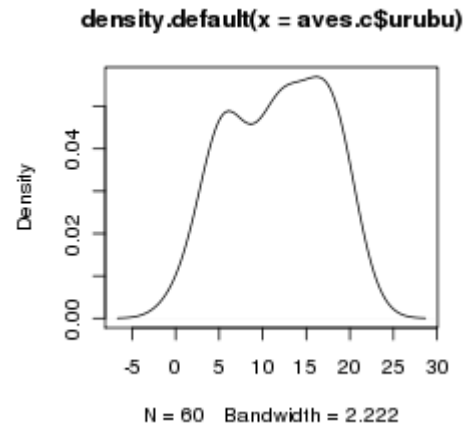
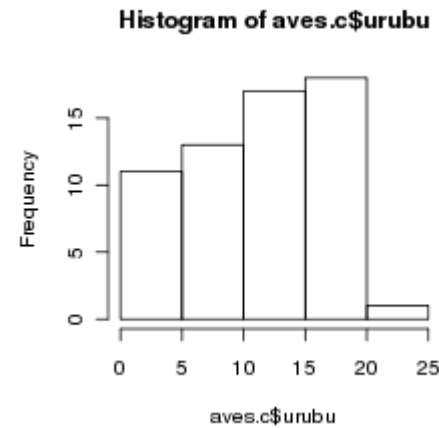
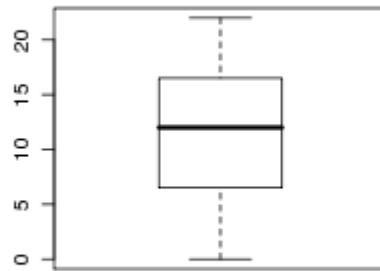
```
chauas  jureia  retiro  
  426    241    360
```



```
> barplot(table(caixeta$local))
```

# `boxplot()`, `hist()`, `density()`, `stripchart()`

## Gráficos Univariados Básicos





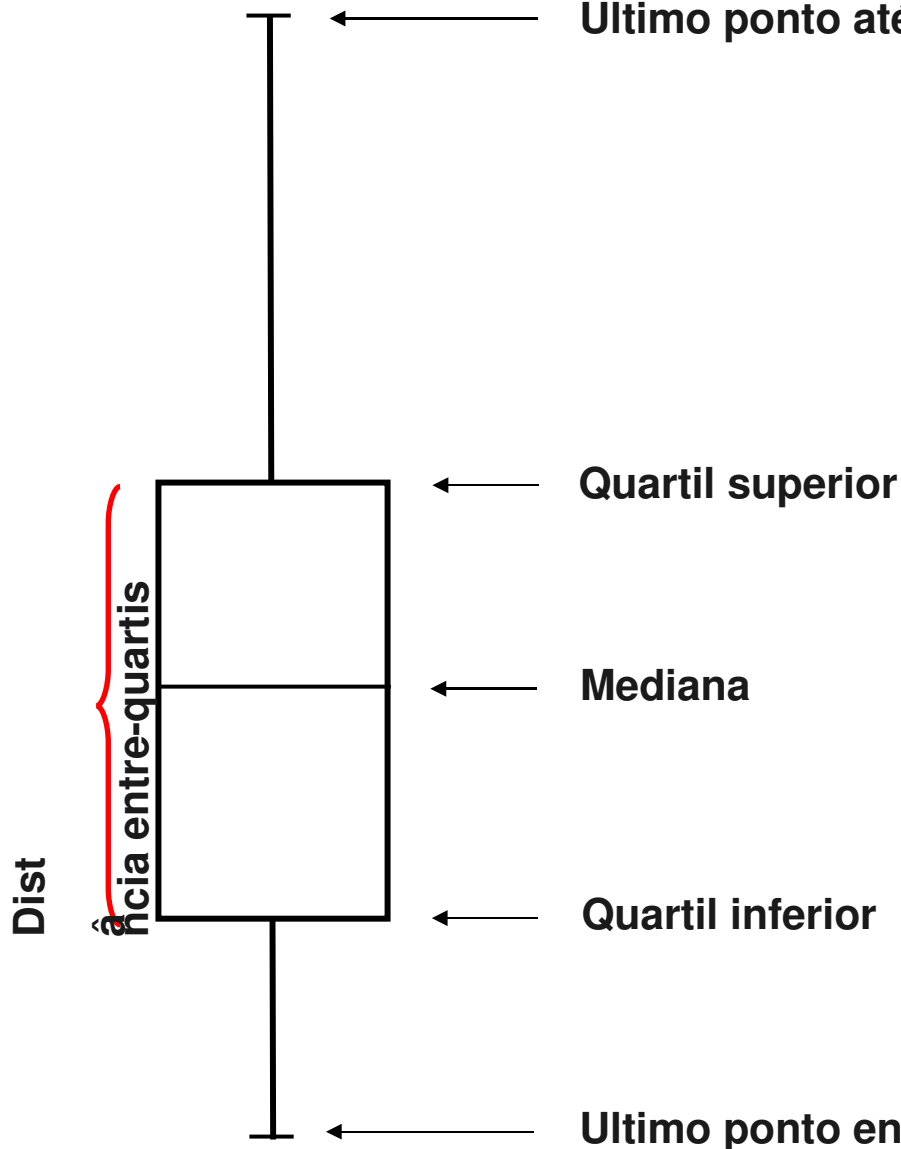
\* ← Valor extremo: + que 1,5 X a distância entre-quartis

← Último ponto até 1,5 X a distância entre-quartis

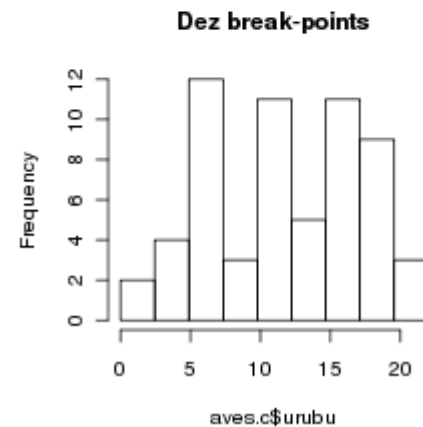
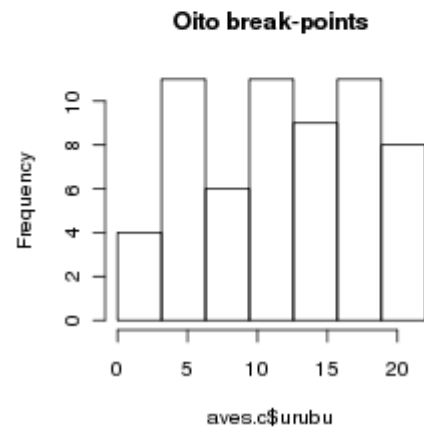
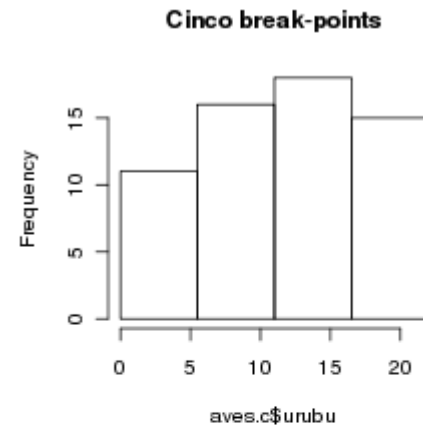
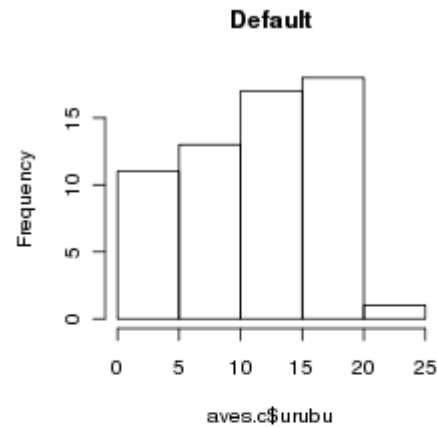
**Box-and-whisker plot**

**ou**

**Diagrama de caixa e bigode de gato**



← Último ponto entre 1,5 X a distância entre-quartis



```
hist(aves.c$urubu)
```

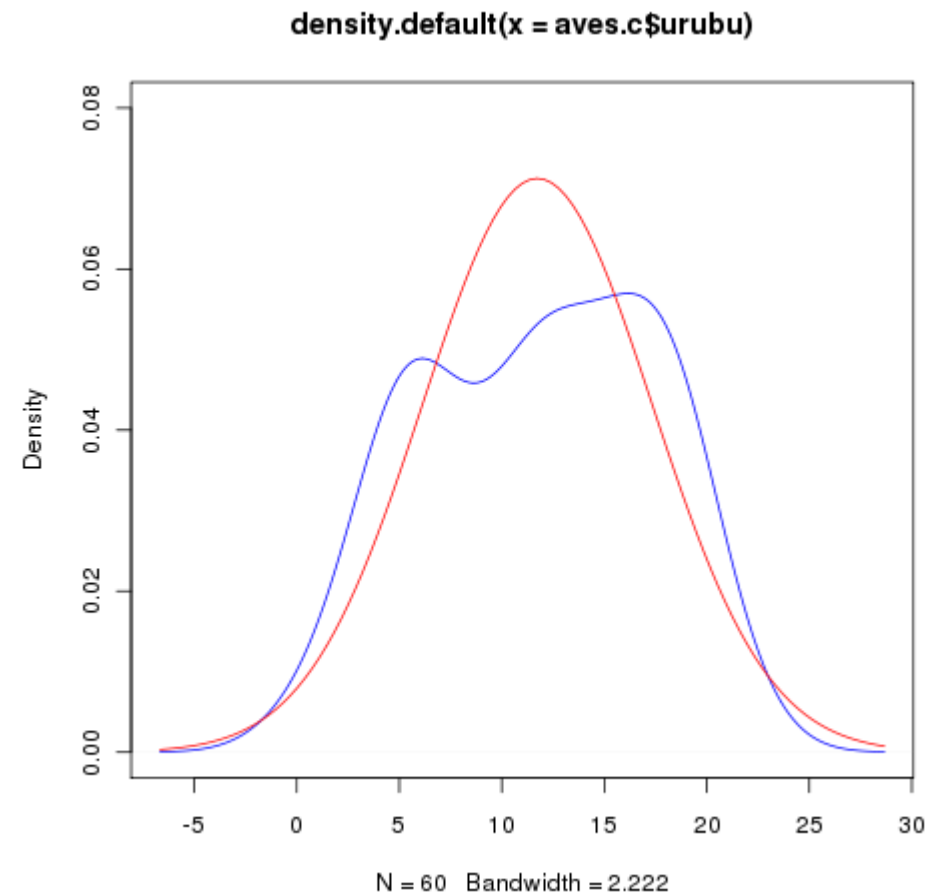
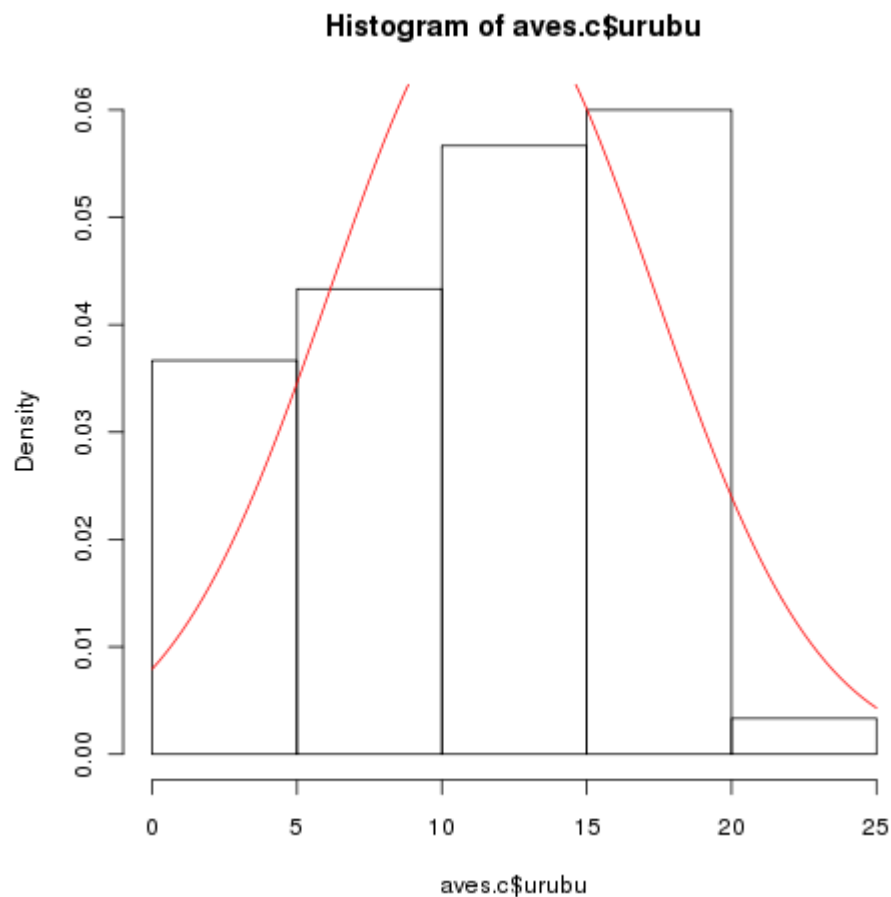
```
hist(aves.c$urubu,breaks=seq(0,max(aves.c$urubu),length=5))
```

```
hist(aves.c$urubu,breaks=seq(0,max(aves.c$urubu),length=8))
```

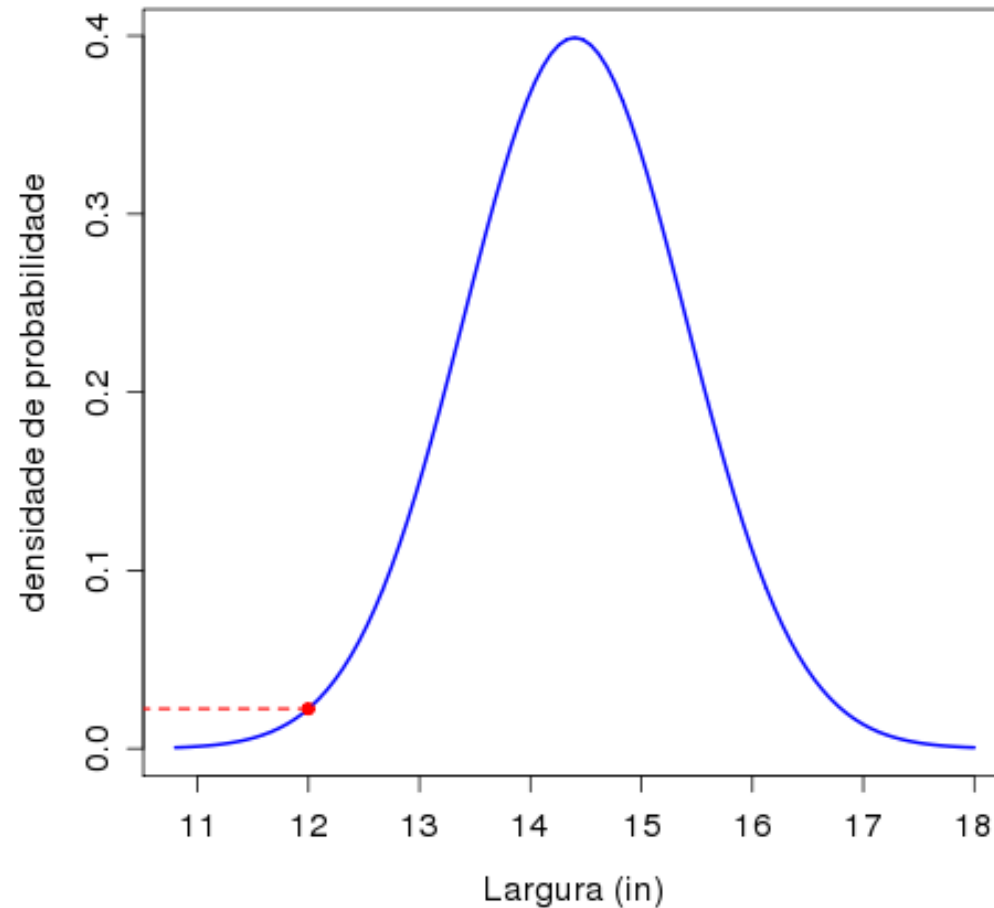
```
hist(aves.c$urubu,breaks=seq(0,max(aves.c$urubu),length=10))
```

**hist(prob=T)** , **density()** , **curve()**

## Curvas Empíricas e Teóricas de Densidade



# Relembrando ...



```
> dnorm(x=12, mean=14.4, sd=1)
[1] 0.02239453
```



Vai para o R!

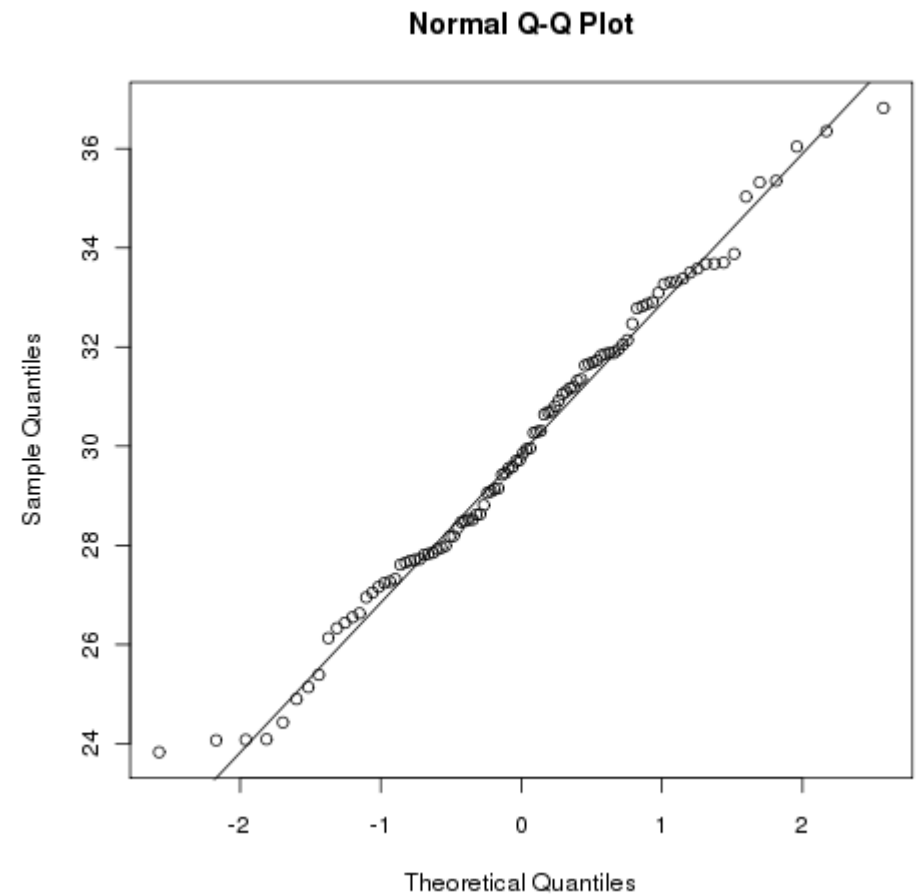
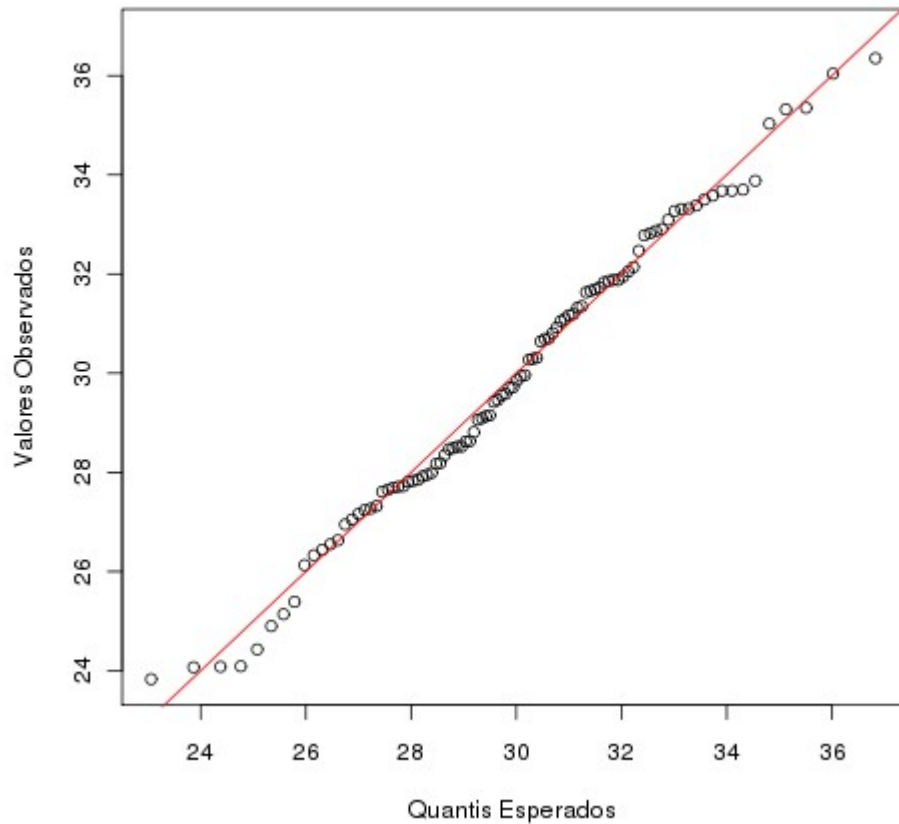
**qqnorm()** , **qqline()**

O melhor teste de normalidade

	<b>x</b>	<b>percentil</b>	<b>q.norm</b>
<b>1</b>	<b>23.83</b>	<b>0.01</b>	<b>23.05859</b>
<b>2</b>	<b>24.07</b>	<b>0.02</b>	<b>23.86540</b>
<b>3</b>	<b>24.08</b>	<b>0.03</b>	<b>24.37730</b>
<b>4</b>	<b>24.09</b>	<b>0.04</b>	<b>24.76238</b>
<b>5</b>	<b>24.43</b>	<b>0.05</b>	<b>25.07561</b>
<b>...</b>			
<b>95</b>	<b>35.03</b>	<b>0.95</b>	<b>34.81219</b>
<b>96</b>	<b>35.32</b>	<b>0.96</b>	<b>35.12542</b>
<b>97</b>	<b>35.35</b>	<b>0.97</b>	<b>35.51050</b>
<b>98</b>	<b>36.04</b>	<b>0.98</b>	<b>36.02240</b>
<b>99</b>	<b>36.35</b>	<b>0.99</b>	<b>36.82921</b>
<b>100</b>	<b>36.82</b>	<b>1.00</b>	<b>Inf</b>

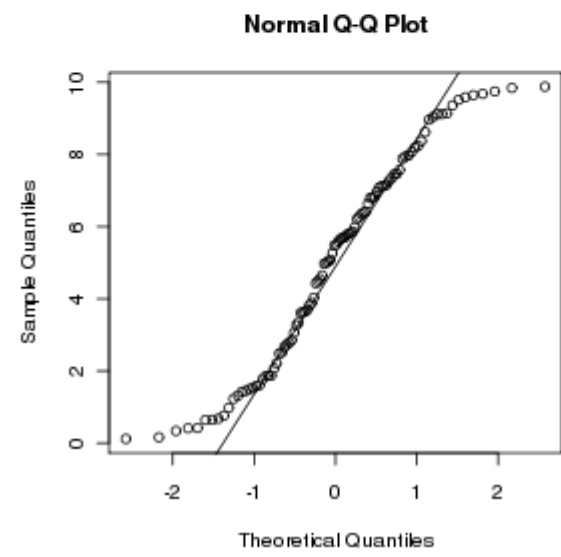
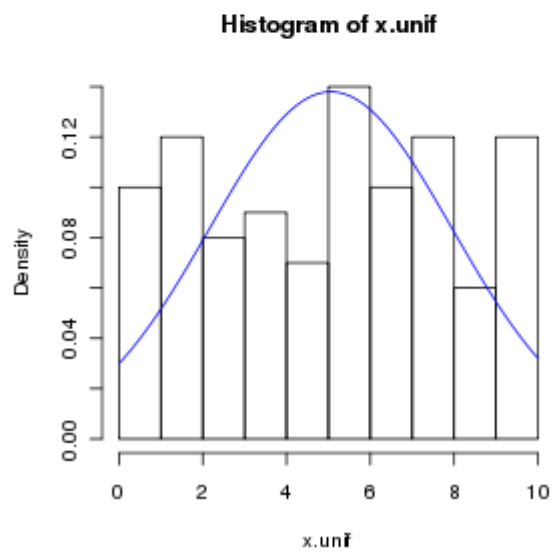
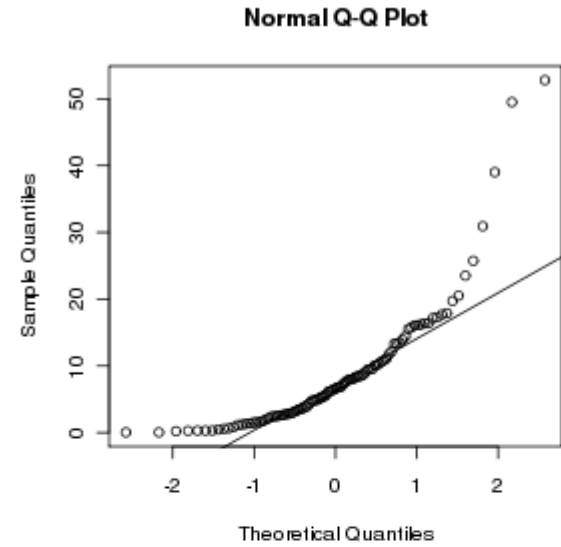
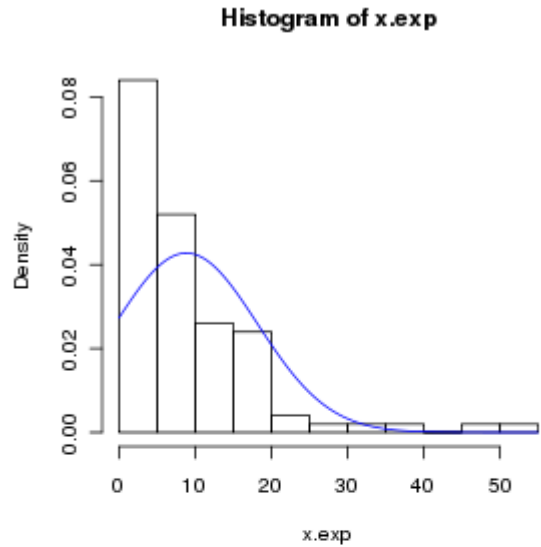
**qqnorm()** , **qqline()**

O melhor teste de normalidade



**qqnorm()** , **qqline()**

O melhor teste de normalidade





# DUAS OU MAIS VARIÁVEIS



**table()**

# Tabelas de Contingência

```
> table(caixeta$especie, caixeta$local)
```

	chauas	jureia	retiro
Alchornea triplinervia	0	3	12
Andira fraxinifolia	0	4	0
bombacaceae	0	1	0
Cabralea canjerana	0	4	0
Callophyllum brasiliensis	7	0	0
Callophyllum brasiliensis	0	4	0
Cecropia sp	0	0	1
Coussapoa macrocarpa	0	3	0
Coussapoa micropoda	2	0	7
Cryptocaria moschata	0	2	0
Cyathea sp	0	0	2

# xtabs()

## Tabulação de Frequências

```
> head(Titanic.df)
```

	Class	Sex	Age	Survived	Freq
1	1st	Male	Child	No	0
2	2nd	Male	Child	No	0
3	3rd	Male	Child	No	35
4	Crew	Male	Child	No	0
5	1st	Female	Child	No	0
6	2nd	Female	Child	No	0

```
> xtabs(Freq~Sex+Survived, data=Titanic.df)
```

	Survived	
Sex	No	Yes
Male	1364	367
Female	126	344

# aggregate()

## "Tabelas Dinâmicas"

```
> names(caixeta)
[1] "local"    "parcela" "arvore"   "fuste"    "cap"
[5] "h"        "especie" "ab"
```

```
> caixeta.alt <- aggregate(caixeta$h,
+ by=list(local=caixeta$local,
+ especie=caixeta$especie), FUN=max)
```

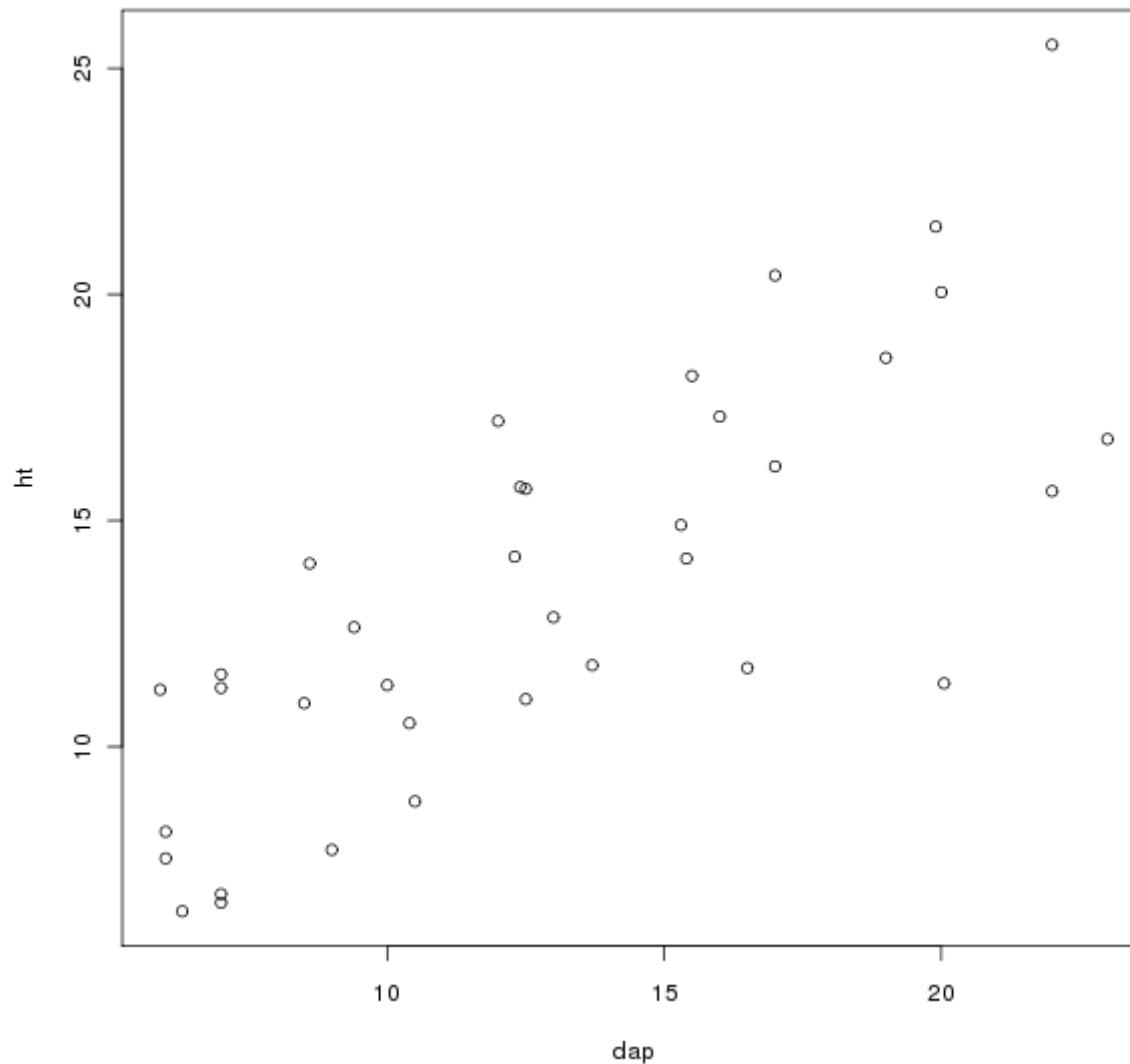
```
> head(caixeta.alt)
  local          especie      x
1 jureia  Alchornea triplinervia 140
2 retiro  Alchornea triplinervia 100
3 jureia      Andira fraxinifolia  90
4 jureia          bombacaceae 150
5 jureia      Cabralea canjerana 150
6 chauvas Callophyllum brasiliensis 200
```



Vai para o R!

# plot(y~x)

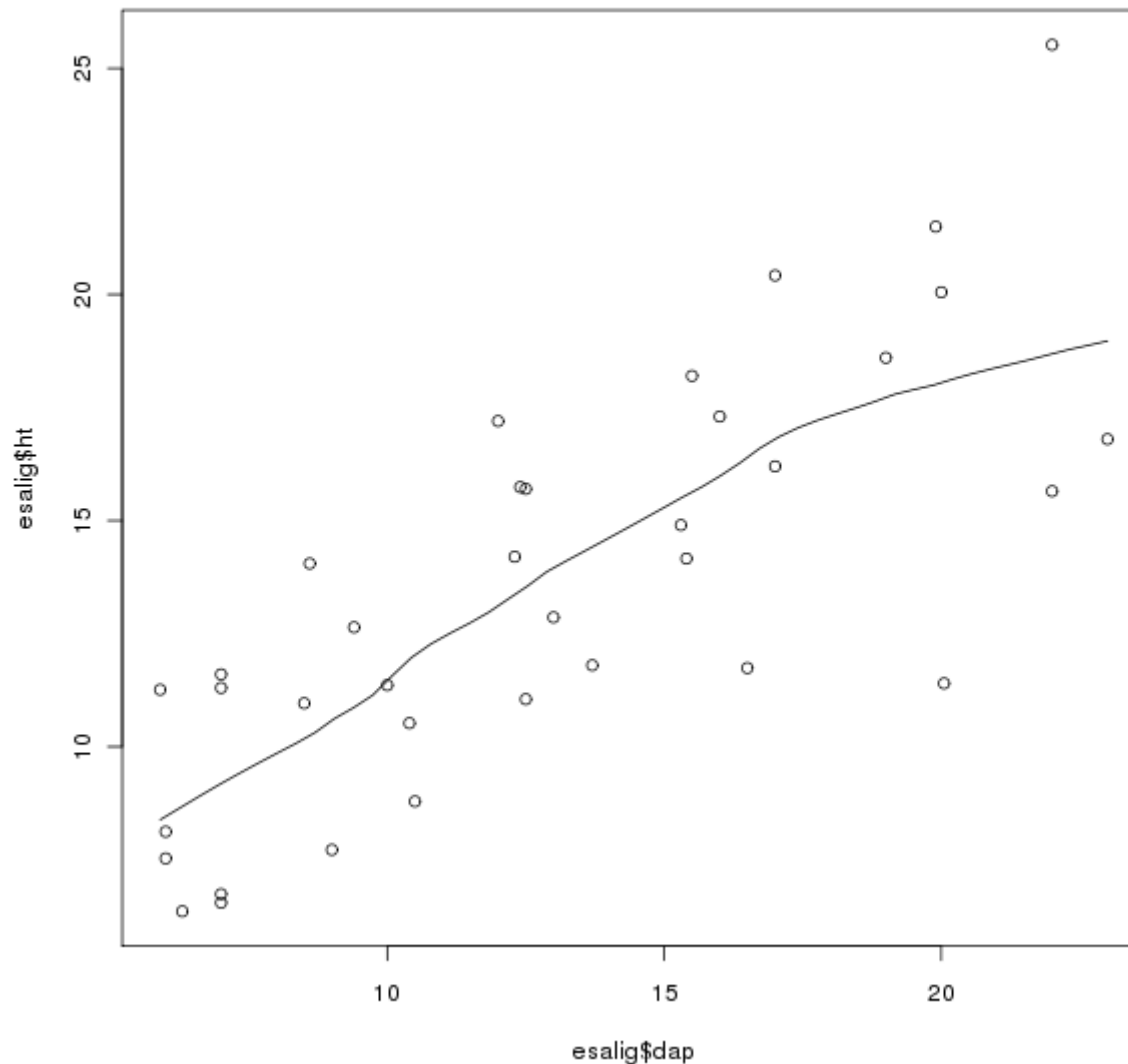
## Espalhogramas



```
> plot(ht~dap, data=esalig)
```

# `scatter.smooth(y~x)`

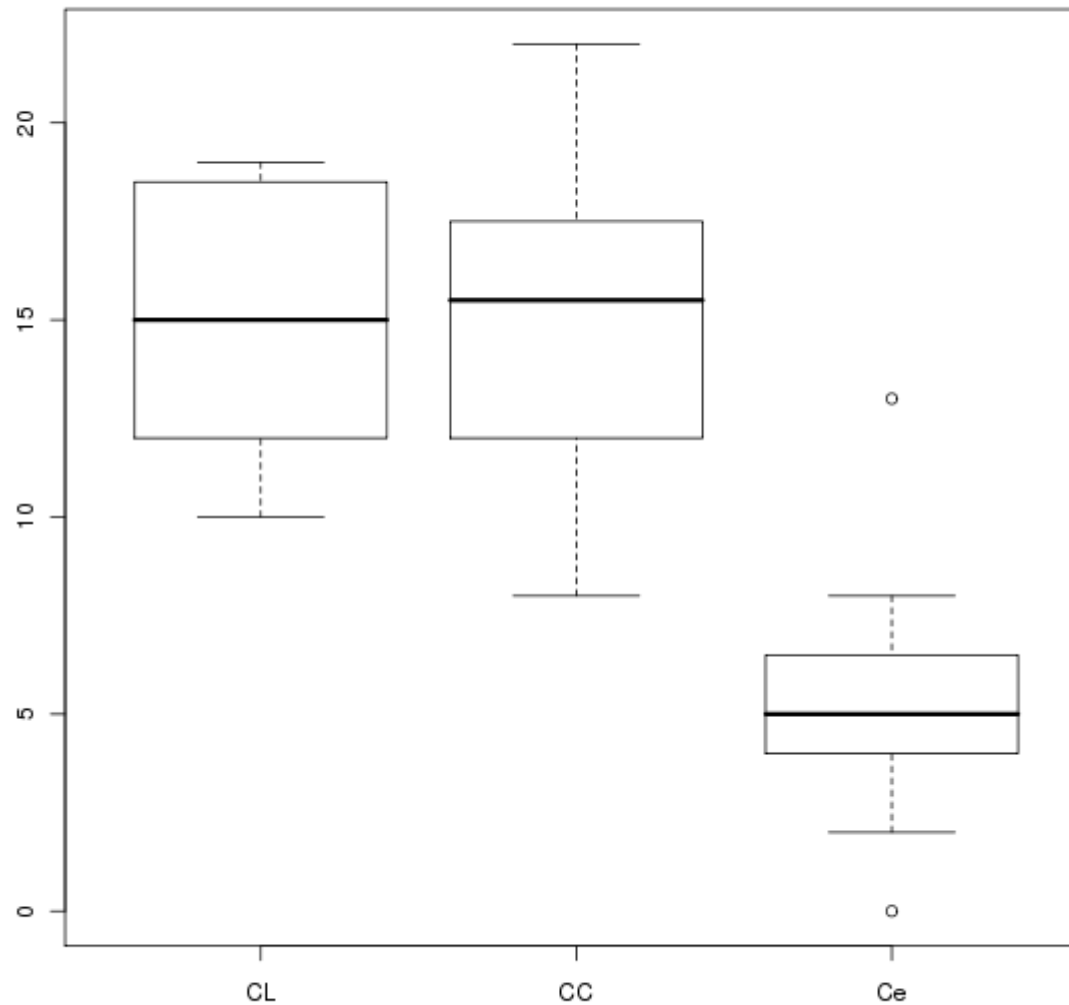
## Espalhogramas com Linha de Tendência



> `scatter.smooth(esalig$ht~esalig$dap, span=1/2)`

# boxplot(y~x)

## Boxplot por Classes

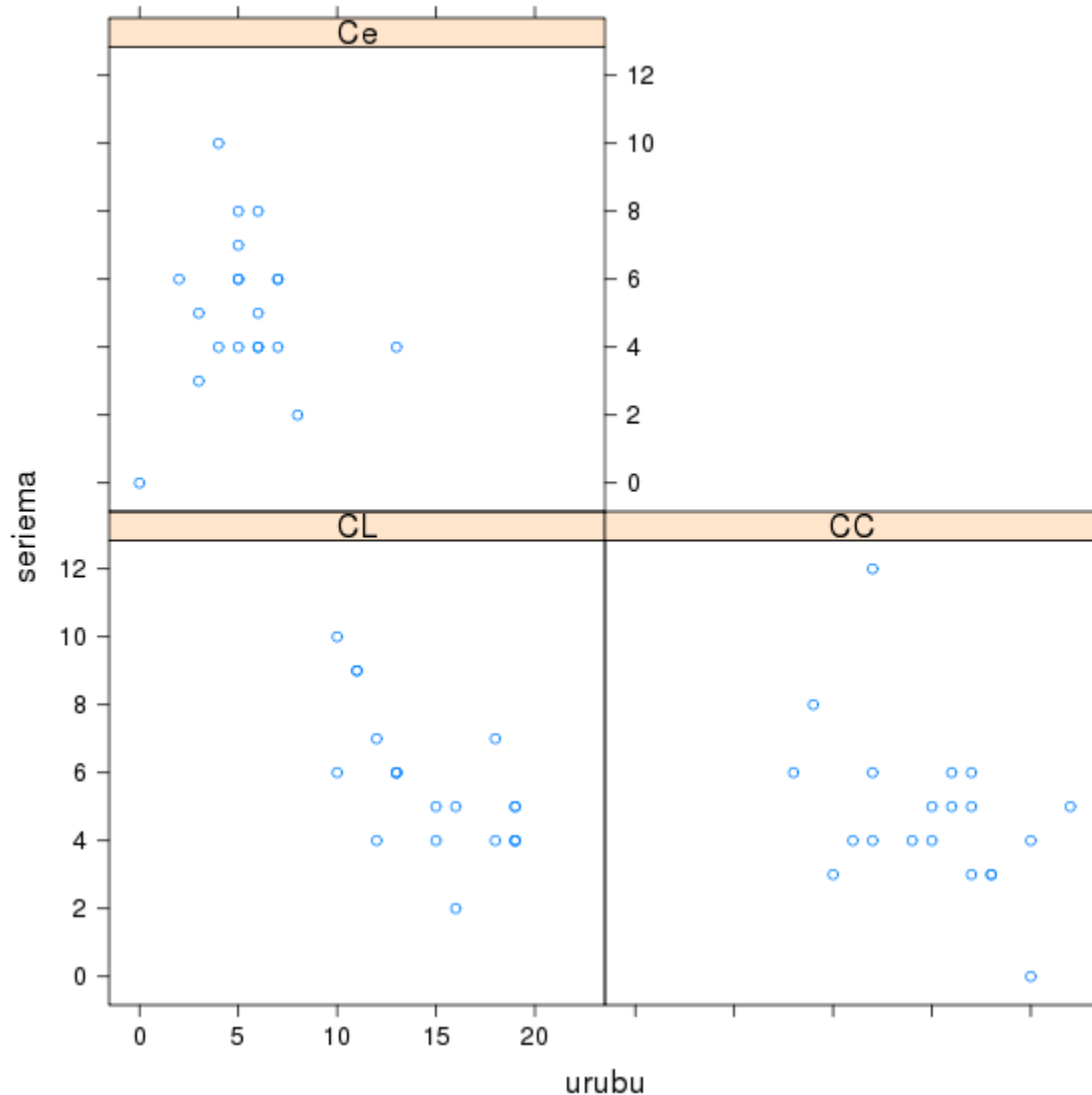


> `boxplot(urubu~fisionomia, data=aves.c)`



# `xypLOT(y~x|z)`

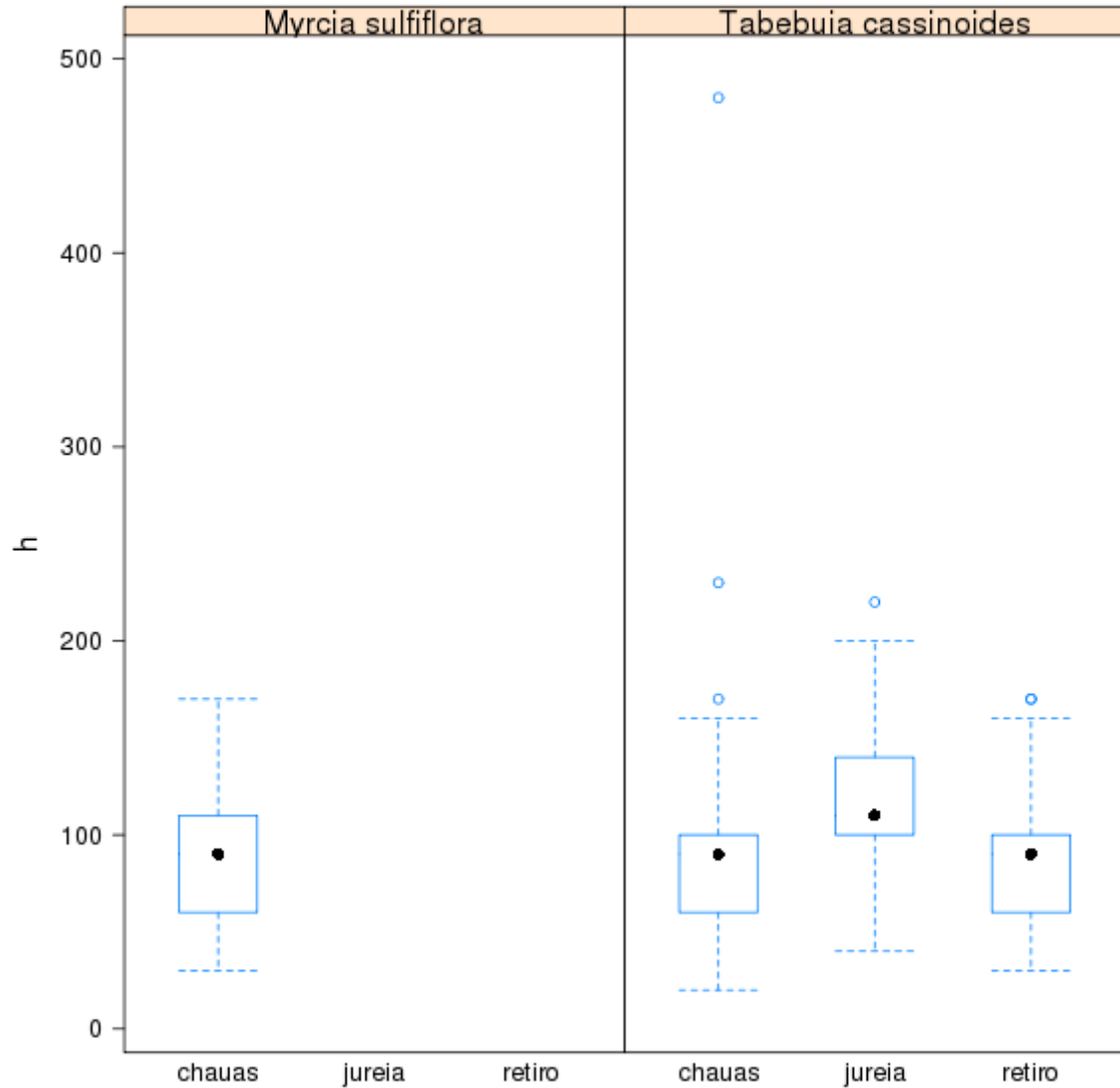
Pacote lattice: gráficos condicionados



```
> xypLOT(seriema~urubu|fisionomia, data= aves.c)
```

# `bwplot(y~x|z)`

## Box-plot no lattice



> `bwplot(h~local|especie, data=caixeta.abund)`

## Sugestão de leitura

**Ellison, A. M. 1993. Exploratory data analysis and graphic display. In: Scheiner, S. M. (ed.), *Design and analysis of ecological experiments*. Chapman & Hall, pp. 14-45.**

**McGill, R., Tukey, J. W. and Larsen, W. A. 1978. Variations of Box Plots. *Am. Statist.* 32: 12-16.**

# FIM DA UNIDADE 5

Para a tarde:

## Tutorial da Unidade 5

[http://ecologia.ib.usp.br/bie5782/doku.php?id=bie5782:02\\_tutoriais:start](http://ecologia.ib.usp.br/bie5782/doku.php?id=bie5782:02_tutoriais:start)

## Lista 4 de Exercícios:

[http://ecologia.ib.usp.br/bie5782/doku.php?id=bie5782:01\\_curso2009:exercicios4](http://ecologia.ib.usp.br/bie5782/doku.php?id=bie5782:01_curso2009:exercicios4)