

Análise de Sobrevivência

Modelos Paramétricos

Ricardo Accioly

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Nesta apresentação vamos ver passo a passo como obter a função taxa de falhas e de sobrevivência para alguns modelos de probabilidade.

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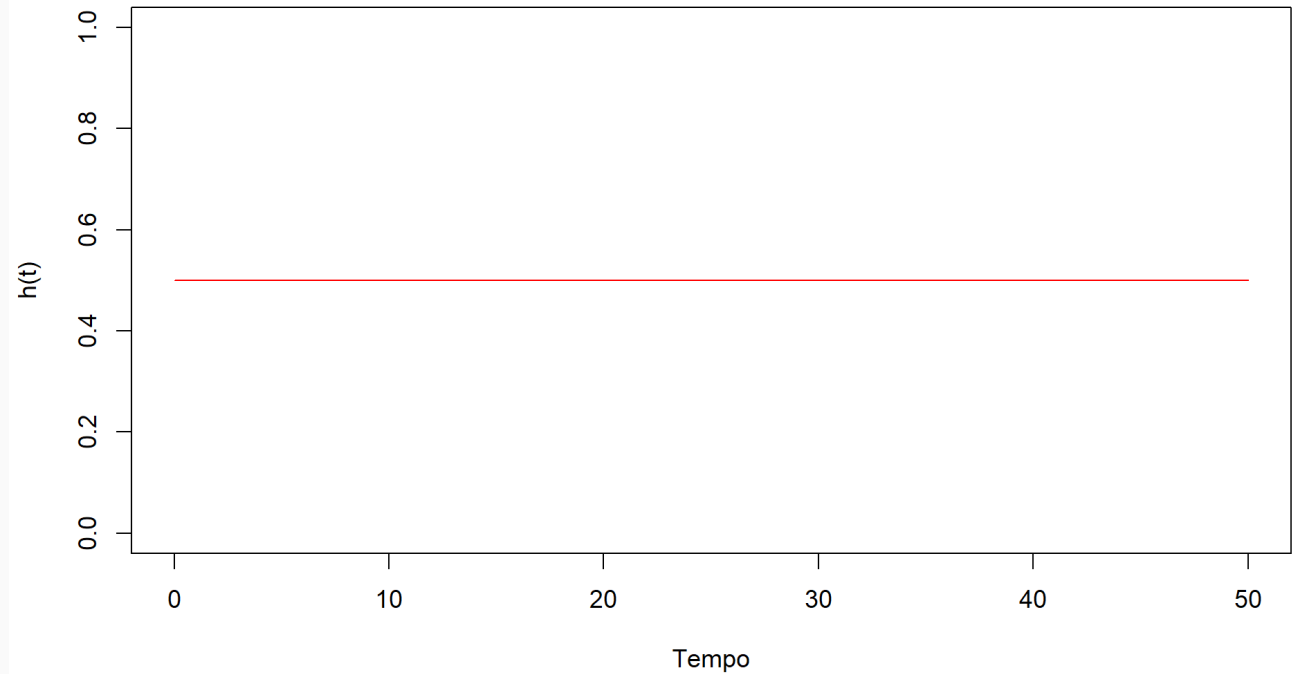
Aqui vamos utilizar as funções existentes no pacote `stats` que vem com a instalação padrão do R.

Modelos Paramétricos - Exponencial

```
expHaz ← function(x, rate) {  
  dexp(x, rate=rate)/  
  pexp(x, rate=rate, lower.tail=F)  
}
```

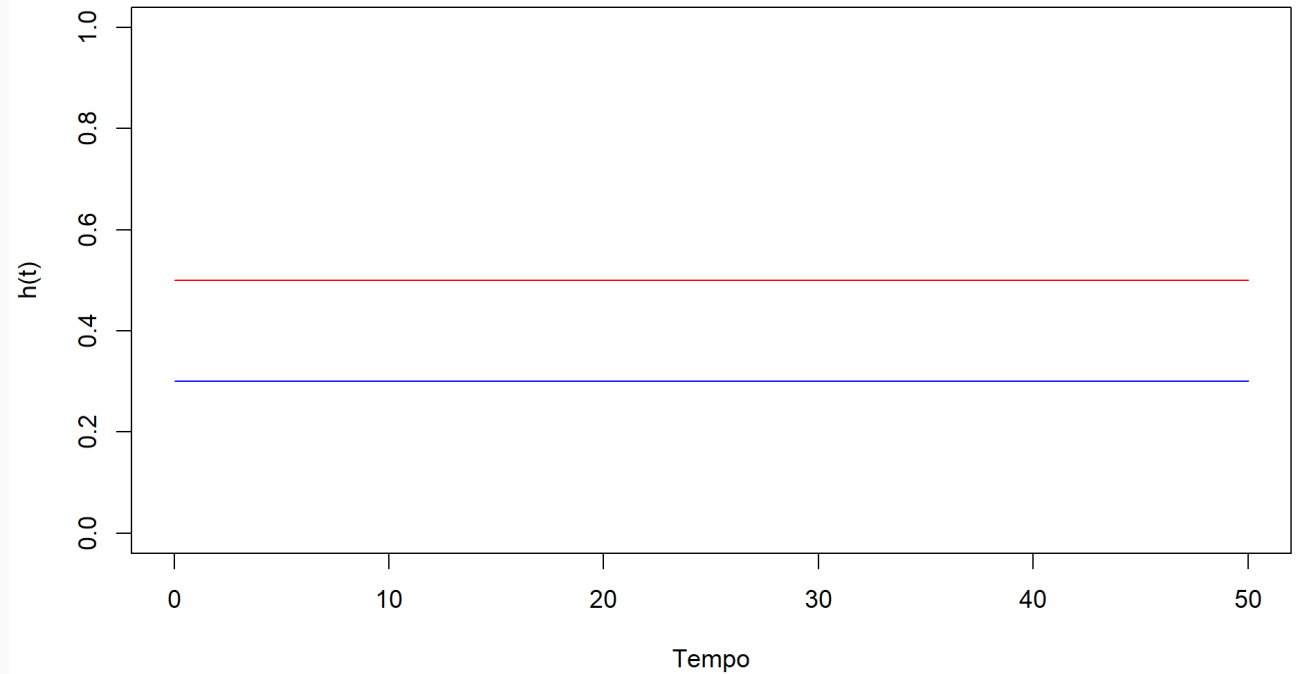
Modelos Paramétricos - Exponencial

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expHaz ← function(x, rate) {  
  dexp(x, rate=rate)/  
  pexp(x, rate=rate, lower.tail=F)  
}  
curve(expHaz(x, rate=0.5), from=0, to=50,  
      ylab="h(t)", xlab="Tempo",  
      col="red", ylim=c(0,1))
```



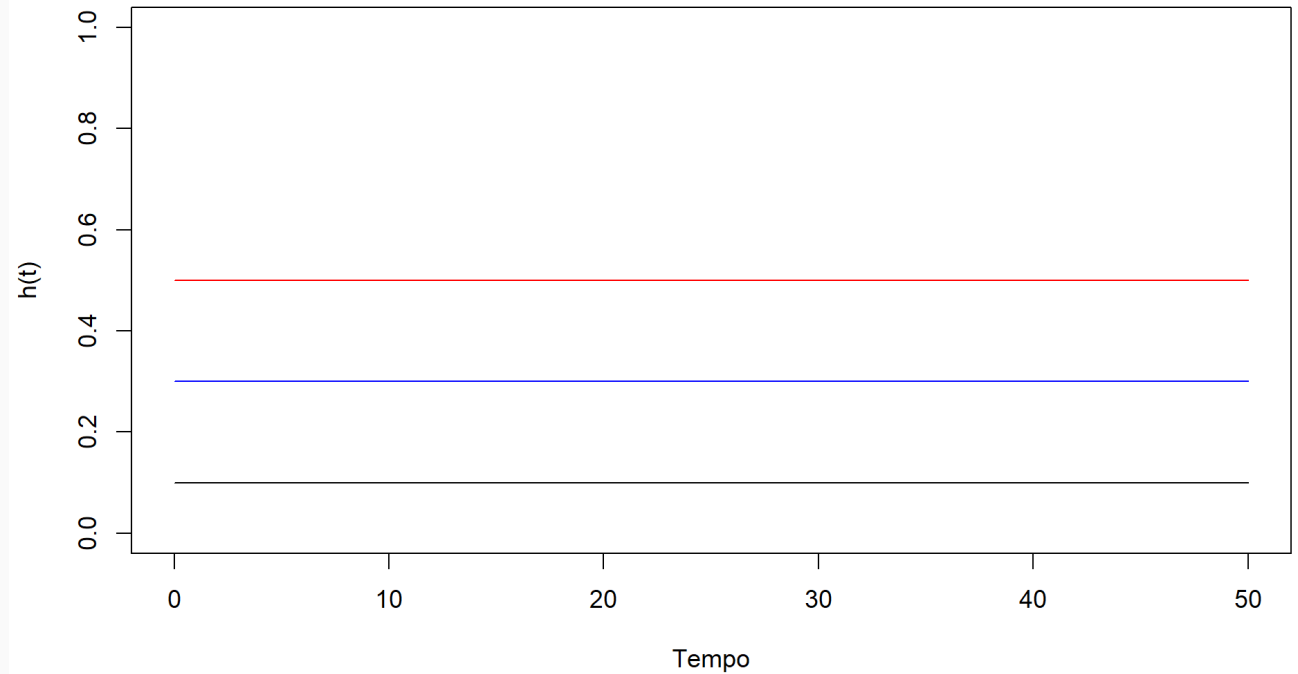
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curve(expHaz(x, rate=0.3), from=0, to=50,  
      ylab="h(t)", xlab="Tempo",  
      col="blue", add = T)
```



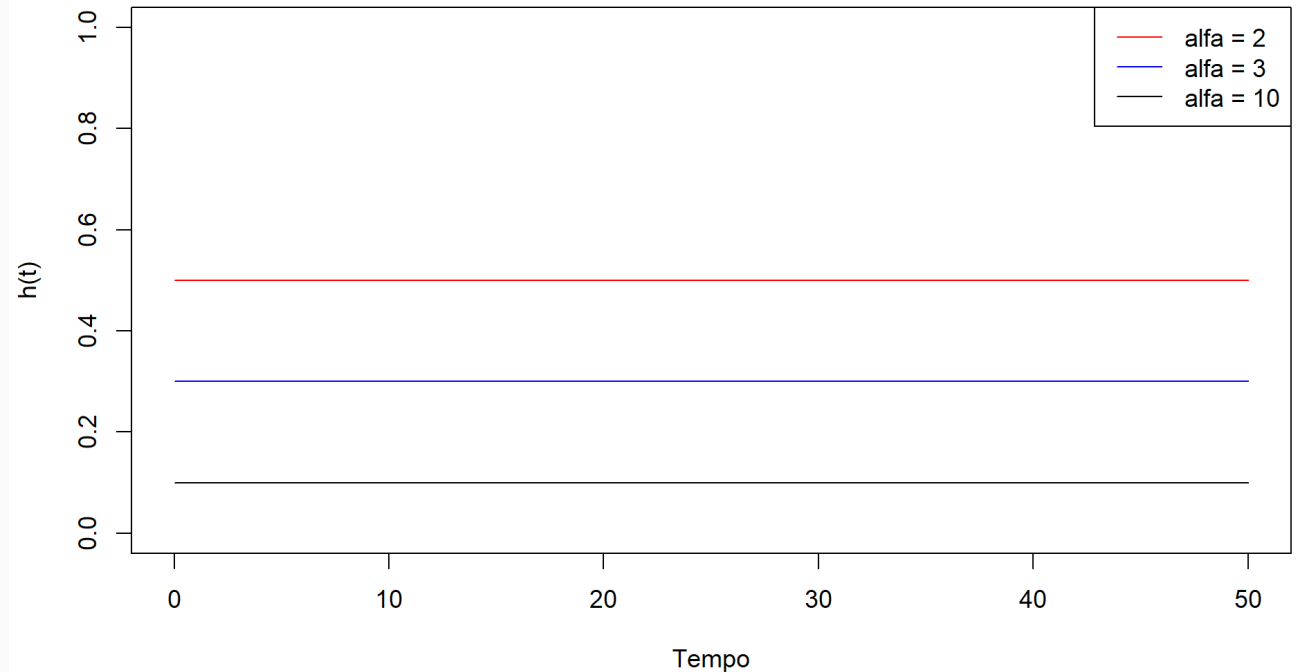
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      col="blue", add = T)  
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      col="blue", add = T)  
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      ylab="h(t)", xlab="Tempo",  
      col="black", add=T)  
legend("topright",  
      legend = c(expression(paste(alfa, " = ", 2)),  
                  expression(paste(alfa, " = ", 3)),  
                  expression(paste(alfa, " = ", 10))),  
      lty=1, col = c("red", "blue", "black"))
```

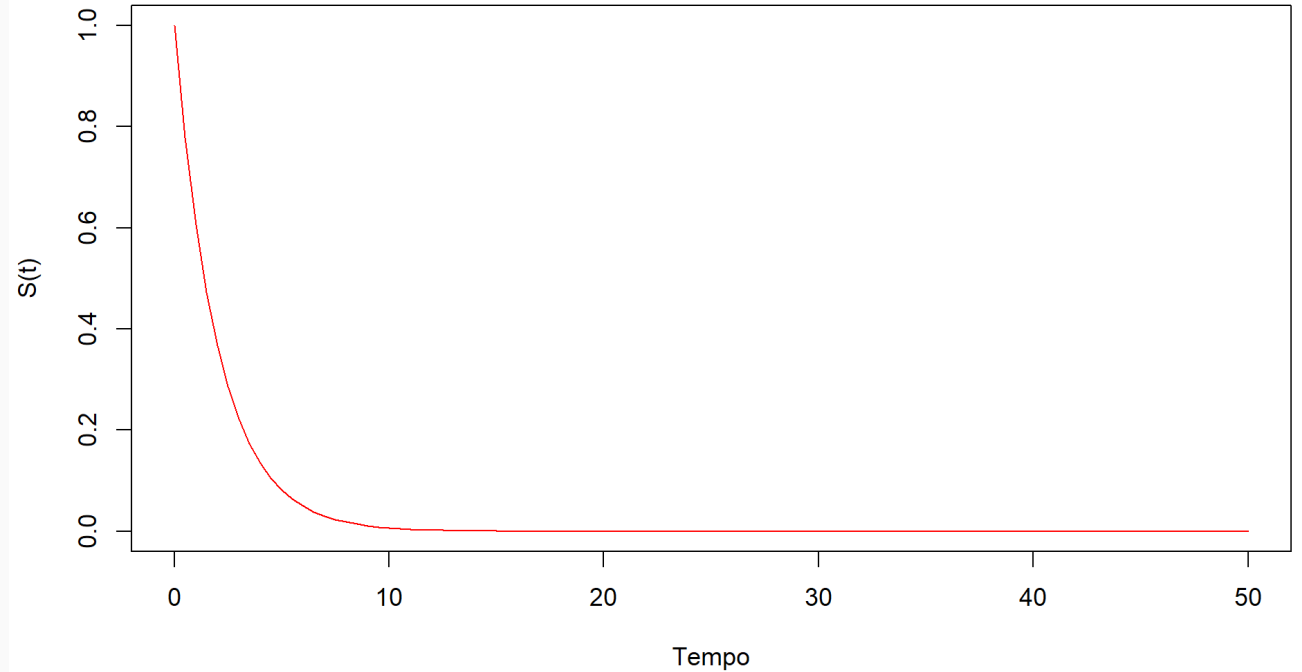


Modelos Paramétricos - Exponencial

```
expSurv ← function(x, rate) {  
  pexp(x, rate=rate, lower.tail=F)  
}
```

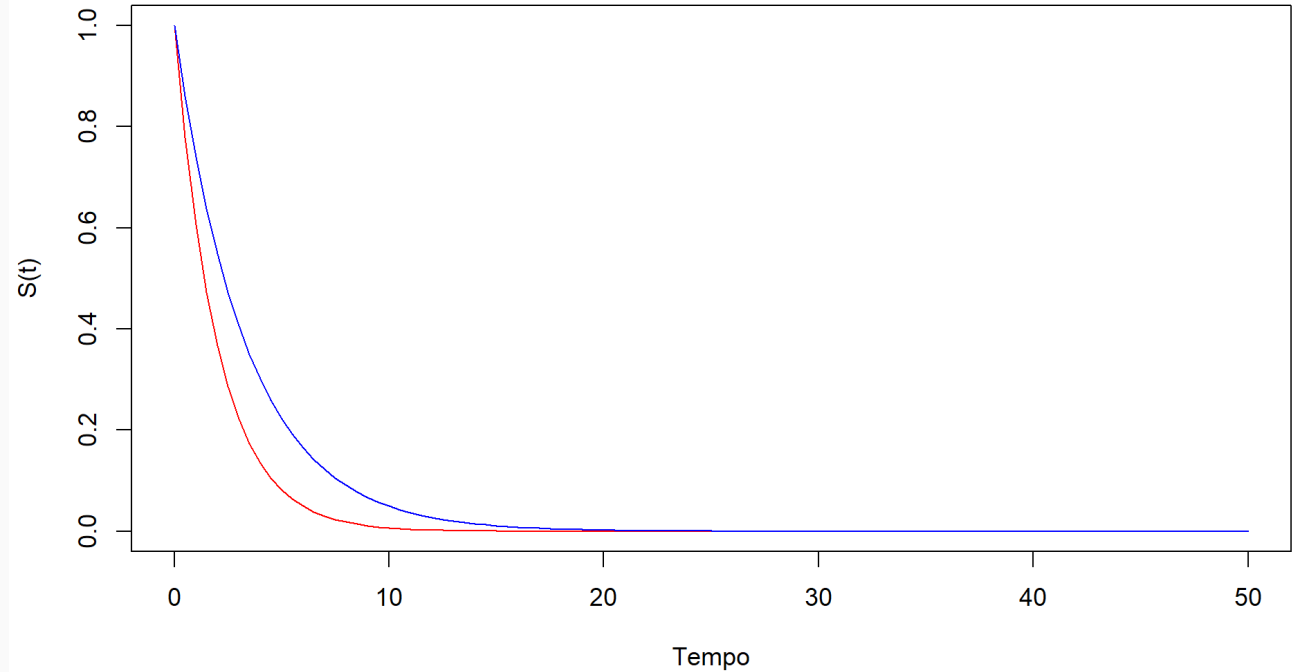
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expSurv <- function(x, rate) {  
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curve(expSurv(x, rate=0.5), from=0, to=50,  
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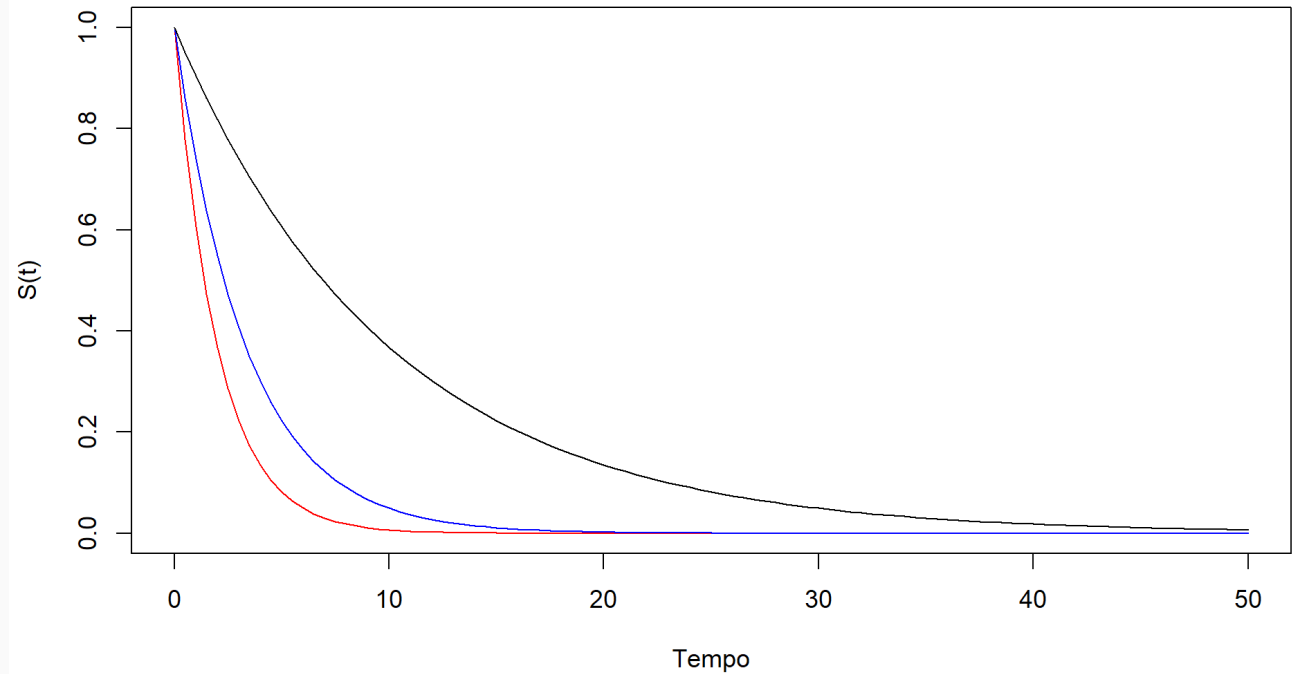
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      ylab="S(t)", xlab="Tempo", col="blue", add=T)
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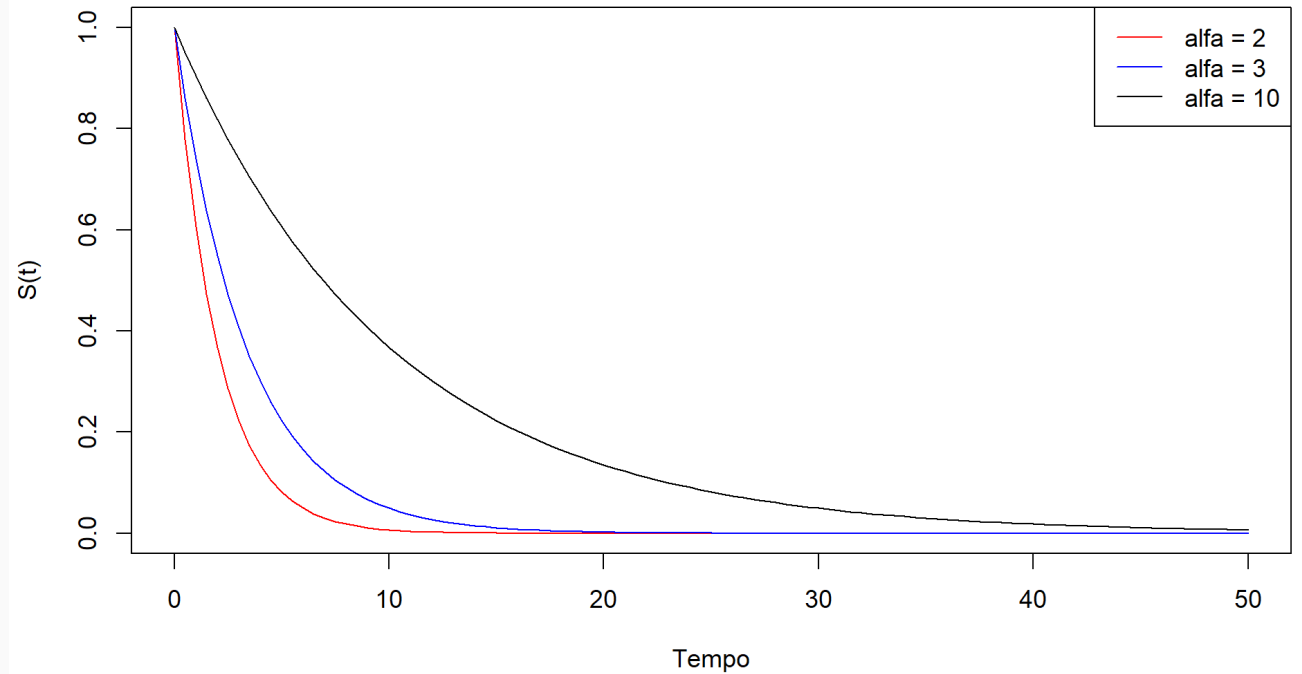
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      ylab="S(t)", xlab="Tempo", col="red")  
curve(expSurv(x, rate=0.3), from=0, to=50,  
      ylab="S(t)", xlab="Tempo", col="blue", add=T)  
curve(expSurv(x, rate=0.1), from=0, to=50,  
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      ylab="S(t)", xlab="Tempo", col="blue", add=T)  
curve(expSurv(x, rate=0.1), from=0, to=50,  
      ylab="S(t)", xlab="Tempo", col="black", add=T)  
legend("topright",  
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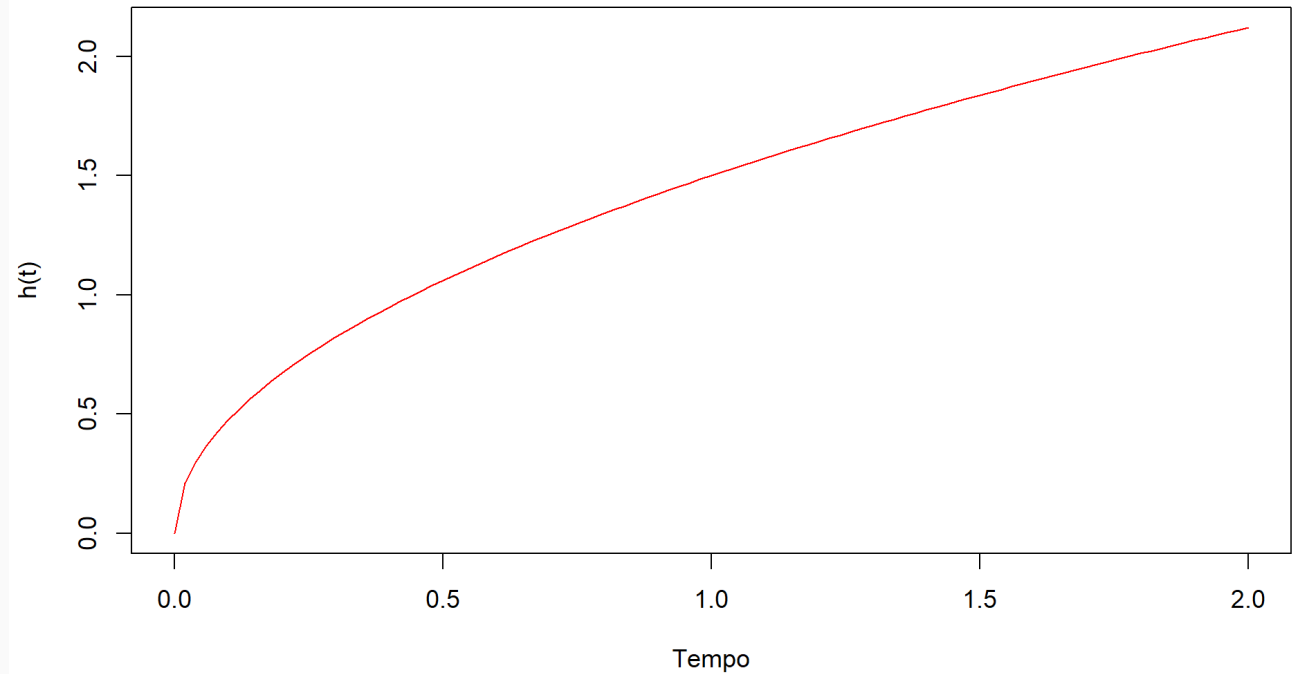


Modelos Paramétricos - Weibull

```
weibHaz ← function(x, shape, scale) {  
  dweibull(x, shape=shape, scale=scale)/  
  pweibull(x, shape=shape, scale=scale,  
    lower.tail=F)  
}
```

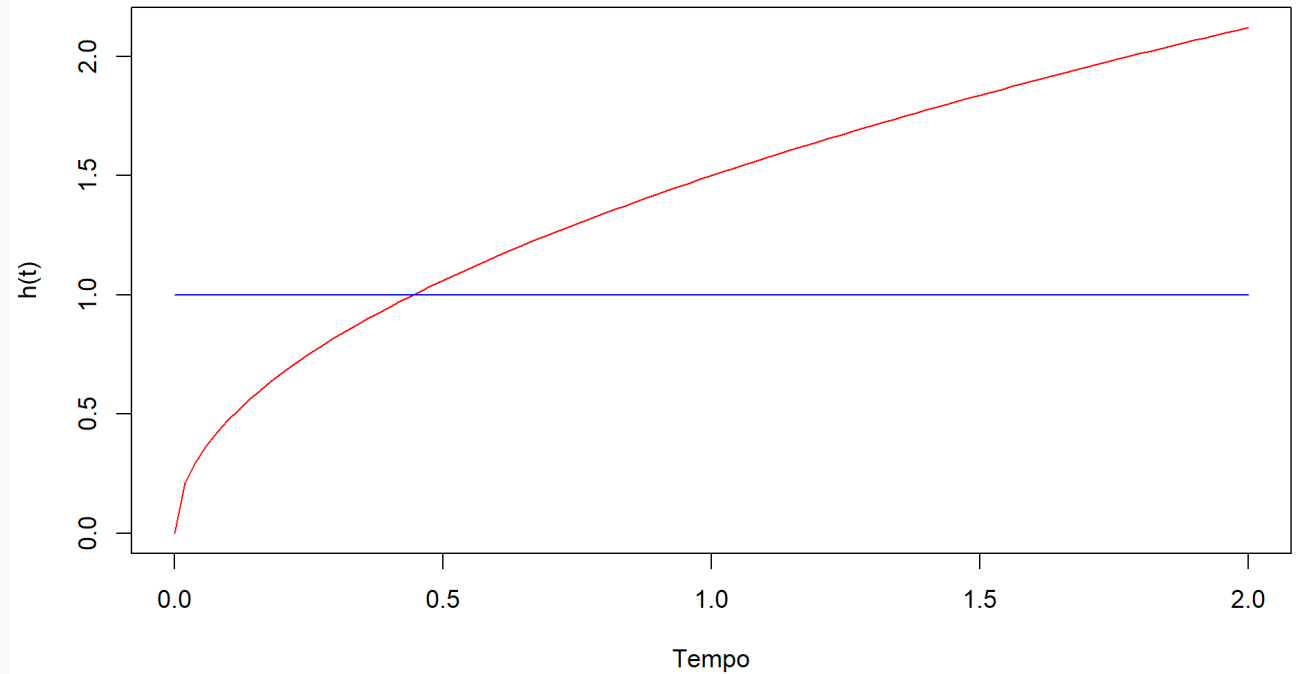
Modelos Paramétricos - Weibull

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weibHaz <- function(x, shape, scale) {  
  dweibull(x, shape=shape, scale=scale)/  
  pweibull(x, shape=shape, scale=scale,  
    lower.tail=F)  
}  
curve(weibHaz(x, shape=1.5, scale=1),  
  from=0, to=2,  
  ylab="h(t)", xlab="Tempo", col="red")
```



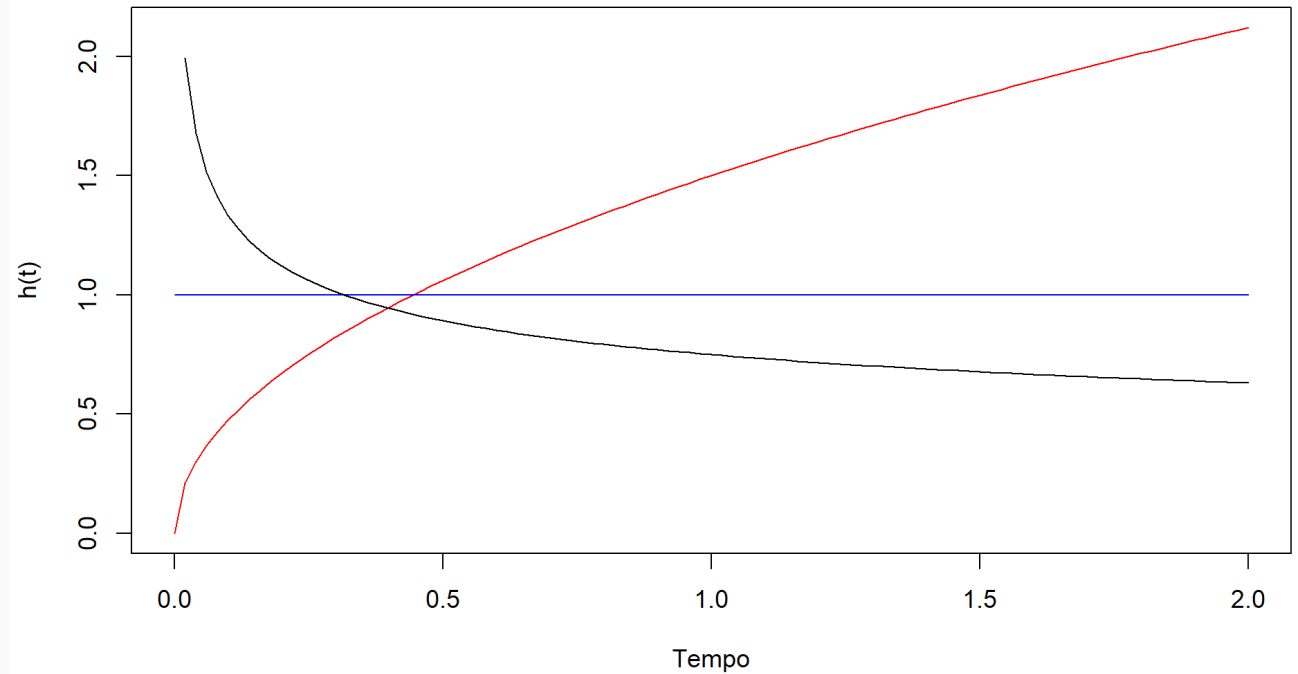
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weibHaz <- function(x, shape, scale) {  
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  pweibull(x, shape=shape, scale=scale,  
    lower.tail=F)  
}  
curve(weibHaz(x, shape=1.5, scale=1),  
  from=0, to=2,  
  ylab="h(t)", xlab="Tempo", col="red")  
curve(weibHaz(x, shape=1, scale=1),  
  from=0, to=2,  
  ylab="h(t)", xlab="Tempo", col="blue",  
  add = T)
```



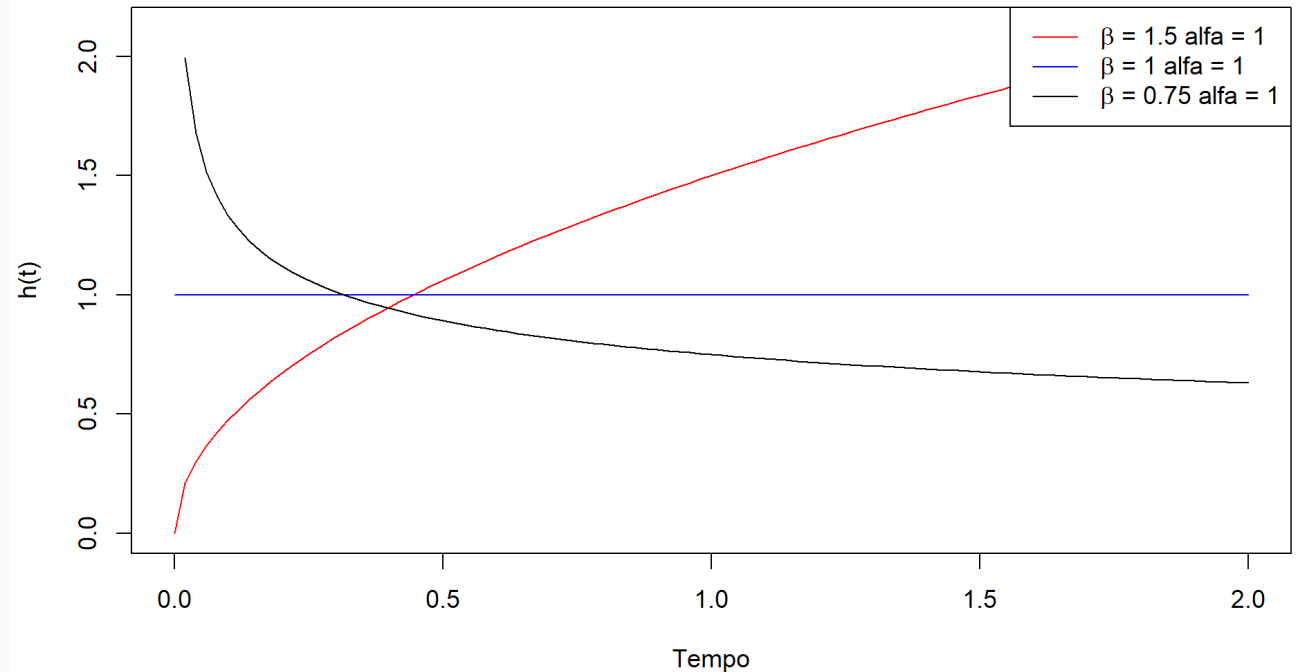
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  ylab="h(t)", xlab="Tempo", col="red")  
curve(weibHaz(x, shape=1, scale=1),  
  from=0, to=2,  
  ylab="h(t)", xlab="Tempo", col="blue",  
  add = T)  
curve(weibHaz(x, shape=0.75, scale=1),  
  from=0, to=2,  
  ylab="h(t)", xlab="Tempo", col="black",  
  add=T)
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    expression(paste(beta, " = ", 1, " ",  
    alfa, " = ", 1)),  
    expression(paste(beta, " = ", 0.75, " ",  
    alfa, " = ", 1))),  
  lty=1, col = c("red", "blue", "black"))
```

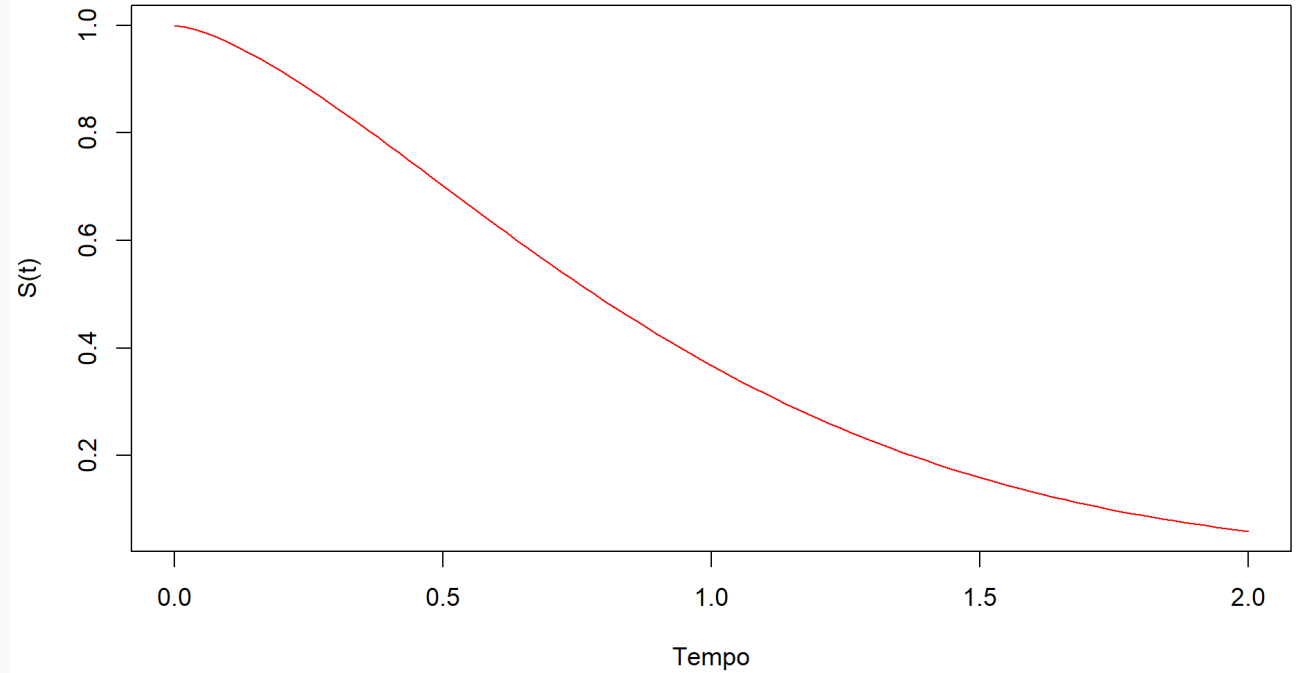


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weibSurv ← function(x, shape, scale) {  
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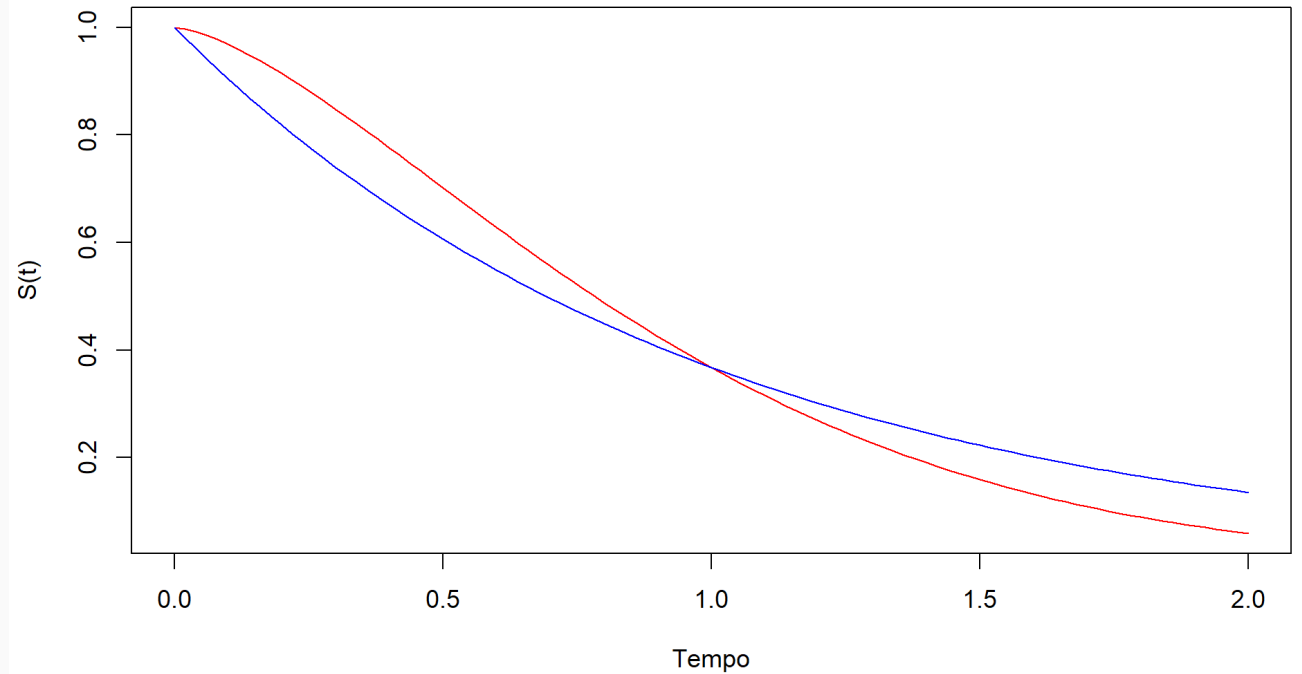
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  ylab="S(t)", xlab="Tempo", col="red")
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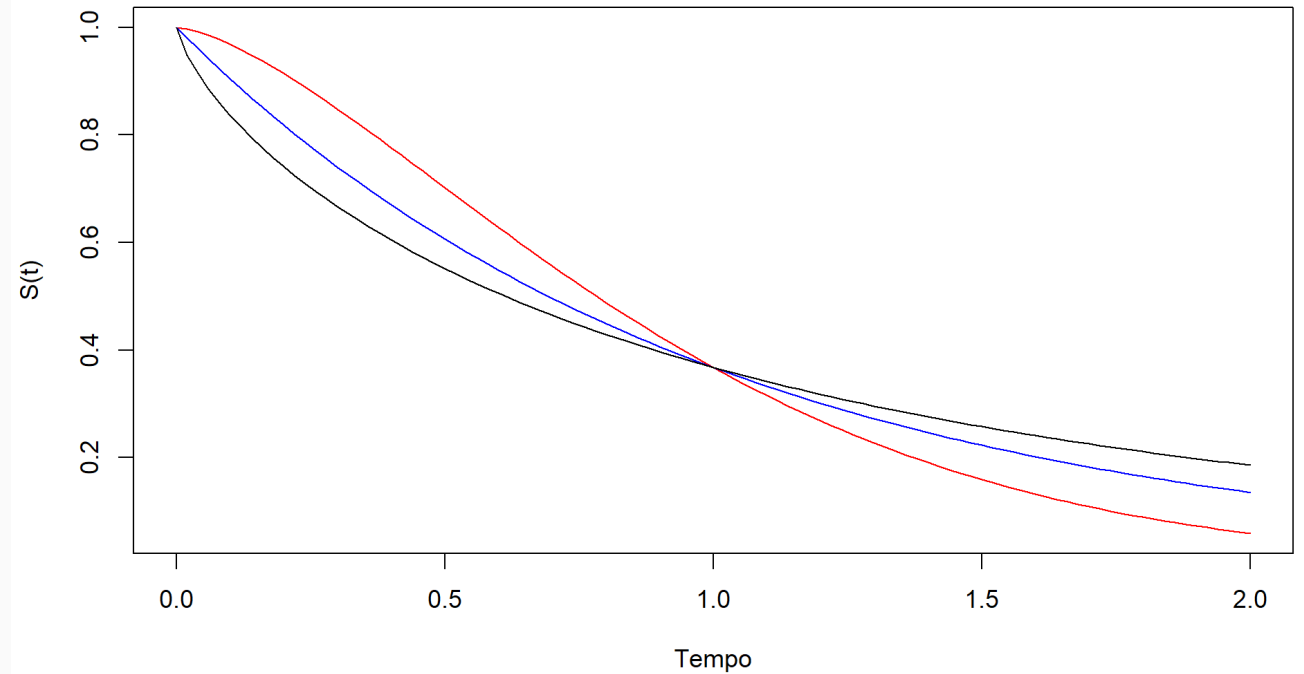
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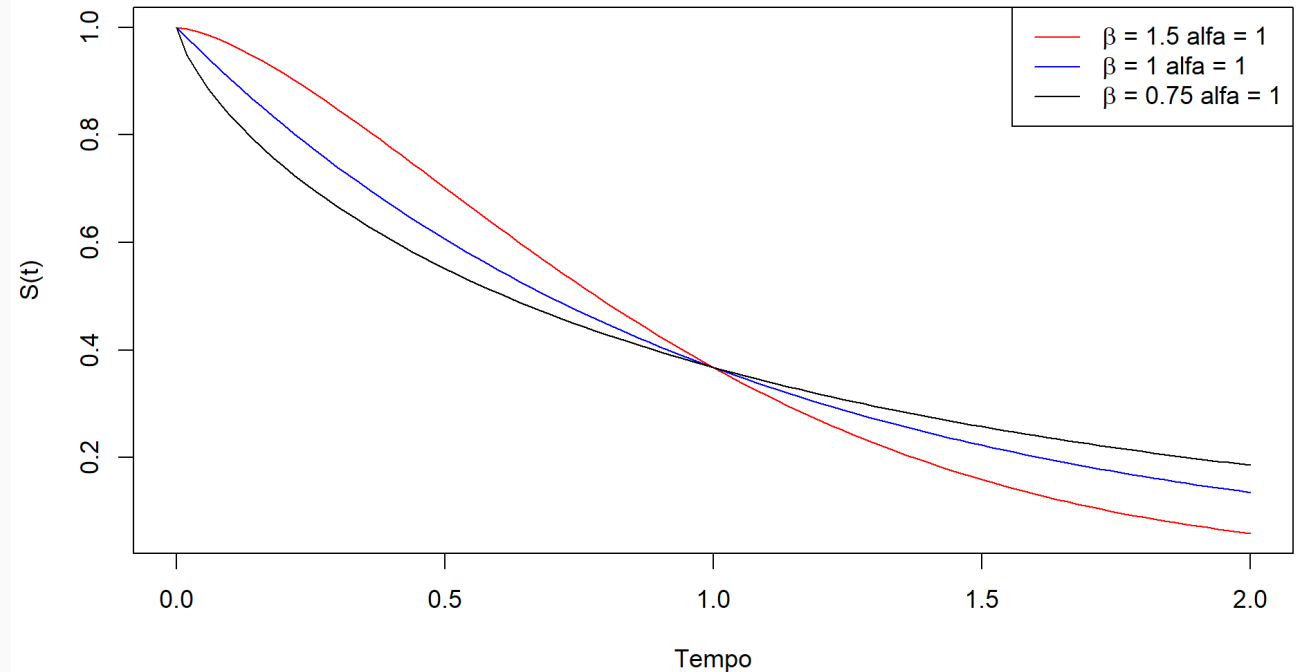
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  ylab="S(t)", xlab="Tempo", col="blue", add=T)  
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  legend = c(expression(paste(beta, " = ", 1.5, " ",  
    alfa, " = ", 1)),  
    expression(paste(beta, " = ", 1, " ",  
    alfa, " = ", 1))),  
  expression(paste(beta, " = ", 0.75, " ",  
    alfa, " = ", 1))),  
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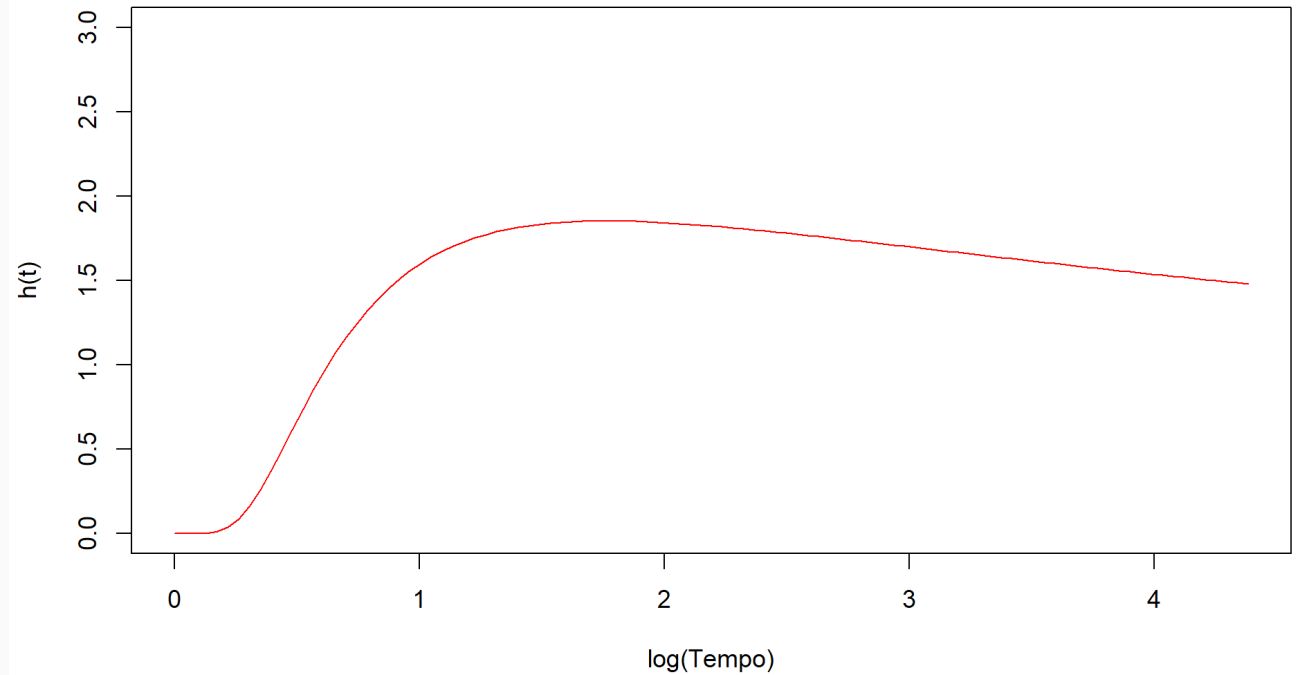


Modelos Paramétricos - Lognormal

```
logHaz ← function(x, meanlog, sdlog) {  
  dlnorm(x, meanlog=meanlog, sdlog=sdlog)/  
  plnorm(x, meanlog=meanlog, sdlog=sdlog,  
    lower.tail=F)  
}
```

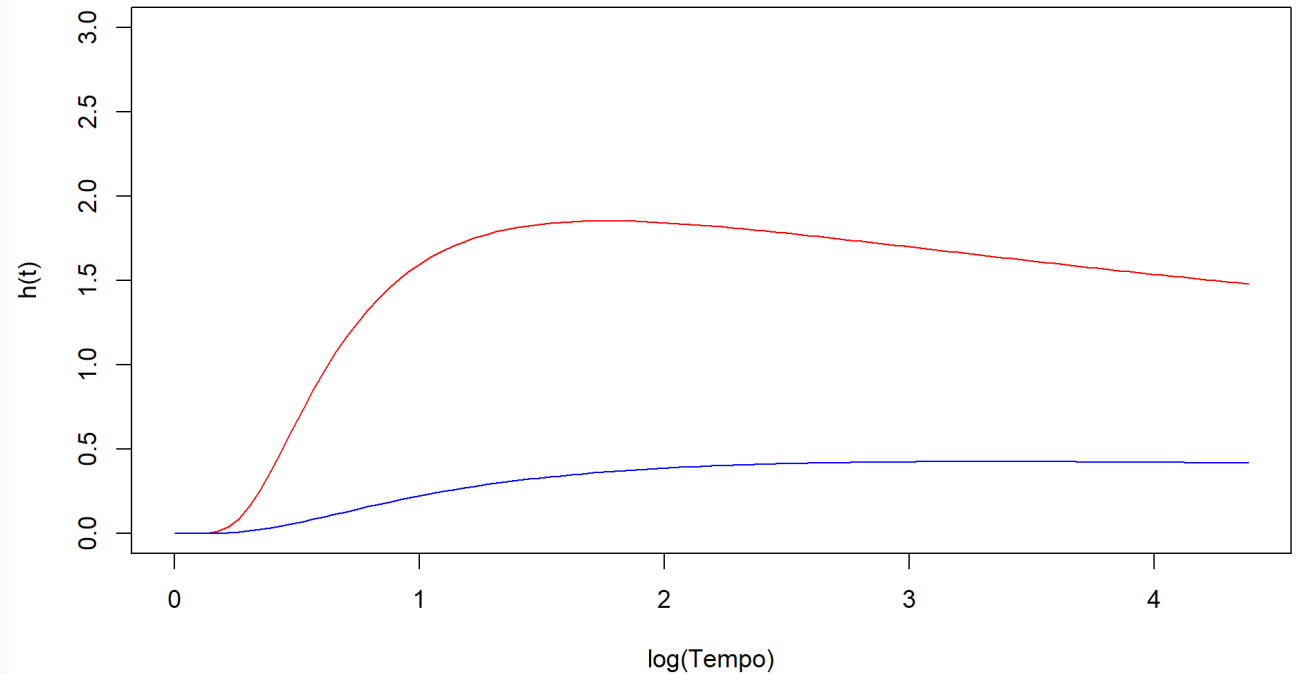
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  plnorm(x, meanlog=meanlog, sdlog=sdlog,  
    lower.tail=F)  
}  
curve(logHaz(x, meanlog=0, sdlog=0.5), from=0, to=log(80),  
  ylab="h(t)", xlab="log(Tempo)",  
  col="red", ylim=c(0,3.0))
```



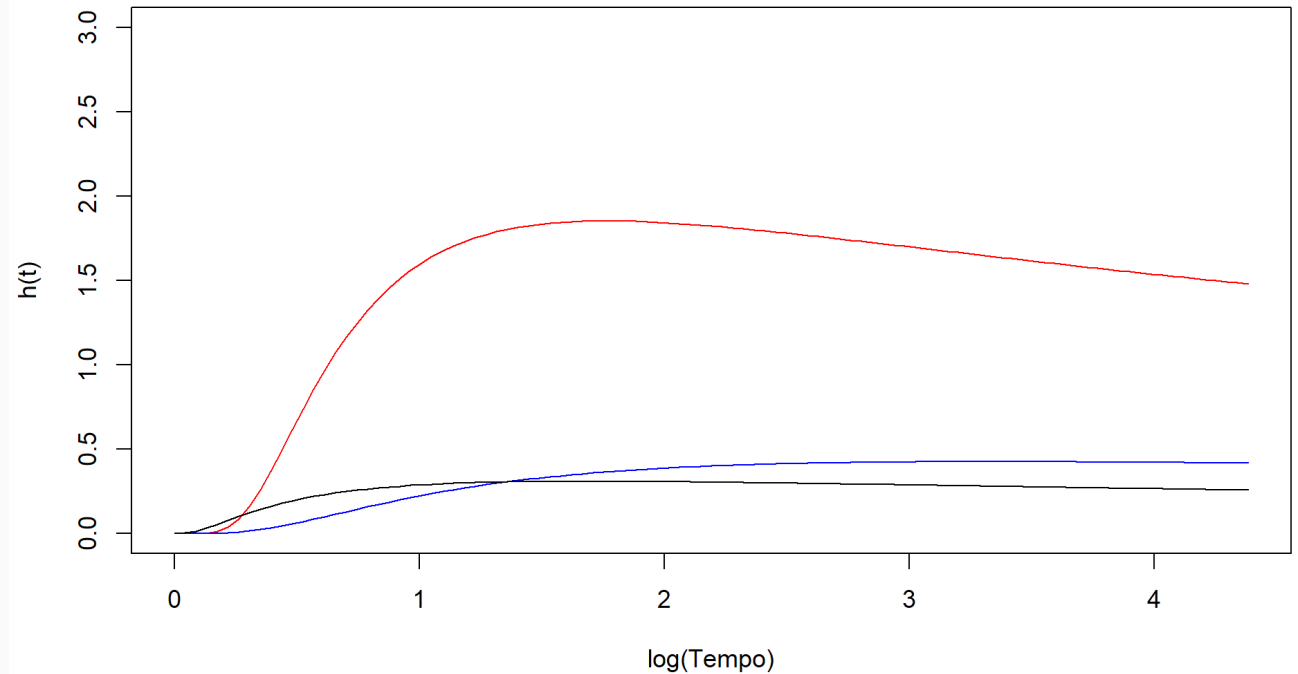
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  plnorm(x, meanlog=meanlog, sdlog=sdlog,  
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  ylab="h(t)", xlab="log(Tempo)",  
  col="red", ylim=c(0,3.0))  
curve(logHaz(x, meanlog=1, sdlog=0.7), from=0, to=log(80),  
  ylab="h(t)", xlab="Log(Tempo)",  
  col="blue", add=T)
```



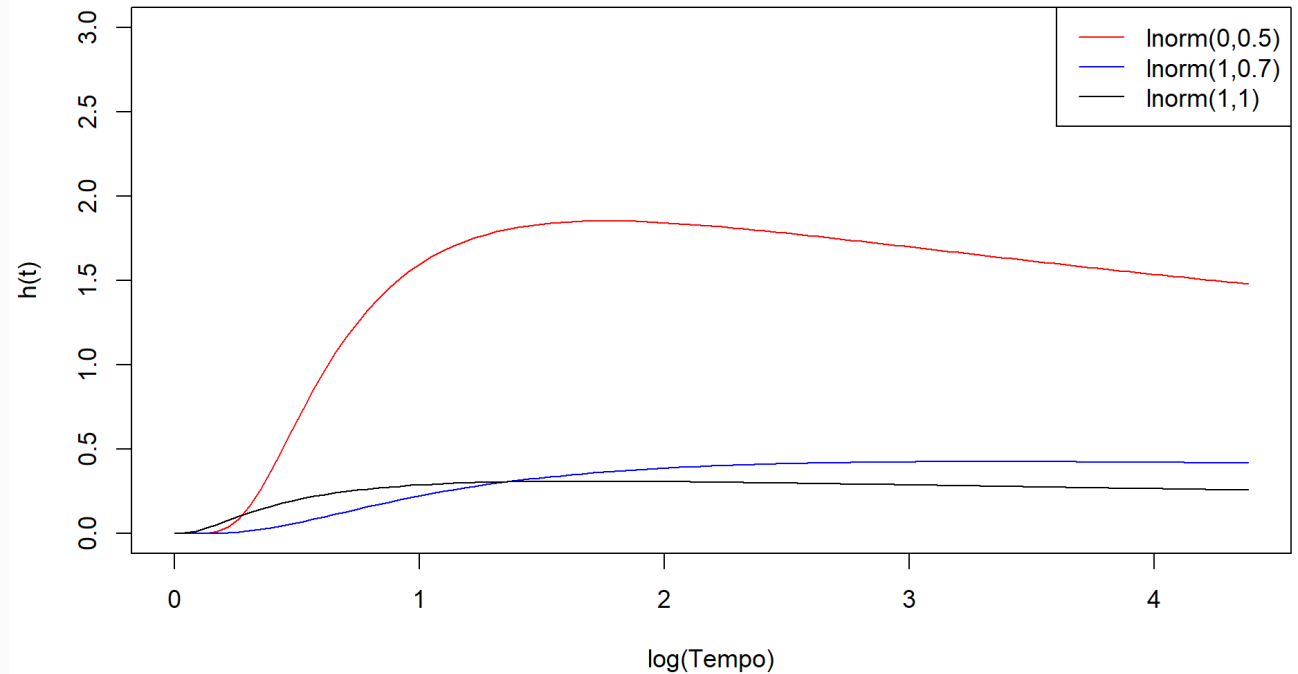
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  ylab="h(t)", xlab="Log(Tempo)",  
  col="black", add=T)  
legend("topright", c("lnorm(0,0.5)", "lnorm(1,0.7)",  
  "lnorm(1,1)"), lty=1,  
  col = c("red","blue","black"))
```

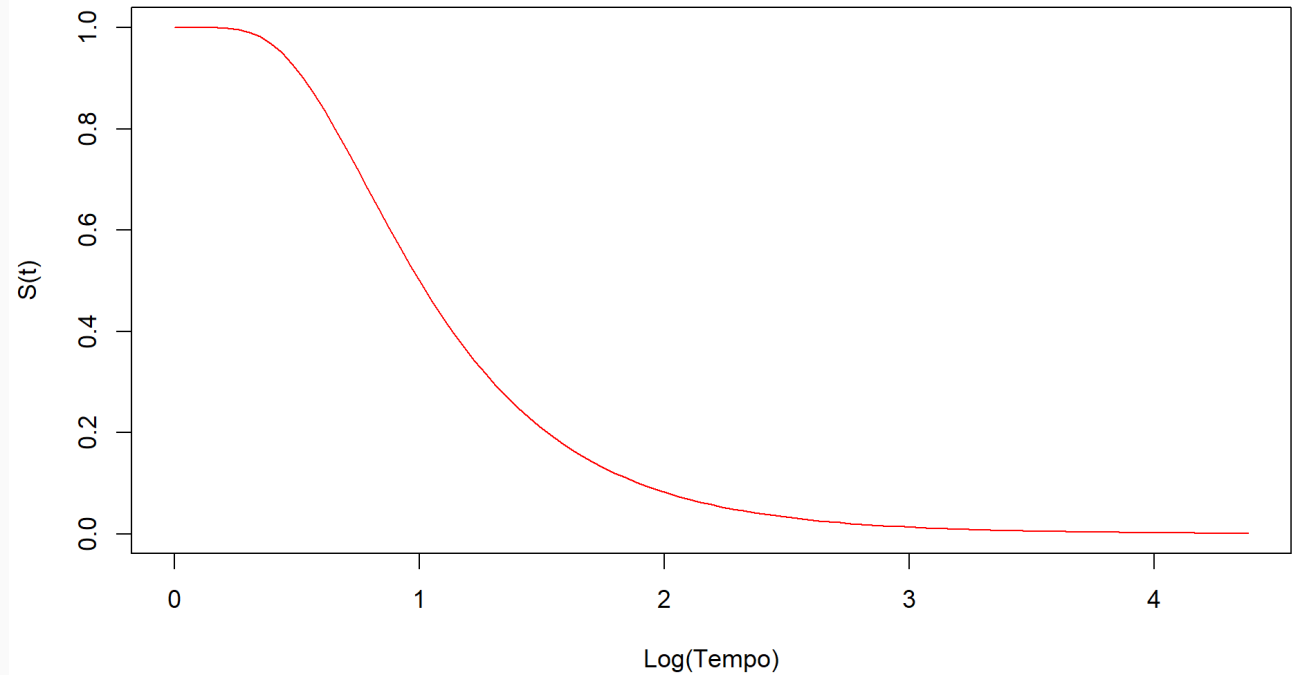


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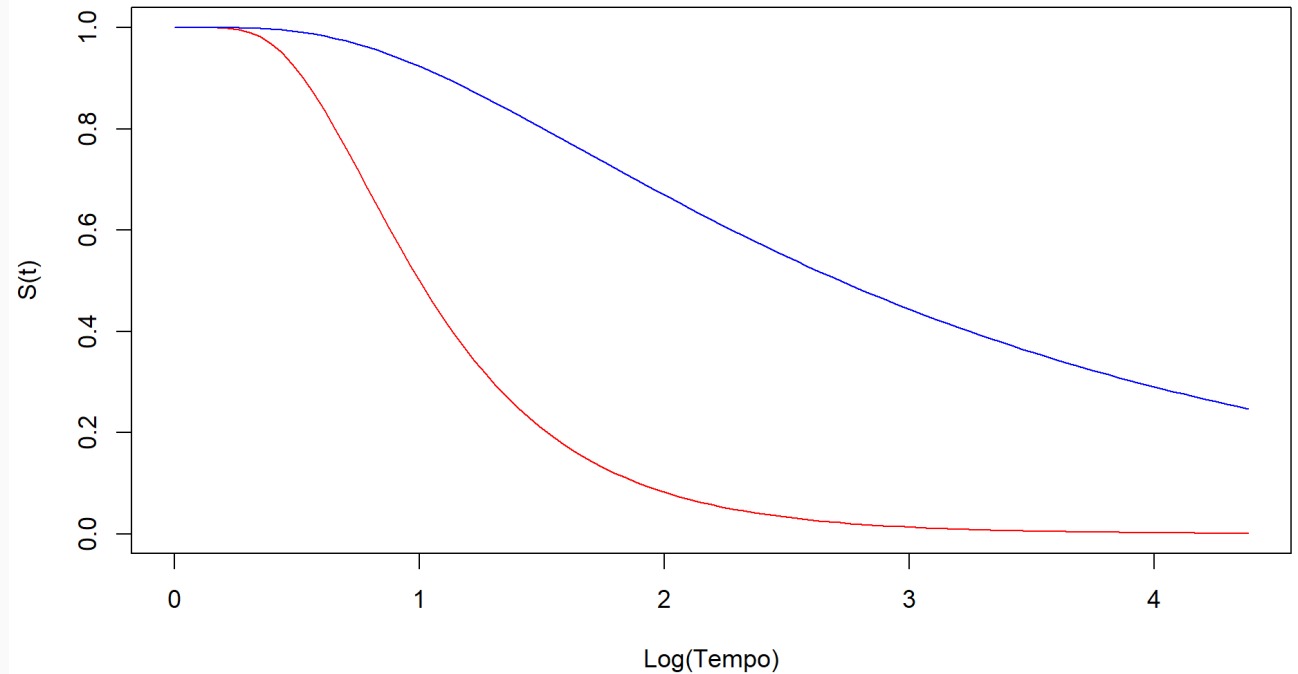
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      ylab="S(t)", xlab="Log(Tempo)",  
      col="red")
```



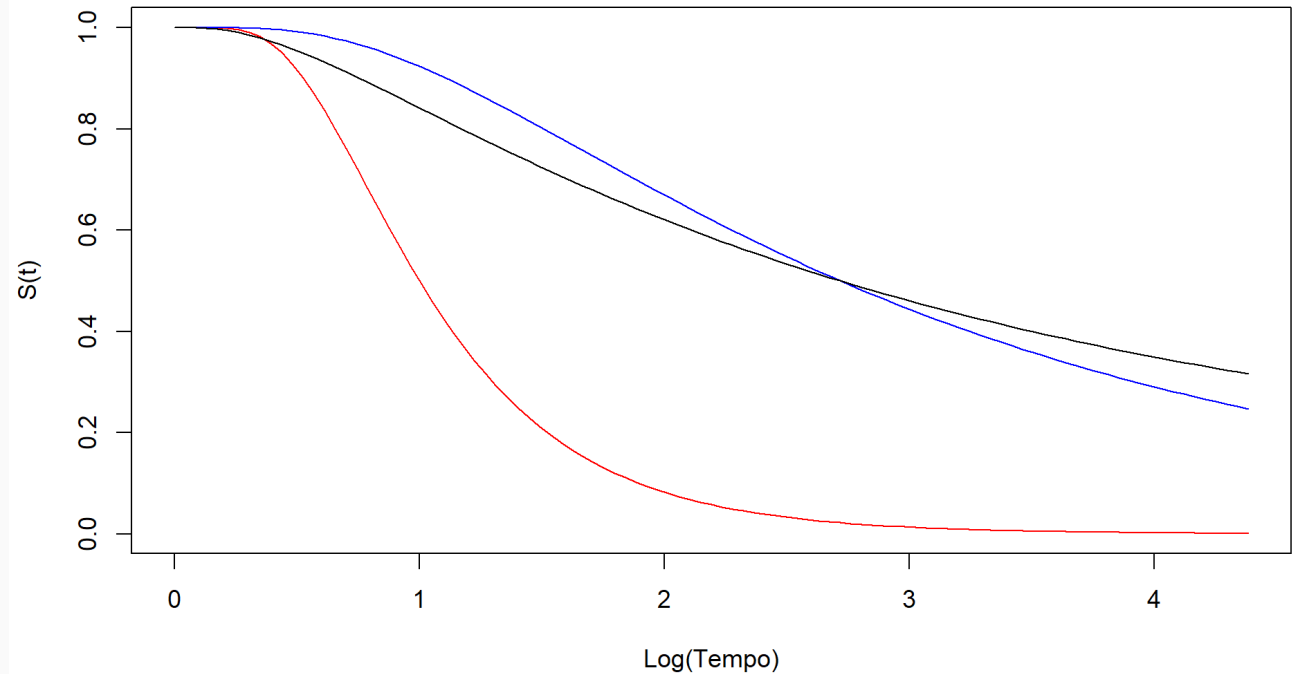
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  col="red")  
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  from=0, to=log(80),  
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```



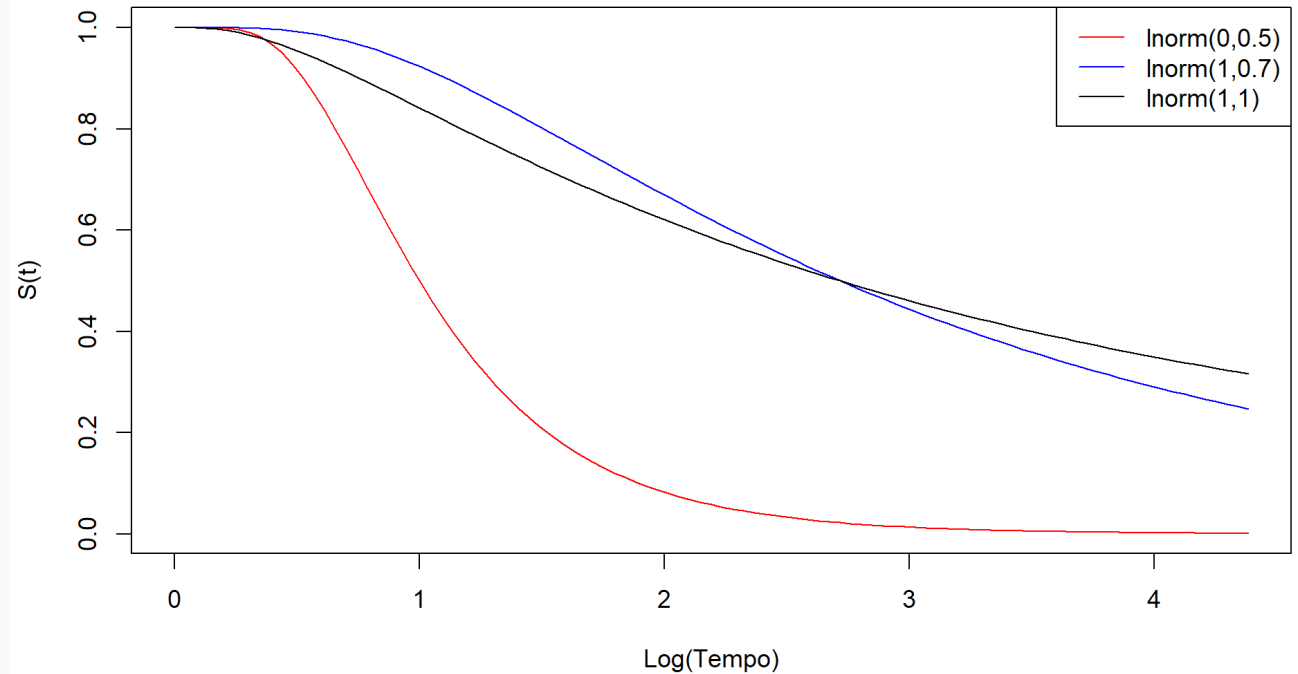
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  from=0, to=log(80),  
  ylab="S(t)", xlab="Log(Tempo)",  
  col="black", add=T)  
legend("topright", c("lnorm(0,0.5)",  
  "lnorm(1,0.7)",  
  "lnorm(1,1)"),  
  lty=1, col = c("red","blue","black"))
```

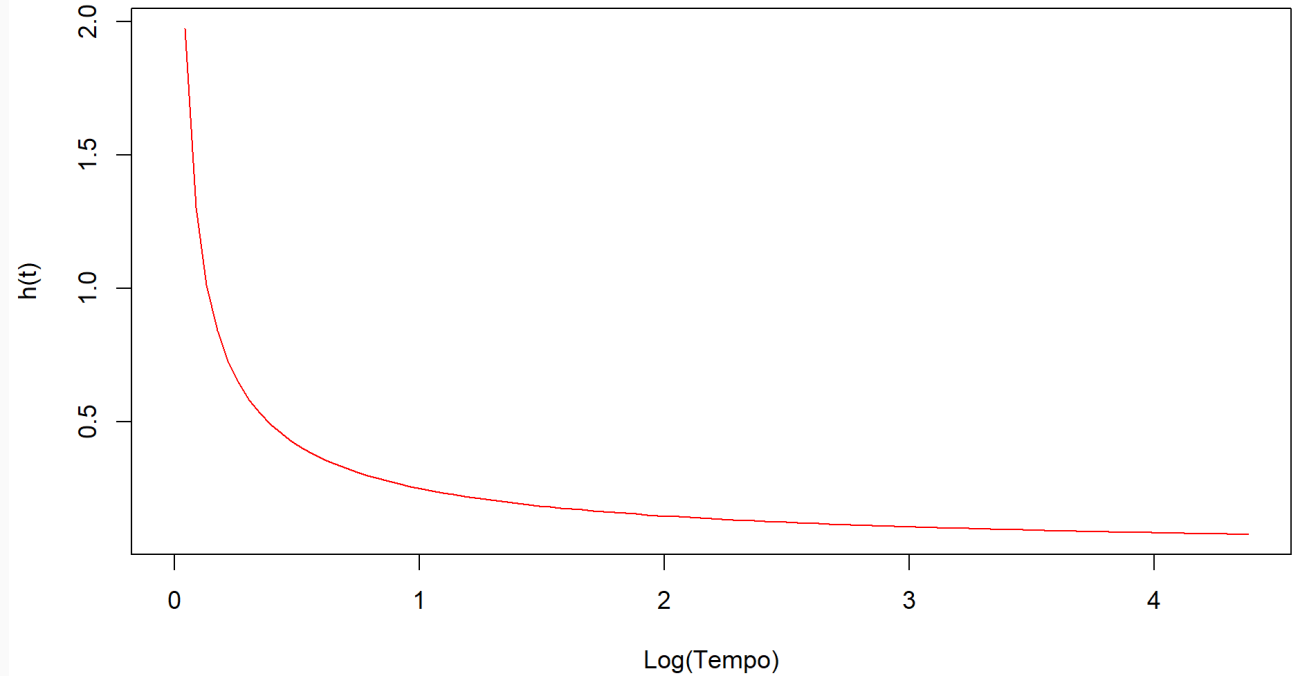


Modelos Paramétricos - Log-Logística

```
llogisHaz ← function(x, alfa, beta) {  
  haz ← beta/alfa*(x/alfa)^(beta-1)/(1+(x/alfa)^beta)  
}
```

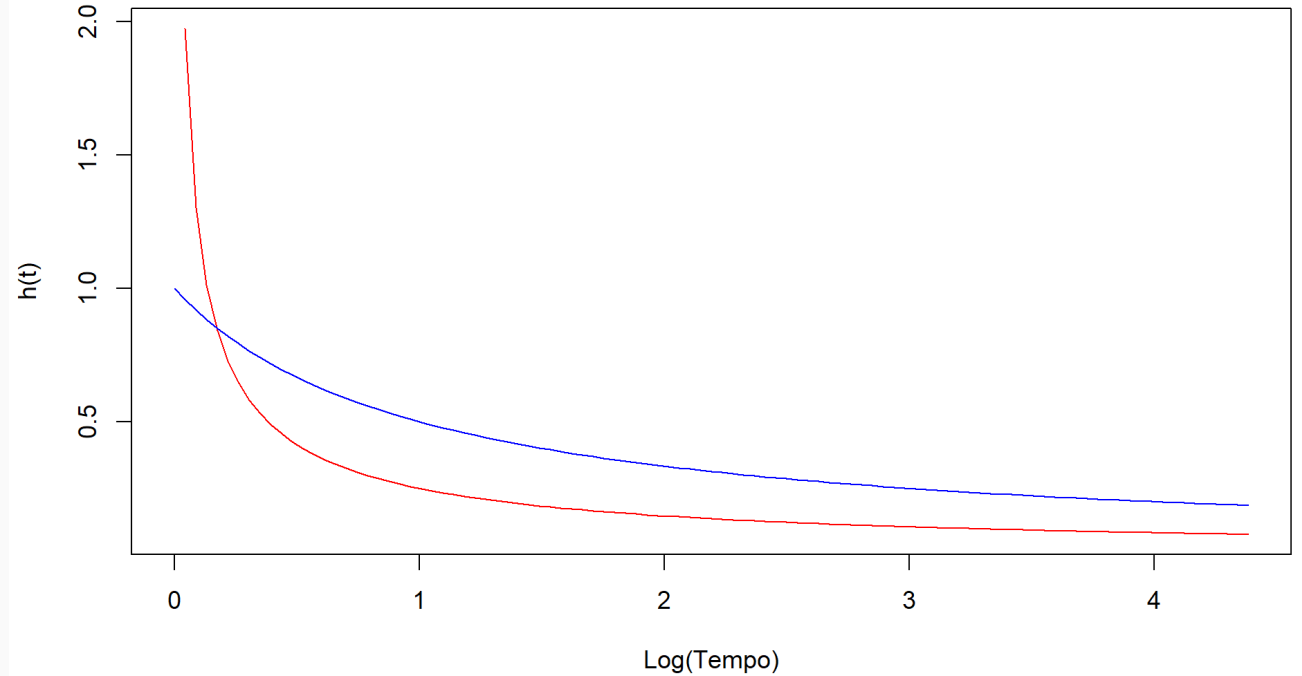
Modelos Paramétricos - Log-Logística

```
llogisHaz ← function(x, alfa, beta) {  
  haz ← beta/alfa*(x/alfa)^(beta-1)/(1+(x/alfa)^beta)  
}  
curve(llogisHaz(x, alfa=1, beta=0.5), from=0, to=log(80))  
  ylab="h(t)", xlab="Log(Tempo)", col="red")
```



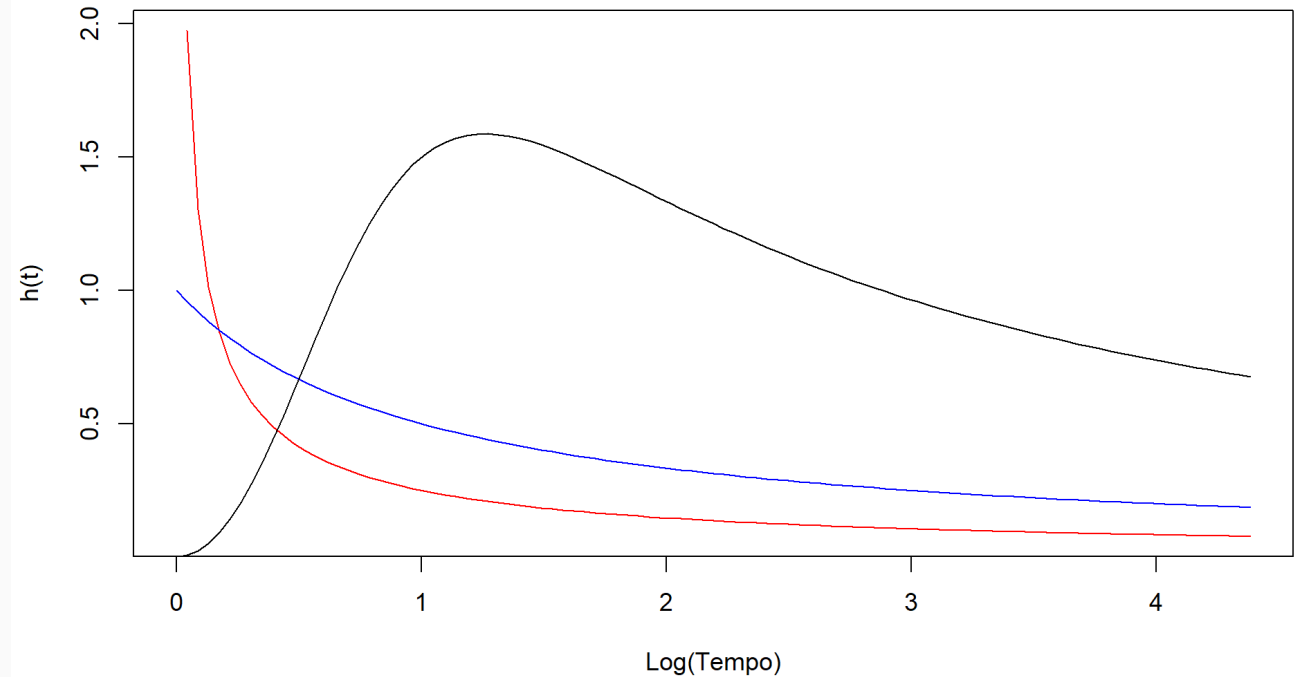
Modelos Paramétricos - Log-Logística

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}  
curve(llogisHaz(x, alfa=1, beta=0.5), from=0, to=log(80),  
      ylab="h(t)", xlab="Log(Tempo)", col="red")  
curve(llogisHaz(x, alfa=1., beta=1), from=0, to=log(80),  
      ylab="h(t)", xlab="Log(Tempo)", col="blue", add=T)
```



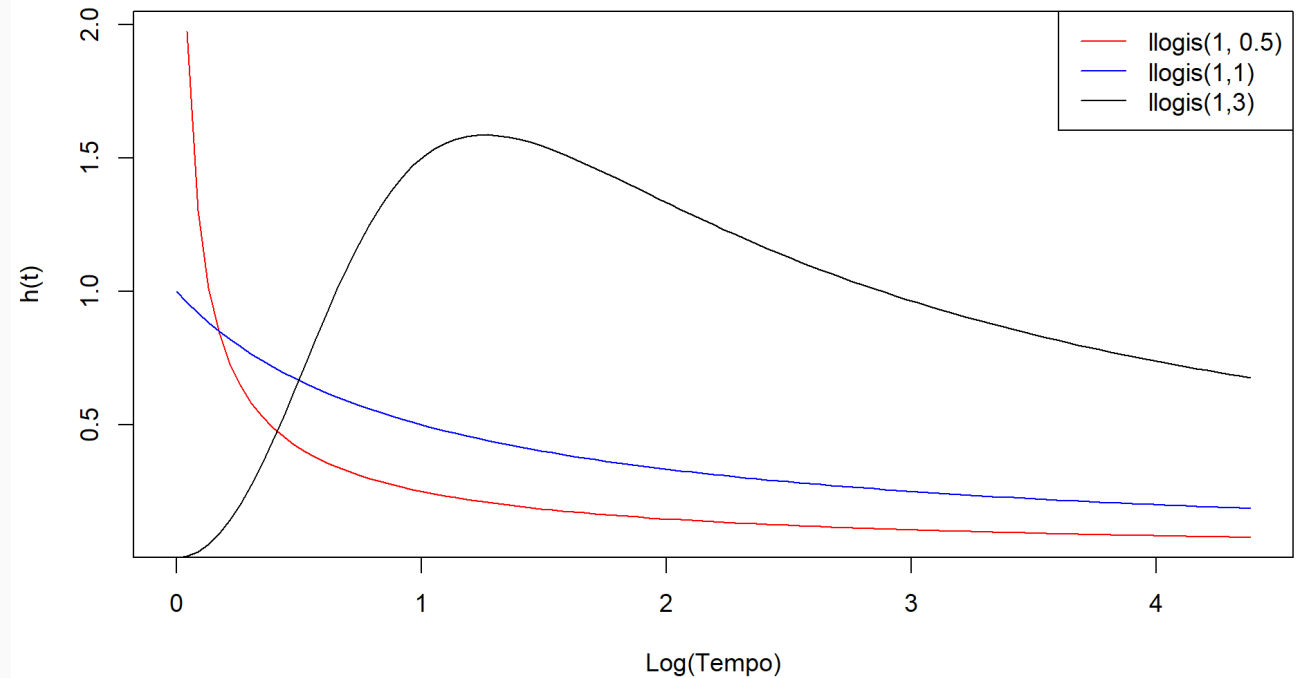
Modelos Paramétricos - Log-Logística

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llogisHaz <- function(x, alfa, beta) {  
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}  
curve(llogisHaz(x, alfa=1, beta=0.5), from=0, to=log(80),  
      ylab="h(t)", xlab="Log(Tempo)", col="red")  
curve(llogisHaz(x, alfa=1., beta=1), from=0, to=log(80),  
      ylab="h(t)", xlab="Log(Tempo)", col="blue", add=T)  
curve(llogisHaz(x, alfa=1., beta=3), from=0, to=log(80),  
      ylab="h(t)", xlab="Log(Tempo)", col="black", add=T)
```



Modelos Paramétricos - Log-Logística

```
llogisHaz <- function(x, alfa, beta) {  
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}  
curve(llogisHaz(x, alfa=1, beta=0.5), from=0, to=log(80),  
      ylab="h(t)", xlab="Log(Tempo)", col="red")  
curve(llogisHaz(x, alfa=1., beta=1), from=0, to=log(80),  
      ylab="h(t)", xlab="Log(Tempo)", col="blue", add=T)  
curve(llogisHaz(x, alfa=1., beta=3), from=0, to=log(80),  
      ylab="h(t)", xlab="Log(Tempo)", col="black", add=T)  
legend("topright", c("llogis(1, 0.5)", "llogis(1,1)",  
                     "llogis(1,3)"),  
      lty=1, col = c("red","blue","black"))
```

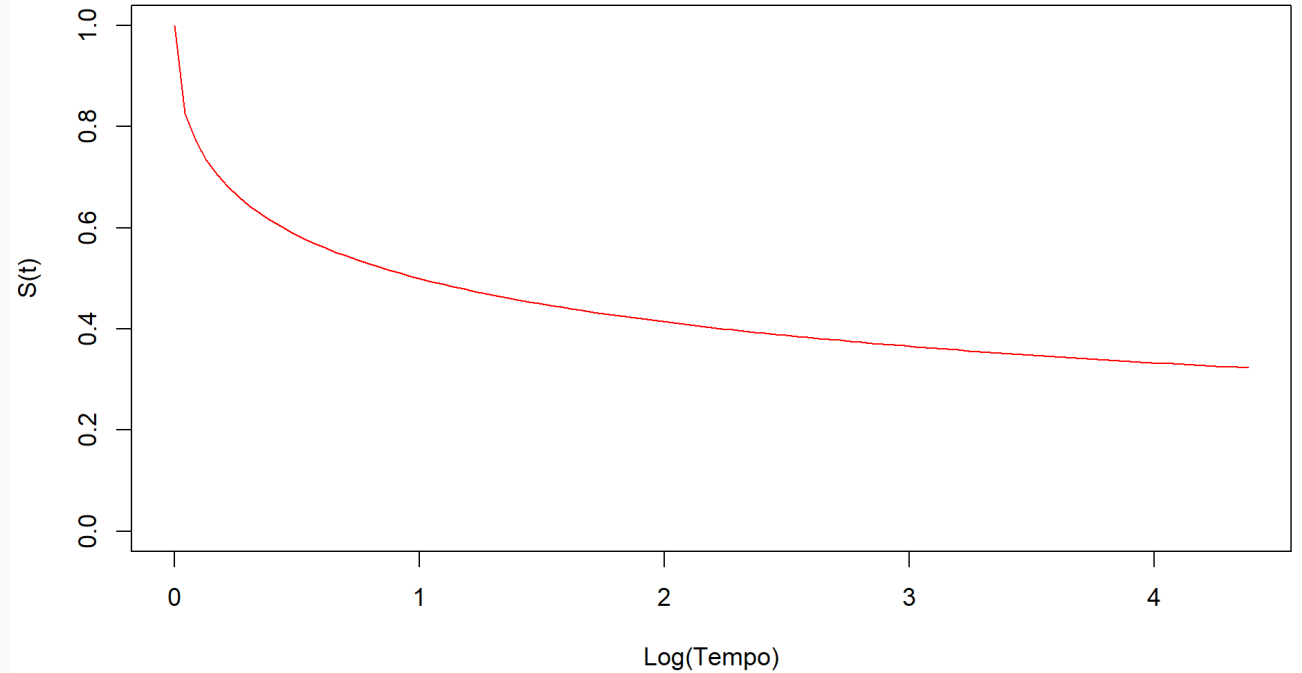


Modelos Paramétricos - Log-Logística

```
llogisSurv <- function(x, alfa, beta) {  
  surv <- 1/(1+(x/alfa)^beta)  
}
```

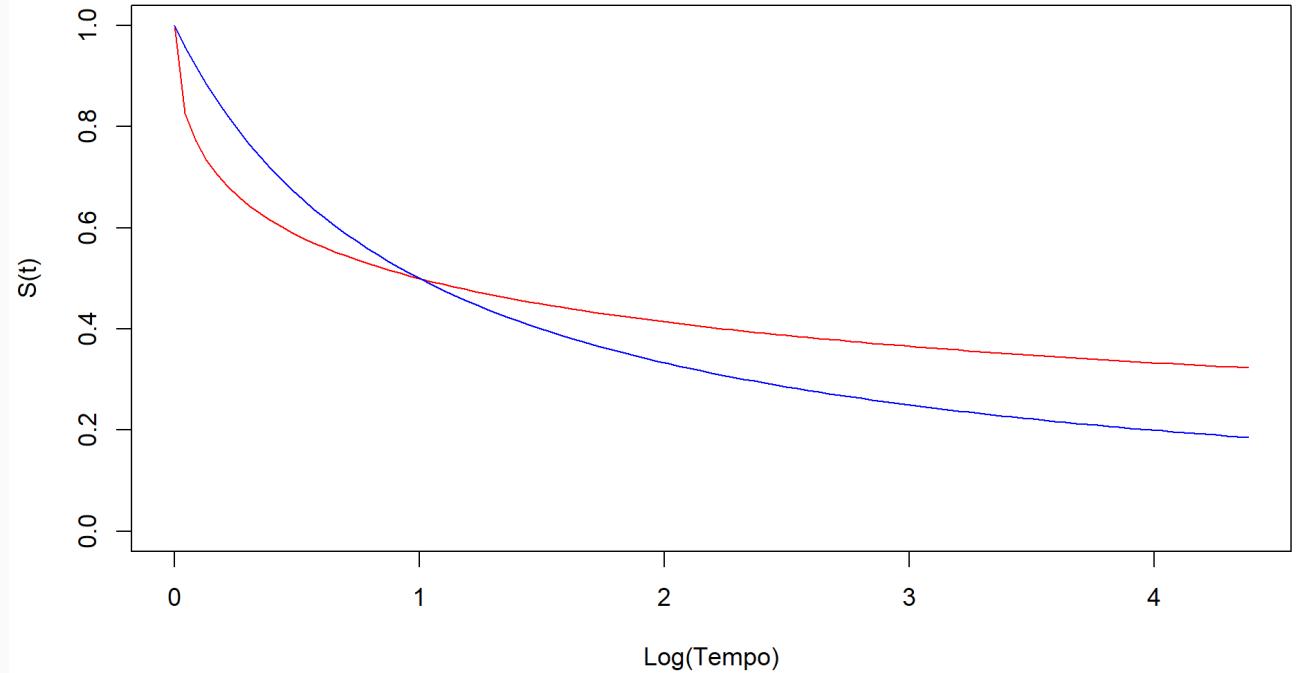

Modelos Paramétricos - Log-Logística

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llogisSurv <- function(x, alfa, beta) {  
  surv <- 1/(1+(x/alfa)^beta)  
}  
curve(llogisSurv(x, alfa=1, beta=0.5),  
      from=0, to=log(80),  
      ylab="S(t)", xlab="Log(Tempo)",  
      col="red", ylim=c(0,1))
```



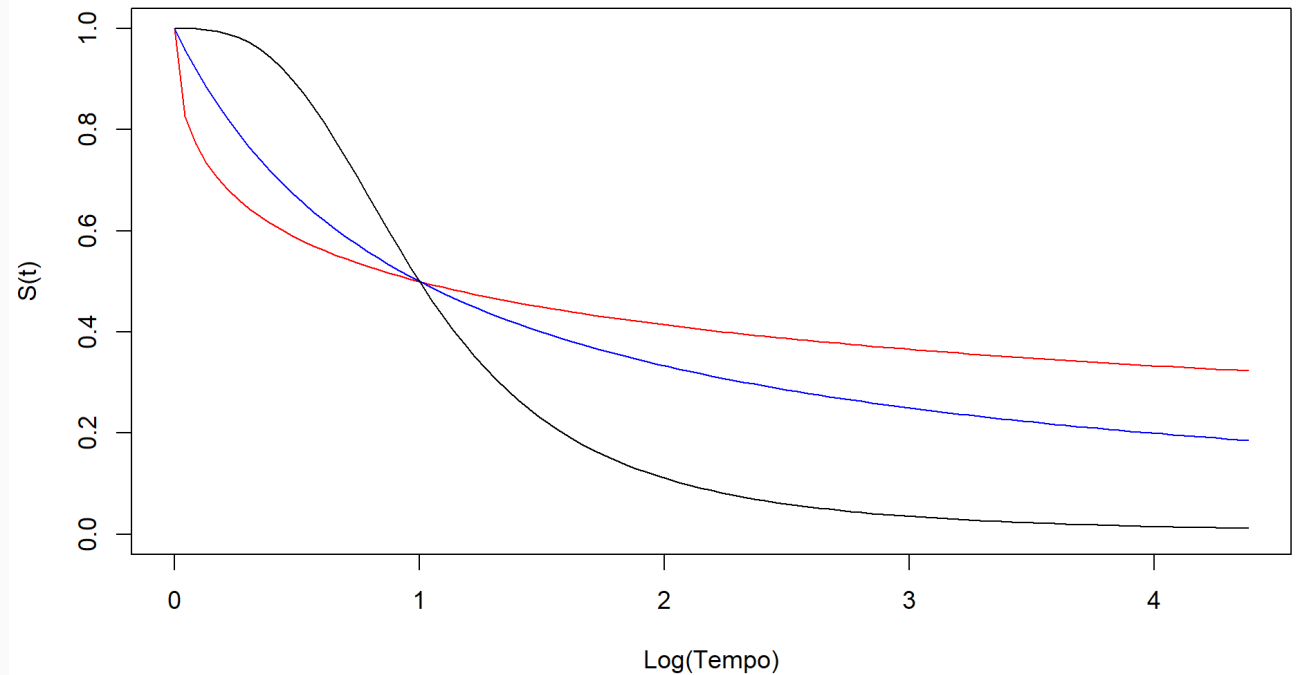
Modelos Paramétricos - Log-Logística

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      from=0, to=log(80),  
      ylab="S(t)", xlab="Log(Tempo)",  
      col="red", ylim=c(0,1))  
curve(llogisSurv(x, alfa=1, beta=1),  
      from=0, to=log(80),  
      ylab="S(t)", xlab="Log(Tempo)",  
      col="blue", add=T)
```



Modelos Paramétricos - Log-Logística

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}  
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      col="red", ylim=c(0,1))  
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      ylab="S(t)", xlab="Log(Tempo)",  
      col="blue", add=T)  
curve(llogisSurv(x, alfa=1, beta=3),  
      from=0, to=log(80),  
      ylab="S(t)", xlab="Log(Tempo)",  
      col="black", add=T)
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Modelos Paramétricos - Log-Logística

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      from=0, to=log(80),  
      ylab="S(t)", xlab="Log(Tempo)",  
      col="red", ylim=c(0,1))  
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      from=0, to=log(80),  
      ylab="S(t)", xlab="Log(Tempo)",  
      col="blue", add=T)  
curve(llogisSurv(x, alfa=1, beta=3),  
      from=0, to=log(80),  
      ylab="S(t)", xlab="Log(Tempo)",  
      col="black", add=T)  
legend("topright", c("llogis(1, 0.5)",  
                     "llogis(1,1)",  
                     "llogis(1,3)"),  
      lty=1, col = c("red","blue","black"))
```

