

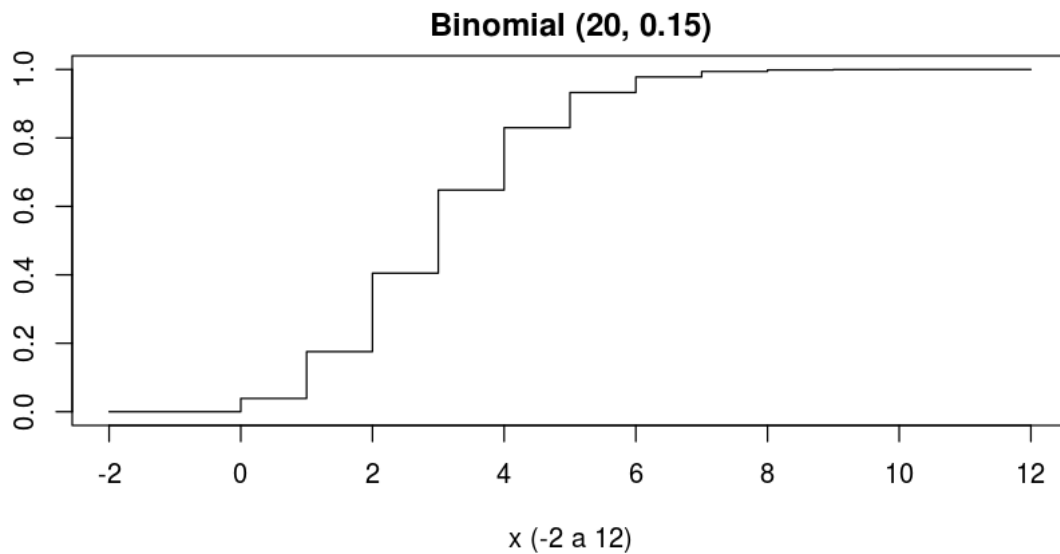
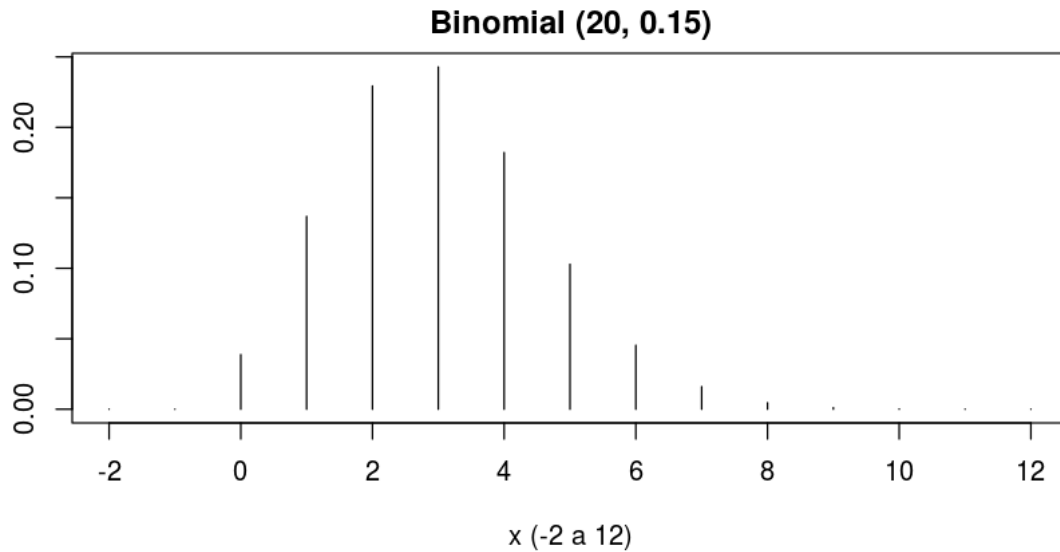
Fundamentos Est. para Ciencia dos Dados - Lista 4

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1 Questão 1

```
In [189]: par(mar=c(4,2,2,2),mfrow=c(2,1))
          x <- seq(-2,12)
          pX <- dbinom(x, 20, 0.15)
          plot(x,pX, type = "h", main="Binomial (20, 0.15)",
              ylab="Distribuição", xlab="x (-2 a 12)")
          FX <- pbinom(x, 20, 0.15)
          plot(x,FX, type = "s", main="Binomial (20, 0.15)",
              ylab="Acumulada", xlab="x (-2 a 12)")
```

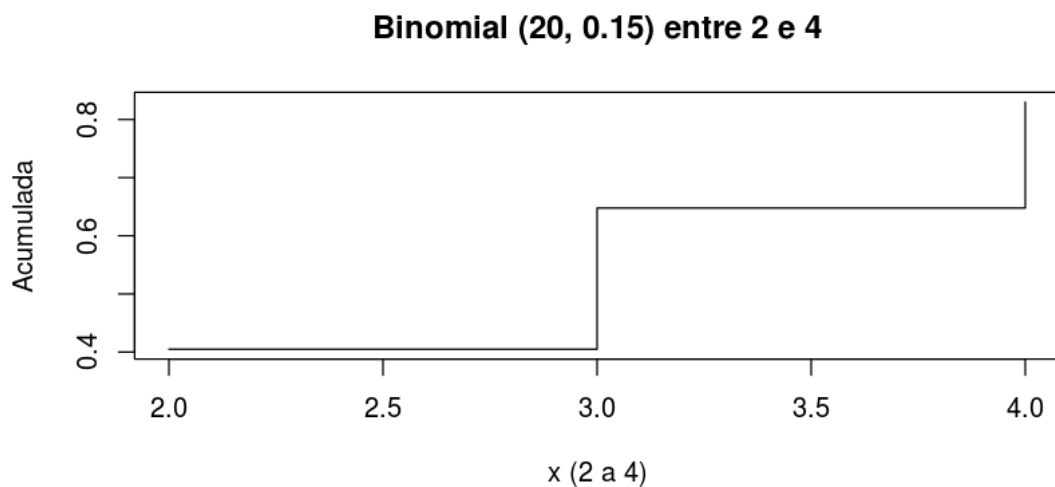
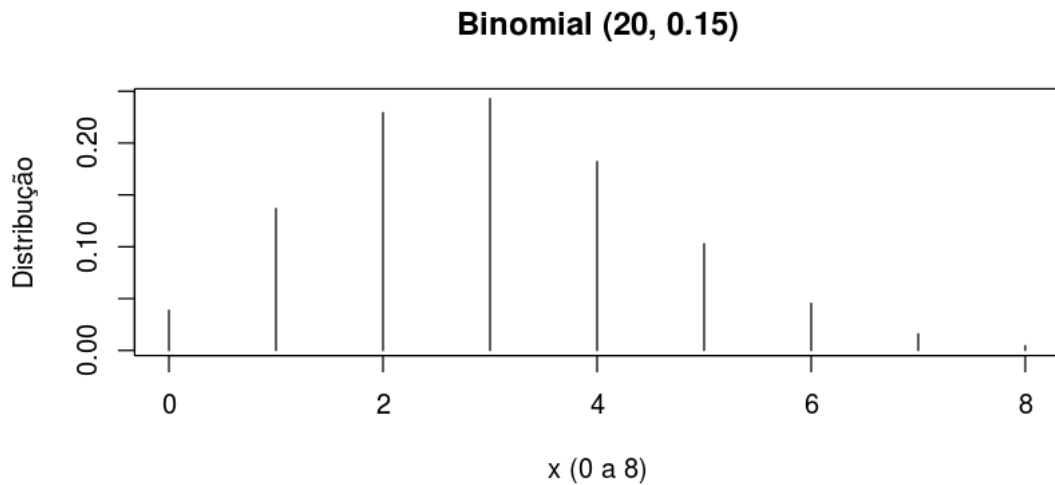


```
In [190]: k = x[match(max(pX),pX)] #P(X = k) máximo é quando k = 3
          maxP = max(pX) # a probabilidade máxima é 24.3% aproximadamente
          paste("Valor máximo quando k = ", k, " e a probabilidade é ", maxP)
```

'Valor máximo quando k = 3 e a probabilidade é 0.242828896149268'

```
In [191]: x2 <- c(0:8)
          pX2 <- dbinom(x2, 20, 0.15)
          par(mfrow=c(2,1))
          plot(x2,pX2, type = "h", main="Binomial (20, 0.15)",
               ylab="Distribuição", xlab="x (0 a 8)")
          eX = 20 * 0.15
          li = eX-1
```

```
ls = eX+1
FX <- pbinom(li:ls, 20, 0.15)
plot(li:ls,FX, type = "s", main="Binomial (20, 0.15) entre 2 e 4"
      , ylab="Acumulada", xlab="x (2 a 4)")
#O valor acumulado no entorno de E(X) é bem alto (perto de 65%)
```



```
In [192]: eX = 20 * 0.15
li = eX-1
ls = eX+1
calcSum <- sum(dbinom(li:ls, 20, 0.15))
calcSub <- pbinom(ls,20, 0.15) - pbinom(li-0.01, 20, 0.15)
# Eh necessario subtrair 0.01 porque senao o valor do limite inferior
# será subtraído do resultado, o que nao eh o que queremos.
```

```

paste("Somando as distribuições: ", calcSum,
      ". Subtraindo os acumulados dos extremos: ", calcSub)

'Somando as distribuições: 0.654288970179971 . Subtraindo os acumulados dos extremos:
0.654288970179971'

In [193]: paste("Quartil ~ 0.95 = ", qbinom(0.95, 20, 0.15))

'Quartil ~ 0.95 = 6'

In [194]: paste("Probabilidade do quartil ~ 0.95: ", pbinom(6,20,0.15))

'Probabilidade do quartil ~ 0.95: 0.978064899143155'

In [195]: size <- 1000
v <- rbinom(size, 20, 0.15)
eX = 20 * 0.15
li = eX-1
ls = eX+1
# Sim, 63% dos valores caíram na faixa, o que era esperado.
paste("% de valores que caíram na faixa delimitada: ",
      length(v[v >= li & v <= ls])/size * 100)

'% de valores que caíram na faixa delimitada: 65.1'

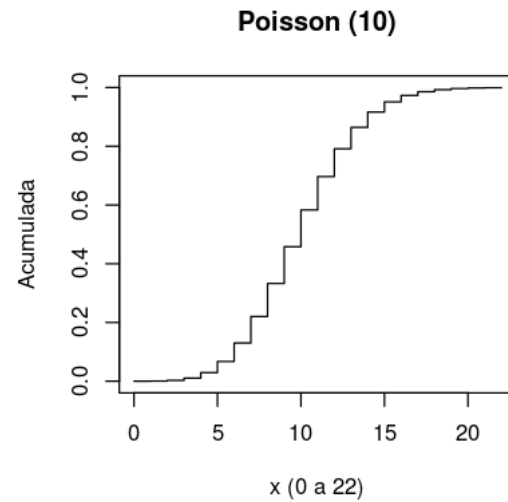
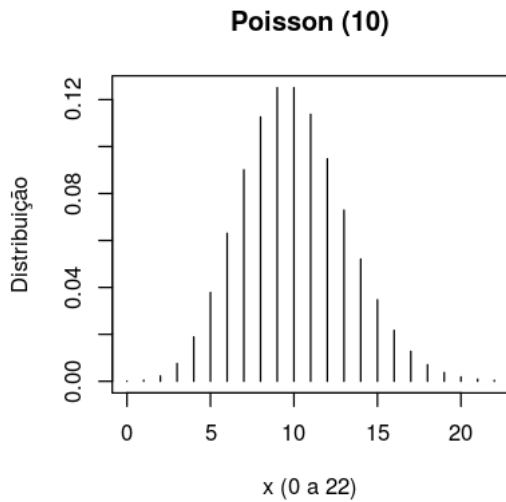
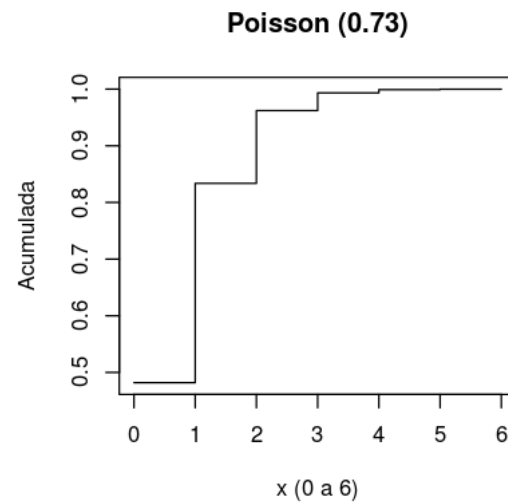
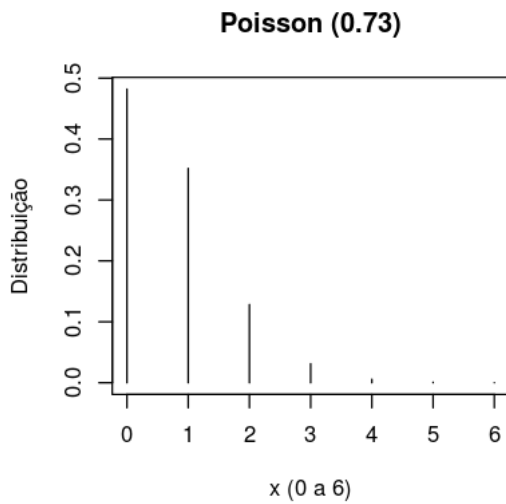
In [196]: size = 300
v <- rbinom(size, 20, 0.15)
paste("Bin(20, 0.15), X = 0, Distribuição: ",
      dbinom(0,20,0.15), "; Frequencia: ", length(v[v == 0])/size)
paste("Bin(20, 0.15), X = 1, Distribuição: ",
      dbinom(1,20,0.15), "; Frequencia: ", length(v[v == 1])/size)
paste("Bin(20, 0.15), X = 2, Distribuição: ",
      dbinom(2,20,0.15), "; Frequencia: ", length(v[v == 2])/size)
paste("Bin(20, 0.15), X = 3, Distribuição: ",
      dbinom(3,20,0.15), "; Frequencia: ", length(v[v == 3])/size)
paste("Bin(20, 0.15), X = 4, Distribuição: ",
      dbinom(4,20,0.15), "; Frequencia: ", length(v[v == 4])/size)
paste("Bin(20, 0.15), X = 5, Distribuição: ",
      dbinom(5,20,0.15), "; Frequencia: ", length(v[v == 5])/size)
paste("Bin(20, 0.15), X = 6, Distribuição: ",
      dbinom(6,20,0.15), "; Frequencia: ", length(v[v == 6])/size)
# Sim, os valores sao parecidos.

'Bin(20, 0.15), X = 0, Distribuição: 0.0387595310845143 ; Frequencia: 0.0233333333333333'
'Bin(20, 0.15), X = 1, Distribuição: 0.136798345004168 ; Frequencia: 0.133333333333333'
'Bin(20, 0.15), X = 2, Distribuição: 0.229338401918753 ; Frequencia: 0.226666666666667'
'Bin(20, 0.15), X = 3, Distribuição: 0.242828896149268 ; Frequencia: 0.24'
'Bin(20, 0.15), X = 4, Distribuição: 0.182121672111951 ; Frequencia: 0.196666666666667'
'Bin(20, 0.15), X = 5, Distribuição: 0.102845179545572 ; Frequencia: 0.0966666666666667'
'Bin(20, 0.15), X = 6, Distribuição: 0.0453728733289289 ; Frequencia: 0.0533333333333333'

```

2 Questao 2

```
In [197]: x1 <- c(0:6)
          x2 <- c(0:22)
          eX1 = 0.73
          eX2 = 10
          pX1 <- dpois(x1, eX1)
          FX1 <- ppois(x1, eX1)
          pX2 <- dpois(x2, eX2)
          FX2 <- ppois(x2, eX2)
          par(mfrow=c(2,2))
          plot(x1,pX1, type = "h", main="Poisson (0.73)"
               , ylab="Distribuição", xlab="x (0 a 6)")
          plot(x1,FX1, type = "s", main="Poisson (0.73)"
               , ylab="Acumulada", xlab="x (0 a 6)")
          plot(x2,pX2, type = "h", main="Poisson (10)"
               , ylab="Distribuição", xlab="x (0 a 22)")
          plot(x2,FX2, type = "s", main="Poisson (10)"
               , ylab="Acumulada", xlab="x (0 a 22)")
```



```
In [198]: x1 <- c(-1:6)
          x2 <- c(0:21)
          eX1 = 0.73
          eX2 = 10
          pX1 <- dpois(x1, eX1)
          FX1 <- ppois(x1, eX1)
          pX2 <- dpois(x2, eX2)
          FX2 <- ppois(x2, eX2)
          paste("Poisson (0.73) E(X) = 0.73, k obtido: ",
                x1[match(max(pX1), pX1)])
          paste("Poisson (10) E(X) = 10, k obtido: ",
                x2[match(max(pX2), pX2)])
          #Sim, o valor k obtido é próximo ao valor esperado
```

#(0 quando $E(x) = 0.73$ e 9 quando $E(x) = 10$)

'Poisson (0.73) $E(X) = 0.73$, k obtido: 0'

'Poisson (10) $E(X) = 10$, k obtido: 9'

```
In [199]: x1 <- c(0:3)
          x2 <- c(3:20)
          eX1 = 0.73
          eX2 = 10
          paste("Poisson (0.73) - 0 a 3 - soma: ",
                sum(dpois(x1, eX1)))
          paste("Poisson (10) - 3 a 20 - soma: ",
                sum(dpois(x2, eX2)))
```

'Poisson (0.73) - 0 a 3 - soma: 0.993352334865238'

'Poisson (10) - 3 a 20 - soma: 0.99564234362263'

```
In [200]: x1 <- c(0:3)
          x2 <- c(3:20)
          eX1 = 0.73
          eX2 = 10
          paste("Poisson (0.73) - 0 a 3 - soma pela dif: ",
                ppois(3,eX1)-ppois(0-0.01,eX1))
          paste("Poisson (10) - 3 a 20 - soma pela dif: ",
                ppois(20,eX2)-ppois(3-0.01,eX2))
```

'Poisson (0.73) - 0 a 3 - soma pela dif: 0.993352334865238'

'Poisson (10) - 3 a 20 - soma pela dif: 0.99564234362263'

```
In [201]: size = 1000
          eX1 = 0.73
          eX2 = 10
          x1_200poison = rpois(size, eX1)
          x2_200poison = rpois(size, eX2)
          #
          X_val = c(0,1,2,3,4,5,6)
          poi_0_73_d <- c(dpois(0,eX1))
          poi_0_73_f <- c(length(x1_200poison[x1_200poison == 0])/size)
          poi_10_d <- c(dpois(0,eX2))
          poi_10_f <- c(length(x2_200poison[x2_200poison == 0])/size)

          poi_0_73_d <- c(poi_0_73_d, dpois(1,eX1))
          poi_0_73_f <- c(poi_0_73_f, length(x1_200poison[x1_200poison == 1])/size)
          poi_10_d <- c(poi_10_d, dpois(1,eX2))
          poi_10_f <- c(poi_10_f, length(x2_200poison[x2_200poison == 1])/size)

          poi_0_73_d <- c(poi_0_73_d, dpois(2,eX1))
          poi_0_73_f <- c(poi_0_73_f, length(x1_200poison[x1_200poison == 2])/size)
          poi_10_d <- c(poi_10_d, dpois(2,eX2))
```

```

poi_10_f <- c(poi_10_f, length(x2_200poison[x2_200poison == 2])/size)

poi_0_73_d <- c(poi_0_73_d, dpois(3,eX1))
poi_0_73_f <- c(poi_0_73_f, length(x1_200poison[x1_200poison == 3])/size)
poi_10_d <- c(poi_10_d, dpois(3,eX2))
poi_10_f <- c(poi_10_f, length(x2_200poison[x2_200poison == 3])/size)

poi_0_73_d <- c(poi_0_73_d, dpois(4,eX1))
poi_0_73_f <- c(poi_0_73_f, length(x1_200poison[x1_200poison == 4])/size)
poi_10_d <- c(poi_10_d, dpois(4,eX2))
poi_10_f <- c(poi_10_f, length(x2_200poison[x2_200poison == 4])/size)

poi_0_73_d <- c(poi_0_73_d, dpois(5,eX1))
poi_0_73_f <- c(poi_0_73_f, length(x1_200poison[x1_200poison == 5])/size)
poi_10_d <- c(poi_10_d, dpois(5,eX2))
poi_10_f <- c(poi_10_f, length(x2_200poison[x2_200poison == 5])/size)

poi_0_73_d <- c(poi_0_73_d, dpois(6,eX1))
poi_0_73_f <- c(poi_0_73_f, length(x1_200poison[x1_200poison == 6])/size)
poi_10_d <- c(poi_10_d, dpois(6,eX2))
poi_10_f <- c(poi_10_f, length(x2_200poison[x2_200poison == 6])/size)

data.frame(X_val, poi_0_73_d, poi_0_73_f, poi_10_d, poi_10_f)
#Sim, os valores simulados sao proximos!

```

X_val	poi_0_73_d	poi_0_73_f	poi_10_d	poi_10_f
0	0.4819089901	0.504	4.539993e-05	0.000
1	0.3517935628	0.329	4.539993e-04	0.001
2	0.1284046504	0.131	2.269996e-03	0.003
3	0.0312451316	0.028	7.566655e-03	0.007
4	0.0057022365	0.007	1.891664e-02	0.017
5	0.0008325265	0.001	3.783327e-02	0.034
6	0.0001012907	0.000	6.305546e-02	0.064

3 Questao 3

```

In [202]: dzipf <- function(k, a, C){
           return(C / (k ^ (a+1)))
         }

pzipf <- function(k, a, C){
           return(cumsum(dzipf(k,a,C)))
         }

In [203]: a1 <- 1/2
          C1 <- 1/2.612
          a2 <- 1

```



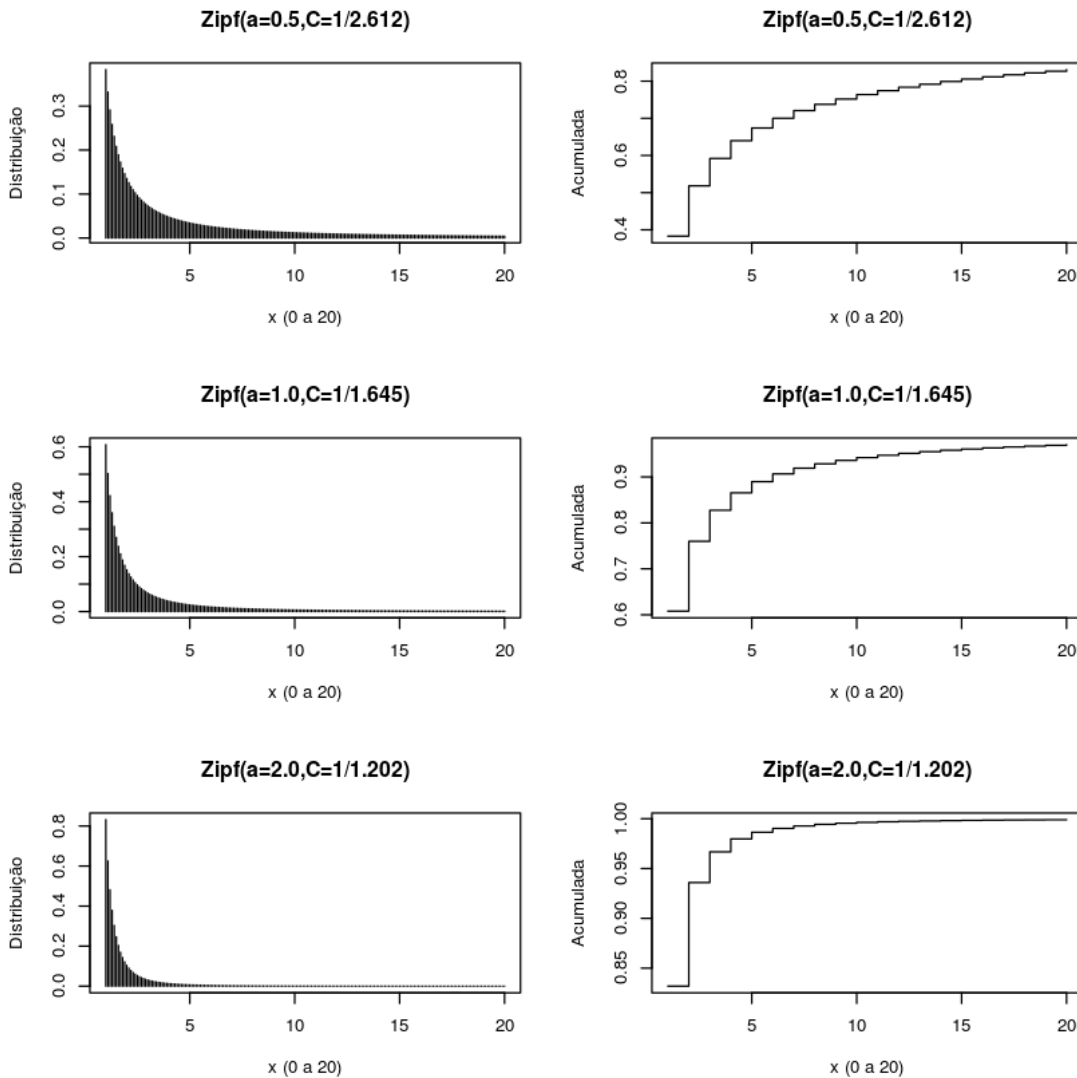
```

C2 <- 1/1.645
a3 <- 2
C3 <- 1/1.202

range1 = seq(1,20,0.1)
range2 = seq(1,20,1)

par(mfrow=c(3,2))
plot(range1,dzipf(range1, a1, C1), type = "h",
     main="Zipf(a=0.5,C=1/2.612)" , ylab="Distribuição", xlab="x (0 a 20)")
plot(range2,pzipf(range2, a1, C1), type = "s",
     main="Zipf(a=0.5,C=1/2.612)" , ylab="Acumulada", xlab="x (0 a 20)")
plot(range1,dzipf(range1, a2, C2), type = "h",
     main="Zipf(a=1.0,C=1/1.645)" , ylab="Distribuição", xlab="x (0 a 20)")
plot(range2,pzipf(range2, a2, C2), type = "s",
     main="Zipf(a=1.0,C=1/1.645)" , ylab="Acumulada", xlab="x (0 a 20)")
plot(range1,dzipf(range1, a3, C3), type = "h",
     main="Zipf(a=2.0,C=1/1.202)" , ylab="Distribuição", xlab="x (0 a 20)")
plot(range2,pzipf(range2, a3, C3), type = "s",
     main="Zipf(a=2.0,C=1/1.202)" , ylab="Acumulada", xlab="x (0 a 20)")

```



```
In [204]: range1 = seq(0,10)
          range2 = range1+1

          ratio_zipf <- function(k, a){
            return ((k / (k + 1 )) ^ (1+a))
          }

          paste("a1 = 1/2 - C1 = 1/2.612")
          a1_calc_ratio_10 <- dzipf(range2, a1,C1) / dzipf(range1, a1,C1)
          a1_form_ratio_10 <- ratio_zipf(range2,a1)
          a1_calc_ratio_500 <- dzipf(range2+500, a1,C1) / dzipf(range1+500, a1,C1)
          a1_form_ratio_500 <- ratio_zipf(range2+500,a1)
          data.frame(range1, a1_calc_ratio_10, a1_form_ratio_10,
```

```

range1+500, a1_calc_ratio_500, a1_form_ratio_500)

paste("a1 = 1 - C1 = 1/1.645")
a2_calc_ratio_10 <- dzipf(range2, a2,C2) / dzipf(range1, a2,C2)
a2_form_ratio_10 <- ratio_zipf(range2,a2)
a2_calc_ratio_500 <- dzipf(range2+500, a2,C2) / dzipf(range1+500, a2,C2)
a2_form_ratio_500 <- ratio_zipf(range2+500,a2)
data.frame(range1, a2_calc_ratio_10, a2_form_ratio_10,
            range1+500, a2_calc_ratio_500, a2_form_ratio_500)

paste("a1 = 2 - C1 = 1/1.202")
a3_calc_ratio_10 <- dzipf(range2, a3,C3) / dzipf(range1, a3,C3)
a3_form_ratio_10 <- ratio_zipf(range2,a3)
a3_calc_ratio_500 <- dzipf(range2+500, a3,C3) / dzipf(range1+500, a3,C3)
a3_form_ratio_500 <- ratio_zipf(range2+500,a3)
data.frame(range1, a3_calc_ratio_10, a3_form_ratio_10,
            range1+500, a3_calc_ratio_500, a3_form_ratio_500)

'a1 = 1/2 - C1 = 1/2.612'


| range1 | a1_calc_ratio_10 | a1_form_ratio_10 | range1...500 | a1_calc_ratio_500 | a1_form_ratio_500 |
|--------|------------------|------------------|--------------|-------------------|-------------------|
| 0      | 0.0000000        | 0.3535534        | 500          | 0.9970075         | 0.9970134         |
| 1      | 0.3535534        | 0.5443311        | 501          | 0.9970134         | 0.9970194         |
| 2      | 0.5443311        | 0.6495191        | 502          | 0.9970194         | 0.9970253         |
| 3      | 0.6495191        | 0.7155418        | 503          | 0.9970253         | 0.9970312         |
| 4      | 0.7155418        | 0.7607258        | 504          | 0.9970312         | 0.9970370         |
| 5      | 0.7607258        | 0.7935601        | 505          | 0.9970370         | 0.9970429         |
| 6      | 0.7935601        | 0.8184876        | 506          | 0.9970429         | 0.9970487         |
| 7      | 0.8184876        | 0.8380525        | 507          | 0.9970487         | 0.9970545         |
| 8      | 0.8380525        | 0.8538150        | 508          | 0.9970545         | 0.9970603         |
| 9      | 0.8538150        | 0.8667842        | 509          | 0.9970603         | 0.9970660         |
| 10     | 0.8667842        | 0.8776415        | 510          | 0.9970660         | 0.9970717         |


'a1 = 1 - C1 = 1/1.645'


| range1 | a2_calc_ratio_10 | a2_form_ratio_10 | range1...500 | a2_calc_ratio_500 | a2_form_ratio_500 |
|--------|------------------|------------------|--------------|-------------------|-------------------|
| 0      | 0.0000000        | 0.2500000        | 500          | 0.9960120         | 0.9960199         |
| 1      | 0.2500000        | 0.4444444        | 501          | 0.9960199         | 0.9960278         |
| 2      | 0.4444444        | 0.5625000        | 502          | 0.9960278         | 0.9960357         |
| 3      | 0.5625000        | 0.6400000        | 503          | 0.9960357         | 0.9960435         |
| 4      | 0.6400000        | 0.6944444        | 504          | 0.9960435         | 0.9960513         |
| 5      | 0.6944444        | 0.7346939        | 505          | 0.9960513         | 0.9960591         |
| 6      | 0.7346939        | 0.7656250        | 506          | 0.9960591         | 0.9960669         |
| 7      | 0.7656250        | 0.7901235        | 507          | 0.9960669         | 0.9960746         |
| 8      | 0.7901235        | 0.8100000        | 508          | 0.9960746         | 0.9960823         |
| 9      | 0.8100000        | 0.8264463        | 509          | 0.9960823         | 0.9960899         |
| 10     | 0.8264463        | 0.8402778        | 510          | 0.9960899         | 0.9960976         |


'a1 = 2 - C1 = 1/1.202'

```

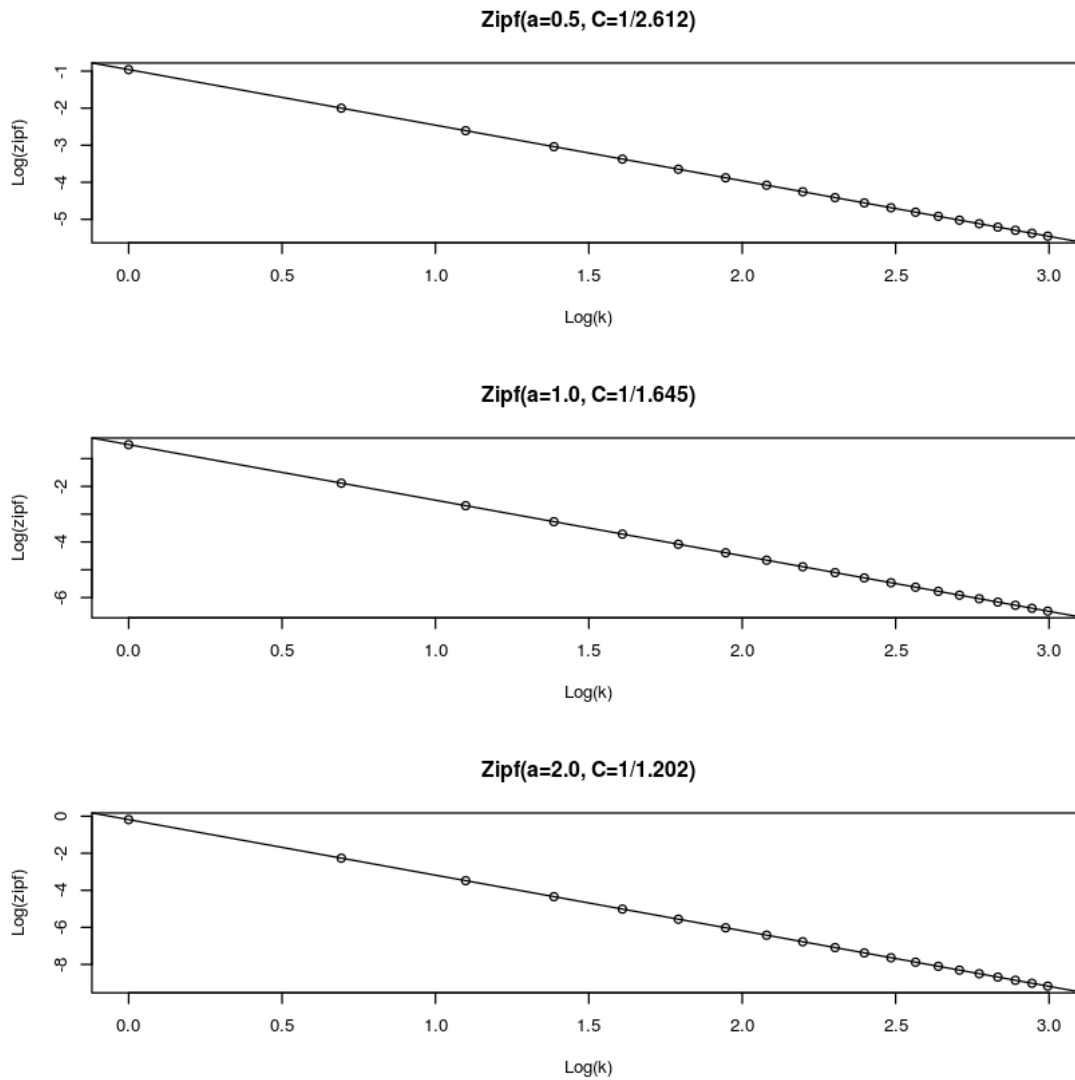
range1	a3_calc_ratio_10	a3_form_ratio_10	range1...500	a3_calc_ratio_500	a3_form_ratio_500
0	0.0000000	0.1250000	500	0.9940239	0.9940358
1	0.1250000	0.2962963	501	0.9940358	0.9940476
2	0.2962963	0.4218750	502	0.9940476	0.9940594
3	0.4218750	0.5120000	503	0.9940594	0.9940712
4	0.5120000	0.5787037	504	0.9940712	0.9940829
5	0.5787037	0.6297376	505	0.9940829	0.9940945
6	0.6297376	0.6699219	506	0.9940945	0.9941061
7	0.6699219	0.7023320	507	0.9941061	0.9941177
8	0.7023320	0.7290000	508	0.9941177	0.9941292
9	0.7290000	0.7513148	509	0.9941292	0.9941406
10	0.7513148	0.7702546	510	0.9941406	0.9941521

```
In [209]: range1 = seq(1,20)
```

```
par(mfrow=c(3,1))
plot(log(range1), log(dzipf(range1,a1,C1)),
     main="Zipf(a=0.5, C=1/2.612)", ylab="Log(zipf)", xlab="Log(k)")
lines(abline(log(C1), -(1 + a1)))

plot(log(range1), log(dzipf(range1,a2,C2)),
     main="Zipf(a=1.0, C=1/1.645)", ylab="Log(zipf)", xlab="Log(k)")
lines(abline(log(C2), -(1 + a2)))

plot(log(range1), log(dzipf(range1,a3,C3)),
     main="Zipf(a=2.0, C=1/1.202)", ylab="Log(zipf)", xlab="Log(k)")
lines(abline(log(C3), -(1 + a3)))
```



```
In [206]: rzipf <- function(nsim = 1, alpha = 1, Cte = 1/1.645)
{
  res = numeric(nsim)
  for(i in 1:nsim) {
    x = -1
    k = 1
    F = p = Cte
    U = runif(1)
    while( x == -1) {
      if(U < F) {
        x = k
      }
      else {

```

```

        p = p * (k/(k+1))^(1+alpha)
        F = F + p
        k = k+1
    }
}
res[i] = x
}
return (res)
}

```

```

In [212]: a1 <- 1/2
          C1 <- 1/2.612
          a2 <- 1
          C2 <- 1/1.645
          a3 <- 2
          C3 <- 1/1.202

```

```

#rzipf(400, a1, C1)
#rzipf(400, a2, C2)
#rzipf(400, a3, C3)

```

```

print(rzipf(400, a2, C2))

```

```

[1] 1 3 1 1 1 1 1 1 2 4 1 1 5 1 2 1 3 3
[19] 1 2 4 2 1 4 3 2 1 10 2 1 1 2 1 3 11 1
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