

question 2

xinyi Lin

2/28/2019

```
library(tidyverse)
```

```
## -- Attaching packages ----- tidyverse
## v ggplot2 3.1.0      v purrr  0.2.5
## v tibble  1.4.2      v dplyr  0.7.8
## v tidyr   0.8.2      v stringr 1.3.1
## v readr   1.1.1      v forcats 0.3.0

## -- Conflicts ----- tidyverse
## x dplyr::filter() masks stats::filter()
## x dplyr::lag()     masks stats::lag()

cancer_data = read_csv("./breast-cancer-1.csv")

## Warning: Missing column names filled in: 'X33' [33]
## Parsed with column specification:
## cols(
##   .default = col_double(),
##   id = col_integer(),
##   diagnosis = col_character(),
##   X33 = col_character()
## )
## See spec(...) for full column specifications.

## Warning in rbind(names(probs), probs_f): number of columns of result is not
## a multiple of vector length (arg 1)

## Warning: 569 parsing failures.
## row # A tibble: 5 x 5 col      row col   expected   actual   file           expected <in
## ... ..
## See problems(...) for more details.
```

classical Newton Raphson

```
logisticstuff <- function(x, y, betavec) {
  u <- x %*% betavec[1:31]
  expu <- exp(u)
  loglik = vector(mode = "numeric", 569)
  for(i in 1:569)
    loglik[i] = y[i]*u[i] - log(1 + expu[i])
  loglik_value = sum(loglik)
  # Log-likelihood at betavec
  p <- expu / (1 + expu)
  # P(Y_i=1/x_i)
  grad = vector(mode = "numeric", 31)
  #grad[1] = sum(y - p)
```

```

for(i in 1:31)
  grad[i] = sum(t(x[,i])%*(y - p))
Hess <- -t(x)%*p%*t(1-p)%*x
# gradient at betavec
#unit_vec = vector(mode = "numeric", 32)
#unit_vec[1] = sum(t(p)%*(1-p))
#for (j in 2:31){
#  #unit_vec[j] = sum(x[,j-1]*p*(1-p))
#}
#Hess = unit_vec
#for(i in 2:31){
#  #Hess = rbind(Hess, x[,i-1]%*unit_vec)
#}
# Hessian at betavec
return(list(loglik = loglik, grad = grad, Hess = Hess))
}

```

Newton-Raphson process

```

NewtonRaphson <- function(x, y, logisticstuff, start, tol=1e-10, maxiter = 200) {
  i <- 0
  cur <- start
  stuff <- logisticstuff(x, y, cur)
  res <- c(0, stuff$loglik, cur)
  prevloglik <- -Inf # To make sure it iterates
  #while(i < maxiter && abs(stuff$loglik - prevloglik) > tol && stuff$loglik > -Inf)
  while(i < maxiter && abs(stuff$loglik - prevloglik) > tol)
  {
    i <- i + 1
    prevloglik <- stuff$loglik
    prev <- cur
    cur <- prev - solve(stuff$Hess) %*% stuff$grad
    stuff <- logisticstuff(x, y, cur) # log-lik, gradient, Hessian
    res <- rbind(res, c(i, stuff$loglik, cur))
    # Add current values to results matrix
  }
  return(res)
}

```

Using data to get answer

```

intercept = rep(1, 569)
central = function(x){
  x = (x-mean(x))/sd(x)
  return(x)
}
x = cancer_data[,3:32] %>%
  apply(2, central) %>%
  cbind(intercept, .) %>%
  as.matrix()
#colnames(x) = NULL
y = as.vector(ifelse(cancer_data$diagnosis=="M",1,0)) # response variables
beta = rep(1,31)
#ans1 = NewtonRaphson(x, y, logisticstuff, beta)
# Error in solve.default(stuff$Hess) : singular

```

gradient descent

```
gradient <- function(x, y, logisticstuff, start, tol=1e-5, maxiter = 200){
  i <- 0
  cur <- start
  beta_len <- length(start)
  stuff <- logisticstuff(x, y, cur)
  res <- c(0, stuff$loglik, cur)
  prevloglik <- -Inf # To make sure it iterates
  #while(i <= maxiter && abs(stuff$loglik - prevloglik) > tol)
  while(i <= maxiter && abs(stuff$loglik - prevloglik) > tol && stuff$loglik > -Inf)
  { i <- i + 1
    prevloglik <- stuff$loglik
    prev <- cur
    cur <- prev + (diag(beta_len)/10)%*(stuff$grad)
    #cur = prev + t(stuff$grad)%*(stuff$grad)
    stuff <- logisticstuff(x, y, cur) # log-lik, gradient, Hessian
    res <- rbind(res, c(i, stuff$loglik, cur))
  }
  return(round(res,2))
}
ans2 <- gradient(x, y, logisticstuff, beta)
ans2
```

```
##      [,1] [,2] [,3] [,4] [,5] [,6] [,7] [,8] [,9] [,10] [,11]
## res    0  0.00  0    0    0.0  0    0.00  0    0.0  0.00  0.00
##      1 -29.66  0    0 -155.8  0 -57.32  0 -35.4 -38.03 -117.09
##      2  -Inf  0    0  -Inf  0    0.00  0    0.0  0.00  0.00
##      [,12] [,13] [,14] [,15] [,16] [,17] [,18] [,19] [,20] [,21] [,22]
## res   -5.10    0  0.00 -0.05  0.0  0.00 -0.46  0.00    0  0.00    0
##      0.00    0 -78.68  0.00 -78.2 -28.11  0.00 -6.95    0 -2.16    0
##  -112.33    0  0.00 -17.46  0.0  0.00 -1.79  0.00    0  0.00    0
##      [,23] [,24] [,25] [,26] [,27] [,28] [,29] [,30] [,31] [,32] [,33]
## res     0  0.00    0    0  0.00  0.00    0    0    0    0  0.00
##     0 -55.71    0    0 -34.57 -14.34    0    0    0    0 -52.19
##     0  0.00    0    0  0.00  0.00    0    0    0    0  0.00
##      [,34] [,35] [,36] [,37] [,38] [,39] [,40] [,41] [,42] [,43]
## res     0    0    0    0  0.00  0.0  -5.59 -0.05 -13.04 -0.02
##     0    0    0    0 -6.21 -15.3  0.00 -6.42  0.00 -23.92
##     0    0    0    0  0.00  0.0 -167.50  0.00 -202.68  0.00
##      [,44] [,45] [,46] [,47] [,48] [,49] [,50] [,51] [,52] [,53] [,54]
## res    0.00  0.00 -2.86    0    0  0.00  0.00  0.00  0.00  0.00  0.00
##  -38.46 -3.19  0.00    0    0 -22.83 -0.43 -26.55 -18.81 -23.67 -5.19
##    0.00  0.00 -3.56    0    0  0.00  0.00  0.00  0.00  0.00  0.00
##      [,55] [,56] [,57] [,58] [,59] [,60] [,61] [,62] [,63] [,64] [,65]
## res     0 -5.54  0.00    0  0.00  0.00    0 -0.01 -0.02  0.00 -0.01
##     0  0.00 -0.33    0 -3.93 -25.24    0  0.00  0.00 -58.81  0.00
##     0 -84.44  0.00    0  0.00  0.00    0  0.00  0.00  0.00  0.00
##      [,66] [,67] [,68] [,69] [,70] [,71] [,72] [,73] [,74] [,75]
## res    0.00  0.00    0  0.00 -31.97  0.00    0 -9.27  0.00 -4.02
##  -10.35 -0.04    0 -6.43  0.00 -11.83    0  0.00 -3.78 -1.69
##    0.00  0.00    0  0.00 -419.18  0.00    0 -23.20  0.00 -30.15
##      [,76] [,77] [,78] [,79] [,80] [,81] [,82] [,83] [,84] [,85] [,86]
## res    0.00    0 -0.42  0.00  0.00  0.0 -0.19 -7.68    0  0.00  0.00
##   -9.21    0  0.00 -22.71 -71.79 -4.9  0.00    0.00    0 -23.72 -0.03
```

```

##      0.00      0 0.00      0.00      -Inf      0.0 0.00 -135.23      -Inf      0.00 0.00
##      [,87] [,88] [,89] [,90]      [,91] [,92] [,93]      [,94] [,95]      [,96] [,97]
## res      0 0.00      0 -0.18      -6.20 0.00 -0.16      0.00 0.00      0.00 0
##      0 -5.57      0 0.00      0.00 -29.23 -0.01 -40.27 -18.46 -11.08      0
##      0 0.00      0 0.00 -91.33      0.00 -7.02      0.00 0.00      0.00 0
##      [,98] [,99] [,100] [,101] [,102] [,103] [,104] [,105] [,106] [,107]
## res      0      0      0 0.00      -2.11      0 0.00      0      0 0.00
##      0      0      0 -10.39      0.00      0 -29.71      0      0 -66.87
##      0      0      0 0.00 -57.25      0 0.00      0      0 0.00
##      [,108] [,109] [,110] [,111] [,112] [,113] [,114] [,115] [,116] [,117]
## res     -0.74      0.00      0.00      0.00      0 -4.86 -20.86 -1.06      0      0
##      0.00 -23.63 -14.08      -0.01      0 0.00      0.00      0.00      0      0
##      0.00      0.00      -Inf      0.00      0 -4.70 -255.23      0.00      0      0
##      [,118] [,119] [,120] [,121] [,122] [,123] [,124] [,125] [,126] [,127]
## res     -0.01      0.00      0.00      0      0      0 0.0 0.00      0.00      0.0
##      0.00 -12.28 -31.22      0      0      0 -61.6 -0.04 -0.02 -31.6
##      0.00      0.00      0.00      0      0      0 -Inf      0.00      0.00      0.0
##      [,128] [,129] [,130] [,131] [,132] [,133] [,134] [,135] [,136]
## res     -3.03      0      -8.09      0      0 -0.01      0 0.00      0
##      0.00      0      0.00      0      0 0.00      0 -24.22      0
##     -44.96      0 -107.96      0      0 0.00      0 0.00      0
##      [,137] [,138] [,139] [,140] [,141] [,142] [,143] [,144] [,145] [,146]
## res     -7.83      0.00      0.0 0.00      0      0      0      0 0.00      0.00
##      0.00 -0.01      -4.6 -25.28      0      0      0      0 -6.89 -3.56
##    -153.15      0.00      0.0 0.00      0      0      0      0 0.00      0.00
##      [,147] [,148] [,149] [,150] [,151] [,152] [,153] [,154] [,155]
## res     -2.06      0.00 -5.88 -0.01      0.00 -0.02 -12.41 -52.68      0
##      0.00 -69.41      0.00 -2.61 -33.43 -0.76      0.00      0.00      0
##      0.00      0.00 -1.30      0.00      0.00      0.00 -122.95 -600.13      0
##      [,156] [,157] [,158] [,159] [,160] [,161] [,162] [,163] [,164] [,165]
## res     -0.04      0.00      0.00      0.00      0.00      0.00 -2.87      0      0 -0.17
##      0.00 -2.11 -3.18 -48.08 -6.79 -12.62      0.00      0      0 0.00
##      0.00      0.00      0.00      0.00      0.00      0.00      0.00      0      0 0.00
##      [,166] [,167] [,168] [,169] [,170] [,171] [,172] [,173] [,174] [,175]
## res      0 0.00      0 -0.01      0 0.00      0 -5.58      0.0 0
##      0 -49.39      0 0.00      0 -31.15      0 0.00 -20.9      0
##      0 0.00      0 0.00      0 0.00      0 -100.60      0.0 0
##      [,176] [,177] [,178] [,179] [,180] [,181] [,182] [,183] [,184] [,185]
## res      0.00      0 -18.5      0.00      0.00      0.00      0      0 -0.06      0
##     -0.59      0      0.0 -11.75 -58.08 -6.06      0      0 0.00      0
##      0.00      0 -140.0      0.00      0.00      0.00      0 -Inf      0.00      0
##      [,186] [,187] [,188] [,189] [,190] [,191] [,192] [,193] [,194] [,195]
## res     -3.90      0 -3.95      0.00      0.00      0.00      0.00      0 0.00      0.00
##      0.00      0 0.00 -3.88 -2.19 -10.77 -142.22      0 -0.02 -35.67
##    -43.67      0 -39.19      0.00      0.00      0.00      0.00      0 0.00      0.00
##      [,196] [,197] [,198] [,199] [,200] [,201] [,202] [,203] [,204] [,205]
## res      0.00      0.00      0.00 -0.01      0      0 0.00 -0.01      0 0.00
##    -31.64 -14.25 -36.85      0.00      0      0 -0.64      0.00      0 -22.27
##      0.00      0.00      0.00 -2.38      0      0 0.00      0.00      0 0.00
##      [,206] [,207] [,208] [,209] [,210] [,211] [,212] [,213] [,214] [,215]
## res     -0.06 -3.59      0 -0.64 -5.04      0.00      0 0.00      0 0.0
##      0.00      0.00      0 0.00      0.00 -37.67      0 -4.74      0 -99.6
##      0.00 -30.69      0 -29.49 -70.35      0.00      0 0.00      -Inf      0.0
##      [,216] [,217] [,218] [,219] [,220] [,221] [,222] [,223] [,224] [,225]

```

```

## res    0.0    0.00 -2.85     0     0     0    0.00     0     0     0
##      -29.3 -32.47  0.00     0     0     0   -6.61     0     0     0
##        0.0    0.00 -0.02     0     0     0    0.00     0     0     0
##      [,226] [,227] [,228] [,229] [,230] [,231] [,232] [,233] [,234] [,235]
## res    0.00    0.00     0    0.00    0.0    0.00     0    0.00    0.0     0
##      -21.79 -18.88     0   -5.41    -7.7 -50.45     0 -28.52   -36.2     0
##        0.00    0.00     0    0.00    0.0    0.00     0    0.00    0.0     0
##      [,236] [,237] [,238] [,239] [,240] [,241] [,242] [,243] [,244] [,245]
## res     0    0.00     0     0   -0.22     0    0.00     0  -12.57    0.00
##        0  -23.22     0     0  -17.23     0  -16.46    -29     0.00  -21.11
##        0    0.00     0     0    0.00     0    0.00     0 -161.80    0.00
##      [,246] [,247] [,248] [,249] [,250] [,251] [,252] [,253] [,254] [,255]
## res     0   -0.15    0.00   -3.32    0.00     0     0    0.00    0.00   -0.03
##        0    0.00  -18.08    0.00   -2.04     0     0   -9.22  -10.43    0.00
##        0    0.00    0.00  -77.98    0.00     0     0    0.00    0.00    0.00
##      [,256] [,257] [,258] [,259] [,260] [,261] [,262] [,263] [,264]
## res     0   -0.13     0     0.0    0.00     0     0   -5.86     0
##        0   -4.73     0   -72.2  -67.89     0     0    0.00     0
##        0    0.00     0     0.0   -Inf     0     0 -132.28     0
##      [,265] [,266] [,267] [,268] [,269] [,270] [,271] [,272] [,273] [,274]
## res  -13.31  -0.01     0   -0.02    0.00    0.00  -1.97    0.00     0     0
##        0.00    0.00     0    0.00  -13.06  -3.93    0.00  -49.81     0     0
##      -211.44  0.00     0    0.00    0.00    0.00    0.00    0.00     0     0
##      [,275] [,276] [,277] [,278] [,279] [,280] [,281] [,282] [,283] [,284]
## res     0   -0.37  -0.21    0.00   -3.16    0.00    0.00     0     0     0
##        0    0.00    0.00   -3.07    0.00  -44.98  -16.24     0     0     0
##        0  -30.93    0.00    0.00  -77.33    0.00    0.00     0     0     0
##      [,285] [,286] [,287] [,288] [,289] [,290] [,291] [,292] [,293] [,294]
## res     0.00     0    0.00  -0.43    0.00  -10.13     0  -23.64  -0.04  -0.01
##      -7.87     0  -20.59    0.00  -21.26    0.00     0    0.00  -18.31    0.00
##        0.00     0    0.00    0.00    0.00  -38.34     0 -203.15    0.00    0.00
##      [,295] [,296] [,297] [,298] [,299] [,300] [,301] [,302] [,303] [,304]
## res     0.00    0.00    0.00     0  -11.07    0.00     0     0     0    0.00
##      -8.24  -8.67  -21.67     0   -0.06  -43.12     0     0     0   -4.66
##        0.00    0.00    0.00     0 -214.91    0.00     0     0     0    0.00
##      [,305] [,306] [,307] [,308] [,309] [,310] [,311] [,312] [,313] [,314]
## res     0     0    0.00    0.00     0    0.00    0.00    0.00    0.00     0
##        0     0   -7.61  -25.25     0  -43.58  -33.83   -7.52  -51.49     0
##        0     0    0.00    0.00     0    0.00    0.00    0.00    0.00     0
##      [,315] [,316] [,317] [,318] [,319] [,320] [,321] [,322] [,323] [,324]
## res     0.00  -0.06     0    0.00     0  -17.26    0.00  -0.38  -0.01     0
##      -0.51    0.00  -33.6  -21.61     0    0.00   -6.29    0.00    0.00     0
##        0.00    0.00     0    0.00     0 -193.48    0.00    0.00    0.00     0
##      [,325] [,326] [,327] [,328] [,329] [,330] [,331] [,332] [,333] [,334]
## res     0    0.00    0.00    0.00    0.00     0    0.00     0  -0.24     0
##        0  -10.77  -8.92  -22.59  -25.32     0  -26.25     0    0.00     0
##        0    0.00    0.00    0.00    0.00     0    0.00     0    0.00     0
##      [,335] [,336] [,337] [,338] [,339] [,340] [,341] [,342] [,343] [,344]
## res     0.00    0.00     0     0     0     0     0  -0.91     0     0
##      -11.77 -15.56     0     0     0     0     0    0.00     0     0
##        0.00    0.00     0     0     0     0     0  -11.98     0     0
##      [,345] [,346] [,347] [,348] [,349] [,350] [,351] [,352] [,353] [,354]
## res     0     0  -0.08    0.0    0.00     0     0    0.00    0.00     0
##        0     0    0.00  -11.8  -20.86     0     0  -16.45  -93.11     0

```

```

##      0      0      0.00      0.0      0.00      0      0      0.00      0.00      -Inf
##      [,355] [,356] [,357] [,358] [,359] [,360] [,361] [,362] [,363] [,364]
## res      0.00      0      -0.05      -5.81      0.00      0      0      0.0      0.00      0.00
##      -2.73      0      0.00      0.00      -29.67      0      0      -41.3      -21.87      -5.37
##      0.00      0      0.00      -47.79      0.00      0      0      0.0      0.00      0.00
##      [,365] [,366] [,367] [,368] [,369] [,370] [,371] [,372] [,373] [,374]
## res     -0.01      0.00      0      0      0.00      0      0      0.00      0.00      0
##     -36.25     -25.69      0      0      -11.44      0      0      -3.59     -27.59      0
##      0.00      0.00      0      0      0.00      0      0      0.00      0.00      0
##      [,375] [,376] [,377] [,378] [,379] [,380] [,381] [,382] [,383] [,384]
## res      0      0.00     -0.10     -16.49      0.00      0      0.00     -0.08      0      0
##      0     -20.88     -2.39      0.00     -46.64      0     -79.99      0.00      0      0
##      0      0.00      0.00     -196.58      0.00      0      0.00      0.00      0      0
##      [,385] [,386] [,387] [,388] [,389] [,390] [,391] [,392] [,393] [,394]
## res     -0.76      0.00     -2.02      0      0.00     -1.52      0.00      0      0      0.00
##      0.00     -9.39      0.00      0     -33.35      0.00     -12.11      0      0     -5.46
##      0.00      0.00     -74.27      0      0.00      0.00      0.00      0      0      0.00
##      [,395] [,396] [,397] [,398] [,399] [,400] [,401] [,402] [,403] [,404]
## res      0      0.00      0.00     -0.06      0      0.00      0.00      0.00      0.00      0.00
##      0     -0.03     -26.94     -1.12      0     -0.25     -2.07     -21.43     -13.02     -0.04
##      0      0.00      0.00      0.00      0      0.00      0.00      0.00      0.00      0.00
##      [,405] [,406] [,407] [,408] [,409] [,410] [,411] [,412] [,413] [,414]
## res      0.00      0.00      0      0.00     -0.02      0      0.00      0.0      0.00      0
##     -9.82     -9.53      0     -34.57      0.00      0     -6.71     -19.5     -0.15      0
##      0.00      0.00      0      0.00      0.00      0      0.00      0.0      0.00      0
##      [,415] [,416] [,417] [,418] [,419] [,420] [,421] [,422] [,423]
## res     -1.59     -1.67      0     -0.09      0.00      0      0.0      0     -13.28
##    -10.91      0.00      0      0.00     -2.15      0     -5.5      0      0.00
##      0.00    -107.76      0      0.00      0.00      0      0.0      0    -162.87
##      [,424] [,425] [,426] [,427] [,428] [,429] [,430] [,431] [,432] [,433]
## res      0     -0.04     -0.29      0.00     -0.03      0.00      0.00      0.00      0.00     -0.68
##      0     -0.01      0.00     -6.93      0.00     -0.01     -5.22     -27.73     -57.23      0.00
##      0      0.00      0.00      0.00      0.00      0.00      0.00      0.00      0.00      0.00
##      [,434] [,435] [,436] [,437] [,438] [,439] [,440] [,441] [,442] [,443]
## res      0      0      0.00     -0.03      0.00      0.00      0.0      0.00     -0.98      0
##      0      0     -27.68      0.00     -12.05     -15.63     -31.5     -29.28      0.00      0
##      0      0      0.00      0.00      0.00      0.00      0.0      0.00      0.00      0
##      [,444] [,445] [,446] [,447] [,448] [,449] [,450] [,451] [,452] [,453]
## res      0.00      0     -0.58     -0.07      0      0.00      0.00      0     -0.1      0
##    -24.69      0      0.00      0.00      0     -25.55     -26.02      0      0.0      0
##      0.00      0      0.00      0.00      0      0.00      0.00      0      0.0      0
##      [,454] [,455] [,456] [,457] [,458] [,459] [,460] [,461] [,462] [,463]
## res      0.00      0.00      0.00      0.00     -0.86      0.0      0      0.0      0      0
##     -1.06     -3.03     -22.91     -34.65     -0.01     -36.5      -41     -11.5      0      0
##      0.00      0.00      0.00      0.00      0.00      0.0      0      0.0      0     -Inf
##      [,464] [,465] [,466] [,467] [,468] [,469] [,470] [,471] [,472]
## res      0.00      0.00      0.00     -7.50     -0.06      0      0.00     -9.93      0
##    -45.18     -2.84     -28.48      0.00      0.00      0     -43.95      0.00      0
##      0.00      0.00      0.00    -103.75      0.00      0      0.00    -113.59      0
##      [,473] [,474] [,475] [,476] [,477] [,478] [,479] [,480] [,481] [,482]
## res      0.00      0.00      0.00      0      0.00     -0.01      0.00      0      0.00      0.00
##    -12.48     -26.94     -26.17      0     -3.19    -13.28    -33.75      0    -50.02    -11.32
##      0.00      0.00      0.00      0      0.00      0.00      0.00      0      0.00      0.00
##      [,483] [,484] [,485] [,486] [,487] [,488] [,489] [,490] [,491]

```

```

## res    0.00      0  0.00 -0.01 -16.58  0.00      0      0 -6.37
##      -40.03      0 -23.02 -1.52   0.00 -43.45      0      0  0.00
##        0.00      0  0.00  0.00 -196.12  0.00      0      0 -102.81
##      [,492] [,493] [,494] [,495] [,496] [,497] [,498] [,499] [,500] [,501]
## res    0.00  0.00      0      0  0.00  0.00 -0.39  0.00      0      0
##      -25.71 -68.18      0      0 -16.76 -27.61  0.00 -17.96      0      0
##        0.00  0.00      0      0  0.00  0.00 -14.01  0.00      0      0
##      [,502] [,503] [,504] [,505] [,506] [,507] [,508] [,509] [,510]
## res    0.00  0.00 -0.03      0 -16.07 -18.55 -0.01 -1.24  0.0
##      -6.65 -49.41  0.00      0  0.00  0.00  0.00  0.00 -23.4
##        0.00  0.00  0.00      0 -238.17 -227.50  0.00  0.00  0.0
##      [,511] [,512] [,513] [,514] [,515] [,516] [,517] [,518] [,519] [,520]
## res    0.00      0  0.00  0.00  0.00 -6.02      0      0      0 -0.89
##      -44.42      0 -29.28 -21.07 -18.68  0.00      0      0      0  0.00
##        0.00      0  0.00  0.00  0.00 -103.29      0      0      0 -5.15
##      [,521] [,522] [,523] [,524] [,525] [,526] [,527] [,528] [,529] [,530]
## res   -0.02 -3.31      0  0.00 -0.23      0      0 -0.01  0.00 -5.46
##        0.00  0.00      0 -13.63  0.00      0      0 -13.32 -18.26  0.00
##        0.00 -9.64      0  0.00  0.00      0      0  0.00  0.00 -23.50
##      [,531] [,532] [,533] [,534] [,535] [,536] [,537] [,538] [,539] [,540]
## res      0      0  0.00  0.00      0      0      0 -0.01 -10.32      0
##        0      0 -0.06 -28.65      0      0      0 -2.24  0.00      0
##        0      0  0.00  0.00      0      0      0  0.00 -108.37      0
##      [,541] [,542] [,543] [,544] [,545] [,546] [,547] [,548] [,549] [,550]
## res   -4.99 -0.02 -7.92  0.00  0.00  0.00  0.00      0      0      0
##        0.00  0.00  0.00 -35.43 -35.98 -0.15 -20.74      0      0      0
##        0.00  0.00 -86.92  0.00  0.00  0.00  0.00      0      0      0
##      [,551] [,552] [,553] [,554] [,555] [,556] [,557] [,558] [,559] [,560]
## res    0.00  0.00      0  0.00      0  0.00 -0.03      0  0.00 -0.18
##      -0.23 -8.97      0 -31.04      0 -16.72  0.00      0 -0.15  0.00
##        0.00  0.00      0  0.00      0  0.00  0.00      0  0.00  0.00
##      [,561] [,562] [,563] [,564] [,565] [,566] [,567] [,568] [,569] [,570]
## res   -0.63 -0.92  0.00  0.00      0      0      0      0  0.00  0.00
##        0.00 -0.38 -35.51 -39.01      0      0      0      0 -7.47 -10.12
##        0.00  0.00  0.00  0.00      0      0      0      0 -Inf  0.00
##      [,571] [,572] [,573] [,574] [,575] [,576] [,577] [,578] [,579] [,580]
## res    1.00  1.00  1.00  1.00  1.00  1.00  1.00  1.00  1.00  1.00
##      -1.34  4.49  2.90  4.11  4.13 -2.22 -3.07 -1.26  0.83 -2.54
##     -10.19 11.81  9.21 12.79 11.61 18.08 20.33 19.76 19.95 15.18
##      [,581] [,582] [,583] [,584] [,585] [,586] [,587] [,588] [,589] [,590]
## res    1.00  1.00  1.00  1.00  1.00  1.00  1.00  1.00  1.00  1.00
##      -7.05  1.44 -1.67  0.90  2.19 -4.51 -6.75 -5.84 -4.63 -3.00
##      11.12 13.80  4.10 14.22 11.86  6.11 12.60  9.08 13.53  6.71
##      [,591] [,592] [,593] [,594] [,595] [,596] [,597] [,598] [,599] [,600]
## res    1.00  1.00  1.00  1.00  1.00  1.00  1.00  1.00  1.00  1.00
##      -8.20  4.55  3.55  4.10  4.09 -0.49 -1.42 -0.89  1.24  1.10
##       7.18 13.98 10.98 14.92 13.13 19.40 20.34 20.14 21.24 16.12
##      [,601]
## res    1.00
##      -3.94
##      17.46

```