STT 810

Homework 5

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- 1. In the car_multi.csv file, there is a field called acceleration. Calculate
- a. The mean value

```
# setwd("C:\\Users\\Adi\\Desktop\\Fall-22 Study Material\\STT 810\\HW\\HW5")
cars_multi <- read.csv('cars_multi.csv', header = TRUE)
mean_acc <- mean(cars_multi$acceleration)
paste(mean_acc)</pre>
```

- ## [1] "15.5680904522613"
 - b. The standard deviation

```
std_acc <- sd(cars_multi$acceleration)
paste(std_acc)</pre>
```

- ## [1] "2.75768892981268"
 - c. The 5th and 95th quantile

```
quantile_range <- quantile(cars_multi$acceleration, c(0.05,0.95))
paste(quantile_range)</pre>
```

```
## [1] "11.285" "20.415"
```

2. For this acceleration field, assuming it is normally distributed, conduct a hypothesis test at the 95% confidence level to determine whether you can say the mean value is greater than 15.2. State the null hypothesis. Conduct the hypothesis test by

The null hypothesis is - the mean acceleration of the car is less than 15.2

a. Constructing an appropriate confidence interval

```
a1 <- mean_acc + (std_acc/sqrt(length(cars_multi$acceleration)))*
  qt(0.05,length(cars_multi$acceleration)-1)
paste(a1)</pre>
```

```
## [1] "15.3401897806772"
```

At 95 % Confidence interval we can say the null hypothesis is invalid and the mean value is greater than 15.2

b. Calculating a p-value, both by

[1] "0.00403136148288605"

```
# ii. Running an appropriate simulation
trials <- 10000
sampmean <- mean_acc
n <- length(cars_multi$acceleration)
HOmean <- 15.2
simmean <- rep(0,trials)
for(i in 1:trials){
    simsamp <- HOmean + std_acc*rt(n, n - 1)
    simmean[i] <- mean(simsamp)
}
p_value <- sum(simmean >= sampmean)/trials
paste(p_value)
```

```
## [1] "0.0043"
```

As p value is less than 0.05, we can say that the null hypothesis is falsified.

3. A Poisson process generates the following data: {3, 5, 6, 7, 10, 4, 5, 6, 4, 3}, covering 2 second intervals. Run a Monte Carlo simulation to test the hypothesis at the 95% confidence level that the rate parameter is greater than 2.

The null hypothesis is - the rate parameter is less than or equal to 2

```
c <- c(3,5,6,7,10,4,5,6,4,3)
trials <- 10000
samprate <- (sum(c)/length(c))
n <- 10
HOrate <- 2
simrate <- rep(0,trials)
for(i in 1:trials){
    simsamp <- rpois(n, HOrate*2) # rate times time (i.e 2 seconds)
    simrate[i] <- sum(simsamp)/n
}
p_value <- sum(simrate >= samprate)/trials
paste(p_value)
```

```
## [1] "0.0283"
```

As p-value is less than 0.05, we can say that the null hypothesis is falsified and the rate parameter is greater than or equal to 2 for the given poisson distribution.

- 4. For the 4 values you calculated in #1, construct 95% confidence intervals using
- a. Regular bootstrapping

```
# Regular Bootstrapping
mn0 \leftarrow rep(0,10000)
sd0 \leftarrow rep(0,10000)
five0 \leftarrow rep(0,10000)
ninefive0 \leftarrow rep(0,10000)
for(i in 1:10000){
  samp0 <- sample(cars_multi$acceleration, length(cars_multi$acceleration),</pre>
                    replace = TRUE)
  mn0[i] \leftarrow mean(samp0)
  sd0[i] \leftarrow sd(samp0)
  five0[i] <- quantile(samp0, 0.05)</pre>
  ninefive0[i] <- quantile(samp0, 0.95)</pre>
paste(quantile(mn0, c(0.025, 0.975)))
## [1] "15.2979899497487" "15.835182160804"
paste(quantile(sd0, c(0.025, 0.975)))
## [1] "2.54541198204302" "2.96372472121071"
paste(quantile(five0, c(0.025, 0.975)))
## [1] "11"
                  "11.585"
paste(quantile(ninefive0, c(0.025, 0.975)))
## [1] "19.5" "21"
  b. Bayesian bootstrapping
# Bayesian Bootstrapping
library(DirichletReg)
## Warning: package 'DirichletReg' was built under R version 4.2.2
## Loading required package: Formula
weight <- rep(0,length(cars_multi$acceleration))</pre>
mn1 \leftarrow rep(0,10000)
sd1 \leftarrow rep(0,10000)
five1 \leftarrow rep(0,10000)
ninefive1 \leftarrow rep(0,10000)
```

```
for(i in 1:10000){
  weight <- rdirichlet(1, rep(1,length(cars_multi$acceleration)))</pre>
  samp1 <- sample(cars_multi$acceleration,length(cars_multi$acceleration),weight,</pre>
                   replace = TRUE)
  mn1[i] <- mean(samp1)</pre>
  sd1[i] \leftarrow sd(samp1)
  five1[i] <- quantile(samp1, 0.05)</pre>
  ninefive1[i] <- quantile(samp1, 0.95)</pre>
}
paste(quantile(mn1, c(0.025, 0.975)))
## [1] "15.1813944723618" "15.9454773869347"
paste(quantile(sd1, c(0.025, 0.975)))
## [1] "2.46368613439917" "3.05172889993441"
paste(quantile(five1, c(0.025, 0.975)))
## [1] "10.425" "12"
paste(quantile(ninefive1, c(0.025, 0.975)))
## [1] "19.245" "21.53"
```

5. Import the data in the dataset called "longtail.csv." Calculate the standard deviation and the 0.99 quantile. Then create 95% confidence intervals for these two quantities, using both regular and Bayesian bootstrapping. Describe what you see with these results

```
lt <- read.csv("longtail.csv", stringsAsFactors = FALSE)</pre>
lt <- lt$x
ltsd <- sd(lt)</pre>
paste(ltsd)
## [1] "78.9768058514152"
lt99 <- quantile(lt,0.99)</pre>
paste(1t99)
## [1] "93.6482862423871"
# regular bootstrapping
ltsd0 \leftarrow rep(0,10000)
lt990 \leftarrow rep(0,10000)
for(i in 1:10000){
  samp0 <- sample(lt, length(lt), replace = TRUE)</pre>
  ltsd0[i] <- sd(samp0)</pre>
  lt990[i] <- quantile(samp0, 0.99)</pre>
paste(quantile(ltsd0, c(0.025, 0.975)))
## [1] "50.9533245760065" "104.819443523271"
paste(quantile(lt990, c(0.025, 0.975)))
## [1] "74.6138513589416" "122.977316854457"
# Bayesian Bootstrapping
weight <- rep(0,length(lt))</pre>
ltsd1 \leftarrow rep(0,10000)
lt991 \leftarrow rep(0,10000)
for(i in 1:10000){
  weight <- rdirichlet(1, rep(1,length(lt)))</pre>
  samp1 <- sample(lt,length(lt),weight, replace = TRUE)</pre>
  ltsd1[i] <- sd(samp1)</pre>
  lt991[i] <- quantile(samp1, 0.99)</pre>
paste(quantile(ltsd1, c(0.025, 0.975)))
## [1] "43.915543220358" "116.96638502209"
```

```
paste(quantile(lt991, c(0.025, 0.975)))
```

[1] "69.0952961242343" "130.213957312874"

(a) Find the eigenvectors and eigenvalues for the matrix

$$A = \begin{bmatrix} 1 & 7 & 3 \\ 7 & 4 & 5 \\ 3 & 5 & 0 \end{bmatrix}$$

```
A = as.matrix(cbind(c(1,7,3),c(7,4,5),c(3,5,0)))
eigenA = eigen(A)
eigenA
```

(b) Express the vectors $x = \langle 1, 3, 1 \rangle$ and $y = \langle -1, 4, 9 \rangle$ in terms of the eigenvectors basis for the above matrix.

```
x = as.matrix(c(1,3,1))
y = as.matrix(c(-1,4,9))
xa = solve(eigenA$vectors)%*%x
ya = solve(eigenA$vectors)%*%y
paste(xa)
```

```
## [1] "-3.12793216336437"    "-0.00369094288744376" "-1.10273603293411"
```

```
paste(ya)
```

```
## [1] "-6.13095663154334" "7.73403921917673" "-0.772015633501637"
```

(c) Find the inner product of x and y in the original coordinates. Then find the inner product of x and y in terms of the eigenvector basis. Do you get the same value?

```
inner_original = t(x)%*%y
inner_basis = t(xa)%*%ya
paste(inner_original)
```

```
## [1] "20"
```

```
paste(inner_basis)
```

```
## [1] "20"
```

```
paste("We get the same value.")
```

[1] "We get the same value."

For this problem we will use the nndb dataset available in the sample data. There are 45 columns, 38 of which are numerical. a. Calculate the covariance matrix for the numerical data.

```
nndb = read.csv("nndb_flat.csv", stringsAsFactors = FALSE)
nndb_num = nndb[8:ncol(nndb)]
cov_nndb = cov(nndb[8:ncol(nndb)])
cov_nndb
```

```
##
                      Energy_kcal
                                       Protein_g
                                                          Fat_g
                                                                       Carb_g
## Energy_kcal
                     2.869260e+04 197.126585658
                                                  2.168329e+03
                                                                 2.247455e+03
## Protein_g
                                                  9.159321e+00 -8.678354e+01
                     1.971266e+02 111.314944832
## Fat_g
                     2.168329e+03
                                     9.159321342
                                                  2.517411e+02 -2.338810e+01
## Carb_g
                     2.247455e+03 -86.783538935 -2.338810e+01
                                                                 7.419631e+02
## Sugar_g
                     7.215148e+02 -38.198033251 -4.234431e-01
                                                                 2.279897e+02
## Fiber_g
                     1.441923e+02
                                    -3.312228183 -1.974011e+00
                                                                 5.383758e+01
## VitA_mcg
                     3.475814e+03 217.760904248
                                                 3.014578e+02
                                                                 3.971645e+01
## VitB6 mg
                     9.880400e+00
                                     1.153773367 -3.565283e-01
                                                                 2.549656e+00
## VitB12 mcg
                                    11.183925768 -1.424434e+00 -1.113389e+01
                    -8.993246e+00
## VitC mg
                    -3.267044e+02 -40.373894767 -5.481173e+01
                                                                 1.203750e+02
## VitE_mg
                     1.980078e+02
                                    -1.197227827
                                                  2.064218e+01
                                                                 7.370322e+00
## Folate_mcg
                     4.611778e+03
                                    17.595392168 -1.718278e+02
                                                                 1.652423e+03
## Niacin_mg
                     1.433043e+02
                                    19.226762927 -1.739030e+00
                                                                 2.281969e+01
## Riboflavin_mg
                     1.187501e+01
                                     0.961069860 -2.590076e-01
                                                                 2.847988e+00
## Thiamin_mg
                     1.645824e+01
                                     0.537939021 -4.758314e-02
                                                                 3.979099e+00
## Calcium_mg
                     4.214856e+03
                                    99.614417728
                                                  4.804869e+01
                                                                 1.037238e+03
## Copper_mcg
                     9.322461e+00
                                     0.927183833
                                                  3.752596e-01
                                                                 9.355972e-01
## Iron_mg
                                     7.635961231 -3.671758e+00
                                                                 5.467115e+01
                     1.897139e+02
## Magnesium_mg
                     2.430184e+03 129.320244096
                                                  6.296670e+01
                                                                 4.386367e+02
## Manganese_mg
                     4.067899e+01
                                     2.676615002 -5.993033e-02
                                                                 9.662447e+00
  Phosphorus_mg
                     6.714554e+03 952.684456473
                                                  2.129536e+02
                                                                 4.048385e+02
  Selenium_mcg
                     2.715990e+02 112.943556962
                                                  1.686016e+01 -8.831674e+01
## Zinc mg
                     6.414646e+01
                                    14.750522644
                                                  1.505954e+00 -1.114788e+00
## VitA_USRDA
                                                                 4.412939e-02
                     3.862015e+00
                                     0.241956560
                                                  3.349531e-01
## VitB6 USRDA
                     5.812000e+00
                                     0.678690216 -2.097225e-01
                                                                 1.499798e+00
## VitB12 USRDA
                                     4.659969070 -5.935141e-01 -4.639122e+00
                    -3.747186e+00
## VitC USRDA
                    -3.630049e+00
                                    -0.448598831 -6.090192e-01
                                                                 1.337500e+00
## VitE_USRDA
                     1.320052e+01
                                    -0.079815188
                                                  1.376145e+00
                                                                 4.913548e-01
## Folate_USRDA
                     1.152945e+01
                                     0.043988480 -4.295696e-01
                                                                 4.131057e+00
## Niacin_USRDA
                     8.956518e+00
                                     1.201672683 -1.086894e-01
                                                                 1.426231e+00
## Riboflavin_USRDA
                     9.134624e+00
                                     0.739284508 -1.992366e-01
                                                                 2.190760e+00
  Thiamin_USRDA
                     1.371520e+01
                                     0.448282517 -3.965262e-02
                                                                 3.315916e+00
  Calcium_USRDA
                     3.512380e+00
                                     0.083012015
                                                  4.004058e-02
                                                                 8.643651e-01
  Copper_USRDA
                     1.035829e-02
                                     0.001030204
                                                  4.169551e-04
                                                                 1.039552e-03
## Magnesium_USRDA
                     5.786153e+00
                                     0.307905343
                                                  1.499207e-01
                                                                 1.044373e+00
## Phosphorus_USRDA
                     9.592220e+00
                                     1.360977795
                                                  3.042194e-01
                                                                 5.783407e-01
## Selenium_USRDA
                     4.938164e+00
                                     2.053519217
                                                  3.065484e-01 -1.605759e+00
                     5.831497e+00
## Zinc_USRDA
                                                  1.369049e-01 -1.013443e-01
                                     1.340956604
##
                                                     VitA_mcg
                           Sugar_g
                                         Fiber_g
                                                                    VitB6_mg
## Energy_kcal
                                    1.441923e+02 3.475814e+03
                     7.215148e+02
                                                               9.880400e+00
## Protein_g
                    -3.819803e+01 -3.312228e+00 2.177609e+02 1.153773e+00
## Fat_g
                    -4.234431e-01 -1.974011e+00 3.014578e+02 -3.565283e-01
                     2.279897e+02 5.383758e+01 3.971645e+01 2.549656e+00
## Carb g
```

```
## Sugar_g
                     1.850171e+02
                                    6.801384e+00 1.075286e+02
                                                                5.778901e-01
## Fiber_g
                     6.801384e+00
                                    1.860775e+01 1.986968e+01
                                                                5.012894e-01
## VitA mcg
                     1.075286e+02
                                    1.986968e+01 6.074054e+05
                                                                5.095539e+01
## VitB6_mg
                     5.778901e-01
                                    5.012894e-01 5.095539e+01
                                                                2.290714e-01
## VitB12_mcg
                     -2.963953e+00 -9.696786e-01 1.955779e+03
                                                                5.464182e-01
## VitC mg
                     5.024715e+01
                                    2.033140e+01 4.993958e+03
                                                                7.477142e+00
## VitE mg
                     3.458409e+00
                                    2.659107e+00 1.323772e+02
                                                                5.269891e-01
## Folate_mcg
                     4.092077e+02
                                    2.004462e+02 1.577821e+04
                                                                4.911759e+01
## Niacin_mg
                     2.260734e+00
                                    2.820760e+00 5.715085e+02
                                                                1.652450e+00
## Riboflavin_mg
                     7.662900e-01
                                    3.060437e-01 1.142001e+02
                                                                1.252462e-01
  Thiamin_mg
                     6.892329e-01
                                    4.588663e-01 2.137979e+01
                                                                1.034600e-01
  Calcium_mg
                     3.548058e+02
                                    2.017672e+02 5.464847e+03
                                                                1.708429e+01
                                                                3.079147e-02
  Copper_mcg
                     -4.390633e-02
                                    4.414566e-01 2.456622e+02
  Iron_mg
                     9.173768e+00
                                    9.553387e+00 4.618463e+02
                                                                1.309941e+00
## Magnesium_mg
                     3.150365e+01
                                    1.310976e+02 1.073741e+03
                                                                7.867222e+00
  Manganese_mg
                     9.439116e-01
                                    2.799346e+00 1.840719e+03
                                                                2.043186e-01
  Phosphorus_mg
                                    1.387903e+02 8.834385e+03
                                                                2.074273e+01
                    -1.375281e+02
  Selenium mcg
                                   -4.381037e+00 1.059354e+03
                                                                1.476032e+00
                    -4.760707e+01
## Zinc_mg
                    -1.004507e+00
                                    1.233557e+00 1.846253e+02
                                                                7.186878e-01
## VitA USRDA
                     1.194762e-01
                                    2.207742e-02 6.748949e+02
                                                                5.661710e-02
## VitB6_USRDA
                     3.399353e-01
                                    2.948761e-01 2.997376e+01
                                                                1.347479e-01
## VitB12 USRDA
                     -1.234981e+00 -4.040328e-01 8.149081e+02
                                                                2.276742e-01
## VitC_USRDA
                                    2.259044e-01 5.548842e+01
                                                                8.307935e-02
                     5.583017e-01
## VitE USRDA
                     2.305606e-01
                                    1.772738e-01 8.825148e+00
                                                                3.513261e-02
                                    5.011156e-01 3.944553e+01
## Folate USRDA
                     1.023019e+00
                                                                1.227940e-01
  Niacin_USRDA
                     1.412959e-01
                                    1.762975e-01 3.571928e+01
                                                                1.032781e-01
  Riboflavin_USRDA
                     5.894539e-01
                                    2.354182e-01 8.784621e+01
                                                                9.634321e-02
  Thiamin_USRDA
                     5.743608e-01
                                    3.823886e-01 1.781649e+01
                                                                8.621667e-02
  Calcium_USRDA
                     2.956715e-01
                                    1.681394e-01 4.554040e+00
                                                                1.423691e-02
                                                                3.421274e-05
## Copper_USRDA
                                    4.905073e-04 2.729580e-01
                    -4.878482e-05
## Magnesium_USRDA
                     7.500868e-02
                                    3.121373e-01 2.556527e+00
                                                                1.873148e-02
  Phosphorus_USRDA -1.964687e-01
                                    1.982718e-01 1.262055e+01
                                                                2.963247e-02
  Selenium_USRDA
                    -8.655830e-01
                                   -7.965521e-02 1.926098e+01
                                                                2.683695e-02
  Zinc_USRDA
##
                    -9.131886e-02
                                    1.121416e-01 1.678412e+01
                                                                6.533526e-02
##
                        VitB12 mcg
                                         VitC mg
                                                        VitE mg
                                                                   Folate mcg
## Energy_kcal
                    -8.993246e+00 -3.267044e+02
                                                  1.980078e+02
                                                                 4.611778e+03
## Protein g
                     1.118393e+01 -4.037389e+01 -1.197228e+00
                                                                 1.759539e+01
                                                  2.064218e+01 -1.718278e+02
## Fat_g
                    -1.424434e+00 -5.481173e+01
## Carb_g
                    -1.113389e+01
                                    1.203750e+02
                                                   7.370322e+00
                                                                 1.652423e+03
## Sugar_g
                    -2.963953e+00
                                    5.024715e+01
                                                   3.458409e+00
                                                                 4.092077e+02
## Fiber_g
                    -9.696786e-01
                                    2.033140e+01
                                                   2.659107e+00
                                                                 2.004462e+02
## VitA mcg
                     1.955779e+03
                                    4.993958e+03
                                                   1.323772e+02
                                                                 1.577821e+04
## VitB6 mg
                     5.464182e-01
                                    7.477142e+00
                                                   5.269891e-01
                                                                 4.911759e+01
## VitB12_mcg
                     1.865534e+01
                                    1.806737e+00
                                                   1.007749e+00
                                                                 1.277037e+02
## VitC_mg
                     1.806737e+00
                                    3.315774e+03
                                                   1.482434e+01
                                                                 7.820334e+02
## VitE_mg
                     1.007749e+00
                                    1.482434e+01
                                                   1.481502e+01
                                                                 1.321031e+02
## Folate_mcg
                     1.277037e+02
                                    7.820334e+02
                                                   1.321031e+02
                                                                 3.480488e+04
## Niacin_mg
                     5.826592e+00
                                    5.821277e+01
                                                   3.665325e+00
                                                                 4.826579e+02
## Riboflavin_mg
                     8.475519e-01
                                    5.852727e+00
                                                   2.721440e-01
                                                                 4.790286e+01
  Thiamin_mg
                     2.230002e-01
                                    1.701012e+00
                                                   2.380549e-01
                                                                 5.210870e+01
  Calcium_mg
                                                   8.500071e+01
                                                                 5.613864e+03
                     1.018873e+01
                                    1.296620e+03
## Copper mcg
                     1.363112e+00
                                    8.108057e-01
                                                   1.585982e-01
                                                                 1.249629e+01
## Iron mg
                     4.386490e+00
                                    2.454079e+01
                                                   3.446064e+00
                                                                 5.067375e+02
## Magnesium mg
                     9.987496e-01
                                    3.720016e+02
                                                  4.212704e+01
                                                                 2.539697e+03
```

```
6.594993e+00
                                                   2.538949e+00
                                                                  6.943299e+01
## Manganese mg
                      6.675315e+00
## Phosphorus_mg
                                                                  4.619803e+03
                      1.305041e+02
                                    1.403372e+02
                                                   5.335232e+01
  Selenium mcg
                                                                  1.838881e+02
                      2.631060e+01
                                   -5.737511e+01
                                                   1.701512e+00
  Zinc_mg
                      4.324385e+00
                                    3.572704e+00
                                                   2.159825e+00
                                                                  2.002202e+02
## VitA_USRDA
                      2.173088e+00
                                    5.548842e+00
                                                   1.470858e-01
                                                                  1.753135e+01
  VitB6 USRDA
                                                   3.099936e-01
##
                      3.214225e-01
                                    4.398319e+00
                                                                  2.889270e+01
  VitB12 USRDA
                      7.773058e+00
                                    7.528069e-01
                                                   4.198953e-01
                                                                  5.320988e+01
## VitC USRDA
                      2.007485e-02
                                    3.684193e+01
                                                   1.647149e-01
                                                                  8.689260e+00
  VitE USRDA
                      6.718324e-02
                                    9.882893e-01
                                                   9.876679e-01
                                                                  8.806876e+00
   Folate_USRDA
                      3.192593e-01
                                    1.955083e+00
                                                   3.302578e-01
                                                                  8.701219e+01
  Niacin_USRDA
                      3.641620e-01
                                    3.638298e+00
                                                   2.290828e-01
                                                                  3.016612e+01
   Riboflavin_USRDA
                      6.519630e-01
                                    4.502098e+00
                                                   2.093415e-01
                                                                  3.684835e+01
   Thiamin_USRDA
                      1.858335e-01
                                    1.417510e+00
                                                   1.983791e-01
                                                                  4.342392e+01
                                                                  4.678220e+00
   Calcium_USRDA
                      8.490607e-03
                                    1.080517e+00
                                                   7.083392e-02
   Copper_USRDA
                      1.514569e-03
                                    9.008952e-04
                                                   1.762202e-04
                                                                  1.388477e-02
   Magnesium_USRDA
                      2.377975e-03
                                                   1.003025e-01
                                                                  6.046898e+00
                                    8.857181e-01
   Phosphorus_USRDA
                     1.864344e-01
                                    2.004817e-01
                                                   7.621760e-02
                                                                  6.599719e+00
   Selenium USRDA
                                                   3.093659e-02
                      4.783746e-01
                                   -1.043184e+00
                                                                  3.343420e+00
   Zinc_USRDA
                                    3.247913e-01
##
                      3.931259e-01
                                                   1.963477e-01
                                                                  1.820184e+01
##
                         Niacin mg Riboflavin mg
                                                     Thiamin mg
                                                                   Calcium mg
##
  Energy_kcal
                      1.433043e+02
                                    1.187501e+01
                                                   1.645824e+01 4.214856e+03
## Protein_g
                      1.922676e+01
                                    9.610699e-01
                                                   5.379390e-01 9.961442e+01
## Fat_g
                     -1.739030e+00 -2.590076e-01
                                                  -4.758314e-02 4.804869e+01
## Carb_g
                      2.281969e+01
                                    2.847988e+00
                                                   3.979099e+00 1.037238e+03
  Sugar_g
                      2.260734e+00
                                    7.662900e-01
                                                   6.892329e-01 3.548058e+02
## Fiber_g
                      2.820760e+00
                                    3.060437e-01
                                                   4.588663e-01 2.017672e+02
  VitA_mcg
                      5.715085e+02
                                    1.142001e+02
                                                   2.137979e+01 5.464847e+03
                      1.652450e+00
                                    1.252462e-01
                                                   1.034600e-01 1.708429e+01
## VitB6_mg
## VitB12_mcg
                      5.826592e+00
                                    8.475519e-01
                                                   2.230002e-01 1.018873e+01
## VitC_mg
                                                   1.701012e+00 1.296620e+03
                      5.821277e+01
                                    5.852727e+00
## VitE_mg
                      3.665325e+00
                                    2.721440e-01
                                                   2.380549e-01 8.500071e+01
                      4.826579e+02
                                    4.790286e+01
                                                   5.210870e+01 5.613864e+03
  Folate_mcg
                      2.337308e+01
                                    1.624134e+00
                                                   1.508239e+00 1.297562e+02
   Niacin_mg
                                                   1.477858e-01 2.012578e+01
  Riboflavin_mg
                      1.624134e+00
                                    2.023920e-01
   Thiamin_mg
                      1.508239e+00
                                    1.477858e-01
                                                   2.687065e-01 1.417969e+01
##
   Calcium_mg
                      1.297562e+02
                                    2.012578e+01
                                                   1.417969e+01 4.054732e+04
  Copper_mcg
                      3.702548e-01
                                    7.483199e-02
                                                   2.857073e-02 9.276577e+00
  Iron_mg
                      1.383697e+01
                                    1.304294e+00
                                                   1.198336e+00 3.985656e+02
  Magnesium_mg
                      7.367333e+01
                                    5.781764e+00
                                                   7.092435e+00 3.531488e+03
  Manganese_mg
                                                   1.597647e-01 9.117719e+01
                      3.084916e+00
                                    3.067682e-01
  Phosphorus mg
                      2.522220e+02
                                    2.046336e+01
                                                   1.838020e+01 2.326078e+04
   Selenium_mcg
                      2.446795e+01
                                    1.791385e+00
                                                   8.168598e-01 5.368660e+01
##
  Zinc_mg
                      7.657354e+00
                                    5.553840e-01
                                                   4.341580e-01 9.516145e+01
##
  VitA_USRDA
                      6.350094e-01
                                    1.268890e-01
                                                   2.375533e-02 6.072053e+00
## VitB6_USRDA
                      9.720296e-01
                                    7.367422e-02
                                                   6.085882e-02 1.004958e+01
  VitB12_USRDA
                      2.427746e+00
                                    3.531466e-01
                                                   9.291674e-02 4.245304e+00
## VitC_USRDA
                      6.468085e-01
                                    6.503030e-02
                                                   1.890014e-02 1.440689e+01
  VitE_USRDA
                      2.443550e-01
                                    1.814293e-02
                                                   1.587033e-02 5.666714e+00
  Folate_USRDA
                      1.206645e+00
                                    1.197571e-01
                                                   1.302718e-01 1.403466e+01
  Niacin_USRDA
                      1.460818e+00
                                    1.015084e-01
                                                   9.426496e-02 8.109765e+00
  Riboflavin_USRDA
                     1.249334e+00
                                    1.556861e-01
                                                   1.136814e-01 1.548137e+01
## Thiamin USRDA
                      1.256866e+00
                                    1.231548e-01
                                                   2.239221e-01 1.181641e+01
## Calcium_USRDA
                      1.081302e-01
                                                   1.181641e-02 3.378944e+01
                                    1.677148e-02
## Copper USRDA
                                    8.314666e-05
                                                   3.174525e-05 1.030731e-02
                      4.113942e-04
```

```
## Magnesium USRDA
                      1.754127e-01
                                    1.376611e-02
                                                  1.688675e-02 8.408304e+00
## Phosphorus USRDA
                     3.603171e-01
                                    2.923337e-02
                                                  2.625743e-02 3.322969e+01
                                    3.257064e-02
  Selenium USRDA
                     4.448719e-01
                                                  1.485200e-02 9.761200e-01
  Zinc USRDA
##
                                                  3.946891e-02 8.651041e+00
                     6.961231e-01
                                    5.048945e-02
                       Copper_mcg
                                         Iron mg Magnesium mg
                                                                Manganese mg
## Energy_kcal
                     9.322461e+00
                                    1.897139e+02 2.430184e+03
                                                                4.067899e+01
## Protein_g
                     9.271838e-01
                                    7.635961e+00 1.293202e+02
                                                                2.676615e+00
## Fat g
                     3.752596e-01 -3.671758e+00 6.296670e+01 -5.993033e-02
## Carb_g
                     9.355972e-01
                                    5.467115e+01 4.386367e+02
                                                                9.662447e+00
## Sugar_g
                    -4.390633e-02
                                    9.173768e+00 3.150365e+01
                                                                9.439116e-01
## Fiber_g
                     4.414566e-01
                                    9.553387e+00 1.310976e+02
                                                                2.799346e+00
## VitA_mcg
                     2.456622e+02
                                    4.618463e+02 1.073741e+03
                                                                1.840719e+03
                     3.079147e-02
                                    1.309941e+00 7.867222e+00
                                                                2.043186e-01
## VitB6_mg
## VitB12_mcg
                     1.363112e+00
                                    4.386490e+00 9.987496e-01
                                                                6.675315e+00
## VitC_mg
                     8.108057e-01
                                    2.454079e+01 3.720016e+02
                                                                6.594993e+00
## VitE_mg
                     1.585982e-01
                                    3.446064e+00 4.212704e+01
                                                                2.538949e+00
## Folate_mcg
                                    5.067375e+02 2.539697e+03
                     1.249629e+01
                                                                6.943299e+01
                     3.702548e-01
                                    1.383697e+01 7.367333e+01
                                                                3.084916e+00
## Niacin mg
## Riboflavin_mg
                     7.483199e-02
                                    1.304294e+00 5.781764e+00
                                                                3.067682e-01
## Thiamin mg
                     2.857073e-02
                                    1.198336e+00 7.092435e+00
                                                                1.597647e-01
##
  Calcium_mg
                     9.276577e+00
                                    3.985656e+02 3.531488e+03
                                                                9.117719e+01
## Copper_mcg
                     3.058670e-01
                                    5.684484e-01 1.056994e+01
                                                                5.918735e-01
## Iron_mg
                                    3.279815e+01 1.291584e+02
                                                                3.414680e+00
                     5.684484e-01
## Magnesium mg
                     1.056994e+01
                                    1.291584e+02 3.143672e+03
                                                                6.381415e+01
  Manganese mg
                     5.918735e-01
                                    3.414680e+00 6.381415e+01
                                                                4.074828e+01
  Phosphorus_mg
                     2.425184e+01
                                    2.566585e+02 4.882429e+03
                                                                1.011897e+02
                                    1.034686e+01 2.016020e+02
  Selenium_mcg
                     1.983955e+00
                                                                4.048977e+00
## Zinc_mg
                     4.800148e-01
                                    7.217161e+00 4.823707e+01
                                                                1.398135e+00
## VitA_USRDA
                     2.729580e-01
                                    5.131625e-01 1.193046e+00
                                                                2.045243e+00
## VitB6_USRDA
                                    7.705537e-01 4.627777e+00
                                                                1.201874e-01
                     1.811263e-02
## VitB12_USRDA
                     5.679633e-01
                                    1.827704e+00 4.161457e-01
                                                                2.781381e+00
## VitC_USRDA
                     9.008952e-03
                                    2.726754e-01 4.133351e+00
                                                                7.327770e-02
## VitE_USRDA
                     1.057321e-02
                                    2.297376e-01 2.808469e+00
                                                                1.692632e-01
## Folate_USRDA
                     3.124073e-02
                                    1.266844e+00 6.349242e+00
                                                                1.735825e-01
## Niacin USRDA
                     2.314093e-02
                                    8.648109e-01 4.604583e+00
                                                                1.928072e-01
## Riboflavin_USRDA
                     5.756307e-02
                                    1.003303e+00 4.447511e+00
                                                                2.359755e-01
  Thiamin USRDA
                     2.380894e-02
                                    9.986132e-01 5.910363e+00
                                                                1.331372e-01
## Calcium_USRDA
                                    3.321380e-01 2.942906e+00
                     7.730481e-03
                                                                7.598099e-02
## Copper_USRDA
                                    6.316094e-04 1.174437e-02
                     3.398522e-04
                                                                6.576372e-04
  Magnesium_USRDA
                     2.516651e-02
                                    3.075199e-01 7.484932e+00
                                                                1.519385e-01
  Phosphorus USRDA
                     3.464548e-02
                                    3.666550e-01 6.974899e+00
                                                                1.445568e-01
## Selenium USRDA
                                    1.881247e-01 3.665491e+00
                     3.607191e-02
                                                                7.361776e-02
##
  Zinc USRDA
                     4.363771e-02
                                    6.561056e-01 4.385189e+00
                                                                1.271032e-01
##
                    Phosphorus_mg
                                    Selenium_mcg
                                                        Zinc_mg
                                                                  VitA_USRDA
## Energy_kcal
                     6.714554e+03
                                    2.715990e+02
                                                  6.414646e+01 3.862015e+00
## Protein_g
                     9.526845e+02
                                    1.129436e+02
                                                  1.475052e+01 2.419566e-01
## Fat_g
                     2.129536e+02
                                    1.686016e+01
                                                  1.505954e+00 3.349531e-01
## Carb_g
                     4.048385e+02 -8.831674e+01 -1.114788e+00 4.412939e-02
                    -1.375281e+02 -4.760707e+01 -1.004507e+00 1.194762e-01
## Sugar_g
## Fiber_g
                     1.387903e+02 -4.381037e+00
                                                   1.233557e+00 2.207742e-02
## VitA_mcg
                     8.834385e+03
                                    1.059354e+03
                                                  1.846253e+02 6.748949e+02
## VitB6 mg
                     2.074273e+01
                                    1.476032e+00
                                                  7.186878e-01 5.661710e-02
## VitB12_mcg
                     1.305041e+02
                                    2.631060e+01
                                                  4.324385e+00 2.173088e+00
## VitC mg
                      1.403372e+02 -5.737511e+01
                                                  3.572704e+00 5.548842e+00
```

```
## VitE mg
                      5.335232e+01
                                    1.701512e+00
                                                   2.159825e+00 1.470858e-01
## Folate_mcg
                                    1.838881e+02
                                                   2.002202e+02 1.753135e+01
                      4.619803e+03
                                                   7.657354e+00 6.350094e-01
## Niacin_mg
                      2.522220e+02
                                    2.446795e+01
## Riboflavin_mg
                      2.046336e+01
                                    1.791385e+00
                                                   5.553840e-01 1.268890e-01
  Thiamin_mg
                      1.838020e+01
                                    8.168598e-01
                                                   4.341580e-01 2.375533e-02
##
  Calcium mg
                                    5.368660e+01
                                                   9.516145e+01 6.072053e+00
                      2.326078e+04
  Copper_mcg
                      2.425184e+01
                                    1.983955e+00
                                                   4.800148e-01 2.729580e-01
  Iron mg
                      2.566585e+02
                                    1.034686e+01
                                                   7.217161e+00 5.131625e-01
  Magnesium_mg
                      4.882429e+03
                                    2.016020e+02
                                                   4.823707e+01 1.193046e+00
  Manganese_mg
                      1.011897e+02
                                    4.048977e+00
                                                   1.398135e+00 2.045243e+00
  Phosphorus_mg
                      4.124686e+04
                                    1.285294e+03
                                                   1.818136e+02 9.815984e+00
  Selenium_mcg
                      1.285294e+03
                                    8.004569e+02
                                                   1.950577e+01 1.177060e+00
                                                   1.127759e+01 2.051392e-01
##
  Zinc_mg
                      1.818136e+02
                                    1.950577e+01
## VitA_USRDA
                      9.815984e+00
                                    1.177060e+00
                                                   2.051392e-01 7.498833e-01
## VitB6_USRDA
                      1.220160e+01
                                    8.682542e-01
                                                   4.227575e-01 3.330418e-02
## VitB12_USRDA
                      5.437671e+01
                                    1.096275e+01
                                                   1.801827e+00 9.054535e-01
## VitC_USRDA
                      1.559302e+00
                                   -6.375013e-01
                                                   3.969671e-02 6.165380e-02
## VitE USRDA
                                                   1.439883e-01 9.805721e-03
                      3.556821e+00
                                    1.134341e-01
                                                   5.005506e-01 4.382837e-02
## Folate_USRDA
                      1.154951e+01
                                    4.597202e-01
## Niacin USRDA
                      1.576387e+01
                                    1.529247e+00
                                                   4.785846e-01 3.968809e-02
## Riboflavin_USRDA
                     1.574105e+01
                                    1.377988e+00
                                                   4.272184e-01 9.760690e-02
  Thiamin USRDA
                      1.531684e+01
                                    6.807165e-01
                                                   3.617984e-01 1.979611e-02
## Calcium USRDA
                                                   7.930121e-02 5.060044e-03
                      1.938398e+01
                                    4.473883e-02
  Copper USRDA
                      2.694649e-02
                                    2.204395e-03
                                                   5.333497e-04 3.032867e-04
  Magnesium USRDA
                      1.162483e+01
                                    4.800048e-01
                                                   1.148502e-01 2.840585e-03
  Phosphorus_USRDA
                     5.892409e+01
                                    1.836134e+00
                                                   2.597336e-01 1.402283e-02
  Selenium_USRDA
                      2.336898e+01
                                    1.455376e+01
                                                   3.546504e-01 2.140109e-02
##
  Zinc_USRDA
                      1.652850e+01
                                    1.773252e+00
                                                   1.025236e+00 1.864902e-02
##
                      VitB6_USRDA
                                    VitB12_USRDA
                                                     VitC_USRDA
                                                                    VitE_USRDA
                      5.812000e+00 -3.747186e+00 -3.630049e+00
## Energy_kcal
                                                                 1.320052e+01
## Protein_g
                      6.786902e-01
                                    4.659969e+00 -4.485988e-01 -7.981519e-02
## Fat_g
                    -2.097225e-01 -5.935141e-01 -6.090192e-01
                                                                 1.376145e+00
                      1.499798e+00 -4.639122e+00
                                                   1.337500e+00
                                                                 4.913548e-01
  Carb_g
                      3.399353e-01 -1.234981e+00
                                                                 2.305606e-01
## Sugar_g
                                                   5.583017e-01
## Fiber_g
                      2.948761e-01 -4.040328e-01
                                                                 1.772738e-01
                                                   2.259044e-01
## VitA_mcg
                      2.997376e+01
                                    8.149081e+02
                                                   5.548842e+01
                                                                 8.825148e+00
## VitB6 mg
                      1.347479e-01
                                    2.276742e-01
                                                   8.307935e-02
                                                                 3.513261e-02
## VitB12_mcg
                      3.214225e-01
                                    7.773058e+00
                                                   2.007485e-02
                                                                 6.718324e-02
## VitC mg
                      4.398319e+00
                                    7.528069e-01
                                                   3.684193e+01
                                                                 9.882893e-01
## VitE_mg
                                                   1.647149e-01
                                                                 9.876679e-01
                      3.099936e-01
                                    4.198953e-01
## Folate_mcg
                      2.889270e+01
                                    5.320988e+01
                                                   8.689260e+00
                                                                 8.806876e+00
## Niacin_mg
                      9.720296e-01
                                    2.427746e+00
                                                   6.468085e-01
                                                                 2.443550e-01
## Riboflavin_mg
                      7.367422e-02
                                    3.531466e-01
                                                   6.503030e-02
                                                                 1.814293e-02
  Thiamin_mg
                      6.085882e-02
                                    9.291674e-02
                                                   1.890014e-02
                                                                 1.587033e-02
## Calcium_mg
                      1.004958e+01
                                    4.245304e+00
                                                   1.440689e+01
                                                                 5.666714e+00
## Copper_mcg
                      1.811263e-02
                                    5.679633e-01
                                                   9.008952e-03
                                                                 1.057321e-02
  Iron_mg
                      7.705537e-01
                                    1.827704e+00
                                                   2.726754e-01
                                                                 2.297376e-01
## Magnesium_mg
                      4.627777e+00
                                    4.161457e-01
                                                   4.133351e+00
                                                                 2.808469e+00
## Manganese_mg
                      1.201874e-01
                                    2.781381e+00
                                                   7.327770e-02
                                                                 1.692632e-01
## Phosphorus_mg
                      1.220160e+01
                                    5.437671e+01
                                                   1.559302e+00
                                                                 3.556821e+00
                                                  -6.375013e-01
## Selenium_mcg
                      8.682542e-01
                                    1.096275e+01
                                                                 1.134341e-01
## Zinc_mg
                      4.227575e-01
                                    1.801827e+00
                                                   3.969671e-02
                                                                 1.439883e-01
## VitA_USRDA
                      3.330418e-02
                                    9.054535e-01
                                                   6.165380e-02
                                                                 9.805721e-03
## VitB6 USRDA
                      7.926347e-02
                                    1.339260e-01
                                                  4.887021e-02
                                                                 2.066624e-02
```

```
## VitB12_USRDA
                      1.339260e-01
                                                   8.364521e-03
                                                                  2.799302e-02
                                    3.238774e+00
## VitC USRDA
                      4.887021e-02
                                                   4.093548e-01
                                                                  1.098099e-02
                                    8.364521e-03
## VitE USRDA
                      2.066624e-02
                                    2.799302e-02
                                                   1.098099e-02
                                                                  6.584452e-02
## Folate_USRDA
                      7.223175e-02
                                    1.330247e-01
                                                   2.172315e-02
                                                                  2.201719e-02
## Niacin_USRDA
                      6.075185e-02
                                    1.517342e-01
                                                   4.042553e-02
                                                                  1.527219e-02
  Riboflavin USRDA
                                                   5.002331e-02
                                                                  1.395610e-02
                      5.667248e-02
                                    2.716512e-01
   Thiamin USRDA
                      5.071569e-02
                                    7.743062e-02
                                                   1.575012e-02
                                                                  1.322527e-02
   Calcium USRDA
                      8.374654e-03
                                    3.537753e-03
                                                   1.200575e-02
                                                                  4.722262e-03
   Copper_USRDA
                      2.012514e-05
                                    6.310703e-04
                                                   1.000995e-05
                                                                  1.174802e-05
   Magnesium_USRDA
                      1.101852e-02
                                    9.908230e-04
                                                   9.841312e-03
                                                                  6.686832e-03
   Phosphorus_USRDA
                      1.743086e-02
                                    7.768101e-02
                                                   2.227574e-03
                                                                  5.081173e-03
   Selenium_USRDA
                      1.578644e-02
                                    1.993228e-01
                                                  -1.159093e-02
                                                                  2.062439e-03
##
   Zinc_USRDA
                      3.843250e-02
                                    1.638025e-01
                                                   3.608792e-03
                                                                  1.308985e-02
##
                      Folate_USRDA
                                    Niacin_USRDA Riboflavin_USRDA Thiamin_USRDA
                      1.152945e+01
  Energy_kcal
                                    8.956518e+00
                                                      9.134624e+00
                                                                     1.371520e+01
  Protein_g
                      4.398848e-02
                                    1.201673e+00
                                                      7.392845e-01
                                                                     4.482825e-01
## Fat_g
                     -4.295696e-01
                                   -1.086894e-01
                                                     -1.992366e-01 -3.965262e-02
                                                                     3.315916e+00
  Carb g
                      4.131057e+00
                                    1.426231e+00
                                                      2.190760e+00
                                                      5.894539e-01
                                                                     5.743608e-01
## Sugar_g
                      1.023019e+00
                                    1.412959e-01
## Fiber_g
                      5.011156e-01
                                    1.762975e-01
                                                      2.354182e-01
                                                                     3.823886e-01
## VitA_mcg
                      3.944553e+01
                                    3.571928e+01
                                                      8.784621e+01
                                                                     1.781649e+01
## VitB6 mg
                      1.227940e-01
                                    1.032781e-01
                                                      9.634321e-02
                                                                     8.621667e-02
## VitB12_mcg
                                                                     1.858335e-01
                      3.192593e-01
                                    3.641620e-01
                                                      6.519630e-01
## VitC mg
                      1.955083e+00
                                    3.638298e+00
                                                      4.502098e+00
                                                                     1.417510e+00
## VitE mg
                      3.302578e-01
                                    2.290828e-01
                                                      2.093415e-01
                                                                     1.983791e-01
## Folate_mcg
                      8.701219e+01
                                    3.016612e+01
                                                      3.684835e+01
                                                                     4.342392e+01
  Niacin_mg
                      1.206645e+00
                                    1.460818e+00
                                                      1.249334e+00
                                                                     1.256866e+00
## Riboflavin_mg
                      1.197571e-01
                                    1.015084e-01
                                                      1.556861e-01
                                                                     1.231548e-01
   Thiamin_mg
                      1.302718e-01
                                    9.426496e-02
                                                      1.136814e-01
                                                                     2.239221e-01
                                    8.109765e+00
  Calcium_mg
                      1.403466e+01
                                                      1.548137e+01
                                                                     1.181641e+01
   Copper_mcg
                      3.124073e-02
                                    2.314093e-02
                                                      5.756307e-02
                                                                     2.380894e-02
##
   Iron_mg
                      1.266844e+00
                                                      1.003303e+00
                                                                     9.986132e-01
                                    8.648109e-01
   Magnesium_mg
                      6.349242e+00
                                    4.604583e+00
                                                      4.447511e+00
                                                                     5.910363e+00
                                                      2.359755e-01
  Manganese_mg
                      1.735825e-01
                                    1.928072e-01
                                                                     1.331372e-01
   Phosphorus mg
                      1.154951e+01
                                    1.576387e+01
                                                      1.574105e+01
                                                                     1.531684e+01
##
  Selenium_mcg
                      4.597202e-01
                                    1.529247e+00
                                                      1.377988e+00
                                                                     6.807165e-01
## Zinc mg
                      5.005506e-01
                                    4.785846e-01
                                                      4.272184e-01
                                                                     3.617984e-01
## VitA_USRDA
                      4.382837e-02
                                    3.968809e-02
                                                      9.760690e-02
                                                                     1.979611e-02
## VitB6_USRDA
                      7.223175e-02
                                    6.075185e-02
                                                      5.667248e-02
                                                                     5.071569e-02
  VitB12_USRDA
                                                      2.716512e-01
                                                                     7.743062e-02
                      1.330247e-01
                                    1.517342e-01
  VitC USRDA
                      2.172315e-02
                                    4.042553e-02
                                                      5.002331e-02
                                                                     1.575012e-02
  VitE USRDA
                      2.201719e-02
                                    1.527219e-02
                                                      1.395610e-02
                                                                     1.322527e-02
                      2.175305e-01
##
  Folate_USRDA
                                    7.541529e-02
                                                      9.212088e-02
                                                                     1.085598e-01
   Niacin_USRDA
                      7.541529e-02
                                    9.130111e-02
                                                      7.808337e-02
                                                                     7.855414e-02
## Riboflavin_USRDA
                      9.212088e-02
                                    7.808337e-02
                                                      1.197586e-01
                                                                     9.473448e-02
   Thiamin_USRDA
                      1.085598e-01
                                    7.855414e-02
                                                      9.473448e-02
                                                                     1.866017e-01
##
   Calcium_USRDA
                      1.169555e-02
                                    6.758138e-03
                                                      1.290114e-02
                                                                     9.847008e-03
   Copper_USRDA
                      3.471192e-05
                                    2.571214e-05
                                                      6.395897e-05
                                                                     2.645438e-05
                                                      1.058931e-02
## Magnesium_USRDA
                      1.511724e-02
                                    1.096329e-02
                                                                     1.407229e-02
  Phosphorus_USRDA
                      1.649930e-02
                                    2.251982e-02
                                                      2.248721e-02
                                                                     2.188119e-02
  Selenium_USRDA
                      8.358550e-03
                                    2.780449e-02
                                                      2.505434e-02
                                                                     1.237666e-02
##
   Zinc_USRDA
                      4.550460e-02
                                    4.350769e-02
                                                      3.883804e-02
                                                                     3.289076e-02
##
                     Calcium_USRDA
                                    Copper_USRDA Magnesium_USRDA Phosphorus_USRDA
## Energy_kcal
                      3.512380e+00
                                    1.035829e-02
                                                     5.786153e+00
                                                                       9.592220e+00
```

```
## Protein_g
                      8.301201e-02
                                    1.030204e-03
                                                     3.079053e-01
                                                                       1.360978e+00
## Fat_g
                      4.004058e-02
                                    4.169551e-04
                                                     1.499207e-01
                                                                       3.042194e-01
                      8.643651e-01
                                                                       5.783407e-01
## Carb g
                                    1.039552e-03
                                                     1.044373e+00
## Sugar_g
                                                     7.500868e-02
                      2.956715e-01 -4.878482e-05
                                                                      -1.964687e-01
## Fiber_g
                      1.681394e-01
                                    4.905073e-04
                                                     3.121373e-01
                                                                       1.982718e-01
## VitA mcg
                      4.554040e+00
                                    2.729580e-01
                                                     2.556527e+00
                                                                       1.262055e+01
## VitB6 mg
                      1.423691e-02
                                    3.421274e-05
                                                     1.873148e-02
                                                                       2.963247e-02
## VitB12 mcg
                      8.490607e-03
                                    1.514569e-03
                                                     2.377975e-03
                                                                       1.864344e-01
## VitC mg
                      1.080517e+00
                                    9.008952e-04
                                                     8.857181e-01
                                                                       2.004817e-01
## VitE_mg
                      7.083392e-02
                                    1.762202e-04
                                                     1.003025e-01
                                                                       7.621760e-02
## Folate_mcg
                      4.678220e+00
                                    1.388477e-02
                                                     6.046898e+00
                                                                       6.599719e+00
## Niacin_mg
                      1.081302e-01
                                    4.113942e-04
                                                     1.754127e-01
                                                                       3.603171e-01
                      1.677148e-02
                                    8.314666e-05
                                                     1.376611e-02
                                                                       2.923337e-02
## Riboflavin_mg
                                    3.174525e-05
                                                     1.688675e-02
  Thiamin_mg
                      1.181641e-02
                                                                       2.625743e-02
## Calcium_mg
                      3.378944e+01
                                    1.030731e-02
                                                     8.408304e+00
                                                                       3.322969e+01
## Copper_mcg
                      7.730481e-03
                                     3.398522e-04
                                                     2.516651e-02
                                                                       3.464548e-02
  Iron_mg
                                                     3.075199e-01
                      3.321380e-01
                                    6.316094e-04
                                                                       3.666550e-01
## Magnesium mg
                      2.942906e+00
                                    1.174437e-02
                                                     7.484932e+00
                                                                       6.974899e+00
## Manganese_mg
                      7.598099e-02
                                    6.576372e-04
                                                     1.519385e-01
                                                                       1.445568e-01
  Phosphorus mg
                      1.938398e+01
                                    2.694649e-02
                                                     1.162483e+01
                                                                       5.892409e+01
## Selenium_mcg
                      4.473883e-02
                                    2.204395e-03
                                                     4.800048e-01
                                                                       1.836134e+00
## Zinc mg
                      7.930121e-02
                                    5.333497e-04
                                                     1.148502e-01
                                                                       2.597336e-01
## VitA_USRDA
                      5.060044e-03
                                    3.032867e-04
                                                     2.840585e-03
                                                                       1.402283e-02
## VitB6 USRDA
                      8.374654e-03
                                    2.012514e-05
                                                     1.101852e-02
                                                                       1.743086e-02
                                                     9.908230e-04
## VitB12 USRDA
                      3.537753e-03
                                    6.310703e-04
                                                                       7.768101e-02
## VitC USRDA
                      1.200575e-02
                                    1.000995e-05
                                                     9.841312e-03
                                                                       2.227574e-03
                                                                       5.081173e-03
## VitE_USRDA
                      4.722262e-03
                                    1.174802e-05
                                                     6.686832e-03
## Folate_USRDA
                      1.169555e-02
                                    3.471192e-05
                                                     1.511724e-02
                                                                       1.649930e-02
## Niacin_USRDA
                      6.758138e-03
                                    2.571214e-05
                                                     1.096329e-02
                                                                       2.251982e-02
## Riboflavin_USRDA
                                    6.395897e-05
                                                     1.058931e-02
                                                                       2.248721e-02
                      1.290114e-02
  Thiamin_USRDA
                      9.847008e-03
                                     2.645438e-05
                                                     1.407229e-02
                                                                       2.188119e-02
  Calcium_USRDA
                      2.815786e-02
                                    8.589423e-06
                                                     7.006920e-03
                                                                       2.769141e-02
   Copper_USRDA
                      8.589423e-06
                                     3.776135e-07
                                                     2.796279e-05
                                                                       3.849498e-05
## Magnesium_USRDA
                      7.006920e-03
                                    2.796279e-05
                                                     1.782127e-02
                                                                       1.660690e-02
   Phosphorus USRDA
                      2.769141e-02
                                     3.849498e-05
                                                     1.660690e-02
                                                                       8.417727e-02
  Selenium USRDA
                      8.134333e-04
                                    4.007990e-05
                                                     8.727360e-03
                                                                       3.338425e-02
## Zinc USRDA
                      7.209201e-03
                                    4.848634e-05
                                                     1.044093e-02
                                                                       2.361215e-02
##
                     Selenium_USRDA
                                        Zinc_USRDA
## Energy_kcal
                                     5.831497e+00
                       4.9381638962
## Protein_g
                                     1.340957e+00
                       2.0535192175
## Fat_g
                       0.3065484240
                                     1.369049e-01
## Carb g
                      -1.6057588219 -1.013443e-01
## Sugar_g
                      -0.8655830263 -9.131886e-02
## Fiber_g
                      -0.0796552134
                                     1.121416e-01
## VitA_mcg
                      19.2609841441
                                     1.678412e+01
## VitB6_mg
                       0.0268369471
                                     6.533526e-02
## VitB12_mcg
                       0.4783746115
                                     3.931259e-01
## VitC_mg
                      -1.0431838724
                                     3.247913e-01
## VitE_mg
                       0.0309365863
                                     1.963477e-01
## Folate_mcg
                       3.3434198231
                                      1.820184e+01
## Niacin_mg
                                     6.961231e-01
                       0.4448718533
## Riboflavin_mg
                       0.0325706372
                                     5.048945e-02
## Thiamin_mg
                       0.0148519964
                                     3.946891e-02
## Calcium mg
                       0.9761199707
                                     8.651041e+00
```

```
## Copper_mcg
                      0.0360719142
                                    4.363771e-02
## Iron_mg
                      0.1881247132
                                    6.561056e-01
## Magnesium mg
                      3.6654912705
                                    4.385189e+00
## Manganese_mg
                                    1.271032e-01
                      0.0736177609
## Phosphorus_mg
                     23.3689773145
                                    1.652850e+01
## Selenium mcg
                     14.5537619189
                                    1.773252e+00
## Zinc mg
                      0.3546504187
                                    1.025236e+00
## VitA USRDA
                      0.0214010935
                                    1.864902e-02
## VitB6 USRDA
                      0.0157864395
                                    3.843250e-02
## VitB12_USRDA
                      0.1993227548
                                    1.638025e-01
## VitC_USRDA
                     -0.0115909319
                                    3.608792e-03
## VitE_USRDA
                      0.0020624391
                                    1.308985e-02
## Folate_USRDA
                      0.0083585496
                                    4.550460e-02
## Niacin_USRDA
                      0.0278044908
                                    4.350769e-02
## Riboflavin_USRDA
                      0.0250543363
                                    3.883804e-02
## Thiamin_USRDA
                      0.0123766637
                                    3.289076e-02
## Calcium_USRDA
                                    7.209201e-03
                      0.0008134333
## Copper USRDA
                      0.0000400799
                                    4.848634e-05
## Magnesium_USRDA
                      0.0087273602
                                    1.044093e-02
## Phosphorus USRDA
                      0.0333842533
                                    2.361215e-02
## Selenium_USRDA
                      0.2646138531
                                    3.224095e-02
## Zinc_USRDA
                                    9.320325e-02
                      0.0322409472
```

b. The eigenvalues of the covariance matrix are called the principal component values. How many of the 38 principal components are within 0.1% of the largest component?

```
eigen_nndb = eigen(cov_nndb)
eigen_nndb$values
    [1]
        6.081308e+05
                      6.818525e+04
                                    3.403074e+04
                                                  2.647470e+04
                                                                1.739410e+04
##
    [6]
        3.307536e+03
                      2.245686e+03
                                    8.021377e+02
                                                  5.516910e+02
                                                                9.999359e+01
## [11]
        8.100209e+01
                      3.402110e+01
                                    2.278368e+01
                                                   1.294877e+01
                                                                1.179346e+01
## [16]
        1.114752e+01 8.411638e+00 6.624400e+00
                                                  2.029089e+00
                                                                2.661836e-01
## [21]
        1.421729e-01
                      1.047091e-01 8.001511e-02
                                                  2.902667e-12
                                                                1.978165e-12
## [26]
        2.119974e-13
                      6.569654e-15
                                    2.431439e-15
                                                  4.177439e-16
                                                                3.362896e-16
  [31] -4.824302e-19 -6.562843e-18 -1.022111e-17 -3.601724e-17 -8.956535e-17
## [36] -1.409050e-16 -9.955419e-14 -2.053233e-13
paste(sum(eigen_nndb$values[2:length(eigen_nndb$values)]
          < 0.001*eigen_nndb$values[1]))
```

```
## [1] "30"
```

The number of principal components that are less than 0.1% of the largest component is equal to - 30

c. Transform the data into the eigenvector basis, also called the principal component basis. Calculate the covariance matrix in the new basis. What structure can you see from this matrix

```
nndb_num = as.matrix(nndb_num)
transform_nndb_num = nndb_num%*%solve(eigen_nndb$vectors)
transform_cov = cov(transform_nndb_num)
transform_cov
```

```
##
                   [,1]
                                  [,2]
                                                 [,3]
                                                                [,4]
                                                                               [,5]
           2995.133164
##
    [1,]
                         -542.7271211
                                          878.892886
                                                       -2974.394629
                                                                       489.9374345
##
    [2,]
           -542.727121
                          722.3943924
                                          661.884045
                                                         832.827248
                                                                       -75.5263585
    [3,]
            878.892886
                                         2719.785274
                                                       -1037.648258
                                                                       906.6519507
##
                          661.8840452
##
    [4,]
          -2974.394629
                          832.8272477
                                        -1037.648258
                                                        4328.988108
                                                                     -1604.0146095
    [5,]
##
            489.937435
                          -75.5263585
                                          906.651951
                                                       -1604.014610
                                                                      3002.3684993
##
    [6,]
           -827.064857
                         1588.0250845
                                        -1795.001784
                                                        1581.220966
                                                                      -842.5852644
    [7,]
##
           2873.522656
                         -466.7067744
                                        -1656.566577
                                                        -306.569391
                                                                       474.8773997
##
    [8,]
             39.489749
                         -122.5902554
                                         1439.540801
                                                         501.050564
                                                                      -246.0654261
    [9,]
##
            641.202700
                         1345.9318103
                                         -268.349445
                                                        -357.201914
                                                                       -91.9617094
   [10,]
          11544.528098
                        -1970.9910774
                                         6811.235241
                                                      -15075.838106
                                                                      3174.2353706
##
   [11,]
           -193.626129
                         -363.6808659
                                         -218.500024
                                                         261.390907
                                                                        18.4723769
##
   [12,]
           1603.464039
                         -247.1977430
                                         1084.332003
                                                       -2285.262934
                                                                       586.9432017
   [13,]
##
           -416.935235
                        -1428.6358076
                                           73.679208
                                                         176.147977
                                                                        34.2067849
## [14,]
             50.733236
                          -26.5201764
                                           53.923368
                                                         -69.693182
                                                                        18.1680133
  [15,]
             15.937485
                         -134.5048372
                                          467.819231
                                                          95.587080
                                                                       -60.9979458
##
   [16,]
            199.901838
                           40.5860291
                                          205.001126
                                                         -89.220303
                                                                       -21.6395295
   [17,]
             49.190910
                          444.9202972
                                        -2382.373232
                                                        -725.360794
                                                                       318.9288650
##
   [18,]
           -943.357779
                          153.0781152
                                         -690.021247
                                                        1316.216699
                                                                      -527.1965294
##
   [19,]
         -33703.703107
                         5736.9085827
                                       -20331.672790
                                                       44191.038745
                                                                     -9278.4293419
##
  [20,]
            -69.981751
                         -877.8616472
                                        -2325.599784
                                                        1651.342531
                                                                      -798.1622163
## [21,]
                         -622.8228390
                                                       -4798.877557
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## [21,] 6.330963e+03 -2235.2276175 -4.395043e+02 -7.402736e+01
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                         808.0394251
## [22,] -2.235228e+03
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## [23,] -4.395043e+02
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## [24,] -7.402736e+01
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## [25,] 4.286610e+02
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## [27,] 2.189584e+02
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## [28,] -4.357302e+01
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## [29.] 9.002135e+00
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## [36,] 8.579512e+00
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##
##
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##
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##
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##
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##
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##
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## [27,]
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## [34,]
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## [35,]
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```

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##
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                                             [,38]
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    [4,]
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    [7,]
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##
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## [20.]
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## [22,]
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## [23,]
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## [24,]
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## [25,]
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## [37,]
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```

dim(transform_cov)

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