# Homework 02 - STAT440

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## Problem 1

Which of the following is an appropriate variable name?

- (a) 1st\_var
- (b) first\_var
- (c) first.var

first\_var or choice b is the appropriate variables name of the three choices. Variables cannot start with a number and using a dot in the variable name can be confused with function syntax.

## Problem 2

Recall that if  $x := (x_1, ..., x_d) \in \mathbb{R}^d$ , then the euclidean norm of x is  $||x||_2 = \sqrt{\sum_{i=1}^d x_i^2}$ . Let

$$V = [v_1, v_2, v_3, v_4, v_5] = \begin{vmatrix} 1 & 2 & 4 & -1 & 0 \\ 2 & 1 & -4 & 1 & 3 \\ 3 & 0 & 1 & -1 & 5 \end{vmatrix}$$

Create matrix V in R:

```
mat_v <- matrix(c(1, 2, 3, 2, 1, 0, 4, -4, 1, -1, 1, -1, 0, 3, 5), nrow = 3, ncol=5)
mat_v
```

```
## [,1] [,2] [,3] [,4] [,5]
## [1,] 1 2 4 -1 0
## [2,] 2 1 -4 1 3
## [3,] 3 0 1 -1 5
```

Use R to do the following

#### 2a

Create a matrix D made out of the norm of all pairwise distances of the column vectors of V. That is, the  $ij^{th}$  entry of D is  $||v_i - v_j||_2$ .

```
12_norm <- function(vec) {
    sqrt(sum(vec^2))
}

num_cols <- dim(mat_v)[2]
mat_d <- matrix(1:25, nrow = num_cols, ncol = num_cols)
for (i in 1:num_cols) {
    for (j in 1:num_cols) {
        mat_d[i, j] <- 12_norm(mat_v[,i] - mat_v[,j])
    }
}
mat_d</pre>
```

```
## [,1] [,2] [,3] [,4] [,5]

## [1,] 0.000000 3.316625 7.000000 4.582576 2.449490

## [2,] 3.316625 0.000000 5.477226 3.162278 5.744563

## [3,] 7.000000 5.477226 0.000000 7.348469 9.000000

## [4,] 4.582576 3.162278 7.348469 0.000000 6.403124

## [5,] 2.449490 5.744563 9.000000 6.403124 0.0000000
```

#### **2**b

Use D to compute the average and standard deviation of these distances. Be careful not to double count.

```
dists <- mat_d[upper.tri(mat_d,diag=TRUE)]
print(paste0('Average: ', mean(dists)))

## [1] "Average: 3.63228997170899"

print(paste0('Standard Deviation: ', sd(dists)))

## [1] "Standard Deviation: 3.14071242397252"</pre>
```

## 2c

Find vectors  $y_j$  so that the  $j^{th}$  of  $Dy_j$  is the average distance from  $v_j$  to all other points. Report these numbers.

```
mat_d %*% c(0.2,0.2,0.2,0.2)
```

```
## [,1]
## [1,] 3.469738
## [2,] 3.540138
## [3,] 5.765139
## [4,] 4.299289
## [5,] 4.719435
```

```
for (i in 1:5) {
    print(mean(mat_d[i,]))
}

## [1] 3.469738
## [1] 3.540138
## [1] 5.765139
## [1] 4.299289
## [1] 4.719435
```

The vector  $y_j = (\frac{1}{5}, \frac{1}{5}, \frac{1}{5}, \frac{1}{5}, \frac{1}{5}, \frac{1}{5})$  will make the vector  $Dy_j$  the average distance from each column vector to the other vectors, because there are 5 total columns, and matrix vector multiplication will multiply this value by the values in the row (which represent all the distances) and then sum them.

## Problem 3

#### 3a

Build a simple linear regression function using ordinary least squares that takes two inputs x and y, fits y to x, and returns the slope and intercept. Use it to fit the **iron** column to the **calcium** column in the **nutrient** dataset.

```
ols_regress <- function(x, y) {
    slope_numerator <- cov(x, y)
    slope_denom <- var(x)
    slope <- slope_numerator / slope_denom
    inter <- mean(y) - slope * mean(x)
    return(list("slope" = slope, "intercept" = inter))
}

# load dataset
nutrient_df <- read.csv('./data/nutrient.csv')

# perform regression
model <- ols_regress(nutrient_df$calc, nutrient_df$iron)
print(paste0('Slope: ', model$slope))

## [1] "Slope: 0.00595636285775166"

print(paste0('Intercept: ', model$intercept))

## [1] "Intercept: 7.41283579661136"</pre>
```

#### 3b

Learn how to use the R function **lm** and use it to fit iron to calcium. Use the **summary** function on the output of **lm** and compare it to the output of your function in (a).

```
model <- lm(iron~calc,data=nutrient_df)
summary(model)</pre>
```

```
##
## Call:
## lm(formula = iron ~ calc, data = nutrient_df)
## Residuals:
##
      Min
                                3Q
                1Q Median
                                       Max
  -16.029 -3.432 -0.799
                                   45.907
##
                             2.401
##
## Coefficients:
##
               Estimate Std. Error t value Pr(>|t|)
## (Intercept) 7.4128358 0.3774502
                                      19.64
                                              <2e-16 ***
## calc
              0.0059564 0.0005103
                                      11.67
                                              <2e-16 ***
## ---
## Signif. codes: 0 '*** 0.001 '** 0.01 '* 0.05 '.' 0.1 ' 1
##
## Residual standard error: 5.5 on 735 degrees of freedom
## Multiple R-squared: 0.1564, Adjusted R-squared: 0.1552
## F-statistic: 136.2 on 1 and 735 DF, p-value: < 2.2e-16
```

The output of the lm function regression of fitting **iron** to **calcium** has the same estimate for the intercept and slope.

## **Book Problems**

#### Chapter 2 Problem 1

Instead of copying the table in the book, use the full dataset Deer.txt, available in Canvas. Use \$ instead of c to extract the appropriate columns and give the average for all animals, not just the seven that are shown. Hint: If you need to tell a function not to include NA values. use na.rm=TRUE as an argument.

```
# read dataset
deers <- read.delim('./data/Deer.txt')

# create length var
Length <- deers$LCT
Tb <- deers$Tb

print(paste0('Average length: ', mean(Length, na.rm = TRUE)))

## [1] "Average length: 161.513821892393"</pre>
```

## Chapter 2 Problem 2

```
Farm <- deers$Farm
Month <- deers$Month
Boar <- cbind(Month, Length, Tb)
print(paste0('# of animals: ', nrow(Boar), ' same as ', dim(Boar)[1]))
## [1] "# of animals: 1182 same as 1182"
print(paste0('# of vars: ', ncol(Boar), ' same as ', dim(Boar)[2]))
## [1] "# of vars: 3 same as 3"
Chapter 2 Problem 5
# Confirm data type
print(str(deers))
                   1182 obs. of 9 variables:
## 'data.frame':
   $ Farm : chr "AL" "AL" "AL" "AL" ...
## $ Month : int 10 10 10 10 10 10 10 10 10 ...
## $ Year : int 0 0 0 0 0 0 0 0 0 ...
## $ Sex
            : int 1 1 1 1 1 1 1 1 1 1 ...
## $ clas1_4: int 4 4 3 4 4 4 4 4 4 4 ...
## $ LCT
            : num 191 180 192 196 204 190 196 200 197 208 ...
## $ KFI
             : num 20.4 16.4 15.9 17.3 NA ...
## $ Ecervi : num 0 0 2.38 0 0 0 1.21 0 0.8 0 ...
            : int 0 0 0 0 NA 0 NA 1 0 0 ...
## $ Tb
## NULL
deers$sqrtLength <- sqrt(deers$LCT)</pre>
deers$sqrtLength[1:5]
## [1] 13.82027 13.41641 13.85641 14.00000 14.28286
deer_list <- list(length = deers$LCT, Farm = Farm)</pre>
print(str(deer_list))
## List of 2
## $ length: num [1:1182] 191 180 192 196 204 190 196 200 197 208 ...
## $ Farm : chr [1:1182] "AL" "AL" "AL" "AL" ...
## NULL
deer_list$sqrtLength <- sqrt(deer_list$length)</pre>
```

```
## [1] 13.82027 13.41641 13.85641 14.00000 14.28286
```

deer\_list\$sqrtLength[1:5]

There was no real difference in performing the operation in the list versus the data.frame. This holds true, because the data.frame data structure is merely a list with certain rules imposed such as each element/column must be the same length.

#### Chapter 2 Problem 6

```
data file <- './data/ISIT.txt'</pre>
bio_read <- read.table(data_file, header = TRUE)</pre>
#bio_scan <- scan(data_file, what = 'character')</pre>
#bio scan <- scan(data file, what = 'real', skip=1)
str(bio_read)
## 'data.frame': 789 obs. of 14 variables:
## $ SampleDepth : num 517 582 547 614 1068 ...
## $ Sources
              : num 28.7 27.9 23.4 18.3 12.4 ...
## $ Station
               : int 1 1 1 1 1 1 1 1 1 1 ...
              : int 3 3 3 3 3 3 3 3 3 3 ...
## $ Time
## $ Latitude : num 50.2 50.2 50.2 50.2 50.2 ...
## $ Longitude : num -14.5 -14.5 -14.5 -14.5 ...
## $ Xkm
               : num -34.1 -34.1 -34.1 -34.1 ...
## $ Ykm
              : num 16.8 16.8 16.8 16.8 16.8 ...
## $ Month
              : int 444444444 ...
              ## $ Year
## $ Season
              : int 1 1 1 1 1 1 1 1 1 1 ...
## $ Discovery : int 252 252 252 252 252 252 252 252 252 ...
## $ RelativeDepth: num 3422 3357 3392 3325 2871 ...
str(bio_scan)
## List of 14
## $ : chr [1:790] "SampleDepth" "517" "582" "547" ...
## $ : chr [1:790] "Sources" "28.73" "27.9" "23.44" ...
## $ : chr [1:790] "Station" "1" "1" "1" ...
## $ : chr [1:790] "Time" "3" "3" "3" ...
## $ : chr [1:790] "Latitude" "50.1508" "50.1508" "50.1508" ...
## $ : chr [1:790] "Longitude" "-14.4792" "-14.4792" "-14.4792" ...
## $ : chr [1:790] "Xkm" "-34.106" "-34.106" "-34.106" ...
## $ : chr [1:790] "Ykm" "16.779" "16.779" "16.779" ...
## $ : chr [1:790] "Month" "4" "4" "4" ...
## $ : chr [1:790] "Year" "2001" "2001" "2001" ...
## $ : chr [1:790] "BottomDepth" "3939" "3939" "3939" ...
## $ : chr [1:790] "Season" "1" "1" "1" ...
## $ : chr [1:790] "Discovery" "252" "252" "252" ...
## $ : chr [1:790] "RelativeDepth" "3422" "3357" "3392" ...
is.data.frame(bio_read)
## [1] TRUE
is.data.frame(bio_scan)
## [1] FALSE
```

```
is.matrix(bio_read)
## [1] FALSE
is.matrix(bio_scan)
```

## [1] FALSE

The read table function will read the text file directly into a data frame object while the scan function will create a single long vector containing each value in the text file. You can also scan each column into separate elements of a list by specifying a list in the what parameter of the scan function.

#### Chapter 3 Problem 2

```
# extract data from station 1
station_1 <- bio_read[which(bio_read$Station == 1),]</pre>
summary(station_1$SampleDepth)
##
      Min. 1st Qu.
                    Median
                               Mean 3rd Qu.
                                                Max.
       517
              1528
                       2520
                               2549
                                        3652
                                                3939
##
# extract data from station 2
station_2 <- bio_read[which(bio_read$Station == 2),]</pre>
summary(station_2$SampleDepth)
##
      Min. 1st Qu.
                     Median
                               Mean 3rd Qu.
                                                Max.
##
       501
              1821
                       3290
                               2760
                                        3602
                                                3916
# extract data from station 3
station_3 <- bio_read[which(bio_read$Station == 3),]</pre>
summary(station_3$SampleDepth)
##
      Min. 1st Qu. Median
                               Mean 3rd Qu.
                                                Max.
##
       516
              1340
                       2169
                               2311
                                        3733
                                                3965
# find low sample size stations
station_counts <- table(bio_read$Station)</pre>
station_counts
##
##
            4 5 6 7 8 9 10 11 12 13 14 15 16 17 18 19
    1 2 3
## 38 44 27 5 12 27 35 34 54 55 53 40 56 58 56 51 47 48 49
```

Stations 4 and 5 have considerably fewer observations, so we will omit them.

```
# remove stations 4 and 5
bio_sub <- bio_read[which((bio_read$Station != 4) & (bio_read$Station != 5)),]
unique(bio sub$Station)
   [1] 1 2 3 6 7 8 9 10 11 12 13 14 15 16 17 18 19
# extract 2002 data
data <- bio_read[which(bio_read$Year == 2002),]</pre>
paste0('# of rows: ', nrow(data))
## [1] "# of rows: 405"
paste0('Unique years in data: ', unique(data$Year))
## [1] "Unique years in data: 2002"
# extract April data
data <- bio_read[which(bio_read$Month == 4),]</pre>
paste0('# of rows: ', nrow(data))
## [1] "# of rows: 126"
paste0('Unique months in data: ', unique(data$Month))
## [1] "Unique months in data: 4"
# extract measurements greater than 2000m depth
data <- bio_read[which(bio_read$SampleDepth > 2000),]
paste0('# of rows: ', nrow(data))
## [1] "# of rows: 387"
pasteO('Min depth of data: ', min(data$SampleDepth))
## [1] "Min depth of data: 2003"
# show data by increasing depth values
data <- bio_read[order(bio_read$SampleDepth),]</pre>
data[1:20,]
##
      SampleDepth Sources Station Time Latitude Longitude
                                                                Xkm
                                                                         Ykm
## 39
           501.00 21.53000
                                2
                                      3 50.0910 -14.4665 -33.294
                                                                      10.112
## 427
           505.00 28.57000
                                13
                                      2 49.8567 -13.9620
                                                              2.722 -15.890
                                     1 50.1337 -14.4992 -35.543
           516.00 24.43000
## 83
                                3
                                                                      14.890
## 694
           516.00 31.63000
                                18
                                      3 49.4647 -15.5700 -113.383 -59.450
           517.00 28.73000
## 1
                                1
                                      3 50.1508 -14.4792 -34.106
                                                                      16.779
## 541
           518.70 59.55335
                                15
                                      2 49.8070 -14.0643
                                                           -4.590 -21.447
                                      1 49.8358 -11.4977 179.313 -18.224
## 112
           522.00 26.45000
                                 4
```

```
## 115
             526.00 26.83000
                                     5
                                              49.8842
                                                       -11.6330
                                                                  169.599
                                                                            -13.067
                                                                   26.693
## 775
             531.00 18.83000
                                    19
                                          2
                                             49.7792
                                                       -13.6275
                                                                            -24.558
## 425
             543.00 33.34000
                                    13
                                          2
                                              49.8567
                                                       -13.9620
                                                                     2.722
                                                                            -15.890
## 3
             547.00 23.44000
                                     1
                                          3
                                             50.1508
                                                       -14.4792
                                                                  -34.106
                                                                             16.779
## 695
             549.00 31.42000
                                    18
                                          3
                                             49.4647
                                                        -15.5700 -113.383
                                                                            -59.450
## 84
             550.00 22.41000
                                     3
                                             50.1337
                                                       -14.4992
                                                                  -35.543
                                                                             14.890
                                          1
## 540
             554.97 77.93401
                                    15
                                          2
                                              49.8070
                                                       -14.0643
                                                                    -4.590
                                                                            -21.447
## 657
             556.00 16.72000
                                    17
                                          2
                                             48.7772
                                                        -16.4845 -181.965 -135.902
## 110
             559.00 27.56000
                                     4
                                          1
                                              49.8358
                                                        -11.4977
                                                                   179.313
                                                                            -18.224
                                     5
## 116
             561.00 25.66000
                                          2
                                             49.8842
                                                       -11.6330
                                                                   169.599
                                                                            -13.067
## 755
             567.00 29.59000
                                    19
                                          2
                                             49.7792
                                                       -13.6275
                                                                    26.693
                                                                            -24.558
## 426
             580.00 32.57000
                                          2
                                              49.8567
                                                                     2.722
                                    13
                                                       -13.9620
                                                                            -15.890
## 693
             580.00 36.33000
                                    18
                                          3
                                              49.4647
                                                       -15.5700 -113.383
                                                                            -59.450
##
       Month Year BottomDepth Season Discovery RelativeDepth
## 39
            4 2001
                           3981
                                               252
                                      1
                                                          3480.00
## 427
            3
             2002
                           3901
                                      1
                                               260
                                                          3396.00
## 83
            4 2001
                                               252
                           3977
                                      1
                                                          3461.00
## 694
           10 2002
                           4728
                                      2
                                               266
                                                          4212.00
## 1
            4 2001
                           3939
                                               252
                                                          3422.00
                                      1
## 541
           3 2002
                           3993
                                      1
                                               260
                                                          3474.30
## 112
           4 2001
                            740
                                      1
                                               252
                                                           218.00
## 115
            4 2001
                           1035
                                               252
                                                           509.00
                                      1
## 775
           10 2002
                                      2
                           2927
                                               266
                                                          2396.00
## 425
           3 2002
                                               260
                                                          3358.00
                           3901
                                      1
## 3
           4 2001
                           3939
                                      1
                                               252
                                                          3392.00
## 695
           10 2002
                           4728
                                      2
                                               266
                                                          4179.00
## 84
           4 2001
                           3977
                                               252
                                                          3427.00
                                      1
## 540
                                               260
           3 2002
                           3993
                                      1
                                                          3438.03
## 657
           10 2002
                           4808
                                      2
                                               266
                                                          4252.00
## 110
           4 2001
                            740
                                               252
                                                           181.00
                                      1
## 116
           4 2001
                           1035
                                      1
                                               252
                                                           474.00
## 755
           10 2002
                           2927
                                      2
                                               266
                                                          2360.00
## 426
           3 2002
                           3901
                                      1
                                               260
                                                          3321.00
## 693
           10 2002
                           4728
                                      2
                                               266
                                                          4148.00
```

# show data at depths > 2000 in April
data <- bio\_read[which((bio\_read\$SampleDepth > 2000) & (bio\_read\$Month == 4)),]
data[1:20,]

```
##
      SampleDepth Sources Station Time Latitude Longitude
                                                                  Xkm
                                                                         Ykm Month
## 14
             2003
                      3.80
                                  1
                                       3
                                          50.1508
                                                    -14.4792 -34.106 16.779
                                                                                  4
## 15
             2034
                      3.63
                                  1
                                       3
                                          50.1508
                                                    -14.4792 -34.106 16.779
                                                                                  4
## 16
                                       3
                                                    -14.4792 -34.106 16.779
             2068
                      2.81
                                  1
                                          50.1508
                                                                                  4
## 17
             2444
                      2.48
                                  1
                                       3
                                          50.1508
                                                    -14.4792 -34.106 16.779
                                                                                  4
## 18
             2504
                      1.98
                                  1
                                       3
                                          50.1508
                                                    -14.4792 -34.106 16.779
                                                                                  4
## 19
                                          50.1508
                                                    -14.4792 -34.106 16.779
             2477
                      1.32
                                  1
                                       3
                                                                                  4
## 20
             2536
                      1.32
                                  1
                                       3
                                          50.1508
                                                    -14.4792 -34.106 16.779
                                                                                  4
## 21
             3722
                      0.83
                                       3
                                          50.1508
                                                    -14.4792 -34.106 16.779
                                                                                  4
                                  1
## 22
             3446
                      0.66
                                       3
                                          50.1508
                                                    -14.4792 -34.106 16.779
                                  1
## 23
                                                    -14.4792 -34.106 16.779
             3630
                      0.66
                                  1
                                       3 50.1508
                                                                                  4
## 24
             3660
                      0.66
                                  1
                                       3
                                          50.1508
                                                    -14.4792 -34.106 16.779
                                                                                  4
## 25
             3939
                      0.66
                                  1
                                       3
                                          50.1508
                                                    -14.4792 -34.106 16.779
                                                                                  4
## 26
                                          50.1508
                                                    -14.4792 -34.106 16.779
             3414
                      0.50
                                  1
                                       3 50.1508
                                                   -14.4792 -34.106 16.779
## 27
             3505
                      0.50
                                  1
```

```
## 28
              3534
                       0.50
                                   1
                                         3
                                            50.1508
                                                      -14.4792 -34.106 16.779
                                                                                     4
## 29
              3912
                       0.50
                                   1
                                         3
                                            50.1508
                                                      -14.4792 -34.106 16.779
                                                                                     4
                                                      -14.4792 -34.106 16.779
##
  30
              3568
                       0.33
                                   1
                                         3
                                            50.1508
                                                                                     4
                                                      -14.4792 -34.106 16.779
  31
              3600
                       0.33
                                   1
                                         3
                                            50.1508
                                                                                     4
##
##
   32
              3697
                       0.33
                                   1
                                         3
                                            50.1508
                                                      -14.4792 -34.106 16.779
                                                                                     4
   33
              3853
                       0.33
                                   1
                                         3
                                            50.1508
                                                      -14.4792 -34.106 16.779
##
                                                                                     4
      Year BottomDepth Season Discovery RelativeDepth
##
## 14 2001
                    3939
                               1
                                        252
                                                      1936
## 15 2001
                    3939
                               1
                                        252
                                                      1905
## 16 2001
                                        252
                   3939
                               1
                                                      1871
## 17 2001
                   3939
                               1
                                        252
                                                      1495
## 18 2001
                   3939
                               1
                                        252
                                                      1435
## 19 2001
                   3939
                               1
                                        252
                                                      1462
## 20 2001
                   3939
                               1
                                        252
                                                      1403
## 21 2001
                    3939
                               1
                                        252
                                                       217
## 22 2001
                    3939
                               1
                                        252
                                                       493
## 23 2001
                                        252
                                                       309
                   3939
                               1
## 24 2001
                   3939
                               1
                                        252
                                                       279
## 25 2001
                   3939
                               1
                                        252
                                                         0
## 26 2001
                   3939
                               1
                                        252
                                                       525
## 27 2001
                   3939
                               1
                                        252
                                                       434
## 28 2001
                   3939
                               1
                                        252
                                                       405
## 29 2001
                                                        27
                   3939
                               1
                                        252
## 30 2001
                   3939
                               1
                                        252
                                                       371
## 31 2001
                   3939
                               1
                                        252
                                                       339
## 32 2001
                   3939
                               1
                                        252
                                                       242
## 33 2001
                    3939
                               1
                                        252
                                                        86
```

## **Sampling Basics**

#### Problem 1

Obtain 1000 samples from the chi-squared distribution with 1 degree of freedom by first sampling 1000 samples  $Z_i$  from a standard normal distribution, and then applying the appropriate transformation. Plot a histogram of the results. Overlay a curve onto the histogram denoting the true density.

```
# standard normal sample
num <- 1000
samples <- rnorm(num)</pre>
```

Recall the definition of a chi-square distribution with k degrees of freedom:

$$Q = \sum_{i=1}^{k} Z_i^2$$

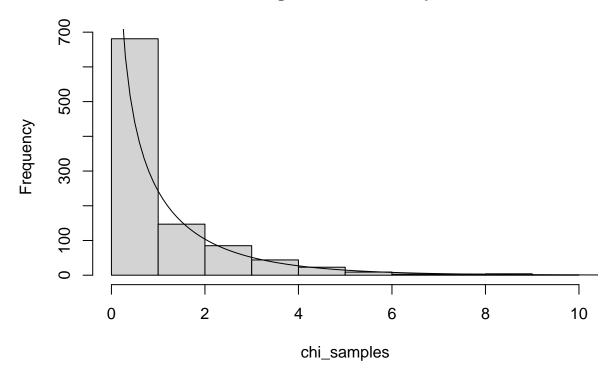
For one degree of freedom this would merely be squaring each sample.

$$Q_i = Z_i^2$$

```
# transform
chi_samples <- samples^2
# histogram
hist(chi_samples)

# overlay true density
df <- 1
x <- seq(0, 12, 0.1)
y <- dchisq(x, df) * num
lines(x,y)</pre>
```

# Histogram of chi\_samples



#### Problem 2

Repeat the previous question, but produce t-distributed random variables with 5 degrees of freedom. Do this by only generating standard normals (then transforming them the appropriate way).

Recall the Student's t distribution follows the formula below where the distribution has n degrees of freedom.

$$\frac{Z}{\sqrt{\chi^2/n}}$$

```
df <- 5
t <- vector(mode='numeric', length=num)
z_samples <- rnorm(df * num)</pre>
```

```
samples <- rnorm(num)
test <- c(0)
for (i in seq(1, df * num, df)) {
    start <- i
    end <- i + df -1
    sub_samp <- z_samples[start:end]
    test <- append(test, sub_samp)
    chi <- sum(sub_samp^2)
    t[i/df] <- samples[i/df] / (sqrt(chi / df))
}
hist(t)

# overlay true sample
x <- seq(-20, 20, 0.1)
y <- dt(x, df) * num
lines(x,y)</pre>
```

# Histogram of t

