# R Notebook

```
# load data set
heartattack <- read.csv("heart_attack_prediction_dataset.csv", header=T)

# Our population of interest are people at risk of heart attack
heartattack <- heartattack[heartattack$Heart.Attack.Risk == 1,]
head(heartattack)
```

```
##    Patient.ID Age    Sex Cholesterol Blood.Pressure Heart.Rate Diabetes
## 6     ZOO7941  54 Female         297         172/86         48        1
## 7     WYV0966  90   Male         358         102/73         84        0
## 8     XXM0972  84   Male         220         131/68        107        0
## 13    FPS0415  77   Male         228         101/72         68        1
## 14    YYU9565  60   Male         259         169/72         85        1
## 16    DCY3282  73   Male         122         114/88         97        1
##    Family.History Smoking Obesity Alcohol.Consumption Exercise.Hours.Per.Week
## 6               1       1       0                   1                0.625008
## 7               0       1       0                   1                4.098177
## 8               0       1       1                   1                3.427929
## 13              1       1       1                   1               19.633268
## 14              1       1       0                   1               17.037374
## 16              1       1       0                   1               14.559664
##         Diet Previous.Heart.Problems Medication.Use Stress.Level
## 6  Unhealthy                      1              1            2
## 7    Healthy                      0              0            7
## 8    Average                      0              1            4
## 13 Unhealthy                      0              0            9
## 14   Healthy                      1              1            1
## 16   Average                      0              0            5
##    Sedentary.Hours.Per.Day Income      BMI Triglycerides
## 6                 7.798752 241339 20.14684           795
## 7                 0.627356 190450 28.88581           284
## 8                10.543780 122093 22.22186           370
## 13               10.917524  29886 35.10224           590
## 14                8.727417 292173 25.56490           506
## 16               10.086479 265839 36.52440           773
##    Physical.Activity.Days.Per.Week Sleep.Hours.Per.Day Country     Continent
## 6                                5                  10 Germany        Europe
## 7                                4                  10  Canada North America
## 8                                6                   7   Japan          Asia
## 13                               7                   6 Vietnam          Asia
## 14                               1                   4   China          Asia
## 16                               5                   8   Italy        Europe
##             Hemisphere Heart.Attack.Risk
## 6  Northern Hemisphere                 1
## 7  Northern Hemisphere                 1
## 8  Northern Hemisphere                 1
```

```
## 13 Northern Hemisphere                 1
## 14 Northern Hemisphere                 1
## 16 Southern Hemisphere                 1
```

**Find recommended sample size for this study**

```
# calculate min sample size needed
pop_size <- nrow(heartattack) # 3139

# using 95% CI, find n for worst case scenario: p = 0.5
MOE <- 0.05
z <- 1.96
p_guess <- 0.5

# if N is large enough to ignore FPC
n_0 = ceiling( ((2*z)^2*(0.5)*(0.5)) / (MOE^2)) # 1537
# since we know N = 8763, using FPC
n = ceiling( n_0 / (1 + (n_0/pop_size)) ) # 1032
```

Assuming the worst case proportions 0.5, the sample size used if we ignored FPC is 1537. Whereas including FPC the sample size used in SRS will be 1032.

**Compare study design for stratification**

```
#Calculate within variance of each sex: Male, Female
variance_within_strata <- aggregate(BMI ~ Sex, heartattack, var)
colnames(variance_within_strata) <- c("Sex","Within Variance Sex")
print(variance_within_strata)
```

**Method 1: stratify by sex**

```
##      Sex Within Variance Sex
## 1 Female            38.33507
## 2   Male            40.77213
```

```
#Get stratum sizes
male_stratum_size <- nrow(heartattack[heartattack$Sex == "Male",])
female_stratum_size <- nrow(heartattack[heartattack$Sex == "Female",])


#Sample size n_h proportional to N_h*S_pw^2/sqrt(cost)
#Ignore costs
total <- sum(male_stratum_size*variance_within_strata$`Within Variance Sex`[1],
             female_stratum_size*variance_within_strata$`Within Variance Sex`[2])

male_size_proportion <-
  male_stratum_size*variance_within_strata$`Within Variance Sex`[1]/total
```

```
female_size_proportion <-
  female_stratum_size*variance_within_strata$`Within Variance Sex`[2]/total

male_sample_size <- round(male_size_proportion*n)
female_sample_size <- round(female_size_proportion*n)

#Overall stratified variance
var.strata <- c(variance_within_strata$`Within Variance Sex`[1],
                variance_within_strata$`Within Variance Sex`[2])
wt.strata <- c(male_size_proportion, female_size_proportion)

overall.sex.var <- sum(wt.strata*var.strata)
print(overall.sex.var)
```

```
## [1] 39.09994
```

```
#Calculate within variance of each diet stratum: Average, Unhealthy, Healthy
variance_within_strata <- aggregate(BMI ~ Diet, heartattack, var)
colnames(variance_within_strata) <- c("Diet","Within Variance BMI")
variance_within_strata
```

**Method 2: stratify by diet**

```
##        Diet Within Variance BMI
## 1   Average            40.50160
## 2   Healthy            40.07035
## 3 Unhealthy            39.64113
```

```
#Get stratum sizes
average_stratum_size <- nrow(heartattack[heartattack$Diet == "Average",])
healthy_stratum_size <- nrow(heartattack[heartattack$Diet == "Healthy",])
unhealthy_stratum_size <- nrow(heartattack[heartattack$Diet == "Unhealthy",])


#Sample size n_h proportional to N_h*S_pw^2/sqrt(cost)
#Ignore costs
total <- sum(average_stratum_size*variance_within_strata$`Within Variance BMI`[1],
             healthy_stratum_size*variance_within_strata$`Within Variance BMI`[2],
             unhealthy_stratum_size*variance_within_strata$`Within Variance BMI`[3])

average_size_proportion <-
  average_stratum_size*variance_within_strata$`Within Variance BMI`[1]/total
healthy_size_proportion <-
  healthy_stratum_size*variance_within_strata$`Within Variance BMI`[2]/total
unhealthy_size_proportion <-
  unhealthy_stratum_size*variance_within_strata$`Within Variance BMI`[3]/total

average_sample_size <- round(average_size_proportion*n)
healthy_sample_size <- round(healthy_size_proportion*n)
unhealthy_sample_size <- round(unhealthy_size_proportion*n)
```

```r
#Overall stratified variance
var.strata <- c(variance_within_strata$`Within Variance BMI`[1],
                variance_within_strata$`Within Variance BMI`[2],
                variance_within_strata$`Within Variance BMI`[3])
wt.strata <-
  c(average_size_proportion, healthy_size_proportion, unhealthy_size_proportion)

overall.diet.var <- sum(wt.strata*var.strata)
print(overall.diet.var)
```

```
## [1] 40.07295
```

```r
#Calculate within variance of whether patient has diabetes: 1: Yes, 0: No
variance_within_strata <- aggregate(BMI ~ Diabetes, heartattack, var)
colnames(variance_within_strata) <- c("Diabetes","Within Variance Diabetes")
print(variance_within_strata)
```

**Method 3: stratify by whether patient has diabetes**

```
##   Diabetes Within Variance Diabetes
## 1        0                 39.23851
## 2        1                 40.46166
```

```r
#Get stratum sizes
diabetes_stratum_size <- nrow(heartattack[heartattack$Diabetes == 1,])
no_diabetes_stratum_size <- nrow(heartattack[heartattack$Diabetes == 0,])


#Sample size n_h proportional to N_h*S_pw^2/sqrt(cost)
#Ignore costs
total <-
  sum(diabetes_stratum_size*variance_within_strata$`Within Variance Diabetes`[1],
      no_diabetes_stratum_size*variance_within_strata$`Within Variance Diabetes`[2])

diabetes_size_proportion <-
  diabetes_stratum_size*variance_within_strata$`Within Variance Diabetes`[1]/total
no_diabetes_size_proportion <-
  no_diabetes_stratum_size*variance_within_strata$`Within Variance Diabetes`[2]/total

diabetes_sample_size <- round(diabetes_size_proportion*n)
no_diabetes_sample_size <- round(no_diabetes_size_proportion*n)

#Overall stratified variance
var.strata <- c(variance_within_strata$`Within Variance Diabetes`[1],
                variance_within_strata$`Within Variance Diabetes`[2])
wt.strata <- c(diabetes_size_proportion, no_diabetes_size_proportion)

overall.diabetes.var <- sum(wt.strata*var.strata)
print(overall.diabetes.var)
```

```
## [1] 39.65881
```

```r
#Calculate within variance of whether patient has
#family history of heart-related problems:#1: Yes, 0: No

variance_within_strata <- aggregate(BMI ~ Family.History, heartattack, var)
colnames(variance_within_strata) <- c("Family History","Within Variance Family History")
print(variance_within_strata)
```

**Method 4: stratify by whether patient has family history of heart-related problems**

```
##   Family History Within Variance Family History
## 1              0                       40.39519
## 2              1                       39.71046
```

```r
#Get stratum sizes
history_stratum_size <- nrow(heartattack[heartattack$Family.History == 1,])
no_history_stratum_size <- nrow(heartattack[heartattack$Family.History == 0,])


#Sample size n_h proportional to N_h*S_pw^2/sqrt(cost)
#Ignore costs
total <-
  sum(history_stratum_size*variance_within_strata$`Within Variance Family History`[1],
   no_history_stratum_size*variance_within_strata$`Within Variance Family History`[2])

history_size_proportion <-
  history_stratum_size*variance_within_strata$`Within Variance Family History`[1]/total
no_history_size_proportion <-
  no_history_stratum_size*variance_within_strata$`Within Variance Diabetes`[2]/total

history_sample_size <- round(history_size_proportion*n)
no_history_sample_size <- round(no_history_size_proportion*n)

#Overall stratified variance
var.strata <- c(variance_within_strata$`Within Variance Family History`[1],
                variance_within_strata$`Within Variance Family History`[2])
wt.strata <- c(history_size_proportion, no_history_size_proportion)

overall.history.var <- sum(wt.strata*var.strata)
print(overall.history.var)
```

```
## [1] 39.7444
```

```r
#Calculate within variance of obesity status: 1: Obese, 0: Not obese
variance_within_strata <- aggregate(BMI ~ Obesity, heartattack, var)
colnames(variance_within_strata) <- c("Obesity","Within Variance Obesity")
print(variance_within_strata)
```

**Method 5: stratify by obesity status**

```
##   Obesity Within Variance Obesity
## 1       0                39.83100
## 2       1                40.29621
```

```r
#Get stratum sizes
obesity_stratum_size <- nrow(heartattack[heartattack$Obesity == 1,])
not_obese_stratum_size <- nrow(heartattack[heartattack$Obesity == 0,])


#Sample size n_h proportional to N_h*S_pw^2/sqrt(cost)
#Ignore costs
total <- sum(obesity_stratum_size*variance_within_strata$`Within Variance Obesity`[1],
             not_obese_stratum_size*variance_within_strata$`Within Variance Obesity`[2])

obesity_size_proportion <-
  obesity_stratum_size*variance_within_strata$`Within Variance Obesity`[1]/total
not_obese_size_proportion <-
  not_obese_stratum_size*variance_within_strata$`Within Variance Obesity`[2]/total

history_sample_size <- round(obesity_size_proportion*n)
no_history_sample_size <- round(not_obese_size_proportion*n)

#Overall stratified variance
var.strata <- c(variance_within_strata$`Within Variance Obesity`[1],
                variance_within_strata$`Within Variance Obesity`[2])
wt.strata <- c(obesity_size_proportion, not_obese_size_proportion)

overall.obesity.var <- sum(wt.strata*var.strata)
print(overall.obesity.var)
```

```
## [1] 40.06844
```

```r
overall_var <-
  data.frame(overall.sex.var,
             overall.diet.var,
             overall.diabetes.var,
             overall.history.var,
             overall.obesity.var)

colnames(overall_var) <-
  c("Overall Sex Var.",
    "Overall Diet Var.",
    "Overall Diabetes Var.",
    "Overall History Var.",
    "Overall Obesity Var.")

print(overall_var)
```

```
##   Overall Sex Var. Overall Diet Var. Overall Diabetes Var. Overall History Var.
## 1         39.09994          40.07295              39.65881              39.7444
##   Overall Obesity Var.
## 1             40.06844
```

By computing and comparing the within variances based on different stratas, stratifying by sex gave the lowest overall within variance of 39.09994. Since the stratification study design performs the best for the largest between-strata variance, implying the lowest within-strata variance, we will stratify by sex.

In the two stratums: Sex = (Male, Female), sample size for Male is 708 and sample size for Female is 324

Selecting Samples through SRS and Stratification by sex

```
# set seed
set.seed(2023)

# take SRS of n = 1032
SRS.index <- sample.int(pop_size, n, replace=F)
SRS_sample <- heartattack[SRS.index, ]
head(SRS_sample)
```

```
##      Patient.ID Age    Sex Cholesterol Blood.Pressure Heart.Rate Diabetes
## 5342    RQF3517  66 Female         169        134/107         66        1
## 4153    PDP7568  36   Male         362        168/103        106        1
## 6867    IGX5007  47   Male         204        179/102         49        1
## 3892    WHO4445  32   Male         329         171/88         91        1
## 5579    LQJ4049  76 Female         289         103/86         93        0
## 2448    MXU7515  72   Male         197         178/60         50        1
##      Family.History Smoking Obesity Alcohol.Consumption Exercise.Hours.Per.Week
## 5342              0       1       0                   1               4.1293715
## 4153              0       1       0                   1              15.8852288
## 6867              1       1       0                   1              12.3257250
## 3892              1       1       1                   1              15.8284110
## 5579              1       1       1                   0               5.1937069
## 2448              0       1       0                   0               0.2085372
##           Diet Previous.Heart.Problems Medication.Use Stress.Level
## 5342 Unhealthy                      1              1            1
## 4153 Unhealthy                      0              0            4
## 6867 Unhealthy                      0              1            5
## 3892   Healthy                      1              0            1
## 5579   Average                      0              1            9
## 2448   Average                      0              0            1
##      Sedentary.Hours.Per.Day Income      BMI Triglycerides
## 5342                7.243322 238240 21.07242           568
## 4153               10.701283  79281 19.72057           281
## 6867               11.100653  24184 30.13575           540
## 3892                7.533750 143838 36.47466           366
## 5579                1.919237 222725 38.46187           506
## 2448                2.174866 210200 28.04375           607
##      Physical.Activity.Days.Per.Week Sleep.Hours.Per.Day        Country
## 5342                               3                  10      Argentina
## 4153                               5                  10        Germany
## 6867                               3                  10      Argentina
## 3892                               2                   7      Argentina
## 5579                               7                   5 United Kingdom
## 2448                               4                   7          Spain
##          Continent          Hemisphere Heart.Attack.Risk
## 5342 South America Southern Hemisphere                 1
## 4153        Europe Northern Hemisphere                 1
```

```
## 6867 South America Southern Hemisphere                1
## 3892 South America Southern Hemisphere                1
## 5579        Europe Northern Hemisphere                1
## 2448        Europe Southern Hemisphere                1
```

```r
#Stratify male and female stratums to take samples from
male_stratum <- heartattack[heartattack$Sex == "Male",]
female_stratum <- heartattack[heartattack$Sex == "Female",]

#Take Stratified samples of males (n = 708) and females (n = 324)
stratified_male.index <- sample.int(male_stratum_size, male_sample_size, replace = F)
male_sample <- male_stratum[stratified_male.index,]
head(male_sample)
```

```
##      Patient.ID Age  Sex Cholesterol Blood.Pressure Heart.Rate Diabetes
## 4935    VPN6145  44 Male         376         154/99         59        1
## 1539    ELT4216  54 Male         139         127/89         90        1
## 739     DVV9040  58 Male         334         161/99         70        1
## 6603    VTF7674  64 Male         385         132/71         76        1
## 2200    OLJ0932  39 Male         173        120/102         52        1
## 8553    VMT8213  79 Male         335         180/66         72        1
##      Family.History Smoking Obesity Alcohol.Consumption Exercise.Hours.Per.Week
## 4935              0       1       1                   0              11.7244566
## 1539              0       1       1                   1              13.7426543
## 739               1       1       1                   0              13.9124380
## 6603              0       1       1                   1               9.8256201
## 2200              1       1       1                   0               0.7459528
## 8553              0       1       0                   1               5.1440220
##           Diet Previous.Heart.Problems Medication.Use Stress.Level
## 4935   Healthy                      1              0            6
## 1539   Healthy                      1              0            5
## 739    Healthy                      1              0            5
## 6603 Unhealthy                      0              0            7
## 2200 Unhealthy                      0              1           10
## 8553   Healthy                      0              1            8
##      Sedentary.Hours.Per.Day Income      BMI Triglycerides
## 4935               1.3805688 287568 25.83086           219
## 1539               0.2789797 112552 30.13741           562
## 739                5.0757092 208279 19.85028           367
## 6603              11.2284119 131419 39.53961           621
## 2200               5.6466859 197775 32.67722           289
## 8553               4.4394842 102466 25.95000           309
##      Physical.Activity.Days.Per.Week Sleep.Hours.Per.Day        Country
## 4935                               6                   5      Australia
## 1539                               0                   5        Vietnam
## 739                                4                   4       Colombia
## 6603                               5                   7       Thailand
## 2200                               7                   8 United Kingdom
## 8553                               7                   5    New Zealand
##          Continent          Hemisphere Heart.Attack.Risk
## 4935     Australia Southern Hemisphere                1
## 1539          Asia Northern Hemisphere                1
## 739  South America Northern Hemisphere                1
## 6603          Asia Northern Hemisphere                1
```

```
## 2200        Europe Northern Hemisphere                1
## 8553     Australia Southern Hemisphere                1
```

```
nrow(male_sample)
```

```
## [1] 708
```

```
stratified_female.index <- sample.int(female_stratum_size, female_sample_size, replace = F)
female_sample <- female_stratum[stratified_female.index,]
head(female_sample)
```

```
##      Patient.ID Age    Sex Cholesterol Blood.Pressure Heart.Rate Diabetes
## 19      XBI0592  50 Female         303        120/100        104        1
## 307     YJN3447  19 Female         153         180/92         48        1
## 8193    HMC4580  24 Female         369          99/80         71        1
## 7961    BMY3921  21 Female         132         116/61         81        1
## 3697    UBX5586  38 Female         197         120/64        103        1
## 2306    HDZ9323  27 Female         390         159/73         92        1
##      Family.History Smoking Obesity Alcohol.Consumption Exercise.Hours.Per.Week
## 19                0       1       0                   1               4.943580
## 307               0       0       1                   1               5.316555
## 8193              0       0       1                   1               2.731501
## 7961              0       0       0                   1               4.239488
## 3697              0       0       1                   1              16.189480
## 2306              0       0       0                   1              17.084501
##         Diet Previous.Heart.Problems Medication.Use Stress.Level
## 19   Average                       1              1            1
## 307  Average                       1              0            3
## 8193 Average                       0              0            2
## 7961 Average                       0              1            4
## 3697 Healthy                       1              1            2
## 2306 Healthy                       1              0            5
##      Sedentary.Hours.Per.Day Income      BMI Triglycerides
## 19                  7.586984  21501 25.96435           517
## 307                 6.689214 209450 35.24326           411
## 8193               10.198683  26970 33.03736           198
## 7961               10.478839  91596 20.44627           553
## 3697                5.126615 106905 23.13294           564
## 2306                9.757017 223566 21.36508           759
##      Physical.Activity.Days.Per.Week Sleep.Hours.Per.Day       Country
## 19                                 1                   5 United States
## 307                                4                   8        France
## 8193                               5                   5         Japan
## 7961                               4                   8        Brazil
## 3697                               2                   9   New Zealand
## 2306                               2                   8      Colombia
##          Continent          Hemisphere Heart.Attack.Risk
## 19   North America Northern Hemisphere                1
## 307         Europe Northern Hemisphere                1
## 8193          Asia Northern Hemisphere                1
## 7961 South America Southern Hemisphere                1
## 3697     Australia Southern Hemisphere                1
## 2306 South America Northern Hemisphere                1
```

```r
nrow(female_sample)
```

```
## [1] 324
```

Calculating Estimates

```r
#Calculate mean BMI from SRS

SRS_BMI_mean <- mean(SRS_sample$BMI)

#Calculate mean BMI from male sample and female sample

male_BMI_mean <- mean(male_sample$BMI)
female_BMI_mean <- mean(female_sample$BMI)
#Calculate stratified estimator for BMI mean (sum of weighted BMI means)

strata_estimator_BMI_mean <- (male_stratum_size/pop_size)*male_BMI_mean +
                                (female_stratum_size/pop_size)*female_BMI_mean


data.frame(`Sampling Method` = c("SRS","Stratified Estimate"),
           `BMI Mean` = c(SRS_BMI_mean,strata_estimator_BMI_mean))
```

```
##       Sampling.Method BMI.Mean
## 1                 SRS 28.85847
## 2 Stratified Estimate 29.02794
```

Calculate standard error

```r
#Calculate SE for SRS and Stratified

#SRS SE calculation
SRS_variance <- sum((SRS_sample$BMI - SRS_BMI_mean)^2)/(n-1)
SRS_FPC <- (1- n/pop_size)
SRS_SE <- sqrt(SRS_FPC * SRS_variance/n)

#Stratified SE calculation
male_strata_variance <- sum((male_sample$BMI - male_BMI_mean)^2)/(male_sample_size-1)
male_strata_FPC <- (1 - male_sample_size/male_stratum_size)
male_proportion_squared <- (male_stratum_size/pop_size)^2

female_strata_variance <-
  sum((female_sample$BMI - female_BMI_mean)^2)/(female_sample_size-1)
female_strata_FPC <- (1 - female_sample_size/female_stratum_size)
female_proportion_squared <- (female_stratum_size/pop_size)^2

stratified_SE <- sqrt(
  (male_proportion_squared*male_strata_FPC*male_strata_variance/male_sample_size)+
(female_proportion_squared*female_strata_FPC*female_strata_variance/female_sample_size))

data.frame(`Sampling Method` = c("SRS","Stratification"),
           SE = c(SRS_SE,stratified_SE))
```

```
##   Sampling.Method        SE
## 1             SRS 0.1605709
## 2  Stratification 0.1632240
```