Assignment 9

Prepared by:

- Josh Levine (jl2108)
- Harsh Patel (hkp49)
- Jaini Patel (jp1891)
- Yifan Liao (yl1463)
- Aayush Shah (avs93)

False Discovery Rate (FDR)

The FDR is known as the expected proportions of type I errors. A type I error is where we incorrectly reject the null hypothesis. FDR is closely related to FWER (family-wise error rate), the probability of making any type I error at all.

FDR Formula:

```
FDR = E (V/R \mid R{>}0) \ P(R{>}0) where:  
* V = Number of Type I errors 
* R = Number of rejected hypotheses
```

Below is the function for FDR implementation:

```
false_discovery_rate <- function(p_values, Q){
    sorted_p_values = sort(p_values) #Sorting the p-values -> Step1
    len = length(sorted_p_values) #Number of p-values

#Hypothesis 1
    hypothesis_1 = Q*c(1:len)/len

#Hypothesis_2 - If not independent
    hep = len * sum(1/c(1:len))
    hypothesis_2 = (Q * c(1:len))/hep

#the p-values less than the hypothesis line are considered to be interesting
    is_interesting_true = (sorted_p_values < hypothesis_1)

#compute the index below which the sorted p-values are less than the line
    threshold_index = max(which(is_interesting_true == "TRUE"))</pre>
```

```
print(paste0("The Threshold Index: ", threshold_index)) #The no. of TRUE values
 p_star = sorted_p_values[threshold_index]
 hypothesis = c(1:len)
 plot(hypothesis, sorted_p_values, col="black")
 lines(c(1:threshold_index), sorted_p_values[c(1:threshold_index)],
      col = "red", type="o")
 lines(hypothesis, hypothesis_1, type="l", col="black")
 #list index of hypothesis which are interesting in the original unsorted list of p values
 temp = (p_values < p_star)</pre>
 fd = which(temp == "TRUE")
 print("Index of intersting p values in the unsorted list:")
 print(fd)
 #false rejection rate
 frr = -log(p_star)/length(fd)
 print(paste0("False Rejection Rate: ", frr))
 # NOTE: FRR depends on the Q value given as an input to the function
 # Here, the Q value was 0.05 hence the frr is approximately 0.05
 }
```

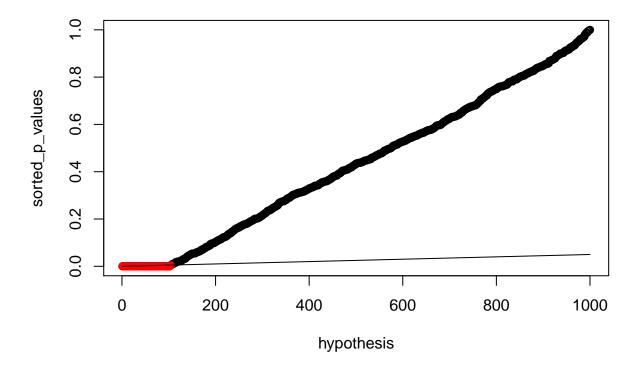
Below is the code to call the fdr function:

```
# Test Vector of p-values

vec <- c(1e-5*runif(100),runif(900))

Q = 0.05

false_discovery_rate(vec, Q)</pre>
```



```
\mbox{\tt \#\#} [1] "Index of intersting p values in the unsorted list:"
     [1]
            1
                2
                     3
                         4
                             5
                                  6
                                      7
                                           8
                                               9
                                                   10
                                                            12
                                                                         15
                                                                                  17
                                                                                      18
                                                                13
                                                                    14
    [19]
                                                                         33
##
           19
               20
                   21
                        22
                            23
                                 24
                                     25
                                          26
                                              27
                                                   28
                                                       29
                                                           30
                                                                31
                                                                    32
                                                                             34
                                                                                  35
                                                                                      36
##
    [37]
          37
               38
                   39
                        40
                            41
                                 42
                                     43
                                          44
                                              45
                                                   46
                                                       47
                                                           48
                                                                49
                                                                    50
                                                                         51
                                                                             52
                                                                                  53
                                                                                      54
##
    [55]
          55
               56
                   57
                        58
                            59
                                 60
                                     61
                                          62
                                              63
                                                   64
                                                       65
                                                           66
                                                                67
                                                                    68
                                                                         69
                                                                             70
                                                                                  71
                                                                                      72
##
    [73]
          73
               74
                   75
                        76
                            77
                                 78
                                     79
                                          80
                                              81
                                                   82
                                                       83
                                                           84
                                                                85
                                                                    86
                                                                         87
                                                                             88
                                                                                  89
                                                                                      90
                   93 94
##
    [91]
          91
              92
                            95
                                 96
                                     97
                                          98
                                              99 100 434 554 665
## [1] "False Rejection Rate: 0.0530982765886552"
```