1. A group of researchers is running an experiment over the course of 30 months, with a single observation collected at the end of each month. Let  $X_1, ..., X_{30}$  denote the observations for each month. From prior studies, the researchers know that

$$X_i \sim f_X(x),$$

but the mean  $\mu_X$  is unknown, and they wish to conduct the following test

$$H_0: \mu_X = 0$$
  
$$H_a: \mu_X > 0.$$

At month k, they have accumulated data  $X_1, ..., X_k$  and they have the t-statistic

$$T_k = \frac{\bar{X} - 0}{S_k / \sqrt{n}}.$$

The initial plan was to test the hypotheses after all data was collected (at the end of month 30), at level  $\alpha=0.05$ . However, conducting the experiment is expensive, so the researchers want to "peek" at the data at the end of month 20 to see if they can stop it early. That is, the researchers propose to check whether  $t_{20}$  provides statistically discernible support for the alternative. If it does, they will stop the experiment early and report support for the researcher's alternative hypothesis. If it does not, they will continue to month 30 and test whether  $t_{30}$  provides statistically discernible support for the alternative.

(a) What values of  $t_{20}$  provide statistically discernible support for the alternative hypothesis?

```
library(VGAM)
## Warning: package 'VGAM' was built under R version 4.4.3
## Loading required package: stats4
## Loading required package: splines
#Question 1
#Part a
t_val20 = qt(0.95, df=19)
t_val20
## [1] 1.729133
#Part b
t_val30 = qt(0.95, df=29)
t_val30
## [1] 1.699127
#Part c
R=10000
err20 = 0
err30 = 0
for(i in 1:R){
set.seed(7272+i)
x20 = rlaplace(20,0,4) #Calculating sample
t20 = mean(x20) / (sd(x20)/sqrt(20)) #Calculating t20
if (t20>t_val20) #If type1 error, add 1
  err20=err20+1
x30 = rlaplace(30,0,4) #Calculating sample
t30 = mean(x30) / (sd(x30)/sqrt(30)) #Calculating t30
if (t30>t_val30)
 err30=err30+1
#Calculating percentage of t error
perc_err20 = err20/R
perc_err30= err30/R
perc_err20
## [1] 0.0507
perc_err30
## [1] 0.05
```

- (b) What values of  $t_{30}$  provide statistically discernible support for the alternative hypothesis?
- (c) Suppose  $f_X(x)$  is a Laplace distribution with a = 0 and b = 4.0. Conduct a simulation study to assess the Type I error rate of this approach.
  - Note: You can use the rlaplace() function from the VGAM package for R (Yee, 2010).
- (d) **Optional Challenge:** Can you find a value of  $\alpha < 0.05$  that yields a Type I error rate of 0.05?
- 2. Perform a simulation study to assess the robustness of the T test. Specifically, generate samples of size n=15 from the Beta(10,2), Beta(2,10), and Beta(10,10) distributions and conduct the following hypothesis tests against the actual mean for each case (e.g.,  $\frac{10}{10+2}$ ,  $\frac{2}{10+2}$ , and  $\frac{10}{10+10}$ ).
  - (a) What proportion of the time do we make an error of Type I for a left-tailed test?

```
OUESTION 2
#####
####################################
n=15 #Initializing
R=10000
mean1 = 10/12
mean2 = 2/12
mean3 = 10/20
err1_left=0
err2_left=0
err3_left=0
err1_right=0
err2_right=0
err3_right=0
err1_two=0
err2_two=0
err3_two=0
for(i in 1:R){
 set.seed(7272+i)
  sample1 = rbeta(n, 10, 2) #Calculating samples
 sample2 = rbeta(n, 2, 10)
 sample3 = rbeta(n, 10, 10)
  #Calculating t values
 t1 = (mean(sample1)-mean1)/(sd(sample1)/sqrt(n))
  t2 = (mean(sample2)-mean2)/(sd(sample2)/sqrt(n))
 t3 = (mean(sample3)-mean3)/(sd(sample3)/sqrt(n))
  #Checking if type 1 error occurred for left test
 if (t1<qt(0.05, df=14))
   err1_left=err1_left+1
  if (t2<qt(0.05, df=14))
    err2_left=err2_left+1
  if (t3<qt(0.05, df=14))
    err3_left=err3_left+1
  #Checking if type 1 error occurred for right test
  if (t1>qt(0.95, df=14))
   err1_right=err1_right+1
  if (t2>qt(0.95, df=14))
    err2_right=err2_right+1
  if (t3>qt(0.95, df=14))
    err3_right=err3_right+1
  #Checking if type 1 error occurred for two tailed test
 if (abs(t1)>qt(0.975, df=14))
   err1 two=err1 two+1
  if (abs(t2)>qt(0.975, df=14))
    err2_two=err2_two+1
  if (abs(t3)>qt(0.975, df=14))
    err3_two=err3_two+1
err1_left/R
## [1] 0.0303
err2_left/R
## [1] 0.0769
```

err3\_left/R ## [1] 0.0477

- (b) What proportion of the time do we make an error of Type I for a right-tailed test?
- (c) What proportion of the time do we make an error of Type I for a two-tailed test?
- (d) How does skewness of the underlying population distribution effect Type I error across the test types?

## References

Yee, T. W. (2010). The VGAM package for categorical data analysis. Journal of Statistical Software, 32(10):1-34.