Homework 3

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Question 2

Write a simulation to calculate the power for the following study design. The study has two variables, treatment group and outcome. There are two treatment groups (0,1) and they should be assigned randomly with equal probability. The outcome should be a random normal variable with a mean of 60 and a standard deviation of 20. If a patient is in the treatment group, add 5 to the outcome. 5 is the true treatment effect. Create a linear of model for the outcome by the treatment group, and extract the p-value (hint: see assignment 1). Test if the p-value is less than or equal to the alpha level, which should be set to 0.05.

Repeat this procedure 1000 times. The power is calculated by finding the percentage of times the p-value is less than or equal to the alpha level. Use the **set.seed** command so that the professor can reproduce your results.

```
#nset seed
set.seed(1)
```

```
#the function takes the number of patients. It is one procedure through and will be used to repeat the
treatment <- function(sampleSize){</pre>
  #treatment groups
  treatmentGroups <- c(0,1)</pre>
  # assign treatments for n patients, we can use sample because
  #there is equal probability of being in either treatment group
  treatmentPerPatient <- sample(treatmentGroups, sampleSize, replace=TRUE)</pre>
  #treatments
  #outcome should be normal with mu=60 and Sigma=20
  outcome <- rnorm(sampleSize, mean = 60, sd = 20)
  #if the patient is in the treatment group, i=1, then add 5 to it, otherwise do nothing
  treatmentOutcome <- ifelse(treatmentPerPatient==1, outcome + 5, outcome)</pre>
  #treatmentOutcome
  #craeate a linear model for the outcome by treatment group
  linMod <- lm(treatmentOutcome ~ treatmentPerPatient)</pre>
  #summary(linMod)
  #return the pvalue
  p <- coef(summary(linMod))[2,4]</pre>
  return(p)
}
```

```
getPower <- function(simulations, sampleSize, alpha){
  #repeat procedure (simulations) number of times
  #allPvalues will have all of the pvalues for each simulation
  allPvalues <- replicate(simulations, treatment(sampleSize))
  #power is the percentage of times the pvalue is less than alpha</pre>
```

```
power <- sum(allPvalues <= alpha)/simulations
return(power)
}</pre>
```

1. Find the power when the sample size is 100 patients

```
getPower(1000, 100, 0.05)
```

[1] 0.281

2. Find the power when the sample size is 1000 patients

```
getPower(1000,1000,0.05)
```

[1] 0.975

Question 3

Obtain a copy of the football-values lecture. Save the 2015/proj_rb15.csv file in your working directory. Read in the data set and remove the first two columns.

```
setwd("~/Documents/Vanderbilt_2015_Fall/Statistical_Computing/football-values-master/2015")
library(MASS)
rb_data <- read.csv("proj_rb15.csv",header=TRUE)
newrb <- rb_data[c(-1,-2)]</pre>
```

1. Show the correlation matrix of this dataset.

```
rho <- cor(newrb)</pre>
```

2. Generate a data set with 30 rows that has a similar correlation structure. Repeat the procedure 10,000 times and return the mean correlation matrix.

```
rho.rb <- cor(newrb) ##Correlation matrix
vcov.rb <- var(newrb) ##Variance matrix
means.rb <- colMeans(newrb) ##returns the mean for columns</pre>
```

```
##simultate using mvnorm, 30 values, mu and sigma the same as rb data
rb.sim <- mvrnorm(30, mu = means.rb, Sigma = vcov.rb)
##convert to data frame
rb.sim <- as.data.frame(rb.sim)
rb.sim</pre>
```

```
rush_yds
        rush att
                                rush tds
                                             rec att
                                                        rec_yds
                                                                     rec tds
## 1
       81.603049
                              2.66539424
                                                                  1.42706012
                  368.20818
                                           32.647163
                                                      270.23197
      204.971736
                  874.49662
                              5.96802566
                                           41.104803
                                                      322.63345
                                                                  2.10178580
  3
       55.814312
                  237.61319
                              1.22411164
                                           37.059668
                                                      282.57144
##
                                                                  0.81138594
## 4
      156.923723
                  701.54404
                              4.25525394
                                           37.444179
                                                      310.72406
                                                                  1.24264068
                  135.05783
## 5
       36.618366
                              1.08421204
                                           10.736366
                                                       97.41280
                                                                  0.71921027
## 6
       26.838136
                  124.76106
                              0.96911520 -17.714416 -174.42288 -1.01937631
## 7
       29.386349
                   74.50493
                              0.59860193
                                           21.107729
                                                      169.85787
                                                                  0.93222480
## 8
       69.155922
                  275.53265
                              1.51347198
                                           11.381829
                                                      106.35415
                                                                  0.39447559
  9
      157.458662
                  678.43864
                              5.06371696
                                           38.934384
                                                      313.73355
                                                                  1.27714827
## 10 -67.153927 -302.97420 -2.26820519
                                           -5.062380
                                                      -31.89264
                                                                  0.02039508
                  -51.53835
                                           -2.309514
                                                      -19.20674
       -9.685195
                              0.01080570
                                                                  0.13736237
##
       54.242222
                  235.22428
                              1.32124232
                                            7.700035
                                                       73.87487
                                                                  0.27246688
   12
## 13 133.316430
                  543.53860
                              2.92430358
                                           23.748318
                                                      194.30598
                                                                  0.96597997
                  195.79482
                                                       62.29252 -0.31527714
## 14
       45.310490
                              1.50839540
                                            7.996124
      -46.254292 -179.53808 -2.27905817
                                           -2.267460
                                                      -22.62423 -0.25843567
                  318.69144
                                                      310.39324
       80.631714
                              1.21519874
                                           39.430006
                                                                  0.96120800
      -78.789728 -361.70752 -2.22086077
                                           -7.113977
                                                      -59.70555
                                                                  0.11883696
                  578.83766
                                           18.983166
                                                      162.92013
## 18 132.076053
                              3.83092068
                                                                  0.82634254
        7.874279
                    21.22121
                              0.50333821
                                            7.718814
                                                       42.36561 -0.16990814
##
  20
       85.114436
                  314.94189
                              2.81024580
                                            8.371183
                                                       61.31674
                                                                  0.28101007
## 21 112.052798
                  487.37362
                              3.77392811
                                           18.101022
                                                      145.01281
                                                                  0.81954927
                  616.95055
                                           27.202361
                                                      206.27046
## 22 135.930618
                              4.18890506
                                                                  0.20386051
                  226.16747
                                                      112.81670
## 23
       49.576277
                              0.04011639
                                           16.572201
                                                                  0.09415518
## 24 154.196972
                  645.83187
                              3.04988065
                                           32.588940
                                                      255.64857
                                                                  1.29190755
## 25
       76.692247
                  309.63108
                              2.04744083
                                           18.652667
                                                      141.42449
                                                                  0.45210674
       59.775270
                  288.15646
                              1.84833271
                                           19.559118
                                                      146.59329
##
  26
                                                                  0.50264473
   27
      196.897781
                  869.43481
                              5.31502567
                                           37.118997
                                                      278.99445
                                                                  1.11128397
      126.857498
                  554.27988
                              2.68916155
                                           36.858273
                                                      304.15759
   28
                                                                  1.71436520
## 29
       95.440260
                   440.70423
                              2.20788363
                                           28.913109
                                                      236.38547
                                                                  0.58732804
## 30
        8.220845
                    40.38183
                              0.27298665
                                           10.982371
                                                       55.02183 -0.01452906
##
         fumbles
                        fpts
##
  1
       1.0040622
                  86.267371
##
  2
       2.2004696 163.514013
##
   3
       1.4656123
                  61.283711
## 4
       1.2869233 131.857394
## 5
       0.7051101
                  32.885669
## 6
      -0.3109560
                  -4.597646
## 7
       0.5078943
                  32.623525
## 8
       0.6780489
                  48.259274
## 9
       1.5096920 134.371997
## 10 -0.1424627 -46.693626
## 11
       0.7231372
                  -7.480020
## 12
       1.3711491
                  37.332899
## 13
       1.6327265
                  93.811057
       0.2495200
## 14
                  32.402069
## 15 -0.1938751 -35.124862
## 16
       0.5078816
                  74.990534
## 17 -0.1611034 -54.990897
       0.5360741 101.327195
  19
     -0.8864040
                  10.349110
## 20
       0.4301827
                  55.163541
## 21
       1.7693964
                  86.950303
## 22 1.7167957 105.286981
```

```
## 23 0.9172106 33.349347
## 24 0.7112733 114.731165
## 25 0.5414861 59.509590
## 26 0.9664182 55.701433
## 27
       0.6300027 152.065361
## 28 1.5472803 108.825051
## 29 1.1722519 82.257080
## 30 0.6531031
                 9.519046
rho.sim <- cor(rb.sim)</pre>
rho.sim ## this is the similar correlation matrix
             rush_att rush_yds rush_tds
                                           rec_att
                                                     rec_yds
## rush_att 1.0000000 0.9975454 0.9659727 0.8027501 0.7973140 0.7149788
## rush_yds 0.9975454 1.0000000 0.9648480 0.8009759 0.7944074 0.6999228
## rush_tds 0.9659727 0.9648480 1.0000000 0.7273136 0.7219083 0.6579178
## rec_att 0.8027501 0.8009759 0.7273136 1.0000000 0.9954492 0.8566808
## rec_yds 0.7973140 0.7944074 0.7219083 0.9954492 1.0000000 0.8798934
## rec_tds 0.7149788 0.6999228 0.6579178 0.8566808 0.8798934 1.0000000
## fumbles 0.6863435 0.6912500 0.6691106 0.6810339 0.6934187 0.6776780
           0.9862491 0.9855233 0.9546242 0.8795748 0.8770637 0.7908361
##
              fumbles
                           fpts
## rush att 0.6863435 0.9862491
## rush_yds 0.6912500 0.9855233
## rush_tds 0.6691106 0.9546242
## rec_att 0.6810339 0.8795748
## rec_yds 0.6934187 0.8770637
## rec_tds 0.6776780 0.7908361
## fumbles 1.0000000 0.7147066
## fpts
            0.7147066 1.0000000
rho.rb ## this is the original correlation matrix
##
```

```
rush_att rush_yds rush_tds
                                           rec_att
                                                     rec_yds
## rush_att 1.0000000 0.9975511 0.9723599 0.7694384 0.7402687 0.5969159
## rush_yds 0.9975511 1.0000000 0.9774974 0.7645768 0.7345496 0.6020994
## rush_tds 0.9723599 0.9774974 1.0000000 0.7263519 0.6984860 0.5908348
## rec_att 0.7694384 0.7645768 0.7263519 1.0000000 0.9944243 0.8384359
## rec_yds 0.7402687 0.7345496 0.6984860 0.9944243 1.0000000 0.8518924
## rec_tds 0.5969159 0.6020994 0.5908348 0.8384359 0.8518924 1.0000000
## fumbles 0.8589364 0.8583243 0.8526904 0.7459076 0.7224865 0.6055598
## fpts
           0.9824135 0.9843044 0.9689472 0.8556928 0.8340195 0.7133908
             fumbles
                          fpts
## rush att 0.8589364 0.9824135
## rush_yds 0.8583243 0.9843044
## rush tds 0.8526904 0.9689472
## rec_att 0.7459076 0.8556928
## rec_yds 0.7224865 0.8340195
## rec_tds 0.6055598 0.7133908
## fumbles 1.0000000 0.8635550
           0.8635550 1.0000000
## fpts
```

```
average <-0
n <- 10000
for(i in seq(n)){
    rb.sim <- mvrnorm(30, mu = means.rb, Sigma=vcov.rb) #create several datasets using mvrnorm
    average <- average + cor(rb.sim)/n #just keep adding the average to build up the average
average ## this is the mean correlation matrix with similar correlation structure
             rush_att rush_yds rush_tds
                                          rec_att rec_yds
## rush_att 1.0000000 0.9974706 0.9714270 0.7650199 0.7356050 0.5914271
## rush yds 0.9974706 1.0000000 0.9767655 0.7601052 0.7298445 0.5966978
## rush_tds 0.9714270 0.9767655 1.0000000 0.7216207 0.6935825 0.5855420
## rec att 0.7650199 0.7601052 0.7216207 1.0000000 0.9942286 0.8340451
## rec_yds 0.7356050 0.7298445 0.6935825 0.9942286 1.0000000 0.8476956
## rec_tds 0.5914271 0.5966978 0.5855420 0.8340451 0.8476956 1.0000000
## fumbles 0.8547969 0.8542501 0.8485418 0.7405059 0.7168070 0.5996222
           0.9818244 0.9837858 0.9679489 0.8523715 0.8303573 0.7081600
              fumbles
                           fpts
## rush_att 0.8547969 0.9818244
## rush_yds 0.8542501 0.9837858
## rush_tds 0.8485418 0.9679489
## rec_att 0.7405059 0.8523715
## rec yds 0.7168070 0.8303573
## rec tds 0.5996222 0.7081600
## fumbles 1.0000000 0.8594595
## fpts
           0.8594595 1.0000000
rho.rb ##this is the original data correlation matrix
             rush_att rush_yds rush_tds
                                            {\tt rec\_att}
##
                                                      rec_yds
## rush_att 1.0000000 0.9975511 0.9723599 0.7694384 0.7402687 0.5969159
## rush_yds 0.9975511 1.0000000 0.9774974 0.7645768 0.7345496 0.6020994
## rush_tds 0.9723599 0.9774974 1.0000000 0.7263519 0.6984860 0.5908348
## rec_att 0.7694384 0.7645768 0.7263519 1.0000000 0.9944243 0.8384359
## rec_yds 0.7402687 0.7345496 0.6984860 0.9944243 1.0000000 0.8518924
## rec tds 0.5969159 0.6020994 0.5908348 0.8384359 0.8518924 1.0000000
## fumbles 0.8589364 0.8583243 0.8526904 0.7459076 0.7224865 0.6055598
## fpts
            0.9824135 0.9843044 0.9689472 0.8556928 0.8340195 0.7133908
```

##

fpts

fumbles

0.8635550 1.0000000

rush_att 0.8589364 0.9824135 ## rush_yds 0.8583243 0.9843044 ## rush_tds 0.8526904 0.9689472 ## rec_att 0.7459076 0.8556928 ## rec_yds 0.7224865 0.8340195 ## rec_tds 0.6055598 0.7133908 ## fumbles 1.0000000 0.8635550

fpts

Question 4

1.

$$P(B) = \sum_{j} P(B|A_{j})P(A_{j}),$$

$$\Rightarrow P(A_{i}|B) = \frac{P(B|A_{i})P(A_{i})}{\sum_{j} (B|A_{j})P(A_{j})}$$
(1)

2.

$$\hat{f}(\zeta) = \int_{-\infty}^{\infty} f(x)e^{-2\pi ix\zeta}dx \tag{2}$$

3.

$$\mathbf{J} = \frac{d\mathbf{f}}{d\mathbf{x}} = \begin{bmatrix} \frac{\partial \mathbf{f}}{\partial x_1} & \dots & \frac{\partial \mathbf{f}}{\partial x_n} \end{bmatrix} \begin{bmatrix} \frac{\partial f_1}{\partial x_2} & \dots & \frac{\partial f_1}{\partial x_n} \\ \vdots & \ddots & \vdots \\ \frac{\partial f_m}{\partial x_1} & \dots & \frac{\partial f_m}{\partial x_n} \end{bmatrix}$$
(3)