## 1 Introduction to R

The goal of this assignment is to introduce you to R. It is not graded, but essential for the rest of the class. Solutions will be posted in a week.

#### 1.1 Introduction

```
Using this sample code,
install.packages("BB")
library(BB)
source("A1.R")
?for
??rpareto
dir()
1+1
2/2
save.image("misc.RDATA")
1:10
30%%4
setwd("/Users/ms486/Dropbox/Papers/Progress")
getwd()
ls()
2/0
log(-1)
sum(1:10)
```

## Exercise 1 Introduction

- 1. Create a directory for this class and store your script "a0.R"
- $2. \ Install \ the \ packages, \ Hmisc, \ gdata, boot, xtable, MASS, moments, snow, mvtnorm$
- 3. Set your working directory

- 4. List the content of your directory and the content of your environment
- 5. Check whether 678 is a multiple of 9
- 6. Save your environment
- 7. Find help on the function mean, cut2
- 8. Find an operation that returns NaN (Not A Number)

## 1.2 Objects

### Vectors, Matrix, Arrays

```
vec0 = NULL
vec1 = c(1,2,3,4)
vec2 = 1:4
vec3 = seq(1,4,1)
vec4 = rep(0,4)
sum(vec1)
str(vec1)
prod(vec1)
mat1 = mat.or.vec(2,2)
mat2 = matrix(0,ncol=2,nrow=2,byrow=T)
mat3 = cbind(c(0,0),c(0,0))
mat4 = rbind(c(1,1),c(0,0))
mat5 = matrix(1:20,nrow=5,ncol=4)
mat5[1:2,3:4]
mat5[1,]
arr1 = array(0,c(2,2))
dim(mat4)
dim(vec2)
length(vec2)
```

length(mat1)

class(mat4)

## Exercise 2 Object Manipulation

1. Print Titanic, and write the code to answer these questions (one function (sum) , one operation)

(a) Total population

(b) Total adults

(c) Total crew

(d)  $3^{rd}$  class children

(e)  $2^{nd}$  class adult female

(f)  $1^{st}$  class children male

(g) Female Crew survivor

(h)  $1^{st}$  class adult male survivor

2. Using the function *prop.table*, find

(a) The proportion of survivors among first class, male, adult

(b) The proportion of survivors among first class, female, adult

(c) The proportion of survivors among first class, male, children

(d) The proportion of survivors among third class, female, adult

#### Exercise 3 Vectors - Introduction

1. Use three different ways, to create the vectors

(a)  $a = 1, 2, \dots, 50$ 

(b)  $b = 50, 49, \dots, 1$ 

Hint: rev

- 2. Create the vectors
  - (a)  $a = 10, 19, 7, 10, 19, 7, \dots, 10, 19, 7$  with 15 occurrences of  $10, 19, 7, \dots, 10, 19, 7, \dots$
  - (b)  $b = 1, 2, 5, 6, \dots, 1, 2, 5, 6$  with 8 occurrences of 1,2,5,6

Hint: rep

- 3. Create a vector of the values of log(x)sin(x) at  $x = 3.1, 3.2, \ldots, 6$
- 4. Using the function sample, draw 90 values between (0,100) and calculate the mean. Re-do the same operation allowing for replacement.
- 5. Calculate

(a) 
$$\sum_{a=1}^{20} \sum_{b=1}^{15} \frac{exp(\sqrt{a})log(a^5)}{5 + cos(a)sin(b)}$$

(b) 
$$\sum_{a=1}^{20} \sum_{b=1}^{a} \frac{exp(\sqrt{a})log(a^5)}{5 + exp(ab)cos(a)sin(b)}$$

6. Create a vector of the values of  $\exp(x)\cos(x)$  at x=3, 3.1, ...6.

#### Exercise 4 Vectors - Advanced

- 1. Create two vectors xVec and yVec by sampling 1000 values between 0 and 999.
- 2. Suppose  $xVec = (x_1, \ldots, x_n)$  and  $yVec = (y_1, \ldots, y_n)$ 

  - (a) Create the vector  $(y_2 x_1, \dots, y_n x_{n-1})$  denoted by zVec. (b) Create the vector  $(\frac{\sin(y_1)}{\cos(x_2}, \frac{\sin(y_2)}{\cos(x_3}, \dots, \frac{\sin(y_{n-1})}{\cos(x_n)})$  denoted by wVec.
  - (c) Create a vector subX which consists of the values of xVec which are  $\geq 200$ .
  - (d) What are the index positions in yVec of the values which are  $\geq 600$ .

#### Exercise 5 Matrix

4

- 1. Create the matrix  $A = \begin{vmatrix} 1 & 1 & 3 \\ 5 & 2 & 6 \\ -2 & -1 & -3 \end{vmatrix}$ 
  - (a) Check that  $A^3=0$  (matrix 0).

- (b) Bind a fourth column as the sum of the first and third column
- (c) Replace the third row by the sum of the first and second row
- (d) Calculate the average by row and column.
- 2. Consider this system of linear equations:

$$2x + y + 3z = 10 (1)$$

$$x + y + z = 6 \tag{2}$$

$$x + 3y + 2z = 13 \tag{3}$$

3. Solve this equation.

#### Exercise 6 Functions

1. Write a function *fun1* which takes two arguments (a,n) where (a) is a scalar and n is a positive integer, and returns

$$a + \frac{a^2}{2} + \frac{a^3}{3} + \ldots + \frac{a^n}{n}$$

2. Consider the function

$$f(x) = \begin{cases} x^2 + 2x + |x| & \text{if } x < 0; \\ x^2 + 3 + \log(1+x) & \text{if } 0 \le x < 2; \\ x^2 + 4x - 14 & \text{if } x \ge 2. \end{cases}$$
 (4)

Evaluate the function at -3, 0 and 3.

#### Exercise 7 Indexes

- 1. Sample 36 values between 1 and 20 and name it v1
- 2. Use two different ways to create the subvector of elements that are not in the first position of the vector. Hint: which and subset can not be used. Check x[a] and x[-a].
- 3. Create a logical element (TRUE or FALSE), v2, which is true if v1 > 5. Can you convert this logical element into a dummy 1 (TRUE) and 0 (FALSE)?

- 4. Create a matrix m1  $[6 \times 6]$  which is filled by row using the vector v1.
- 5. Create the following object

```
x = c(rnorm(10),NA,paste("d",1:16),NA,log(rnorm(10)))
```

6. Test for the position of missing values, and non-finite values. Return a subvector free of missing and non-finite values.

### Exercise 8 Data Manipulation

- 1. Load the library AER, and the dataset (data("GSOEP9402")) to be named dat.
- 2. What type of object is it? Find the number of rows and column? Can you provide the names of the variables?
- 3. Evaluate and plot the average annual income by year.
- 4. Create an array that illustrates simultaneously the income differences (mean) by gender, school and memployment.

## Exercise 9 First regression

- 1. Load the dataset (data("CASchools")) to be named dat1.
- 2. Using the function lm, run a regression of read on the following variables: district, school, county, grades, students, teachers, calworks, lunch, computer, expenditure, income and english. Store this regression as reg1.
- 3. Can you run a similar regression by specifying,

Create reg2, that uses only the 200 first observations.

#### Exercise 10 Advanced indexing

- 1. Create a vector lu of 200 draws from a pareto distribution (1,1). How many values are higher than 10. Replace these values by draws from a logistic distribution (6.5,0.5).
- 2. Create a vector de of 200 draws from a normal distribution (1,2). Set  $de = \log(de)$ , and count the number of missing values or negative values. Replace these values by draws from a normal distribution (0,1) truncated at 0. hint:truncnorm
- 3. Create two vectors, orig and dest as 200 draws from a uniform distribution [0,1].
- 4. Create two matrices, hist and dist as 200\*200 draws from a uniform distribution [0,1].
- 5. Consider this function

$$q_{jl}(w) = \frac{r + de_j}{r + de_l}w + lu_j log(w) - lu_l(1 + log(w)) + \frac{r + de_j}{r + de_l} \sum_{k \neq j} su_{jk} - \sum_{k \neq l} su_{lk} + \frac{r + de_j}{r + de_l} \sum_{k \neq j} se_{jk} - \sum_{k \neq l} se_{lk}$$
(5)

where

$$su_{i,l} = \log(orig_i + dest_l + dist_{i,l})/(1 + \log(orig_i + dest_l + dist_{i,l}))$$
(6)

$$se_{j,l} = \exp(orig_j + dest_l + hist_{j,l})/(1 + \exp(orig_j + dest_l + hist_{j,l}))$$
 (7)

- 6. Create the matrices su and se.
- 7. Set r = 0.05. Create a function to evaluate  $q_{jl}(.)$ . Evaluate  $q_{jl}(9245)$  for all pairs (j,l).
- 8. Create gridw, which consists of a sequence from 9100 to 55240 of length 50.
- 9. Using the function sapply, evaluate  $q_{jl}$ . Store the ouput into an array of dimension (50 × 200 × 200). How long does it take to evaluate  $q_{jl}$ () for each value of w?

List

$$li[[1]] = mat1$$

```
li[[2]] = Titanic
li1 = list(x=mat1,y=Titanic)
li1$x
1i2$y
Dataframe
data=data.frame(x=rnorm(100),y=runif(100))
data
browse(data)
edit(data)
data[,1]
data[1,]
data$x
names(data)
attach(data)
х
detach(data)
у
Tests and Conversion
is.na()
is.list() as.list()
is.factor() as.factor()
is.matrix()
is.vector()
is.array()
is.finite()
a==b
a=>b
a<=b
```

## Exercise 11 Tests and indexing

- 1. Test if c(1,2,3) is an array? a vector? a matrix?
- 2. x0 = rnorm(1000); Using the function table() count the number of occurrences of x0 > 0, x0 > 1, x0 > 2, x0 > 0.5, x0 < 1 and x0 > -1
- 3. x1 = cut2(runif(100,0,1),g=10)
  levels(x1)=paste("q",1:10,sep="")
- 4. Test whether or not x1 is a factor?
- 5. Verify that "q1" has 10 occurences.
- 6. Convert x1 into a numeric variables. What happens to the levels?
- 7. rand = rnorm(1000)
- 8. Using the function which() find the indexes of positive values.
- 9. Create the object w of positive values of x using:
  - (a) Which
  - (b) Subset
  - (c) By indexing directly the values that respect a condition

#### 1.3 Basic functions

Table 1: Basic Functions

| Function                           | Description  |
|------------------------------------|--|
| abs(x)                             | absolute value                                       |
| $\operatorname{sqrt}(x)$           | square root  |
| ceiling(x)                         | ceiling(3.475) is 4                                  |
| floor(x)                           | floor(3.475) is 3                                    |
| $\operatorname{trunc}(\mathbf{x})$ | trunc(5.99) is 5                                     |
| round(x, digits=n)                 | round(3.475, digits=2) is $3.48$                     |
| signif(x, digits=n)                | signif(3.475, digits=2) is $3.5$                     |
| $\log(x)$                          | logarithm  |
| $\exp(x)$                          | $e^x$  |
| substr(x, start=n1, stop=n2)       | Extract or replace substrings in a character vector. |
|                                    | x = "abcdef", substr(x, 2, 4) is "bcd"               |
| grep(pattern, x )                  | Search for pattern in x.                             |
| sub(pattern, replacement, x)       | Find pattern in x and replace with replacement text. |
| strsplit(x, split)                 | Split the elements of character vector x at split.   |
| strsplit("abc", "")                | returns 3 element vector "a", "b", "c"               |
| paste(, sep="")                    | Concatenate strings                                  |
| toupper(x)                         | Uppercase  |
| tolower(x)                         | Lowercase  |

## 1.4 Language

```
if (condition) statement
for (i in range) statement
while (condition) statement
fun = function(input) {calculation return(output)}
fun = function(input) {calculation output}
```

# Exercise 12 Programming

```
Write a program that asks the user to type an integer N and compute u(N) defined with : u(0){=}1 u(1){=}1 u(n{+}1){=}u(n){+}u(n{-}1)
```

1. Evaluate  $1^2 + 2^2 + 3^2 + \dots 400^2$ .

Table 2: Apply functions

| Functions | Usage   |
|-----------|---|
| apply     | Apply Functions Over Array Margins                    |
| by        | Apply a Function to a Data Frame Split by Factors     |
| eapply    | Apply a Function Over Values in an Environment        |
| lapply    | Apply a Function over a List or Vector                |
| mapply    | Apply a Function to Multiple List or Vector Arguments |
| rapply    | Recursively Apply a Function to a List                |
| tapply    | Apply a Function Over a Ragged Array                  |

- 2. Evaluate  $1 \times 2 + 2 \times 3 + 3 \times 4 + ... + 249 \times 250$
- 3. Create a function "crra" with two arguments  $(c, \theta)$  that returns  $\frac{e^{1-\theta}}{1-\theta}$ . Add an if condition such that the utility is given by the log when  $\theta \in [0.97, 1, 03] \approx 1$
- 4. Create a function "fact" that returns the factorial of a number

## Exercise 13 Apply Functions

1. Using this object,

```
m = matrix(c(rnorm(20,0,10), rnorm(20,-1,10)), nrow = 20, ncol = 2)
```

Calculate the mean, median, min, max and standard deviation by row and column.

- 2. Using the dataset iris in the package "datasets", calculate the average **Sepal.Length** by **Species**. Evaluate the sum log of **Sepal.Width** by **Species**.
- 3. y1 = NULL; for (i in 1:100) y1[i]=exp(i)
  y2 = exp(1:100)
  y3 = sapply(1:100,exp)
  - (a) Check the outcome of these three operations.
  - (b) Using proc.time() or system.time(), compare the execution time of these three equivalents commands.

Table 3: Statistical distributions

| name        | description                     |
|-------------|---------------------------------|
| dname()     | density or probability function |
| pname()     | cumulative density function     |
| qname()     | quantile function               |
| $rname(\ )$ | random deviates                 |

Table 4: Statistical Functions

| Function                    | Description  |
|-----------------------------|--|
| mean(x, trim=0,na.rm=FALSE) | mean of object x   |
| sd(x), var(x)               | standard deviation, variance of $object(x)$                              |
| median(x)                   | median   |
| quantile(x, probs)          | x is the numeric vector and probs is a numeric vector with probabilities |
| range(x)                    | range  |
| sum(x)                      | sum  |
| diff(x, lag=1)              | lagged differences, with lag indicating which lag to use                 |
| $\min(x)$                   | minimum  |
| $\max(\mathbf{x})$          | maximum  |

Table 5: Statistical distributions

| Distribution      | R name |
|-------------------|--------|
| Beta              | beta   |
| Lognormal         | lnorm  |
| Binomial          | binom  |
| Negative Binomial | nbinom |
| Cauchy            | cauchy |
| Normal            | norm   |
| Chisquare         | chisq  |
| Poisson           | pois   |
| Exponential       | $\exp$ |
| Student t         | t      |
| F                 | f      |
| Uniform           | unif   |
| Gamma             | gamma  |
| Tukey             | tukey  |
| Geometric         | geom   |
| Weibull           | weib   |
| Hypergeometric    | hyper  |
| Wilcoxon          | wilcox |
| Logistic          | logis  |

## 1.5 Statistics

## Exercise 14 Simulating and Computing

- 1. Simulate a vector x of 10,000 draws from a normal distribution. Use the function summary to provide basic characteristics of x.
- 2. Create a function dsummary that returns, the minimum, the 1st decile, the 1st quartile, the median, the mean, the standard deviation, the 3rd quartile, the 9th decile, and the maximum.
- 3. Suppose  $X \sim N(2, 0.25)$ . Evaluate  $f(0.5), F(2.5), F^{-1}(0.95)$
- 4. Repeat if X has t-distribution with 5 degrees of freedom.
- 5. Suppose  $X \sim P(3,1)$ , where P is the pareto distribution. Evaluate  $f(0.5), F(2.5), F^{-1}(0.95)$

#### Exercise 15 Moments

Consider a vector V = rnorm(100, -2, 5).

- 1. Evaluate n as the length of V.
- 2. Compute the mean  $m = \frac{1}{n} \sum_{i=1}^{i=n} V_i$
- 3. Compute the variance  $s^2 = \frac{1}{n-1} \sum_{i=1}^{n} (V_i m)^2$
- 4. Compute the skewness  $\gamma_1 = \frac{1}{n} \frac{(V_i m)^3}{s^3}$
- 5. Compute the kurtosis  $k_1 = \frac{1}{n} \frac{(V_i m)^4}{s^4} 3$

#### Exercise 16 OLS

- 1. Create a matrix X of dimension (1000,10). Fill it with draws from a beta distribution with shape1 parameter 2, and shape 2 parameter 1. Make sure that there is no negative.
- 2. Create a scalar denoted by  $\sigma^2$  and set it to 0.5. Generate a vector  $\beta$  of size 10. Fill it with draws from a Gamma distribution with parameters 2 and 1.

Table 6: Matrix operation

| Function (Operator) | Description                              |
|---------------------|--|
| A * B               | Element wise multiplication              |
| A% * %B             | matrix multiplication                    |
| t(A)                | Transpose                                |
| diag(a)             | Create a diagonal matrix with a elements |
| diag(A)             | Return the diagonal of A                 |
| Solve(A)            | inverse of A                             |

- 3. Create a vector  $\epsilon$  of 1000 draws from a normal distribution.
- 4. Create  $Y = X\beta + \sqrt{\sigma^2} * \epsilon$
- 5. Recover  $\hat{\beta} = (X'X)^{-1}(X'Y)$
- 6. Evaluate  $\hat{\epsilon} = \hat{y} y$ . Plot the histogram (filled in grey) and the kernel density of the distribution of the error term.
- 7. Estimate  $\sigma^2 = \frac{\widehat{\epsilon}' \widehat{\epsilon}}{n-p-1}$ , and  $\mathbb{V}(\widehat{\beta}) = \sigma^2 (X'X)^{-1}$
- 8. Create param that binds  $(\beta, \sqrt{V(\widehat{\beta})})$ . Using the command lm, check these estimates.
- 9. Construct a confidence interval for  $\beta$ .
- 10. Redo the exercise by setting  $\sigma^2 = 0.01$ . How are your confidence intervals for  $\beta$ .