R Programming Basics - part 2

Outline

- Flow Control
- Functions
- R for statistics

Flow Control

Conditional execution

if statement

If a logical condition holds, execute one or more statements

syntax: if (condition) {executable statements}

```
nclasses=2
fulltime=FALSE
if (nclasses >= 3){
  fulltime=TRUE}
fulltime
```

```
## [1] FALSE
```

if else pair

If a condition holds, execute one set of statements, or else execute a second set of statements.

syntax: if (condition) { executable statements 1 } else { executable statements 2 }

```
fulltime=NA
nclasses=1
if (nclasses >= 3) {fulltime=TRUE
} else {fulltime=FALSE}
fulltime
```

[1] FALSE

It is essential to begin the second line of this if/else pair as "} else". In this case the R interpreter "waits" for the "}", and sees it paired with the "else". The "if" statement would be completed if the "}" was included on the end of the first line.

Often one wants to use several "else if" clauses. The following example takes a numerical grade, and assigns a letter grade according to the Dalhousie common grade scale.

```
if (grade >= 80) {Lgrade="A-"
} else
    if (grade >= 77) {Lgrade="B+"
} else
    if (grade >= 73) {Lgrade="B"
} else
    if (grade >= 70) {Lgrade="B-"
} else
    if (grade >= 65) {Lgrade="C+"
} else
    if (grade >= 60) {Lgrade="C"
} else
    if (grade >= 55) {Lgrade="C-"
} else
    if (grade >= 50) {Lgrade="D"
    } else {Lgrade="F"; print("Too bad!")}
## [1] "Good job!"
Lgrade
## [1] "A+"
Example: determine if a number is positive, negative or 0.
a <- 0
if (a < 0) {
   print("a is a negative number")
} else if (a > 0) {
   print("a is a positive number")
} else {
   print("a is zero")
}
## [1] "a is zero"
ifelse
ifelse is a compact version of if ... else ...
Syntax
ifelse(condition, statement1, statement2)
There is a subtle difference in that ifelse works on vectors.
Examples
\#find the minimum of scalars a and b
a=rnorm(1); a
## [1] 1.221303
b=rnorm(1); b
## [1] -1.36175
```

minab=ifelse(a<b,a,b); print(minab)</pre>

```
## [1] -1.36175
#find the component by component minimum of vectors a and b
a=rnorm(10);
b=rnorm(10);
vecminab=ifelse(a<b,a,b); print(cbind(a,b,vecminab))</pre>
##
                  a
                              b
                                  vecminab
##
    [1,] 0.2382978 1.4205132
                                 0.2382978
   [2,] 0.3469096 -0.2634322 -0.2634322
##
   [3,] 1.2586368 1.3490283 1.2586368
    [4,] -1.2703117 -0.2585920 -1.2703117
##
   [5,] -0.3756399 -0.1392408 -0.3756399
   [6,] 0.2513194 -1.9331005 -1.9331005
   [7,] 0.5255681 1.7536043 0.5255681
##
##
   [8,] 0.8685623 0.9200573 0.8685623
##
  [9,] 1.2893349 -0.7981538 -0.7981538
## [10,] 1.5769835 -1.3398801 -1.3398801
#determine if the elements of a vector are evenly divisible by 2
vec = 1:12
evenOdd = ifelse(vec \( \frac{1}{2} == 0, \text{"even", "odd"} \)
print(evenOdd)
## [1] "odd"
               "even" "odd" "even" "odd" "even" "odd" "even" "odd"
## [11] "odd"
               "even"
Logical Operators
& (and), | (or), == (equals), ! (not)
  • get help on logical operators
#?"=="
```

Truth tables

Suppose that x, y are logical variables, taking values T or F. The following "truth table" gives the values of the functions x & y (x and y), x | y (x or y), and !x (not x).

```
## x y x&y x|y !x
## [1,] TRUE TRUE TRUE TRUE FALSE
## [2,] TRUE FALSE FALSE TRUE FALSE
## [3,] FALSE TRUE FALSE TRUE TRUE
## [4,] FALSE FALSE FALSE FALSE TRUE
```

These basic functions can be built up into more complex expressions.

Example: (x|y)&z

```
##
          x \mid y
                  z (x|y)&z
## [1,]
        TRUE TRUE
                        TRUE
## [2,]
        TRUE FALSE
                       FALSE
## [3,] FALSE
               TRUE
                       FALSE
## [4,] FALSE FALSE
                       FALSE
Example: (x/\&y)\%7Cz$
##
          x&y
                  z(x&y)|z
## [1,] TRUE TRUE
                        TRUE
```

```
## [2,] TRUE FALSE
                       TRUE
## [3,] FALSE TRUE
                       TRUF.
## [4,] FALSE FALSE
                      FALSE
```

It is often useful to include brackets in order to specify the logical expression that you want. For example, suppose that you are interested to know whether (one or the other of x and y are TRUE) and (z is TRUE). Then you want to evaluate (x|y)&z. Suppose that you forget to include the brackets, and instead evaluate x|y&z. Are these the same? Sometimes yes, sometimes no.

```
x=c(rep(T,4),rep(F,4))
y=rep(c(rep(T,2),rep(F,2)),2)
z=rep(c(T,F),4)
cbind(x,y,z,(x|y)&z,x|y&z,x|(y&z))
```

```
##
           X
                 У
## [1,]
        TRUE
              TRUE
                   TRUE
                         TRUE
                                TRUE
                                      TRUE
## [2,]
        TRUE
             TRUE FALSE FALSE
                                TRUE
                                      TRUE
## [3,]
                         TRUE
        TRUE FALSE
                   TRUE
                                TRUE
                                      TRUE
## [4,]
        TRUE FALSE FALSE FALSE
                                TRUE
                                      TRUE
## [5,] FALSE
              TRUE
                    TRUE
                         TRUE
                                TRUE
                                      TRUE
## [6,] FALSE
              TRUE FALSE FALSE FALSE
## [7,] FALSE FALSE
                   TRUE FALSE FALSE FALSE
## [8,] FALSE FALSE FALSE FALSE FALSE
```

Using logical values to subset data

• Examples:

7

10

10

11

18

17

```
vec = c(1, 3, 6, 2, 5, 10, 11, 9)
#return all values which are evenly divisible by 3
vec[vec%3 == 0]
## [1] 3 6 9
#return all values which are not evenly divisible by 3
vec[!vec%3 == 0]
## [1] 1 2 5 10 11
vec[!((vec%%3) == 0)] #better to use brackets if you're unsure of operator precedence
## [1] 1 2 5 10 11
# return all the values in vec which are greater than 5
vec[vec > 5]
## [1] 6 10 11 9
# use "cars" data set, return all the rows where dist is less than 20
cars[cars$dist < 20, ]</pre>
##
      speed dist
## 1
          4
               2
## 2
          4
              10
## 3
          7
               4
## 5
              16
## 6
          9
              10
```

```
## 12
         12
              14
# return all the rows where speed is 10
cars[cars[,1] == 10, ]
##
     speed dist
## 7
        10
             18
## 8
        10
             26
## 9
        10
###Example: is a specified year a leap year? (Uses &, |, and !)
year = 2018
if ( (year \\\ 4 == 0 & year \\\ 100 != 0) | year \\\ 400 == 0) {
    print(paste(year, "is a leap year"))
  } else {
    print("no")
 }
## [1] "no"
Here is essentially the same thing, where the logical operations are more clearly identified.
  year=2018
 x=year %% 4 == 0
 y=year %% 100 != 0
 z=year %% 400 ==0
  condition=x&y|z
  c(x,y,z,condition)
## [1] FALSE TRUE FALSE FALSE
  if(condition) print(paste(year, "is a leap year"))
####Example: find records in a database
rm(list=ls()) #remove all objects
ls()
## character(0)
subjectno=c(1:8)
#enter some data for first and last name, age
firstname=c("Dick","Jane","","Jian","jing","Li","John","Li")
lastname=c("Tracy","Doe","Smith","Yuan","Xian","Li","Doe","")
age=sample(c(18:35),8) #assign random ages from 18 through 35
data=data.frame(subject=subjectno,firstname=firstname,
      surname=lastname,age=age)
rm("subjectno", "firstname", "lastname", "age")
ls()
## [1] "data"
attach(data) #attach the dataframe data
data
##
     subject firstname surname age
## 1
           1
                  Dick
                          Tracy 20
           2
## 2
                   Jane
                            Doe 23
## 3
           3
                          Smith 32
## 4
           4
                  Jian
                          Yuan 34
```

```
## 5
                           Xian
                  jing
## 6
                             T.i
                                 33
           6
                    T.i
## 7
           7
                  John
                            Doe
                                 24
## 8
           8
                    Li
                                 19
#find subjects whose surname is "Li"
subset1=data[surname=="Li",];subset1
     subject firstname surname age
## 6
           6
                    Li
                                 33
#Is there a Jane Doe in the database?
subset2=data[surname=="Doe"&firstname=="Jane",];subset2
     subject firstname surname age
## 2
           2
                  Jane
                            Doe 23
#find subjects whose given or surname is missing ("")
subset3=data[surname=="" | firstname=="",];subset3
     subject firstname surname age
## 3
           3
                          Smith 32
## 8
           8
                    Li
#Find the subjects who are older than 29 years?
data[age>29,]
##
     subject firstname surname age
## 3
           3
                                 32
                          Smith
## 4
           4
                  Jian
                           Yuan
                                 34
                           Xian
## 5
           5
                                 31
                  jing
## 6
           6
                    Li
                             Li
                                 33
#find all subjects whose first name starts with "J"
#use substr(chvector,1,1) to extract the first character
#of each element of the character vector chvector
subset4=data[substr(firstname,1,1)=="J",];subset4
##
     subject firstname surname age
## 2
           2
                  Jane
                           Doe
                                 23
## 4
           4
                  Jian
                           Yuan
                                 34
## 7
           7
                            Doe
                                 24
                  John
#find all subjects whose first name starts with either "J" or "j"
subset5=data[substr(firstname,1,1)=="J"|substr(firstname,1,1)=="j",];subset5
##
     subject firstname surname age
## 2
           2
                  Jane
                            Doe
                                 23
## 4
           4
                  Jian
                           Yuan
                                 34
## 5
           5
                           Xian 31
                  jing
## 7
           7
                  John
                           Doe
                                 24
detach(data) #detach the dataframe data
```

Flow control

for, while, repeat, break and next

for, while and repeat are iterative constructs, meaning that a collection of R statements are repeated.

for is the most common loop structure

```
-Syntax
```

```
for (var in range) {
    statements
}
```

• Examples:

```
# sum the numbers 1:k
k=12
mysum=0 #initialize the sum to 0
for (i in 1:k) {
   mysum=mysum+i}
print(mysum)
```

[1] 78

• Example: Find which of the years 2000 through 2020 are leap years

```
for (i in 2000:2020){
  if ( (i %% 4 == 0 & i %% 100 != 0) | i %% 400 == 0) {
    print(paste(i, "is a leap year"))
  }
}
```

```
## [1] "2000 is a leap year"
## [1] "2004 is a leap year"
## [1] "2008 is a leap year"
## [1] "2012 is a leap year"
## [1] "2016 is a leap year"
## [1] "2020 is a leap year"
```

Here is essentially the same thing, where the logical operations are more clearly

```
for (i in 2000:2020){
    x=i %% 4 == 0
    y=i %% 100 != 0
    z=i %% 400 ==0
    condition=x&y|z
    print(c(x,y,z,condition))
        if(condition) print(paste(i,"is a leap year"))
}
```

```
## [1] TRUE FALSE TRUE TRUE
## [1] "2000 is a leap year"
## [1] FALSE TRUE FALSE FALSE
## [1] FALSE TRUE FALSE FALSE
## [1] TRUE TRUE FALSE TRUE
## [1] "2004 is a leap year"
## [1] FALSE TRUE FALSE FALSE
## [1] FALSE TRUE FALSE FALSE
## [1] FALSE TRUE FALSE FALSE
## [1] TRUE TRUE FALSE FALSE
## [1] TRUE TRUE FALSE TRUE
## [1] "2008 is a leap year"
## [1] FALSE TRUE FALSE FALSE
```

```
## [1] FALSE
              TRUE FALSE FALSE
              TRUE FALSE FALSE
  [1] FALSE
       TRUE
              TRUE FALSE TRUE
  [1] "2012 is a leap year"
  [1] FALSE
              TRUE FALSE FALSE
  [1] FALSE
              TRUE FALSE FALSE
## [1] FALSE
              TRUE FALSE FALSE
## [1]
       TRUE
              TRUE FALSE TRUE
## [1] "2016 is a leap year"
  [1] FALSE
              TRUE FALSE FALSE
## [1] FALSE
              TRUE FALSE FALSE
              TRUE FALSE FALSE
  [1] FALSE
## [1]
       TRUE
              TRUE FALSE TRUE
## [1] "2020 is a leap year"
```

Example: Calculate the inner product of two vectors. Suppose that u and v are each numeric vectors of length n. Then the inner product of u and v is defined as

$$\sum_{i=1}^{n} u_i v_i$$

That is, we sum the products of the corresponding elements of the two vectors. This is easy to program using a *for* loop.

```
u=1:10
v=-10:-1
u*v

## [1] -10 -18 -24 -28 -30 -30 -28 -24 -18 -10
prod=0
for (i in 1:10)prod=prod+u[i]*v[i] #note no {} needed if everying on same line
print(prod)

## [1] -220
#verify
sum(u*v)
```

[1] -220

Example: matrix multiplication Suppose that U is a matrix with m rows and n columns, and that V is a matrix with n rows and p columns. The the matrix product P = UV is a matrix with m rows and p columns, and the entry in the i'th row and j'th column of P is

$$P_{ij} = \sum_{k=1}^{n} U_{ik} V_{kj}$$

Define some conforming matrices U and V, in this example, U being 4 by 3 and V being 3 by 3 The product P is a 4 by 3 matrix. Find $P_{2,3}$, the element in the 2nd row and 3rd column of P. By definition

$$P_{2,3} = \sum_{k=1}^{n} U_{2k} V_{k3}$$

```
U=matrix(1:12,byrow=T,ncol=3)
U # a 4 by 3 matrix
```

```
[,1] [,2] [,3]
##
## [1,]
           1
                2
## [2,]
           4
                5
                     6
## [3,]
           7
                     9
                8
## [4,]
          10
               11
                    12
V=matrix(c(rep(1,3),c(-1,0,1),-3:-1),byrow=T,ncol=3)
V # a 3 by 3 matrix
##
        [,1] [,2] [,3]
## [1,]
          1
## [2,]
          -1
                0
                     1
## [3,]
          -3
               -2
                    -1
U2=U[2,] #second row of U
V3=V[,3] #third column of V
P23=0
for (k in 1:3) P23=P23+U2[k]*V3[k]
## [1] 3
We want to calculate P_{i,j} for each pair of indices (i,j). Essentially
for (i in 1:4){
   #for each i in (1,2,3,4), do something
  for (j in 1:3){
    #for each j in (1,2,3) do something
     #calculate Pij here
  } # end of j for loop
    } # end of i for loop
This can be calculated in R using three "nested" for loops.
#result will be a 4 by 3 matrix, having 12 elements
P=matrix(rep(0,12),byrow=T,ncol=3) #initialize product with 0's
for (i in 1:4){ #for each i, execute code until the closing }
  for (j in 1:3) { #for each j, execute code until the closing }
    for (k in 1:3){ # for each k, execute code until the closing }
      P[i,j]=P[i,j]+U[i,k]*V[k,j]
      }}}
Ρ
        [,1] [,2] [,3]
## [1,] -10
              -5
## [2,]
        -19
               -8
                     3
        -28 -11
## [3,]
                     6
## [4,] -37 -14
                     9
#verify using the builtin R matrix multiplication operator "%*%".
U%*%V
##
        [,1] [,2] [,3]
## [1,]
        -10
               -5
         -19
              -8
## [2,]
                     3
## [3,]
         -28 -11
                     6
## [4,]
        -37 -14
                     9
```

Executing loops, in this case, "for" loops, in R is very inefficent as compared to many computer languages, such as Java or C, and using the built in functions (in this case %*%) is always recommended. That said, you need to know how to use loops effectively, in order to be able to do things in addition to calling the built in procedures.

The for loop in R is more general than the simlar construct in most programming languages. The general structure is

```
for (var in set) {
    statements
}
```

Where "set" is an arbitrary set, and the instructions are evaluated for each element of the set.

```
set=c("this","that","cat","mouse","male","female")
for (var in set) {
    print(var)
}

## [1] "this"
## [1] "that"
## [1] "cat"
## [1] "mouse"
## [1] "male"
## [1] "female"
```

The basic definitions and a few simple examples are given below for the *while*, *repeat*, *break*, *next*

statements/constructs.

More meaningful examples will be given in the material on user defined functions.

while

Syntax

```
while (condition){
  statement
}
```

Example

```
x = 5
while(x <= 20){
  print(x)
  x = x+5
}

## [1] 5
## [1] 10
## [1] 15
## [1] 20

repeat</pre>
```

Syntax: repeat {statement}

```
need to use break
```

```
x = 5
repeat{
 print(x)
 x = x+5
 if (x > 20) break
}
## [1] 5
## [1] 10
## [1] 15
## [1] 20
"break" and "next"
"break": break the current loop
for (i in 1:6){
  if (i==5){
   break
 }
 print(i)
}
## [1] 1
## [1] 2
## [1] 3
## [1] 4
"next": skip to next iteration
for (i in 1:6){
  if (i==5){
   next
 }
 print(i)
}
## [1] 1
## [1] 2
## [1] 3
## [1] 4
## [1] 6
```

User-defined functions

```
-Syntax
```

```
funtionname= function(arg1,arg2,...){
  statements
  return(something)
}
```

-Examples:

```
SumSquare = function(x,y){
   val = x^2+y^2
   return(val)
}
SumSquare(3,4)
## [1] 25
SumSquares = function(x){
# function to create the sum of squares of elements of x
   temp=0
   for (i in 1:length(x)){
  print(c(i,x[i],x[i]^2))
   temp=temp+x[i]^2}
   return(temp)
}
data=c(4,1,-2,5)
SumSquares(data)
## [1] 46
SumSquares1 = function(x){
# another way to do the same thing
   temp=0
   for (i in x){
   print(c(i,i^2))
   temp=temp+i^2}
   return(temp)
}
SumSquares1(data)
## [1] 4 16
## [1] 1 1
## [1] -2 4
## [1] 5 25
## [1] 46
SumSquares2 = function(x){
\# if statement checks that the input argument x
# is a numeric vector. If it is not, print an
# error message, and return a NULL value
   if(!is.vector(x)|!is.numeric(x)){
       print("x should be a numeric vector")
       return(NULL)}
# otherwise, return the sum of the squared elements of x
   temp=0
   for (i in 1:length(x))temp=temp+x[i]^2
   return(temp)
}
SumSquares2(data)
```

[1] 46

```
SumSquares2(c("a","b"))

## [1] "x should be a numeric vector"

## NULL

SumSquares2(matrix(1:4,byrow=T,ncol=2))

## [1] "x should be a numeric vector"

## NULL
```

Exercise: create a function for finding leap years

- input: startYear, endYear
- output: return a vector of all the leap years between startYear and endYear
- Using a for loop

```
leapYears1 = function(startYear,endYear){
  output = NULL
#uses a for loop
  for (year in c(startYear:endYear)){
   if ( (year %% 4 == 0 & year %% 100 != 0) | year %% 400 ==0){
     output = c(output,year)
  }}
  return(output)
}
```

[1] 2020 2024 2028

• Use while or repeat for looping

```
leapYears2 = function(startYear,endYear){
  results = c()

#uses a while loop, as opposed to a for loop
  year = startYear
  while (year <= endYear){
   if ( (year %% 4 == 0 & year %% 100 != 0) | year %% 400 ==0){
     results = c(results,year)
  }
    year = year + 1
  }
  return(results)
}</pre>
```

```
## [1] 2020 2024 2028
```

```
leapYears3 = function(years=2019){
    #uses built in vectorized logical indexing
    return(years[(years %% 4 == 0 & years %% 100 != 0) | years %% 400 ==0])}
leapYears3(2018:2028)
```

[1] 2020 2024 2028

```
test=leapYears3(1867:2019)
test
```

```
## [1] 1868 1872 1876 1880 1884 1888 1892 1896 1904 1908 1912 1916 1920 1924 1928
## [16] 1932 1936 1940 1944 1948 1952 1956 1960 1964 1968 1972 1976 1980 1984 1988
## [31] 1992 1996 2000 2004 2008 2012 2016
```

-Example: function calling another function

Recall that the formula for the sample variance of x_1, x_2, \ldots, x_n is

$$s^{2} = \frac{1}{n-1} \sum_{i=1}^{n} (x_{i} - \bar{x})^{2}$$

where $\bar{x} = \sum_{i=1}^{n} x_i/n$.

```
mymean=function(x){
#returns the sample mean of the values in the vector x
  mysum=0
  for (i in x){
    mysum=mysum+i
  }
  return(mysum/length(x))
}
myvar=function(x){
  n=length(x)
# subtract the mean from the values in x
  data=x-mymean(x)
# sum the squares of the entries of data
  myvar=SumSquares(data)
# divide the sum of squares by n-1
  myvar=myvar/(n-1)
  return(myvar)
myvar(data)
```

[1] 10

```
#check using the built in function var
var(1:7)
```

[1] 4.666667

-How fast is our user defined function as compared to the builtin function var?

```
v=rnorm(50000) #vector of 50000 observations from the standard normal
start1=Sys.time()
var(v) #sample variance of v using builtin function
```

```
## [1] 0.9928466
end1=Sys.time()
tm1=end1-start1
tm1 #elapsed time
```

Time difference of 0.001680136 secs

```
start2=Sys.time()
myvar(v) #sample variance of v using user defined function

## [1] 0.9928466
end2=Sys.time()
tm2=end2-start2
tm2 #elapsed time
```

Time difference of 0.009307146 secs

It is important to be able to write user defined functions in order to make extensions to the language. However, the built in functions, which use vectorized arithmetic, with calls to more efficient languages, are typically much faster, and so the recommended choice with even moderate sized data sets.

##Scope: the *scope* of a variable tells us which version of the variable is being used. Variables can be local or global. A variable defined within a function is local to that function.

TRICK to remember: Variables go in but do not go out.

By this we mean that:

- 1. variables that are defined in the main R program keep their values (if not redefined) inside functions (variables go in)
- 2. variables only defined in a function have a scope limited to the function, and disappear (are undefined) back in the main program (variables do not go out)

The following exercises are just ways to familiarize you with variable scopes. You can create your own variants.

For example, test the following:

- define a and b in the main program
- modify a and b inside a function (not passing a or b as arguments)
- print a and b in the main program
- what are your conclusions?

Example: only z exists in the global environment. a and b are defined within the function test. They are local to test and not available in the global environment after the function is run.

```
rm(list=ls()) #clear everything in the global environment

z=10
ls()

## [1] "z"

test=function(x){
   a=1
   b=2
   y=a+b*x
   return(y)
   }

test(z)
```

[1] 21

```
ls()
## [1] "test" "z"
Example 2: a, b and z exist in the global environment. Only y, and the argument to the function, x, are
available within the function. When the function test is defined, the values of a and b available at that time
are used in the definition.
rm(list=ls()) #clear everything in the global environment
a=1
b=2
z=10
ls()
## [1] "a" "b" "z"
test=function(x){
  v=a+b*x
  print(ls()) #ls lists the variables in the local environment
               #note there is no a or b local to the function
               #the values printed are those from the global
  print(a)
  print(b)
               #environment when the function was defined
  return(y)
  }
test(z)
## [1] "x" "y"
## [1] 1
## [1] 2
## [1] 21
ls()
                       "test" "z"
## [1] "a"
               "b"
Example 3: a, b and z exists in the global environment. a and b are also defined within the environment
which is local to the function. The local versions are used within the function.
rm(list=ls()) #clear everything in the global environment
a=1
b=2
z=10
ls()
## [1] "a" "b" "z"
test=function(x){
```

```
test=function(x){
  a=10
  b=20
  y=a+b*x
  print(ls()) #ls lists the variables in the local environment
  return(y)
  }
output=test(z) #now there will be a variable *output* in the global environment.
```

[1] 2

• A more advanced example: suppose we have one function defined within another, and the same variable name used in each function, and globally. Before evaluating the following code, see if you can understand what the final result f(10)+a will be, and also, any intermediate outputs. What would the result be if you remove the line a=3 in function g? Which value of a will function g use? In this case, the value of a used in function g is that value which was present in the in the environment where g was defined, namely a=2.

```
rm(list=ls())
a=1
z=10
f=function(x){
  print(c(x,a))
  g=function(x){
  a=3
  print(c(x,a))
  resultg=a+x
  print(paste("function g returns ",resultg))
  return(resultg)}
    resultf=g(x+5)+a
    print(paste("function f returns ",resultf))
    return(resultf)
    }
f(10) + a
```

Advanced topic: the argument ...

Usually a function is called with a fixed number of arguments. In more advanced applications, you may want to pass in arguments only on some occasions, and pass them directly through to other functions within the function you have written. The argument . . . is a placeholder for any number of named arguments, which can be passed through to other functions.

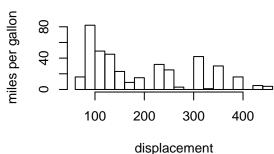
For example, suppose that we want a function which makes plots of both y vs x, and also a histogram of x. We would like to use the function with variables of any name, but we would like to be able to pass in labels to the function to better identify the variables. Let's work with the Auto data, and make plots using mpg as the y-variable, both vs both displacement and log(displacement) as the y-variable, and let's pass the labels through to the plot and histogram functions.

```
data=mydata=read.csv("http://faculty.marshall.usc.edu/gareth-james/ISL/Auto.csv")
attach(data)
par(mfrow=c(2,2))  #set graphics region to have two rows, two columns

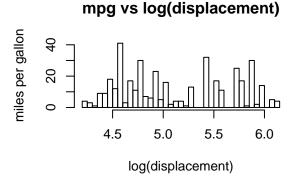
plot2=function(x,y,nclassin=20,...){
    #this function first makes a plot of y vs x. Notice that ... is passed through
    #from the plot2 function definition
    plot(x,y,...)
    #next make a histogram of x. Notice that the default number of histogram bars is 20
    hist(x,nclass=nclassin,...)
}

plot2(displacement, mpg, xlab="displacement", ylab="miles per gallon")
plot2(log(displacement), mpg, xlab="log(displacement)", ylab="miles per gallon", main="mpg vs log(displacement)"
    Histogram of x
```

Der Jagen 100 200 300 400 displacement



wiles ber gallon 4.5 5.0 5.5 6.0



Recursion - a recursive function calls itself.

log(displacement)

mpg vs log(displacement)

• Example 1: for non-negative integer n, "n factorial", written as n! is defined as

$$!n = n!(n-1) = n(n-1)!(n-2) = \dots = n(n-1)(n-2)\dots(2)(1)$$

with the consistency condition 0! = 1.

The following gives R code for calculating n! using both recursion, and a calculation using a for loop.

```
fact0=function(x){
  if(x==1){return(1)}
  } else
  {return(x*fact0(x-1))}
```

```
}
fact0(6)
## [1] 720
#better to force the input value to be an integer
#and to include some comment as to what the function is doing
fact1=function(x){
  #returns x! for x a positive integer
  x=as.integer(x)
   if(x<0){
  print("Error: x must be a positive integer")
  return(NULL)} else {
   if(x==0|x==1){
   return(1)} else {
   return(x*fact1(x-1))}
  }}
fact1(6)
## [1] 720
#fact2 calculates factorial using a for loop
fact2=function(x){
#returns x! for x a positive integer
 x=as.integer(x)
  if(x<0){
  print("Error: x must be a positive integer")
  return(NULL)} else {
  if(x==0|x==1){
  return(1)} else {
  temp=1
  for (i in 2:x) temp=temp*i
  return(temp)
  }}}
fact2(6)
## [1] 720
start=Sys.time()
fact1(60)
## [1] 8.320987e+81
end=Sys.time()
end-start
## Time difference of 0.001328945 secs
start=Sys.time()
fact2(60)
## [1] 8.320987e+81
end=Sys.time()
end-start
```

Time difference of 0.005215883 secs

```
start=Sys.time()
factorial(60)

## [1] 8.320987e+81
end=Sys.time()
end-start

## Time difference of 0.001406908 secs
```

#Some Useful Functions for Statistics

Arithmetic

- Arithmetic Operators
- Mathematic Functions

Vectorized Arithmetic

```
testVect = c(1,3,5,2,9,10,7,8,6)
min(testVect) # minimum
## [1] 1
max(testVect) # maximum
## [1] 10
mean(testVect) # mean
## [1] 5.666667
median(testVect) # median
## [1] 6
quantile(testVect) # quantile
##
     0% 25% 50% 75% 100%
           3
var(testVect) #variance
## [1] 10
sd(testVect) # standard deviation
## [1] 3.162278
vect1 = cars$speed
vect2 = cars$dist
cov(vect1,vect2) # covariance
## [1] 109.9469
cor(vect1,vect2) # correlation coefficient
## [1] 0.8068949
```

apply, inner product, outer product

```
The 'apply' function gives you a way to perform flexible operations on arrays.
```

The syntax is:

```
apply(X, MARGIN, FUN, ...)
```

For details on the syntax of the 'apply' family of functions, please go to:

```
https://www.datacamp.com/community/tutorials/r-tutorial-apply-family
# Construct a 5x6 matrix
X <- matrix(rnorm(30), nrow=5, ncol=6)</pre>
# Sum the values of each column with `apply()`
apply(X, 2, sum)
product <- outer(0:1, 0:1, "*")</pre>
    [,1] [,2]
#[1,] 0 0
      0
#[2,]
            1
product2 <- outer(product, product, "*")</pre>
product
##
       [,1] [,2]
## [1,]
         0 0
## [2,]
         0
product2
## , , 1, 1
##
##
     [,1] [,2]
## [1,]
       0
## [2,]
              0
         0
##
## , , 2, 1
##
     [,1] [,2]
##
## [1,]
       0
## [2,]
         0
##
## , , 1, 2
##
##
      [,1] [,2]
## [1,]
         0
## [2,]
         0
##
## , , 2, 2
##
##
      [,1] [,2]
## [1,]
         0
## [2,]
         0
```

##Probability Distributions

• key words

```
d: density (returns the height of the pdf)
p: distribution function (returns the cdf)
q: quantile function (returns the inverse cdf)
r: random generation
distributions
binom: Binomial Distribution
pois: Poisson Distribution
unif: Uniform Distribution
exp: Exponential Distribution
norm: Normal Distribution
chisq: Chi-Squared Distribution
t: t Distribution
```

What is the probability of four or less questions answered correctly by random in a twelve question multiple choice quiz?

What is the threshold q that I should place on a random variable z drawn from a standard normal distribution to make sure that z is less than q with probability 0.75?

How can I produce a series of independent Poisson distributed counts?

Mathematical expressions of densities (pdfs):

- f : F Distribution

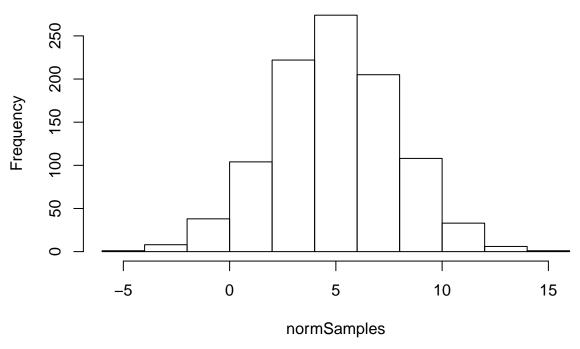
```
d \sim e^{-x^2}d = \binom{n}{x} p^x (1-p)^{n-x}
```

https://www.calvin.edu/~rpruim/courses/s341/S17/from-class/MathinRmd.html

• Examples

```
# binomial probability of having 2 successes in 10 Benoulli draws of probability 0.2
dbinom(2, size=10, prob=0.2)
## [1] 0.3019899
dbinom(0, size=10, prob=0.2) + dbinom(1, size=10, prob=0.2) + dbinom(2, size=10, prob=0.2)
## [1] 0.6777995
pbinom(2,size=10,prob=0.2)
## [1] 0.6777995
runif(6,min=1,max=2)
## [1] 1.477235 1.591193 1.416582 1.448760 1.166077 1.165975
qt(c(.025, .975), df=4)
## [1] -2.776445 2.776445
qf(.95, df1=3, df2=4)
## [1] 6.591382
normSamples = rnorm(1000,mean=5,sd = 3)
hist(normSamples)
```

Histogram of normSamples



• set.seed() reproduce the results even using random

```
set.seed(100)
rnorm(5)

## [1] -0.50219235  0.13153117 -0.07891709  0.88678481  0.11697127

rnorm(5)

## [1]  0.3186301 -0.5817907  0.7145327 -0.8252594 -0.3598621

set.seed(100) # reproduce the results
rnorm(5)

## [1] -0.50219235  0.13153117 -0.07891709  0.88678481  0.11697127

rnorm(5)
```

[1] 0.3186301 -0.5817907 0.7145327 -0.8252594 -0.3598621