Programming in R

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Overview

One of the main attractions of using the R (http://cran.at.r-project.org) environment is the ease with which users can write their own programs and custom functions. The R programming syntax is extremely easy to learn, even for users with no previous programming experience. Once the basic R programming control structures are understood, users can use the R language as a powerful environment to perform complex custom analyses of almost any type of data (Gentleman 2008).

Why Programming in R?

- Powerful statistical environment and programming language
- Facilitates reproducible research
- Efficient data structures make programming very easy
- Ease of implementing custom functions
- Powerful graphics
- Access to fast growing number of analysis packages
- Most widely used language in bioinformatics
- Is standard for data mining and biostatistical analysis
- Technical advantages: free, open-source, available for all OSs

R. Basics

The previous Rbasics tutorial provides a general introduction to the usage of the R environment and its basic command syntax. More details can be found in the R & BioConductor manual here.

Code Editors for R

Several excellent code editors are available that provide functionalities like R syntax highlighting, auto code indenting and utilities to send code/functions to the R console.

- RStudio: GUI-based IDE for R
- Vim-R-Tmux: R working environment based on vim and tmux
- Emacs (ESS add-on package)
- gedit and Rgedit
- RKWard
- Eclipse
- Tinn-R
- Notepad++ (NppToR)

Programming in R using RStudio

Programming in R using Vim or Emacs

Finding Help

Reference list on R programming (selection)

- Advanced R, by Hadley Wickham
- R Programming for Bioinformatics, by Robert Gentleman
- S Programming, by W. N. Venables and B. D. Ripley
- Programming with Data, by John M. Chambers
- R Help & R Coding Conventions, Henrik Bengtsson, Lund University
- Programming in R (Vincent Zoonekynd)
- Peter's R Programming Pages, University of Warwick
- Rtips, Paul Johnsson, University of Kansas
- R for Programmers, Norm Matloff, UC Davis
- High-Performance R, Dirk Eddelbuettel tutorial presented at useR-2008
- C/C++ level programming for R, Gopi Goswami

Control Structures

Important Operators

Comparison operators

```
 == (equal)!= (not equal)> (greater than)
```

- >= (greater than or equal)
- < (less than)
- <= (less than or equal)

Logical operators

- & (and)
- | (or)
- ! (not)

Conditional Executions: if Statements

An if statement operates on length-one logical vectors.

Syntax

```
if(TRUE) {
    statements_1
} else {
    statements_2
}
```

Example

```
if(1==0) {
    print(1)
} else {
    print(2)
}
```

[1] 2

Conditional Executions: ifelse Statements

The ifelse statement operates on vectors.

Syntax

```
ifelse(test, true_value, false_value)
```

Example

```
x <- 1:10
ifelse(x<5, x, 0)
## [1] 1 2 3 4 0 0 0 0 0 0</pre>
```

Loops

for loop

for loops iterate over elements of a looping vector.

Syntax

```
for(variable in sequence) {
    statements
}
```

Example

```
mydf <- iris
myve <- NULL
for(i in seq(along=mydf[,1])) {
    myve <- c(myve, mean(as.numeric(mydf[i,1:3])))
}
myve[1:8]</pre>
```

```
## [1] 3.333333 3.100000 3.066667 3.066667 3.333333 3.666667 3.133333 3.300000
```

Note: Inject into objecs is much faster than append approach with c, cbind, etc.

Example

```
myve <- numeric(length(mydf[,1]))
for(i in seq(along=myve)) {
    myve[i] <- mean(as.numeric(mydf[i,1:3]))
}
myve[1:8]</pre>
```

```
## [1] 3.333333 3.100000 3.066667 3.066667 3.333333 3.666667 3.133333 3.300000
```

Conditional Stop of Loops

The stop function can be used to break out of a loop (or a function) when a condition becomes TRUE. In addition, an error message will be printed.

Example

```
x <- 1:10
z <- NULL
for(i in seq(along=x)) {
    if(x[i] < 5) {
        z <- c(z, x[i]-1)
    } else {
        stop("values need to be < 5")
    }
}</pre>
```

while loop

Iterates as long as a condition is true.

Syntax

```
while(condition) {
    statements
}
```

Example

```
z <- 0
while(z<5) {
    z <- z + 2
    print(z)
}
## [1] 2
## [1] 4</pre>
```

The apply Function Family

apply

[1] 6

Syntax

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

Arguments

- X: array, matrix or data.frame
- MARGIN: 1 for rows, 2 for columns
- FUN: one or more functions
- ARGs: possible arguments for functions

Example

3.33333 3.100000 3.066667 3.066667 3.333333 3.666667 3.133333 3.300000

tapply

Applies a function to vector components that are defined by a factor.

Syntax

```
tapply(vector, factor, FUN)
```

Example

```
iris[1:2,]
```

```
## Sepal.Length Sepal.Width Petal.Length Petal.Width Species
## 1 5.1 3.5 1.4 0.2 setosa
## 2 4.9 3.0 1.4 0.2 setosa
```

```
tapply(iris$Sepal.Length, iris$Species, mean)
```

```
## setosa versicolor virginica
## 5.006 5.936 6.588
```

sapply and lapply

Both apply a function to vector or list objects. The lapply function always returns a list object, while sapply returns vector or matrix objects when it is possible.

Examples

```
x <- list(a = 1:10, beta = exp(-3:3), logic = c(TRUE, FALSE, TRUE))
lapply(x, mean)</pre>
```

```
## $a
## [1] 5.5
##
## $beta
## [1] 4.535125
##
## $logic
## [1] 0.5

sapply(x, mean)

## a beta logic
## 5.500000 4.535125 0.500000
```

Often used in combination with a function definition:

```
lapply(names(x), function(x) mean(x))
sapply(names(x), function(x) mean(x))
```

Functions

Function Overview

A very useful feature of the R environment is the possibility to expand existing functions and to easily write custom functions. In fact, most of the R software can be viewed as a series of R functions.

Syntax to define function

```
myfct <- function(arg1, arg2, ...) {
   function_body
}</pre>
```

Syntax to call functions

```
myfct(arg1=..., arg2=...)
```

The value returned by a function is the value of the function body, which is usually an unassigned final expression, e.g.: return()

Function Syntax Rules

General

- Functions are defined by
 - 1. The assignment with the keyword function
 - 2. The declaration of arguments/variables (arg1, arg2, ...)
 - 3. The definition of operations (function_body) that perform computations on the provided arguments. A function name needs to be assigned to call the function.

Naming

• Function names can be almost anything. However, the usage of names of existing functions should be avoided.

Arguments

• It is often useful to provide default values for arguments (e.g.: arg1=1:10). This way they don't need to be provided in a function call. The argument list can also be left empty (myfct <- function() { fct_body }) if a function is expected to return always the same value(s). The argument ... can be used to allow one function to pass on argument settings to another.

Body

• The actual expressions (commands/operations) are defined in the function body which should be enclosed by braces. The individual commands are separated by semicolons or new lines (preferred).

Usage

• Functions are called by their name followed by parentheses containing possible argument names. Empty parenthesis after the function name will result in an error message when a function requires certain arguments to be provided by the user. The function name alone will print the definition of a function.

Scope

• Variables created inside a function exist only for the life time of a function. Thus, they are not accessible outside of the function. To force variables in functions to exist globally, one can use the double assignment operator: <<-

Examples

Define sample function

```
myfct <- function(x1, x2=5) {
    z1 <- x1 / x1
    z2 <- x2 * x2
        myvec <- c(z1, z2)
        return(myvec)
}</pre>
```

Function usage

Apply function to values 2 and 5

```
myfct(x1=2, x2=5)
```

```
## [1] 1 25
```

Run without argument names

```
myfct(2, 5)
## [1] 1 25
```

Makes use of default value 5

```
myfct(x1=2)
```

```
## [1] 1 25
```

Print function definition (often unintended)

myfct

```
## function(x1, x2=5) {
## z1 <- x1 / x1
## z2 <- x2 * x2
## myvec <- c(z1, z2)
## return(myvec)
## }</pre>
```

Useful Utilities

Debugging Utilities

Several debugging utilities are available for R. They include:

- traceback
- browser
- options(error=recover)
- options(error=NULL)
- debug

The Debugging in R page provides an overview of the available resources.

Regular Expressions

R's regular expression utilities work similar as in other languages. To learn how to use them in R, one can consult the main help page on this topic with ?regexp.

String matching with grep

The grep function can be used for finding patterns in strings, here letter A in vector month.name.

```
month.name[grep("A", month.name)]
```

```
## [1] "April" "August"
```

String substitution with gsub

Example for using regular expressions to substitute a pattern by another one using a back reference. Remember: single escapes $\$ need to be double escaped $\$ in R.

```
gsub('(i.*a)', 'xxx_\\1', "virginica", perl = TRUE)
## [1] "vxxx_irginica"
```

Interpreting a Character String as Expression

Some useful examples

Generates vector of object names in session

```
mylist <- ls()
mylist[1]</pre>
```

```
## [1] "i"
```

Executes 1st entry as expression

```
get(mylist[1])
```

```
## [1] 150
```

Alternative approach

```
eval(parse(text=mylist[1]))
```

[1] 150

Replacement, Split and Paste Functions for Strings

Selected examples

Substitution with back reference which inserts in this example _ character

```
x <- gsub("(a)","\\1_", month.name[1], perl=T)
x</pre>
```

```
## [1] "Ja_nua_ry"
```

Split string on inserted character from above

```
strsplit(x,"_")
```

```
## [[1]]
## [1] "Ja" "nua" "ry"
```

Reverse a character string by splitting first all characters into vector fields

```
paste(rev(unlist(strsplit(x, NULL))), collapse="")
## [1] "yr_aun_aJ"
```

Time, Date and Sleep

Selected examples

Return CPU (and other) times that an expression used (here ls)

```
system.time(ls())
```

```
## user system elapsed
## 0 0 0 0
```

Return the current system date and time

```
date()
```

```
## [1] "Sun Apr 16 08:11:14 2017"
```

Pause execution of R expressions for a given number of seconds (e.g. in loop)

```
Sys.sleep(1)
```

Example

Import of Specific File Lines with Regular Expression

The following example demonstrates the retrieval of specific lines from an external file with a regular expression. First, an external file is created with the cat function, all lines of this file are imported into a vector with readLines, the specific elements (lines) are then retieved with the grep function, and the resulting lines are split into vector fields with strsplit.

```
cat(month.name, file="zzz.txt", sep="\n")
x <- readLines("zzz.txt")
x[1:6]</pre>
```

```
## [1] "January" "February" "March" "April" "May" "June"
```

```
x <- x[c(grep("^J", as.character(x), perl = TRUE))]
t(as.data.frame(strsplit(x, "u")))</pre>
```

Calling External Software

External command-line software can be called with system. The following example calls blastall from R

```
system("blastall -p blastp -i seq.fasta -d uniprot -o seq.blastp")
```

Running R Scripts

Possibilities for Executing R Scripts

R console

```
source("my_script.R")
```

Command-line

```
Rscript my_script.R # or just ./myscript.R after making it executable R CMD BATCH my_script.R # Alternative way 1 R --slave < my_script.R # Alternative way 2
```

Passing arguments from command-line to R

Create an R script named test.R with the following content:

```
myarg <- commandArgs()
print(iris[1:myarg[6], ])</pre>
```

Then run it from the command-line like this:

```
Rscript test.R 10
```

In the given example the number 10 is passed on from the command-line as an argument to the R script which is used to return to STDOUT the first 10 rows of the <code>iris</code> sample data. If several arguments are provided, they will be interpreted as one string and need to be split in R with the strsplit function. A more detailed example can be found here.

Building R Packages

Short Overview of Package Building Process

R packages can be built with the package.skeleton function. The given example will create a directory named mypackage containing the skeleton of the package for all functions, methods and classes defined in the R script(s) passed on to the code_files argument. The basic structure of the package directory is described here. The package directory will also contain a file named Read-and-delete-me with instructions for completing the package:

```
package.skeleton(name="mypackage", code_files=c("script1.R", "script2.R"))
```

Once a package skeleton is available one can build the package from the command-line (Linux/OS X). This will create a tarball of the package with its version number encoded in the file name. Subequently, the package tarball needs to be checked for errors with:

```
R CMD build mypackage
R CMD check mypackage_1.0.tar.gz
```

Install package from source

```
install.packages("mypackage_1.0.tar.gz", repos=NULL)
```

For more details see here

Programming Exercises

Exercise 1

for loop

Task 1.1: Compute the mean of each row in myMA by applying the mean function in a for loop.

```
myMA <- matrix(rnorm(500), 100, 5, dimnames=list(1:100, paste("C", 1:5, sep="")))
myve_for <- NULL
for(i in seq(along=myMA[,1])) {
    myve_for <- c(myve_for, mean(as.numeric(myMA[i, ])))
}
myResult <- cbind(myMA, mean_for=myve_for)
myResult[1:4, ]</pre>
```

```
## C1 C2 C3 C4 C5 mean_for
## 1 0.07927221 -1.4428685 0.6975614 -1.1093279 0.44573774 -0.2659250
## 2 1.19742197 -0.4971164 -0.3432921 0.6728799 -0.03686824 0.1986050
## 3 -1.59735579 -2.3832667 0.7183594 0.3964477 1.33681336 -0.3058004
## 4 1.16939495 -1.2115285 0.1470573 0.7375473 -0.31301378 0.1058915
```

while loop

Task 1.2: Compute the mean of each row in myMA by applying the mean function in a while loop.

```
z <- 1
myve_while <- NULL
while(z <= length(myMA[,1])) {
    myve_while <- c(myve_while, mean(as.numeric(myMA[z, ])))
    z <- z + 1
}
myResult <- cbind(myMA, mean_for=myve_for, mean_while=myve_while)
myResult[1:4, -c(1,2)]</pre>
```

```
## C3 C4 C5 mean_for mean_while

## 1 0.6975614 -1.1093279 0.44573774 -0.2659250 -0.2659250

## 2 -0.3432921 0.6728799 -0.03686824 0.1986050 0.1986050

## 3 0.7183594 0.3964477 1.33681336 -0.3058004 -0.3058004

## 4 0.1470573 0.7375473 -0.31301378 0.1058915 0.1058915
```

Task 1.3: Confirm that the results from both mean calculations are identical

```
all(myResult[,6] == myResult[,7])
## [1] TRUE
apply loop
```

Task 1.4: Compute the mean of each row in myMA by applying the mean function in an apply loop

Avoiding loops

Task 1.5: When operating on large data sets it is much faster to use the rowMeans function

3 0.3964477 1.33681336 -0.3058004 -0.3058004 -0.3058004 -0.3058004 ## 4 0.7375473 -0.31301378 0.1058915 0.1058915 0.1058915 0.1058915

Exercise 2

Custom functions

Task 2.1: Use the following code as basis to implement a function that allows the user to compute the mean for any combination of columns in a matrix or data frame. The first argument of this function should specify the input data set, the second the mathematical function to be passed on (e.g. mean, sd, max) and the third one should allow the selection of the columns by providing a grouping vector.

```
myMA <- matrix(rnorm(100000), 10000, 10, dimnames=list(1:10000, paste("C", 1:10, sep="")))
myMA[1:2,]
##
                       C2
                                    СЗ
                                              C4
                                                         C5
                                                                    C6
                                                                               C7
                                                                                           C8
## 1 1.0579551 -1.2770846 -1.32150140 0.6821067 0.3002011 0.6971941
                                                                       0.9682067 -0.6422546
                                                                                              0.3912427
## 2 0.6294469 -0.9086788 0.05546482 0.8222621 0.1797109 -0.4354320 -0.4247061 -1.0789142 -0.1454791
## 1 -0.04067505
## 2 0.43038546
myList \leftarrow tapply(colnames(myMA), c(1,1,1,2,2,2,3,3,4,4), list)
names(myList) <- sapply(myList, paste, collapse="_")</pre>
myMAmean <- sapply(myList, function(x) apply(myMA[,x], 1, mean))
myMAmean[1:4,]
                   C4_C5_C6
##
        C1_C2_C3
                                  C7_C8
                                           C9_C10
## 1 -0.51354363 0.5598340 0.1629761 0.1752838
## 2 -0.07458905  0.1888470 -0.7518102  0.1424532
## 3 -0.11839169  0.8791726 -0.5360216  0.7488324
## 4 -0.34606523 -0.8315808 -0.9720177 0.2090652
```

Exercise 3

Nested loops to generate similarity matrices

Task 3.1: Create a sample list populated with character vectors of different lengths

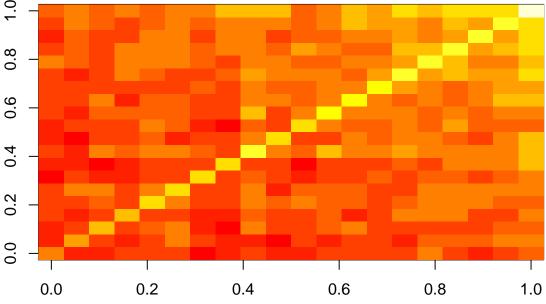
```
setlist <- lapply(11:30, function(x) sample(letters, x, replace=TRUE))</pre>
names(setlist) <- paste("S", seq(along=setlist), sep="")</pre>
setlist[1:6]
## $S1
    [1] "o" "b" "k" "a" "n" "x" "p" "w" "h" "n" "r"
##
##
##
   $$2
    [1] "a" "j" "o" "m" "e" "a" "h" "i" "q" "p" "x" "s"
##
##
##
   $S3
##
    [1] "z" "q" "n" "b" "n" "o" "u" "w" "s" "e" "i" "h" "f"
##
## $S4
    [1] "n" "m" "h" "b" "h" "z" "v" "r" "x" "i" "f" "c" "x" "o"
##
##
##
   $S5
##
        "w" "v" "j" "b" "c" "z" "t" "p" "h" "g" "s" "e" "b" "o" "k"
    [1]
##
## $S6
    [1] "e" "z" "k" "i" "v" "b" "i" "q" "j" "o" "a" "h" "p" "b" "n" "s"
```

Task 3.2: Compute the length for all pairwise intersects of the vectors stored in setlist. The intersects can be determined with the %in% function like this: sum(setlist[[1]] %in% setlist[[2]])

```
##
                                          S10 S11 S12 S13 S14 S15 S16 S17 S18 S19 S20
        S1 S2 S3 S4 S5
                           S6
                               S7
                                   S8
                                       S9
## S1
        10
             5
                 5
                         6
                             7
                                 3
                                     5
                                        6
                                             5
                                                   5
                                                       6
                                                             6
                                                                  6
                                                                       7
                                                                            9
                                                                                 7
                                                                                      5
                                                                                           6
                                                                                                8
##
   S2
          5
            11
                 6
                     5
                         6
                             9
                                 7
                                    5
                                        5
                                             4
                                                   6
                                                       5
                                                             7
                                                                  6
                                                                       5
                                                                            8
                                                                                 8
                                                                                      8
                                                                                           9
                                                                                                9
          5
                                                   7
                                                                       6
                                                                            7
                                                                                      6
                                                                                                8
##
   S3
             6 12
                     6
                         8
                             9
                                 5
                                     3
                                        9
                                             7
                                                       8
                                                             9
                                                                                 6
                                                                                           8
##
   S4
          6
             5
                 6 12
                         6
                             7
                                 5
                                    5
                                        8
                                             7
                                                  6
                                                       8
                                                             5
                                                                  6
                                                                       9
                                                                            9
                                                                                 9
                                                                                      6
                                                                                           6
                                                                                               10
          6
             6
                 8
                     6
                                 7
                                    7
                                                  9
                                                       8
                                                             8
                                                                  7
                                                                       8
                                                                           10
                                                                                           8
                                                                                                8
##
   S5
                        14
                            10
                                       10
                                             8
                                                                                10
                                                                                     10
##
   S6
          7
             9
                 9
                        10
                           14
                                 7
                                     6
                                        9
                                             5
                                                  8
                                                       8
                                                            8
                                                                  7
                                                                       6
                                                                            9
                                                                                10
                                                                                      9
                                                                                          10
                                                                                                9
             7
                                     6
                                             7
                                                  5
                                                       6
                                                             7
                                                                                      7
##
   S7
                 5
                               13
                                                                       7
                                                                            8
                                                                                 8
                                                                                           8
                                                                                                9
                 3
                         7
                             6
                                 6
                                        7
                                             7
                                                   4
                                                       7
                                                             7
                                                                  7
                                                                            7
                                                                                 9
                                                                                           9
                                                                                               12
##
   S8
          5
             5
                     5
                                   13
                                                                       8
                                                                                     10
##
   S9
          6
             5
                 9
                     8
                        10
                             9
                                 8
                                    7
                                       17
                                             9
                                                  8
                                                      12
                                                           10
                                                                  9
                                                                      11
                                                                           10
                                                                                10
                                                                                     10
                                                                                               12
          5
              4
                 7
                                 7
                                                  6
                                                       7
                                                                      10
                                                                                           9
                                                                                               12
## S10
                         8
                             5
                                    7
                                        9
                                            14
                                                           10
                                                                  8
                                                                            9
                                                                                 8
                                                                                      7
          5
## S11
             6
                 7
                             8
                                 5
                                        8
                                             6
                                                 13
                                                      10
                                                            8
                                                                  8
                                                                       9
                                                                            8
                                                                                11
                                                                                      8
                                                                                           8
                                                                                                8
          6
                                 6
                                             7
                                                                                           9
                                                                                               10
## S12
             5
                 8
                     8
                         8
                             8
                                    7 12
                                                 10
                                                      15
                                                           10
                                                                  9
                                                                      10
                                                                            8
                                                                                10
                                                                                      8
```

Task 3.3 Plot the resulting intersect matrix as heat map. The image or the heatmap.2 function from the gplots library can be used for this.





Exercise 4

Build your own R package

Task 4.1: Save one or more of your functions to a file called script.R and build the package with the package.skeleton function.

```
package.skeleton(name="mypackage", code_files=c("script1.R"), namespace=TRUE)
```

Task 4.2: Build tarball of the package

```
system("R CMD build mypackage")
```

Task 4.3: Install and use package

```
install.packages("mypackage_1.0.tar.gz", repos=NULL, type="source")
library(mypackage)
?myMAcomp # Opens help for function defined by mypackage
```

Homework 5

Reverse and complement of DNA

Task 1: Write a RevComp function that returns the reverse and complement of a DNA sequence string. Include an argument that will allow to return only the reversed sequence, the complemented sequence or the reversed and complemented sequence. The following R functions will be useful for the implementation:

```
x <- c("ATGCATTGGACGTTAG")
x
## [1] "ATGCATTGGACGTTAG"

x <- substring(x, 1:nchar(x), 1:nchar(x))
x
## [1] "A" "T" "G" "C" "A" "T" "T" "G" "G" "A" "C" "G" "T" "T" "A" "G"

x <- rev(x)
x
## [1] "G" "A" "T" "T" "G" "C" "A" "G" "G" "T" "T" "A" "C" "G" "T" "A"

x <- paste(x, collapse="")
x
## [1] "GATTGCAGGTTACGTA"
chartr("ATGC", "TACG", x)</pre>
## [1] "CTAACGTCCAATGCAT"
```

Task 2: Write a function that applies the RevComp function to many sequences stored in a vector.

Translate DNA into Protein

Task 3: Write a function that will translate one or many DNA sequences in all three reading frames into proteins. The following commands will simplify this task:

```
AAdf <- read.table(file="http://faculty.ucr.edu/~tgirke/Documents/R_BioCond/My_R_Scripts/AA.txt", heade
AAdf [1:4,]
    Codon AA_1 AA_3 AA_Full AntiCodon
##
## 1
      TCA
            S Ser Serine
## 2
      TCG
            S
                    Serine
                                CGA
               Ser
## 3
      TCC
            S
               Ser
                    Serine
                                GGA
## 4
      TCT
            S Ser Serine
                                AGA
AAv <- as.character(AAdf[,2])
names(AAv) <- AAdf[,1]</pre>
AAv
## TCA TCG TCC TCT TTT TTC TTA TTG TAT TAC TAA TAG TGT TGC TGA TGG CTA CTG CTC CTT CCA CCG CCC CCT CAT
## CAC CAA CAG CGA CGG CGC CGT ATT ATC ATA ATG ACA ACG ACC ACT AAT AAC AAA AAG AGT AGC AGA AGG GTA GTG
## "H" "Q" "Q" "R" "R" "R" "R" "I" "I" "I" "I" "T" "T" "T" "T" "N" "N" "K" "K" "S" "S" "R" "R" "V"
## GTC GTT GCA GCG GCC GCT GAT GAC GAA GAG GGA GGG GGC GGT
## "V" "V" "A" "A" "A" "D" "D" "E" "E" "G" "G" "G" "G"
y \leftarrow gsub("(...)", "\1_", x)
y <- unlist(strsplit(y, "_"))</pre>
y <- y[grep("^{...}, y)]
AAv[y]
## GAT TGC AGG TTA CGT
## "D" "C" "R" "I." "R"
```

Homework submission

Submit the 3 functions in one well structured and annotated R script to the instructor. The script should include instructions on how to use the functions.

Due date

This homework is due on Thu, April 27th at 6:00 PM.

Homework Solutions

To be added after due date.

Session Info

sessionInfo()

```
## R version 3.3.3 (2017-03-06)
## Platform: x86_64-pc-linux-gnu (64-bit)
## Running under: Ubuntu 14.04.5 LTS
##
## locale:
##
   [1] LC_CTYPE=en_US.UTF-8
                                   LC_NUMERIC=C
                                                              LC_TIME=en_US.UTF-8
   [4] LC_COLLATE=en_US.UTF-8
                                   LC_MONETARY=en_US.UTF-8
                                                              LC_MESSAGES=en_US.UTF-8
   [7] LC_PAPER=en_US.UTF-8
                                                              LC_ADDRESS=C
                                   LC_NAME=C
## [10] LC_TELEPHONE=C
                                   LC_MEASUREMENT=en_US.UTF-8 LC_IDENTIFICATION=C
##
## attached base packages:
## [1] stats
                graphics utils
                                     datasets grDevices base
## other attached packages:
## [1] ggplot2 2.1.0 limma 3.30.0
                                       BiocStyle 2.2.0
##
## loaded via a namespace (and not attached):
  [1] Rcpp_0.12.7
                         codetools_0.2-15 digest_0.6.10
                                                           assertthat_0.1
                                                                            plyr_1.8.4
   [6] grid_3.3.3
                         gtable_0.2.0
                                          formatR_1.4
                                                                            scales_0.4.0
                                                           magrittr_1.5
## [11] evaluate_0.10
                         stringi_1.1.2
                                          rmarkdown_1.1
                                                           tools_3.3.3
                                                                            stringr_1.1.0
## [16] munsell_0.4.3
                         yaml_2.1.13
                                          colorspace_1.2-7 htmltools_0.3.5 knitr_1.14
## [21] methods_3.3.3
                         tibble_1.2
```

References

Gentleman, Robert. 2008. R Programming for Bioinformatics (Chapman & Hall/CRC Computer Science & Data Analysis). 1 edition. Chapman; Hall/CRC. http://www.amazon.com/Programming-Bioinformatics-Chapman-Computer-Analysis/dp/1420063677.