Data Analysis with R (1)

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R as a scientific calculator

Any spaces between identifiers seem meaningless, yet putting in proper rhythm, they will improve simplicity, consistency, and aesthetic.

Do not divide any meaningful identifier

```
> 1 + 2 + 3 + 4 + 5 + 6 +7 + 8 + 9 + 1 0
Error: <text>:1:38: unexpected numeric constant
1: 1 + 2 + 3 + 4 + 5 + 6 +7 + 8 + 9 + 1 0
```

```
> s in(30)

Error: <text>:1:3: unexpected 'in'
1: s in
```

Symbols in this slide

- > : R의 명령 프롬프트
- \$: 유닉스, 리눅스 계열 운영체제에서 bash 터미널의 명령 프롬프트
- +: 윗 행과 이어지는 행
- # : 주석

We can guess what the following functions mean

```
> exp(1)
[1] 2.718282
> log(10)
[1] 2.302585
> sin(30)
[1] -0.9880316
> sqrt(2)
[1] 1.414214
> 2^5
[1] 32
```

exponential function: e^1

> exp(1)
[1] 2.718282

natural logarithmic function: log_e 10

> log(10) [1] 2.302585

square-root function: $\sqrt{2}$

> sqrt(2) [1] 1.414214

power operator: $2^5 = 2 \times 2 \times 2 \times 2 \times 2$

> 2⁵

Basic arithmetic operators¹

Introduction

Operators	meaning	examples
+ X	0 + <i>x</i>	+ 3.14 = +3.14
- X	0-x	- 90 = -90
x + y	x + y	0.5 + 8.1 = 8.6
x - y	x - y	3.14 - 0.02 = 3.12
x * y	$x \times y$	12 * 30 = 360
x / y	x/y	7 / 3 = 2.333333
x ^ y	x to the power y	4 ^ 3 = 64
x %% y	modulus of x/y	7 % 3 = 1
x %/% y	integer division of x/y	7 %/% 3 = 2

 $^{^1 \}verb|"list of R operators": \verb|https://www.statmethods.net/management/operators.html|$



Relational and Logical operators (functions)²

Introduction

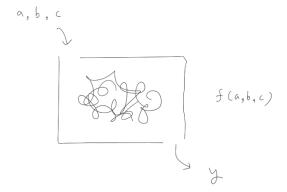
Operators	meaning	examples	yield
x < y		3 < 5	TRUE
x > y		5 < 3	FALSE
x <= y		3 <= 3	TRUE
x >= y		5 >= 7	FALSE
x == y	Does x equal to y?	32 == 32.1	FALSE
x != y	Does NOT x equal to y?	32 != 32.1	TRUE
! x	Not x	! (pi != 3.14)	FALSE
		! 0	TRUE
x & y	logical AND operator	TRUE & TRUE	TRUE
		1 & 4	TRUE
		4 & 0	FALSE
x y	logical OR operator	TRUE FALSE	TRUE
		1 0	TRUE
isTRUE (x)		isTRUE(5 < 3)	FALSE
isFALSE(x)		isFALSE(5 < 3)	TRUE

 $^{^2\}mbox{In logical operation, TRUE corresponds to 1 or any value other than 0 while FALSE only to 0.$



Functions

A function receives 0, or 1, or more parameters but always yields a single output.



Function	no. of Parameter(s)	performs
log(x)	1	log _e x
log(x, base = y)	2	log _v x
exp(x)	1	e ^x
c(x, y, z,)	any greater than 0	concatenate parameters and make them up a single vector
sin(x), $cos(x)$, $tan(x)$	1	obvious trigonometric functions
load(x)	1	load R dataset named "x"
read.table(x,)	1 or many	read text file "x" and make it up to a data.frame according to parameters
x:y	2	generate a vector starting from x to y by 1
seq(from, to (, by))	2 or 3	generate a vector starting from from to to (by by)
seq(x)	1	generate a vector starting from 1 to x by 1 (or -1)
rep(what, how.long)	2	generate a vector of how.long -repetition of what .
		But, when x is a vertor (whose length is greater than 1), the output will be somewhat complex.

Look in Google by "basic R functions list," then you will find https://cran.r-project.org/doc/contrib/Short-refcard.pdf



Major statistical functions

Function	no. of Parameter(s)	performs
t.test(x1, x2)	2 vectors in x1 and x2	Welch-Satterthwaite modification of t-test
$t.test(y \sim x)$	1 (meaning "y is ex- plained by x")	same as above
t.test(x1, x2, var.equal = TRUE)	3 (2 vectors and 1 flag)	Standard t-test
t.test(x1, x2, paired = TRUE)	3 (2 vectors and 1 flag)	Paired t-test
chisq.test(x)	1 (matrix x as a table)	Pearson's X ² -test
$aov(y \sim x1 + x2 +)$	1 (meaning "y is ex-	analysis of variance (ANOVA) for y as depe
	plaiend by a series of	dent variable and x1 , x2 , as independe
	xs")	variable(s)
anova(m)	1	generate ANOVA table for a model m
fisher.test(x)	1 (matrix x as a table)	Fisher's exact test
wilcox.test(x1, x2)	2 vectors in x1 and x2	Wilcoxon's rank sum test

For deeper understanding, read built-in manual of functions in R: Try like "?t.test" after the R prompt.

Data type

Туре	examples	query
Numeric number	0, 4, -3.14, 1.4141	is.numeric(x)
Logical	TRUE, FALSE	is.logical(x)
Character string	"abcde", "Korea", "R programming is easy.",	is.character(x)
	"male/female"	
Factor	inappropriate	is.factor(x)

> is.numeric(3.14)
[1] TRUE
> is.logical(TRUE)
[1] TRUE
> is.character(754)
[1] FALSE
> is.character("Tigers are not afraid.")
[1] TRUE

> is.factor(TRUE)
[1] FALSE
> is.factor(365)
[1] FALSE
> is.factor("male")
[1] FALSE

Characters are just characters, never be a candidate for arithmetic operations.

```
> "Tigers" + "Lions"

Error in "Tigers" + "Lions": non-numeric argument to binary operator
> # paste() function pastes (or concatenates) a series of characters.
> paste("Tigers", "Lions")
[1] "Tigers Lions"
> # strsplit() function splits a character into several characters.
> strsplit("Tigers are not afraid.", split = " ")
[[1]]
[[1]] "Tigers" "are" "not" "afraid."
```

Factor, one extraordinary atomic data type.

- R factor has a name, called "label."
- But, It works by its "levels."

```
> gender <- c("M", "F")
> is.factor(gender)
[1] FALSE
> is.character(gender)
[1] TRUE
> fGender <- factor(gender)

[1] M F
Levels: F M
> is.factor(fGender)
[1] TRUE
```

No arithmetic/manupulative functions work for R Factors.

Factors are declared names for specific purposes.

```
> fGender[1]
[1] M
Levels: F M
> fGender[1] + fGender[2]
Warning in Ops.factor(fGender[1], fGender[2]): '+' not meaningful for factors

[1] NA
> # factor-pasting produces a character
> p <- paste(fGender[2], fGender[2])
> is.factor(p)
[1] FALSE
> is.character(p)
[1] TRUE
```

Data structure

- Vector
- Matrix
- List
- Data Frame

Vectors

Vectors are the R workhorse³.

Vectors

```
> x <- 8
> X
[1] 8
> x <- c(2, 5, -3, 7)
> X
[1] 2 5 -3 7
> length(x)
[1] 4
> y <- c("abc", "de", "f")
> y
[1] "abc" "de" "f"
> length(y)
[1] 3
> z <- c(1, 3, 5, "k")
> typeof(z)
[1] "character"
```



Indexing a vector

```
> x <- c(2, 5, -3, 7)
> x[2]
[1] 5
> y <- c("The", "art", "of", "R", "programming")
> length(y)
[1] 5
> y[3]
[1] "of"
> y[c(1, 3)]
[1] "The" "of"
> y[2:4]
[1] "artt" "of" "R"
> (x[2] + x[1]) / x[4]
[1] 1
```

A matrix is an 2-dimensional vector.

Vectors

```
> x < -c(2, 5, -3, 7)
> y <- matrix(x, ncol = 2) # no. of columns
> y
    [,1] [,2]
[1,] 2 -3
[2,] 5 7
> z <- matrix(1:12, ncol = 4, byrow = TRUE) # fill the matrix by row-first order
> 7
    [,1] [,2] [,3] [,4]
[1,] 1 2 3 4
[2,] 5 6 7 8
[3.] 9 10 11 12
> x <- c(2, 5, -3, "7") # type of x is coerced to "character"
> (y <- matrix(x, ncol = 2))
    [,1] [,2]
[1.] "2" "-3"
[2.1 "5" "7"
> typeof(y)
[1] "character"
```

Vector operations

```
> x <- c(2, 5, -3, 7)

> x + 1

[1] 3 6 -2 8

> x / 3

[1] 0.6666667 1.6666667 -1.00000000 2.33333333

> y1 <- seq(0, 360, 10) # from 0 to 360 by 10

> y1

[1] 0 10 20 30 40 50 60 70 80 90 100 110 120 130 140 150 160

[18] 170 180 190 200 210 220 230 240 250 260 270 280 290 300 310 320 330

[35] 340 350 360

> y2 <- y1 * pi / 180
```

> y2
[1] 0.0000000 0.1745329 0.3490659 0.5235988 0.6981317 0.8726646 1.0471976
[8] 1.2217305 1.3962634 1.5707963 1.7453293 1.9198622 2.0943951 2.26889280
[15] 2.4434610 2.6179939 2.7925268 2.9676597 3.1415927 3.3161256 3.4906585
[22] 3.6651914 3.8397244 4.0142573 4.1887902 4.3633231 4.5378561 4.7123890
[29] 4.8869219 5.0614548 5.2359878 5.4105207 5.5850536 5.7595865 5.9341195
[36] 6.1086524 6.2831853
> (y3 <- sin(y2))
[1] 0.000000e+00 1.736482e-01 3.420201e-01 5.000000e-01 6.427876e-01
[6] 7.660444e-01 8.660254e-01 9.396926e-01 9.848078e-01 1.000000e+00
[11] 9.848078e-01 9.396926e-01 8.660254e-01 7.660444e-01 6.427876e-01
[6] 5.000000e-01 3.420201e-01 1.736482e-01 7.660444e-01 8.660254e-01
[21] -3.420201e-01 -5.000000e-01 -6.427876e-01 -7.660444e-01 -8.660254e-01
[22] -3.96926e-01 -9.848078e-01 -1.000000e+00 -9.848078e-01 -9.396926e-01
[23] -8.660254e-01 -9.848078e-01 -7.660444e-01 -8.660254e-01

Vectors

[36] -1.736482e-01 -2.449294e-16

Column-Combination of vectors

```
> yy <- cbind(y1, y3) # cbind() binds vectors by columns
> head(yy) # function head() displays first 10 values.
    y1 y3
[1.] 0 0.0000000
[2,] 10 0.1736482
[3,] 20 0.3420201
[4.1 30 0.5000000
[5.1 40 0.6427876
[6.1 50 0.7660444
> yy[3, 1]
y1
20
> yy[4, 2]
у3
0.5
> is.matrix(yy)
[1] TRUE
> is.matrix(yy[4, 2])
[1] FALSE
```

	(5	
Function	no. of Parameter(s)	performs
log(x)	1	log _e x
log(x, base = y)	2	log _v x
exp(x)	1	e ^x
c(x, y, z,)	any greater than 0	concatenate parameters and make them up
-		a single vector
sin(x), $cos(x)$, $tan(x)$	1	obvious trigonometric functions
load(x)	1	load R dataset named "x"
read.table(x,)	1 or many	read text file "x" and make it up to a
		data.frame according to parameters
x:y	2	generate a vector starting from x to y by 1
seq(from, to (, by))	2 or 3	generate a vector starting from from to to (by by)
seq(x)	1	generate a vector starting from 1 to x by 1 (or -1)
rep(what, how.long)	2	generate a vector of how.long -repetition of what .
		But, when x is a vertor (whose length is greater than 1), the output will be somewhat complex.

These 4 functions are automatic vector-generator most commonly used.

x:y generates a vector that is incremental or decremental by 1

```
> 1:5; -1:-5
[1] 1 2 3 4 5
[1] -1 -2 -3 -4 -5
> 1:-7
[1] 1 0 -1 -2 -3 -4 -5 -6 -7
> 1:10 * 100
[1] 100 200 300 400 500 600 700 800 900 1000
> 1:10 / 2; 1:(10 / 2)
[1] 0.5 1.0 1.5 2.0 2.5 3.0 3.5 4.0 4.5 5.0
[1] 1 2 3 4 5
> 1:9.5
[1] 1 2 3 4 5 6 7 8 9
> 0.5:14
[1] 0.5 1.5 2.5 3.5 4.5 5.5 6.5 7.5 8.5 9.5 10.5 11.5 12.5 13.5
```

seq() generates a vector having a typical sequence.

```
> seq(1, 10) # from 1 to 10 by 1
[1] 1 2 3 4 5 6 7 8 9 10
> seq(1, 10, 2) # from 1 to 10 by 2
[1] 1 3 5 7 9
> # same result with full inserting full parameter names
> seq(from = 1, to = 10, by = 2)
[1] 1 3 5 7 9
> seq(1, 10, length = 3) # from 1 to 10 in a vector whose length is 3.
[1] 1.0 5.5 10.0
> seq(9) # same as 1:9
[1] 1 2 3 4 5 6 7 8 9
```

rep() generates a vector having a pattern.

Vectors

Lists

A list is a container for any values, any different types.

```
> x <- list(a = 3, b = "abc", d = TRUE)
> x
$a
[1] 3

$b
[1] "abc"

$d
[1] TRUE
> typeof(x)
[1] "list"
> x1 <- rnorm(20, 92)
> x2 <- rnorm(20, 80)
> 0 <- t.test(x1, x2)
> typeof(o)
[1] "list"
```

```
> print(o)

Welch Two Sample t-test

data: x1 and x2
t = 39.619, df = 35.97, p-value < 2.2e-16
alternative hypothesis: true difference in means is not equal to 0
95 percent confidence interval:
11.23017 12.44197
sample estimates:
mean of x mean of y y
91.92881 80.09274
```

> str(o) # DO NOT RUN

```
> Z
    [,1] [,2] [,3] [,4]
[1.] 1
         2
[2,] 5 6 7
[3,] 9 10 11 12
> dim(z)
[1] 3 4
> dimnames(z) <- list(c("r1", "r2", "r3"), c("c1", "c2", "c3", "c4"))</pre>
> Z
c1 c2 c3 c4
r1 1 2 3 4
r2 5 6 7 8
r3 9 10 11 12
> z[2, 3] == z["r2", "c3"]
[1] TRUE
```

Indexing and extracting components out of a list

```
> dbPersonal <- list(math = "A", biology = "B", literature = "A", height = 1.7, weight = 72)</pre>
> dbPersonal
$math
[1] "A"
$biology
[1] "B"
$literature
[1] "A"
$height
[1] 1.7
$weight
[1] 72
> dbPersonal$height
[1] 1.7
> dbPersonal$weight
[1] 72
```

```
Lists
```

```
> dbPersonal$bmi <- dbPersonal$weight / dbPersonal$height ^ 2
> round(dbPersonal$bmi, 1)
[1] 24.9
> dbPersonal$calcBmi <- function(w, h) round(w / h ^ 2, 2)</pre>
> dhPersonal
$math
[1] "A"
$biology
[1] "B"
$literature
[1] "A"
$height
[1] 1.7
$weight
[1] 72
$bmi
[1] 24.91349
$calcBmi
function (w, h)
round(w/h^2, 2)
> dbPersonal$calcBmi(w = dbPersonal$weight. h = dbPersonal$height)
[1] 24.91
```

Vector-vector arithmetic

```
> a <- c(1, 3, 4, 2, 9, 8)
> a
[1] 1 3 4 2 9 8
> a + 2
[1] 3 5 6 4 11 10
> b <- c(1, 2)
> a / b
[1] 1.0 1.5 4.0 1.0 9.0 4.0
```

Data frames

Data frames are a core dataset consisting of grid-type arrangement.

```
> Diet <- data.frame(
      subject = 1:16,
   baseline = c(159, 93, 130, 174, 148, 148, 85, 180,
       92. 89. 204. 182. 110. 88. 134. 84).
   final = c(194, 122, 158, 154, 93, 90, 101, 99,
       183, 82, 100, 104, 72, 108, 110, 81))
> Diet
   subject baseline final
                159
                      194
                 93
                      122
                130
                      158
                174
                      154
                148
                      93
                148
                       90
                 85
                      101
                180
                       99
                 92
                      183
10
        10
                 89
                      82
11
        11
                204
                      100
12
        12
                182
                      104
        13
                      72
13
                110
14
        14
                 88
                      108
15
        15
                134
                      110
16
        16
                 84
                       81
```

Data frames

subject	baseline	final
1	159	194
2	93	122
3	130	158
4	174	154
5	148	93
6	148	90
7	85	101
8	180	99
9	92	183
10	89	82
11	204	100
12	182	104
13	110	72
14	88	108
15	134	110
16	84	81

In a sense, data frames are a simple subtype of the 'lists' in R.

```
> str(Diet)
'data.frame': 16 obs. of 3 variables:
$ subject : int 1 2 3 4 5 6 7 8 9 10 ...
$ baseline: num 159 93 130 174 148 148 85 180 92 89 ...
$ final : num 194 122 158 154 93 90 101 99 183 82 ...
> Diet$subject
[1] 1 2 3 4 5 6 7 8 9 10 11 12 13 14 15 16
> Diet$baseline[1:4]
[1] 159 93 130 174
> Diet$final - Diet$baseline
[1] 35 29 28 -20 -55 -58 16 -81 91 -7 -104 -78 -38 20
[15] -24 -3
> is.numeric(Diet$subject)
[1] TRUE
> Diet$subject <- factor(Diet$subject)
> is.factor(Diet$subject)
[1] TRUE
```

Conditional statesments

'if ()'

if (conditions) {statements} else {statements}

```
> if (a < b)
+    print("b is greater than a.")
+ # Errors 1
+ if (a < b)
+    print("b is greater than a.")
+ else
+    print("b is not greater than a.")

Error: <text>:6:1: unexpected 'else'
5:    print("b is greater than a.")
6: else
```

```
> # Errors 2
+ if (a < b) {
+          print("b is greater than a.")
+ }
+ else
+ print("b is not greater than a.")

Error: <text>:5:1: unexpected 'else'
4:     }
5: else
^
```

```
> # Errors 3
+ if (a < b) {
+    print("b is greater than a.")
+  }
+ else {
+    print("b is not greater than a.")
+  }

Error: <text>:5:1: unexpected 'else'
4:  }
5: else
^
```

```
> # No errors
> if (a < b) {
+    print("b is greater than a.")
+ } else
+ print("b is not greater than a.")
[1] "b is greater than a."</pre>
```

```
> # Errors
+ if (a < b) print("b is greater than a.")
+ else print("b is not greater than a.")
+

Error: <text>:3:5: unexpected 'else'
2: if (a < b) print("b is greater than a.")
3: else</pre>
```

```
> # No Errors
> if (a < b) print("b is greater than a.") else print("b is not greater than a.")
[1] "b is greater than a."</pre>
```

```
X if (conditions) {statement}
  else {statement}
O if (conditions) {statement} else {statement}
```

청소년(나이 18세 미만)의 입장요금은 7000원이고 노인(만 65세부터)의 입장요금은 7000원, 보통 성인의 입장요금은 15000원인 공원에서 나이를 age 변수에 입력했을 때 입장료를 출력하는 R 구문을 작성하라.

```
> age <- 65
> if (age < 18 | age >= 65) print(7000) else print(15000)
[1] 7000
```

```
> age <- 43
> price <- if (age < 18 | age >= 65) 7000 else 15000
> price
[1] 15000
> # same output with less intuitive (but stout) approach
```

> price <- ifelse(age < 18, 7000, ifelse(age >= 65, 7000, 15000))

Vector operators: ifelse()

if () ... else ... statement can accept only one length of a vector, while ifelse() accepts all members in a vector.

```
> age <- c(10, 26, 60, 75)
> if (age < 18 | age >= 65) 7000 else 15000

Warning in if (age < 18 | age >= 65) 7000 else 15000: the condition has length > 1 and only the first element will be used

[1] 7000
> #
> ifelse (age < 18 | age >= 65, 7000, 15000)
[1] 7000 15000 15000 7000
```

Loops

for (indexer in range)

for (assign indexer to a range)

```
> s <- 0 
> for (i in 1:100) # for () loop runs by order of i = 1, 2, 3, 4, ... 100 
+ s <- s + i 
> print(s) 
[1] 5050
```

The R for () assigns how many times a loop runs with what indexer values at the head of the loop.

while (condition for entering a loop)

```
> s <- 0
> i <- 1
> while (i <= 100) { # while() loop runs only when i <= 100
+ s <- s + i
+ i <- i + 1
+ }
> print(s)
[1] 5050
```

The R while () assigns nothing about how many times a loop runs with what indexer values. It only verifies a condition at the first of the loop.

repeat

```
> s <- 0
> i <- 0
> repeat {
    i <- i + 1
    + s <- s + i
    + if (i == 100) break
    + }
> print(s)
[1] 5050
```

The R repeat assigns nothing about how many times a loop runs with what indexer values. It only repeats the loop. To exit the loop, you must provide an escape statement.

특정 자연수를 입력 받아서 1부터 그 자연수까지의 합을 구하되, 1부터 더해 나가지 않고 거꾸로 더해 나가는 R 코드를 세 가지 반복구문으로(loop) 만들라.

Loop in a loop

repeat

Loop can be nested in loops.

User-defined functions

Functions

A function receives 0, or 1, or more parameters but always yields a single output.

And you can make up a function as you want it to perform.

```
> age <- 43
> price <- if (age < 18 | age >= 65) 7000 else 15000
> price
[1] 15000
> calcPrice <- function(age) if (age < 18 | age >= 65) 7000 else 15000
> calcPrice(age = 20)
[1] 15000
> age <- c(8, 12, 35, 45, 78)
> cbind(age, calcPrice(age))
Warning in if (age < 18 | age >= 65) 7000 else 15000: the condition has length > 1 and only
the first element will be used
     age
[1.] 8 7000
[2,] 12 7000
[3,] 35 7000
[4,] 45 7000
[5.] 78 7000
> # if age < 0
```

Exercises

심폐우회로를 적용하는 심장수술에서 혈류량을 결정할 때 임상의사들은 환자의 체표면 적(body surface area)을 기준으로 한다. 체표면적은 측정할 수도 있지만 임상상황에 서는 측정하는 것이 사실상 불가능하여 근사식을 이용하여 얻게 되는데, 계산에 필요한 변수는 키와 체중이다. 키를 height 변수에 cm 단위로 넣고, 체중을 weight 변수에 kg 단위로 넣은 후 호출하면 체표면적을 되돌려 주는 함수 calcBSA(weight, height)를 작성하라. (Mosteller의 공식을 이용한다) 피보나치 수열은 단순 덧셈으로 이루어졌으면서 자연계에서 여러 응용사례를 들 수 있는 유용한 수열이다. 정의는 단순하다.

- 수열의 n번째 값은 n-1과 n-2의 합이다.
- ❷ 수열의 0번째 값은 0이고 1번째 값은 1이다.

다음을 수행하고 행 단위로 설명할 수 있다:

- 수행 1: 0부터 9까지, 즉 첫 10개의 피보나치 수열을 계산해서 벡터 F에 저장한 뒤 출력하는 R 코드를 만든다.
- 수행 2: 특정 숫자 n이 주어겼을 때 피보나치 수열의 n번째 값을 계산하는(구하는) 함수를 만들어서 함수 이름은 getFibonacci(n)으로 이름 붙인다.

Function that is calling itself

A function can call itself.

자연수 x가 주어졌을 때 1부터 x까지의 합을 구할 때 내장 함수를 쓰기도 했고 반복문을 쓰기도 했었다. 1부터 x까지 자연수의 합은 이렇게도 구할 수 있다. x에서 거꾸로 1을 빼어 나가면서 더하되 1이 되면 멈추는 방식이다. R로 코딩 할 수 있을까?

1, 2, 3, 4, ..., x의 합은 1, 2, 3, 4, ..., x - 1의 합에 x를 더한 값이다.

```
> mySummation <- function(x)
+ if (x > 1) x + mySummation(x - 1) else x
> #
> mySummation(x = 10)
[1] 55
```

- 코드의 효율을 다루지 않는다.
- 한글 문제는 다루지 않는다.
- 프로그래밍과 통계학은 다르다.