

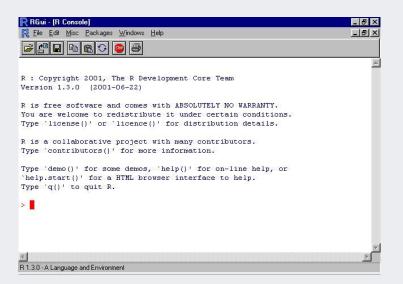
# Lecture 2: Introduction to R (Part I)

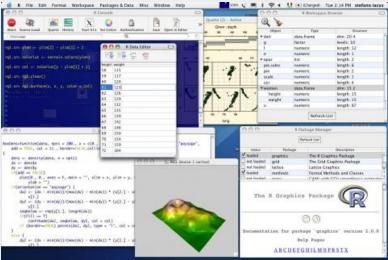
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School of Industrial Management Engineering
Korea University

# AGENDA

01	R Overview	
02	Handling Different Data Types	
03	Text Processing	

# History of (R)



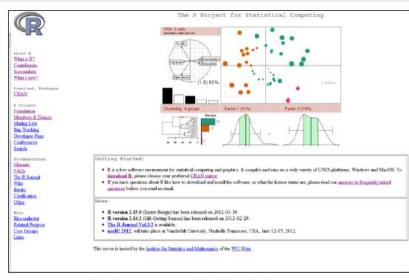


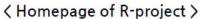
- R is an open source programming language and software environment for statistical computing and graphics
  - ✓ Created by Ross Ihaka and Robert Gentleman at the University of Auckland, New Zealand, and is currently developed by the R Development Core Team
  - ✓ Highly extensible through the use of user-submitted packages for specific functions or specific areas of study

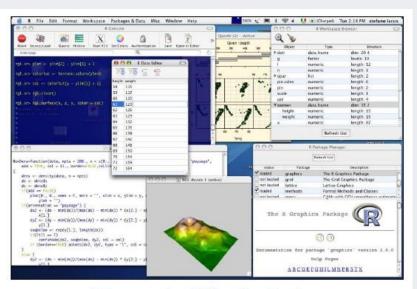
### The R Language

- R is an expression-based language
  - ✓ User type language <u>expressions</u> at the R prompt
  - ✓ These expressions are <u>evaluated</u> by the R <u>interpreter</u>
  - √ The computed values of the expressions are printed
- R is extensile
  - ✓ Users can implement new functionality in the form of functions
  - ✓ Developers can implement new <u>packages</u> of functionality that extends the base system

- Provides a wide variety of statistical techniques
- Free software under GNU public license, highly extensible
- Independent to OS:Windows, Linux, MacOS X, etc.

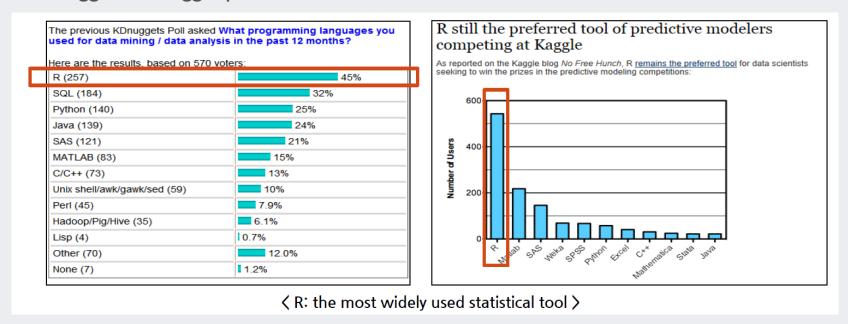






R screenshot: Visualization >

- Data analysis with R: new trend!
  - ✓ Many researchers now use R for their statistical analysis
  - √ Kdnuggets & Kaggle poll results

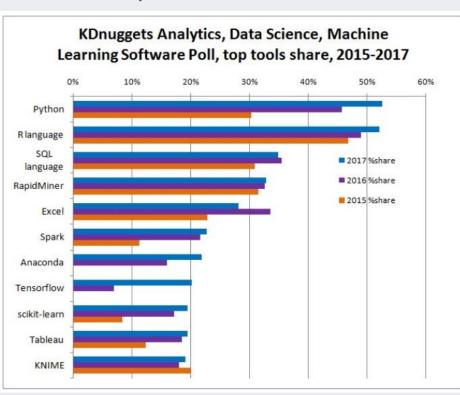


Collaboration among users: the reason why R is loved by a number of users



KNIME

- Data analysis with R: new trend!
  - √ Many researchers now use R for their statistical analysis



Tubic it isprinary and but the item to its in 2017 its in 880 to 1 on				
Tool	2017 % Usage	% change 2017 vs 2016	% alone	
Python	52.6%	15%	0.2%	
R language	52.1%	6.4%	3.3%	
SQL language	34.9%	-1.8%	0%	
RapidMiner	32.8%	0.7%	13.6%	
Excel	28.1%	-16%	0.1%	
Spark	22.7%	5.3%	0.2%	
Anaconda	21.8%	37%	0.8%	
Tensorflow	20.2%	195%	0%	
scikit-learn	19.5%	13%	0%	
Tableau	19.4%	5.0%	0.4%	

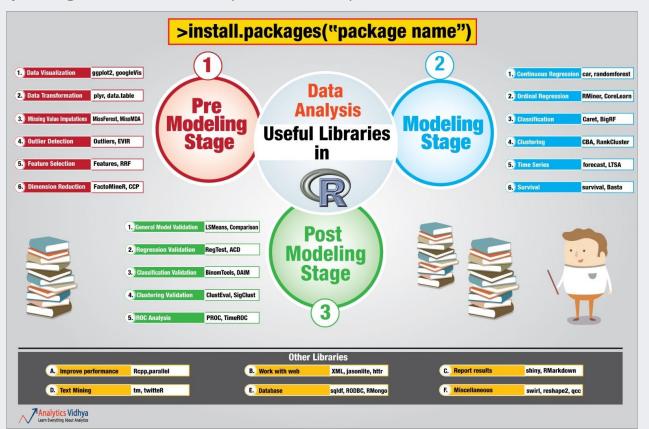
6.3%

Table 1: Top Analytics/Data Science Tools in 2017 KDnuggets Poll

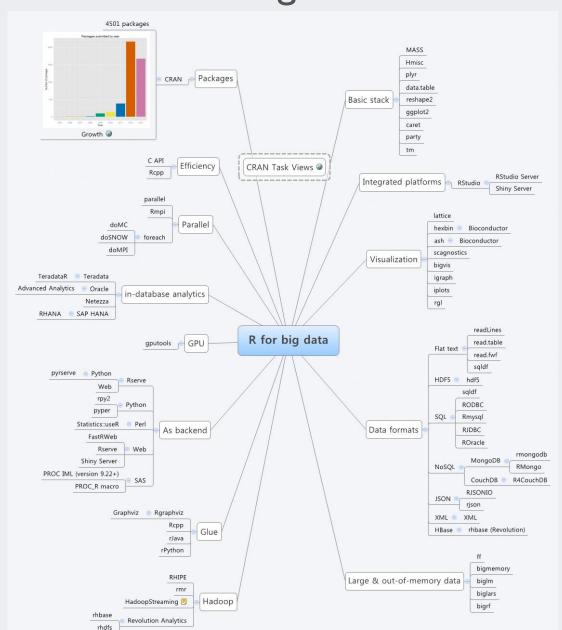
19.1%

2.4%

- R packages
  - ✓ Everyone can make, distribute, and use R packages
  - ✓ Almost every statistical analysis can be possible
  - √ 12,956 packages are available (2018. 08. 27)



## R for Big Data



http://www.r-bloggers.com/steppingup-to-big-data-with-r-and-python-amind-map-of-all-the-packages-youwill-ever-need/

### Install R

- For Windows
  - √ <a href="http://www.r-project.org">http://www.r-project.org</a>
  - ✓ Download 'R base' file: the latest version is 3.5.3 I for windows



[Home]

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CRAN

#### R Project

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### The R Project for Statistical Computing

### Getting Started

R is a free software environment for statistical computing and graphics. It compiles and runs on a wide variety of UNIX platforms, Windows and MacOS. To download R, please choose your preferred CRAN mirror.

If you have questions about R like how to download and install the software, or what the license terms are, please read our answers to frequently asked questions before you send an email.

#### News

- R version 3.3.3 (Another Canoe) prerelease versions will appear starting Friday 2017-02-24.
   Final release is scheduled for Monday 2017-03-06.
- useR! 2017 (July 4 7 in Brussels) has opened registration and more at http://user2017.brussels/
- Tomas Kalibera has joined the R core team.

### Install R

- For Windows
  - √ <a href="http://www.r-project.org">http://www.r-project.org</a>
  - ✓ Download 'R base' file: the latest version is 3.5.1 for windows

Korea

http://cran.nexr.com/

http://healthstat.snu.ac.kr/CRAN/

http://cran.biodisk.org/

NexR Corporation, Seoul

Graduate School of Public Health, Seoul National University, Seoul

The Genome Institute of UNIST (Ulsan National Institute of Science and Technology)

The Comprehensive R Archive Network

R for Windows

#### Download and Install R

Precompiled binary distributions of the base system and contributed packages, **Windows and Mac** users most likely want one of these versions of R:

- Download R for Linux
- Download R for (Mac) OS X
- Download R for Windows

R is part of many Linux distributions, you should check with your Linux package management system in addition to the link above.

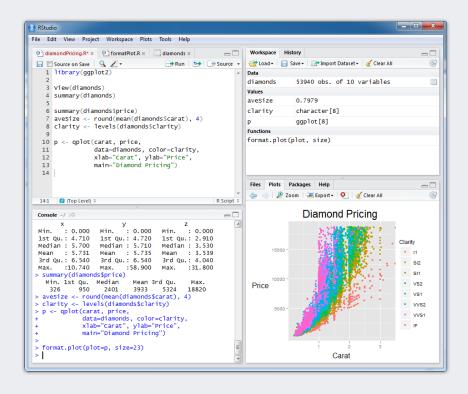
#### Subdirectories:

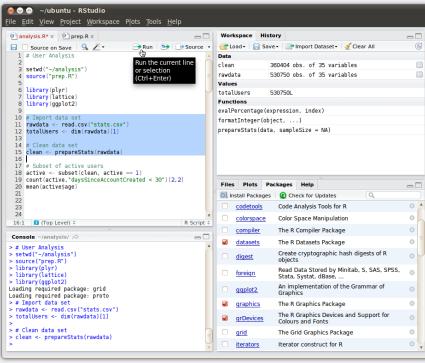
<u>base</u>	Binaries for base distribution (managed by Duncan Murdoch). This is what you want to install R for the first time.
<u>contrib</u>	Binaries of contributed CRAN packages (for R >= 2.11.x; managed by Uwe Ligges). There is also information on third party software available for CRAN Windows services and corresponding environment and make variables.
old contrib	Binaries of contributed CRAN packages for outdated versions of R (for R < 2.11.x; managed by Uwe Ligges).
Rtools	Tools to build R and R packages (managed by Duncan Murdoch). This is what you want to build your own packages on Windows, or to build R itself.

• RStudio



- ✓ A free and open source integrated development environment (IDE) for R
  - Available OS:Windows, Mac, or Linux
  - Can run it over the web using RStudio Server

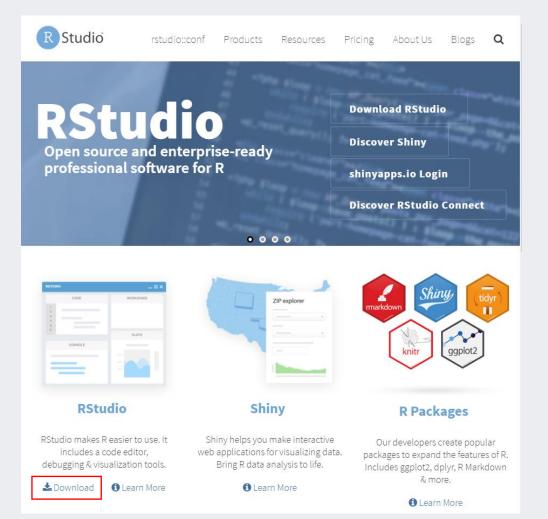




RStudio

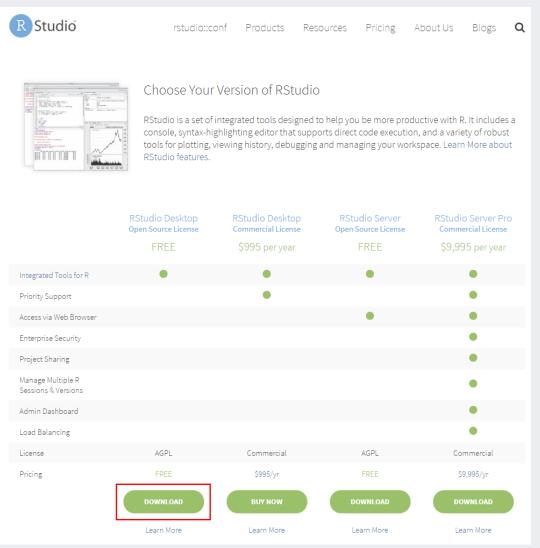


✓ https://www.rstudio.com/



### RStudio





### RStudio



#### RStudio Desktop 1.0.136 — Release Notes

RStudio requires R 2.11.1+. If you don't already have R, download it here.

#### **Installers for Supported Platforms**

Installers
RStudio 1.0.136 - Windows Vista/7/8/10
RStudio 1.0.136 - Mac OS X 10.6+ (64-bit)
RStudio 1.0.136 - Ubuntu 12.04+/Debian &+ (32-bit)
RStudio 1.0.136 - Ubuntu 12.04+/Debian &+ (64-bit)
RStudio 1.0.136 - Fedora 19+/RedHat 7+/openSUSE 13.1+ (32-bit)
RStudio 1.0.136 - Fedora 19+/RedHat 7+/openSUSE 13.1+ (64-bit)

Size	Date	MD5
81.9 MB	2016-12-21	93b3f307f567c33f7a4db4c114099b3e
71.2 MB	2016-12-21	12d6d6ade0203a2fcef6fe3dea65c1ae
85.5 MB	2016-12-21	0a.20fb89d8aa.eb39b329a640ddadd2c5
92.1 MB	2016-12-21	2a73b88a12a9fbaf96251cecf8b41340
84.7 MB	2016-12-21	fa.61 79a7855b f f Of 939a34c1 69da.45 f d
85.7 MB	2016-12-21	2b3a.148ded380b704e58496befb55545

#### Zip/Tarballs

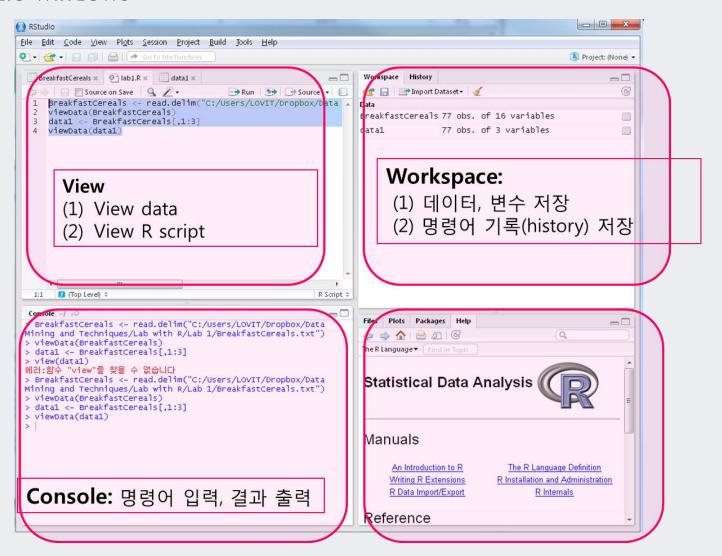
Zip/tar archives	Size	Date	MD5
RStudio 1.0.136 - Windows Vista/7/8/10	117.5 MB	2016-12-21	f415939bf5012c0ab127c7cfbc9600be
RStudio 1.0.136 - Ubuntu 12.04+/Debian 8+ (32-bit)	86.2 MB	2016-12-21	fca75f953dd425694b7fd4335bd29165
RStudio 1.0.136 - Ubuntu 12.04+/Debian 8+ (64-bit)	93.2 MB	2016-12-21	7c f0092653aa.44 fc 76325a8f 1325 fb1 f
RStudio 1.0.136 - Fedora 19+/RedHat 7+/openSUSE 13.1+ (32-bit)	85.4 MB	2016-12-21	30c89299d30ec03b38098e51e9bf49b8
RStudio 1.0.136 - Fedora 19+/RedHat 7+/openSUSE 13.1+ (64-bit)	86.6 MB	2016-12-21	ea.2a.262f 650e 92 f 568 f 48e dc 1 c 0939 02

#### **Source Code**

A tarball containing source code for RStudio v1.0.136 can be downloaded from here

### R Studio

R Studio windows



### The Three Sexy Skills of Data Geeks

- Statistics (Studying)
  - √ The most important skill and the hardest to learn
  - √ Deep and rigorous discipline and actively progressing
- Data Munging (Suffering)
  - ✓ The painful process of cleaning, parsing, and proofing one's data before it's suitable for analysis
  - √ Real world data is messy!!
- Visualization (Storytelling)
  - ✓ exploratory data visualizations: intended to facilitate a data analyst's understanding of the data
  - ✓ communicate to a wider audience, whose goal is to visually advocate for a hypothesis

# AGENDA

01	R Overview
02	Handling Different Data Types
03	Text Processing

### Data Types in R

Questions

```
✓ QI:Are all variables homogeneous?
```

✓ Q2: Are there more than one record?

Attribute\No. Records	I	>= 2
Homogeneous	Vector	Matrix or Array
Heterogeneous	List	Dataframe

• Dataframe makes R powerful to analyze heterogeneous multivariate data

## Data Types in R

Scalar Vector List Matrix Array Factor Data.frame

- Vector
  - √ Vectors are homogeneous
    - All elements in a vector should be the same mode
  - √ Vector has an index for each element
    - A set of indices returns the corresponding sub-vector
    - Index starts from I (python: 0)
  - ✓ The elements of a vector can have its own name
  - ✓ Vectors in R is a column-wise vectors

```
1 * # Part 1-1: Data Handling (Vector)
 3 # Assign values to the vector A & B
  A \leftarrow c(1,2,3)
   B < -c(1, "A", 0.5)
 7 # Check the mode
 8 mode(A)
   mode(B)
10
11 # Select a subset of vector
12 A[1]
13 A[2:3]
14 A[c(2,3)]
15
16 # Assign names
17 names(A)
18 names(A) <- c("First", "Second", "Third")</pre>
19
20 # call by index or name
21 A[1]
22 A["First"]
```

- Vector initiation
  - ✓ Do not have to initiate → creation and value assignment are done at the same time
    - a <- 3: create a vector named 'a' and assign the value 3 to it</p>
- Add elements to an existing vector
  - √ The size of a vector is fixed when it is created
  - ✓ We have to recreate the vector if we want to add or remove some elements

```
24 # Data Handling: Vector

25 x <- c(1,2,3,4)

26 x

27 x <- c(x[1:3], 10, x[4])

28 x

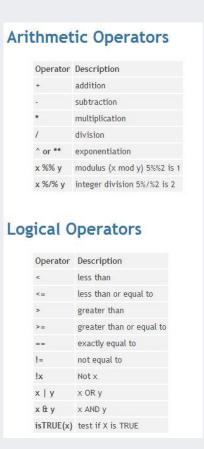
29 length(x)
```

#### Vector reuse

✓ When R conduct an operation with two vectors, the shorter vector is reused to
avoid an error

```
> c(1,2,4) + c(10,11,12,13,14)
[1] 11 13 16 14 16
Warning message:
In c(1, 2, 4) + c(10, 11, 12, 13, 14) :
   longer object length is not a multiple of shorter object length
```

### √ Column-first



- Vector operations are element-wise
- Vector indexing
  - ✓ Extract a subset of vectors
  - √ Index can be used redundantly
  - √ A negative index is used to remove the corresponding element

```
Console ~/ 🖒
                        Console ~/ 🖒
> x < -c(1,2,3)
                       > y <- c(10,20,30,40,50)
> y <- c(10,20,30)
                       > y[c(1,3)]
                       [1] 10 30
> X+Y
[1] 11 22 33
                       > y[2:3]
                       [1] 20 30
> x*y
[1] 10 40 90
                       > v <- 2:3
                       > v[v]
> x%%y
                       [1] 20 30
[1] 1 2 3
```



- Creating vectors with operators
  - ✓: operator: create vectors with certain range
  - ✓ seq: a generalized version of ":" operator
  - ✓ rep: repeat values

#### Operator Syntax and Precedence Description Outlines R syntax and gives the precedence of operators. The following unary and binary operators are defined. They are listed in precedence groups, from highest to lowest. access variables in a namespace \$ @ component / slot extraction 11 1 indexing exponentiation (right to left) unary minus and plus sequence operator %anv% special operators (including %% and %/%) multiply, divide (binary) add, subtract ! = ordering and comparison negation 33 3 and as in formulae rightwards assignment assignment (right to left) assignment (right to left) help (unary and binary)

- Apply conditions for each element in a vector
  - ✓ any() function: return TRUE if at least one of the elements satisfies the condiditon
  - ✓ all() function: return TRUE only when all elements satisfy the condition
- NA vs NULL
  - ✓ NA (Not Available): Some value exists but we cannot exactly know the value
  - ✓ NULL: Physically not exist

```
Console ~/ \Leftrightarrow

> x <- 1:10

> x > 8

[1] FALSE FALSE FALSE FALSE FALSE FALSE FALSE TRUE TRUE

> any(x > 8)

[1] TRUE

> any(x > 20)

[1] FALSE

> all(x > 8)

[1] FALSE

> all(x > 0)

[1] TRUE

>
```

- Filtering: Extract the element that satisfy a given condition
  - ✓ Directly extract from index
  - √ subset(): return the values that satisfy the condition
  - √ which(): return the indices that satisfy the condition

```
> x <- c(10,20,NA,40,50)
> x[x>20]
[1] NA 40 50
> subset(x, x>20)
[1] 40 50
> which(x>20)
[1] 4 5
```

Scalar Vector List Matrix Array Factor Data.frame

- Lists are heterogeneous
  - ✓ Element in a list can have different modes
  - ✓ List can have other structured object such as dataframe as its element
- Elements in a list are referred by their index
- Elements in a list can have their names

- Creating a list
  - √ Use list() or vector() function
    - Element names can be assigned using tags

```
Console ~/ 🖒
Console ~/ 🖒
                                                           Console ~/ 🖒
                                                                                              > C <- vector(mode="list")
> A <- list(name="Kang", salary = 10000, union = TRUE)
                                                          > B <- list("Kang", 10000, TRUE)
                                                                                               > C[["name"]] <- "Kang"
                                                          > B
> A
                                                                                              > C[["salary"]] <- 10000
                                                          [[1]]
$name
                                                                                              > C[["union"]] <- TRUE
[1] "Kang"
                                                          [1] "Kang"
                                                                                               > C
                                                                                               $name
$salary
                                                          [[2]]
                                                                                               [1] "Kang"
[1] 10000
                                                          [1] 10000
                                                                                               $salary
$union
                                                          [[3]]
                                                                                               [1] 10000
[1] TRUE
                                                          [1] TRUE
                                                                                               Sunion
> A$name
                                                          > B[[1]]
                                                                                               [1] TRUE
[1] "Kang"
                                                          [1] "Kang"
                                                          >
```

- List operations
  - √ List indexing
    - Three ways of accessing the elements in a list
    - list\$element\_name, list[["element\_name"]], list[[element's index]]
    - A list is returned if [] is used
  - ✓ Add/remove element in a list
    - Add: use a new name
    - Remove: use NULL

```
Console ~/ A

> C$name
[1] "Kang"

> C[["name"]]
[1] "Kang"

> C[[1]]
[1] "Kang"

> |
```

```
Console ~/ \Leftrightarrow
> C$office <- "frontier"
> C
$name
[1] "Kang"

$salary
[1] 10000

$union
[1] TRUE

$office
[1] "frontier"
```

```
Console ~/ 🖘

> C$salary <- NULL

> C
$name
[1] "Kang"

$union
[1] TRUE

$office
[1] "frontier"
```

- List operations (cont')
  - ✓ Unlist returns a vector with a single mode values

```
Console ~/ 📣
> tmplist <- list(a = list(1:5, c("a", "b", "c")), b = "Z", c = NA)
> tmplist
$a
$a[[1]]
[1] 1 2 3 4 5
$a[[2]]
[1] "a" "b" "c"
$b
[1] "z"
$c
[1] NA
> unlist(tmplist)
a1 a2 a3 a4 a5 a6 a7 a8 b c
"1" "2" "3" "4" "5" "a" "b" "c" "Z" NA
> unlist(tmplist, use.names = FALSE)
[1] "1" "2" "3" "4" "5" "a" "b" "c" "Z" NA
```

- Applying functions to list
  - √ lapply() returns a list while sapply() returns a vector

Scalar Vector List Matrix Array Factor Data.frame

- Matrix
  - ✓ Matrix is a vector with dimensions
    - Vectors and lists can be transformed into a matrix
- Array
  - ✓ Matrix can be extended to n-dimensions.
    - Indexed by multiple locations and returns subvectors

```
148 - # Part 1-3: Data Handling (Matrix)
149
150 # Example of a matrix
151 A <- 1:6
152 dim(A)
153 print(A)
154
155 dim(A) \leftarrow c(2,3)
156 print(A)
157
158 B <- list(1,2,3,4,5,6)
159 print(B)
160 dim(B)
161 dim(B) \leftarrow c(2,3)
162 print(B)
163
164 D <- 1:12
165 \dim(D) \leftarrow c(2,3,2)
166 print(D)
```

- Features of matrix in R
  - ✓ Index begins with I (0 for python)
  - √ Column-major order
- Create a matrix: matrix()
  - ✓ Method I: provide all elements and assign the number of columns and rows (column first)
  - ✓ Method 2: provide all elements and assign the number of columns and rows (use row first option)
  - ✓ Method 3: Create an empty matrix and fill each element in

```
Console ~/ 🖒
                                       Console ~/ 🖒
> A = matrix(1:15, nrow=5, ncol=3)
                                      > B = matrix(1:15, nrow=5, byrow = T)
     [,1] [,2] [,3]
                                           [,1] [,2] [,3]
[1,]
[2,]
[3,]
                13
                                      [3,]
[4,]
                                      [4,]
                                             10
                                                        12
                                                  11
        5 10
[5,]
                 15
                                             13
                                                   14
                                                        15
```

```
Console ~/ \( \infty\) > C = matrix(nrow=2,ncol=2) 
> C[1,1] = 1 
> C[1,2] = 2 
> C[2,1] = 3 
> C[2,2] = 4 
> C 

[,1] [,2] 

[1,] 1 2 

[2,] 3 4 
> |
```

- Matrix operations
  - ✓ Linear algebra of matrix: matrix multiplication, matrix-constant multiplication, etc.
  - ✓ Indexing and filtering

```
Console ~/ 🖒
> A = matrix(1:4, nrow=2, ncol=2)
> B = matrix(seq(from=2,to=8,by=2), nrow=2, ncol=2)
> A
     [,1] [,2]
[1,]
[2,]
> B
     [,1] [,2]
[1,]
[2,]
> A*B # 행렬 원소간 곱셈
     [,1] [,2]
[1,]
        2 18
            32
> A %*% B # 행렬간 곱셈
     [,1] [,2]
      14
       20
> A*3 # 행렬*상수
     [,1] [,2]
[1,]
[2,]
> A+B # 행렬간 합
     [,1] [,2]
[1,]
           12
[2,]
```

```
Console ~/ 🖨
> C = matrix(1:15, nrow=5, ncol=3)
     [,1] [,2] [,3]
[1,]
             6
[2,]
                 12
                 13
[3,]
[4,]
                 14
[5,]
           10
> C[3,2]
[1] 8
> C[2,]
[1] 2 7 12
> C[,3]
[1] 11 12 13 14 15
> C[2:4,2:3]
     [,1] [,2]
[1,]
            12
[2,]
            13
[3,]
            14
> C[-1,]
     [,1] [,2] [,3]
[1,]
[2,]
                 13
[3,]
                 14
[4,]
        5 10
                15
> C[1,] <- c(10, 11, 12)
> C
     [,1] [,2] [,3]
[1,]
       10
            11
[2,]
                 12
[3,]
                 13
[4,]
[5,]
            10
                 15
>
```

- Applying functions to the rows/columns of matrix
  - ✓ Use apply() function family: apply(), sapply(), tapply(), lapply(), etc.
    - apply(m, dimcode, f, fargs)
      - m: matrix
      - dimcode: dimension to apply (1: row, 2: column)
      - f: function
      - fargs: arguments needed to execute f

- Modifying matrix
  - √ rbind( ) & cbind( ): combine two matrices
  - √ rbind(): combine two matrices with the same column names (top and bottom)
  - √ cbind(): combine two matrices with the same row names (left and right)

```
Console ~/ 📣
> A <- matrix(c(1:6), nrow=3, ncol=2)
> B <- matrix(c(11:16), nrow=3, ncol=2)
> A
     [,1] [,2]
[1,]
[2,]
[3,]
> B
     [,1] [,2]
[1,]
       11
            14
[2,]
       12
            15
[3,]
       13
            16
```

```
Console ~/ 🖒
> rbind(A,B)
     [,1] [,2]
[1,]
[2,]
[3,]
[4,]
       11
            14
             15
[5,]
       12
             16
[6,]
       13
> cbind(A,B)
     [,1] [,2] [,3] [,4]
[1,]
[2,]
                  12
                        15
[3,]
                  13
                        16
> cbind(A[,1],B[,2])
     [,1] [,2]
[1,]
[2,]
             15
[3,]
             16
>
```

## Handling Matrix and Array

- Assign names for matrix columns/rows
  - √ Use colnames() and rownames()

```
Console ~/ 🖒
> A <- matrix(c(1:6), nrow=3, ncol=2)
> colnames(A)
NULL
> rownames(A)
NULL
> colnames(A) <- c("1st", "2nd")
> colnames(A)
[1] "1st" "2nd"
> rownames(A) <- c("First", "Second", "Third")
> rownames(A)
[1] "First" "Second" "Third"
> A[,"1st",drop=FALSE]
       1st
First
Second
Third
>
```

## Handling Matrix and Array

High dimensional array

√ Use array() function

```
Console ~/ 📣
> A <- matrix(c(1:15), nrow=5, ncol=3)
> B <- matrix(c(11:25), nrow=5, ncol=3)
> A
     [,1] [,2] [,3]
[1,]
                  11
[2,]
                 12
[3,]
                 13
[4,]
                 14
[5,]
                  15
> B
     [,1] [,2] [,3]
[1,]
       11
            16
                  21
[2,]
       12
            17
                  22
[3,]
      13
            18
                 23
[4,]
      14
            19
                  24
                  25
[5,]
       15
            20
> C <- array(data=c(A,B),dim=c(3,2,2))</pre>
> C
, , 1
     [,1] [,2]
[1,]
        1
[2,]
[3,]
, , 2
     [,1] [,2]
[1,]
            10
[2,]
            11
[3,]
            12
```

Scalar Vector List Matrix Array **Factor** Data.frame Factor 245 \* # Part 1-4: Data Handling (Factor) 246 √ Vector representation for nominal/categorical 247 # Example of a factor A <- c("Cho", "Kim", "Kang") variables 249 B <- as.factor(A) 250 Factor has its levels that are equivalent the 251 print(A) 252 print(B) number of possible values 253 254 mode(A) 255 mode(B) Usage 256 257 A[1]+A[2] ✓ Categorical variable representation: I level for I 258 B[1]+B[2] category > A[1]+A[2] Error in A[1] + A[2] : non-numeric argument to binary operator ✓ Grouping and tagging > B[1]+B[2] [1] NA Warning message: Factor levels must be consistent! In Ops.factor(B[1], B[2]):

요인(factors)에 대하여 의미있는 '+'가 아닙니다.

- Factor
  - ✓ Factor in R is a vector with additional information
    - Additional information is a set of non-redundant values called level
    - The length of a factor is the number of elements, not levels
    - Possible to add a new level
    - A new value with non-existing level is considered as NA

```
Console ~/ 🗇
> xff <- factor(x, levels=c(5,12,13,88))</pre>
> xff
[1] 5 12 13 12
Levels: 5 12 13 88
> xff[2] <- 88
> xff
[1] 5 88 13 12
Levels: 5 12 13 88
> xff[2] <- 20
Warning message:
In `[<-.factor`(`*tmp*`, 2, value = 20) :</pre>
  invalid factor level, NA generated
> xff
[1] 5
         <NA> 13 12
Levels: 5 12 13 88
```

Applying function to a factor

```
✓ tapply()
```

- Useful to make frequency table with different categories
- Can be used to more than two factors

```
Console ~/ 🖒
> gender <- c("M", "M", "F", "M", "F", "F")
> age <- c(47,59,21,32,33,24)
> income <- c(55000,88000,32450,76500,123000,45650)
> tmp <- data.frame(gender, age, income)
> tmp$over25 <- ifelse(tmp$age>25,1,0)
> tmp
  gender age income over25
      M 47 55000
      M 59 88000
       F 21 32450
      M 32 76500
      F 33 123000
                        1
       F 24 45650
> tapply(tmp$income, list(tmp$gender, tmp$over25), mean)
F 39050 123000.00
     NA 73166.67
>
```

- Applying function to a factor
  - ✓ split() function
    - Used to make groups
    - can be used to more than two factors

```
Console →/ 
> split(tmp$income, list(tmp$gender, tmp$over25))
$F.0
[1] 32450 45650

$M.0
numeric(0)

$F.1
[1] 123000

$M.1
[1] 55000 88000 76500
```

Scalar Vector List Matrix Array Factor Data.frame

### Dataframe

- ✓ A table with rows and columns
- √ Regarded as a special case of list
- ✓ Can have different modes for different columns
- ✓ Elements in a column must have the same modes
- √ Columns can have names

```
296 - # Part 1-5: Data Handling (DataFrame)
297
298 # Example of data frame
299 A <- c(1,2,3)
300 B <- c("a", "b", "c")
301 C <- data.frame(A,B)
302 C
303 C[[1]]
304 C[[2]]
305 C[1,2]
306 C$B[2]
307
308 C <- data.frame(A,B, stringsAsFactors=FALSE)
309 C
310 C[[1]]
311 C[[2]]
312 C[1,2]
313 C$B[2]
```

- Creating and accessing Dataframe
  - √ Use data.frame( ) function to create a dataframe
  - ✓ Three ways to access a certain element

```
Console ~/ 🗇
> d[[1]]
[1] "Jack" "Jill"
> class(d[[1]])
[1] "character"
> d$kids
[1] "Jack" "Jill"
> class(d$kids)
[1] "character"
> d[,1]
[1] "Jack" "Jill"
> class(d[,1])
[1] "character"
> d[1]
  kids
1 Jack
2 Jill
> class(d[1])
[1] "data.frame"
>
```

- Extracting and filtering a subset of dataframe
  - ✓ Same as matrix
- Combine dataframe
  - √ Same as matrix

```
Console ~/ 🖒
> Exam
  Exam1 Exam2 Quiz
   2.0
         3.3 4.0
   3.3
         2.0 3.7
   4.0
   2.3
         0.0 3.3
        1.0 3.3
> Exam[2:5,]
  Exam1 Exam2 Quiz
  3.3
   4.0
           4 4.0
   2.3
           0 3.3
  2.3
           1 3.3
> Exam[2:5,2]
[1] 2 4 0 1
> Exam[2:5,2, drop=FALSE]
  Exam2
2
3
5
```

```
Console ~/ 🗇
> Exam[Exam$Exam1 > 3,]
  Exam1 Exam2 Quiz
   3.3
          2.0 3.7
   4.0
        4.0 4.0
  3.3
        3.7 4.0
> rbind(d, list("Laura", 19))
   kids ages
  Jack
2 3111
          10
3 Laura
         19
```

- Merge dataframes
  - ✓ If there are more than on sources of data tables in a database
  - ✓ Inner/outer/left/right joins are possible

```
> merge(dfA, dfB) # default: inner join
  kids ages state
1 jill
         10
2 Laura 19
              CA
> merge(dfA, dfB, all = TRUE) # outer join
  kids ages state
1 Alice NA
2 Jack 12 <NA>
3 Jill 10
              NY
4 Laura 19
              CA
> merge(dfA, dfB, all.x = TRUE) # left join
  kids ages state
1 Jack 12 <NA>
2 Jill 10
               NY
3 Laura 19
              CA
> merge(dfA, dfB, all.y = TRUE) # right join
  kids ages state
1 Alice NA
2 Jill
         10
              NY
3 Laura 19
              CA
```

### Merge dataframes

✓ If different data frames have different column name strategy, explicitly state the column names to use

```
firstname <- c("Alice","Jill", "Laura")
state <- c("MA", "NY", "CA")
dfC <- data.frame(firstname, state, stringsAsFactors=FALSE)
dfC
merge(dfA, dfC, by.x="kids", by.y="firstname")</pre>
```

```
> dfC <- data.frame(firstname, state, stringsAsFactors=FALSE)
> dfC
    firstname state
1    Alice    MA
2    Jill    NY
3    Laura    CA
> merge(dfA, dfC, by.x="kids", by.y="firstname")
    kids ages state
1 Jill    10    NY
2 Laura    19    CA
```

# AGENDA

01	R Overview
02	Handling Different Data Types
03	Text Processing

- The length of a string
  - √ Use nchar() function instead of length()
    - Space and special characters can be counted as well
- Concatenate strings
  - √ Use paste() function
    - Various spacing strategies can be used
    - Non-character values are also possible

```
Console ~/ A
> S <- "Welcome to Data Science!"
> length(S)
[1] 1
> nchar(S)
[1] 24
> S1 <- "My name is"
> S2 <- "Pilsung Kang"
> paste(S1, S2)
[1] "My name is Pilsung Kang"
> paste(S1, S2, sep="-")
[1] "My name is-Pilsung Kang"
> paste(S1, S2, sep="")
[1] "My name isPilsung Kang"
> paste(S1, S2, sep="")
[1] "My name isPilsung Kang"
> paste(S1, S2, sep="")
```

- Extract sub-strings
  - √ Use substring(string, start, end) function
    - Extract the substring that begins with "start" and ends with "end"
    - If the string argument is a vector, the other options are applied to all elements

```
Console ~/ 
> substr("Data Science", 1, 4)
[1] "Data"
> substr("Data Science", 6, 10)
[1] "Scien"
> stooges <- c("Dongmin", "Sangkyum", "Junhong")
> substr(stooges, 1,3)
[1] "Don" "San" "Jun"
> cities <- c("New York, NY", "Los Angeles, CA", "Peoria, IL")
> substr(cities, nchar(cities)-1, nchar(cities))
[1] "NY" "CA" "IL"
> |
```

- Split text
  - √ Use strsplit(string, separator) function
    - A simple string or regular expression can be used as a separator
    - Ex: split the file path using "/" as a separator

```
Console ~/ 🖒
> path <- c("C:/home/mike/data/trials.csv",
+ "C:/home/mike/data/errors.txt",
+ "C:/home/mike/data/report.doc")
> strsplit(path,"/")
[[1]]
                                "mike"
                                             "data"
                                                           "trials.csv"
[1] "c:"
                  "home"
[[2]]
[1] "c:"
                  "home"
                                             "data"
                                                           "errors.txt"
                                "mike"
[[3]]
                                                           "report.doc"
[1] "c:"
                  "home"
                               "mike"
                                             "data"
```

- Regular expression
  - √ a sequence of characters that define a search pattern
  - √ this pattern is then used by string searching algorithms

```
Console ~/ 🖒
> strsplit(path, "om")
[[1]]
[1] "c:/h"
                                "e/mike/data/trials1.csv"
[[2]]
[1] "C:/h"
                                "e/mike/data/errors2.txt"
[[3]]
[1] "c:/h"
                                "e/mike/data/report3.doc"
> strsplit(path, "[hm]")
[[1]]
[1] "c:/"
                            "0"
                                                                             "ike/data/trials1.csv"
[[2]]
[1] "C:/"
                            "0"
                                                                             "ike/data/errors2.txt"
[[3]]
[1] "C:/"
                            "0"
                                                                             "ike/data/report3.doc"
> strsplit(path, "i.e")
[[1]]
[1] "C:/home/m"
                         "/data/trials1.csv"
[[2]]
[1] "C:/home/m"
                         "/data/errors2.txt"
[[3]]
                         "/data/report3.doc"
[1] "C:/home/m"
```

```
Console ~/ 🖒
> strsplit(path, "\\.")
[1] "C:/home/mike/data/trials1" "csv"
[[2]]
[1] "C:/home/mike/data/errors2" "txt"
[[3]]
[1] "C:/home/mike/data/report3" "doc"
> strsplit(path, "r{2}")
[1] "C:/home/mike/data/trials1.csv"
[1] "C:/home/mike/data/e" "ors2.txt"
[1] "C:/home/mike/data/report3.doc"
> strsplit(path, "[[:digit:]]")
[1] "C:/home/mike/data/trials" ".csv"
[1] "C:/home/mike/data/errors" ".txt"
[1] "C:/home/mike/data/report" ".doc"
```

Regular expression in R

### • Regular expression

POSIX	비표준	펄/Tcl	Vim	ASCII	설명
[:alnum:]				[A-Za-z0-9]	영숫자
	[:word:]	₩w	₩w	[A-Za-z0-9_]	영숫자 + "_"
		₩W	₩W	[^A-Za-z0-9_]	낱말이 아닌 문자
[:alpha:]			₩a	[A-Za-z]	알파벳 문자
[:blank:]			₩s	[ #t]	공백과 탭
		₩b	<b>#&lt; #&gt;</b>	(?<=\\)(?=\\)(?=\\)	낱말 경계
[:cntrl:]				[#x00-#x1F#x7F]	제어 문자
[:digit:]		₩d	₩d	[0-9]	숫자
		#D	₩D	[^0-9]	숫자가 아닌 문자
[:graph:]				[#x21-#x7E]	보이는 문자
[:lower:]			#1	[a-z]	소문자
[:print:]			#p	[#x20-#x7E]	보이는 문자 및 공백 문자
[:punct:]				[][!"#\$%&'()*+,./:;<=>?@\^_`{ }~-]	구두점
[:space:]		₩s	₩_S (단순히 줄 끝에 추가)	[ \t\#r\n\v\ <mark>\f</mark> ]	공백 문자
		#S		[^ \#t\#r\n\#v\#f]	공백이 아닌 모든 문자
[:upper:]			₩u	[A-Z]	대문자
[:xdigit:]			₩x	[A-Fa-f0-9]	16진수

From: wikipedia

- Substitution
  - √ Use sub(old, new, string) or gsub(old, new, string) functions
  - √ sub( ) replaces the first substring whereas gsub( ) replaces all substrings.

```
Console ~/ 	
> tmpstring <- "Kim is stupid and Kang is stupid too"
> sub("stupid", "smart", tmpstring)
[1] "Kim is smart and Kang is stupid too"
> gsub("stupid", "smart", tmpstring)
[1] "Kim is smart and Kang is smart too"
```

- String pattern matching
  - √ Use grep(pattern, x) function
    - Return the index that matches pattern

```
Console ~/ 
> grep("mike",path)
[1] 1 2 3
> grep("errors",path)
[1] 2
```

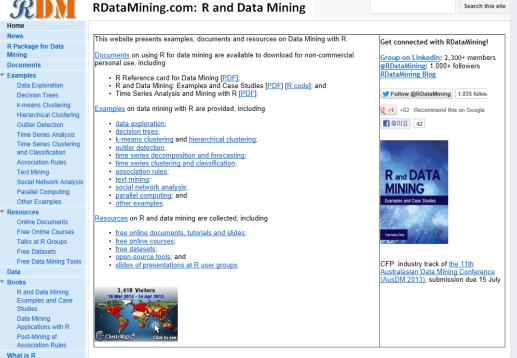


### References

### R Datamining

**Donation & Supporters** Job News About RDataMining

### √ <a href="http://www.rdatamining.com">http://www.rdatamining.com</a>



#### R Reference Card for Data Mining

by Yanchang Zhao, yanchang@rdatamining.com, March 20, 2013 The latest version is available at http://www.RDataMining.com. Click the link also for document R and Data Mining: Examples and Case Studies. The package names are in parentheses.

#### Association Rules & Frequent Itemsets

#### APRIORI Algorithm

a level-wise, breadth-first algorithm which counts transactions to find frequent

apriori () mine associations with APRIORI algorithm (arules)

#### ECLAT Algorithm

employs equivalence classes, depth-first search and set intersection instead of

eclat () mine frequent itemsets with the Eclat algorithm (arules)

#### Packages

arules mine frequent itemsets, maximal frequent itemsets, closed frequent itemsets and association rules. It includes two algorithms, Apriori and Eclat. arules Viz visualizing association rules

#### Sequential Patterns

#### Functions

cspade () mining frequent sequential patterns with the cSPADE algorithm

seqefsub() searching for frequent subsequences (TraMineR)

#### Packages

arules Sequences add-on for arules to handle and mine frequent sequences TraMineR mining, describing and visualizing sequences of states or events

#### Classification & Prediction

#### **Decision Trees**

ctree () conditional inference trees, recursive partitioning for continuous, censored, ordered, nominal and multivariate response variables in a conditional inference framework (party)

rpart () recursive partitioning and regression trees (rpart)

mob () model-based recursive partitioning, yielding a tree with fitted models associated with each terminal node (party)

#### Random Forest

#### Support Vector Machine (SVM)

svm () train a support vector machine for regression, classification or densityestimation (e1071)

ksvm() support vector machines (kernlab)

#### **Performance Evaluation**

performance () provide various measures for evaluating performance of pre-

diction and classification models (ROCR)

roc () build a ROC curve (pROC)

auc () compute the area under the ROC curve (pROC)

ROC () draw a ROC curve (DiagnosisMed) PRcurve () precision-recall curves (DMwR)

CRchart () cumulative recall charts (DMwR)

#### Packages

rpart recursive partitioning and regression trees

party recursive partitioning

randomForest classification and regression based on a forest of trees using ran-

dom inputs rpartOrdinal ordinal classification trees, deriving a classification tree when the

response to be predicted is ordinal

rpart.plot plots rpart models with an enhanced version of plot.rpart in the rpart package

ROCR visualize the performance of scoring classifiers

pROC display and analyze ROC curves

nnet feed-forward neural networks and multinomial log-linear models

RSNNS neural networks in R using the Stuttgart Neural Network Simulator

neuralnet training of neural networks using backpropagation, resilient backpropagation with or without weight backtracking

#### Regression

#### Functions

#### 1m() linear regression

glm() generalized linear regression

nls() non-linear regression

predict () predict with models

residuals () residuals, the difference between observed values and fitted val-

gls () fit a linear model using generalized least squares (nlme)

gnls () fit a nonlinear model using generalized least squares (nlme)

#### Packages

#### nlme linear and nonlinear mixed effects models

#### Clustering

Partitioning based Clustering

### References

- R Bloggers
  - √ <a href="http://r-bloggers.com">http://r-bloggers.com</a>

