# **R** programming

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(Big) Data Processing

### Background

R is a programming language and software environment for statistical analysis, graphics representation and reporting.

R was created by Ross Ihaka and Robert Gentleman at the University of Auckland, New Zealand, and is currently developed by the R Development Core Team.

R is freely available under the GNU General Public License, and pre-compiled binary versions are provided for various operating systems like Linux, Windows and Mac.



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### Intro

The following important features of R:

R is a well-developed, simple and effective programming language which includes conditionals, loops, user defined recursive functions and input and output facilities.

R has an effective data handling and storage facility,

R provides a suite of operators for calculations on arrays, lists, vectors and matrices.

R provides a large, coherent and integrated collection of tools for data analysis.

R provides graphical facilities for data analysis and display either directly at the computer or printing at the papers.



R is world's most widely used statistics programming language.

It's the # 1 choice of data scientists and supported by a vibrant and talented community of contributors. R is taught in universities and deployed in mission critical business applications.



### **R** studio

https://www.rstudio.com/

https://www.rstudio.com/products/rstudio/download/





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### **Need Help with functions? Use ? Or help()**

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>	R: Matrices  Find in Topic	
> >	matrix {base}	Documentation
	Matrices	
	Description	
>	matrix creates a matrix from the given set of values.	
>	as.matrix attempts to turn its argument into a matrix	κ.
> >	is.matrix tests if its argument is a (strict) matrix.	
> help(matrix) > ?matrix >	Usage	
	matrix (data = NA prov = 1 pcol = 1 ht	TOW - FAISE









(Big) Data Processing

### R - Data Types

In contrast to other Programming languages like C and java in R the variables are not declared as some data type.

The variables are assigned with R-Objects and the data type of the R-object becomes the data type of the variable **just like in Python** 

There are many types of R-objects.

The frequently used ones are

Vectors

**∙Lists** 

Matrices

Arrays

Factors

**·Data Frames** 



## Mode and Class

- R looks at two things:
- Mode
  - How the data is formatted (think int, float, char, matrix, list)
- $> \dim(x) <- c(3,3)$  Always numeric > X [,1] [,2] [,3] • Class [1,] 4 1 7 Overall structure [2,] 2 5 8 [3,] 3 9 6 > x = 1:9> mode(x) [1] "numeric" > class(x) [1] "matrix"



### R - Data Types cont...

Data Type	Example	Command Line
Logical	TRUE , FALSE	<pre>v &lt;- TRUE print(class(v)) it produces following result: [1] "logical"</pre>
Numeric	12.3, 5, 999	v <- 23.5 print(class(v)) it produces following result: [1] "numeric"
Integer	2L, 34L, 0L	v <- 2L print(class(v)) it produces following result: [1] "integer"
Complex	3 + 2i	<pre>v &lt;- 2+5i print(class(v)) it produces following result: [1] "complex"</pre>
Character	'a' , '"good", "TRUE", '23.4'	v <- "TRUE" print(class(v)) it produces following result: [1] "character"
Raw	"Hello" is stored as 48 65 6c 6c 6f	v <- charToRaw("Hello") print(class(v)) it produces following result: [1] "raw"



Variable Assignment

The variables can be assigned values using leftward, rightward and equal to operator. The values of the variables can be printed using **print()** or **cat()**function. The **cat()** function combines multiple items into a continuous print output.

```
# Assignment using equal operator.
var1 = "abcdefg"
```

# Assignment using leftward operator.
var2 <- 12345</pre>

```
# Assignment using rightward operator.
c(TRUE,1) -> var.3 print(var.1) cat ("var.1
is ", var.1 ,"\n") cat ("var.2 is ", var.
2 ,"\n") cat ("var.3 is ", var.3 ,"\n")
```



#### Vectors

A **vector** is a sequence of data elements of the same basic type. Members in a vector are officially called **components**. Nevertheless, we will just call them **members** in this site.

When you want to create vector with more than one element, you should use c() <u>concatenate</u> function which means to combine the elements into a vector.

```
# Create a vector.
apple <- c('red','green',"yellow")
>apple
```

```
# Get the class of the vector.
class(apple)
```

When we execute above code, it produces following result:

```
[1] "red" "green" "yellow"
```

```
[1] "character"
```



### **Creating Vectors**

The c() function can be used to create vectors of objects.

```
> x <- c(0.5, 0.6)  ## numeric
> x <- c(TRUE, FALSE)  ## logical
> x <- c(T, F)  ## logical
> x <- c("a", "b", "c")  ## character
> x <- 9:29  ## integer
> x <- c(1+0i, 2+4i)  ## complex</pre>
```

Using the vector() function

```
> x <- vector("numeric", length = 10)
> x
[1] 0 0 0 0 0 0 0 0 0 0
```



### **Mixing Objects**

What about the following?

> y <- c(1.7, "a") ## character > y <- c(TRUE, 2) ## numeric > y <- c("a", TRUE) ## character</pre>

When different objects are mixed in a vector, *coercion* occurs so that every element in the vector is of the same class.



## Let's Make a Vector!

Remember me? I'm a Python scalar.
 someInt = 12

someString = "hello Pittsburgh!"

Remember me? I'm a Python list.
 someIntList = [1,3,4,19]

someStringList = ["apple", "banana", "kittens"]

- In R, I am handled like this:
- > newVector = c(1,2,4,19)
- > newVector
- [1] 1 2 4 19
- > newVector[2]
- [1] 2 (Wait a second!) (2 = 2?) (Shouldn't 1 = 2?)



# 1 is the new 0

- "A single 0 in an index position returns an empty structure;. x[0] returns named numeric(0)."
- So in Python it's 0.. In R, its 1
  - Got that? Good..

http://cran.r-project.org/doc/contrib/R\_language.pdf



## Matrices

All the elements of a matrix must be of the same type (numeric, logical, character, complex).

- Maybe the most important lesson to be learned today
- Stored as a single vector with columns stacked together

USAGE: matrix(data = NA, nrow = 1, ncol = 1, byrow = FALSE, dimnames = NULL)

```
data = the data going into the matrix
```

```
nrow = # of rows
```

```
ncol = # of columns
```

```
byrow = TRUE or FALSE
```

```
dimnames = dimension names
```



### Matrices

Matrices are vectors with a *dimension* attribute. The dimension attribute is itself an integer vector of length 2 (nrow, ncol)

```
> m <- matrix(nrow = 2, ncol = 3)
> m
      [,1] [,2] [,3]
[1,] NA NA NA
[2,] NA NA NA
2 dim(m)
[1] 2 3
> attributes(m)
$dim
[1] 2 3
```



## Let's Add Some Labels!

>someMatrix = matrix(1:16, 4, 4, FALSE, dimnames=list(c("A","B","C","D"),c("W","X","Y","Z")))

> someMatrix

	W	Х	Υ	Ζ
А	1	5	9	13
В	2	6	10	14
С	3	7	11	15
D	4	8	12	16
> sor	neMatri	x["B","Y	"]	
[1] 1	0			

\*Note: Use NULL if you don't want to append labels to either x or y axis





#### **Data Frames**

Data frames are tabular data objects. **Unlike a matrix in data frame each column can contain different modes of data**. The first column can be numeric while the second column can be character and third column can be logical. It is a list of vectors of equal length.

Data Frames are created using the **data.frame()** function.

```
# Create the data frame.
BMI <- data.frame( gender = c("Male", "Male", "Female"),
height = c(152, 171.5, 165), weight = c(81,93, 78), Age =c(4:
print(BMI)</pre>
```



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# Read.Table()

- The majority of data is handled using a table (especially in ggplot)
- USAGE: read.table(file, header = FALSE, sep = "", quote = "\"", dec = ".", row.names, col.names, as.is = !stringsAsFactors, na.strings = "NA", colClasses = NA, nrows = -1, skip = 0, check.names = TRUE, fill = !blank.lines.skip, strip.white = FALSE, blank.lines.skip = TRUE, comment.char = "#", allowEscapes = FALSE, flush = FALSE, stringsAsFactors = default.stringsAsFactors(), fileEncoding = "", encoding = "unknown", text)



## Header

Made a slight change to "BeerAndWinePerCapita.txt" State,GallonsOfBeer,GallonsOfWine nEVADA,44,5.75

fromFile = read.table("BeerAndWinePerCapita.txt", header = TRUE, sep = ",")

> fromFile

State	GallonsOfBeer		GallonsOfWine
1 nEVADA	44	5.75	
2 nEW hAMPSHIRE	43.4	6.26	
3 nORTH dAKOTA	41.7	1.56	
4 mONTANA	41.5	3.06	
5 sOUTH dAKOTA	39	1.50	
6 wISCONSIN	38.2	2.63	



## >mydata <- read.table("Retention.txt",header=TRUE,sep="\t") >summary(mydata)

spend	apret	top10	rejr
Min. : 4125	Min. :18.75	Min. : 8.00	Min. : 0.00
1st Qu.: 7372	1st Qu.:45.37	1st Qu.:22.00	1st Qu.:19.17
Median : 9265	Median :55.71	Median :30.00	Median :27.39
Mean :10975	Mean :56.72	Mean :38.46	Mean :30.65
3rd Qu.:12838	3rd Qu.:68.69	3rd Qu.:49.50	3rd Qu.:36.81
Max. :35863	Max. :95.25	Max. :98.00	Max. :84.07
tstsc	расс	strat	salar
tstsc Min. :48.12	pacc Min. : 8.964	strat Min. : 7.20	salar Min. :38640
Min. :48.12	Min. : 8.964	Min. : 7.20	Min. :38640
Min. :48.12 1st Qu.:61.11	Min. : 8.964 1st Qu.:33.904	Min. : 7.20 1st Qu.:13.40	Min. :38640 1st Qu.:54650
Min. :48.12 1st Qu.:61.11 Median :64.78	Min. : 8.964 1st Qu.:33.904 Median :40.850	Min. : 7.20 1st Qu.:13.40 Median :16.00	Min. :38640 1st Qu.:54650 Median :61150



### Factors---Types of Variables

• Nominal (Categorical) –

Two or more categories

Have no intrinsic ordering

Think: (Male/Female), (Blonde/Brunette/Red Hair), and (Pittsburgh/State College/Erie/etc.)

• Ordinal

Similar to Nominal, but with order Think: (Low/Medium/High), (Tall/Average/Short), and (Tall Latte/Grande Latte/Venti Latte no whip)

• Interval

Same as Ordinal, but evenly spaced Think: (Temperature), (Time), and (Measurements)







(Big) Data Processing

# Some Basics of ggplot2

- Extended library of R
- Used to create a variety of visualizations without a lot of background knowledge
- Created in a layered fashion



### Terminology

#### Mapping

Taking the data and the aesthetics and mapping between them to visualize results

#### Geom

Geometric Objects – Points, lines, polygons (Remind you of something?)

#### Stat

Statistical Transformation

Example: Taking the data and counting observations to create a histogram

#### Scale

Gives you an understanding of the range of data in the visualizations Think: Legend or Axis



## Terminology (cont.)

### Coord

**Coordinate System** 

**Either by Cartesian or polar coordinates** 

### Facet

**Faceting Specification** 

Think: Small multiples.. Segmenting data into groups for deeper understanding

A group of nodes in a cluster becoming a single node to understand group to group interaction


# Examples





http://docs.ggplot2.org/current/geom\_histogram.html



## **Facet Grid**

ggplot2 Quick Reference: facet

The faceting approach supported by ggplot2 partitions a plot into a matrix of panels. Each panel shows a different subset of the data. There are two faceting approaches:

**facet\_wrap**(~cell) - univariate: create a 1-d strip of panels, based on one factor, and wrap the strip into a 2-d matrix **facet\_grid**(row~col) - (usually) bivariate: create a 2-d matrix

of panels, based on two factors





## **Violin Plots**

The violin plot is similar to <u>box plots</u>, except that they also show the <u>probability density</u> of the data at different values (in the simplest case this could be a <u>histogram</u>). Typically violin plots will include a marker for the median of the data and a box indicating the interquartile range, as in standard box plots. Overlaid on this box plot is a <u>kernel density estimation</u>.





#### NBA per game performance of top 50 scorers

2008-2009 season

## **Heat Maps**

### ohttps://learnr.wordpress.com/ 2010/01/26/ggplot2-quickheatmap-plotting/





## Heat Maps cont...

https://learnr.wordpress.com/2010/01/26/ggplot2-quick-heatmapplotting/

nba <- read.csv("http://datasets.flowingdata.com/ppg2008.csv")</pre>

nba\$Name <- with(nba, reorder(Name, PTS))</pre>

### With

• "Evaluate an R expression in an environment constructed from data, possibly modifying the original data."

nba\$Name <- with(nba, reorder(Name, PTS))</li>



### **R** Markdown

R Markdown is an authoring format that enables easy creation of dynamic documents, presentations, and reports from R.

mputer may not have enough memory to open the image, or the image may have been corrupted. Restart your computer, and then open the file again. If the red x still appears, you may have to delete the image and then insert it again.

http://www.rstudio.com/wp-content/uploads/2015/02/rmarkdowncheatsheet.pdf



**Useful Links** 

### https://cran.r-project.org/

http://zevross.com/blog/2014/08/04/beautiful-plotting-in-r-a-ggplot2cheatsheet-3/

http://tutorials.iq.harvard.edu/R/Rgraphics/Rgraphics.html

- http://blog.echen.me/2012/01/17/quick-introduction-to-ggplot2/
- http://had.co.nz/ggplot2/
- https://github.com/jennybc/ggplot2-tutorial
- http://www.ceb-institute.org/bbs/wp-content/uploads/2011/09/
  handout\_ggplot2.pdf

http://www.r-bloggers.com/basic-introduction-to-ggplot2/



### Facet

### http://sape.inf.usi.ch/quick-reference/ggplot2

**Whisker** 

<u>http://asq.org/learn-about-quality/data-collection-analysis-</u> tools/ overview/box-whisker-plot.html

<u>Violin</u>

http://www.sthda.com/english/wiki/ggplot2-violin-plot-quick-startguide-r-software-and-data-visualization

Machine learning kaggle titanic

https://www.datacamp.com/courses/kaggle-tutorial-on-machinelearing-the-sinking-of-the-titanic



## **Kaggle Titanic Assignment**



Home	π
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Evaluation	
Rules	
Prizes	
Frequently Asked Questio	
Further Reading / Watching	
Getting Started With Excel	
Getting Started With Pyth	
Getting Started With Pyth	
Getting Started With Rand	
New: Getting Started with R	
Submission Instructions	
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New Script	
New Notebook	
Leaderboard	=
Visualization	ę
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GitHub	0
My Submissions	
3,455 Scripts	

Decision Tree Visualization & Submission 49 Votes / 50 days ago / R

A Journey through Titanic

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### Data Files

File Name	Available Formats
train	.csv (59.76 kb)
gendermodel	.csv (3.18 kb)
genderclassmodel	.csv (3.18 kb)
test	.csv (27.96 kb)
gendermodel	.py (3.58 kb)
genderclassmodel	.py (5.63 kb)
myfirstforest	.py (3.99 kb)

#### See, fork, and run a random forest benchmark model through Kaggle Scripts

VARIABLE DESCRIP	PTIONS:
survival	Survival
	(0 = No; 1 = Yes)
pclass	Passenger Class
	(1 = 1st; 2 = 2nd; 3 = 3rd)
name	Name
sex	Sex
age	Age
sibsp	Number of Siblings/Spouses Aboard
parch	Number of Parents/Children Aboard
ticket	Ticket Number
fare	Passenger Fare
cabin	Cabin
embarked	Port of Embarkation
	(C = Cherbourg; Q = Queenstown; S = Southampton)

**Titanic Data Graphics** 

(1) Go to kaggle.com > Titanic: Machine Learning from Disaster and download (train.csv)

(2) You will submit a single R file (DOCUMENTED)

- (3) You will create a plot (for each, so 5 plots in total) in ggplot2 using:
- a. Whisker-plot
- b. Histogram
- c. Facet grid
- d. Violin plot
- e. Heatmap

(4) Write up a 500 – 1500 word document talking about the assignment using the graphics to describe the passengers of Titanic.















### **Midterm Exam Next week**

You can bring with you to the exam one double-sided letter-size sheet of paper with notes.

There are no limits on the font size – you can cram as much information on these two pages as you wish – but the notes have to be handwritten personally by you and this is a strict requirement.

Copied or computer-printed sheets are not allowed.

