

# INTRODUCTION TO DATA SCIENCE

## Lecture 4

Dr. Ibrahim Radwan

- Data Structures
  - Factors
  - Arrays and Matrices
  - Lists
  - Data Frames

## Similar type of items

### Homogeneous data structures

Atomic vector      1-D

Matrix              2-D

Array                n-D

## Dissimilar type of items

### Heterogeneous data structures

List                  1-D

Data frame        2-D

- Special case of vector, used to store nominal/categorical data
- A factor can be thought as an integer vector, where each integer has a label
  - It is more efficient to have a variable with “Female” and “Male” values than a variable with 1 and 2 values
  - Integers are more efficient when comparing values or when searching for a value than using characters
  - However, integers are not self describing and characters are
  - Factor is the solution that integrates both
- Creating a factor
  - `x <- factor(c("yes", "yes", "no", "yes", "no"))`

# FACTOR (2)

## Code Example

```
1 # Factor example
2
3 # Create character vector for types of the properties
4 houses.types <- c("House", "Unit", "House", "Unit")
5 houses.types
6 str(houses.types)
7 # Create integer vector for types of the properties
8 houses.types <- c(1L, 2L, 1L, 2L)
9 houses.types
10 str(houses.types)
11
12 # create a factor
13 houses.types <- factor(c("House", "Unit", "House", "Unit"))
14 houses.types
15 # underlying representation of factor
16 unclass(houses.types)
17 str(houses.types)
18 # searching using characters
19 houses.types[houses.types == "House"] # not efficient
20 # searching using integer
21 houses.types[as.numeric(houses.types) == 1] # efficient
22
23 #
24 employees.gender <- rep(c("female", "male", "male", "female", "male"), 10)
25 employees.gender
26 employees <- factor(employees.gender)
27 str(employees)
28
29 # order of levels
30 x <- factor(c("yes", "no", "yes", "no"))
31 x
32 y <- factor(c("yes", "no", "yes", "no"), levels= c("yes", "no"))
33 y
```

# ARRAYS AND MATRICES

- Arrays store data elements in several dimensions. Matrices are special cases of arrays with only two dimensions. Arrays and Matrices in R are nothing more than vectors with a attribute that is the dimension.

- Creating a matrix:

```
- m <- matrix(c(45, 23, 66, 77, 33, 44, 56, 12, 78, 23), 2, 5)
```

Elements of the matrix

nrows

ncols

- Creating an array:

```
- m <- array(c(45, 23, 66, 77, 33, 44, 56, 12), c(2, 2, 2))
```

Elements of the array

dimensions

# ARRAYS AND MATRICES (2)

Code Example

```
1 # arrays
2 my.array <- array(1:24, dim=c(3,4,2))
3 my.array
4 # Q: how are the items ordered?
5 # A: It is ordered column-wise
6
7 # change the dimensions of a vector in R
8 my.vector <- 1:24
9 dim(my.vector) <- c(3,4,2)
10
11 # check that the contents of two objects are equal using identical function
12 identical(my.array, my.vector)
13
14 # matrices
15 my.matrix <- matrix(1:24, nrow= 4, ncol= 6)
16 my.matrix
```

# ARRAYS AND MATRICES (3)

Code example for sub-setting

```
1 # Subsetting arrays and matrices
2 m <- matrix(c(45, 23, 66, 77, 33, 44, 56, 12, 78, 23, 38, 17), nrow= 3, ncol=4)
3 m
4 # extract the element of the second row and third column
5 m[2, 3]
6 # extract all elements of the second row
7 m[2,]
8 # extract all elements of the third column
9 m[,3]
10 # extract all element of the second row except the the third element of this row
11 m[2, -3]
12 # extract the second and fourth elements of the second row
13 m[2, c(2, 4)]
14 # extract all elements of the second row except the second and fourth elements
15 m[2, -c(2, 4)]
16
17 # all of the above are either column or row, so the results were vectors
18 # The results can be a sub-matrix
19 a <- m[c(1,2), c(2, 4)]
20 a
21 class(a)
22 # If you want the result of subsetting to be a matrix even for row and column
23 b <- m[1, ,drop= FALSE] # result in matrix
24 b
25 class(b)
```



# ARRAYS AND MATRICES (4)

- You can use *cbind()* and *rbind()* functions to join two or more vectors together or matrices, by columns or by rows, respectively. The following examples illustrates this:

Code example

```
1 # rbind and cbind example
2 m1 <- matrix(c(45, 23, 66, 77, 33, 44, 56, 12, 78, 23, 38, 17), nrow=3, ncol=4)
3 m1
4 res <- cbind(c(4, 76, 12), m1[, 4])
5 res
6
7 res <- rbind(c(4, 76, 12, 14), m1[3, ])
8 res
9 |
10 m2 <- matrix(rep(10, 16), nrow= 4, ncol= 4)
11 m2
12
13 m3 <- rbind(m1[1, ], m2[3, ])
14 m3
```

# ARRAYS AND MATRICES (5)

- You can also give names to the columns and rows of matrices, using the functions
- *colnames()* and *rownames()*. This facilitates memorizing the data positions.

Code example

```
1 # using rownames() and colnames() functions
2 results <- matrix(c(10, 30, 40, 50, 43, 56, 21, 30), 2, 4, byrow= TRUE)
3
4 # names of the columns
5 colnames(results) <- c("1st_qrt", "2nd_qrt", "3rd_qrt", "4th_qrt")
6
7 # names of the rows
8 rownames(results) <- c("store1", "store2")
9
10 # show the matrix
11 results
12
13 # indexing using the names of the columns/rows
14 results["store1", ]
15 results["store2", c("1st_qrt", "4th_qrt")]
16
```

You can also use  
*dim(matrix)* to get the  
dimensions of arrays  
or matrices

- A list is a data structure that holds collection of possibly unrelated (or heterogeneous) objects in order under one name.
    - Think of a vector, when you would like to combine the name, age, salary of an employee in one vector, is it possible?
    - No, most likely all of the numeric values (e.g. age and salary) will be converted to character to fulfill the rule that the items of a vector have to be from the same data type
    - However, with the lists, this is possible:
      - `> employee <- list(name='Jack', age=25L, salary=5210.43)`
- Different type of objects are concatenated together
- Combining two lists will results in a list

# LISTS (2)

## Code Example

```
1 # vectors
2 # Character
3 houses.addresses <- c("7 George st", "18/5 Irwan crescent", "8 Morad close", "1/2 London Circuit")
4 # Numeric
5 houses.area <- c(420.5, 220.15, 750.4, 120.5)
6 # Integer
7 houses.bedrooms <- c(4L, 3L, 5L, 2L)
8 # Logical
9 houses.has.garden <- c(TRUE, FALSE, TRUE, FALSE)
10
11 # Combine the features of each property
12 # using vector
13 houses.sample <- c(address= houses.addresses[1], area=houses.area[1], bedrooms= houses.bedrooms[1],
14                   has_garden=houses.has.garden[1])
15 print(houses.sample)
16 mode(houses.sample)
17 houses.sample[1]
18 houses.sample[2]
19 houses.sample['bedrooms']
20 str(houses.sample)
21 # using list
22 houses.sample <- list(address= houses.addresses[1], area=houses.area[1], bedrooms= houses.bedrooms[1],
23                      has_garden=houses.has.garden[1])
24 print(houses.sample)
25 mode(houses.sample)
26 houses.sample[1]
27 houses.sample[2]
28 houses.sample['bedrooms']
29 houses.sample$bedrooms
30 mode(houses.sample$bedrooms)
31 str(houses.sample)
```

- A data frame is a series of records represented by rows (observations), where each row contains values in several fields/columns (variables).
- They are like matrices in structure as they are also bi-dimensional.
  - All the operations, we have used for matrices can be applied on data frames as well
    - such as `rbind()`, `cbind()`, `dim()`, ...
- However, contrary to matrices, data frames may include data of a different type in each column.
- So, a data frame is a special type of lists, where a list represents only one row (in-order) and a data frame can be one row or more.

# DATA FRAMES (2)

```
ID, Name, Age
23424, Ana, 45
11234, Charles, 23
77654, Susanne, 76
```

data.csv

How to read this using  
the base functions in R?

Data Frame

	X	Y	Z
1	...	...	...
2	...	...	...
3	...	...	...
4	...	...	...
5	...	...	...

Observations

How many?



Variables

Types

Names

Strings as Factors

# DATA FRAMES (3)

- Create data frames from vectors:

```
# create dataframe from vectors
employee <- c('John Doe', 'Peter Gynn', 'Jolie Hope')
salary <- c(21000, 23400, 26800)
startdate <- as.Date(c('2010-11-1', '2008-3-25', '2007-3-14'))
employ.data <- data.frame(employee, salary, startdate)
```

- Check structure of data frame

```
str(employ.data)
```

- Characters by the default are set as Factors, however this can be changed using:

```
employ.data <- data.frame(employee, salary, startdate,  
  stringsAsFactors = FALSE)
```

- Full example in the next slide

# DATA FRAMES (4)

## Code Example

```
1 # create dataframe from vectors
2 employee <- c('John Doe', 'Peter Gynn', 'Jolie Hope')
3 salary <- c(21000, 23400, 26800)
4 startdate <- as.Date(c('2010-11-1', '2008-3-25', '2007-3-14'))
5
6 employ.data <- data.frame(employee, salary, startdate)
7 # check structure of data frame
8 str(employ.data)
9
10 # keep characters as characters
11 employ.data <- data.frame(employee, salary, startdate, stringsAsFactors = FALSE)
12 str(employ.data)
13
14 # using the accessor $ to access the variables of the data frame
15 employ.data$employee
16 employ.data$salary
17 employ.data$startdate[1]
18
19 # what is the difference between the following expressions
20 aa <- employ.data["salary"]
21 bb <- employ.data[["salary"]]
22 aa
23 class(aa)
24 bb
25 class(bb)
```



# DATA FRAMES (5)

- Sub-setting data frame using [] or accessor operator, \$:

```
my.dataset <- data.frame(site=c("A", "B", "A", "A", "B"),  
  season=c("Winter", "Summer", "Summer", "Spring", "Fall"),  
  pH=c(7.4, 6.3, 8.6, 7.2, 8.9), stringsAsFactors = FALSE)  
my.dataset[3, 2]  
my.dataset$pH
```

- Sub-setting based on conditions:

```
my.dataset[my.dataset$pH > 7, ]  
my.dataset[my.dataset$pH > 7, "site"]  
my.dataset[my.dataset$season == "Summer", c("site", "pH")]
```

- Is it possible to refer to the columns directly?
  - Like we say, my.dataset[pH > 7, ]
  - No this is not possible unless we attach. Let us discuss the full example in the next slide.

# DATA FRAMES (6)

## Code Example

```
1 # create and manipulate data frame
2 my.dataset <- data.frame(site=c("A", "B", "A", "A", "B"),
3                             season=c("Winter", "Summer", "Summer", "Spring", "Fall"),
4                             pH=c(7.4,6.3,8.6,7.2,8.9), stringsAsFactors = FALSE)
5 my.dataset
6 my.dataset[3, 2]
7 my.dataset$pH
8 # subsetting with conditions
9 my.dataset[my.dataset$pH > 7, ]
10 my.dataset[my.dataset$pH > 7, "site"]
11 my.dataset[my.dataset$season == "Summer", c("site", "pH")]
12 # Is it possible to refer to the columns directly?
13 my.dataset[pH > 7, ]
14 # This is only possible if you `attach` the dataset
15 attach(my.dataset)
16 my.dataset[pH > 7, ]
17 season
18 my.dataset[site=='B', ]
19 # To go back, use `detach`
20 detach(my.dataset)
21 season
22 # it is much safer to use `subset`
23 subset(my.dataset, pH > 8)
24 subset(my.dataset, season=="Summer", select=c(season,pH))
25 # change values in the dataframe, e.g., sum 1 to the pH values of all summer rows
26 my.dataset[my.dataset$season == "Summer", 'pH'] <-
27   my.dataset[my.dataset$season == "Summer", 'pH'] + 1
28
29 subset(my.dataset, season=="Summer", select=c(season,pH))
30
```

# DATA FRAMES (7)

- Some other operations on R:

#1- add new column to the data frame, must be the same number of rows

```
my.dataset$N03 <- c(234.5, 256.6, 654.1, 356.7, 776.4)
```

#2- check number of rows

```
nrow(my.dataset)
```

#3- check number of columns

```
ncol(my.dataset)
```

#4- check dimension

```
dim(my.dataset)
```

#5- edit the existing dataset

```
my.dataset <- edit(my.dataset)
```

#6- create new dataset and open it in the edit mode

```
new.data <- edit(data.frame())
```

#7- check names of the columns

```
names(my.dataset)
```

#8- change names of the columns

```
names(my.dataset) <- c("area", "season", "pH", "N03")
```

# KEY TAKEAWAYS

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- Matrices and Arrays are tabular forms that hold data from the same types
- Lists are like vectors, but for heterogeneous data types
- Data frames are the most commonly used data structure in R
- Data frames combine features of lists and matrices together

# RECOMMENDED READING

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- You are recommended to read section 3.5 from the following online book:
  - <https://rafalab.github.io/dsbook/r-basics.html#data-frames>
- Also, you may check some of the following links for some tutorial about data frames:
  - <https://www.datamentor.io/r-programming/data-frame/>
  - <http://www.r-tutor.com/r-introduction/data-frame>
  - [https://www.tutorialspoint.com/r/r\\_data\\_frames.htm](https://www.tutorialspoint.com/r/r_data_frames.htm)

# ANNOUNCEMENTS

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- Unit readiness test is available, due on Sunday 7<sup>th</sup> of March
- The solutions of the weekly lab exercises will be available every subsequent Monday.
- The census date is due this Friday, 5<sup>th</sup> of March