#### 2. R Foundations - Lists and Functions

Data Science for OR - J. Duggan

## Recap - R Data Types

	Homogenous	Heterogenous
2d	Atomic Vector Matrix Array	<b>List</b> Data Frame/Tibble

- Lists are different from atomic vectors because their elements can be of any type, including lists.
- list() creates a list, instead of c()

### **Creating a list**

## \$ : chr "a"

## \$ : logi [1:3] TRUE FALSE TRUE ## \$ : num [1:3] 1.2 1.3 1.4

```
x <- list(1:3, "a", c(T,F,T), c(1.2, 1.3, 1.4))
str(x)
## List of 4
## $ : int [1:3] 1 2 3</pre>
```

### **Subsetting Lists**

- Works in the same way as subsetting an atomic vector
- Using [ will always return a list
- [[ and \$ pull out the contents of a list
- If list x is a train carrying objects, then x[[5]] is the object in car 5,
   x[4:6] is a train of cars 4-6" @RLangTip



### **E**xample

```
x \leftarrow list(1:3, c(T,F,T))
x[1]
## [[1]]
## [1] 1 2 3
str(x[1])
## List of 1
## $ : int [1:3] 1 2 3
x[[1]]
## [1] 1 2 3
str(x[[1]])
   int [1:3] 1 2 3
```

### Naming list elements

```
x <- list(el1=1:3, el2=c(T,F,T))
x

## $el1
## [1] 1 2 3
##
## $el2</pre>
```

TRUE FALSE TRUE

## [1]

### The \$ operator

- \$ is a shorthand operator, where x\$y is equivalent to x[["y",exact=FALSE]]
- Often used to access variables in a data frame
- \$ does partial matching

```
## $el1
## [1] 1 2 3
##
## $el2
## [1] TRUE FALSE TRUE

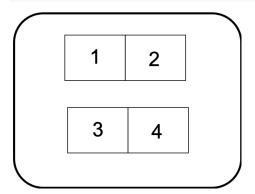
x$el1
## [1] 1 2 3
```

x\$el2

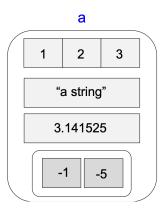
### **Visualising Lists**

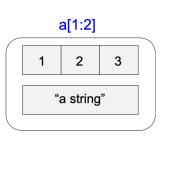
- Lists have rounded corners.
- Atomic vectors have square corners
- Children are drawn inside their parent, and have a slightly darker background

$$y \leftarrow list(c(1,2),c(3,4))$$



### **Further List Example**





### Summarising the list structure

```
## List of 4
## $ el1: int [1:3] 1 2 3
## $ el2: chr "a string"
## $ el3: num 3.14
## $ el4:List of 2
## ..$: num -1
## ..$: num -5
```

str(a)

### **Exploring element 4**

\$ el4:List of 2

```
str(a[4])
```

##

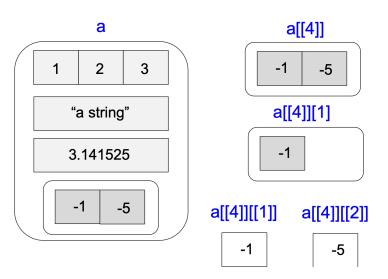
## List of 1

```
## ..$ : num -1
## ..$ : num -5
         а
                                a[4]
         2
               3
      "a string"
      3.141525
            -5
                             -1
                                  -5
```

### **Exploring the fourth element (a list)**

```
str(a[[4]])
## List of 2
## $ : num -1
## $ : num -5
str(a[[4]][1])
## List of 1
   $: num -1
str(a[[4]][[1]])
    num -1
##
str(a[[4]][[2]])
    num -5
```

### Visualising these operations



### Challenge 2.1

```
11 <- list(1:4,list(2:4,c(T,F,T)),1:10)</pre>
```

- What is the structure of I1[[2]]?
- What is the structure of I1[[2]][1]?
- Sum all of the elements of the first element of the embedded list
- Explain the following result

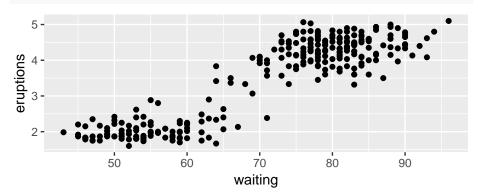
```
unlist(11[[2]])
```

```
## [1] 2 3 4 1 0 1
```

### **Using Lists**

- Are the basis of many S3 objects that are returned from regression functions (e.g. linear regression)
- The basis for data frames (the \$ operator identifies columns)

```
ggplot(data=faithful)+
geom_point(aes(x=waiting,y=eruptions))
```



### Im function - Returns a list of 12

```
mod <- lm(eruptions ~ waiting, data=faithful)
mod$coefficients
## (Intercept) waiting
## -1.87401599 0.07562795
class(mod)
## [1] "lm"
coefficients (mod)
## (Intercept) waiting
## -1.87401599 0.07562795
str(coefficients(mod))
   Named num [1:2] -1.874 0.0756
##
```

## - attr(\*, "names") = chr [1:2] "(Intercept)" "waiting"

### **Summary - Lists**

- Lists are vectors, but can store many different types
- [] returns a subset of a list (as a list),
- [[]] returns the list contents
- The function unlist() will convert a list to an atomic vector
- The tag (\$) operator is very useful (and used in data frames)
- In regression (and other machine learning algorithms in R), result information is returned as a list

#### **Functions**

- A function is a group of instructions that:
  - takes input,
  - uses the input to compute other value, and
  - returns a result (Matloff 2009).
- Functions are a fundamental building block of R
- Users of R should adopt the habit of creating simple functions which will make their work more effective and also more trustworthy (Chambers 2008).
- Functions:
  - are declared using the function reserved word
  - are objects

#### **General Form**

- function (arguments) expression
- arguments gives the arguments, separated by commas.
- Expression (body of the function) is any legal R expression, usually enclosed in { }
- Last evaluation is returned
- return() can also be used, but usually for exceptions.

```
f <- function(x)x^2 # this function squares a vector f(1:3)
```

```
## [1] 1 4 9
```

### Challenge 2.2

Write an R function (evens) that filters a vector to return all the even numbers. Use the modulus operator %%, and also logical filtering of vectors.

```
x <- 1:6
x
## [1] 1 2 3 4 5 6
y <- evens(x)
y
```

## [1] 2 4 6

### **Function Arguments**

- It is useful to distinguish between formal arguments and the actual arguments
  - Formal arguments are the property of the function
  - Actual arguments can vary each time the function is called.
- When calling functions, arguments can be specified by
  - Complete name
  - Partial name
  - Position
- Guidelines (Wickham 2015)
  - Use positional mapping for the first one or two arguments (most commonly used)
  - Avoid using positional mapping for less commonly used attributes
  - Named arguments should always come after unnamed arguments

### **Function Arguments - Example**

```
f1 <- function(arg1, arg2, arg3) arg1 * arg2 + arg3
f1(2, 3, 4) # positional
## [1] 10
f1(2, arg3=4,3) # name for arg3
## [1] 10
f1(arg3=4, arg2=3, 2) # name for arg2, arg3
## [1] 10
```

### **Default Arguments**

- Function arguments in R can have default values
- R function arguments are "lazy" only evaluated if actually used

```
g \leftarrow function(a=1,b=2) c(a,b)
g()
## [1] 1 2
g(10)
## [1] 10 2
g(10,20)
## [1] 10 20
```

### **Functions are objects**

- Functions are first class objects, so they can be passed to other functions
- Provides flexibility, and widely used in R

```
f1 <- function(f,v)f(v) # f is a function object
f1(min,c(2,4,6,7))
## [1] 2
f1(max,c(2,4,6,7))</pre>
```

## [1] 7

### Challenge 2.3

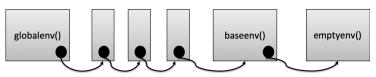
Write a function that takes in a vector and returns a vector with no duplicates. Make use of the R function duplicated().

```
x <- c(1, 2, 3, 4, 5, 1)
duplicated(x)
```

## [1] FALSE FALSE FALSE FALSE TRUE

#### **Environments**

- Environments can be thought of as consisting of two things: a frame, which is a set of symbol-value pairs, and an enclosure, a pointer to an enclosing environment
- Every object (variable or function) in an environment has a unique name
- The working environment is known as the Global Environment
- Environments form a tree structure. The tree of environments is rooted in an empty environment, available through emptyenv(), which has no parent



# Using search() to explore the hierarchy

#### **Functions and Environments**

- Functions are first class objects that exist in an environment
- Functions can access all variables contained in their enclosing environment
- If a name isn't defined inside a function, R will look one level up to the enclosing environment

```
x <- 2
g <- function(){
    y <- 1
    c(x,y)
}</pre>
```

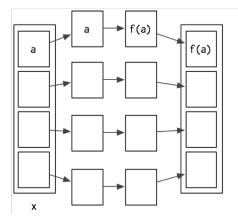
## [1] 2 1

### **Functionals**

- A functional is a function that takes a function as an input and returns a vector as output
- Commonly used as an alternative for loops
- Common ones
  - sapply()
  - apply()
  - lapply()

## Common Pattern (Wickham 2015)

- Create a container for output
- Apply f() to each component of the list
- Fill the container with the results



### sapply()

- The general form of the sapply(x,f,fargs) function is as follows:
  - x is the target vector or list
  - **f** is the function to be called and applied to each element
  - fargs are the optional set of arguments that can be applied to the function f.
- sapply() returns a vector

```
x <- 1:3
y <- sapply(x,function(v)v*2)
y</pre>
```

## [1] 2 4 6

# apply() - process matrices/data frames

The general form of this function is apply(m, dimcode, f, fargs), where: - m is the target matrix - dimcode identifies whether it's a row or column target. The number 1 applies to rows, whereas 2 applies to columns - f is the function to be called, and fargs are the optional set of arguments that can be applied to the function f.

```
m <- matrix(1:10,nrow = 2)
m

## [,1] [,2] [,3] [,4] [,5]
## [1,] 1 3 5 7 9
## [2,] 2 4 6 8 10
apply(m,1,sum) # sum the row</pre>
```

apply(m,2,sum) # sum the columns

## [1] 25 30

### **Summary - Functions**

- Functions are a fundamental building block of R
- Functions:
  - are declared using the function reserved word
  - are objects
- Functions can access variables within the environment where they are created
- Functionals are functions that takes a function as an input and returns a vector as output (can be used as a looping structure)
- The apply family in R are functionals (apply, sapply, lapply)
- The package purrr is now being used instead of apply