

RAdvanced Lists

PhD Toolbox - R introductory course - stream II
Martino ADAMO
Matteo CHIALVA





object class:list

A list is a group of any type of objects (vector, matrix, data.frame)

- function is **list()**, each object in the list can be identified by a name

```
> vector <- rep(c("A", "B"), 2, each=2)

> matrix <- rbind(c(1,2),c(1,2),c(1,2))

> df<-data.frame( "colname_1"=rep(c("A", "B"), 2, each=2),
                  "colname_2"=sample(seq(1,30), 8),
                  "colname_3"=seq(8,11.5, by=0.5))

> my_list<-list("vector"=vector, "matrix"=matrix, "dataframe"=df)

> str(my_list)
List of 3
 $ vector   : chr [1:8] "A" "A" "B" "B" ...
 $ matrix    : num [1:3, 1:2] 1 1 1 2 2 2
 $ dataframe:'data.frame':8 obs. of  3 variables:
 ..$ colname_1: chr [1:8] "A" "A" "B" "B" ...
 ..$ colname_2: int [1:8] 7 24 20 23 22 25 1 10
 ..$ colname_3: num [1:8] 8 8.5 9 9.5 10 10.5 11 11.5
```



rows/columns/object indexing in lists

select element in list

```
> my_list[[1]] # positional selection (select the first element)  
[1] "A" "A" "B" "B" "A" "A" "B" "B"
```

```
> my_list[["df"]] # selection by name  
   colname_1 colname_2 colname_3  
1      A       13     8.0  
2      A        5     8.5  
3      B       20     9.0  
4      B       21     9.5  
5      A        9    10.0  
6      A       28    10.5  
7      B        8    11.0  
8      B       12    11.5
```



rows/columns/object indexing (lists)

select column in a dataframe included in a list

```
> my_list[["df"]]$colname_1  
[1] "A" "A" "B" "B" "A" "A" "B" "B"
```

select rows (or columns) in element included in a list

```
> my_list[["df"]][1:5,]  
  colname_1 colname_2 colname_3  
1       A       13     8.0  
2       A        5     8.5  
3       B       20     9.0  
4       B       21     9.5  
5       A        9    10.0
```



Why to work with lists in R

Few....but worth reasons!

- reduce lines of code
- Enhance reproducibility in your data analysis
 - functions are applied simultaneously to all list elements
(less prone to human errors)
- speed-up complex data analysis (also with multi-core functions)
- The only way to go when dealing with hundreds separate datasets



functions to work with lists

Main functions are:

- `list()`
- `lapply()`
- `sapply`
- `unlist()`
- `do.call() / rbindlist`



lapply()

list-apply

We first need to introduce the apply() function

What it does?

Takes a matrix or data.frame in input and applies functions to it **column-wise** or **row-wise**

```
> m1 <- matrix(1:10, nrow=5, ncol=6)
```

```
> m1
```

```
      [,1] [,2] [,3] [,4] [,5] [,6]  
[1,]    1    6    1    6    1    6  
[2,]    2    7    2    7    2    7  
[3,]    3    8    3    8    3    8  
[4,]    4    9    4    9    4    9  
[5,]    5   10    5   10    5   10
```



apply()

We first need to introduce the apply() function. Not really....

`apply(object, margin, function)`

```
# margin=1 applies function by row
> apply(m1, 1, sum)
[1] 21 27 33 39 45

# margin=2 applies function by column
> apply(m1, 2, sum)
[1] 15 40 15 40 15 40
```

	[,1]	[,2]	[,3]	[,4]	[,5]	[,6]
[1,]	1	6	1	6	1	6
[2,]	2	7	2	7	2	7
[3,]	3	8	3	8	3	8
[4,]	4	9	4	9	4	9
[5,]	5	10	5	10	5	10

= 21

= 27

= 33

= 39

= 45

15 40 15 40 15 40

“apply is simpler only if your data are already simpler than reality.”



apply()

We first need to introduce the apply() function

```
apply( object, margin, function )
```

```
# with custom functions
> apply(m1, 2, function(x) x+1)

 [,1] [,2] [,3] [,4] [,5] [,6]
[1, ]    2     7     2     7     2     7
[2, ]    3     8     3     8     3     8
[3, ]    4     9     4     9     4     9
[4, ]    5    10     5    10     5    10
[5, ]    6    11     6    11     6    11
```

Note: `apply()` returns a vector or a matrix/dataframe depending on the input and the function applied.



lapply()

the workhorse of iteration in R

What it does?

Applies a function to list/vector of elements. Functions are applied to each element individually.

lapply(object, function)

```
# a simple example on a vector
```

```
> vector<-c(1,2,3,4)
```

```
> lapply_output<-lapply(vector, function(x) x+100)
```

```
> str(lapply_output)
```

```
List of 4
```

```
$ : num 101  
$ : num 102  
$ : num 103  
$ : num 104
```

```
> unlist(lapply_output)
```

```
[1] 101 102 103 104
```



lapply()

list-apply

What it does?

Applies a function to list/vector of elements. Functions are applied to each element individually.

lapply(object, function)

```
# a simple example on list

# generate a list from two simple vectors
> fruits=c("banana", "apple", "apricot", "peach")
> colors=c("yellow", "red", "orange", "pink")

> items<-list(fruits=fruits,colors=colors)

> items
$fruits
[1] "banana"   "apple"     "apricot"   "peach"

$colors
[1] "yellow"   "red"       "orange"    "pink"
```



lapply()

list-apply

What it does?

Applies a function to list/vector of elements. Functions are applied to each element individually.

lapply(object, function)

```
# a simple example on list
```

```
> lapply(items, length)
```

```
$fruits
```

```
[1] 4
```

```
$colors
```

```
[1] 4
```



lapply()

list-apply

What it does?

Applies a function to list/vector of elements. Functions are applied to each element individually.

lapply(object, function)

```
# a simple example on list using custom functions

> lapply(items, function(x) str_length(x))
$fruits
[1] 6 5 7 5

$colors
[1] 6 3 6 4
```



lapply()

lapply() is useful mostly when you have list of data.frames!

If you want to recursively work on data.frames in a list, they must contain the same columns

```
# create a list of two dataframes
> list_df<-list(df_1=df_1, df_2=df_1)
                df_1<-data.frame(
                  fruits=fruits, colors=colors)

> list_df
$df_1
  fruits colors
1  banana yellow
2    apple     red
3 apricot orange
4   peach    pink

$df_2
  fruits colors
1  banana yellow
2    apple     red
3 apricot orange
4   peach    pink
```



lapply()

lapply() is useful mostly when you have list of data.frames!

```
# list class of each elements in the list
> lapply(list_df, class)
$df_1
[1] "data.frame"

$df_2
[1] "data.frame"

# count words length in the first column of each element
> lapply(list_df, function(x) str_length(x[,1]))
$df_1
[1] 6 5 7 5

$df_2
[1] 6 5 7 5
```



lapply()

lapply() is useful mostly when you have list of data.frames!

```
# select columns in a list of data.frames

> lapply(list_df, "[", c(2))
$df_1
  colors
1 yellow                      # by column name
2   red
3 orange
4   pink

$df_2
  colors
1 yellow
2   red
3 orange
4   pink

# using tidyverse grammar
>lapply(list_df, function(x) x %>%
  select(fruits))
```



sapply()

simplified apply

What it does?

Applies a function to list/vector of elements

sapply(object, function)

```
# sapply  
# same as lapply but returns a vector  
> sapply(list, function(x) str_length(x))  
  
fruits colors  
[1,]      6      6  
[2,]      5      3  
[3,]      7      6  
[4,]      5      4
```



Map()

What it does? It applies a function to the corresponding (aligned) elements of given vectors (or lists).

Map(function, item_1, item_2)

```
# Map object name to a column  
  
> Map( cbind, list_df, new_col=names(list_df) )
```

item_1

```
$df_1  
  fruits colors  
1 banana yellow  
2 apple   red  
3 apricot orange  
4 peach   pink
```

item_2

```
> names(list df)  
[1] "df_1" "df_2"
```

```
$df_2  
  fruits colors  
1 banana yellow  
2 apple   red  
3 apricot orange  
4 peach   pink
```

Output

```
$df_1  
  fruits colors new_col  
1 banana yellow   df_1  
2 apple   red    df_1  
3 apricot orange df_1  
4 peach   pink   df_1
```

```
$df_2  
  fruits colors new_col  
1 banana yellow   df_2  
2 apple   red    df_2  
3 apricot orange df_2  
4 peach   pink   df_2
```



Map()

Map applies a function to the corresponding (aligned) elements of given vectors (or lists).

Map(function, item_1, item_2)

```
# Map object name to a column
```

```
> Map(cbind, list_df, new_col=names(list_df))
```

```
$df_1
  fruits colors new_col
1  banana   yellow    df_1
2   apple      red    df_1
3 apricot   orange    df_1
4   peach     pink    df_1
```

```
$df_2
  fruits colors new_col
1  banana   yellow    df_2
2   apple      red    df_2
3 apricot   orange    df_2
4   peach     pink    df_2
```

```
> lapply(  list_df, function(x) cbind(x,
                                         new_col=names(list_df)) )
```

```
$df_1
  fruits colors new_col
1  banana   yellow    df_1
2   apple      red    df_2
3 apricot   orange    df_1
4   peach     pink    df_2
```

```
$df_2
  fruits colors new_col
1  banana   yellow    df_1
2   apple      red    df_2
3 apricot   orange    df_1
4   peach     pink    df_2
```

**unwanted
behavior!**



multi-core versions

library(parallel) implements parallelized version of many functions

mclapply(..., mc.cores=n)

mcMap(..., mc.cores=n)

...

When are they useful?

- your dataset is really big and your standard function takes too long to run
- when using functions which query a remote database (you can forward multiple queries at once)



do.call()

What it does?

Calls a function on a list of arguments.

`do.call(function, list)`

`lapply()`: function is applied to each element of a list

`do.call()`: function is applied only one time with the arguments provided (list)

```
> do.call(sum, list(1,1))
```

```
[1] 2
```

```
> do.call(sum, list(c(1,1), c(1,1)))
```

```
[1] 4
```

```
> lapply(list(c(1,1), c(1,1)), sum)
```

```
[[1]]  
[1] 2
```

```
[[2]]  
[1] 2
```



do.call() - Collapse lists

An example use case on lists:

You have done your analysis or summarized your data and you need to collapse your list

`do.call()`

```
> list_df
$df_1
  fruits colors
1  banana yellow
2    apple     red
3 apricot orange
4   peach    pink

$df_2
  fruits colors
1  banana yellow
2    apple     red
3 apricot orange
4   peach    pink

> do.call(rbind, list_df)
      fruits colors
df_1.1  banana yellow
df_1.2    apple     red
df_1.3 apricot orange
df_1.4   peach    pink
df_2.1  banana yellow
df_2.2    apple     red
df_2.3 apricot orange
df_2.4   peach    pink
```

rbindlist() - Collapse lists

You have done your analysis or summarized your data and you need to collapse your list

The modern way:

```
> dplyr::bind_rows(list_df, .id="df")  
  
> data.table::rbindlist(list_df, idcol = "df")
```

```
      df  fruits colors  
1: df_1  banana yellow  
2: df_1    apple     red  
3: df_1 apricot orange  
4: df_1    peach    pink  
5: df_2  banana yellow  
6: df_2    apple     red  
7: df_2 apricot orange  
8: df_2    peach    pink
```



A real use case example

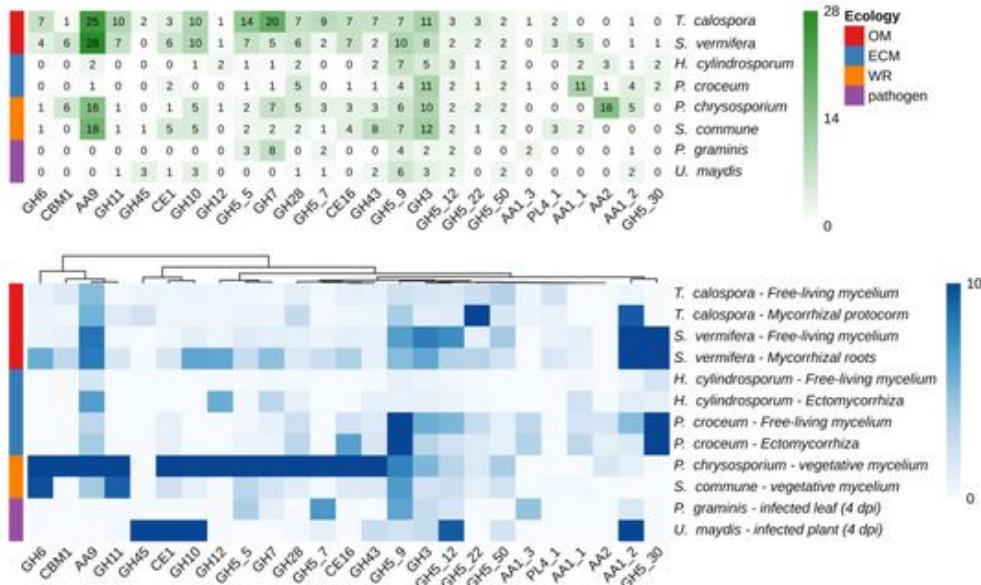
The dataset contains CAZymes genes predictions (enzymes involved in the assembly, modification or deconstruction of carbohydrates) in the transcriptomes of 8 fungal species.

- The software who generated predictions outputs 1 file for each species.

List all the files in your folder

```
>files<-list.files(pattern =  
".txt")
```

Adamo, Chialva et al., 2020.





A real use case example

Import all the files listed in the object files into a list

- for each elements in the field vector do the read.delim() function
- be careful since text files has an header



A real use case example

Import all the files listed in the object files into a list

- for each elements in the field vector do the read.delim() function
- be careful since text files has an header

```
# import multiple predictions in a list at once  
> pred <- lapply(files, function(x) read.delim(x, header = T))
```



A real use case example

Assign the species names to each elements in the list

Suggestion 1: the species name is contained in the names of each file in “file” object.

Suggestion 2: remove “.txt” file extension using str_replace()



A real use case example

Assign the species names to each elements in the list

Suggestion 1: the species name is contained in the names of each file in “file” object.

Suggestion 2: remove “.txt” file extension using str_replace()

```
# assign names to list elements  
> names(pred)<-str_replace(files, ".txt", "")
```



A real use case example

```
##### Filter each data.frame in the list by x.ofTools column >=2
```

- use **filter()**



A real use case example

Add a column in each data.frame indicating the name of the Species

- use **Map()**



A real use case example

```
##### # operations on columns
```

```
# split the Gene.ID column
```

- use **separate()** to split fields in Gene.ID column
- field separator “|” is a special character: use “\\|” to escape



A real use case example

```
##### Collapse the list into a data.frame
```

- use **rbindlist()** or **do.call()**

```
##### export each element of the list into a .tsv file
```

- use **write.table**
- tab separator is “\t”