

Miscellaneous Tips and Tricks in R

EC 425/525, Lab 7

Edward Rubin

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Prologue

Schedule

Last time

Simulation in \mathbb{R}

Today

Helpful tips and tricks in \mathbb{R}

Tips and tricks

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The apply family

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2. That said, sometimes you just gotta loop.

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1. Many functions are vectorized—you can apply a function over a vector.

E.g., the square root of the numbers from 1 to 10: `sqrt(1:10)`.

2. That said, sometimes you just gotta loop.

For these situations, `base` R offers a family of `apply` functions.

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- `FUN` The function you want to evaluate on each value of `x`.

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lapply(X = c("a", "pig"), FUN = toupper)
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`lapply(X = c("a", "pig"), FUN = toupper)` returns `list("A", "PIG")`.

Note This is a silly example, as you can directly use `toupper()` on vectors.

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Your options for `MARGIN` are `1` for rows and `2` for columns.

Example Let's find the maximum value in each row of a matrix.

```
# Create a matrix
ex_matrix ← matrix(data = 1:16, nrow = 4, byrow = T)
# Find the maximum value in each row.
apply(X = ex_matrix, MARGIN = 1, FUN = max)
```

```
#> [1]  4  8 12 16
```

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Example Random normal draws with different means and variances.

```
mapply(FUN = rnorm, n = 1, mean = c(0, 10, 20), sd = 1:3)
```

```
#> [1] 0.9761572 8.0805632 20.0179475
```

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Alternatively, you define your own function at `FUN`, *e.g.*,

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```
lapply(X = c("a", "pig"), FUN = toupper)
```

Alternatively, you define your own function at `FUN`, e.g.,

```
lapply(X = 1:2, FUN = function(i) {i > 1})
```

```
#> [[1]]  
#> [1] FALSE  
#>  
#> [[2]]  
#> [1] TRUE
```

Tips and tricks

Other packages

Other packages offer similar (and parallelized) functions.

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`lapply()`

`apply()`

`mapply()`

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parallel

`mclapply()`

`mcapply()`

`mcmapply()`

Tips and tricks

`for()` loops

However, if you're really committed to running for loops, the syntax is

```
# Create an empty vector
our_vector ← c()
# Run the for loop for some numbers
for (i in c(1, 1, 2, 3, 5, 8)) {
  # Print 'i'
  print(i)
  # Append 'i' to the end of our_vector
  our_vector ← c(our_vector, i)
})
```

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List output

```
lapply(  
  X = 1:2,  
  FUN = as.character  
)
```

```
#> [[1]]  
#> [1] "1"  
#>  
#> [[2]]  
#> [1] "2"
```

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Lists (e.g., as outputted by `lapply()`) can be helpful—but they can also be fairly annoying. Enter `unlist()`.

List output

```
lapply(  
  X = 1:2,  
  FUN = as.character  
)
```

```
#> [[1]]  
#> [1] "1"  
#>  
#> [[2]]  
#> [1] "2"
```

`unlist()`-ing to vector

```
lapply(  
  X = 1:2,  
  FUN = as.character  
) %>% unlist()
```

```
#> [1] "1" "2"
```

Tips and tricks

From lists to data frames

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In this case, you can use `bind_rows()` or `bind_cols()` from `dplyr`.

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From lists to data frames

Sometimes you don't want to entirely `unlist()` a list.

For example, you might have a list of data frames that you want to bind into a new data frame.

In this case, you can use `bind_rows()` or `bind_cols()` from `dplyr`.

Alternatively, you might be able to make use of `map_dfr()` or `map_df()`.

Tips and tricks

Indexing lists

Also Don't forget that you can index lists using double-brackets.

```
# Capitalize the alphabet  
our_list ← lapply(X = letters, FUN = toupper)  
# The third letter  
our_list[[3]]
```

```
#> [1] "C"
```

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Logical vectors and `which()`

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`which()` tells you *which* of the entries in a logical vector are `TRUE`, *i.e.*, *which* element—or elements—satisfies your logical condition(s).

```
letters
```

```
#>  [1] "a" "b" "c" "d" "e" "f" "g" "h" "i" "j" "k" "l" "m" "n" "o" "p" "q"  
#> [18] "r" "s" "t" "u" "v" "w" "x" "y" "z"
```



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```

```
letters > "m"
```

```
#> [1] FALSE FALSE FALSE FALSE FALSE FALSE FALSE FALSE FALSE FALSE FALSE  
#> [12] FALSE FALSE TRUE TRUE TRUE TRUE TRUE TRUE TRUE TRUE TRUE TRUE  
#> [23] TRUE TRUE TRUE TRUE
```

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```

```
which(letters > "m")
```

```
#> [1] 14 15 16 17 18 19 20 21 22 23 24 25 26
```

```
letters
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#> [1] "a" "b" "c" "d" "e" "f" "g" "h" "i" "j" "k" "l" "m" "n" "o" "p" "q"  
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```
which(letters > "m")
```

```
#> [1] 14 15 16 17 18 19 20 21 22 23 24 25 26
```

```
letters[which(letters > "m")]
```

```
#> [1] "n" "o" "p" "q" "r" "s" "t" "u" "v" "w" "x" "y" "z"
```

Alternatively, we could have just used the logical vector.

```
letters
```

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Tips and tricks

Logical vectors, continued

This logic-based selection works on many classes of objects, but it may change the class/structure of the object.

```
# Create a matrix  
mat ← matrix(1:9, ncol = 3)  
# Print it out  
mat
```

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

```
# Is the entry even?
mat %% 2 == 0
```

```
#>      [,1] [,2] [,3]
#> [1,] FALSE TRUE FALSE
#> [2,]  TRUE FALSE  TRUE
#> [3,] FALSE TRUE  FALSE
```

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#> [2,]  TRUE FALSE  TRUE
#> [3,] FALSE  TRUE FALSE
```

```
# Print the even entries
mat[mat %% 2 == 0]
```

```
#> [1] 2 4 6 8
```

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Tips and tricks

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