

# Advanced Loops

STAT 133

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# Advanced Looping

# Outline

- ▶ Vectorizing a function
- ▶ Loops over elements of data structures

# Motivation

```
# fahrenheit to celsius  
to_celsius <- function(x) {  
  (x - 32) * (5/9)  
}
```

The function `to_celsius()` happens to be a vectorized function:

```
to_celsius(c(32, 40, 50, 60, 70))  
  
## [1] 0.000000 4.444444 10.000000 15.555556 21.111111
```

# Motivation

- ▶ In general, R functions defined on scalar values are expected to be vectorized
- ▶ You should have noticed that many functions in R are vectorized

# Motivation

What happens in this situation?

```
# trying to_celsius() on a list  
to_celsius(list(32, 40, 50, 60, 70))
```

# Motivation

```
# trying to_celsius() on a list  
to_celsius(list(32, 40, 50, 60, 70))  
  
## Error in x - 32: non-numeric argument to binary  
operator
```

to\_celsius() does not work with a list

# Motivation

One solution is to use a **for** loop:

```
temps_farhenheit <- list(32, 40, 50, 60, 70)

temps_celsius <- numeric(5)
for (i in 1:5) {
  temps_celsius[i] <- to_celsius(temps_farhenheit[[i]])
}

temps_celsius

## [1] 0.000000 4.444444 10.000000 15.555556 21.111111
```



# Vectorizing Functions - Vectors

- ▶ R provides a set of functions to “vectorize” functions over the elements of data structures:
  - `lapply()`, `sapply()`, `apply()`, etc
- ▶ These functions allow us to avoid writing loops
- ▶ These are functions that have grown organically
- ▶ They have common names but unfortunately not all of them use the same arguments naming conventions

`lapply()`

# Loops over vectors or lists

- ▶ The simplest apply function is `lapply()`
- ▶ `lapply()` stands for **list apply**
- ▶ It takes a list or vector and a function as inputs
- ▶ It applies the function to each element of the list
- ▶ The output is another list

# lapply()

```
players <- list(  
  warriors = c('kurry', 'iguodala', 'thompson', 'green'),  
  cavaliers = c('james', 'shumpert', 'thompson'),  
  rockets = c('harden', 'howard')  
)
```

```
lapply(players, length)
```

```
## $warriors  
## [1] 4  
##  
## $cavaliers  
## [1] 3  
##  
## $rockets  
## [1] 2
```

# lapply()

```
# convert to upper case
lapply(players, toupper)

## $warriors
## [1] "KURRY"      "IGUODALA" "THOMPSON" "GREEN"
##
## $cavaliers
## [1] "JAMES"      "SHUMPERT" "THOMPSON"
##
## $rockets
## [1] "HARDEN" "HOWARD"
```

# lapply()

You can pass arguments to the applied functions

```
# collapsing with paste()  
lapply(players, paste, collapse = '-')  
  
## $warriors  
## [1] "kurry-iguodala-thompson-green"  
##  
## $cavaliers  
## [1] "james-shumpert-thompson"  
##  
## $rockets  
## [1] "harden-howard"
```

# lapply()

You can pass your own functions

```
num_chars <- function(x) {  
  nchar(x)  
}
```

```
lapply(players, num_chars)
```

```
## $warriors  
## [1] 5 8 8 5  
##  
## $cavaliers  
## [1] 5 8 8  
##  
## $rockets  
## [1] 6 6
```

# Anonymous functions

You can define a function with no name (i.e. anonymous function):

```
# anonymous function
lapply(players, function(x) paste('mr', x))

## $warriors
## [1] "mr kurry"      "mr iguodala" "mr thompson" "mr green"
##
## $cavaliers
## [1] "mr james"      "mr shumpert" "mr thompson"
##
## $rockets
## [1] "mr harden" "mr howard"
```



# Anonymous functions

```
# anonymous function  
lapply(players, function(x) grep('a', x, value = TRUE))  
  
## $warriors  
## [1] "iguodala"  
##  
## $cavaliers  
## [1] "james"  
##  
## $rockets  
## [1] "harden" "howard"
```

# lapply()

Remember that a `data.frame` is internally stored as a list:

```
df <- data.frame(  
  name = c('Luke', 'Leia', 'R2-D2', 'C-3PO'),  
  gender = c('male', 'female', 'male', 'male'),  
  height = c(1.72, 1.50, 0.96, 1.67),  
  weight = c(77, 49, 32, 75)  
)
```

# lapply()

Remember that a `data.frame` is internally stored as a list:

```
lapply(df, class)
```

```
## $name  
## [1] "factor"  
##  
## $gender  
## [1] "factor"  
##  
## $height  
## [1] "numeric"  
##  
## $weight  
## [1] "numeric"
```

sapply()

# Loops over vectors or lists

- ▶ `sapply()` is a modified version of `lapply()`
- ▶ `sapply()` stands for **simplified apply**
- ▶ It takes a list or vector and a function as inputs
- ▶ It applies the function to each element of the list
- ▶ `sapply()` attempts to simplify the output (possibly as a vector or list)

# sapply()

```
players <- list(  
  warriors = c('kurry', 'iguodala', 'thompson', 'green'),  
  cavaliers = c('james', 'shumpert', 'thompson'),  
  rockets = c('harden', 'howard')  
)
```

```
sapply(players, length)
```

```
## warriors cavaliers rockets  
##          4          3          2
```

# sapply()

```
sapply(players, nchar)
```

```
## $warriors  
## [1] 5 8 8 5  
##  
## $cavaliers  
## [1] 5 8 8  
##  
## $rockets  
## [1] 6 6
```

when the output cannot be simplified, `sapply()` returns the same output as `lapply()`

`apply()`



# Loops on matrices (or arrays)

Consider a matrix:

```
(m <- matrix(1:20, 4, 5))
```

```
##      [,1] [,2] [,3] [,4] [,5]  
## [1,]    1    5    9   13   17  
## [2,]    2    6   10   14   18  
## [3,]    3    7   11   15   19  
## [4,]    4    8   12   16   20
```

How can we get the median of each row?

# Loops on matrices (or arrays)

We could write something like this (not recommended)

```
medians <- numeric(nrow(m))  
  
medians[1] <- median(m[1, ])  
medians[2] <- median(m[2, ])  
medians[3] <- median(m[3, ])  
medians[4] <- median(m[4, ])
```

# Loops on matrices (or arrays)

Repetition is error prone:

```
medians <- numeric(nrow(m))  
  
medians[1] <- median(m[1, ])  
medians[2] <- median(m[2, ])  
medians[3] <- median(m[2, ])  
medians[4] <- median(m[4, ])
```

# Loops on matrices (or arrays)

We could also write a for loop

```
medians <- numeric(nrow(m))

for (r in 1:nrow(m)) {
  medians[r] <- median(m[r, ])
}

medians

## [1]  9 10 11 12
```

Or we could use the `apply()` function

# Loops over matrices or arrays

- ▶ `apply()` is perhaps the most popular apply function
- ▶ It takes a matrix or array, an index and a function as inputs
- ▶ Additionally, it can take more arguments
- ▶ The MARGIN index gives the subscript which the function will be applied over
  - MARGIN = 1 indicates rows
  - MARGIN = 2 indicates columns
  - MARGIN = c(1, 2) indicates both rows and columns

# apply()

```
(m <- matrix(1:20, 4, 5))

##      [,1] [,2] [,3] [,4] [,5]
## [1,]    1    5    9   13   17
## [2,]    2    6   10   14   18
## [3,]    3    7   11   15   19
## [4,]    4    8   12   16   20
```

```
# median of rows
apply(m, 1, median)
```

```
## [1]  9 10 11 12
```

# apply()

```
(m <- matrix(1:20, 4, 5))  
  
##      [,1] [,2] [,3] [,4] [,5]  
## [1,]    1    5    9   13   17  
## [2,]    2    6   10   14   18  
## [3,]    3    7   11   15   19  
## [4,]    4    8   12   16   20  
  
# median of columns  
apply(m, 2, median)  
  
## [1]  2.5  6.5 10.5 14.5 18.5
```

# apply()

apply() can be used on data frames

```
# mean height and weight (on columns)  
apply(df[,c('height', 'weight')], 2, mean)  
  
## height weight  
## 1.4625 58.2500
```



# apply()

apply() can be used on data frames

```
# product of height and weight (on rows)  
apply(df[,c('height', 'weight')], 1, prod)  
  
## [1] 132.44 73.50 30.72 125.25
```

`tapply()`

# Loops over vectors split by a factor

- ▶ `tapply()`
- ▶ the name does not mean anything
- ▶ very useful to **aggregate** data

# tapply()

Say you need to obtain average height and weight by gender

```
df

##      name gender height weight
## 1  Luke   male   1.72     77
## 2  Leia female   1.50     49
## 3 R2-D2   male   0.96     32
## 4 C-3P0   male   1.67     75
```

# Without `tapply()`

```
# mean height by gender  
mean(df$height[df$gender == 'female'])  
  
## [1] 1.5  
  
mean(df$height[df$gender == 'male'])  
  
## [1] 1.45
```

## Without `tapply()`

```
# mean weight by gender  
mean(df$weight[df$gender == 'female'])  
  
## [1] 49  
  
mean(df$weight[df$gender == 'male'])  
  
## [1] 61.33333
```

# Using `tapply()`

```
# mean height by gender  
tapply(df$height, df$gender, mean)
```

```
## female    male  
##    1.50    1.45
```

```
# mean weight by gender  
tapply(df$weight, df$gender, mean)
```

```
##    female      male  
## 49.00000 61.33333
```

`mapply()`



# Multiple-Input Apply

- ▶ `lapply()` only accepts a single vector or list to loop over
- ▶ `lapply()` does not give you access to the names of the elements
- ▶ `mapply()` solves this issues

# Multiple-Input Apply

- ▶ `mapply()` stands for **m**ultiple **a**rgument **l**ist **a**pply
- ▶ it lets you pass in as many vectors as you like
- ▶ the first argument is the function to be applied
- ▶ the following arguments are vectors

# mapply()

```
# pasting player name and team
mapply(paste, players, names(players))

## $warriors
## [1] "kurry warriors"      "iguodala warriors" "thompson warriors"
## [4] "green warriors"
##
## $cavaliers
## [1] "james cavaliers"      "shumpert cavaliers" "thompson cavaliers"
##
## $rockets
## [1] "harden rockets" "howard rockets"
```

# mapply()

How would you generate this list:

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

# mapply()

```
lst <- vector('list', 4)
for (k in 1:4) {
  lst[[k]] <- rep(k, 5-k)
}
lst
```

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

# mapply()

```
# multiple input argument
```

```
mapply(rep, 1:4, 4:1)
```

```
## [[1]]
```

```
## [1] 1 1 1 1
```

```
##
```

```
## [[2]]
```

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

```
##
```

```
## [[3]]
```

```
## [1] 3 3
```

```
##
```

```
## [[4]]
```

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

# apply() Related Functions

# Related Functions

Some convenient functions (faster than using `apply()`)

- ▶ `colMeans()`
- ▶ `rowMeans()`
- ▶ `colSums()`
- ▶ `rowSums()`



## colMeans()

```
# column means of height and weight
colMeans(df[,c('height', 'weight')])

## height weight
## 1.4625 58.2500

# equivalent to:
apply(df[,c('height', 'weight')], 2, mean)

## height weight
## 1.4625 58.2500
```

## rowMeans()

```
# row means of height and weight
rowMeans(df[,c('height', 'weight')])

## [1] 39.360 25.250 16.480 38.335

# equivalent to:
apply(df[,c('height', 'weight')], 1, mean)

## [1] 39.360 25.250 16.480 38.335
```

## rowSums()

```
# row sums of height and weight
rowSums(df[,c('height', 'weight')])

## [1] 78.72 50.50 32.96 76.67

# equivalent to:
apply(df[,c('height', 'weight')], 1, sum)

## [1] 78.72 50.50 32.96 76.67
```

## colSums()

```
# column sums of height and weight
colSums(df[,c('height', 'weight')])

## height weight
##    5.85 233.00

# equivalent to:
apply(df[,c('height', 'weight')], 2, sum)

## height weight
##    5.85 233.00
```

aggregate()

# Apply a function to data subsets

- ▶ `aggregate()` can be thought as a generalization of `tapply()`
- ▶ It splits the data into subsets, and applies a function
- ▶ The subsets must be provided as a list
- ▶ The output is returned in a “convenient” form

# aggregate()

```
df <- data.frame(  
  name = c('Luke', 'Leia', 'R2-D2', 'C-3PO'),  
  gender = c('male', 'female', 'male', 'male'),  
  species = c('human', 'human', 'robot', 'robot'),  
  height = c(1.72, 1.50, 0.96, 1.67),  
  weight = c(77, 49, 32, 75)  
)
```

# aggregate()

```
# mean height and weight by gender  
aggregate(df[,c('height', 'weight')],  
          list(df$gender), mean)
```

```
##   Group.1 height  weight  
## 1  female   1.50 49.00000  
## 2   male    1.45 61.33333
```



# aggregate()

```
# mean height and weight by species  
aggregate(df[,c('height', 'weight')],  
          list(df$species), mean)
```

```
##   Group.1 height weight  
## 1   human  1.610   63.0  
## 2   robot  1.315   53.5
```

# aggregate()

```
# mean height and weight by gender and species  
aggregate(df[,c('height', 'weight')],  
          list(df$gender, df$species), mean)
```

```
##   Group.1 Group.2 height weight  
## 1  female   human  1.500   49.0  
## 2    male   human  1.720   77.0  
## 3    male  robot  1.315   53.5
```

sweep()

# Sweep out array summaries

- ▶ Sometimes we need to sweep out a summary statistic
- ▶ e.g. removing the mean on each column
- ▶ `sweep()` is specially designed for this

## sweep() mean

```
# mean height and weight
hw_mean <- colMeans(df[,c('height', 'weight')])

# centering height and weight
sweep(df[,c('height', 'weight')], 2, hw_mean)

##      height weight
## 1  0.2575  18.75
## 2  0.0375  -9.25
## 3 -0.5025 -26.25
## 4  0.2075  16.75
```

## sweep() median

```
# mean height and weight
hw_median <- apply(df[,c('height', 'weight')], 2, median)

# centering height and weight
sweep(df[,c('height', 'weight')], 2, hw_median)

##    height weight
## 1  0.135      15
## 2 -0.085     -13
## 3 -0.625     -30
## 4  0.085      13
```

R Package "plyr"

# R package "plyr"

- ▶ "plyr" provides alternative functions to the apply-family functions in base R
- ▶ functions in "plyr" are better designed, usually faster, and with better names of arguments
- ▶ Read the paper **The Split-Apply-Combine Strategy for Data Analysis**
- ▶ <http://www.jstatsoft.org/v40/i01>