

DATA 133 - Introduction to Data Science I

Instructor: Renzhi Cao
Computer Science Department
Pacific Lutheran University



Announcements

- Go over Quiz 4
- Continue to work on project 1

Reference book

- R Programming for Data Science. By Roger Peng.
ISBN-10: 1365056821, April 20, 2016.

Learning in today

- R basics - Debugging

Something is wrong

R has a number of ways to indicate to you that something's not right.

- **message**: A generic notification/diagnostic message produced by the `message()` function; execution of the function continues
- **warning**: An indication that something is wrong but not necessarily fatal; execution of the function continues. Warnings are generated by the `warning()` function
- **error**: An indication that a fatal problem has occurred and execution of the function stops. Errors are produced by the `stop()` function.
- **condition**: A generic concept for indicating that something unexpected has occurred; programmers can create their own custom conditions if they want.

Something is wrong

Example:

- $\log(-1)$

Something is wrong

Example:

```
printmessage <- function (x) {  
+   if (x > 0 )  
+     print("x is greater than zero" )  
+   else  
+     print("x is less than or equal to zero" )  
+   invisible(x)  
+ }
```

```
> printmessage(1)
```

```
[1 ] "x is greater than zero"
```

Seems no errors, warnings, or messages

How about:

```
printmessage(NA )
```

Something is wrong

Fixed Example:

```
> printmessage2 <- function (x) {  
+   if (is.na(x))  
+     print("x is a missing value!" )  
+   else if (x > 0 )  
+     print("x is greater than zero" )  
+   else  
+     print("x is less than or equal to zero" )  
+   invisible(x)  
+ }
```

```
> printmessage2(NA )  
[1 ] "x is a missing value!"
```


Something is wrong

Think about the following:

```
> x <- log(c(-1 , 2 ))
```

Warning **in** log(c(-1 , 2)): NaNs produced

```
> printmessage2(x)
```

Warning **in if** (is.na(x)) print("x is a missing value!") **else if** (x > 0)

print("x is greater than zero") **else** print("x is less than or equal to zero"): the condition has length > 1 and only the first element will be used

```
[1] "x is a missing value!"
```

The `printmessage2()` is not vectorized

Something is wrong

One solution:

```
> printmessage3 <- function (x) {  
+   if (length(x) > 1L )  
+     stop("'x' has length > 1" )  
+   if (is.na(x))  
+     print("x is a missing value!" )  
+   else if (x > 0 )  
+     print("x is greater than zero" )  
+   else  
+     print("x is less than or equal to zero" )  
+   invisible(x)  
+ }  
  
> printmessage3(1:2 )  
Error in printmessage3(1:2 ): 'x' has length > 1
```

Something is wrong

Another solution:

```
> printmessage4 <- Vectorize(printmessage2)
> out <- printmessage4(c(-1, 2))
[1] "x is less than or equal to zero"
[1] "x is greater than zero"
```

Figuring out what is wrong

Some basic questions you need to ask are

- What was your input? How did you call the function?
- What were you expecting? Output, messages, other results?
- What did you get?
- How does what you get differ from what you were expecting?
- Were your expectations correct in the first place?
- Can you reproduce the problem (exactly)?

Debugging tools in R

- `traceback()`: prints out the function call stack after an error occurs; does nothing if there's no error
- `debug()`: flags a function for “debug” mode which allows you to step through execution of a function one line at a time
- `browser()`: suspends the execution of a function wherever it is called and puts the function in debug mode
- `trace()`: allows you to insert debugging code into a function at specific places
- `recover()`: allows you to modify the error behavior so that you can browse the function call stack

Debugging tools in R

`traceback()`:

```
> mean(x)
```

```
Error in mean(x) : object 'x' not found
```

```
> traceback()
```

```
1: mean(x)
```

The `traceback()` function must be called immediately after an error occurs

Debugging tools in R

`debug()` initiates an interactive debugger (also known as the “browser” in R) for a function.

```
> debug(lm) ## Flag the 'lm()' function for interactive debugging
> lm(y ~ x)
debugging in: lm(y ~ x)
debug: {
  ret.x <- x
  ret.y <- y
  cl <- match.call()

  ...
  if (!qr)
    z$qr <- NULL
  z
}
```

Now, every time you call the `lm()` function it will launch the interactive debugger
Use `undebug()` to turn off: `undebug(lm)`

Debugging tools in R

There are a few special commands you can call in the browser:

- `n` executes the current expression and moves to the next expression
- `c` continues execution of the function and does not stop until either an error or the function

exits

- `Q` quits the browser

Here's an example of a browser session with the `lm()` function.

```
Browse[2]> n ## Evaluate this expression and move to the next one
```

```
debug: ret.x <- x
```

```
Browse[2]> n
```

```
debug: ret.y <- y
```

```
Browse[2]> n
```

```
debug: cl <- match.call()
```

```
Browse[2]> n
```

```
debug: mf <- match.call(expand.dots = FALSE)
```

```
Browse[2]> n
```

```
debug: m <- match(c("formula", "data", "subset", "weights", "na.action",  
"offset"), names(mf), 0L)
```


Debugging R code

Continue to work on Project 1

Next Tuesday is review day for mid-term exam

Read book