$Structure^*$

Chapter 3

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R Workflow for Economists

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Logical Operations

[1] TRUE

Recall from chapter 1 that a logical object can take two values: TRUE or FALSE. Logical operators, those that have logical objects as inputs or outputs, are commonly used and crucial to understand before we discuss conditional statements and loops. We will define a, b, c, and d to help demonstrate logical operators.

```
a <- 3
b <- 8
c \leftarrow c(1, 9, 3)
d \leftarrow c(7, 10, 3)
The inequalities, <, >, \le, \ge, are denoted <, >, <=, >=, respectively.
a > b
## [1] FALSE
a <= b
## [1] TRUE
Note that we can also apply these operators to vectors with more than one element.
## [1] 1 9 3
## [1] 7 10 3
c < d
        TRUE TRUE FALSE
The operator == allows us to test if two objects are equal. The operator != allows us to test if two objects
are not equal.
a == b
## [1] FALSE
c != d
## [1] TRUE TRUE FALSE
Generally, ! indicates negation.
is.character(b)
## [1] FALSE
!is.character(b)
## [1] TRUE
We can combine logical operators using & (conjunction, "and") or | (disjunction, "or").
(a > b) & (b != 7)
## [1] FALSE
(a > b) | (b != 7)
```

If there are many logical comparisons, it is useful to have functions that output TRUE if any or all of the comparisons are true.

```
c < d
## [1] TRUE TRUE FALSE
any(c < d)
## [1] TRUE
all(c < d)
## [1] FALSE</pre>
```

If you are comparing objects with more than one element, you may want TRUE if the two objects are identical and FALSE otherwise. That is, you do not want a logical vector with more than one element.

```
c == d
## [1] FALSE FALSE TRUE
identical(c, d)
## [1] FALSE
```

Practice Exercises 3.1

- 1. Define a vector \mathbf{x} of 10 random draws from the uniform [0,1] distribution. Test if each element is greater than or equal to 0.9.
- 2. Define a variable that is TRUE if at least 1 element of x is greater than or equal to 0.9.

Conditional Statements

Conditional statements allow you to dictate different actions depending on the outcome of a condition. The general syntax is as follows.

```
if (<condition>) {
    <command if condition is true>
}
```

If the condition, denoted in a general way as **<condition>**, is true, then the commands inside the brackets are executed. Otherwise, if the condition is false, R will continue executing the next line of code. Here is a concrete example.

```
f <- runif(1, min = 0, max = 1)
f

## [1] 0.2128504
if (f < 0.5) {
  print("The random number is less than one half.")
}</pre>
```

[1] "The random number is less than one half."

If you want R to execute a different command if the condition is false, then the general code is as follows.

```
if (<condition>) {
      <command if condition is true>
} else {
      <command if condition is false>
}
```

Here is a concrete example.

```
## [1] 0.2128504
if (f < 0.5) {
    print("The random number is less than one half.")
} else {
    print("The random number is greater than or equal to one half.")
}

## [1] "The random number is less than one half."

It is possible that there are more than two logical possibilities.

f

## [1] 0.2128504
if (f < 0.25) {
    print("The random number is less than one quarter.")
} else if (f >= 0.25 & f < 0.5) {
    print("The random number is between one quarter and one half.")
} else if (f >= 0.5 & f < 0.75) {
    print("The random number is between one half and three quarters.")
} else {</pre>
```

[1] "The random number is less than one quarter."

print("The random number is between three quarters and one.")

Conditional statements can be nested. It is always best practice to have consistent use of indentations and brackets, but these conventions are especially important when nesting conditional statements. The below chunk produces the same results as the above chunk, but using nested conditional statements rather than else if.

```
f
```

```
## [1] 0.2128504

if (f < 0.5) {
    if (f < 0.25) {
        print("The random number is less than one quarter.")
    }
    else {
        print("The random number is between one quarter and one half.")
    }
} else {
    if (f < 0.75) {
        print("The random number is between one half and three quarters.")
    } else {
        print("The random number is between three quarters and one.")
    }
}</pre>
```

[1] "The random number is less than one quarter."

It is important to be careful with the conditions you use. A common error is to have a condition that has more than one element (i.e., a logical vector with length greater than 1). In this case, R will use the first element and throw a warning.

```
g <- runif(2, min = 0, max = 1)
g

## [1] 0.2964665 0.4137872

if (g < 0.5) {
   print("The random number is less than one half.")
}

## Warning in if (g < 0.5) {: the condition has length > 1 and only the first
## element will be used

## [1] "The random number is less than one half."
g < 0.5

## [1] TRUE TRUE</pre>
```

The function ifelse() is sometimes useful when applying functions to vectors or assigning values to a variable. It follows the same logic as conditional statements, but allows for a more concise implementation.

```
x <- 2:-1
y <- ifelse(x >= 0, sqrt(x), NA)

## Warning in sqrt(x): NaNs produced
ifelse(is.na(y), 0, 1)

## [1] 1 1 1 0
```

Practice Exercises 3.2

1. Run the following (incorrect) code. How can you change the condition to avoid the warning and ensure that the print out is correct?

```
g <- runif(2, min = 0, max = 1)
g
if (g < 0.5) {
   print("All the random numbers are less than one half.")
}</pre>
```

Loops

Loops indicate portions of the code to be executed more than once. The loop ends when the number of iterations has been reached or there is an exit condition.

for

The for instruction involves running the code a pre-specified number of iterations. The general syntax is as follows.

```
for (i in <vector>) {
     <commands>
}
```

R iterates through each value of <vector> and executes the commands inside the brackets. Once the last element of the vector is reached, R executes the next line of code. Here is an example.

```
for (i in 1:3) {
   print(factorial(i))
}
## [1] 1
## [1] 2
## [1] 6
```

while

The while instruction involves running the code until an exit condition is satisfied. The general syntax is as follows

```
while (<condition>) {
    <command>
}
```

Here is an example.

```
j <- 1
while (j < 4) {
  print(factorial(j))
  j <- j + 1
}
## [1] 1</pre>
```

[1] 2 ## [1] 6

Other Loop Instructions

In some contexts, it is useful to further control a loop. The instruction break tells R to exit the loop.

```
1 <- c(2, 4, 7)
for (i in 1) {
   if (i == 4) {
      out <- i
      break
   }
}
out</pre>
```

[1] 4

The instruction next tells R to move to the next iteration.

```
for (i in 1) {
   if (i == 4) {
      next
   }
   print(i)
}
```

```
## [1] 2
## [1] 7
```

Efficiency

A common maxim that loops are slow in R and it is best to avoid them. It is true that there are faster alternatives. The use of vectorized operations is preferable when possible as these operations are incredibly fast. The function system.time() allows you to test the speed of your code. Evidently, the vectorized operation factorial(1:100000) is faster than the loop. The divergence in speeds between the two methods will be larger for more complex functions and more iterations.

```
system.time(for (i in 1:100000) {
  factorial(i)
})

##  user system elapsed
##  0.018  0.002  0.020

system.time(factorial(1:100000))

##  user system elapsed
##  0  0  0
```

Regardless, it is still crucial to be comfortable with loops. For smaller computations, like factorial, the difference is very minor. Sometimes, the code is clearer and makes more sense with a loop than with a vectorized operation.

Practice Exercises 3.3

1. Define an object out with the value 0. In a for loop iterating 1, 2, ..., 20, add the reciprocal to out if the number is even. The sum should be $\frac{1}{2} + \frac{1}{4} + \ldots + \frac{1}{20}$.

Apply Functions

A family of functions allows you to take advantage of R's efficiency with vectorized operations, rather than relying too heavily on loops. There are several different functions within this family that differ by what object the function is applied and the desired output.

apply()

The function apply() applies a function to the rows or columns (these are called margins) of matrices or data frames. While it is not faster than loops, it allows for more compact code. Following chapter 19 in Boehmke (2016), we will use the built-in data frame mtcars. To see the first 6 rows of mtcars, use the head() function.

head(mtcars)

```
##
                      mpg cyl disp hp drat
                                                 wt qsec vs am gear carb
## Mazda RX4
                      21.0
                                160 110 3.90 2.620 16.46
## Mazda RX4 Wag
                      21.0
                             6
                                160 110 3.90 2.875 17.02
                                                           0
                                                              1
                                                                    4
                                                                         4
## Datsun 710
                      22.8
                             4
                                108
                                     93 3.85 2.320 18.61
                                                                         1
## Hornet 4 Drive
                                258 110 3.08 3.215 19.44
                                                                    3
                      21.4
                             6
                                                                         1
                                                           1
                                                                         2
## Hornet Sportabout 18.7
                             8
                                360 175 3.15 3.440 17.02
                                                           0
                                                                    3
## Valiant
                      18.1
                                225 105 2.76 3.460 20.22
```

If we want the mean of each column, we can use the apply() function. Note that 2 corresponds to the second margin of the data frame, i.e., the columns. Notice that the output is a named vector.

```
x <- apply(mtcars, 2, mean)
x
## mpg cyl disp hp drat wt qsec</pre>
```

```
20.090625
                 6.187500 230.721875 146.687500
                                                     3.596563
                                                                 3.217250 17.848750
##
           VS
                        am
                                  gear
                                              carb
##
     0.437500
                 0.406250
                             3.687500
                                         2.812500
str(x)
    Named num [1:11] 20.09 6.19 230.72 146.69 3.6 ...
    - attr(*, "names") = chr [1:11] "mpg" "cyl" "disp" "hp" ...
The first margin of the data frame is row.
apply(mtcars, 1, max)
##
              Mazda RX4
                               Mazda RX4 Wag
                                                        Datsun 710
                                                                          Hornet 4 Drive
##
                  160.0
                                        160.0
                                                              108.0
                                                                                    258.0
##
     Hornet Sportabout
                                      Valiant
                                                        Duster 360
                                                                               Merc 240D
##
                  360.0
                                        225.0
                                                              360.0
                                                                                    146.7
##
               Merc 230
                                     Merc 280
                                                         Merc 280C
                                                                              Merc 450SE
##
                  140.8
                                        167.6
                                                              167.6
                                                                                    275.8
##
             Merc 450SL
                                 Merc 450SLC
                                               Cadillac Fleetwood Lincoln Continental
##
                                        275.8
                                                              472.0
                  275.8
                                                                                    460.0
                                                       Honda Civic
##
                                    Fiat 128
                                                                          Toyota Corolla
     Chrysler Imperial
##
                                                               75.7
                  440.0
                                         78.7
                                                                                     71.1
##
                                                       AMC Javelin
                                                                              Camaro Z28
         Toyota Corona
                            Dodge Challenger
##
                  120.1
                                        318.0
                                                              304.0
                                                                                    350.0
##
      Pontiac Firebird
                                    Fiat X1-9
                                                     Porsche 914-2
                                                                            Lotus Europa
##
                  400.0
                                         79.0
                                                              120.3
                                                                                    113.0
##
        Ford Pantera L
                                Ferrari Dino
                                                     Maserati Bora
                                                                              Volvo 142E
##
                  351.0
                                        175.0
                                                              335.0
                                                                                    121.0
If the function to be applied has other arguments, these can be specified separated by commas. Here is an
example where we trim 10% of observations from each end.
out <- apply(mtcars, 2, mean, trim = 0.1)
out
##
                         cyl
           mpg
                                     disp
                                                    hp
                                                               drat
                                                                              wt
    19.6961538
##
                  6.2307692 222.5230769 141.1923077
                                                         3.5792308
                                                                       3.1526923
##
           qsec
                          vs
                                       am
                                                               carb
                                                  gear
    17.8276923
                  0.4230769
                               0.3846154
                                            3.6153846
                                                         2.6538462
There are some function that are faster than the analogous implementation in apply(). These include
summary(), colSums(), rowSums(), colMeans(), and rowMeans().
colMeans(mtcars)
##
                                                                                 qsec
                                 disp
                                                         drat
                       cyl
                                                hp
                                                                        wt.
          mpg
##
                                                     3.596563
                                                                 3.217250
    20.090625
                 6.187500 230.721875 146.687500
                                                                            17.848750
##
            VS
                        am
                                  gear
                                              carb
##
     0.437500
                 0.406250
                             3.687500
                                         2.812500
summary(mtcars)
##
                           cyl
                                            disp
                                                               hp
         mpg
                     Min.
                                       Min.
           :10.40
                             :4.000
                                               : 71.1
                                                        Min.
                                                                : 52.0
    1st Qu.:15.43
                     1st Qu.:4.000
                                       1st Qu.:120.8
                                                        1st Qu.: 96.5
##
##
    Median :19.20
                     Median :6.000
                                       Median :196.3
                                                        Median :123.0
##
            :20.09
    Mean
                     Mean
                             :6.188
                                       Mean
                                               :230.7
                                                        Mean
                                                                :146.7
    3rd Qu.:22.80
                     3rd Qu.:8.000
                                       3rd Qu.:326.0
                                                        3rd Qu.:180.0
```

```
:33.90
                            :8.000
                                             :472.0
                                                              :335.0
##
    Max.
                     Max.
                                      Max.
                                                       Max.
##
         drat
                           wt.
                                           qsec
                                                              VS
           :2.760
##
   Min.
                     Min.
                            :1.513
                                      Min.
                                             :14.50
                                                       Min.
                                                               :0.0000
    1st Qu.:3.080
                     1st Qu.:2.581
                                      1st Qu.:16.89
                                                       1st Qu.:0.0000
##
##
    Median :3.695
                     Median :3.325
                                      Median :17.71
                                                       Median :0.0000
##
    Mean
           :3.597
                     Mean
                            :3.217
                                      Mean
                                             :17.85
                                                       Mean
                                                               :0.4375
##
    3rd Qu.:3.920
                     3rd Qu.:3.610
                                      3rd Qu.:18.90
                                                       3rd Qu.:1.0000
##
    Max.
           :4.930
                     Max.
                             :5.424
                                      Max.
                                              :22.90
                                                       Max.
                                                               :1.0000
                           gear
##
          am
                                            carb
##
   Min.
           :0.0000
                      Min.
                              :3.000
                                       Min.
                                               :1.000
   1st Qu.:0.0000
                      1st Qu.:3.000
                                       1st Qu.:2.000
   Median :0.0000
                      Median :4.000
                                       Median :2.000
##
                              :3.688
##
   Mean
           :0.4062
                                       Mean
                                               :2.812
                      Mean
    3rd Qu.:1.0000
##
                      3rd Qu.:4.000
                                       3rd Qu.:4.000
## Max.
           :1.0000
                      Max.
                             :5.000
                                       Max.
                                               :8.000
summary(mtcars$mpg)
##
      Min. 1st Qu.
                     Median
                               Mean 3rd Qu.
                                                 Max.
##
     10.40
             15.43
                      19.20
                               20.09
                                       22.80
                                                33.90
lapply()
The lapply() function is designed to apply functions to lists and return a list. It efficiently loops through a
list and applies the specified function to each element.
carlist <- as.list(mtcars[1:5, ]) # Convert the first 5 rows into a list
str(carlist)
## List of 11
    $ mpg : num [1:5] 21 21 22.8 21.4 18.7
    $ cyl : num [1:5] 6 6 4 6 8
##
    $ disp: num [1:5] 160 160 108 258 360
   $ hp : num [1:5] 110 110 93 110 175
##
    $ drat: num [1:5] 3.9 3.9 3.85 3.08 3.15
##
    $ wt : num [1:5] 2.62 2.88 2.32 3.21 3.44
##
    $ qsec: num [1:5] 16.5 17 18.6 19.4 17
   $ vs : num [1:5] 0 0 1 1 0
  $ am : num [1:5] 1 1 1 0 0
##
    $ gear: num [1:5] 4 4 4 3 3
    $ carb: num [1:5] 4 4 1 1 2
lapply(carlist, mean)
## $mpg
## [1] 20.98
##
## $cyl
## [1] 6
##
## $disp
## [1] 209.2
##
## $hp
## [1] 119.6
##
## $drat
```

```
## [1] 3.576
##
## $wt
   [1] 2.894
##
##
## $qsec
## [1] 17.71
##
## $vs
##
  [1] 0.4
## $am
##
   [1] 0.6
##
## $gear
## [1] 3.6
##
## $carb
## [1] 2.4
```

##

1.0000

The elements of the list carlist are all vectors. A list may contain matrices or data frames as well. In that case, we may want to iterate through each element of the list and apply the function to each item of each element. This is efficiently done through nesting apply functions. To demonstrate, we create a list in which each element is a data frame.

```
carlist <- list(mazda = mtcars[1:2, ], hornet = mtcars[4:5, ], merc = mtcars[8:14, ])</pre>
carlist
## $mazda
##
                  mpg cyl disp
                                hp drat
                                                 qsec vs am gear carb
                                            wt
                   21
## Mazda RX4
                        6
                           160 110
                                     3.9 2.620 16.46
                                                       0
## Mazda RX4 Wag
                   21
                        6
                           160 110
                                     3.9 2.875 17.02
                                                                     4
##
## $hornet
##
                       mpg cyl disp hp drat
                                                      qsec vs am gear carb
                                                  wt
## Hornet 4 Drive
                      21.4
                             6
                                 258 110 3.08 3.215 19.44
                                                                     3
                                                             1
                                                                     3
                                                                          2
  Hornet Sportabout 18.7
                             8
                                 360 175 3.15 3.440 17.02
##
##
  $merc
##
                                hp drat
                                           wt qsec vs am gear carb
                 mpg cyl disp
## Merc 240D
                       4 146.7
                                 62 3.69 3.19 20.0
                                                     1
                                                              4
                                                                   2
                24.4
                       4 140.8 95 3.92 3.15 22.9
                                                                   2
## Merc 230
                22.8
## Merc 280
                19.2
                       6 167.6 123 3.92 3.44 18.3
                                                     1
                                                        0
                                                              4
                                                                   4
## Merc 280C
                17.8
                       6 167.6 123 3.92 3.44 18.9
                                                     1
                                                              4
                                                                   4
## Merc 450SE
                16.4
                       8 275.8 180 3.07 4.07 17.4
                                                              3
                                                                   3
## Merc 450SL
               17.3
                       8 275.8 180 3.07 3.73 17.6
                                                        0
                                                              3
                                                                   3
                       8 275.8 180 3.07 3.78 18.0
## Merc 450SLC 15.2
                                                              3
                                                                   3
The x is a stand-in value.
lapply(carlist, function(x) apply(x, 2, mean))
## $mazda
##
        mpg
                  cyl
                          disp
                                      hp
                                              drat
                                                         wt
                                                                 qsec
                                                                             vs
##
               6.0000 160.0000 110.0000
                                           3.9000
                                                                        0.0000
    21.0000
                                                     2.7475
                                                            16.7400
##
                 gear
                          carb
         am
               4.0000
                        4.0000
```

```
##
##
   $hornet
##
        mpg
                  cyl
                           disp
                                       hp
                                               drat
                                                                   qsec
                                                                               vs
                                                                18.2300
##
               7.0000 309.0000 142.5000
                                             3.1150
                                                       3.3275
                                                                           0.5000
    20.0500
##
                 gear
                           carb
          am
     0.0000
               3.0000
                         1.5000
##
##
##
   $merc
##
                                     disp
                                                                               wt
                         cyl
                                                     hp
                                                                drat
            mpg
                                                                        3.5428571
##
    19.0142857
                  6.2857143 207.1571429 134.7142857
                                                          3.5228571
##
                                                                carb
           qsec
                          vs
                                        am
                                                   gear
    19.0142857
                  0.5714286
                                0.000000
                                             3.5714286
                                                          3.0000000
##
```

sapply()

The function sapply() is very similar to lapply() except it outputs a simplified result whenever possible. If the output is a list with elements of length 1 (more than 1), sapply() returns a vector (matrix). Otherwise, sapply() returns a list.

```
sapply(carlist, function(x) apply(x, 2, mean))
```

```
##
           mazda
                    hornet
                                   merc
## mpg
         21.0000
                   20.0500
                            19.0142857
          6.0000
                    7.0000
                             6.2857143
## cyl
## disp 160.0000 309.0000 207.1571429
        110.0000 142.5000 134.7142857
## hp
## drat
          3.9000
                    3.1150
                             3.5228571
## wt
          2.7475
                    3.3275
                             3.5428571
         16.7400
                   18.2300
                            19.0142857
## qsec
                    0.5000
          0.0000
                             0.5714286
## vs
                    0.0000
## am
          1.0000
                             0.000000
## gear
          4.0000
                    3.0000
                             3.5714286
          4.0000
## carb
                    1.5000
                             3.0000000
```

tapply()

The function tapply() efficiently applies functions over subsets of a vector. It is useful when you want to apply functions within groups. The below code calculates the average miles per gallon (mpg) grouped by the number of cylinders (cyl).

```
tapply(mtcars$mpg, mtcars$cyl, mean)

## 4 6 8

## 26.66364 19.74286 15.10000

Here is an example of the same situation but for each column in the data frame.
```

```
apply(mtcars, 2, function(x) tapply(x, mtcars$cyl, mean))
```

```
##
          mpg cyl
                      disp
                                   hp
                                                             qsec
## 4 26.66364
                4 105.1364
                            82.63636 4.070909 2.285727 19.13727 0.9090909
## 6 19.74286
                6 183.3143 122.28571 3.585714 3.117143 17.97714 0.5714286
                8 353.1000 209.21429 3.229286 3.999214 16.77214 0.0000000
## 8 15.10000
                   gear
##
            am
## 4 0.7272727 4.090909 1.545455
## 6 0.4285714 3.857143 3.428571
## 8 0.1428571 3.285714 3.500000
```

Practice Exercises 3.4

- 1. Create a list with 4 elements, each containing a vector with 30 numbers: the first element is 30 draws from the uniform [0,1] distribution, the second element is 30 draws from the uniform [1,2] distribution, the third element is 30 draws from the uniform [2,3] distribution, and the fourth element is 30 draws from the uniform [3,4] distribution. How does lapply and sapply differ here?
- 2. Here is an example of implementing the function quantile. Calculate the 25th, 50th, and 75th percentile for the columns of mtcars using apply().

```
quantile(1:100, probs = c(0.10, 0.90))
## 10% 90%
## 10.9 90.1
```

Functions

By now, you have been exposed to functions, both those built into the base packages of R, and those that are accessible from external packages. Now, you will write your own functions. User-defined functions are crucial in the workflow. They allow for tasks to be more general and automatic. Often, they make the script easier to read and understand. They also make it easier to test and debug, resulting in more correct output. Even if it feels burdensome to write functions, it is usually worthwhile.

The example function we will be using is very simple from Boehmke (2016). Suppose we want a function to calculate the present value of a future value given interest rate and number of periods. The output should be rounded to three digits.

```
calc_pv <- function(fv, r, n) {
  pv <- fv / ((1 + r)^n)
  return(round(pv, 3))
}</pre>
```

There are three components of the function. The body is the meat of the function. It contains all the calculations, that is, everything between {}.

```
body(calc_pv)
```

```
## {
##     pv <- fv/((1 + r)^n)
##     return(round(pv, 3))
## }</pre>
```

The formals are the inputs the function requires. These are also called arguments.

formals(calc pv)

```
## $fv
##
## $r
## $r
## ## $n
```

Finally, the environment includes all of the named objects accessible to the function.

```
environment(calc_pv)
```

```
## <environment: R_GlobalEnv>
```

The function is called the same way as built-in functions.

```
calc_pv(fv = 1000, r = 0.08, n = 10)
## [1] 463.193
calc_pv(1000, 0.08, 10) # Positional matching
```

```
## [1] 463.193
```

It might be convenient to set default values for some arguments. You can see examples of default values in many built-in functions. In the documentation for mean(), the arguments trim and na.rm are listed in the description with trim = 0 and na.rm = FALSE. Setting default values for your own code can help prevent errors and make the function easier to use.

```
calc_pv <- function(fv, r = 0.08, n) {
  pv <- fv / ((1 + r)^n)
  return(round(pv, 3))
}</pre>
```

Now, you can use the function even without specifying r.

```
calc_pv(fv = 1000, n = 20)
```

```
## [1] 214.548
```

If you specify a function with an argument that is not used, it will not throw an error or warning. The technical name for this is lazy evaluation.

```
calc_pv <- function(fv, r, n, x) {
  pv <- fv / ((1 + r)^n)
  return(round(pv, 3))
}
calc_pv(fv = 1000, r = 0.08, n = 10) # No need to pass a value to x</pre>
```

```
## [1] 463.193
```

In the present value example, the output is one number. Functions can also return more than one object. Above, we used the function return() to be very clear about what the function is returning. While this is good practice, the function will default to returning the last object of the body.

```
arith <- function(x, y) {
    x + y
    x - y
    x * y
    x / y
}
arith(1, 2)</pre>
```

[1] 0.5

Returning a vector allows the function to return more than one result.

```
arith <- function(x, y) {
   addition <- x + y
   subtraction <- x - y
   multiplication <- x * y
   division <- x / y
   c(addition, subtraction, multiplication, division)
}
arith(1, 2)</pre>
```

```
## [1] 3.0 -1.0 2.0 0.5
```

Returning a list allows the function to return more than one result and allows for an easier understanding of the output.

```
arith <- function(x, y) {</pre>
  addition \leftarrow x + y
  subtraction <- x - y
  multiplication <- x * y
  division <- x / y
  c(list(Addition = addition, Subtraction = subtraction,
         Multiplication = multiplication, Division = division))
arith(1, 2)
## $Addition
## [1] 3
##
## $Subtraction
## [1] -1
##
## $Multiplication
## [1] 2
```

Scoping

\$Division ## [1] 0.5

When writing functions, it is useful to have a sense of the scoping rules. These are the rules that R follows to decide on the value of the objects in a function. R will first search within the function. If all the objects are defined within the function, R does not search anymore.

```
calc_pv <- function() {
  fv <- 1000
  r <- 0.08
  n <- 10
  fv / ((1 + r)^n)
}
calc_pv()</pre>
```

[1] 463.1935

If a value is not present within the function, R will expand the search up one level. The levels are demarcated with {}.

```
fv <- 1000
calc_pv <- function() {
    r <- 0.08
    n <- 10
    fv / ((1 + r)^n)
}
calc_pv()</pre>
```

```
## [1] 463.1935
```

These rules are general, including when the function takes arguments.

```
calc_pv <- function(fv, r) {
   n <- 10
   fv / ((1 + r)^n)
}
calc_pv(1000, 0.08)</pre>
```

[1] 463.1935

Niceties

Our example functions are simple, but often actual functions can be complex. Your script may define and use many functions that have many inputs and outputs. Even if you are the only person who will ever read your code, it is useful to include some checks to help ensure you are properly using your function. Even though these checks take time, they can save trouble down the line. The function stop() stops the execution of the function and throws an error message.

```
## Error in calc_pv("1000", 0.08, 10): All inputs must be numeric.
## The inputs are of the following classes:
## fv: character
## r: numeric
## n: numeric
```

Notice that our function can take in vectors. As discussed above, vectorized operations like this are very efficient in R.

```
calc_pv(fv = 1:10, r = 0.08, n = 10)
```

```
## [1] 0.463 0.926 1.390 1.853 2.316 2.779 3.242 3.706 4.169 4.632
```

But what if one of the elements of the input vector is a missing value?

```
calc_pv(fv = c(100, NA, 1000), r = 0.08, n = 10)
```

```
## [1] 46.319 NA 463.193
```

This is a frequent issue that arises when using functions within a larger script. Adding the argument na.rm allows you to specify how you want the function to handle NA values.

```
calc_pv <- function(fv, r, n, na.rm = FALSE) {
    # Input validation</pre>
```

```
if (!is.numeric(fv) | !is.numeric(r) | !is.numeric(n)) {
    stop("All inputs must be numeric.\n",
         "The inputs are of the following classes:\n",
         "fv: ", class(fv), "\n",
         "r: ", class(r), "\n",
         "n: ", class(n))
  }
  # na.rm argument
  if (na.rm == TRUE) {
    fv <- fv[!is.na(fv)] # Only keep non-missing values in fv
 pv \leftarrow fv / ((1 + r)^n)
 return(round(pv, 3))
calc_pv(fv = c(100, NA, 1000), r = 0.08, n = 10)
## [1] 46.319
                    NA 463.193
calc_pv(fv = c(100, NA, 1000), r = 0.08, n = 10, na.rm = TRUE)
## [1] 46.319 463.193
```

With input validation and conditional statements, the code to write functions can be very long. Just like in Matlab, you can write your function in a separate script. The script should contain the entirety of the code for the function.

```
# Title: calc_pv.R
calc_pv <- function(fv, r, n, na.rm = FALSE) {</pre>
  # Input validation
  if (!is.numeric(fv) | !is.numeric(r) | !is.numeric(n)) {
    stop("All inputs must be numeric.\n",
         "The inputs are of the following classes:\n",
         "fv: ", class(fv), "\n",
         "r: ", class(r), "\n",
         "n: ", class(n))
  }
  # na.rm argument
  if (na.rm == TRUE) {
    fv <- fv[!is.na(fv)] # Only keep non-missing values in fv
 pv \leftarrow fv / ((1 + r)^n)
 return(round(pv, 3))
}
```

The function source() allows you to add the function to your global environment.

```
# Title: main.R
```

```
source("calc_pv.R")
calc_pv(fv = c(100, NA, 1000), r = 0.08, n = 10, na.rm = TRUE)
```

Practice Exercises 3.5

- 1. Write a function to convert fahrenheit to celsius. Define a 10×10 matrix with 100 draws from the uniform [-10, 100] distribution. Test your function on this matrix.
- 2. The Fibonacci sequence is recursive: $x_n = x_{n-1} + x_{n-2}$. Write a function that takes n as an argument and computes x_n . Recall that $x_0 = 0$ and $x_1 = 1$. Use a for loop to print the first 15 elements of the Fibonacci sequence. Bonus: try using sapply to print the first 15 elements of the Fibonacci sequence.

Further Reading

The information from this chapter comes from chapters 18, 19 of Boehmke (2016) and chapters 5.2, 5.7-5.8 of Zamora Saiz et al. (2020).

References

Boehmke, Bradley C. 2016. Data Wrangling with R. Use R! Springer. https://link-springer-com.proxy.lib.du ke.edu/content/pdf/10.1007%2F978-3-319-45599-0.pdf.

Zamora Saiz, Alfonso, Carlos Quesada González, Lluís Hurtado Gil, and Diego Mondéjar Ruiz. 2020. An Introduction to Data Analysis in R: Hands-on Coding, Data Mining, Visualization and Statistics from Scratch.