



# Advanced Function Writing

Justin Post

# Recap!

- Function writing opens R up!
- Syntax

```
nameOfFunction <- function(input1, input2, ...) {  
  #code  
  #return something with return()  
  #or returns last value  
}
```

- Can set defaults in function definition
- Can return a named list
- Can give unnamed arguments for use

# Going Further

A few more useful topics:

- `...` for unnamed arguments
- Writing `tidyverse` style functions
- Lazy evaluation
- Environments and lexical scoping

# Unnamed Arguments

- Sometimes we want to
  - supply arguments to functions used in the body of our function
  - allow the user to specify more than one argument (say column)
- Consider the first argument of `data.frame()`

```
data.frame
```

```
## function (... , row.names = NULL, check.rows = FALSE, check.names = TRUE,
##   fix.empty.names = TRUE, stringsAsFactors = FALSE)
## {
##   data.row.names <- if (check.rows && is.null(row.names))
##     function(current, new, i) {
##       if (is.character(current))
##         new <- as.character(new)
##       if (is.character(new))
##         current <- as.character(current)
##       if (anyDuplicated(new))
##         return(current)
##       if (is.null(current))
##         return(new)
##       new) || all(current == ""))
```

# Our `standardize()` Function

Recall the function we wrote a while back:

```
standardize <- function(vector, center = TRUE, scale = TRUE) {  
  mean <- mean(vector)  
  stdev <- sd(vector)  
  if (center) {  
    vector <- vector - mean  
  }  
  if (scale) {  
    vector <- vector / stdev  
  }  
  return(list(result = vector, mean = mean, sd = stdev))  
}
```

# Unnamed Arguments

- Add unnamed arguments to our function for use with `sd()` and `mean()`

`sd`

```
## function (x, na.rm = FALSE)
## sqrt(var(if (is.vector(x) || is.factor(x)) x else as.double(x),
##      na.rm = na.rm))
## <bytecode: 0x0000000026188868>
## <environment: namespace:stats>
```

`mean.default`

```
## function (x, trim = 0, na.rm = FALSE, ...)
## {
##   if (!is.numeric(x) && !is.complex(x) && !is.logical(x)) {
##     warning("argument is not numeric or logical: returning NA")
##     return(NA_real_)
##   }
##   if (na.rm)
##     x <- x[!is.na(x)]
##   if (!is.numeric(trim) || length(trim) != 1L)
##     stop("'trim' must be numeric of length one")
##   n <- length(x)
##   if (trim > 0 && n) {
##     if (is.complex(x))
##       stop("NaNs are not defined for complex data")
##     if (trim >= 0.5)
##       return(mean(x))
##     else {
##       n1 <- (n * trim) %>>= 1L
##       n2 <- n - n1
##       x1 <- x[1:n1]
##       x2 <- x[n2+1:n]
##       return((mean(x1) + mean(x2)) / 2)
```

# Unnamed Arguments

- Add `...` as an argument

```
standardize <- function(vector, center = TRUE, scale = TRUE, ...) {  
  mean <- mean(vector, ...)  
  stdev <- sd(vector, ...)  
  if (center) {  
    vector <- vector - mean  
  }  
  if (scale) {  
    vector <- vector / stdev  
  }  
  return(list(result = vector, mean = mean, sd = stdev))  
}
```

# Apply Our Function to Data

- `airquality` has a column called `Ozone` with missing values

```
airquality$Ozone
```

```
##      [1]  41  36  12  18 NA  28  23  19   8 NA   7  16  11  14  18  14  34   6
##     [19]  30  11   1  11   4  32 NA  NA  NA  23  45 115  37 NA  NA  NA  NA  NA
##     [37] NA  29 NA  71  39 NA  NA  23 NA  NA  21  37  20  12  13 NA  NA  NA
##     [55] NA  NA  NA  NA  NA  NA  NA  NA 135  49  32 NA  64  40  77  97  97  85 NA
##     [73]  10  27 NA   7  48  35  61  79  63  16 NA  NA  80 108  20  52  82  50
##     [91]  64  59  39   9  16  78  35  66 122  89 110 NA  NA  44  28  65 NA  22
##    [109]  59  23  31  44  21   9 NA  45 168  73 NA  76 118  84  85  96  78  73
##   [127]  91  47  32  20  23  21  24  44  21  28   9  13  46  18  13  24  16  13
##   [145]  23  36   7  14  30 NA  14  18  20
```



# Apply Our Function to Data

- `airquality` has a column called `Ozone` with missing values

```
standard_Ozone <- standardize(airquality$Ozone, na.rm = TRUE)
standard_Ozone$mean
```

```
## [1] 42.12931
```

```
standard_Ozone$sd
```

```
## [1] 32.98788
```

# Dealing with ...

- Note: You can get at the unnamed arguments with `list(...)`

```
f <- function(x, ...){  
  unnamed <- list(...)  
  modifyX <- x^2  
  return(list(newX = modifyX, ellipses = unnamed))  
}  
f(x = 10, a = 1, b = list(char = "hey there", num = 1:3))
```

```
## $newX  
## [1] 100  
##  
## $ellipses  
## $ellipses$a  
## [1] 1  
##  
## $ellipses$b  
## $ellipses$b$char  
## [1] "hey there"  
##  
## $ellipses$b$num  
## [1] 1 2 3
```

# Dealing with

- Alternatively, just grab the names

```
f <- function(x, ...){  
  unnamed <- names(list(...))  
  modifyX <- x^2  
  return(list(newX = modifyX, elipses_names = unnamed))  
}  
f(x = 10, a = 1, b = list(char = "hey there", num = 1:3))
```

```
## $newX  
## [1] 100  
##  
## $elipses_names  
## [1] "a" "b"
```

# tidyverse Style Functions

(This section is distilled from **Modern R with tidyverse**)

- We've seen the usefulness of functions such as `filter()` and `select()`
- We may want to write functions in a similar manner so they work well with the `tidyverse`
- Specifically, how can we write functions that take columns of data as arguments in the `tidyverse` framework?

# Motivation

- Function to find group means

```
iris |>
  group_by(Species) |>
  summarize(across(where(is.numeric),
                     list("mean" = mean),
                     .names = "{.fn}_{.col}"))
```

```
## # A tibble: 3 x 5
##   Species mean_Sepal.Length mean_Sepal.Width mean_Petal.Length mean_Petal.Width
##   <fct>      <dbl>          <dbl>          <dbl>          <dbl>
## 1 setosa      5.01            3.43            1.46            0.246
## 2 versico~    5.94            2.77            4.26            1.33
## 3 virginia~   6.59            2.97            5.55            2.03
```

# Motivation

- Function to find group means

```
find_group_mean <- function(.df, group){  
  .df |>  
    group_by(group) |>  
    summarize(across(where(is.numeric),  
                      list("mean" = mean),  
                      .names = "{.fn}_{.col}"))  
}  
find_group_mean(iris, Species)
```

```
## Error in `group_by()`:  
## ! Must group by variables found in `.data`.  
## x Column `group` is not found.
```

# Motivation

- Function to find group means

```
find_group_mean <- function(.df, group){  
  .df |>  
    group_by(group) |>  
    summarize(across(where(is.numeric),  
                      list("mean" = mean),  
                      .names = "{.fn}_{.col}"))  
}  
find_group_mean(iris, "Species")
```

```
## Error in `group_by()`:  
## ! Must group by variables found in `.data`.  
## x Column `group` is not found.
```

# Selecting Columns in tidy Style Functions

- Two approaches:
  - `enquo()` with `!!()` (injection operator)
  - `{{}}`



# Selecting Columns in `tidy` Style Functions

- Two approaches:
  - `enquo()` with `!!()` (injection operator)
  - `{{}}`

```
find_group_mean <- function(.df, group){  
  group_name <- enquo(group)  
  .df |>  
    group_by(!!group_name) |>  
    summarize(across(where(is.numeric),  
                      list("mean" = mean),  
                      .names = "{.fn}_{.col}"))  
}  
find_group_mean(iris, Species)
```

```
## # A tibble: 3 x 5  
##   Species mean_Sepal.Length mean_Sepal.Width mean_Petal.Length mean_Petal.Width  
##   <fct>      <dbl>          <dbl>          <dbl>          <dbl>  
## 1 setosa      5.01            3.43            1.46            0.246  
## 2 versico~    5.94            2.77            4.26            1.33  
## 3 virginia~  6.59            2.97            5.55            2.03
```

# Selecting Columns in `tidy` Style Functions

- Two approaches:
  - `enquo()` with `!!()` (injection operator)
  - `{{}}`

```
find_group_mean <- function(.df, group){  
  .df |>  
    group_by({{group}}) |>  
    summarize(across(where(is.numeric),  
                      list("mean" = mean),  
                      .names = "{.fn}_{.col}"))  
}  
find_group_mean(iris, Species)
```

```
## # A tibble: 3 x 5  
##   Species mean_Sepal.Length mean_Sepal.Width mean_Petal.Length mean_Petal.Width  
##   <fct>      <dbl>          <dbl>          <dbl>          <dbl>  
## 1 setosa      5.01            3.43            1.46            0.246  
## 2 versico~    5.94            2.77            4.26            1.33  
## 3 virginia~  6.59            2.97            5.55            2.03
```

# Combining with ...

- We can allow for multiple columns with ...
- Must use `quos()` and `!!!()` instead

```
find_group_mean <- function(.df, ...){  
  group_vars <- quos(...)  
  .df |>  
    group_by(!!!group_vars) |>  
    summarize(across(where(is.numeric),  
                      list("mean" = mean),  
                      .names = "{.fn}_{.col}"))  
}  
find_group_mean(CO2, Type, Treatment)
```

```
## # A tibble: 4 x 4  
## # Groups:   Type [2]  
##   Type      Treatment mean_conc mean_uptake  
##   <fct>      <fct>      <dbl>      <dbl>  
## 1 Quebec    nonchilled    435        35.3  
## 2 Quebec     chilled    435        31.8  
## 3 Mississippi nonchilled    435        26.0  
## 4 Mississippi chilled      435        15.8
```

# as\_label() for tidyverse Style Functions

- We may want to name a variable using a column passed
- `as_label()` can be used!
- Must use "Walrus" operator, `:=`

```
find_group_mean <- function(.df, group, column){  
  group_name <- enquo(group)  
  column_name <- enquo(column)  
  column_label <- paste0("mean_", as_label(column_name))  
  .df |>  
    group_by(!!group_name) |>  
    summarize(!!(column_label) := mean(!!column_name))  
}  
find_group_mean(iris, Species, Sepal.Length)
```

```
## # A tibble: 3 x 2  
##   Species    mean_Sepal.Length  
##   <fct>          <dbl>  
## 1 setosa          5.01  
## 2 versicolor     5.94  
## 3 virginica      6.59
```

# Pipeable functions

- Piping is great - we may want to make sure our functions are pipeable!
- Two types of pipeable functions:
  1. **transformations**
  2. **side-effects**

# Pipeable functions

- Piping is great - we may want to make sure our functions are pipeable!
- Two types of pipeable functions:
  1. **transformations**
  2. **side-effects**
- transformations naturally return the modified argument (df)
- side-effects don't
  - Solution: Silently return the DF with `invisible()`

# Pipeable functions

- Example: Side-effect function to print info

```
print_num_obs <- function(.df) {  
  cat("The number of observations in the data set is ",  
      nrow(.df),  
      "\n",  
      sep = "")  
}  
iris |>  
  print_num_obs() |>  
  summarize(mean = mean(Sepal.Length))
```

```
## The number of observations in the data set is 150
```

```
## Error in UseMethod("summarise"): no applicable method for 'summarise' applied to an object of class "NULL"
```

# Pipeable functions

- Example: Side-effect function to print info

```
print_num_obs <- function(.df) {  
  cat("The number of observations in the data set is ",  
      nrow(.df),  
      "\n",  
      sep = "")  
  invisible(.df)  
}  
iris |>  
  print_num_obs() |>  
  summarize(mean = mean(Sepal.Length))
```

```
## The number of observations in the data set is 150
```

```
##      mean
```

```
## 1 5.843333
```



# Lazy Evaluation

- R evaluates arguments only when needed!
- Consider the silly function below:

```
run <- function(x){  
  3  
}  
run(stop("stop now!"))
```

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

# Lazy Evaluation

- R evaluates arguments only when needed!
  - Force evaluation by writing the argument or `force(arg)`

```
run <- function(x){  
  force(x) #or just x, this just makes it explicit it wasn't a typo!  
  3  
}  
run(stop("stop now!"))
```

## Error in force(x): stop now!

# Lazy Evaluation On Comparisons

- This is true for compound `if` statements as well!

```
x <- NULL  
x > 0
```

```
## logical(0)
```

```
if(x > 0){  
  print("hey")  
}
```

```
## Error in if (x > 0) {: argument is of length zero
```

```
!is.null(x)
```

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

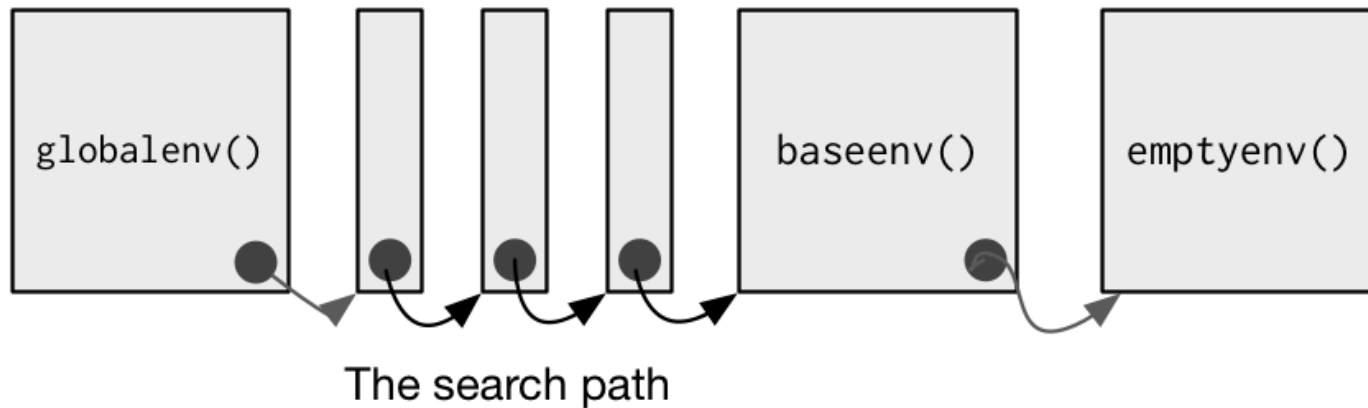
```
if (!is.null(x) && x > 0) {  
  print("hey")  
}
```

# Environments and Lexical Scoping

- R objects live in an environment
- You can think of it as a "bag of names" that point to things in memory
- Like a list but with no ordering (and other things)

# Environments and Lexical Scoping

- Environments have 'parents' and 'children'
  - Global environment is where our created function objects live
  - Search path has all packages loaded in (most recent package is the parent of the global environment)
  - Base environment is the child of the ultimate ancestor, the empty environment



# Environments and Lexical Scoping

- We can see the 'search' path using `search()`

```
## [1] ".GlobalEnv"      "package:knitr"    "package:forcats"  
## [4] "package:stringr" "package:dplyr"    "package:purrr"  
## [7] "package:readr"   "package:tidyr"    "package:tibble"  
## [10] "package:ggplot2" "package:tidyverse" "package:stats"  
## [13] "package:graphics" "package:grDevices" "package:utils"  
## [16] "package:datasets" "package:methods"  "Autoloads"  
## [19] "package:base"
```

# Environments and Lexical Scoping

- Don't need to fully understand environments but some things are important

```
library(pryr) #install if needed  
x <- "hey"  
where("x")
```

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

```
where("mean")
```

```
## <environment: base>
```

# Environments and Lexical Scoping

- When you call a function, it creates temporary function environments
- This is why variables in functions don't overwrite things!

```
f <- function(x){  
  mean <- paste0(x, " is a value")  
  mean  
}  
f(1:3)
```

```
## [1] "1 is a value" "2 is a value" "3 is a value"
```

```
mean
```

```
## function (x, ...)  
## UseMethod("mean")  
## <bytecode: 0x00000000160f5cc0>  
## <environment: namespace:base>
```



# Environments and Lexical Scoping

- When you call a function, it creates temporary function environments
- This is why variables in functions don't exist outside the function

```
g <- function(x) {  
  if (!exists("a", inherits = FALSE)) {  
    message("Defining a")  
    a <- 1  
  } else {  
    a <- a + 1  
  }  
  a  
}
```

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

```
g(10)
```

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

# Environments and Lexical Scoping

- When you call a function, it creates temporary function environments
- This is why variables can have the same name in a function and in your global environment

```
y <- 10  
f <- function(x){  
  y <- 1  
  x + y  
}  
f(15)
```

```
## [1] 16
```

# Environments and Lexical Scoping

- **Important:** If R doesn't find an object in the current environment, it will search up the path

```
y <- 1  
f <- function(x){  
  x + y  
}  
f(10)
```

```
## [1] 11
```

# Recap!

- `...` for unnamed arguments
- Writing `tidyverse` style functions
- Lazy evaluation
- Environments and lexical scoping