

Chapter 11: Function Operators

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R4DS Reading Group



What are function operators (FO)?

Chapter 9 is about functionals. Chapter 10 is about function factories. What makes function operators different?

Term	Required Input	Optional Input	Output
Functionals	Function	Vector	Vector
Function Factory		Vector, Function	Function
Function Operator	Function	Vector	Function

FOs are probably best studied by thinking about how they operate on functions.

- **Behavioral FO**: Changes the behavior of a function, e.g. logging, running a function only when necessary
 - `memoise::memoise()`
- **Output FO**: Manipulates the output of a function
 - `purrr::possibly()`, `purrr::safely()`, `purrr::quietly()`
- **Input FO**: Manipulates the input of a function
 - `purrr::partial()`

`purrr::safely()` docs: ... "They are all adverbs because they modify the action of a verb (a function)."



Behavior FO Example #1

Now with an additional input, vector `n`

```
slowly <- function(f, n){  
  force(f)  
  force(n)  
  function(...){  
    stopifnot(is.numeric(n))  
    cat(  
      glue::glue('Sleeping for {n} seconds.'),  
      sep = '\n'  
    )  
    Sys.sleep(n)  
    f(...)  
  }  
}  
  
purrr::walk(  
  c('hello', 'world'),  
  slowly(cat, 0.1),  
  sep = '\n' # Passed to `f()` via `...`  
)
```

```
## Sleeping for 0.1 seconds.  
## hello  
## Sleeping for 0.1 seconds.  
## world
```

<https://gist.github.com/ColinFay/d32cf4c9c5fb8d849f12a4e98d6c0549>



Behavioral FO Example #2

```
twice <- function(f){  
  force(f)  
  function(...){  
    f(...)  
    f(...)  
  }  
}  
  
purrr::walk(  
  c('hello', 'world'),  
  twice(cat),  
  sep = '\n' # Passed to `f()` via `...`  
)  
  
## hello  
## hello  
## world  
## world
```

Inspiration: <https://realpython.com/primer-on-python-decorators/>



Behavioral FO Example #2

With python 🐍

```
def do_twice(f):  
    def wrapper(*args, **kwargs):  
        f(*args, **kwargs)  
        f(*args, **kwargs)  
    return wrapper  
  
@do_twice  
def say(x):  
    print(x)  
  
list(map(say, ['hello', 'world']))  
  
## hello  
## hello  
## world  
## world  
## [None, None]
```



Behavioral FO Example #3

```
download_beers <- function(name, verbose = TRUE) {  
  base_url <- 'https://raw.githubusercontent.com/rfordatascience/tidytuesday/master/data/2022/  
  url <- glue::glue('{base_url}{name}.csv')  
  if(verbose) {  
    cat(glue::glue('Downloading {name}.csv'), sep = '\n')  
  }  
  readr::read_csv(url)  
}
```

Using `memoise::memoise()` for caching

```
download_beers_quickly <- memoise::memoise(download_beers)  
  
bench::mark(  
  download_beers('brewer_size', verbose = FALSE),  
  download_beers_quickly('brewer_size', verbose = FALSE)  
) %>%  
  dplyr::select(expression, min, median)
```

```
## # A tibble: 2 x 3  
##   expression                                min    median  
##   <bch:expr>                        <bch:tm> <bch:tm>  
## 1 download_beers("brewer_size", verbose = FALSE)      77.8ms    89.6ms  
## 2 download_beers_quickly("brewer_size", verbose = FALSE)  162us    188.5us
```



Behavioral FO Example #4

Testing the speed of `memoise::memoise()`

```
# Forgive the contrived function.
slow_function <- function(x) {
  Sys.sleep(0.2)
  x * runif(1)
}
fast_function <- memoise::memoise(slow_function)
```

```
system.time(slow_function(1))
```

```
##    user  system elapsed
##    0.00    0.00    0.36
```

```
system.time(slow_function(1))
```

```
##    user  system elapsed
##    0.00    0.00    0.21
```

```
system.time(fast_function(11))
```

```
##    user  system elapsed
##    0.00    0.00    0.34
```

```
system.time(fast_function(11))
```

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



Behavioral FO Example #4

Even if you've changed the inputs since the most recent call, it will still be fast.

```
system.time(fast_function(22))
```

```
##      user  system elapsed  
##      0.0      0.0      0.3
```

```
system.time(fast_function(33))
```

```
##      user  system elapsed  
##      0.0      0.0      0.2
```

```
system.time(fast_function(22))
```

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

In fact, it remembers everything from the same session (assuming you haven't used `memoise::forget()`).

```
system.time(fast_function(11))
```

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

```
system.time(fast_function(22))
```

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

```
system.time(fast_function(33))
```

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


Input FO Example #1

Setting `na.rm = TRUE`

```
stat_robust <- function(f, ...) {  
  function(...) {  
    f(..., na.rm = TRUE)  
  }  
}  
mean_robust <- stat_robust(mean)  
min_robust <- stat_robust(min)  
quantile_robust <- stat_robust(quantile)
```

```
x1 <- 1L:10L  
mean_robust(x1)
```

```
## [1] 5.5
```

```
min_robust(x1)
```

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

```
quantile_robust(x1, 0.25)
```

```
## 25%
```

```
## 3.25
```

```
x2 <- x1; x2[1] <- NA  
mean_robust(x2)
```

```
## [1] 6
```

```
min_robust(x2)
```

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

```
quantile_robust(x2, 0.25)
```

```
## 25%
```

```
## 4
```



Input FO Example #1

Using `purrr::partial()` to set `na.rm = TRUE`

```
mean_partial <- partial(mean, na.rm = TRUE)
min_partial <- partial(min, na.rm = TRUE)
quantile_partial <- partial(quantile, na.rm = TRUE, ... = )
```

Without `purrr::partial()`

```
mean_wrapper <- function(...) {
  mean(..., na.rm = TRUE)
}
```

Input FO Example #2

Using the `brewer_size` data set

```
brewer_size %>%  
  summarize_at(  
    vars(total_barrels, total_shipped),  
    list(mean = mean, mean_robust = mean_robust)  
  ) %>%  
  mutate_all(  
    ~scales::number(., scale = 1e-3, big.mark = ',', suffix = ' k')  
  ) %>%  
  glimpse()
```

```
## Rows: 1  
## Columns: 4  
## $ total_barrels_mean      <chr> NA  
## $ total_shipped_mean     <chr> NA  
## $ total_barrels_mean_robust <chr> "30,796 k"  
## $ total_shipped_mean_robust <chr> "885 k"
```



Output FO Example #1

Using `purrr::safely()`

```
download_beers_safely <- purrr::safely(download_beers)

brewing_material <- download_beers_safely('brewing_material') # Oops!
```

```
## Downloading brewing_material.csv
```

```
brewing_material
```

```
## $result
## NULL
##
## $error
## <simpleError in open.connection(con, "rb"): HTTP error 404.>
```

```
brewing_materials <- download_beers_safely('brewing_materials') # Good
```

```
## Downloading brewing_materials.csv
```

```
brewing_materials$result %>% head(5)
```

```
## # A tibble: 5 x 9
##   data_type          material_type  year month type          month_current mon
##   <chr>              <chr>      <dbl> <dbl> <chr>          <dbl>
## 1 Pounds of Materials Used Grain Products  2008     1 Malt and malt products  374165152
## 2 Pounds of Materials Used Grain Products  2008     1 Corn and corn products  57563519
## 3 Pounds of Materials Used Grain Products  2008     1 Rice and rice products  72402143
## 4 Pounds of Materials Used Grain Products  2008     1 Barley and barley products  3800844
## 5 Pounds of Materials Used Grain Products  2008     1 Wheat and wheat products  1177186
```



Output FO Example #2

Using `purrr::possibly()`

```
download_beers_possibly <- purrr::possibly(download_beers, otherwise = tibble())  
  
brewing_material <- download_beers_possibly('brewing_material') # Oops!  
## Downloading brewing_material.csv  
brewing_material  
## # A tibble: 0 x 0
```



Output FO Example #3

Using `purrr::quietly()`

```
download_beers_quietly <- purrr::quietly(download_beers)

brewing_materials <- download_beers_quietly('brewing_materials')
names(brewing_materials)
```

```
## [1] "result" "output" "warnings" "messages"
```

```
brewing_materials$result %>% head(5)
```

```
## # A tibble: 5 x 9
```

##	data_type	material_type	year	month	type	month_current	mon
##	<chr>	<chr>	<dbl>	<dbl>	<chr>	<dbl>	
## 1	Pounds of Materials Used	Grain Products	2008	1	Malt and malt products	374165152	
## 2	Pounds of Materials Used	Grain Products	2008	1	Corn and corn products	57563519	
## 3	Pounds of Materials Used	Grain Products	2008	1	Rice and rice products	72402143	
## 4	Pounds of Materials Used	Grain Products	2008	1	Barley and barley products	3800844	
## 5	Pounds of Materials Used	Grain Products	2008	1	Wheat and wheat products	1177186	



Combining FOs Example

```
nms <- c('woops', 'brewing_materials', 'beer_taxed', 'brewer_size', 'beer_states') %>%  
  setNames(., .)
```

```
download_beers_nicely <- slowly(download_beers_safely, 0.1)  
beers <- nms %>%  
  map(.,  
    ~download_beers_nicely(..1) %>%  
      purrr::pluck('result')  
  )
```

```
## Sleeping for 0.1 seconds.  
## Downloading woops.csv  
## Sleeping for 0.1 seconds.  
## Downloading brewing_materials.csv  
## Sleeping for 0.1 seconds.  
## Downloading beer_taxed.csv  
## Sleeping for 0.1 seconds.  
## Downloading brewer_size.csv  
## Sleeping for 0.1 seconds.  
## Downloading beer_states.csv
```

```
beers %>% map(dim) %>% str()
```

```
## List of 5  
## $ woops          : NULL  
## $ brewing_materials: int [1:2] 1440 9  
## $ beer_taxed      : int [1:2] 1580 10  
## $ brewer_size     : int [1:2] 137 6  
## $ beer_states     : int [1:2] 1872 4
```



Combining FOs Example

And a real-world use-case for `purrr::reduce()`!

```
beers %>%  
  purrr::discard(is.null) %>%  
  purrr::reduce(dplyr::left_join) %>%  
  dim()
```

```
## [1] 15984    18
```




FOs in the Wild

- `{scales}` and `{ggplot2}`'s `scale_(color|fill)_*`()
- `{glue}` with it's transformers
- Sparingly in `{styler}` and `{lintr}`
- `{plumber}` uses R6 🐱

FIN

