



Apply Family of Functions

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Efficient Code

For loops vs Vectorized Functions

`apply()` Family

- `apply()` family of functions *pretty* fast
- Check `help(apply)`!
 - We'll look at `apply()`, `sapply()`, `lapply()`

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- Consider our Batting data set

```
library(Lahman)
my_batting <- Batting[, c("playerID", "teamID", "G", "AB", "R", "H", "X2B", "X3B", "HR")] |>
  as_tibble()
my_batting
```

```
## # A tibble: 108,789 x 9
##   playerID teamID      G    AB    R    H   X2B   X3B   HR
##   <chr>     <fct> <int> <int> <int> <int> <int> <int> <int>
## 1 abercda01 TR0      1     4     0     0     0     0     0
## 2 addybo01  RC1     25    118    30    32     6     0     0
## 3 allisar01 CL1     29    137    28    40     4     5     0
## 4 allisdo01 WS3     27    133    28    44    10     2     2
## 5 ansonca01 RC1     25    120    29    39    11     3     0
## # i 108,784 more rows
```

apply() Family

- Use `apply()` to find summary for the batting data

```
apply(X = my_batting,  
      MARGIN = 2,  
      FUN = summary,  
      na.rm = TRUE)
```

```
##      playerID    teamID      G      AB      R      H  
## Length "108789"    "108789"  "108789"  "108789"  "108789"  "108789"  
## Class  "character" "character" "character" "character" "character" "character"  
## Mode   "character" "character" "character" "character" "character" "character"  
##      X2B      X3B      HR  
## Length "108789"    "108789"  "108789"  
## Class  "character" "character" "character"  
## Mode   "character" "character" "character"
```

apply() Family

- Let's try it with just numeric data!

```
batting_summary <- apply(X = my_batting |>
  select(where(is.numeric)),
  MARGIN = 2,
  FUN = summary,
  na.rm = TRUE)

batting_summary
```

##	G	AB	R	H	X2B	X3B	HR
## Min.	1.00000	0.0000	0.0000	0.00000	0.000000	0.000000	0.00000
## 1st Qu.	12.00000	4.0000	0.0000	0.00000	0.000000	0.000000	0.00000
## Median	34.00000	46.0000	4.0000	8.00000	1.000000	0.000000	0.00000
## Mean	50.74049	139.2413	18.4835	36.38861	6.202024	1.247075	2.85015
## 3rd Qu.	79.00000	224.0000	27.0000	56.00000	9.000000	1.000000	2.00000
## Max.	165.00000	716.0000	198.0000	262.00000	67.000000	36.000000	73.00000

Anonymous Functions

- We often use our own custom functions with the `apply()` family
 - Called anonymous functions or lambda functions

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```
custom_batting_summary <- apply(X = my_batting |>
  select(where(is.numeric)),
  MARGIN = 2,
  FUN = function(x){
    temp <- c(mean(x), sd(x))
    names(temp) <- c("mean", "sd")
    temp
  }
)
custom_batting_summary
```

```
##           G      AB      R      H      X2B      X3B      HR
## mean 50.74049 139.2413 18.48350 36.38861 6.202024 1.247075 2.850150
## sd   46.88959 183.6021 28.04323 52.18888 9.627314 2.595462 6.368678
```


Anonymous Functions

- Anonymous functions can take other arguments

```
custom_batting_summary <- apply(X = my_batting |>
  select(where(is.numeric)),
  MARGIN = 2,
  FUN = function(x, trim){
    temp <- c(mean(x, trim), sd(x))
    names(temp) <- c("mean", "sd")
    temp
  },
  trim = 0.1
)
custom_batting_summary
```

```
##           G           AB           R           H           X2B           X3B           HR
## mean 44.74459 105.1568 12.30237 25.69437 4.058495 0.5909368 1.168660
## sd   46.88959 183.6021 28.04323 52.18888 9.627314 2.5954618 6.368678
```

lapply()

- Use `lapply()` to apply function to lists
- Obtain a list object

```
set.seed(10)
my_list <- list(rnorm(100), runif(10), rgamma(40, shape = 1, rate = 1))
```

lapply()

- Apply `mean()` function to each list element

```
lapply(X = my_list, FUN = mean)
```

```
## [[1]]  
## [1] -0.1365489  
##  
## [[2]]  
## [1] 0.5997619  
##  
## [[3]]  
## [1] 1.108209
```

lapply()

- To give additional arguments to FUN we add them on afterward

```
lapply(X = my_list, FUN = mean, trim = 0.1, na.rm = TRUE)
```

```
## [[1]]  
## [1] -0.1359629  
##  
## [[2]]  
## [1] 0.6062252  
##  
## [[3]]  
## [1] 0.9563087
```

sapply()

- Similar function but it attempts to simplify when possible

```
sapply(X = my_list, FUN = mean, trim = 0.1, na.rm = TRUE)
```

```
## [1] -0.1359629  0.6062252  0.9563087
```

Recap!

- Vectorized functions fast!
- `apply()` family is sort of vectorized
- `lapply()` and `sapply()` to apply a function to a list
- `aggregate()`, `replicate()`, `tapply()`, `vapply()`, and `mapply()` also exist!