Manipulating Data with dplyr

Thinking about our big goals (doing data science):

- Read in raw data and manipulate it
- Combine data sources
- Summarize data to glean insights
- Apply common analysis methods
- Communicate Effectively

We now have a good idea about reading in certain types of data. Let's take a bit of time going through common data manipulation tasks before returning to reading data in.

The two major tasks we'll consider are

- Row manipulations
 - filtering or subsetting our observations
 - o arranging our observations in some order
- Column manipulations
 - selecting a subset of our variables
 - rename a column
 - o mutating our data frame to create a new variable

We can use BaseR for this (via [or the subset() function). However, the tidyverse has a more coherent set of functions to allow us to do all of our tasks without having to spend as much time learning syntax. So let's go that route!

Recall the basic fundamentals about the tidyverse:

- (Almost) all functions take in tibbles (special data frames) and output tibbles
- (Almost) all functions have similar syntax!

```
function(tibble, arguments, ...)
```

Allows for easy chaining!

```
my_data |>
  select(var1:var10, var20) |>
  filter(var1 == "first") |>
  mutate(new_var = lag(var20)) |>
  ...
```

Coercing a Data Frame to a Tibble

If you happen to have a data frame that isn't already a tibble, we can easily coerce it

using the as_tibble() function.

Consider a data set on major league baseball players (batting statistics):

```
library(dplyr)
```

Warning: package 'dplyr' was built under R version 4.1.3

Attaching package: 'dplyr'

The following objects are masked from 'package:stats':

filter, lag

The following objects are masked from 'package:base':

intersect, setdiff, setequal, union

```
library(Lahman)
```

Warning: package 'Lahman' was built under R version 4.1.3

```
batting_tbl <- as_tibble(Batting)
batting_tbl</pre>
```

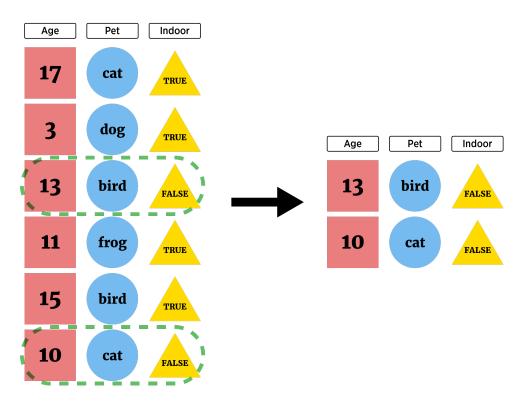
```
# A tibble: 108,789 x 22
   playerID yearID stint teamID lgID
                                                                      X2B
                                              G
                                                    AΒ
                                                           R
                                                                  Н
                                                                             X3B
HR
               <int> <int> <fct> <fct> <int> <int> <int> <int> <int> <int> <int>
   <chr>>
<int>
 1 abercda01
                1871
                          1 TRO
                                   NA
                                              1
                                                     4
                                                           0
                                                                  0
                                                                               0
 2 addybo01
                1871
                          1 RC1
                                   NA
                                             25
                                                   118
                                                          30
                                                                 32
 3 allisar01
                1871
                          1 CL1
                                   NA
                                             29
                                                   137
                                                          28
                                                                               5
0
 4 allisdo01
                1871
                          1 WS3
                                   NA
                                             27
                                                   133
                                                          28
                                                                       10
                                                                               2
2
 5 ansonca01
                                                                               3
                1871
                          1 RC1
                                   NA
                                             25
                                                   120
                                                          29
                                                                 39
                                                                       11
 6 armstbo01
                1871
                          1 FW1
                                   NA
                                             12
                                                    49
                                                           9
                                                                 11
                                                                        2
                                                                               1
0
 7 barkeal01
                                              1
                                                     4
                                                           0
                                                                  1
                                                                        0
                                                                               0
                1871
                          1 RC1
                                   NA
0
 8 barnero01
                1871
                          1 BS1
                                   NA
                                             31
                                                   157
                                                          66
                                                                 63
                                                                       10
                                                                               9
                                                     5
 9 barrebi01
                1871
                          1 FW1
                                   NA
                                              1
                                                           1
                                                                  1
                                                                        1
                                                                               0
10 barrofr01
                1871
                          1 BS1
                                   NA
                                             18
                                                    86
                                                          13
                                                                 13
                                                                        2
                                                                               1
# i 108,779 more rows
# i 10 more variables: RBI <int>, SB <int>, CS <int>, BB <int>, SO <int>,
```

IBB (INT), HBP (INT), SH (INT), SF (INT), GIDP (INT)

Nice, now we can work on this tibble!

Row Manipulations with dplyr

A common task is to only grab certain types of observations (filter rows)



or rearrange the order of the observations (rows). The two functions from <code>dplyr</code> that help us here are

- filter() subset rows
- arrange() reorder rows

filter()

filter() generally takes a tibble as its first argument and then a logical vector as the next (of the same length as the number of rows):

 Return observations where the number of games played is greater than 50 (the G column):

```
filter(batting_tbl, G > 50)
# A tibble: 40,168 x 22
   playerID yearID stint teamID lgID
                                                    AB
                                                           R
                                                                      X2B
                                                                            X3B
HR
               <int> <int> <fct> <fct> <int> <int> <int> <int> <int> <int> <int>
   <chr>>
<int>
 1 bechtge01
                1872
                          1 NY2
                                   NA
                                             51
                                                   247
                                                          61
                                                                74
                                                                               3
                                             55
 2 cummica01
                1872
                          1 NY2
                                   NA
                                                   249
                                                          37
                                                                 52
                                                                               3
```

0												
3 eggleda01	1872	1 NY2	NA	56	290	94	97	20	0			
0												
4 hallge01	1872	1 BL1	NA	53	250	69	84	17	6			
1												
5 hatfijo01	1872	1 NY2	NA	56	288	76	93	15	2			
1												
6 hicksna01	1872	1 NY2	NA	56	267	54	82	12	2			
0												
7 mcmuljo01	1872	1 NY2	NA	54	236	47	60	6	1			
0												
8 millsev01	1872	1 BL1	NA	55	266	55	79	14	2			
0												
9 pikeli01	1872	1 BL1	NA	56	285	68	85	15	5			
7												
10 radcljo01	1872	1 BL1	NA	56	297	70	86	13	4			
1												
# i 40,158 mor	# i 40,158 more rows											
# i 10 more variables: RBI <int>, SB <int>, CS <int>, BB <int>, SO <int>,</int></int></int></int></int>												
# IBB <int>, HBP <int>, SH <int>, SF <int>, GIDP <int></int></int></int></int></int>												

Notice the number of observations is far less now!

• Of course, we'll do many operations so let's use chaining even in this simple case:

```
batting_tbl |>
  filter(G > 50)
```

```
# A tibble: 40,168 x 22
   playerID yearID stint teamID lgID
                                               G
                                                     AΒ
                                                                   Н
                                                                       X2B
                                                            R
                                                                              X3B
HR
               <int> <int> <fct> <fct> <int> <int> <int> <int> <int> <int> <int><</pre>
   <chr>>
<int>
 1 bechtge01
                1872
                          1 NY2
                                    NA
                                              51
                                                   247
                                                           61
                                                                  74
                                                                        11
                                                                                3
                                                                         9
 2 cummica01
                1872
                          1 NY2
                                    NA
                                              55
                                                    249
                                                           37
                                                                  52
                                                                                3
 3 eggleda01
                                                    290
                                                                  97
                1872
                          1 NY2
                                    NA
                                              56
                                                           94
                                                                        20
                                                                                0
 4 hallge01
                1872
                          1 BL1
                                    NA
                                              53
                                                   250
                                                           69
                                                                  84
                                                                        17
                                                                                6
                1872
 5 hatfijo01
                          1 NY2
                                                    288
                                                           76
                                                                  93
                                                                        15
                                                                                2
                                    NA
                                              56
1
 6 hicksna01
                1872
                          1 NY2
                                              56
                                                   267
                                                           54
                                                                  82
                                                                        12
                                                                                2
                                    NA
0
 7 mcmuljo01
                1872
                          1 NY2
                                              54
                                                   236
                                                           47
                                                                  60
                                                                         6
                                                                                1
                                    NA
0
 8 millsev01
                1872
                          1 BL1
                                    NA
                                              55
                                                    266
                                                           55
                                                                  79
                                                                        14
                                                                                2
 9 pikeli01
                                                                                5
                1872
                          1 BL1
                                    NA
                                              56
                                                    285
                                                           68
                                                                  85
                                                                        15
10 radcljo01
                                                    297
                1872
                          1 BL1
                                    NA
                                              56
                                                           70
                                                                  86
                                                                        13
                                                                                4
1
```

```
# i 40,158 more rows
# i 10 more variables: RBI <int>, SB <int>, CS <int>, BB <int>, SO <int>,
    IBB <int>, HBP <int>, SH <int>, SF <int>, GIDP <int>
```

- If we want to return observations where than one condition is TRUE we can either pass additional arguments or use the compound logical operator & we discussed earlier.
 - Condition on those that played more than 50 games and played in 2018

```
batting_tbl |>
 filter(G > 50 \& yearID == 2018)
```

```
# A tibble: 518 x 22
   playerID yearID stint teamID lgID
                                                                       X2B
                                                                              X3B
                                               G
                                                     AΒ
                                                            R
                                                                   Н
HR
   <chr>>
               <int> <int> <fct> <fct> <int> <int> <int> <int> <int> <int> <int>
<int>
 1 abreujo02
                2018
                          1 CHA
                                    AL
                                             128
                                                    499
                                                           68
                                                                 132
                                                                        36
                                                                                1
22
 2 acunaro01
                2018
                          1 ATL
                                    NL
                                             111
                                                    433
                                                           78
                                                                 127
                                                                        26
                                                                                4
26
 3 adamewi01
                2018
                          1 TBA
                                    ΑL
                                              85
                                                    288
                                                           43
                                                                  80
                                                                          7
                                                                                0
10
                                                                          9
                                                                                0
 4 adamsma01
                2018
                          1 WAS
                                    NL
                                              94
                                                    249
                                                           37
                                                                  64
18
 5 adducji02
                                                           19
                                                                          8
                                                                                2
                2018
                          1 DET
                                    AL
                                              59
                                                    176
                                                                  47
3
 6 adriaeh01
                2018
                          1 MIN
                                    ΑL
                                             114
                                                   335
                                                           42
                                                                  84
                                                                        23
                                                                                1
6
 7 aguilje01
                2018
                          1 MIL
                                    NL
                                             149
                                                    492
                                                           80
                                                                 135
                                                                        25
                                                                                0
 8 ahmedni01
                                                                                5
                2018
                          1 ARI
                                    NL
                                             153
                                                    516
                                                           61
                                                                 121
                                                                        33
16
                                                                                5
 9 albieoz01
                          1 ATL
                                             158
                                                    639
                                                          105
                                                                 167
                                                                        40
                2018
                                    NL
24
10 alexasc01
                2018
                          1 LAN
                                    NL
                                              73
                                                      5
                                                            0
                                                                   0
                                                                          0
                                                                                0
0
# i 508 more rows
# i 10 more variables: RBI <int>, SB <int>, CS <int>, BB <int>, SO <int>,
    IBB <int>, HBP <int>, SH <int>, SF <int>, GIDP <int>
           #equivalently
```

```
batting_tbl |>
 filter(G > 50, yearID == 2018)
```

```
# A tibble: 518 x 22
   playerID yearID stint teamID lgID
                                                                       X2B
                                                                              Х3В
                                               G
                                                    AB
                                                            R
                                                                   Н
HR
   <chr>>
               <int> <int> <fct> <fct> <int> <int> <int> <int> <int> <int> <int>
<int>
 1 abreujo02
                2018
                          1 CHA
                                             128
                                                    499
                                                                 132
                                                                        36
                                                                                1
                                    ΑL
                                                           68
22
                                                           78
                                                                                4
 2 acunaro01
                2018
                          1 ATL
                                    NL
                                             111
                                                   433
                                                                 127
                                                                        26
```

```
26
 3 adamewi01
                          1 TBA
                                                    288
                                                                   80
                                                                                 0
                2018
                                    AL
                                               85
                                                            43
10
 4 adamsma01
                2018
                          1 WAS
                                    NL
                                               94
                                                    249
                                                            37
                                                                   64
                                                                           9
                                                                                 0
18
 5 adducji02
                2018
                          1 DET
                                    AL
                                               59
                                                    176
                                                            19
                                                                   47
                                                                           8
                                                                                 2
3
 6 adriaeh01
                2018
                          1 MIN
                                    AL
                                             114
                                                    335
                                                            42
                                                                   84
                                                                         23
                                                                                 1
6
 7 aguilje01
                2018
                          1 MIL
                                    NL
                                             149
                                                    492
                                                            80
                                                                  135
                                                                         25
                                                                                 0
35
 8 ahmedni01
                                                                                 5
                2018
                          1 ARI
                                    NL
                                             153
                                                    516
                                                            61
                                                                  121
                                                                         33
16
 9 albieoz01
                                             158
                                                           105
                                                                                 5
                2018
                          1 ATL
                                    NL
                                                    639
                                                                  167
                                                                         40
24
                                              73
                                                      5
                                                             0
                                                                                 0
10 alexasc01
                2018
                          1 LAN
                                    NL
                                                                    0
                                                                           0
0
# i 508 more rows
# i 10 more variables: RBI <int>, SB <int>, CS <int>, BB <int>, SO <int>,
    IBB <int>, HBP <int>, SH <int>, SF <int>, GIDP <int>
```

 Often we want to check if a variable is in a specific group of values. We might think this is the way:

```
#wrong!
batting_tbl |>
  filter(G > 50, yearID == c(2018, 2019, 2020))
```

```
# A tibble: 408 x 22
   playerID yearID stint teamID lgID
                                                      AΒ
                                                              R
                                                                         X2B
                                                                               Х3В
                                                G
                                                                    Н
HR
   <chr>>
               <int> <int> <fct> <fct> <int> <int> <int> <int> <int> <int> <int>
<int>
 1 abreujo02
                2018
                           1 CHA
                                     AL
                                              128
                                                     499
                                                            68
                                                                  132
                                                                          36
                                                                                  1
22
                                               59
 2 adducji02
                2018
                           1 DET
                                     AL
                                                     176
                                                            19
                                                                   47
                                                                           8
                                                                                  2
3
 3 ahmedni01
                           1 ARI
                                                                                  5
                2018
                                     NL
                                              153
                                                     516
                                                            61
                                                                  121
                                                                          33
16
 4 albieoz01
                2018
                           1 ATL
                                     NL
                                              158
                                                     639
                                                           105
                                                                  167
                                                                          40
                                                                                  5
24
 5 alexasc01
                2018
                           1 LAN
                                     NL
                                               73
                                                       5
                                                             0
                                                                    0
                                                                           0
                                                                                  0
0
 6 almoral01
                2018
                           1 CHN
                                     NL
                                              152
                                                     444
                                                            62
                                                                  127
                                                                          24
                                                                                  1
5
 7 altheaa01
                2018
                           1 PHI
                                     NL
                                              105
                                                     243
                                                            28
                                                                   44
                                                                          11
                                                                                  1
8
 8 alvarjo03
                                                       0
                                                                                  0
                2018
                           1 TBA
                                     AL
                                               70
                                                             0
                                                                    0
                                                                           0
0
 9 anderbr06
                2018
                           1 MIA
                                     NL
                                              156
                                                     590
                                                            87
                                                                  161
                                                                          34
                                                                                  4
11
                                                                    0
                                                                                  0
10 anderju01
                2018
                           1 LAA
                                     ΑL
                                               57
                                                       0
                                                              0
                                                                           0
# i 398 more rows
```

```
# i 10 more variables: RBI <int>, SB <int>, CS <int>, BB <int>, SO <int>,
```

- # IBB <int>, HBP <int>, SH <int>, SF <int>, GIDP <int>
- Here, R uses *recycling* on the vector and actually compares the 1st element to 2018, the 2nd to 2019, the third to 2020, the fourth to 2018, the fifth to 2019, ...
- Use %in% to choose any observations matching an element of a vector

```
batting_tbl |>
  filter(G > 50, yearID %in% c(2018, 2019, 2020))
```

```
# A tibble: 1,172 x 22
   playerID yearID stint teamID lgID
                                               G
                                                     AB
                                                             R
                                                                   Н
                                                                        X2B
                                                                              X3B
HR
               <int> <int> <fct> <fct> <int> <int> <int> <int> <int> <int> <int>
   <chr>>
<int>
                          1 CHA
                                             128
                                                    499
                                                                 132
 1 abreujo02
                2018
                                    AL
                                                           68
                                                                         36
                                                                                1
22
 2 acunaro01
                2018
                          1 ATL
                                             111
                                                    433
                                                           78
                                                                 127
                                                                         26
                                                                                4
                                    NL
26
 3 adamewi01
                2018
                          1 TBA
                                    ΑL
                                              85
                                                    288
                                                           43
                                                                  80
                                                                          7
                                                                                0
10
 4 adamsma01
                2018
                          1 WAS
                                    NL
                                              94
                                                    249
                                                           37
                                                                          9
                                                                                0
18
                                                                                2
 5 adducji02
                2018
                          1 DET
                                    AL
                                              59
                                                    176
                                                           19
                                                                  47
                                                                          8
3
 6 adriaeh01
                2018
                          1 MIN
                                    AL
                                             114
                                                    335
                                                           42
                                                                  84
                                                                         23
                                                                                1
6
 7 aguilje01
                                                    492
                                                                         25
                                                                                0
                2018
                          1 MIL
                                    NL
                                             149
                                                           80
                                                                 135
35
                                                                                5
 8 ahmedni01
                          1 ARI
                                    NL
                                             153
                                                    516
                                                                 121
                2018
                                                           61
                                                                         33
16
 9 albieoz01
                2018
                          1 ATL
                                    NL
                                             158
                                                    639
                                                          105
                                                                 167
                                                                         40
                                                                                5
24
                                                      5
                                                                                0
10 alexasc01
                                    NL
                                              73
                                                            0
                                                                   0
                                                                          0
                2018
                          1 LAN
# i 1,162 more rows
# i 10 more variables: RBI <int>, SB <int>, CS <int>, BB <int>, SO <int>,
    IBB <int>, HBP <int>, SH <int>, SF <int>, GIDP <int>
```

- If we want an *or* condition, we use the compound logical operator for that
 - Here, grab those with either games greater than 50 or those that played in 2018, 2019, or 2020 (or both)

```
batting_tbl |>
  filter(G > 50 | yearID %in% c(2018, 2019, 2020))
```

```
# A tibble: 43,460 x 22
   playerID yearID stint teamID lgID
                                                G
                                                      AB
                                                              R
                                                                    Н
                                                                         X2B
                                                                                X3B
HR
   <chr>>
                <int> <int> <fct> <fct> <int> <int> <int> <int> <int> <int> <int><</pre>
<int>
                                                                   74
 1 bechtge01
                1872
                           1 NY2
                                     NA
                                               51
                                                     247
                                                            61
                                                                          11
0
```

```
2 cummica01
                1872
                          1 NY2
                                    NA
                                              55
                                                   249
                                                           37
                                                                  52
                                                                         9
                                                                                3
0
 3 eggleda01
                1872
                          1 NY2
                                    NA
                                              56
                                                   290
                                                           94
                                                                  97
                                                                        20
                                                                                0
 4 hallge01
                                                   250
                1872
                          1 BL1
                                    NA
                                              53
                                                           69
                                                                  84
                                                                        17
                                                                                6
 5 hatfijo01
                1872
                          1 NY2
                                                   288
                                                                 93
                                                                                2
                                    NA
                                              56
                                                           76
                                                                        15
 6 hicksna01
                1872
                          1 NY2
                                              56
                                                   267
                                                           54
                                                                  82
                                                                        12
                                                                                2
                                    NA
0
 7 mcmuljo01
                                                   236
                                                                                1
                1872
                          1 NY2
                                    NA
                                              54
                                                           47
                                                                  60
                                                                         6
0
 8 millsev01
                                              55
                                                           55
                                                                 79
                                                                                2
                1872
                          1 BL1
                                    NA
                                                   266
                                                                        14
 9 pikeli01
                1872
                          1 BL1
                                              56
                                                   285
                                                                  85
                                                                        15
                                                                                5
                                    NΑ
                                                           68
                          1 BL1
10 radcljo01
                                              56
                                                   297
                                                           70
                                                                  86
                                                                                4
                1872
                                    NA
                                                                        13
1
# i 43,450 more rows
  i 10 more variables: RBI <int>, SB <int>, CS <int>, BB <int>, SO <int>,
    IBB <int>, HBP <int>, SH <int>, SF <int>, GIDP <int>
```

• Again, note the change in the observation count!

arrange()

The other major observation (row) manipulation is to reorder the observations (rows). This is done through <code>arrange()</code> from <code>dplyr</code> (or <code>sort()</code> in <code>BaseR)</code>

Let's take our result from above and reorder by teamID

```
batting_tbl |>
  filter(G > 50, yearID %in% c(2018, 2019, 2020)) |>
  arrange(teamID)
```

```
# A tibble: 1,172 x 22
                                                                        X2B
   playerID yearID stint teamID lgID
                                                     AB
                                                             R
                                                                               X3B
                                               G
                                                                   Н
HR
               <int> <int> <fct> <fct> <int> <int> <int> <int> <int> <int> <int>
   <chr>>
<int>
 1 ahmedni01
                2018
                          1 ARI
                                    NL
                                             153
                                                    516
                                                            61
                                                                 121
                                                                         33
                                                                                 5
16
 2 avilaal01
                2018
                          1 ARI
                                    NL
                                              80
                                                    194
                                                            13
                                                                  32
                                                                          6
                                                                                 0
7
 3 boxbebr01
                2018
                          1 ARI
                                    NL
                                              60
                                                      0
                                                             0
                                                                   0
                                                                          0
                                                                                 0
0
 4 bradlar01
                2018
                          1 ARI
                                    NL
                                              76
                                                      0
                                                             0
                                                                   0
                                                                          0
                                                                                 0
 5 chafian01
                2018
                          1 ARI
                                    NL
                                              77
                                                      0
                                                             0
                                                                   0
                                                                          0
                                                                                 0
0
 6 descada01
                2018
                          1 ARI
                                             138
                                                    349
                                                            54
                                                                         22
                                                                                 4
                                    NL
                                                                  83
13
 7 dysonja01
                2018
                          1 ARI
                                    NL
                                              67
                                                    206
                                                            29
                                                                   39
                                                                                 2
2
```

```
8 escobed01
                2018
                         2 ARI
8
 9 goldspa01
               2018
                         1 ARI
                                   NL
                                           158
                                                  593
                                                         95
                                                              172
                                                                      35
                                                                             5
33
                                                                             0
10 hiranyo01
               2018
                         1 ARI
                                   NL
                                            75
                                                    1
                                                          0
                                                                0
# i 1,162 more rows
 i 10 more variables: RBI <int>, SB <int>, CS <int>, BB <int>, SO <int>,
    IBB <int>, HBP <int>, SH <int>, SF <int>, GIDP <int>
```

- Remember to read the pipe (|>) as 'then'. Here we would say:
 - Take the batting tibble and then
 - filter the rows to only include those with games greater than 50 and those that played in 2018-2020 and then
 - o arrange the rows by the team name

batting_tbl |>

We can obtain a secondary arrangement by giving a second column

```
filter(G > 50, yearID %in% c(2018, 2019, 2020)) |>
             arrange(teamID, playerID)
# A tibble: 1,172 x 22
   playerID yearID stint teamID lgID
                                                    AB
                                                            R
                                                                   Н
                                                                       X2B
                                                                              X3B
                                               G
HR
               <int> <int> <fct> <fct> <int> <int> <int> <int> <int> <int> <int>
   <chr>>
<int>
 1 ahmedni01
                2018
                          1 ARI
                                    NL
                                             153
                                                   516
                                                           61
                                                                 121
                                                                        33
                                                                                5
16
 2 ahmedni01
                2019
                          1 ARI
                                    NL
                                             158
                                                   556
                                                           79
                                                                 141
                                                                        33
                                                                                6
19
 3 ahmedni01
                2020
                          1 ARI
                                              57
                                                   199
                                                           29
                                                                 53
                                                                        10
                                                                                1
                                    NL
 4 andrima01
                2019
                          1 ARI
                                              54
                                                     6
                                                            0
                                                                   0
                                                                                0
                                    NL
0
 5 avilaal01
                2018
                          1 ARI
                                    NL
                                              80
                                                   194
                                                           13
                                                                  32
                                                                         6
                                                                                0
7
 6 avilaal01
                2019
                          1 ARI
                                    NL
                                              63
                                                   164
                                                           22
                                                                  34
                                                                         8
                                                                                0
9
 7 boxbebr01
                2018
                          1 ARI
                                    NL
                                              60
                                                     0
                                                            0
                                                                   0
                                                                         0
                                                                                0
 8 bradlar01
                2018
                          1 ARI
                                    NL
                                              76
                                                      0
                                                            0
                                                                   0
                                                                         0
                                                                                0
0
 9 bradlar01
                                                     1
                                                            0
                                                                   0
                                                                         0
                                                                                0
                2019
                          1 ARI
                                    NL
                                              66
0
                                                                         9
                                                                                0
10 calhoko01
                2020
                          1 ARI
                                    NL
                                              54
                                                   190
                                                           35
                                                                  43
16
# i 1,162 more rows
# i 10 more variables: RBI <int>, SB <int>, CS <int>, BB <int>, SO <int>,
```

IBB <int>, HBP <int>, SH <int>, SF <int>, GIDP <int>

We can reorder descending on a variable

```
arrange(desc(teamID), playerID)
# A tibble: 1,172 x 22
   playerID yearID stint teamID lgID
                                                                       X2B
                                                                             X3B
HR
   <chr>>
               <int> <int> <fct> <fct> <int> <int> <int> <int> <int> <int> <int>
<int>
 1 adamsma01
                2018
                          1 WAS
                                    NL
                                              94
                                                   249
                                                           37
                                                                         9
                                                                                0
18
 2 adamsma01
                2019
                          1 WAS
                                             111
                                                   310
                                                           42
                                                                 70
20
                                                   190
                                                                         9
                                                                                3
 3 cabreas01
                2020
                          1 WAS
                                    NL
                                              52
                                                           23
                                                                  46
8
 4 difowi01
                2018
                                             148
                                                   408
                                                                                7
                          1 WAS
                                    NL
                                                           55
                                                                 94
                                                                        14
7
 5 doolise01
                2019
                                              63
                                                     3
                                                            0
                                                                  0
                                                                         0
                                                                                0
                          1 WAS
                                    NL
 6 doziebr01
                2019
                          1 WAS
                                    NL
                                             135
                                                   416
                                                           54
                                                                  99
                                                                        20
                                                                                0
20
                                              95
                                                   319
                                                           55
 7 eatonad02
                2018
                          1 WAS
                                    NL
                                                                 96
                                                                        18
                                                                                1
5
 8 eatonad02
                2019
                                            151
                                                                        25
                                                                                7
                          1 WAS
                                    NL
                                                   566
                                                          103
                                                                158
15
 9 gomesya01
                2019
                          1 WAS
                                    NL
                                              97
                                                   314
                                                           36
                                                                 70
                                                                        16
                                                                                0
12
                2018
                          1 WAS
                                    NL
                                              56
                                                     3
                                                            0
                                                                         0
                                                                                0
10 gracema02
                                                                   1
# i 1,162 more rows
# i 10 more variables: RBI <int>, SB <int>, CS <int>, BB <int>, SO <int>,
```

filter(G > 50, yearID %in% c(2018, 2019, 2020)) |>

Column Manipulations with dplyr

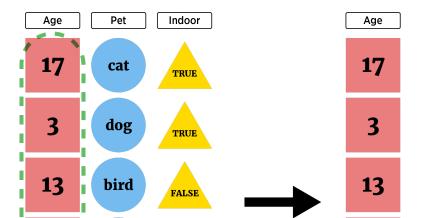
We may want to subset our variables, rename them, or create new variables.

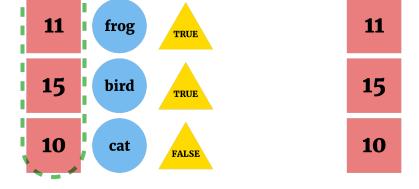
select() - Subset Columns

batting_tbl |>

We call the subset of our variables **selecting** columns (or variables)

IBB <int>, HBP <int>, SH <int>, SF <int>, GIDP <int>





• To return a single (probably simplified) column we looked at the following methods (one of which is in the tidyverse):

```
o dplyr::pull()
o $
o [ , ]
```

When we want to look at pulling more than one column, <code>select()</code> is much better!

- Suppose we just wanted to look at the playerID, teamID, and hits type variables: H, X2B X3B, and HR of the players in our subset
- We can add in a select() function to our chain (thanks again coherent ecosystem!).
 - One way is to simply list the columns you want:

```
batting_tbl |>
  filter(G > 50, yearID %in% c(2018, 2019, 2020)) |>
  arrange(desc(teamID), playerID) |>
  select(playerID, teamID, H, X2B, X3B, HR)
```

```
# A tibble: 1,172 x 6
  playerID teamID
                       H X2B
                                 X3B
                                        HR
   <chr>>
            <fct> <int> <int> <int> <int>
                             9
 1 adamsma01 WAS
                      64
                                   0
                                        18
 2 adamsma01 WAS
                      70
                            14
                                   0
                                        20
                            9
 3 cabreas01 WAS
                      46
                                   3
                                         8
 4 difowi01 WAS
                            14
                                   7
                                         7
 5 doolise01 WAS
                      0
                             0
                                         0
                      99
                            20
                                        20
 6 doziebr01 WAS
 7 eatonad02 WAS
                      96
                            18
                                   1
                                        5
 8 eatonad02 WAS
                            25
                                   7
                                        15
                     158
                      70
                            16
                                   0
                                        12
9 gomesya01 WAS
10 gracema02 WAS
                       1
                             0
                                         0
# i 1,162 more rows
```

- Where we really gain here is the ability to use helper functions when selecting columns!
 - : to select all contiguous columns

.

```
filter(G > 50, yearID %in% c(2018, 2019, 2020)) |>
    arrange(desc(teamID), playerID) |>
    select(playerID, teamID, H:HR)

# A tibble: 1,172 x 6
    playerID teamID H X2B X3B HR
    cent cint cint cint cint
```

<chr>> <fct> <int> <int> <int> <int><</pre> 0 1 adamsma01 WAS 64 9 18 2 adamsma01 WAS 70 14 20 0 3 3 cabreas01 WAS 46 9 8 7 4 difowi01 WAS 94 14 7 5 doolise01 WAS 0 0 0 0 99 20 6 doziebr01 WAS 20 0 7 eatonad02 WAS 96 18 1 5 8 eatonad02 WAS 158 25 7 15 70 12 9 gomesya01 WAS 16 0 10 gracema02 WAS 1 0 0 # i 1,162 more rows

starts_with() and ends_with() are also really useful

```
batting_tbl |>
  filter(G > 50, yearID %in% c(2018, 2019, 2020)) |>
  arrange(desc(teamID), playerID) |>
  select(ends_with("ID"), G, AB, H:HR)
```

```
# A tibble: 1,172 x 10
   playerID yearID teamID lgID
                                                           X2B
                                                                  X3B
                                                                          HR
                                         G
                                               AΒ
                                                       Н
   <chr>>
                <int> <fct>
                              <fct> <int> <int> <int>
                                                         <int> <int> <int><</pre>
 1 adamsma01
                2018 WAS
                              NL
                                        94
                                              249
                                                              9
                                                                    0
                                                                          18
                                                      64
 2 adamsma01
                2019 WAS
                              NL
                                       111
                                              310
                                                      70
                                                             14
                                                                    0
                                                                          20
 3 cabreas01
                                                             9
                                                                     3
                                                                           8
                2020 WAS
                              NL
                                        52
                                              190
                                                      46
 4 difowi01
                2018 WAS
                              NL
                                       148
                                              408
                                                      94
                                                             14
                                                                    7
                                                                           7
 5 doolise01
                              NL
                                        63
                                                3
                                                       0
                                                                    0
                                                                           0
                2019 WAS
                                                             0
 6 doziebr01
                2019 WAS
                              NL
                                       135
                                              416
                                                      99
                                                             20
                                                                    0
                                                                          20
 7 eatonad02
                2018 WAS
                              NL
                                        95
                                              319
                                                      96
                                                             18
                                                                    1
                                                                           5
                                                                    7
                                       151
                                                             25
                                                                          15
 8 eatonad02
                2019 WAS
                              NL
                                              566
                                                     158
                                        97
 9 gomesya01
                2019 WAS
                              NL
                                              314
                                                      70
                                                             16
                                                                    0
                                                                          12
10 gracema02
                              NL
                                        56
                                                3
                                                       1
                                                              0
                                                                    0
                                                                           0
                 2018 WAS
# i 1,162 more rows
```

We can combine those two as well using & and | operators

```
batting_tbl |>
  filter(G > 50, yearID %in% c(2018, 2019, 2020)) |>
  arrange(desc(teamID), playerID) |>
  select(ends_with("ID") | starts_with("X"), G, AB, H, HR)
```

```
# A tibble: 1,172 x 10
   playerID yearID teamID lgID
                                         X2B
                                                X3B
                                                          G
                                                                AB
                                                                        Н
                                                                              HR
   <chr>>
                <int> <fct>
                                <fct> <int> <int> <int> <int> <int> <int> <int> <int> <int>
 1 adamsma01
                 2018 WAS
                               NL
                                           9
                                                   0
                                                        94
                                                               249
                                                                       64
                                                                              18
                                          14
 2 adamsma01
                 2019 WAS
                               NL
                                                   0
                                                       111
                                                               310
                                                                       70
                                                                              20
```

```
9
 3 cabreas01
                 2020 WAS
                              NL
                                                3
                                                      52
                                                            190
                                                                           8
                                                                    46
                                                7
                                                                           7
 4 difowi01
                 2018 WAS
                              NL
                                        14
                                                     148
                                                           408
                                                                   94
 5 doolise01
                 2019 WAS
                              NL
                                         0
                                                0
                                                      63
                                                             3
                                                                    0
                                                                           0
 6 doziebr01
                 2019 WAS
                              NL
                                        20
                                                0
                                                     135
                                                           416
                                                                   99
                                                                          20
 7 eatonad02
                 2018 WAS
                              NL
                                                1
                                                      95
                                                            319
                                                                   96
                                                                           5
                                        18
 8 eatonad02
                 2019 WAS
                              NL
                                        25
                                                7
                                                     151
                                                                          15
                                                            566
                                                                  158
 9 gomesya01
                 2019 WAS
                              NL
                                        16
                                                0
                                                      97
                                                            314
                                                                    70
                                                                          12
10 gracema02
                              NL
                                         0
                                                0
                                                      56
                                                              3
                                                                     1
                                                                           0
                 2018 WAS
# i 1,162 more rows
```

 If our goal is really just to reorder the columns, we can use everything() after specifying the columns of interest

```
batting_tbl |>
  filter(G > 50, yearID %in% c(2018, 2019, 2020)) |>
  arrange(desc(teamID), playerID) |>
  select(playerID, H:HR, everything())
```

```
# A tibble: 1,172 x 22
   playerID
                   Н
                       X2B
                              X3B
                                      HR yearID stint teamID lgID
                                                                                 AB
R
              <int> <int> <int> <int><</pre>
                                         <int> <int> <fct> <fct> <int> <int><</pre>
   <chr>>
<int>
                          9
                                      18
                                           2018
                                                     1 WAS
                                                                               249
 1 adamsma01
                  64
                                                               NL
                                                                          94
37
 2 adamsma01
                  70
                        14
                                      20
                                           2019
                                                     1 WAS
                                                                         111
                                                                               310
                                                               NL
42
 3 cabreas01
                  46
                          9
                                3
                                           2020
                                                     1 WAS
                                                               NL
                                                                          52
                                                                               190
23
                                7
                                                      1 WAS
 4 difowi01
                  94
                        14
                                       7
                                           2018
                                                               NL
                                                                         148
                                                                               408
55
                                                                                  3
 5 doolise01
                                0
                                       0
                                           2019
                                                      1 WAS
                                                                NL
                                                                          63
0
 6 doziebr01
                  99
                        20
                                0
                                      20
                                           2019
                                                      1 WAS
                                                                NL
                                                                         135
                                                                               416
54
 7 eatonad02
                                1
                                       5
                  96
                        18
                                           2018
                                                      1 WAS
                                                                NL
                                                                          95
                                                                               319
55
 8 eatonad02
                158
                        25
                                7
                                      15
                                           2019
                                                      1 WAS
                                                               NL
                                                                         151
                                                                               566
103
 9 gomesya01
                  70
                                0
                                      12
                                           2019
                                                      1 WAS
                                                                NL
                                                                          97
                                                                               314
                        16
36
                   1
                          0
                                0
                                       0
                                           2018
                                                                          56
                                                                                 3
10 gracema02
                                                      1 WAS
                                                               NL
0
# i 1,162 more rows
# i 10 more variables: RBI <int>, SB <int>, CS <int>, BB <int>, SO <int>,
    IBB <int>, HBP <int>, SH <int>, SF <int>, GIDP <int>
```

 See the help for select() for more information about selection features (these can usually be used in any tidyverse functions where you are selecting columns!)

rename()

We've seen the use of colnames() or names() to rename columns. Those are great

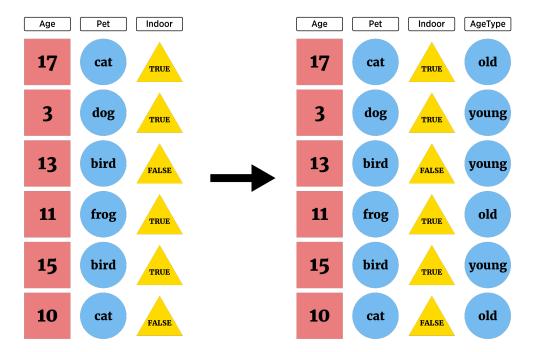
but aren't easy to chain. rename() comes in handy in this case!

```
batting_tbl |>
  filter(G > 50, yearID %in% c(2018, 2019, 2020)) |>
  arrange(desc(teamID), playerID) |>
  select(playerID, teamID, H:HR) |>
  rename("Doubles" = "X2B", "Triples" = "X3B")
```

```
# A tibble: 1,172 x 6
   playerID teamID
                         H Doubles Triples
                                                HR
   <chr>>
              <fct> <int>
                              <int>
                                       <int> <int>
 1 adamsma01 WAS
                                           0
                                                18
                        64
                                  9
 2 adamsma01 WAS
                        70
                                 14
                                           0
                                                20
 3 cabreas01 WAS
                        46
                                  9
                                           3
                                                 8
                                                 7
                                           7
 4 difowi01 WAS
                        94
                                 14
 5 doolise01 WAS
                                                 0
                         0
                                  0
                                           0
 6 doziebr01 WAS
                        99
                                 20
                                                20
                                                 5
 7 eatonad02 WAS
                        96
                                 18
                                           1
 8 eatonad02 WAS
                       158
                                 25
                                           7
                                                15
 9 gomesya01 WAS
                        70
                                 16
                                           0
                                                12
                                                 0
10 gracema02 WAS
                         1
                                  0
                                           0
# i 1,162 more rows
```

Creating New Variables with dplyr

Often we want to create new variables!



This can be accomplished using <code>mutate()</code>. This function allows us to create one or more variables and append them to our tibble.

 For our dataset from above, suppose we wanted to create an "extra base hits" type column that is the sum of the doubles, triples, and home runs.

```
batting_tbl |>
  filter(G > 50, yearID %in% c(2018, 2019, 2020)) |>
```

```
arrange(desc(teamID), playerID) |>
select(playerID, teamID, H:HR) |>
rename("Doubles" = "X2B", "Triples" = "X3B") |>
mutate(Extra_Base_Hits = Doubles + Triples + HR)
```

```
# A tibble: 1,172 x 7
   playerID teamID
                         H Doubles Triples
                                                HR Extra_Base_Hits
   <chr>>
              <fct> <int>
                              <int>
                                       <int> <int>
                                                              <int>
 1 adamsma01 WAS
                                  9
                                           0
                        64
                                                18
                                                                  27
 2 adamsma01 WAS
                        70
                                 14
                                           0
                                                20
                                                                  34
 3 cabreas01 WAS
                                  9
                                           3
                                                 8
                                                                  20
                        46
 4 difowi01 WAS
                                           7
                                                 7
                        94
                                 14
                                                                  28
 5 doolise01 WAS
                         0
                                  0
                                                 0
                                                                   0
 6 doziebr01 WAS
                        99
                                 20
                                           0
                                                20
                                                                  40
                                                 5
 7 eatonad02 WAS
                        96
                                 18
                                                                  24
 8 eatonad02 WAS
                       158
                                 25
                                           7
                                                15
                                                                  47
 9 gomesya01 WAS
                        70
                                 16
                                           0
                                                12
                                                                  28
10 gracema02 WAS
                         1
                                  0
                                           0
                                                 0
                                                                   0
# i 1,162 more rows
```

- If we want to add more than one variable, we just separate the variable definitions with a comma.
 - Let's add a Singles variable representing the number of hits minus the number of extra base hits

A tibble: 1,172 x 8 playerID teamID Singles Doubles Triples HR H Extra Base Hits <chr>> <fct> <int> <int> <int> <int> <int> <int> 1 adamsma01 WAS 2 adamsma01 WAS 3 cabreas01 WAS 4 difowi01 WAS 5 doolise01 WAS 6 doziebr01 WAS 7 eatonad02 WAS 8 eatonad02 WAS 9 gomesya01 WAS 10 gracema02 WAS # i 1,162 more rows

We can of course use lots of functions when creating a new variable as well.
 Some common functions are log(), lead(), lag(), percent_rank(),
 cumsum(), etc. (see the help for mutate for a nice list).

 Let's use percent_rank() to get a new column telling us where they rank for number of hits

```
# A tibble: 1,172 x 9
   playerID teamID
                         H H_Percentile Doubles Triples
                                                              HR
Extra_Base_Hits
   <chr>>
              <fct> <int>
                                   <dbl>
                                            <int>
                                                    <int> <int>
<int>
 1 adamsma01 WAS
                        64
                                   0.512
                                                              18
27
 2 adamsma01 WAS
                        70
                                   0.546
                                               14
                                                              20
34
                                                9
                                                         3
 3 cabreas01 WAS
                        46
                                   0.352
                                                               8
20
 4 difowi01 WAS
                        94
                                   0.675
                                               14
                                                        7
                                                               7
28
 5 doolise01 WAS
                                                0
                                                               0
                         0
0
 6 doziebr01 WAS
                        99
                                   0.698
                                               20
                                                              20
40
 7 eatonad02 WAS
                                                               5
                        96
                                   0.686
                                               18
                                                        1
24
 8 eatonad02 WAS
                       158
                                   0.933
                                               25
                                                        7
                                                              15
47
                                                              12
 9 gomesya01 WAS
                        70
                                   0.546
                                               16
                                                        0
28
                                   0.194
                                                0
                                                        0
                                                               0
10 gracema02 WAS
                         1
# i 1,162 more rows
# i 1 more variable: Singles <int>
```

• A common comparison we want to do is to take a particular value and compare it to its mean. Let's add in a mean variable for hits as well.

```
# A tibble: 1,172 x 10
   playerID teamID
                       H H Mean H Percentile Doubles Triples
                                                                HR
             <fct> <int> <dbl>
   <chr>>
                                       <dbl>
                                               <int>
                                                       <int> <int>
 1 adamsma01 WAS
                      64
                          69.7
                                       0.512
                                                  9
                                                           0
                                                                18
 2 adamsma01 WAS
                      70 69.7
                                       0.546
                                                  14
                                                           0
                                                                20
 3 cabreas01 WAS
                      46 69.7
                                       0.352
                                                   9
                                                           3
                                                                 8
                      94
                                                           7
                                                                 7
 4 difowi01 WAS
                          69.7
                                       0.675
                                                  14
                      0
 5 doolise01 WAS
                          69.7
                                                   0
                                                           0
                                                                 0
6 doziebr01 WAS
                      99
                           69.7
                                                  20
                                                                20
                                       0.698
                                                           0
                                                                 5
7 eatonad02 WAS
                      96
                          69.7
                                       0.686
                                                  18
                                                           1
 8 eatonad02 WAS
                     158
                           69.7
                                       0.933
                                                  25
                                                           7
                                                                15
                      70
                                                                12
 9 gomesya01 WAS
                           69.7
                                       0.546
                                                  16
                                                           0
10 gracema02 WAS
                       1
                           69.7
                                       0.194
                                                   0
                                                                 0
# i 1,162 more rows
```

- # i 2 more variables: Extra Base Hits <int>, Singles <int>
 - Useful, but what if we want to show the mean by team? Easy to do in dplyr using group_by()!
 - If we add group_by() in our chain, any summary statistics created will honor those groups (ungroup() exists if you want to remove a grouping).

```
batting tbl |>
 filter(G > 50, yearID %in% c(2018, 2019, 2020)) |>
  arrange(desc(teamID), playerID) |>
  select(playerID, teamID, H:HR) |>
  rename("Doubles" = "X2B", "Triples" = "X3B") |>
 group_by(teamID)
```

```
# A tibble: 1,172 x 6
         teamID [30]
# Groups:
   playerID teamID
                        H Doubles Triples
                                             HR
             <fct> <int>
                           <int>
                                    <int> <int>
   <chr>>
 1 adamsma01 WAS
                      64
                               9
                                        0
                                             18
 2 adamsma01 WAS
                       70
                               14
                                        0
                                             20
 3 cabreas01 WAS
                       46
                                9
                                        3
                                              8
 4 difowi01 WAS
                       94
                               14
                                        7
                                              7
 5 doolise01 WAS
                      0
                               0
                                        0
                                              0
                       99
 6 doziebr01 WAS
                               20
                                             20
 7 eatonad02 WAS
                       96
                               18
                                        1
                                             5
                                        7
 8 eatonad02 WAS
                      158
                                             15
                               25
 9 gomesya01 WAS
                       70
                               16
                                        0
                                             12
10 gracema02 WAS
                                0
                                        0
                                              0
                        1
# i 1,162 more rows
```

Notice there is now an additional attribute associated with this tibble!

```
batting_tbl |>
  filter(G > 50, yearID %in% c(2018, 2019, 2020)) |>
  arrange(desc(teamID), playerID) |>
  select(playerID, teamID, H:HR) |>
  rename("Doubles" = "X2B", "Triples" = "X3B") |>
  group by(teamID) |>
```

attributes()

\$class [1] "gr	ouped	_df"	"tbl_df"		"t	"tbl"		"data.frame"						
\$row.na	\$row.names													
[1]	1	2	3	4	5	6	7	8	9	10	11	12	13	
14 [15]	15	16	17	18	19	20	21	22	23	24	25	26	27	
28														
[29] 42	29	30	31	32	33	34	35	36	37	38	39	40	41	
[43] 56	43	44	45	46	47	48	49	50	51	52	53	54	55	
[57]	57	58	59	60	61	62	63	64	65	66	67	68	69	
70 [71]	71	72	73	74	75	76	77	78	79	80	81	82	83	
84	, _	, _	, 3	, -	, 3	70	, ,	, 0	, ,	00	01	02	o ₃	
[85] 98	85	86	87	88	89	90	91	92	93	94	95	96	97	
[99]	99	100	101	102	103	104	105	106	107	108	109	110	111	
112 [113]	113	114	115	116	117	118	119	120	121	122	123	124	125	
126												120		
[127] 140	127	128	129	130	131	132	133	134	135	136	137	138	139	
[141] 154	141	142	143	144	145	146	147	148	149	150	151	152	153	
[155] 168	155	156	157	158	159	160	161	162	163	164	165	166	167	
[169]	169	170	171	172	173	174	175	176	177	178	179	180	181	
182 [183]	183	184	185	186	187	188	189	190	191	192	193	194	195	
196 [197]	197	198	199	200	201	202	203	204	205	206	207	200	200	
210	197	190	199	200	201	202	203	204	205	206	207	208	209	
[211]	211	212	213	214	215	216	217	218	219	220	221	222	223	
224 [225]	225	226	227	228	229	230	231	232	233	234	235	236	237	
238														
[239] 252	239	240	241	242	243	244	245	246	247	248	249	250	251	
[253] 266	253	254	255	256	257	258	259	260	261	262	263	264	265	
[267] 280	267	268	269	270	271	272	273	274	275	276	277	278	279	
[281]	281	282	283	284	285	286	287	288	289	290	291	292	293	
[295]	295	296	297	298	299	300	301	302	303	304	305	306	307	
308 [309]	309	310	311	312	313	314	315	316	317	318	319	320	321	
322														
[323] 336	323	324	325	326	327	328	329	330	331	332	333	334	335	
F 2 2 7 7	227	222	222	2 4 4	244	2 4 2	242	246	245	246	24-	240	240	

[337] 350	337	338	339	340	341	342	343	344	345	346	347	348	349
[351] 364	351	352	353	354	355	356	357	358	359	360	361	362	363
[365] 378	365	366	367	368	369	370	371	372	373	374	375	376	377
[379] 392	379	380	381	382	383	384	385	386	387	388	389	390	391
[393] 406	393	394	395	396	397	398	399	400	401	402	403	404	405
[407]	407	408	409	410	411	412	413	414	415	416	417	418	419
420 [421]	421	422	423	424	425	426	427	428	429	430	431	432	433
434 [435]	435	436	437	438	439	440	441	442	443	444	445	446	447
448	440	450			452	454	455	456	457	450	450	460	461
[449] 462	449	450	451	452	453	454	455	456	457	458	459	460	461
[463] 476	463	464	465	466	467	468	469	470	471	472	473	474	475
[477] 490	477	478	479	480	481	482	483	484	485	486	487	488	489
[491] 504	491	492	493	494	495	496	497	498	499	500	501	502	503
[505] 518	505	506	507	508	509	510	511	512	513	514	515	516	517
[519] 532	519	520	521	522	523	524	525	526	527	528	529	530	531
[533]	533	534	535	536	537	538	539	540	541	542	543	544	545
546 [547]	547	548	549	550	551	552	553	554	555	556	557	558	559
560 [561]	561	562	563	564	565	566	567	568	569	570	571	572	573
574 [575]	575	576	577	578	579	580	581	582	583	584	585	586	587
588													
[589] 602	589	590	591	592	593	594	595	596	597	598	599	600	601
[603] 616	603	604	605	606	607	608	609	610	611	612	613	614	615
[617]	617	618	619	620	621	622	623	624	625	626	627	628	629
630 [631] 644	631	632	633	634	635	636	637	638	639	640	641	642	643
[645]	645	646	647	648	649	650	651	652	653	654	655	656	657
658 [659]	659	660	661	662	663	664	665	666	667	668	669	670	671
672 [673]	673	674	675	676	677	678	679	680	681	682	683	684	685
686													
[687] 700	687	688	689	690	691	692	693	694	695	696	697	698	699
[701] 714	701	702	703	704	705	706	707	708	709	710	711	712	713
[715]	715	716	717	718	719	720	721	722	723	724	725	726	727

728													
[729]	729	730	731	732	733	734	735	736	737	738	739	740	741
742													
[743]	743	744	745	746	747	748	749	750	751	752	753	754	755
756													
[757]	757	758	759	760	761	762	763	764	765	766	767	768	769
770													
[771]	771	772	773	774	775	776	777	778	779	780	781	782	783
784													
[785]	785	786	787	788	789	790	791	792	793	794	795	796	797
798													
[799]	799	800	801	802	803	804	805	806	807	808	809	810	811
812													
[813]	813	814	815	816	817	818	819	820	821	822	823	824	825
826													
[827]	827	828	829	830	831	832	833	834	835	836	837	838	839
840													
[841]	841	842	843	844	845	846	847	848	849	850	851	852	853
854													
[855]	855	856	857	858	859	860	861	862	863	864	865	866	867
868													
[869]	869	870	871	872	873	874	875	876	877	878	879	880	881
882													
[883]	883	884	885	886	887	888	889	890	891	892	893	894	895
896													
[897]	897	898	899	900	901	902	903	904	905	906	907	908	909
910													
[911]	911	912	913	914	915	916	917	918	919	920	921	922	923
924													
[925]	925	926	927	928	929	930	931	932	933	934	935	936	937
938													
[939]	939	940	941	942	943	944	945	946	947	948	949	950	951
952													
[953]	953	954	955	956	957	958	959	960	961	962	963	964	965
966													
[967]	967	968	969	970	971	972	973	974	975	976	977	978	979
980													
[981]	981	982	983	984	985	986	987	988	989	990	991	992	993
994													
[995]	995	996	997	998	999	1000	1001	1002	1003	1004	1005	1006	1007
1008													
[1009]	1009	1010	1011	1012	1013	1014	1015	1016	1017	1018	1019	1020	1021
1022													
[1023]	1023	1024	1025	1026	1027	1028	1029	1030	1031	1032	1033	1034	1035
1036													
[1037]	1037	1038	1039	1040	1041	1042	1043	1044	1045	1046	1047	1048	1049
1050													
[1051]	1051	1052	1053	1054	1055	1056	1057	1058	1059	1060	1061	1062	1063
1064													
[1065]	1065	1066	1067	1068	1069	1070	1071	1072	1073	1074	1075	1076	1077
1078													
[1079]	1079	1080	1081	1082	1083	1084	1085	1086	1087	1088	1089	1090	1091
1092													
[1093]	1093	1094	1095	1096	1097	1098	1099	1100	1101	1102	1103	1104	1105
1106													

```
[1107] 1107 1108 1109 1110 1111 1112 1113 1114 1115 1116 1117 1118 1119
1120
[1121] 1121 1122 1123 1124 1125 1126 1127 1128 1129 1130 1131 1132 1133
1134
[1135] 1135 1136 1137 1138 1139 1140 1141 1142 1143 1144 1145 1146 1147
1148
[1149] 1149 1150 1151 1152 1153 1154 1155 1156 1157 1158 1159 1160 1161
1162
[1163] 1163 1164 1165 1166 1167 1168 1169 1170 1171 1172
$names
[1] "playerID" "teamID"
                                      "Doubles"
                                                 "Triples"
$groups
# A tibble: 30 x 2
   teamID
                .rows
   <fct> <list<int>>
 1 ARI
                 [43]
 2 ATL
                 [38]
 3 BAL
                 [39]
 4 BOS
                 [41]
 5 CHA
                 [39]
 6 CHN
                 [38]
 7 CIN
                 [44]
 8 CLE
                 [41]
 9 COL
                 [39]
10 DET
                 [40]
# i 20 more rows
```

Let's find our mean relative to each team using a group_by() in our chain (this
finds the percentile by teamID as well).

```
# A tibble: 1,172 x 10
# Groups:
            teamID [30]
   playerID teamID
                        H H_Mean H_Percentile Doubles Triples
                                                                   HR
   <chr>>
             <fct> <int> <dbl>
                                         <dbl>
                                                 <int>
                                                          <int> <int>
 1 adamsma01 WAS
                       64
                            72.0
                                         0.486
                                                     9
                                                              0
                                                                   18
 2 adamsma01 WAS
                       70
                           72.0
                                         0.514
                                                    14
                                                                   20
                                                              0
                                                     9
 3 cabreas01 WAS
                       46
                            72.0
                                         0.351
                                                              3
                                                                    8
 4 difowi01 WAS
                       94
                            72.0
                                         0.676
                                                    14
                                                              7
                                                                    7
 5 doolise01 WAS
                            72.0
                                         0
                                                     0
```

б	aoziebroi	WAS	99	72.0	0.730	20	Ø	20
7	eatonad02	WAS	96	72.0	0.703	18	1	5
8	eatonad02	WAS	158	72.0	0.919	25	7	15
9	gomesya01	WAS	70	72.0	0.514	16	0	12
10	gracema02	WAS	1	72.0	0.162	0	0	0
11	gracema02	WAS	0	72.0	0	0	0	0
12	harpebr03	WAS	137	72.0	0.811	34	0	34
13	kendrho01	WAS	115	72.0	0.757	23	1	17
14	kiebosp01	WAS	29	72.0	0.243	5	0	2
15	milleju02	WAS	0	72.0	0	0	0	0
16	murphda08	WAS	57	72.0	0.459	9	0	6
17	parrage01	WAS	47	72.0	0.378	11	1	8
18	raineta01	WAS	0	72.0	0	0	0	0
19	rendoan01	WAS	163	72.0	0.946	44	2	24
20	rendoan01	WAS	174	72.0	0.973	44	3	34
21	reynoma01	WAS	51	72.0	0.405	8	0	13
22	roblevi01	WAS	139	72.0	0.838	33	3	17
23	roblevi01	WAS	37	72.0	0.297	5	1	3
	severpe01		32	72.0	0.270	9	0	2
	solissa01		0	72.0	0	0	0	0
	sotoju01	WAS	121	72.0	0.784	25	1	22
	sotoju01	WAS	153	72.0	0.865	32	5	34
	stevean01		19	72.0	0.189	2	0	1
			0	72.0	0	0	0	0
	suzukku01		74	72.0	0.568	11	0	17
	taylomi02		80	72.0	0.649	22	3	6
	taylomi02		22	72.0	0.216	7	0	1
	turnetr01		180	72.0	1	27	6	19
	turnetr01		155	72.0	0.892	37	5	19
	turnetr01		78	72.0	0.622	15	4	12
	wietema01		56	72.0	0.432	8	0	8
	zimmery01		76	72.0	0.595	21	2	13
	zimmery01		44	72.0	0.324	9	0	6
	biggica01		83	72.9	0.485	17	2	16
	biggica01		55	72.9	0.242	16	0	8
	clippty01		0	72.9	0	0 26	0	0
	diazal02 drurybr01	TOR	111	72.9	0.818	26 21	0	18
	galvifr01		91 120	72.9 72.9	0.667 0.879	21 24	1 1	15 18
	garvirrer gavigsa01		0	72.9	0.879	0	0	0
	gileske01		0	72.9	0	0	0	0
	grandcu01		74	72.9		21	1	11
	grandcuoi grichra01			72.9	0.455 0.758	32	1	
	grichra01		104 136	72.9	0.758 1	32 29	5	25 31
	grichra01		59	72.9	0.333	9	9	12
	i 1,122 moi		,,	, , , ,	0.000	,	U	14
			Fxtra	Base Hits	<int>, Sin</int>	ıσles ∠int	>	
	V	a. 1001C3.	באנום_	_5050_11103	, (±1107) Jill	.6+63 (1116	•	

• We can get a secondary grouping too! Let's group by year as well

```
batting_tbl |>
  filter(G > 50, yearID %in% c(2018, 2019, 2020)) |>
  arrange(desc(teamID), playerID) |>
  select(playerID, yearID, teamID, H:HR) |>
  rename("Doubles" = "X2B", "Triples" = "X3B") |>
```

```
# A tibble: 1,172 x 11
# Groups: teamID, yearID [90]
   playerID teamID yearID
                              H H Mean H Percentile Doubles Triples
   <chr>>
            <fct>
                    <int> <int> <dbl>
                                             <dbl>
                                                     <int>
                                                             <int> <int>
                                             0.529
                                                                 0
 1 adamsma01 WAS
                     2018
                                 69.8
                                                         9
                                                                      18
 2 adamsma01 WAS
                     2019
                            70 77.6
                                             0.438
                                                        14
                                                                 0
                                                                      20
 3 cabreas01 WAS
                     2020
                             46 53.7
                                             0.5
                                                         9
                                                                       8
                                                                 7
 4 difowi01 WAS
                     2018
                             94
                                 69.8
                                             0.706
                                                        14
 5 doolise01 WAS
                             0
                                77.6
                                             0
                                                         0
                                                                      0
                     2019
 6 doziebr01 WAS
                     2019
                             99
                                77.6
                                             0.625
                                                        20
                                                                      20
 7 eatonad02 WAS
                                 69.8
                                             0.765
                                                        18
                                                                 1
                                                                     5
                     2018
                            96
 8 eatonad02 WAS
                     2019
                            158
                                 77.6
                                             0.938
                                                        25
                                                                      15
                                77.6
9 gomesya01 WAS
                     2019
                            70
                                             0.438
                                                        16
                                                                 0
                                                                     12
10 gracema02 WAS
                     2018
                                 69.8
                                             0.118
                                                         0
                                                                       0
# i 1,162 more rows
# i 2 more variables: Extra_Base_Hits <int>, Singles <int>
```

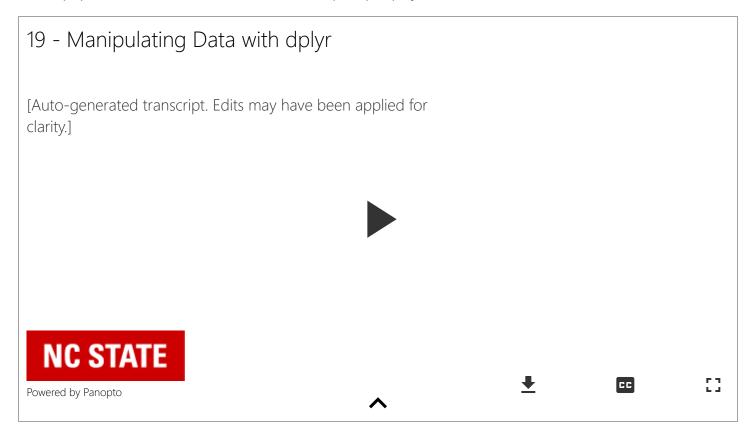
We are really able to do a lot quickly with these functions! Nice. One other commonly used function in <code>mutate()</code> is <code>ifelse()</code> or <code>if_else()</code> (the <code>tidyverse</code> version with slightly more restrictive functionality).

- Let's add a new variable that compares a number of hits to the mean. If it is
 more than the mean we'll say "Great", if it is less than the mean we'll say
 "Needs some work".
 - Recall ifelse() takes in a vector of conditions as the first argument. The second argument is what to do when TRUE and the third what to do when FALSE.

	prayer ro	CEAIIIII	year 10	11	п_пеан	Status	u_rei ceiicite	DOUDTES	птртез				
HR													
	<chr></chr>	<fct></fct>	<int></int>	<int></int>	<dbl></dbl>	<chr></chr>	<dbl></dbl>	<int></int>	<int></int>				
<i!< td=""><td>nt></td><td></td><td></td><td></td><td></td><td></td><td></td><td></td><td></td></i!<>	nt>												
1	adamsma~	WAS	2018	64	69.8	Needs~	0.529	9	0				
18									-				
	adamsma~	WAS	2019	70	77 6	Needs~	0.438	14	0				
20	auamsma	WAS	2013	70	77.0	Necus	0.438	14	U				
		LIAC	2020	4.0	F2 7	Naada	0.5	0	2				
	cabreas~	WAS	2020	46	53./	Needs~	0.5	9	3				
8									_				
	difowi01	WAS	2018	94	69.8	Great	0.706	14	7				
7													
5	doolise~	WAS	2019	0	77.6	Needs~	0	0	0				
0													
6	doziebr~	WAS	2019	99	77.6	Great	0.625	20	0				
20													
7	eatonad~	WAS	2018	96	69.8	Great	0.765	18	1				
5													
8	eatonad~	WAS	2019	158	77.6	Great	0.938	25	7				
15	caconaa		2023		,,,,	o. cac	0.550		•				
_	gomocya.	MAC	2019	70	77 6	Needs~	0.438	16	0				
	gomesya~	WAS	2019	70	//.0	Neeus~	0.436	10	Ø				
12									_				
	gracema~	WAS	2018	1	69.8	Needs~	0.118	0	0				
0													
# :	# i 1,162 more rows												
# :	<pre># i 2 more variables: Extra_Base_Hits <int>, Singles <int></int></int></pre>												

Quick R Video

Please pop this video out and watch it in the full panopto player!



dplyr gives us a ton of functionality for doing common data manipulations

- as_tibble() coerce a data frame to a tibble
- filter() subset rows
- arrange() reorder rows
- select() subset/reorder columns
- rename() rename columns
- mutate() add new variables to the tibble

The functionality of selecting columns described in the help for <code>select()</code> can be used in many places across the <code>tidyverse</code> and the functions <code>group_by()</code> and <code>ifelse()</code> are really useful as well!

• <u>dplyr Cheat Sheet</u> (PDF version on the right hand side of the page)