### 4, Code

#### Lynn Huang

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```
## -- Attaching packages ----- tidyvers
## v ggplot2 3.3.2
                    v purrr
                               0.3.4
## v tibble 3.0.3 v dplyr 1.0.0
## v tidyr 1.1.0 v stringr 1.4.0
## v readr 1.3.1 v forcats 0.5.0
## -- Conflicts ------ tidyverse_conf
## x dplyr::filter() masks stats::filter()
## x dplyr::lag()
                   masks stats::lag()
4.1 Manipulating Data: Logicals Logical statements are comparisons between 2 quantities.
"hi" == " hi"
## [1] FALSE
"hi" == "hi"
## [1] TRUE
4 == 1
## [1] FALSE
4 != 1
## [1] TRUE
Package tidyverse has package dplyr, useful for comparisons (esp. numeric).
Due to loss of precision, first one will be FALSE even though it's TRUE!
sqrt(3)^2 == 3
## [1] FALSE
```

```
dplyr::near(sqrt(3)^2, 3)
## [1] TRUE
Check type of object using is functions.
is.numeric("Word")
## [1] FALSE
is.numeric(10)
## [1] TRUE
is.character("10")
## [1] TRUE
is.na(c(1:2, NA, 3))
## [1] FALSE FALSE TRUE FALSE
Can use Boolean vector to index (which elements to include/exclude). Index using [], subset(), tidy-
verse/dplyr filter().
# Tibble is like dataframe, just nicer printing properties
iris <- tbl_df(iris)</pre>
## Warning: 'tbl_df()' is deprecated as of dplyr 1.0.0.
## Please use 'tibble::as_tibble()' instead.
## This warning is displayed once every 8 hours.
## Call 'lifecycle::last_warnings()' to see where this warning was generated.
iris
## # A tibble: 150 x 5
##
      Sepal.Length Sepal.Width Petal.Length Petal.Width Species
##
             <dbl>
                         <dbl>
                                       <dbl>
                                                   <dbl> <fct>
                            3.5
##
  1
               5.1
                                         1.4
                                                      0.2 setosa
## 2
               4.9
                                         1.4
                                                      0.2 setosa
                            3
## 3
               4.7
                           3.2
                                         1.3
                                                     0.2 setosa
## 4
               4.6
                           3.1
                                         1.5
                                                     0.2 setosa
## 5
               5
                           3.6
                                         1.4
                                                     0.2 setosa
                           3.9
##
  6
               5.4
                                         1.7
                                                     0.4 setosa
##
   7
               4.6
                            3.4
                                         1.4
                                                     0.3 setosa
##
  8
               5
                            3.4
                                         1.5
                                                      0.2 setosa
##
  9
               4.4
                            2.9
                                         1.4
                                                      0.2 setosa
               4.9
                                         1.5
                                                      0.1 setosa
## 10
                            3.1
```

## # ... with 140 more rows

# # How to get only "setosa" irises? iris\$Species=="setosa"

```
##
                                   [1]
                                                                TRUE
                                                                                                         TRUE
                                                                                                                                                  TRUE
                                                                                                                                                                                                   TRUE
                                                                                                                                                                                                                                               TRUE
                                                                                                                                                                                                                                                                                          TRUE
                                                                                                                                                                                                                                                                                                                                      TRUE
                                                                                                                                                                                                                                                                                                                                                                                TRUE
                                                                                                                                                                                                                                                                                                                                                                                                                           TRUE
                                                                                                                                                                                                                                                                                                                                                                                                                                                                      TRUE
                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                 TRUE
                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                           TRUE
##
                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                 TRUE
                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                           TRUE
                             [13]
                                                                  TRUE
                                                                                                              TRUE TRUE
                                                                                                                                                                                               TRUE
                                                                                                                                                                                                                                             TRUE
                                                                                                                                                                                                                                                                                          TRUE
                                                                                                                                                                                                                                                                                                                                      TRUE
                                                                                                                                                                                                                                                                                                                                                                                 TRUE
                                                                                                                                                                                                                                                                                                                                                                                                                            TRUE
                                                                                                                                                                                                                                                                                                                                                                                                                                                                      TRUE
                                                                                                             TRUE TRUE TRUE
                                                                                                                                                                                                                                          TRUE
                            [25]
                                                                    TRUE
                                                                                                                                                                                                                                                                                          TRUE
                                                                                                                                                                                                                                                                                                                                      TRUE
                                                                                                                                                                                                                                                                                                                                                                                TRUE
                                                                                                                                                                                                                                                                                                                                                                                                                           TRUE
                                                                                                                                                                                                                                                                                                                                                                                                                                                                      TRUE
                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                                TRUE
                                                                                                          TRUE TRUE TRUE TRUE TRUE TRUE TRUE
##
                             [37] TRUE
                                                                                                                                                                                                                                                                                                                                                                                                                          TRUE TRUE TRUE TRUE
                            [49] TRUE TRUE FALSE FAL
##
                   [61] FALSE FALSE
## [73] FALSE FALSE
## [85] FALSE FALS
## [97] FALSE FALS
## [109] FALSE FALSE
## [121] FALSE FALSE
## [133] FALSE FALSE
## [145] FALSE FALSE FALSE FALSE FALSE
```

#### iris[iris\$Species=="setosa",]

```
## # A tibble: 50 x 5
##
      Sepal.Length Sepal.Width Petal.Length Petal.Width Species
##
             <dbl>
                         <dbl>
                                       <dbl>
                                                   <dbl> <fct>
##
  1
               5.1
                           3.5
                                         1.4
                                                     0.2 setosa
  2
               4.9
##
                           3
                                         1.4
                                                     0.2 setosa
##
  3
               4.7
                           3.2
                                         1.3
                                                     0.2 setosa
##
   4
               4.6
                           3.1
                                         1.5
                                                     0.2 setosa
##
  5
                           3.6
                                         1.4
                                                     0.2 setosa
               5
##
  6
               5.4
                           3.9
                                         1.7
                                                     0.4 setosa
## 7
               4.6
                           3.4
                                         1.4
                                                     0.3 setosa
##
   8
               5
                           3.4
                                         1.5
                                                     0.2 setosa
##
  9
               4.4
                           2.9
                                         1.4
                                                     0.2 setosa
               4.9
                                         1.5
## 10
                           3.1
                                                     0.1 setosa
## # ... with 40 more rows
```

#### subset(iris, Species=="setosa")

```
## # A tibble: 50 x 5
##
      Sepal.Length Sepal.Width Petal.Length Petal.Width Species
##
             <dbl>
                          <dbl>
                                       <dbl>
                                                    <dbl> <fct>
##
               5.1
                            3.5
                                         1.4
                                                      0.2 setosa
   1
##
   2
               4.9
                            3
                                         1.4
                                                      0.2 setosa
##
  3
               4.7
                            3.2
                                         1.3
                                                      0.2 setosa
##
                                         1.5
  4
               4.6
                            3.1
                                                      0.2 setosa
## 5
                                         1.4
               5
                            3.6
                                                      0.2 setosa
##
   6
               5.4
                            3.9
                                         1.7
                                                      0.4 setosa
##
   7
               4.6
                            3.4
                                         1.4
                                                      0.3 setosa
##
   8
               5
                            3.4
                                         1.5
                                                      0.2 setosa
##
    9
               4.4
                            2.9
                                         1.4
                                                      0.2 setosa
## 10
               4.9
                            3.1
                                         1.5
                                                      0.1 setosa
## # ... with 40 more rows
```

```
dplyr::filter(iris, Species=="setosa") # NOTE: dplyr:: not necessary if only 1 filter() function
```

```
## # A tibble: 50 x 5
##
      Sepal.Length Sepal.Width Petal.Length Petal.Width Species
                                     <dbl>
                                                  <dbl> <fct>
##
             <dbl>
                        <dbl>
## 1
              5.1
                          3.5
                                        1.4
                                                    0.2 setosa
## 2
               4.9
                           3
                                        1.4
                                                   0.2 setosa
## 3
              4.7
                                       1.3
                                                   0.2 setosa
                          3.2
## 4
               4.6
                          3.1
                                       1.5
                                                   0.2 setosa
## 5
              5
                           3.6
                                                   0.2 setosa
                                       1.4
## 6
              5.4
                           3.9
                                       1.7
                                                   0.4 setosa
## 7
               4.6
                           3.4
                                       1.4
                                                   0.3 setosa
## 8
               5
                           3.4
                                       1.5
                                                    0.2 setosa
## 9
               4.4
                           2.9
                                       1.4
                                                   0.2 setosa
## 10
               4.9
                          3.1
                                       1.5
                                                    0.1 setosa
## # ... with 40 more rows
```

Beware implicit or explicit coercion, when R changes element type from less to more flexible: logical, integer, double, character.

```
# Implicit coercion using c()
c("hi", 10)
## [1] "hi" "10"
c(TRUE, FALSE) + 0
## [1] 1 0
c(TRUE, "hi")
## [1] "TRUE" "hi"
mean(c(TRUE, FALSE, TRUE))
## [1] 0.6666667
# Explicit coercion using as functions
as.numeric(c(TRUE, FALSE, TRUE))
## [1] 1 0 1
as.character(c(1, 2, 3.5, TRUE))
## [1] "1"
             "2"
                   "3.5" "1"
```

Compound logic available with operators.

```
# And using &. Or using /
set.seed(3)
(x \leftarrow runif(n=10, min=0, max=1))
    [1] 0.1680415 0.8075164 0.3849424 0.3277343 0.6021007 0.6043941 0.1246334
   [8] 0.2946009 0.5776099 0.6309793
(x < 0.25) \mid (x > 0.75)
         TRUE TRUE FALSE FALSE FALSE TRUE FALSE FALSE
# Double operators only check 1st comparison if given a vector
(x < 0.25) \mid | (x > 0.75)
## [1] TRUE
# Use logical operators to do multiple subsets on data
filter(iris, (Petal.Length>1.5) & (Petal.Width>0.3) & (Species=="setosa"))
## # A tibble: 5 x 5
     Sepal.Length Sepal.Width Petal.Length Petal.Width Species
##
##
            <dbl>
                        <dbl>
                                      <dbl>
                                                  <dbl> <fct>
## 1
              5.4
                          3.9
                                        1.7
                                                    0.4 setosa
## 2
              5.1
                           3.3
                                        1.7
                                                    0.5 setosa
## 3
              5
                                                    0.4 setosa
                           3.4
                                        1.6
## 4
              5
                           3.5
                                                    0.6 setosa
                                        1.6
              5.1
## 5
                          3.8
                                        1.9
                                                    0.4 setosa
iris[(iris$Petal.Length>1.5) & (iris$Petal.Width>0.3) & (iris$Species=="setosa"), ]
## # A tibble: 5 x 5
     Sepal.Length Sepal.Width Petal.Length Petal.Width Species
##
            <dbl>
                        <dbl>
                                      <dbl>
                                                  <dbl> <fct>
##
## 1
              5.4
                           3.9
                                        1.7
                                                    0.4 setosa
## 2
              5.1
                          3.3
                                        1.7
                                                    0.5 setosa
## 3
              5
                           3.4
                                        1.6
                                                    0.4 setosa
## 4
              5
                           3.5
                                        1.6
                                                    0.6 setosa
              5.1
## 5
                          3.8
                                        1.9
                                                    0.4 setosa
```

#### 4.2 Manipulating Data: Aside: R Packages

- **4.3 Manipulating Data: dplyr Package** Lahman contains Major League Baseball data from 1871-2019 in 4 tables + others:
- \* People = Player names, dates of birth, death, biographical info
- \* Batting = Batting statistics
- \* Pitching = Pitching statistics
- \* Fielding = Fielding statistics

Other tables about teams, post-season play, awards, Hall of Fame, etc. also included. Use help(Lahman) to see more details.

```
#install.packages("Lahman")
library(Lahman)
head(Batting, n=4)
      playerID yearID stint teamID lgID G AB R H X2B X3B HR RBI SB CS BB SO
##
## 1 abercda01
                 1871
                          1
                               TRO
                                     NA
                                         1
                                             4
                                                0
                                                  0
                                                       0
                                                           0
                                                              0
                                                                     0
## 2 addybo01
                 1871
                          1
                               RC1
                                     NA 25 118 30 32
                                                       6
                                                           0
                                                              0
                                                                 13
                                                                     8
                                                                        1
                                                                           4
## 3 allisar01
                 1871
                          1
                               CL1
                                     NA 29 137 28 40
                                                       4
                                                           5 0
                                                                 19
                                                                     3
                                                                        1
                                                                           2
                                                                              5
## 4 allisdo01
                 1871
                          1
                               WS3
                                     NA 27 133 28 44
                                                      10
                                                           2 2
                                                                 27
##
     IBB HBP SH SF GIDP
## 1 NA NA NA NA
## 2
     NA
         NA NA NA
## 3 NA
         NA NA NA
                      1
## 4 NA NA NA NA
# Tibble prints nicer
Batting <- tbl_df(Batting)</pre>
Batting
## # A tibble: 107,429 x 22
                                             G
                                                                   X2B
##
     playerID yearID stint teamID lgID
                                                  AB
                                                         R
                                                               Η
                                                                         ХЗВ
                                                                                HR
                ##
      <chr>
##
   1 abercda~
                 1871
                         1 TRO
                                   NA
                                             1
                                                   4
                                                         0
                                                               0
                                                                     0
                                                                           0
##
   2 addybo01
                 1871
                          1 RC1
                                   NA
                                            25
                                                 118
                                                        30
                                                              32
                                                                     6
                                                                           0
                                                                                 0
##
   3 allisar~
                 1871
                          1 CL1
                                   NA
                                            29
                                                 137
                                                        28
                                                              40
                                                                     4
                                                                           5
                                                                                 0
                                                                           2
##
                 1871
                          1 WS3
                                            27
                                                 133
                                                        28
                                                                                 2
  4 allisdo~
                                   NA
                                                              44
                                                                    10
##
   5 ansonca~
                 1871
                          1 RC1
                                            25
                                                 120
                                                        29
                                                              39
                                                                                 0
                                   NA
                                                                    11
                                                                           3
##
   6 armstbo~
                 1871
                          1 FW1
                                   NA
                                            12
                                                  49
                                                         9
                                                              11
                                                                     2
                                                                           1
                                                                                 0
##
                 1871
                          1 RC1
                                            1
                                                   4
                                                         0
                                                                     0
                                                                           0
                                                                                 0
   7 barkeal~
                                   NA
                                                               1
##
   8 barnero~
                 1871
                          1 BS1
                                   NA
                                            31
                                                 157
                                                        66
                                                              63
                                                                    10
                                                                           9
                 1871
                          1 FW1
                                                                                 0
##
   9 barrebi~
                                   NA
                                             1
                                                   5
                                                                           0
                                                         1
                                                               1
                                                                     1
## 10 barrofr~
                 1871
                          1 BS1
                                   NA
                                            18
                                                  86
                                                        13
                                                              13
                                                                           1
## # ... with 107,419 more rows, and 10 more variables: RBI <int>, SB <int>,
      CS <int>, BB <int>, SO <int>, IBB <int>, HBP <int>, SH <int>, SF <int>,
      GIDP <int>
## #
# Subset to get only PIT data, only 2000
filter(Batting, teamID=="PIT")
## # A tibble: 4,871 x 22
                                                                   X2B
##
      playerID yearID stint teamID lgID
                                             G
                                                  AB
                                                         R
                                                               Η
                                                                         ХЗВ
                                                                                HR
##
      <chr>
                ##
   1 barklsa~
                 1887
                          1 PIT
                                   NL
                                            89
                                                 340
                                                        44
                                                              76
                                                                    10
                                                                           4
                                                                                 1
##
   2 beeched~
                 1887
                          1 PIT
                                                 169
                                                                           0
                                                                                 2
                                   NL
                                            41
                                                        15
                                                              41
                                                                     8
##
   3 bishobi~
                 1887
                          1 PIT
                                   NL
                                             3
                                                   9
                                                         0
                                                               0
                                                                     0
                                                                           0
                                                                                 0
                                                                           4
##
   4 brownto~
                 1887
                          1 PIT
                                   NL
                                            47
                                                 192
                                                        30
                                                              47
                                                                     3
                                                                                 0
##
   5 carrofr~
                 1887
                          1 PIT
                                           102
                                                 421
                                                        71
                                                             138
                                                                    24
                                                                          15
                                   NL
                                                 475
##
   6 colemjo~
                 1887
                          1 PIT
                                   NL
                                           115
                                                        75
                                                             139
                                                                    21
                                                                          11
                                                                                 2
##
   7 dalryab~
                 1887
                          1 PIT
                                   NL
                                            92
                                                 358
                                                        45
                                                              76
                                                                    18
                                                                           5
                                                                                 2
##
   8 fieldjo~
                 1887
                          1 PIT
                                   NL
                                            43
                                                 164
                                                        26
                                                              44
                                                                     9
                                                                           2
                                                                                 0
                          1 PIT
                                            49
                                                 193
                                                        10
                                                                     7
                                                                           3
   9 galvipu~
                 1887
                                   NL
                                                              41
## 10 kuehnbi~
                                           102
                                                 402
                 1887
                          1 PIT
                                   NL
                                                        68
                                                             120
                                                                          15
                                                                                 1
                                                                    18
```

```
## # ... with 4,861 more rows, and 10 more variables: RBI <int>, SB <int>,
      CS <int>, BB <int>, SO <int>, IBB <int>, HBP <int>, SH <int>, SF <int>,
      GIDP <int>
filter(Batting, teamID=="PIT" & yearID==2000)
## # A tibble: 46 x 22
##
     playerID yearID stint teamID lgID
                                             G
                                                  AB
                                                         R
                                                               Η
                                                                   X2B
                                                                         ХЗВ
                                                                                HR
##
      <chr>
                <int> <int> <fct>
                                   <fct> <int> <int> <int> <int> <int> <int> <int> <int> <int>
##
   1 anderji~
                 2000
                          1 PIT
                                   NL
                                            27
                                                  50
                                                         5
                                                               7
                                                                     1
                                                                           0
                                                         2
##
   2 arroybr~
                 2000
                          1 PIT
                                   NL
                                            21
                                                  21
                                                               3
                                                                     2
## 3 avenbr01
                 2000
                          1 PIT
                                            72
                                                 148
                                                              37
                                                                           0
                                                                                 5
                                   NL
                                                        18
                                                                    11
## 4 benjami~
                 2000
                          1 PIT
                                   NL
                                            93
                                                 233
                                                        28
                                                              63
                                                                    18
                                                                           2
                                                                                 2
## 5 bensokr~
                 2000
                          1 PIT
                                  NL
                                            32
                                                  65
                                                         3
                                                               6
                                                                     2
                                                                           0
                                                                                 0
## 6 brownad~
                 2000
                          1 PIT
                                   NL
                                           104
                                                 308
                                                        64
                                                              97
                                                                    18
                                                                           3
##
  7 brownem~
                 2000
                          1 PIT
                                   NL
                                            50
                                                 119
                                                        13
                                                              26
                                                                     5
                                                                           0
                                                                                 3
##
   8 chrisja~
                 2000
                          1 PIT
                                   NL
                                            44
                                                   0
                                                         0
                                                               0
                                                                     0
                                                                           0
## 9 clontbr~
                 2000
                          1 PIT
                                   NL
                                             5
                                                   0
                                                         1
                                                               0
                                                                     0
                                                                           0
                                                                                 Λ
## 10 cordewi~
                 2000
                          1 PIT
                                                 348
                                   NL
                                            89
                                                              98
                                                                    24
## # ... with 36 more rows, and 10 more variables: RBI <int>, SB <int>, CS <int>,
     BB <int>, SO <int>, IBB <int>, HBP <int>, SH <int>, SF <int>, GIDP <int>
# Re-order rows (default by ascending order)
arrange(Batting, teamID)
## # A tibble: 107,429 x 22
##
     playerID yearID stint teamID lgID
                                                  AB
                                                         R
                                                               Η
                                                                   X2B
                                                                         ХЗВ
                                                                                HR
##
      <chr>>
                ##
  1 berrych~
                 1884
                          1 ALT
                                   UA
                                             7
                                                  25
                                                         2
                                                               6
##
                 1884
                                                  88
                                                        12
                                                                     2
                                                                           2
   2 brownji~
                          1 ALT
                                   UA
                                            21
                                                              22
                                                                                 1
##
   3 carropa~
                 1884
                          1 ALT
                                   UA
                                            11
                                                  49
                                                         4
                                                              13
                                                                           0
## 4 connojo~
                 1884
                          1 ALT
                                   UA
                                             3
                                                         0
                                                                           0
                                                                                 0
                                                  11
                                                               1
                                                                     0
##
   5 crosscl~
                 1884
                          1 ALT
                                             2
                                                   7
                                                                           0
                                   UA
                                                         1
                                                                     1
##
                                                         0
                                                                           0
                                                                                 0
  6 daisege~
                 1884
                          1 ALT
                                   UA
                                             1
                                                   4
                                                               0
                                                                     0
   7 doughch~
                 1884
                          1 ALT
                                   UA
                                            23
                                                  85
                                                         6
                                                              22
                                                                     5
                                             9
##
   8 gradyjo~
                 1884
                          1 ALT
                                   UA
                                                  36
                                                         5
                                                              11
                                                                     3
                                                                           0
                                                                                 0
## 9 harrifr~
                 1884
                          1 ALT
                                   UA
                                            24
                                                  95
                                                        10
                                                              25
                                                                     2
                                                                           1
                                                                                 0
                                            21
                                                  78
## 10 koonsha~
                 1884
                          1 ALT
                                   UA
                                                         8
                                                              18
                                                                     2
## # ... with 107,419 more rows, and 10 more variables: RBI <int>, SB <int>,
      CS <int>, BB <int>, SO <int>, IBB <int>, HBP <int>, SH <int>, SF <int>,
## #
## #
      GIDP <int>
arrange(Batting, teamID, G)
## # A tibble: 107,429 x 22
##
      playerID yearID stint teamID lgID
                                             G
                                                  AB
                                                         R
                                                               Η
                                                                   X2B
                                                                         ХЗВ
                                                                                HR
##
                <chr>
                                   UA
##
   1 daisege~
                 1884
                          1 ALT
                                             1
                                                   4
                                                         0
                                                               0
                                                                     0
                                                                           0
##
   2 crosscl~
                 1884
                          1 ALT
                                             2
                                                   7
                                                                           0
                                   UA
                                                         1
                                                               4
                                                                     1
                                                   7
## 3 manloch~
                 1884
                          1 ALT
                                   UA
                                             2
                                                         1
                                                               3
                                                                     0
                                                                           0
                                                                                 0
                                             3
                                                         0
## 4 connojo~
                 1884
                          1 ALT
                                   UA
                                                  11
                                                               1
## 5 shafff01
                                             6
                                                                                 0
                 1884
                          1 ALT
                                   UA
                                                  19
                                                         1
                                                               3
                                                                     0
                                                                           0
```

```
##
    6 berrych~
                  1884
                           1 ALT
                                    UA
                                                    25
                                                            2
                                                                  6
                  1884
##
  7 noftsge~
                           1 ALT
                                               7
                                                    25
                                                            0
                                                                        0
                                                                               0
                                                                                     0
                                    UA
                                                                  1
    8 learyja~
                  1884
                           1 ALT
                                    UA
                                               8
                                                    33
                                                            1
                                                                  3
                                                                               0
                                                                                     0
                                                                                     0
## 9 gradyjo~
                  1884
                           1 ALT
                                    UA
                                               9
                                                    36
                                                            5
                                                                        3
                                                                               0
                                                                 11
## 10 carropa~
                  1884
                           1 ALT
                                    UA
                                              11
                                                    49
                                                            4
                                                                 13
                                                                               0
## # ... with 107,419 more rows, and 10 more variables: RBI <int>, SB <int>,
       CS <int>, BB <int>, SO <int>, IBB <int>, HBP <int>, SH <int>, SF <int>,
       GIDP <int>
## #
arrange(Batting, teamID, desc(G))
## # A tibble: 107,429 x 22
##
      playerID yearID stint teamID lgID
                                               G
                                                    AB
                                                            R
                                                                  Η
                                                                      X2B
                                                                             хзв
                                                                                    HR.
##
      <chr>
                <int> <int> <fct> <fct> <int> <int> <int>
                                                              <int> <int> <int> <int>
                           1 ALT
##
    1 smithge~
                  1884
                                     UA
                                              25
                                                    108
                                                            9
                                                                 34
                                                                        8
                                                                               1
##
    2 harrifr~
                  1884
                           1 ALT
                                    UA
                                              24
                                                    95
                                                           10
                                                                 25
                                                                        2
                                                                               1
## 3 doughch~
                  1884
                           1 ALT
                                              23
                                                    85
                                                            6
                                                                 22
                                                                        5
                                                                               0
                                                                                     0
                                    UA
## 4 murphjo~
                           1 ALT
                                              23
                  1884
                                    UA
                                                           10
                                                                 14
## 5 brownji~
                                                                               2
                  1884
                           1 ALT
                                    UA
                                              21
                                                    88
                                                           12
                                                                 22
                                                                        2
                                                                                     1
## 6 koonsha~
                 1884
                           1 ALT
                                    UA
                                              21
                                                    78
                                                            8
                                                                 18
                                                                        2
                                                                               1
                                                                                     0
## 7 mooreje~
                  1884
                           1 ALT
                                    UA
                                              20
                                                    80
                                                           10
                                                                 25
                                                                        3
                                                                               1
                                                                                     1
## 8 shaffta~
                  1884
                           1 ALT
                                    UA
                                              13
                                                    55
                                                           10
                                                                 18
                                                                        2
                                                                               0
                                                                                     0
##
    9 carropa~
                  1884
                           1 ALT
                                    UA
                                              11
                                                    49
                                                            4
                                                                 13
                                                                               0
                                                                                     0
                                                            5
## 10 gradyjo~
                  1884
                           1 ALT
                                    UA
                                               9
                                                    36
                                                                 11
                                                                        3
## # ... with 107,419 more rows, and 10 more variables: RBI <int>, SB <int>,
       CS <int>, BB <int>, SO <int>, IBB <int>, HBP <int>, SH <int>, SF <int>,
## #
       GIDP <int>
# Subset columns: Select cols that match certain characteristic (contain X2B)
# $ operator returns simplified vector form, select() returns same type of object (tibble)
vec <- Batting$X2B</pre>
tib <- select(Batting, X2B)
# Piping/chanining can feed one function's output into another function's input
arrange(select(filter(Batting, teamID=="PIT"), playerID, G, X2B), desc(X2B))
## # A tibble: 4,871 x 3
##
      playerID
                     G
                         X2B
##
      <chr>
                <int> <int>
##
   1 wanerpa01
                   154
                          62
##
    2 wanerpa01
                   148
                          53
##
    3 sanchfr01
                  157
                          53
## 4 wanerpa01
                  152
                          50
## 5 comorad01
                  152
                          47
                  152
##
    6 mclouna01
                          46
                  135
##
   7 wagneho01
                          45
## 8 parkeda01
                          45
                   158
   9 vanslan01
                   154
                          45
```

## 10 wagneho01

132

## # ... with 4,861 more rows

44

```
Batting %>% filter(teamID=="PIT") %>% select(playerID, G, X2B) %>% arrange(desc(X2B))
## # A tibble: 4,871 \times 3
##
     playerID
                   G X2B
##
      <chr>
               <int> <int>
                 154
## 1 wanerpa01
                        62
## 2 wanerpa01
                 148
## 3 sanchfr01
                 157
                        53
## 4 wanerpa01
                 152
                        50
## 5 comorad01
                 152
                        47
## 6 mclouna01
                 152
                        46
## 7 wagneho01
                 135
                        45
## 8 parkeda01
                 158
                        45
## 9 vanslan01
                 154
                        45
## 10 wagneho01
                 132
## # ... with 4,861 more rows
# Select columns using multiple types of criteria
Batting %>% select(X2B:HR)
## # A tibble: 107,429 x 3
##
       X2B
             ХЗВ
                    HR
      <int> <int> <int>
##
## 1
         0
               0
                     0
## 2
         6
               0
                     0
## 3
         4
               5
                     0
## 4
        10
               2
                     2
## 5
        11
               3
                     0
## 6
         2
                     0
               1
## 7
         0
               0
                     0
## 8
        10
               9
                     0
## 9
         1
                     0
## 10
         2
                     0
               1
## # ... with 107,419 more rows
Batting %>% select(contains("X"))
## # A tibble: 107,429 x 2
##
       X2B
            ХЗВ
##
      <int> <int>
## 1
         0
## 2
         6
               0
## 3
         4
               2
## 4
        10
## 5
        11
               3
## 6
        2
               1
## 7
         0
               0
## 8
        10
               9
## 9
         1
               0
         2
## 10
## # ... with 107,419 more rows
```

```
## # A tibble: 107,429 x 7
##
        X2B
              X3B playerID
                            yearID teamID lgID
                                                      G
##
      <int> <int> <chr>
                                           <fct> <int>
                              <int> <fct>
                0 abercda01
                               1871 TRO
##
   1
          0
                                           NA
                                                      1
    2
                               1871 RC1
                                                     25
##
          6
                0 addybo01
                                           NA
##
    3
          4
                5 allisar01
                               1871 CL1
                                           NA
                                                     29
##
   4
         10
                2 allisdo01
                               1871 WS3
                                           NA
                                                     27
##
   5
         11
                3 ansonca01
                               1871 RC1
                                           NA
                                                     25
##
          2
                1 armstbo01
                               1871 FW1
                                                     12
    6
                                           NA
##
   7
          0
                0 barkeal01
                               1871 RC1
                                           NΑ
                                                      1
##
   8
         10
                9 barnero01
                               1871 BS1
                                           NA
                                                     31
##
  9
                0 barrebi01
                               1871 FW1
                                           NA
                                                      1
          1
## 10
          2
                1 barrofr01
                               1871 BS1
                                           NA
                                                     18
## # ... with 107,419 more rows
# Rename variables
# NOTE: This renaming isn't permanent, b/c we don't save output
Batting %>%
  select(starts_with("X"), ends_with("ID"), G) %>%
 rename("Doubles"=X2B, "Triples"=X3B)
## # A tibble: 107,429 x 7
##
      Doubles Triples playerID yearID teamID lgID
                                                          G
##
        <int>
                <int> <chr>
                                  <int> <fct>
                                                <fct> <int>
##
   1
            0
                    0 abercda01
                                   1871 TRO
                                                NA
                                                          1
##
    2
            6
                    0 addybo01
                                   1871 RC1
                                                NA
                                                         25
##
    3
            4
                    5 allisar01
                                   1871 CL1
                                                         29
                                                NA
##
   4
           10
                    2 allisdo01
                                   1871 WS3
                                                         27
## 5
                    3 ansonca01
                                   1871 RC1
                                                         25
           11
                                                NA
##
    6
            2
                    1 armstbo01
                                   1871 FW1
                                                         12
                                                NA
##
  7
            0
                    0 barkeal01
                                   1871 RC1
                                                NA
                                                          1
##
  8
           10
                    9 barnero01
                                   1871 BS1
                                                         31
                                                NΑ
##
  9
            1
                    0 barrebi01
                                   1871 FW1
                                                NΑ
                                                          1
## 10
            2
                    1 barrofr01
                                   1871 BS1
                                                         18
                                                NA
## # ... with 107,419 more rows
# Re-order variables
# everything() grabs all other variables, so this puts playerID 1st, HR 2nd, then all other cols
Batting %>% select(playerID, HR, everything())
## # A tibble: 107,429 x 22
##
                                                     G
                                                                 R
                                                                            X2B
                                                                                  хзв
      playerID
                  HR yearID stint teamID lgID
                                                          AB
                                                                        Η
##
      <chr>
               <int>
                      <int> <int> <fct> <fct> <int> <int>
                                                             <int> <int> <int> <int>
                                 1 TRO
##
   1 abercda~
                        1871
                                          NA
                                                           4
                                                                              0
                                                                                    0
                   0
                                                     1
                                                                  0
                                                                        0
    2 addybo01
                   0
                        1871
                                 1 RC1
                                                    25
                                                         118
                                                                 30
                                                                       32
                                                                              6
                                                                                    0
                                          NA
  3 allisar~
                        1871
                                 1 CL1
                                                                              4
##
                   0
                                          NA
                                                    29
                                                         137
                                                                 28
                                                                       40
                                                                                    5
##
   4 allisdo~
                   2
                        1871
                                 1 WS3
                                          NA
                                                    27
                                                         133
                                                                 28
                                                                       44
                                                                             10
                                                                                    2
                                 1 RC1
                                                    25
                                                                                    3
## 5 ansonca~
                   0
                        1871
                                          NA
                                                         120
                                                                 29
                                                                       39
                                                                             11
## 6 armstbo~
                        1871
                                 1 FW1
                                                    12
                                                          49
                                                                              2
                                                                                    1
                   0
                                          NA
                                                                       11
## 7 barkeal~
                       1871
                                 1 RC1
                                                                                    0
                   0
                                          NA
                                                    1
                                                           4
                                                                  0
                                                                        1
                                                                              0
```

Batting %>% select(starts\_with("X"), ends\_with("ID"), G)

```
## 8 barnero~
                   0
                        1871
                                 1 BS1
                                          NA
                                                    31
                                                         157
                                                                 66
                                                                       63
                                                                             10
## 9 barrebi~
                        1871
                                 1 FW1
                                          NΑ
                                                           5
                                                                 1
                                                                        1
                                                                                    0
                    0
                                                     1
                                                                              1
                        1871
## 10 barrofr~
                   0
                                 1 BS1
                                          NA
                                                    18
                                                          86
                                                                 13
                                                                       13
                                                                                    1
## # ... with 107,419 more rows, and 10 more variables: RBI <int>, SB <int>,
       CS <int>, BB <int>, SO <int>, IBB <int>, HBP <int>, SH <int>, SF <int>,
## #
       GIDP <int>
```

**4.4 Manipulating Data: Creating New Variables** From fivethirtyeight.com, fandango dataframe of film ratings (n=146 films, p=23 cols).

```
#install.packages("fivethirtyeight")
library(fivethirtyeight)

## Some larger datasets need to be installed separately, like senators and
## house_district_forecast. To install these, we recommend you install the
## fivethirtyeightdata package by running:
## install.packages('fivethirtyeightdata', repos =
## 'https://fivethirtyeightdata.github.io/drat/', type = 'source')
```

#### fandango

```
## # A tibble: 146 x 23
##
            year rottentomatoes rottentomatoes_~ metacritic metacritic_user imdb
##
      <chr> <dbl>
                           <int>
                                            <int>
                                                        <int>
                                                                        <dbl> <dbl>
##
   1 Aven~ 2015
                              74
                                               86
                                                           66
                                                                          7.1
                                                                                7.8
   2 Cind~ 2015
                                                           67
                                                                          7.5
                                                                                7.1
##
                              85
                                               80
##
   3 Ant-~ 2015
                              80
                                               90
                                                                          8.1
                                                                                7.8
                                                           64
##
   4 Do Y~ 2015
                              18
                                               84
                                                           22
                                                                          4.7
                                                                                5.4
  5 Hot ~ 2015
                                               28
                                                           29
                                                                          3.4
                                                                                5.1
##
                              14
## 6 The ~ 2015
                              63
                                               62
                                                           50
                                                                          6.8
                                                                                7.2
   7 Irra~ 2015
                              42
                                               53
                                                           53
                                                                          7.6
                                                                                6.9
##
  8 Top ~ 2014
                              86
                                               64
                                                           81
                                                                          6.8
                                                                                6.5
   9 Shau~ 2015
                                               82
                                                           81
                                                                          8.8
##
                              99
                                                                                7.4
                                               87
                                                                          8.5
                                                                                7.8
## 10 Love~ 2015
                              89
                                                           80
## # ... with 136 more rows, and 16 more variables: fandango_stars <dbl>,
       fandango_ratingvalue <dbl>, rt_norm <dbl>, rt_user_norm <dbl>,
## #
       metacritic_norm <dbl>, metacritic_user_nom <dbl>, imdb_norm <dbl>,
## #
       rt_norm_round <dbl>, rt_user_norm_round <dbl>, metacritic_norm_round <dbl>,
## #
       metacritic_user_norm_round <dbl>, imdb_norm_round <dbl>,
       metacritic_user_vote_count <int>, imdb_user_vote_count <int>,
## #
       fandango_votes <int>, fandango_difference <dbl>
```

## # Add new column fandango %% mutate(avgRotten = (rottentomatoes + rottentomatoes\_user)/2)

```
## # A tibble: 146 x 24
##
      film
            year rottentomatoes rottentomatoes_~ metacritic metacritic_user imdb
##
      <chr> <dbl>
                           <int>
                                             <int>
                                                        <int>
                                                                        <dbl> <dbl>
   1 Aven~ 2015
                              74
                                                           66
                                                                          7.1
                                                                                7.8
##
                                               86
   2 Cind~
             2015
                              85
                                               80
                                                           67
                                                                          7.5
                                                                                7.1
                              80
  3 Ant-~ 2015
                                               90
                                                           64
                                                                          8.1
                                                                                7.8
```

```
## 4 Do Y~ 2015
                                                           22
                                                                          4.7
                                                                                5.4
                              18
                                               84
## 5 Hot ~ 2015
                              14
                                               28
                                                           29
                                                                          3.4
                                                                                5.1
   6 The ~ 2015
                                                                                7.2
                              63
                                               62
                                                           50
                                                                          6.8
  7 Irra~ 2015
                              42
                                               53
                                                           53
                                                                          7.6
                                                                                6.9
##
    8 Top ~ 2014
                              86
                                                64
                                                           81
                                                                          6.8
                                                                                6.5
## 9 Shau~ 2015
                              99
                                                82
                                                           81
                                                                          8.8
                                                                                7.4
## 10 Love~ 2015
                              89
                                                87
                                                                          8.5
                                                                                7.8
## # ... with 136 more rows, and 17 more variables: fandango_stars <dbl>,
       fandango_ratingvalue <dbl>, rt_norm <dbl>, rt_user_norm <dbl>,
## #
       metacritic_norm <dbl>, metacritic_user_nom <dbl>, imdb_norm <dbl>,
       rt_norm_round <dbl>, rt_user_norm_round <dbl>, metacritic_norm_round <dbl>,
       metacritic_user_norm_round <dbl>, imdb_norm_round <dbl>,
## #
## #
       metacritic_user_vote_count <int>, imdb_user_vote_count <int>,
## #
       fandango_votes <int>, fandango_difference <dbl>, avgRotten <dbl>
# Will be at the end (might have to scroll right in output), so select to view it up front
fandango %>%
  mutate(avgRotten = (rottentomatoes + rottentomatoes_user)/2) %>%
  select(avgRotten)
## # A tibble: 146 x 1
##
      avgRotten
##
          <dbl>
   1
           80
##
   2
##
           82.5
##
   3
           85
##
   4
           51
##
   5
           21
##
   6
           62.5
   7
           47.5
##
## 8
           75
## 9
           90.5
## 10
           88
## # ... with 136 more rows
# Transmute just grabs new column only (like mutate + select)
fandango %>% transmute(avgRotten = (rottentomatoes + rottentomatoes_user)/2)
## # A tibble: 146 x 1
##
      avgRotten
          <dbl>
##
##
   1
           80
##
   2
           82.5
##
   3
           85
   4
           51
##
    5
           21
##
##
   6
           62.5
##
   7
           47.5
##
   8
           75
   9
           90.5
##
## 10
           88
## # ... with 136 more rows
```

```
# Summarize will apply basic functions like mean and sd to data
fandango %>% summarise(avgStars = mean(fandango_stars), sdStars = sd(fandango_stars))
## # A tibble: 1 x 2
##
    avgStars sdStars
##
        <dbl>
               <dbl>
## 1
        4.09
              0.540
# Can also summarize by group_by variable
fandango %>% group_by(year) %>% summarise(avgSTars = mean(fandango_stars), sdStars = sd(fandango_stars)
## 'summarise()' ungrouping output (override with '.groups' argument)
## # A tibble: 2 x 3
##
     year avgSTars sdStars
##
     <dbl>
             <dbl>
                     <dbl>
## 1 2014
                     0.574
              4.12
## 2 2015
               4.09
                     0.538
# NOTE: RUn this in console and you will see Groups: year[2] showing you've grouped by year into 2 group
# Conditional Execution with If-Then-Else
# NOTE: Always GPP (good programming practice) to include base case if no conditions are met (else)
# How to create new variable for large setosa flowers?
# If can only take 1 comparison (see Warning)
if ((iris$Petal.Length>1.5) & (iris$Petal.Width>0.3) & (iris$Species=="setosa")) {
  "Large Setosa"
}
## Warning in if ((iris$Petal.Length > 1.5) & (iris$Petal.Width > 0.3) &
## (iris$Species == : the condition has length > 1 and only the first element will
## be used
# Use ifelse() function for a compound logical condition
help(ifelse)
## starting httpd help server ...
## done
ifelse((iris$Petal.Length>1.5) & (iris$Petal.Width>0.3) & (iris$Species=="setosa"), "L-S", "NotL-S")
##
     [1] "NotL-S" "NotL-S" "NotL-S" "NotL-S" "L-S"
                                                               "NotL-S" "NotL-S"
     [9] "NotL-S" "NotL-S" "NotL-S" "NotL-S" "NotL-S" "NotL-S" "NotL-S" "NotL-S"
##
   [17] "NotL-S" "NotL-S" "NotL-S" "NotL-S" "NotL-S" "NotL-S" "L-S"
   [25] "NotL-S" "NotL-S" "L-S"
                                   "NotL-S" "NotL-S" "NotL-S" "NotL-S"
##
    [33] "NotL-S" "NotL-S" "NotL-S" "NotL-S" "NotL-S" "NotL-S" "NotL-S" "NotL-S"
   [41] "NotL-S" "NotL-S" "NotL-S" "L-S"
##
                                            "L-S"
                                                     "NotL-S" "NotL-S" "NotL-S"
  [49] "NotL-S" "NotL-S" "NotL-S" "NotL-S" "NotL-S" "NotL-S" "NotL-S" "NotL-S"
## [57] "NotL-S" "NotL-S" "NotL-S" "NotL-S" "NotL-S" "NotL-S" "NotL-S" "NotL-S"
```

```
[65] "NotL-S" "NotL-S" "NotL-S" "NotL-S" "NotL-S" "NotL-S" "NotL-S" "NotL-S"
##
   [73] "NotL-S" "NotL-S" "NotL-S" "NotL-S" "NotL-S" "NotL-S" "NotL-S" "NotL-S"
  [81] "NotL-S" "NotL-S" "NotL-S" "NotL-S" "NotL-S" "NotL-S" "NotL-S" "NotL-S"
## [89] "NotL-S" "NotL-S" "NotL-S" "NotL-S" "NotL-S" "NotL-S" "NotL-S" "NotL-S"
   [97] "NotL-S" "NotL-S" "NotL-S" "NotL-S" "NotL-S" "NotL-S" "NotL-S" "NotL-S"
## [105] "NotL-S" "NotL-S" "NotL-S" "NotL-S" "NotL-S" "NotL-S" "NotL-S" "NotL-S"
## [113] "NotL-S" "NotL-S" "NotL-S" "NotL-S" "NotL-S" "NotL-S" "NotL-S" "NotL-S"
## [121] "NotL-S" "NotL-S" "NotL-S" "NotL-S" "NotL-S" "NotL-S" "NotL-S" "NotL-S"
## [129] "NotL-S" "NotL-S" "NotL-S" "NotL-S" "NotL-S" "NotL-S" "NotL-S" "NotL-S"
## [137] "NotL-S" "NotL-S" "NotL-S" "NotL-S" "NotL-S" "NotL-S" "NotL-S" "NotL-S"
## [145] "NotL-S" "NotL-S" "NotL-S" "NotL-S" "NotL-S" "NotL-S"
# To save this new data label, use transmute() (mutate + selects new col to view) or mutate()
mutate(iris,
       Size=ifelse((Petal.Length>1.5) & (Petal.Width>0.3) & (Species=="setosa"), "L-S", "NotL-S"))
## # A tibble: 150 x 6
      Sepal.Length Sepal.Width Petal.Length Petal.Width Species Size
##
             <dbl>
                         <dbl>
                                      <dbl>
                                                   <dbl> <fct>
                                                                 <chr>
##
  1
               5.1
                           3.5
                                        1.4
                                                     0.2 setosa NotL-S
## 2
               4.9
                           3
                                        1.4
                                                     0.2 setosa NotL-S
## 3
               4.7
                           3.2
                                        1.3
                                                     0.2 setosa NotL-S
## 4
               4.6
                           3.1
                                        1.5
                                                     0.2 setosa NotL-S
## 5
               5
                           3.6
                                        1.4
                                                     0.2 setosa
                                                                 NotL-S
##
  6
               5.4
                           3.9
                                        1.7
                                                     0.4 setosa L-S
                                                     0.3 setosa NotL-S
##
   7
               4.6
                           3.4
                                        1.4
##
   8
               5
                           3.4
                                        1.5
                                                     0.2 setosa
                                                                 NotL-S
##
   9
               4.4
                           2.9
                                        1.4
                                                     0.2 setosa NotL-S
## 10
               4.9
                           3.1
                                        1.5
                                                     0.1 setosa NotL-S
## # ... with 140 more rows
# Convert from wide to long data using gather() for machine learning
(tempsData <- read delim(file="./Data/cityTemps.txt", delim=" "))</pre>
## Parsed with column specification:
## cols(
##
     city = col_character(),
##
     sun = col_double(),
##
    mon = col_double(),
##
    tue = col_double(),
##
    wed = col_double(),
##
    thr = col_double(),
##
     fri = col_double(),
     sat = col_double()
##
## )
## # A tibble: 6 x 8
##
     city
                             tue
                                   wed
                                         thr
                                                fri
                                                      sat
                       mon
##
               <dbl> <dbl> <dbl> <dbl> <dbl> <dbl> <dbl> <dbl> <
     <chr>
## 1 atlanta
                  81
                        87
                              83
                                    79
                                           88
                                                 91
                                                       94
## 2 baltimore
                  73
                        75
                              70
                                    78
                                           73
                                                 75
                                                       79
## 3 charlotte
                  82
                        80
                              75
                                    82
                                           83
                                                 88
                                                       93
```

```
## 4 denver
                   72
                         71
                               67
                                      68
                                            72
                                                  71
                                                         58
## 5 ellington
                         42
                               47
                                      52
                                            55
                                                  56
                                                         59
                   51
## 6 frankfort
                                      70
                                            74
                                                  74
                   70
                         70
                               72
                                                         79
(newTempsData <- tempsData %>% gather(key=day, value=temp, 2:8))
## # A tibble: 42 x 3
##
      city
                day
                        temp
##
                 <chr> <dbl>
      <chr>
##
   1 atlanta
                sun
    2 baltimore sun
                          73
##
##
    3 charlotte sun
                          82
##
  4 denver
                          72
                sun
  5 ellington sun
                          51
## 6 frankfort sun
                          70
   7 atlanta
                          87
                mon
                          75
## 8 baltimore mon
## 9 charlotte mon
                          80
## 10 denver
                          71
                mon
## # ... with 32 more rows
# Convert form long to wide data using
newTempsData %>% spread(key=day, value=temp)
## # A tibble: 6 x 8
##
     city
                 fri
                        mon
                              sat
                                     sun
                                           thr
                                                 tue
                                                        wed
##
     <chr>>
               <dbl> <dbl> <dbl> <dbl> <dbl> <dbl>
                                               <dbl>
                                                     <dbl>
## 1 atlanta
                   91
                         87
                               94
                                      81
                                            88
                                                  83
                                                         79
                   75
                                            73
                                                  70
## 2 baltimore
                         75
                               79
                                      73
                                                         78
## 3 charlotte
                                            83
                                                  75
                                                         82
                   88
                         80
                               93
                                      82
## 4 denver
                   71
                         71
                               58
                                      72
                                            72
                                                  67
                                                         68
## 5 ellington
                   56
                         42
                               59
                                      51
                                            55
                                                  47
                                                         52
## 6 frankfort
                   74
                         70
                               79
                                      70
                                            74
                                                  72
                                                         70
# NOTE: Same data set as before, although columns now alphabetically ordered
# Split 1 col into multiple cols using separate()
(chicagoData <- read_csv(file="./Data/Chicago.csv"))</pre>
## Parsed with column specification:
## cols(
##
     X = col_double(),
##
     city = col_character(),
     date = col_character(),
##
##
     death = col_double(),
##
     temp = col_double(),
##
     dewpoint = col_double(),
     pm10 = col_double(),
##
##
     o3 = col_double(),
##
     time = col_double(),
##
     season = col_character(),
##
     year = col_double()
## )
```

```
## # A tibble: 1,461 x 11
##
                          death temp dewpoint pm10
         X city date
                                                       o3 time season year
                                         <dbl> <dbl> <dbl> <dbl> <dbl> <dbl>
##
     <dbl> <chr> <chr>
                          <dbl> <dbl>
   1 3654 chic 1/1/1997
                            137
                                36
                                         37.5 13.1
                                                     5.66 3654 winter 1997
##
##
   2 3655 chic 1/2/1997
                            123
                                 45
                                         47.2 41.9
                                                     5.53
                                                          3655 winter
##
   3 3656 chic 1/3/1997
                            127
                                 40
                                         38
                                               27.0
                                                     6.29 3656 winter 1997
   4 3657 chic 1/4/1997
                            146
                                 51.5
                                         45.5 25.1
                                                     7.54 3657 winter 1997
   5 3658 chic 1/5/1997
                            102
                                 27
                                         11.2 15.3 20.8
                                                           3658 winter 1997
##
   6 3659 chic 1/6/1997
##
                            127
                                17
                                          5.75 9.36 14.9
                                                           3659 winter 1997
##
   7 3660 chic 1/7/1997
                                16
                                         7
                                               20.2 11.9
                                                           3660 winter 1997
                            116
                                              33.1
   8 3661 chic 1/8/1997
                            118
                                19
                                         17.8
                                                     8.68 3661 winter 1997
  9 3662 chic 1/9/1997
                                26
                                               12.1
                                                           3662 winter 1997
##
                            148
                                         24
                                                    13.4
## 10 3663 chic 1/10/1997
                                                           3663 winter 1997
                            121
                                16
                                         5.38 24.8 10.4
## # ... with 1,451 more rows
```

#### chicagoData %>% separate(date, c("Day", "Month", "Year"), sep="/")

```
## # A tibble: 1,461 x 13
         X city Day
                       Month Year death temp dewpoint pm10
##
                                                                  o3 time season
      <dbl> <chr> <chr> <chr> <chr> <chr> <dbl> <dbl>
                                                   <dbl> <dbl> <dbl> <dbl> <chr>
##
                                                                5.66
##
   1 3654 chic 1
                       1
                              1997
                                      137
                                          36
                                                   37.5 13.1
                                                                     3654 winter
##
   2 3655 chic 1
                       2
                              1997
                                      123
                                          45
                                                   47.2 41.9
                                                                5.53
                                                                      3655 winter
   3 3656 chic 1
                                                         27.0
                              1997
                                      127
                                          40
                                                   38
                                                                6.29
                                                                      3656 winter
##
                       3
                                                   45.5 25.1
   4 3657 chic 1
                             1997
                                     146
                                                               7.54
##
                       4
                                          51.5
                                                                      3657 winter
   5 3658 chic 1
##
                              1997
                                      102
                                          27
                                                   11.2 15.3 20.8
                                                                      3658 winter
                       5
                                                   5.75 9.36 14.9
   6 3659 chic
##
                1
                       6
                              1997
                                      127
                                          17
                                                                      3659 winter
##
   7 3660 chic
                       7
                              1997
                                     116
                                          16
                                                   7
                                                         20.2 11.9
                                                                      3660 winter
##
   8 3661 chic
                              1997
                                      118
                                          19
                                                   17.8 33.1
                                                               8.68
                                                                     3661 winter
                1
                       8
  9 3662 chic 1
##
                       9
                              1997
                                      148
                                          26
                                                   24
                                                         12.1 13.4
                                                                      3662 winter
## 10 3663 chic 1
                              1997
                                                   5.38 24.8 10.4
                                                                      3663 winter
                       10
                                      121
                                          16
## # ... with 1,451 more rows, and 1 more variable: year <dbl>
```