# dplyr Basics

Sadaf Zuhra

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# dplyr Basics

The five key dplyr functions that allow you to solve the vast majority of your data-manipulation challenges:

- Pick observations by their values (filter()).
- Reorder the rows (arrange()).
- Pick variables by their names (select()).
- Create new variables with functions of existing variables(mutate()).
- Collapse many values down to a single summary (summarize()).

These can all be used in conjunction with group\_by(), which changes the scope of each function from operating on the entire dataset to operating on it group-by-group. ## Filter Rows with filter()

```
library(tidyverse)
library(nycflights13)
filter(flights, month == 1, day == 1)
## # A tibble: 842 x 19
##
                      day dep_time sched_dep_time dep_delay arr_time sched_arr_time
        year month
       <int> <int> <int>
                                                         <dbl>
##
                              <int>
                                              <int>
                                                                   <int>
                                                                                    <int>
##
       2013
                                                515
                                                              2
                                                                      830
                                                                                      819
    1
                  1
                        1
                                517
##
       2013
                  1
                        1
                                533
                                                529
                                                              4
                                                                      850
                                                                                      830
       2013
                                542
                                                              2
##
    3
                  1
                        1
                                                540
                                                                      923
                                                                                      850
       2013
##
    4
                  1
                        1
                                544
                                                545
                                                             -1
                                                                    1004
                                                                                     1022
    5
##
       2013
                        1
                                                             -6
                  1
                                554
                                                600
                                                                      812
                                                                                      837
##
    6
       2013
                        1
                                554
                                                558
                                                             -4
                                                                      740
                                                                                      728
                  1
    7
                                                             -5
##
       2013
                  1
                        1
                                555
                                                600
                                                                      913
                                                                                      854
##
    8
       2013
                        1
                                557
                                                600
                                                             -3
                                                                      709
                                                                                      723
                  1
##
    9
       2013
                        1
                                557
                                                600
                                                             -3
                                                                      838
                                                                                      846
## 10
       2013
                        1
                                558
                                                600
                                                             -2
                                                                      753
                                                                                      745
                  1
   # i 832 more rows
## # i 11 more variables: arr_delay <dbl>, carrier <chr>, flight <int>,
        tailnum <chr>, origin <chr>, dest <chr>, air_time <dbl>, distance <dbl>,
## #
       hour <dbl>, minute <dbl>, time_hour <dttm>
```

```
jan1 <- filter(flights, month == 1, day == 1)
(dec25 <- filter(flights, month == 12, day == 25))</pre>
```

```
## # A tibble: 719 x 19
##
       year month
                    day dep_time sched_dep_time dep_delay arr_time sched_arr_time
##
      <int> <int> <int>
                            <int>
                                            <int>
                                                      <dbl>
                                                                <int>
   1 2013
                                                                                  651
##
               12
                      25
                              456
                                              500
                                                         -4
                                                                  649
##
    2 2013
               12
                      25
                              524
                                              515
                                                          9
                                                                  805
                                                                                  814
##
    3 2013
               12
                      25
                              542
                                              540
                                                          2
                                                                  832
                                                                                  850
   4 2013
                                              550
                                                         -4
                                                                                 1027
               12
                      25
                              546
                                                                 1022
   5 2013
##
               12
                      25
                              556
                                              600
                                                         -4
                                                                  730
                                                                                 745
##
    6 2013
               12
                      25
                              557
                                              600
                                                         -3
                                                                  743
                                                                                 752
##
   7 2013
                      25
                                              600
                                                         -3
               12
                              557
                                                                  818
                                                                                 831
   8 2013
               12
                      25
                              559
                                              600
                                                         -1
                                                                  855
                                                                                  856
   9 2013
                                                                                  855
##
               12
                      25
                              559
                                              600
                                                         -1
                                                                  849
## 10 2013
               12
                      25
                              600
                                              600
                                                          0
                                                                  850
                                                                                  846
## # i 709 more rows
## # i 11 more variables: arr_delay <dbl>, carrier <chr>, flight <int>,
       tailnum <chr>, origin <chr>, dest <chr>, air_time <dbl>, distance <dbl>,
       hour <dbl>, minute <dbl>, time_hour <dttm>
```

# library(tidyverse) filter(flights, month == 11 | month == 12)

```
## # A tibble: 55,403 x 19
                     day dep time sched dep time dep delay arr time sched arr time
##
       year month
##
      <int> <int> <int>
                            <int>
                                            <int>
                                                       <dbl>
                                                                <int>
                                                                                <int>
##
   1 2013
                                             2359
                                                                   352
                                                                                  345
               11
                       1
                                5
                                                           6
    2 2013
##
                11
                       1
                               35
                                             2250
                                                         105
                                                                   123
                                                                                 2356
##
    3 2013
                11
                       1
                              455
                                              500
                                                          -5
                                                                   641
                                                                                  651
##
   4 2013
                              539
                                              545
                                                          -6
                                                                  856
               11
                       1
                                                                                  827
##
   5 2013
               11
                       1
                              542
                                              545
                                                          -3
                                                                  831
                                                                                  855
   6 2013
                                                         -11
##
                              549
                                              600
                                                                  912
                                                                                  923
               11
                       1
##
    7 2013
               11
                       1
                              550
                                              600
                                                         -10
                                                                  705
                                                                                  659
##
   8 2013
               11
                       1
                              554
                                              600
                                                          -6
                                                                   659
                                                                                  701
##
   9 2013
               11
                              554
                                              600
                                                          -6
                                                                   826
                                                                                  827
## 10 2013
                                                                                  751
                              554
                                              600
                                                          -6
                                                                  749
               11
                       1
## # i 55,393 more rows
## # i 11 more variables: arr_delay <dbl>, carrier <chr>, flight <int>,
       tailnum <chr>, origin <chr>, dest <chr>, air_time <dbl>, distance <dbl>,
```

### nov\_dec <- filter(flights, month %in% c(11, 12))</pre>

hour <dbl>, minute <dbl>, time\_hour <dttm>

## #

```
library(tidyverse)
filter(flights, !(arr_delay > 120 | dep_delay > 120))
```

```
## # A tibble: 316,050 x 19
##
       year month
                     day dep_time sched_dep_time dep_delay arr_time sched_arr_time
##
                                                       <dbl>
      <int> <int> <int>
                            <int>
                                            <int>
                                                                <int>
                                                                                <int>
   1 2013
                                                           2
                1
                       1
                              517
                                              515
                                                                  830
                                                                                  819
    2 2013
##
                 1
                       1
                              533
                                              529
                                                           4
                                                                  850
                                                                                  830
##
    3 2013
                 1
                       1
                              542
                                              540
                                                           2
                                                                  923
                                                                                  850
##
   4 2013
                 1
                       1
                              544
                                              545
                                                          -1
                                                                 1004
                                                                                 1022
##
   5 2013
                       1
                              554
                                              600
                                                          -6
                                                                  812
                                                                                  837
                1
```

```
##
    6 2013
                              554
                                              558
                                                          -4
                                                                  740
                                                                                  728
                1
                       1
##
   7 2013
                       1
                              555
                                              600
                                                          -5
                                                                  913
                                                                                  854
                1
##
    8 2013
                       1
                              557
                                              600
                                                          -3
                                                                  709
                                                                                  723
   9 2013
##
                              557
                                              600
                                                          -3
                                                                  838
                                                                                  846
                1
                       1
## 10
       2013
                       1
                              558
                                              600
                                                          -2
                                                                  753
                                                                                  745
## # i 316,040 more rows
## # i 11 more variables: arr delay <dbl>, carrier <chr>, flight <int>,
       tailnum <chr>, origin <chr>, dest <chr>, air_time <dbl>, distance <dbl>,
## #
       hour <dbl>, minute <dbl>, time_hour <dttm>
```

#### filter(flights, arr\_delay <= 120, dep\_delay <= 120)</pre>

```
## # A tibble: 316,050 x 19
##
                     day dep_time sched_dep_time dep_delay arr_time sched_arr_time
       year month
##
      <int> <int> <int>
                            <int>
                                            <int>
                                                       dbl>
                                                                 <int>
##
   1 2013
                              517
                                               515
                                                           2
                                                                   830
                                                                                   819
                 1
                       1
##
    2 2013
                 1
                       1
                              533
                                               529
                                                           4
                                                                   850
                                                                                   830
   3 2013
                                                           2
##
                              542
                                               540
                                                                   923
                       1
                                                                                   850
                 1
   4 2013
                                                                                  1022
##
                 1
                       1
                              544
                                               545
                                                          -1
                                                                  1004
##
   5 2013
                              554
                                               600
                                                          -6
                                                                   812
                                                                                   837
                 1
                       1
##
    6 2013
                       1
                              554
                                               558
                                                          -4
                                                                                   728
                 1
                                                                   740
                                                          -5
##
   7 2013
                       1
                              555
                                               600
                                                                   913
                                                                                   854
                 1
   8 2013
                                                          -3
                                                                   709
                                                                                   723
                 1
                       1
                              557
                                               600
       2013
##
    9
                               557
                                               600
                                                          -3
                                                                   838
                                                                                   846
                 1
                       1
## 10
       2013
                 1
                       1
                               558
                                               600
                                                          -2
                                                                   753
                                                                                   745
## # i 316,040 more rows
## # i 11 more variables: arr_delay <dbl>, carrier <chr>, flight <int>,
## #
       tailnum <chr>, origin <chr>, dest <chr>, air_time <dbl>, distance <dbl>,
       hour <dbl>, minute <dbl>, time_hour <dttm>
```

### Arrange Rows with arrange()

```
library(tidyverse)
arrange(flights, year, month, day)
```

```
## # A tibble: 336,776 x 19
                     day dep_time sched_dep_time dep_delay arr_time sched_arr_time
##
       year month
##
      <int> <int> <int>
                             <int>
                                             <int>
                                                       <dbl>
                                                                 <int>
                                                                                 <int>
##
   1 2013
                 1
                       1
                               517
                                               515
                                                            2
                                                                   830
                                                                                   819
##
    2 2013
                       1
                               533
                                               529
                                                            4
                                                                   850
                                                                                   830
                 1
    3 2013
                                                            2
                                                                                   850
##
                 1
                       1
                               542
                                               540
                                                                   923
##
    4 2013
                       1
                               544
                                               545
                                                           -1
                                                                  1004
                                                                                  1022
                 1
##
    5 2013
                       1
                               554
                                               600
                                                           -6
                                                                   812
                                                                                   837
##
    6 2013
                                               558
                                                           -4
                                                                   740
                                                                                   728
                 1
                       1
                              554
##
    7
       2013
                 1
                       1
                               555
                                               600
                                                           -5
                                                                   913
                                                                                   854
    8 2013
##
                               557
                                               600
                                                           -3
                                                                   709
                                                                                   723
                 1
                       1
##
    9
       2013
                               557
                                               600
                                                           -3
                                                                   838
                                                                                   846
                 1
                       1
## 10 2013
                                                           -2
                                                                                   745
                 1
                       1
                               558
                                               600
                                                                   753
## # i 336,766 more rows
## # i 11 more variables: arr_delay <dbl>, carrier <chr>, flight <int>,
       tailnum <chr>, origin <chr>, dest <chr>, air_time <dbl>, distance <dbl>,
       hour <dbl>, minute <dbl>, time_hour <dttm>
## #
```

#### arrange(flights, desc(arr\_delay))

```
## # A tibble: 336,776 x 19
##
       year month
                    day dep_time sched_dep_time dep_delay arr_time sched_arr_time
##
      <int> <int> <int>
                           <int>
                                           <int>
                                                     <dbl>
                                                               <int>
   1 2013
##
                1
                      9
                             641
                                             900
                                                      1301
                                                                1242
                                                                               1530
##
    2 2013
                6
                     15
                            1432
                                            1935
                                                      1137
                                                                1607
                                                                               2120
##
    3 2013
                     10
                            1121
                                            1635
                                                      1126
                                                                1239
                                                                               1810
                1
##
   4 2013
                     20
                            1139
                                            1845
                                                      1014
                                                                1457
                                                                               2210
##
   5 2013
                7
                     22
                             845
                                                      1005
                                                                1044
                                                                               1815
                                            1600
   6 2013
##
                4
                     10
                            1100
                                            1900
                                                       960
                                                                1342
                                                                               2211
##
   7 2013
                3
                     17
                            2321
                                             810
                                                       911
                                                                135
                                                                               1020
##
  8 2013
                7
                     22
                            2257
                                             759
                                                       898
                                                                 121
                                                                               1026
## 9 2013
                      5
                                                       896
                                                                               2020
               12
                             756
                                            1700
                                                                1058
## 10 2013
                5
                      3
                            1133
                                            2055
                                                       878
                                                                1250
                                                                               2215
## # i 336,766 more rows
## # i 11 more variables: arr_delay <dbl>, carrier <chr>, flight <int>,
       tailnum <chr>, origin <chr>, dest <chr>, air_time <dbl>, distance <dbl>,
## #
       hour <dbl>, minute <dbl>, time_hour <dttm>
```

### Select Columns with select()

```
library(tidyverse)
select(flights, year, month, day)
```

```
## # A tibble: 336,776 x 3
##
      year month
##
      <int> <int> <int>
##
   1 2013
               1
   2 2013
##
               1
                      1
   3 2013
##
                1
                      1
##
   4 2013
                      1
               1
##
   5 2013
##
   6 2013
                     1
               1
##
   7 2013
               1
##
  8 2013
               1
                     1
##
  9 2013
## 10 2013
               1
                      1
## # i 336,766 more rows
```

# library(tidyverse) select(flights, year:day)

```
## # A tibble: 336,776 x 3
##
       year month
                    day
      <int> <int> <int>
##
##
   1 2013
                1
   2 2013
##
                1
                      1
   3 2013
                1
   4 2013
##
                1
```

```
##
    5 2013
                1
##
    6 2013
                       1
                1
##
   7 2013
   8 2013
##
                       1
                1
##
   9
       2013
                1
                       1
## 10 2013
                1
                       1
## # i 336,766 more rows
```

# library(tidyverse) select(flights, -(year:day))

## # A tibble: 336,776 x 16

```
##
      dep_time sched_dep_time dep_delay arr_time sched_arr_time arr_delay carrier
##
         <int>
                         <int>
                                    <dbl>
                                             <int>
                                                              <int>
                                                                         <dbl> <chr>
##
   1
           517
                           515
                                        2
                                                830
                                                                819
                                                                           11 UA
##
                                                                830
                                                                            20 UA
    2
           533
                           529
                                        4
                                                850
##
    3
           542
                           540
                                        2
                                                923
                                                                850
                                                                            33 AA
                                                                           -18 B6
##
   4
           544
                           545
                                       -1
                                               1004
                                                               1022
##
   5
                           600
                                       -6
                                                812
                                                                837
                                                                           -25 DL
           554
                                                                728
##
   6
           554
                           558
                                       -4
                                                740
                                                                           12 UA
##
    7
           555
                           600
                                       -5
                                                                854
                                                                           19 B6
                                                913
##
   8
           557
                           600
                                       -3
                                                709
                                                                723
                                                                           -14 EV
##
   9
                           600
                                       -3
                                                838
                                                                            -8 B6
           557
                                                                846
## 10
           558
                           600
                                       -2
                                                753
                                                                745
                                                                             8 AA
## # i 336,766 more rows
## # i 9 more variables: flight <int>, tailnum <chr>, origin <chr>, dest <chr>,
       air_time <dbl>, distance <dbl>, hour <dbl>, minute <dbl>, time_hour <dttm>
```

#### select(flights, time\_hour, air\_time, everything())

```
## # A tibble: 336,776 x 19
##
      time_hour
                                                   day dep_time sched_dep_time
                           air_time year month
##
      <dttm>
                              <dbl> <int> <int> <int>
                                                           <int>
                                                                          <int>
##
   1 2013-01-01 05:00:00
                                227
                                     2013
                                                                            515
                                               1
                                                     1
                                                             517
   2 2013-01-01 05:00:00
                                227
                                     2013
                                               1
                                                     1
                                                             533
                                                                            529
   3 2013-01-01 05:00:00
##
                                160
                                     2013
                                               1
                                                     1
                                                             542
                                                                            540
    4 2013-01-01 05:00:00
                                183
                                     2013
                                               1
                                                     1
                                                             544
                                                                            545
## 5 2013-01-01 06:00:00
                                     2013
                                116
                                               1
                                                     1
                                                            554
                                                                            600
  6 2013-01-01 05:00:00
                                150
                                     2013
                                               1
                                                     1
                                                            554
                                                                            558
## 7 2013-01-01 06:00:00
                                158
                                     2013
                                                                            600
                                               1
                                                     1
                                                            555
   8 2013-01-01 06:00:00
                                 53
                                     2013
                                               1
                                                     1
                                                            557
                                                                            600
## 9 2013-01-01 06:00:00
                                140
                                     2013
                                               1
                                                     1
                                                            557
                                                                            600
## 10 2013-01-01 06:00:00
                                138
                                     2013
                                               1
                                                     1
                                                            558
                                                                            600
## # i 336,766 more rows
## # i 12 more variables: dep_delay <dbl>, arr_time <int>, sched_arr_time <int>,
       arr delay <dbl>, carrier <chr>, flight <int>, tailnum <chr>, origin <chr>,
## #
       dest <chr>, distance <dbl>, hour <dbl>, minute <dbl>
```

```
library(tidyverse)
select(flights, contains("TIME"))
```

## # A tibble: 336,776 x 6

```
##
      dep_time sched_dep_time arr_time sched_arr_time air_time time_hour
##
         <int>
                          <int>
                                   <int>
                                                   <int>
                                                             <dbl> <dttm>
                                                               227 2013-01-01 05:00:00
##
    1
           517
                            515
                                     830
                                                     819
           533
                            529
##
    2
                                     850
                                                     830
                                                               227 2013-01-01 05:00:00
##
    3
           542
                            540
                                     923
                                                     850
                                                               160 2013-01-01 05:00:00
    4
                                                               183 2013-01-01 05:00:00
##
                            545
                                    1004
                                                     1022
           544
    5
##
           554
                            600
                                     812
                                                     837
                                                               116 2013-01-01 06:00:00
                                     740
##
    6
           554
                            558
                                                     728
                                                               150 2013-01-01 05:00:00
##
    7
           555
                            600
                                     913
                                                     854
                                                               158 2013-01-01 06:00:00
##
    8
           557
                            600
                                     709
                                                     723
                                                                53 2013-01-01 06:00:00
##
    9
           557
                            600
                                     838
                                                     846
                                                               140 2013-01-01 06:00:00
           558
                            600
                                     753
                                                     745
                                                               138 2013-01-01 06:00:00
## 10
## # i 336,766 more rows
```

change the name of column with rename()

library(tidyverse)

```
rename(flights, tail_num = tailnum)
## # A tibble: 336,776 x 19
##
                      day dep_time sched_dep_time dep_delay arr_time sched_arr_time
        year month
##
       <int> <int>
                    <int>
                              <int>
                                               <int>
                                                          <dbl>
                                                                    <int>
                                                                                    <int>
##
    1 2013
                        1
                                517
                                                 515
                                                              2
                                                                      830
                                                                                       819
                  1
##
    2 2013
                        1
                                533
                                                 529
                                                              4
                                                                      850
                                                                                       830
##
    3 2013
                        1
                                542
                                                              2
                                                                      923
                                                                                       850
                                                 540
                  1
##
    4
       2013
                        1
                                                 545
                                                             -1
                                                                     1004
                                                                                      1022
                  1
                                544
##
    5 2013
                                                             -6
                  1
                        1
                                554
                                                 600
                                                                      812
                                                                                       837
##
    6 2013
                  1
                        1
                                554
                                                 558
                                                             -4
                                                                      740
                                                                                       728
##
    7 2013
                                                 600
                                                             -5
                                                                      913
                                                                                       854
                  1
                        1
                                555
##
    8
       2013
                  1
                        1
                                557
                                                 600
                                                             -3
                                                                      709
                                                                                       723
##
    9
       2013
                                557
                                                 600
                                                             -3
                                                                      838
                  1
                        1
                                                                                       846
       2013
                                                             -2
## 10
                  1
                        1
                                558
                                                 600
                                                                      753
                                                                                       745
```

## # i 11 more variables: arr\_delay <dbl>, carrier <chr>, flight <int>,

## # tail\_num <chr>, origin <chr>, dest <chr>, air\_time <dbl>, distance <dbl>,

## # hour <dbl>, minute <dbl>, time\_hour <dttm>

## Add New Variables with mutate()

## # i 336,766 more rows

```
library(tidyverse)
flights_sml <- select(flights, year:day, ends_with("delay"), distance, air_time)</pre>
```

```
library(tidyverse)
mutate(flights_sml, gain = arr_delay - dep_delay, speed = distance / air_time * 60)
```

```
## # A tibble: 336,776 x 9
##
       year month
                    day dep_delay arr_delay distance air_time
                                                                 gain speed
                                                           <dbl> <dbl> <dbl>
      <int> <int> <int>
                             <dbl>
                                        <dbl>
                                                 <dbl>
    1 2013
                                                  1400
##
                1
                                           11
                                                            227
                                                                     9 370.
                       1
```

```
##
    3 2013
                       1
                                 2
                                           33
                                                  1089
                                                            160
                                                                    31
                                                                       408.
                 1
    4 2013
##
                       1
                                -1
                                          -18
                                                  1576
                                                            183
                                                                   -17
                                                                        517.
   5 2013
                                          -25
                                                                        394.
##
                       1
                                -6
                                                   762
                                                            116
                                                                   -19
                 1
##
    6 2013
                 1
                       1
                                -4
                                           12
                                                   719
                                                            150
                                                                    16
                                                                        288.
##
    7 2013
                       1
                                -5
                                           19
                                                  1065
                                                            158
                                                                    24 404.
                 1
##
    8 2013
                       1
                                -3
                                          -14
                                                   229
                                                                   -11 259.
                 1
                                                             53
                                                                    -5 405.
## 9 2013
                                           -8
                                                   944
                 1
                       1
                                -3
                                                            140
## 10 2013
                       1
                                -2
                                            8
                                                   733
                                                            138
                                                                    10 319.
## # i 336,766 more rows
library(tidyverse)
mutate(flights_sml, gain = arr_delay - dep_delay, hours = air_time / 60, gain_per_hour = gain / hours)
## # A tibble: 336,776 x 10
##
       year month
                     day dep_delay arr_delay distance air_time gain hours
##
      <int> <int> <int>
                             <dbl>
                                        <dbl>
                                                 <dbl>
                                                          <dbl> <dbl> <dbl>
##
    1 2013
                                           11
                                                  1400
                                                            227
                                                                     9 3.78
                 1
                       1
                                 2
    2 2013
                                                                    16 3.78
                                 4
                                           20
                                                  1416
                                                            227
##
                       1
                 1
##
    3 2013
                                 2
                                           33
                                                  1089
                                                            160
                                                                    31 2.67
                 1
                       1
##
   4 2013
                 1
                       1
                                -1
                                          -18
                                                  1576
                                                            183
                                                                   -17 3.05
##
   5 2013
                       1
                                -6
                                          -25
                                                   762
                                                            116
                                                                   -19 1.93
                 1
## 6 2013
                                                                    16 2.5
                                -4
                                           12
                                                   719
                                                            150
                 1
                       1
##
    7 2013
                                -5
                                                  1065
                                                            158
                                                                    24 2.63
                 1
                       1
                                           19
##
   8 2013
                                -3
                                          -14
                                                   229
                                                             53
                                                                   -11 0.883
                 1
                       1
   9 2013
##
                 1
                       1
                                -3
                                           -8
                                                   944
                                                            140
                                                                    -5 2.33
## 10 2013
                                -2
                                            8
                                                   733
                                                            138
                                                                    10 2.3
## # i 336,766 more rows
## # i 1 more variable: gain_per_hour <dbl>
library(tidyverse)
transmute(flights, gain = arr_delay - dep_delay, hours = air_time / 60, gain_per_hour = gain / hours)
## # A tibble: 336,776 x 3
##
       gain hours gain_per_hour
      <dbl> <dbl>
##
                           <dbl>
##
    1
          9 3.78
                            2.38
##
    2
         16 3.78
                            4.23
##
    3
         31 2.67
                           11.6
        -17 3.05
##
    4
                           -5.57
##
        -19 1.93
                           -9.83
    5
##
    6
         16 2.5
                            6.4
##
    7
         24 2.63
                            9.11
##
    8
        -11 0.883
                          -12.5
         -5 2.33
    9
                           -2.14
##
```

20

1416

4

227

16 374.

#### Grouped Summaries with summarize()

4.35

## 10

10 2.3

## # i 336,766 more rows

2 2013

##

```
library(tidyverse)
summarize(flights, delay = mean(dep_delay, na.rm = TRUE))
## # A tibble: 1 x 1
```

## delay ## <dbl> ## 1 12.6

summarize() is not terribly useful unless we pair it with group\_by().

```
library(tidyverse)
by_day<- group_by(flights, year, month, day)
summarize(by_day, delay = mean(dep_delay, na.rm = TRUE))</pre>
```

```
## # A tibble: 365 x 4
## # Groups:
           year, month [12]
##
     year month day delay
    <int> <int> <int> <dbl>
##
  1 2013
           1
                 1 11.5
          1
##
  2 2013
                 2 13.9
## 3 2013 1
               3 11.0
## 4 2013 1
                4 8.95
## 5 2013 1
                5 5.73
## 6 2013 1 6 7.15
## 7 2013
           1 7 5.42
## 8 2013 1 8 2.55
## 9 2013
                9 2.28
            1
## 10 2013
            1
                10 2.84
## # i 355 more rows
```