## WK5 925

Zichun Liu 9/25/2017

#### Why dplyr

- 1. Easier to read and write
- 2. More efficient

```
# compare efficiency
microbenchmark(
  filter(flights, month == 1, day == 1),
  subset(flights, subset = month == 1 & day == 1)
)
  Unit: milliseconds
##
##
                                                expr
                                                           min
                                                                      lq
##
              filter(flights, month == 1, day == 1)
                                                     4.941193 7.797154
##
    subset(flights, subset = month == 1 & day == 1) 10.477060 15.873613
##
                median
                                      max neval cld
         mean
                              uq
##
     8.896212 8.56473 9.741162 16.92796
                                             100
   19.091702 18.79468 21.096396 65.77061
                                             100
```

### %>% Operator

Although not required, the dplyr packages make use of the pipe operator %>% developed by Stefan Milton Bache in the R package magrittr. Although all the functions in dplyr can be used without the pipe operator, one of the great conveniences these packages provide is the ability to string multiple functions together by incorporating %>%.

This operator will forward a value, or the result of an expression, into the next function call/expression. For instance a function to filter data can be written as:

```
filter(data, variable == numeric_value)
data %>% filter(variable == numeric_value)
```

Both functions complete the same task and the benefit of using %>% is not evident; however, when you desire to perform multiple functions its advantage becomes obvious. For instance, if we want to filter some data, summarize it, and then order the summarized results we would write it out as:

```
#Nested Option:
arrange(summarize(filter(data, variable == numeric_value), Total = sum(variable)), desc(Total))
#or
#Multiple Object Option:
a = filter(data, variable == numeric_value)
b = summarise(a, Total = sum(variable))
c = arrange(b, desc(Total))
#or
#%>% Option:
data %>%
```

```
filter(variable == "value") %>%
summarise(Total = sum(variable)) %>%
arrange(desc(Total))
```

As your function tasks get longer the %>% operator becomes more efficient and makes your code more legible. In addition, although not covered in this tutorial, the %>% operator allows you to flow from data manipulation tasks straight into vizualization functions (via ggplot and ggvis) and also into many analytic functions.

#### dplyr functions

```
select() # select columns # Reduce dataframe size to only desired variables for current task
filter() # select rows # Reduce rows/observations with matching conditions
group_by() # Group data by categorical variables
summarise() #Perform summary statistics on variables
arrange() # Order variable values
XXX_join() # Join two datasets together
mutate() # Creates new variables
#select
flights %>%
  select(month, day, carrier, distance)
## # A tibble: 336,776 \times 4
##
      month
              day carrier distance
##
      <int> <int>
                     <chr>
                              <dbl>
## 1
                               1400
          1
                1
                        UA
## 2
                               1416
          1
                 1
                        UA
## 3
          1
                               1089
                 1
                        AA
## 4
          1
                1
                        B6
                               1576
## 5
          1
                1
                        DL
                                762
## 6
          1
                1
                        UA
                                719
## 7
          1
                 1
                        B6
                               1065
## 8
                        ΕV
                                 229
          1
                 1
## 9
                        B6
                                 944
## 10
                                733
          1
                 1
                        AA
## # ... with 336,766 more rows
# filter
flights %>%
  select(month, day, carrier, distance) %>%
  filter(month == 1, day == 1)
## # A tibble: 842 × 4
##
      month
              day carrier distance
##
      <int> <int>
                     <chr>
                              <dbl>
## 1
                               1400
          1
                 1
                        UA
## 2
          1
                 1
                        UA
                               1416
## 3
                               1089
          1
                 1
                        AA
```

```
## 4
          1
                1
                        B6
                               1576
## 5
          1
                1
                        DL
                                762
## 6
          1
                        UA
                                719
## 7
                               1065
          1
                        B6
                1
## 8
          1
                 1
                        EV
                                 229
## 9
                        B6
                                944
          1
                 1
## 10
          1
                 1
                                733
                        AA
## # ... with 832 more rows
# summarise and group_by
flights %>%
  select(month, day, carrier, distance) %>%
  filter(month == 1, day == 1) %>%
  group_by(carrier) %>%
  summarise(meandistance = mean(distance))
## # A tibble: 14 × 2
##
      carrier meandistance
##
        <chr>
                      <dbl>
## 1
           9E
                  520.3571
## 2
           AA
                  1337.7128
## 3
           AS
                 2402.0000
## 4
           В6
                 1106.2025
## 5
           DL
                  1222.0357
## 6
           ΕV
                  491.4569
## 7
           F9
                  1620.0000
## 8
           FL
                  686.6000
## 9
           HA
                  4983.0000
## 10
           MQ
                  577.0000
## 11
           UA
                  1496.4909
## 12
           US
                  833.1562
## 13
           VX
                  2502.3333
## 14
           WN
                   895.7037
#arrange
flights %>%
  select(month, day, carrier, distance) %>%
  filter(month == 1, day == 1) %>%
  group_by(carrier) %>%
  summarise(meandistance = mean(distance)) %>%
  arrange(desc(meandistance))
## # A tibble: 14 × 2
##
      carrier meandistance
##
        <chr>
                      <dbl>
## 1
           HA
                  4983.0000
## 2
           VX
                 2502.3333
## 3
           AS
                 2402.0000
## 4
           F9
                  1620.0000
## 5
           UA
                  1496.4909
## 6
           AA
                  1337.7128
## 7
           DL
                  1222.0357
## 8
           В6
                  1106.2025
## 9
           WN
                  895.7037
## 10
           US
                   833.1562
## 11
           FL
                   686.6000
```

```
## 12
           MQ
                   577.0000
## 13
                   520.3571
           9E
## 14
           ΕV
                   491.4569
# mutate()
flights %>%
  select(month, day, carrier, distance) %>%
  filter(month == 1, day == 1) %>%
  group by(carrier) %>%
  summarise(meandistance = mean(distance), N = n()) %>%
  arrange(desc(meandistance)) %>%
  mutate(totaldistance = meandistance * N)
## # A tibble: 14 × 4
##
      carrier meandistance
                                N totaldistance
##
        <chr>
                      <dbl> <int>
                                           <dbl>
## 1
                                            4983
           HA
                 4983.0000
                                1
## 2
           VX
                 2502.3333
                               12
                                           30028
## 3
                                2
           AS
                 2402.0000
                                            4804
## 4
           F9
                 1620.0000
                                2
                                            3240
## 5
           UA
                 1496.4909
                              165
                                          246921
## 6
           AA
                 1337.7128
                               94
                                          125745
## 7
           DL
                 1222.0357
                              112
                                          136868
## 8
           B6
                 1106.2025
                              163
                                          180311
## 9
           WN
                  895.7037
                               27
                                           24184
## 10
           US
                   833.1562
                               32
                                           26661
## 11
           FL
                   686.6000
                               10
                                            6866
## 12
           MQ
                   577.0000
                               78
                                           45006
## 13
           9E
                   520.3571
                               28
                                           14570
## 14
           EV
                   491.4569
                              116
                                           57009
(flight_1 = flights %>%
  select(month, day, carrier, distance) %>%
  filter(month == 1, day == 1) %>%
  group_by(carrier) %>%
  summarise(meandistance = mean(distance), N = n()) %>%
  arrange(desc(meandistance)) %>%
  mutate(totaldistance = meandistance * N))
## # A tibble: 14 × 4
##
      carrier meandistance
                                N totaldistance
##
        <chr>
                      <dbl> <int>
                                           <dbl>
## 1
           HA
                  4983.0000
                                            4983
                                1
## 2
           VX
                  2502.3333
                               12
                                           30028
## 3
           AS
                 2402.0000
                                2
                                            4804
## 4
           F9
                  1620.0000
                                2
                                            3240
## 5
           UA
                 1496.4909
                              165
                                          246921
## 6
                 1337.7128
                               94
                                          125745
           AA
## 7
           DL
                  1222.0357
                              112
                                          136868
## 8
           В6
                  1106.2025
                              163
                                          180311
## 9
           WN
                  895.7037
                               27
                                           24184
## 10
           US
                   833.1562
                               32
                                           26661
## 11
                   686.6000
           FL
                               10
                                           6866
## 12
           MQ
                   577.0000
                               78
                                           45006
## 13
           9E
                   520.3571
                               28
                                           14570
```

57009

## 14

EV

491.4569

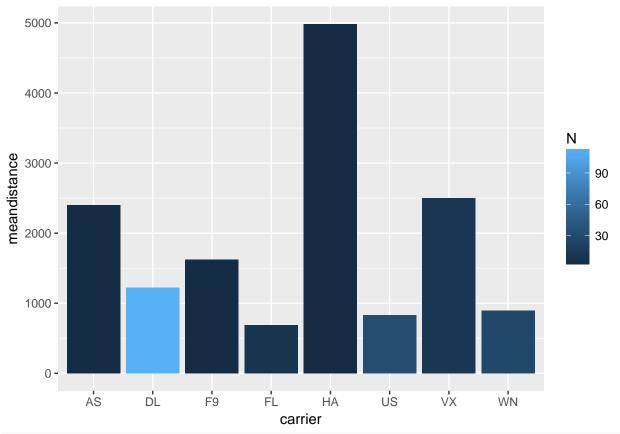
116

```
(flight_2 = flights %>%
  select(month, day, carrier, air_time) %>%
  filter(month == 1, day == 1) %>%
  group_by(carrier) %>%
  summarise(meantime = mean(air_time), N1 = n()) %>%
  arrange(meantime) %>% na.omit())
## # A tibble: 8 × 3
##
     carrier meantime
                          N1
##
       <chr>
                <dbl> <int>
## 1
          FL 120.5000
                          10
## 2
          US 139.6250
## 3
          WN 162.8148
                          27
## 4
          DL 184.7768
                         112
## 5
                           2
          F9 249.5000
## 6
          AS 337.0000
                           2
## 7
          VX 353.6667
                          12
## 8
          HA 659.0000
                           1
inner_join(flight_1, flight_2, by = "carrier")
## # A tibble: 8 × 6
                                                            N1
##
     carrier meandistance
                               N totaldistance meantime
##
       <chr>>
                    <dbl> <int>
                                         <dbl>
                                                   <dbl> <int>
## 1
          HA
                4983.0000
                                          4983 659.0000
                               1
                                                             1
## 2
          VX
                2502.3333
                              12
                                         30028 353.6667
## 3
          AS
                2402.0000
                               2
                                          4804 337.0000
                                                             2
## 4
          F9
                1620.0000
                               2
                                          3240 249.5000
                                                             2
## 5
          DL
                1222.0357
                             112
                                        136868 184.7768
                                                           112
## 6
                 895.7037
                                         24184 162.8148
          WN
                              27
                                                            27
## 7
          US
                 833.1562
                              32
                                         26661 139.6250
                                                            32
## 8
          FL
                 686.6000
                              10
                                          6866 120.5000
                                                            10
left_join(flight_1, flight_2, by = "carrier")
## # A tibble: 14 × 6
##
      carrier meandistance
                                N totaldistance meantime
                                                             N1
##
        <chr>
                      <dbl> <int>
                                         <dbl>
                                                    <dbl> <int>
## 1
                                           4983 659.0000
           HA
                 4983.0000
                                1
                                                              1
## 2
           VX
                 2502.3333
                               12
                                         30028 353.6667
                                                             12
## 3
           AS
                 2402.0000
                                2
                                           4804 337.0000
                                                              2
## 4
           F9
                 1620.0000
                                2
                                           3240 249.5000
                                                              2
## 5
           UA
                 1496.4909
                              165
                                         246921
                                                             NA
                                                       NA
## 6
           AA
                 1337.7128
                               94
                                         125745
                                                       NA
                                                             NA
## 7
           DL
                                         136868 184.7768
                 1222.0357
                              112
                                                            112
## 8
           B6
                 1106.2025
                              163
                                         180311
                                                       NA
                                                             NΑ
## 9
           WN
                  895.7037
                               27
                                          24184 162.8148
                                                             27
## 10
           US
                  833.1562
                               32
                                          26661 139.6250
                                                             32
## 11
                                           6866 120.5000
           FL
                  686.6000
                               10
                                                             10
## 12
           MQ
                  577.0000
                               78
                                          45006
                                                       NA
                                                             NA
## 13
           9E
                  520.3571
                               28
                                           14570
                                                       NA
                                                             NA
                  491.4569
## 14
           ΕV
                              116
                                          57009
                                                       NA
                                                             NA
full_join(flight_1, flight_2, by = "carrier")
```

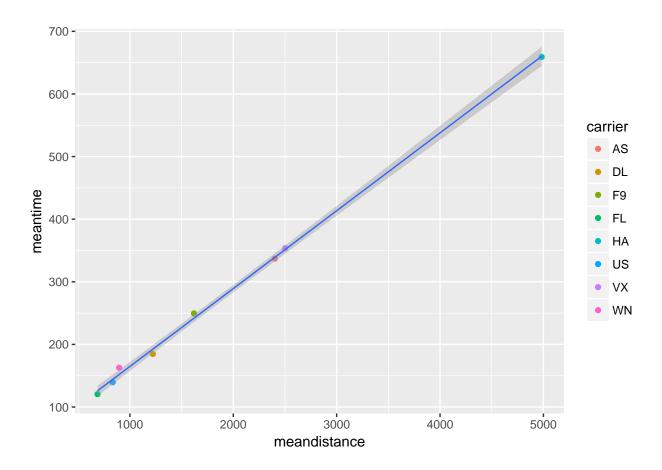
## # A tibble: 14  $\times$  6

```
##
      carrier meandistance
                                N totaldistance meantime
##
        <chr>>
                      <dbl> <int>
                                           <dbl>
                                                    <dbl> <int>
                                           4983 659.0000
## 1
           HA
                  4983.0000
                               1
## 2
           VX
                 2502.3333
                               12
                                          30028 353.6667
                                                              12
                                2
## 3
           AS
                 2402.0000
                                            4804 337.0000
                                                               2
## 4
           F9
                 1620.0000
                                2
                                            3240 249.5000
                                                               2
## 5
           UA
                 1496.4909
                              165
                                          246921
                                                              NA
                                                       NA
                 1337.7128
                                          125745
## 6
           AA
                               94
                                                       NA
                                                              NA
## 7
           DL
                 1222.0357
                              112
                                          136868 184.7768
                                                             112
## 8
           В6
                              163
                 1106.2025
                                          180311
                                                       NA
                                                             NA
## 9
           WN
                  895.7037
                               27
                                           24184 162.8148
                                                              27
           US
                                           26661 139.6250
## 10
                  833.1562
                               32
                                                              32
                                            6866 120.5000
## 11
           FL
                  686.6000
                               10
                                                              10
## 12
           MQ
                  577.0000
                               78
                                           45006
                                                       NA
                                                              NA
## 13
           9E
                  520.3571
                               28
                                           14570
                                                       NA
                                                              NA
## 14
           ΕV
                  491.4569
                              116
                                           57009
                                                       NA
                                                              NA
semi_join(flight_1, flight_2, by = "carrier")
## # A tibble: 8 × 4
                               N totaldistance
     carrier meandistance
##
       <chr>>
                     <dbl> <int>
                                          <dbl>
## 1
          FL
                  686.6000
                              10
                                           6866
## 2
          US
                 833.1562
                              32
                                          26661
## 3
          WN
                 895.7037
                              27
                                         24184
## 4
                                         136868
          DL
                1222.0357
                             112
## 5
          F9
                1620.0000
                               2
                                           3240
## 6
          AS
                2402.0000
                               2
                                           4804
## 7
          VX
                2502.3333
                              12
                                          30028
## 8
          HA
                4983.0000
                               1
                                           4983
anti_join(flight_1, flight_2, by = "carrier")
## # A tibble: 6 × 4
##
     carrier meandistance
                               N totaldistance
##
       <chr>>
                     <dbl> <int>
                                          <dbl>
## 1
          ΕV
                 491.4569
                             116
                                          57009
                 520.3571
## 2
          9E
                              28
                                          14570
## 3
          MQ
                 577.0000
                              78
                                          45006
## 4
          В6
                1106.2025
                             163
                                         180311
## 5
          AA
                1337.7128
                              94
                                         125745
## 6
          UA
                1496.4909
                             165
                                         246921
library(ggplot2)
inner_join(flight_1, flight_2, by = "carrier") %>%
 ggplot() +
```

geom\_bar(aes(x = carrier, y = meandistance, fill = N), stat = "identity")



```
inner_join(flight_1, flight_2, by = "carrier") %>%
   ggplot() +
   geom_point(aes(x = meandistance, y = meantime, col = carrier)) +
   geom_smooth(aes(x = meandistance, y = meantime), method = "lm", lwd = 0.5)
```



# End