tidyverse and data.table

```
library(pacman)
p_load(nycflights13, tidyverse)
```

Tidyverse: dplyr and tidyr

dplyr

1. filter

name

Filter (i.e. subset) rows based on their values.

```
starwars %>%
 filter(
    species == "Human",
   height >= 190
   )
## # A tibble: 4 x 14
    name
              height mass hair_color skin_color eye_color birth_year sex
##
                                                                           gender
    <chr>
              <int> <dbl> <chr>
                                      <chr> <chr>
                                                              <dbl> <chr> <chr>
## 1 Darth Va~
                 202 136 none
                                      white
                                                yellow
                                                                41.9 male mascu~
## 2 Qui-Gon ~
                 193
                        89 brown
                                      fair
                                               blue
                                                                     male mascu~
## 3 Dooku
                 193
                        80 white
                                                               102
                                     fair
                                                brown
                                                                     male mascu~
## 4 Bail Pre~
                 191
                        NA black
                                                brown
                                      tan
                                                                67
                                                                     male mascu~
## # ... with 5 more variables: homeworld <chr>, species <chr>, films <list>,
## # vehicles <list>, starships <list>
starwars %>%
 filter(grepl("Skywalker", name))
## # A tibble: 3 x 14
##
             height mass hair_color skin_color eye_color birth_year sex
    name
                                                                           gender
##
    <chr>
              <int> <dbl> <chr>
                                     <chr>
                                                <chr>
                                                              <dbl> <chr>
                                                                           <chr>
## 1 Luke Sk~
                172
                       77 blond
                                     fair
                                                blue
                                                               19
                                                                    male
## 2 Anakin ~
                188
                       84 blond
                                                               41.9 male
                                     fair
                                                blue
                                                                           mascu~
## 3 Shmi Sk~
                163
                       NA black
                                     fair
                                                brown
                                                               72
                                                                    female femin~
## # ... with 5 more variables: homeworld <chr>, species <chr>, films <list>,
## # vehicles <list>, starships <list>
starwars %>%
 filter(is.na(height))
## # A tibble: 6 x 14
```

height mass hair_color skin_color eye_color birth_year sex

gender

```
<chr>>
               <int> <dbl> <chr>
                                       <chr>
                                                   <chr>>
                                                                   <dbl> <chr>
                                                                                <chr>
                                                   brown
## 1 Arvel C~
                                                                      NA male
                  NA
                         NA brown
                                       fair
                                                                                mascu~
## 2 Finn
                  NA
                         NA black
                                       dark
                                                   dark
                                                                      NA male
                                                                                mascu~
## 3 Rey
                  NA
                         NA brown
                                       light
                                                                      NA female femin~
                                                   hazel
## 4 Poe Dam~
                  NA
                         NA brown
                                       light
                                                   brown
                                                                      NA male
                                                                                mascu~
## 5 BB8
                  NA
                         NA none
                                       none
                                                   black
                                                                      NA none
                                                                                mascu~
                         NA unknown
## 6 Captain~
                  NA
                                       unknown
                                                   unknown
                                                                      NA <NA>
                                                                                 <NA>
## # ... with 5 more variables: homeworld <chr>, species <chr>, films <list>,
     vehicles <list>, starships <list>
```

```
starwars %>%
filter(!is.na(height))
```

```
## # A tibble: 81 x 14
##
              height mass hair_color
                                        skin_color eye_color birth_year sex
      name
                                                                   <dbl> <chr> <chr>
##
      <chr>
               <int> <dbl> <chr>
                                        <chr>>
                                                   <chr>
   1 Luke S~
                        77 blond
##
                 172
                                        fair
                                                   blue
                                                                   19
                                                                         male
                                                                               mascu~
##
   2 C-3P0
                 167
                        75 <NA>
                                                   yellow
                                                                   112
                                        gold
                                                                         none
                                                                               mascu~
## 3 R2-D2
                  96
                        32 <NA>
                                        white, bl~ red
                                                                   33
                                                                         none
                                                                               mascu~
## 4 Darth ~
                 202
                       136 none
                                                                   41.9 male mascu~
                                        white
                                                   yellow
## 5 Leia 0~
                 150
                        49 brown
                                                                         fema~ femin~
                                        light
                                                   brown
                                                                   19
## 6 Owen L~
                       120 brown, grey light
                 178
                                                   blue
                                                                   52
                                                                        male mascu~
## 7 Beru W~
                 165
                        75 brown
                                                   blue
                                                                   47
                                                                        fema~ femin~
                                        light
## 8 R5-D4
                        32 <NA>
                  97
                                        white, red red
                                                                   NA
                                                                        none mascu~
## 9 Biggs ~
                 183
                        84 black
                                                                   24
                                                                        male mascu~
                                        light
                                                   brown
                 182
                                                   blue-gray
## 10 Obi-Wa~
                        77 auburn, wh~ fair
                                                                   57
                                                                        male mascu~
## # ... with 71 more rows, and 5 more variables: homeworld <chr>, species <chr>,
     films <list>, vehicles <list>, starships <list>
```

2. arrange

Arrange (i.e. reorder) rows based on their values.

```
starwars %>%
arrange(birth_year)
```

```
## # A tibble: 87 x 14
##
               height mass hair_color skin_color eye_color birth_year sex
                                                                              gender
##
      <chr>
                <int> <dbl> <chr>
                                                   <chr>
                                       <chr>>
                                                                  <dbl> <chr> <chr>
##
  1 Wicket ~
                   88 20
                            brown
                                       brown
                                                   brown
                                                                    8
                                                                        male
                                                                              mascu~
## 2 IG-88
                  200 140
                                       metal
                                                   red
                                                                   15
                            none
                                                                        none
                                                                              mascu~
## 3 Luke Sk~
                  172 77
                            blond
                                       fair
                                                   blue
                                                                   19
                                                                        male
                                                                              mascu~
## 4 Leia Or~
                  150 49
                            brown
                                       light
                                                   brown
                                                                   19
                                                                        fema~ femin~
## 5 Wedge A~
                  170 77
                            brown
                                       fair
                                                   hazel
                                                                   21
                                                                        male
                                                                              mascu~
## 6 Plo Koon
                  188 80
                            none
                                       orange
                                                   black
                                                                   22
                                                                        male
                                                                              mascu~
## 7 Biggs D~
                  183 84
                            black
                                       light
                                                   brown
                                                                   24
                                                                        male
                                                                              mascu~
## 8 Han Solo
                  180 80
                                                                   29
                                                                        male
                            brown
                                       fair
                                                   brown
                                                                              mascu~
## 9 Lando C~
                  177 79
                            black
                                       dark
                                                   brown
                                                                   31
                                                                        male
                                                                              mascu~
## 10 Boba Fe~
                  183 78.2 black
                                       fair
                                                   brown
                                                                   31.5 male mascu~
## # ... with 77 more rows, and 5 more variables: homeworld <chr>, species <chr>,
      films <list>, vehicles <list>, starships <list>
```

```
starwars %>%
arrange(desc(birth_year))
```

```
## # A tibble: 87 x 14
##
      name
              height mass hair_color skin_color
                                                   eye_color birth_year sex
                                                                                gender
##
      <chr>
               <int> <dbl> <chr>
                                       <chr>
                                                    <chr>
                                                                   <dbl> <chr> <chr>
##
   1 Yoda
                                                                     896 male
                  66
                         17 white
                                       green
                                                   brown
                                                                               mascu~
##
   2 Jabba ~
                 175
                      1358 <NA>
                                                                     600 herm~ mascu~
                                       green-tan,~ orange
   3 Chewba~
##
                 228
                       112 brown
                                       unknown
                                                   blue
                                                                     200 male
                                                                               mascu~
##
   4 C-3P0
                 167
                        75 <NA>
                                       gold
                                                   yellow
                                                                     112 none
                                                                               mascu~
##
  5 Dooku
                 193
                        80 white
                                       fair
                                                   brown
                                                                     102 male
                                                                               mascu~
  6 Qui-Go~
##
                 193
                        89 brown
                                                                      92 male
                                       fair
                                                   blue
                                                                               mascu~
##
   7 Ki-Adi~
                 198
                        82 white
                                       pale
                                                   yellow
                                                                      92 male
                                                                               mascu~
## 8 Finis ~
                 170
                        NA blond
                                                                      91 male
                                       fair
                                                   blue
                                                                               mascu~
## 9 Palpat~
                 170
                        75 grey
                                       pale
                                                   vellow
                                                                      82 male
                                                                               mascu~
## 10 Cliegg~
                 183
                        NA brown
                                       fair
                                                   blue
                                                                      82 male
                                                                               mascu~
## # ... with 77 more rows, and 5 more variables: homeworld <chr>, species <chr>,
     films <list>, vehicles <list>, starships <list>
```

3. select

Select (i.e. subset) columns by their names:

```
starwars %>%
  select(name:skin_color, species, -height)
## # A tibble: 87 x 5
                           mass hair color
##
      name
                                               skin color
                                                           species
##
                                                           <chr>
      <chr>
                          <dbl> <chr>
                                               <chr>
##
   1 Luke Skywalker
                             77 blond
                                               fair
                                                           Human
##
   2 C-3PO
                             75 <NA>
                                                           Droid
                                              gold
    3 R2-D2
                             32 <NA>
                                              white, blue Droid
##
##
  4 Darth Vader
                            136 none
                                              white
                                                           Human
  5 Leia Organa
                             49 brown
                                              light
                                                           Human
##
  6 Owen Lars
                            120 brown, grey
                                               light
                                                           Human
    7 Beru Whitesun lars
                             75 brown
                                              light
                                                           Human
##
  8 R5-D4
                             32 <NA>
                                                           Droid
                                               white, red
    9 Biggs Darklighter
                             84 black
                                               light
                                                           Human
## 10 Obi-Wan Kenobi
                             77 auburn, white fair
                                                           Human
## # ... with 77 more rows
```

```
starwars %>%
select(alias=name, crib=homeworld, sex=gender)
```

```
## # A tibble: 87 x 3
##
      alias
                          crib
                                   sex
##
      <chr>
                          <chr>>
                                   <chr>
    1 Luke Skywalker
                          Tatooine masculine
##
   2 C-3P0
                          Tatooine masculine
## 3 R2-D2
                          Naboo
                                   masculine
## 4 Darth Vader
                          Tatooine masculine
```

```
## 5 Leia Organa Alderaan feminine
## 6 Owen Lars Tatooine masculine
## 7 Beru Whitesun lars Tatooine feminine
## 8 R5-D4 Tatooine masculine
## 9 Biggs Darklighter Tatooine masculine
## 10 Obi-Wan Kenobi Stewjon masculine
## # ... with 77 more rows
```

```
starwars %>%
select(name, contains("color"))
```

```
## # A tibble: 87 x 4
##
                         hair_color
                                        skin_color eye_color
      name
##
      <chr>
                          <chr>>
                                        <chr>
                                                     <chr>>
##
   1 Luke Skywalker
                         blond
                                        fair
                                                     blue
   2 C-3P0
                          <NA>
                                        gold
                                                     vellow
##
   3 R2-D2
                          <NA>
                                        white, blue red
  4 Darth Vader
##
                         none
                                        white
                                                     yellow
## 5 Leia Organa
                         brown
                                        light
                                                     brown
## 6 Owen Lars
                         brown, grey
                                        light
                                                     blue
## 7 Beru Whitesun lars brown
                                        light
                                                     blue
## 8 R5-D4
                                        white, red red
## 9 Biggs Darklighter
                         black
                                        light
                                                     brown
## 10 Obi-Wan Kenobi
                         auburn, white fair
                                                     blue-gray
## # ... with 77 more rows
```

The select(..., everything()) option is another useful shortcut if you only want to bring some variable(s) to the "front" of a data frame.

```
starwars %>%
select(species, homeworld, everything()) %>%
head(5)
```

```
## # A tibble: 5 x 14
     species homeworld name
                                       height mass hair_color skin_color
                                                                            eye_color
                                        <int> <dbl> <chr>
     <chr>>
             <chr>>
                       <chr>
                                                                <chr>
                                                                            <chr>
## 1 Human
             Tatooine Luke Skywalker
                                                                fair
                                          172
                                                 77 blond
                                                                            blue
## 2 Droid
             Tatooine C-3PO
                                          167
                                                 75 <NA>
                                                                gold
                                                                            yellow
## 3 Droid
             Naboo
                       R2-D2
                                           96
                                                 32 <NA>
                                                                white, blue red
## 4 Human
             Tatooine Darth Vader
                                          202
                                                136 none
                                                                white
                                                                            yellow
## 5 Human
             Alderaan Leia Organa
                                          150
                                                 49 brown
                                                                light
                                                                            brown
## # ... with 6 more variables: birth_year <dbl>, sex <chr>, gender <chr>,
     films <list>, vehicles <list>, starships <list>
```

4. mutate

Create new columns.

```
starwars %>%
select(name, birth_year) %>%
mutate(dog_years = birth_year * 7) %>%
```

```
mutate(comment = paste0(name, " is ", dog_years, " in dog years."))
## # A tibble: 87 x 4
##
     name
                        birth_year dog_years comment
##
      <chr>
                             <dbl>
                                       <dbl> <chr>
                                        133 Luke Skywalker is 133 in dog years.
## 1 Luke Skywalker
                              19
## 2 C-3PO
                             112
                                        784 C-3PO is 784 in dog years.
## 3 R2-D2
                              33
                                        231 R2-D2 is 231 in dog years.
## 4 Darth Vader
                              41.9
                                        293. Darth Vader is 293.3 in dog years.
## 5 Leia Organa
                                        133 Leia Organa is 133 in dog years.
                              19
## 6 Owen Lars
                              52
                                        364 Owen Lars is 364 in dog years.
## 7 Beru Whitesun lars
                             47
                                        329 Beru Whitesun lars is 329 in dog yea~
## 8 R5-D4
                              NA
                                        NA R5-D4 is NA in dog years.
## 9 Biggs Darklighter
                              24
                                        168 Biggs Darklighter is 168 in dog year~
## 10 Obi-Wan Kenobi
                              57
                                        399 Obi-Wan Kenobi is 399 in dog years.
## # ... with 77 more rows
same as the last one. We can chain multiple mutates in a single call.
starwars %>%
 select(name, birth_year) %>%
 mutate(
   dog_years = birth_year * 7, ## Separate with a comma
    comment = paste0(name, " is ", dog_years, " in dog years.")
## # A tibble: 87 x 4
##
     name
                        birth_year dog_years comment
##
     <chr>
                                       <dbl> <chr>
                             <dbl>
## 1 Luke Skywalker
                              19
                                        133 Luke Skywalker is 133 in dog years.
## 2 C-3PO
                             112
                                        784 C-3PO is 784 in dog years.
## 3 R2-D2
                              33
                                        231 R2-D2 is 231 in dog years.
## 4 Darth Vader
                              41.9
                                        293. Darth Vader is 293.3 in dog years.
## 5 Leia Organa
                             19
                                        133 Leia Organa is 133 in dog years.
## 6 Owen Lars
                              52
                                        364 Owen Lars is 364 in dog years.
## 7 Beru Whitesun lars
                             47
                                        329 Beru Whitesun lars is 329 in dog yea~
## 8 R5-D4
                              NA
                                        NA R5-D4 is NA in dog years.
## 9 Biggs Darklighter
                              24
                                        168 Biggs Darklighter is 168 in dog year~
## 10 Obi-Wan Kenobi
                                        399 Obi-Wan Kenobi is 399 in dog years.
                              57
## # ... with 77 more rows
starwars %>%
 select(name, height) %>%
 filter(name %in% c("Luke Skywalker", "Anakin Skywalker")) %>%
 mutate(tall1 = height > 180) %>%
 mutate(tall2 = ifelse(height > 180, "Tall", "Short"))
## # A tibble: 2 x 4
##
   name
                     height tall1 tall2
    <chr>
                      <int> <lgl> <chr>
                       172 FALSE Short
## 1 Luke Skywalker
## 2 Anakin Skywalker
                        188 TRUE Tall
```

Lastly, combining mutate with the new across feature in dplyr 1.0.0+ allows you to easily work on a subset of variables. For example:

```
starwars %>%
  select(name:eye_color) %>%
  mutate(across(where(is.character), toupper)) %>%
## # A tibble: 5 x 6
##
     name
                    height mass hair_color skin_color
                                                          eye_color
##
     <chr>>
                     <int> <dbl> <chr>
                                             <chr>>
                                                          <chr>
## 1 LUKE SKYWALKER
                       172
                               77 BLOND
                                             FAIR
                                                          BLUE
                       167
                                             GOLD
                                                          YELLOW
## 2 C-3PO
                               75 <NA>
                                             WHITE, BLUE RED
## 3 R2-D2
                        96
                               32 <NA>
```

WHITE

LIGHT

YELLOW

BROWN

5. summarise

4 DARTH VADER

5 LEIA ORGANA

Collapse multiple rows into a single summary value.

202

150

136 NONE

49 BROWN

```
starwars %>%
  group_by(species, gender) %>%
  summarise(mean_height = mean(height, na.rm = TRUE))
## `summarise()` has grouped output by 'species'. You can override using the `.groups` argument.
## # A tibble: 42 x 3
## # Groups:
               species [38]
##
      species
                gender
                          mean_height
##
      <chr>
                <chr>>
                                <dbl>
##
   1 Aleena
                masculine
                                   79
##
  2 Besalisk masculine
                                  198
## 3 Cerean
               masculine
                                  198
## 4 Chagrian masculine
                                  196
## 5 Clawdite feminine
                                  168
##
  6 Droid
                feminine
                                   96
##
  7 Droid
                masculine
                                  140
##
   8 Dug
                masculine
                                  112
## 9 Ewok
                masculine
                                   88
## 10 Geonosian masculine
                                  183
## # ... with 32 more rows
```

Note that including "na.rm = TRUE" (or, its alias "na.rm = T") is usually a good idea with summarise functions. Otherwise, any missing value will propogate to the summarised value too.

```
starwars %>%
  summarise(mean_height = mean(height))

## # A tibble: 1 x 1

## mean_height

## <dbl>
## 1 NA
```

```
starwars %>%
  summarise(mean_height = mean(height, na.rm = TRUE))
## # A tibble: 1 x 1
     mean_height
##
           <dbl>
## 1
            174.
starwars %>%
  group_by(species) %>%
  summarise(across(where(is.numeric), mean, na.rm=T)) %>%
  head(5)
## # A tibble: 5 x 4
     species height mass birth_year
##
     <chr>>
               <dbl> <dbl>
                                <dbl>
## 1 Aleena
                 79
                       15
                                  NaN
## 2 Besalisk
                 198
                       102
                                  NaN
## 3 Cerean
                 198
                       82
                                   92
                 196
## 4 Chagrian
                       NaN
                                  NaN
## 5 Clawdite
                 168
                        55
                                  NaN
join
left_join(flights, planes) %>%
  select(year, month, day, dep_time, arr_time, carrier, flight, tailnum, type, model)
## Joining, by = c("year", "tailnum")
## # A tibble: 336,776 x 10
##
                    day dep_time arr_time carrier flight tailnum type model
       year month
##
      <int> <int> <int>
                           <int>
                                   <int> <chr>
                                                <int> <chr>
                                                                 <chr> <chr>
   1 2013
                             517
                                      830 UA
                                                   1545 N14228 <NA>
                                                                       <NA>
                1
                      1
    2 2013
                             533
                                      850 UA
                                                   1714 N24211
                                                                <NA>
                                                                       <NA>
##
                1
                      1
## 3 2013
                      1
                             542
                                      923 AA
                                                   1141 N619AA
                                                                <NA>
                                                                       <NA>
                1
## 4 2013
                      1
                             544
                                     1004 B6
                                                    725 N804JB <NA>
                                                                       <NA>
                1
## 5 2013
                                     812 DL
                                                    461 N668DN <NA> <NA>
                1
                      1
                             554
  6 2013
##
                1
                      1
                             554
                                     740 UA
                                                   1696 N39463
                                                                <NA>
                                                                       <NA>
   7 2013
##
                1
                      1
                             555
                                     913 B6
                                                    507 N516JB
                                                                <NA>
                                                                       <NA>
## 8 2013
                                     709 EV
                                                   5708 N829AS
                                                                <NA>
                                                                       <NA>
                1
                      1
                             557
## 9 2013
                      1
                             557
                                     838 B6
                                                     79 N593JB
                                                                <NA>
                                                                       <NA>
                1
## 10 2013
                                     753 AA
                                                    301 N3ALAA <NA>
                1
                      1
                             558
                                                                       <NA>
## # ... with 336,766 more rows
```