Exploring data with dplyr

DATA MANIPULATION WITH DPLYR



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The dplyr package

- Part of the tidyverse collection
- Specializes in data manipulation

- Install dplyr only:
 - o install.packages("dplyr")
- Install entire tidyverse, inc. dplyr:
 - o install.packages("tidyverse")



¹ Wickham H, Averick M, Bryan J, Chang W, McGowan LD, François R, Grolemund G, et al. (2019). "Welcome to the tidyverse." Journal of Open Source Software, 4(43), 1686. doi:10.21105/joss.01686.

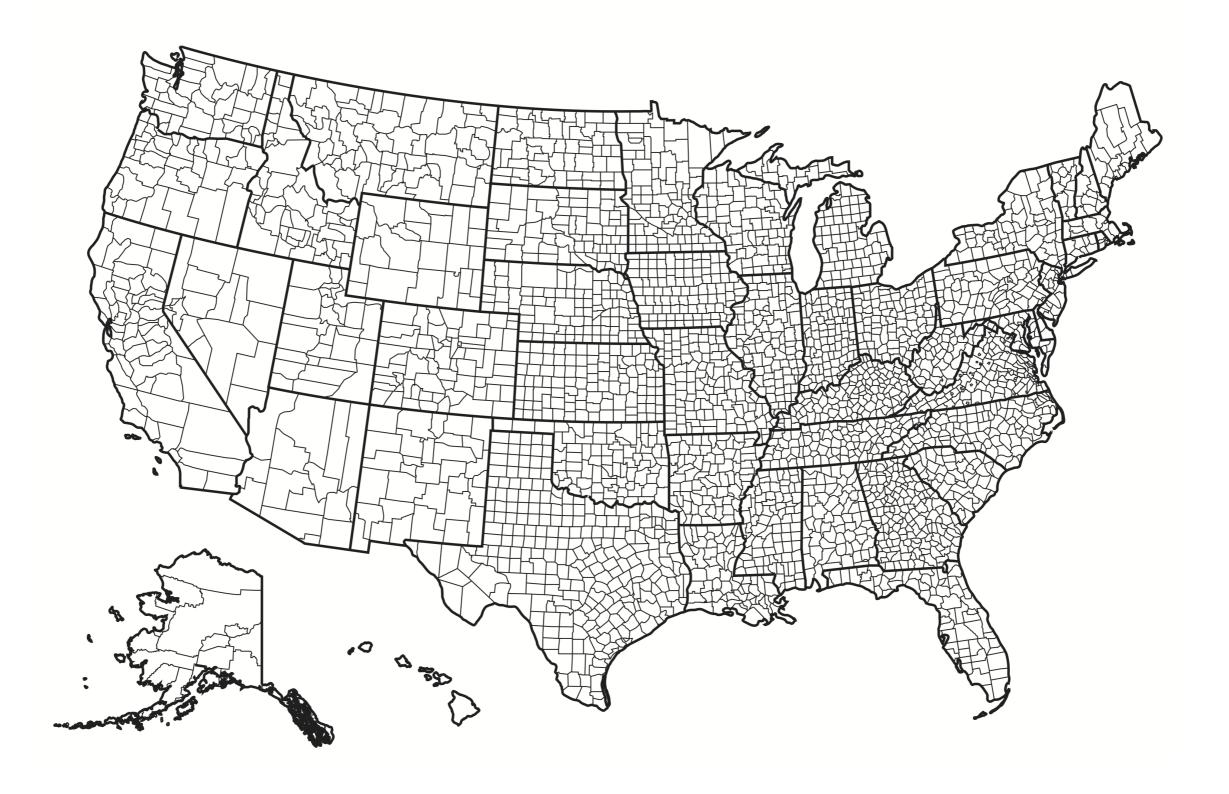


Chapter 1 verbs

- select()
- filter()
- arrange()
- mutate()

2015 United States Census





counties dataset

counties

```
# A tibble: 3,138 x 40
   census_id state county region metro population men women hispanic white black native asian pacific
                                           <dbl> <dbl> <dbl>
                                                                <chr>
             <chr> <chr> <chr> <chr>
                                                                                               <dbl>
            Alab... Autau... South Metro
                                           55221 26745 28476
                                                                 2.6 75.8 18.5
                                                                                    0.4
 1 1001
 2 1003
                                                                 4.5 83.1
                                                                                    0.6 0.7
            Alab... Baldw... South Metro
                                          195121 95314 99807
 3 1005
                                           26932 14497 12435
                                                                 4.6 46.2 46.7
            Alab... Barbo... South Nonm...
                                                                                    0.2 0.4
 4 1007
            Alab... Bibb South Metro
                                                                 2.2 74.5 21.4
                                                                                    0.4 0.1
                                           22604 12073 10531
 5 1009
            Alab... Blount South Metro
                                           57710 28512 29198
                                                                 8.6 87.9
                                                                                    0.3
                                                                                         0.1
                                                                            1.5
            Alab... Bullo... South Nonm...
                                           10678 5660 5018
                                                                 4.4 22.2 70.7
 6 1011
                                                                                    1.2 0.2
            Alab... Butler South Nonm...
                                           20354 9502 10852
                                                                 1.2 53.3 43.8
                                                                                    0.1 0.4
 7 1013
 8 1015
                                                                            20.3
            Alab... Calho... South Metro
                                         116648 56274 60374
                                                                 3.5 73
                                                                                    0.2 0.9
 9 1017
            Alab... Chamb... South Nonm...
                                           34079 16258 17821
                                                                 0.4 57.3 40.3
                                                                                    0.2
                                                                                         0.8
10 1019
            Alab... Chero... South Nonm...
                                           26008 12975 13033
                                                                 1.5 91.7 4.8
                                                                                    0.6 0.3
# ... with 3,128 more rows, and 26 more variables: citizens <dbl>, income <dbl>, income_err <dbl>,
    income_per_cap <dbl>, income_per_cap_err <dbl>, poverty <dbl>, child_poverty <dbl>,
    professional <dbl>, service <dbl>, office <dbl>, construction <dbl>, production <dbl>, drive <dbl>,
    carpool <dbl>, transit <dbl>, walk <dbl>, other_transp <dbl>, work_at_home <dbl>, mean_commute <dbl>,
    employed <dbl>, private_work <dbl>, public_work <dbl>, self_employed <dbl>, family_work <dbl>,
    unemployment <dbl>, land_area <dbl>
```



glimpse(counties)

```
Observations: 3,138
Variables: 40
$ census_id
                     <chr> "1001", "1003", "1005", "1007", "1009", "1011", "1013", ...
$ state
                     <chr> "Alabama", "Alabama", "Alabama", "Alabama", "Alabama", "...
$ county
                     <chr> "Autauga", "Baldwin", "Barbour", "Bibb", "Blount", "Bull...
$ region
                     <chr> "South", "South", "South", "South", "South", "South", "S...
$ metro
                     <chr> "Metro", "Metro", "Nonmetro", "Metro", "Metro", "Nonmetr...
$ population
                     <dbl> 55221, 195121, 26932, 22604, 57710, 10678, 20354, 116648...
$ men
                     <dbl> 26745, 95314, 14497, 12073, 28512, 5660, 9502, 56274, 16...
                     <dbl> 28476, 99807, 12435, 10531, 29198, 5018, 10852, 60374, 1...
$ women
$ hispanic
                     <dbl> 2.6, 4.5, 4.6, 2.2, 8.6, 4.4, 1.2, 3.5, 0.4, 1.5, 7.6, 0...
$ white
                     <dbl> 75.8, 83.1, 46.2, 74.5, 87.9, 22.2, 53.3, 73.0, 57.3, 91...
$ black
                     <dbl> 18.5, 9.5, 46.7, 21.4, 1.5, 70.7, 43.8, 20.3, 40.3, 4.8,...
$ native
                     <dbl> 0.4, 0.6, 0.2, 0.4, 0.3, 1.2, 0.1, 0.2, 0.2, 0.6, 0.4, 0...
$ asian
                     <dbl> 1.0, 0.7, 0.4, 0.1, 0.1, 0.2, 0.4, 0.9, 0.8, 0.3, 0.3, 0...
$ pacific
                     $ citizens
                     <dbl> 40725, 147695, 20714, 17495, 42345, 8057, 15581, 88612, ...
$ income
                    <dbl> 51281, 50254, 32964, 38678, 45813, 31938, 32229, 41703, ...
```



select() verb

```
counties %>%
  select(state, county, population, unemployment)
```

```
# A tibble: 3,138 x 4
                    population unemployment
   state
           county
           <chr>
                         <dbl>
                                      <dbl>
   <chr>
1 Alabama Autauga
                         55221
                                        7.6
 2 Alabama Baldwin
                                        7.5
                        195121
 3 Alabama Barbour
                         26932
                                       17.6
 4 Alabama Bibb
                         22604
                                        8.3
 5 Alabama Blount
                         57710
                                        7.7
 6 Alabama Bullock
                         10678
                                       18
 7 Alabama Butler
                                       10.9
                         20354
 8 Alabama Calhoun
                                       12.3
                        116648
 9 Alabama Chambers
                         34079
                                        8.9
10 Alabama Cherokee
                         26008
                                        7.9
# ... with 3,128 more rows
```

Creating a new table

```
counties_selected <- counties %>%
  select(state, county, population, unemployment)
```



counties_selected

```
# A tibble: 3,138 x 4
                   population unemployment
           county
  state
           <chr>
                         <dbl>
                                      <dbl>
  <chr>
                                        7.6
1 Alabama Autauga
                         55221
                                        7.5
2 Alabama Baldwin
                        195121
3 Alabama Barbour
                         26932
                                       17.6
4 Alabama Bibb
                                        8.3
                         22604
5 Alabama Blount
                         57710
                                        7.7
6 Alabama Bullock
                         10678
                                       18
 7 Alabama Butler
                                       10.9
                         20354
8 Alabama Calhoun
                        116648
                                       12.3
9 Alabama Chambers
                         34079
                                        8.9
10 Alabama Cherokee
                         26008
                                        7.9
# ... with 3,128 more rows
```

Let's practice!

DATA MANIPULATION WITH DPLYR



The filter and arrange verbs

DATA MANIPULATION WITH DPLYR



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```
counties_selected <- counties %>%
  select(state, county, population, unemployment)
counties_selected
```

```
# A tibble: 3,138 x 4
                    population unemployment
           county
   state
   <chr>
           <chr>
                         <dbl>
                                      <dbl>
1 Alabama Autauga
                         55221
                                        7.6
2 Alabama Baldwin
                                        7.5
                        195121
 3 Alabama Barbour
                         26932
                                       17.6
 4 Alabama Bibb
                         22604
                                        8.3
 5 Alabama Blount
                         57710
                                        7.7
 6 Alabama Bullock
                         10678
                                       18
 7 Alabama Butler
                         20354
                                       10.9
 8 Alabama Calhoun
                        116648
                                       12.3
 9 Alabama Chambers
                         34079
                                        8.9
10 Alabama Cherokee
                         26008
                                        7.9
# ... with 3,128 more rows
```



arrange()

• Sorts observations based on one or more variables

```
counties_selected %>%
  arrange(population)
```

```
# A tibble: 3,138 x 4
                        population unemployment
   state
              county
              <chr>
                              <dbl>
                                           <dbl>
   <chr>
1 Hawaii
              Kalawao
                                 85
                                             0
                                267
                                             5.1
 2 Texas
              King
              McPherson
                                433
                                             0.9
 3 Nebraska
              Petroleum
                                443
                                             6.6
 4 Montana
 5 Nebraska
              Arthur
                                448
                                             4
 6 Nebraska
                                548
                                             0.7
              Loup
 7 Nebraska
                                             0.7
              Blaine
                                551
8 New Mexico Harding
                                565
                                             6
9 Texas
                                565
              Kenedy
                                             0
10 Colorado
              San Juan
                                606
                                            13.8
# ... with 3,128 more rows
```





```
counties_selected %>%
  arrange(desc(population))
```

```
# A tibble: 3,138 x 4
                          population unemployment
   state
              county
   <chr>
              <chr>
                               <dbl>
                                             <dbl>
1 California Los Angeles
                                             10
                            10038388
2 Illinois
                                             10.7
              Cook
                             5236393
3 Texas
              Harris
                             4356362
                                              7.5
              Maricopa
                                              7.7
 4 Arizona
                             4018143
 5 California San Diego
                             3223096
                                              8.7
 6 California Orange
                                              7.6
                             3116069
7 Florida
              Miami-Dade
                             2639042
                                              10
8 New York
              Kings
                                             10
                             2595259
9 Texas
              Dallas
                                              7.6
                             2485003
10 New York
                                               8.6
              Queens
                             2301139
# ... with 3,128 more rows
```



filter()

Extract observations based on conditions

```
counties_selected %>%
  arrange(desc(population)) %>%
  filter(state == "New York")
```

```
# A tibble: 62 x 4
                        population unemployment
  state
            county
                             <dbl>
   <chr>
            <chr>
                                          <dbl>
1 New York Kings
                                           10
                           2595259
 2 New York Queens
                           2301139
                                            8.6
3 New York New York
                                            7.5
                           1629507
 4 New York Suffolk
                           1501373
                                            6.4
 5 New York Bronx
                           1428357
                                           14
 6 New York Nassau
                           1354612
                                            6.4
 7 New York Westchester
                            967315
                                            7.6
8 New York Erie
                                            7
                            921584
9 New York Monroe
                            749356
                                            7.7
10 New York Richmond
                                            6.9
                            472481
# ... with 52 more rows
```

filter()

```
counties_selected %>%
  arrange(desc(population)) %>%
  filter(unemployment < 6)</pre>
```

```
# A tibble: 949 x 4
                         population unemployment
   state
            county
                              <dbl>
                                            <dbl>
   <chr>
            <chr>
 1 Virginia Fairfax
                                              4.9
                            1128722
 2 Utah
            Salt Lake
                            1078958
                                              5.8
 3 Hawaii
            Honolulu
                             984178
                                             5.6
            Collin
 4 Texas
                             862215
                                              4.9
 5 Texas
            Denton
                             731851
                                             5.7
                                             5.1
            Fort Bend
                             658331
 6 Texas
 7 Kansas
            Johnson
                             566814
                                              4.5
 8 Maryland Anne Arundel
                             555280
                                              5.9
 9 Colorado Jefferson
                             552344
                                              5.9
            Utah
                                             5.5
10 Utah
                             551957
# ... with 939 more rows
```



Combining conditions

```
counties_selected %>%
  arrange(desc(population)) %>%
  filter(state == "New York",
      unemployment < 6)</pre>
```

```
# A tibble: 5 x 4
                      population unemployment
  state
          county
  <chr> <chr>
                           <dbl>
                                        <dbl>
1 New York Tompkins
                          103855
                                          5.9
                                          5.4
2 New York Chemung
                           88267
3 New York Madison
                                          5.1
                           72427
4 New York Livingston
                           64801
                                          5.4
5 New York Seneca
                           35144
                                          5.5
```

Let's practice!

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The mutate() verb

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```
counties_selected <- counties %>%
  select(state, county, population, unemployment)
counties_selected
```

```
# A tibble: 3,138 x 4
                    population unemployment
           county
   state
   <chr>
           <chr>
                         <dbl>
                                      <dbl>
1 Alabama Autauga
                         55221
                                        7.6
2 Alabama Baldwin
                                        7.5
                        195121
 3 Alabama Barbour
                         26932
                                       17.6
 4 Alabama Bibb
                         22604
                                        8.3
 5 Alabama Blount
                         57710
                                        7.7
 6 Alabama Bullock
                         10678
                                       18
 7 Alabama Butler
                         20354
                                       10.9
 8 Alabama Calhoun
                        116648
                                       12.3
 9 Alabama Chambers
                         34079
                                        8.9
10 Alabama Cherokee
                         26008
                                        7.9
# ... with 3,128 more rows
```



Total number of unemployed people

unemployed_population = population * unemployment / 100



mutate()

```
counties_selected %>%
mutate(unemployed_population = population * unemployment / 100)
```

```
# A tibble: 3,138 x 5
                    population unemployment unemployed_population
   state
           county
   <chr>
           <chr>
                         <dbl>
                                       <dbl>
                                                              <dbl>
                         55221
                                         7.6
1 Alabama Autauga
                                                             4197.
2 Alabama Baldwin
                                         7.5
                                                            14634.
                        195121
3 Alabama Barbour
                                        17.6
                                                             4740.
                         26932
 4 Alabama Bibb
                         22604
                                         8.3
                                                              1876.
 5 Alabama Blount
                         57710
                                         7.7
                                                              4444.
 6 Alabama Bullock
                         10678
                                        18
                                                             1922.
7 Alabama Butler
                         20354
                                        10.9
                                                             2219.
 8 Alabama Calhoun
                        116648
                                        12.3
                                                            14348.
 9 Alabama Chambers
                         34079
                                         8.9
                                                             3033.
10 Alabama Cherokee
                         26008
                                                              2055.
                                         7.9
# ... with 3,128 more rows
```



```
counties_selected %>%
  mutate(unemployed_population = population * unemployment / 100) %>%
  arrange(desc(unemployed_population))
```

```
# A tibble: 3,138 x 5
                             population unemployment unemployed_population
   state
              county
              <chr>
                                  <dbl>
                                                                      <dbl>
   <chr>
                                                <dbl>
1 California Los Angeles
                               10038388
                                                 10
                                                                   1003839.
              Cook
 2 Illinois
                                5236393
                                                 10.7
                                                                    560294.
3 Texas
              Harris
                                                  7.5
                                4356362
                                                                    326727.
              Maricopa
                                4018143
                                                  7.7
                                                                    309397.
 4 Arizona
 5 California Riverside
                                                                    296446.
                                2298032
                                                 12.9
 6 California San Diego
                                                  8.7
                                3223096
                                                                    280409.
 7 Michigan
                                                 14.9
              Wayne
                                1778969
                                                                    265066.
 8 California San Bernardino
                                2094769
                                                 12.6
                                                                    263941.
 9 Florida
              Miami-Dade
                                                                    263904.
                                2639042
                                                 10
             Kings
10 New York
                                                                    259526.
                                2595259
                                                 10
# ... with 3,128 more rows
```

Let's practice!

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