```
library(dplyr)

rladies_global %>%
  filter(city == 'Bucharest')
```



## EXPLORE YOUR DATA IN R USING dplyr

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#### Ce este dplyr?



- un pachet din sistemul tidyverse
- un pachet specific etapei de manipulare şi curățare a datelor,
- include funcții de selectare, filtrare, ordonare, sumarizare și creare de noi variabile.



### Cum începem cu dplyr

#Începem să folosim R

RStudio, VIM, Sublime, Revolution R, etc...

# Instalam pachetul complet tidyverse: install.packages("tidyverse")

# Alternativ, instalam doar dplyr: install.packages("dplyr")

# Pentru utilizare, încărcăm pachetul în memorie library(dplyr)



#### Women in workforce Setul de date

Obiecte din memorie

jobs\_gender.csv

(2088 rânduri, 12 coloane)

Earnings\_female.csv

(264 rânduri, 3 coloane)

employed\_gender.csv

(64 rânduri, 7 coloane)

year occupation major\_category

minor\_category

workers\_male

workers\_female

total\_earnings\_male

total\_earnings\_female

year group percent year full\_time\_female part\_time\_female full\_time\_male

part\_time\_male



#### Glimpse()

#### glimpse(jobs\_gender)

```
Observations: 2,088
Variables: 12
                       <dbl> 2013, 2013, 2013, 2013, 2013, 2013, 2013, 2013, 2013, 20...
$ vear
$ occupation
                       <chr> "Chief executives", "General and operations managers", "...
$ major category
                      <chr> "Management, Business, and Financial", "Management, Busi...
                      <chr> "Management", "Management", "Management", "Management", ...
$ minor category
$ total workers
                     <dbl> 1024259, 977284, 14815, 43015, 754514, 44198, 109703, 48...
$ workers male
                    <dbl> 782400, 681627, 8375, 17775, 440078, 16141, 72873, 35436...
$ workers female
                   <dbl> 241859, 295657, 6440, 25240, 314436, 28057, 36830, 13467...
$ percent female
                     <db1> 23.6, 30.3, 43.5, 58.7, 41.7, 63.5, 33.6, 27.5, 53.5, 76...
$ total earnings
                   <dbl> 120254, 73557, 67155, 61371, 78455, 74114, 62187, 99167,...
$ total earnings male <db1> 126142, 81041, 71530, 75190, 91998, 90071, 66579, 101318...
$ total earnings female <dbl> 95921, 60759, 65325, 55860, 65040, 66052, 55079, 90940, ...
$ wage percent of male <db1> 76.04208, 74.97316, 91.32532, 74.29179, 70.69719, 73.333...
```

<sup>\*</sup> Afișarea se face în funcție de mărimea consolei



#### R

#### select(tabel,col1,col2, ...)

select(jobs\_gender, year, occupation, total\_earnings\_female)

```
# A tibble: 2,088 x 3
    year occupation
                                                      total earnings female
   <db1> <chr>
                                                                        <db1>
 1 2013 Chief executives
                                                                       95921
 2 <u>2</u>013 General and operations managers
                                                                       60759
 3 <u>2</u>013 Legislators
                                                                       65325
 4 2013 Advertising and promotions managers
                                                                       55860
 5 <u>2</u>013 Marketing and sales managers
                                                                       65040
 6 2013 Public relations and fundraising managers
                                                                       66052
 7 2013 Administrative services managers
                                                                       55079
 8 <u>2</u>013 Computer and information systems managers
                                                                       90940
 9 2013 Financial managers
                                                                       57406
10 <u>2</u>013 Compensation and benefits managers
                                                                       68207
# ... with 2,078 more rows
```

Este folosit pentru selecţia coloanelor menţionate



### Filter() filter(tabel, numecol=="nume observatie")

filter(jobs\_gender, occupation=="Cost estimators")

```
# A tibble: 4 x 12
  year occupation major category minor category total workers workers male workers female
  <dbl> <chr>
                  <chr>
                                                      <db1>
                                                                  <db1>
                                                                                <db1>
 2013 Cost esti~ Management, B~ Business and ~
                                                    105744
                                                               91484
                                                                                14260
2 2014 Cost esti~ Management, B~ Business and ~
                                                  115808 103325
                                                                                12483
3 2015 Cost esti~ Management, B~ Business and ~
                                               117961 102374
                                                                                15587
4 2016 Cost esti~ Management, B~ Business and ~
                                                                                17282
                                                    122804
                                                                 105522
# ... with 5 more variables: percent female <dbl>, total earnings <dbl>,
# total earnings male <dbl>, total earnings female <dbl>, wage percent of male <dbl>
```

- Returnează datele în funcție de filtrul adaugat
- Se folosește pe randuri



### Arrange() arrange(tabel,col1); arrange(tabel,desc(col2))

arrange(jobs\_gender, desc(total\_earnings\_female))

```
# A tibble: 2,088 x 6
   year occupation
                            major category
                                               workers male workers female total earnings ~
   <dbl> <chr>
                                                       <db1>
                                                                      <db1>
                                                                                        <db1>
1 2016 Physicians and su~ Healthcare Practi~
                                                     489748
                                                                     253635
                                                                                      166388
2 2016 Derrick, rotary d~ Natural Resources~
                                                       15545
                                                                                      158929
   2016 Nurse anesthetists Healthcare Practi~
                                                       10941
                                                                      15312
                                                                                      151667
   2015 Physicians and su~ Healthcare Practi~
                                                     477655
                                                                     237706
                                                                                      150975
   2014 Physicians and su~ Healthcare Practi~
                                                     461288
                                                                     225539
                                                                                      150053
6 2015 Nurse anesthetists Healthcare Practi~
                                                                                      148873
                                                       10381
                                                                      12452
7 2014 Nurse anesthetists Healthcare Practi~
                                                       8875
                                                                      11151
                                                                                      142372
   2013 Nurse anesthetists Healthcare Practi~
                                                       8259
                                                                      13405
                                                                                      142185
   2013 Physicians and su~ Healthcare Practi~
                                                     495061
                                                                     242485
                                                                                      140036
   2015 Architectural and~ Management, Busin~
                                                                                      131780
                                                      130504
                                                                      12188
# ... with 2,078 more rows
```

 Ordonează setul de date crescator sau descrescator, în funcție de o coloana anume



### Summarise() summarise(tabel, x=fct(var1), y=fct(var2), ...)

Reduce observaţiile la un singur rând



### Mutate() mutate(tabel, coloana noua=var1\*/-+var2)

mutate(jobs\_gender, diferenta = total\_earnings\_male - total\_earnings\_female)

```
# A tibble: 2,088 x 5
   year occupation
                                                   total earnings male total earnings female diferenta
   <dbl> <chr>
                                                                  <db1>
                                                                                        <db1>
                                                                                                  <db1>
   2013 Chief executives
                                                                 126142
                                                                                        95921
                                                                                                  30221
   2013 General and operations managers
                                                                 81041
                                                                                        60759
                                                                                                  20282
   2013 Legislators
                                                                 71530
                                                                                        65325
                                                                                                   6205
   2013 Advertising and promotions managers
                                                                 75190
                                                                                        55860
                                                                                                  19330
   2013 Marketing and sales managers
                                                                 91998
                                                                                        65040
                                                                                                  26958
   2013 Public relations and fundraising managers
                                                                 90071
                                                                                        66052
                                                                                                  24019
   2013 Administrative services managers
                                                                 66579
                                                                                        55079
                                                                                                  11500
   2013 Computer and information systems managers
                                                                101318
                                                                                        90940
                                                                                                  10378
   2013 Financial managers
                                                                 90278
                                                                                        57406
                                                                                                  32872
   2013 Compensation and benefits managers
                                                                  97552
                                                                                        68207
                                                                                                  29345
# ... with 2,078 more rows
```

Creeaza variabile noi într-un tabel



### Group\_by() group\_by(tabel, var1, var2, ...)

group\_by(jobs\_gender, year)

```
# A tibble: 2,088 x 12
# Groups: year [4]
   year occupation major category minor category total workers
   <dbl> <chr>
                   <chr>
                                                         <db1>
1 2013 Chief exe~ Management, B~ Management
                                                       1024259
2 2013 General a~ Management, B~ Management
                                                       977284
3 2013 Legislato~ Management, B~ Management
                                                       14815
4 2013 Advertisi~ Management, B~ Management
                                                        43015
5 2013 Marketing~ Management, B~ Management
                                                        754514
 6 2013 Public re~ Management, B~ Management
                                                        44198
7 2013 Administr~ Management, B~ Management
                                                        109703
8 2013 Computer ~ Management, B~ Management
                                                       489048
   2013 Financial~ Management, B~ Management
                                                        990611
10 2013 Compensat~ Management, B~ Management
                                                        14656
# ... with 2,078 more rows, and 7 more variables:
   workers male <dbl>, workers female <dbl>, percent female <dbl>,
   total earnings <dbl>, total earnings male <dbl>,
   total earnings female <dbl>, wage percent of male <dbl>
```

Grupează datele după una sau mai multe variabile



### %>% operatorul "pipe"

```
select(jobs_gender, total_earnings_female)
jobs_gender %>% # din tabelul jobs_gender
```

select(total\_earnings\_female) # selectam coloana total\_earnings\_female

- Facilitează rularea mai multor funcții
- Creează o legatură între funcții



#### O legătură între group\_by()+filter()+summarise() %>%

```
group by(jobs gender, major category)
filter(jobs_gender, !is.na(total_earnings_female))
summarise(jobs_gender, media_veniturilor_fem=mean(total_earnings_female))
jobs gender %>% #in tabelul jobs gender
 group_by(major_category) %>% #grupam după categorii majore
  filter(!is.na(total_earnings_female)) %>% #selectam doar randurile fără N/A
  summarise(media_veniturilor_fem=mean(total_earnings_female)) %>%
  arrange(desc(media_veniturilor_fem)) # calc media veniturilor pe categ majore
  # ordonam rezultatele descrescător după medie venituri femei
```



### Care este media veniturilor femeilor pe categorii mari? Output: group\_by()+filter()+summarise()+arrange()

# A tibble: 8 x 2 major_category <chr></chr>	<pre>media_veniturilor_fem</pre>
1 Computer, Engineering, and Science	<u>69</u> 427.
2 Healthcare Practitioners and Technical	<u>68</u> 887.
3 Management, Business, and Financial	<u>59</u> 070.
4 Education, Legal, Community Service, Arts, and	Media <u>46</u> 258.
5 Natural Resources, Construction, and Maintenance	e <u>38</u> 549.
6 Sales and Office	<u>37</u> 106.
7 Production, Transportation, and Material Moving	<u>32</u> 438.
8 Service	<u>31</u> 988.



#### inner\_join() inner\_join(tabel1, tabel2, by="nume coloana comuna")

 Unește două sau mai multe tabele în funcție de o coloană comună, adăugând variabilele din ambele tabele, însă doar pentru observațiile comune

#### inner\_join()



employed\_gender %>%
select(year, full\_time\_female, part\_time\_female) %>%
arrange(desc(year))

```
# A tibble: 49 x 3
   year full time female part time female
   <db1>
                    <db1>
                                    <db1>
                    75.1
1 2016
                                     24.9
2 2015
                    74.8
                                     25.2
3 2014
                    74.2
                                     25.8
 4 2013
                    74
                                     26
5 2012
                    73.7
                                     26.3
                    73.5
 6 2011
                                     26.5
7 2010
                   73.4
                                     26.6
   2009
                    73.5
                                     26.5
   2008
                    75.4
                                     24.6
   2007
                    75.3
                                     24.7
# ... with 39 more rows
```



25.2

24.9

#### inner\_join()

3 2015

2016

#### inner\_join(employed\_gender, jobs\_gender, by="year")

```
jobs_gender %>% group_by(year) %>%
 summarise(medie angajati total=mean(total workers),
          femei=mean(workers female), barbati=mean(workers male)) %>%
 inner join(employed gender, jobs gender, by="year") %>%
 select(year, medie_angajati_total, femei, full_time_female, part_time_female)
  # A tibble: 4 x 5
     year medie angajati total femei full time female part time female
    <dbl>
                         <db1> <db1>
                                                <db1>
                                                                 <dbl>
                                                 74
                                                                  26
   2013
                      189364. 81723.
  2 2014
                      193872. 83428.
                                                 74.2
                                                                  25.8
```

198685. 85578.

202299 87429.

74.8

75.1



### 9 verbe de reţinut despre dplyr

- Glimpse()
- Select()
- Filter()
- Arrange()
- Summarise()
- Mutate()
- Group\_by()
- %<%
- Inner\_join()



### VĂ MULŢUMIM