APPLICATIONS



OF DATA SCIENCE

Tidy Data Wrangling - Part A

Applications of Data Science - Class 2

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2023-03-12



dplyr: Basic Data Verbs



Basic Data Verbs

- filter() rows based on one or more conditions
- mutate() one or more columns, usually based on existing columns
- select() the column(s) you want
- arrange () rows by one or more columns order
- summarize() or summarise() that single quantity off a column
- pull () a column as a vector, don't want it as a column no more

And the much beloved group_by(): do whatever by groups of one or more variables.



Read in the data

```
library(tidyverse)
okcupid <- read csv("~/okcupid.csv.zip")</pre>
```

Reminder:

```
dim(okcupid)
## [1] 59946
                 31
colnames(okcupid)
```

```
##
    [1] "age"
                       "body type"
                                      "diet"
                                                     "drinks"
                                                                    "drugs"
                                                                    "essay3"
    [6] "education"
                       "essav0"
                                      "essav1"
                                                     "essav2"
##
   [11] "essay4"
                       "essav5"
                                      "essav6"
                                                     "essav7"
                                                                    "essav8"
                                      "height"
                                                     "income"
                                                                    "dob"
## [16] "essay9"
                       "ethnicity"
## [21] "last online" "location"
                                      "offspring"
                                                     "orientation" "pets"
## [26] "religion"
                                      "sian"
                                                     "smokes"
                                                                    "speaks"
                       "sex"
## [31] "status"
```

mutate()

Add a column height cm, the height in centimeters:

```
okcupid <- okcupid %>%
  mutate(height_cm = 2.54 * height)
```

if you also load the magrittr package you could do:

okcupid %<>% mutate(height_cm = 2.54 * height)



filter() and select()

Filter only women, select only age and height:

```
okcupid %>%
  filter(sex == "f") %>%
  select(age, height)
## # A tibble: 24,117 \times 2
##
      age height
##
     <dbl> <dbl>
##
       32
             65
##
     31 65
##
   3 24 67
##
   4 30 66
##
   5 29
             62
##
  6 39
             65
##
  7 26 64
  8 27 67
##
  9 22
             67
## 10
     27
             64
## # ... with 24,107 more rows
```



Same but income over 100K, and select all essay questions:

```
okcupid %>%
   filter(sex == "f", income > 100000) %>%
   select(starts with("essay"))
## # A tibble: 208 × 10
##
      essav0
                        essay1 essay2 essay3 essay4 essay5 essay6 essay7 essay
##
      <chr>
                        <chr> <chr> <chr> <chr> <chr> <chr> <chr> <chr>
    1 "i love it he... "bein... "scra... "my b... "musi... "vege... "maki... "kick... "wow,
##
    2 "i'm silly. i... "curr... "eati... "my p... "prid... "noth... "my n... "eati... "i'm
##
    3 "welcome... i... "pian... "sing... "my h... "book... "touc... "diff... <NA>
##
                                                                                  <NA>
    4 "purebred cal... "by d... "bein... "my h... "to s... "- wa... "my n... "i tr... "ummm
##
    5 "i wasn't lik... "chic... "usin... "lips... "arma... "lust... "ente... "maki... <NA>
##
##
    6 "hello!<br />... "i ta... "anyt... "my a... "book... "my g... "ever... "i wo... <NA>
   7 "life's but a... "i'm ... "gett ... "its ... "otis ... "1. s ... "the ... "oh m ... "i do
##
##
    8 "everything h... "livi... "bein... "my e... "dubs... "dirt... "how ... "reco... "i lo
    9 "love to do a... "dail... "i am... "my s... "love... "masc... "if i... <NA> "i am...
##
## 10 "<b>physical ... "i am... "piss... "my s... "book... "my d... "who ... "tota... "my d.
```



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... with 198 more rows

Same but using a range of columns:

```
okcupid %>%
   filter(sex == "f", income > 100000) %>%
   select(essay0:essay9)
## # A tibble: 208 × 10
##
      essav0
                        essay1 essay2 essay3 essay4 essay5 essay6 essay7 essay
##
      <chr>
                       <chr> <chr> <chr> <chr> <chr> <chr> <chr> <chr>
    1 "i love it he... "bein... "scra... "my b... "musi... "vege... "maki... "kick... "wow,
##
    2 "i'm silly. i... "curr... "eati... "my p... "prid... "noth... "my n... "eati... "i'm
##
    3 "welcome... i... "pian... "sing... "my h... "book... "touc... "diff... <NA>
##
                                                                                  <NA>
    4 "purebred cal... "by d... "bein... "my h... "to s... "- wa... "my n... "i tr... "ummm
##
    5 "i wasn't lik... "chic... "usin... "lips... "arma... "lust... "ente... "maki... <NA>
##
##
    6 "hello!<br />... "i ta... "anyt... "my a... "book... "my g... "ever... "i wo... <NA>
   7 "life's but a... "i'm ... "gett... "its ... "otis... "1. s... "the ... "oh m... "i do
##
##
    8 "everything h... "livi... "bein... "my e... "dubs... "dirt... "how ... "reco... "i lo
    9 "love to do a... "dail... "i am... "my s... "love... "masc... "if i... <NA> "i am...
##
## 10 "<b>physical ... "i am... "piss... "my s... "book... "my d... "who ... "tota... "my d.
## # ... with 198 more rows
```

Many, many such gifts, see <u>tidyselect</u>



summarize()

Find the average height of women

```
okcupid %>%
  filter(sex == "f") %>%
  summarize(avg_height = mean(height_cm, na.rm = TRUE))

## # A tibble: 1 × 1
## avg_height
## <dbl>
## 1 165.
```

Notice we got a tibble. We could either pull this single number:

```
okcupid %>%
  filter(sex == "f") %>%
  summarize(avg_height = mean(height_cm, na.rm = TRUE)) %>%
  pull()
```

[1] 165.3638



Or pull the vector of heights first, then calculate their mean:

```
okcupid %>%
  filter(sex == "f") %>%
  pull(height_cm) %>%
  mean(na.rm = TRUE)

## [1] 165.3638
```

Amazingly, this would also work:

```
mean(pull(filter(okcupid, sex == "f"), height_cm), na.rm = TRUE)
## [1] 165.3638
```



group_by()

But why settle for women only?

And you might want to consider rename () ing sex!

```
okcupid %>%
  group_by(sex) %>%
  summarize(avg_height = mean(height_cm, na.rm = TRUE)) %>%
  rename(gender = sex)
```



New in dplyr 1.1: .by argument

Do you prefer...



Group by multiple variables, get more summaries, arrange by descending average height:

```
## # A tibble: 10 \times 5
## # Groups: sex [2]
##
                     avg height med height
    sex status
##
  <chr> <chr>
                         <dbl> <dbl> <int>
                                  180. 1209
##
  1 m available
                          179.
## 2 m married
                         179.
                                 180. 175
##
                         179. 178. 1061
  3 m seeing someone
                         179. 178. 33378
##
         single
                                  177.
##
       unknown
                         177.
                                 166. 656
## 6 f available
                         166.
## 7 f married
                         166. 165. 135
## 8 f seeing someone 165. 165. 1003
## 9 f
         single
                         165. 165. 22319
## 10 f
         unknown
                          161.
                                  159.
```



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Protip: count()

When all you want is, well, count, no need to group by:

```
okcupid %>% count(body type, sort = TRUE)
## # A tibble: 13 \times 2
     body type
                        n
     <chr>
##
                  <int>
##
  1 average
                    14652
##
  2 fit
                   12711
##
  3 athletic
                    11819
## 4 <NA>
                    5296
## 5 thin
                   4711
## 6 curvy
                   3924
## 7 a little extra 2629
## 8 skinny
                    1777
## 9 full figured 1009
## 10 overweight
                    444
## 11 jacked
                     421
## 12 used up
                     355
## 13 rather not say
                      198
```



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Protip: add count()

Add count without first creating an initial table, joining etc.:

```
okcupid %>%
  mutate(id = row number()) %>%
  select(id, body type, sex) %>%
  add count (body type, name = "n bt") %>%
  filter(n bt > \overline{10000}) %>%
 head(5)
```

```
## # A tibble: 5 \times 4
##
       id body type sex
                         n bt
## <int> <chr> <chr> <int>
## 1 2 average m
                        14652
## 2 5 athletic m 11819
## 3 6 average m 14652
## 4 7 fit f 12711
## 5 8 average f 14652
```



Beyond Basics



A simple answer to the religion question?

okcupid %>% count(religion)

```
## # A tibble: 46 \times 2
##
      religion
                                                         n
##
      \langle chr \rangle
                                                     \langle int \rangle
                                                      2724
    1 agnosticism
    2 agnosticism and laughing about it
                                                      2496
##
    3 agnosticism and somewhat serious about it 642
##
    4 agnosticism and very serious about it
                                                      314
##
    5 agnosticism but not too serious about it
                                                     2636
##
   6 atheism
                                                      2175
## 7 atheism and laughing about it
                                                      2074
##
   8 atheism and somewhat serious about it
                                                      848
                                                       570
    9 atheism and very serious about it
## 10 atheism but not too serious about it
                                                      1318
## # ... with 36 more rows
```



Recoding with case_when()

```
okcupid <- okcupid %>% mutate(religion2 = case_when(
   str_detect(religion, "agnosticism") | str_detect(religion, "athe
   str_detect(religion, "buddhism") ~ "buddhist",
   str_detect(religion, "christianity") | str_detect(religion, "cat
   str_detect(religion, "judaism") ~ "jewish",
   str_detect(religion, "hinduism") ~ "hindu",
   str_detect(religion, "islam") ~ "muslim",
   TRUE ~ "NA"))

okcupid %>% count(religion2, sort = TRUE)
```



Recoding with case_match()

For a 1-to-1 or many-to-1 simple recoding, case_match() should be faster:

```
okcupid <- okcupid %>% mutate(smokes = case_match(
    smokes,
    c("sometimes", "trying to quit", "when drinking") ~ "yes",
    NA ~ "prefer not to say",
    .default = smokes))

okcupid %>% count(smokes)
```



Getting extreme observations with slice max() and slice min()

```
(top n() and top frac() were superseded by slice min()/slice max())
```

```
okcupid %>%
  select(sex, age) %>%
  group by (sex) %>%
  slice max(age, n = 3)
## # A tibble: 33 \times 2
## # Groups: sex [2]
##
     sex
            age
## <chr> <dbl>
## 1 f 110
## 2 f 69
##
  3 f 69
## 4 f
            69
##
            69
```

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69 69

> 69 69

69

6 f

##

To get rid of ties:



Or use rank ()



Remove duplicates with distinct()

```
okcupid %>%
  filter(diet == "kosher") %>%
  distinct (body type, drugs)
## # A tibble: 7 \times 2
## body type drugs
##
  <chr> <chr>
## 1 fit
               <NA>
## 2 <NA>
         never
## 3 used up <NA>
               never
## 4 fit
## 5 skinnv
           never
## 6 a little extra never
## 7 jacked
           never
```

distinct() is much more powerful than unique(), see ?distinct.

To count number of distinct obs look at n_distinct()



The _at(), _if() and _all() families

Many of the verbs we've seen come with these suffixes:

```
okcupid %>%
  select if(is.numeric)
## # A tibble: 59,946 \times 4
##
     age height income height cm
                      <dbl>
##
    <dbl> <dbl> <dbl>
      22
           75
                      190.
##
                 -1
##
  2
    35 70 80000 178.
  3 38 68
##
                -1 173.
##
  4 23
           71 20000 180.
  5 29
                    168.
##
           66
                 -1
##
  6 29 67
               -1
                     170.
##
  7 32 65 -1 165.
## 8 31 65 -1 165.
##
  9 24 67 -1 170.
## 10 37 65 -1
                      165.
## # ... with 59,936 more rows
```

Do you see something strange?



Take care of those missing observations for me without breaking the pipe:

```
okcupid %>%
  mutate(income = na if(income, -1)) %>%
  select if(is.numeric)
## # A tibble: 59,946 \times 4
##
       age height income height cm
##
     <dbl> <dbl> <dbl>
                             <dbl>
##
        22
               75
                             190.
                      NA
##
        35
               70 80000
                             178.
##
      38
               68
                             173.
                      NA
        23
                             180.
##
               71 20000
##
        29
               66
                             168.
                      NA
##
        29
               67
                             170.
                      NA
##
     32
                             165.
               65
                      NA
##
     31
               65
                      NA
                             165.
##
   9 24
               67
                             170.
                      NA
## 10 37
               65
                             165.
                      NA
## # ... with 59,936 more rows
```



Transform all my numeric columns with log:

```
okcupid %>%
  mutate(income = na_if(income, -1)) %>%
  select_if(is.numeric) %>%
  mutate_all(log)

## # A tibble: 59,946 × 4

## age height income height_cm
## <dbl> <dbl> <dbl> <dbl>
## 1 3.09 4.32 NA 5.25
```





Same but add sqrt and keep original columns:

```
okcupid %>%
  mutate(income = na if(income, -1)) %>%
  select if(is.numeric) %>%
  mutate all(list(logged = log, sgrted = sgrt))
## # A tibble: 59,946 \times 12
##
       age height income height cm age logged height logged income logged
##
                           <dbl>
     <dbl>
          <dbl>
                  <dbl>
                                     <dbl>
                                                  <dbl>
                                                               <dbl>
        22
##
              75
                     NA
                            190.
                                      3.09
                                                   4.32
                                                               NA
     35
##
              70 80000
                            178.
                                      3.56
                                                   4.25
                                                               11.3
                                                   4.22
##
       38
              68
                            173.
                                      3.64
                     NA
                                                               NA
        23
##
              71 20000
                          180.
                                      3.14
                                                   4.26
                                                                9.90
##
        29
                                                   4.19
              66
                     NA
                         168.
                                      3.37
                                                               NA
##
   6 29
              67
                     NA
                        170.
                                   3.37
                                                   4.20
                                                               NA
##
  7 32
              65
                    NA
                           165.
                                    3.47
                                                   4.17
                                                               NA
##
       31
              65
                            165.
                                      3.43
                                                   4.17
                    NA
                                                               NA
##
        24
              67
                           170.
                                      3.18
                                                   4.20
                     NA
                                                               NA
## 10
        37
              65
                     NA
                            165.
                                      3.61
                                                   4.17
                                                               NA
## # ... with 59,936 more rows, and 5 more variables: height cm logged <dbl>,
## #
      age sgrted <dbl>, height sgrted <dbl>, income sgrted <dbl>,
      height cm sqrted <dbl>
####
```



Same but take care of zeros under log:

```
okcupid %>%
  mutate(income = na if(income, -1)) %>%
  select if(is.numeric) %>%
  mutate all(list(logged = function(x) log(x + 1), sqrted = sqrt))
## # A tibble: 59,946 \times 12
##
       age height income height cm age logged height logged income logged
##
                            <dbl>
     <dbl>
            <dbl>
                  <dbl>
                                      <dbl>
                                                   <dbl>
                                                                 <dbl>
        22
##
               75
                     NA
                             190.
                                       3.14
                                                    4.33
                                                                NA
     35
##
              70 80000
                             178.
                                       3.58
                                                    4.26
                                                                11.3
##
       38
              68
                            173.
                                       3.66
                                                    4.23
                     NA
                                                                NA
##
        23
              71 20000
                           180.
                                      3.18
                                                    4.28
                                                                 9.90
##
        29
                                                    4.20
              66
                     NA
                          168.
                                      3.40
                                                                NA
##
   6 29
              67
                     NA
                            170.
                                      3.40
                                                    4.22
                                                                NA
##
   7 32
              65
                     NA
                            165.
                                      3.50
                                                    4.19
                                                                NA
##
       31
              65
                            165.
                                      3.47
                                                    4.19
                     NA
                                                                NA
##
        24
              67
                            170.
                                       3.22
                                                    4.22
                     NA
                                                                NA
## 10
        37
               65
                     NA
                             165.
                                       3.64
                                                    4.19
                                                                NA
## # ... with 59,936 more rows, and 5 more variables: height cm logged <dbl>,
####
      age sgrted <dbl>, height sgrted <dbl>, income sgrted <dbl>,
      height cm sqrted <dbl>
####
```



Same but select only non-negative columns:

```
is non negative <- function(x) all(is.numeric(x) & (is.na(x) | x >
okcupid %>%
  mutate(income = na if(income, -1)) %>%
  select if (is non negative) %>%
  mutate all(list(logged = function(x) log(x + 1), sqrted = sqrt))
## # A tibble: 59,946 × 12
##
       age height income height cm age logged height logged income logged
##
     <dbl> <dbl> <dbl>
                          <dbl>
                                    <dbl>
                                                 <dbl>
                                                             <dbl>
##
        22
              75
                           190.
                                     3.14
                                                  4.33
                    NA
                                                             NA
##
     35
              70 80000
                           178.
                                    3.58
                                                 4.26
                                                             11.3
                           173.
                                                 4.23
##
     38
             68
                    NA
                                    3.66
                                                             NA
##
  4
       23
             71 20000
                         180.
                                    3.18
                                                 4.28
                                                             9.90
##
       29
              66
                        168.
                                   3.40
                                                 4.20
                    NA
                                                             NA
##
   6 29
              67
                       170. 3.40
                                                4.22
                    NA
                                                             NA
##
  7 32
             65
                   NA
                        165. 3.50
                                                4.19
                                                             NA
##
  8 31 65
                   NA
                          165.
                                    3.47
                                                 4.19
                                                             NA
                                    3.22
##
   9
     24
              67
                    NA
                          170.
                                                 4.22
                                                             NA
## 10
       37
              65
                    NA
                           165.
                                     3.64
                                                  4.19
                                                             NA
## # ... with 59,936 more rows, and 5 more variables: height cm logged <dbl>,
## #
      age sqrted <dbl>, height sqrted <dbl>, income sqrted <dbl>,
####
     height cm sqrted <dbl>
```



On second thought log would probably be appropriate just for income and height cm (not really, just for demo):

```
okcupid %>%
  mutate(income = na if(income, -1)) %>%
  mutate at(c("income", "height cm"),
             list(logged = function(x) log(x + 1), sgrted = sgrt))
   select(ends with("logged"), ends with("sqrted"))
## # A tibble: 59,946 \times 4
##
      income logged height cm logged income sqrted height cm sqrted
##
              <dbl>
                                <dbl>
                                               <dbl>
                                                                  <dbl>
##
   1
              NA
                                 5.25
                                                 NA
                                                                  13.8
##
              11.3
                                 5.19
                                                283.
                                                                  13.3
##
                                 5.16
                                                                  13.1
              NA
                                                 NA
##
              9.90
                                 5.20
                                                141.
                                                                  13.4
##
    5
                                 5.13
                                                 NA
                                                                  12.9
              NA
##
                                 5.14
                                                                  13.0
              NA
                                                 NA
##
   7
                                 5.11
                                                                  12.8
              NA
                                                 NA
##
                                 5.11
                                                                  12.8
              NA
                                                 NA
##
                                 5.14
                                                                  13.0
              NA
                                                 NA
## 10
                                  5.11
                                                                  12.8
              NA
                                                 NA
## # ... with 59,936 more rows
```



across() and c_across()

The _if(), _at() and _all() families are so last year...

With a few exceptions (select_if(),na_if()...) they have now been "superseded" by across(). So instead of mutate_all() we would do:

```
okcupid %>% mutate(across(everything(), log))
```

Instead of mutate at() we would now do:

```
okcupid %>% mutate(across(c("income", "height_cm"), log))
```

And instead of mutate if () we would do:

```
okcupid %>% mutate(across(where(is.numeric), log))
```



Dealing with NAs

You've already seen na_if(). We could simply, always, keep those NAs in income:

```
okcupid <- okcupid %>%
  mutate(income = ifelse(income == -1, NA, income))
```

Or:

```
okcupid <- okcupid %>%
  mutate(income = na_if(income, -1))
```

Dropping NAs with, well, drop_na():

```
okcupid_no_nas <- okcupid %>% drop_na()
```



Replacing NAs with, well, replace na():

```
okcupid back to minus1 <- okcupid %>% replace na(list(income = -1)
```

Could be useful for imputing NAs, say the median:

```
okcupid na income imputed <- okcupid %>%
 replace na(list(income = median(.$income, na.rm = TRUE)))
```



Sampling with slice_sample()

```
(sample_n() and sample_frac() were superseded by slice_sample())
```

```
okcupid %>% select(drugs, age, income, sex) %>%
  group_by(drugs) %>%
  slice_sample(n = 3, replace = TRUE)
```

```
## # A tibble: 12 \times 4
## # Groups: drugs [4]
##
  drugs age income sex
##
  <chr> <dbl> <dbl> <chr>
##
  1 never
                27
                     NA m
##
            39
  2 never
                     NA m
##
  3 never
               25
                   NA m
##
  4 often
               20
                  NA m
## 5 often
           26
                  NA f
## 6 often
           25
                  NA m
## 7 sometimes 36
                  NA m
             35
## 8 sometimes
                   NA m
##
  9 sometimes
             30
                   NA f
## 10 <NA>
              30
                     NA m
## 11 <NA>
               30
                     NA f
## 12 <NA>
               42
                     NA m
```



Put it in a function



Compose a function which would accept an unquoted variable

```
count_var_for_gender <- function(var, gender) {
  okcupid %>%
    filter(sex == gender) %>%
    count({{var}}, sort = TRUE)
}

count_var_for_gender(body_type, "f") %>% head(9)
```

```
## # A tibble: 9 \times 2
## body type
                    n
## <chr>
                <int>
                 5620
## 1 average
## 2 fit
                 4431
               3811
## 3 curvy
                 2703
## 4 <NA>
## 5 thin
                 2469
## 6 athletic
                2309
## 7 full figured 870
## 8 a little extra 821
                  601
## 9 skinny
```



Making a data. frame function pipeable

```
transform_all_my_numerics <- function(df, transformation) {
   df %>% mutate(across(where(is.numeric), transformation))
}
okcupid %>%
   transform_all_my_numerics(log) %>%
   select_if(is.numeric)
```

```
## # A tibble: 59,946 \times 4
##
      age height income height cm
   <dbl> <dbl> <dbl>
##
                         <dbl>
  1 3.09 4.32 NA
##
                         5.25
  2 3.56 4.25 11.3
##
                        5.18
  3 3.64 4.22 NA
##
                        5.15
  4 3.14 4.26 9.90 5.19
##
##
  5 3.37 4.19 NA
                         5.12
## 6 3.37 4.20 NA
                         5.14
## 7 3.47 4.17 NA
                         5.11
## 8 3.43 4.17 NA
                       5.11
## 9 3.18 4.20 NA
                       5.14
## 10 3.61 4.17 NA
                          5.11
## # ... with 59,936 more rows
```



invisible()

If your function does not return a data.frame make it!

```
print n rows <- function(df) {</pre>
  cat("number of rows: ", nrow(df), "\n")
  invisible(df)
okcupid %>%
  filter(sex == "m", body type %in% c("fit", "thin", "skinny")) %
  print n rows() %>%
  summarise(mean height = mean(height cm, trim = 0.025))
## number of rows: 11698
## # A tibble: 1 × 1
## mean height
##
          <dbl>
           179.
## 1
```



Or even better:

```
filter and print <- function(df, ...) {
  df filtered <- df %>% filter(...)
  cat("number of rows: ", nrow(df filtered), "\n")
  df filtered
okcupid %>%
  filter and print(sex == "m", body type %in% c("fit", "thin", "s)
  summarise(mean height = mean(height cm, trim = 0.025))
## number of rows: 11698
## # A tibble: 1 × 1
## mean height
##
         <dbl>
          179.
## 1
  for better living see glue::glue("number of rows: {nrow(df)}")
  and %T>%
```

