Week 8 - Data Exploration and Summary

Alex Lishinski and Joshua Rosenberg March 11, 2021

Welcome!

Welcome to week 8!

Record the meeting

Breakout rooms!

Starting with whomever has the most bandwidth at home/outside of school (and work):

One question:

• What is something you're grateful for?

One reflection/discussion:

• What is one thing that you like about this course? And, what is one thing about this course that you wished were different?

Review of last week's class

- Using color
- Grouping and stacking bar charts
- Faceting charts

Josh's Anecdote

From webinar: https://jrosen48.github.io/airs-ngss-survey/

https://www.youtube.com/watch?v=WxdWzTlzYml

https://www.youtube.com/watch?v=WxdWzTlzYml

Homework highlights

This week's topics

Overview

- A. Summarizing variables
- B. Inspecting data frames and correlations
- C. Summary tables

A. Summarizing variables

Overview

- Sometimes you need to summarize variables
- Data viz is often a good tool to use
- Statistics are important too

As always with R, there are multiple ways to get there.

A. Summarizing variables – Base R

library(₩)

summary(mtcars)

```
##
                          cvl
                                           disp
                                                             hp
         mpg
   Min.
           :10.40
                     Min.
                            :4.000
                                     Min. : 71.1
                                                      Min. : 52.0
   1st Ou.:15.43
                    1st Ou.:4.000
                                     1st Ou.:120.8
                                                      1st Ou.: 96.5
##
   Median :19.20
                    Median :6.000
                                     Median :196.3
                                                      Median :123.0
##
    Mean
           :20.09
                     Mean
                            :6.188
                                     Mean
                                             :230.7
                                                      Mean
                                                              :146.7
##
   3rd Ou.:22.80
                     3rd Ou.:8.000
                                      3rd Ou.:326.0
                                                      3rd Ou.:180.0
##
           :33.90
                            :8.000
                                             :472.0
                                                              :335.0
   Max.
                     Max.
                                      Max.
                                                      Max.
##
         drat.
                           wt.
                                           qsec
                                                             VS
##
    Min.
           :2.760
                            :1.513
                                             :14.50
                                                              :0.0000
                     Min.
                                     Min.
                                                      Min.
   1st Ou.:3.080
                    1st Ou.:2.581
                                     1st Ou.:16.89
                                                      1st Ou.:0.0000
##
   Median :3.695
                    Median :3.325
                                     Median :17.71
                                                      Median :0.0000
           :3.597
                                             :17.85
                                                              :0.4375
    Mean
                     Mean
                            :3.217
                                     Mean
                                                      Mean
##
    3rd Ou.:3.920
                     3rd Ou.:3.610
                                      3rd Ou.:18.90
                                                      3rd Ou.:1.0000
           :4.930
                            :5.424
                                      Max.
                                             :22.90
                                                              :1.0000
##
    Max.
                     Max.
                                                      Max.
##
                                            carb
          am
                           gear
           :0.0000
                             :3.000
                                              :1.000
    Min.
                      Min.
                                      Min.
   1st Ou.:0.0000
                     1st Ou.:3.000
                                      1st Ou.:2.000
##
   Median :0.0000
                     Median :4.000
                                      Median :2.000
           :0.4062
                             :3.688
                                              :2.812
##
   Mean
                      Mean
                                       Mean
   3rd Ou.:1.0000
                      3rd Qu.:4.000
                                       3rd Ou.:4.000
##
         :1.0000
                             :5.000
                                              :8.000
   Max.
                      Max.
                                      Max.
```

A. Summarizing variables – skimr

skimr package - https://cran.r-project.org/web/packages/skimr/vignettes/skimr.html

```
library(skimr)
skim(mtcars)
```

Table: Data summary

Name	mtcars
Number of rows	32
Number of columns	11
_	
Column type frequency:	
numeric	11
_	
Group variables	None

Variable type: numeric

skim_variable	n_missing compl	ete_rate	mean	sd	p0	p25	p50	p75	p100	hist
mpg	0	1	20.09	6.03	10.40	15.43	19.20	22.80	33.90	
cyl	0	1	6.19	1.79	4.00	4.00	6.00	8.00	8.00	
disp	0	1	230.72	123.94	71.10	120.83	196.30	326.00	472.00	
hp	0	1	146.69	68.56	52.00	96.50	123.00	180.00	335.00	
drat	0	1	3.60	0.53	2.76	3.08	3.70	3.92	4.93	
wt	0	1	3.22	0.98	1.51	2.58	3.33	3.61	5.42	
qsec	0	1	17.85	1.79	14.50	16.89	17.71	18.90	22.90	
VS	0	1	0.44	0.50	0.00	0.00	0.00	1.00	1.00	
am	0	1	0.41	0.50	0.00	0.00	0.00	1.00	1.00	
gear	0	1	3.69	0.74	3.00	3.00	4.00	4.00	5.00	
carb	0	1	2.81	1.62	1.00	2.00	2.00	4.00	8.00	

A. Summarizing variables – skimr

Grouping also works with some of these summary functions

```
mtcars %>%
  group_by(am) %>%
  skim()
```

Table: Data summary

```
Name Piped data
Number of rows 32
Number of columns 11

Column type frequency:
numeric 10

Group variables am
```

Variable type: numeric

skim_variab	ole am n_m	issing co	mplete_rate	mean	sd	р0	p25	p50	p75	p100 hi	st
mpg	0	0	1	17.15	3.83	10.40	14.95	17.30	19.20	24.40 🕳	
mpg	1	0	1	24.39	6.17	15.00	21.00	22.80	30.40	33.90 🕳	
cyl	0	0	1	6.95	1.54	4.00	6.00	8.00	8.00	8.00 _	
cyl	1	0	1	5.08	1.55	4.00	4.00	4.00	6.00	8.00	L –
disp	0	0	1	290.38	110.17	120.10	196.30	275.80	360.00	472.00	
disp	1	0	1	143.53	87.20	71.10	79.00	120.30	160.00	351.00	
hp	0	0	1	160.26	53.91	62.00	116.50	175.00	192.50	245.00 🕳	
hp	1	0	1	126.85	84.06	52.00	66.00	109.00	113.00	335.00	
drat	0	0	1	3.29	0.39	2.76	3.07	3.15	3.70	3.92 🕳	
drat	1	0	1	4.05	0.36	3.54	3.85	4.08	4.22	4.93	
wt	0	0	1	3.77	0.78	2.46	3.44	3.52	3.84	5.42 _	

A. Summarizing variables – psych

library(psych) describe(mtcars)

```
##
                          sd median trimmed
                                               mad
                                                     min
                                                                 range skew
        vars
                 mean
                                                            max
          1 32
                                              5.41 10.40
## mpa
                20.09
                        6.03 19.20
                                      19.70
                                                          33.90
                                                                 23.50 0.61
## cvl
                                       6.23
                                              2.97 4.00
          2 32
                 6.19
                        1.79
                               6.00
                                                           8.00
                                                                  4.00 -0.17
## disp
          3 32 230.72 123.94 196.30
                                     222.52 140.48 71.10 472.00 400.90 0.38
## hp
          4 32 146.69
                       68.56 123.00
                                     141.19
                                             77.10 52.00 335.00 283.00 0.73
         5 32
                        0.53
                                              0.70 2.76
                                                           4.93
                                                                  2.17 0.27
## drat
                 3.60
                               3.70
                                       3.58
                 3.22
                        0.98
                               3.33
                                       3.15
## wt
          6 32
                                              0.77
                                                   1.51
                                                           5.42
                                                                  3.91 0.42
         7 32 17.85
                        1.79
                              17.71
                                      17.83
                                              1.42 14.50
                                                          22.90
                                                                  8.40 0.37
## qsec
          8 32
                 0.44
                        0.50
                               0.00
## vs
                                       0.42
                                              0.00
                                                    0.00
                                                           1.00
                                                                  1.00 0.24
## am
                        0.50
                               0.00
                                       0.38
                                                    0.00
                                                           1.00
                                                                  1.00 0.36
          9 32
                0.41
                                              0.00
        10 32 3.69
                                     3.62
                                              1.48
                                                    3.00
                                                           5.00
                                                                  2.00 0.53
## gear
                        0.74
                               4.00
## carb
         11 32
                 2.81
                        1.62
                               2.00
                                       2.65
                                              1.48 1.00
                                                           8.00
                                                                  7.00 1.05
##
       kurtosis
                   se
          -0.37 1.07
## mpg
          -1.76 0.32
## cyl
          -1.21 21.91
## disp
## hp
          -0.14 12.12
          -0.71 0.09
## drat
          -0.02 0.17
## wt
          0.34 0.32
## asec
          -2.00 0.09
## vs
          -1.92 0.09
## am
          -1.07 0.13
## gear
          1.26 0.29
## carb
```

A. Summarizing variables

Can also use subsets of variables

A. Summarizing variables

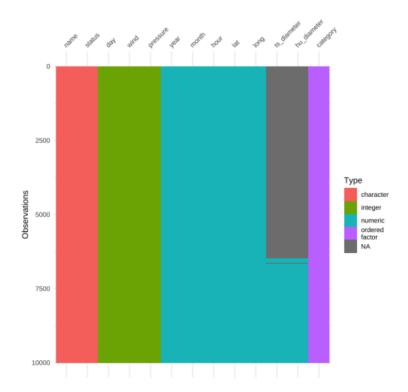
Or subsets of rows

```
mtcars %>% filter(str detect(row.names(mtcars), "Merc")) %>%
  describe()
##
                        sd median trimmed
       vars n
                mean
                                            mad
                                                   min
                                                          max range skew
## mpa
          1 7
               19.01 3.40 17.80
                                          2.08
                                                15.20
                                                                9.20 0.48
                                                        24.40
                                    19.01
## cyl
                6.29 1.80
                             6.00
                                     6.29 2.97
                                                  4.00
          2 7
                                                         8.00
                                                                4.00 - 0.22
                                   207.16 39.73 140.80 275.80 135.00 0.17
## disp
          3 7 207.16 64.97 167.60
## hp
          4 7 134.71 47.07 123.00
                                   134.71 84.51
                                                 62.00 180.00 118.00 -0.24
                3.52 0.43
                                     3.52 0.34
                                                  3.07
## drat
         5 7
                             3.69
                                                         3.92
                                                                0.85 - 0.15
## wt
               3.54 0.33
                                                         4.07
          6 7
                             3.44
                                     3.54
                                           0.43
                                                  3.15
                                                                0.92 0.23
               19.01
                     1.92
                                   19.01
                                           1.04
                                                        22.90
## asec
          7 7
                            18.30
                                                 17.40
                                                                5.50 1.03
                0.57 0.53
                                                                1.00 -0.23
## vs
          8 7
                             1.00
                                     0.57
                                          0.00
                                                  0.00
                                                         1.00
## am
                0.00 0.00
                                     0.00
                                          0.00
                                                  0.00
                                                         0.00
          9 7
                             0.00
                                                                0.00
                                                                      NaN
                3.57 0.53
                                     3.57
                                           0.00
                                                         4.00
         10 7
                             4.00
                                                  3.00
                                                                1.00 -0.23
## gear
## carb
                3.00 0.82
         11 7
                             3.00
                                     3.00
                                          1.48
                                                  2.00
                                                         4.00
                                                                2.00 0.00
##
       kurtosis
                   se
## mpg
          -1.59 1.28
          -1.90 0.68
## cyl
## disp
          -2.16 24.55
## hp
          -1.75 17.79
## drat
          -2.17 0.16
## wt
          -1.61 0.13
          -0.49 0.73
## asec
          -2.20 0.20
## vs
          NaN 0.00
## am
          -2.20 0.20
## gear
## carb
          -1.71 0.31
```

Another handy package is visdat: https://cran.r-
project.org/web/packages/visdat/vignettes/using_visdat.html

Lets you essentially visualize the sort of information you see in glimpse()

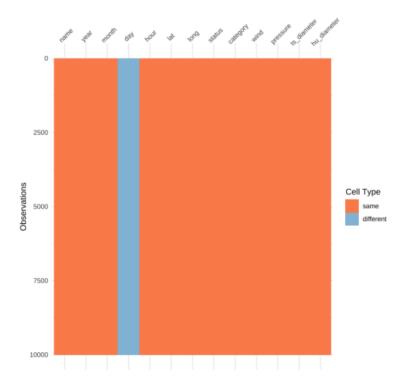
```
library(visdat)
vis_dat(storms)
```



Another useful function from visdat is vis_compare()

This lets you compare two data sets of the same size to see what's different

```
storms_2 <- storms %>% mutate(day = as.numeric(day))
vis_compare(storms, storms_2)
```



Correlations are something you'll probably want to look at.

Base R:

```
cor(mtcars)
                                 disp
##
                        cyl
## mpg
        1.0000000 - 0.8521620 - 0.8475514 - 0.7761684 0.68117191 - 0.8676594
## cyl -0.8521620 1.0000000 0.9020329 0.8324475 -0.69993811 0.7824958
## disp -0.8475514 0.9020329 1.0000000 0.7909486 -0.71021393 0.8879799
       -0.7761684 0.8324475 0.7909486 1.0000000 -0.44875912 0.6587479
## hp
## drat 0.6811719 -0.6999381 -0.7102139 -0.4487591 1.00000000 -0.7124406
      -0.8676594 0.7824958 0.8879799 0.6587479 -0.71244065 1.0000000
## gsec 0.4186840 -0.5912421 -0.4336979 -0.7082234 0.09120476 -0.1747159
        0.6640389 - 0.8108118 - 0.7104159 - 0.7230967 0.44027846 - 0.5549157
## vs
        0.5998324 -0.5226070 -0.5912270 -0.2432043 0.71271113 -0.6924953
## am
## gear 0.4802848 -0.4926866 -0.5555692 -0.1257043 0.69961013 -0.5832870
## carb -0.5509251 0.5269883 0.3949769 0.7498125 -0.09078980 0.4276059
##
              asec
                                              gear
                          VS
                                     am
        ## mpa
## cyl -0.59124207 -0.8108118 -0.52260705 -0.4926866 0.52698829
## disp -0.43369788 -0.7104159 -0.59122704 -0.5555692 0.39497686
## hp -0.70822339 -0.7230967 -0.24320426 -0.1257043 0.74981247
## drat 0.09120476 0.4402785 0.71271113 0.6996101 -0.09078980
      -0.17471588 -0.5549157 -0.69249526 -0.5832870 0.42760594
## gsec 1.00000000 0.7445354 -0.22986086 -0.2126822 -0.65624923
      0.74453544 1.0000000 0.16834512 0.2060233 -0.56960714
## vs
## am -0.22986086 0.1683451 1.00000000 0.7940588 0.05753435
## gear -0.21268223 0.2060233 0.79405876 1.0000000 0.27407284
## carb -0.65624923 -0.5696071 0.05753435 0.2740728 1.00000000
```

Base R:

Correlations are in a matrix object

```
storms %>%
  select if(is.numeric) %>%
  cor()
##
                                  month
                                                  dav
                                                               hour
                      vear
## vear
              1.000000000 -0.011488006 0.0183703369 0.0015741629 -0.121252667
              -0.011488006 1.000000000 -0.1830702018 -0.0051201358 -0.065922836
## month
               0.018370337 -0.183070202 1.0000000000
                                                       0.0007164624 -0.050859874
## day
               0.001574163 - 0.005120136 0.0007164624 1.0000000000 0.002682367
## hour
## lat
              -0.121252667 -0.065922836 -0.0508598742
                                                       0.0026823666
                                                                    1.000000000
              0.060387523  0.048382680  0.0406477301 -0.0091876627 -0.104014683
## long
         0.048966015 0.126682358 -0.0064971154 0.0018333102 0.076141764
## wind
## pressure
              -0.072615741 -0.134238300 -0.0010113895
                                                       0.0016030589 -0.103772744
## ts diameter
                        NA
                                     NA
                                                   NA
                                                                 NA
                                                                              NA
## hu diameter
                        NA
                                     NA
                                                                 NA
                      long
                                   wind
                                            pressure ts diameter hu diameter
              0.060387523 0.048966015 -0.072615741
## vear
## month
              0.048382680 0.126682358 -0.134238300
                                                              NA
                                                                          NA
## day
               0.040647730 -0.006497115 -0.001011389
                                                                          NA
                                                              NA
                                        0.001603059
## hour
              -0.009187663 0.001833310
                                                              NA
                                                                          NA
## lat
              -0.104014683 0.076141764 -0.103772744
                                                              NA
                                                                          NA
## long
              1.000000000 0.004737422 0.058467333
                                                              NA
                                                                          NA
              0.004737422 1.000000000 -0.942249266
## wind
                                                              NA
                                                                          NA
## pressure
               0.058467333 -0.942249266
                                        1.000000000
                                                              NA
                                                                          NA
## ts diameter
                        NA
                                                                          NA
                                     NA
                                                  NA
## hu diameter
                                                  NA
                                                              NA
                                                                           1
                        NA
                                     NA
```

Base R:

storms %>%

pressure

Correlations are in a matrix object

```
select if(is.numeric) %>%
  cor(use = "pairwise")
##
                                    month
                                                     dav
                                                                  hour
                       vear
## vear
        1.000000000 -0.011488006 0.0183703369 0.0015741629 -0.121252667
## month
               -0.011488006 1.000000000 -0.1830702018 -0.0051201358 -0.065922836
## day
              0.018370337 -0.183070202 1.0000000000
                                                         0.0007164624 -0.050859874
         0.001574163 -0.005120136 0.0007164624 1.000000000 0.002682367
## hour
         -0.121252667 -0.065922836 -0.0508598742 0.0026823666 1.000000000 0.060387523 0.048382680 0.0406477301 -0.0091876627 -0.104014683
## lat
## long
         ## wind
## pressure -0.072615741 -0.134238300 -0.0010113895 0.0016030589 -0.103772744
## ts diameter 0.021186700 0.139077211 0.0201075619 0.0085555295 0.300578521
## hu diameter -0.099658339 0.111651830 0.0338940169 0.0050504779 0.164416787
                                     wind
                                              pressure ts diameter hu diameter
                       long
             0.06038752\overline{3} 0.048966015 - 0.072615741 0.021186700 - 0.099658339
## vear
## month
          0.048382680 0.126682358 -0.134238300 0.139077211 0.111651830
           0.040647730 -0.006497115 -0.001011389 0.020107562 0.033894017 -0.009187663 0.001833310 0.001603059 0.008555529 0.005050478
## day
## hour
               -0.009187663  0.001833310  0.001603059  0.008555529  0.005050478
## lat
         -0.104014683 0.076141764 -0.103772744 0.300578521 0.164416787
          1.00000000 0.004737422 0.058467333 -0.014605508 -0.102351984 0.004737422 1.000000000 -0.942249266 0.639640594 0.773608569
## long
## wind
```

0.058467333 -0.942249266 1.000000000 -0.683340131 -0.842244047

```
corrr package - correlate()
```

Introduces a new data frame type for correlations

```
library(corrr)
correlate(mtcars)
```

```
## # A tibble: 11 x 12
     term
              mpa
                    cvl
                          disp
                                  hp
                                      drat
                                                wt
                                                      asec
                                                                      am
     <chr> <dbl> <dbl> <dbl> <dbl> <dbl> <dbl>
                                                    <dbl> <dbl>
                                                                   <dbl>
                 -0.852 - 0.848 - 0.776 0.681 - 0.868 0.419
                                                           0.664
   1 mpg
           NA
                                                                  0.600
                         0.902 0.832 -0.700 0.782 -0.591
                                                          -0.811 -0.523
   2 cvl
           -0.852 NA
                               0.791 -0.710 0.888 -0.434
   3 disp -0.848 0.902 NA
                                                          -0.710 -0.591
   4 hp
           -0.776 0.832 0.791 NA
                                     -0.449 0.659 -0.708 -0.723 -0.243
   5 drat 0.681 -0.700 -0.710 -0.449 NA
                                            -0.712 0.0912 0.440 0.713
                                                   -0.175 -0.555 -0.692
           -0.868 0.782 0.888 0.659 -0.712 NA
   6 wt.
   7 gsec 0.419 -0.591 -0.434 -0.708 0.0912 -0.175 NA
                                                           0.745 - 0.230
           0.664 -0.811 -0.710 -0.723 0.440 -0.555 0.745 NA
##
   8 vs
                                                                  0.168
  9 am
          0.600 -0.523 -0.591 -0.243 0.713 -0.692 -0.230
                                                          0.168 NA
## 10 gear 0.480 -0.493 -0.556 -0.126 0.700 -0.583 -0.213 0.206 0.794
## 11 carb -0.551 0.527 0.395 0.750 -0.0908 0.428 -0.656 -0.570 0.0575
## # ... with 2 more variables: gear <dbl>, carb <dbl>
```

corrr package - Adds some useful features: variable subsets

```
mtcars %>% correlate() %>%
focus(mpg, cyl, disp)
```

corrr package - Adds some useful features: neater print output

```
mtcars %>% correlate() %>%
  focus(mpg, cyl, disp) %>%
  fashion()

## term mpg cyl disp
## 1 hp -.78 .83 .79
## 2 drat .68 -.70 -.71
## 3 wt -.87 .78 .89
## 4 qsec .42 -.59 -.43
## 5 vs .66 -.81 -.71
## 6 am .60 -.52 -.59
## 7 gear .48 -.49 -.56
## 8 carb -.55 .53 .39
```

corrr package - Adds some useful features: visualizing correlations

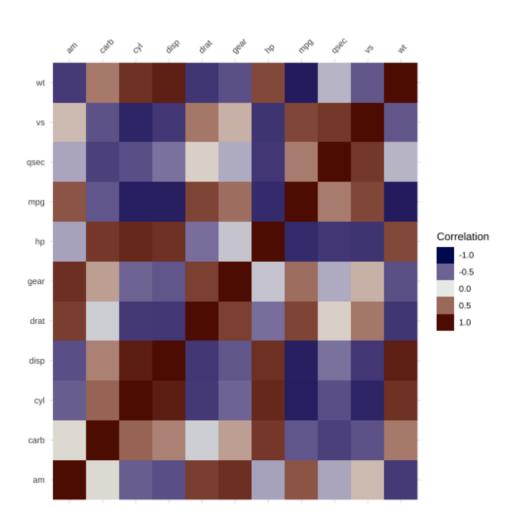
```
mtcars %>% correlate() %>%
  rplot()
```

corrr package - Adds some useful features: visualizing correlations

```
mtcars %>% correlate() %>%
  shave() %>%
  rplot()
```

visdat package does correlation heatmaps as well:

mtcars %>% vis cor()



We also can make some of this summary information neater for our Rmd documents

describe (mtcars)

```
##
                          sd median trimmed
                                                                 range skew
       vars
                 mean
                                               mad
                                                     min
                                                            max
## mpg
          1 32
                                                                 23.50
                20.09
                        6.03
                             19.20
                                      19.70
                                              5.41 10.40
                                                          33.90
                                                                       0.61
## cvl
                 6.19
                        1.79
                               6.00
                                       6.23
                                                   4.00
                                                           8.00
          2 32
                                              2.97
                                                                  4.00 -0.17
## disp
          3 32 230.72 123.94 196.30
                                     222.52 140.48 71.10 472.00 400.90 0.38
         4 32 146.69
                       68.56 123.00
                                     141.19
                                             77.10 52.00 335.00 283.00
## hp
## drat
                 3.60
                        0.53
                                       3.58
                                              0.70
        5 32
                               3.70
                                                   2.76
                                                           4.93
                                                                  2.17 0.27
          6 32
                 3.22
                        0.98
                               3.33
                                       3.15
                                              0.77 1.51
                                                           5.42
                                                                  3.91 0.42
## wt
               17.85
                        1.79
## asec
          7 32
                              17.71
                                      17.83
                                              1.42 14.50
                                                          22.90
                                                                  8.40 0.37
          8 32
                        0.50
                                              0.00
## vs
                0.44
                               0.00
                                      0.42
                                                    0.00
                                                           1.00
                                                                  1.00 0.24
          9 32
## am
                0.41
                        0.50
                               0.00
                                       0.38
                                              0.00
                                                    0.00
                                                           1.00
                                                                  1.00 0.36
                3.69
                        0.74
                               4.00
                                              1.48
                                                           5.00
                                                                  2.00 0.53
## gear
        10 32
                                       3.62
                                                    3.00
         11 32
                                              1.48 1.00
                                                                  7.00 1.05
## carb
                 2.81
                        1.62
                               2.00
                                       2.65
                                                           8.00
##
       kurtosis
                   se
          -0.37 1.07
## mpg
## cyl
         -1.76 0.32
          -1.21 21.91
## disp
          -0.14 12.12
## hp
## drat
          -0.71 0.09
          -0.02 0.17
## wt
          0.34 0.32
## asec
          -2.00 0.09
## vs
          -1.92 0.09
## am
## gear
          -1.07 0.13
          1.26 0.29
## carb
```

We also can make some of this summary information neater for our Rmd documents

```
library(knitr)
kable(describe(mtcars), digits = 2)
```

	vars	n	mean	sd	median	trimmed	mad	min	max	range	skew	kurtosis	se
mpg	1	32	20.09	6.03	19.20	19.70	5.41	10.40	33.90	23.50	0.61	-0.37	1.07
cyl	2	32	6.19	1.79	6.00	6.23	2.97	4.00	8.00	4.00	-0.17	-1.76	0.32
disp	3	32	230.72	123.94	196.30	222.52	140.48	71.10	472.00	400.90	0.38	-1.21	21.91
hp	4	32	146.69	68.56	123.00	141.19	77.10	52.00	335.00	283.00	0.73	-0.14	12.12
drat	5	32	3.60	0.53	3.70	3.58	0.70	2.76	4.93	2.17	0.27	-0.71	0.09
wt	6	32	3.22	0.98	3.33	3.15	0.77	1.51	5.42	3.91	0.42	-0.02	0.17
qsec	7	32	17.85	1.79	17.71	17.83	1.42	14.50	22.90	8.40	0.37	0.34	0.32
VS	8	32	0.44	0.50	0.00	0.42	0.00	0.00	1.00	1.00	0.24	-2.00	0.09
am	9	32	0.41	0.50	0.00	0.38	0.00	0.00	1.00	1.00	0.36	-1.92	0.09
gear	10	32	3.69	0.74	4.00	3.62	1.48	3.00	5.00	2.00	0.53	-1.07	0.13
carb	11	32	2.81	1.62	2.00	2.65	1.48	1.00	8.00	7.00	1.05	1.26	0.29

We also can make some of this summary information neater for our Rmd documents

```
cors <- mtcars %>% correlate() %>%
  focus(mpg, cyl, disp) %>%
  fashion()

cors

## term mpg cyl disp
## 1 hp -.78 .83 .79
## 2 drat .68 -.70 -.71
## 3 wt -.87 .78 .89
## 4 qsec .42 -.59 -.43
## 5 vs .66 -.81 -.71
## 6 am .60 -.52 -.59
## 7 gear .48 -.49 -.56
## 8 carb -.55 .53 .39
kable(cors)
```

term mpg cyl disp

```
    hp
    -.78
    .83
    .79

    drat
    .68
    -.70
    -.71

    wt
    -.87
    .78
    .89

    qsec
    .42
    -.59
    -.43

    vs
    .66
    -.81
    -.71

    am
    .60
    -.52
    -.59

    gear
    .48
    -.49
    -.56

    carb
    -.55
    .53
    .39
```

We can also do some additional customizing with kable()

```
kable(describe(mtcars), digits = 2, caption = "This is my summary table")
```

Table: This is my summary table

	vars	n	mean	sd	median	trimmed	mad	min	max	range	skew	kurtosis	se
mpg	1	32	20.09	6.03	19.20	19.70	5.41	10.40	33.90	23.50	0.61	-0.37	1.07
cyl	2	32	6.19	1.79	6.00	6.23	2.97	4.00	8.00	4.00	-0.17	-1.76	0.32
disp	3	32	230.72	123.94	196.30	222.52	140.48	71.10	472.00	400.90	0.38	-1.21	21.91
hp	4	32	146.69	68.56	123.00	141.19	77.10	52.00	335.00	283.00	0.73	-0.14	12.12
drat	5	32	3.60	0.53	3.70	3.58	0.70	2.76	4.93	2.17	0.27	-0.71	0.09
wt	6	32	3.22	0.98	3.33	3.15	0.77	1.51	5.42	3.91	0.42	-0.02	0.17
qsec	7	32	17.85	1.79	17.71	17.83	1.42	14.50	22.90	8.40	0.37	0.34	0.32
VS	8	32	0.44	0.50	0.00	0.42	0.00	0.00	1.00	1.00	0.24	-2.00	0.09
am	9	32	0.41	0.50	0.00	0.38	0.00	0.00	1.00	1.00	0.36	-1.92	0.09
gear	10	32	3.69	0.74	4.00	3.62	1.48	3.00	5.00	2.00	0.53	-1.07	0.13
carb	11	32	2.81	1.62	2.00	2.65	1.48	1.00	8.00	7.00	1.05	1.26	0.29

The kableExtra packages adds more customization options to kable()

```
library(kableExtra)
table <- kable(describe(mtcars), digits = 2, caption = "This is my summary table")
row_spec(table, 5, bold = TRUE, background = "yellow") %>%
footnote("only the highlighted row is important, but you can't have a table with just one row")
```

This is my summary table

	vars	n	mean	sd	median	trimmed	mad	min	max	range	skew	kurtosis	se
mpg	1	32	20.09	6.03	19.20	19.70	5.41	10.40	33.90	23.50	0.61	-0.37	1.07
cyl	2	32	6.19	1.79	6.00	6.23	2.97	4.00	8.00	4.00	-0.17	-1.76	0.32
disp	3	32	230.72	123.94	196.30	222.52	140.48	71.10	472.00	400.90	0.38	-1.21	21.91
hp	4	32	146.69	68.56	123.00	141.19	77.10	52.00	335.00	283.00	0.73	-0.14	12.12
drat	5	32	3.60	0.53	3.70	3.58	0.70	2.76	4.93	2.17	0.27	-0.71	0.09
wt	6	32	3.22	0.98	3.33	3.15	0.77	1.51	5.42	3.91	0.42	-0.02	0.17
qsec	7	32	17.85	1.79	17.71	17.83	1.42	14.50	22.90	8.40	0.37	0.34	0.32
VS	8	32	0.44	0.50	0.00	0.42	0.00	0.00	1.00	1.00	0.24	-2.00	0.09
am	9	32	0.41	0.50	0.00	0.38	0.00	0.00	1.00	1.00	0.36	-1.92	0.09
gear	10	32	3.69	0.74	4.00	3.62	1.48	3.00	5.00	2.00	0.53	-1.07	0.13
carb	11	32	2.81	1.62	2.00	2.65	1.48	1.00	8.00	7.00	1.05	1.26	0.29
Note.													

only the highlighted row is important, but you can't have a table with just one row

There are other packages that can customize tables for specific formats

the sjPlot package is particularly useful for producing orderly and nice looking output tables for different kinds of models.

Example: lm() summary output

```
library(sjPlot)
model <- lm(mpg ~ disp + cyl, data = mtcars)</pre>
```

Example: lm() print output

```
model <- lm(mpg ~ disp + cyl, data = mtcars)
model

##
## Call:
## lm(formula = mpg ~ disp + cyl, data = mtcars)
##
## Coefficients:
## (Intercept) disp cyl
## 34.66099 -0.02058 -1.58728</pre>
```

Example: lm() summary output

```
model <- lm(mpg ~ disp + cvl, data = mtcars)</pre>
summary(model)
##
## Call:
## lm(formula = mpg ~ disp + cyl, data = mtcars)
##
## Residuals:
      Min
           10 Median 30
                                     Max
## -4.4213 -2.1722 -0.6362 1.1899 7.0516
##
## Coefficients:
              Estimate Std. Error t value Pr(>|t|)
##
## (Intercept) 34.66099 2.54700 13.609 4.02e-14 ***
## disp
        -0.02058 0.01026 -2.007 0.0542.
           -1.58728 0.71184 -2.230 0.0337 *
## cvl
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
## Residual standard error: 3.055 on 29 degrees of freedom
## Multiple R-squared: 0.7596, Adjusted R-squared: 0.743
## F-statistic: 45.81 on 2 and 29 DF, p-value: 1.058e-09
```

Example: lm() sjPlots table output

```
model <- lm(mpg ~ disp + cyl, data = mtcars)
tab model(model)</pre>
```

		mpg	
Predictors	Estimates	CI	р
(Intercept)	34.66	29.45 — 39.87	<0.001
disp	-0.02	-0.04 - 0.00	0.054
cyl	-1.59	-3.04 — -0.13	0.034
Observations	32		
R ² / R ² adjusted	0.760 / 0	.743	

```
library(apaTables)
apa.cor.table(attitude)
apa.cor.table(attitude, filename="ex.CorTable1.doc")
```

Live coding

Let's head over to the following file for a demonstration: Week 8 demo

Feedback

We're at the middle of the semester

- 1. What should we keep doing?
- 2. What should we do more?
- 3. What should we do less?

Logistics

This week

- Homework 8: Available tomorrow by noon; **Due by Thursday, 3/18**
- Readings https://r4ds.had.co.nz/exploratory-data-analysis.html

Final Project

• Final project

Wrapping up

In your base group's Slack channel:

- What is one thing you learned today?
- What is something you want to learn more about?
- Share your feelings in GIF form!

We really appreciate being able to see these reactions and get this feedback!