Module 2: Reporting, Data Wrangling and Graphing (I)

Yaqi Shi

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Outline

We will review R, Rstudio, and Syntax of R together.

- LaTeX/Markdown
- Tidy data, processing (tidyverse)

LaTeX

LaTeX is most often used to produce technical or scientific documents, but it can be used for almost any form of publishing

Overleaf - an online, collaborative LaTeX editor

Windows: MiKTeX

Mac: TexShop

Basic Document Structure

- In the preamble: Documentclass, Packages
- In the front matter: Title/author
- In the body: Contents
- In the back matter: bibliography

In the Preamble

- Document classes: letter, article, report, book, slides(beamer, prosper)
 - \documentclass[12pt]{article}
 - Backslash at the beginning of text markup command
- Packages: numerous packages are available
 - \usepackage[margin=1in]{geometry}
 - \usepackage{setspace}
 - \usepackage{harvard}

In the Front Matter

- \begin{document}
- \title{}
- \author{}
- \maketitle
- \begin{abstract}
- \end{abstract}
- \pagebreak

In the Body

- To begin a new section
- \section{}
 - Similarly, \subsection{}, \subsubsection{}, \subsubsubsection{}
- \bullet LaTeX does automatic numbering. If you don't like it, use section $^*\{\}$
- \emph{}, \textbf{}
- \singlespacing, \doublespacing, \onehalfspacing
- \centering or \begin{centering} & \end{centering}

Footnotes/Quotes/Equations

- \footnote{}
- \begin{quote} & \end{quote}
- '', "'' for quotations
- Mathematical Equations
 - ullet Inline equation e.g. (α) returns α
 - Equation e.g. (\$\$e = mc^2\$\$) returns

$$e = mc^2$$

- Alternatively, \begin{equation} & \end{equation}
- \frac{}{}, \sqrt{}, \sum_{k=1}^{n}
- ^{}, _{}
- \greek letters (e.g. \alpha or \Alpha)

Citations

- \cite{bibtexkey}, citeyear{bibtexkey}
- It is more convenient to create a bibliography file, called bibtex file(.bib) and use it as needed.

Creating a Table

- \begin{table}[h]
- \caption{Summary of Conclusions from Diagnostic Tests}
- begin{tabular}{1111}
- \hline
- \hline
- & Macropartisanship & Consumer Sentiment & Presidential Approval\\
- \hline
 Joint F test & \$d=1\$ & \$d=1\$ & \$d=0\$\\
- Joint F test & \$d=1\$ & \$d=1\$ & \$d=0\$\\

 VR test & \$0<d\leq1\$ & \$d=1\$ & \$0<d\leq1\$ \\
- \hline
- \end{tabular}
- \end(table)

Table 1: Summary of Conclusions from Diagnostic Tests

	Macropartisanship	Consumer Sentiment	Presidential Approval
Joint F test	d = 1	d = 1	d = 0
VR test	$0 < d \le 1$	d = 1	$0 < d \le 1$

In the Back Matter

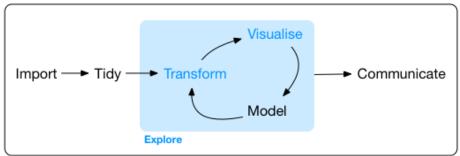
- Don't forget \bibliography{filename}
 - Make sure that the bibtex file is saved in the same location where the main tex file is saved.
- Don't forget \end{document}

Beamer

- \documentclass[pdf]{beamer}
- \modeentation>{}
- \title{The title}
- \subtitle{The subtitle}
- \author{your name}
- \begin{document}
- \begin{frame}{Frame title}
 - The body of the frame.
- \end{frame}
- \end{document}

Let's code!

Data science project workflow:



Program

Data import

```
df <- read.table("mtcars.txt", header = TRUE)
head(df) # Show the first 6 rows.</pre>
```

```
Cntry lper100k weight length
             19.8
                    2178
                         5.92
                    1026
## 2 Japan
              9.9
                         4.32
## 3
             10.8
                   1188
                         4.27
       US
                   1444 5.11
## 4
       US
             12.5
## 5
       US
             12.5
                    1485 5.03
## 6
             12.5
                         5.03
       US
                    1485
```

Tidy data

The goal is to clean the dataset so it is much easier to use.

Specifically,

- Each variable must have its own column.
- Each observation must have its own row.
- Each value must have its own cell.

We will focus on the functions from "tidyverse" package.

library(tidyverse)

Tidy data 1: pivoting

For a dataset having column names are not names of variables, but values of a variable, e.g.

table4a

- Need to change 1999, 2000 to a column named as "year".
- Need to change the values of 1999, 2000 as "cases".

We can use pivot_longer() from the "tidyverse" package.

Pivot longer

```
<chr>
                <chr> <dbl>
## 1 Afghanistan 1999
                       745
## 2 Afghanistan 2000
                     2666
## 3 Brazil
                1999
                      37737
## 4 Brazil
                2000
                      80488
## 5 China
               1999 212258
## 6 China
                2000 213766
```

Another example

```
table2 %>% head(5)
```

• case and population are two variables and should be converted into columns.

We can use pivot_wider().

Pivot wider

A tibble: 6 x 4

```
table2 %>%
  pivot_wider(names_from = type, values_from = count)
```

```
country
              year cases population
    <chr>
                <dbl> <dbl>
                                 <db1>
## 1 Afghanistan 1999
                       745
                            19987071
## 2 Afghanistan
                 2000
                       2666
                            20595360
## 3 Brazil
                       37737 172006362
                 1999
## 4 Brazil
                 2000
                       80488 174504898
## 5 China
                 1999 212258 1272915272
## 6 China
                 2000 213766 1280428583
```

Transform data

Use the "pipes" from the "tidyverse" package, a powerful tool for clearly expressing a sequence of multiple operations, with the combination of the following functions:

- select()
- filter()
- arrange()
- mutate()
- summarise()
- group_by()

Dataset - Diamonds

A dataset containing the prices and other attributes of almost 54,000 diamonds.

head(diamonds)

```
# A tibble: 6 x 10
                  color clarity depth table price
  carat cut
  <dbl> <ord>
                  <ord> <ord>
                                <dbl> <dbl> <dbl> <dbl> <dbl> <dbl> <dbl> <
   0.23 Ideal
                        SI2
                                 61.5
                                               326
                                                   3.95
                                                          3.98 2.43
   0.21 Premium
                        ST1
                                 59.8
                                               326
                                                   3.89
                                                          3.84
                                                               2.31
   0.23 Good
                        VS1
                                 56.9
                                              327
                                                   4.05
                                                          4.07
                                                               2.31
   0.29 Premium
                        VS2
                                 62.4
                                               334
                                                   4.2
                                                          4 23 2 63
   0.31 Good
                        SI2
                                 63.3
                                               335 4.34 4.35 2.75
   0.24 Very Good J
                        VVS2
                                 62.8
                                               336 3.94 3.96 2.48
```

Select

Use select() to get a column, e.g. "color"

```
diamonds %>%
  select(color) %>%
 head()
## # A tibble: 6 x 1
     color
     <ord>
## 2 E
## 3 E
## 5 J
## 6 J
# Equivalent to ...
head(diamonds$color)
```

Select

Use select() to remove a column, e.g. "color"

```
diamonds %>%
 select(-color)
## # A tibble: 53,940 x 9
                     clarity depth table price
      carat cut
      <dbl> <ord>
                    <ord>
                             <dbl> <dbl> <dbl> <dbl> <dbl> <dbl> <dbl> <
   1 0.23 Ideal
                     SI2
                              61.5
                                           326
                                                3.95
                                                     3.98
                                                           2.43
      0.21 Premium SI1
                              59.8
                                           326
                                                3.89
                                                      3.84 2.31
      0.23 Good
                    VS1
                              56.9
                                           327
                                                4.05
                                                      4.07 2.31
      0.29 Premium
                    VS2
                              62.4
                                           334
                                                4.2
                                                      4.23
                                                            2.63
      0.31 Good
                     ST2
                              63.3
                                      58
                                           335
                                                4.34
                                                      4.35
                                                           2.75
  6 0.24 Very Good VVS2
                              62.8
                                           336
                                                3.94
                                                      3.96 2.48
## 7 0.24 Very Good VVS1
                              62.3
                                           336
                                                3.95
                                                     3.98 2.47
      0.26 Very Good SI1
                              61.9
                                           337
                                               4.07 4.11 2.53
                                      55
   9 0.22 Fair
                     VS2
                              65.1
                                      61
                                           337
                                                3.87
                                                      3.78 2.49
## 10 0.23 Very Good VS1
                              59.4
                                      61
                                           338 4
                                                      4 05 2 39
## # i 53,930 more rows
# Need to assign the change to the original dataset, otherwise, the deletion won't affect the dataset.
diagmonds <- diamonds %>%
 select(-color)
```

Filter

Use filter() to filter by some condition, e.g. filter all price > 335

```
diamonds %>%
filter(price > 335)
```

```
## # A tibble: 53.935 x 10
                    color clarity depth table price
     carat cut
     <dbl> <ord>
                    <ord> <ord>
                                  <dbl> <dbl> <dbl> <dbl> <dbl> <dbl> <dbl>
   1 0.24 Very Good J
                          VVS2
                                   62.8
                                                336
                                                    3.94
                                                          3.96 2.48
   2 0.24 Very Good I
                         VVS1
                                   62.3
                                                336
                                                    3.95
                                                          3.98 2.47
## 3 0.26 Very Good H
                          SI1
                                   61.9
                                               337
                                                    4.07
                                                          4.11 2.53
  4 0.22 Fair
                          VS2
                                   65.1
                                                          3.78 2.49
                                           61
                                                337
                                                    3.87
   5 0.23 Very Good H
                          VS1
                                   59.4
                                                338
                                                          4.05 2.39
## 6
      0.3 Good
                          SI1
                                           55
                                               339 4.25
                                                          4.28 2.73
                                   64
## 7 0.23 Ideal
                          VS1
                                   62.8
                                           56
                                               340
                                                    3.93
                                                          3.9
                                                                2.46
      0.22 Premium F
                          SI1
                                   60.4
                                              342 3.88
                                                          3.84 2.33
## 9 0.31 Ideal
                          SI2
                                   62.2
                                           54 344 4.35 4.37 2.71
## 10 0.2 Premium
                          SI2
                                   60.2
                                           62
                                                345 3.79 3.75 2.27
## # i 53.925 more rows
```

Filters with multiple conditions

```
diamonds %>%
 filter(price > 335 & depth < 64)
## # A tibble: 51.849 x 10
##
      carat cut
                     color clarity depth table price
                                                        Х
      <dhl> <ord>
                     <ord> <ord>
                                   <dbl> <dbl> <dbl> <dbl> <dbl> <dbl> <dbl> <
##
                                    62.8
  1 0.24 Very Good J
                           VVS2
                                                 336
                                                     3.94 3.96 2.48
   2 0.24 Very Good I
                           VVS1
                                   62.3
                                                336
                                                    3.95
                                                           3.98 2.47
                                                337 4.07 4.11
##
   3 0.26 Very Good H
                           SI1
                                   61.9
                                           55
                                                                2.53
  4 0.23 Very Good H
                           VS1
                                    59.4
                                                338
                                                           4.05 2.39
                                           61
## 5 0.23 Ideal
                           VS1
                                   62.8
                                           56
                                                340 3.93
                                                           3.9
                                                                 2.46
  6 0.22 Premium
                           SI1
                                    60.4
                                                342
                                                    3.88
                                                           3.84 2.33
## 7 0.31 Ideal
                           SI2
                                    62.2
                                                 344
                                                    4.35
                                                          4.37 2.71
      0.2 Premium E
                           SI2
                                    60.2
                                           62
                                                 345
                                                     3.79 3.75 2.27
      0.32 Premium
                                           58
                                                345
                                                     4.38 4.42 2.68
                           I1
                                    60.9
## 10 0.3 Tdeal
                           SI2
                                    62
                                            54
                                                 348
                                                    4.31 4.34 2.68
## # i 51.839 more rows
diamonds %>%
 filter(cut == "Very Good" | cut == "Fair")
## # A tibble: 13,692 x 10
      carat cut
                     color clarity depth table price
     <dbl> <ord>
                     <ord> <ord>
                                   <dbl> <dbl> <dbl> <dbl> <dbl> <dbl> <dbl> <
##
                           VVS2
                                   62.8
                                           57
                                                336
                                                    3.94
                                                           3.96
                                                                 2.48
   1 0.24 Very Good J
   2 0.24 Very Good I
                           VVS1
                                   62.3
                                           57
                                                336
                                                    3.95
                                                           3.98 2.47
   3 0.26 Very Good H
                           SI1
                                   61.9
                                                337 4.07
                                                           4.11 2.53
      0.22 Fair
                           VS2
                                   65.1
                                                337
                                                     3.87
                                                           3.78 2.49
                                           61
   5 0.23 Very Good H
                           VS1
                                    59.4
                                           61
                                                338
                                                           4.05 2.39
   6 0.3 Very Good J
                           SI1
                                    62.7
                                            59
                                                351
                                                    4.21 4.27 2.66
## 7 0.23 Very Good E
                           VS2
                                    63.8
                                            55
                                                352
                                                    3.85
                                                          3.92 2.48
      0.23 Very Good H
                           VS1
                                    61
                                           57
                                                353
                                                     3.94
                                                           3.96 2.41
                                                353 4 39 4 43 2 62
     0.31 Very Good J
                           ST1
                                    59.4
                                            62
```

Filter after select

This is an example of "a sequence of operations".

```
diamonds %>%
  select(price) %>%
 filter(price > 335)
## # A tibble: 53,935 x 1
      price
      <int>
    1
        336
        336
        337
        337
        338
        339
        340
        342
        344
## 10
        345
## # i 53,925 more rows
```

Arrange

Use arrange() to order data.

```
diamonds %2% arrange(price)
```

```
## # A tibble: 53.940 x 10
      carat cut color clarity depth table price
                                                        Х
      <dbl> <ord> <ord> <ord>
                                   <dbl> <dbl> <dbl> <dbl> <dbl> <dbl> <dbl> <
   1 0.23 Ideal
                           SI2
                                    61.5
                                           55
                                                 326
                                                     3.95
                                                           3.98 2.43
      0.21 Premium
                           ST1
                                    59.8
                                           61
                                                326
                                                     3.89
                                                           3.84
                                                                 2.31
      0.23 Good
                           VS1
                                   56.9
                                                327
                                                     4.05
                                                           4.07 2.31
      0.29 Premium
                           VS2
                                    62.4
                                           58
                                                334
                                                     4.2
                                                           4.23 2.63
## 5 0.31 Good
                           SI2
                                    63.3
                                            58
                                                335
                                                     4.34
                                                          4.35 2.75
## 6 0.24 Very Good J
                           VVS2
                                   62.8
                                           57
                                                336
                                                     3.94
                                                           3.96 2.48
##
  7 0.24 Very Good I
                           VVS1
                                   62.3
                                                336
                                                     3.95
                                                           3.98 2.47
## 8 0.26 Very Good H
                           SI1
                                   61.9
                                                337 4.07 4.11 2.53
     0.22 Fair
## 9
                           VS2
                                   65.1
                                           61
                                                337
                                                     3.87
                                                           3.78 2.49
## 10 0.23 Very Good H
                           VS1
                                    59.4
                                           61
                                                338 4
                                                           4.05 2.39
## # i 53,930 more rows
```

Arrange descending order

e.g. from the cheapest!

```
diamonds %>%
arrange(-price)
```

```
## # A tibble: 53.940 x 10
     carat cut
                     color clarity depth table price
      <dbl> <ord>
                    <ord> <ord>
                                   <dbl> <dbl> <dbl> <dbl> <dbl> <dbl> <dbl>
   1 2 29 Premium
                           VS2
                                    60.8
                                           60 18823
                                                     8.5
                                                           8.47 5.16
           Very Good G
                           SI1
                                   63.5
                                           56 18818
                                                    7.9
                                                           7.97 5.04
      1.51 Ideal
                           TF
                                   61.7
                                           55 18806
                                                     7.37
                                                           7.41 4.56
      2.07 Ideal
                           SI2
                                   62.5
                                                     8.2
                                                           8.13 5.11
                                           55 18804
           Very Good H
                           SI1
                                   62.8
                                           57 18803
                                                     7.95
                                                                 5.01
      2.29 Premium
                           SI1
                                   61.8
                                           59 18797
                                                     8.52
                                                           8.45 5.24
      2.04 Premium
                           SI1
                                   58.1
                                           60 18795
                                                     8.37
                                                           8.28 4.84
           Premium
                           VS1
                                   60.8
                                           59 18795
                                                    8.13
                                                           8.02 4.91
      1.71 Premium
                           VS2
                                   62.3
                                           59 18791
                                                    7.57 7.53 4.7
## 10 2.15 Ideal
                           SI2
                                    62.6
                                           54 18791
                                                    8.29
                                                           8.35 5.21
## # i 53.930 more rows
```

Arrange by multiple conditions

```
diamonds %>%
  arrange(price, cut)
## # A tibble: 53,940 x 10
                      color clarity depth table price
      carat cut
      <dbl> <ord>
                      <ord> <ord>
                                    <dbl> <dbl> <dbl> <dbl> <dbl> <dbl> <dbl> <
    1 0.21 Premium
                            SI1
                                     59.8
                                             61
                                                  326
                                                       3.89
                                                             3.84
    2 0.23 Ideal
                      Ε
                            SI2
                                     61.5
                                                  326
                                                       3.95
                                                             3.98
                                                                   2.43
      0.23 Good
                            VS1
                                     56.9
                                                  327
                                                       4.05
                                                             4.07 2.31
      0.29 Premium
                            VS2
                                     62.4
                                                  334
                                                       4.2
                                                             4.23 2.63
      0.31 Good
                            SI2
                                     63.3
                                                  335
                                                       4.34
                                                             4.35 2.75
       0.24 Very Good J
                            VVS2
                                     62.8
                                                  336
                                                       3.94
                                                             3.96
                                                                   2.48
       0.24 Very Good I
                            VVS1
                                     62.3
                                                  336
                                                       3.95
                                                             3.98
                                                                   2.47
       0.22 Fair
                            VS2
                                     65.1
                                                  337
                                                       3.87
                                                             3.78
                                                                   2.49
                                             61
       0.26 Very Good H
                            SI1
                                     61.9
                                             55
                                                  337
                                                       4.07
                                                             4.11 2.53
      0.23 Very Good H
                            VS1
                                     59.4
                                             61
                                                  338 4
                                                             4.05 2.39
    i 53,930 more rows
```

Filter, select, arrange

```
diamonds %>%
  filter(table < 340) %>%
  select(carat, cut, price) %>%
  arrange(price, cut)
```

```
## # A tibble: 53,940 x 3
     carat cut
                    price
     <dbl> <ord>
                    <int>
  1 0.21 Premium
                      326
   2 0.23 Ideal
                    326
   3 0.23 Good
                    327
## 4 0.29 Premium
                      334
## 5 0.31 Good
                      335
  6 0.24 Very Good
                      336
  7 0.24 Very Good
                      336
  8 0.22 Fair
                      337
## 9 0.26 Very Good
                      337
## 10 0.23 Very Good
                      338
## # i 53,930 more rows
```

Mutate

Create new variables using mutate().

• Create a boolean variable, 0 = not affordable, 1 = affordable.

```
diamonds %>%
mutate(affordable = price < 400)
```

```
## # A tibble: 53,940 x 11
      carat cut
                      color clarity depth table price
                                                                       z affordable
                                                          х
      <dbl> <ord>
                    <ord> <ord>
                                    <dbl> <
  1 0.23 Ideal
                            SI2
                                     61.5
                                                       3.95 3.98
                                             55
                                                  326
                                                                    2.43 TRUE
   2 0.21 Premium
                                     59.8
                                                  326
                                                       3.89
                                                             3.84
                                                                   2.31 TRUE
                            SI1
                                             61
   3 0.23 Good
                            VS1
                                     56.9
                                                  327
                                                       4.05
                                                             4.07 2.31 TRUE
  4 0.29 Premium
                            VS2
                                     62.4
                                             58
                                                  334
                                                       4.2
                                                              4.23 2.63 TRUE
   5 0.31 Good
                            ST2
                                     63.3
                                             58
                                                  335
                                                       4.34
                                                             4.35
                                                                   2.75 TRUE
                                     62.8
   6 0.24 Very Good J
                            VVS2
                                                  336
                                                       3.94
                                                             3.96
                                                                   2.48 TRUE
  7 0.24 Very Good I
                            VVS1
                                     62.3
                                                  336
                                                        3.95
                                                              3.98
                                                                   2.47 TRUE
      0.26 Very Good H
                            ST1
                                     61.9
                                             55
                                                  337
                                                       4.07
                                                             4.11
                                                                   2.53 TRUE
## 9 0.22 Fair
                            VS2
                                     65.1
                      E
                                             61
                                                  337
                                                       3.87
                                                              3.78
                                                                   2.49 TRUE
## 10 0.23 Very Good H
                            VS1
                                     59.4
                                             61
                                                  338 4
                                                              4 05 2 39 TRUE
## # i 53.930 more rows
```

Mutate (cont'd)

diamonds %>%

Create a variable containing string with case_when():

```
mutate(affordable = case_when(price<400 ~ "affordable",
                               TRUE ~ "not affordable"))
## # A tibble: 53.940 x 11
     carat cut
                     color clarity depth table price
                                                                    z affordable
                                                        Х
      <dbl> <ord>
                    <ord> <ord>
                                   <dbl> <dbl> <dbl> <dbl> <dbl> <dbl> <dbl> <dbl> <dr>
##
  1 0.23 Ideal
                           SI2
                                    61.5
                                                 326
                                                    3.95 3.98 2.43 affordable
   2 0.21 Premium
                           SI1
                                    59.8
                                                326
                                                     3.89
                                                           3.84 2.31 affordable
##
   3 0.23 Good
                           VS1
                                    56.9
                                                327 4.05
                                                           4.07 2.31 affordable
   4 0.29 Premium
                           VS2
                                    62.4
                                                 334
                                                     4.2
                                                           4.23 2.63 affordable
## 5 0.31 Good
                           ST2
                                    63.3
                                                335
                                                    4.34
                                                           4.35 2.75 affordable
  6 0.24 Very Good J
                                    62.8
                                                           3.96 2.48 affordable
                           VVS2
                                                 336
                                                     3.94
## 7 0.24 Very Good I
                           VVS1
                                    62.3
                                                 336
                                                     3.95
                                                           3.98 2.47 affordable
```

8 0.26 Very Good H

10 0.23 Very Good H

i 53.930 more rows

9 0.22 Fair

SI1

VS2

VS1

61.9

65.1

59.4

337 3.87

338 4

61

61

337 4.07 4.11 2.53 affordable

3.78 2.49 affordable

4.05 2.39 affordable

Group by and Summarise

Use group_by and summarise to group variables:

```
diamonds %>%
  group_by(cut) %>%
  summarise(n = n())

## # A tibble: 5 x 2
## cut n
```

```
## a tibble: 5 x 2
## cut n
## <ord> <int>
## 1 Fair 1610
## 2 Good 4906
## 3 Very Good 12082
## 4 Premium 13791
## 5 Ideal 21551
```

More examples

<ord> <int>

1610

21551

3 Very Good 12082 3982.

1 Fair

2 Good

5 Ideal

4 Premium

<dbl>

3458.

4359.

4906 3929.

13791 4584.

```
diamonds %>%
  group_by(cut) %>%
  summarise(n = n(), price_avg = mean(price))

## # A tibble: 5 x 3
## cut n price_avg
```

Proportions

```
diamonds %>%
  group_by(cut) %>%
  summarise(n = n(), price_avg = mean(price)) %>%
  ungroup() %>%
  mutate(prop = n/sum(n))

## # A tibble: 5 x 4
```

```
## a title: 5 x 4
## cut n price_avg prop
## <ord> <int> <dbl> <dbl > 0.0298
## 1 Fair 1610 4359 0.0298
## 2 Good 4906 3929 0.0910
## 3 Very Good 12082 3982 0.224
## 4 Premium 13791 4584 0.256
## 5 Ideal 21551 3458 0.400
```

With percentage

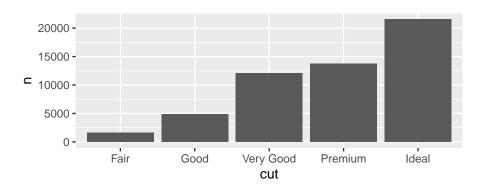
Use scales::percent() to add %.

```
diamonds %>%
  group_by(cut) %>%
  summarise(n = n(), price_avg = mean(price)) %>%
  ungroup() %>%
  mutate(prop = scales::percent(n/sum(n)))
```

```
## # A tibble: 5 x 4
    cut
                n price_avg prop
                      <dbl> <chr>
    <ord>
             <int>
## 1 Fair
            1610
                   4359. 3.0%
## 2 Good
             4906 3929. 9.1%
## 3 Very Good 12082 3982. 22.4%
## 4 Premium
             13791 4584, 25.6%
## 5 Ideal
             21551 3458, 40.0%
```

Graphing after transformation

```
diamonds %>%
  group_by(cut) %>%
  summarise(n = n(), price_avg = mean(price)) %>%
  ggplot() +
  geom_bar(aes(x = cut, y = n), stat = "identity")
```



Resources

This module is based on

- Brendan R. E. Ansell's "Introduction to R tidyverse" [link]
- Overleaf introduction to LaTeX (part 1) [link]
- Overleaf introduction to LaTeX (part 2) [link]
- Overleaf Tutorials [link]
- Introduction to R [link]
- Advanced R [link]