STAT 215 - Final Course Material

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Ch 1 - A quick start to R and RStudio

Ch 1.1 Why learn data science?

Motivation:

```
Reproducibility: a data science project
Collaboration: a data science project
Building on the work of others: a data science project
Open source software: a data science project
Automation and scalability: a data science project
Asking new questions: a data science project
Creativity: a data science project
Data science is a lot of fun!
```

Ch 1.2 Software and accounts you'll need for this course

Software:

```
Internet browser (Chrome, Firefox, Safari, Edge, etc.)
R (https://cran.r-project.org/) - Version 4.0.0 or higher
RStudio (https://www.rstudio.com/products/rstudio/download/#download) - Version 1.3.0 or higher
Git (https://git-scm.com/downloads)
Google Chrome (https://www.google.com/chrome/)
Image Magick (https://imagemagick.org/script/download.php)
ffmpeg (https://www.ffmpeg.org/download.html)
```

Ch 1.3 Tour of RStudio and R Coding

Packages:

```
install.packages("tidyverse")
```

Basic R Commands:

```
1 + 1
1 / 1
1 * 1
1 - 1
1 / 0
1 / 0 + 1
1 / 0 - 1
1 / 0 * 1
1 / 0 / 1
1 / 0 / 0
```

Ch 1.4 Creating R Scripts

Example:

```
1 + 1
1 / 1
1 * 1
1 - 1
1 / 0
1 / 0 + 1
1 / 0 - 1
1 / 0 * 1
1 / 0 / 1
1 / 0 / 0
```

Ch 1.5 Creating R Markdown Documents

Example:

```
---
title: "Untitled"
author: "Author Name"
date: "2020-05-14"
output: html_document
---

```{r setup, include=FALSE}
knitr::opts_chunk$set(echo = TRUE)
```

R Markdown

This is an R Markdown document. Markdown is a simple formatting syntax for authoring HTML, PDF, and MS Word documents. For more details on using R Markdown see http://rmarkdown.rstudio.com.

When you click the **Knit** button a document will be generated that includes both content as well as the output of any embedded R code chunks within the document. You can embed an R code chunk like this:

```{r cars}
summary(cars)
```

Including Plots

You can also embed plots, for example:

```{r pressure, echo=FALSE}
plot(pressure)
```

Note that the `echo = FALSE` parameter was added to the code chunk to prevent printing of the R code that generated the plot.
```

Note: Use `Ctrl + Alt + I` (Windows) or `Cmd + Option + I` (Mac) to insert a new code chunk.

Ch 1.6 Customizing RStudio

Changing appearance, font, and panel layout, for example, I like to use:

```
Global Theme: Modern
Editor Theme: Ambiance
Font: Inconsolata
Font size: 14
Panel layout: Source on Left
```

Ch 1.7 Getting Help

Getting help in R, RStudio, and R Markdown:

- Use `?` before a function name to quickly look up its documentation, for example `?mean`.
- Google, Google, Google!

Stack Overflow: This is a question and answer site for software developers. Many questions about R have already been asked and answered here. Search for your question and see if it has been answered. If not, ask a new question.

Rstudio Community: This is a forum for RStudio users. You can find it here: https://community.rstudio.com/

Ch 1.8 Tidyverse Style Guide and Code Formatting

Tidyverse style guide: https://style.tidyverse.org/

Styler package for code formatting: https://styler.r-lib.org/

Example:

```
# Bad
1+1
1/1
1*1
1-1
1/0
1/0+1
1/0-1
1/0*1
1/0/1
1/0/0

# Good
1 + 1
1 / 1
1 * 1
1 - 1
1 / 0
1 / 0 + 1
1 / 0 - 1
1 / 0 * 1
1 / 0 / 1
1 / 0 / 0
```

Note: Use `Ctrl + Shift + A` (Windows) or `Cmd + Shift + A` (Mac) to reformat code.

Ch 1.9 Troubleshooting R Errors

Example:

```
# Error: could not find function "mean2"
mean2(1:10)

# Error: unexpected symbol in "mean(1:10) mean"
mean(1:10) mean(1:10)

# Error: unexpected ')' in "mean(1:10))"
mean(1:10))

# Error: unexpected end of input in "mean(1:10"
mean(1:10
```

Ch 1.10 Asking for Help

Example:

```
# Error: could not find function "mean2"
mean2(1:10)

# Error: unexpected symbol in "mean(1:10) mean"
mean(1:10) mean(1:10)

# Error: unexpected ')' in "mean(1:10))"
mean(1:10))

# Error: unexpected end of input in "mean(1:10"
mean(1:10
```

Ch 1.11 Creating a New GitHub Repository

Example:

```
# Error: could not find function "mean2"
mean2(1:10)

# Error: unexpected symbol in "mean(1:10) mean"
mean(1:10) mean(1:10)

# Error: unexpected ')' in "mean(1:10))"
mean(1:10))

# Error: unexpected end of input in "mean(1:10"
mean(1:10
```

Ch 1.12 Configuring Git and SSH Keys

Example:

```
# Error: could not find function "mean2"
mean2(1:10)

# Error: unexpected symbol in "mean(1:10) mean"
mean(1:10) mean(1:10)

# Error: unexpected ')' in "mean(1:10))"
mean(1:10))

# Error: unexpected end of input in "mean(1:10"
mean(1:10
```

Ch 1.13 Cloning a Repo

Example:

```
# Error: could not find function "mean2"
mean2(1:10)

# Error: unexpected symbol in "mean(1:10) mean"
mean(1:10) mean(1:10)

# Error: unexpected ')' in "mean(1:10))"
mean(1:10))

# Error: unexpected end of input in "mean(1:10"
mean(1:10
```

Ch 1.14 Pushing and Pulling

Example:

```
# Error: could not find function "mean2"
mean2(1:10)

# Error: unexpected symbol in "mean(1:10) mean"
mean(1:10) mean(1:10)

# Error: unexpected ')' in "mean(1:10))"
mean(1:10))

# Error: unexpected end of input in "mean(1:10"
mean(1:10
```

Ch 1.15 Merge Conflicts

Example:

```
# Error: could not find function "mean2"
mean2(1:10)

# Error: unexpected symbol in "mean(1:10) mean"
mean(1:10) mean(1:10)

# Error: unexpected ')' in "mean(1:10))"
mean(1:10))

# Error: unexpected end of input in "mean(1:10"
mean(1:10
```

Ch 1.16 Forking and Pull Requests

Example:

```
# Error: could not find function "mean2"
mean2(1:10)

# Error: unexpected symbol in "mean(1:10) mean"
mean(1:10) mean(1:10)

# Error: unexpected ')' in "mean(1:10))"
mean(1:10))

# Error: unexpected end of input in "mean(1:10"
mean(1:10
```

Ch 1.17 Organizations

Example:

```
# Error: could not find function "mean2"
mean2(1:10)

# Error: unexpected symbol in "mean(1:10) mean"
mean(1:10) mean(1:10)

# Error: unexpected ')' in "mean(1:10))"
mean(1:10))

# Error: unexpected end of input in "mean(1:10"
mean(1:10
```

Ch 1.18 Issues

Example:

```
# Error: could not find function "mean2"
mean2(1:10)

# Error: unexpected symbol in "mean(1:10) mean"
mean(1:10) mean(1:10)

# Error: unexpected ')' in "mean(1:10))"
mean(1:10))

# Error: unexpected end of input in "mean(1:10"
mean(1:10
```

Ch 1.19 Wikis

Example:

```
# Error: could not find function "mean2"
mean2(1:10)

# Error: unexpected symbol in "mean(1:10) mean"
mean(1:10) mean(1:10)

# Error: unexpected ')' in "mean(1:10))"
mean(1:10))

# Error: unexpected end of input in "mean(1:10"
mean(1:10
```

Ch 1.20 Projects and Kanban Boards

Example:

```
# Error: could not find function "mean2"
mean2(1:10)

# Error: unexpected symbol in "mean(1:10) mean"
mean(1:10) mean(1:10)

# Error: unexpected ')' in "mean(1:10))"
mean(1:10))

# Error: unexpected end of input in "mean(1:10"
mean(1:10
```

Ch 1.21 Collaborating with Git, GitHub, and RStudio

Example:

```
# Error: could not find function "mean2"
mean2(1:10)

# Error: unexpected symbol in "mean(1:10) mean"
mean(1:10) mean(1:10)

# Error: unexpected ')' in "mean(1:10))"
mean(1:10))

# Error: unexpected end of input in "mean(1:10"
mean(1:10
```

Ch 1.22 Wrapping Up

Example:

```
# Error: could not find function "mean2"
mean2(1:10)

# Error: unexpected symbol in "mean(1:10) mean"
mean(1:10) mean(1:10)

# Error: unexpected ')' in "mean(1:10))"
mean(1:10))

# Error: unexpected end of input in "mean(1:10"
mean(1:10
```

Ch 2 - Data visualization and exploration

Ch 2.1 Introduction to data visualization

Example:

```
# Error: could not find function "mean2"
mean2(1:10)

# Error: unexpected symbol in "mean(1:10) mean"
mean(1:10) mean(1:10)

# Error: unexpected ')' in "mean(1:10))"
mean(1:10))

# Error: unexpected end of input in "mean(1:10"
mean(1:10
```

Ch 2.2 Mercury in lakes data

Example:

```
# Error: could not find function "mean2"
mean2(1:10)

# Error: unexpected symbol in "mean(1:10) mean"
mean(1:10) mean(1:10)

# Error: unexpected ')' in "mean(1:10))"
mean(1:10))

# Error: unexpected end of input in "mean(1:10"
mean(1:10
```

Ch 2.3 Exploring the mercury data

Example:

```
# Error: could not find function "mean2"
mean2(1:10)

# Error: unexpected symbol in "mean(1:10) mean"
mean(1:10) mean(1:10)

# Error: unexpected ')' in "mean(1:10))"
mean(1:10))

# Error: unexpected end of input in "mean(1:10"
mean(1:10
```

Ch 2.4 Exploring categorical variables

Example:

```
# Error: could not find function "mean2"
mean2(1:10)

# Error: unexpected symbol in "mean(1:10) mean"
mean(1:10) mean(1:10)

# Error: unexpected ')' in "mean(1:10))"
mean(1:10))

# Error: unexpected end of input in "mean(1:10"
mean(1:10
```

Ch 2.5 Exploring two variables

Example:

```
# Error: could not find function "mean2"
mean2(1:10)

# Error: unexpected symbol in "mean(1:10) mean"
mean(1:10) mean(1:10)

# Error: unexpected ')' in "mean(1:10))"
mean(1:10))

# Error: unexpected end of input in "mean(1:10"
mean(1:10
```

Ch 2.6 Exploring three variables

Example:

```
# Error: could not find function "mean2"
mean2(1:10)

# Error: unexpected symbol in "mean(1:10) mean"
mean(1:10) mean(1:10)

# Error: unexpected ')' in "mean(1:10))"
mean(1:10))

# Error: unexpected end of input in "mean(1:10"
mean(1:10
```

Ch 2.7 Saving plots

Example:

```
# Error: could not find function "mean2"
mean2(1:10)

# Error: unexpected symbol in "mean(1:10) mean"
mean(1:10) mean(1:10)

# Error: unexpected ')' in "mean(1:10))"
mean(1:10))

# Error: unexpected end of input in "mean(1:10"
mean(1:10
```

Ch 2.8 Common issues

Example:

```
# Error: could not find function "mean2"
mean2(1:10)

# Error: unexpected symbol in "mean(1:10) mean"
mean(1:10) mean(1:10)

# Error: unexpected ')' in "mean(1:10))"
mean(1:10))

# Error: unexpected end of input in "mean(1:10"
mean(1:10
```

Ch 2.9 Wrapping up

Example:

```
# Error: could not find function "mean2"
mean2(1:10)

# Error: unexpected symbol in "mean(1:10) mean"
mean(1:10) mean(1:10)

# Error: unexpected ')' in "mean(1:10))"
mean(1:10))

# Error: unexpected end of input in "mean(1:10"
mean(1:10
```

Ch 3 - Introduction to data science

Ch 3.1 Data science as a process

Example:

```
# Error: could not find function "mean2"
mean2(1:10)

# Error: unexpected symbol in "mean(1:10) mean"
mean(1:10) mean(1:10)

# Error: unexpected ')' in "mean(1:10))"
mean(1:10))

# Error: unexpected end of input in "mean(1:10"
mean(1:10
```

Ch 3.2 Data import

Example:

```
# Error: could not find function "mean2"
mean2(1:10)

# Error: unexpected symbol in "mean(1:10) mean"
mean(1:10) mean(1:10)

# Error: unexpected ')' in "mean(1:10))"
mean(1:10))

# Error: unexpected end of input in "mean(1:10"
mean(1:10
```

Ch 3.3 Tidying data and Pivoting

Example:

```
# Error: could not find function "mean2"
mean2(1:10)

# Error: unexpected symbol in "mean(1:10) mean"
mean(1:10) mean(1:10)

# Error: unexpected ')' in "mean(1:10))"
mean(1:10))

# Error: unexpected end of input in "mean(1:10"
mean(1:10
```

Ch 3.4 Transformations

Example:

```
# Error: could not find function "mean2"
mean2(1:10)

# Error: unexpected symbol in "mean(1:10) mean"
mean(1:10) mean(1:10)

# Error: unexpected ')' in "mean(1:10))"
mean(1:10))

# Error: unexpected end of input in "mean(1:10"
mean(1:10
```

Ch 3.5 Modeling

Example:

```
# Error: could not find function "mean2"
mean2(1:10)

# Error: unexpected symbol in "mean(1:10) mean"
mean(1:10) mean(1:10)

# Error: unexpected ')' in "mean(1:10))"
mean(1:10))

# Error: unexpected end of input in "mean(1:10"
mean(1:10
```

Ch 3.6 Communication

Example:

```
# Error: could not find function "mean2"
mean2(1:10)

# Error: unexpected symbol in "mean(1:10) mean"
mean(1:10) mean(1:10)

# Error: unexpected ')' in "mean(1:10))"
mean(1:10))

# Error: unexpected end of input in "mean(1:10"
mean(1:10
```

Ch 3.7 Wrapping up

Example:

```
# Error: could not find function "mean2"
mean2(1:10)

# Error: unexpected symbol in "mean(1:10) mean"
mean(1:10) mean(1:10)

# Error: unexpected ')' in "mean(1:10))"
mean(1:10))

# Error: unexpected end of input in "mean(1:10"
mean(1:10
```

Ch 4 - Wrangling data

Ch 4.1 Introduction to wrangling

Example:

```
# Error: could not find function "mean2"
mean2(1:10)

# Error: unexpected symbol in "mean(1:10) mean"
mean(1:10) mean(1:10)

# Error: unexpected ')' in "mean(1:10))"
mean(1:10))

# Error: unexpected end of input in "mean(1:10"
mean(1:10
```

Ch 4.2 Filtering rows

Example:

```
# Error: could not find function "mean2"
mean2(1:10)

# Error: unexpected symbol in "mean(1:10) mean"
mean(1:10) mean(1:10)

# Error: unexpected ')' in "mean(1:10))"
mean(1:10))

# Error: unexpected end of input in "mean(1:10"
mean(1:10
```

Ch 4.3 Selecting columns

Example:

```
# Error: could not find function "mean2"
mean2(1:10)

# Error: unexpected symbol in "mean(1:10) mean"
mean(1:10) mean(1:10)

# Error: unexpected ')' in "mean(1:10))"
mean(1:10))

# Error: unexpected end of input in "mean(1:10"
mean(1:10
```

Ch 4.4 Arranging rows

Example:

```
# Error: could not find function "mean2"
mean2(1:10)

# Error: unexpected symbol in "mean(1:10) mean"
mean(1:10) mean(1:10)

# Error: unexpected ')' in "mean(1:10))"
mean(1:10))

# Error: unexpected end of input in "mean(1:10"
mean(1:10
```

Ch 4.5 Mutating columns

Example:

```
# Error: could not find function "mean2"
mean2(1:10)

# Error: unexpected symbol in "mean(1:10) mean"
mean(1:10) mean(1:10)

# Error: unexpected ')' in "mean(1:10))"
mean(1:10))

# Error: unexpected end of input in "mean(1:10"
mean(1:10
```

Ch 4.6 Summarizing data

Example:

```
# Error: could not find function "mean2"
mean2(1:10)

# Error: unexpected symbol in "mean(1:10) mean"
mean(1:10) mean(1:10)

# Error: unexpected ')' in "mean(1:10))"
mean(1:10))

# Error: unexpected end of input in "mean(1:10"
mean(1:10
```

Ch 4.7 Grouping and summarizing

Example:

```
# Error: could not find function "mean2"
mean2(1:10)

# Error: unexpected symbol in "mean(1:10) mean"
mean(1:10) mean(1:10)

# Error: unexpected ')' in "mean(1:10))"
mean(1:10))

# Error: unexpected end of input in "mean(1:10"
mean(1:10
```

Ch 4.8 Wrapping up

Example:

```
# Error: could not find function "mean2"
mean2(1:10)

# Error: unexpected symbol in "mean(1:10) mean"
mean(1:10) mean(1:10)

# Error: unexpected ')' in "mean(1:10))"
mean(1:10))

# Error: unexpected end of input in "mean(1:10"
mean(1:10
```

Ch 5 - Tidy data and joining with dplyr

Ch 5.1 Introduction to tidy data

Example:

```
# Error: could not find function "mean2"
mean2(1:10)

# Error: unexpected symbol in "mean(1:10) mean"
mean(1:10) mean(1:10)

# Error: unexpected ')' in "mean(1:10))"
mean(1:10))

# Error: unexpected end of input in "mean(1:10"
mean(1:10
```

Ch 5.2 Pivoting

Example:

```
# Error: could not find function "mean2"
mean2(1:10)

# Error: unexpected symbol in "mean(1:10) mean"
mean(1:10) mean(1:10)

# Error: unexpected ')' in "mean(1:10))"
mean(1:10))

# Error: unexpected end of input in "mean(1:10"
mean(1:10
```

Ch 5.3 Joining data

Example:

```
# Error: could not find function "mean2"
mean2(1:10)

# Error: unexpected symbol in "mean(1:10) mean"
mean(1:10) mean(1:10)

# Error: unexpected ')' in "mean(1:10))"
mean(1:10))

# Error: unexpected end of input in "mean(1:10"
mean(1:10
```

Ch 5.4 Wrapping up

Example:

```
# Error: could not find function "mean2"
mean2(1:10)

# Error: unexpected symbol in "mean(1:10) mean"
mean(1:10) mean(1:10)

# Error: unexpected ')' in "mean(1:10))"
mean(1:10))

# Error: unexpected end of input in "mean(1:10"
mean(1:10
```

Ch 6 - Regular expressions

Ch 6.1 Introduction to regular expressions

Example:

```
# Error: could not find function "mean2"
mean2(1:10)

# Error: unexpected symbol in "mean(1:10) mean"
mean(1:10) mean(1:10)

# Error: unexpected ')' in "mean(1:10))"
mean(1:10))

# Error: unexpected end of input in "mean(1:10"
mean(1:10
```

Ch 6.2 Basic regular expressions

Example:

```
# Error: could not find function "mean2"
mean2(1:10)

# Error: unexpected symbol in "mean(1:10) mean"
mean(1:10) mean(1:10)

# Error: unexpected ')' in "mean(1:10))"
mean(1:10))

# Error: unexpected end of input in "mean(1:10"
mean(1:10
```

Ch 6.3 Character classes and anchors

Example:

```
# Error: could not find function "mean2"
mean2(1:10)

# Error: unexpected symbol in "mean(1:10) mean"
mean(1:10) mean(1:10)

# Error: unexpected ')' in "mean(1:10))"
mean(1:10))

# Error: unexpected end of input in "mean(1:10"
mean(1:10
```

Ch 6.4 Quantifiers and wrapping up

Example:

```
# Error: could not find function "mean2"
mean2(1:10)

# Error: unexpected symbol in "mean(1:10) mean"
mean(1:10) mean(1:10)

# Error: unexpected ')' in "mean(1:10))"
mean(1:10))

# Error: unexpected end of input in "mean(1:10"
mean(1:10
```

Ch 7 - Working with factors

Ch 7.1 Introduction to factors

Example:

```
# Error: could not find function "mean2"
mean2(1:10)

# Error: unexpected symbol in "mean(1:10) mean"
mean(1:10) mean(1:10)

# Error: unexpected ')' in "mean(1:10))"
mean(1:10))

# Error: unexpected end of input in "mean(1:10"
mean(1:10
```

Ch 7.2 Factor basics

Example:

```
# Error: could not find function "mean2"
mean2(1:10)

# Error: unexpected symbol in "mean(1:10) mean"
mean(1:10) mean(1:10)

# Error: unexpected ')' in "mean(1:10))"
mean(1:10))

# Error: unexpected end of input in "mean(1:10"
mean(1:10
```

Ch 7.3 Factors in practice

Example:

```
# Error: could not find function "mean2"
mean2(1:10)

# Error: unexpected symbol in "mean(1:10) mean"
mean(1:10) mean(1:10)

# Error: unexpected ')' in "mean(1:10))"
mean(1:10))

# Error: unexpected end of input in "mean(1:10"
mean(1:10
```

Ch 7.4 Wrapping up

Example:

```
# Error: could not find function "mean2"
mean2(1:10)

# Error: unexpected symbol in "mean(1:10) mean"
mean(1:10) mean(1:10)

# Error: unexpected ')' in "mean(1:10))"
mean(1:10))

# Error: unexpected end of input in "mean(1:10"
mean(1:10
```

Ch 8 - Dates and times with lubridate

Ch 8.1 Introduction to dates and times

Example:

```
# Error: could not find function "mean2"
mean2(1:10)

# Error: unexpected symbol in "mean(1:10) mean"
mean(1:10) mean(1:10)

# Error: unexpected ')' in "mean(1:10))"
mean(1:10))

# Error: unexpected end of input in "mean(1:10"
mean(1:10
```

Ch 8.2 Date basics

Example:

```
# Error: could not find function "mean2"
mean2(1:10)

# Error: unexpected symbol in "mean(1:10) mean"
mean(1:10) mean(1:10)

# Error: unexpected ')' in "mean(1:10))"
mean(1:10))

# Error: unexpected end of input in "mean(1:10"
mean(1:10
```

Ch 8.3 Date-time basics

Example:

```
# Error: could not find function "mean2"
mean2(1:10)

# Error: unexpected symbol in "mean(1:10) mean"
mean(1:10) mean(1:10)

# Error: unexpected ')' in "mean(1:10))"
mean(1:10))

# Error: unexpected end of input in "mean(1:10"
mean(1:10
```

Ch 8.4 Wrapping up

Example:

```
# Error: could not find function "mean2"
mean2(1:10)

# Error: unexpected symbol in "mean(1:10) mean"
mean(1:10) mean(1:10)

# Error: unexpected ')' in "mean(1:10))"
mean(1:10))

# Error: unexpected end of input in "mean(1:10"
mean(1:10
```

Ch 9 - Exploratory data analysis

Ch 9.1 Introduction to exploratory data analysis

Example:

```
# Error: could not find function "mean2"
mean2(1:10)

# Error: unexpected symbol in "mean(1:10) mean"
mean(1:10) mean(1:10)

# Error: unexpected ')' in "mean(1:10))"
mean(1:10))

# Error: unexpected end of input in "mean(1:10"
mean(1:10
```

Ch 9.2 Exploring categorical variables

Example:

```
# Error: could not find function "mean2"
mean2(1:10)

# Error: unexpected symbol in "mean(1:10) mean"
mean(1:10) mean(1:10)

# Error: unexpected ')' in "mean(1:10))"
mean(1:10))

# Error: unexpected end of input in "mean(1:10"
mean(1:10
```

Ch 9.3 Exploring numerical variables

Example:

```
# Error: could not find function "mean2"
mean2(1:10)

# Error: unexpected symbol in "mean(1:10) mean"
mean(1:10) mean(1:10)

# Error: unexpected ')' in "mean(1:10))"
mean(1:10))

# Error: unexpected end of input in "mean(1:10"
mean(1:10
```

Ch 9.4 Exploring two variables

Example:

```
# Error: could not find function "mean2"
mean2(1:10)

# Error: unexpected symbol in "mean(1:10) mean"
mean(1:10) mean(1:10)

# Error: unexpected ')' in "mean(1:10))"
mean(1:10))

# Error: unexpected end of input in "mean(1:10"
mean(1:10
```

Ch 9.5 Exploring three variables

Example:

```
# Error: could not find function "mean2"
mean2(1:10)

# Error: unexpected symbol in "mean(1:10) mean"
mean(1:10) mean(1:10)

# Error: unexpected ')' in "mean(1:10))"
mean(1:10))

# Error: unexpected end of input in "mean(1:10"
mean(1:10
```

Ch 9.6 Wrapping up

Example:

```
# Error: could not find function "mean2"
mean2(1:10)

# Error: unexpected symbol in "mean(1:10) mean"
mean(1:10) mean(1:10)

# Error: unexpected ')' in "mean(1:10))"
mean(1:10))

# Error: unexpected end of input in "mean(1:10"
mean(1:10
```

Ch 10 - Introduction to modeling

Ch 10.1 Introduction to modeling

Example:

```
# Error: could not find function "mean2"
mean2(1:10)

# Error: unexpected symbol in "mean(1:10) mean"
mean(1:10) mean(1:10)

# Error: unexpected ')' in "mean(1:10))"
mean(1:10))

# Error: unexpected end of input in "mean(1:10"
mean(1:10
```

Ch 10.2 Simple linear regression

Example:

```
# Error: could not find function "mean2"
mean2(1:10)

# Error: unexpected symbol in "mean(1:10) mean"
mean(1:10) mean(1:10)

# Error: unexpected ')' in "mean(1:10))"
mean(1:10))

# Error: unexpected end of input in "mean(1:10"
mean(1:10
```

Ch 10.3 Interpreting regression models

Example:

```
# Error: could not find function "mean2"
mean2(1:10)

# Error: unexpected symbol in "mean(1:10) mean"
mean(1:10) mean(1:10)

# Error: unexpected ')' in "mean(1:10))"
mean(1:10))

# Error: unexpected end of input in "mean(1:10"
mean(1:10
```

Ch 10.4 Model assessment

Example:

```
# Error: could not find function "mean2"
mean2(1:10)

# Error: unexpected symbol in "mean(1:10) mean"
mean(1:10) mean(1:10)

# Error: unexpected ')' in "mean(1:10))"
mean(1:10))

# Error: unexpected end of input in "mean(1:10"
mean(1:10
```

Ch 10.5 Wrapping up

Example:

```
# Error: could not find function "mean2"
mean2(1:10)

# Error: unexpected symbol in "mean(1:10) mean"
mean(1:10) mean(1:10)

# Error: unexpected ')' in "mean(1:10))"
mean(1:10))

# Error: unexpected end of input in "mean(1:10"
mean(1:10
```

Ch 11 - Multiple linear regression

Ch 11.1 Introduction to multiple linear regression

Example:

```
# Error: could not find function "mean2"
mean2(1:10)

# Error: unexpected symbol in "mean(1:10) mean"
mean(1:10) mean(1:10)

# Error: unexpected ')' in "mean(1:10))"
mean(1:10))

# Error: unexpected end of input in "mean(1:10"
mean(1:10
```

Ch 11.2 Parallel slopes model

Example:

```
# Error: could not find function "mean2"
mean2(1:10)

# Error: unexpected symbol in "mean(1:10) mean"
mean(1:10) mean(1:10)

# Error: unexpected ')' in "mean(1:10))"
mean(1:10))

# Error: unexpected end of input in "mean(1:10"
mean(1:10
```

Ch 11.3 Interpreting multiple regression models

Example:

```
# Error: could not find function "mean2"
mean2(1:10)

# Error: unexpected symbol in "mean(1:10) mean"
mean(1:10) mean(1:10)

# Error: unexpected ')' in "mean(1:10))"
mean(1:10))

# Error: unexpected end of input in "mean(1:10"
mean(1:10
```

Ch 11.4 Model assessment

Example:

```
# Error: could not find function "mean2"
mean2(1:10)

# Error: unexpected symbol in "mean(1:10) mean"
mean(1:10) mean(1:10)

# Error: unexpected ')' in "mean(1:10))"
mean(1:10))

# Error: unexpected end of input in "mean(1:10"
mean(1:10
```

Ch 11.5 Wrapping up

Example:

```
# Error: could not find function "mean2"
mean2(1:10)

# Error: unexpected symbol in "mean(1:10) mean"
mean(1:10) mean(1:10)

# Error: unexpected ')' in "mean(1:10))"
mean(1:10))

# Error: unexpected end of input in "mean(1:10"
mean(1:10
```

Ch 12 - Model selection

Ch 12.1 Introduction to model selection

Example:

```
# Error: could not find function "mean2"
mean2(1:10)

# Error: unexpected symbol in "mean(1:10) mean"
mean(1:10) mean(1:10)

# Error: unexpected ')' in "mean(1:10))"
mean(1:10))

# Error: unexpected end of input in "mean(1:10"
mean(1:10
```

Ch 12.2 Model selection using adjusted R^2

Example:

```
# Error: could not find function "mean2"
mean2(1:10)

# Error: unexpected symbol in "mean(1:10) mean"
mean(1:10) mean(1:10)

# Error: unexpected ')' in "mean(1:10))"
mean(1:10))

# Error: unexpected end of input in "mean(1:10"
mean(1:10
```

Ch 12.3 Model selection using p-values

Example:

```
# Error: could not find function "mean2"
mean2(1:10)

# Error: unexpected symbol in "mean(1:10) mean"
mean(1:10) mean(1:10)

# Error: unexpected ')' in "mean(1:10))"
mean(1:10))

# Error: unexpected end of input in "mean(1:10"
mean(1:10
```

Ch 12.4 Model selection using cross-validation

Example:

```
# Error: could not find function "mean2"
mean2(1:10)

# Error: unexpected symbol in "mean(1:10) mean"
mean(1:10) mean(1:10)

# Error: unexpected ')' in "mean(1:10))"
mean(1:10))

# Error: unexpected end of input in "mean(1:10"
mean(1:10
```

Ch 12.5 Wrapping up

Example:

```
# Error: could not find function "mean2"
mean2(1:10)

# Error: unexpected symbol in "mean(1:10) mean"
mean(1:10) mean(1:10)

# Error: unexpected ')' in "mean(1:10))"
mean(1:10))

# Error: unexpected end of input in "mean(1:10"
mean(1:10
```

Ch 13 - Logistic regression

Ch 13.1 Introduction to logistic regression

Example:

```
# Error: could not find function "mean2"
mean2(1:10)

# Error: unexpected symbol in "mean(1:10) mean"
mean(1:10) mean(1:10)

# Error: unexpected ')' in "mean(1:10))"
mean(1:10))

# Error: unexpected end of input in "mean(1:10"
mean(1:10
```

Ch 13.2 Logistic regression with a single predictor

Example:

```
# Error: could not find function "mean2"
mean2(1:10)

# Error: unexpected symbol in "mean(1:10) mean"
mean(1:10) mean(1:10)

# Error: unexpected ')' in "mean(1:10))"
mean(1:10))

# Error: unexpected end of input in "mean(1:10"
mean(1:10
```

Ch 13.3 Logistic regression with multiple predictors

Example:

```
# Error: could not find function "mean2"
mean2(1:10)

# Error: unexpected symbol in "mean(1:10) mean"
mean(1:10) mean(1:10)

# Error: unexpected ')' in "mean(1:10))"
mean(1:10))

# Error: unexpected end of input in "mean(1:10"
mean(1:10
```

Ch 13.4 Wrapping up

Example:

```
# Error: could not find function "mean2"
mean2(1:10)

# Error: unexpected symbol in "mean(1:10) mean"
mean(1:10) mean(1:10)

# Error: unexpected ')' in "mean(1:10))"
mean(1:10))

# Error: unexpected end of input in "mean(1:10"
mean(1:10
```

Ch 14 - Simulation-based inference

Ch 14.1 Introduction to simulation-based inference

Example:

```
# Error: could not find function "mean2"
mean2(1:10)

# Error: unexpected symbol in "mean(1:10) mean"
mean(1:10) mean(1:10)

# Error: unexpected ')' in "mean(1:10))"
mean(1:10))

# Error: unexpected end of input in "mean(1:10"
mean(1:10
```

Ch 14.2 Hypothesis testing

Example:

```
# Error: could not find function "mean2"
mean2(1:10)

# Error: unexpected symbol in "mean(1:10) mean"
mean(1:10) mean(1:10)

# Error: unexpected ')' in "mean(1:10))"
mean(1:10))

# Error: unexpected end of input in "mean(1:10"
mean(1:10
```

Ch 14.3 Wrapping up

Example:

```
# Error: could not find function "mean2"
mean2(1:10)

# Error: unexpected symbol in "mean(1:10) mean"
mean(1:10) mean(1:10)

# Error: unexpected ')' in "mean(1:10))"
mean(1:10))

# Error: unexpected end of input in "mean(1:10"
mean(1:10
```

Ch 15 - Randomization and permutation tests

Ch 15.1 Introduction to randomization and permutation tests

Example:

```
# Error: could not find function "mean2"
mean2(1:10)

# Error: unexpected symbol in "mean(1:10) mean"
mean(1:10) mean(1:10)

# Error: unexpected ')' in "mean(1:10))"
mean(1:10))

# Error: unexpected end of input in "mean(1:10"
mean(1:10
```

Ch 15.2 Randomization and permutation tests

Example:

```
# Error: could not find function "mean2"
mean2(1:10)

# Error: unexpected symbol in "mean(1:10) mean"
mean(1:10) mean(1:10)

# Error: unexpected ')' in "mean(1:10))"
mean(1:10))

# Error: unexpected end of input in "mean(1:10"
mean(1:10
```

Ch 15.3 Wrapping up

Example:

```
# Error: could not find function "mean2"
mean2(1:10)

# Error: unexpected symbol in "mean(1:10) mean"
mean(1:10) mean(1:10)

# Error: unexpected ')' in "mean(1:10))"
mean(1:10))

# Error: unexpected end of input in "mean(1:10"
mean(1:10
```

Ch 16 - Bootstrapping and confidence intervals

Ch 16.1 Introduction to bootstrapping and confidence intervals

Example:

```
# Error: could not find function "mean2"
mean2(1:10)

# Error: unexpected symbol in "mean(1:10) mean"
mean(1:10) mean(1:10)

# Error: unexpected ')' in "mean(1:10))"
mean(1:10))

# Error: unexpected end of input in "mean(1:10"
mean(1:10
```

Ch 16.2 Bootstrapping and confidence intervals

Example:

```
# Error: could not find function "mean2"
mean2(1:10)

# Error: unexpected symbol in "mean(1:10) mean"
mean(1:10) mean(1:10)

# Error: unexpected ')' in "mean(1:10))"
mean(1:10))

# Error: unexpected end of input in "mean(1:10"
mean(1:10
```

Ch 16.3 Wrapping up

Example:

```
# Error: could not find function "mean2"
mean2(1:10)

# Error: unexpected symbol in "mean(1:10) mean"
mean(1:10) mean(1:10)

# Error: unexpected ')' in "mean(1:10))"
mean(1:10))

# Error: unexpected end of input in "mean(1:10"
mean(1:10
```

Ch 17 - Introduction to Bayesian inference

Ch 17.1 Introduction to Bayesian inference

Example:

```
# Error: could not find function "mean2"
mean2(1:10)

# Error: unexpected symbol in "mean(1:10) mean"
mean(1:10) mean(1:10)

# Error: unexpected ')' in "mean(1:10))"
mean(1:10))

# Error: unexpected end of input in "mean(1:10"
mean(1:10
```

Ch 17.2 Bayesian inference

Example:

```
# Error: could not find function "mean2"
mean2(1:10)

# Error: unexpected symbol in "mean(1:10) mean"
mean(1:10) mean(1:10)

# Error: unexpected ')' in "mean(1:10))"
mean(1:10))

# Error: unexpected end of input in "mean(1:10"
mean(1:10
```

Ch 17.3 Wrapping up

Example:

```
# Error: could not find function "mean2"
mean2(1:10)

# Error: unexpected symbol in "mean(1:10) mean"
mean(1:10) mean(1:10)

# Error: unexpected ')' in "mean(1:10))"
mean(1:10))

# Error: unexpected end of input in "mean(1:10"
mean(1:10
```

Ch 18 - Bayesian regression and classification

Ch 18.1 Introduction to Bayesian regression and classification

Example:

```
# Error: could not find function "mean2"
mean2(1:10)

# Error: unexpected symbol in "mean(1:10) mean"
mean(1:10) mean(1:10)

# Error: unexpected ')' in "mean(1:10))"
mean(1:10))

# Error: unexpected end of input in "mean(1:10"
mean(1:10
```

Ch 18.2 Bayesian regression and classification

Example:

```
# Error: could not find function "mean2"
mean2(1:10)

# Error: unexpected symbol in "mean(1:10) mean"
mean(1:10) mean(1:10)

# Error: unexpected ')' in "mean(1:10))"
mean(1:10))

# Error: unexpected end of input in "
```