STA 444/5 - Introductory Data Science using R

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Preface

This book is intended to provide students with a resource for learning R while using it during an introductory statistics course. The *Introduction* section covers common issues that students in a typical statistics course will encounter and provides a simple examples and does not attempt to be exhaustive. The *Deeper Details* section addresses issues that commonly arise in many data wrangling situations and is intended to give students a deep enough understanding of R that they will be able to use it as their primary computing resource to manipulate, graph and model data.

The pdf version of this book isn't quite as good as the on-line version because I've had to remove some of the animated gifs as well as remove chapters that show how to create html output.

Other Resources

There are a great number of very good online and physical resources for learning R.

- Hadley Wickham and Garrett Grolemund's free online book R for Data Science. This is a wonderful introduction to the tidyverse and is free. If there is any book I'd recommend buying, this would be it. Many of the topics my book covers are perhaps better covered in Hadley and Garrett's book. However, I think it is better to triangulate on a concept utilizing multiple sources so I've presented my taking on teaching these concepts.
- Hadley Wickham and Jenny Bryan have a whole book on R packages to effectively manage large projects.
- Hadley Wickham also has a book about Advanced R programming and is quite helpful in understanding deeper issues relating to Object Oriented program in R, Environments, Namespaces, and function evaluation.

Non-Hadley books:

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• Michael Freeman's book Programming Skills for Data Science. This book covers much of what we'll do in this class and is quite readable.

Acknowledgments

These online books are a huge amount of work and without the support of my wife Aubrey, this book would not be possible.

Introduction

Familiarization

- 1.1 Working within an Rmarkdown File
- 1.2 R file Types
- 1.2.1 R Scripts (.R files)
- 1.2.2 R Markdown (.Rmd files)
- 1.2.3 R Notebooks (.Rmd files)
- 1.3 R as a simple calculator
- 1.4 Assignment
- 1.5 Vectors
- 1.6 Packages
- 1.7 Finding Help
- 1.7.1 How does this function work?
- 1.7.2 How does this package work?
- 1.7.3 How do I do XXX?
- 1.8 Exercises

Data Frames

- 2.1 Introduction to Importing Data
- 2.1.1 From a Package
- 2.1.2 Import from .csv or .xls files
- 2.2 Data Types
- 2.3 Basic Manipulation
- 2.4 Exercises

Graphing

- 3.1 Basic Graphs
- 3.1.1 Scatterplots
- 3.1.2 Box Plots
- 3.2 Faceting
- 3.3 Annotation
- 3.3.1 Axis Labels and Titles
- 3.3.2 Text Labels
- 3.3.2.1 Using a data.frame
- 3.3.2.2 Setting attributes in-line
- 3.4 Exercises

Data Wrangling

- 4.1 Verbs
- 4.1.1 add_row
- $4.1.2 \quad {\tt bind_rows}$
- 4.1.3 Subsetting
- 4.1.3.1 select()
- 4.1.3.2 filter()
- 4.1.3.3 slice()
- 4.1.4 arrange()
- 4.1.5 mutate()
- 4.1.6 summarise()
- 4.2 Split, apply, combine
- 4.3 Exercises

Statistical Models

- 5.1 Formula Notation
- 5.2 Basic Models
- **5.2.1** t-tests
- 5.2.1.1 Two Sample t-tests
- 5.2.1.2 Paired t-tests
- 5.2.2 lm objects
- 5.3 Accessor function
- 5.4 Exercises

Flow Control

- 6.1 Logical Expressions
- 6.2 Decision statements
- 6.2.1 In dplyr wrangling
- 6.2.2 General if else
- 6.3 Loops
- $6.3.1 \quad \hbox{while Loops} \quad$
- $6.3.2 \quad \text{for Loops} \quad$
- 6.3.3 mosaic::do() loops
- 6.4 Functions
- 6.5 Exercises

Factors

Placeholder

Edit Factor Labels

Reorder Levels

Add or Subtract Levels

- 7.1 Creation and Structure
- 7.2 Change Labels
- 7.3 Reorder Levels
- 7.4 Add or substract Levels
- 7.5 Exercises

Miscellaneous

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Placeholder

Example Distributions

mosaic::plotDist() function

Base R functions

d-function

p-function

 ${\tt q\text{-}function}$

r-function

Exercises

Rmarkdown Tricks

Chunk Options

Verbatim & List Environments

7.6 [1] 5

Mathematical expressions

Tables

- 7.7 Girth Height Volume
- 7.8 1 8.3 70 10.3
- 7.9 2 8.6 65 10.3
- 7.10 3 8.8 63 10.2
- 7.11 4 10.5 72 16.4
- 7.11.1 Simple Tables
- 7.11.2 Grid Tables
- 7.11.3 Pipe Tables

R functions to produce table code.

- 7.11.4 knitr::kable
- 7.11.5 Package pander

Code Appendix

7.11.6 Code Appendix

Data Wrangling Process

- 7.12 Introduction
- **7.13** Import
- 7.14 Tidying
- 7.15 Cleaning
- 7.16 Use

Deeper Details

Data Structures

- 8.1 Vectors
- 8.1.1 Accessing Vector Elements
- 8.1.2 Scalar Functions Applied to Vectors
- 8.1.3 Vector Algebra
- 8.1.4 Commonly Used Vector Functions
- 8.2 Matrices
- 8.3 Data Frames
- 8.3.1 data.frames vs tibbles
- 8.4 Lists
- 8.5 Exercises

Importing Data

- 9.1 Working directory
- 9.2 Comma Separated Data
- 9.3 MS Excel
- 9.4 Multiple files
- 9.5 Exercises

Functions

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\mathbf{P}	ace	h_{Ω}		Or
	auc	11()	I ()	CI

10.1	Basic	function	definition

- 10.2 Parameter Defaults
- 10.3 Ellipses
- 10.4 Function Overloading
- 10.5 Debugging
- 10.5.1 Rmarkdown Recommendations
- 10.5.2 Step-wise Execution
- 10.5.3 Print Statements
- 10.5.4 browser
- **10.6** Scope
- 10.7 Exercises

String Manipulation

11.1 Base function

- 11.2 stringr: Basic operations
- 11.2.1 Concatenating with str_c() or str_join()
- 11.2.2 Calculating string length with str_length()
- 11.2.3 Extracting substrings with str_sub()
- 11.2.4 Pad a string with str_pad()
- 11.2.5 Trim a string with str_trim()
- 11.3 stringr: Pattern Matching Tools
- 11.3.1 Detecting a pattern using str_detect()
- 11.3.2 Locating a pattern using str locate()
- 11.3.3 Replacing sub-strings using str_replace()
- 11.3.4 Splitting into sub-strings using str_split()
- 11.4 Regular Expressions
- 11.4.1 Regular Expression Ingredients
- 11.4.2 Matching a specific string
- 11.4.3 Matching arbitrary numbers
- 11.4.4 Greedy matching
- 11.5 Fuzzy Pattern Matching
- 11.5.1 Key Collision Merge
- 11.5.2 String Distances
- 11.5.3 N-gram Merge
- 11.6 Exercises

Dates and Times

- 12.1 Creating Date and Time objects
- 12.2 Extracting information
- 12.3 Arithmetic on Dates
- 12.4 Exercises

Data Reshaping

- 13.1 data.frames vs tibbles
- 13.2 cbind & rbind
- 13.3 tidyr
- 13.3.1 Verbs
- 13.4 Storing Data in Multiple Tables
- 13.5 Table Joins
- 13.6 Row summations
- 13.7 Exercises

R Packages

- 14.1 Introduction
- 14.1.1 Useful packages and books
- 14.2 Package Structure
- 14.2.1 Minimal files and directories
- 14.2.2 Optional Files and Directories
- 14.3 Documenting
- 14.3.1 Data Documentation
- 14.3.2 Documenting Functions
- 14.4 Testing
- 14.5 The DESCRIPTION file
- 14.6 Sharing your Package
- 14.7 An Example Package
- 14.8 Exercises

Data Scraping

- 15.1 Web Pages
- 15.1.1 Example Wikipedia Table
- 15.1.2 Lists
- 15.2 Scraping .pdf files
- 15.3 Exercises

API Data Queries

- 16.1 Introduction
- 16.2 Census Bureau API
- 16.3 Package censusapi
- 16.3.1 Population Estimates
- 16.4 Package tidycensus
- 16.5 Exercises

Databases

- 17.1 Tutorial Set-Up
- 17.2 SQL
- 17.3 dbplyr
- 17.4 Exercises