









ELAC 2019 INTRODUCTION TO DATA SCIENCE

Day 2 Rafael Santos - rafael.santos@inpe.br www.lac.inpe.br/~rafael.santos/talks.html

Introduction to Data Science



About this Lecture

Where are we?



Introduction to Data Science



R/RStudio

We'll start with R/RStudio

- □ Free language, free IDE.
- □ All major OSs.
- □ Focus on scripts.
 - Fancy stuff later!
- □ Easy to edit/run code, import packages, etc.

Run R/RStudio

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Editing/Running a R Script

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Installing Packages in RStudio

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Installing Packages in RStudio

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Installing Packages in RStudio

Usually everything works OK but...

- Installation may not be as smooth as shown.
- □ If R version changes you may need to reinstall.

Introduction to Data Science



Introduction to R

"R Programming"



Introduction to R

https://github.com/rafaeldcsantos/IntroDataScience

- 01-Variables
 - Pros and cons of starting scripts with rm(list=ls())

02-PrimitiveTypes

- Primitives are actually Vectors!
- [1] 10 -> Index of first element of vector.
- 03-Vectors
- 04-OperationsWithVectors
- 05-Factors
 - Factors are categorical variables, very important for classification!

Introduction to R

06-DataFrames

DataFrames are the essential data structure for Data Science.

O7-Control

Remember: there are other ways to do conditionals and loops

Introduction to Data Science



Raw Data and Tidy Data

Raw Data

- Data in databases, spreadsheets...
- □ Images, videos, audio...
- □ Time series...
- □ Logs, text, JSON files, XML files...

Based on Coursera's "Getting and Cleaning Data" course.

Tidy Data

- One table with all the data (or linked tables).
 - Each variable in its column.
 - Each observation in its row.
 - Variable names in the first row, with good, clear names.
- "Tidiness" is not an absolute feature!
 - Depends on what we have and what we want to do.

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Based on Coursera's "Getting and Cleaning Data" course.

Raw Data to Tidy Data

- Create a Code Book that describes how we can get from Raw Data to Tidy Data.
- □ A simple (formatted) text file with:
 - Sources for the raw data.
 - More detail on the variables.
 - What was {selected, enhanced, preprocessed} and how.
 - Instruction on how the data was processed.
- Code Books essential to reproducibility!

Based on Coursera's "Getting and Cleaning Data" course.

Introduction to R (Part II)

https://github.com/rafaeldcsantos/IntroDataScience

- 08-DateTime
- 09-DownloadingFiles
- □ 10-Strings
- 11-TidyData

Introduction to Data Science



Help!

Help!

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Help!

- Much better options, specially for usage and tips and/or more complex scripts:
 - rseek.org
 - stackoverflow.com
- Can I do X with R?
 - https://cran.r-project.org/
 - https://cran.r-project.org/web/views/



Copying and Pasting from Stack Overflow

O'REILLY[®]

Essential

The Practical Developer @ThePracticalDev

Introduction to Data Science



References

References





O'REILLY®

Joseph Adler

O'REILLY°

Paul Teetor

30

References

THE **R** BOOK

WILEY

U	se R !
ji N	im Albert Aaria Rizzo
	R by Example
0	oncepts to Code
	D Springer

Shameless Advertising

- Applied Computing Graduate Program at INPE:
 - http://www.inpe.br/pos_graduacao/cursos/cap/
- CAP's Annual Workshop (September 2019):
 http://www.inpe.br/worcap/
- Grants!

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Introduction to Data Science



Publishing R code and results on GitHub



Did you do this first?



Then do this (on github.com):

Owner	Repository name *
i rafaeldcsanto	os 🗸 / IntroDataScience 🗸
Great repository nam	nes are short and memorable. Need inspiration? How about expert-waffle?
Description (optional	()
D Public	
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 Public Anyone can set Private You choose wh Initialize this report This will let you immore pository. 	e this repository. You choose who can commit. no can see and commit to this repository. ository with a README nediately clone the repository to your computer. Skip this step if you're importing an existing

NO!

Publishing your R code on GitHub

- cd your-directory-with-R-code
- 2. git add .
- 3. git commit -m "First commit"
- 4. git remote add origin
 https://github.com/rafaeldcsantos/IntroDataScien
 ce.git
- 5. git push -u origin master

6. Check https://github.com/rafaeldcsantos/IntroDataScien ce

Publishing your R code on GitHub

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(Re)Publishing your R code on GitHub

- 1. git add .
- 2. git commit -m "Nth commit"
- 3. git push -u origin master
- 4. Check https://github.com/rafaeldcsantos/IntroDataScience

- R Scripts: source code only.
- R Notebook: creates a .Rmd and a .html file.
 - .Rmd: shown as is (no plots)
 - .html file: shown as source code.
- □ R HTML: formatted HTML code.

R Script	<mark>ጉ</mark> װא
R Notebook	
R Markdown Shiny Web App)
Text File C++ File	
R Sweave R HTML R Presentation	
R Documentati	on

 Solution: create a R Markdown with a GitHub Document template.

R Markdown with a GitHub Document template.

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R Markdown with a GitHub Document template.





R as a Calculator

Basic Example

Let's create some variables and operations.

a <- 12 b <- 24 a+b

[1] 36

Awesome!

1. git add .

- 2. git commit -m "Nth commit"
- 3. git push -u origin master

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