

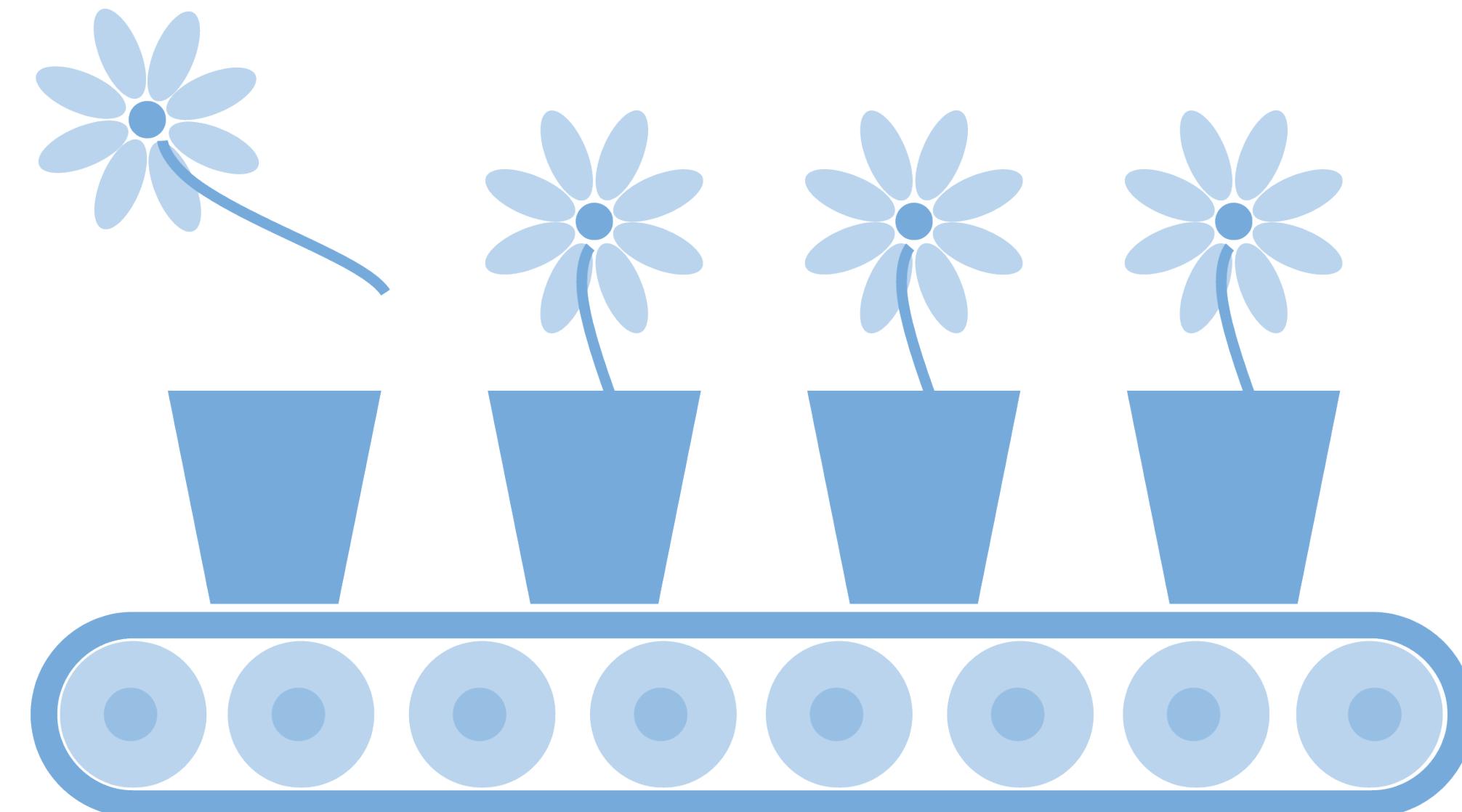
Reproducibility in Production

September 2019

Garrett Grolemund

 rstd.io/repro-in-production

 Studio® [CC-BY-4.0](#)



How the Reproducibility Crisis in Academia is Affecting Scientific Research

—Forbes, 2017

1. Reproducibility in Production

Garrett Grolemund - Today!

2. RStudio Connect in Production

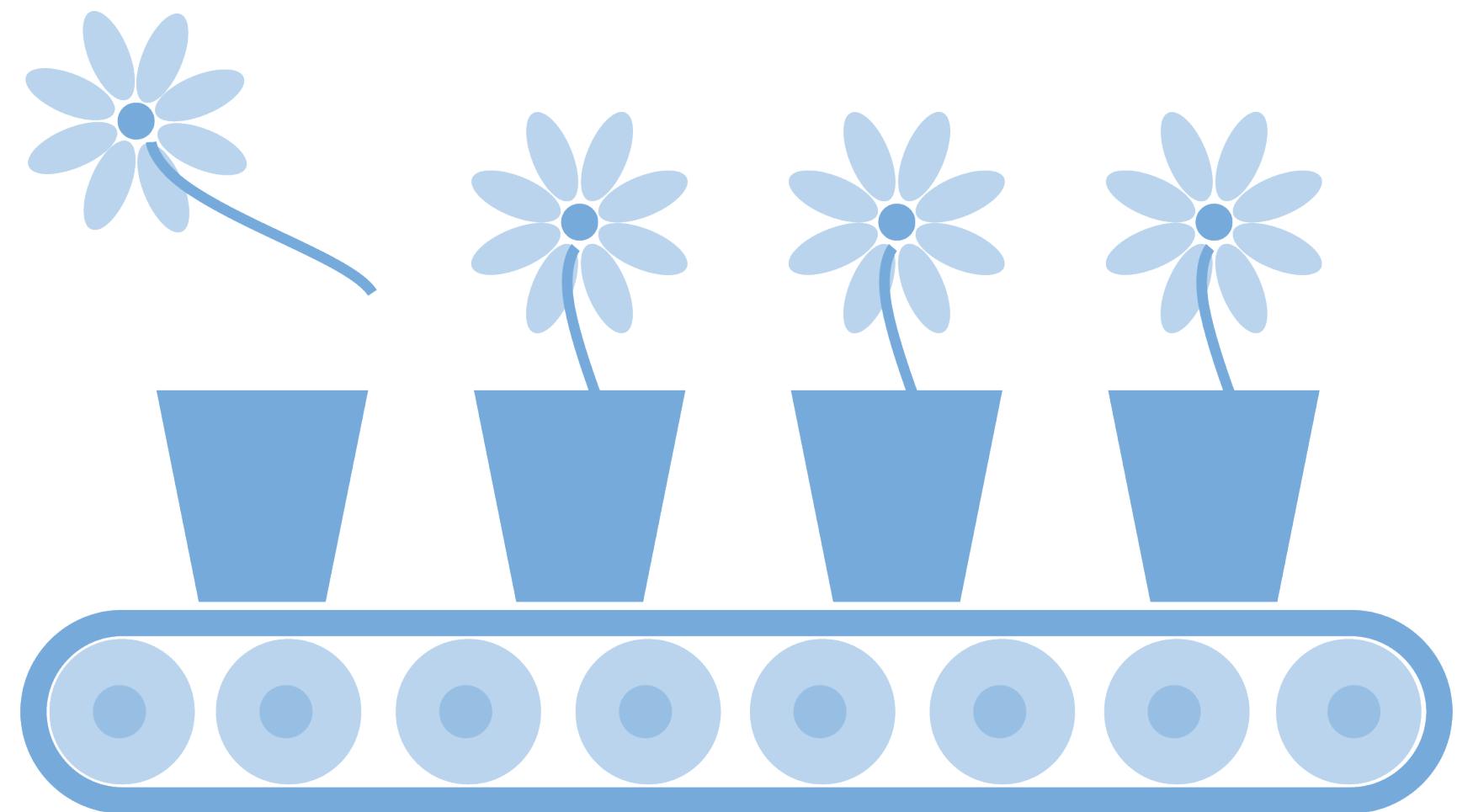
Thomas Mock - September 18, 2019

3. Interactivity in Production

Kelly O'Briant - October 2, 2019

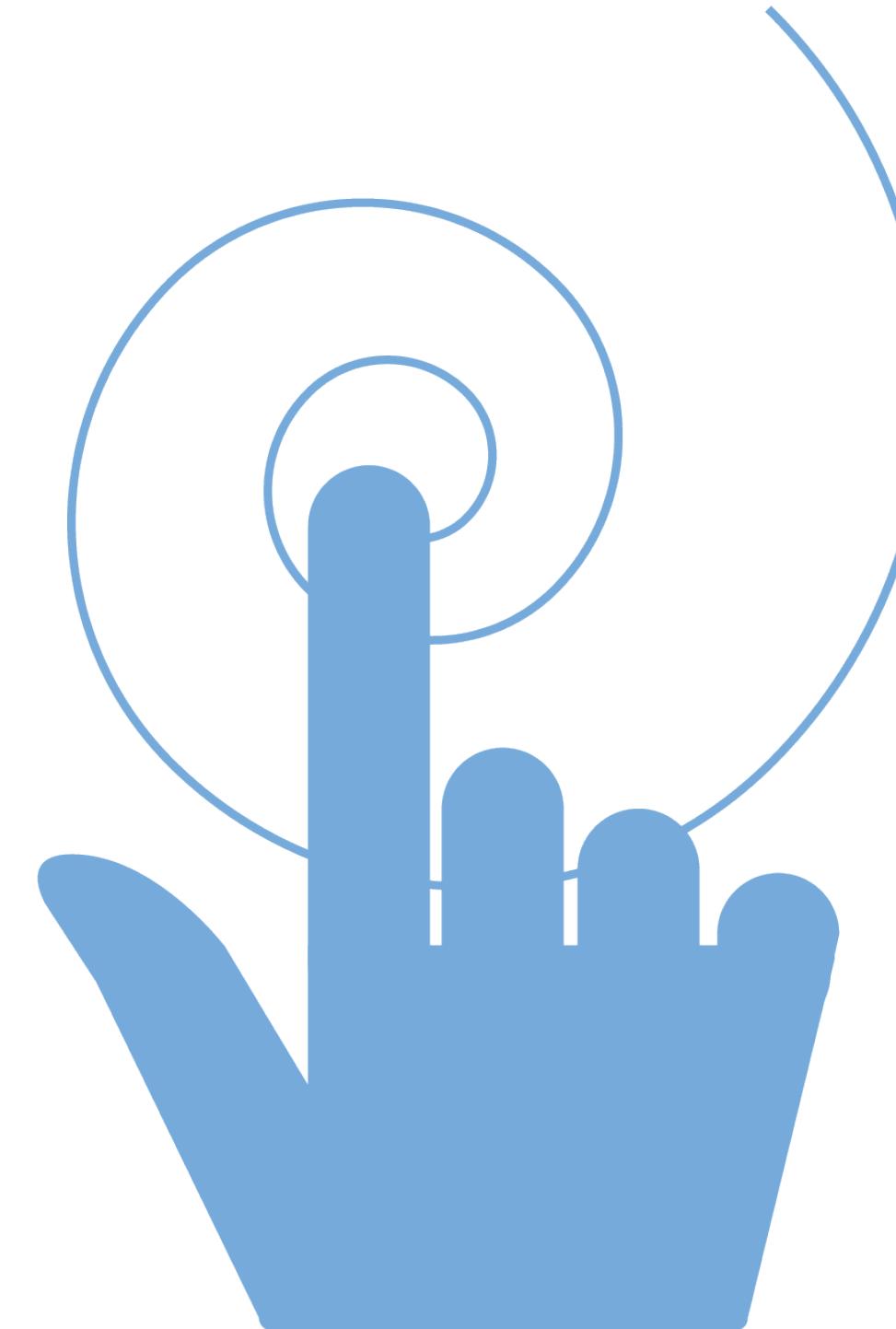
Computational Documents





Authors

Generate reports
efficiently



Users

Interact with
content

Outline

1. Computational Documents
2. R Markdown
3. Tips
4. Thinking about Interactivity

R Markdown

rmarkdown.rstudio.com/formats

RStudio Formats

R Markdown formats from RStudio (see below for additional formats created by the R community)

Documents

Notebook	Interactive R Notebooks
HTML	HTML document w/ Bootstrap CSS
PDF	PDF document (via LaTeX template)
Word	Microsoft Word document (docx)
ODT	OpenDocument Text document
RTF	Rich Text Format document
Markdown	Markdown document (various flavors)

Presentations

ioslides	HTML presentation with ioslides
reveal.js	HTML presentation with reveal.js
Slidy	HTML presentation with W3C Slidy
Beamer	PDF presentation with LaTeX Beamer
PowerPoint	PowerPoint presentation

Journals

jss_article	Journal of Statistical Software (JSS)
acm_article	Association for Computing Machinery (ACM)
acs_article	American Chemical Society (ACS) Journal
ctex	Documents based on the LaTeX package ctex
elsevier_article	Submissions to Elsevier journals

More

flexdashboard	Interactive dashboards
bookdown	HTML, PDF, ePub, and Kindle books
Websites	Multi-page websites
blogdown	Customizable websites and blogs
pkgdown	Package documentation websites
Tufte Handout	Handouts in the style of Edward Tufte
Package Vignette	R package vignette (HTML)
Github Document	Github Flavored Markdown document.

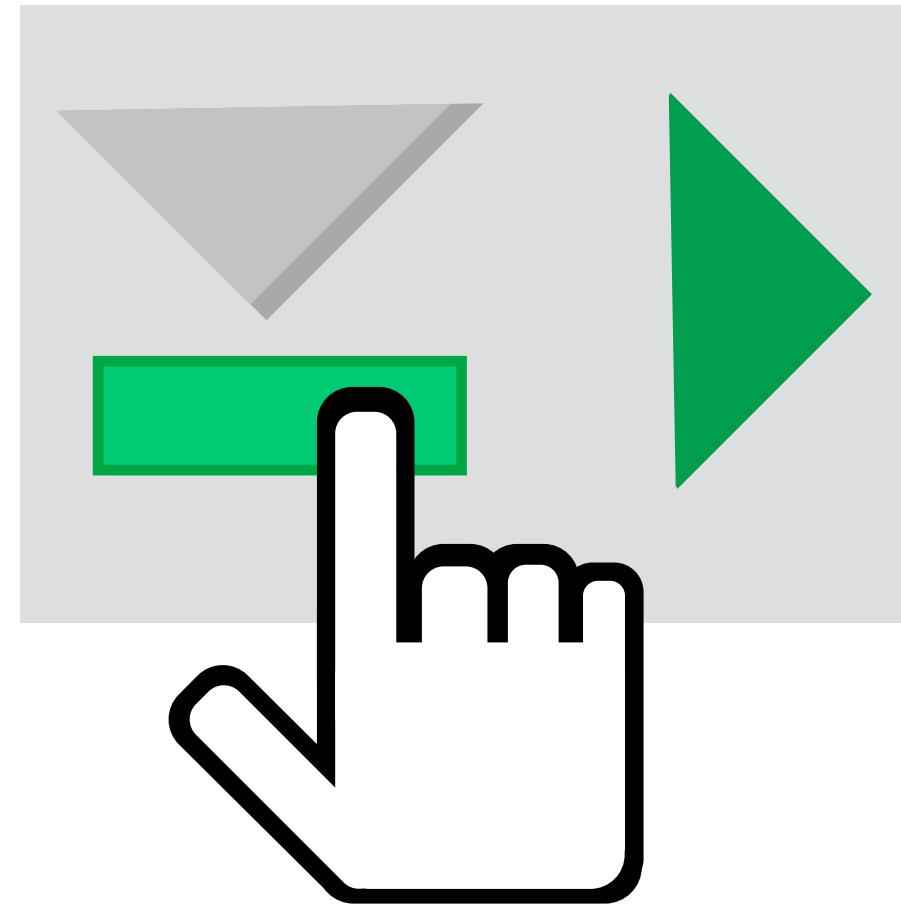
Recap



Plain text
files



Embedded
code



Notebook
interface



Generate
reports

Tips

rmarkdown.rstudio.com/lesson-1.html

[Introduction](#)

[How It Works](#)

[Code Chunks](#)

[Inline Code](#)

[Code Languages](#)

[Parameters](#)

[Tables](#)

[Markdown Basics](#)

[Output Formats](#)

[Notebooks](#)

[Slide Presentations](#)

[Dashboards](#)

[Websites](#)

[Interactive Documents](#)

[Cheatsheets](#)

Introduction

Overview

R Markdown provides an authoring framework for data science. You can use a single R Markdown file to both

- save and execute code
- generate high quality reports that can be shared with an audience

R Markdown documents are fully reproducible and support dozens of static and dynamic output formats. This 1-minute video provides a quick tour of what's possible with R Markdown:



bookdown.org/yihui/rmarkdown

R Markdown: The Definitive Guide

≡ ⌂ A ⌂ i

[Twitter](#) [GitHub](#)

Preface

How to read this book

Structure of the book

Software information and conventions

Acknowledgments

About the Authors

Yihui Xie

J.J. Allaire

Garrett Grolemund

I Get Started

1 Installation

2 Basics

2.1 Example applications

2.1.1 Airbnb's knowledge repository

2.1.2 Homework assignments on GitHub

2.1.3 Personalized mail

2.1.4 2017 Employer Health Benefits Survey

2.1.5 Journal articles

2.1.6 Dashboards at eeloo

2.1.7 Books

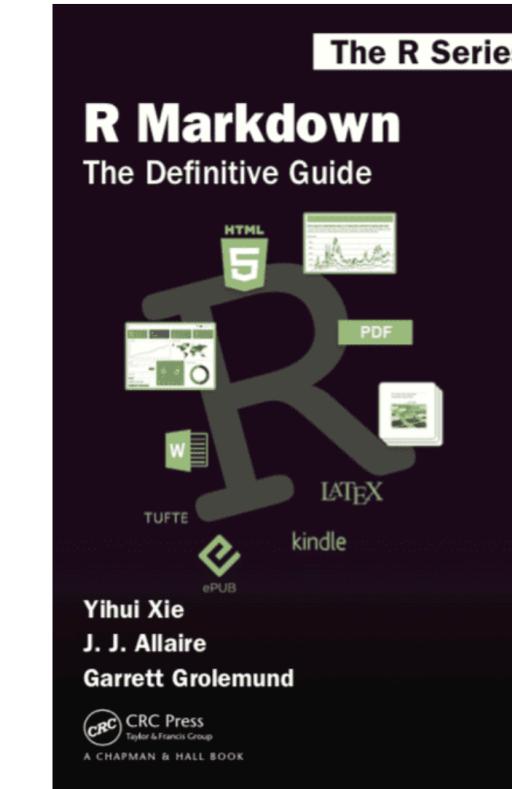
R Markdown: The Definitive Guide

Yihui Xie, J. J. Allaire, Garrett Grolemund

2019-06-03

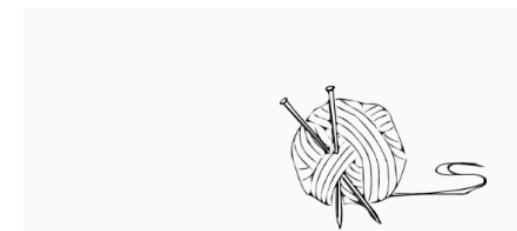
Preface

Note: This book has been published by Chapman & Hall/CRC. The online version of this book is free to read here (thanks to Chapman & Hall/CRC), and licensed under the Creative Commons Attribution-NonCommercial-ShareAlike 4.0 International License.





yihui.name/knitr



*knitr: elegant, flexible,
and fast dynamic report
generation with R*

[Home](#) •
[Options](#) •
[Hooks](#) •
[Examples](#) •
[FAQ](#) •
[Github repo](#) •
[Yihui Xie](#) •
•
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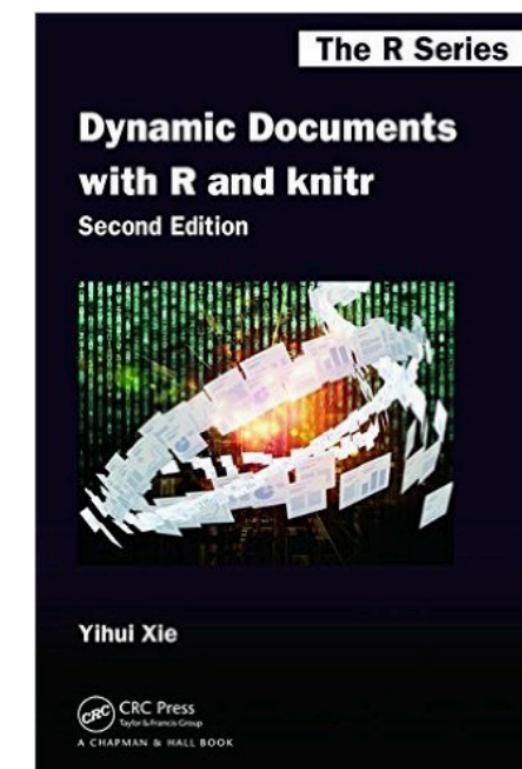
knitr

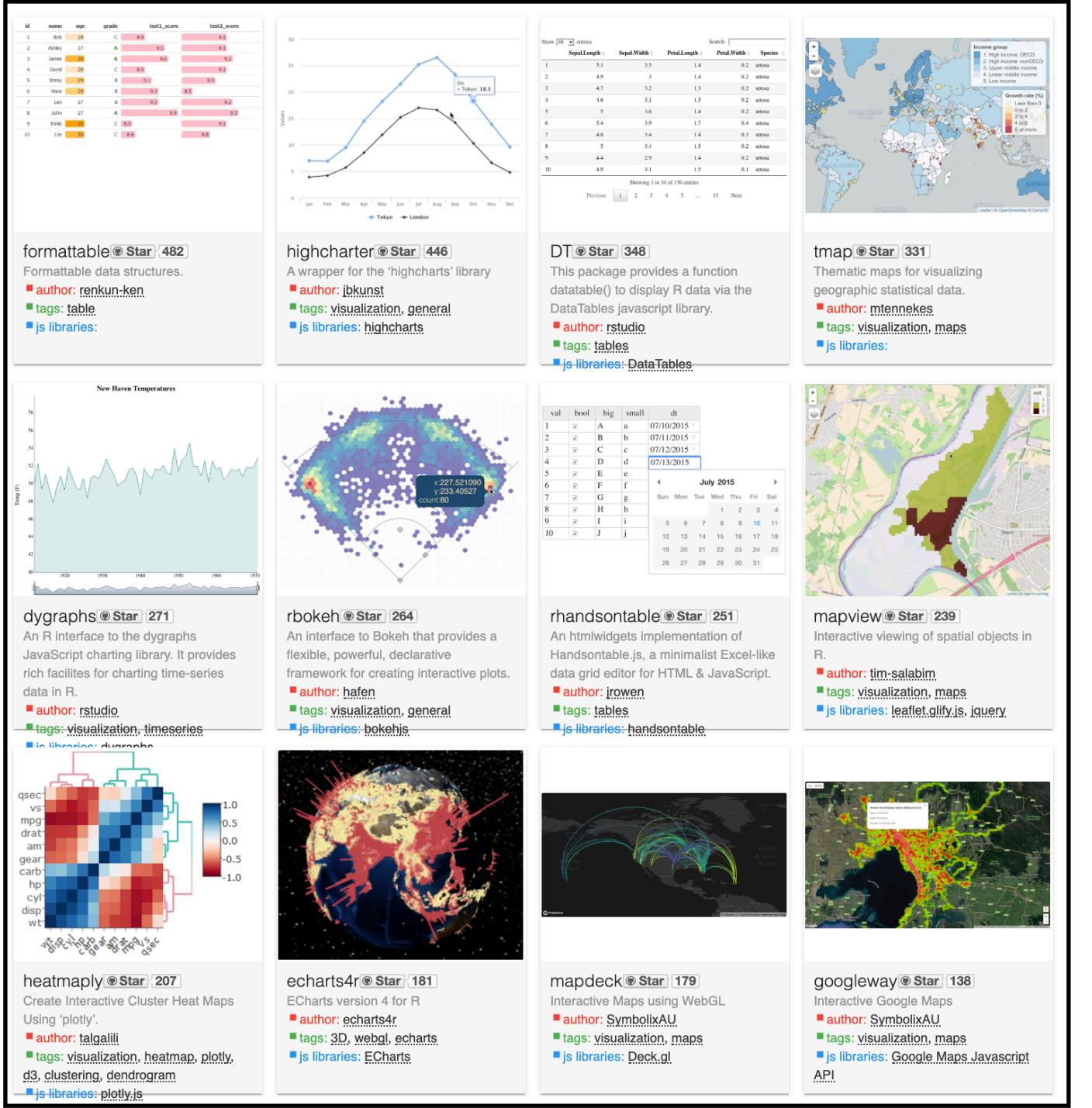
Elegant, flexible, and fast dynamic report generation with R

Overview

The **knitr** package was designed to be a transparent engine for dynamic report generation with R, solve some long-standing problems in Sweave, and combine features in other add-on packages into one package (**knitr** \approx Sweave + cacheSweave + pgfSweave + weaver + animation::saveLatex + R2HTML::RweaveHTML + highlight::HighlightWeaveLatex + 0.2 * brew + 0.1 * SweaveListingUtils + more).

- Transparency means that the user has full access to every piece of the input and output, e.g., `1 + 2` produces [1] 3 in an R terminal, and **knitr** can let the user decide whether to put `1 + 2` between `\begin{verbatim}` and `\end{verbatim}`, or `<div class="rsource">` and `</div>`, and put [1] 3 in `\begin{Rout}` and `\end{Rout}`; see the [hooks](#) page for details
- **knitr** tries to be consistent with users' expectations by running R code as if it were pasted in an R terminal, e.g., `qplot(x, y)` directly produces the plot (no need to `print()` it), and *all* the plots in a code chunk will be written to the output





htmlwidgets

Self-contained
interactive widgets



Shiny

Interactive GUI
to a live R session

www.htmlwidgets.org

htmlwidgets for R

Home

Showcase

Develop ▾

Flexdashboard

Crosstalk

Gallery

GitHub

Bring the best of JavaScript data visualization to R

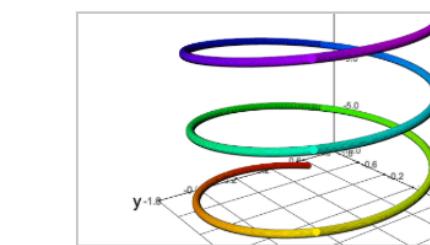
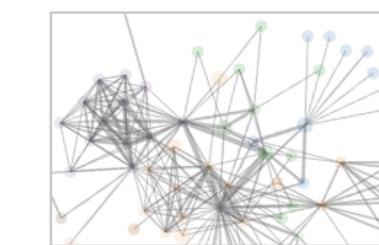
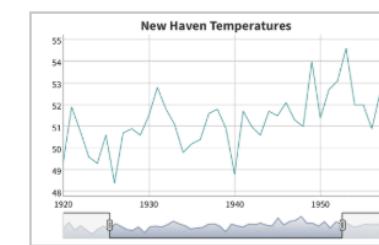
Use JavaScript visualization libraries at the R console, just like plots

Embed widgets in R Markdown documents and Shiny web applications

Develop new widgets using a framework that seamlessly bridges R and JavaScript

At the R console In R Markdown docs In Shiny apps

Widgets in action



Just a line or two of R code can be used to create interactive visualizations. See the featured widgets in the [showcase](#) and browse over 50 available widgets in the [gallery](#).

[See the showcase »](#)

shiny.rstudio.com

Shiny

from Studio

Get Started Gallery Articles Reference Deploy Help Contribute

Interact. Analyze. Communicate.

Take a fresh, interactive approach to telling your data story with Shiny. Let users interact with your data and your analysis. And do it all with R.

Shiny is an R package that makes it easy to build interactive web apps straight from R. You can host standalone apps on a webpage

```
16
17  ## Using Terrain Colors
18
19  ````{r}
20  image(x, y, volcano, col=terrain.colors(100), axes=FALSE)
21  contour(x, y, volcano, levels=seq(90, 200, by=5), add=TRUE, col="brown")
22  axis(1, at=x)
23  axis(2, at=y)
24  box()
25  title(main="Maunga Whau Volcano", sub = "col=terrain.colors(100)", font.main=4)
26
```

Movie explorer

Recap

Inline code

multi-language support

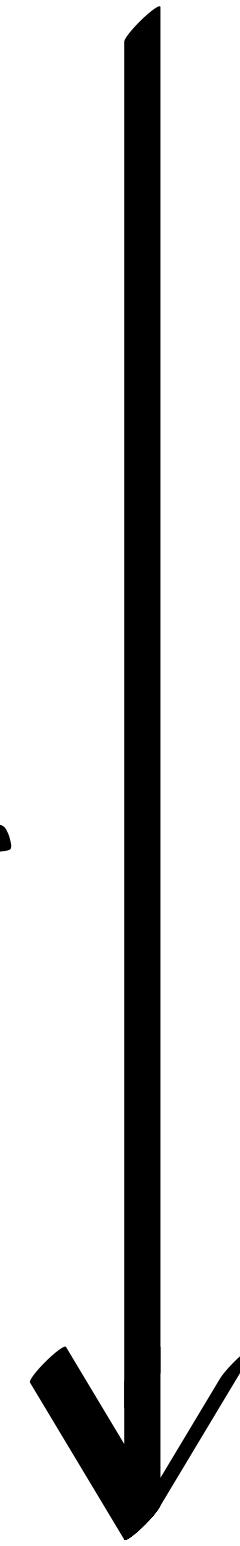
`echo = FALSE`

.Rmd with parameters

.Rmd with htmlwidgets

.Rmd with Shiny components

**MORE
INTERACTIVE**



.Rmd

.Rmd with parameters

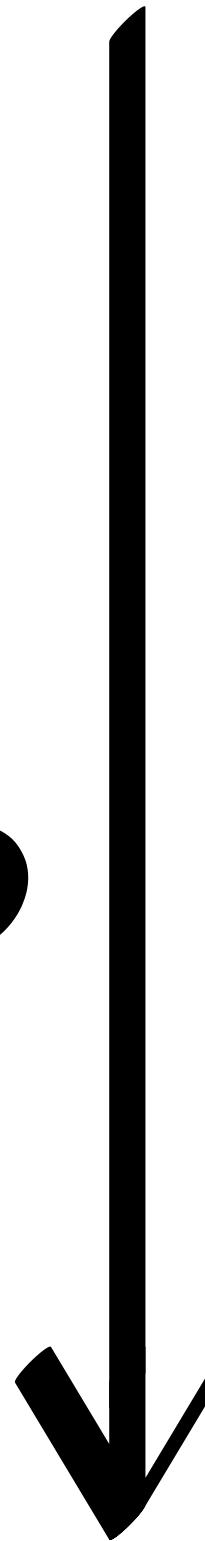
.Rmd with htmlwidgets

.Rmd with Shiny components

Shiny app

Thinking about Interactivity

**MORE
COMPLICATED**



.Rmd

.Rmd with parameters

.Rmd with htmlwidgets

.Rmd with Shiny components

Shiny app

**CHANGE THE DATA
MORE THAN ONCE
PER SESSION?**

.Rmd

.Rmd with parameters

.Rmd with htmlwidgets

.Rmd with Shiny components

Shiny app

**NEED MORE THAN
A DOCUMENT OR
DASHBOARD?**

.Rmd

.Rmd with parameters

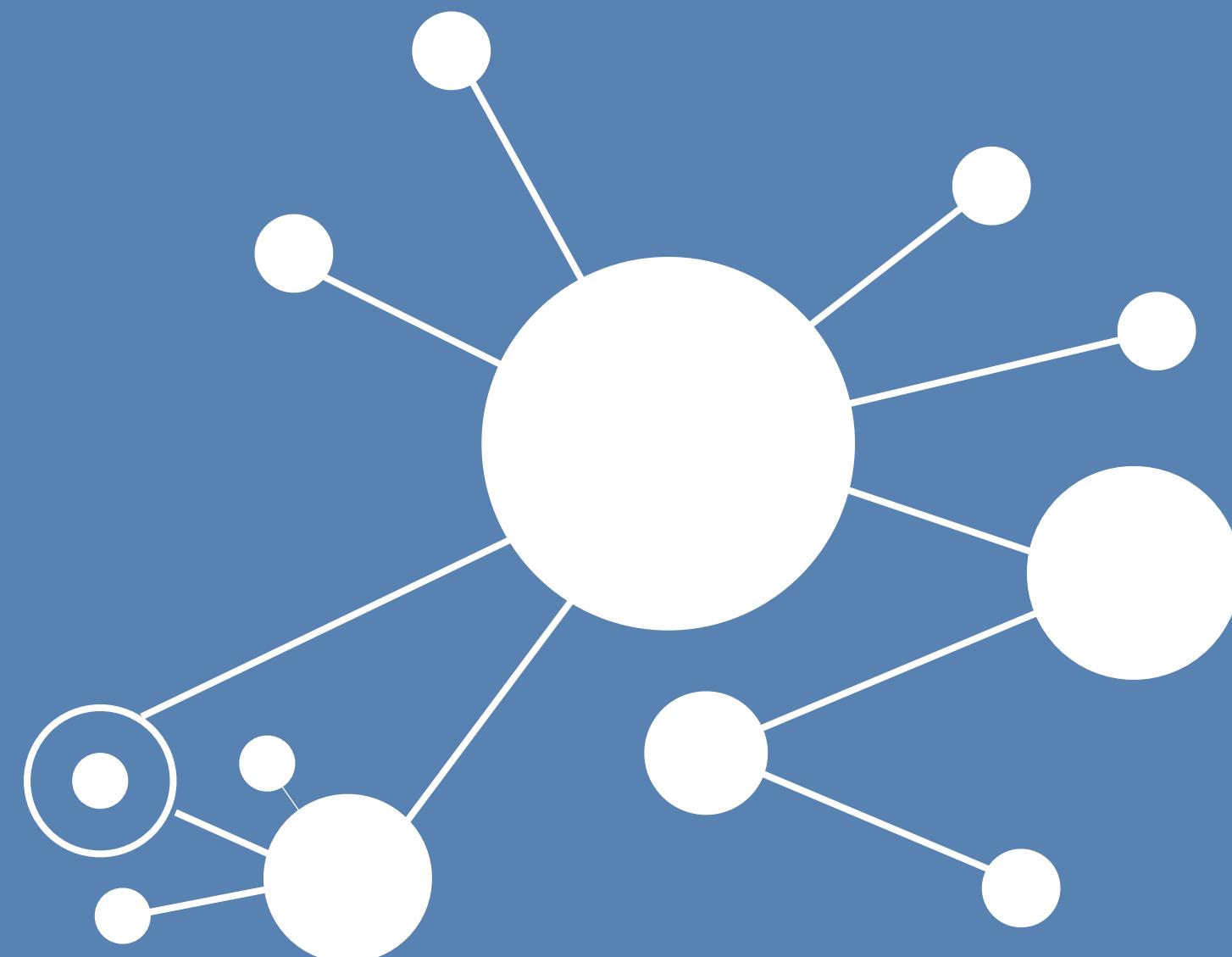
.Rmd with htmlwidgets

.Rmd with Shiny components

Shiny app

September 18

RStudio Connect in Production



Thank you!

Garrett Grolemund

 rstd.io/repro-in-production

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