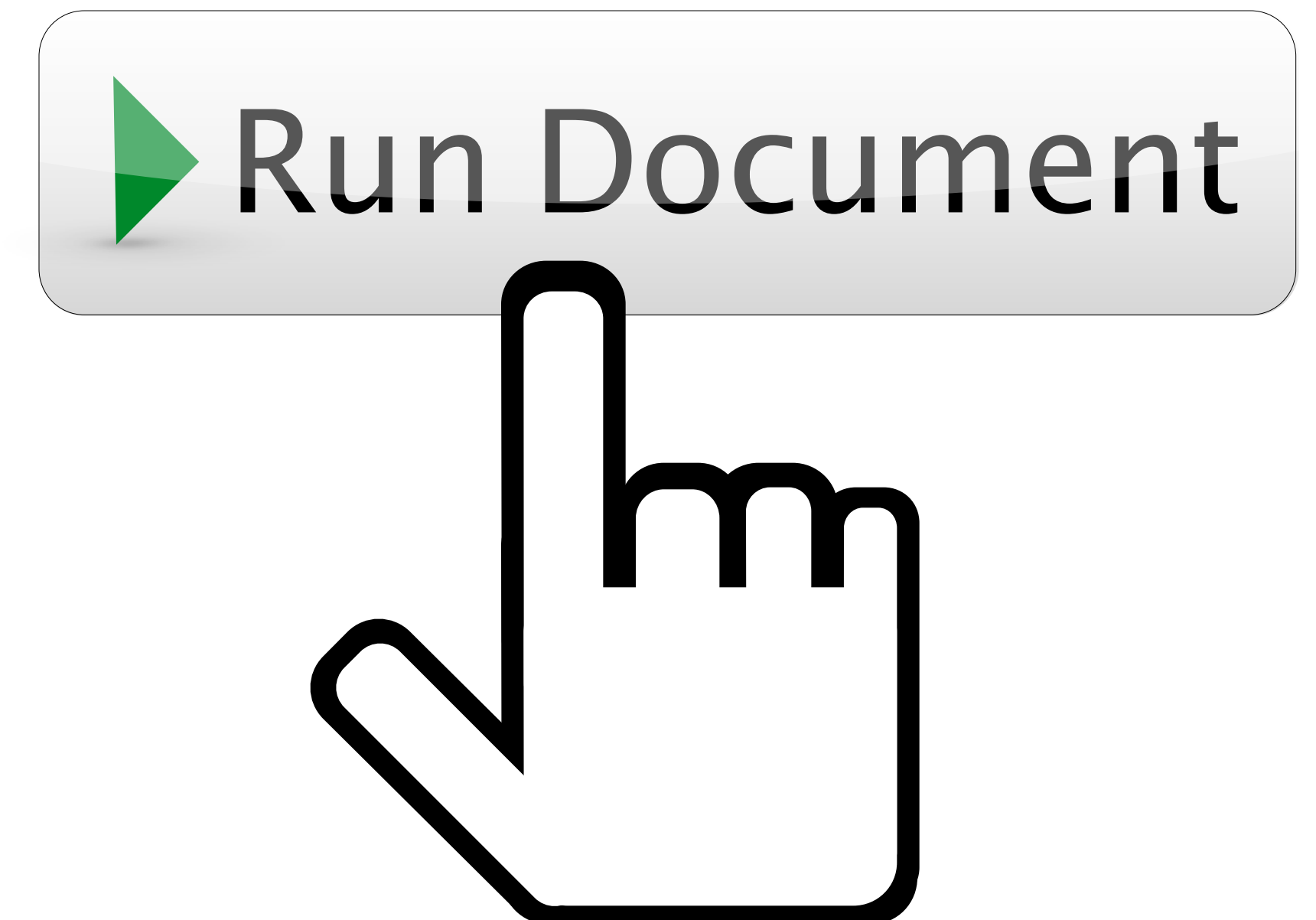


All Training materials are provided "as is" and without warranty and RStudio disclaims any and all express and implied warranties including without limitation the implied warranties of title, fitness for a particular purpose, merchantability and noninfringement.

The Training Materials are licensed under the Creative Commons Attribution-Noncommercial 3.0 United States License. To view a copy of this license, visit <http://creativecommons.org/licenses/by-nc/3.0/us/> or send a letter to Creative Commons, 171 Second Street, Suite 300, San Francisco, California, 94105, USA.

Shiny and R Markdown

Interactive apps and
reproducible reports from R



Garrett Grolemund

Data Scientist and Master Instructor
June 2015
Email: garrett@rstudio.com

R Markdown Resources

File > New File > R Markdown...

<http://rmarkdown.rstudio.com/>

<http://www.rstudio.com/resources/cheatsheets/>

http://rmarkdown.rstudio.com/developer_document_templates.html

http://rmarkdown.rstudio.com/developer_parameterized_reports.html

htmlwidgets Resources

htmlwidgets.org

http://www.htmlwidgets.org/showcase_leaflet.html

Shiny Resources

shiny.rstudio.com/articles

shiny.rstudio.com/tutorial

<http://www.rstudio.com/resources/cheatsheets/>

Shiny Demos

<http://www.rstudio.com/products/shiny/shiny-user-showcase/>

<http://shiny.rstudio.com/gallery/>

<http://webpopix.org:8080/dashboard/absorption/>

<http://shiny.rstudio.com/gallery/widget-gallery.html>

<http://rstudio.github.io/shinydashboard/>

<https://gallery.shinyapps.io/marketing/>

<https://gallery.shinyapps.io/LDAelife/>

<http://shiny.rstudio.com/gallery/superzip-example.html>

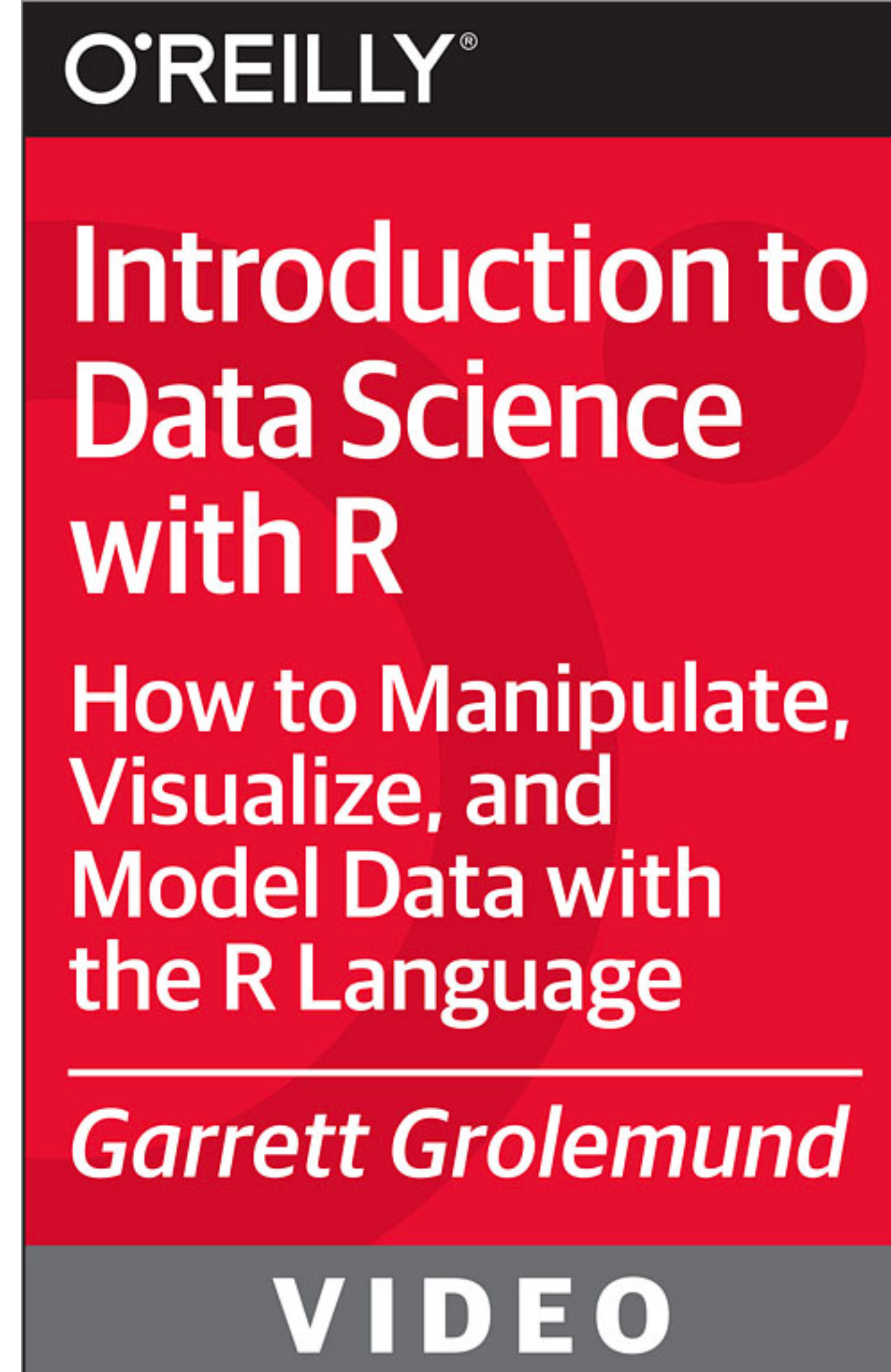
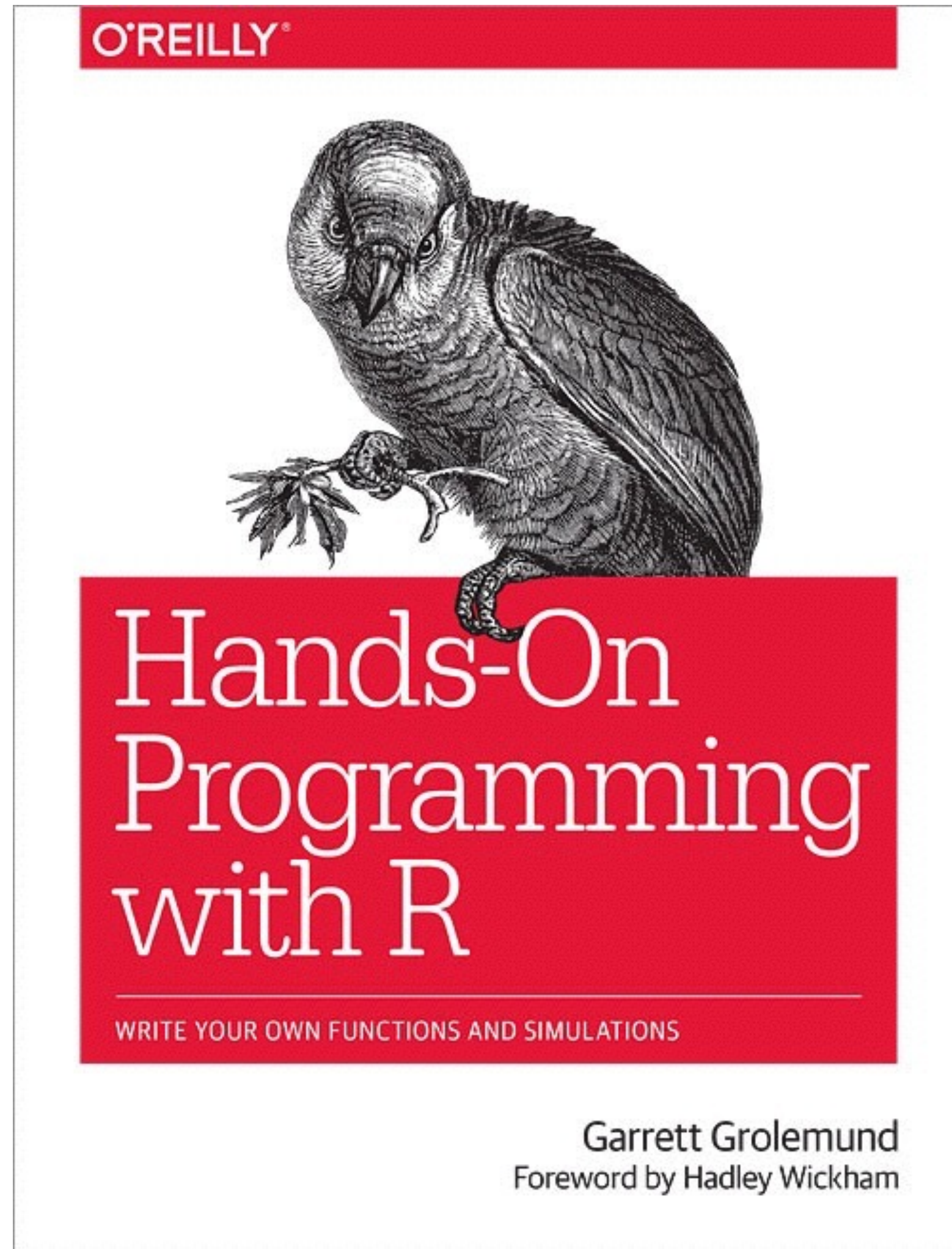
<https://gallery.shinyapps.io/EDsimulation/>

<http://shiny.rstudio.com/articles/#interactive-plots>




<http://shiny.rstudio.com/gallery/authentication-and-database.html>

<https://gallery.shinyapps.io/ga-effect/>

<http://gallery.shinyapps.io/087-crandash>

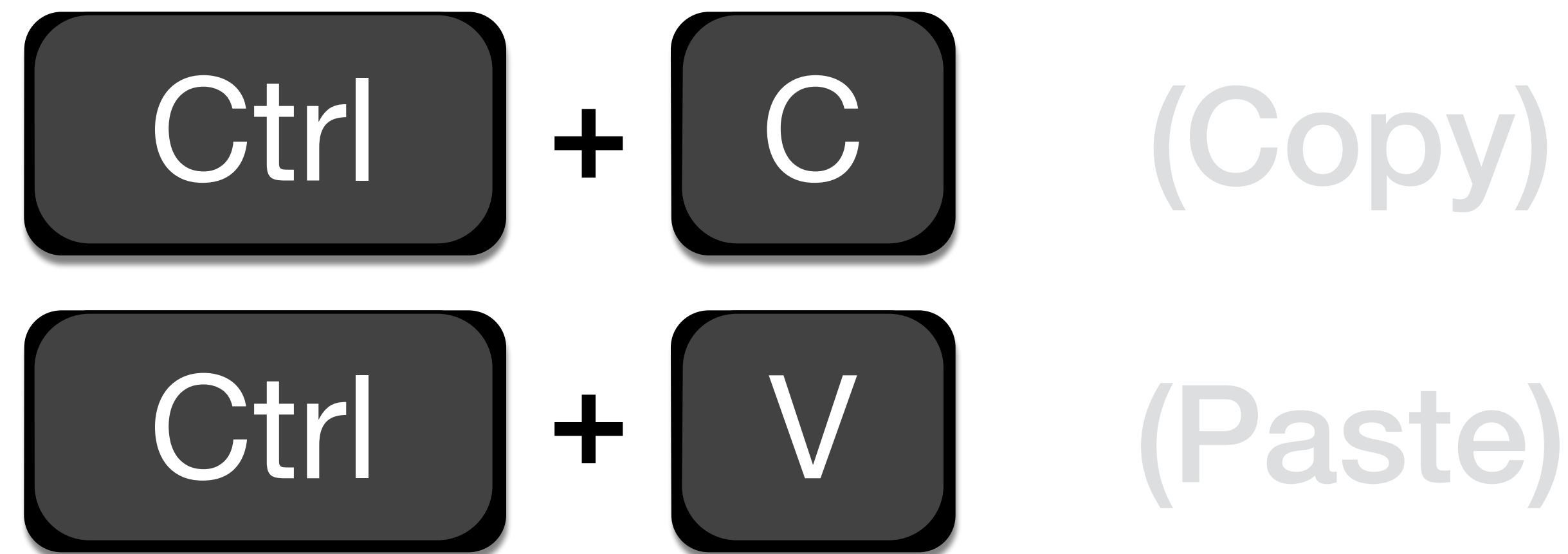


DataCamp

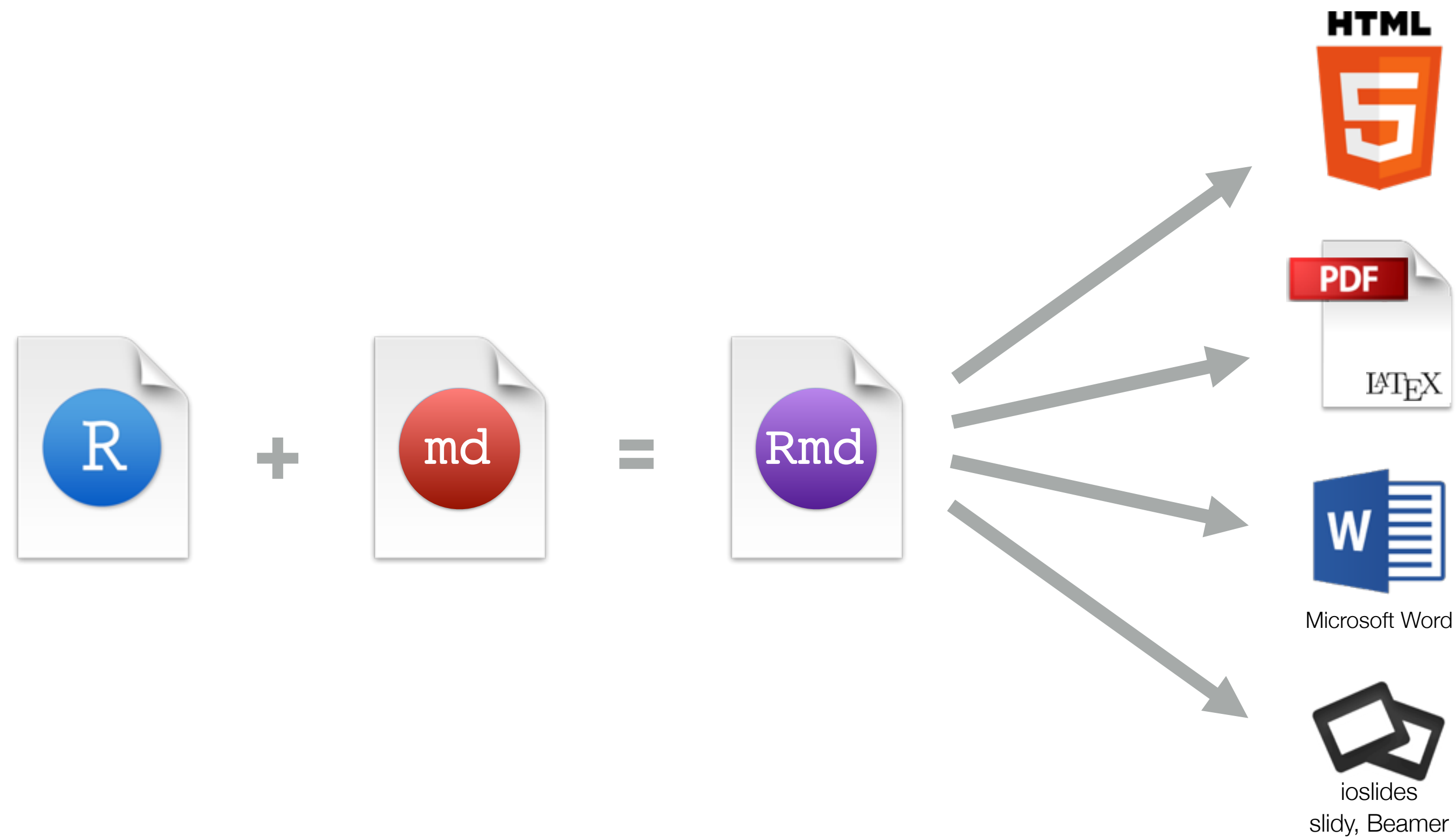
-  Reporting with R Markdown
-  Data Visualization in R with ggvis
-  Data Manipulation in R with dplyr

R Markdown

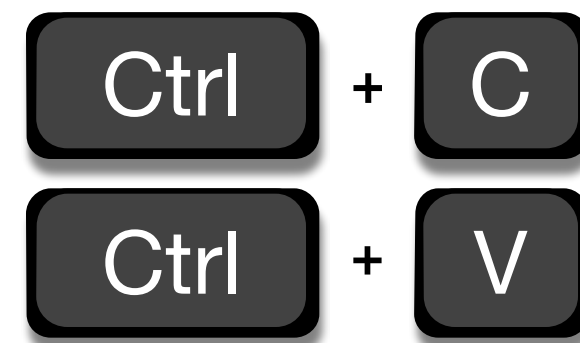
Can we do better?



R Markdown



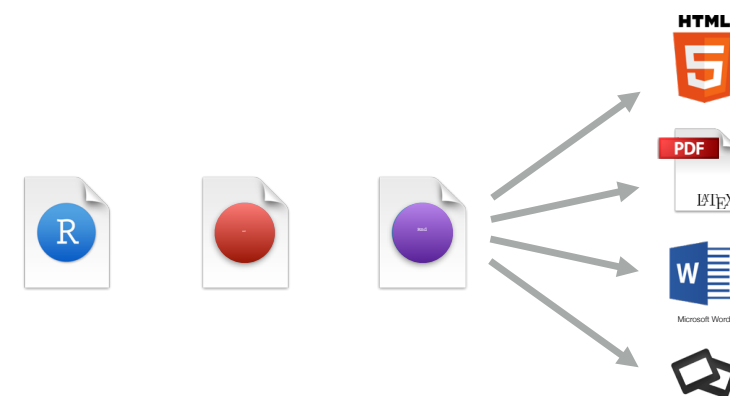
Recap: R Markdown



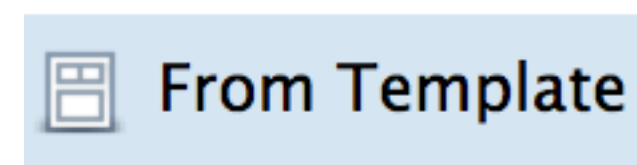
Reproducible



Automatic



Flexible



Reusable

params:

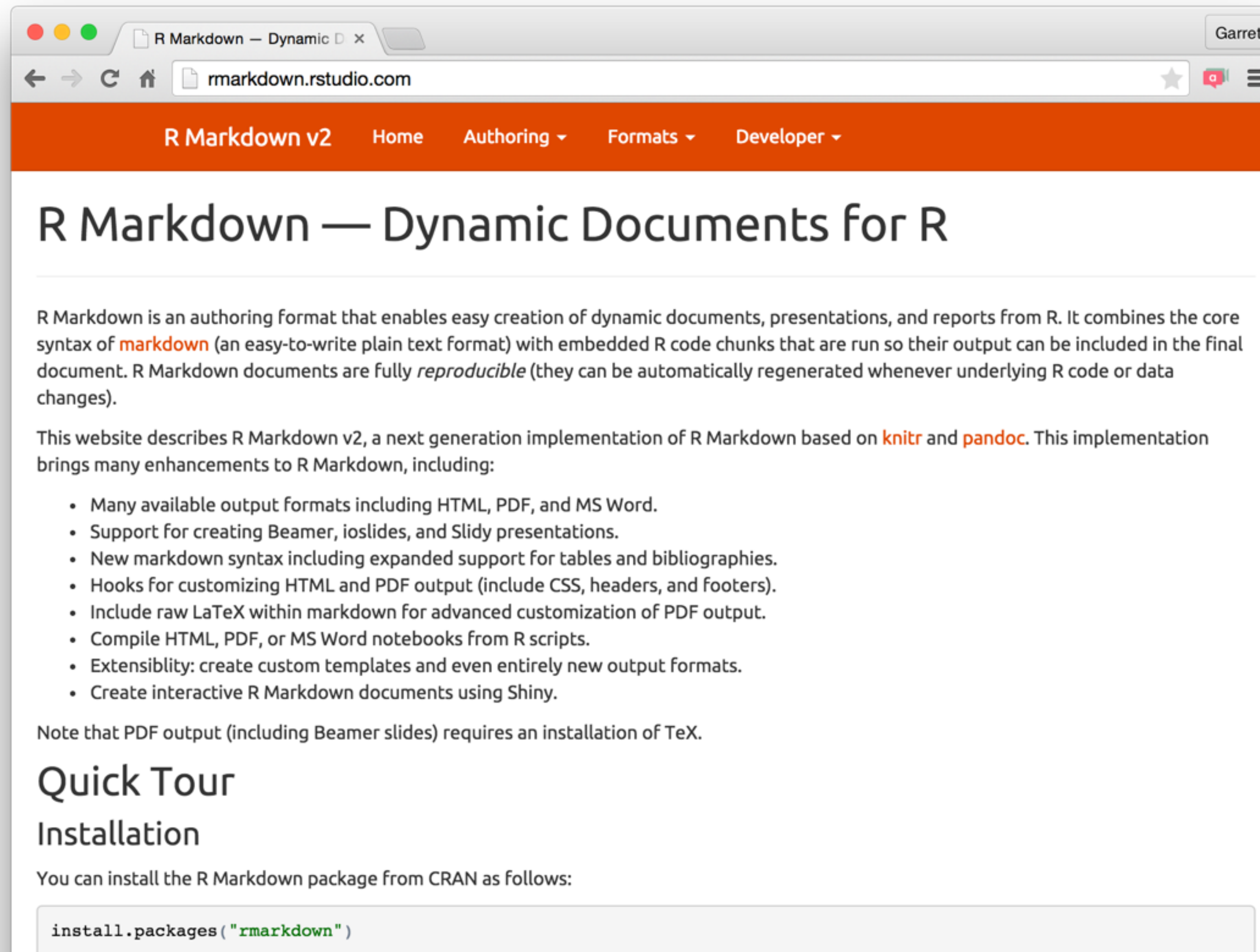
Parameterizable

Teach yourself

R Markdown


The R Markdown Development Center

rmarkdown.rstudio.com



The R Markdown Reference Guide

www.rstudio.com/resources/cheatsheets/



R Markdown Reference Guide

Learn more about R Markdown at rmarkdown.rstudio.com
 Learn more about Interactive Docs at shiny.rstudio.com/articles

Contents:

1. Markdown Syntax
- 2. Knitr chunk options**
3. Pandoc options

Syntax	Becomes
<p>Make a code chunk with three back ticks followed by an <code>r</code> in braces. End the chunk with three back ticks:</p> <pre>```{r} paste("Hello", "World!") ```</pre>	<p>Make a code chunk with three back ticks followed by an <code>r</code> in braces. End the chunk with three back ticks:</p> <pre>paste("Hello", "World!") ## [1] "Hello World!"</pre>
<p>Place code inline with a single back ticks. The first back tick must be followed by an <code>R</code>, like this <code>`r paste("Hello", "World!")`</code>.</p>	<p>Place code inline with a single back ticks. The first back tick must be followed by an <code>R</code>, like this <code>Hello World!</code>.</p>
<p>Add chunk options within braces. For example, <code>`echo=FALSE`</code> will prevent source code from being displayed:</p> <pre>```{r eval=TRUE, echo=FALSE} paste("Hello", "World!") ```</pre>	<p>Add chunk options within braces. For example, <code>echo=FALSE</code> will prevent source code from being displayed:</p> <pre>## [1] "Hello World!"</pre>

Learn more about chunk options at <http://yihui.name/knitr/options>

Chunk options		
option	default value	description
Code evaluation		
<code>child</code>	NULL	A character vector of filenames. Knitr will knit the files and place them into the main document.
<code>code</code>	NULL	Set to R code. Knitr will replace the code in the chunk with the code in the code option.
<code>engine</code>	<code>'R'</code>	Knitr will evaluate the chunk in the named language, e.g. <code>engine = 'python'</code> . Run <code>names(knitr::knit_engines\$get())</code> to see supported languages.
<code>eval</code>	TRUE	If <code>FALSE</code> , knitr will not run the code in the code chunk.
<code>include</code>	TRUE	If <code>FALSE</code> , knitr will run the chunk but not include the chunk in the final document.
<code>purl</code>	TRUE	If <code>FALSE</code> , knitr will not include the chunk when running <code>purl()</code> to extract the source code.
Results		
<code>collapse</code>	FALSE	If <code>TRUE</code> , knitr will collapse all the source and output blocks created by the chunk into a single block.
<code>echo</code>	TRUE	If <code>FALSE</code> , knitr will not display the code in the code chunk above it's results in the final document.
		If <code>'hide'</code> knitr will not display the code's results in the final document. If <code>'hold'</code> knitr will delay displaying all output


The R Markdown Cheat Sheet

www.rstudio.com/resources/cheatsheets/

R Markdown Cheat Sheet

learn more at rmarkdown.rstudio.com


rmarkdown 0.2.50 Updated: 8/14



1. Workflow

R Markdown is a format for writing reproducible, dynamic reports with R. Use it to embed R code and results into slideshows, pdfs, html documents, Word files and more. To make a report:

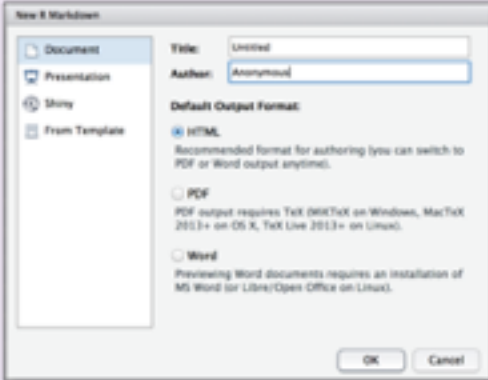
- Open** - Open a file that uses the .Rmd extension
- Write** - Write content with the easy to use R Markdown syntax
- Embed** - Embed R code that creates output to include in the report
- Render** - Replace R code with its output and transform the report into a slideshow, pdf, html or ms Word file.



2. Open File


Start by saving a text file with the extension .Rmd, or open an RStudio Rmd template

- In the menu bar, click **File ► New File ► R Markdown...**
- A window will open. Select the class of output you would like to make with your .Rmd file
- Select the specific type of output to make with the radio buttons (you can change this later)
- Click OK



3. Markdown

Next, write your report in plain text. Use markdown syntax to describe how to format text in the final report.

syntax	becomes
Plain text End a line with two spaces to start a new paragraph. <i>*italics*</i> and <i>_italics_</i> **bold** and __bold__ ^{superscript^2^} --strikethrough-- [link](www.rstudio.com)	Plain text End a line with two spaces to start a new paragraph. <i>italics</i> and <i>italics</i> bold and bold ^{superscript²} strikethrough link
# Header 1 ## Header 2 ### Header 3 #### Header 4 ##### Header 5 ##### Header 6	Header 1 Header 2 Header 3 Header 4 Header 5 Header 6
endash: -- endash: --- ellipsis: ... inline equation: $A = \pi r^2$ image:	endash: -- endash: --- ellipsis: ... inline equation: $A = \pi r^2$ image: 
horizontal rule (or slide break): ***	horizontal rule (or slide break): ---
> block quote * unordered list + item 2 + sub-item 1 + sub-item 2 1. ordered list 2. item 2 + sub-item 1 + sub-item 2	block quote * unordered list + item 2 + sub-item 1 + sub-item 2 1. ordered list 2. item 2 + sub-item 1 + sub-item 2
Table Header Second Header ----- Table Cell Cell 2 Cell 3 Cell 4	Table Header Second Header ----- Table Cell Cell 2 Cell 3 Cell 4

4. Choose Output

Write a YAML header that explains what type of document to build from your R Markdown file.

YAML
A YAML header is a set of key: value pairs at the start of your file. Begin and end the header with a line of three dashes (---)


```
title: "Untitled"
author: "Anonymous"
output: html_document

This is the start of my report. The above is metadata saved in a YAML header.
```

The RStudio template writes the YAML header for you

The output value determines which type of file R will build from your .Rmd file (in Step 6)

- output: **html_document** html file (web page)
- output: **pdf_document** pdf document
- output: **word_document** Microsoft Word .docx
- output: **beamer_presentation** beamer slideshow (pdf)
- output: **ioslides_presentation** ioslides slideshow (html)



RStudio® is a trademark of RStudio, Inc. • All rights reserved • info@rstudio.com • 844-448-1212 • rstudio.com

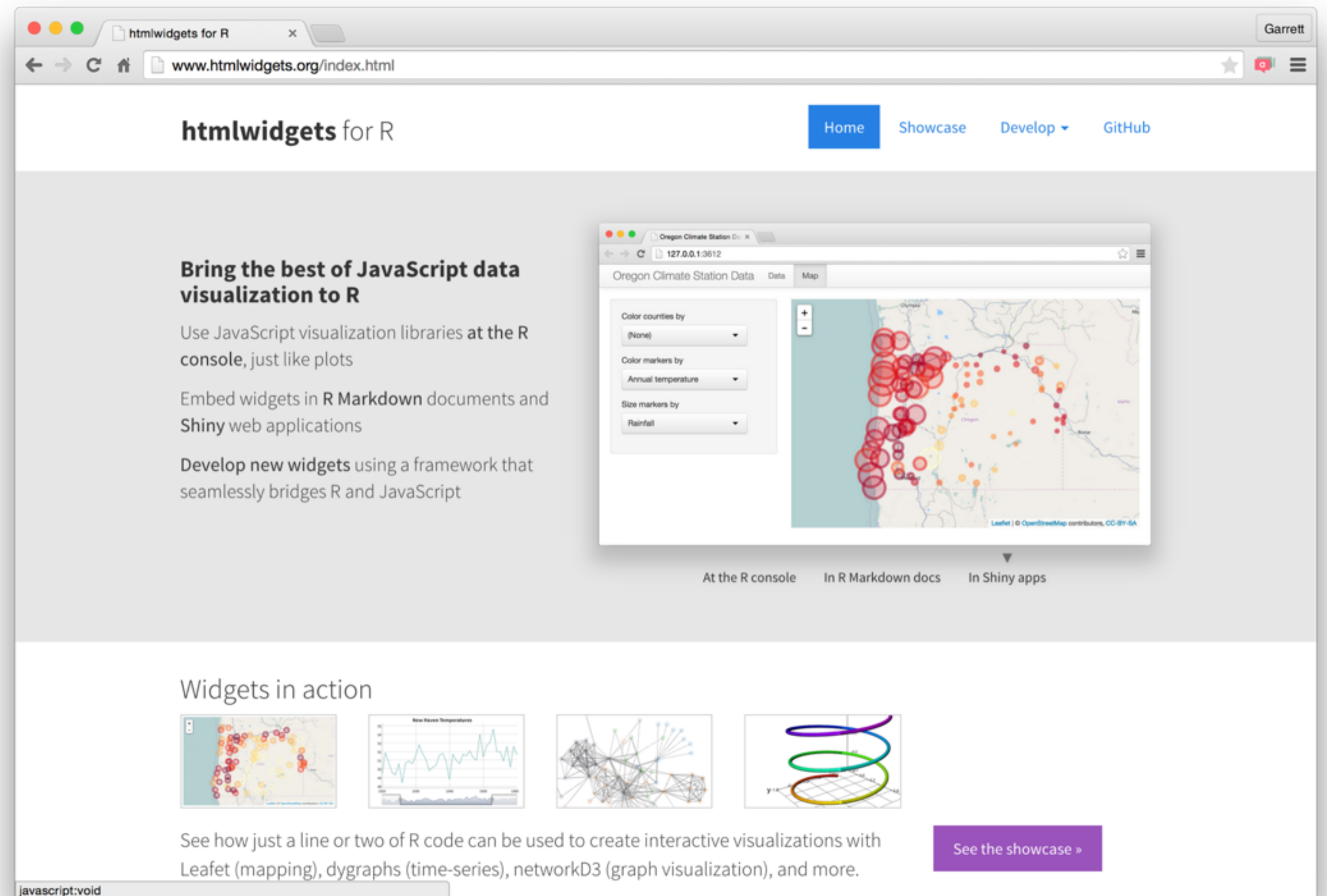
htmlwidgets

htmlwidgets

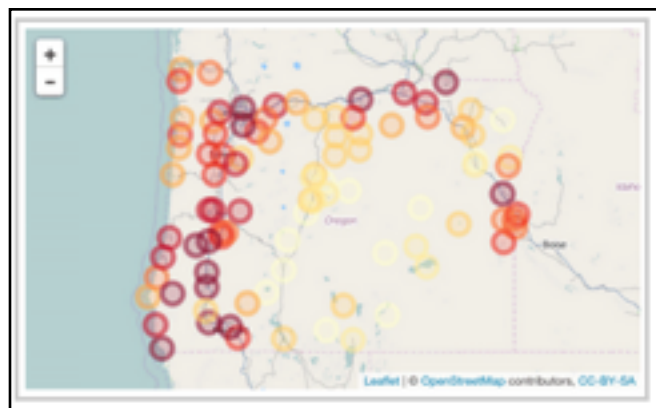
Use htmlwidgets in:

- RStudio viewer pane
- R Markdown files
- Shiny Apps

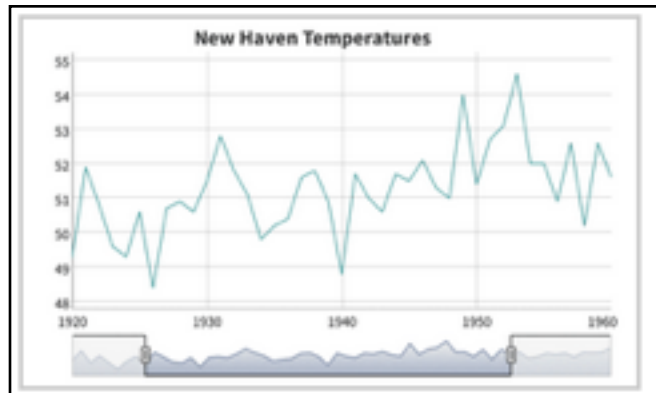
www.htmlwidgets.org



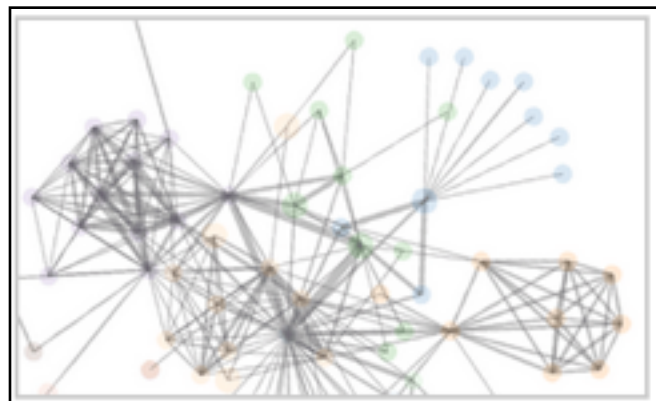
Packages with ready-to-use htmlwidgets:



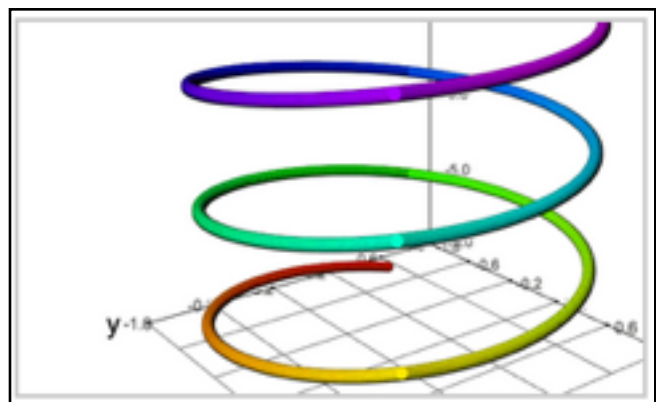
Leaflet - Interactive maps
rstudio.github.io/leaflet/



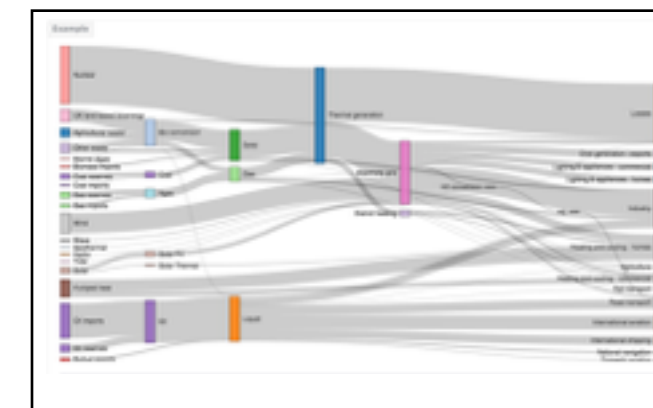
dygraphs - Time series
rstudio.github.io/dygraphs



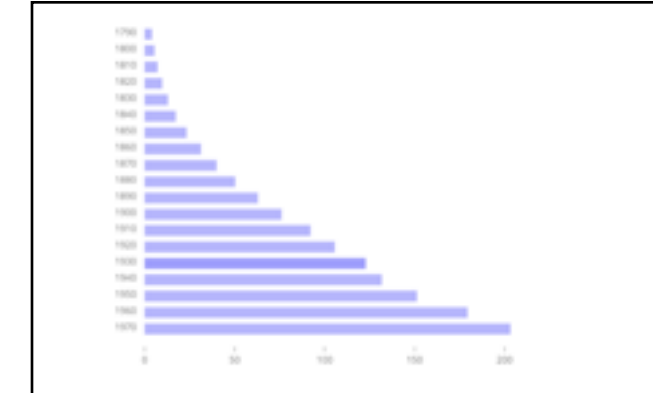
networkD3 - network graphs
christophergandrud.github.io/networkD3/



threejs - 3D charts
github.com/bwlewis/rthreejs



rCharts - Various charts
rCharts.io

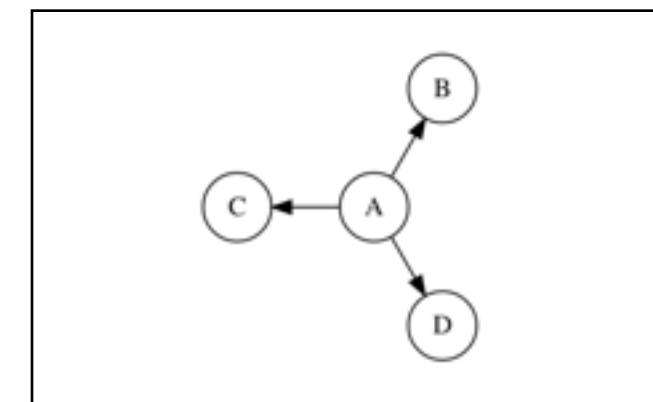


MetricsGraphics - d3 charts
hrbrmstr.github.io/metricsgraphics/



Sepal.Length	Sepal.Width	Petal.Length	Petal.Width	Species
5.1	3.5	1.4	0.2	setosa
4.9	3	1.4	0.2	setosa
4.7	3.2	1.3	0.2	setosa
4.6	3.1	1.5	0.2	setosa
5	3.6	1.4	0.2	setosa

DT - Data tables
rstudio.github.io/DT/



Diagrammer - Diagrams
rich-iannone.github.io/DiagrammeR/

Shiny

Shiny

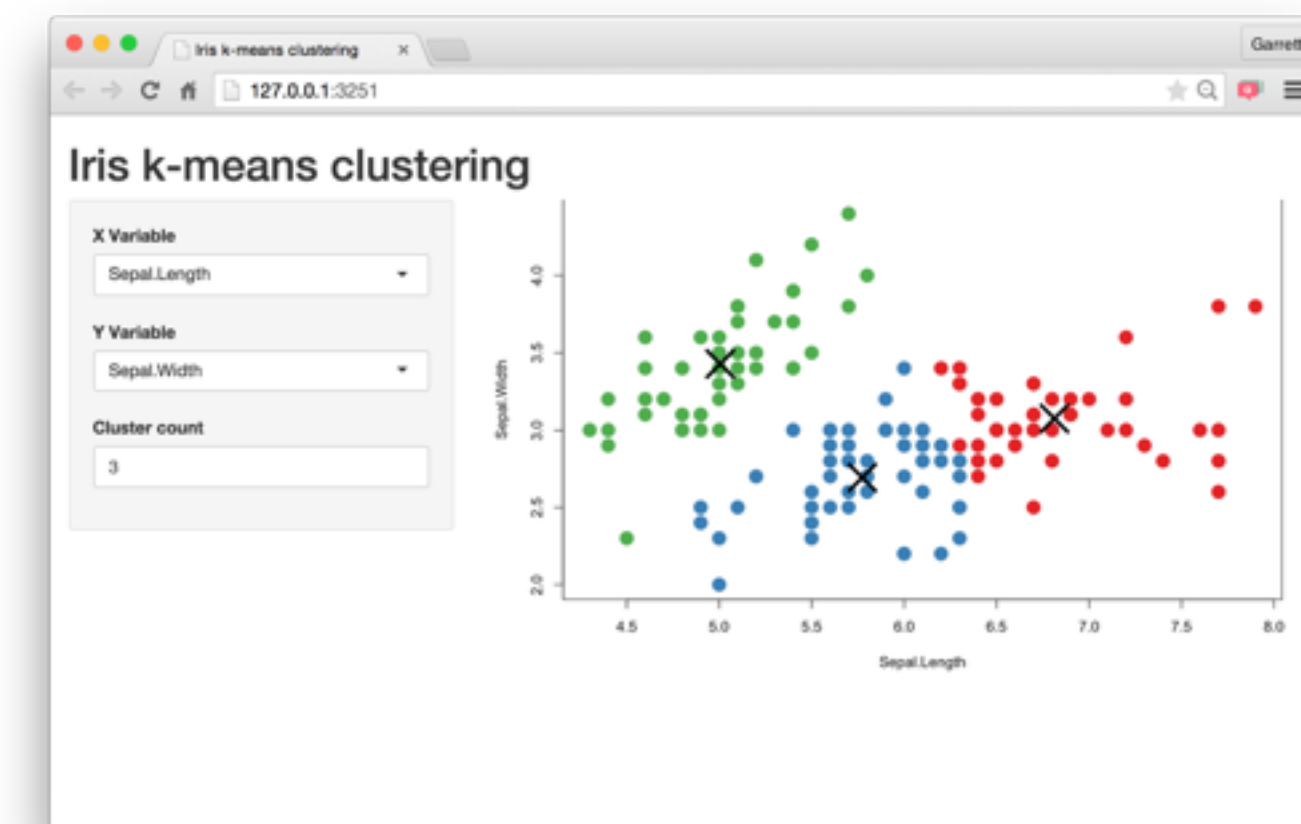


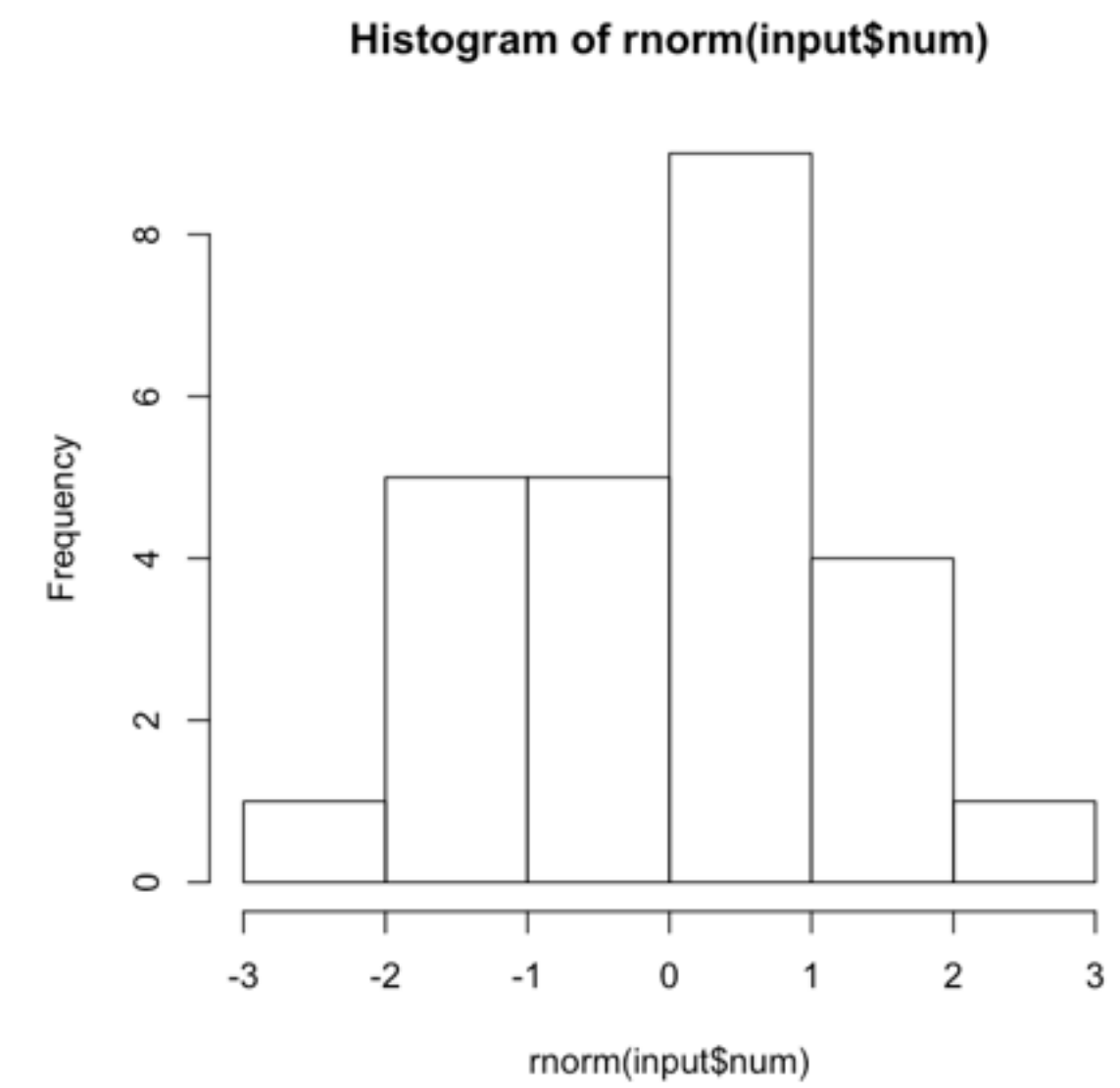
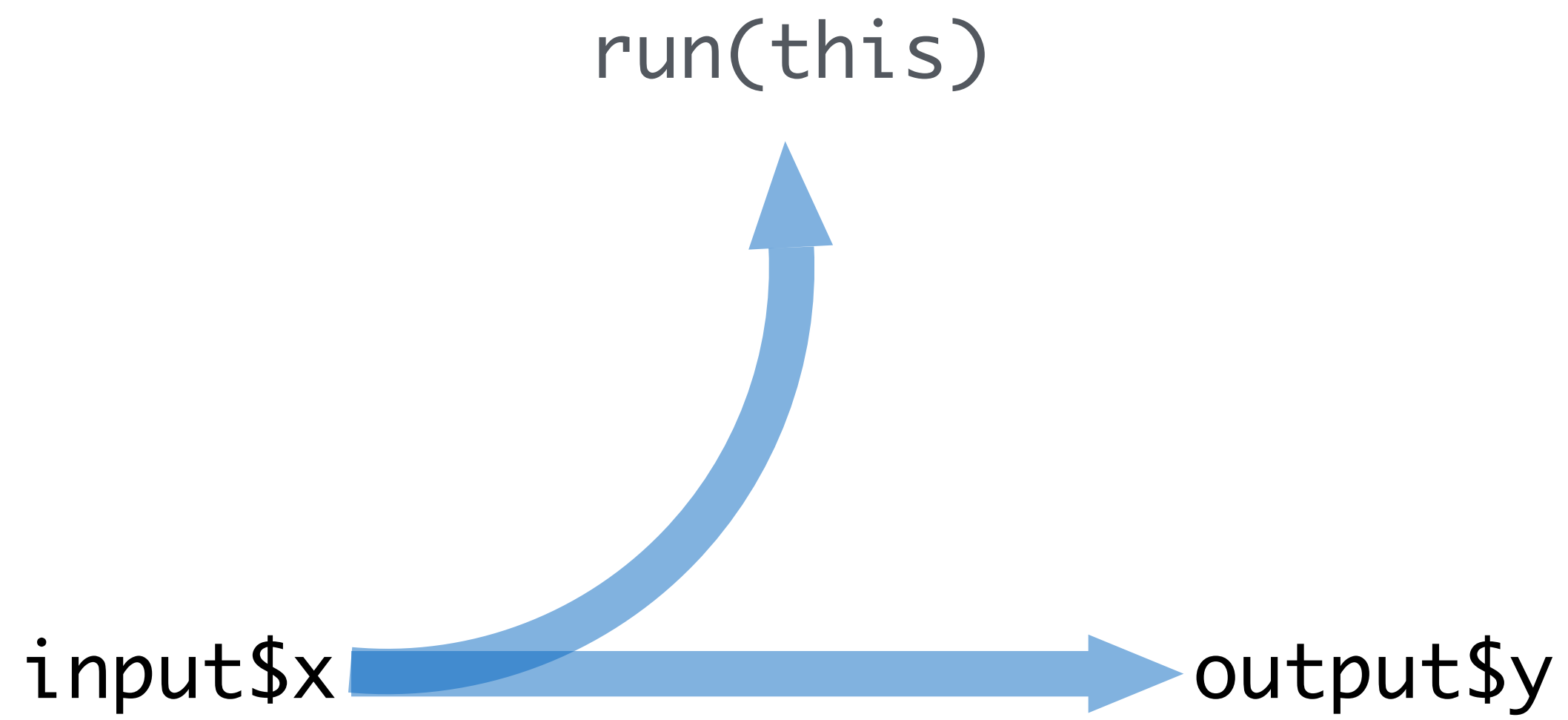
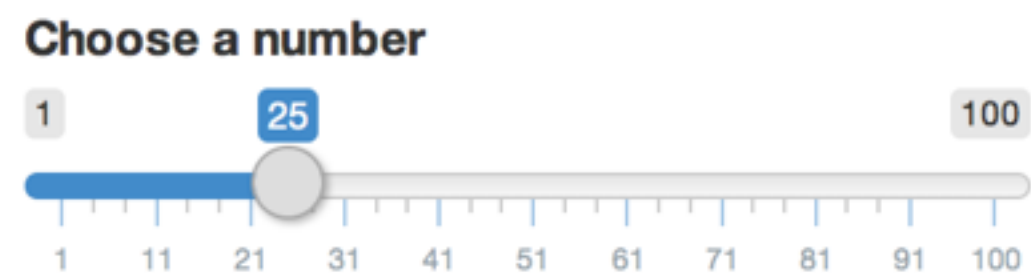
Every Shiny app is maintained by a computer running R

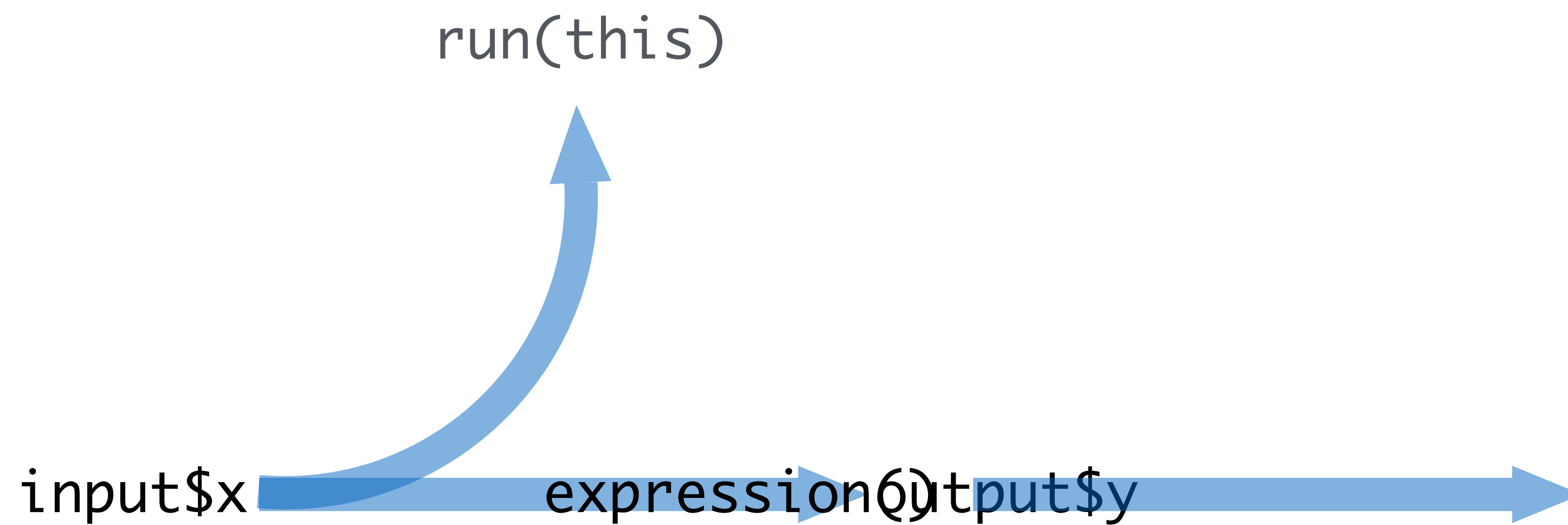


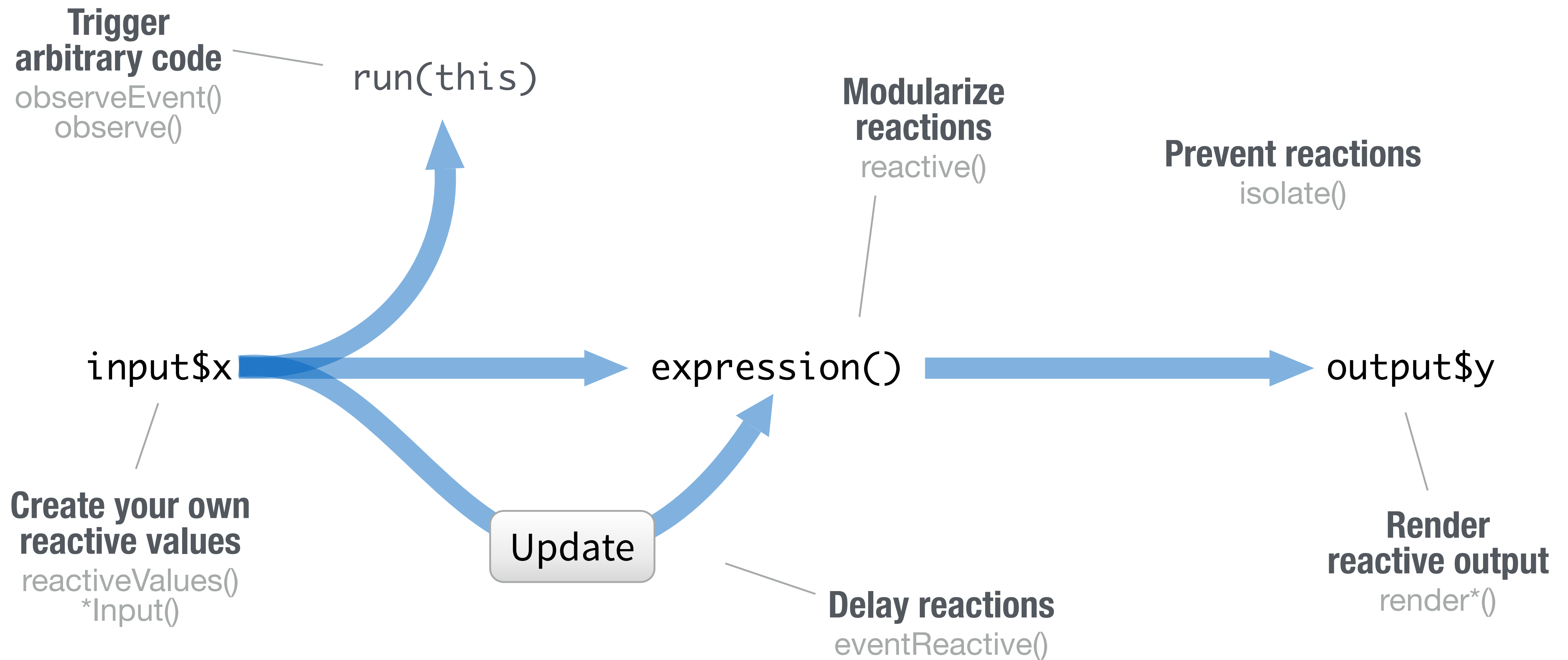
How to make an app

Every Shiny app is maintained by a computer running R









Recap: UI

Begin each app with the template

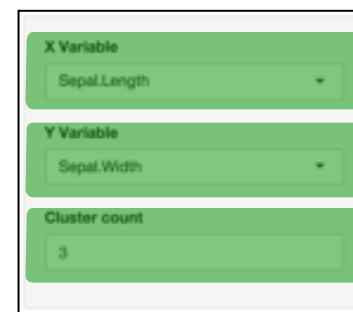
```
library(shiny)
ui <- fluidPage()
server <- function(input, output) {}
shinyApp(ui = ui, server = server)
```



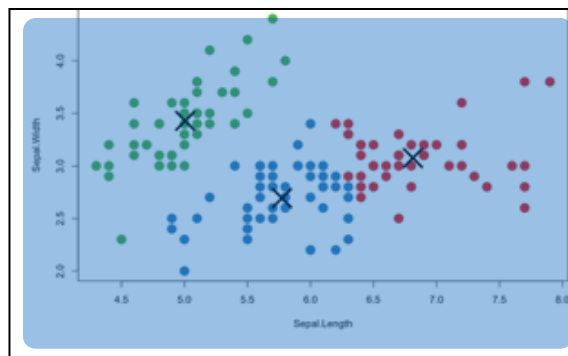
Hello World

Add elements as arguments to **fluidPage()**

Create reactive inputs with an ***Input()** function



Display reactive results with an ***Output()** function



Recap: Server



Use the server function to assemble inputs into outputs. Follow 3 rules:

output\$hist ←

1. Save the output that you build to **output\$**

```
renderPlot({  
  hist(rnorm(input$num))  
})
```

2. Build the output with a **render*()** function

input\$num

3. Access input values with **input\$**


Teach yourself
Shiny

The Shiny Cheat Sheet

www.rstudio.com/resources/cheatsheets/


Interactive Web Apps with shiny Cheat Sheet

learn more at shiny.rstudio.com



Basics

A **Shiny** app is a web page (**UI**) connected to a computer running a live R session (**Server**).



Users can manipulate the UI, which will cause the server to update the UI's displays (by running R code).

App template

Begin writing a new app with this template. Preview the app by running the code at the R command line.

```
library(shiny)
ui <- fluidPage()
server <- function(input, output){
  shinyApp(ui = ui, server = server)
}
```

- ui** - nested R functions that assemble an HTML user interface for your app
- server** - a function with instructions on how to build and rebuild the R objects displayed in the UI
- shinyApp** - combines **ui** and **server** into a functioning app. Wrap with **runApp()** if calling from a sourced script or inside a function.

Share your app

The easiest way to share your app is to host it on shinyapps.io, a cloud based service from RStudio

- Create a free or professional account at <http://shinyapps.io>
- Click the **Publish** icon in the RStudio IDE (≥ 0.99) or run: `rsconnect::deployApp("<path to directory>")`

Build or purchase your own Shiny Server at www.rstudio.com/products/shiny-server/

Building an App

Complete the template by adding arguments to **fluidPage()** and a body to the server function.

Add inputs to the UI with ***Input()** functions.
Add outputs with ***Output()** functions.
Tell server how to render outputs with R in the server function. To do this:

- Refer to outputs with **output\$<id>**
- Refer to inputs with **input\$<id>**
- Wrap code in a **render*()** function before saving to output

```
library(shiny)
ui <- fluidPage(
  numericInput(inputId = "n",
    "Sample size", value = 25),
  plotOutput(outputId = "hist")
)
server <- function(input, output) {
  output$hist <- renderPlot({
    hist(rnorm(input$n))
  })
}
shinyApp(ui = ui, server = server)
```

Save your template as **app.R**. Alternatively, split your template into two files named **ui.R** and **server.R**.

```
library(shiny)
ui <- fluidPage(
  numericInput(inputId = "n",
    "Sample size", value = 25),
  plotOutput(outputId = "hist")
)
server <- function(input, output) {
  output$hist <- renderPlot({
    hist(rnorm(input$n))
  })
}
shinyApp(ui = ui, server = server)
```

ui.R contains everything you would save to ui.
server.R ends with the function you would save to server.
No need to call **shinyApp()**.

Save each app as a directory that contains an **app.R** file (or a **server.R** file and a **ui.R** file) plus optional extra files.

- The directory name is the name of the app
- (optional) defines objects available to both ui.R and server.R
- (optional) used in showcase mode
- (optional) data, scripts, etc.
- (optional) directory of files to share with web browsers (images, CSS, js, etc.) Must be named **"www"**

Launch apps with **runApp(<path to directory>)**

Outputs - render*() and *Output() functions work together to add R output to the UI

Function	Arguments
renderDataTable	<code>renderDataTable(expr, options, callback, escape, env, quoted)</code>
renderImage	<code>renderImage(expr, env, quoted, deleteFile)</code>
renderPlot	<code>renderPlot(expr, width, height, res, ..., env, quoted, func)</code>
renderPrint	<code>renderPrint(expr, env, quoted, func, width)</code>
renderTable	<code>renderTable(expr, ..., env, quoted, func)</code>
renderText	<code>renderText(expr, env, quoted, func)</code>
renderUI	<code>renderUI(expr, env, quoted, func)</code>
dataTableOutput	<code>dataTableOutput(outputId, icon, ...)</code>
imageOutput	<code>imageOutput(outputId, width, height, click, dblclick, hover, hoverDelay, hoverDelayType, brush, clickId, hoverId, inline)</code>
plotOutput	<code>plotOutput(outputId, width, height, click, dblclick, hover, hoverDelay, hoverDelayType, brush, clickId, hoverId, inline)</code>
verbatimTextOutput	<code>verbatimTextOutput(outputId)</code>
tableOutput	<code>tableOutput(outputId)</code>
textOutput	<code>textOutput(outputId, container, inline)</code>
uiOutput	<code>uiOutput(outputId, inline, container, ...)</code>
htmlOutput	<code>htmlOutput(outputId, inline, container, ...)</code>

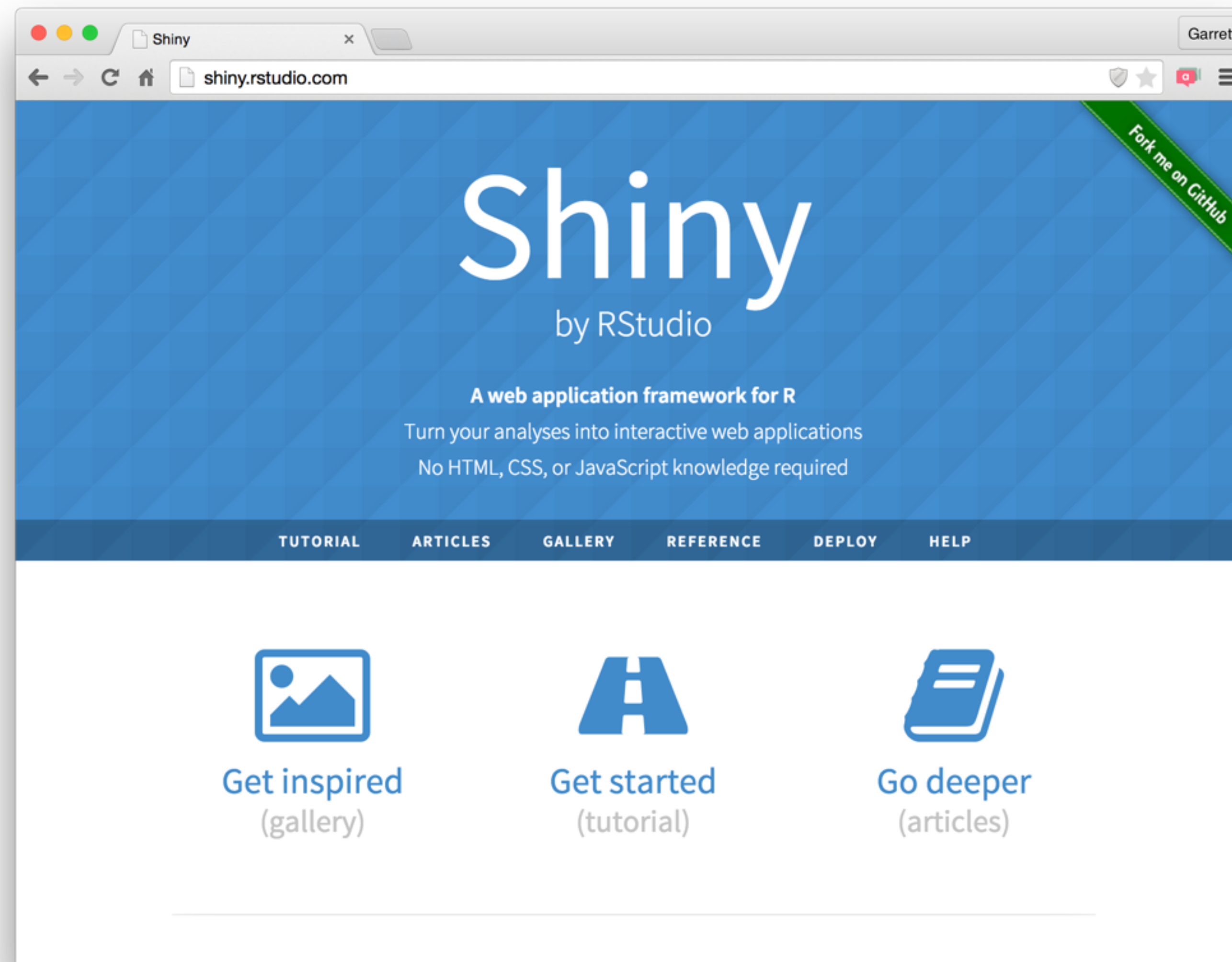
Inputs - collect values from the user

Access the current value of an input object with **input\$<inputId>**. Input values are reactive.

Action	Function
Action	<code>actionButton(inputId, label, icon, ...)</code>
Link	<code>actionLink(inputId, label, icon, ...)</code>
Choice 1	<code>checkboxGroupInput(inputId, label, choices, selected, inline)</code>
Choice 2	<code>checkboxInput(inputId, label, value)</code>
Choice 3	<code>checkboxInput(inputId, label, value)</code>
Check me	<code>checkboxInput(inputId, label, value)</code>
	<code>dateInput(inputId, label, value, min, max, format, startview, weekstart, language)</code>
	<code>dateRangeInput(inputId, label, start, end, min, max, format, startview, weekstart, language, separator)</code>
Choose File	<code>fileInput(inputId, label, multiple, accept)</code>
1	<code>numericInput(inputId, label, value, min, max, step)</code>
	<code>passwordInput(inputId, label, value)</code>
Choice A	<code>radioButtons(inputId, label, choices, selected, inline)</code>
Choice B	<code>radioButtons(inputId, label, choices, selected, inline)</code>
Choice C	<code>radioButtons(inputId, label, choices, selected, inline)</code>
Choice 1	<code>selectInput(inputId, label, choices, selected, multiple, selectize, width, size) (also selectizeInput())</code>
Choice 2	<code>selectInput(inputId, label, choices, selected, multiple, selectize, width, size) (also selectizeInput())</code>
	<code>sliderInput(inputId, label, min, max, value, step, round, format, locale, ticks, animate, width, sep, pre, post)</code>
Apply Changes	<code>submitButton(text, icon) (Prevents reactions across entire app)</code>
Enter text	<code>textInput(inputId, label, value)</code>

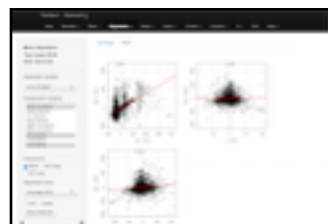
The Shiny Development Center

shiny.rstudio.com



**What can an
app do?**

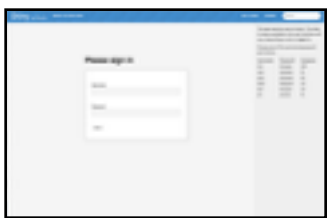
What can a Shiny app do?



Make R analysis accessible to **non-programmers**



Highly **customizable**, highly **shareable** HTML front end



Read and write to **databases**



Monitor **streaming data**



Require and use **authentication**



Ideal for Exploratory Data Analysis

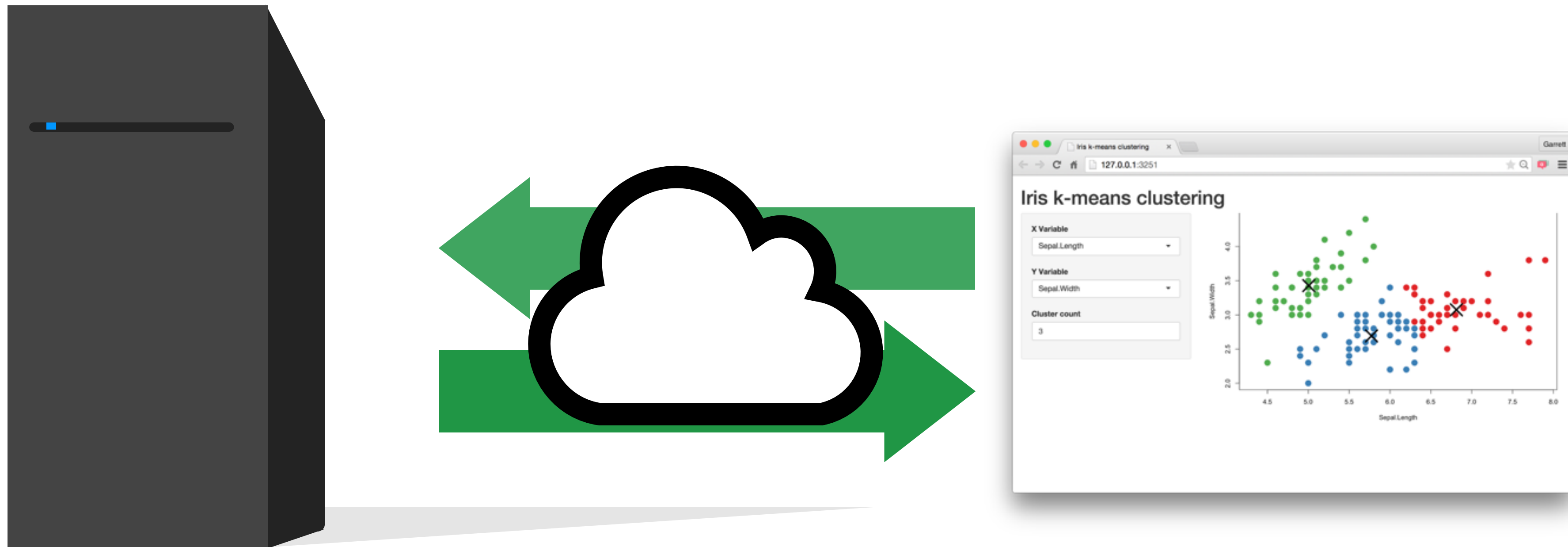


Ideal Data Portal / Results Explorer / Simulation API / Dashboard

Share
your app



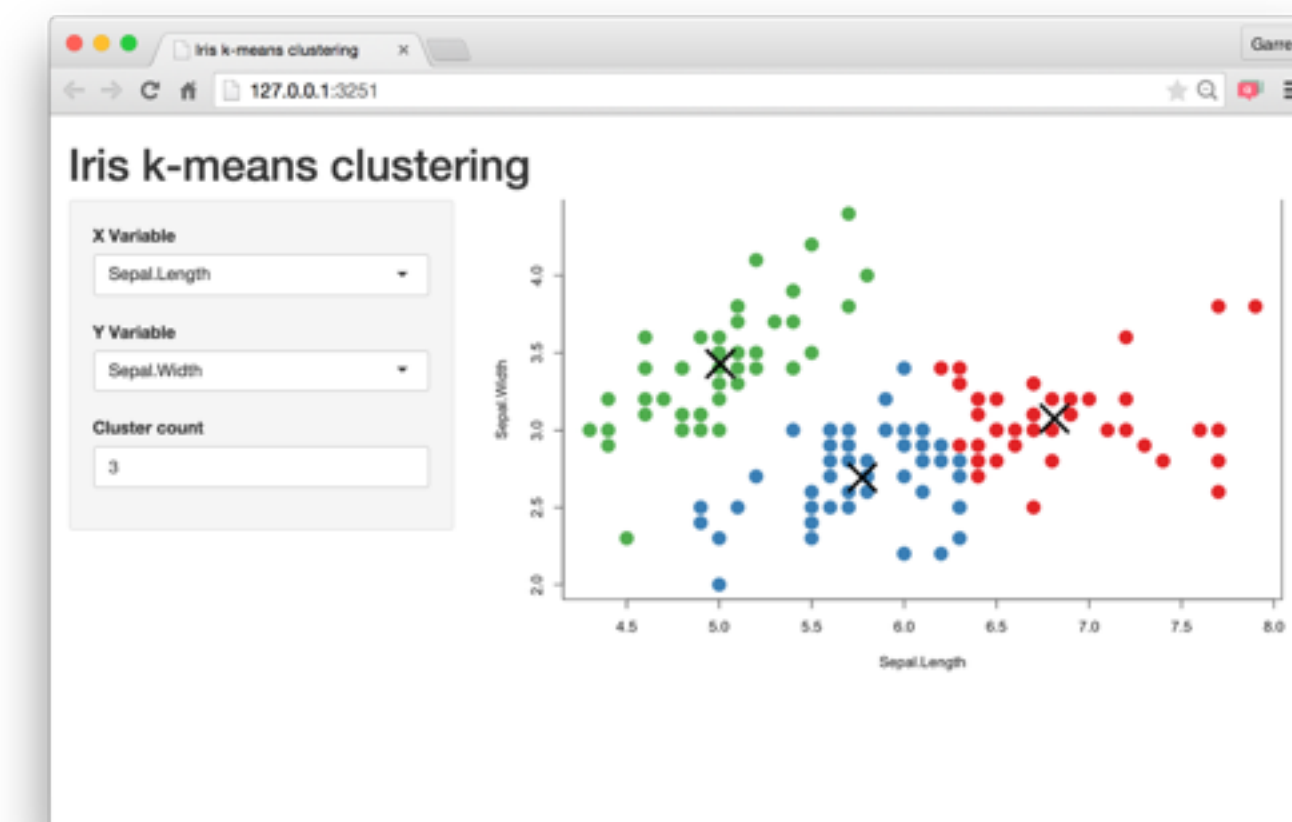
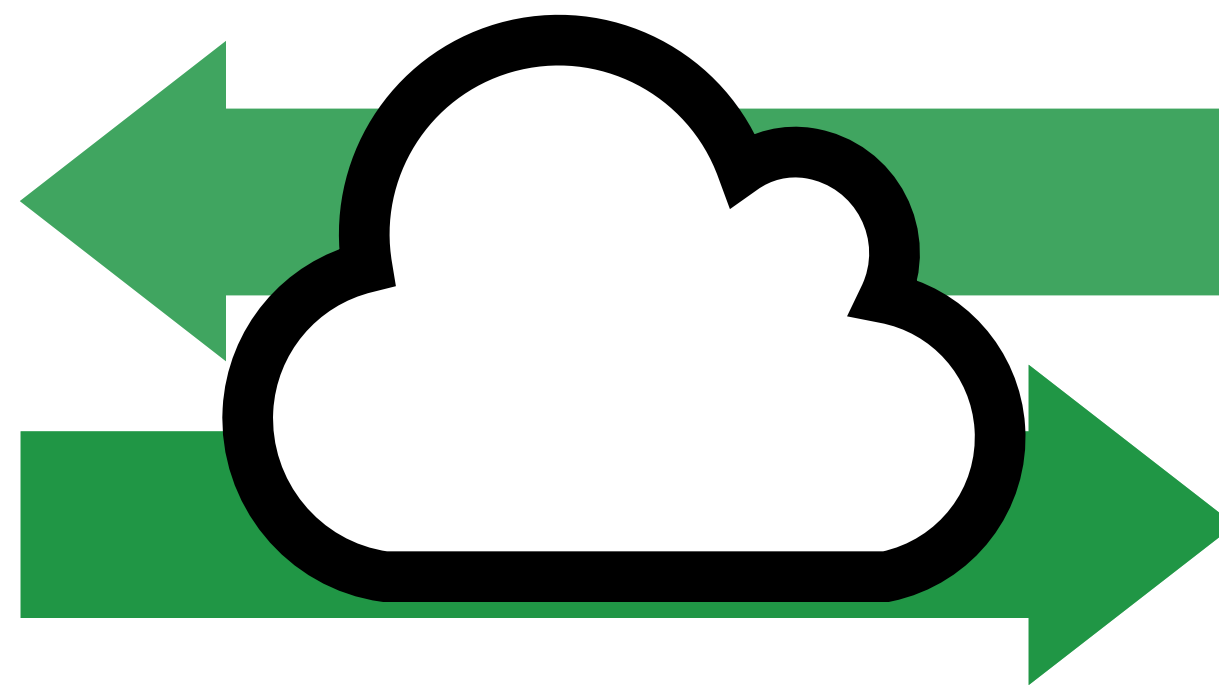
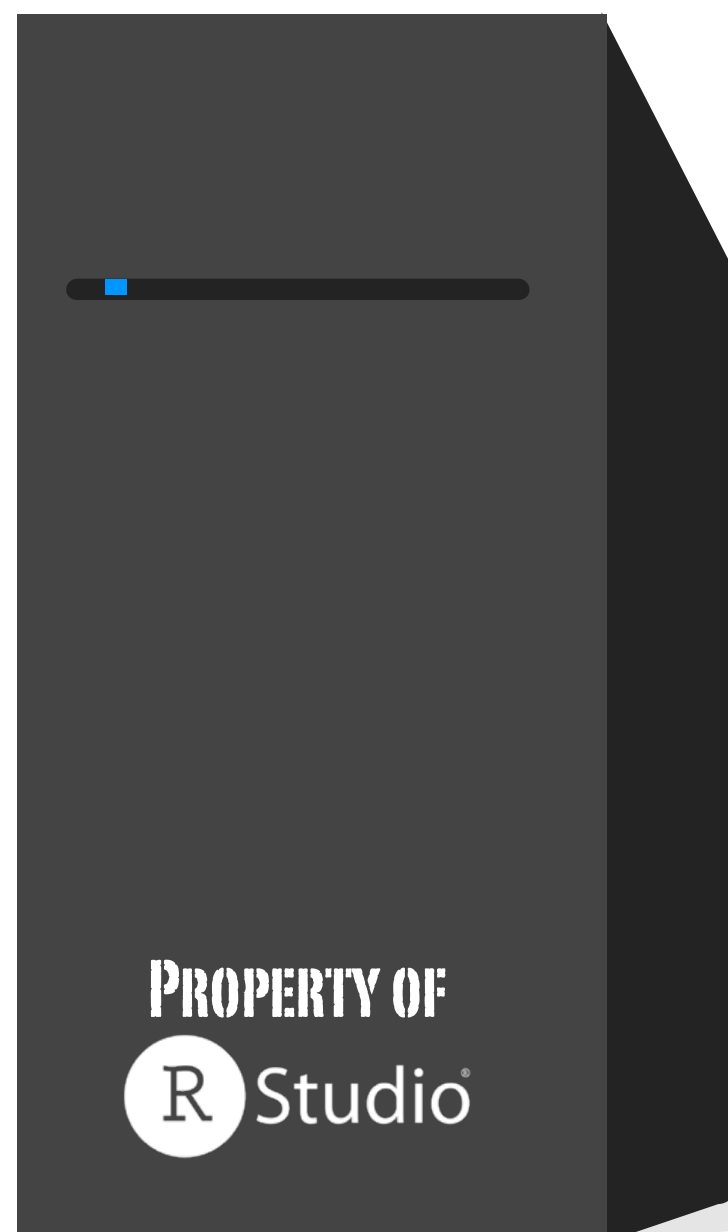
Every Shiny app is maintained by a computer running R



Shinyapps.io

A server maintained by RStudio

- free
- easy to use
- secure
- scalable



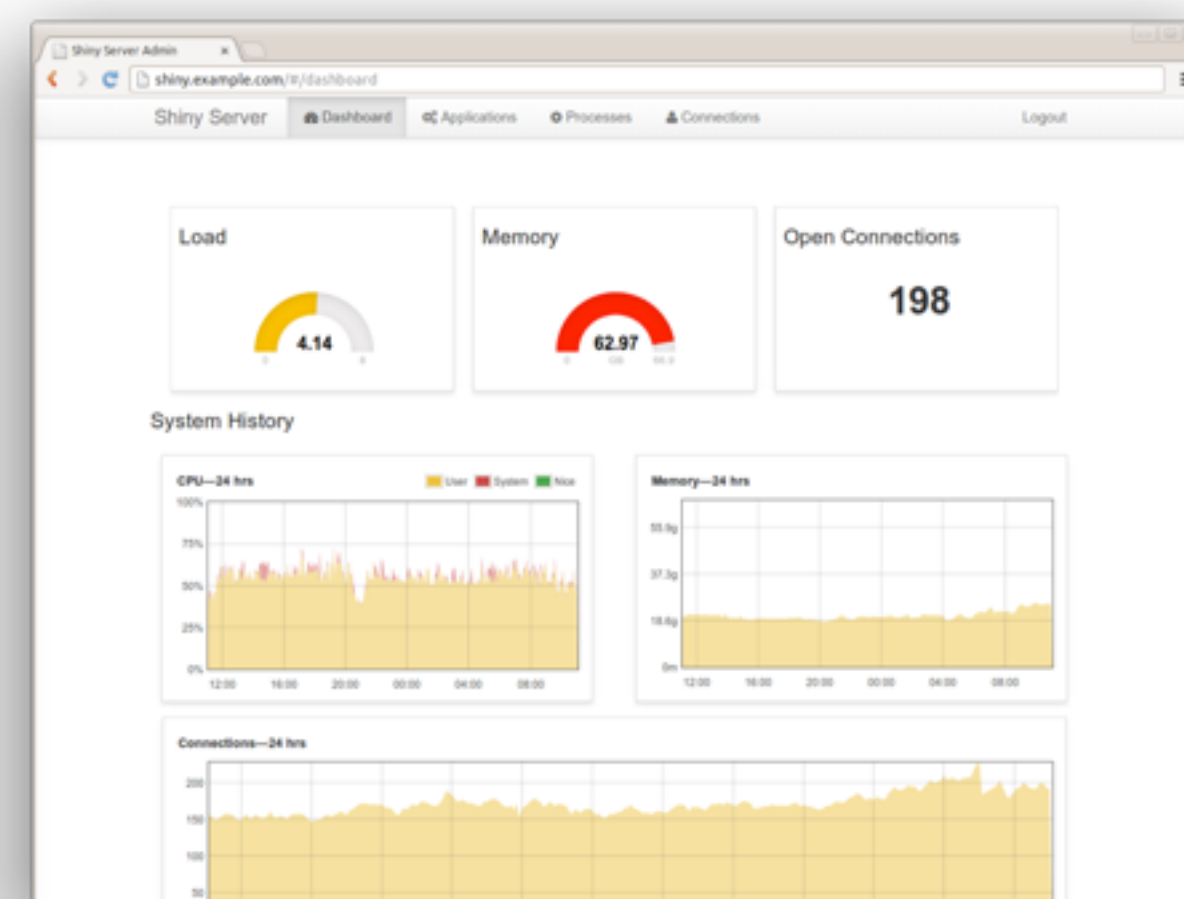
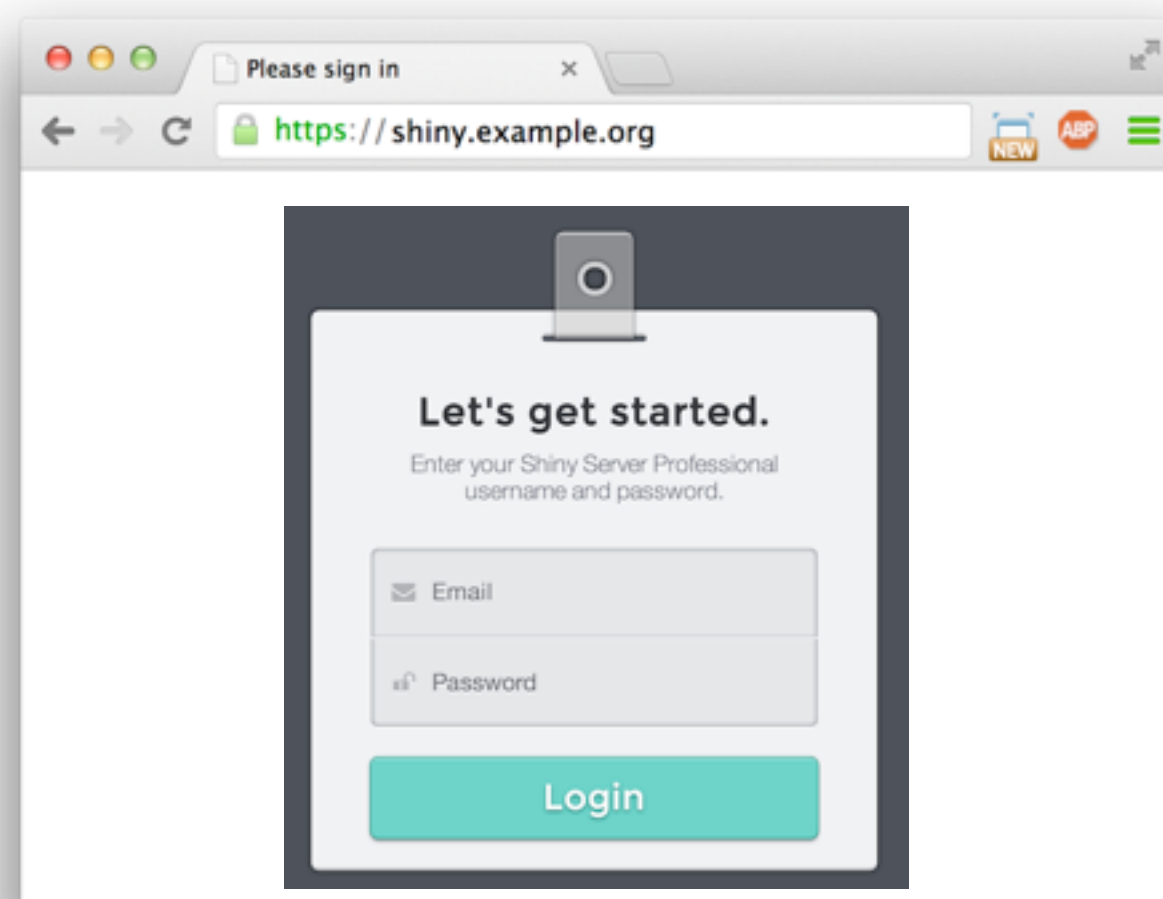
Build your own server

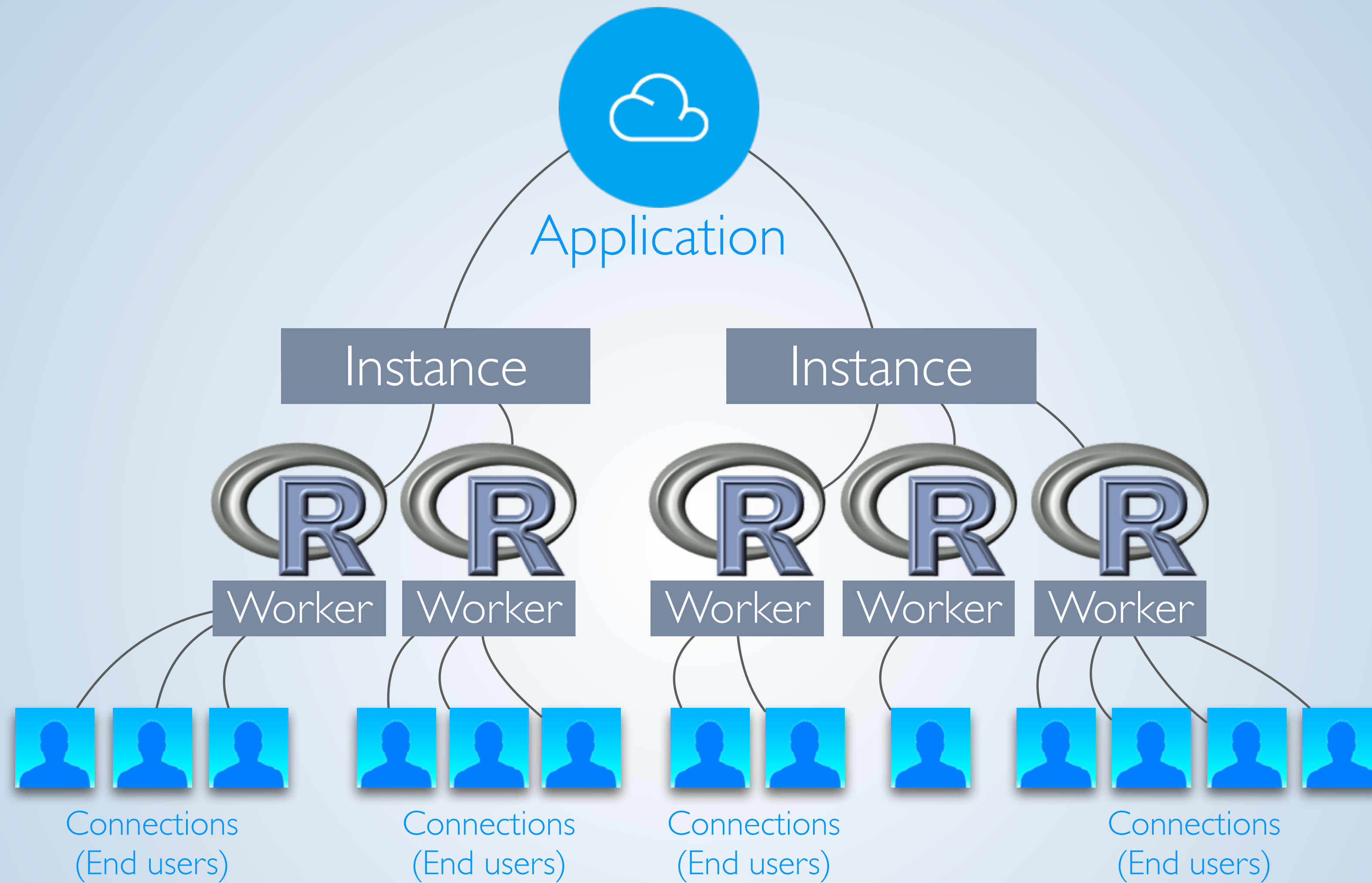


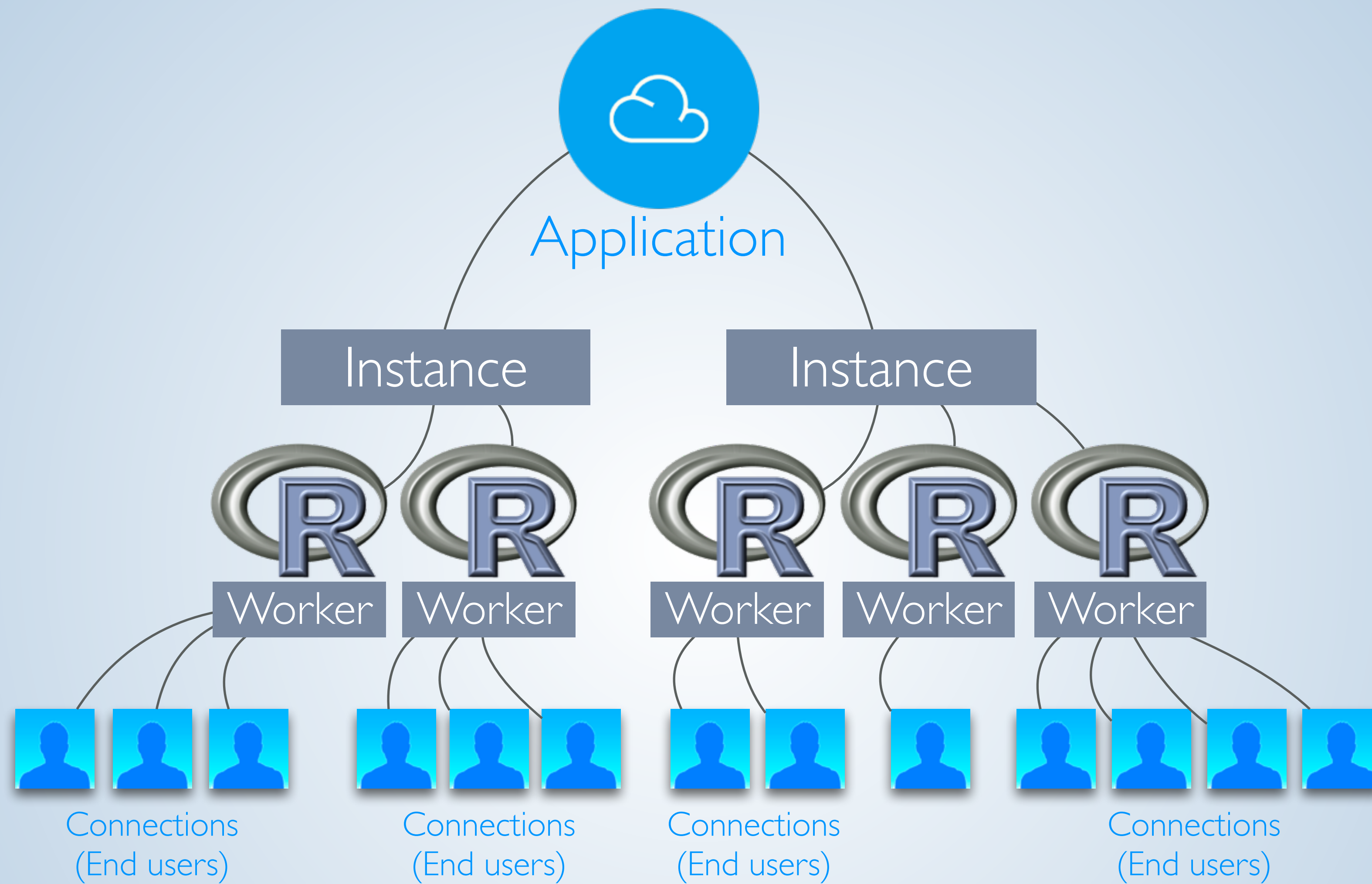
Shiny Server Pro

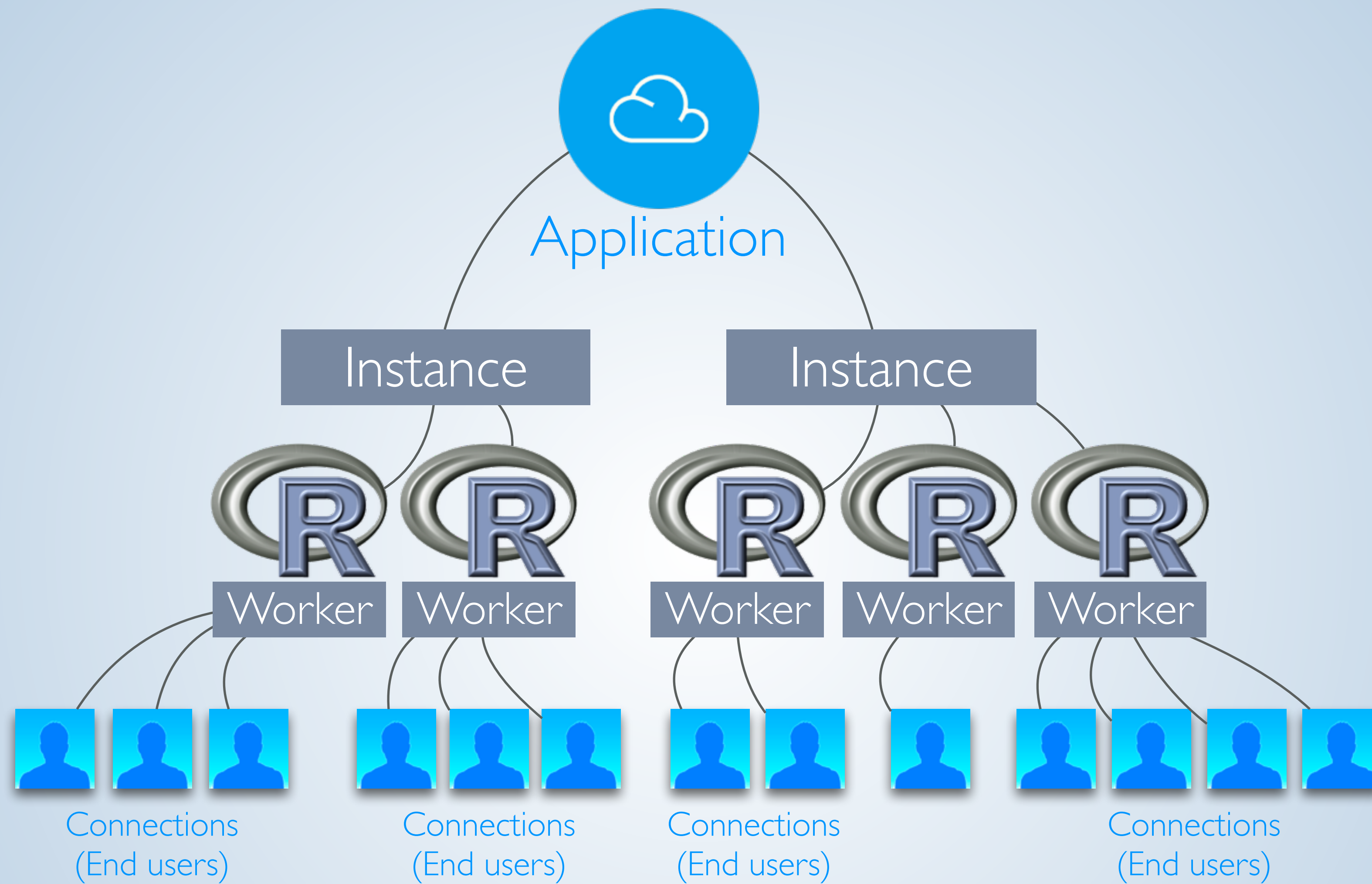
www.rstudio.com/products/shiny/shiny-server/

- ✓ **Secure access** - LDAP, GoogleAuth, SSL, and more
- ✓ **Performance** - fine tune at app and server level
- ✓ **Management** - monitor and control resource use
- ✓ **Support** - direct priority support









Useful websites



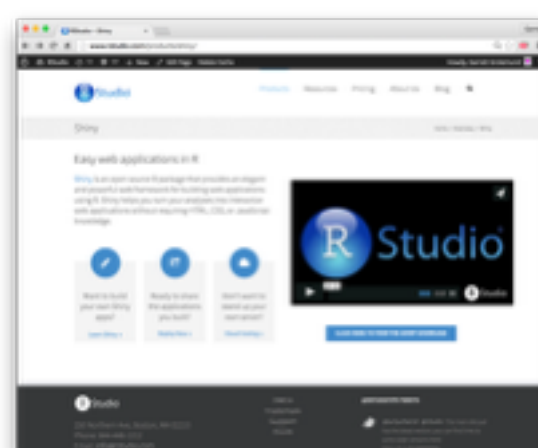
The Shiny development center:
shiny.rstudio.com



The R Markdown development center:
rmarkdown.rstudio.com



Shiny and R Markdown cheat sheets:
www.rstudio.com/resources/cheatsheets



RStudio products:
www.rstudio.com/products/shiny