

Visualization for Data Science in R

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Data Matters 2019

<https://github.com/amzoss/RVis-DM2019>

Objectives/Outline

Day 1: Static visualizations

- Visualization and data science
- Basic ggplot2 syntax
- Basics of geoms and aes
- Manipulating data
- Categorical variables
- Advanced topics: mapping, saving charts out

Day 2: Interactivity

- Simple interactive plots
- Arranging charts into dashboards
- Incorporating Shiny elements into documents, dashboards
- Advanced topics: full Shiny apps

Interactivity

Why make charts interactive?

- Easier for data exploration
 - Drill-down to data subsets of interest
 - Details on demand
 - Customize look-and-feel of chart
- Can be more engaging for users

Visual information seeking mantra

Overview first,
zoom and filter,
then details-on-demand

Shneiderman, B. (1996). The eyes have it: A task by data type taxonomy for information visualization. In *VL '96 Proceedings of the 1996 IEEE Symposium on Visual Languages*.

Interactivity in R Markdown

- R Markdown gets compiled into HTML
- Some R packages can create interactive elements by converting R output to JavaScript code for the final HTML document
- We will use the **plotly** package to create interactive charts

<http://www.htmlwidgets.org/>

Other interactive chart packages

- [ggiraph](#) for extending ggplot2 with interactive geoms
- [rCharts](#) for an R version of Polycharts, NVD3, and MorrisJS
- [rBokeh](#) for an R version of Bokeh
- [altair](#) for an R version of Altair
- [leaflet](#) for interactive maps

Exercise 1: Make yesterday's
charts interactive

Dashboards in R Markdown

“Normal” R Markdown

- R Markdown elements like headings, text

Heading 1

Heading 2

Regular text

* Bulleted text

- Code chunks

```
```{r}
```

```
```
```

Markdown for flexdashboards

Page

=====

Regular text

* Bulleted text

Column (or Row)

```
``{r}
```

```
```
```

### Chart titles

## Exercise 2: Star Wars dashboard

# Exercise 3: Vis Portfolio

Shiny

# What is Shiny?

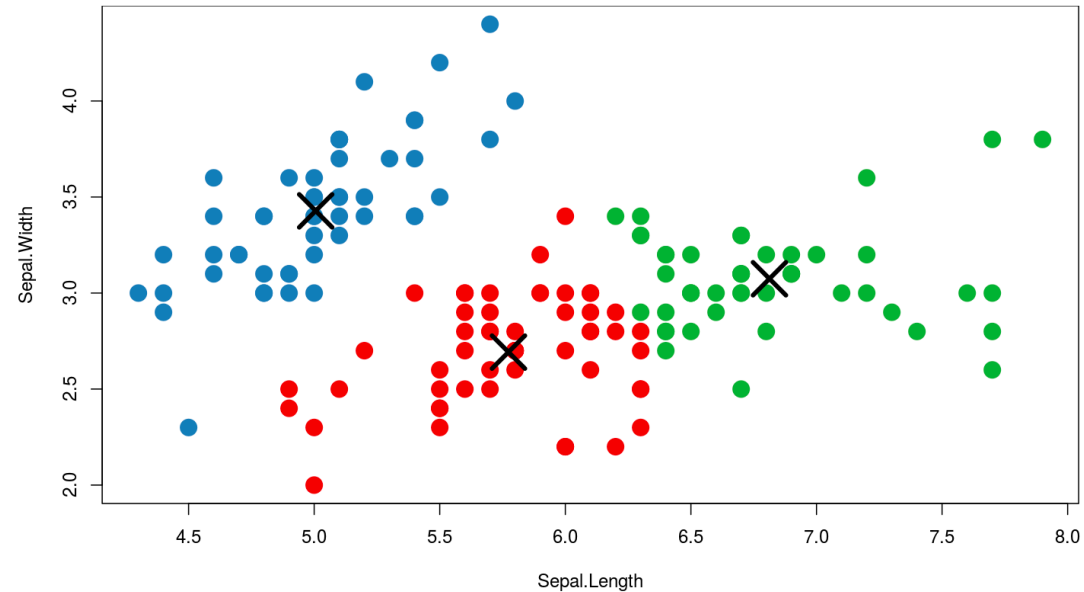
An interactive interface onto an R program

## Iris k-means clustering

**X Variable**  
Sepal.Length ▼

**Y Variable**  
Sepal.Width ▼

**Cluster count**  
3



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

# How can you use Shiny for visualization?

- Use Shiny to control some kind of simulation interactively, then visualize the results
- Use Shiny to change components within the chart (e.g., switch the mappings)
- Use Shiny to filter data to subsets to highlight patterns
- Change type of regression, plot results

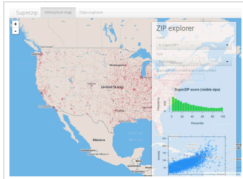
Shiny examples



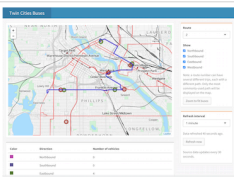
# Gallery

## Interactive visualizations

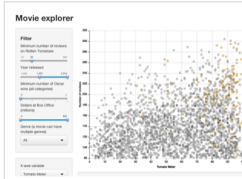
Shiny is designed for fully interactive visualization, using JavaScript libraries like [d3](#), [Leaflet](#), and [Google Charts](#).



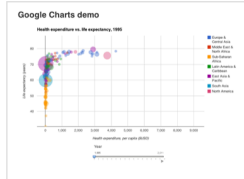
[SuperZip example](#)



[Bus dashboard](#)



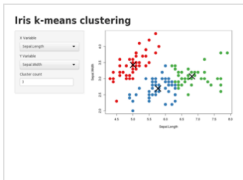
[Movie explorer](#)



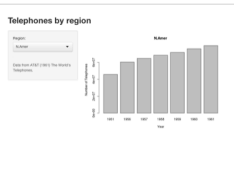
[Google Charts](#)

## Start simple

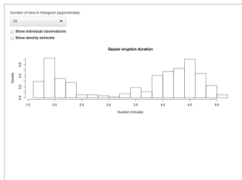
If you're new to Shiny, these simple but complete applications are designed for you to study.



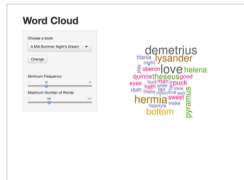
[Kmeans example](#)



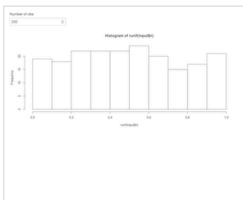
[Telephones by region](#)



[Faithful](#)



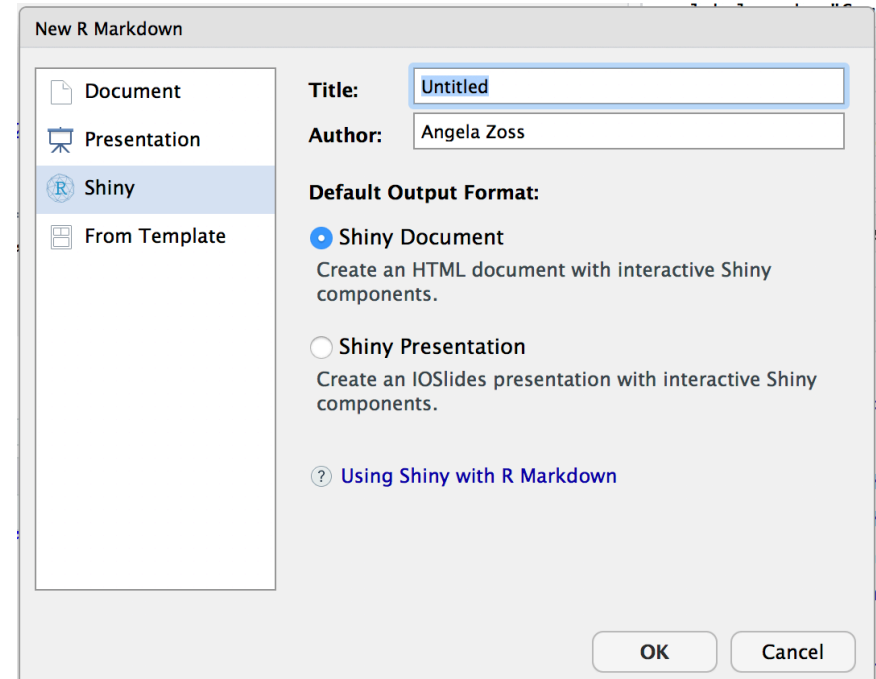
[Word cloud](#)



[Single-file shiny app](#)

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

# Shiny in R Markdown

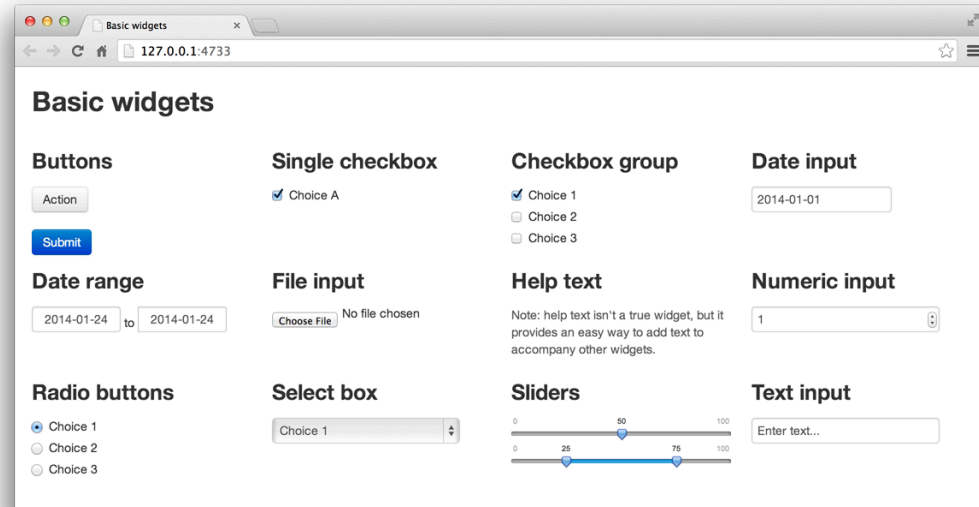


# Components

Some kind of **input widget**  
(e.g., selectInput, sliderInput)

Some kind of **render object**  
(e.g., renderPlot, renderTable)

renderPlot wraps around  
something like a ggplot() plot



# Layout

- In this case, Shiny elements are included to change/control individual charts
- The overall layout of the file is just using normal R Markdown syntax, and Shiny elements get embedded whenever the right code chunk comes up

# Both components go in same code chunk

```
```{r}

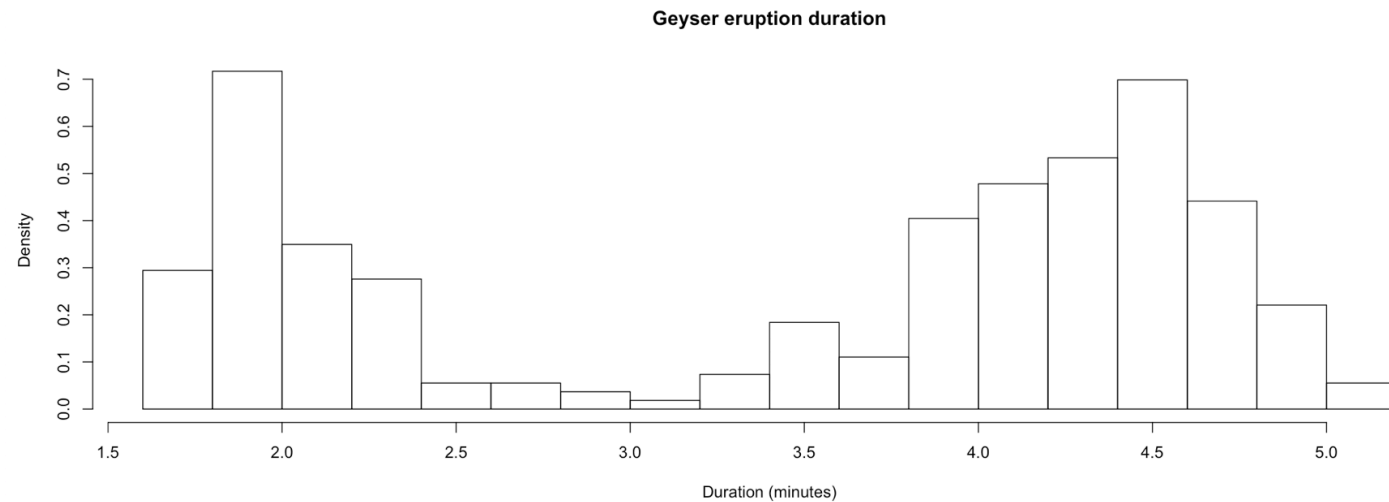
selectInput("n_breaks", label = "Number of bins:",
            choices = c(10, 20, 35, 50), selected = 20)

renderPlot({
  hist(faithful$eruptions, probability = TRUE, breaks = as.numeric(input$n_breaks),
       xlab = "Duration (minutes)", main = "Geyser eruption duration")
})

```
```

Number of bins:

20 ▼



# Anatomy of a widget

- **Name** for the widget (internal only)
- **Label** (will be visible)
- Check documentation for other required arguments

# Exercise 4: Game of Thrones Markdown

Select Variable for Color:

gender

▼

Change Label Font Size:

1

4

10

1

2

3

4

5

6

7

8

9

10





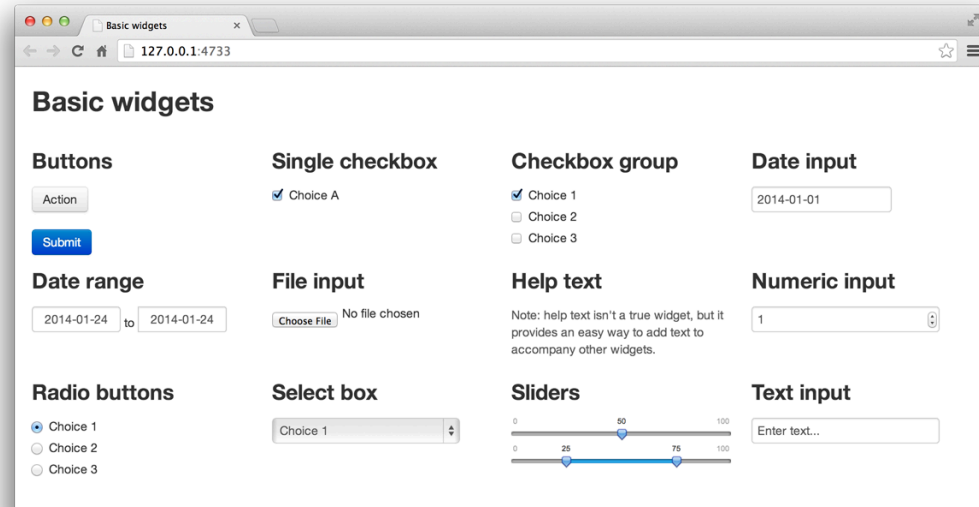
# Shiny in Dashboards

# Components (same as R Markdown)

Some kind of **input widget**  
(e.g., selectInput, sliderInput)

Some kind of **render object**  
(e.g., renderPlot, renderTable)

renderPlot wraps around  
something like a ggplot() plot



# Layout (similar to normal flexdashboards)

Page

=====

Regular text

\* Bulleted text

Column `{.sidebar}`

-----

```
``{r}
```

(including Shiny input, render objects)

```
...
```

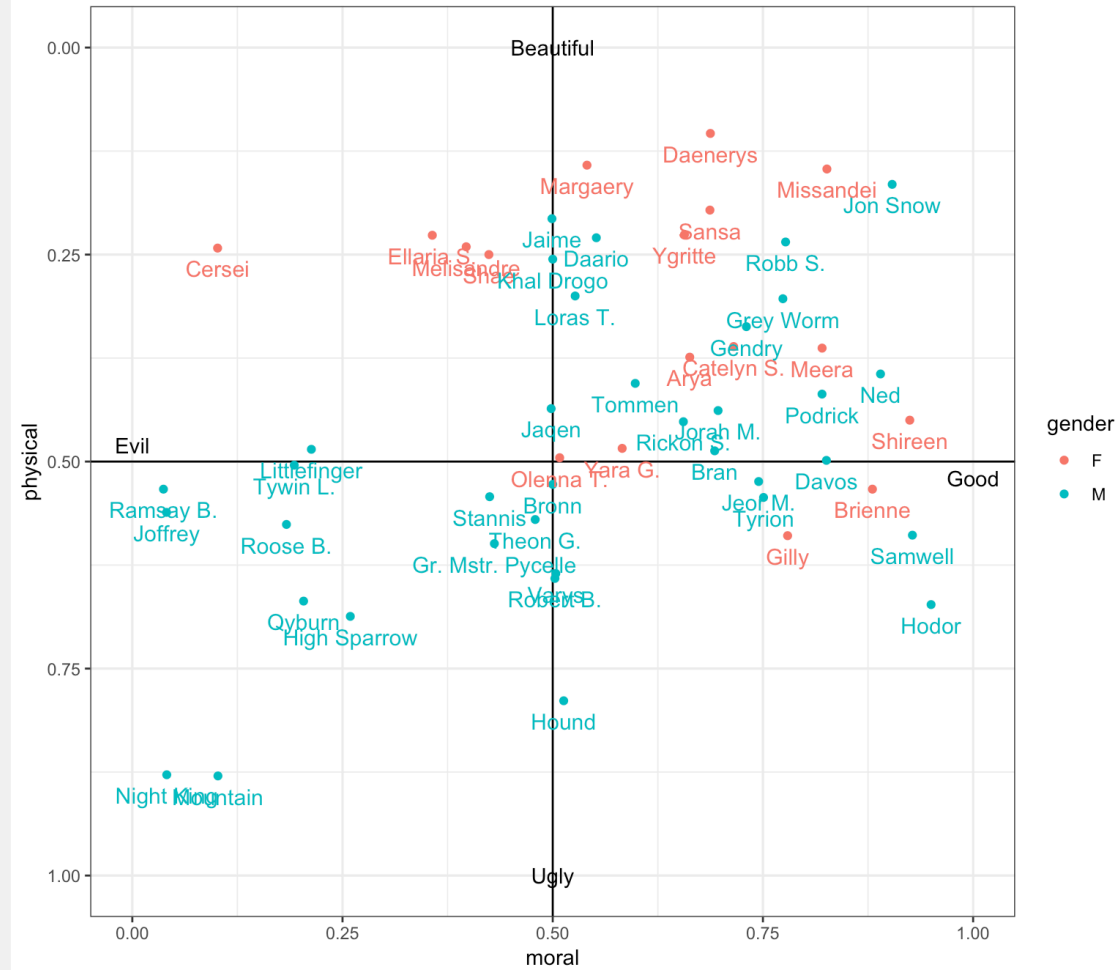
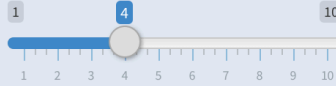
### Chart titles

# Exercise 5: Interactive Vis Portfolio

Select Variable for Color:

gender

Change Label Font Size:



# Shiny Apps

# How do you build a Shiny app?

## **User Interface (UI)**

the website people will see and interact with

## **Server**

takes values from the interface, does some calculations, and creates more content for the interface

Step 1: Create the interface



# What to put in the UI?

- Layout elements
- Extra text/HTML elements
- Control widgets
- Placeholders for reactive output

# Page layout

## 1. fluidPage

- titlePanel
- sidebarLayout
  - sidebarPanel
  - mainPanel
- fluidRow
  - column
  - wellPanel
- tabsetPanel
- navlistPanel

## 2. fixedPage

- fixedRow

## 3. navbarPage

- tabPanel
- navbarMenu
  - tabPanel

<http://shiny.rstudio.com/articles/layout-guide.html>

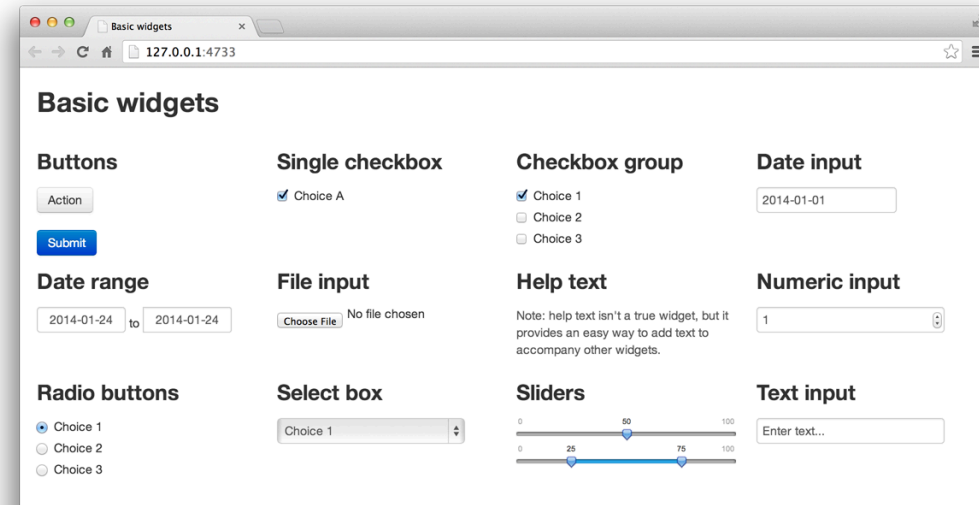
# HTML elements

- Shiny has special wrapper functions for this – e.g., `h2()`, `p()`

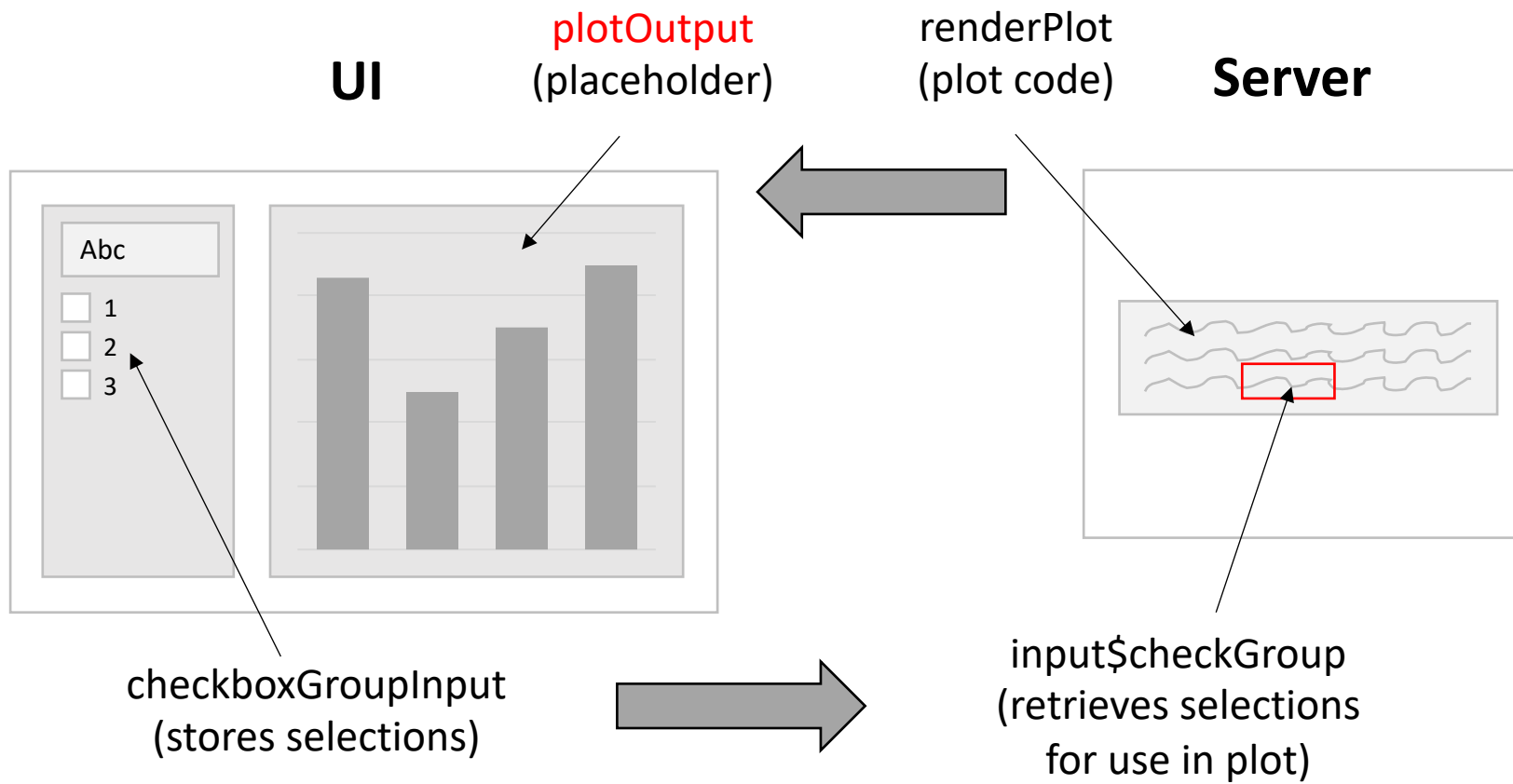
<http://shiny.rstudio.com/tutorial/written-tutorial/lesson2/>

# Control widgets

- Button
- Checkboxes
- Date, date range input
- File input
- Numeric input
- Radio buttons
- Drop-down (select) box
- Slider bar
- Text input
- Text



<http://shiny.rstudio.com/tutorial/written-tutorial/lesson3/>  
<http://shiny.rstudio.com/gallery/widget-gallery.html>

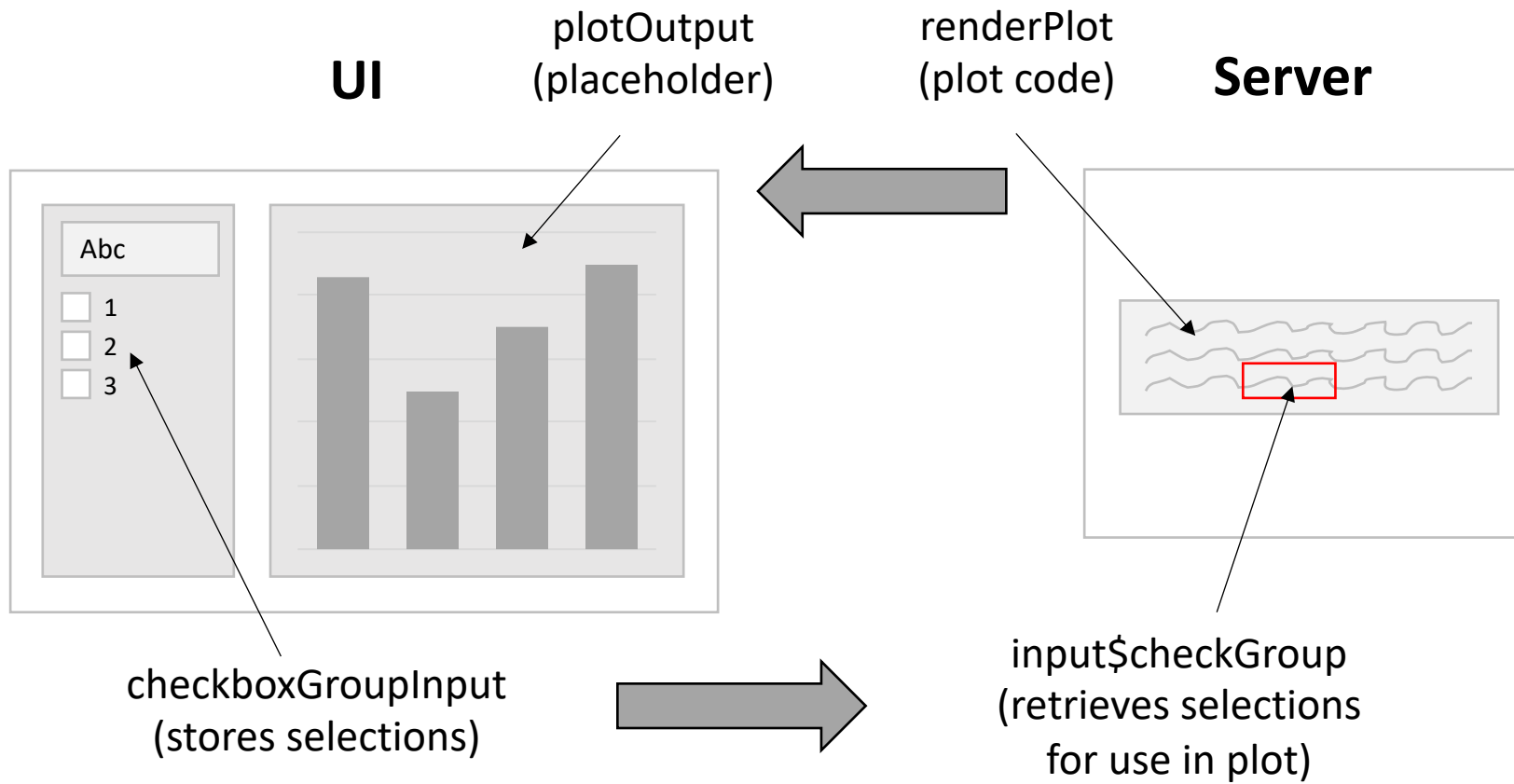


# Reactive output objects

| UI                 | Server      |
|--------------------|-------------|
| htmlOutput         | renderUI    |
| imageOutput        | renderImage |
| plotOutput         | renderPlot  |
| tableOutput        | renderTable |
| textOutput         | renderText  |
| uiOutput           | renderUI    |
| verbatimTextOutput | renderPrint |

<http://shiny.rstudio.com/tutorial/written-tutorial/lesson4/>

Step 2: Set up server to create  
dynamic objects





# What to put in the server

- R code
- Render objects with same names and types as the ones listed in UI
- Input objects with the same names as the control widgets

## UI:

```
sliderInput("slider1")

textOutput("text1")
```

## Server:

```
output$text1 <- renderText({
 input$slider1
})
```

Step 3: Test

# Running the app

Set options in RStudio:

- Window
- Viewer
- External

# Exercise 6: Portfolio as full Shiny App

Select Variable for Color:

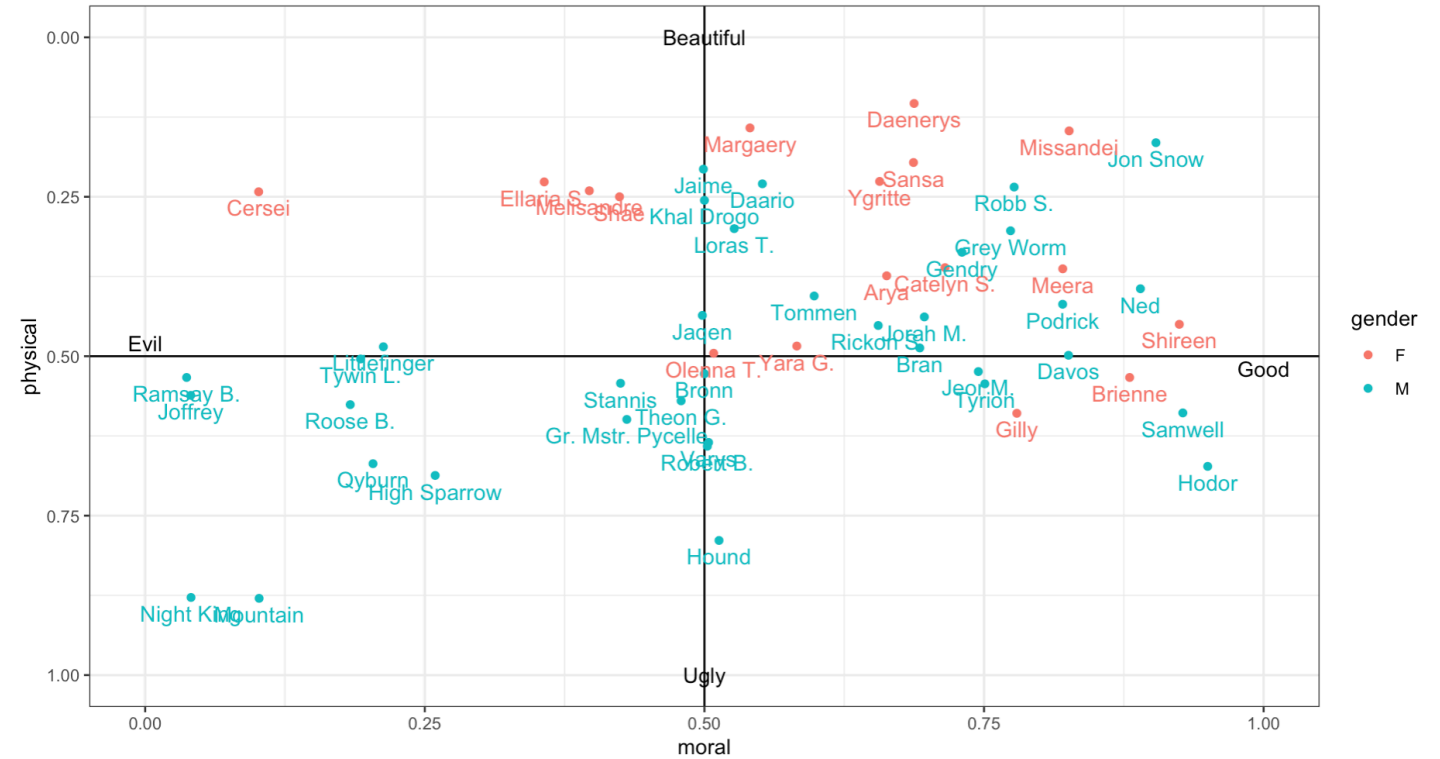
gender

Change Label Font Size:

1

4

10



# Sharing an app

- Shiny Apps  
<http://www.shinyapps.io/>
- Shiny Server (free – host on your own server)  
<https://github.com/rstudio/shiny-server/blob/master/README.md>
- Shiny Server Pro (fee)  
<https://www.rstudio.com/products/shiny/shiny-server/>

# Shiny resources

- [Shiny Gallery](#)
- [Shiny Tutorial](#)
- [Shiny Articles](#)
- [Shiny function reference](#)
- [Shinyapps.io](#)
- RStudio::conf 2019 workshop: [Introduction to Shiny and R Markdown](#)
- [Shiny in Production \(slides\)](#), [Shiny in Production \(book\)](#)
- [Interactive web-based data visualization with R, plotly, and shiny](#)
- [Accessing and responding to plotly events in shiny](#)

Thanks for your time this week!

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