

# Shiny & reactivity

**Hadley Wickham**

@hadleywickham

Chief Scientist, RStudio



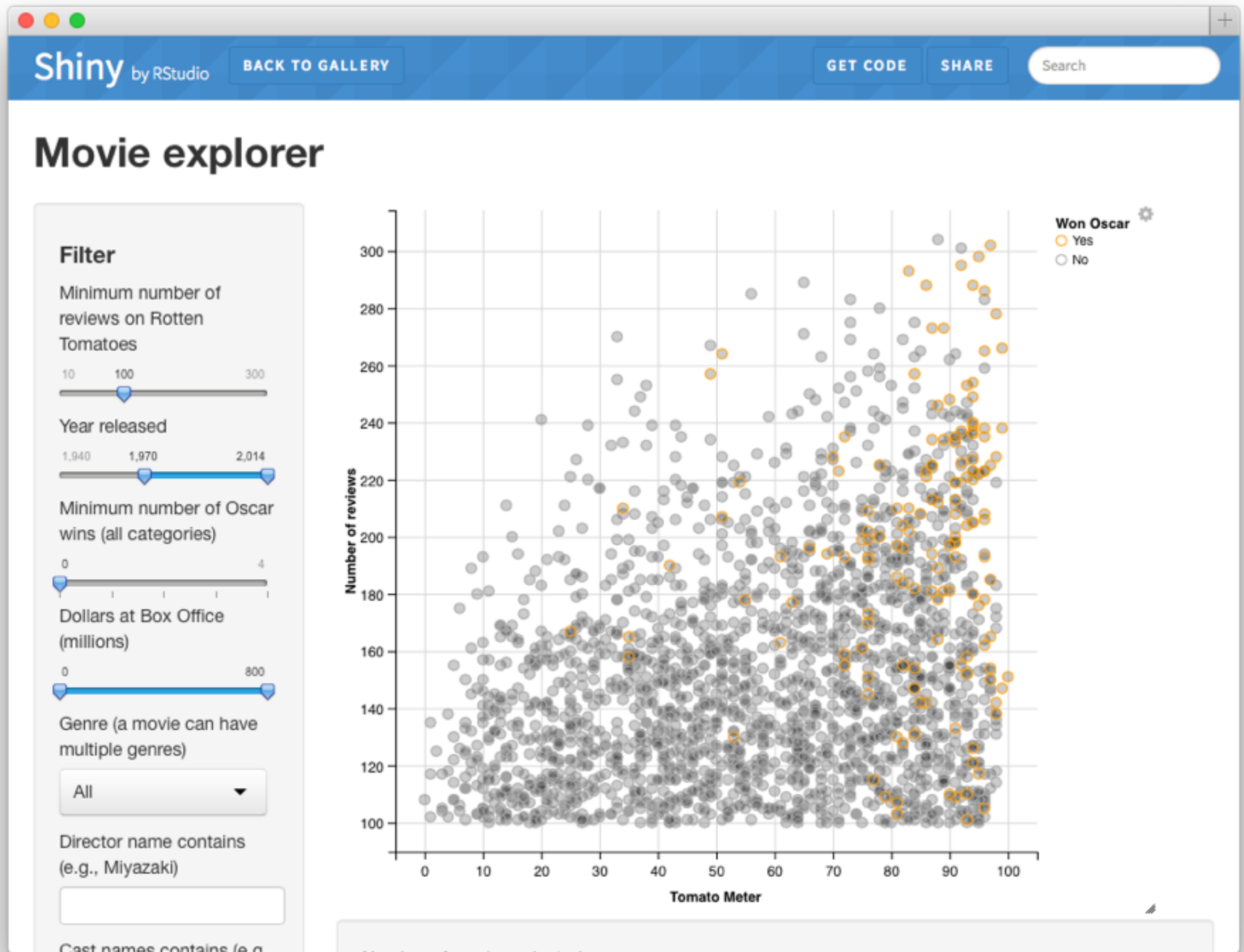
**July 2015**

1. Motivation
2. Shiny basics
3. User interface
4. Inputs & outputs
5. Shiny + ggvis
6. Reactivity
7. HTML widgets
8. shinyapps.io

# Motivation

# Why Shiny?

- In a report, you pose and answer questions. In a shiny app, you allow the reader to pose (constrained) questions
- Tie ggvis into richer set of interactive components and other parts of R
- Makes you look awesome



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

# Sums of squares in ANOVA

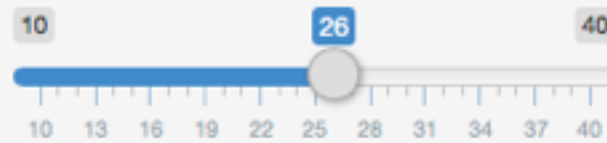
Mean of population 1,  $\mu_1$ :



Mean of population 2,  $\mu_2$ :



Mean of population 3,  $\mu_3$ :



Population standard deviation,  $\sigma$ :

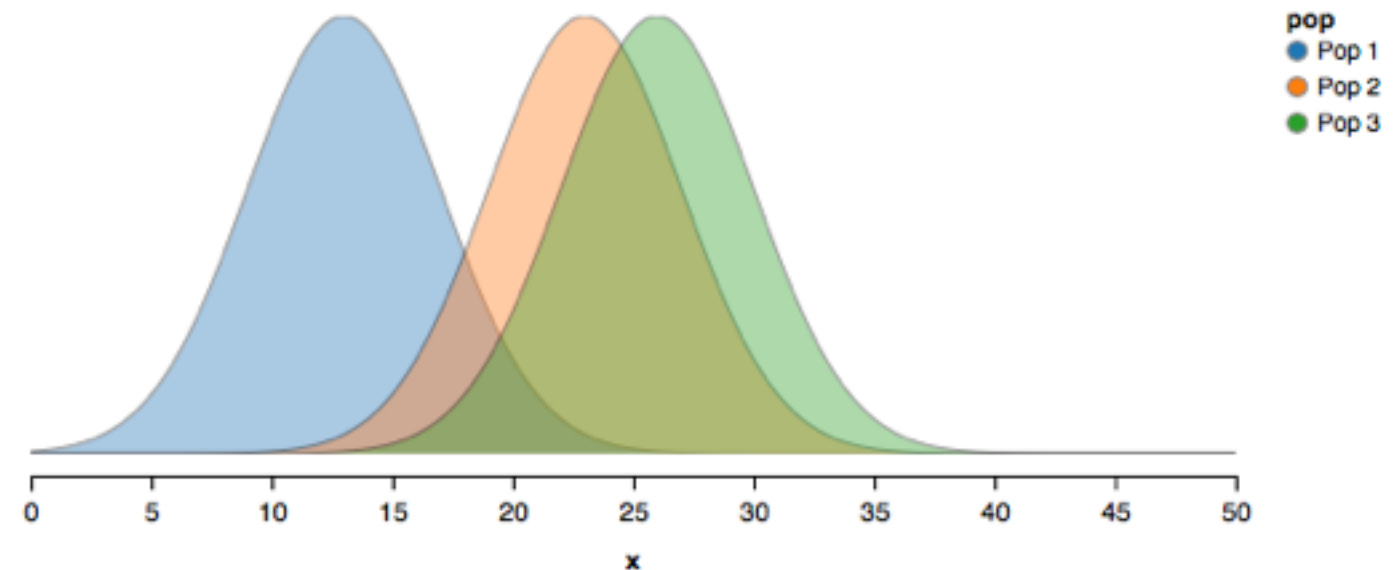


Take samples

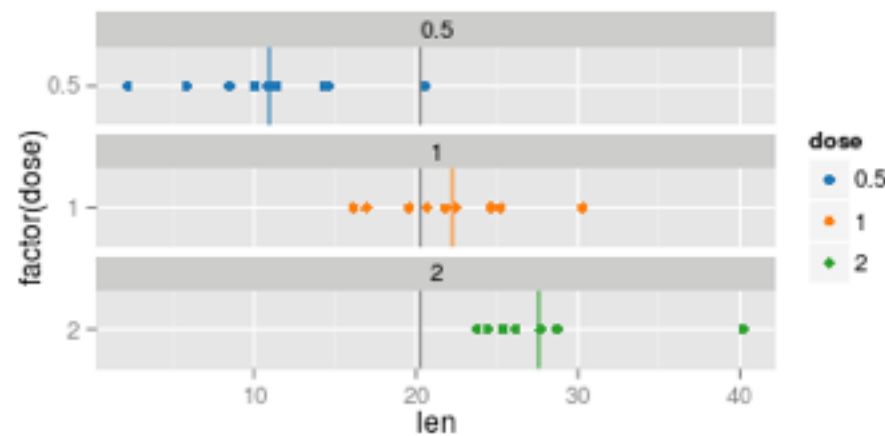
sample size

10

## Population distributions



## Observed sample data



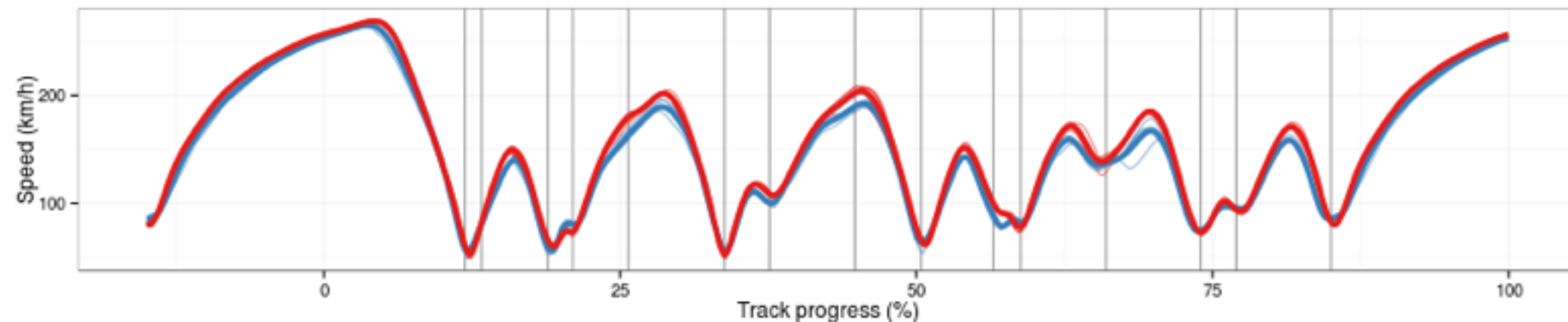
[https://gallery.shinyapps.io/anova\\_shiny\\_rstudio/](https://gallery.shinyapps.io/anova_shiny_rstudio/)

## Where are the speeds of the two riders the most different?

Click and drag in the plot below to select a portion of the track to examine more closely

 Racer  Journalist

ggplot2



## Racing Line

ggvis



## Rider Stats

Averaged over all laps on selected section

Racer leads by

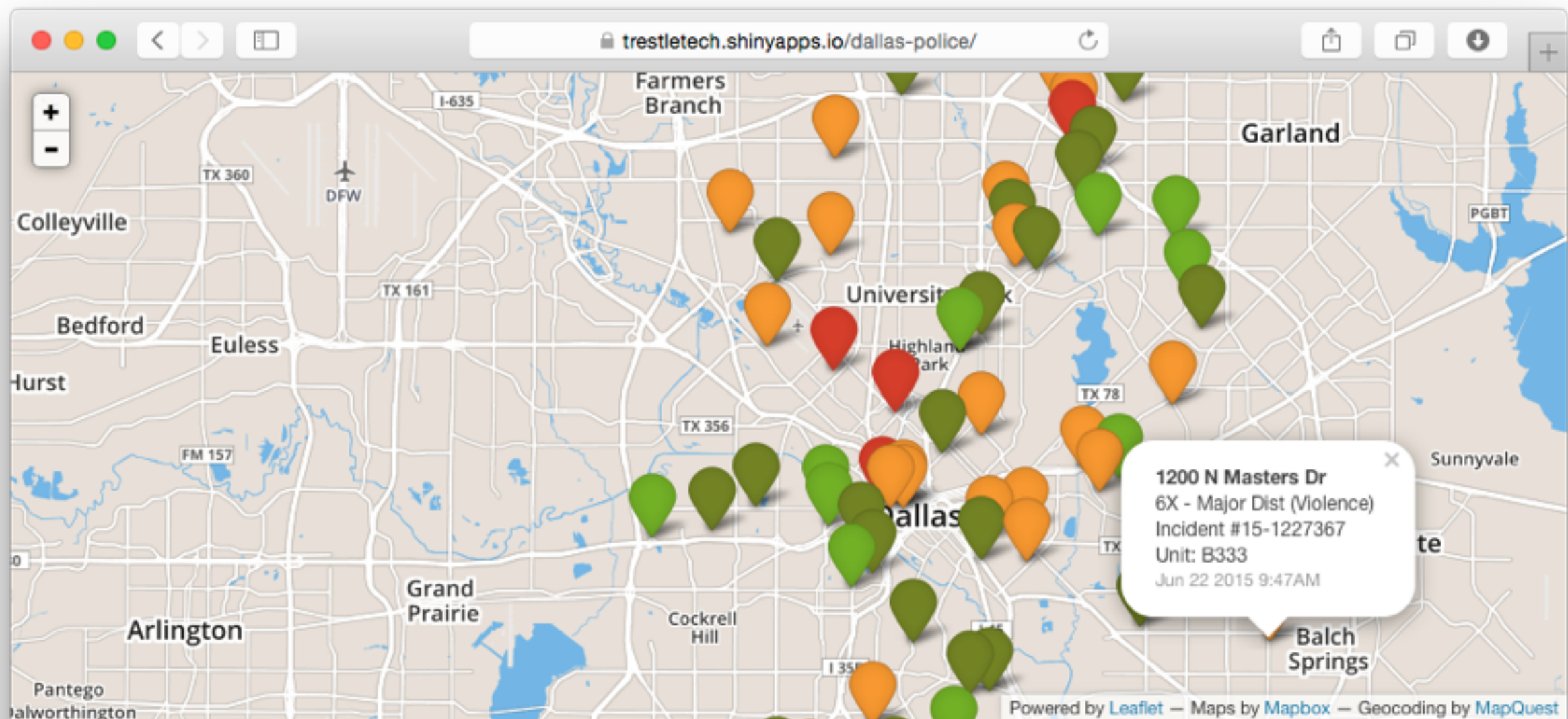
**4.53**

seconds



	Racer	Journalist
Time (sec):	104.07	108.6
Avg. speed (km/h):	130	124
Max. speed (km/h):	269	265
Min. speed (km/h):	51	53





## Real-time Dallas Police Calls

Showing the **71** calls the Dallas Police are responding to as of **6/22/2015 9:47:56 AM**

25 records per page

Search:

Incident	Nature	Priority	DateTime	UnitNum	Block	Street	Beat	ReportingArea
15-1227264	41/11R - Burg Res in Progress	1	Jun 22 2015 9:33AM	D542	3900	Lemmon Ave	546	3116

<https://trestletech.shinyapps.io/dallas-police/>



# Basics

Open



shiny.Rproj

```
# install.packages("shiny")  
library(shiny)  
  
ui <- fluidPage("Hello World")  
server <- function(input, output) {}  
  
runApp(shinyApp(ui, server))
```

```
# install.packages("shiny")
```

```
library(shiny)
```

User interface

```
ui <- fluidPage("Hello World")
```

```
server <- function(input, output) {}
```

Computation

```
runApp(shinyApp(ui, server))
```

Use stop to quit

Console ~/Dropbox (RStudio)/rstudio-training/15-uzurich/2-shiny/

```
> # install.packages("shiny")
> library(shiny)
>
> ui <- fluidPage("Hello World")
> server <- function(input, output) {}
>
> runApp(shinyApp(ui, server))
```

Listening on http://127.0.0.1:5045

R session now runs  
shiny app

```
library(shiny)

ui <- fluidPage(
  sliderInput("number", "Pick a number", 1, 10, value = 5),
  p("You picked: ", textOutput("result", inline = TRUE))
)

server <- function(input, output) {
  message("Initialising")
  output$result <- renderText({
    message("Updating")
    input$number
  })
}

runApp(shinyApp(ui, server))
```

# Input

```
library(shiny)
```

```
ui <- fluidPage(  
  sliderInput("number", "Pick a number", 1, 10, value = 5),  
  p("You picked: ", textOutput("result", inline = TRUE))  
)
```

```
server <- function(input, output) {  
  message("Initialising")  
  output$result <- renderText({  
    message("Updating")  
    runif(input$number)  
  })  
}
```

```
runApp(shinyApp(ui, server))
```



# Output

```
library(shiny)
```

```
ui <- fluidPage(  
  sliderInput("number", "Pick a number", 1, 10, value = 5),  
  p("You picked: ", textOutput("result", inline = TRUE))  
)
```

```
server <- function(input, output) {  
  message("Initialising")  
  output$result <- renderText({  
    message("Updating")  
    runif(input$number)  
  })  
}
```

```
runApp(shinyApp(ui, server))
```

# Reactivity

```
library(shiny)
```

```
ui <- fluidPage(  
  sliderInput("number", "Pick a number", 1, 10, value = 5),  
  p("You picked: ", textOutput("result", inline = TRUE))  
)
```

Run once

```
server <- function(input, output) {  
  message("Initialising")  
  output$result <- renderText({  
    message("Updating")  
    runif(input$number)  
  })  
}
```

Run many times

```
runApp(shinyApp(ui, server))
```

# User interface

```
library(shiny)
```

```
ui <- fluidPage(  
  titlePanel("This is a title"),  
  sidebarLayout(  
    sidebarPanel("This is a sidebar"),  
    mainPanel("This is the main panel")  
  )  
)
```

Just HTML!

```
ui  
runApp(shinyApp(ui, function(input, output) {}))
```

A horizontal number line with major tick marks every 5 units, labeled from 0 to 50. A slider is positioned at the number 5.

Total downloads

Unique users

Raw data

[illegible]

	Package name	% of downloads
1	reshape2	4.4
2	digest	3.5
3	ggplot2	3.5
4	gtable	2.6
5	plyr	2.6
6	proto	2.6
7	RColorBrewer	2.6
8	Rcpp	2.6
9	scales	2.6
10	colorspace	1.8
11	dichromat	1.8
12	dplyr	1.8
13	labeling	1.8
14	munsell	1.8
15	stringr	1.8

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

h1, h2, h3...	Headings
p	Paragraph
strong	Bold text
a	A link

```
library(shiny)
```

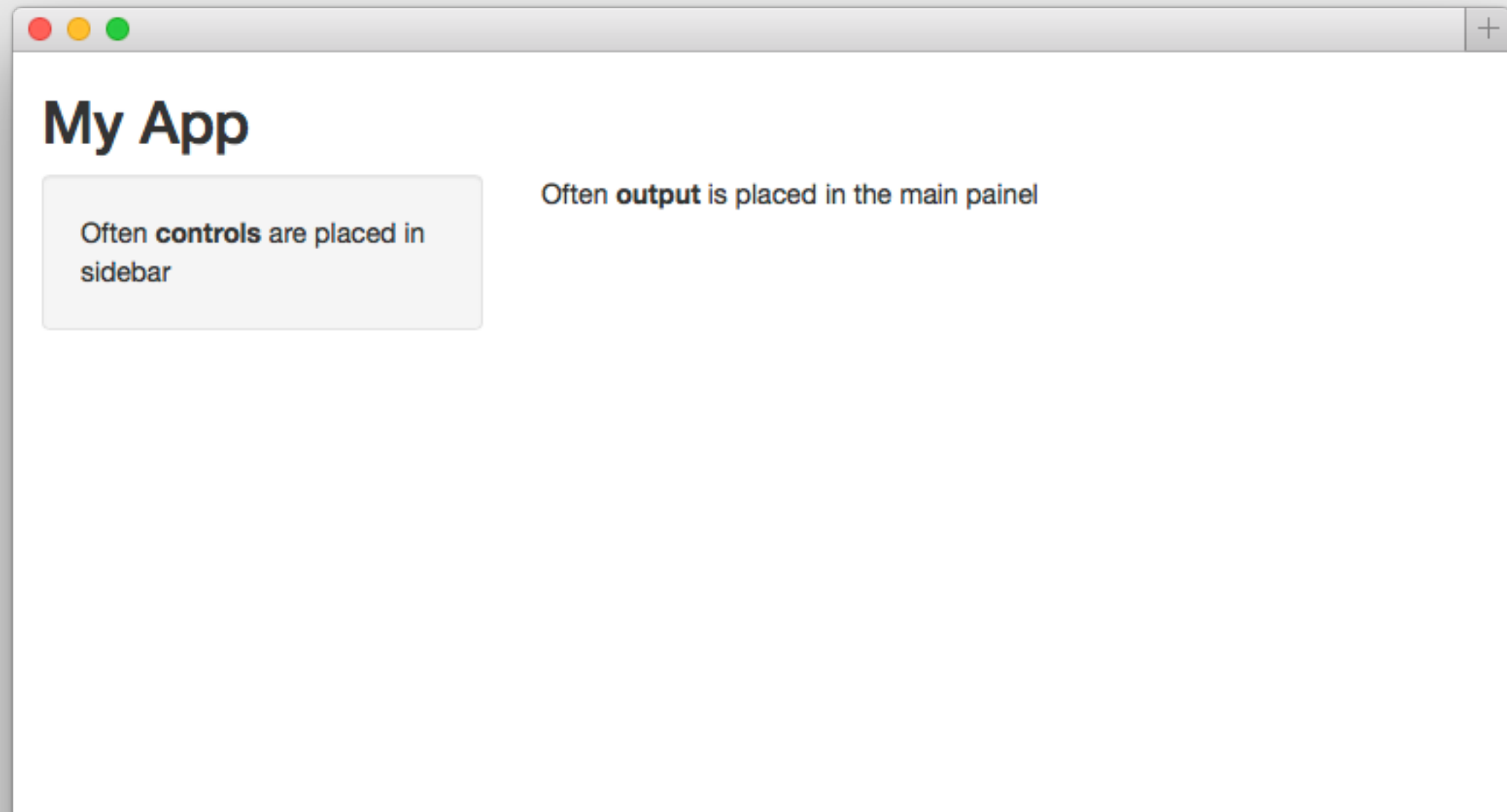
```
ui <- fluidPage(  
  h1("This is a title"),  
  p("It is ", strong("important"),  
    " to understand the basics of HTML."  
),  
  p("A link has an ",  
    a(href = "http://shiny.rstudio.com",  
      " href attribute"),  
    ". "  
)  
)  
ui  
runApp(shinyApp(ui, function(input, output) {}))
```

The tree structure of  
HTML is mimicked by  
the tree of function calls



# Your turn

Recreate this page.



# **Inputs & Outputs**

# Input

```
library(shiny)
```

Define with input function

```
ui <- fluidPage(  
  sliderInput("number", "Pick a number", 1, 10, value = 5),  
  p("You picked: ", textOutput("result", inline = TRUE))  
)
```

```
server <- function(input, output) {  
  message("Initialising")  
  output$result <- renderText({  
    message("Updating")  
    runif(input$number)  
  })  
}
```

Get value with input\$

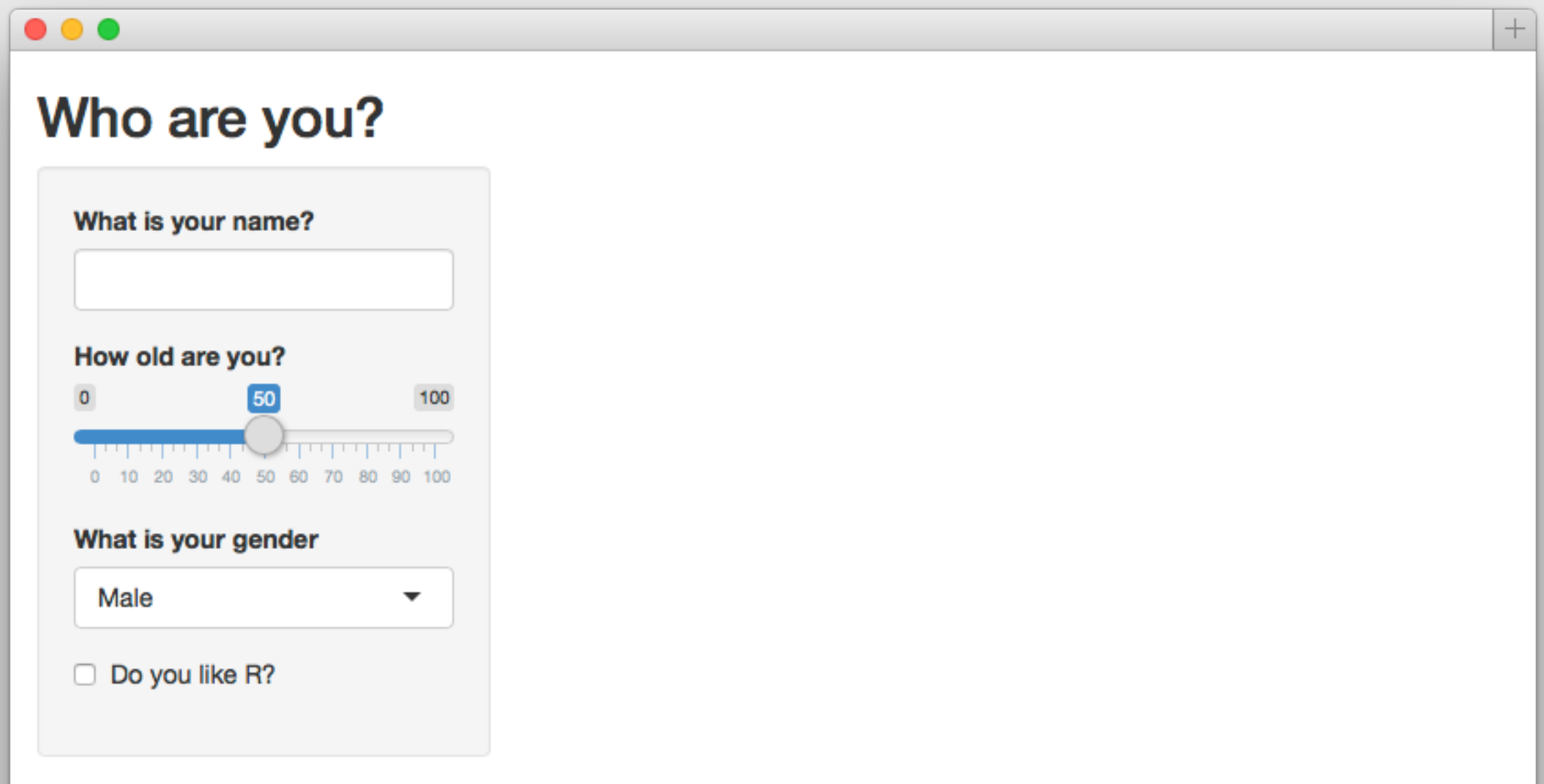
```
runApp(shinyApp(ui, server))
```

textInput	Free form text	character
numericInput	A number	numeric
sliderInput	Numeric slider	numeric
selectInput	Drop down of options	character
checkboxInput	Check box	logical

Hint: `type shiny::input<Tab>`

# Your turn

Recreate this page.



A web browser window with a title bar containing three colored buttons (red, yellow, green) and a plus sign. The page content is a form titled "Who are you?". The form is enclosed in a light gray box and contains the following elements:

- What is your name?**: A text input field.
- How old are you?**: A range slider with a blue track and a gray knob. The track has major ticks every 10 units from 0 to 100. The knob is positioned at 50. Above the track, the values 0, 50, and 100 are displayed.
- What is your gender**: A dropdown menu with "Male" selected and a downward arrow.
- ☐ Do you like R?

```
# As with any complex task, always easiest to solve  
# problems in isolation. So before you write the shiny  
# code to connect input and output, first do it with  
# ordinary variables.
```

```
#
```

```
# Your turn:
```

```
description <- function(name, age, gender, likes_r) {  
  
}
```

```
# Example output (e.g.):
```

```
description("Hadley", 35, "Male", TRUE)
```

```
# Hadley is 35 year old male who likes R.
```

```
description <- function(name, age, gender, likes_r) {  
  gender_desc <- switch(gender,  
    Male = "man",  
    Female = "female",  
    Other = "person"  
  )  
  
  paste0(name, " is a ", age, " year old ", gender_desc,  
    " who ", if (likes_r) "likes" else "doesn't like", " R")  
}  
description("Hadley", 35, "Male", TRUE)
```



# Process

1. Solve a specific problem.
2. Generalise by making a function.
3. Test your function!
4. Use the function inside `server()`

# Advice

- Writing complex code in shiny app is recipe for frustration.
- If it works on the command line, but not in your app, most likely cause is that input is not the type you expect.

# Output

```
library(shiny)
```

```
ui <- fluidPage(  
  sliderInput("number", "Pick a number", 1, 10, value = 5),  
  p("You picked: ", textOutput("result", inline = TRUE))  
)
```

Define with output function

```
server <- function(input, output) {  
  message("Initialising")  
  output$result <- renderText({  
    message("Updating")  
    runif(input$number)  
  })  
}
```

Set value with output\$ +  
render function

```
runApp(shinyApp(ui, server))
```

Create hole

Fill the hole

textOutput

renderText

Text

plotOutput

renderPlot

Plot

tableOutput

renderTable

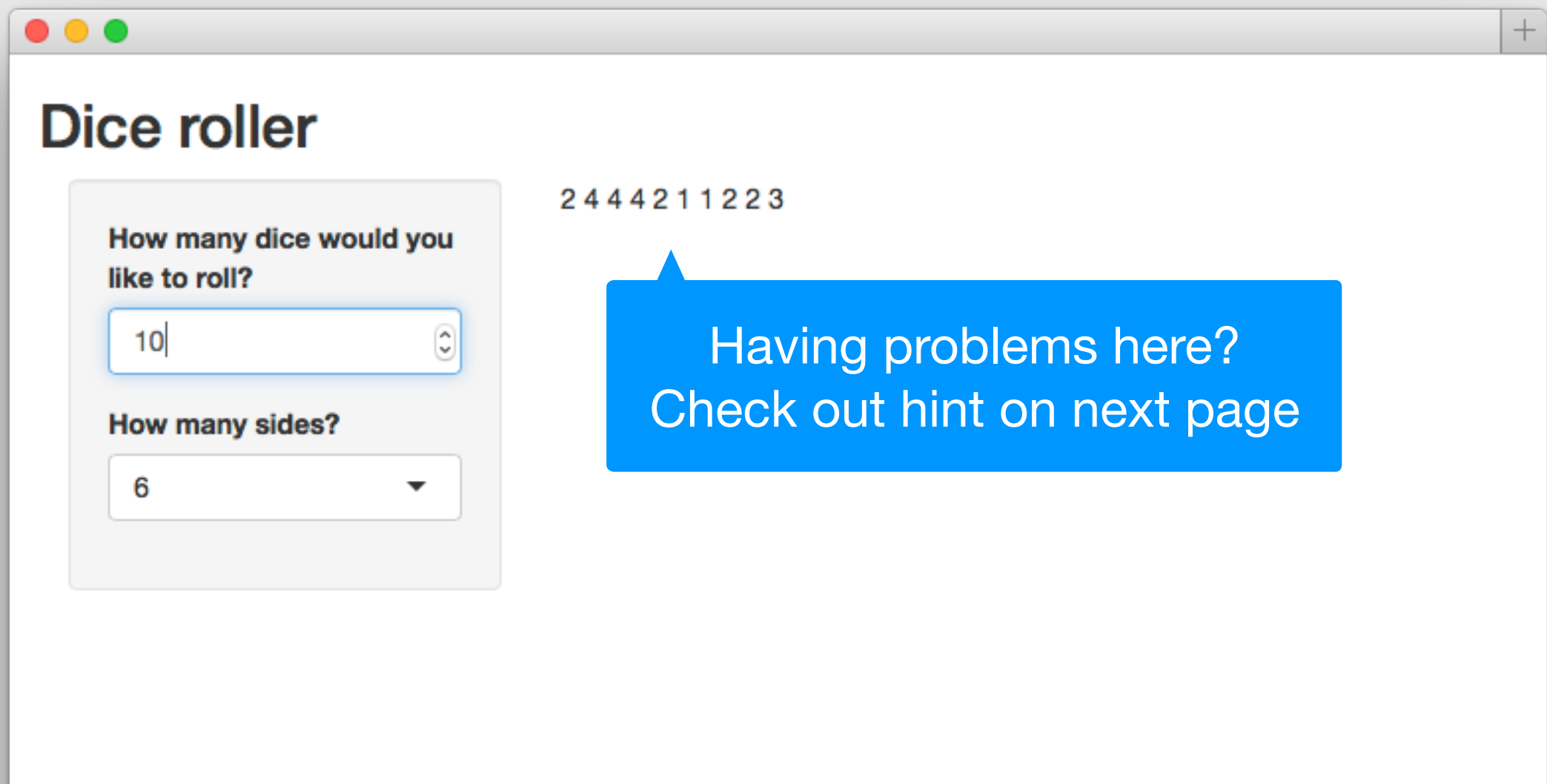
Table

```
ui <- fluidPage(  
  titlePanel(  
    "Who are you?"  
  ),  
  sidebarLayout(  
    sidebarPanel(  
      textInput("name", "What is your name?"),  
      sliderInput("age", "How old are you?", 0, 100, 50),  
      selectInput("gender", "What is your gender",  
        c("Male", "Female", "Other")),  
      checkboxInput("like_r", "Do you like R?")  
    ),  
    mainPanel(  
      textOutput("description")  
    )  
  )  
)
```

```
server <- function(input, output) {  
  output$description <- renderText(  
    description(  
      input$name, input$age,  
      input$gender, input$like_r  
    )  
  )  
}
```

# Your turn

Recreate this simple app.





# Hint:

```
sample("6", 10, replace = TRUE)
```

```
sample(6, 10, replace = TRUE)
```

# Reactivity

# Motivation

- You now have everything you need to make simple apps
- Mastering reactivity gives you the tools to create richer apps
- Key idea is graph/network of calculation. When input changes do minimal recalculation to get output

**Inputs**

**Reactives**

**Outputs**

sides

n

sum1

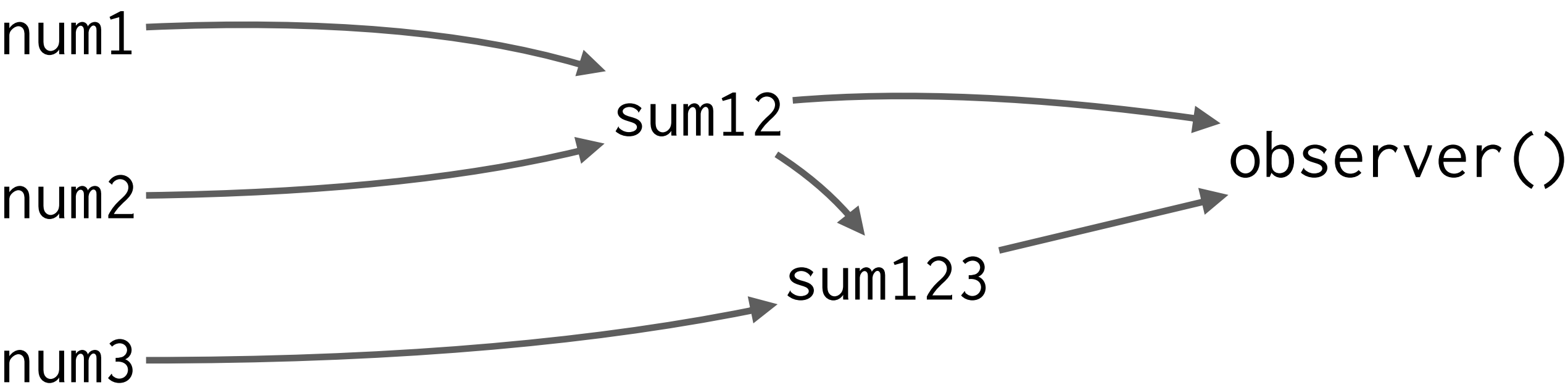


```
server <- function(input, output, session) {  
  sum12 <- reactive({  
    message("sum12 = num1 + num2")  
    input$num1 + input$num2  
  })  
  sum123 <- reactive({  
    message("sum123 = sum12 + num3")  
    sum12() + input$num3  
  })  
  
  observe({  
    sum12()  
    sum123()  
    message("-----")  
  })  
  
  output$sum12 <- renderText(sum12())  
  output$sum123 <- renderText(sum123())  
}  
  
runApp(shinyApp(ui, server))
```

**Inputs**

**Reactives**

**Outputs**



# Challenge

Extend the dice roller app to display a bar chart and a table of results.

```
ui <- fluidPage(  
  titlePanel("Dice roller"),  
  sidebarPanel(  
    numericInput("n", "How many dice would you like to roll?", 10, min = 1),  
    selectInput("sides", "How many sides?", c(6, 12, 20))  
  ),  
  mainPanel(  
    textOutput("rolls"),  
    plotOutput("dist"),  
    tableOutput("summary")  
  )  
)
```



```
server1 <- function(input, output) {  
  rolls <- roll_die(input$n, as.numeric(input$sides))  
  
  output$rolls <- renderText(rolls)  
  output$dist <- renderPlot(plot(table(rolls)))  
  output$summary <- renderTable(table(rolls))  
}
```

# What's wrong with this approach?

```
server2 <- function(input, output) {  
  rolls <- function() {  
    roll_die(input$n, as.numeric(input$sides))  
  }  
  
  output$rolls <- renderText(rolls())  
  output$dist <- renderPlot(plot(table(rolls())))  
  output$summary <- renderTable(table(rolls()))  
}
```

```
server3 <- function(input, output) {  
  rolls <- reactive({  
    roll_die(input$n, as.numeric(input$sides))  
  })  
  
  output$rolls <- renderText(rolls())  
  output$dist <- renderPlot(plot(table(rolls())))  
  output$summary <- renderTable(table(rolls()))  
}
```

Creates a function that automatically updates when inputs change

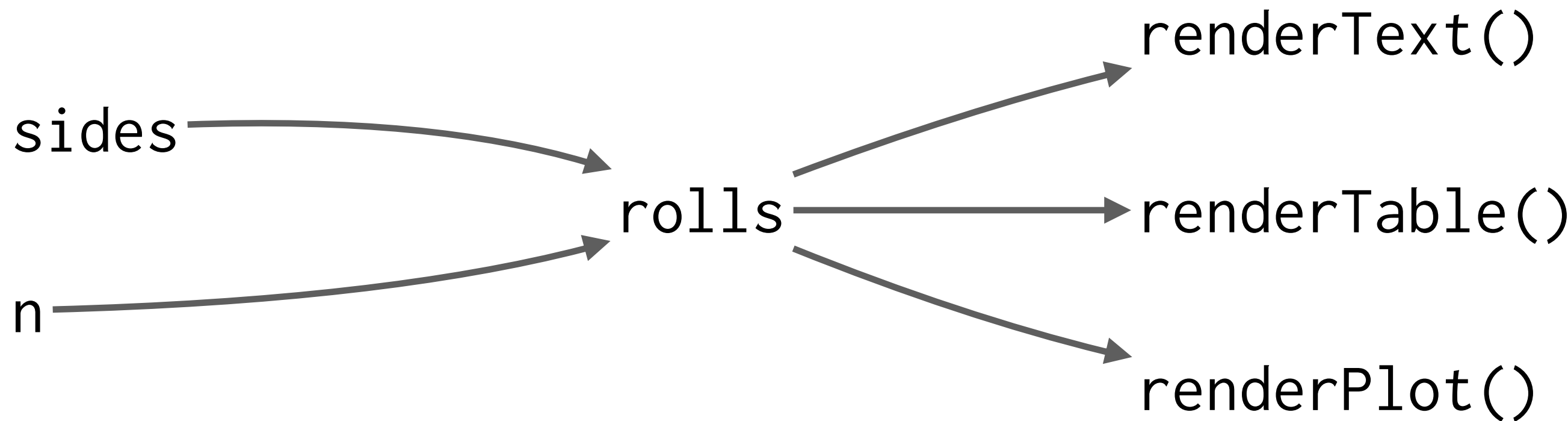
```
server3 <- function(input, output) {  
  rolls <- reactive({  
    roll_die(input$n, as.numeric(input$sides))  
  })  
  
  output$rolls <- renderText(rolls())  
  output$dist <- renderPlot(plot(table(rolls())))  
  output$summary <- renderTable(table(rolls()))  
}
```

Lazily evaluated: only re-run when inputs change

## Inputs

## Reactives

## Outputs



Where is some more  
duplication that we could  
remove?

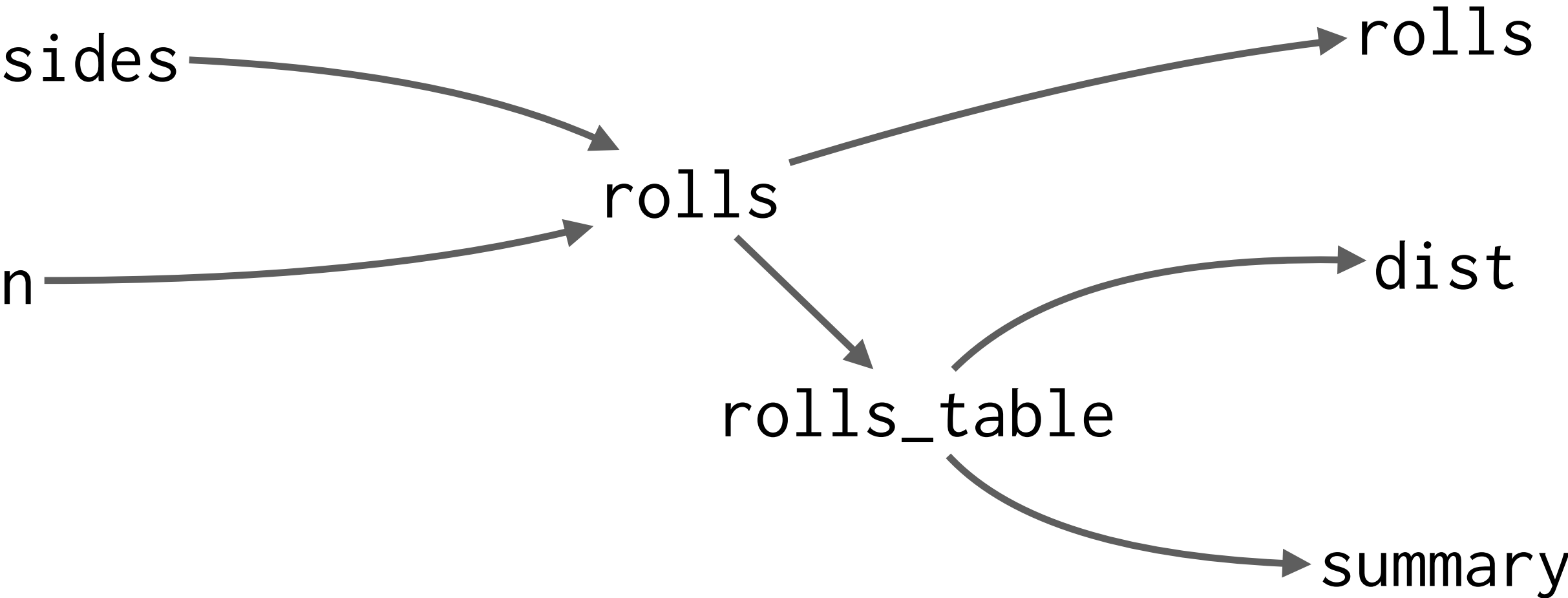
```
server3 <- function(input, output) {  
  rolls <- reactive({  
    roll_die(input$n, as.numeric(input$sides))  
  })  
  
  output$rolls <- renderText(rolls())  
  output$dist <- renderPlot(plot(table(rolls())))  
  output$summary <- renderTable(table(rolls()))  
}
```

```
server4 <- function(input, output) {  
  rolls <- reactive({  
    roll_die(input$n, as.numeric(input$sides))  
  })  
  rolls_table <- reactive(table(rolls()))  
  
  output$rolls <- renderText(rolls())  
  output$dist <- renderPlot(plot(rolls_table()))  
  output$summary <- renderTable(rolls_table())  
}
```

**Inputs**

**Reactives**

**Outputs**





# Your turn

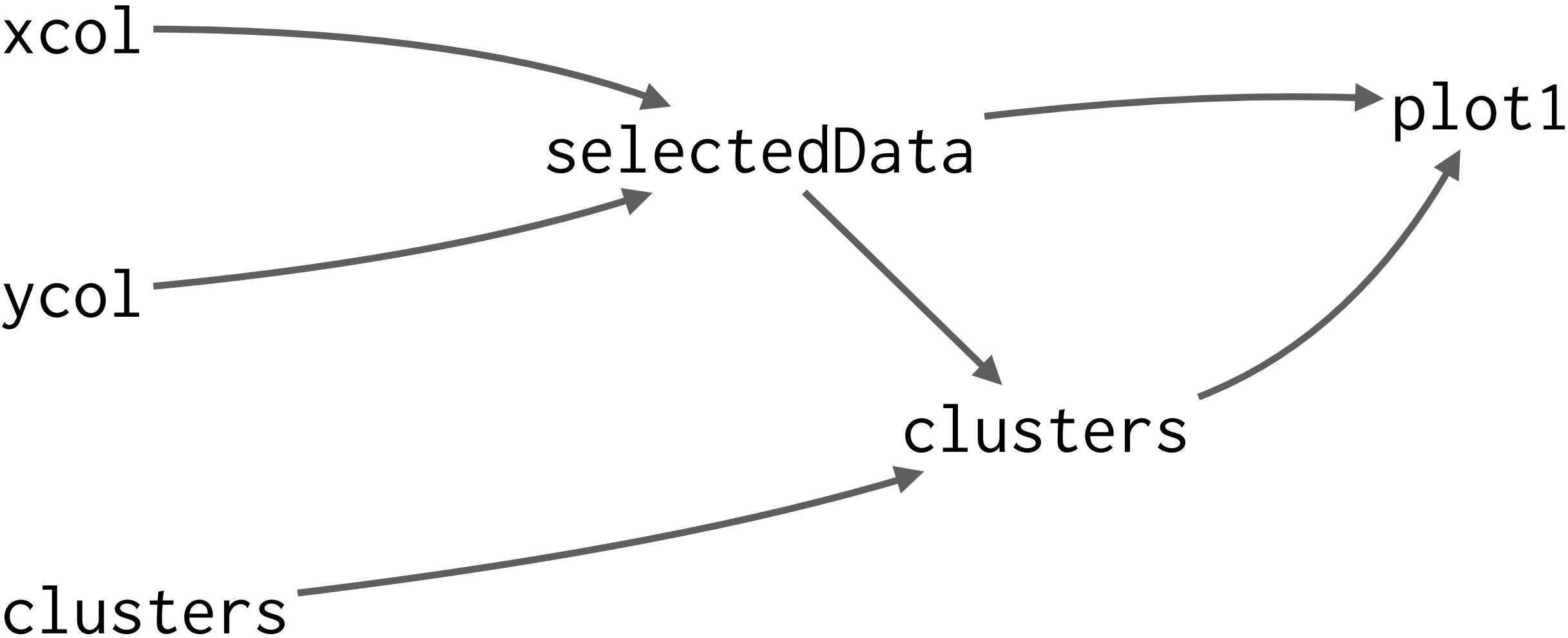
Play around with the shiny app in `kmeans.R`, and then draw the reactivity graph.

(Challenge: what other implicit input causes the plot to be redrawn?)

**Inputs**

**Reactives**

**Outputs**



**ggvis**

```
# Step 1: get the plot working for a specific  
# set of parameters
```

```
mpg %>%  
  ggvis(~displ, ~hwy) %>%  
  layer_points() %>%  
  layer_smooths(span = 0.5)
```

# Step 2: turn it into a function

```
draw_plot <- function(span) {  
  mpg %>%  
    ggvis(~displ, ~hwy) %>%  
    layer_points() %>%  
    layer_smooths(span = span)  
}  
draw_plot(0.5)
```

```
# Step 3: add it to server()
# Different pattern to other outputs!
```

```
server <- function(input, output) {
  draw_plot(reactive(input$span)) %>%
    bind_shiny("p")
}
```

Arguments must be reactives

```
runApp(shinyApp(ui, server))
```

# Your turn

Adapt `6-ggvis.R` to use `layer_model_predictions()` and allow the user to select between `lm` and `MASS::rlm`.

# ggvis reactivity

- Data can be reactive (`tourr.R`)
- Layer parameters can be reactive
- Layer properties can be reactive
- (But not everything might be plumbed up correctly yet)
- Or wrap entire plot in `reactive()`



# Html widgets

# Generalised vs. specialised

- ggvis is a general purpose plotting toolkit
- htmlwidgets packages provide bindings to specialised js libraries
- Work in console, shiny apps & R markdown

```
m %>% addProviderTiles("Stamen.Toner")
```



```
m %>% addProviderTiles("Acetate.terrain")
```

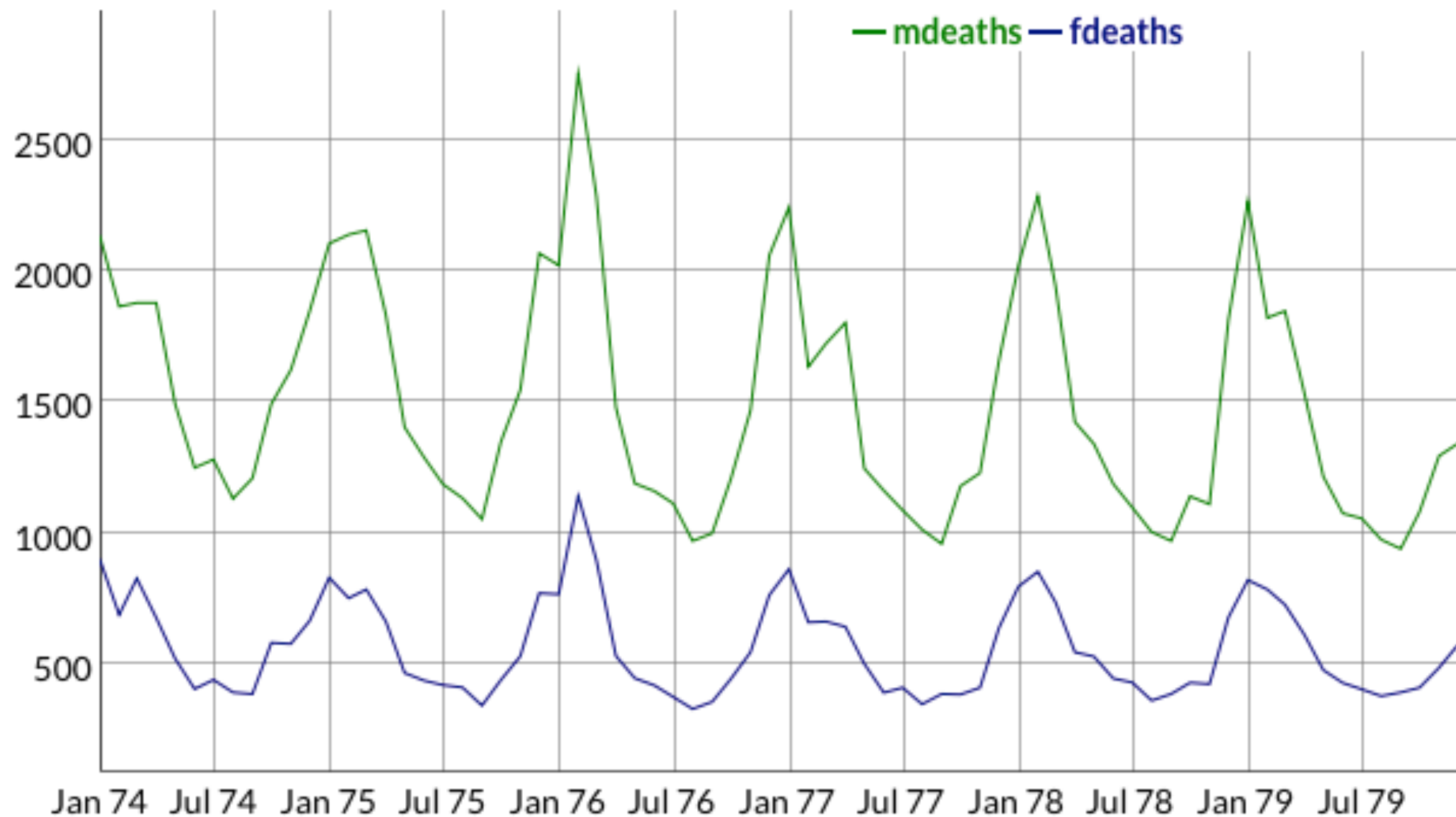


```
m %>% addProviderTiles("CartoDB.Positron")
```

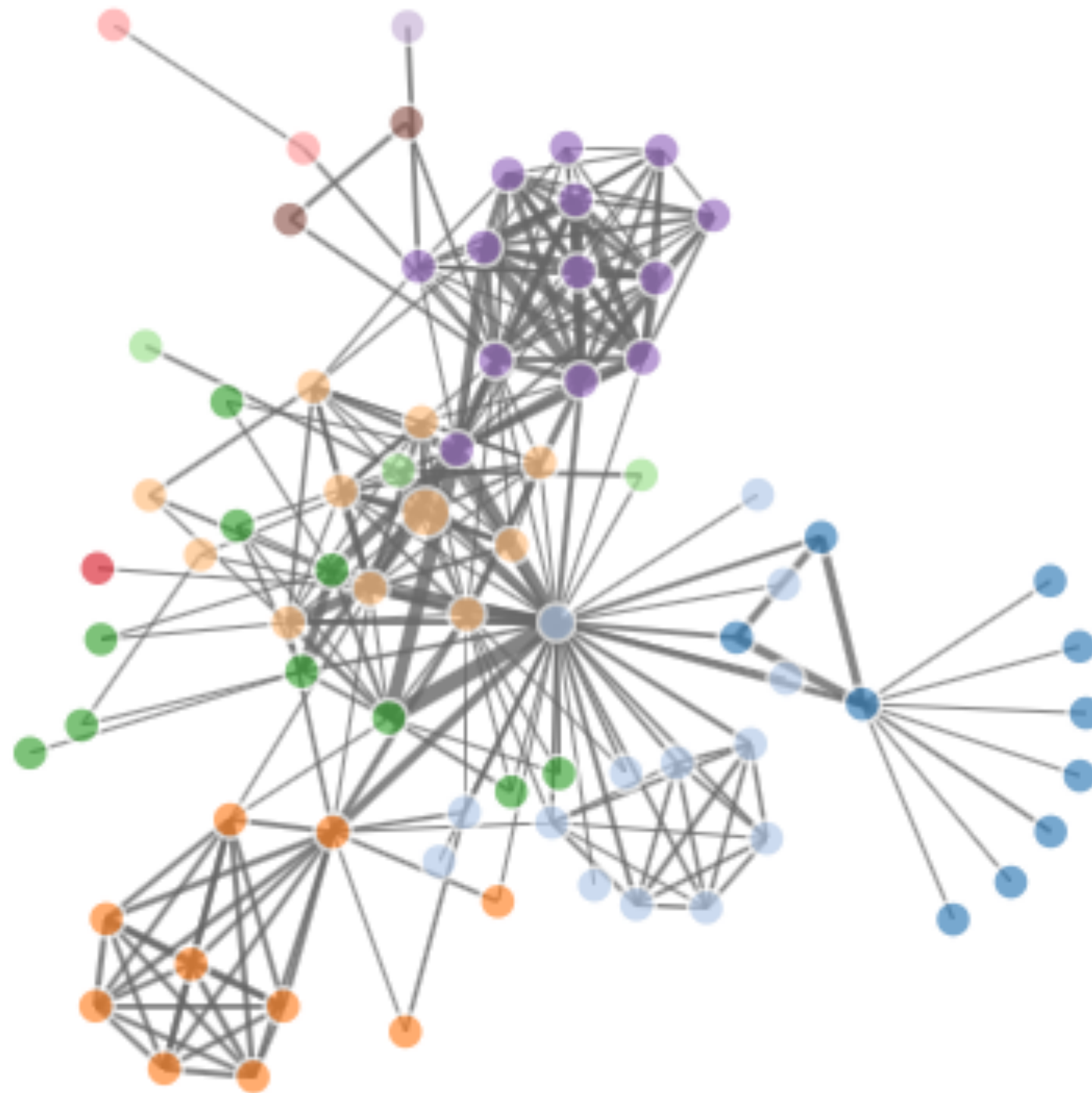


<http://rstudio.github.io/leaflet>

```
library(dygraphs)
lungDeaths <- cbind(mdeaths, fdeaths)
dygraph(lungDeaths)
```



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






<http://christophergandrud.github.io/networkD3/>

```
library(DT)
datatable(iris)
```

Show 10  entries

Search:

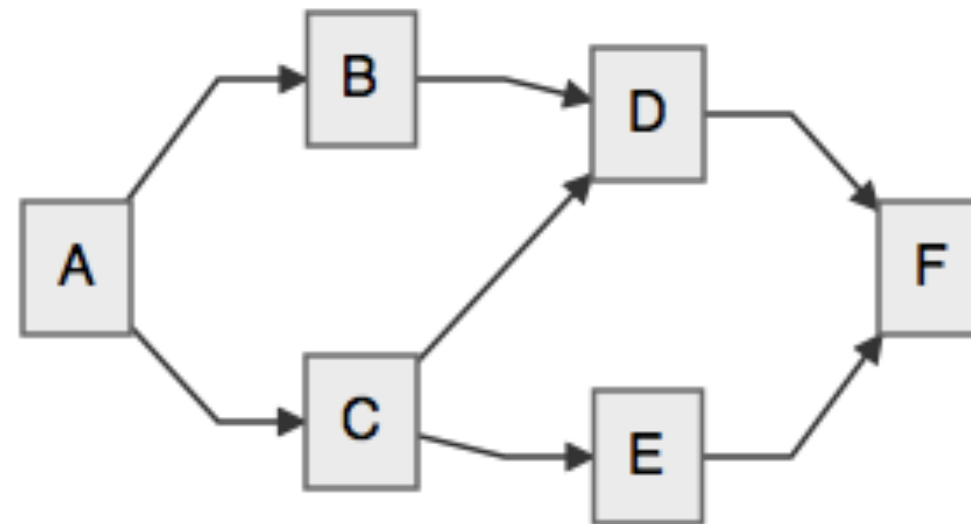
	Sepal.Length 	Sepal.Width 	Petal.Length 	Petal.Width 	Species 
1	5.1	3.5	1.4	0.2	setosa
2	4.9	3	1.4	0.2	setosa
3	4.7	3.2	1.3	0.2	setosa
4	4.6	3.1	1.5	0.2	setosa
5	5	3.6	1.4	0.2	setosa
6	5.4	3.9	1.7	0.4	setosa
7	4.6	3.4	1.4	0.3	setosa
8	5	3.4	1.5	0.2	setosa
9	4.4	2.9	1.4	0.2	setosa
10	4.9	3.1	1.5	0.1	setosa

Showing 1 to 10 of 150 entries

Previous 1 2 3 4 5 ... 15 Next

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

## EXAMPLE



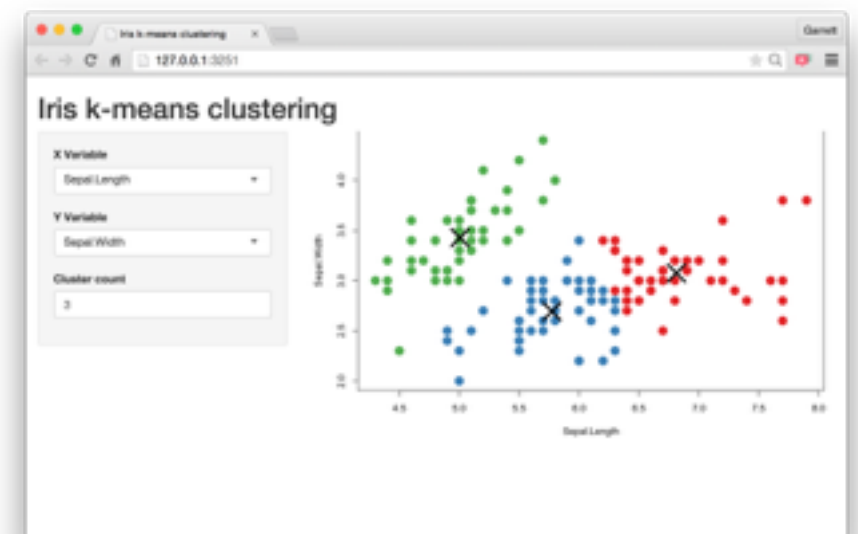
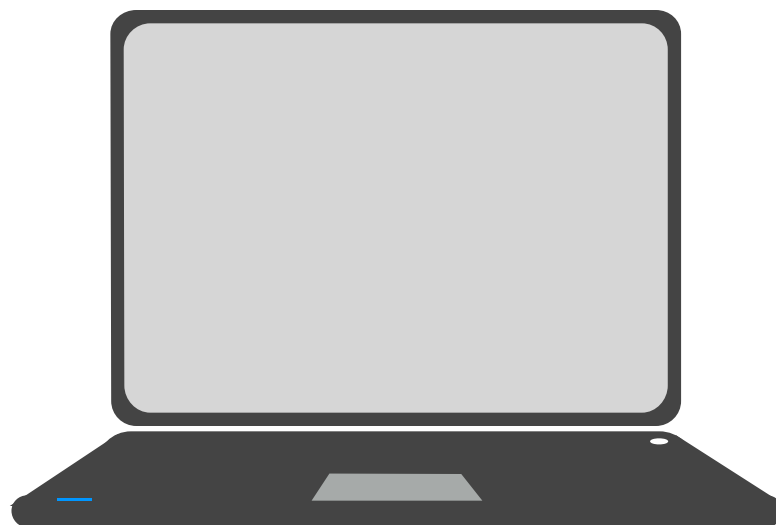
```
mermaid("
graph LR
  A-->B
  A-->C
  C-->E
  B-->D
  C-->D
  D-->F
  E-->F
")
```

Copy

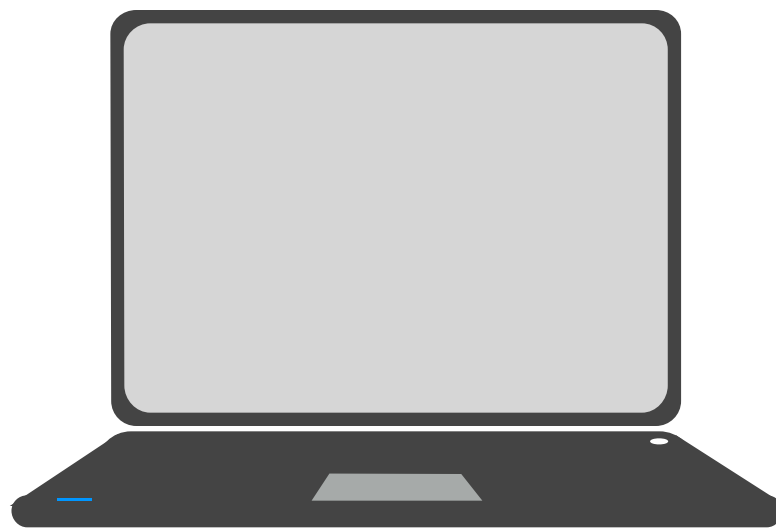
# **Shiny apps**



# Every Shiny app needs a computer running R



# Every Shiny app needs a computer running R



server



ui

# Shinyapps

As your apps get more complex, it's useful to put ui and server code in separate files.

`runApp()` can also take path to directory containing `ui.R` and `server.R`

```
library(shiny)

ui <- fluidPage(
  sliderInput("number", "Pick a number", 1, 10, value = 5),
  p("You picked: ", textOutput("result", inline = TRUE))
)

server <- function(input, output) {
  message("Initialising")
  output$result <- renderText({
    message("Updating")
    runif(input$number)
  })
}

runApp(shinyApp(ui, server))
```

## ui.R

```
library(shiny)

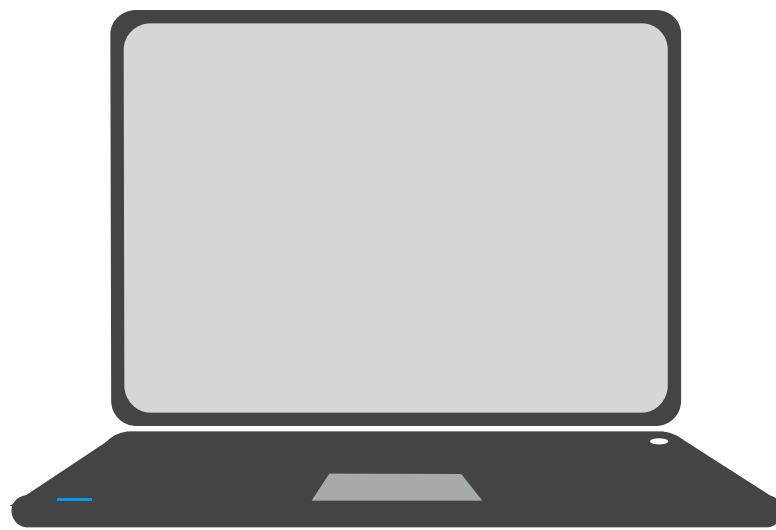
fluidPage(
  sliderInput("number",
    "Pick a number", 1, 10,
    value = 5),
  p("You picked: ",
    textOutput(
      "result", inline = TRUE
    )
  )
)
```

## server.R

```
library(shiny)

function(input, output) {
  output$result <- renderText({
    runif(input$number)
  })
}
```

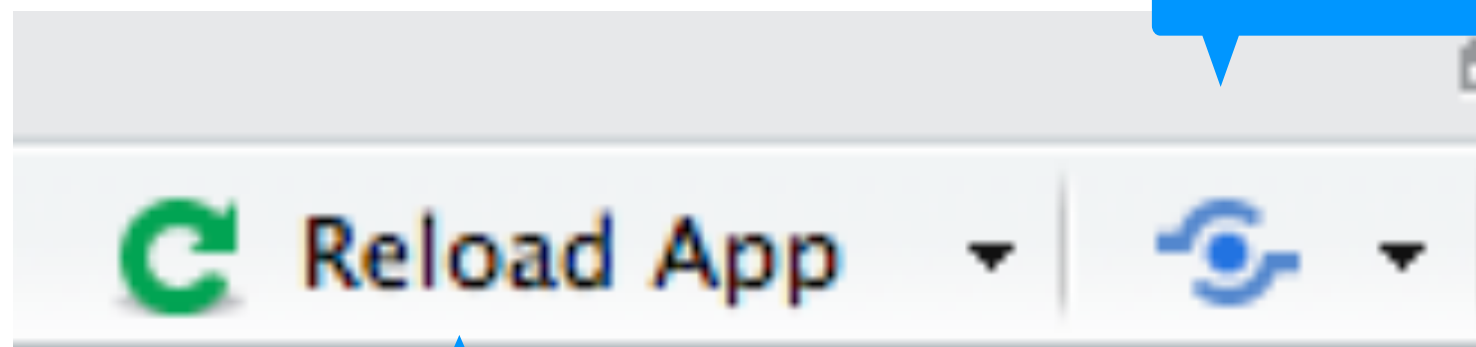
# Every Shiny app needs a computer running R



server.R



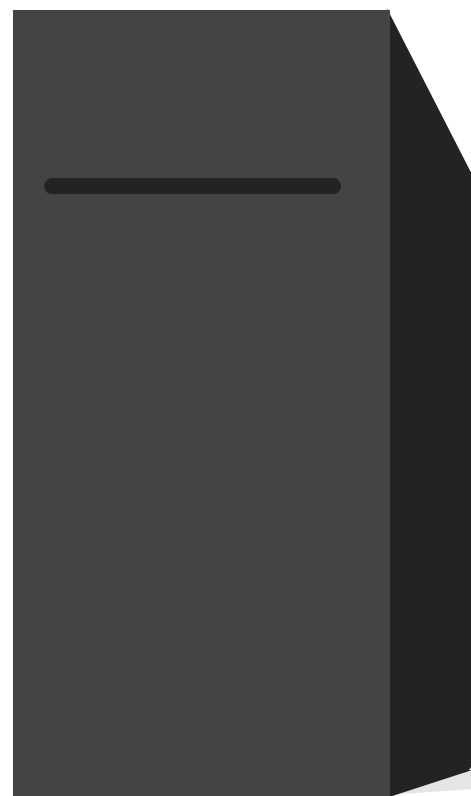
ui.R



Publish an app

Easily reload app

# To publish you need a server



server.R



ui.R



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

shinyapps.io	Free (for personal use)	Easy setup. Data in “cloud”
Shiny Server OS	Free	Run on own server
Shiny Server pro	\$10,000 / year	“Enterprise”, more control over execution

# Your turn

Sign up for [shinyapps.io](https://shinyapps.io).

Create a two-file app in it's own directory.

Publish it!