

R Markdown and Interactive Dashboards

Shiny



Layouts and Design

Flexdashboards

Storyboards

Your turn: Lay out your story

Datatables

Plotly, highcharter

HTML widgets

Leaflet maps

Your turn: Building your first dashboard

Your turn: Bring your dashboard to life

Synchronizing widgets with crosstalk

Controls

Displays

Layouts

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Components of a Dashboard

Shiny Dashboards

What is Shiny

How does Shiny work?

Shiny apps versus embedding Shiny in R
Markdown

Input elements

App elements

Building out your app

Your turn: Your first Shiny dashboard

Next level Shiny: Reactivity

Your turn: Build a reactive dashboard

Shinyapps.io

RStudio Connect

Publishing your Shiny dashboard

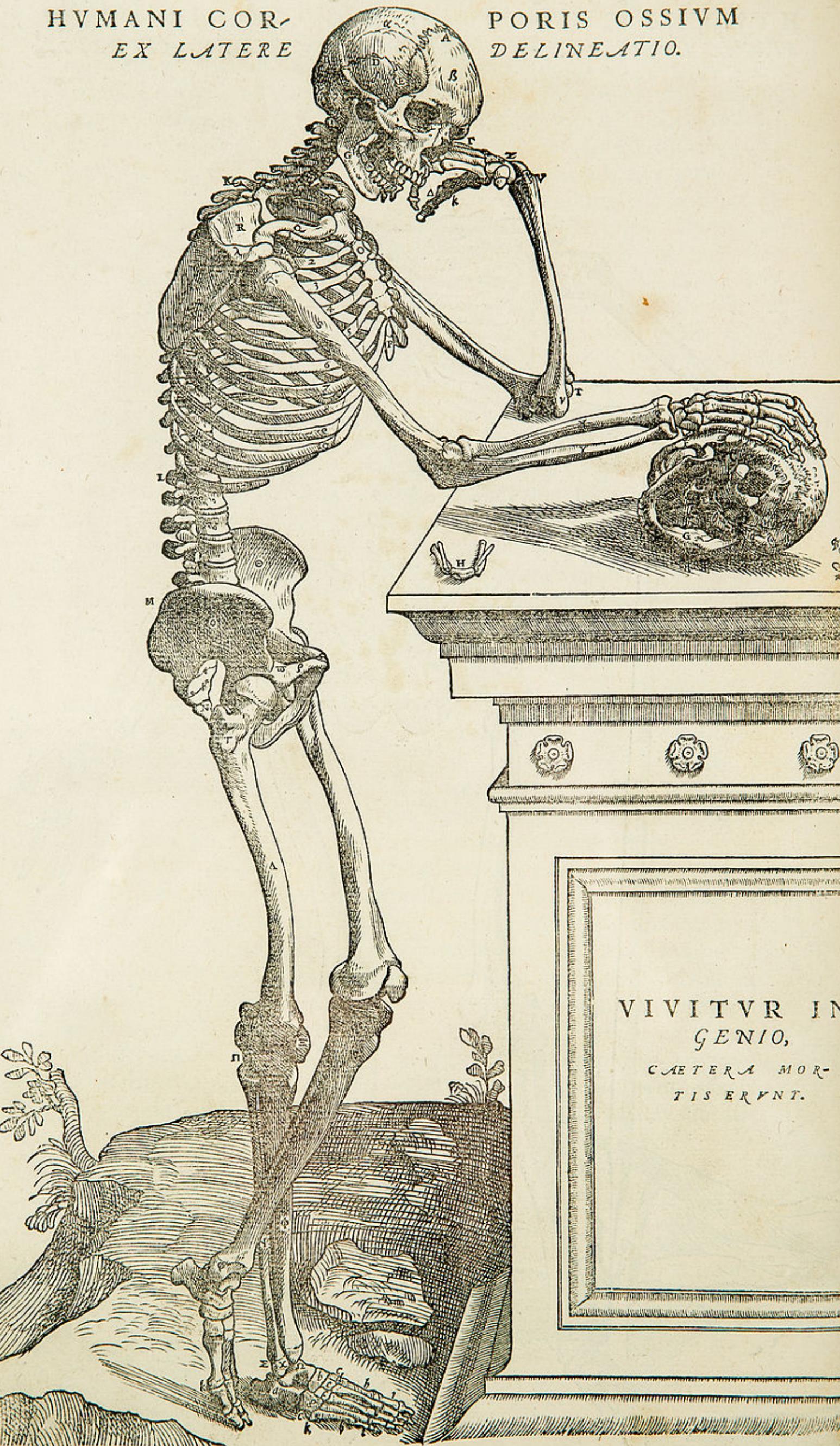
Shiny is an R package that
makes it easy to build
interactive web apps from R.

shiny.rstudio.com

In This Course We Teach A Subset of Shiny

- Shiny has all the mechanisms to create your own app with a fully custom UI
- In this course, we're teaching the essential inputs and outputs that will work within a flexdashboard layout
- There's much more to Shiny if you wish to explore it
- Learn more at shiny.rstudio.com
- The Shiny cheat sheet lives at

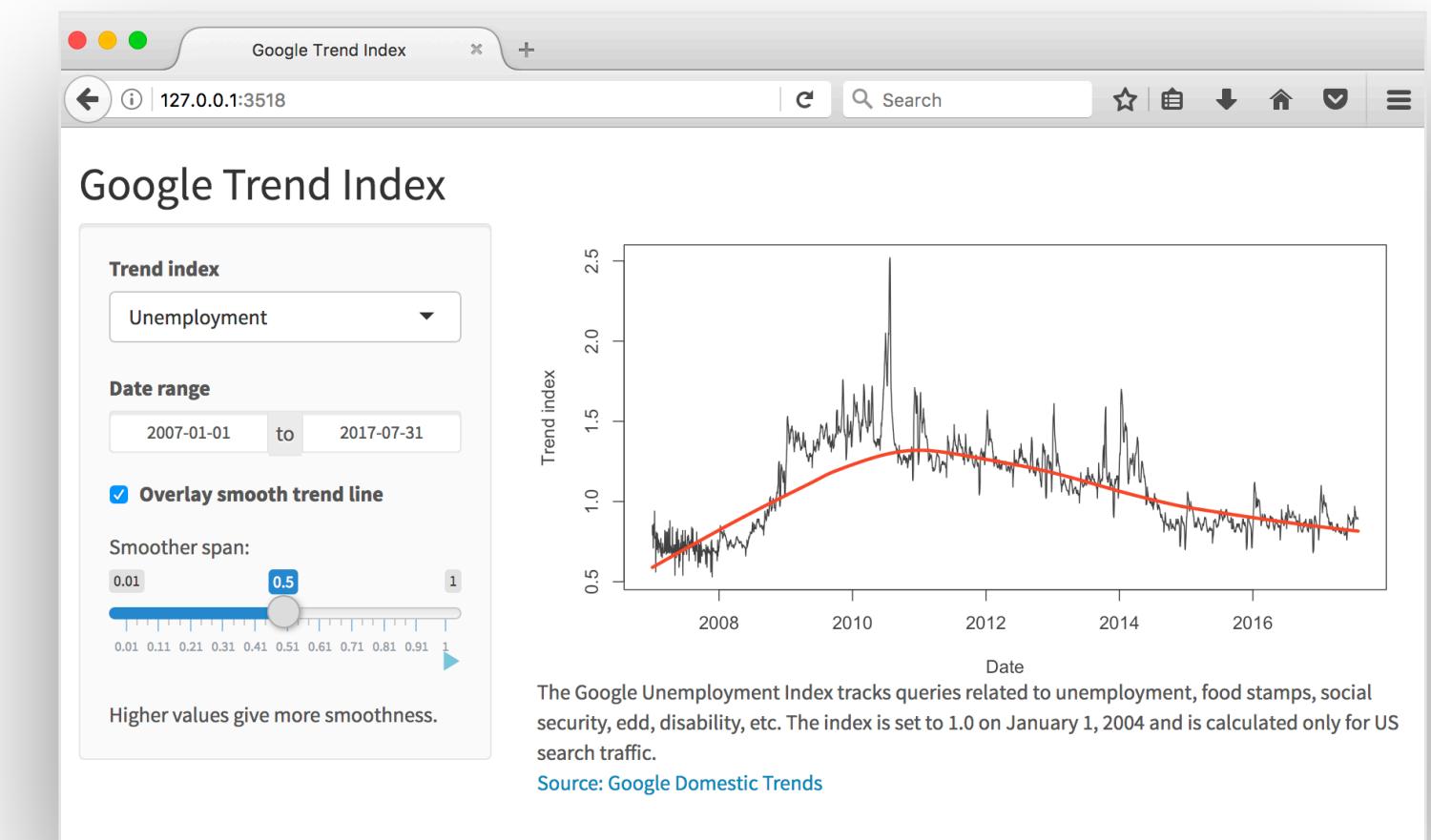
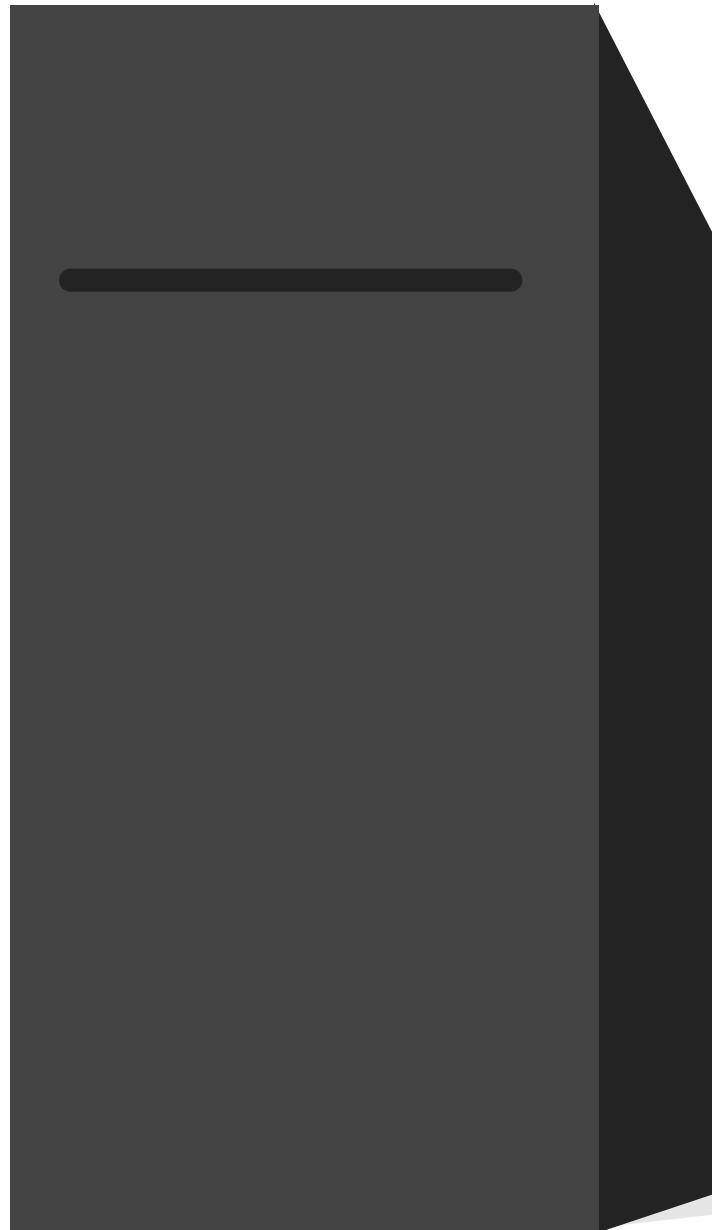
<https://github.com/rstudio/cheatsheets/raw/master/shiny.pdf>



THE ANATOMY OF A SHINY APP MADE WITH FLEXDASHBOARD

You'll learn

- What is a Shiny flexdashboard app
- How to build Shiny inputs for your dashboard
- How to render differing types of output



Program logic

R code

Github repo: rstudio.cloud/rstd.io/conf20-rmd-dash



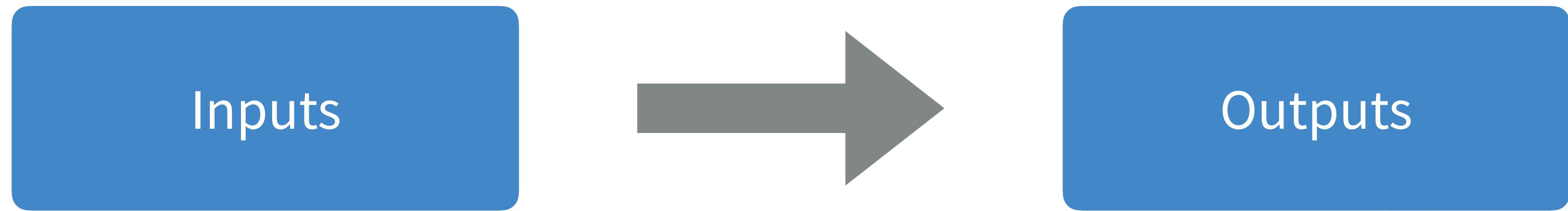
Layout

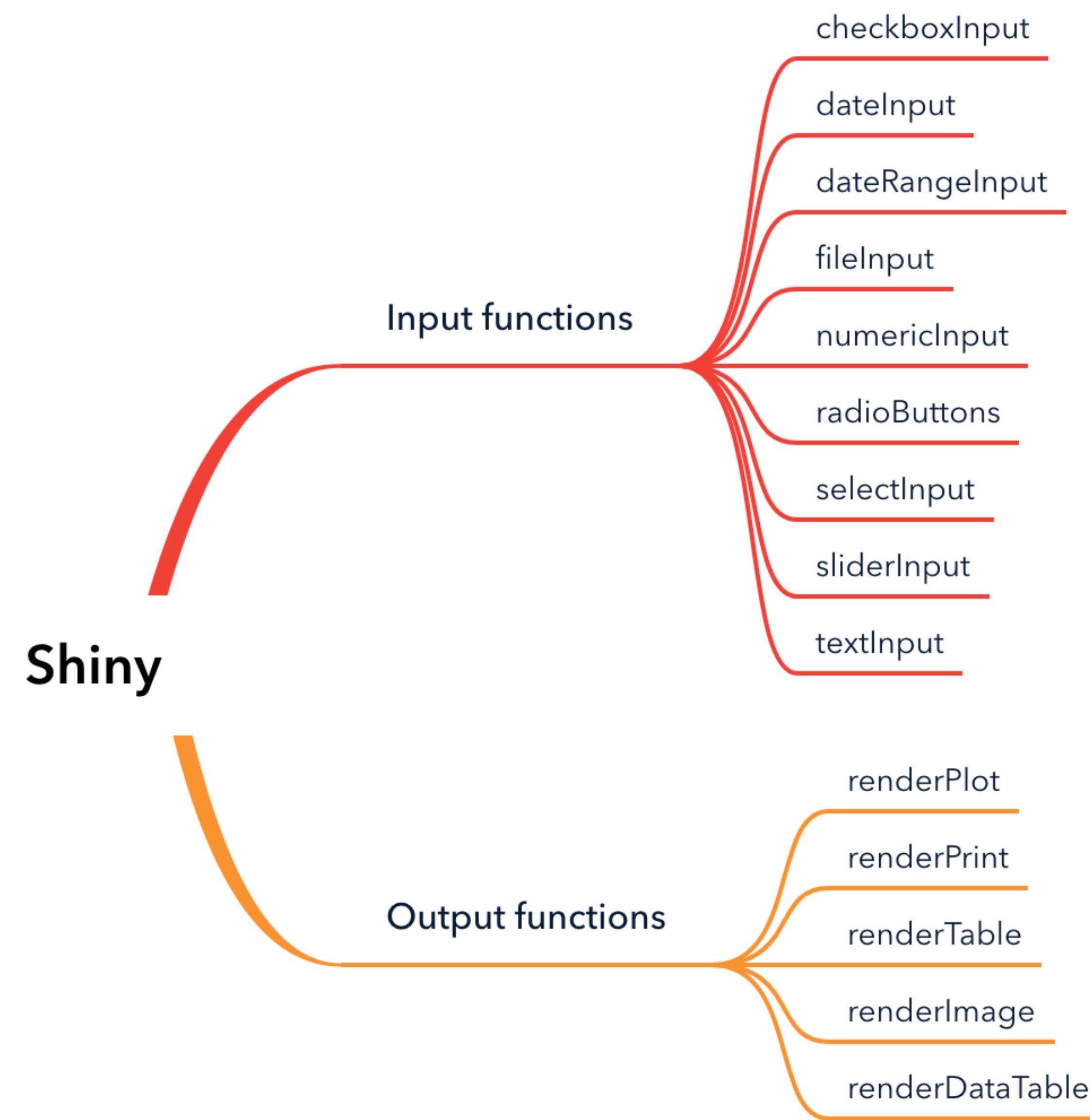
R Markdown

rstudio.cloud workspace: rstudio.cloud/rstd.io/RMAID

Shiny offers user interface
and rendering functions for
input and output controls.

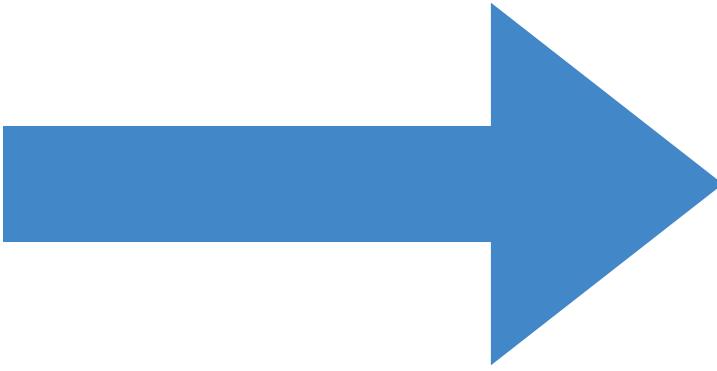






Let's Start With selectInput and renderPlot

```
selectInput(inputId = "x",  
           label = "X-axis:",  
           choices = choices,  
           selected = "critics_score")
```



X-axis:

critics_score

imdb_rating

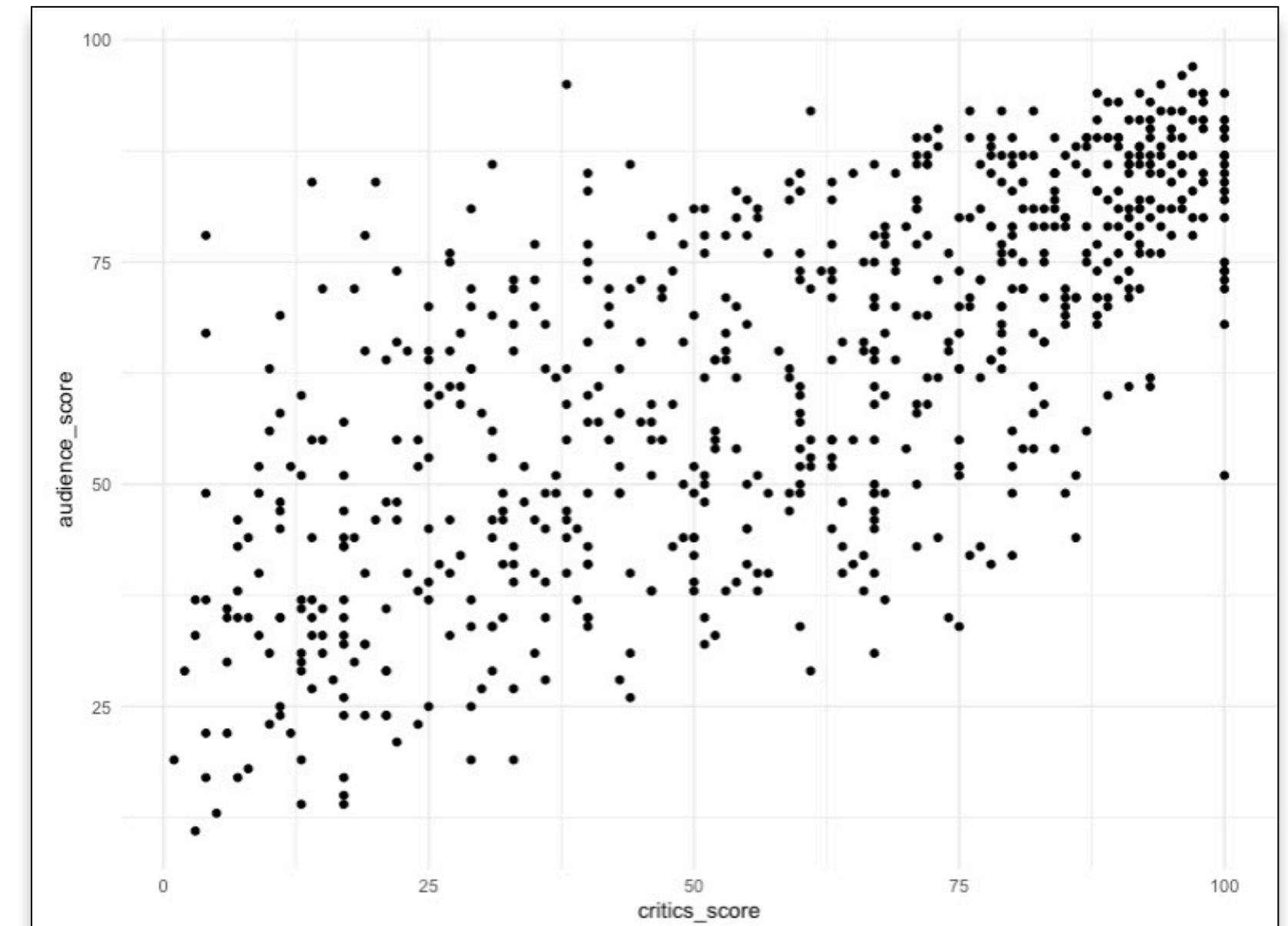
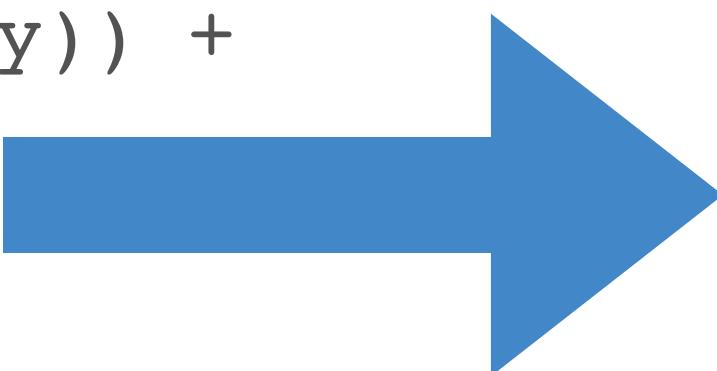
imdb_num_votes

critics_score

audience_score

runtime

```
renderPlot({  
  ggplot(data = movies,  
         aes_string(x = input$x, y = input$y)) +  
  geom_point()  
})
```



Basic Shiny Dashboard Structure

```
---  
title: "Movies Dashboard with Shiny Inputs"  
output:  
  flexdashboard::flex_dashboard:  
    orientation: columns  
    vertical_layout: fill  
    runtime: shiny  
---  
  
```{r setup, include=FALSE}  
library(flexdashboard)
library(shiny)
library(ggplot2)
load("data/movies.Rdata")
theme_set(theme_minimal())
```  
  
## Column {data-width=350}  
### Inputs  
  
```{r}  
choices <- c("imdb_rating", "imdb_num_votes", "critics_score", "audience_score", "runtime")

Select variable for x-axis -----
selectInput(inputId = "x", # this is the name of a reactive input variable
 label = "X-axis:",
 choices = choices,
 selected = "critics_score")

Add another selectInput function for the y axis.
```  
  
## Column {data-width=550}  
### Output  
  
```{r}  
renderPlot({
 ggplot(data = movies, aes_string(x = input$x, y = input$y)) +
 geom_point()
})
...
rstudio.cloud workspace: rstd.io/RMAID
```

Flexdashboard with  
columns orientation

# BASIC SHINY DASHBOARD STRUCTURE

```

```

```
title: "Movies Dashboard with Shiny Inputs"
output:
 flexdashboard::flex_dashboard:
 orientation: columns
 vertical_layout: fill
 runtime: shiny

```

```
```{r setup, include=FALSE}
library(flexdashboard)
library(shiny)
library(ggplot2)
load("data/movies.Rdata")
theme_set(theme_minimal())
```

```

```
Column {data-width=350}
Inputs
```{r}
choices <- c("imdb_rating", "imdb_num_votes", "critics_score", "audience_score", "runtime")

# Select variable for x-axis -----
selectInput(inputId = "x", # this is the name of a reactive input variable
           label = "X-axis:",
           choices = choices,
           selected = "critics_score")

### Add another selectInput function for the y axis.
```

```

```
Column {data-width=550}
Output
```{r}
renderPlot({
  ggplot(data = movies, aes_string(x = input$x, y = input$y)) +
    geom_point()
})
```

```

Inputs get created by a Shiny function like **selectInput**.



They appear as variables like **input\$x**

# Basic Shiny Dashboard Structure

```

```

```
title: "Movies Dashboard with Shiny Inputs"
output:
 flexdashboard::flex_dashboard:
 orientation: columns
 vertical_layout: fill
 runtime: shiny

```

```
```{r setup, include=FALSE}
library(flexdashboard)
library(shiny)
library(ggplot2)
load("data/movies.Rdata")
theme_set(theme_minimal())
```

```

```
Column {data-width=350}

```

```
Inputs

```

```
```{r}
choices <- c("imdb_rating", "imdb_num_votes", "critics_score", "audience_score", "runtime")

# Select variable for x-axis -----
selectInput(inputId = "x", # this is the name of a reactive input variable
           label = "X-axis:",
           choices = choices,
           selected = "critics_score")

### Add another selectInput function for the y axis.

```

```
```

```

```
Column {data-width=550}

```

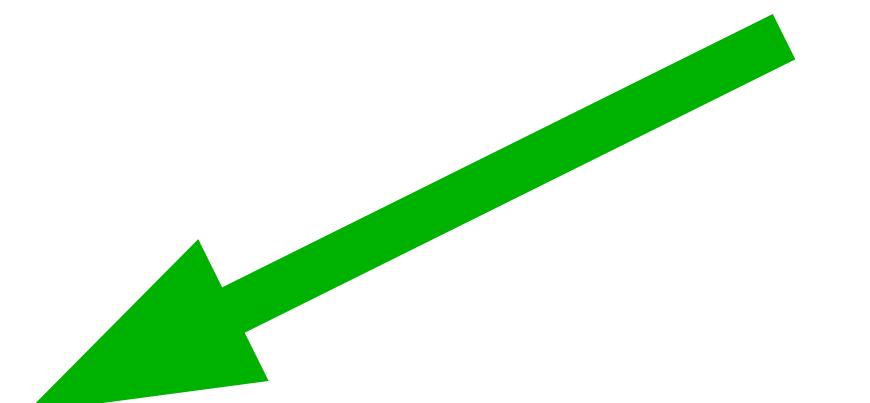
```
Output

```

```
```{r}
renderPlot({
  ggplot(data = movies, aes_string(x = input$x, y = input$y)) +
    geom_point()
})
```

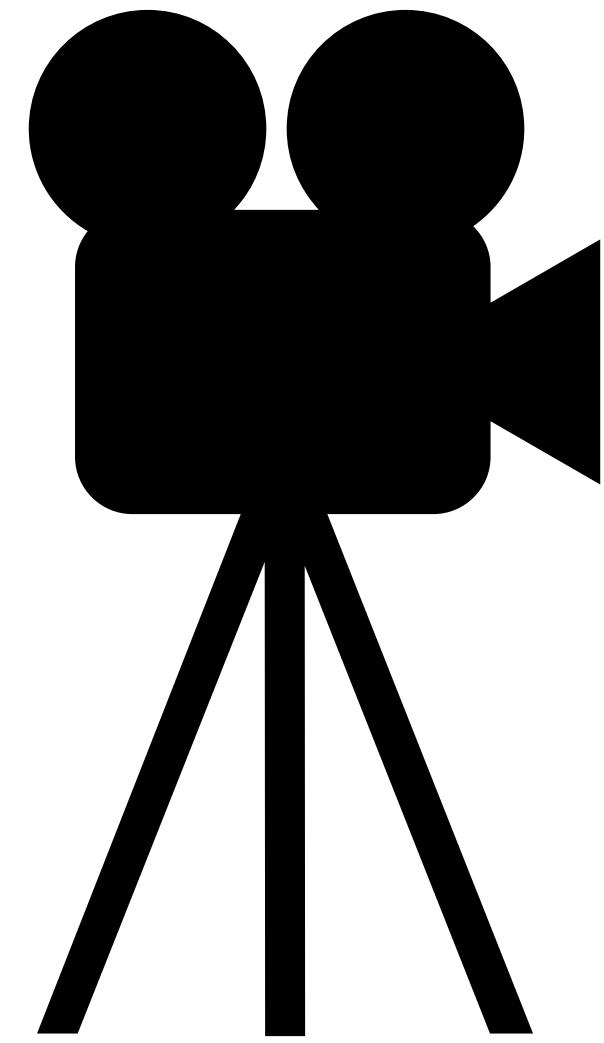
```

Output usually gets put in another flexdashboard pane using a function like `renderPlot`.

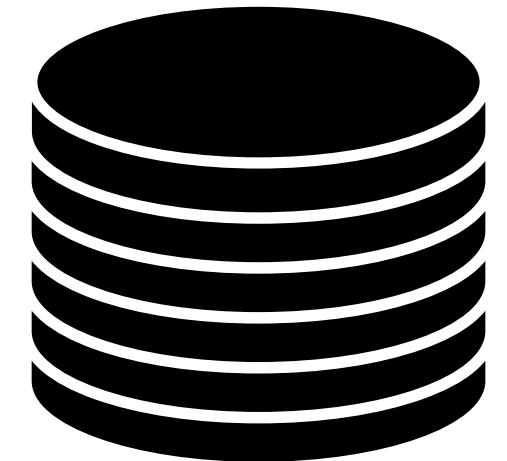


# What Is This Syntax About?

- `renderPlot` takes an `ggplot` output object that generates a plot.
- The code inside the {} is code generates that output object, but it doesn't get evaluated until `renderPlot` asks it to.
- The funny syntax of `renderPlot( {plotting_code} )` is simply a way to say, "When you render the plot, use `plotting_code` to do so".



# Let's build a simple movie browser app!



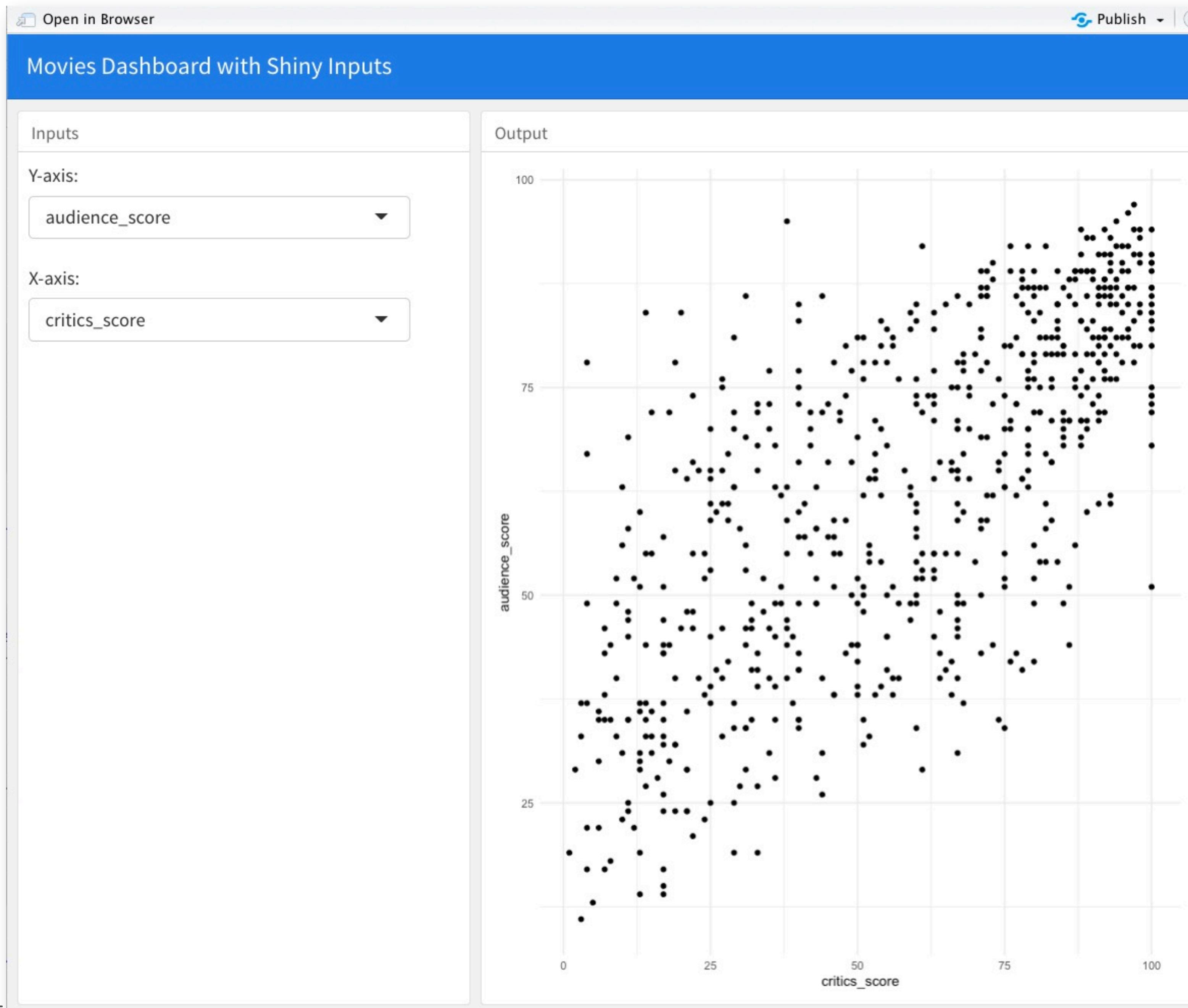
**data/movies.Rdata**

Data from IMDB and Rotten Tomatoes on random sample  
of 651 movies released in the US between 1970 and 2014

## Build A Movie Brower

1. Open the project **05-RMAID-Shiny-Dashboards**
2. Click on **51-movies1.Rmd** in the Files pane to open that file
3. Add in a second **selectInput** function to set the variable **y**
4. Click on *Run App*. Note that *Knit* isn't available.

5m 00s



# EXERCISE 52

rstudio::conf

## Add Color

1. Using the same file, now add a `selectInput` function to set the variable `z`.
2. Make the choices for z be `c("title_type", "genre", "mpaa_rating", "critics_rating", "audience_rating")`
3. Modify the ggplot routine to add an aesthetic value `color=z`.
4. Run your app.

5m 00s

## Movies Dashboard with Shiny Inputs



[Github repo: rstd.io/conf20-rmd-dash](https://github.com/rstd/conf20-rmd-dash)

[rstudio.cloud workspace: rstd.io/RMAID](https://rstudio.cloud/workspace/rstd.io/RMAID)

## Add Transparency

1. Using the same file, now add a `sliderInput` function to set the variable `alpha`.
2. Modify the `ggplot` chunk to add an aesthetic value `alpha=alpha`.
3. Run your app.

5m 00s

## Movies Dashboard with Shiny Inputs

Inputs

Y-axis:

audience\_score

X-axis:

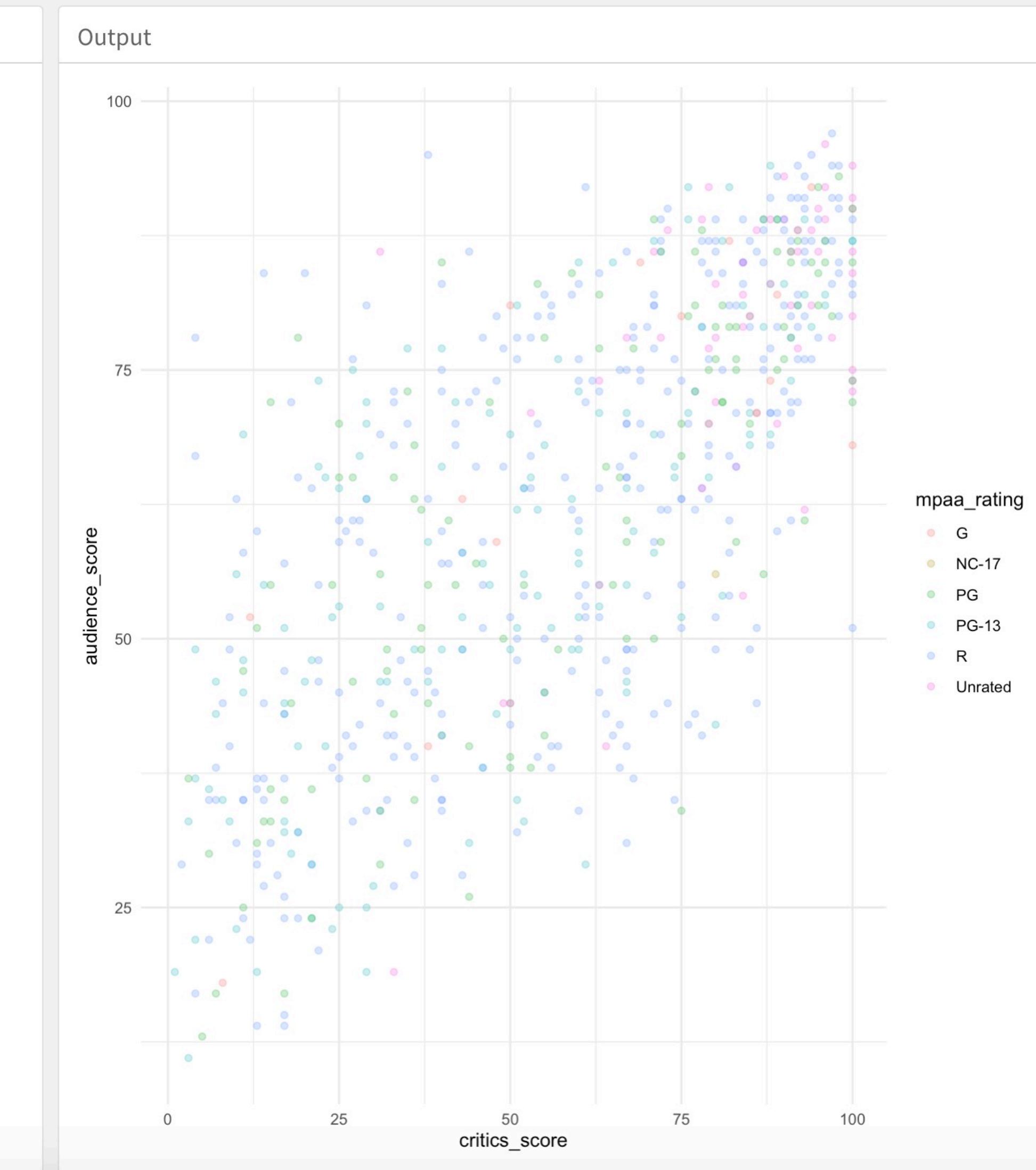
critics\_score

Color by:

mpaa\_rating

Alpha:

0 0.25 1



# EXERCISE 54

rstudio::conf

## Add DataTable Output

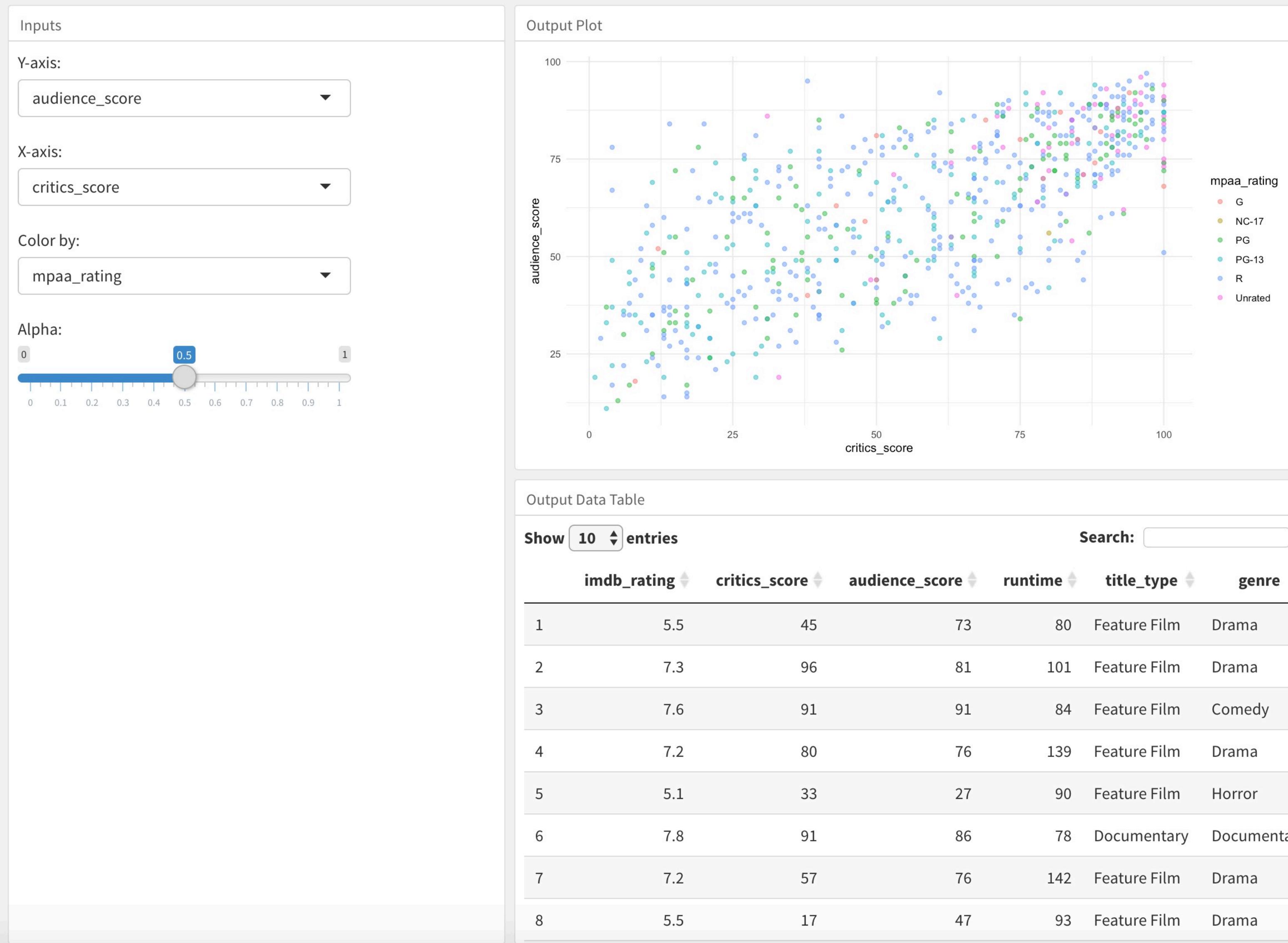
1. Open file **54-movies-4.Rmd**
2. Add another RMarkdown pane below the plot using a level 3 header (### something)
3. Within that pane, add a renderDataTable for movies using the following code:

```
DT::renderDataTable({
 DT::datatable(data = movies %>% select(selected_columns),
 options = list(pageLength = 10,
 rownames = FALSE))
})
```

4. Run your app.

5m 00s

## Movies Dashboard with Shiny Inputs



[Github repo: rstd.io/conf20-rmd-dash](https://rstudio.cloud)

[rstudio.cloud workspace: rstd.io/RMAID](https://rstudio.cloud)

## Filtering Results

1. Open file 55-movies5-doesnt-work.Rmd
2. Examine the code we added below ### \$\$\$\$.
3. Run the app and see what happens.

5m 00s

# What is

Error in .getReactiveEnvironment()  
\$currentContext: Operation not allowed  
without an active reactive context. (You  
tried to do something that can only be  
done from inside a reactive expression or  
observer.)?

Shiny inputs drive outputs  
through *reactivity*



# This Code Doesn't Work Because....

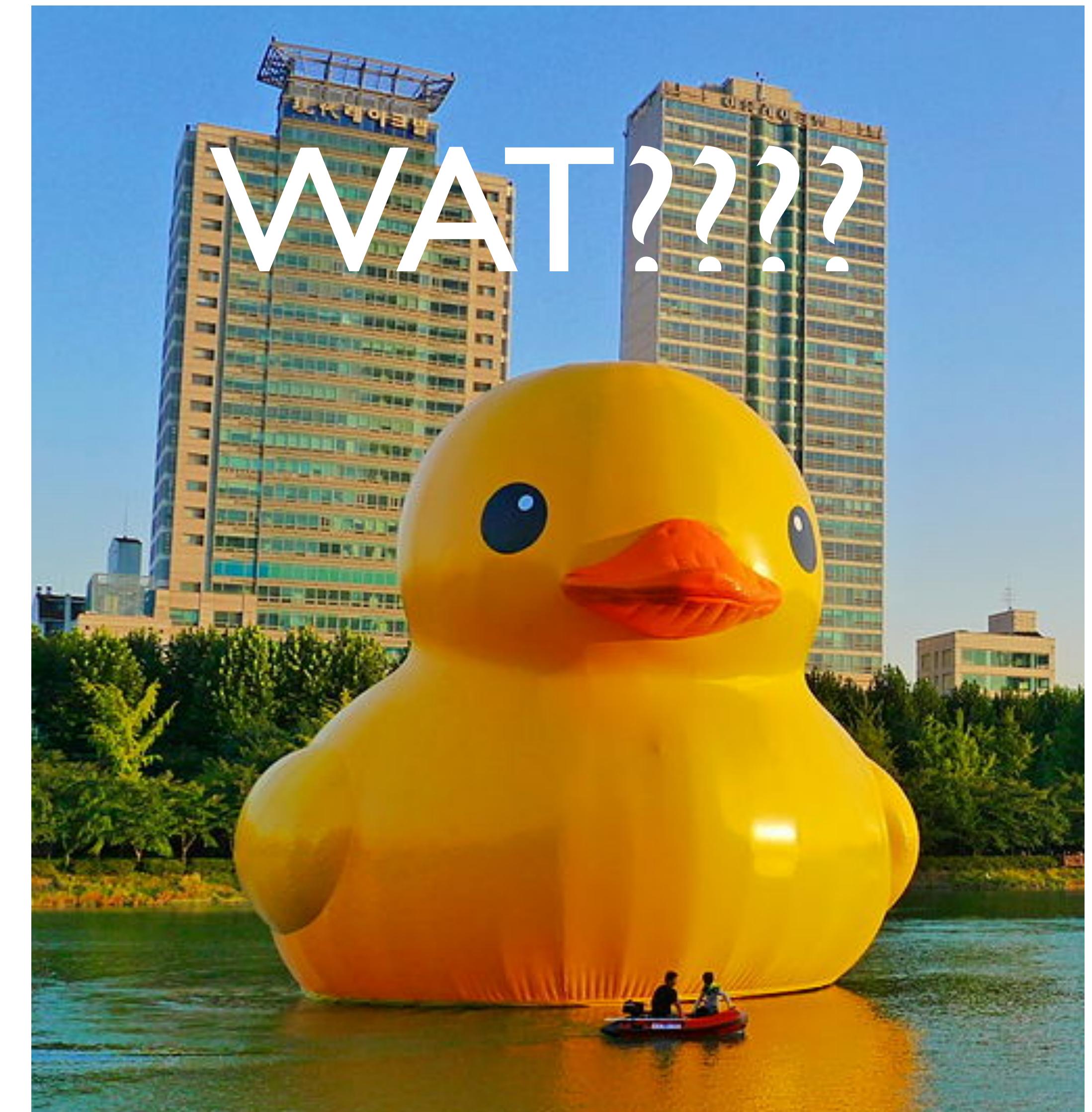
```
Select genre for filtering
 selectInput(inputId = "genre_selection",
 label = "Filter by genre:",
 choices = movies %>% select(genre) %>% unique(),
 selected = "mpaa_rating")

filtered_movies <- movies %>%
 filter(genre == input$genre_selection)
```

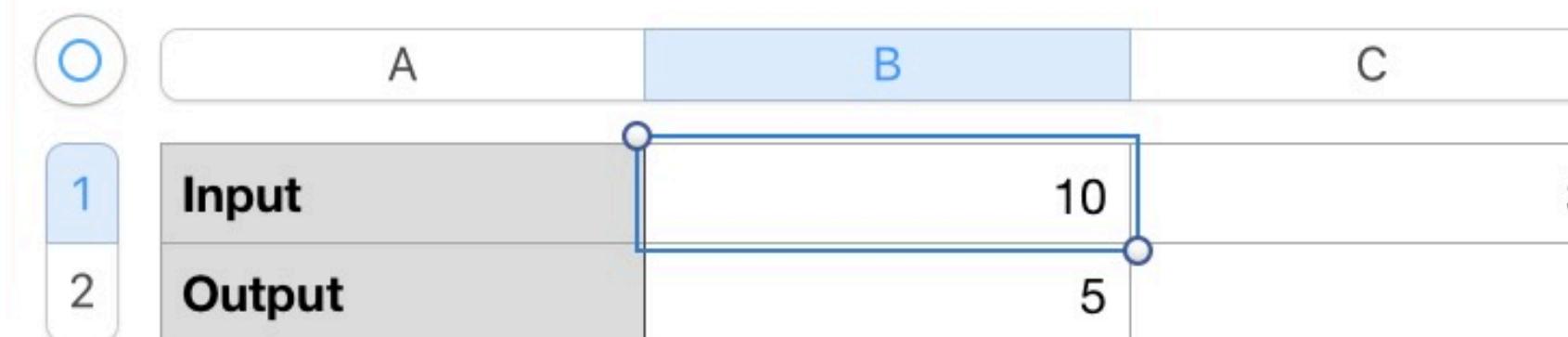
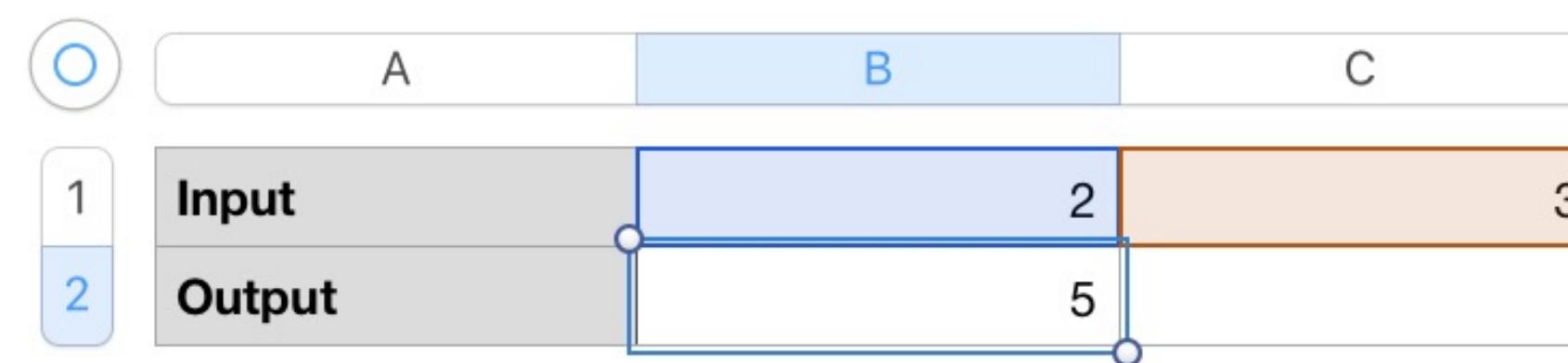
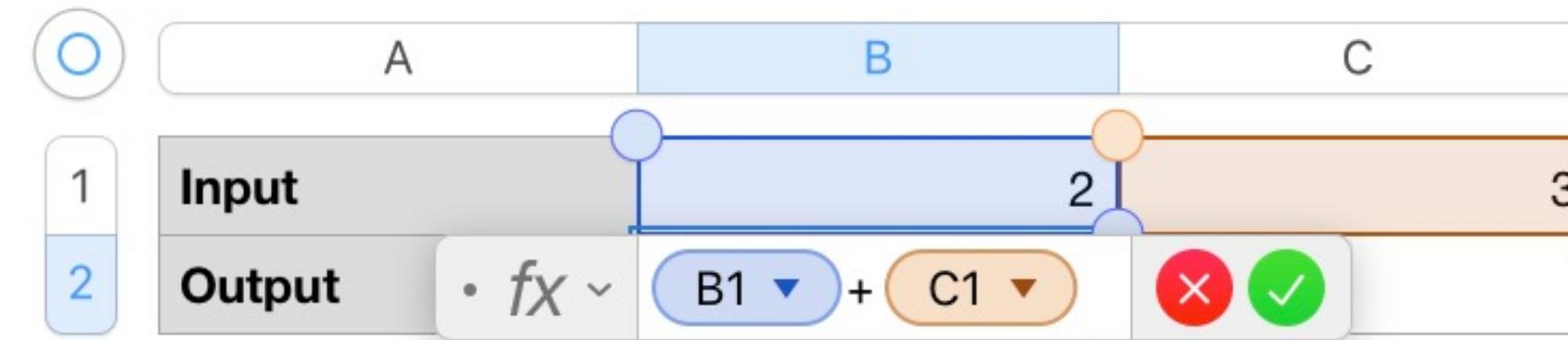
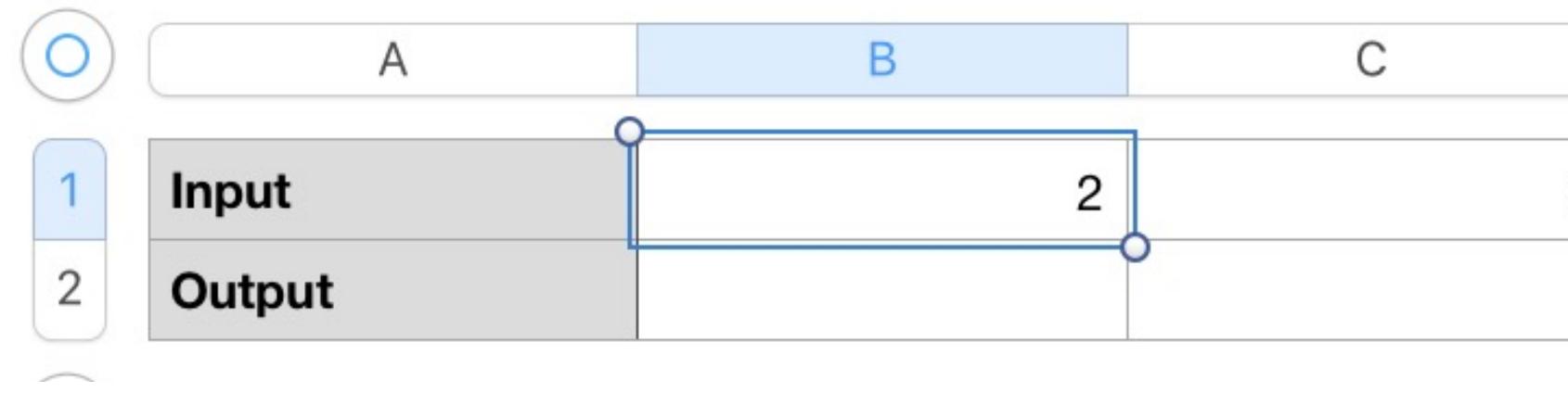
input\$genre\_selection isn't an ordinary variable  
it's a reactive input that can change value with time

# Reactivity

- Shiny input results of the form `input$variable` are **reactive** variables
- `input` variables can be used directly inside `render` expressions
- Any other uses of `input` variables must be inside a `reactive( {} )` expression
- Reactive expressions yield functions that are reactive when called as functions.



# Think Of A Spreadsheet



- The value 13 was computed by **reacting** to B1 changing from 2 to 10
- All cells in spreadsheets are reactive by default
- In Shiny, only input variables created by Shiny input functions are reactive by default

# We Tell Shiny About Reactivity With The `reactive` Function

We have to change this:

```
filtered_movies <- movies %>%
 filter(genre == input$genre_selection)
```

To this:

```
reactive_movies <- reactive({ movies %>%
 filter(genre == input$genre_selection)
})
```

And when we want the value of `reactive_movies`, we have to invoke a function instead of just referencing it:

```
ggplot(data = reactive_movies(), ...)
```

## Filtering Results

1. Open file `55-movies5.Rmd`
2. Change `filtered_movies` to a new reactive expression,  
`reactive_movies` where \$\$\$ appears
3. Also change references to `filtered_movies` to `reactive_movies()`
4. Run the app and see what happens.

5m 00s

## Movies Dashboard with Shiny Inputs

Inputs

Y-axis:

audience\_score

X-axis:

critics\_score

Color by:

title\_type

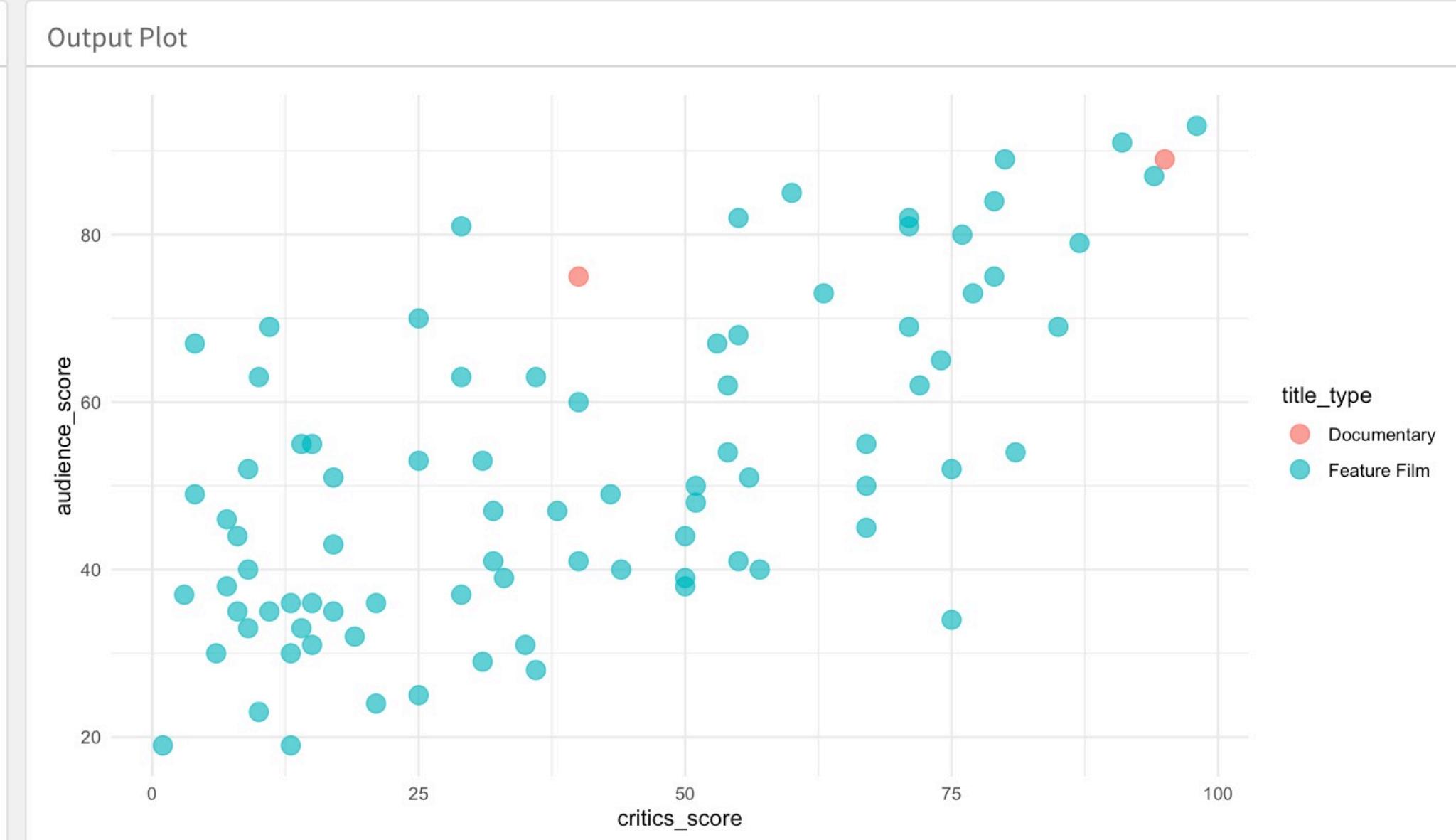
Alpha:

0.71

Size:

4

Filter by genre:

Comedy

Output Data Table

Show 10 entries

Search:

|   | title                 | title_type   | genre  | runtime | mpaa_rating | studio                           | thtr_rel_ |
|---|-----------------------|--------------|--------|---------|-------------|----------------------------------|-----------|
| 1 | Waiting for Guffman   | Feature Film | Comedy | 84      | R           | Sony Pictures Classics           |           |
| 2 | The Royal Tenenbaums  | Feature Film | Comedy | 110     | R           | Buena Vista Distribution Company |           |
| 3 | School for Scoundrels | Feature Film | Comedy | 100     | PG-13       | MGM                              |           |
| 4 | Rhinestone            | Feature Film | Comedy | 111     | PG          | 20th Century Fox                 |           |

Publishing Shiny apps  
requires a server that runs R.  
[shinyapps.io](https://shinyapps.io) and RStudio  
Connect are two easy options

# Publishing Shiny Apps

- Unlike HTML widgets that just rely on HTML and Javascript, Shiny apps must be published to a server that can run R.
- RStudio runs a public server called [shinyapps.io](https://shinyapps.io) that you can publish Shiny apps to.
- To publish your app so others can use it, hit the *Publish* button in the IDE.
- Create an account on [shinyapps.io](https://shinyapps.io) when asked and publish your app there.
- Note that [shinyapps.io](https://shinyapps.io) will only allow you to run 5 apps without paying, so be sure to kill off apps when you no longer want them.

## Publish your app to Connect

1. If you currently have a working app, click the Publish button
2. Select RStudio Connect as your publishing destination
3. Go check out your Shiny app on Connect to see what it looks like there

5m 00s

# Shiny Tips and Tricks

- Debugging Shiny apps can be VERY challenging because of their real-time nature
  1. Start by writing a static plotting application without Shiny
  2. Build out your UI in R Markdown without Shiny
  3. Encapsulate your application and UI within Shiny functions

You can use HTML Widgets in  
your Shiny app by modifying  
your render functions

# Render Functions For 2 HTML Widgets

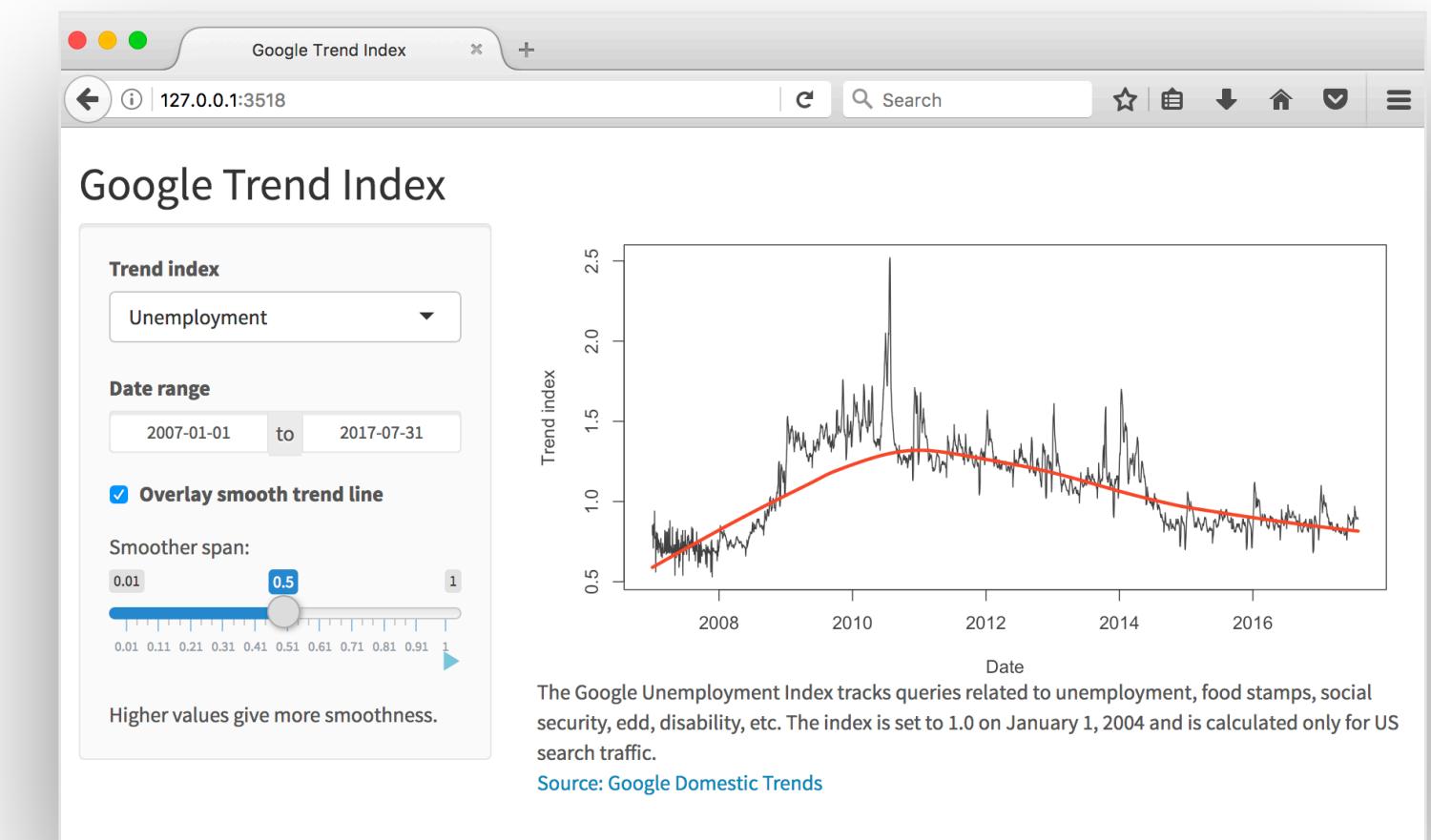
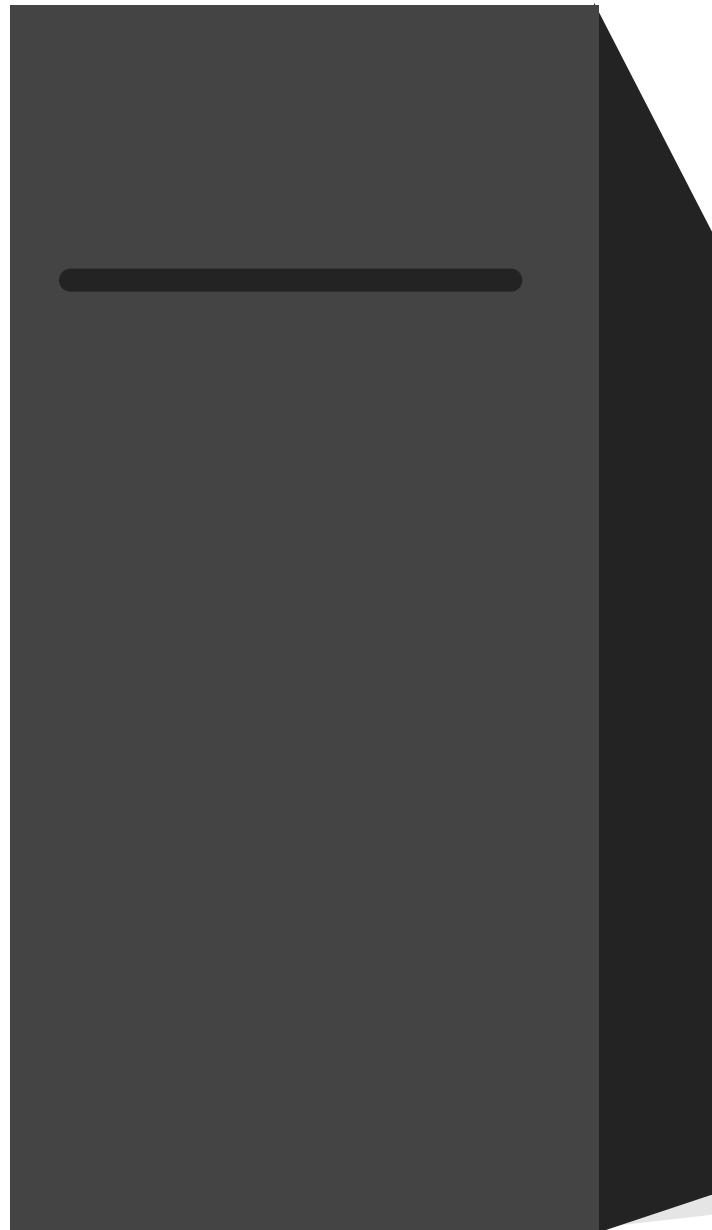
| If you want to use... | render using... | Instead of....       |
|-----------------------|-----------------|----------------------|
| Plotly plots          | renderPlotly    | renderPlot           |
| Leaflet maps          | renderLeaflet   | making your own maps |

# EXERCISE 56

rstudio::conf

## Pull It All Together

1. Open file **56-movies-and-earthquakes.Rmd**
2. Modify the existing plots to use **plotly**
3. Collect the existing materials into a single first level header **# Movies**
4. Create a new first level header page titled **# Earthquakes** that plots recent earthquakes using **leaflet** and **renderLeaflet**. You can find the leaflet code in the dashboard **01-my-first-dashboard.Rmd** in the **01-Introduction** directory; you will, however, want to remove the layer with temperatures and the grouping legend code.
5. Extra credit: add a datatable below your leaflet map with the most recent earthquakes



Program logic

R code

Github repo: [rstudio.cloud/rstd.io/conf20-rmd-dash](https://rstudio.cloud/rstd.io/conf20-rmd-dash)



Layout

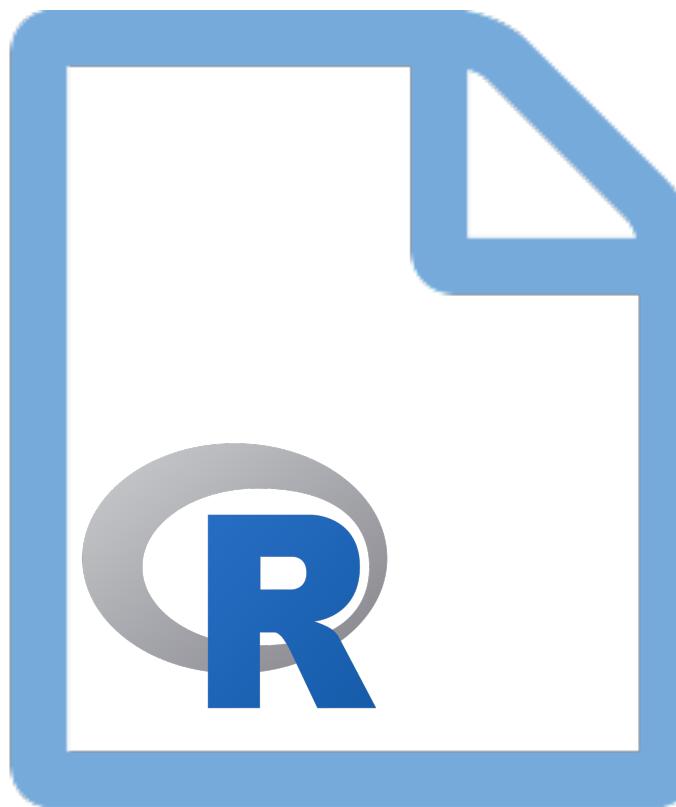
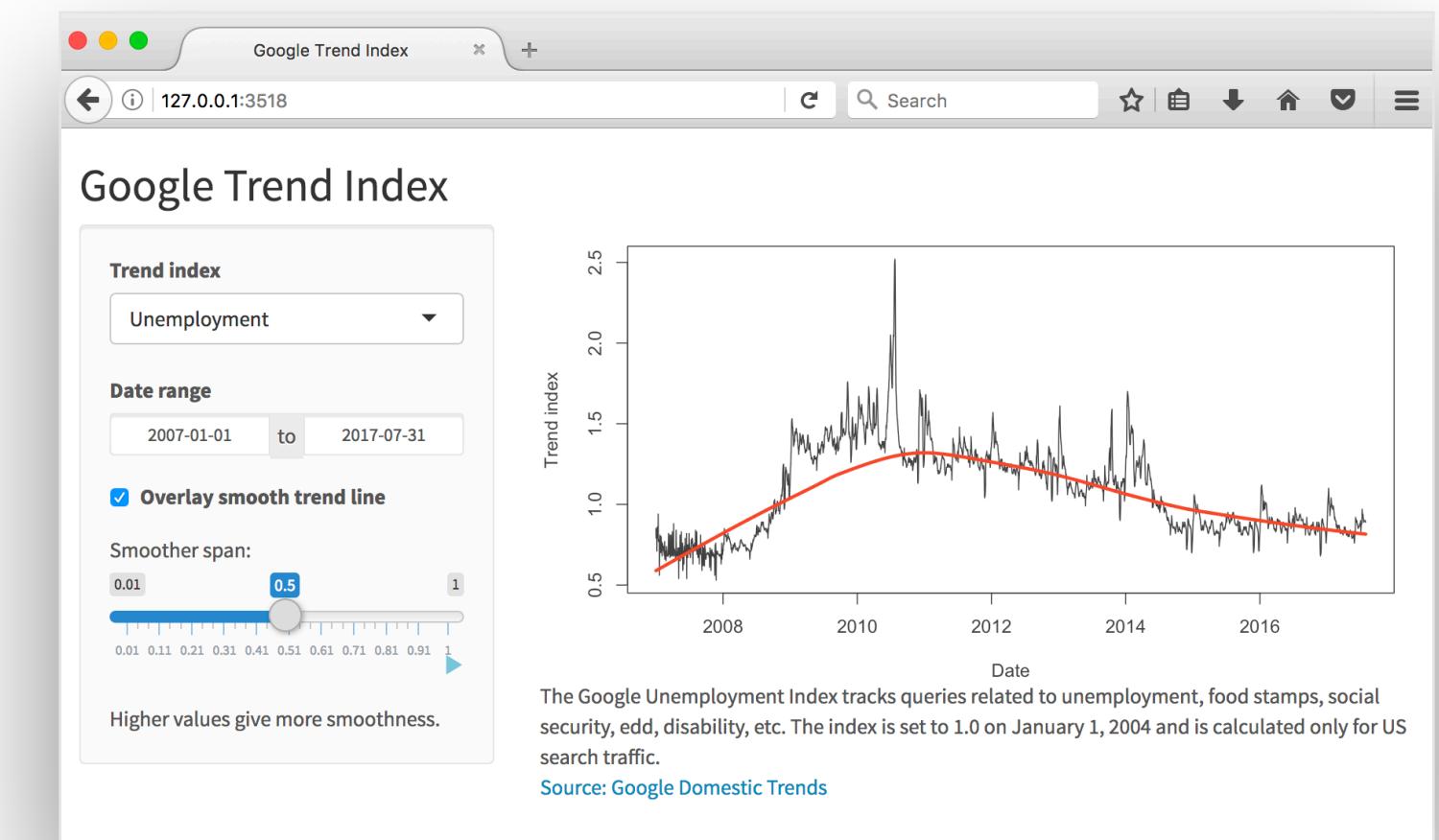
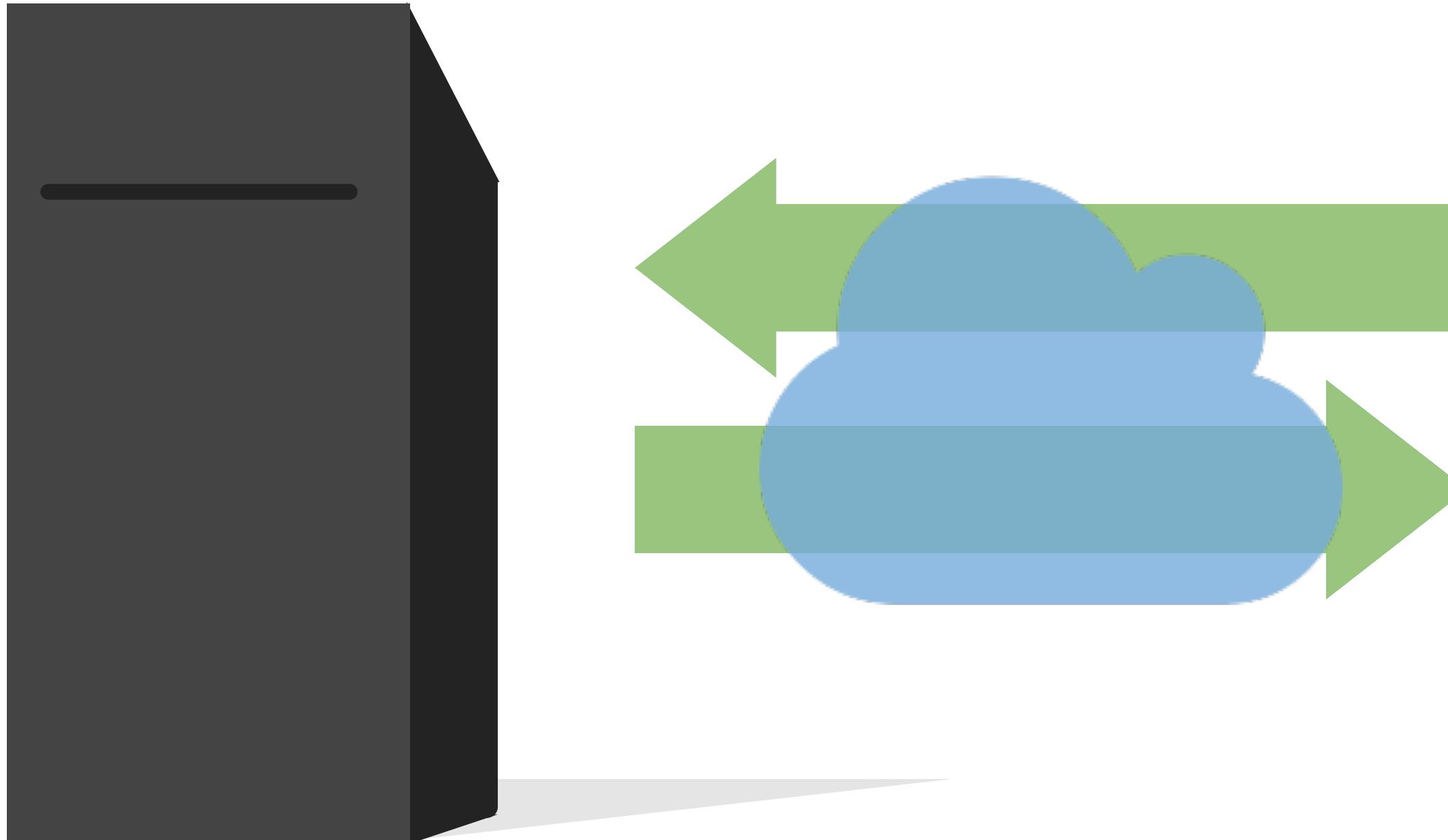
R Markdown

rstudio.cloud workspace: [rstudio.cloud/rstd.io/RMAID](https://rstudio.cloud/rstd.io/RMAID)

# But what about using pure Shiny?

Now that you know Shiny, you may can skip R Markdown altogether.

Instead of .Rmd files, we'll just create .R scripts in two pieces



Server instructions  
server.R

[Github repo: rstd.io/conf20-rmd-dash](#)



User interface  
ui.R

[rstudio.cloud workspace: rstd.io/RMAID](#)

# EXERCISE 57

rstudio::conf

## Explore pure Shiny versions of the movies browser

1. Open file **57-movies-no-markdown.R**
2. Compare the code here with **52-movies2.Rmd**
3. Notice that the pure Shiny version now adds functions devoted to layout
4. Also notice that we click *Run App* instead of *Run Document*.
5. Run the app and observe the differences in layout
6. Load and run **58-movies-color.R** to observe how color was added, just as was done in **53-movies3.Rmd**

# Summary

- Shiny is an R package that makes it easy to build interactive web apps from R
- Shiny offers user interface and rendering functions for input and output controls
- Shiny inputs drive outputs through reactivity
- Publishing Shiny apps requires a server that runs R. shinyapps.io and RStudio Connect are two easy options
- You can use HTML Widgets in your Shiny app by modifying your render functions
- You can build dashboards using pure Shiny and no R Markdown

# Shiny Dashboards

What is Shiny

How does Shiny work?

Shiny apps versus embedding Shiny in R  
Markdown

Input elements

App elements

Building out your app

Your turn: Your first Shiny dashboard

Next level Shiny: Reactivity

Your turn: Build a reactive dashboard

Shinyapps.io

RStudio Connect

Publishing your Shiny dashboard

[21 R Markdown Recipes](#)

[Yihui Answers Your Questions](#)

## R Markdown Master Class with Yihui Xie

Summary and Wrap-Up

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# R Markdown and Interactive Dashboards

## Master Class with Yihui Xie



# WRAP UP

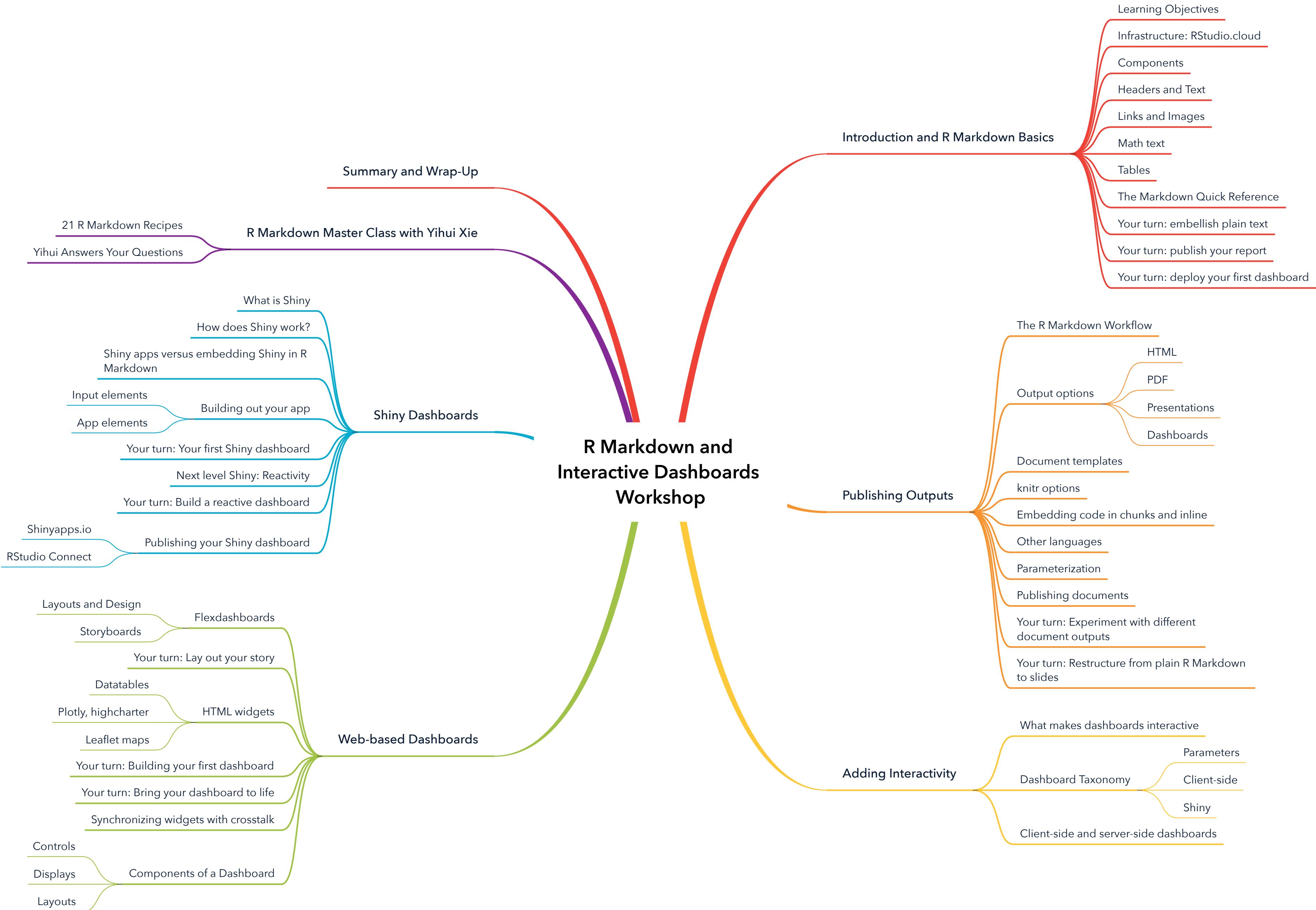
[21 R Markdown Recipes](#)

[Yihui Answers Your Questions](#)

## R Markdown Master Class with Yihui Xie

[Summary and Wrap-Up](#)





# Introduction and R Markdown Basics

## Learning Objectives

Infrastructure: RStudio.cloud

Components

Headers and Text

Links and Images

Math text

Tables

The Markdown Quick Reference

Your turn: embellish plain text

Your turn: publish your report

Your turn: deploy your first dashboard

# R Markdown is a language for creating *computational* *documents\**

Donald Knuth's name for computational documents was *Literate Programming*, which he defined in a book of the same name. I prefer computation documents because it is more intuitively descriptive.

Metadata for an R Markdown  
document is written at the  
top of the document in YAML

R Markdown flags structural  
elements of our text for  
special treatment



Code chunks delimited by  
``` glyphs allow us to add  
computation to our
document.



R Markdown code chunks
support many languages.



Introduction and R Markdown Basics

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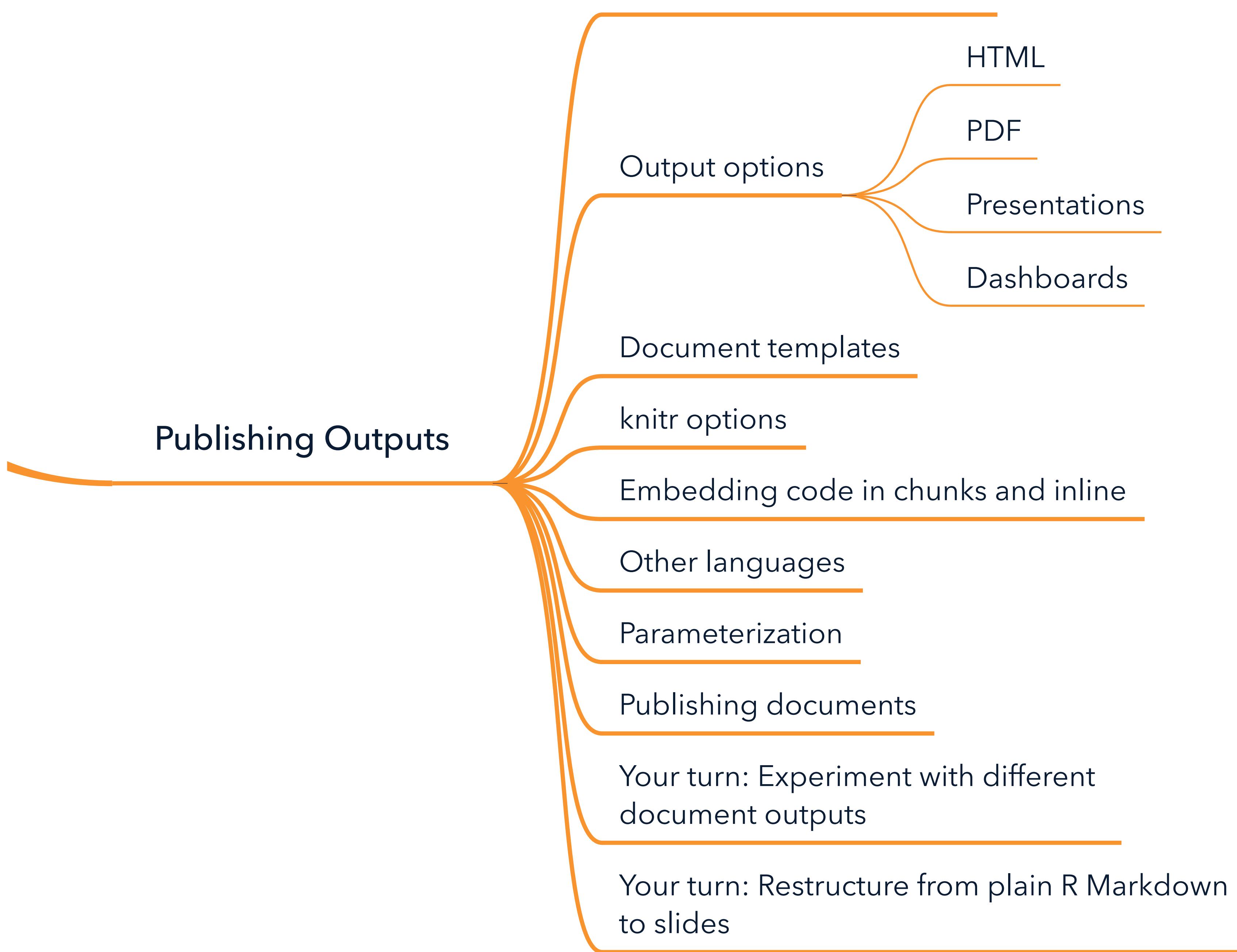
The Markdown Quick Reference

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The R Markdown Workflow



*R Markdown is a system for
creating structured
computational documents*

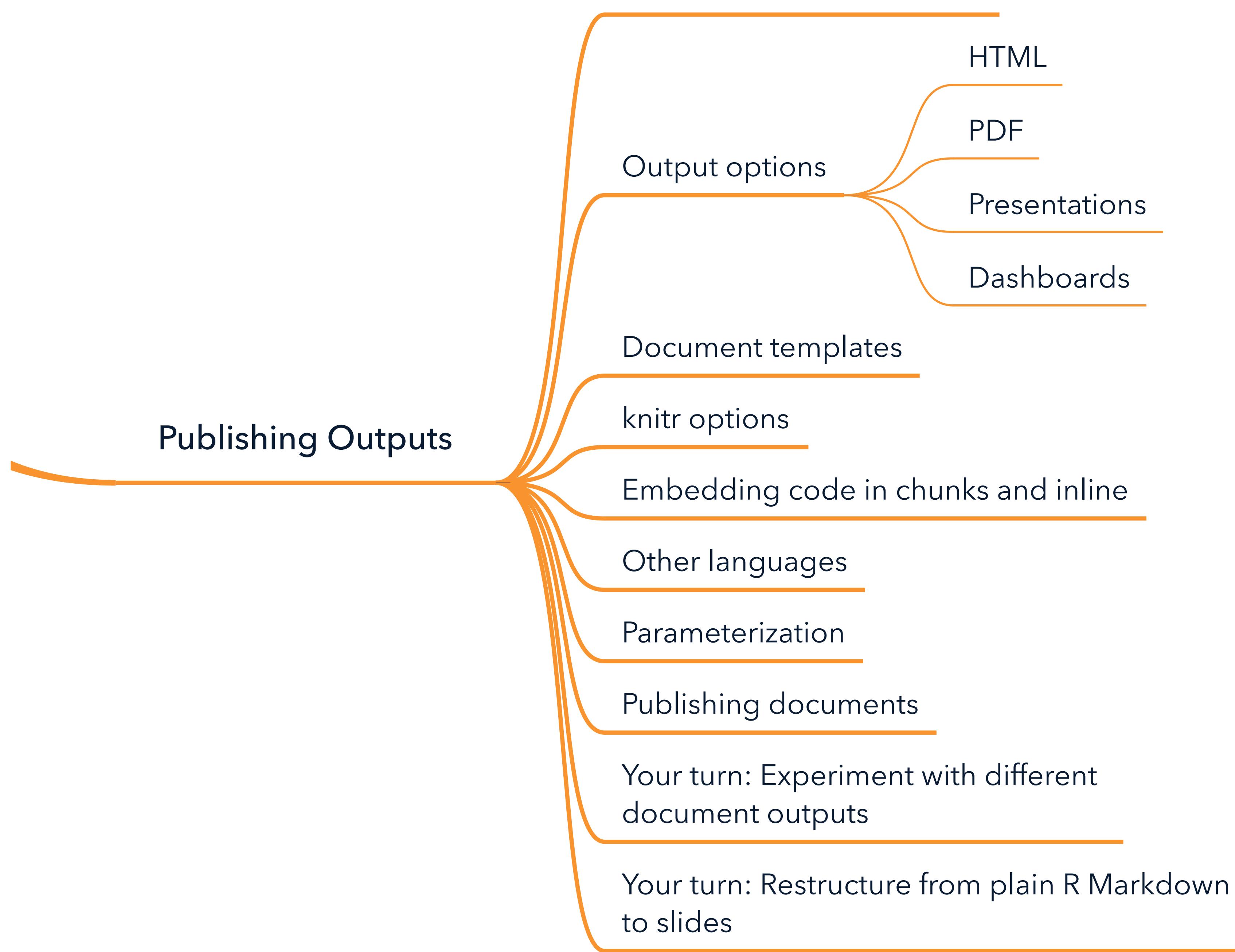
R Markdown can knit to
many document types



*HTML-based R Markdown
documents can be shared
using the publish button in
the RStudio IDE*

R Markdown similar to that
for reports and slides can
also generate dashboards.

The R Markdown Workflow



Adding Interactivity

What makes dashboards interactive

Dashboard Taxonomy

Parameters

Client-side

Shiny

Client-side and server-side dashboards

Interactivity is the gateway
drug that hooks users on
your content



R Markdown supports three
different types of
interactivity: one-time, web-
based, and server-side

Tailor your interactivity plan
to your data and user goals

TRI

Adding Interactivity

What makes dashboards interactive

Dashboard Taxonomy

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Client-side

Shiny

Client-side and server-side dashboards

Web-based Dashboards

Layouts and Design

Flexdashboards

Storyboards

Your turn: Lay out your story

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Plotly, highcharter

HTML widgets

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Your turn: Building your first dashboard

Your turn: Bring your dashboard to life

Synchronizing widgets with crosstalk

Controls

Displays

Components of a Dashboard

Layouts

Dashboards have three
building blocks:

1. Controls
2. Displays
3. Layouts

R Markdown layouts use
header information to mark
rows and columns on pages

HTML widgets create display
interactivity using the user's
browser



We build interactive controls
using either knitting with
parameters or using Shiny

Web-based Dashboards

Layouts and Design

Flexdashboards

Storyboards

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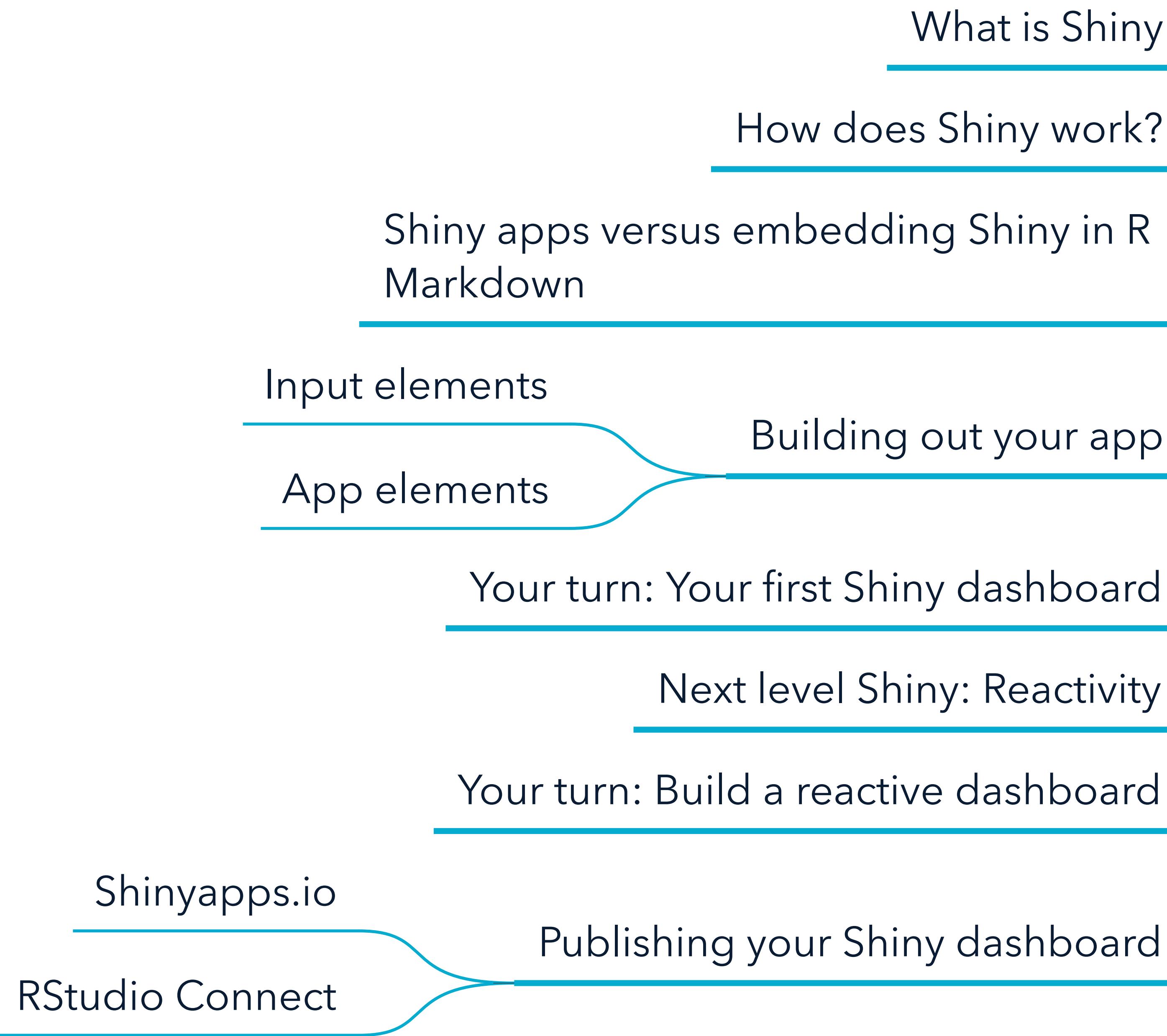
Controls

Displays

Layouts

Components of a Dashboard

Shiny Dashboards



Shiny is an R package that
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shiny.rstudio.com

Shiny offers user interface
and rendering functions for
input and output controls.



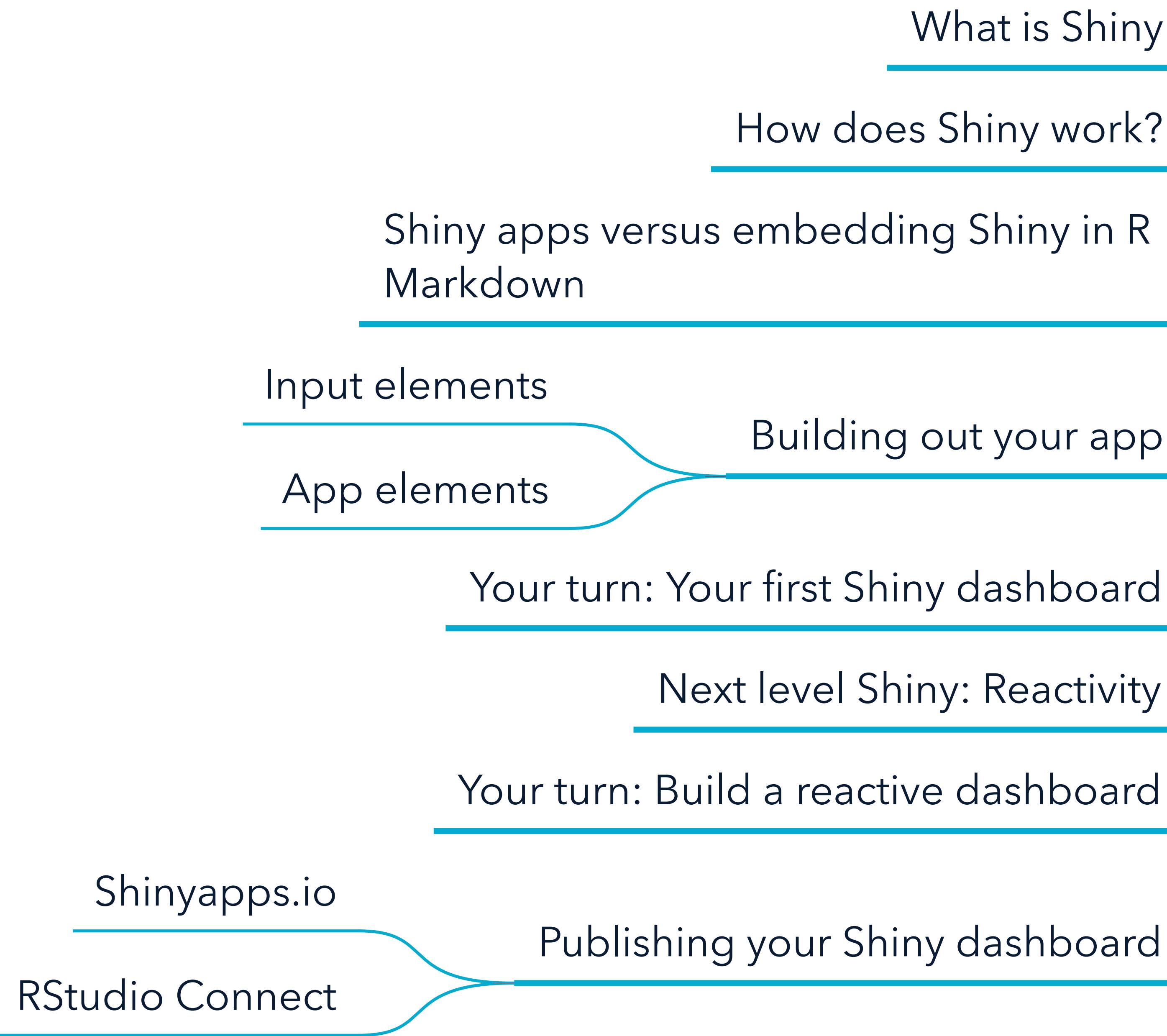
Shiny inputs drive outputs
through *reactivity*



Publishing Shiny apps
requires a server that runs R.
shinyapps.io and RStudio
Connect are two easy options

You can use HTML Widgets in
your Shiny app by modifying
your render functions

Shiny Dashboards



[21 R Markdown Recipes](#)
[Yihui Answers Your Questions](#)

R Markdown Master Class with Yihui Xie
[Summary and Wrap-Up](#)

The background image shows a wide-angle aerial view of the San Francisco city skyline during sunset. The city is bathed in a warm, golden light from the setting sun, which is visible on the horizon. The skyline features numerous skyscrapers, including the Transamerica Pyramid and the Salesforce Tower. In the foreground, there are residential and commercial buildings, streets, and parks. The bay area and distant hills are also visible.

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<https://rstd.io/ws-survey>

A wide-angle aerial photograph of the San Francisco skyline at sunset. The city is bathed in a warm, golden light from the setting sun, which is visible on the right side of the frame. The cityscape includes the Transamerica Pyramid, various other skyscrapers, and a dense grid of lower buildings. In the background, the Golden Gate Bridge is visible across the water, and the hills of the city are silhouetted against the bright sky.

Thank you for your participation!

Please help us improve our workshops by
filling out our survey at:

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