

## CS 252- Data Science

# Building data products

```
library(shiny)
```

```
ui <- fluidPage()
```

User interface:

- Inputs defined and laid out
- Outputs lay out

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

Server function:

- Outputs calculated
- Any other calculations needed to run the app

```
shinyApp(ui=ui, server=server)
```

Runs the application

Best practice:

- You need to have saved at least 2 .R files in your directory

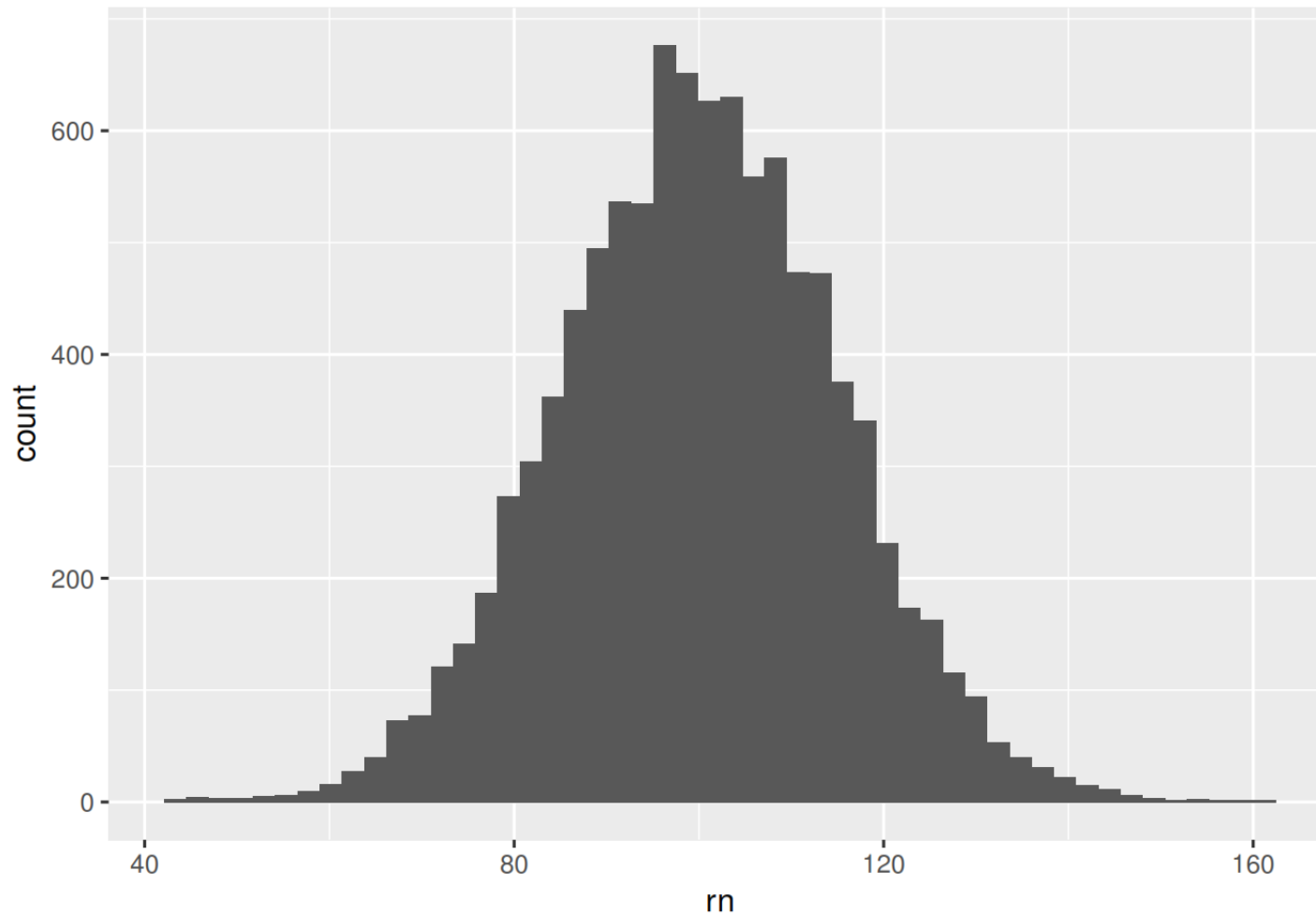
ui.R

server.R

- Also you can have both server and ui in the same R file
- Optionally you can have an R file Global.R that contains functions, code that does not fit in either server or ui.
- For example: user defined functions can be defined in global.R

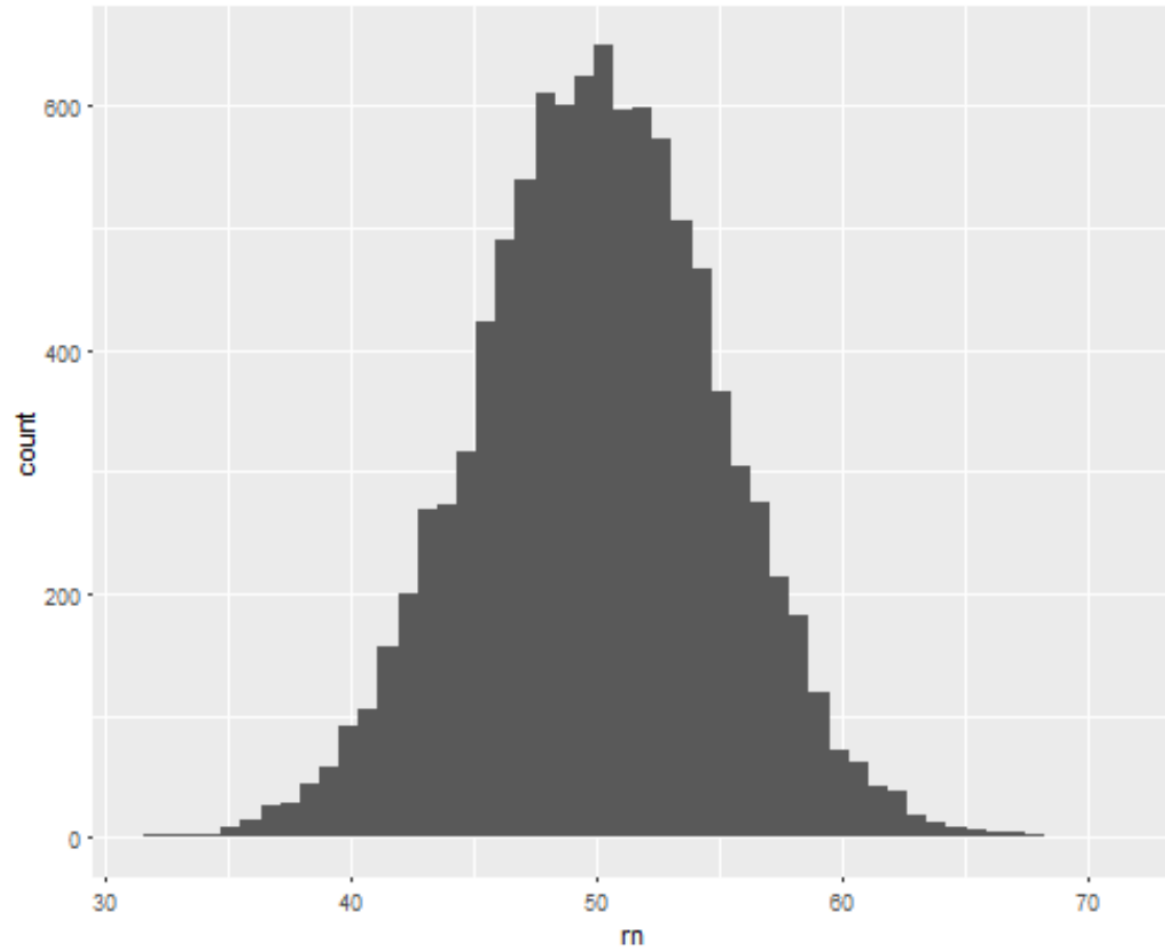
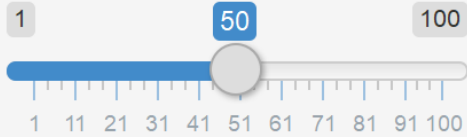
## Create a histogram by changing the parameter for mean

```
rn <- rnorm(n=10000, mean=100, sd=15)  
ggplot()+geom_histogram(aes(x=rn), bins = 50)
```



# Building web applications with shiny

Mean for distribution:



## Selectors

The widget [gallery](#) with codes

### Buttons

Action

Submit

### Date range

2014-01-24 to 2014-01-24

### Radio buttons

- ☒ Choice 1  
☐ Choice 2  
☐ Choice 3

### Single checkbox

☒ Choice A

### File input

Choose File No file chosen

### Select box

Choice 1

### Checkbox group

- ☒ Choice 1  
☐ Choice 2  
☐ Choice 3

### Help text

Note: help text isn't a true widget, but it provides an easy way to add text to accompany other widgets.

### Sliders



### Date input

2014-01-01

### Numeric input

1

### Text input

Enter text...

To run the app don't forget to add `shinyApp(ui = ui, server = server)` to your .R file

```
ui <- fluidPage(  
  sidebarLayout(  
    sidebarPanel(  
      sliderInput(inputId = "mu",  
                  label = "Mean for distribution:",  
                  min = 1,max = 100, value = 50)),  
    mainPanel(plotOutput("histogram"))  
  ))
```

```
server <- function(input, output){  
  output$histogram <- renderPlot({  
    rn <- rnorm(n=10000, mean=input$mu, sd=5)  
    ggplot()+geom_histogram(aes(x=rn), bins=50)  
  })  
}
```

- server takes the value for mean from ui
  - to specify input from ui use `input$<name of the input>`

```
ui <- fluidPage(  
  sidebarLayout(  
    sidebarPanel(  
      sliderInput(inputId = "mu",  
                  label = "Mean for distribution:",  
                  min = 1, max = 100, value = 50)),  
    mainPanel(plotOutput("histogram"))  
  ))
```

```
server <- function(input, output){  
  output$histogram <- renderPlot({  
    rn <- rnorm(n=10000, mean=input$mu, sd=5)  
    ggplot()+geom_histogram(aes(x=rn), bins=50)  
  })  
}
```



## Building web applications with shiny

- Server creates a plot using `renderPlot({})` and saves as an object `output$histogram`,
- to show the plot on ui use `plotOutput` and the name of the output

```
ui <- fluidPage(  
  sidebarLayout(  
    sidebarPanel(  
      sliderInput(inputId = "mu",  
                  label = "Mean for distribution:",  
                  min = 1, max = 100, value = 50)),  
    mainPanel(plotOutput("histogram"))  
  ))
```

```
server <- function(input, output){  
  output$histogram <- renderPlot({  
    rn <- rnorm(n=10000, mean=input$mu, sd=5)  
    ggplot()+geom_histogram(aes(x=rn), bins=50)  
  })  
}
```

sidebarLayout(

  sidebarPanel()

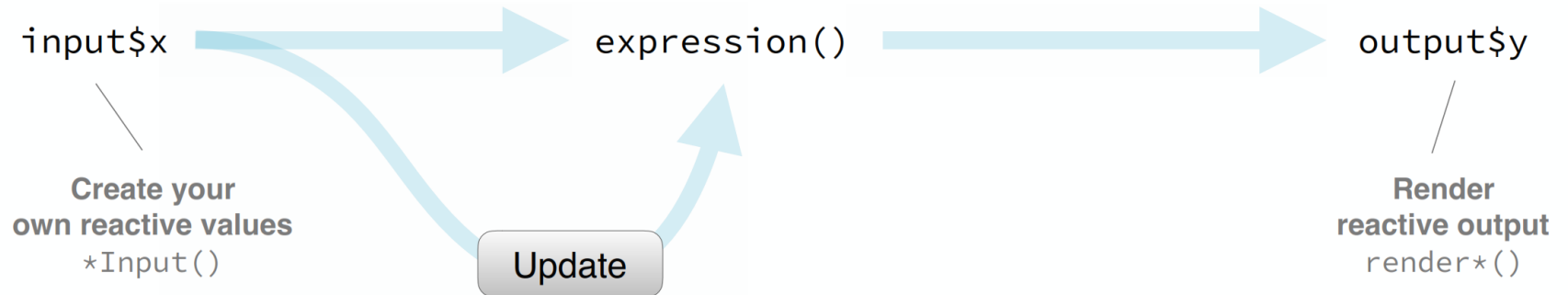
  mainPanel() )

Controls the layout of the app

```
ui <- fluidPage(  
  sidebarLayout(  
    sidebarPanel(  
      sliderInput(inputId = "mu",  
                  label = "Mean for distribution:",  
                  min = 1,max = 100, value = 50)),  
    mainPanel(plotOutput("histogram"))  
  ))
```

```
server <- function(input, output){  
  output$histogram <- renderPlot({  
    rn <- rnorm(n=10000, mean=input$mu, sd=5)  
    ggplot()+geom_histogram(aes(x=rn), bins=50)  
  })  
}
```

## Reactive flow



```
sliderInput(inputId = "mu",  
            label = "Mean for distribution:",  
            min = 1,max = 100, value = 50)),
```

**inputId** – you will use this to refer to the input in server

**label** – the label of the slider

**min, max** – the minimum and maximum values that the mean can have

**value** – the default value

Add another sidebar for standard deviation

ui

```
ui <- fluidPage(  
  
  sidebarLayout(  
    sidebarPanel(  
      sliderInput(inputId = "mu",  
                  label = "Mean for distribution:",  
                  min = 1,max = 100, value = 50),  
      sliderInput(inputId = "sd",  
                  label = "Standard deviation for distribution:",  
                  min = 5,max = 50, value = 40)),  
    mainPanel(  
      plotOutput("histogram"))  
    )  
  )  
)
```

## Server

```
server <- function(input, output){  
  output$histogram <- renderPlot({  
    rn <- rnorm(n=10000, mean=input$mu, sd=input$sd)  
    ggplot()+geom_histogram(aes(x=rn), bins=50)  
  })  
}
```

Add numeric input for sample size

- set the minimum to 100 and maximum to 10,000

**numericInput**(inputId, label, value,  
min, max, step)

## Step 1: Add an R object to the UI

Shiny provides a family of functions that turn R objects into output for your user interface. Each function creates a specific type of output.

### Output function

dataTableOutput

htmlOutput

imageOutput

plotOutput

tableOutput

textOutput

uiOutput

verbatimTextOutput

### Creates

DataTable

raw HTML

image

plot

table

text

raw HTML

text



## Add calculated median of the vector to the dashboard

```
ui <- fluidPage(  
  sidebarLayout(  
    sidebarPanel(  
      sliderInput(inputId = "mu",  
                  label = "Mean for distribution:",  
                  min = 1,max = 100, value = 50),  
      sliderInput(inputId = "sd",  
                  label = "Standard deviation for distribution:",  
                  min = 5,max = 50, value = 40)),  
    mainPanel(  
      plotOutput("histogram"),  
      textOutput("text_median"))  
  )  
)
```

use reactive to make a reactive object, thus an object that reacts to user input

```
server <- function(input, output){  
  rn <- reactive({rnorm(n=10000, mean=input$mu, sd=input$sd)})  
  
  output$histogram <- renderPlot({  
    ggplot()+geom_histogram(aes(x=rn()), bins=50)  
  })  
  
  output$text_median <- renderText({  
    median(rn())  
  })  
}
```

- If you use reactive object in later code, use `rn()`
- Thus this value will be recalculated only when inputs would change

```
server <- function(input, output){  
  rn <- reactive({rnorm(n=10000, mean=input$mu, sd=input$sd)})  
  
  output$histogram <- renderPlot({  
    ggplot()+geom_histogram(aes(x=rn()), bins=50)  
  })  
  
  output$text_median <- renderText({  
    median(rn())  
  })  
}
```

- use `renderText` to make a text
- add it to output, with the name `output$text_median`

```
server <- function(input, output){  
  rn <- reactive({rnorm(n=10000, mean=input$mu, sd=input$sd)})  
  
  output$histogram <- renderPlot({  
    ggplot()+geom_histogram(aes(x=rn()), bins=50)  
  })  
  
  output$text_median <- renderText({  
    median(rn())  
  })  
}
```

## Add textOutput to your ui

```
ui <- fluidPage(  
  sidebarLayout(  
    sidebarPanel(  
      sliderInput(inputId = "mu",  
                  label = "Mean for distribution:",  
                  min = 1,max = 100, value = 50),  
      sliderInput(inputId = "sd",  
                  label = "Standard deviation for distribution:",  
                  min = 5,max = 50, value = 40)),  
    mainPanel(  
      plotOutput("histogram"),  
      textOutput("text_median"))  
  )  
)
```

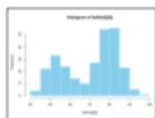
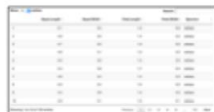
Use `paste()` to add other text elements

```
server <- function(input, output){  
  rn <- reactive({rnorm(n=10000, mean=input$mu, sd=input$sd)})  
  
  output$histogram <- renderPlot({  
    ggplot()+geom_histogram(aes(x=rn()), bins=50)  
  })  
  
  output$text_median <- renderText({  
    #####  
    paste("Median is", median(rn()))  
    #####  
  })  
}
```

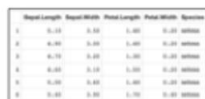
Use html headers (h1, h2, h3, etc) to change the size of the text

```
ui <- fluidPage(  
  sidebarLayout(  
    sidebarPanel(  
      sliderInput(inputId = "mu",  
                  label = "Mean for distribution:",  
                  min = 1,max = 100, value = 50),  
      sliderInput(inputId = "sd",  
                  label = "Standard deviation for distribution:",  
                  min = 5,max = 50, value = 40)),  
    mainPanel(  
      plotOutput("histogram"),  
      #####  
      h3(textOutput("text_median"))  
      #####  
    )  
  )  
)
```

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



"data.frame": 3 obs. of 2 variables:  
 \$ Sepal.Length: num 5.1 4.9 4.7  
 \$ Sepal.Width : num 3.5 3 3.2



foo



works  
with

**DT::renderDataTable**(expr, options, callback, escape, env, quoted)

**dataTableOutput**(outputId, icon, ...)

**renderImage**(expr, env, quoted, deleteFile)

**imageOutput**(outputId, width, height, click, dblclick, hover, hoverDelay, inline, hoverDelayType, brush, clickId, hoverId)

**renderPlot**(expr, width, height, res, ..., env, quoted, func)

**plotOutput**(outputId, width, height, click, dblclick, hover, hoverDelay, inline, hoverDelayType, brush, clickId, hoverId)

**renderPrint**(expr, env, quoted, func, width)

**verbatimTextOutput**(outputId)

**renderTable**(expr, ..., env, quoted, func)

**tableOutput**(outputId)

**renderText**(expr, env, quoted, func)

**textOutput**(outputId, container, inline)

**renderUI**(expr, env, quoted, func)

&

**uiOutput**(outputId, inline, container, ...)

**htmlOutput**(outputId, inline, container, ...)



The app we need

**X axis**

gross\_adjusted ▼

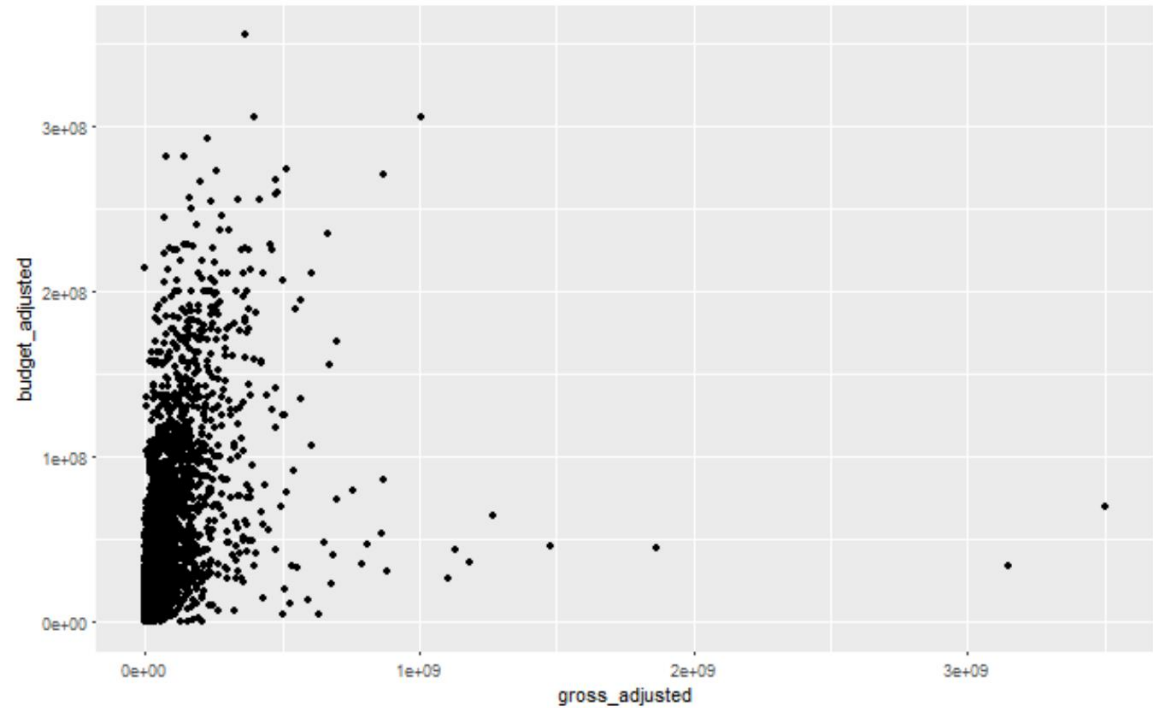
**Y axis**

budget\_adjusted ▼



selectInput

chart



### Look at the structure of selectInput

```
movies <- read.csv("movies3.csv", stringsAsFactors = F)
movies_num <- movies[,apply(movies, is.numeric)]

ui <- fluidPage(
  sidebarLayout(
    sidebarPanel(
      selectInput(inputId = "first", label="X axis",
        choices = colnames(movies_num),
        selected = "gross_adjusted"),
      selectInput(inputId = "second", label="Y axis",
        choices = colnames(movies_num),
        selected = "budget_adjusted")
    ),
    mainPanel(
      plotOutput("scatterplot")
    )
  )
)
```

## Building web applications with shiny

- `aes_string` is used when you have quoted names (“gross\_adjusted” and not `gross_adjusted`)
- the `input$` format from `selectInput` is a quoted text

```
server <- function(input, output){  
  output$scatterplot <- renderPlot({  
    ggplot(data=movies_num, aes_string(x=input$first, y=input$second))+geom_point()  
  })  
}
```

Adding some more functionality  
alpha, the parameter for point transparency

```
ui <- fluidPage(  
  sidebarLayout(  
    sidebarPanel(  
      selectInput(inputId = "first", label="X axis",  
                  choices = colnames(movies_num),  
                  selected = "gross_adjusted"),  
      selectInput(inputId = "second", label="Y axis",  
                  choices = colnames(movies_num),  
                  selected = "budget_adjusted"),  
      #####  
      sliderInput(inputId = "alpha",  
                  label = "Transparency:",  
                  min = 0,max = 1, value = 0.5)),  
      #####  
    mainPanel(  
      plotOutput("scatterplot")  
    )  
  )  
)
```

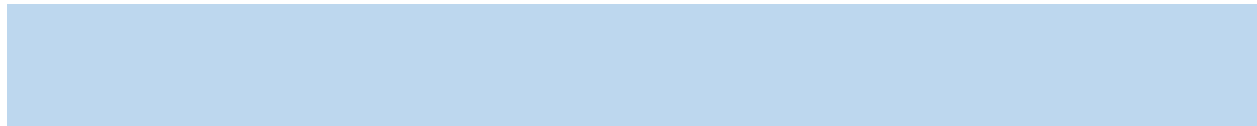
## Adding data table

```
server <- function(input, output){  
  output$scatterplot <- renderPlot({  
    ggplot(data=movies_num, aes_string(x=input$first, y=input$second))+  
      geom_point(alpha=input$alpha)  
  })  
  #####  
  output$summary <- renderDataTable({  
    movies_num[,c(input$first, input$second)]  
  })  
  #####  
}
```

## UI

```
ui <- fluidPage(  
  sidebarLayout(  
    sidebarPanel(  
      selectInput(inputId = "first", label="X axis",  
                  choices = colnames(movies_num),  
                  selected = "gross_adjusted"),  
      selectInput(inputId = "second", label="Y axis",  
                  choices = colnames(movies_num),  
                  selected = "budget_adjusted"),  
      sliderInput(inputId = "alpha",  
                  label = "Transparency:",  
                  min = 0,max = 1, value = 0.5)),  
    mainPanel(  
      plotOutput("scatterplot"),  
      #####  
      dataTableOutput("summary"))  
      #####  
    )  
  )  
)
```

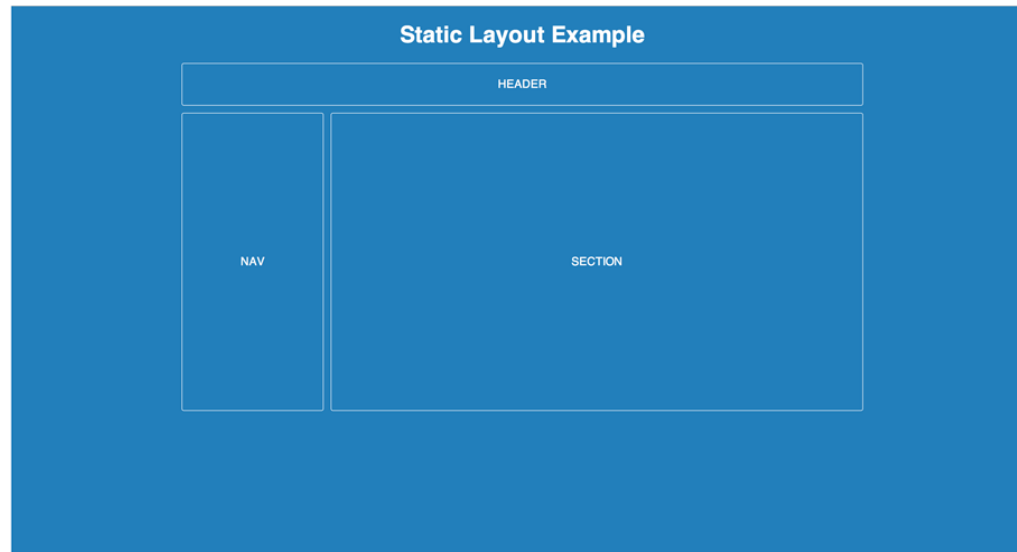
# ui Layout



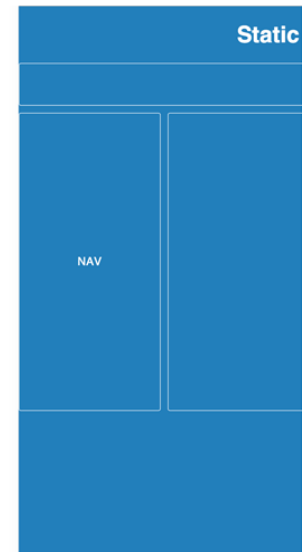
## Building web applications with shiny

- A static page layout (sometimes called a “fixed” layout or “fixed width” layout) uses a preset page size and does not change based on the browser width. In other words, the page layout might have a permanent width of 960 pixels no matter what.
- Different devices will treat a static page layout in various ways, so the rendered page could be slightly unpredictable.
- For example, on a desktop browser, if the window is too small horizontally, then the page will be cut off and horizontal scroll bars will be displayed.

- `fixedPage()`



1440px

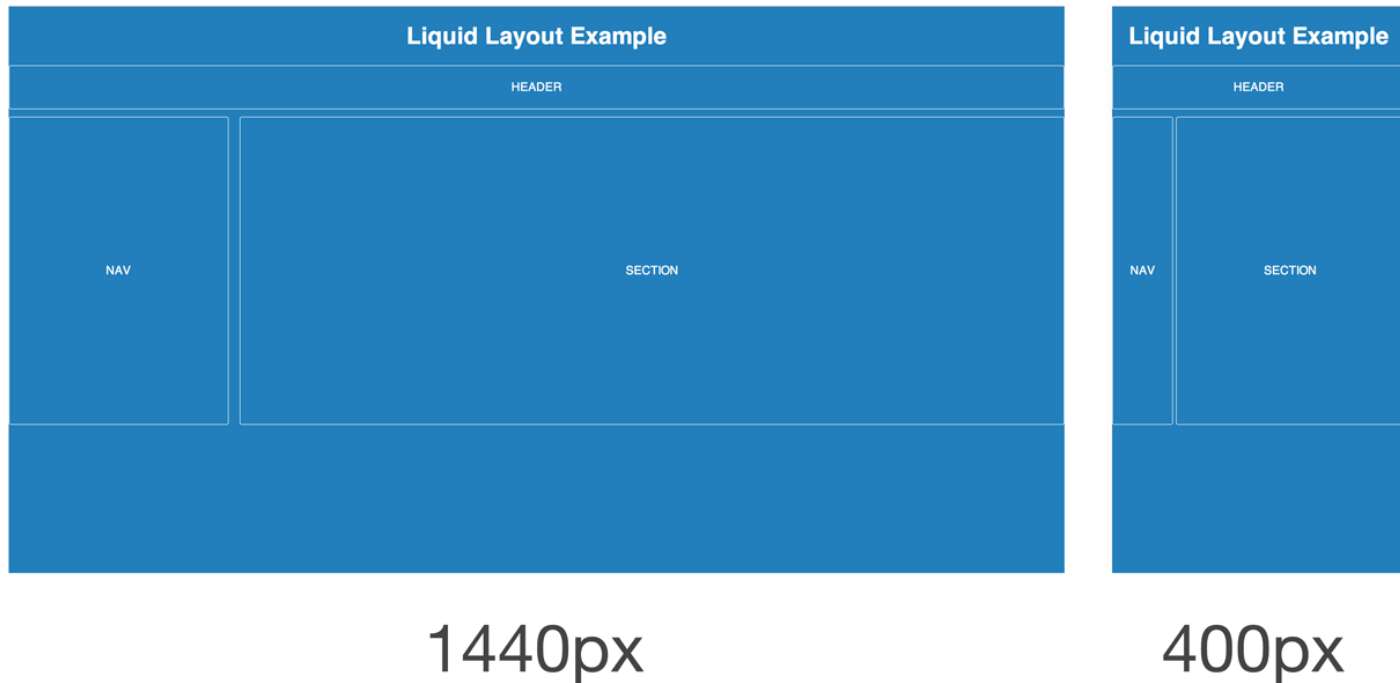


400px



# Building web applications with shiny

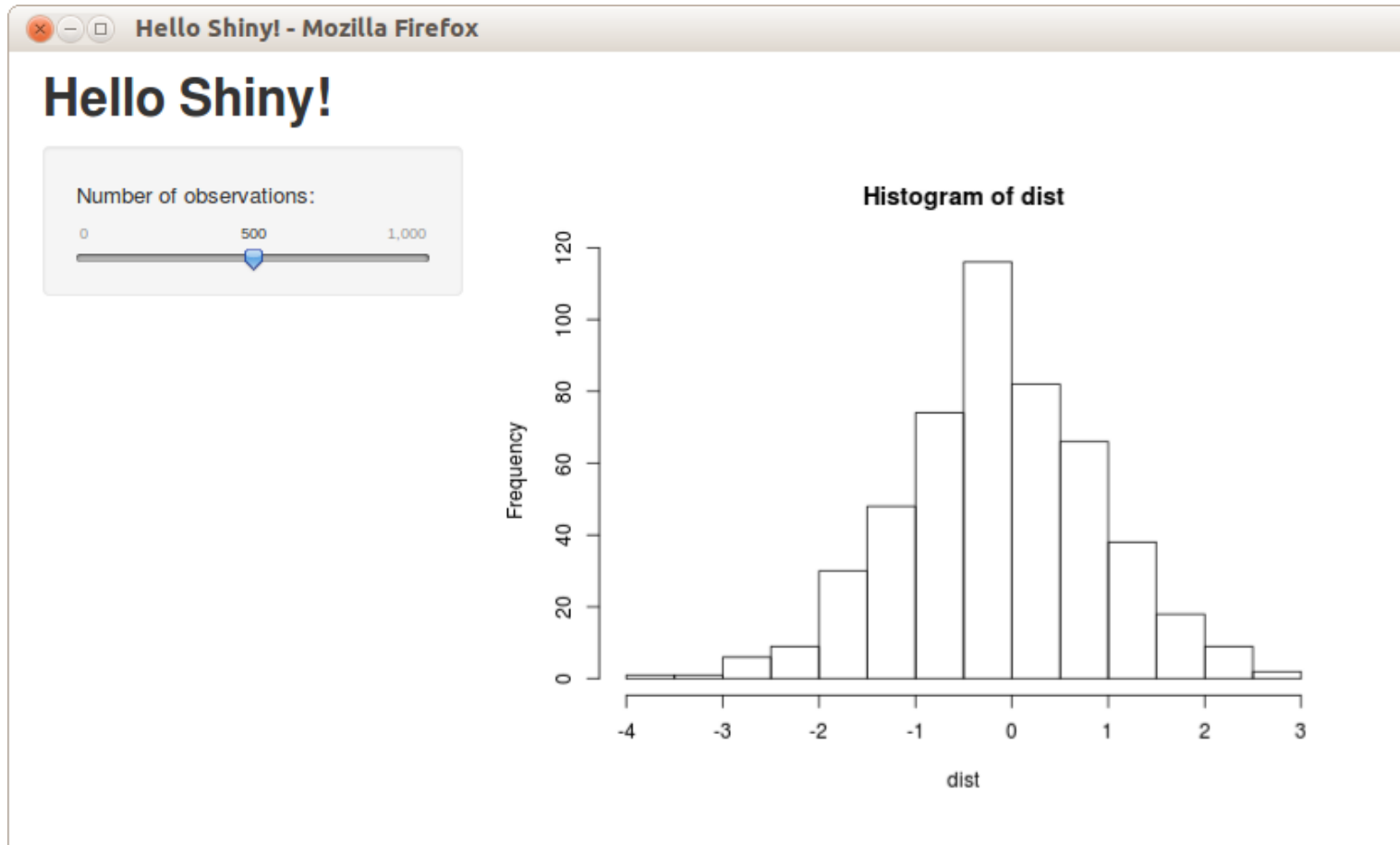
- A liquid page layout (sometimes called “fluid” or “fluid width”) uses relative units instead of fixed units.
- Typically a liquid layout will use percentages instead of pixels, but any relative unit of measurement will work, such as [ems](#).
- A liquid layout often will fill the width of the page, no matter what the width of the browser might be.
- **fluidPage()** in shiny



# Building web applications with shiny

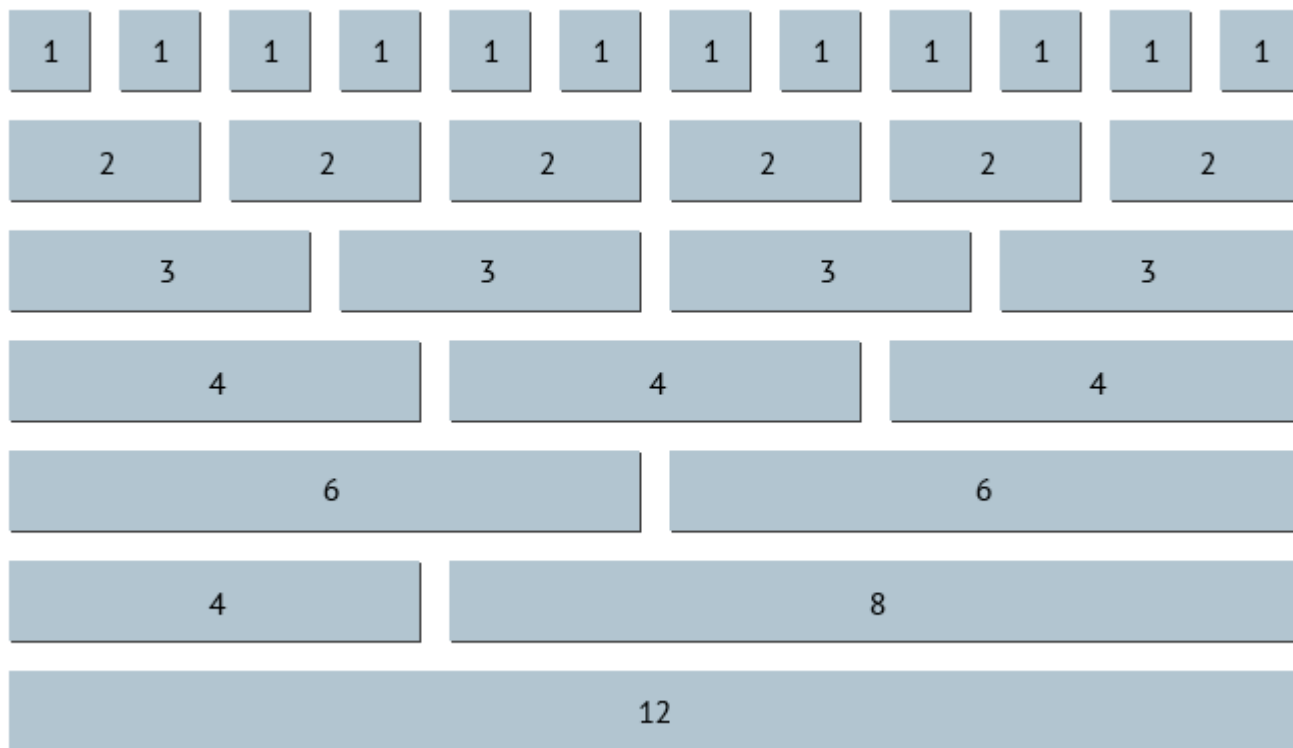
Sidebar layout:

This layout provides a sidebar for inputs and a large main area for output:



## Building web applications with shiny

- Grid Layout
- The familiar sidebarLayout() described above makes use of Shiny's lower-level grid layout functions.
- Rows are created by the fluidRow() function and include columns defined by the column() function.
- Column widths are based on the Bootstrap 12-wide grid system, so should add up to 12 within a fluidRow() container.



## The same server

```
server <- function(input, output){  
  output$scatterplot <- renderPlot({  
    ggplot(data=movies_num, aes_string(x=input$first, y=input$second))+  
      geom_point(alpha=input$alpha)  
  })  
  output$summary <- renderDataTable({  
    movies_num[,c(input$first, input$second)]  
  })  
}
```

## The ui

```
ui <- fluidPage(  
  fluidRow(  
    column(1, selectInput(inputId = "first", label="X axis",  
                          choices = colnames(movies_num),  
                          selected = "gross_adjusted")),  
    column(1, selectInput(inputId = "second", label="Y axis",  
                          choices = colnames(movies_num),  
                          selected = "budget_adjusted")),  
    column(1, sliderInput(inputId = "alpha",  
                          label = "Transparency:",  
                          min = 0,max = 1, value = 0.5))  
  ),  
  fluidRow(  
    column(4, plotOutput("scatterplot")),  
    column(4, dataTableOutput("summary"))  
  )  
)
```

## Two rows

```
ui <- fluidPage(  
  fluidRow(  
    column(1, selectInput(inputId = "first", label="X axis",  
                          choices = colnames(movies_num),  
                          selected = "gross_adjusted")),  
    column(1, selectInput(inputId = "second", label="Y axis",  
                          choices = colnames(movies_num),  
                          selected = "budget_adjusted")),  
    column(1, sliderInput(inputId = "alpha",  
                          label = "Transparency:",  
                          min = 0,max = 1, value = 0.5))  
  )  
)
```



The comma you don't  
want to miss

```
    fluidRow(  
      column(4, plotOutput("scatterplot")),  
      column(4, dataTableOutput("summary"))  
    )  
  )  
)
```

## Columns inside the rows

```
ui <- fluidPage(  
  fluidRow(  
    column(1, selectInput(inputId = "first", label="X axis",  
                           choices = colnames(movies_num),  
                           selected = "gross_adjusted")),  
    column(1, selectInput(inputId = "second", label="Y axis",  
                           choices = colnames(movies_num),  
                           selected = "budget_adjusted")),  
    column(1, sliderInput(inputId = "alpha",  
                           label = "Transparency:",  
                           min = 0,max = 1, value = 0.5))  
  ),  
  fluidRow(  
    column(4, plotOutput("scatterplot")),  
    column(4, dataTableOutput("summary"))  
  )  
)
```

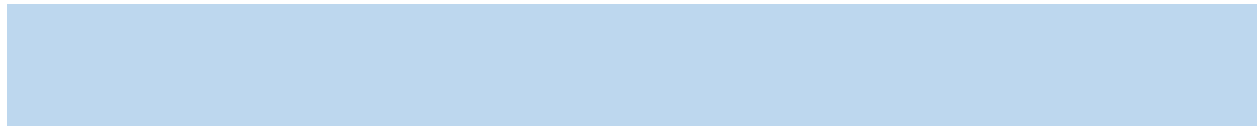
### Width of the column

The sum of widths of the columns inside every row needs to be no more than 12

```
ui <- fluidPage(  
  fluidRow(  
    column(1, selectInput(inputId = "first", label="X axis",  
                          choices = colnames(movies_num),  
                          selected = "gross_adjusted")),  
    column(1, selectInput(inputId = "second", label="Y axis",  
                          choices = colnames(movies_num),  
                          selected = "budget_adjusted")),  
    column(1, sliderInput(inputId = "alpha",  
                          label = "Transparency:",  
                          min = 0,max = 1, value = 0.5))  
  ),  
  fluidRow(  
    column(4, plotOutput("scatterplot")),  
    column(4, dataTableOutput("summary"))  
  )  
)
```

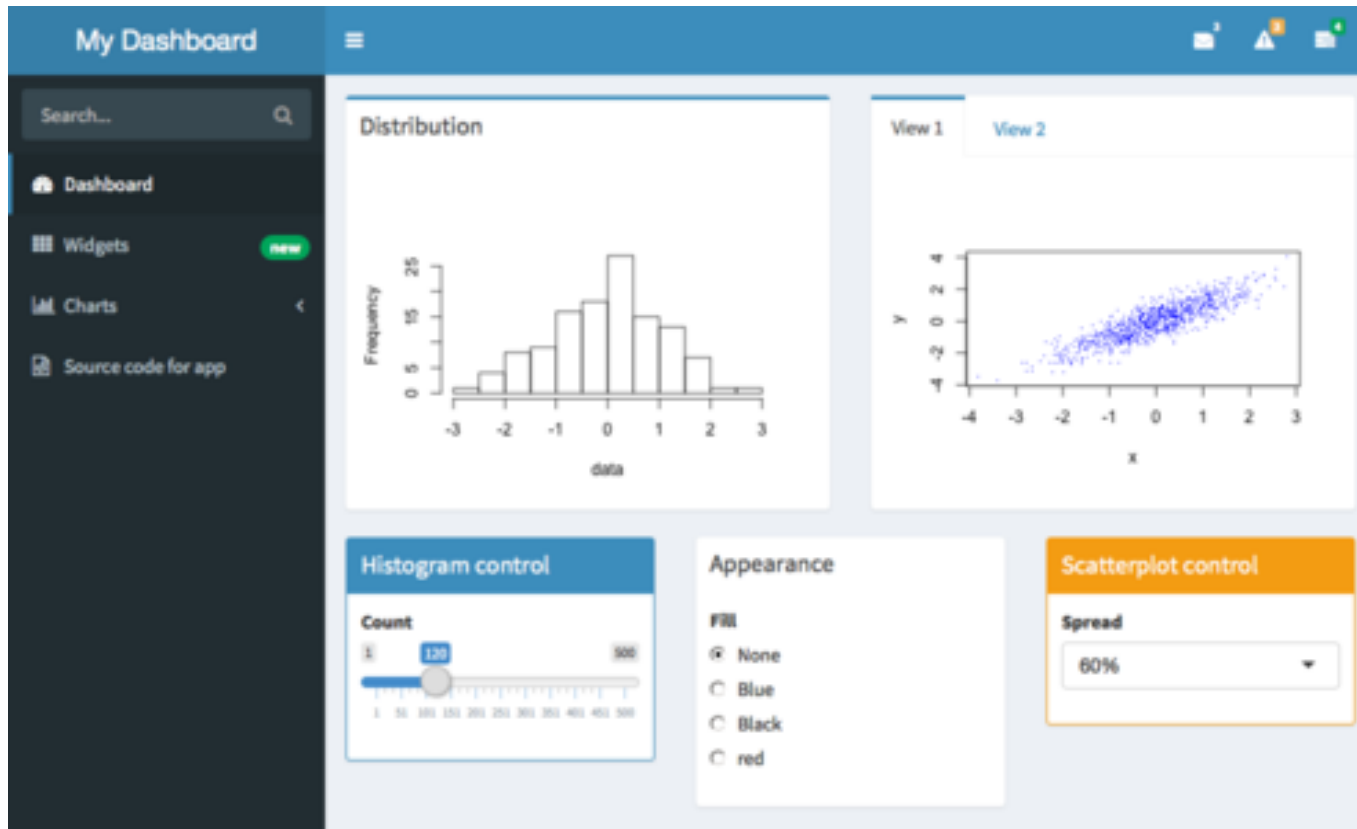


# shinydashboard



# Building web applications with shiny

Shiny dashboard makes it easy to construct dashboards  
`install.packages("shinydashboard")`



A dashboard has three parts: a header, a sidebar, and a body. Here's the most minimal possible UI for a dashboard page.

```
library(shinydashboard)

dashboardPage(
  dashboardHeader(),
  dashboardSidebar(),
  dashboardBody()
)
```

## Add title to the dashboard

```
ui <- dashboardPage(  
  dashboardHeader(title = "This is my dashboard"),  
  dashboardSidebar(),  
  dashboardBody()  
)  
  
server <- function(input, output) { }  
  
shinyApp(ui, server)
```

## App with the histogram

```
ui <- dashboardPage(  
  dashboardHeader(title = "This is my dashboard"),  
  
  dashboardSidebar(  
    sliderInput(inputId = "mu",  
      label = "Mean for distribution:",  
      min = 1, max = 100, value = 50),  
    sliderInput(inputId = "sd",  
      label = "Standard deviation for distribution:",  
      min = 5, max = 50, value = 40),  
    numericInput(inputId = "sample",  
      label = "Sample size",  
      min = 100, max = 10000, value = 1000)),  
  
  dashboardBody(plotOutput("histogram"))  
)
```

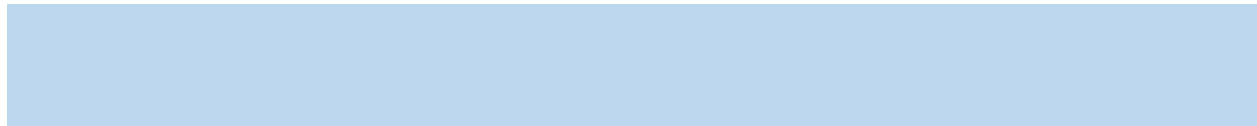
App user inputs are located in dashboardSidebar

```
ui <- dashboardPage(  
  dashboardHeader(title = "This is my dashboard"),  
  
  dashboardSidebar(  
    sliderInput(inputId = "mu",  
      label = "Mean for distribution:",  
      min = 1, max = 100, value = 50),  
    sliderInput(inputId = "sd",  
      label = "Standard deviation for distribution:",  
      min = 5, max = 50, value = 40),  
    numericInput(inputId = "sample",  
      label = "Sample size",  
      min = 100, max = 10000, value = 1000)),  
  
  dashboardBody(plotOutput("histogram"))  
)
```

## Output is in dashboardBody

```
ui <- dashboardPage(  
  dashboardHeader(title = "This is my dashboard"),  
  
  dashboardSidebar(  
    sliderInput(inputId = "mu",  
      label = "Mean for distribution:",  
      min = 1, max = 100, value = 50),  
    sliderInput(inputId = "sd",  
      label = "Standard deviation for distribution:",  
      min = 5, max = 50, value = 40),  
    numericInput(inputId = "sample",  
      label = "Sample size",  
      min = 100, max = 10000, value = 1000)),  
  
  dashboardBody(plotOutput("histogram"))  
)
```

# using shinyapps.io





- Allows to deploy shiny apps on the web
- integrated with R studio
- Is free, but limited to 5 active applications and 25 Active hours
- You can update your plan on shinyapps.io
- Or build something by yourself using [shinyproxy](https://shinyproxy.io/)

Register with shinyapps.io

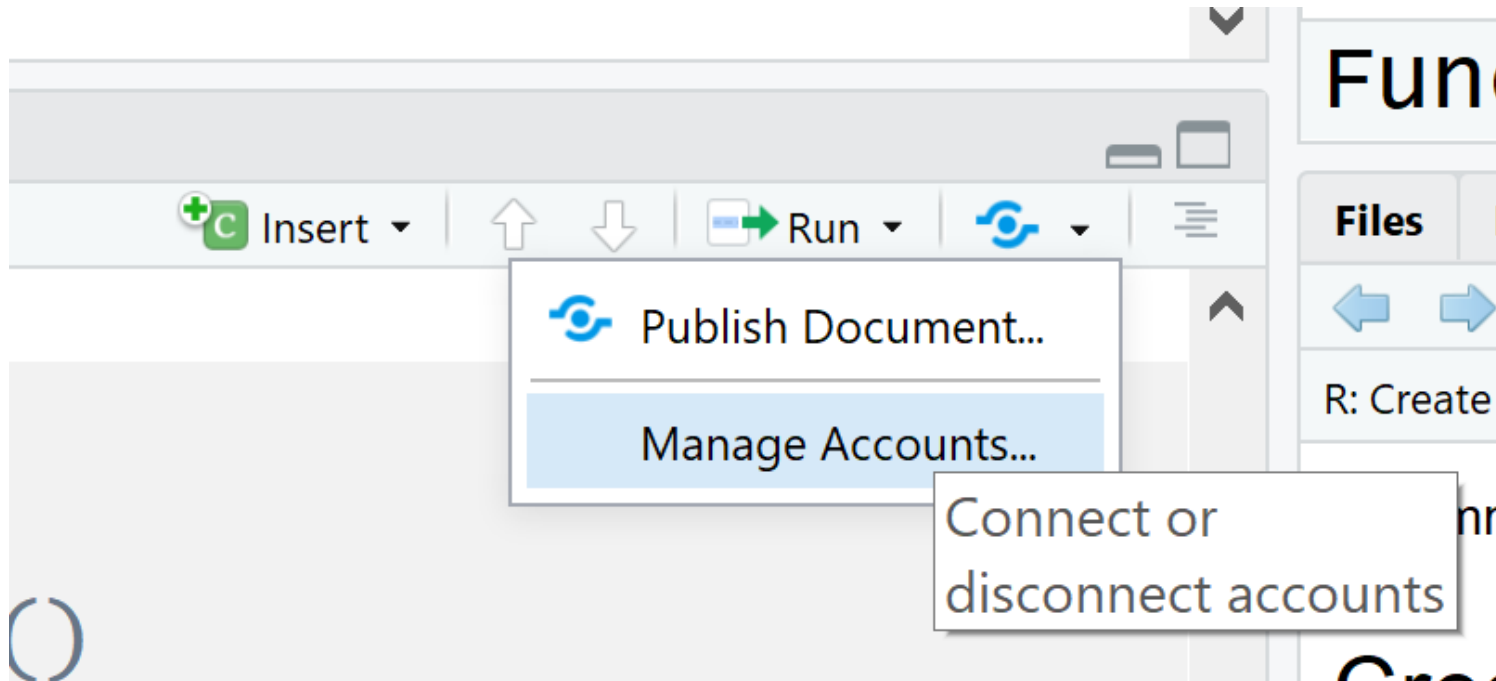
Install the following packages

```
install.packages('rsconnect')
```

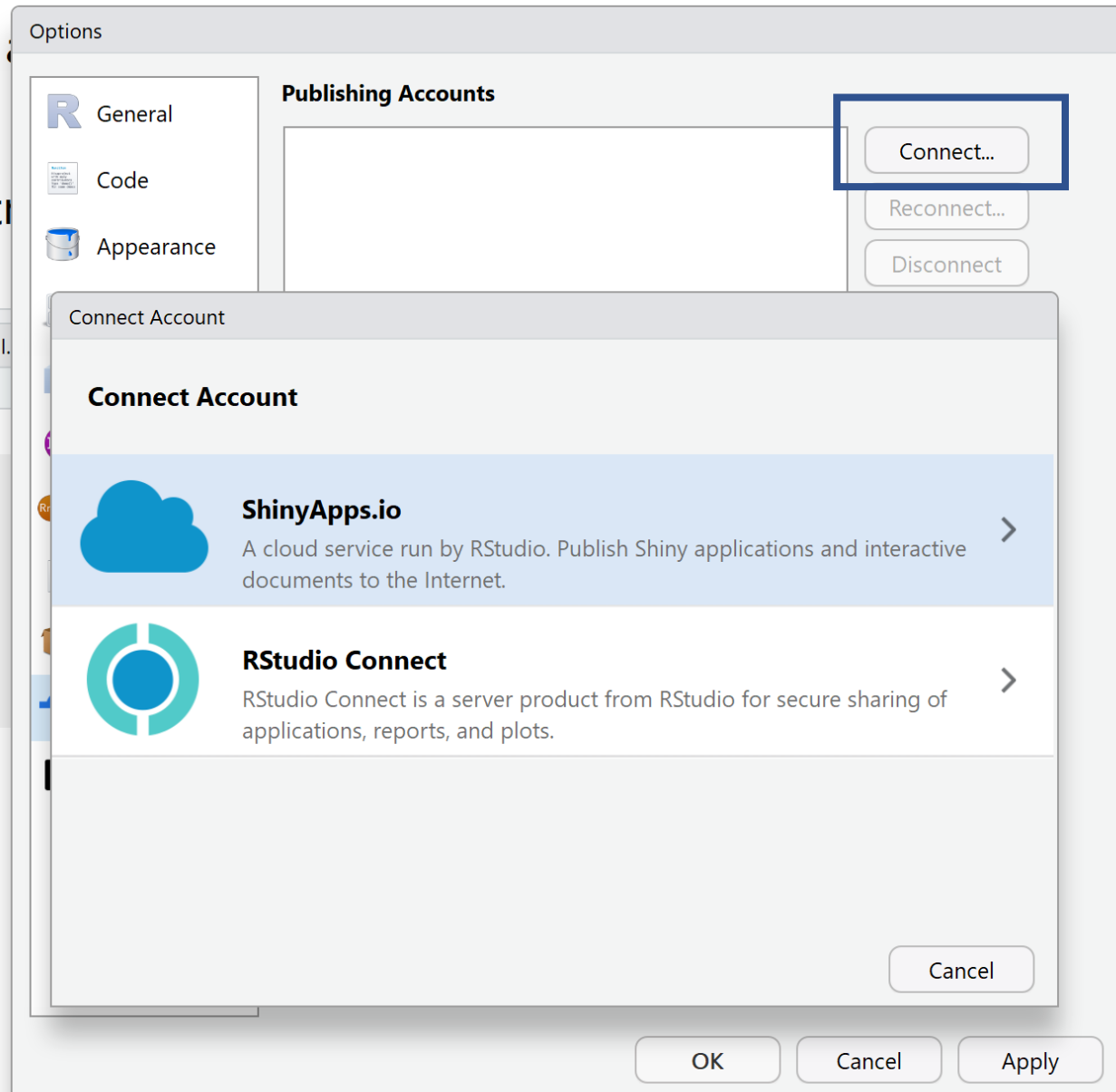
Login into your page on shinyapps.io

Copy token and secret

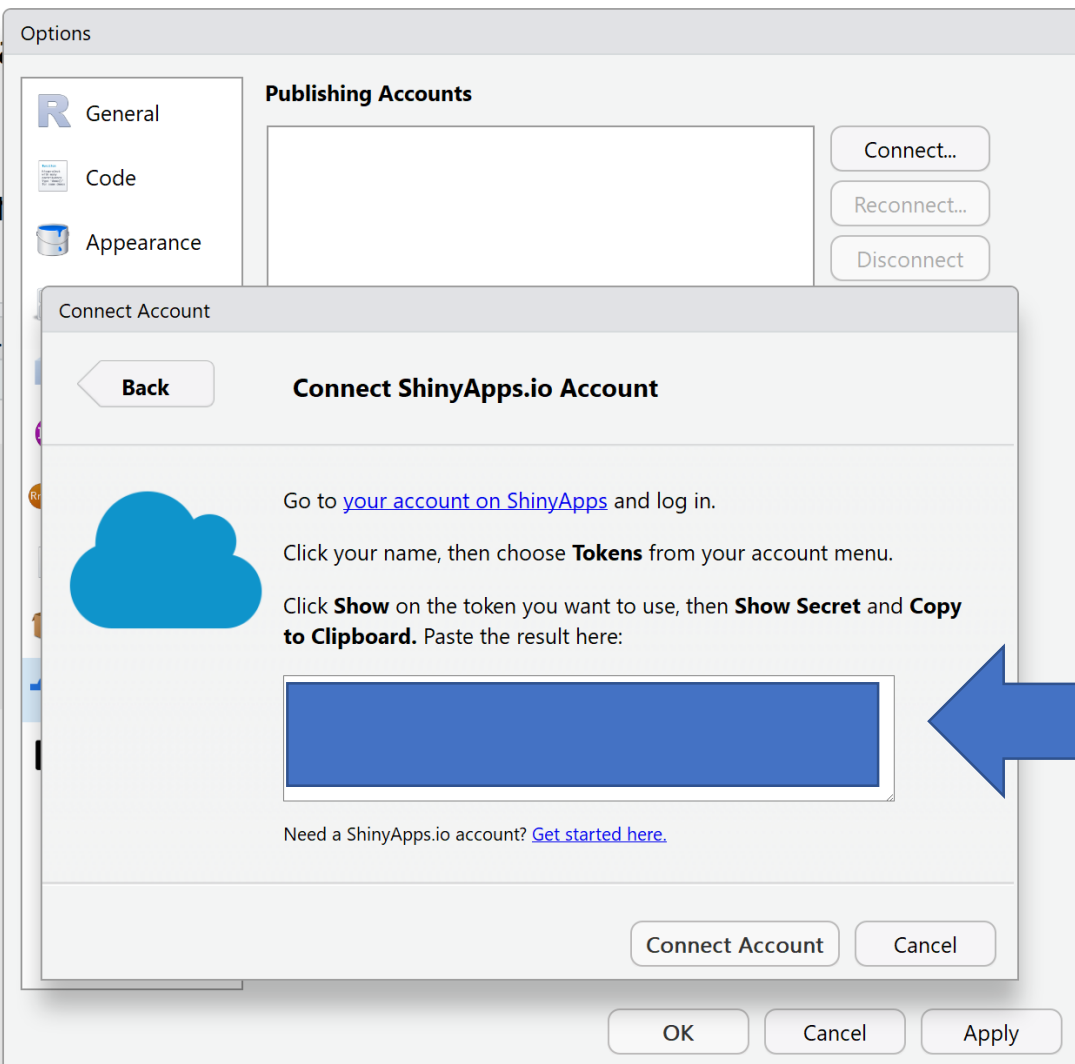
## Set up your account



# Building web applications with shiny



# Building web applications with shiny



In your shinyapps.io account dashboard



Show secret

 Copy to clipboard



# Building web applications with shiny


## Ready to publish


chose the files to upload


- can be a single file with ui and server
- separate files named ui and server


Publish to Server


Publish Files From: **.../Week 5 - Building Data Products/example 1**


☒  **ex 4.R**


☐  ex 1.R


☐  ex 2.R


☐  ex 3.R


☐  ex 5.R


☐  ex 6.R

☐  movies3.csv

☐  server.R


☐  shiny.pdf

☐  shiny.Rmd

☐  ui.R

☒ Launch browser

Publish To Account:

 **habet:** shinyapps.io

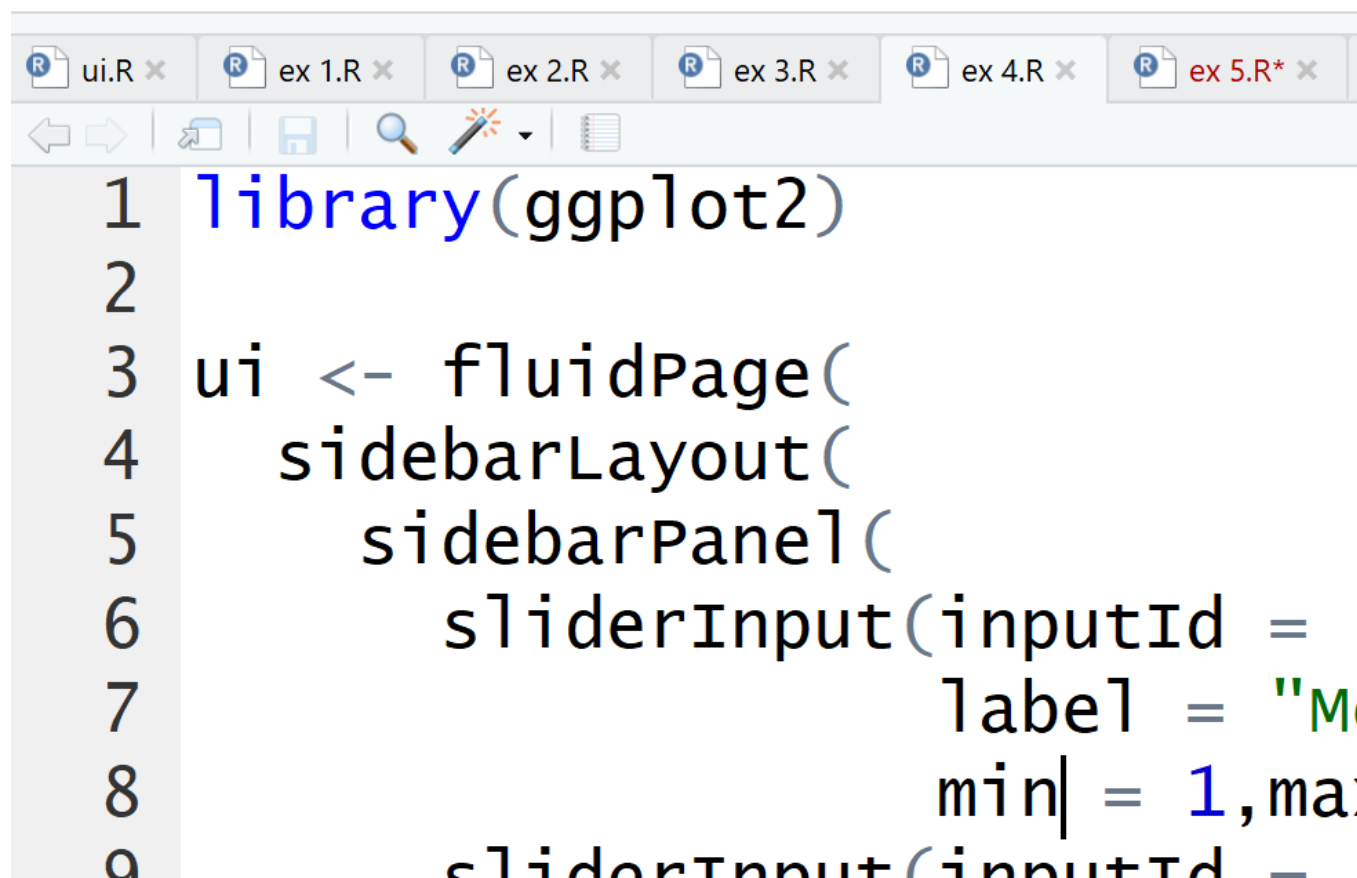
Update: [Create New](#)

**example\_1**

[https://habet.shinyapps.io/example\\_1/](https://habet.shinyapps.io/example_1/)

If planning to use a library include it in the R script

- no need to install, just call it



The screenshot shows an RStudio editor window with several open files: ui.R, ex 1.R, ex 2.R, ex 3.R, ex 4.R, and ex 5.R\*. The active file is ex 5.R\*. The code in the editor is as follows:

```
1 library(ggplot2)
2
3 ui <- fluidPage(
4   sidebarLayout(
5     sidebarPanel(
6       sliderInput(inputId = "min",
7                   label = "Minimum",
8                   min = 1, max = 100,
9                   sliderTpnput(inputId = "max",
```

- if planning to use an external file, read it
- Don't forget to upload the data file into server too

```
movies <- read.csv("movies3.csv", stringsAsFactors = F)
movies_num <- movies[,sapply(movies, is.numeric)]
library(ggplot2)

ui <- fluidPage(
  sidebarLayout(
    sidebarPanel(
      selectInput(inputId = "first", label="x axis",
                  choices = colnames(movies_num),
```



## Other important/fun stuff

- [plotly](#) allows to make interactive graphs
- [ggViz](#) – interactive graphs with similar logic as ggplot
- shiny apps [gallery](#)