

Reports, Slides and Dashboards with R

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We will learn how to create

- Scientific reproducible reports, books, papers...
- Slides
- Statistical Dashboards

With only FREE tools

LaTeX

- Download [Miktex](#) (for Windows users) and [Mactex](#) (for Mac users)
- Online and collaborative tools : [Overleaf](#) and [Sharelatex](#)

Overleaf

- Create your own account
- For your first document choose one template and change it! (Here's a demo)
- We will show:
 - *How to add a figure and a table: Caption, position in the text, reference and labels?*
 - *How to add Bibliography: .bib file, several options: bibtex code: [Jabref](#) (for windows users) and [Bibdeck](#) (for Mac users) Or Google scholar*

rmarkdown: Examples:

- Document
 - *HTML (for websites)*
 - *PDF (in Latex)*
 - *Word document*

rmarkdown: Examples:

- Presentation
 - *HTML: 2 types isoslides and slidy*
 - *PDF: beamer presentations*
 - *PowerPoint (see Example below)*

rmarkdown: Examples:

- From template
 - *Revealjs (Presentation)*
 - *Tufte (HTML and PDF)*
 - *Bioconductor (PDF)*
 - *Flexdashboard*

Flexdashboard (from Template)

- YAML

```
---  
title: "rbokeh iris dataset"  
author: "Ryan Hafen"  
output:  
  flexdashboard::flex_dashboard:  
    orientation: columns  
    social: menu  
    source_code: embed  
---
```

- Loading packages that will be used

```
library(rbokeh)  
library(flexdashboard)
```


Flexdashboard (from Template)

- Part I
 - *Declare the column*

```
Column {data-width=600}
```

```
+ Make your plot
```

```
figure(width = NULL, height = NULL) %>%  
  ly_points(Sepal.Length, Sepal.Width, data = iris, color = Species)  
# figure() %>%  
#   ly_points(Sepal.Length, Sepal.Width, data = iris,  
#             color = Species, glyph = Species)
```

Flexdashboard

Species

Species (Quantile)
Petal Width

Flexdashboard (from Template)

- Part 2
 - *Declare 2nd column*

```
Column {data-width=400}
```

- Figure 2

```
figure(width = NULL, height = NULL, legend_location = "top_left") %>%  
  ly_quantile(Sepal.Length, group = Species, data = iris)
```

and

```
figure(width = NULL, height = NULL) %>%  
  ly_points(Sepal.Length, Sepal.Width, data = iris,  
            color = Petal.Width)
```

Flexdashboard with Shiny app

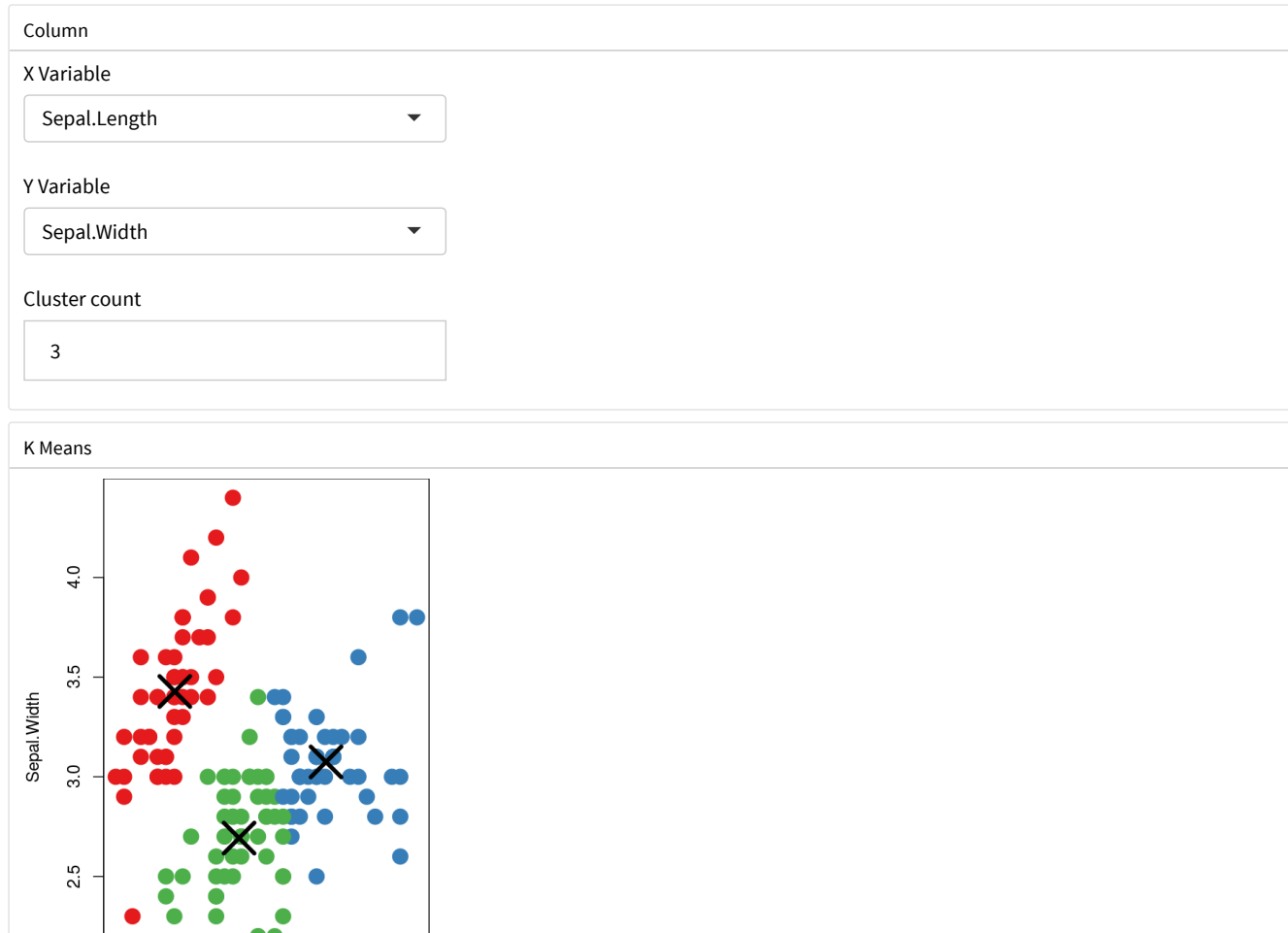
- YAML

```
---  
title: "Iris K-Means Clustering"  
output:  
  flexdashboard::flex_dashboard:  
    orientation: columns  
    social: menu  
    source_code: embed  
runtime: shiny  
---
```

- Loading packages

```
library(datasets)  
data(iris)
```

Flexdashboard with Shiny app



Flexdashboard with Shiny app (sidebar panel)

- Declaring the sidebar

```
Column {.sidebar}
```

- Input part (UI)

```
selectInput('xcol', 'X Variable', names(iris))

selectInput('ycol', 'Y Variable', names(iris),
            selected=names(iris)[[2]])

numericInput('clusters', 'Cluster count', 3,
            min = 1, max = 9)
```

Flexdashboard with Shiny app (Main panel)

- Declaring the Main panel

```
Column
```

- Displaying result

```
palette(c("#E41A1C", "#377EB8", "#4DAF4A", "#984EA3",
          "#FF7F00", "#FFFF33", "#A65628", "#F781BF", "#999999"))

# Combine the selected variables into a new data frame
selectedData <- reactive({
  iris[, c(input$xcol, input$ycol)]
})

clusters <- reactive({
  kmeans(selectedData(), input$clusters)
})

renderPlot({
  par(mar = c(5.1, 4.1, 0, 1))
  plot(selectedData(),
        col = clusters()$cluster,
        pch = 20, cex = 3)
  points(clusters()$centers, pch = 4, cex = 4, lwd = 4)
})
```

Power Point with R (Example)

- Installing packages:

```
> library(devtools)
> devtools::install_github('davidgohe1/ReporteRsjars')
> devtools::install_github('davidgohe1/ReporteRs')
```

- Loading the packages

```
> library(ReporteRs)
> library(haven)
> library(vcd)
> library(ggplot2)
> library(reshape2)
```


Power Point with R (Example)

- Importing data (It can be downloaded in this [link])(<http://wiki.q-researchsoftware.com/images/9/94/GSSforDIYsegmentation.sav>)

```
> dat<-read_sav("GSSforDIYsegmentation.sav")
```

- Now we give a name to the PPTX file and a Title to the presentation

```
> filename = "mypresentation.pptx"  
> mypresentation= pptx(title = "Significant crosstabs")
```

Power Point with R (Example)

- Creating first slides : They contain mosaic-plots with the variable `privbiz` on the dependent variables:

```
dependent.variable.names = c("wrkstat", "marital", "sibs", "age", "educ")
```

- Write a function for the mosaic-plot.

```
DrawMP<-function(v1,v2){
  l1 = attr(v1, "label")
  l2 = attr(v2, "label")
  l1a = attr(v1, "labels")
  l2a = attr(v2, "labels")

  l1a=l1a[l1a%in%na.omit(unique(v1))]
  v1a=mapvalues(as.factor(v1),from=na.
               omit(unique(v1)),to=names(l1a))

  l2a=l2a[l2a%in%na.omit(unique(v2))]
  v2a=mapvalues(as.factor(v2),
               from=na.omit(unique(v2)),to=names(l2a))

  x = xtabs(~v1a + v2a)
  x = x[rowSums(x) > 0, colSums(x) > 0]
  ch = chisq.test(x)
  crosstab = prop.table(x, 2) * 100
  melted = melt(crosstab)
  melted$position = 100 - as.numeric(apply(crosstab, 2, cumsum) - 0.5 * crosstab)
  p = ggplot(melted, aes(x = v2a, y = value, fill = as.factor(v1a))) + geom_bar(stat='identity')
  p = p + geom_text(data = melted, aes(x = v2a, y = position, label = paste0(round(value, 0), "%")), size=4)
  p = p + scale_fill_manual(l1, values = rainbow(length(l1a)))
  p = p + labs(x = l2, y = l1)+theme_bw()
  colnames(crosstab) = paste0(colnames(crosstab), "%")
  list(graph=p, crosstab=crosstab, chisqtest=ch)
}
```

Power Point with R (Example)

- Computing the first mosaic-plot

```
> v1=dat$privbiz  
> v2=dat$marital  
> X=DrawMP(v1,v2)  
> l1 = attr(v1, "label")  
> l2 = attr(v2, "label")
```

Power Point with R (Example)

- Adding first graph and table to the Slide I

```
> filename = "mypresentation.pptx" # the mypresentation to produce
> mypresentation = pptx(title = "Significant crosstabs")
> mypresentation = addSlide(mypresentation,
+                           slide.layout = "Title and Content" )
> mypresentation = addTitle(mypresentation,
+                           paste0("Standardized residuals and chart: ",
+                                 11, " by ", 12))
> mypresentation = addPlot(doc = mypresentation,
+                          fun = print, x = X$graph,
+                          offx = 3, offy = 1, width = 6,
+                          height = 5 )
> mypresentation = addFlexTable(doc = mypresentation,
+                               FlexTable(round(X$chisqtest$stdres, 1),
+                                         add.rownames = TRUE),
+                               offx = 8, offy = 2,
+                               width = 4.5, height = 3 )
```

Power Point with R (Example)

- Saving the PPTX document

```
> writeDoc(mypresentation, file = filename )  
> file.exists(filename)  
[1] TRUE
```

- Go to the work directory and you will the file `mypresentation.pptx`.

Plots in LaTeX format: tikzDevice

We want to change this figure into LaTeX code

```
> library(ggpubr)
> data("ToothGrowth")
> df <- ToothGrowth
> ggboxplot(df, x = "dose", y = "len", width = 0.8)
```

```
> library(tikzDevice)
> tikz("fig.tex",standAlone=TRUE)
> ggboxplot(df, x = "dose", y = "len", width = 0.8)
Measuring dimensions of: \char77
Measuring dimensions of: \char100
Measuring dimensions of: \char111
....
> dev.off()
null device
1
```

Plots in LaTeX format: tikzDevice

Latex file is created in your work directory

```
% Created by tikzDevice version 0.10.1 on 2017-11-21 18:43:00
% !TEX encoding = UTF-8 Unicode
\documentclass[10pt]{article}
\usepackage{tikz}

\usepackage[active,tightpage,psfixbb]{preview}

\PreviewEnvironment{pgfpicture}

\setlength\PreviewBorder{0pt}
\begin{document}

\begin{tikzpicture}[x=1pt,y=1pt]
\definecolor{fillColor}{RGB}{255,255,255}
.... # truncated output.
```

HTML tables: DT package

```
> install.packages('DT')
> library(DT)
> datatable(iris, options = list(
+   searching = FALSE,
+   pageLength = 5,
+   lengthMenu = c(5, 15, 35, 50)
+ ))
```


HTML tables: DT package

Show entries

| | 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 |

Showing 1 to 5 of 150 entries

Previous 2 3 4 5 ... 30 Next

DT tables with options: color in one column

```
> datatable(iris, options = list(pageLength = 5)) %>%  
+   formatStyle('Sepal.Length', color = 'red', backgroundColor = 'orange', fontWeight = 'bold')
```

DT tables with options: color in one column

Show entriesSearch:

| | 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 |

Showing 1 to 5 of 150 entries

Previous 2 3 4 5 ... 30 Next

Adding buttons to download the table

```
> datatable(  
+   iris, extensions = 'Buttons', options = list(  
+     dom = 'Bfirtip',  
+     buttons = c('copy', 'csv', 'excel', 'pdf', 'print')  
+   )  
+ )
```

Adding buttons to download the table

[Copy](#) [CSV](#) [Excel](#) [PDF](#) [Print](#)

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

Reordering columns

You can click and drag the table header to move a certain column to a different place

```
> datatable(iris2, extensions = 'ColReorder', options = list(colReorder = TRUE))
```

Reordering columns

Show entriesSearch:

| | 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 2 3 4 5 ... 15 Next

More resources on DT package

- <http://rstudio.github.io/DT/extensions.html>
- <https://blog.rstudio.com/2015/06/24/dt-an-r-interface-to-the-datatables-library/>
- `googleVis`

HTML table with sjPlot package

```
> library(sjmisc)
> library(sjPlot)
> xCSS = list(css.table = "border: 2px solid;",
+             css.tdata = "border: 1px solid;",
+             css.firsttablecol = "color:#003399;
+             font-weight:bold;")
> data(efc)
> sjt.df(efc, altr.row.col = TRUE, CSS=xCSS)
```

HTML table with sjPlot package

| Variable | <i>vars</i> | <i>n</i> | <i>missings</i> | <i>missings</i> (percentage) | <i>mean</i> | <i>sd</i> | <i>median</i> | <i>trimmed</i> | <i>mad</i> | <i>min</i> | <i>max</i> | <i>range</i> | <i>skew</i> | <i>kurtosis</i> | <i>se</i> |
|-----------------|-------------|----------|-----------------|---------------------------------|-------------|-----------|---------------|----------------|------------|------------|------------|--------------|-------------|-----------------|-----------|
| cl2hour | 1 | 902 | 6 | 0.66 | 42.4 | 50.81 | 20 | 31.43 | 17.79 | 4 | 168 | 164 | 1.65 | 1.31 | 1.69 |
| e15relat | 2 | 901 | 7 | 0.77 | 2.85 | 2.08 | 2 | 2.44 | 0 | 1 | 8 | 7 | 1.55 | 1.21 | 0.07 |
| e16sex | 3 | 901 | 7 | 0.77 | 1.67 | 0.47 | 2 | 1.71 | 0 | 1 | 2 | 1 | -0.73 | -1.47 | 0.02 |
| e17age | 4 | 891 | 17 | 1.87 | 79.12 | 8.09 | 79 | 79.05 | 8.9 | 65 | 103 | 38 | 0.06 | -0.83 | 0.27 |
| e42dep | 5 | 901 | 7 | 0.77 | 2.94 | 0.94 | 3 | 3.02 | 1.48 | 1 | 4 | 3 | -0.42 | -0.84 | 0.03 |

Online LaTeX and HTML tables

<https://www.tablesgenerator.com>

Tables Generator (/)

| | | | | | |
|--|--------------------------------------|--------------------------------------|--|--|------------------------------|
| LaTeX Tables (/latex_tables) | HTML Tables (/html_tables) | Text Tables (/text_tables) | Markdown Tables (/markdown_tables) | MediaWiki Tables (/mediawiki_tables) | Contact (/contact) |
|--|--------------------------------------|--------------------------------------|--|--|------------------------------|

LaTeX Table Generator

Facebook 4487 Twitter

File ▾ Edit ▾ Table ▾ Column ▾ Row ▾ Cell ▾ Help ▾

Show Example





 A 🔥 
 ▾

| | A | B | C | D | E |
|---|---|---|---|---|---|
| 1 | | | | | |
| 2 | | | | | |
| 3 | | | | | |
| 4 | | | | | |

 Generate

Result (click "Generate" to refresh)

 Copy to clipboard

```

1 \begin{table}[]
2 \centering
3 \caption{My caption}
4 \label{my-label}
5 \begin{tabular}{lllll}

```

LaTeX tables with xtable package

```
> library(xtable)
> tli$grade<-tli$grade+rnorm(nrow(tli))
> tli.table <- xtable(tli[1:3,],align=c("l","c","l","l","c","c"),
+                    digits=c(0,2,0,0,0,0),
+                    caption="My table",label="tbl1")
> tli.table
% latex table generated in R 3.4.2 by xtable 1.8-2 package
% Wed Nov 22 15:16:29 2017
\begin{table}[ht]
\centering
\begin{tabular}{lcllcc}
\hline
& grade & sex & disadv & ethnicity & tlimth \\
\hline
1 & 5.95 & M & YES & HISPANIC & 43 \\
2 & 6.22 & M & NO & BLACK & 88 \\
3 & 3.33 & F & YES & HISPANIC & 34 \\
\hline
\end{tabular}
\caption{My table}
\label{tbl1}
\end{table}
```

HTML tables with xtable package

```
> library(xtable)
> data(tli)
> tli$grade<-tli$grade+rnorm(nrow(tli))
> tli.table <- xtable(tli[1:3,],align=c("l","c","l","l","c","c"),
+                    digits=c(0,2,0,0,0,0),
+                    caption="My table",label="tbl1")
> print(tli.table,type="html")
```

HTML tables with xtable package

| | grade | sex | disadv | ethnicity | timth |
|---|--------------|------------|---------------|------------------|--------------|
| 1 | 6.60 | M | YES | HISPANIC | 43 |
| 2 | 3.65 | M | NO | BLACK | 88 |
| 3 | 5.14 | F | YES | HISPANIC | 34 |

My table

Model LaTeX and HTML tables with stargazer package

I. Data Summary

```

> library(stargazer)
> data("attitude")
> head(attitude,3)
> stargazer(attitude, flip=T)

% Table created by stargazer v.5.2 by Marek Hlavac, Harvard University. E-mail: hlavac at fas.harvard.edu
% Date and time: Wed, Nov 22, 2017 - 14:33:03
\begin{table}[!htbp] \centering
  \caption{}
  \label{}
\begin{tabular}{@{\extracolsep{5pt}}lcccccc}
\[-1.8ex]\hline
\hline \[-1.8ex]
Statistic & rating & complaints & privileges & learning & raises & critical & advance \\\
\hline \[-1.8ex]
N & 30 & 30 & 30 & 30 & 30 & 30 & 30 \\\
Mean & 64.633 & 66.600 & 53.133 & 56.367 & 64.633 & 74.767 & 42.933 \\\
St. Dev. & 12.173 & 13.315 & 12.235 & 11.737 & 10.397 & 9.895 & 10.289 \\\
Min & 40 & 37 & 30 & 34 & 43 & 49 & 25 \\\
Max & 85 & 90 & 83 & 75 & 88 & 92 & 72 \\\
\hline \[-1.8ex]
\end{tabular}
\end{table}
>

```

Model LaTeX and HTML tables with stargazer package

2. Display a whole table

```
> stargazer(attitude, summary=FALSE)

% Table created by stargazer v.5.2 by Marek Hlavac, Harvard University. E-mail: hlavac at fas.harvard.edu
% Date and time: Wed, Nov 22, 2017 - 14:35:15
\begin{table}[!htbp] \centering
  \caption{}
  \label{}
  \begin{tabular}{@{\extracolsep{5pt}} ccccccc}
  \hline
  \hline \hline
  & rating & complaints & privileges & learning & raises & critical & advance & \hline
  \hline \hline
  1 & $43$ & $51$ & $30$ & $39$ & $61$ & $92$ & $45$ & \hline
  2 & $63$ & $64$ & $51$ & $54$ & $63$ & $73$ & $47$ & \hline
  3 & $71$ & $70$ & $68$ & $69$ & $76$ & $86$ & $48$ & \hline
  4 & $61$ & $63$ & $45$ & $47$ & $54$ & $84$ & $35$ & \hline
  5 & $81$ & $78$ & $56$ & $66$ & $71$ & $83$ & $47$ & \hline
  6 & $43$ & $55$ & $49$ & $44$ & $54$ & $49$ & $34$ & \hline
  .... #Truncated output
```


Model LaTeX and HTML tables with stargazer package

3. Comparing models:

```
> library(stargazer)
> attitude$high.rating <- (attitude$rating > 70)
> linear.1 <- lm(rating ~ complaints + privileges + learning
+               + raises + critical, data=attitude)
>
> linear.2 <- lm(rating ~ complaints + privileges + learning, data=attitude)
> probit.model <- glm(high.rating ~ learning + critical + advance, data=attitude,
+                    family = binomial(link = "probit"))
>
> stargazer(linear.1, linear.2, probit.model, title="Regression Results")
```

Model LaTeX and HTML tables with stargazer package

3. Comparing models:

LaTeX file

```
% Table created by stargazer v.5.2 by Marek Hlavac, Harvard University. E-mail: hlavac at fas.harvard.edu
% Date and time: Wed, Nov 22, 2017 - 14:46:00
\begin{table}[!htbp] \centering
  \caption{Regression Results}
  \label{}
  \begin{tabular}{@{\extracolsep{5pt}}lccc}
    \hline
    \hline \hline
    & \multicolumn{3}{c}{\textit{Dependent variable:}} & \\
    \cline{2-4}
    \hline & \multicolumn{2}{c}{rating} & high.rating & \\
    \hline & \multicolumn{2}{c}{\textit{OLS}} & \textit{probit} & \\
    \hline & (1) & (2) & (3) & \\
    \hline \hline
    complaints & 0.692$^{***}$ & 0.682$^{***}$ & & \\
    & (0.149) & (0.129) & & \\
    & & & & \\
    privileges & $-0.104 & $-0.103 & & \\
    & (0.135) & (0.129) & & \\
    & & & & \\
    learning & 0.249 & 0.238$^{*}$ & 0.164$^{***}$ & \\
    & (0.160) & (0.139) & (0.053) & \\
    & & & & \\
    raises & $-0.033 & & & \\
    & (0.202) & & & \\
    & & & & \\
    critical & 0.015 & & $-0.001 & \\
    & (0.147) & & (0.044) & \\
    & & & & \\
    advance & & & $-0.062 & \\
    & & & (0.042) & \\
    & & & & \\
    Constant & 11.011 & 11.258 & $-7.476$^{**}$ & \\
    & (11.704) & (7.318) & (3.570) & \\
    & & & & \\
    \hline \hline
    Observations & 30 & 30 & 30 & \\
    R$^2$ & 0.715 & 0.715 & & \\
    Adjusted R$^2$ & 0.656 & 0.682 & & \end{tabular}
  \end{table}
```

```
Log Likelihood & & &  $-\$9.087$  \\
Akaike Inf. Crit. & & & 26.175 \\
Residual Std. Error & 7.139 (df = 24) & 6.863 (df = 26) & \\
F Statistic & 12.063 $^{***}$  (df = 5; 24) & 21.743 $^{***}$  (df = 3; 26) & \\
\hline
\hline \\[-1.8ex]
\textit{Note:} & \multicolumn{3}{r}{ $^*$   $p < 0.1$ ;  $^{**}$   $p < 0.05$ ;  $^{***}$   $p < 0.01$ } \\
\end{tabular}
\end{table}
```

Model LaTeX and HTML tables with stargazer package

3. Comparing models (HTML output)

```
> library(stargazer)
> attitude$high.rating <- (attitude$rating > 70)
> linear.1 <- lm(rating ~ complaints + privileges + learning
+               + raises + critical, data=attitude)
>
> linear.2 <- lm(rating ~ complaints + privileges + learning, data=attitude)
> probit.model <- glm(high.rating ~ learning + critical + advance, data=attitude,
+                    family = binomial(link = "probit"))
>
> stargazer(linear.1, linear.2, probit.model,
+           type="html",
+           title="Regression Results",
+           single.row=TRUE,
+           ci=TRUE, ci.level=0.9,
+           omit.stat=c("f", "ser"))
```

Model LaTeX and HTML tables with stargazer package

3. Comparing models (HTML output)

Regression Results

| | <i>Dependent variable:</i> | | |
|-------------------------|----------------------------|-------------------------|------------------------------|
| | rating OLS (1) | rating OLS (2) | high.rating probit (3) |
| complaints | 0.692*** (0.447, 0.937) | 0.682*** (0.470, 0.894) | |
| privileges | -0.104 (-0.325, 0.118) | -0.103 (-0.316, 0.109) | |
| learning | 0.249 (-0.013, 0.512) | 0.238* (0.009, 0.467) | 0.164*** (0.077, 0.252) |
| raises | -0.033 (-0.366, 0.299) | | |
| critical | 0.015 (-0.227, 0.258) | | -0.001 (-0.073, 0.072) |
| advance | | | -0.062 (-0.131, 0.007) |
| Constant | 11.011 (-8.240, 30.262) | 11.258 (-0.779, 23.296) | -7.476** (-13.349, -1.604) |
| Observations | 30 | 30 | 30 |
| R ² | 0.715 | 0.715 | |
| Adjusted R ² | 0.656 | 0.682 | |
| Log Likelihood | | | -9.087 |
| Akaike Inf. Crit. | | | 26.175 |

Note:

$p < 0.1$; **$p < 0.05$** ; $p < 0.01$