# Literate Statistical Programming with knitr and R Markdown

Biostatistics 140.776

## What is knitr?

- An R package written by Yihui Xie (while he was a grad student at Iowa State)
- Available on CRAN
- Supports R Markdown, LaTeX, and HTML as documentation languages
- Can export to PDF, HTML, Word
- Built right into RStudio for your convenience

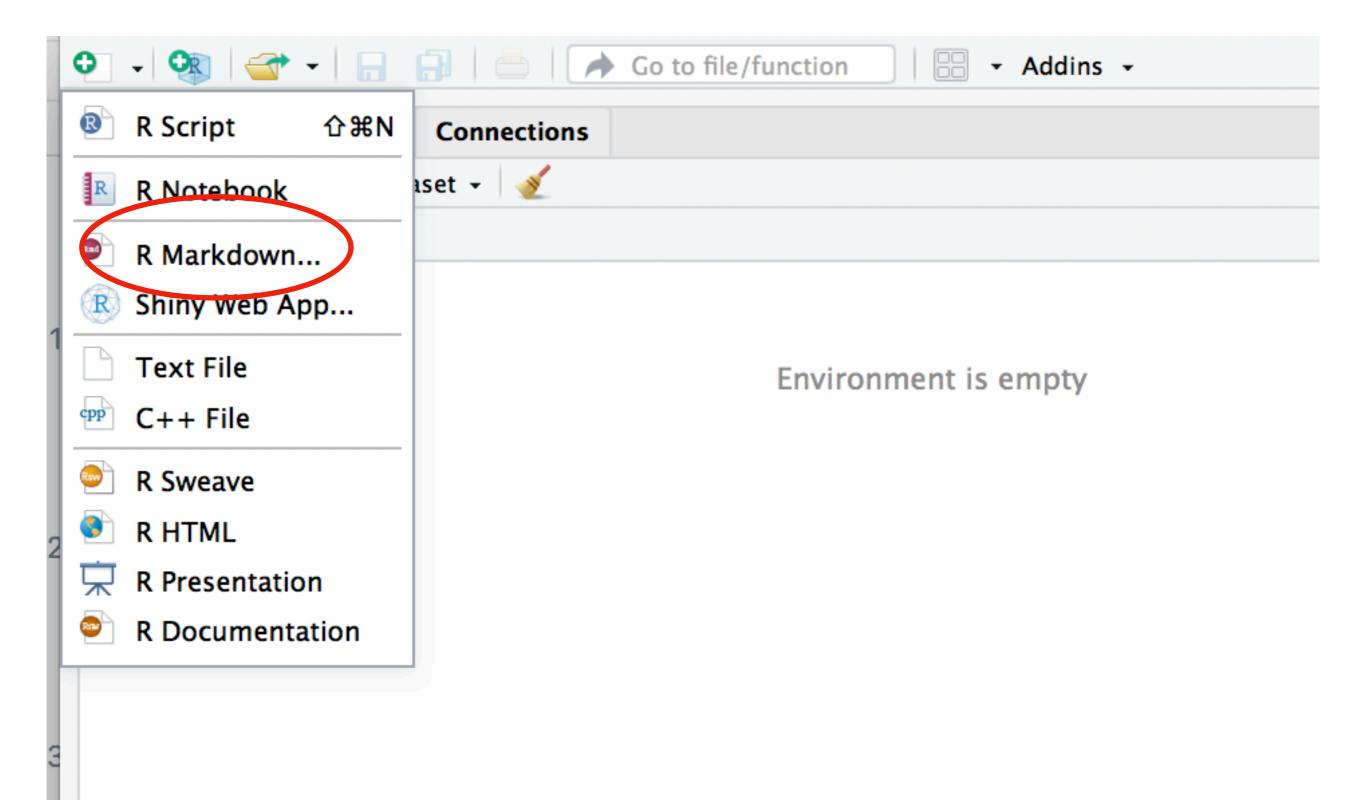
## What is knitr Good For?

- Manuals
- Short/medium-length technical documents
- Tutorials
- Reports (esp. if generated periodically)
- Data preprocessing documents/summaries

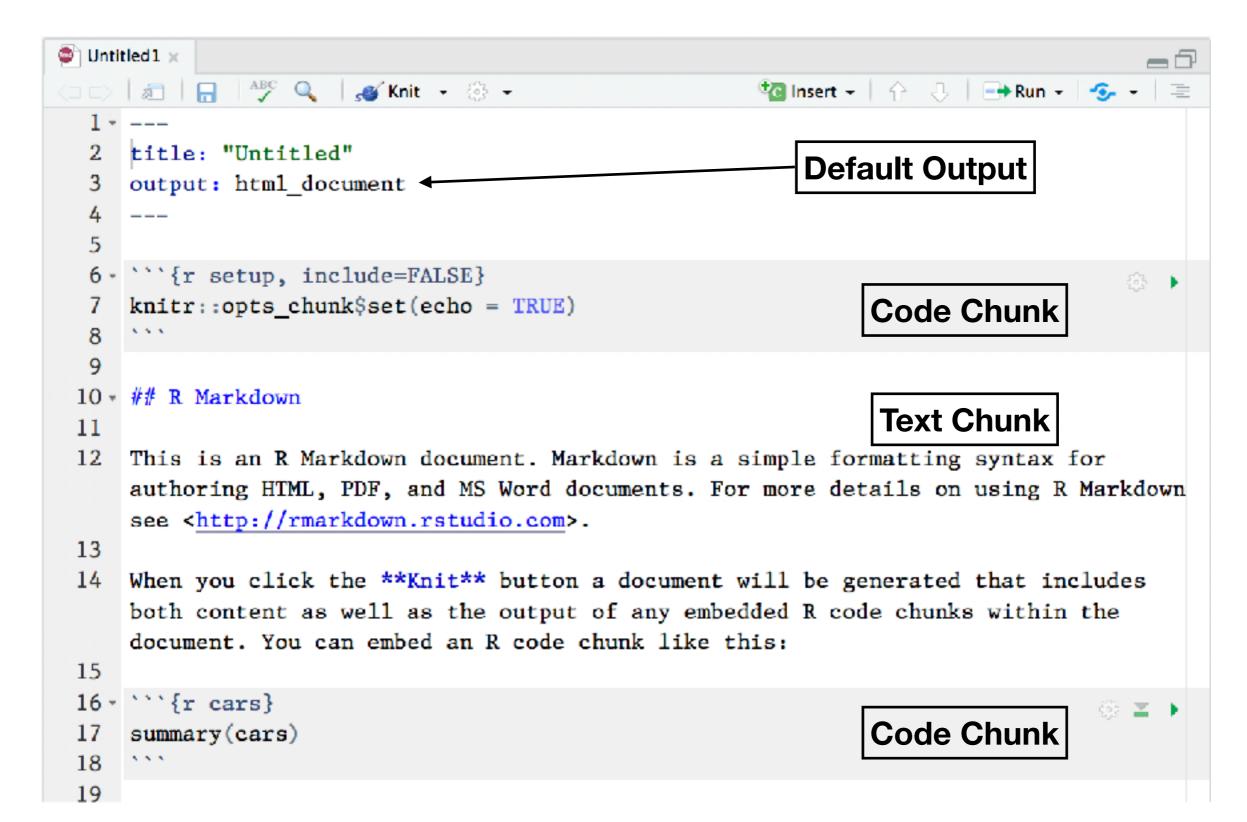
## What is knitr NOT Good For?

- Very long research articles
- Analyses with complex, time-consuming computations
- Documents that require precise formatting
- Documents where formatting needs to be continuously visualized

## My First Document!



## My First Document!



# Knitting a Document

```
Untitled1 x
                                                      1 Insert - | ↑ → Run - - -

≪ Knit →

    title: "Untitled"
    output: html document
  5
  6 * ```{r setup, include=FALSE}
     knitr::opts chunk$set(echo = TRUE)
  8
  9
 10 - ## R Markdown
 11
     This is an R Markdown document. Markdown is a simple formatting syntax for
     authoring HTML, PDF, and MS Word documents. For more details on using R Markdown
     see <http://rmarkdown.rstudio.com>.
 13
 14
     When you click the **Knit** button a document will be generated that includes
     both content as well as the output of any embedded R code chunks within the
     document. You can embed an R code chunk like this:
 15
 16 - ```{r cars}
     summary(cars)
 18
 19
```

# Knitting

<pre>processing file: Untitled.Rmd</pre>	1	14%
	1	29%
ordinary text without R code	1	43%
		57%
ordinary text without R code		71%
label: pressure (with options) List of 1 \$ echo: logi FALSE	1	86%

## HTML Output

#### Untitled

#### R Markdown

This is an R Markdown document. Markdown is a simple formatting syntax for authoring HTML, PDF, and MS Word documents. For more details on using R Markdown see <a href="http://rmarkdown.rstudio.com">http://rmarkdown.rstudio.com</a>.

When you click the **Knit** button a document will be generated that includes both content as well as the output of any embedded R code chunks within the document. You can embed an R code chunk like this:

```
Code Input
summary(cars)
                       dist
##
       speed
   Min.
          : 4.0
                         : 2.00
   1st Qu.:12.0
                  1st Ou.: 26.00
                                                                       Code Output
   Median :15.0
                  Median : 36.00
   Mean
   3rd Ou.:19.0
                  3rd Ou.: 56.00
        :25.0
   Max.
                  Max.
                         :120.00
```

#### **Including Plots**

You can also embed plots, for example:

## A Few Notes

- knitr will fill a new document with boilerplate text; just delete it
- Code chunks begin with ``` {r} and end with ```
- All R code goes in between these markers
- Code chunks can have names, which is useful when we start making graphics

```
```{r firstchunk}
## R code goes here
```
```

 By default, code in a code chunk is echoed, as will the results of the computation (if there are results to print)

## Processing Documents

- You write the RMarkdown document (.Rmd)
- knitr produces a Markdown document (.md)
- knitr converts the Markdown document into HTML (by default)
- .Rmd —> .md —> .html
- You should NOT edit (or save) the .md or .html documents until you are finished
- By default RStudio does not save the .md document

## Another Example

```
# My First knitr Document
Roger D. Peng
## Introduction
This is some text (i.e. a "text chunk").
Here is a code chunk.
```{r, simulation, echo = TRUE}
   ※ 포 >
set.seed(1)
x \leftarrow rnorm(100)
mean(x)
. . .
```

## HTML Output

## My First knitr Document

Roger D. Peng

#### Introduction

This is some text (i.e. a "text chunk").

Here is a code chunk.

```
set.seed(1)
x <- rnorm(100)
mean(x)</pre>
```

```
## [1] 0.1088874
```

## Hiding the Code

```
```{r, simulation, echo = FALSE}
set.seed(1)
x <- rnorm(100)
mean(x)
```</pre>
```

## HTML Output

## My First knitr Document

Roger D. Peng

## Introduction

This is some text (i.e. a "text chunk").

Here is a code chunk.

```
## [1] 0.1088874
```

# Inline Computations

```
# My First knitr Document
Roger D. Peng
                                      Do not show code chunk
## Introduction
```{r, computetime, include = FALSE}
                                                          ∰ ▼
time <- format(Sys.time(), "%a %b %d %X %Y")
rand <- rnorm(1)
The current time is `r time`.
My favorite random number is `r rand`.
```

## Inline Computations

## My First knitr Document

Roger D. Peng

## Introduction

The current time is Thu Sep 06 08:36:10 2018.

My favorite random number is 1.674726.

# Graphics

```
## Introduction
Let's first simulate some data.
```{r, simulatedata, echo = TRUE}
x \leftarrow rnorm(100)
y < -x + rnorm(100, sd = 0.5)
   Adjust figure height
Here is a scatterplot of the data.
```{r, scatterplot, fig.height = 4}*
library(ggplot2)
qplot(x, y, main = "My Simulated Data")
. . .
```

# Graphics

#### Introduction

Let's first simulate some data.

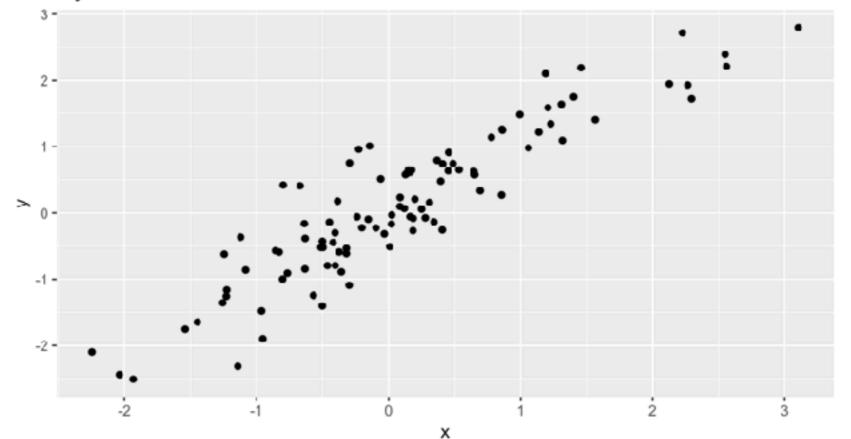
```
x \leftarrow rnorm(100)

y \leftarrow x + rnorm(100, sd = 0.5)
```

Here is a scatterplot of the data.

```
library(ggplot2)
gplot(x, y, main = "My Simulated Data")
```

#### My Simulated Data



Graphic (embedded)

## **Tables**

```
## Data Summary
```{r, loaddata, include = FALSE}
library(datasets)
data(airquality)
```{r,summary}
                                                           # ₹ ▶
library(tableone)
tab <- CreateTableOne(c("Ozone", "Wind", "Temp", "Solar.R"),
                       data = airquality)
summary(tab)
. . .
```

## **Tables**

### Data Summary

```
##
##
      ### Summary of continuous variables ###
##
## strata: Overall
##
  n miss p.miss mean sd median p25 p75 min max skew kurt
                       42 33
## Ozone 153 37
                   24
                               32 18 63 1 168 1.2 1.3
## Wind 153 0
                    0 10 4
                               10 7 12 2 21 0.3 0.1
## Temp 153 0 0 78 9 79 72 85 56 97 -0.4 -0.4
## Solar.R 153
                      186 90 205 116 259 7 334 -0.4 -1.0
```

# Tables (Formatted)

```
## Data Summary
```{r, loaddata, include = FALSE}
  ∰ ¥ ▶
library(datasets)
data(airquality)
```{r,summary,results="asis"}
library(xtable)
print(xtable(airquality), type = "html")
```

# Tables (Formatted)

#### **Data Summary**

```
library(xtable)
print(xtable(airquality), type = "html")
```

	Ozone	Solar.R	Wind	Temp	Month	Day
1	41	190	7.40	67	5	1
2	36	118	8.00	72	5	2
3	12	149	12.60	74	5	3
4	18	313	11.50	62	5	4
5			14.30	56	5	5
6	28		14.90	66	5	6
7	23	299	8.60	65	5	7
8	19	99	13.80	59	5	8
9	8	19	20.10	61	5	9
10		194	8.60	69	5	10
11	7		6.90	74	5	11
12	16	256	9.70	69	5	12

# Setting Global Options

- Sometimes we want to set options for every code chunk that are different from the defaults
- For example, we may want to suppress all code echoing and results output
- We have to write some code to set these global options (usually at the beginning of the document)

## Global Options

```
```{r, include = FALSE}
   # ≥ ▶
knitr::opts_chunk$set(echo = FALSE)
. . .
## Introduction
First simulate some data.
```{r, simulatedata}
                                                             £ ¥ ▶
x \leftarrow rnorm(100)
y < -x + rnorm(100, sd = 0.5)
. . .
Here's a scatterplot.
'``{r, scatterplot}
                                                             ∰ ▼ ▶
library(ggplot2)
qplot(x, y, main = "My Simulated Data")
. . .
```

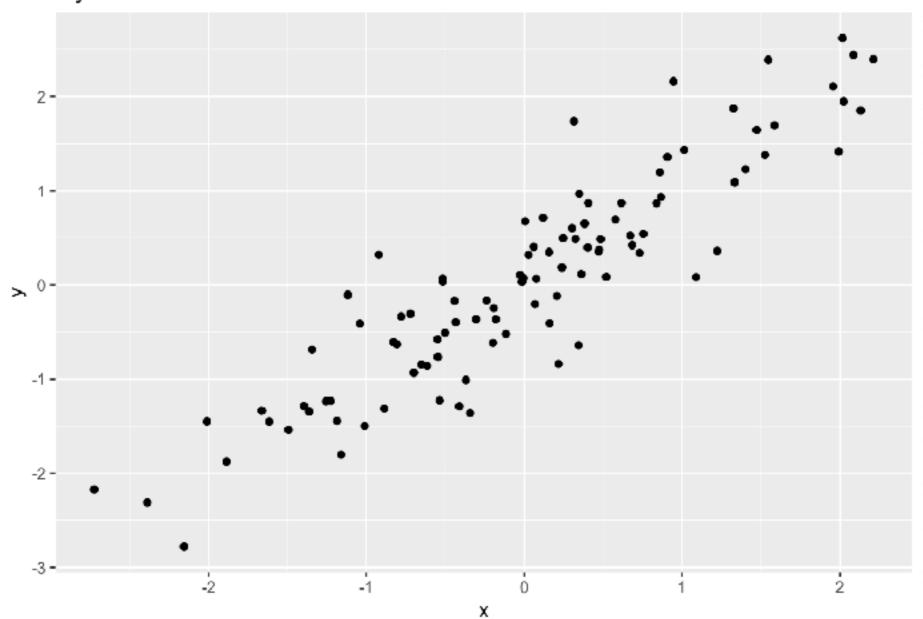
# Global Options

#### Introduction

First simulate some data.

Here's a scatterplot.

My Simulated Data



## Overriding Global Options

```
```{r, include = FALSE}
  ∰ ¥ ▶
knitr::opts_chunk$set(echo = FALSE)
. . .
## Introduction
First simulate some data.
```{r, simulatedata echo = TRUE}
                                                              ## ¥ ▶
x \leftarrow rnorm(100)
y < -x + rnorm(100, sd = 0.5)
N N N
Here's a scatterplot.
'``{r, scatterplot}
                                                              $$} <u>▼</u> ▶
library(ggplot2)
qplot(x, y, main = "My Simulated Data")
. . .
```

## Overriding Global Options

#### Introduction

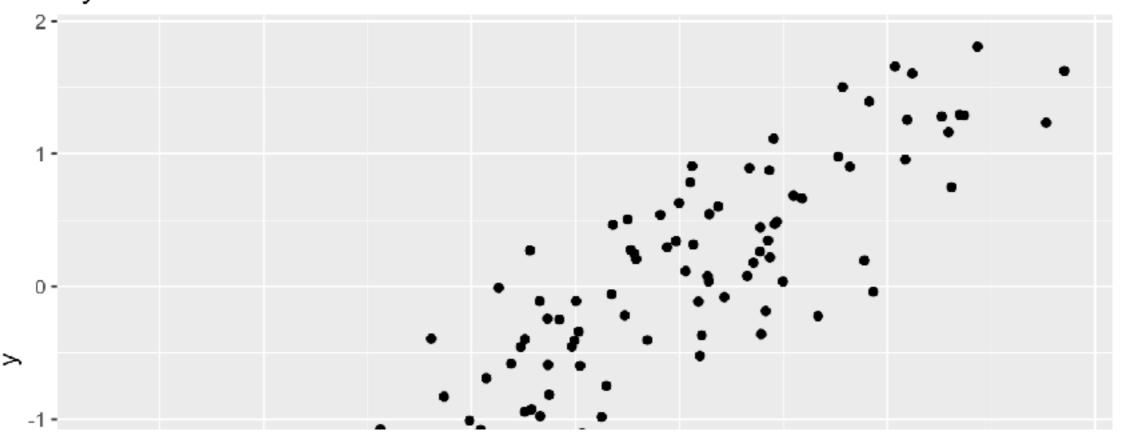
First simulate some data.

```
x <- rnorm(100)

y <- x + rnorm(100, sd = 0.5)
```

Here's a scatterplot.

#### My Simulated Data



## Caching Computations

- What if one chunk takes a long time to run?
- All chunks have to be re-computed every time you re-knit the file
- The cache=TRUE option can be set on a chunk-by-chunk basis to store results of computation
- After the first run, results are loaded from cache

## Caching Computations

- If the data or code (or anything external) changes, you need to re-run the cached code chunks
- Dependencies are not checked explicitly
- Chunks with significant side effects may not be cacheable

## Summary

- Literate statistical programming can be a useful way to put text, code, data, output all in one document
- knitr is a powerful tool for integrating code and text in a simple document format
- Particularly useful for "work-in-progress" reports and for regularly generated monitoring-style output
- Code + output can be overwhelming so be judicious with what you show others!