

# literate programming

prepared by Jenny Bryan for  
Reproducible Science Workshop

how to organize your work?

how to make work more pleasant for you?

how to make it navigable by others?

how to reduce tedium and manual processes?

how to reduce friction for collaboration?

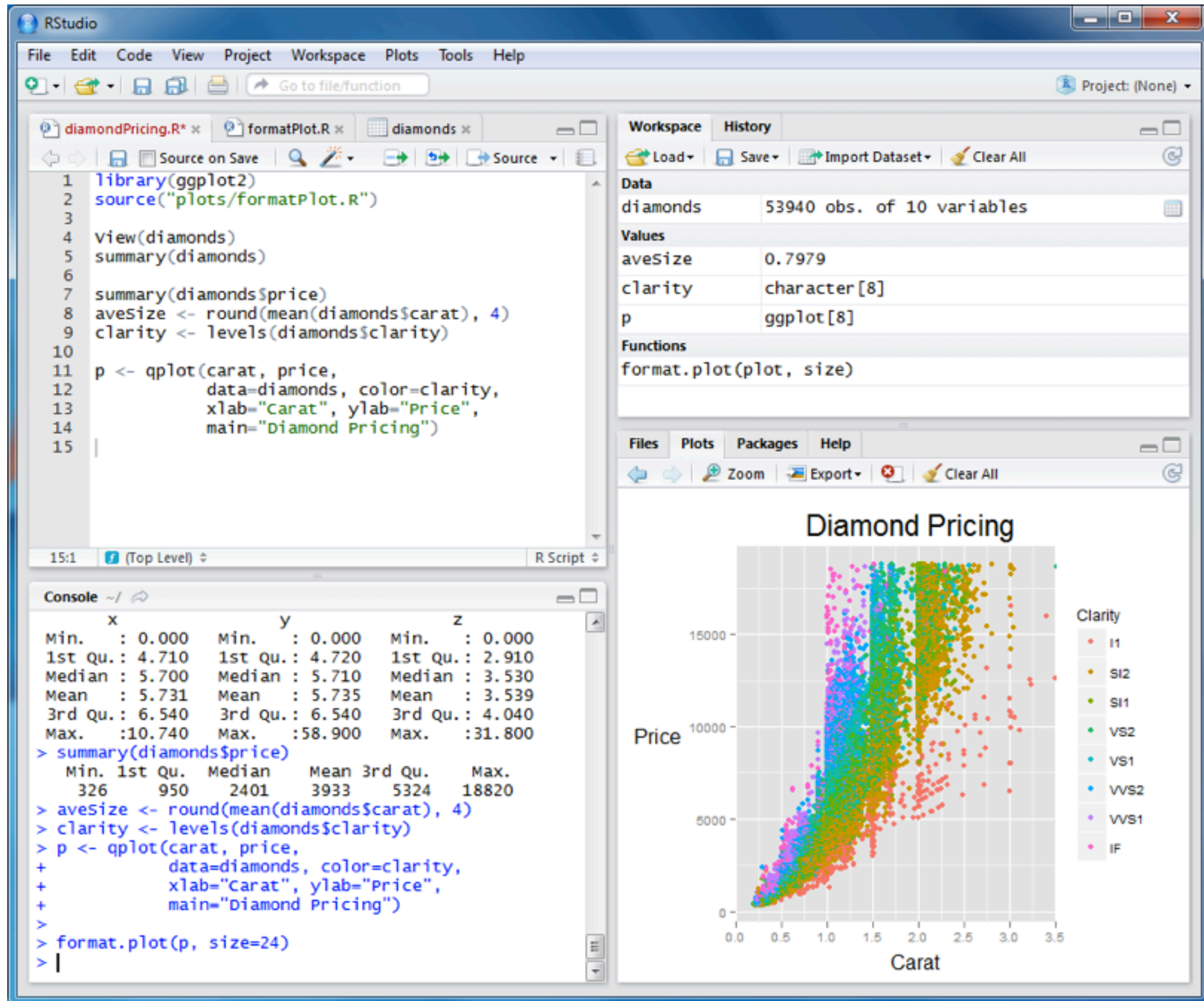
how to reduce friction for communication?

specific tools and habits can build alot of this into  
the normal coding and analysis process

**weak links in the chain:  
process, packaging and  
presentation**



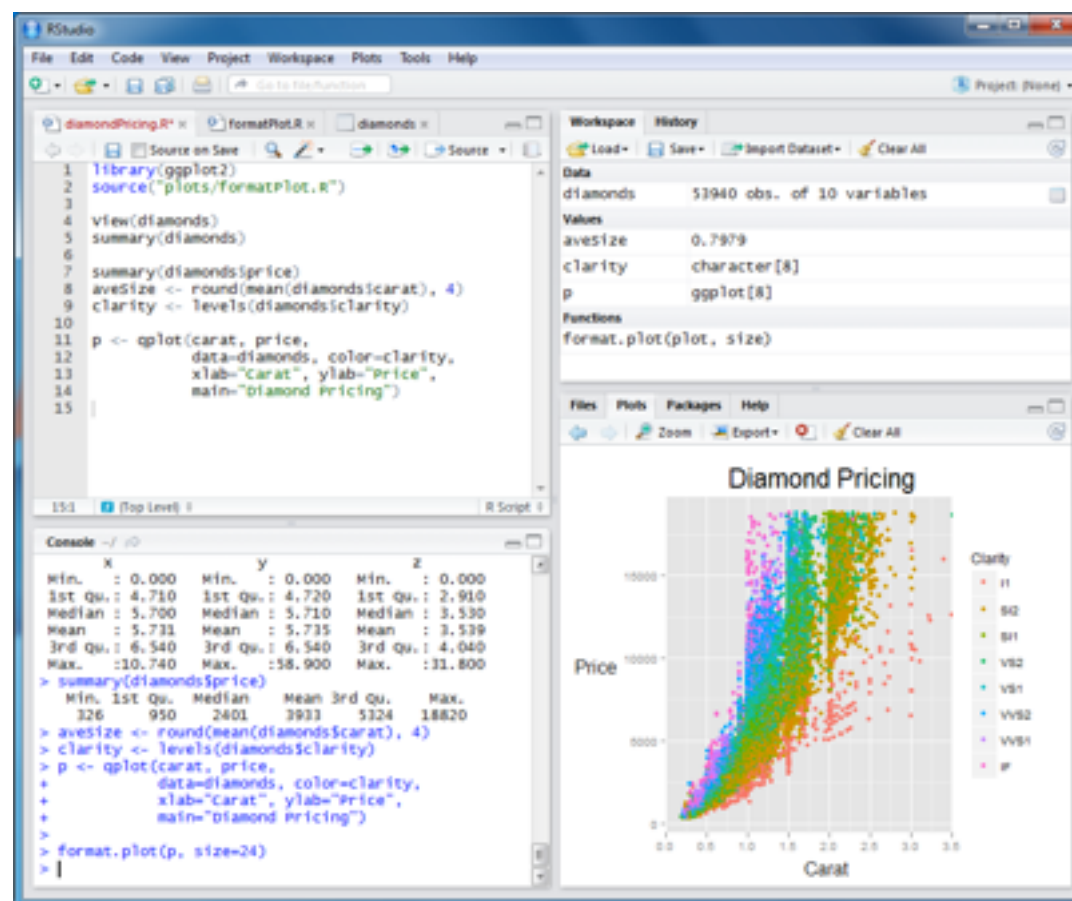
# RStudio is an integrated development environment (IDE) for R



# R $\neq$ RStudio

RStudio mediates your interaction with R; it would replace Emacs + ESS or Tinn-R, but not R itself

Rstudio is a product of -- actually, more a driver of -- the emergence of R Markdown, `knitr`, R + Git(Hub)



**markdown**



# What is Markdown?

- Markdown is a lightweight markup language for creating HTML (or XHTML) documents.
- Markup languages are designed produce documents from human readable text (and annotations).
- Some of you may be familiar with *LaTeX*. This is another (less human friendly) markup language for creating pdf documents.
- Why I love Markdown:
  - Easy to learn and use.
  - Focus on **content**, rather than **coding** and debugging **errors**.
  - Once you have the basics down, you can get fancy and add HTML, JavaScript & CSS.

<http://cpsievert.github.io/slides/markdown/#/5>

Markdown



HTML

foo.md



foo.html

easy to write  
(and read!)

easy to publish  
easy to read in  
browser



# Markdown



# HTML

Title (header 1, actually)

This is a Markdown document.

## Medium header (header 2, actually)

It's easy to do *italics* or **make things bold**.

> All models are wrong, but some are useful. An approximate answer to the right problem is worth a good deal more than an exact answer to an approximate problem. Absolute certainty is a privilege of uneducated minds-and fanatics. It is, for scientific folk, and you do every day matter once in a while. We can do anything we didn't teach. Enthusiasm is a form of

Code block below. Just we'll get to R Markdown

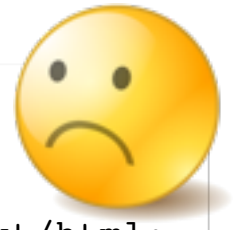
```
```
```

```
x <- 3 * 4
```

```
```
```

I can haz equations. Inline equations, such as ... the average is computed as  $\frac{1}{n} \sum_{i=1}^n x_i$ . Or display equations like this:

```
$$
\begin{equation*}
|x| =
\begin{cases} x & \text{if } x \geq 0, \\
-x & \text{if } x \leq 0. \end{cases}
\end{equation*}
$$
```



```
<!DOCTYPE html>
<html>
<head>
<meta http-equiv="Content-Type" content="text/html;
charset=utf-8"/>
```

```
<title>Title (header 1, actually)</title>
```

```
<!-- MathJax scripts -->
<script type="text/javascript" src="https://
c328740.ssl.cf1.rackcdn.com/mathjax/2.0-latest/
MathJax.js?config=TeX-AMS-MML_HTMLorMML">
</script>
```

You can author in Markdown  
(and not in HTML).

```
rial, sans-serif;
```

```
<p>This is a Markdown document.</p>
```

```
<h2>Medium header (header 2, actually)</h2>
```

```
<p>It's easy to do <em>italics</em> or
<strong>make things bold</strong>.</p>
```

```
<blockquote>
```

```
<p>All models are wrong, but some are...
<p>Code block below. Just affects formatting here
but we'll get to R Markdown for the real fun
soon!</p>
```

```
<pre><code>x <- 3 * 4
</code></pre>
```

# Markdown



# HTML

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=====

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Code block below. Just affects formatting here but we'll get to R Markdown for the real fun soon!

```
```\n x <- 3 * 4\n```
```

I can haz equations. Inline equations, such as ... the average is computed as  $\frac{1}{n} \sum_{i=1}^n x_i$ . Or display equations like this:

```
$$\n\\begin{equation*}\n|x|=\n\\begin{cases} x & \\text{if } x \\geq 0, \\ \\ \\ \n-x & \\text{if } x \\leq 0. \\ \n\\end{cases}\n\\end{equation*}\n$$
```



## Title (header 1, actually)

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$$|x| = \begin{cases} x & \text{if } x \geq 0, \\ -x & \text{if } x \leq 0. \end{cases}$$



# If I use Markdown, am I restricted to HTML output?

No.

pandoc = “swiss-army knife” of document conversion  
(RStudio will gladly install and invoke for you.)

## About pandoc

---

If you need to convert files from one markup format into another, pandoc is your swiss-army knife. Pandoc can convert documents in [markdown](#), [reStructuredText](#), [textile](#), [HTML](#), [DocBook](#), [LaTeX](#), [MediaWiki markup](#), [OPML](#), or [Haddock markup](#) to

- HTML formats: XHTML, HTML5, and HTML slide shows using [Slidy](#), [reveal.js](#), [Slideous](#), [S5](#), or [DZSlides](#).
- Word processor formats: Microsoft Word [docx](#), OpenOffice/LibreOffice [ODT](#), [OpenDocument XML](#)
- Ebooks: [EPUB](#) version 2 or 3, [FictionBook2](#)
- Documentation formats: [DocBook](#), [GNU TexInfo](#), [Groff man](#) pages, [Haddock markup](#)
- Outline formats: [OPML](#)
- TeX formats: [LaTeX](#), [ConTeXt](#), LaTeX Beamer slides
- [PDF](#) via LaTeX
- Lightweight markup formats: [Markdown](#), [reStructuredText](#), [AsciiDoc](#), [MediaWiki markup](#), Emacs [Org-Mode](#), [Textile](#)
- Custom formats: custom writers can be written in [lua](#).

If you have an annoying process for authoring for the web ....

or

If you avoid authoring for the web, because you're not sure how ...

**start writing in Markdown.**

**R** markdown

# R Markdown



# Markdown

R Markdown rocks  
=====

This is an R Markdown document.

```
```{r}
x <- rnorm(1000)
head(x)
```
```

See how the R code gets executed and a representation thereof appears in the document? `knitr` gives you control over how to represent all conceivable types of output. In case you care, then average of the `r length(x)` random normal variates we just generated is `r round(mean(x), 3)`. Those numbers are NOT hard-wired but are computed on-the-fly. As is this figure. No more copy-paste ... copy-paste ... oops forgot to copy-paste.

```
```{r}
plot(density(x))
```
```

Note that all the previously demonstrated math typesetting still works. You don't have to choose between having math cred and being web-friendly!

Inline equations, such as ... the average is computed as  $\frac{1}{n} \sum_{i=1}^n x_i$ . Or display equations like this:

```
$$
\begin{equation*}
|x|=
\begin{cases} x & \text{if } x \geq 0, \\
-x & \text{if } x \leq 0. \end{cases}
\end{equation*}
$$
```

R Markdown rocks  
=====

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```
```r
x <- rnorm(1000)
head(x)
```

## [1] -1.3007  0.7715  0.5585 -1.2854  1.1973
2.4157
```
```

See how the R code gets executed and a representation thereof appears in the document? `knitr` gives you control over how to represent all conceivable types of output. In case you care, then average of the 1000 random normal variates we just generated is -0.081. Those numbers are NOT hard-wired but are computed on-the-fly. As is this figure. No more copy-paste ... copy-paste ... oops forgot to copy-paste.

```
```r
plot(density(x))
```
```

```
![[plot of chunk unnamed-chunk-2](figure/unnamed-
chunk-2.png)]
```

...



# Markdown → HTML

R Markdown rocks

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```
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```
```r
plot(density(x))
```
```

```
![plot of chunk unnamed-chunk-2](figure/unnamed-chunk-2.png)
```

...

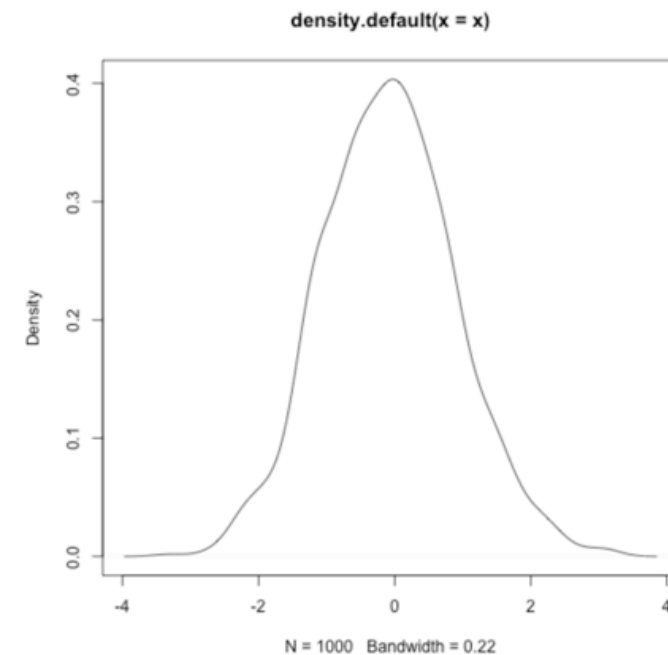
## R Markdown rocks

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$$|x| = \begin{cases} x & \text{if } x \geq 0, \\ -x & \text{if } x \leq 0. \end{cases}$$



R Markdown → Markdown → HTML

foo.rmd → foo.md → foo.html

easy to write  
(and read!)

easy to publish  
easy to read in  
browser

How do to actually convert Markdown to HTML?

`knitr`, `rmarkdown` add-on packages provide user-friendly functions

RStudio makes them available via button

# R Markdown



# HTML

R Markdown rocks

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See how the R code gets executed and a  
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```

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```
$$
\begin
|x|=
\begin
-x &\text{if } x \le 0. \\
\end{cases}
\end{equation*}
$$
```

R Markdown rocks

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```
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```

See how the R code gets executed and a representation thereof appears in the

## How to achieve at the command line:

```
> library("rmarkdown")
> render("foo.Rmd")
```

equations like this:

$$|x| = \begin{cases} x & \text{if } x \geq 0, \\ -x & \text{if } x \leq 0. \end{cases}$$

# R Markdown



# HTML

R Markdown rocks

This is an R Markdown document.

```
```{r}
```

```
x <- rnorm(1000)
```

Go to file/function

foo.Rmd

Knit HTML

```
1 ---
2 title: "Untitled"
3 author: "Jenny Bryan"
4 date: "22 February, 2015"
5 output: html_document
6 ---
7
8 This is an R Markdown document. Markdown is a simple
  formatting syntax for authoring HTML, PDF, and MS
```

1:1 (Top Level)

Console ~/tmp/test/

```
'citation()' on how to cite R or R packages in publications
```

```
Type 'demo()' for some demos, 'help()' for on-line help, or
'help.start()' for an HTML browser interface to help.
Type 'q()' to quit R.
```

```
> library("rmarkdown")
```

```
\begin{cases} x & \text{if } x \geq 0, \\ -x & \text{if } x \leq 0. \end{cases}
```

R Markdown rocks

This is an R Markdown document.

```
x <- rnorm(1000)
```

Environment

History

To Console To Source

```
library("rmarkdown")
render("test.Rmd")
```

Files Plots Help Viewer

New Folder Delete Rename More

Home tmp test

	Name	Size	Modified
	..		
	test.Rproj	257 B	Feb 22, 2015, 9:47 PM
	foo.Rmd	723 B	Feb 22, 2015, 9:47 PM

Click here.

Inline equations, such as ... the average is computed as  $\frac{1}{n} \sum_{i=1}^n x_i$ . Or display equations like this:

$$|x| = \begin{cases} x & \text{if } x \geq 0, \\ -x & \text{if } x \leq 0. \end{cases}$$

Do I have to do everything in R markdown? What about plain R scripts?

Use `rmarkdown::render()` or Rstudio's Compile Notebook button to get a satisfying stand-alone webpage based on an R script.

simple R script:  
toyline.R

→ HTML

toyline.R

jenny — Sep 6, 2013, 3:15 PM

```
1 a <- 2
2 b <- 7
3 sigSq <- 0.5
4 n <- 400
5
6 set.seed(1234)
7 x <- runif(n)
8 y <- a + b * x + rnorm(n, sd = sqrt(sigSq))
9
10 (avgX <- mean(x))
11
12 plot(x, y)
13 abline(a, b, col = "blue", lwd = 2)
```

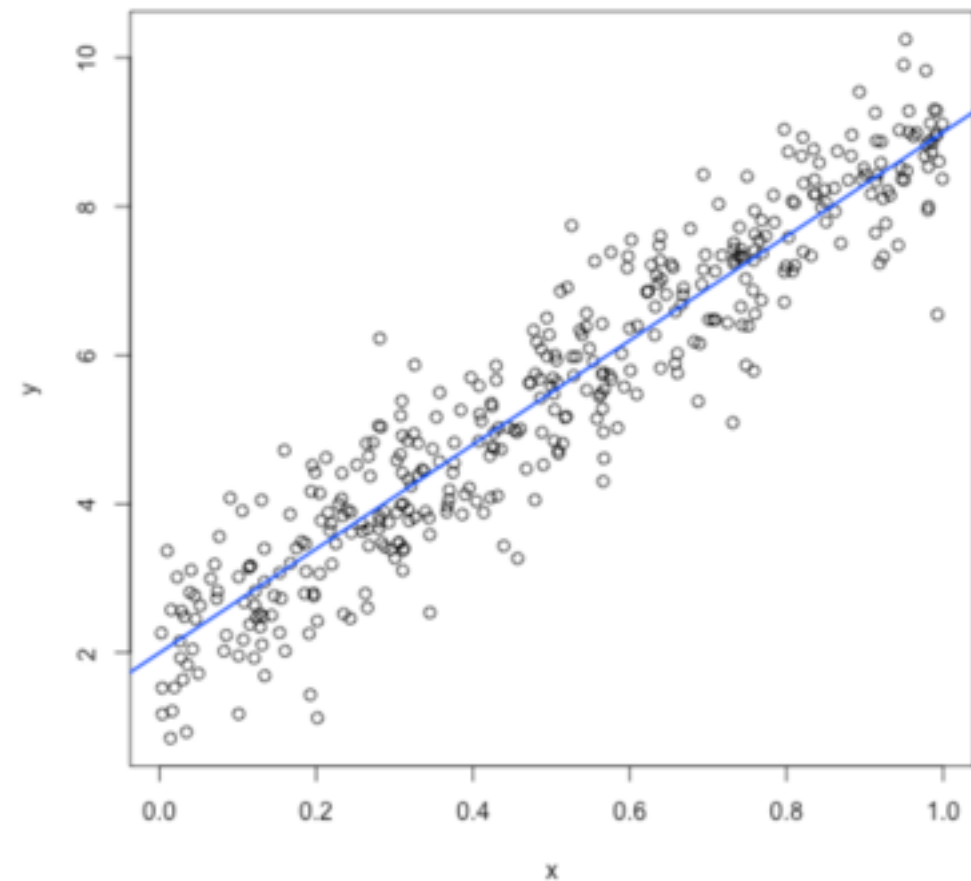
```
a <- 2
b <- 7
sigSq <- 0.5
n <- 400

set.seed(1234)
x <- runif(n)
y <- a + b * x + rnorm(n, sd = sqrt(sigSq))

(avgX <- mean(x))
```

```
[1] 0.4969
```

```
plot(x, y)
abline(a, b, col = "blue", lwd = 2)
```



How do I show the world all these awesome dynamic HTML reports I'm creating?

Easiest: Rpubs

Or do whatever you usually do to get HTML on the web.

Or use GitHub ....



# Summary:

web-friendly is good

various hosting platforms make it easy to share web-ready products with minimal effort

embedding analysis and logic in source document for a report is good

- huge win for reproducibility
- also excellent for communication and documentation

(R) Markdown + `knitr` (+ RStudio) make it very easy to author dynamic reports that are ready for the web

disclaimer:

knitr is **not limited** to executing R code  
knitr is **not limited** to processing R Markdown

I just chose to focus on R and R Markdown

Read more in the book or on the web:

*Dynamic documents with R and knitr* by Yihui Xie,  
part of the CRC Press / Chapman & Hall R  
Series (2013). ISBN: 9781482203530.

