

R Markdown

INFO 201

Data Report of the Day

MEMBER ↕	PARTY ↕	STATE ↕	Trump's share of the vote in the 2016 election minus Clinton's TRUMP MARGIN ↕	How often a member is expected to support Trump based on Trump's 2016 margin PREDICTED SCORE ↕	How often a member votes in line with Trump's position TRUMP SCORE ↕	Difference between a member's actual and predicted Trump-support scores TRUMP PLUS-MINUS ↕
Barrasso	R	WY	+46.3	99.8%	100.0%	+0.2
Enzi	R	WY	+46.3	99.8%	100.0%	+0.2
Capito	R	WV	+42.2	99.7%	100.0%	+0.3
Manchin	D	WV	+42.2	99.7%	87.5%	-12.2
Baldwin	D	WI	+0.8	78.2%	50.0%	-28.2
Johnson	R	WI	+0.8	78.2%	100.0%	+21.8
Cantwell	D	WA	-15.5	59.0%	62.5%	+3.5
Murray	D	WA	-15.5	59.0%	50.0%	-9.0
Leahy	D	VT	-26.4	47.0%	50.0%	+3.0
Sanders	I	VT	-26.4	47.0%	25.0%	-22.0
Kaine	D	VA	-5.3	70.8%	75.0%	+4.2
Warner	D	VA	-5.3	70.8%	87.5%	+16.7
Hatch	R	UT	+18.1	94.1%	100.0%	+5.9
Lee	R	UT	+18.1	94.1%	100.0%	+5.9

<https://projects.fivethirtyeight.com/congress-trump-score/>

Today's Objectives

By the end of class, you should be able to

- Comfortably read and access **web APIs**
- Manage **api keys** (access tokens)
- Generate *dynamic reports* with **R Markdown**

API Review

Module 11 exercise-1

Module 11 exercise-2

Today's API



[Get NYT API Key](#)

The New York Times Developer Network

All the APIs Fit to POST

You already know that NYTimes.com is an unparalleled source of news and information. But now it's a premier source of data, too — why just read the news when you can hack it?

Getting Started

The Times Developer Network is our API clearinghouse and community. Here's how to get started:

1. Request an [API key](#)
2. Read the API documentation, [FAQ](#) and [Terms of Use](#)
3. Use the API Tool associated with each API to experiment without writing code

<http://developer.nytimes.com/>

Access Tokens

An **access token** (or **api key**) is a unique identifier for each developer who uses the API. These are used to control access (like user names or passwords).

Access tokens are usually sent as a **query parameter**:

```
https://api.github.com/user&access_token=12345678abcdefgh
```



parameter name
(varies by API)



API key
(varies by user)

Managing Access Tokens

Because **access tokens** are like passwords, we don't want to push them to GitHub!

Best practice is to store keys in a ***separate script*** which is added to your **.gitignore** file to avoid being committed.

```
### in apikey.R file ###  
my.apikey <- "123456789abcdefg" # save the key
```

```
### in script.R file ###  
# load the script with the key  
source("apikey.R") # makes my.apikey available  
  
# use the key  
query.params <- list(access_token = my.apikey)  
# ...
```

```
### in .gitignore file ###  
apikey.R # tell git to ignore!
```

Module 11 exercise-4



Can copy/paste the exercise
CHECK THE README!

Data Presentation

Data Presentation

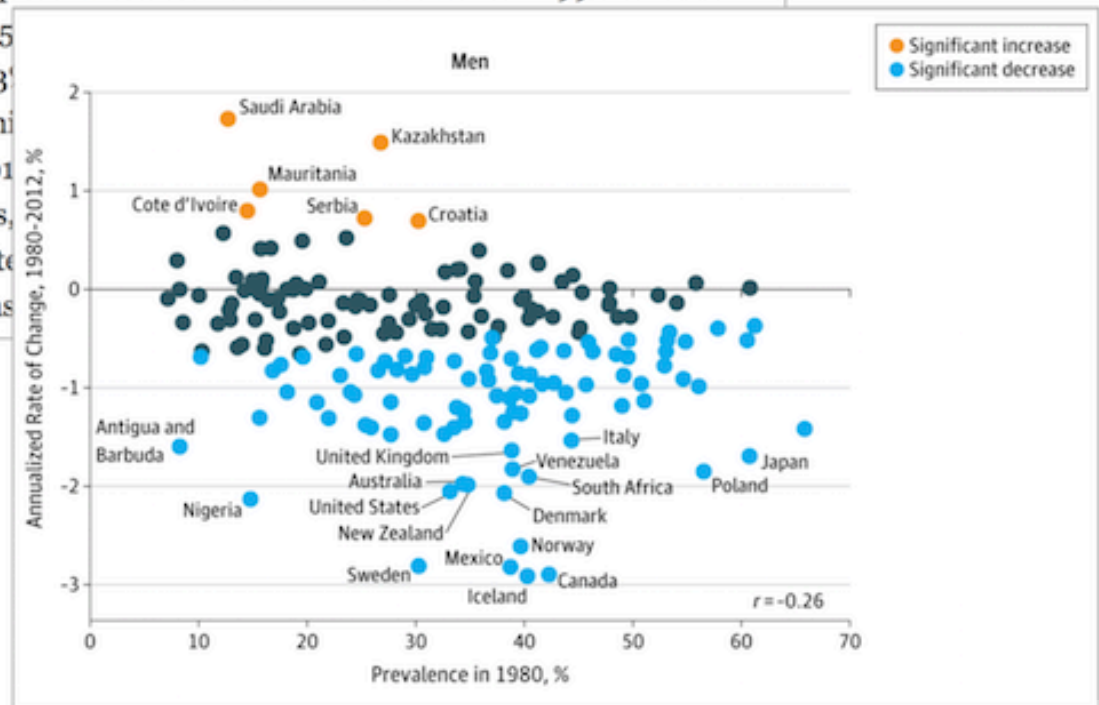
Results Global modeled age-standardized prevalence of daily tobacco smoking in the population older than 15 years decreased from 41.2% (95% uncertainty interval [UI], 40.0%-42.6%) in 1980 to 31.1% (95% UI, 30.2%-32.0%; $P < .001$) in 2012 for men and from 10.6% (95% UI, 10.2%-11.1%) to 6.2% (95% UI, 6.0%-6.4%; $P < .001$) for women. Global modeled prevalence declined at a faster rate from 1996 to 2006 (mean annualized rate of decline, 1.7%; 95% UI, 1.5%-1.9%) compared with the subsequent period (mean annualized rate of decline, 0.9%; 95% UI, 0.5%-1.3%; $P = .003$). Despite the decline in modeled prevalence, the number of daily smokers increased from 721 million (95% UI, 700 million–742 million) in 1980 to 967 million (95% UI, 944 million–989 million; $P < .001$) in 2012. Modeled prevalence rates exhibited substantial variation across age, sex, and countries, with rates below 5% for women in some African countries to more than 55% for men in Timor-Leste and Indonesia. The number of cigarettes per smoker per day also varied widely across countries and was not correlated with modeled prevalence.

How many numbers are in this summary?

Data Reports

Data reports have hundreds (thousands!) of variables, dozens of representations (tables or graphics)

Results Global modeled age-standardized prevalence of daily tobacco smoking in the population older than 15 years decreased from 41.2% (95% uncertainty interval [UI], 40.0%-42.6%) in 1980 to 31.1% (95% UI, 30.2%-32.0%; $P < .001$) in 2012 for men and from 10.6% (95% UI, 10.2%-11.1%) to 6.2% (95% UI, 6.0%-6.4%; $P < .001$) for women. Global modeled prevalence declined at a faster rate from 1996 to 2006 (mean annualized rate of decline, 1.7%; 95% UI, 1.5% annualized rate of decline, 0.9%; 95% UI, 0.5%-1.3%) than from 1980 to 1996 (mean annualized rate of decline, 0.9%; 95% UI, 0.5%-1.3%). The number of daily smokers increased from 721 million (95% UI, 944 million-989 million; $P < .001$) in 1980 to 944 million (95% UI, 944 million-989 million; $P < .001$) in 2012. There was substantial variation across age, sex, and countries, with prevalence ranging from less than 1% to more than 55% for men in Timor-Leste. The number of cigarettes smoked per day also varied widely across countries and was



How can we **update**
our report when the
data or analysis
changes?

Copy and Paste?

```
# to join on the "airports" dataframe, which has the airport info
10 avg_arrival_delay <- flights %>%
11   group_by(dest) %>%
12   summarise(avg_delay = mean(arr_delay)) %>%
13   mutate(faa = dest) %>%
14   left_join(airports, by = "faa") %>%
15   arrange(-avg_delay)
16
17 # Create a dataframe of the average arrival delay by city, then use left_join
18 # to join on the "airlines" dataframe, which has the airline info
19 avg_airline_delay <- flights %>%
20   group_by(carrier) %>%
21   summarise(avg_delay = mean(arr_delay, na.rm=TRUE)) %>%
22   left_join(airlines, by = "carrier") %>%
23   arrange(-avg_delay)
24
25 ### Bonus ###
26 # Calculate the average delay by city and airline, then merge on the city and airline info
27 avg_city_airline <- flights %>%
28   group_by(dest, carrier) %>%
29   summarise(avg_delay = mean(arr_delay, na.rm=TRUE)) %>%
30   arrange(-avg_delay)
```

20:40 (Top Level) ▾

Console ~/Documents/INFO-498F/ ↗

+ arrange(-avg_delay)

> avg_arrival_delay

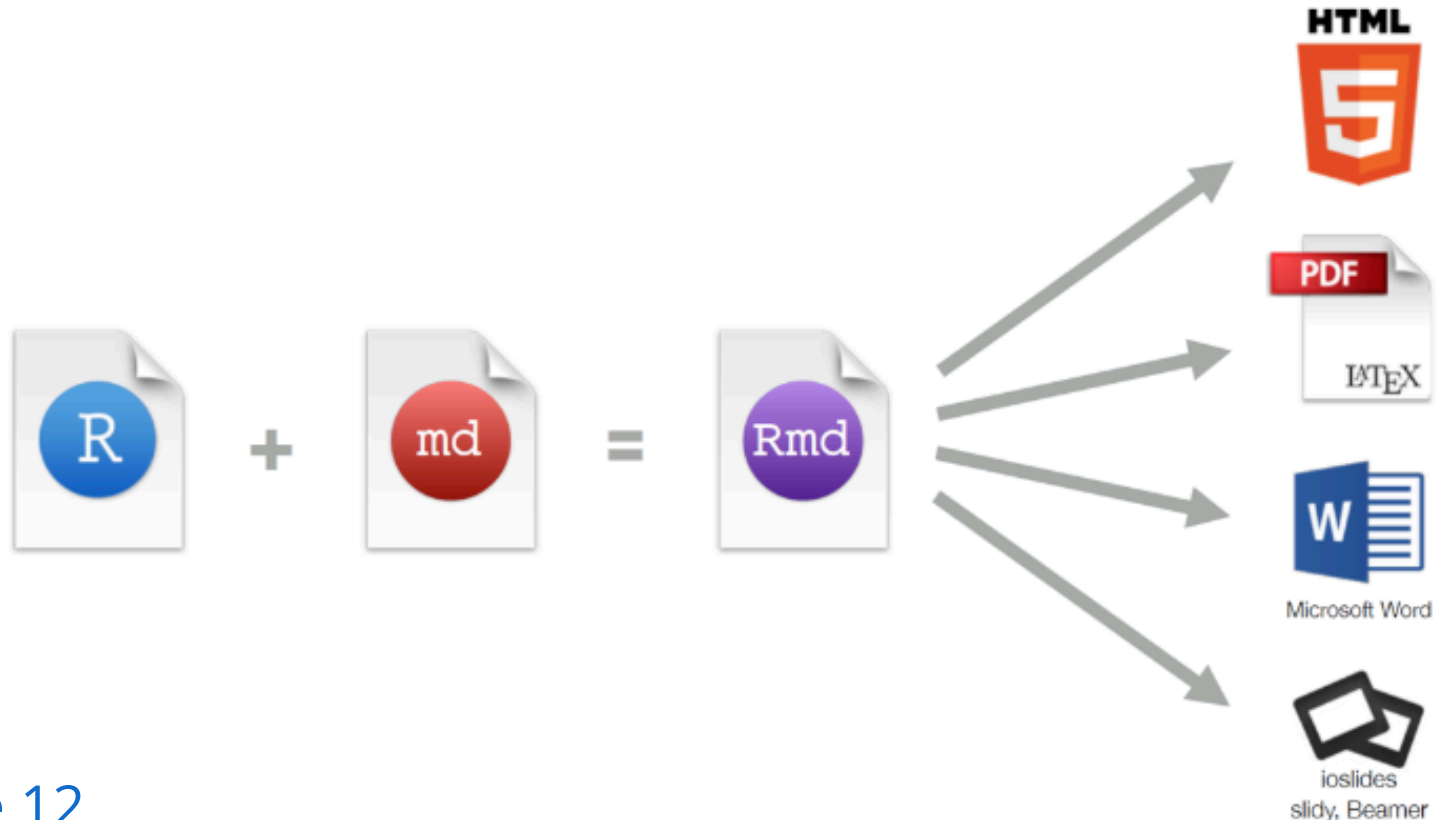
Source: local data frame [105 x 9]

	dest	avg_delay	faa	lon	lat	alt	city	state
1	CAE	41.76415	CAE	-81.11953	33.94161	1000	Columbia Metropolitan	SC
2	TUL	33.65986	TUL	-95.88811	36.20108	600	Tulsa	OK
3	OKC	30.61905	OKC	-103.60000	35.66000	1800	Will Rogers World	OK
4	JAC	28.09524	JAC	-110.75500	43.61750	6000	Jackson Hole Airport	WY
5	TYS	24.06920	TYS	-84.60750	35.80000	1000	Mc Ghee Tyson	NC
6	MSN	20.19604	MSN	-88.10000	42.00000	1000	Dane Co Regl Truax Fld	WI
7	RIC	20.11125	RIC	-76.75000	36.80000	1000	Richmond Intl	VA
8	CAK	19.69834	CAK	-80.92000	29.25000	1000	Akron Canton Regional Airport	OH
9	DSM	19.00574	DSM	-93.65000	41.50000	1000	Des Moines Intl	IA
10	GRR	18.18956	GRR	-85.50000	43.00000	1000	Gerald R Ford Intl	MI

age-standardized prevalence of daily tobacco smoking for men declined from 42.6% to 31.1% (95% UI, 30.2%-32.0%; $P < .001$), an 11.5% decline (95% UI, 0.8%-1.0%; $P < .001$) and for women declined from 15.1% to 10.1% (95% UI, 9.6%-10.6%; $P < .001$) or 33.1% (95% UI, 6.0%-6.4%; $P < .001$) or 1.7% (95% UI, 1.5%-1.9%; $P < .001$) per year. Global progress in reducing the age-standardized prevalence of daily tobacco smoking for both men and women (Figure 1B): modest progress (mean annualized rate of decline, 1.7%; 95% UI, 1.5%-1.9%; $P < .001$), the rate of decline, 0.6%; 95% UI, 0.4%-0.8%), with an apparent increase since 2010 for men. This deceleration in the rate of decline since 2006 in several large countries including Bangladesh, China, Indonesia, and Russia. Since 1980, the global rate of decline in the Supplement provides various estimates of tobacco smoking including modeled age-standardized prevalence rates, daily smokers, and total cigarettes consumed each year worldwide. While estimates of the prevalence declined, the growth in population older than 15 years resulted in an increase in the number of men and women who smoke daily, increasing from 700 million–742 million in 1980 to 967 million (95% UI, 944 million–994 million) in 2012. Between 1980 and 2012, the number of cigarettes smoked increased from 4.96 trillion (95% UI, 4.78 trillion–5.16 trillion) to 6.25 trillion (95% UI, 6.04 trillion–6.44 trillion; $P < .001$). There was no discernible trend in the global average number of cigarettes smoked per smoker per day, remaining around 18.

R Markdown

An R package (framework) for dynamically generating documents from code. Formatted **text**, executed **code**, and displayed **graphics** are seamlessly integrated.





Markdown

Markdown is a simple **syntax** for specifying how plain text should be formatted.

```
This is a paragraph in which we'll add
**bold text**, _italicized text_, and `code`
into the middle of a sentence
```

```
# Top Level header
## Second Level Header
```


```
Here is a normal paragraph
```

- List item 1
- List item 2
- List item 3

```
```
block of code
across multiple lines
```
```

```
> Here is a block quote
```

**Make this
executable!**



This is a paragraph in which we'll add **bold text**,
italicized text, and `code` into the middle of a
sentence

Top Level header

Second Level Header

Here is a normal paragraph

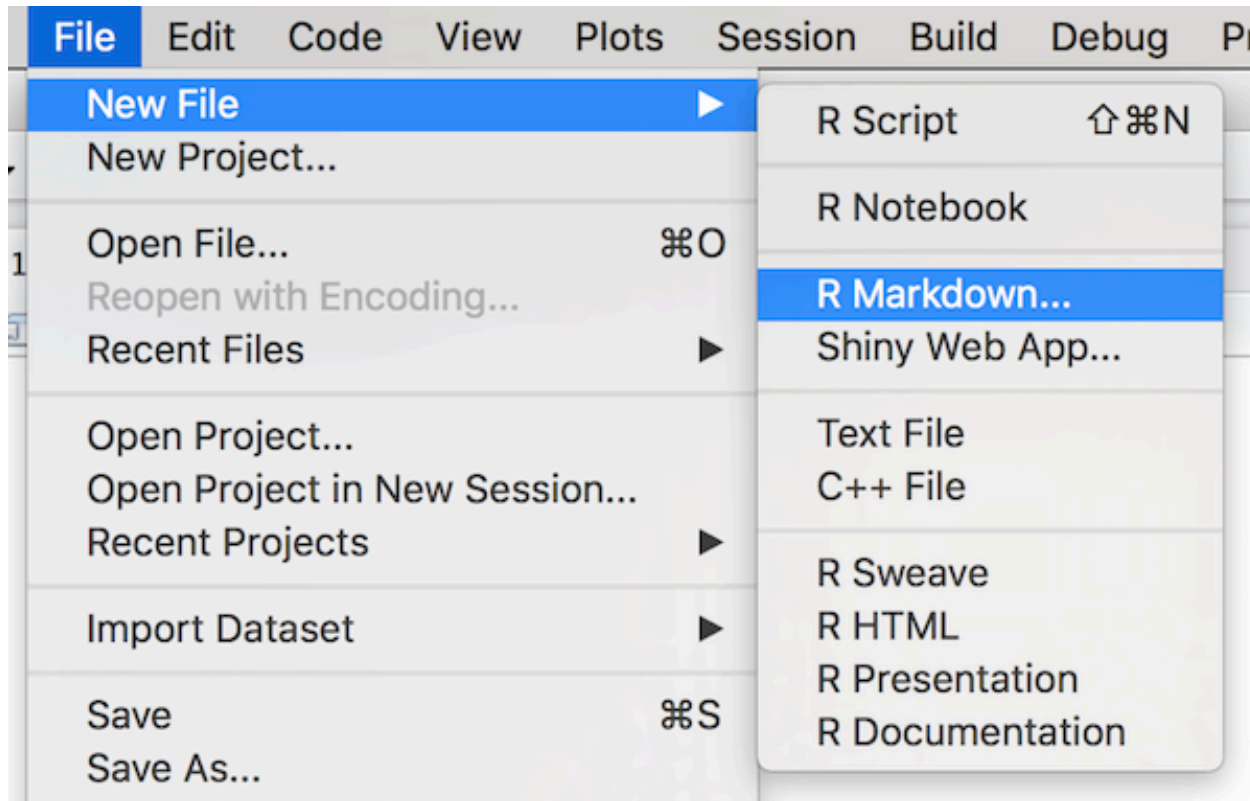
- List item 1
- List item 2
- List item 3

```
block of code
across multiple lines
```

Here is a block quote

Rmd Files

R Markdown document source code is written in `.Rmd` files. These can easily be created through R Studio.



Markdown and Code

We write Markdown code as normal in the document,
but include `{r}` next to code blocks we want to execute!

This is the code we will look at in class. This is just plain old Markdown that lets you render text in **bold** or *italics*. However, you can put in a block of R code, and the document will show the code and the results!

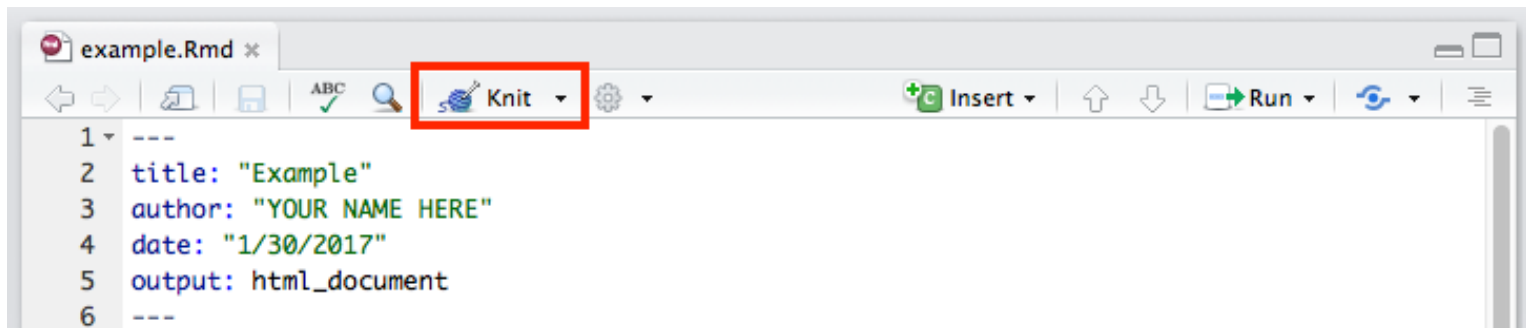
```
```{r} ←  
numbers <- runif(1:100) # make random numbers

hist(x) # show a histogram of those numbers
```
```

Knitting



R Markdown files are converted into readable documents (e.g., HTML) using the `knitr` library. This library handles the code execution and producing the output.



Markdown and Code

This is the code we will look at in class. This is just plain old Markdown that lets you render text in **bold** or *italics*. However, you can put in a block of R code, and the document will show the code and the results!

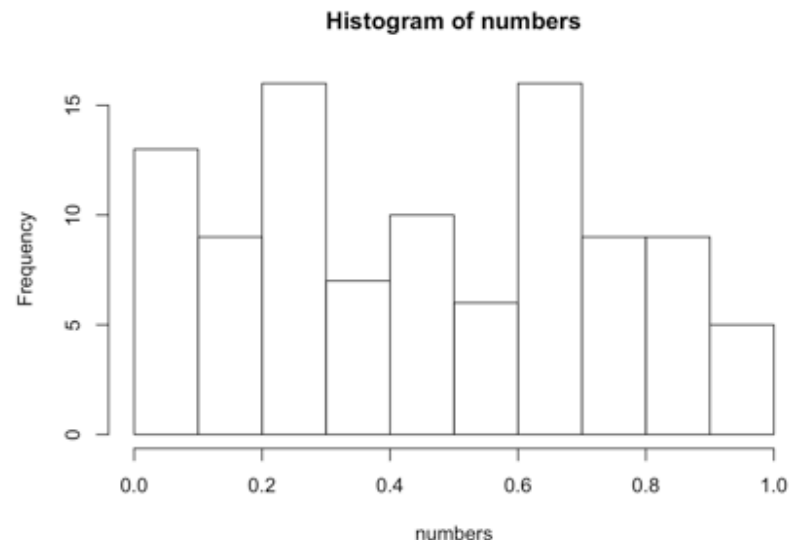
```
```{r}
numbers <- runif(1:100) # make random numbers

hist(x) # show a histogram of those numbers
```
```

This is the code we will look at in class. This is just plain old Markdown that lets you render text in **bold** or *italics*. However, you can put in a block of R code, and the document will show the code and the results!

```
numbers <- runif(1:100) # make random numbers

hist(numbers) # show a histogram of those numbers
```



knitr Options

Specify options after a comma in the `{r}` to specify what content should be rendered.

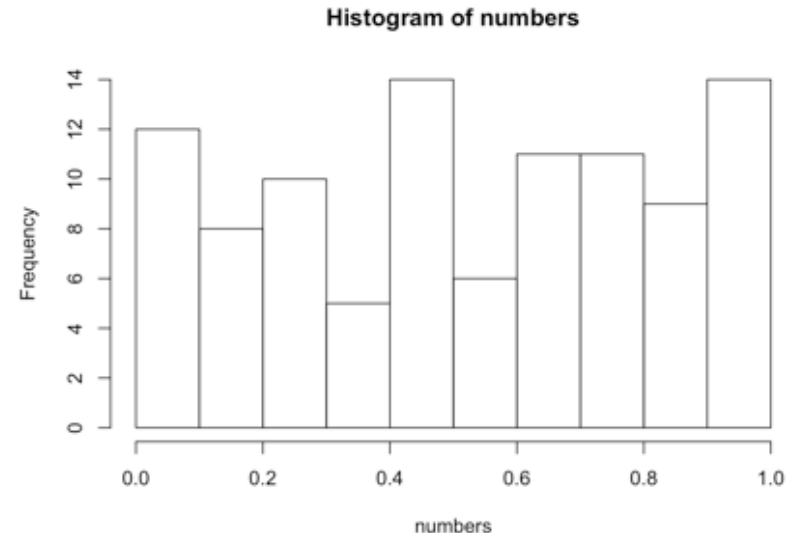
This is the code we will look at in class. This is just plain old Markdown that lets you render text in **bold** or *italics*. However, you can put in a block of R code, and the document will show the code and the results!

```
```${r, echo=FALSE}  
numbers <- runif(1:100) # make random numbers

hist(x) # show a histogram of those numbers
```
```

Do not echo (show)
the code, just output

This is the code we will look at in class. This is just plain old Markdown that lets you render text in **bold** or *italics*. However, you can put in a block of R code, and the document will show the code and the results!



Inline Code

Include expressions (e.g., variables) in **inline** code blocks by prepending them with `r`

This is the code we will look at in class. This is just plain old Markdown that lets you render text in **bold** or *italics*. However, you can put in a block of R code, and the document will show the code and the results!

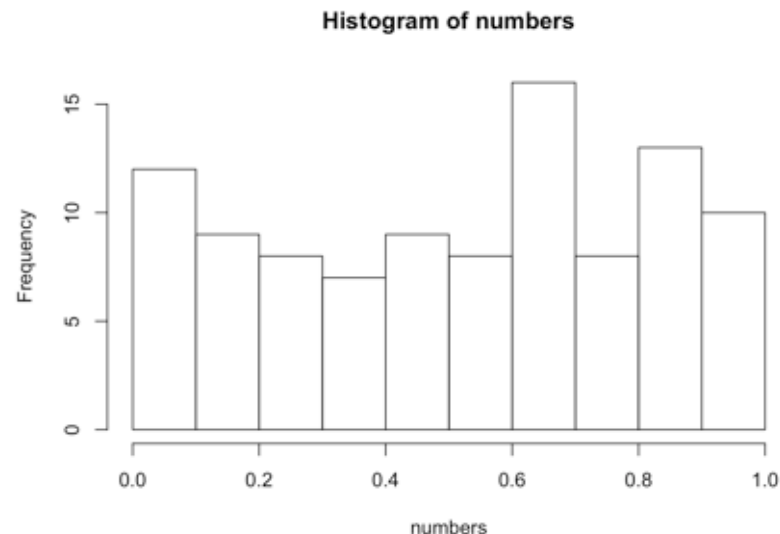
```
```{r, echo=FALSE}
numbers <- runif(1:100) # make random numbers

hist(x) # show a histogram of those numbers

numbers.mean <- mean(numbers) # save the mean
```
```

The mean of the above histogram
is **`r numbers.mean`**

This is the code we will look at in class. This is just plain old Markdown that lets you render text in **bold** or *italics*. However, you can put in a block of R code, and the document will show the code and the results!



The mean of the above histogram is **0.5175073**

Module 12 exercise-1



CHECK THE README!

**Questions on
anything so far?**

Action Items!

- Be comfortable with **module 11-12**
- Assignment 5 due ***Tuesday before class***

Tuesday: Making pretty diagrams!