## REPRODUCING R

Scripts, Documents, and Packages

#### About Me

- MS Computer Science, SMU
- □ By day...
  - ComputationalBiologist at UTSouthwestern
    - Use R to analyze biomedical data
    - Develop Java-based web applications

- □ By night...
  - Freelance consultant as Trestle Technology
    - Training
    - Web development
    - Data analysis
    - IT consulting



### Overview

- Motivation
- Scripts
- □ Reproducible Documents
- □ R Packages



#### Motivation

- □ R coding will get lonely
- Eventually want to share with others
- □ How best to wrap up your R code for different audiences?
  - Non-technical managers?
  - Technical peers?
  - The public at large?



# R Scripts

source()



### R Scripts

- □ First step towards reproducibility
- □ Save your analysis in a file
  - □ Can be re-executed
- □ Call source("filename.R") to run a file



#### Uses

- □ Poor man's reproducibility
  - □ Certainly better than just interactive use
  - Will have some reference later on
- Only accessible to R programmers
- □ A lot of opportunities to do this poorly
  - Dependency on local files
  - Assume data has already been loaded
  - Assume packages have already been loaded
  - No documentation standards



# Reproducible Documents

sweave, knitR



### History

- □ Sweave came first
  - Embed R code in LaTeX
  - Execute R and embed input/output into LaTeX doc
  - □ Convert to PDF, etc.
- □ knitr came next
  - More flexible engine
  - Embed R code into whatever you want (slides, HTML, LaTeX, ...)
  - Various improvements like caching



#### LaTeX

"A document markup language and document preparation system."

```
\documentclass[12pt] {article}
\usepackage{amsmath}
\title{\LaTeX}
\date{}
\begin{document}
 \maketitle
 \LaTeX{} is a document preparation system for the \TeX{}
 typesetting program. It offers programmable desktop publishing
 features and extensive facilities for automating most aspects of
 typesetting and desktop publishing, including numbering and
 cross-referencing, tables and figures, page layout, bibliographies,
 and much more. \LaTeX{} was originally written in 1984 by Leslie
 Lamport and has become the dominant method for using \TeX; few
  people write in plain \TeX{} anymore. The current version is
  \LaTeXe.
  % This is a comment; it will not be shown in the final output.
  % The following shows a little of the typesetting power of LaTeX:
 \begin{align}
   E \&= mc^2
   m \&= \frac{m 0}{\sqrt{2} \{c^2\}}
 \end{align}
\end{document}
```



### LaTeX

"A document markup language and document preparation system."

IATEX

LATEX is a document preparation system for the TEX typesetting program. It offers programmable desktop publishing features and extensive facilities for automating most aspects of typesetting and desktop publishing, including numbering and cross-referencing, tables and figures, page layout, bibliographies, and much more. LATEX was originally written in 1984 by Leslie Lamport and has become the dominant method for using TEX; few people write in plain TEX anymore. The current version is LATEX  $2\varepsilon$ .

$$E = mc^2 (1)$$

$$m = \frac{m_0}{\sqrt{1 - \frac{v^2}{c^2}}}\tag{2}$$



#### Markdown

# Title

- Markup language to render HTML
- □ A variety of formats and subtle variants

```
## Section Header
```

This is Markdown text, you can even add [links!] (http://trestletech.com) Lists are supported, as well:

- Here's one list element
- Here's a list element with some `inline code`.



#### Markdown

- Markup language to render HTML
- □ A variety of formats and subtle variants

#### **Title**

#### **Section Header**

This is Markdown text, you can even add links! Lists are supported, as well:

- · Here's one list element
- Here's a list element with some inline code.



### R + Markdown

```
# Sample Markdown
This is an R Markdown document!
```{r}
x < -1:10
You can also embed plots, for example:
```{r fig.width=7, fig.height=6}
plot(x, x^2)
```



#### R + Markdown

```
# Sample Markdown
This is an R Markdown document!
x < -1:10
## [1] 1 2 3 4 5 6 7 8 9 10
You can also embed plots, for example:
plot(x, x^2)
![plot of chunk unnamed-chunk-2](figure/unnamed-
chunk-2.png)
```



### R + Markdown

#### Sample Markdown

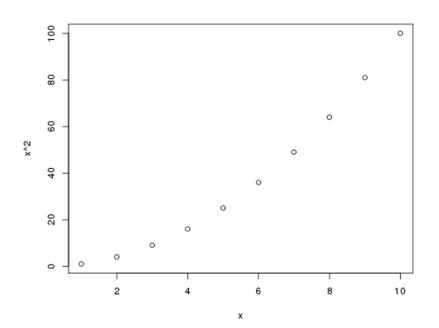
This is an R Markdown document!

```
X <- 1:10

## [1] 1 2 3 4 5 6 7 8 9 10
```

You can also embed plots, for example:

```
plot(x, x^2)
```





### Rstudio IDE

- □ Support for knitR & Sweave
  - R + Markdown
  - R + LaTeX
- □ One button push to generate either



#### Uses

- □ Great for sharing with non-technical audience
  - May or may not include the raw R code
  - They can follow the English
- Great for sharing data analysis with fellow R programmers
  - Encourages "literate programming"
  - Much easier to follow English than R
- □ Not great for sharing R functions



### Packages

#### Outline

- Ingredients
- Tools
- Code

Publishing & Sharing



- $\Box$  /R
- □ /man
- □ /inst
- □ /src
- DESCRIPTION
- NAMESPACE



```
/R
/man
/inst
Out of Scope
/src
DESCRIPTION
NAMESPACE
```





- $\Box$  /R
- □ /man
- □ /inst
- □ /src
- □ DESCRIPTION
- NAMESPACE

Our responsibilities



### DESCRIPTION

Package: RODProt

Type: Package

Title: JSON Table Schemas from R

Version: 0.1.3

Date: 2013-04-22

Author: Jeffrey D. Allen <jeffrey.allen@utsouthwestern.edu>

Maintainer: Jeffrey D. Allen < jeffrey.allen@utsouthwestern.edu>

Description: An R Client for Interacting with Data Encoded in one of the 'Open

Data Protocols' Standards including JSON Table Schemas.

#### Imports:

rjson (>= 0.2.10), RCurl,

License: MIT



### Tools You'll Want

Packages

(Why this section is only 30 minutes long.)



## roxygen2

- R Documentation (Rd) format
  - LaTeX-like, very fickle
  - Bad error checking

```
\title{Download Data Package Resource}
 get_resource(dataPkg, resource, cache = TRUE, ...)
\arguments{
 \item{dataPkg}{The Data Package (as loaded from
 \code{\link{read_data_package}}) to use.}
 \item{resource}{A character string specifying the names
 of the resource to retrieve from the Data Package. At the
 time of development, it was unclear exactly how a
 resource would be indexed (see
 \url{https://github.com/dataprotocols/dataprotocols/issues
 thus the package supports a variety of indexing
 mechanisms for resources. The order of precedence is as
 follows: \enumerate{ \item Keys from the \code{resources}
 hash - If the \code{resources} value was provided as a
 JSON hash instead of an array, the required name
 prefacing each resource will be used as that resource's
 canonical name. \item The \code{id} field within each
 resource will be checked for any exact matches. \item The
 \code{name} field within each resource will be checked
 for any exact matches. \item The \code{url} and
 \code{path} fields within each resource will be checked
 for any exact matches. \item The \code{url} and
 \code{path} fields within each resource will be checked
 for partial matches on the extracted \code{<resource>}
 portion of a \code{/<path>/<resource>} reference. The
 path is extracted using \code{\link{dirname}} and ignored
 to see if the remainder of the string matches (with the
 possible exclusion of a prefacing slash). }}
```



### roxygen2

- Roxygen2 is an R package
- Documentation is in yourR code
- Compiles Rd files for you
- Integrated into RStudioIDE

```
@param cache Whether or not to
  function will check this Data
   it has, it will simply return
   retrieve the remote resource t
   involve storing an extra copy
  function will retrieve the
   resource remotely, but not sto
   is to set cache to \code{"flus
  resource remotely, ignoring an
  for future use.
  @param ... Arguments to be pas
  @importFrom digest digest
  @author Jeffrey D. Allen \emai
  @export
get resource <- function(dataPkg,</pre>
  if (cache != TRUE && cache != F
    stop("Invalid cache value. Mu
  if (resource %in% names(dataPkg
    ind <- which(resource == name
  } else if (resource %in% lapply
```



#### devtools

- □ An R package
- Designed to make package authorship simpler
- □ Integrated into RStudio IDE



# Walkthrough

### Packages

(Let's do it!)



### Steps

- Install devtools and roxygen2
- 2. Create an RStudio project with "package" build mode.
  - 1. Set to roxygenize on all three possibilities
  - 2. Set to build NAMESPACE, collate, and man fields
- 3. Create a package directory
- 4. Create an "R" directory
- 5. Put some Roxygenized R code into "./R"
- 6. Load/Install Devtools
- 7. load\_all()
- 8. Fill out the description File



### Steps

- 9. Build and Reload
- 10. Test & debug R code, go back to step 9
- 11. Check package before submitting
  - --no-manual if you don't have pdflatex



### Resources

### Packages

(How do I ...;)



### How to Get Help

- Authoritative Manual
  - http://cran.us.r-project.org/doc/manuals/R-exts.html
- Other Presentations
  - http://dl.dropboxusercontent.com/u/41902/easy-packages3.pdf
- StackOverflow
  - http://stackoverflow.com/questions/tagged/r
  - Q & A site with active R community
- Mailing Lists
  - R-devel, Bioconductor
  - http://www.r-project.org/posting-guide.html#which\_list
  - Do your research; they bite



## Distribution

### Packages

(... Now what?)



## Publishing and Sharing

#### **CRAN**

- □ Any domain
- Any code that passesR CMD CHECK
- Available online in a matter of days

#### Bioconductor

- Biological applications
- More rigorously curated
- □ 6 month release cycle



#### GitHub

- Social coding platform based on Git
  - Great collaboration tool
- Free for open-source usage, a few \$/month for private repositories
- Use devtools' install\_github() function to install an R package from a GitHub repo.



### Tips

- Study and emulate the experts
  - https://github.com/hadley/stringr
  - https://github.com/yihui/knitr
- □ Learn Roxygen2
  - https://github.com/klutometis/roxygen
- □ Learn devtools
  - https://github.com/hadley/devtools/



### Questions?

- □ Slides at
  - http://trestletech.com/blog/

#### Find me on:



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# Outstanding Question

Packages

(How do I make use of other packages?)



### Using Other Packages

- □ Short answer: imports
- Long answer:
  - http://cran.r-project.org/doc/manuals/R-exts.html#Package-namespaces
  - http://stackoverflow.com/questions/9893791/imports-and-depends
  - http://stackoverflow.com/questions/8637993/better-explanation-of-when-to-use-imports-depends
- □ Rule of thumb: Don't use "depends" in DESCRIPTION. There's a better way now.

