### KnitR + $\angle AT_EX \rightarrow paper$ Tools for Reproducible Research

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```
\documentclass[12pt]{article}
\usepackage{graphicx}
\title{An example document}
\author{Karl Broman}
\begin{document}
\maketitle
\thispagestyle{empty}
\section{A section}
This is a simple example of a \LaTeX\/ document for an article.
Here's some in-line math: y = \beta + \beta + \beta + \beta
And here's a display equation:
$ \hat{\beta} = (X'X)^{-1} X'y $$
\end{document}
```

# What I actually do

```
\documentclass[12pt]{article}
\setlength{\headheight}{10pt}
\strut_{\n}
\setlength{\topmargin}{-25pt}
\setlength{\topskip}{0in}
\setlength{\textheight}{8.7in}
\setlength{\footskip}{0.3in}
\setlength{\oddsidemargin}{0.0in}
\setlength{\evensidemargin}{0.0in}
\setlength{\textwidth}{6.5in}
\begin{document}
\begin{center}
\textbf{\large An example document}
\vspace{10mm}
Karl Broman
\end{center}
\vspace{30mm}
\textbf{\sffamily A section}
```

# Why LATEX?

- Fine control of document appearance
- Transparency of how that was achieved
- Version control (diff/merge)
- Typesetting equations
- Markdown's not quite ready, or sufficiently rich

# simple $\longleftrightarrow$ flexible

# $simple \longleftrightarrow flexible$

\centerline{\Large simple \quad \$\longleftrightarrow\$ \quad flexible}

Modify your desires to match the defaults.

Focus your compulsive behavior on things that matter.

### Stuff I use a lot

```
% other fonts
\usepackage{palatino}
\usepackage{times}
\setlength{\rightskip}{Opt plus 1fil} % makes ragged right
\newcommand{\LOD}{\text{LOD}}}
\usepackage{setspace}
\setstretch{2.0}
\addtocounter{framenumber}{-1}
% make figures S1, S2, ...
\renewcommand {\thefigure}{\textbf{S\arabic{figure}}}
\renewcommand{\figurename}{\textbf{Figure}}
% bigger space between rows in tables
\renewcommand{\arraystretch}{1.5}
% paragraphs not indented but have space between
\setlength{\parskip}{6pt}
\setlength{\parindent}{0pt}
```

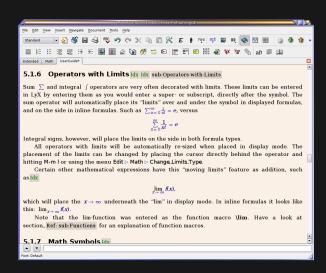
# KnitR + LATEX→ Rnw

```
\documentclass[12pt]{article}
\title{An example Rnw document}
\author{Karl Broman}
\begin{document}
\maketitle
<<load library, echo=FALSE, results="hide">>=
library(broman) # used for myround()
<<example_chunk>>=
x < - rnorm(100)
v < -5*x + rnorm(100)
lm.out <- lm(v ~ x)
plot(x,y)
abline(lm.out$coef)
@
The estimated slope is \Sexpr{myround(lm.out$coef[2], 1)}.
\end{document}
```

# KnitR + LATEX→ Rnw

```
\documentclass[12pt]{article}
\title{An example Rnw document}
\author{Karl Broman}
\begin{document}
\maketitle
<<load library, echo=FALSE, results="hide">>=
library(broman) # used for myround()
<<example_chunk, out.width="0.8\\textwidth">>=
x < - rnorm(100)
v < -5*x + rnorm(100)
lm.out <- lm(y ~ x)
plot(x,y)
abline(lm.out$coef)
@
The estimated slope is \Sexpr{myround(lm.out$coef[2], 1)}.
\end{document}
```





### Also

- ▶ WriteLaTeX
- ► Authorea
- ▶ ShareLaTeX
- ▶ Verbosus

# Flavors of LATEX

- ► LATEX
- ▶ pdflatex
- ▶ xelatex
- ▶ lualatex

# Getting help

- Google
- tex.stackexchange.com
- Ask a friend
- ► Look at others' documents
- ► Resign yourself to something less-than-ideal

### Figure captions and floats

```
<<fig_with_caption, fig.cap="Scatterplot of $y$ vs $x$">>=
x <- rnorm(100)
y <- 5*x + rnorm(100)
lm.out <- lm(y ~ x)
plot(x,y)
abline(lm.out$coef)
@</pre>
```

```
\begin{figure}[]
\includegraphics{figure/fig_with_caption}
\caption{Scatterplot of $y$ vs $x$\label{fig:fig_with_caption}}
\end{figure}
```

# Tables in LATEX

#### xtable

```
<<generate_and_fit>>=
x <- rnorm(100)
y <- x + rnorm(100)
lm.out <- lm(y ~ x)
@

<<table, results="asis">>=
library(xtable)
xtable(lm.out, digits=c(0,2,2,1,2))
@
```

# Read proofs carefully

#### As submitted

$$\Pr(g_1 = i, g_2 = j) = \begin{cases} \frac{1-r}{8(1+6r)} & \text{if } i = j\\ \frac{r}{8(1+6r)} & \text{if } i \neq j \end{cases}$$

#### As printed

$$\Pr(g_1 = i, g_2 = j) = \begin{cases} \frac{1-r}{8(1+6r)} & \text{if } i = j\\ \frac{r}{2(1+6r)} & \text{if } i \neq j. \end{cases}$$

# Re-type that!

| Table 4 Two-locus haplotype probabilities at generation F <sub>k</sub> in the formation of four-way RIL by sibling mating            |            |           |            |  |
|--|------------|-----------|------------|--|
| Chr.   | Individual | Prototype | No. states | Probability of each  |
| A  | Random     | AA        | 4          | $\frac{1}{4(1+6r)^{-}} \left[ \frac{6r^{2} - 7r - 3rs}{4(1+6r)s} \right] \left( \frac{1 - 2r + s}{4} \right)^{k} + \left[ \frac{6r^{2} - 7r + 3rs}{4(1+6r)s} \right] \left( \frac{1 - 2r - s}{4} \right)^{k}$  |
|  |            | AB        | 4          | $\frac{r}{2(1+6r)^{+}} \left[ \frac{10r^{2} - r - rs}{4(1+6r)s} \left[ \frac{1 - 2r + s}{4} \right]^{k} - \left[ \frac{10r^{2} - r + s}{4(1+6r)s} \right] \left( \frac{1 - 2r - s}{4} \right)^{k}$   |
|  |            | AC        | 8          | $\frac{r}{2(1+6r)} - \left[\frac{2r^2 + 3r + rs}{4(1+6r)s}\right] \left(\frac{1 - 2r + s}{4}\right)^k + \left[\frac{2r^2 + 3r - rs}{4(1+6r)s}\right] \left(\frac{1 - 2r - s}{4}\right)^k$  |
| x  | Female     | AA        | 2          | $\frac{1}{3(1+4r)^{+}} + \frac{1}{6(1+r)} \left(-\frac{1}{2}\right)^{k} - \left[\frac{4r^{3} - (4r^{2} + 3r)t + 3r^{2} - 5r}{4(4r^{2} + 5r + 1)t}\right] \left(\frac{1-r+t}{4}\right)^{k} + \left[\frac{4r^{3} + (4r^{2} + 3r)t + 3r^{2} - 5r}{4(4r^{2} + 5r + 1)t}\right] \left(\frac{1-r+t}{4}\right)^{k}$   |
|  |            | AB        | 2          | $\frac{2r}{3(1+4r)} + \frac{r}{3(1+r)} \left( -\frac{1}{2} \right)^k + \left[ \frac{2r^3 + 6r^2 - (2r^2 + r)t}{2(4r^2 + 5r + 1)t} \right] \left( \frac{1-r + t}{4} \right)^k - \left[ \frac{2r^3 + 6r^2 + (2r^2 + r)t}{2(4r^2 + 5r + 1)t} \right] \left( \frac{1-r - t}{4} \right)^k$  |
|  |            | AC        | 4          | $\frac{2r}{3(1+4r)} - \frac{r}{6(1+r)} \left(-\frac{1}{2}\right)^k - \left[\frac{9r^2 + 5r + rt}{4(4r^2 + 5r + 1)t}\right] \left(\frac{1-r + t}{4}\right)^k + \left[\frac{9r^2 + 5r - rt}{4(4r^2 + 5r + 1)t}\right] \left(\frac{1-r - t}{4}\right)^k$  |
|  |            | СС        | 1          | $\frac{1}{3(1+4r)} - \frac{1}{3(1+r)} \left(-\frac{1}{2}\right)^k + \left[\frac{9r^2 + 5r + rt}{2(4r^2 + 5r + 1)t}\right] \left(\frac{1-r + t}{4}\right)^k - \left[\frac{9r^2 + 5r - rt}{2(4r^2 + 5r + 1)t}\right] \left(\frac{1-r - t}{4}\right)^k$   |
| ×  | Male       | AA        | 2          | $\frac{1}{3(1+4r)} - \frac{1}{3(1+r)} \left( -\frac{1}{2} \right)^k + \left[ \frac{r^3 - (8r^3 + r^2 - 3r)t - 10r^2 + 5r}{2(4r^4 - 35r^3 - 29r^2 + 15r + 5)} \right] \left( \frac{1-r + t}{4} \right)^k + \left[ \frac{r^3 + (8r^3 + r^2 - 3r)t - 10r^2 + 5r}{2(4r^4 - 35r^3 - 29r^2 + 15r + 5)} \right] \left( \frac{1-r - t}{4} \right)^k + \left[ \frac{r^3 + (8r^3 + r^2 - 3r)t - 10r^2 + 5r}{2(4r^4 - 35r^3 - 29r^2 + 15r + 5)} \right] \left( \frac{1-r - t}{4} \right)^k + \left[ \frac{r^3 + (8r^3 + r^2 - 3r)t - 10r^3 + 5r}{2(4r^4 - 35r^3 - 29r^2 + 15r + 5)} \right] \left( \frac{1-r - t}{4} \right)^k + \left[ \frac{r^3 + (8r^3 + r^2 - 3r)t - 10r^3 + 5r}{2(4r^4 - 35r^3 - 29r^2 + 15r + 5)} \right] \left( \frac{1-r + t}{4} \right)^k + \left[ \frac{r^3 + (8r^3 + r^2 - 3r)t - 10r^3 + 5r}{2(4r^4 - 35r^3 - 29r^2 + 15r + 5)} \right] \left( \frac{1-r + t}{4} \right)^k + \left[ \frac{r^3 + (8r^3 + r^2 - 3r)t - 10r^3 + 5r}{2(4r^4 - 35r^3 - 29r^2 + 15r + 5)} \right] \left( \frac{1-r + t}{4} \right)^k + \left[ \frac{r^3 + (8r^3 + r^2 - 3r)t - 10r^3 + 5r}{2(4r^4 - 35r^3 - 29r^2 + 15r + 5)} \right] \left( \frac{1-r + t}{4} \right)^k + \left[ \frac{r^3 + (8r^3 + r^2 - 3r)t - 10r^3 + 5r}{2(4r^4 - 35r^3 - 29r^2 + 15r + 5)} \right] \left( \frac{1-r + t}{4} \right)^k + \left[ \frac{r^3 + (8r^3 + r^2 - 3r)t - 10r^3 + 5r}{2(4r^4 - 35r^3 - 29r^2 + 15r + 5)} \right] \left( \frac{1-r + t}{4} \right)^k + \left[ \frac{r^3 + (8r^3 + r^2 - 3r)t - 10r^3 + 5r}{2(4r^4 - 35r^3 - 29r^2 + 15r + 5)} \right] \left( \frac{1-r + t}{4} \right)^k + \left[ \frac{r^3 + (8r^3 + r^2 - 3r)t - 10r^3 + 5r}{2(4r^4 - 35r^3 - 29r^2 + 15r + 5)} \right] \left( \frac{1-r + t}{4} \right)^k + \left[ \frac{r^3 + (8r^3 + r^2 - 3r)t - 10r^3 + 5r}{2(4r^4 - 35r^3 - 29r^2 + 15r + 5)} \right] \left( \frac{1-r + t}{4} \right)^k + \left[ \frac{r^3 + (8r^3 + r^2 - 3r)t - 10r^3 + 5r}{2(4r^4 - 35r^3 - 29r^2 + 15r + 5r} \right] \left( \frac{1-r + t}{4} \right)^k + \left[ \frac{r^3 + (8r^3 + r^3 - 3r)t - 10r^3 + 5r}{2(4r^4 - 35r^3 - 29r^3 + 15r + 5r} \right] \left( \frac{1-r + t}{4} \right)^k + \left[ \frac{r^3 + (8r^3 + r^3 - 4r)t - 10r^3 + 5r}{2(4r^4 - 35r^3 - 29r^3 + 15r + 5r} \right] \left( \frac{1-r + t}{4} \right)^k + \left[ \frac{r^3 + (8r^3 + r^3 + 15r + 5r}{4} \right] \left( \frac{1-r + t}{4} \right)^k + \frac{r^3 + (8r^3 + 15r + 5r)t - 10r^3 + 5r}{4} \right)^k + \frac{r^3 + (8r^3 + 15r + 5r)t - 10r^3 + 5r}{4} \right)^k + \frac{r^3 + (8r^3 + 15r + 5r)t - 10r^3 + 5r^3 + 5r}{4} \right)^k + \frac{r^3 + (8r^3 + 15r + 5r)t - 10r^3 + 5r}{4} \right)^k + r^3 + (8r^3 + 15r + 5r$  |
|  |            | AB        | 2          | $\frac{2r}{3(1+4r)} - \frac{2r}{3(1+r)} \left(-\frac{1}{2}\right)^k + \left[\frac{r^4 + (5r^3 - r)t - 10r^3 + 5r^2}{4r^4 - 35r^3 - 29r^2 + 15r + 5}\right] \left(\frac{1-r + t}{4}\right)^k + \left[\frac{r^4 - (5r^3 - r)t - 10r^3 + 5r^2}{4r^4 - 35r^3 - 29r^2 + 15r + 5}\right] \left(\frac{1-r - t}{4}\right)^k$   |
|  |            | AC        | 4          | $\frac{2r}{3(1+4r)} + \frac{r}{3(1+r)} \left(-\frac{1}{2}\right)^k \\ - \left[\frac{2r^4 + (2r^3 - r^2 + r)t - 19r^3 + 5r}{2(4r^4 - 35r^3 - 29r^2 + 15r + 5)}\right] \left(\frac{1-r+t}{4}\right)^k \\ - \left[\frac{2r^4 - (2r^3 - r^2 + r)t - 19r^3 + 5r}{2(4r^4 - 35r^3 - 29r^2 + 15r + 5)}\right] \left(\frac{1-r-t}{4}\right)^k \\ - \left[\frac{2r^4 - (2r^3 - r^2 + r)t - 19r^3 + 5r}{2(4r^4 - 35r^3 - 29r^2 + 15r + 5)}\right] \left(\frac{1-r-t}{4}\right)^k \\ - \left[\frac{2r^4 - (2r^3 - r^2 + r)t - 19r^3 + 5r}{2(4r^4 - 35r^3 - 29r^2 + 15r + 5)}\right] \left(\frac{1-r-t}{4}\right)^k \\ - \left[\frac{2r^4 - (2r^3 - r^2 + r)t - 19r^3 + 5r}{2(4r^4 - 35r^3 - 29r^2 + 15r + 5)}\right] \left(\frac{1-r-t}{4}\right)^k \\ - \left[\frac{2r^4 - (2r^3 - r^2 + r)t - 19r^3 + 5r}{2(4r^4 - 35r^3 - 29r^2 + 15r + 5)}\right] \left(\frac{1-r-t}{4}\right)^k \\ - \left[\frac{2r^4 - (2r^3 - r^2 + r)t - 19r^3 + 5r}{2(4r^4 - 35r^3 - 29r^2 + 15r + 5)}\right] \left(\frac{1-r-t}{4}\right)^k \\ - \left[\frac{2r^4 - (2r^3 - r^2 + r)t - 19r^3 + 5r}{2(4r^4 - 35r^3 - 29r^2 + 15r + 5)}\right] \left(\frac{1-r-t}{4}\right)^k \\ - \left[\frac{2r^4 - (2r^3 - r^2 + r)t - 19r^3 + 5r}{2(4r^4 - 35r^3 - 29r^2 + 15r + 5)}\right] \left(\frac{1-r-t}{4}\right)^k \\ - \left[\frac{2r^4 - (2r^3 - r^2 + r)t - 19r^3 + 5r}{2(4r^4 - 35r^3 - 29r^2 + 15r + 5)}\right] \left(\frac{1-r-t}{4}\right)^k \\ - \left[\frac{2r^4 - (2r^3 - r^2 + r)t - 19r^3 + 5r}{2(4r^4 - 35r^3 - 29r^2 + 15r + 5)}\right] \left(\frac{1-r-t}{4}\right)^k \\ - \left[\frac{2r^4 - (2r^3 - r^2 + r)t - 19r^3 + 5r}{2(4r^4 - 35r^3 - 29r^2 + 15r + 5)}\right] \left(\frac{1-r-t}{4}\right)^k \\ - \left[\frac{2r^4 - (2r^3 - r^2 + r)t - 19r^3 + 5r}{2(4r^4 - 35r^3 - 29r^2 + 15r + 5)}\right] \left(\frac{1-r-t}{4}\right)^k \\ - \left[\frac{2r^4 - (2r^3 - r^2 + r)t - 19r^3 + 5r}{2(4r^4 - r^2 + r)t - 19r^3 + 5r}\right] \left(\frac{1-r-t}{4}\right)^k \\ - \left[\frac{2r^4 - (2r^3 - r)t - 19r^3 + 5r}{2(4r^4 - r)t - 19r^3 + 5r}\right] \left(\frac{1-r-t}{4}\right)^k \\ - \left(\frac{2r^4 - (2r^3 - r)t - 19r^3 + 5r}{2(4r^4 - r)t - 19r^3 + 5r}\right) \left(\frac{1-r-t}{4}\right)^k \\ - \left(\frac{2r^4 - (2r^3 - r)t - 19r^3 + 5r}{2(4r^4 - r)t - 19r^3 + 5r}\right) \left(\frac{1-r-t}{4}\right)^k \\ - \left(\frac{2r^4 - (2r^3 - r)t - 19r^3 + 5r}{2(4r^4 - r)t - 19r^3 + 5r}\right) \left(\frac{1-r-t}{4}\right)^k \\ - \left(\frac{2r^4 - (2r^3 - r)t - 19r^3 + 5r}{2(4r^4 - r)t - 19r^3 + 5r}\right) \left(\frac{1-r-t}{4}\right)^k \\ - \left(\frac{2r^4 - (2r^4 - r)t - 19r^4 + 5r}{2(4r^4 - r)t - 19r^4 + 5r}\right) \left(\frac{1-r-t}{4}\right)^k \\ - \left(\frac{2r^4 - (2r^4 - r)t - 19r^4 + 5r}{2(4r$ |
|  |            | СС        | 1          | $\frac{1}{3(1+4r)} + \frac{2}{3(1+r)} \left(-\frac{1}{2}\right)^k + \left[\frac{2r^4 + (2r^3 - r^2 + r)t - 19r^3 + 5r}{4r^4 - 35r^3 - 29r^2 + 15r + 5}\right] \left(\frac{1-r + t}{4}\right)^k + \left[\frac{2r^4 - (2r^3 - r^2 + r)t - 19r^3 + 5r}{4r^4 - 35r^3 - 29r^2 + 15r + 5}\right] \left(\frac{1-r - t}{4}\right)^k$   |
| $s = \sqrt{4r^2 - 12r + 5}$ and $t = \sqrt{r^2 - 10r + 5}$ ; the autosomal haplotype probabilities are valid for $r < \frac{1}{2}$ . |            |           |            |  |

Broman (2012) Genetics 190:403-412

# BibTeX for bibliographies

```
%bibliography format
\usepackage[authoryear]{natbib}
\bibpunct{(){})}{;}{a}{}{,}

A number of investigators have developed methods for identifying such sample mix-ups \citep{Westra2011, Schadt2012, Lynch2012, Ekstrom2012}, and a similar approach was applied by \citet{Baggerly2008, Baggerly2009} in their forensic...
\bibliographystyle{genetics}
\renewcommand*{\refname}{\centerline{\normalsize\sffamily \textbf{Literature Cited}}}
\bibliography{samplemixups}
```

```
@article{Baggerly2008,
author = {Baggerly, Keith A. and Coombes, Kevin R.},
journal = {J. Clin. Oncol.},
pages = {1186--1187},
title = {Run batch effects potentially compromise...},
volume = {26},
year = {2008} }
```

# Organizing analyses

Directory for the main analysis project

~/Projects/Blah

Directory for a paper

~/Docs/Papers/Blah

- ► Paper directory may have an analysis directory ~/Docs/Papers/Blah/Analysis
- ► Symbolic links to .RData files

  ln -s ~/Projects/Blah/DerivedData/blah.RData .
- Each part well organized and fully reproducible.
- R Markdown reports documenting different aspects.
- ► Analysis with the paper may be re-done "properly."

### Make every number reproducible.

```
<<define numbers, echo=FALSE>>=
numbers <- c("one", "two", "three", "four", "five",
             "six", "seven", "eight", "nine", "ten")
cap <- function(vec) pasteO(toupper(substr(vec, 1, 1)),</pre>
                             substr(vec, 2, nchar(vec)))
Numbers <- cap(numbers)</pre>
n \leftarrow sample(1:10, 1)
Then if I want to talk about a number, like \Sexpr{n}, I can
refer to it by name: \Sexpr{numbers[n]}. And I can start a
sentence with it. \Sexpr{Numbers[n]} grasshoppers walked into a
bar\dots
But be careful about singular vs. plural, and so write
\Sexpr{Numbers[n]} grasshopper\Sexpr{ifelse(n>1, "s", "")}
walked\dots
```

# Keep the figures separate

```
# simple make file
mypaper.pdf: mypaper.tex Figs/fig1.pdf Figs/fig2.pdf
pdflatex mypaper
Figs/fig1.pdf: R/fig1.R
cd R;R CMD BATCH fig1.R fig1.Rout
Figs/fig2.pdf: R/fig2.R
cd R;R CMD BATCH fig2.R
```

```
\clearpage
\includegraphics{Figs/fig1.pdf}
\clearpage
\includegraphics{Figs/fig2.pdf}
```

#### **Version Control**

► Your manuscript is under version control, right?

#### **Version Control**

- Your manuscript is under version control, right?
- Local or private repository for the whole thing
  - including reviewers' reports and my response
  - PDF of submitted and final manuscript
- Snapshot of the final version as a public repository
  - I don't really want to show the whole history

### Word

- With papers led by a collaborator, I'm usually stuck with Word.
- ► But my analyses and figures are fully reproducible.
- Create an R Markdown document with the detailed results.

### Summary

- LATEX is brilliant for fine control and for equations
- Floating figures and tables can be a pain
- You use KnitR with LaTEX much the same way as you'd used it with Markdown.
- Ensure that every statistic, figure, and table in your paper are fully reproducible.
- Use xtable to make tables.
- Separate out the code for the figures.
- Use version control!