## Introduction to R for computation and analysis in ecology & evolutionary biology

## **RESOURCES**

## **Getting Started:**

First, download the program for the platform you use:

From the R home page <a href="http://www.r-project.org/">http://www.r-project.org/</a>

Navigate to the R CRAN download page < <a href="http://cran.r-project.org/mirrors.html">http://cran.r-project.org/mirrors.html</a>>

Find local mirror site (e.g. Carnegie Mellon in PA) <a href="http://lib.stat.cmu.edu/R/CRAN/">http://lib.stat.cmu.edu/R/CRAN/></a>

Download most recent compiled binary base package (to date, R v2.13.0) for: windows < <a href="http://lib.stat.cmu.edu/R/CRAN/bin/windows/base/R-2.13.1-win.exe">http://lib.stat.cmu.edu/R/CRAN/bin/macosx/R-2.13.1-win.exe</a> \* or mac os < <a href="http://lib.stat.cmu.edu/R/CRAN/bin/macosx/R-2.13.1.pkg">http://lib.stat.cmu.edu/R/CRAN/> (navigate to ubuntu, red hat etc.)</a>

Follow the menu options to install.

\*For Windows Vista or 7, additional default security 'features' can complicate installation and update of packages. To avoid these hassles, right click on the \*.exe file and choose "Install as Administrator". Then, for any session in which you want to update or install new packages, right click on the R icon and choose to "Run as Administrator." The new Windows default is to run as a user, with the Administrator 'looking over your shoulder' – this will interfere with routine operations unless you take these two steps (see <u>R for Windows FAQ</u>).

#### Also see:

Brief Introduction to R, with help tools and a tutorial, from the folks at CRAN: http://cran.r-project.org/doc/manuals/R-intro.html

Most beginners may want to start with the appendices: http://cran.r-project.org/doc/manuals/R-intro.html#A-sample-session

## **References, Resources and Other Notables:**

## BOOKS <a href="http://www.r-project.org/doc/bib/R-books.html">http://www.r-project.org/doc/bib/R-books.html</a>

- many in stacks or on course reserve at McKeldin library, some available online through UMCP library system [including entire *Use R! series* and other Springer texts]
- \* indicates recommended resource (I have not consulted many of those lacking an asterisk)
- Aitkin, M., B. Francis, J. Hinde, and R. Darnell. 2009. <u>Statistical Modelling in R.</u> Oxford University Press, Oxford, UK.
- Albert, J. 2007. Bayesian Computation with R. Springer, New York. (Use R! series)
- Andersen, P. K., and L. T. Skovgaard. 2008. <u>Regression with Linear Predictors</u>. Springer, New York. (Statistics for Biology and Health series)
- \*Bivand, R. S., E. J. Pebesma, and V. Gómez-Rubio. 2008. <u>Applied Spatial Data Analysis with R.</u> Springer, New York. *(Use R! series)*
- \*Bolker, B. M. 2008. Ecological Models and Data in R. Princeton University Press, Princeton, NJ.
- Borcard, D., F. Gillet, and P. Legendre. 2011. <u>Numerical Ecology with R</u>. Springer, New York. (Use R! series)
- Braun, W. J., and D. J. Murdoch. 2009. <u>A First Course in Statistical Programming with R.</u> Cambridge University Press, Cambridge, UK.
- Broman, K. W., and S. Sen. 2009. <u>A Guide to QTL Mapping with R/qtl</u>. Springer, New York. (Statistics for Biology and Health series)
- Chambers, J. M. 2009. <u>Software for Data Analysis</u>. Springer, New York. *(Statistics and Computing series)*
- Cook, D., and D. Swayne. 2007. <u>Interactive and Dynamic Graphics for Data Analysis</u>. Springer, New York. (*Use R! series*)
- Cowpertwait, P. S. P., and A. V. Metcalfe. 2009. <u>Introductory Time Series with R. Springer</u>, New York. (*Use R! series*)
- Crawley, M. J. 2005. Statistics: an Introduction using R. John Wiley & Sons, New York.
- \*Crawley, M. J. 2007. The R Book. John Wiley & Sons, Ltd, West Sussex, England.
- \*Dalgaard, P. 2008. <u>Introductory Statistics with R. Springer, New York</u>. *(Statistics and Computing series)*
- Everitt, B. S., and T. Hothorn. 2006. <u>A Handbook of Statistical Analyses Using R</u>. Chapman & Hall/CRC, Boca Raton, Fl.
- Everitt, B., and T. Hothorn. 2011. <u>An Introduction to Applied Multivariate Analysis with R.</u> Springer, New York. (*Use R! series*)
- Ewens, W. J., and G. Grant. 2005. <u>Statistical Methods in Bioinformatics: an Introduction</u>. Springer, New York. *(Statistics for Biology and Health series)*

- \*Faraway, J. 2005. Linear Models with R. Taylor & Francis Group, Boca Raton, FL.
- Faraway, J. 2006. Extending the Linear Model with R: Generalized Linear, Mixed Effects and Nonparametric Regression Models. Taylor & Francis Group, Boca Raton, FL.
- Foulkes, A. S. 2009. Applied Statistical Genetics with R. Springer, New York. (Use R! series)
- Gentleman, R. 2008. R Programming for Bioinformatics. Chapman and Hall, Boca Raton, FL.
- Gentleman, R., V. J. Carey, W. Huber, R. A. Irizarry, and S. Dudoit. 2005. <u>Bioinformatics and Computational Biology Solutions Using R and Bioconductor</u>. Springer, New York. (Statistics for Biology and Health series)
- Heiberger, R. M., and E. Neuwirth. 2009. <u>R Through Excel: a Spreadsheet Interface for Statistics</u>, <u>Data Analysis</u>, and <u>Graphics</u>. Springer, New York. *(Use R! series)*
- Horgan, J. 2008. <u>Probability with R: an Introduction with Computer Science Applications</u>. John Wiley & Sons, New York.
- Jones, O., R. Maillardet, and A. Robinson. 2009. <u>Introduction to Scientific Programming and Simulation Using R</u>. Chapman & Hall/CRC, Boca Raton, FL.
- \*Kéry, M. 2010. <u>Introduction to WinBUGS for Ecologists: a Bayesian Approach to Regression, ANOVA, Mixed Models and Related Analyses</u>. Academic Press, New York.
- \*Logan, M. 2010. <u>Biostatistical Design and Analysis Using R: a Practical Guide</u>. Wiley-Blackwell, Oxford, UK.
- \*Maindonald, J., and W. J. Braun. 2010. <u>Data Analysis and Graphics Using R</u>, 3rd edition. Cambridge University Press, Cambridge, UK.
- Muenchen, R. A. 2009. R for SAS and SPSS Users. Springer, New York. (Use R! series)
- \*Murrell, P. 2005. R Graphics. Chapman & Hall/CRC, Boca Raton, FL.
- Paradis, E. 2006. <u>Analysis of Phylogenetics and Evolution with R</u>. Springer, New York. *(Use R! series)*
- Peng, R. D., and F. Dominici. 2008. <u>Statistical Methods for Environmental Epidemiology with R.</u> Springer, New York. *(Use R! series)*
- Petris, G., S. Petrone, and P. Campagnoli. 2009. <u>Dynamic Linear Models with R. Springer</u>, New York. (*Use R! series*)
- \*Pinheiro, J. C., and D. M. Bates. 2000. <u>Mixed-Effects Models in S and S-PLUS</u>. Springer, New York. (Statistics and Computing series)
- Ramsay, J., G. Hooker, and S. Graves. 2009. <u>Functional Data Analysis with R and MATLAB</u>. Springer, New York. (*Use R! series*)
- Reimann, C., P. Filzmoser, R. Garrett, and R. Dutter. 2008. <u>Statistical Data Analysis Explained:</u>
  Applied Environmental Statistics With R. John Wiley & Sons, New York.
- Ritz, C., and J. C. Streibig. 2009. <u>Nonlinear Regression with R. Springer</u>, New York. *(Use R! series)*
- Rizzo, M. L. 2007. Statistical Computing with R. Chapman & Hall/CRC, Boca Raton, FL.

- Robert, C. P., and G. Casella. 2010. <u>Introducing Monte Carlo Methods with R.</u> Springer, New York. (*Use R! series*)
- \*Sarkar, D. 2008. <u>Lattice: Multivariate Data Visualization with R</u>. Springer, New York. *(Use R! series)*
- Sawitzki, G. 2009. <u>Computational Statistics: an Introduction to R</u>. Chapman and Hall, Boca Raton, FL.
- Soetaert, K., and P. M. J. Herman. 2009. <u>A Practical Guide to Ecological Modelling: Using R as a Simulation Platform</u>. Springer, New York.
- \*Spector, P. 2008. <u>Data Manipulation with R. Springer</u>, New York. (Use R! series)
- \*Stevens, M. H. 2009. A Primer of Ecology with R. Springer, New York. (Use R! series)
- Suess, E. A., and B. E. Trumbo. 2010. <u>Introduction to Probability Simulation and Gibbs Sampling</u> with R. Springer, New York. *(Use R! series)*
- Ugarte, M. D., A. F. Militino, and A. Arnholt. 2008. <u>Probability and Statistics with R.</u> Chapman & Hall/CRC, Boca Raton, FL.
- Venables, W. N., and B. D. Ripley. 2002. <u>Modern Applied Statistics with S</u>, 4th edition. Springer, New York. *(Statistics and Computing series)*
- Verzani, J. 2005. <u>Using R for Introductory Statistics</u>. Chapman & Hall/CRC, Boca Raton, FL.
- Wickham, H. 2009. ggplot2: Elegant Graphics for Data Analysis. Springer, New York. (Use R! series)
- \*Zuur, A. F., E. N. Ieno, and E. Meesters. 2009a. <u>A Beginner's Guide to R</u>. Springer, New York. (*Use R! series*)
- Zuur, A. F., E. N. Ieno, and G. M. Smith. 2007. <u>Analysing Ecological Data</u>. Springer, New York. *(Statistics for Biology and Health series)*
- \*Zuur, A. F., E. N. Ieno, N. J. Walker, A. A. Saveliev, and G. M. Smith. 2009b. <u>Mixed Effects Models and Extensions in Ecology with R</u>. Springer, New York. *(Statistics for Biology and Health series)*

# *R News*, a newsletter with announcements on new packages and tools <a href="http://cran.r-project.org/doc/Rnews/">http://cran.r-project.org/doc/Rnews/</a>

"The newsletter as a medium for communication intends to fill the gap between the R mailing lists and scientific journals: Compared with emails it is more persistent, one can cite articles in the newsletter and because the newsletter is edited it has better quality control. On the other hand, when compared to scientific journals, it is faster, less formal, and last but not least focused on R."

Examples of articles in *R News*:

- Bates, D. 2005. Fitting linear mixed models in R. R News 5:27-30.
- Bretz, F., T. Hothorn, and P. Westfall. 2002. On multiple comparisons in R. *R News* **2**:14-17.
- Canty, A. J. 2002. Resampling methods in R: the boot package. R News 2:2-7.
- Dormann, C. F., B. Gruber, and J. Fründ. 2008. Introducting the bipartite package: analysing ecological networks. *R News* **8**:8-11.
- Guha, R. 2006. Generating, using and visualizing molecular information in R. *R News* **6**:28-33.
- Hankin, R. K. S. 2007. Very large numbers in R: introducing package Brobdingnag. *R News* **7**:15-16.
- Ligges, U., and J. Fox. 2008. How can I avoid this loop or make it faster? R News 8:46-50.
- Pebesma, E. J., and R. S. Bivand. 2005. Classes and methods for spatial data in R. *R News* **5**:9-13.
- Schwartz, M. 2003. An introduction to using R's base graphics. R News 3:2-6.
- Zeileis, A., and T. Hothorn. 2002. Diagnostic checking in regression relationships. *R News* **2**:7-10.

## The R Journal supersedes R News (2008) http://journal.r-project.org/

The R Journal is the refereed journal of the R project for statistical computing. It features short to medium length articles covering topics that might be of interest to users or developers of R, including:

- Add-on packages: short introductions to or reviews of R extension packages.
- Programmer's Niche: hints for programming in R (or S).
- Hints for newcomers: Explaining aspects of R that might not be so obvious from reading the manuals and FAQs.
- Applications: examples of analyzing data with R.

## Examples of articles in *The R Journal*:

- Graves, S., S. Dorai-Raj, and R. François. 2009. sos: searching help pages of R packages. *The R Journal* **1**:56-59.
- Murrell, P. 2009. Drawing diagrams with R. The R Journal 1:15-21.
- Poisot, T. 2011. The digitize package: extracting numerical data from scatterplots. *The R Journal* **3**:25-26.

## Webpages, Blogs, and Online Resources

Agglomeration of R blogs: http://www.r-bloggers.com/

An Introduction to R, from CRAN: <a href="http://cran.r-project.org/doc/manuals/R-intro.html">http://cran.r-project.org/doc/manuals/R-intro.html</a>

Quick-R, designed especially for users of SAS, SPSS, Stata

http://www.statmethods.net/index.html

- Learning R blog: <a href="http://learnr.wordpress.com/">http://learnr.wordpress.com/</a> (recently [Aug 2009] lots of focus on data visualization in ggplot2)
- The R-wiki project: tips and tricks in wiki format: <a href="http://wiki.r-project.org/rwiki/doku.php">http://wiki.r-project.org/rwiki/doku.php</a>
- An Introduction to R: Software for Statistical Modelling & Computing, by Kuhnert, P. and B. Venables (2005). <a href="http://CRAN.R-project.org/doc/contrib/Kuhnert+Venables-">http://CRAN.R-project.org/doc/contrib/Kuhnert+Venables-</a>
  - <u>R Course Notes.zip</u>. (360 page PDF document of lecture notes in combination with the data sets and R scripts)
- USGS training workshop in R, put together by Paul Geissler and Tom Philippi:

  <a href="http://www.fort.usgs.gov/BRDScience/LearnR.htm">http://www.fort.usgs.gov/BRDScience/LearnR.htm</a>. This site contains a wealth of information and links to outside resources, as well as downloadable labs and exercises with accompanying audio files. Notes, slides, data, code and R files can be downloaded directly: ftp://ftpext.usgs.gov/pub/cr/co/fort.collins/Geissler/LearnR/</a>
- Ecological Models and Data in R, from Ben Bolker to support his book; contains code and practice exercises from the book, along with draft pdfs of each chapter <a href="http://www.zoology.ufl.edu/bolker/emdbook/">http://www.zoology.ufl.edu/bolker/emdbook/</a>
- Ecology and epidemiology in the R programming environment by Karen Garrett et al.; provides introductory exercises along with more advances routines for programming analyses in the following topics: disease progress over time, modeling dispersal gradients, spatial analysis & disease forecasting
- http://www.apsnet.org/education/AdvancedPlantPath/Topics/RModules/default.html A mini-course on using R for statistical analysis, by Dan Stoebel,

http://life.bio.sunysb.edu/~dstoebel/R/

- R Labs for Vegetation Ecologists (from the "Laboratory for Dynamic Synthetic Vegephenomenology"), includes tutorials, lab exercises, and example datasets for a course in quantitative analysis and multivariate statistics in vegetation ecology. <a href="http://ecology.msu.montana.edu/labdsv/R/">http://ecology.msu.montana.edu/labdsv/R/</a>
- "Programming in R" by John Fox, author of a number of R packages a short course towards getting started, with scripts and links <a href="http://socserv.socsci.mcmaster.ca/jfox/Courses/R-programming/index.html">http://socserv.socsci.mcmaster.ca/jfox/Courses/R-programming/index.html</a>
- "R By Example" by Ajay Shah, <a href="http://www.mayin.org/ajayshah/KB/R/index.html">http://www.mayin.org/ajayshah/KB/R/index.html</a>
- "R-Seek" a specialized Google-esque search for R functions, examples etc. http://www.rseek.org/
- "Looking at Data" workshop organized by Di Cook & Hadley Wickham explores the plyr, reshape packages for crunching data, and the ggobi program for visualizing complex data sets <a href="http://lookingatdata.com/">http://lookingatdata.com/</a>
- "A Quick and (Very) Dirty Intro to Doing Your Statistics in R" by Jarrett Byrnes http://homes.msi.ucsb.edu/~byrnes/rtutorial.html
- Information on "Sweave": a utility with base installation that allows the creation of Latex documents embedded with R code scripts and output. "The purpose is to create dynamic reports, which can be updated automatically if data or analysis change. Instead of inserting a prefabricated graph or table into the report, the master document contains the R code necessary to obtain it."
  - http://www.statistik.lmu.de/~leisch/Sweave/

And there is sooo much more......

## Help, Forums, Listservs etc.

Reference cards (printable pdfs with most essential commands and shortcuts):

- Tom Short's: <a href="http://cran.r-project.org/doc/contrib/Short-refcard.pdf">http://cran.r-project.org/doc/contrib/Short-refcard.pdf</a>
- Jonathan Baron's: http://cran.r-project.org/doc/contrib/refcard.pdf

General R-Help listserv <a href="http://tolstoy.newcastle.edu.au/R/">http://tolstoy.newcastle.edu.au/R/</a> (people here can be snippy if you do not first make an honest attempt to solve a problem before posting. Read up on etiquette before posting)

Ecology-specific list, more friendly.... <a href="https://stat.ethz.ch/mailman/listinfo/r-sig-ecology">https://stat.ethz.ch/mailman/listinfo/r-sig-ecology</a>
.....and many others for interest groups <a href="https://stat.ethz.ch/mailman/listinfo">https://stat.ethz.ch/mailman/listinfo</a>
R forum on Nabble: <a href="http://www.nabble.com/R-f13819.html">http://www.nabble.com/R-f13819.html</a> (also find eco-sig on Nabble2: <a href="http://n2.nabble.com/r-sig-ecology-f471788.html">http://n2.nabble.com/r-sig-ecology-f471788.html</a>)

## **Text Editors**

Tinn-R is a free, simple, stand-alone but efficient replacement for the basic code editor provided by Rgui. Many people find this *very* helpful while learning the R syntax and basic commands <a href="http://www.sciviews.org/Tinn-R/">http://www.sciviews.org/Tinn-R/</a>

SciViews-R is a series of packages providing a GUI API on top of R, and integrating more completely with R <a href="http://www.sciviews.org/SciViews-R/index.html">http://www.sciviews.org/SciViews-R/index.html</a>

For linux users, ESS + Emacs provide script editing tools ("Emacs Speaks Statistics: A Multiplatform, Multipackage Development Environment for Statistical Analysis") <a href="http://ess.r-project.org/">http://ess.r-project.org/</a>

ESS can be implemented in windows through XEmacs, another open-source text editor

<a href="http://socserv.mcmaster.ca/jfox/Books/Companion/ESS/">http://socserv.mcmaster.ca/jfox/Books/Companion/ESS/</a> and <a href="http://www.xemacs.org/">http://www.xemacs.org/</a>
RStudio™ is a new integrated development environment (IDE) for R that combines an intuitive</a>

user interface with powerful coding tools. <a href="http://www.rstudio.org/">http://www.rstudio.org/</a>

## Packages http://lib.stat.cmu.edu/R/CRAN/web/packages/

The R distribution comes with the following packages (a *package* is a contributed bundle of code and procedures, usually centered on a theme – aside from the core capabilities of the pprogram [often in C++] most R functions and datasets are stored and implemented in *packages*). This is not to be confused with a *library* which is a directory or sub-directory of packages. Only when a package is loaded are its contents available. This is done both for efficiency (the full list would require astounding memory and would take longer to search than a subset), and to aid package developers, who are protected from name clashes with other code.

Type: "library()" or "require()" with the package name inside the parentheses

## base

Base R functions (and datasets before R 2.0.0).

## datasets

Base R datasets (added in R 2.0.0).

## grDevices

Graphics devices for base and grid graphics (added in R 2.0.0).

## graphics

R functions for base graphics.

## grid

A rewrite of the graphics layout capabilities, plus some support for interaction.

#### methods

Formally defined methods and classes for R objects, plus other programming tools, as described in the Green Book.

## splines

Regression spline functions and classes.

stats

R statistical functions.

stats4

Statistical functions using S4 classes.

tcltk

Interface and language bindings to Tcl/Tk GUI elements.

tools

Tools for package development and administration.

utils

R utility functions.

# <u>Frequently used add-on packages</u> (from CRAN; also others from Omegahat, Bioconductor...) [as of 7-Aug-2011: the CRAN package repository features 3195 packages]

#### ade4

Analysis of Ecological Data: Exploratory and Euclidean methods in Environmental sciences (also GUI: ade4TkGUI)

## **AICcmodavg**

Model selection and multimodel inference based on (Q)AIC(c)

#### BiodiversityR

GUI for biodiversity and community ecology analysis

#### bbmle

Tools for general maximum likelihood estimation

boot

Bootstrap R (S-Plus) Functions (Canty)

car

Companion to Applied Regression

## ecodist

Dissimilarity-based functions for ecological analysis

## emdbook

Ecological models and data (Bolker's book support)

#### geoR

Analysis of geostatistical data

## geoRglm

a package for generalised linear spatial models

## ggplot2

An implementation of the Grammar of Graphics

#### lattice

**Lattice Graphics** 

#### lavaan

Latent Variable Analysis

#### lme4

Linear mixed-effects models using S4 classes

#### maanova

Tools for analyzing Micro Array experiments

#### maps

**Draw Geographical Maps** 

## matlab

MATLAB emulation package

#### nlme

Linear and Nonlinear Mixed Effects Models

#### ouch

Ornstein-Uhlenbeck models for phylogenetic comparative hypotheses.

#### **PHYLOGR**

Functions for phylogenetically based statistical analyses

#### plotrix

Various plotting functions

## plyr

Tools for splitting, applying and combining data

## qgen

Quantitative Genetics using R

## **R2WinBUGS**

Running WinBUGS and OpenBUGS from R / S-PLUS

#### Rcmdr

A platform-independent basic-statistics GUI (graphical user interface) for R, based on the **tcltk** package.

#### **RcolorBrewer**

ColorBrewer palettes

## **RMySQL**

R interface to the MySQL database

## reshape

Flexibly reshape data

## scatterplot3d

3D Scatter Plot

#### sem

**Structural Equation Models** 

## spdep

Spatial dependence: weighting schemes, statistics and models

vegan

Community Ecology Package

zipcode

U.S. ZIP Code database

## How do I find the package I need?

CRAN task views – narrative organization of packages around conceptual themes <a href="http://cran.r-project.org/web/views/index.html">http://cran.r-project.org/web/views/index.html</a>

- Bayesian (Bayesian Inference)
   <a href="http://lib.stat.cmu.edu/R/CRAN/web/views/Bayesian.html">http://lib.stat.cmu.edu/R/CRAN/web/views/Bayesian.html</a>
- Environmetrics (Analysis of ecological and environmental data)
   <a href="http://cran.r-project.org/web/views/Environmetrics.html">http://cran.r-project.org/web/views/Environmetrics.html</a>
- Graphics (Graphic displays & dynamic graphics & graphicdevices & visualization) <a href="http://lib.stat.cmu.edu/R/CRAN/web/views/Graphics.html">http://lib.stat.cmu.edu/R/CRAN/web/views/Graphics.html</a>
- Multivariate (Multivariate statistics) <u>http://lib.stat.cmu.edu/R/CRAN/</u>
- Spatial (Analysis of spatial data) http://lib.stat.cmu.edu/R/CRAN/web/views/Spatial.html

(or use r-seek, or the forums & blogs above)