Good Programming Practice

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This talk is . . .

- on R language programming
- my own view, and hence biased
- hopefully helping userR s to improve
- somewhat entertaining ?

This talk is . . .

- not a one or two days' course (from Insightful or . . .)
- not systematic and comprehensive like a book such as Chambers "Programming with Data" (1998),

Venables + Ripley "S Programming" (2000),

Uwe Ligges "R Programmierung" (2004) [in German]

- not for complete newbies
- not really for experts either
- not about C (or Fortran or C++ \ldots) $\mathsf{programming}$
- not always entirely serious ©

"Good Programming Practice"

- "Good", not "best practice"
- "Programming" using R:



"Practice": What I've learned over the years, with examples; but

software (R 1.9.x as opposed to S-plus 3.4) have improved much! but "The times they are a-changing" : Speed, memory and the

- $\star
 ightarrow$ many 'tricks' no longer needed (nor would some still apply)
- * tradeoff speed ←→ memory is shifting:

even in C), but Saving intermediate results may no longer be more efficient (not

are still nicer to read and maintain

Rule 1: Work with Source files!

Source files aka 'Scripts' (but more).

- obvious to some,
- not intuitive for useRs used to GUIs
- Paradigm (shift):

their source! Do not edit objects or fix() them, but modify (and re-evaluate)

In other words (from the ESS manual):

The source code is real

The objects are realizations of the source code

Programming = ?

Is Programming

- like car driving, something you learn and then know to do?
- a scientific process to be undertaken with care?
- a creative art?
- ightarrow all of them, but not the least an | art Your 'programs' should become works of art

In spite of this, Guidelines or Rules for Good Programming Practice:

Use a smart editor:

- \star syntax-aware: parentheses matching " $(\ ..\)]"$ highlighting (differing fonts & colors syntax dependently)
- able to evaluate R code, by line, whole selection (region) function, and the whole file
- ★ command completion on R objects

such as

- Emacs + ESS ('Emacs Speaks Statistics') WinEdt + R-WinEdt (MS Windows) (all platforms)
- Alpha (Mac)
- Kate + R-Kate (KDE: Linux etc), (?), .
- . (there are more)

Good source code

- 1a. is well readable by humans
- 1b. is as much self-explaining as possible

 ${ar N} = \{Rule\ 1: \ ar Nork\ with\ Source\ files\}$

well maintainable $(Rule\ 2\ ext{cont.})$

- 2d. Do use comments copiously! (about every 10 lines) We recommend
- '##' for the usually indented comments,
- '#' for end-of-line comments (ESS: align to comment-column = 40), and

'###' for the (major) beginning-of-line ones.

2e. Even better (but more laborious): Use <u>Sweave</u> (or another "weave & tangle" system such as noweb)

Rule 2: Good source code is well maintainable

(hence 'well readable' ('1a.' above))

- 2a. Do indent lines! (i.e. initial spaces)
- 2b. Do use spaces!

e.g., around <-, =, <=,..., +, -,....; after ', '; before '{'

2c. Do wrap long lines!

(at column 70–80; \longrightarrow do not put the editor in fullscreen mode)

... well readable code and the assignment operator

Beware: this is very controversial, and I am severely biased!

Some (including me, but by far not all!) believe that using \leftarrow instead of = leads to far easier readable code:

'=' is also used much in function *calls* (incl.

list(a=.., b=..) and definitions (argument defaults) and

stands out visually

and can be marked up (by font/color) quite easily in syntax-aware editors or pretty-printers, something really hard to achieve with =

\end{really-controversial}

..... well maintainable

$(Rule\ 2\ (\mathsf{end}))$

 $2 \times 100 \text{ No matter sections}$ for function argument names, and if available also for new functions and/or classes.

But do not impose rigid rules here, since

- 1. programming is art (©)
- 2. The S language has a long history with many contributers: We will live with some historical misnomers and have sometimes deprecated and replaced others.
- 2 . . . Modularity, Clarity: "refine and polish your code" (V&R):

 More on "well maintainable" in the following rules

[2

Rule 3: Do read the documentation

and read it again and again . . . (and—only then—submit bug reports ©)

- 1. Books: V&R's, ...
- The manuals "An Introduction to R" (early),
 "Writing R Extensions" (when you're mutating from
 useR to programmeR)
- 3. The help pages! and try their examples (in ESS)
- . Do use help.search()!! (and read its help page to find out about fuzzy matching and the agrep argument!)

Rule 4: Do learn from the masters

An art is learned from the master artists:

Picasso, Van Gogh, Gauguin, Manet, Klimt . . .

John Chambers, Bill Venables, Bill Dunlap, Brian Ripley, Luke Tierney, . . .

Read others' source

Read the source - of packages

Nota bene: The R source of a package (in *source* state) is inside < pkg > /R/*.R, and *not* what you get when you print the function! e.g., plot or dev.print from package:graphics.

If the package source is not easily available to you, $and\ if$ the package is not installed "binary", e.g.,

system.file("../graphics/R/graphics"))

gives you the name of a file with all the R source files concatenated Inside this file, you'll find the real source, e.g., of dev.print.

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Rule 5: Do not Copy & Paste!

because the result is *not* well maintainable:

Changes in one part do not propagate to the copy!

- a) write functions instead
- b) break a long function into several smaller ones, if possible
- c) Inside functions: still Rule 5: "Do not Copy & Paste!!"
- ightarrow write local or (package) global helper functions
- \longrightarrow use many small helper functions in NAMESPACE
- d) Possibly use

```
if(A) A.expression else B.expr
```

 $\mathsf{if}(\mathsf{A})$ $\mathsf{A}.\mathsf{expression}$ else $\mathsf{B}.\mathsf{expression}$

instead of

 $\begin{array}{ll} \textbf{if} (A) & \textbf{mat} [\texttt{complicated} \ , \ \texttt{compcomp}] <- \ A. \ \textbf{expression} \\ \textbf{else} & \textbf{mat} [\texttt{complicated} \ , \ \texttt{compcomp}] <- \ B. \ \textbf{expression} \\ \end{array}$

Ŭ

Rule 7: Test your code!

- a. Carefully write (small) testing examples, for each function ("modularity", "unit testing")
- b. Next step: Start a 'package' via package.skeleton(). This allows (via R CMD check $\langle pkg \rangle$)
- auto-testing (all the help pages examples).
 use example (your_function)
- specific testing (in a ./tests/ subdirectory, with or without strict comparison to previous results)
- <u>documenting</u> your functions (and data, classes, methods): takes time, but almost always leads you to improve your code!

Rule 6: Strive for clarity and simplicity

first! . . . and second . . . and again e.g., think about naming of intermediate results ("self-explainable") but use short names for extended formulae

V.&R: "Refine and polish your code in the same way you would polish your English prose" (using 'dictionary': your reference material)

ightarrow modularity ("granularity")

Optimization: much much later, see below

Test your code! (Rule 7 cont.)

c. Use software tools for testing: Those of R CMD check are in the standard R package tools.

Advanced (at version 0.0-0): Luke Tierney's codetools http://www.stat.uiowa.edu/~luke/R/codetools/

Optimizing code

Citing from V&R's "S Programming" (p.172)

much quoted rules (on 'code optimization'): Jackson (1975) "Principles of Program Design"

- Rule 1 Don't do it.
- Rule 2 (for experts only) Don't do it yet—that is not until you have a perfectly clear and unoptimized solution.

method' to which we might add 'to the right problem by an efficient

Optimizing code - 2

- 1. Really do clean up and test your code and think twice before you even start contemplating optimizing the code . . .
- 2. do measure, not guess:

Date: 28 Feb 2001 From: Thomas Lumley (tlumley@u.washington.edu)

R-help

There are two fundamental principles of optimisation

- 1) Don't do it unless you need it
- 2) Measure, don't guess, about speed

 $|\operatorname{gc}()|$ you have all the information you need. $\ldots \ldots$ memory intensive is to try it and see. Between Rprof(), unix.time() and The simple way to answer questions about which way is slower/more

"Case studies"

others, how to improve, for a matrix M on Case study 0 - The small features inside cov2cor(): Among

- 1. diag(a) %*% M
- 2. M %*% diag(b)

Case study 1: function() returning function

Good examples:

- help(ecdf), example(ecdf) (also splinefun(), etc)
- 2. The 'polynom' package by Bill Venabels et al polynomials library(help=polynom) has an as.function() method for
- 3. This talk: The 'scatterplotd3d' package

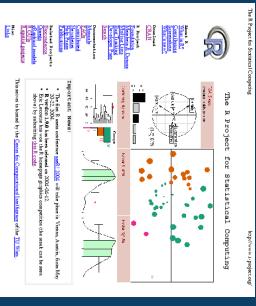
library(scatterplot3d)

more modern: library(rgl)

?scatterplot3d

at the Examples one, examples 5 and 6 Look at the $\underline{\text{Value}}$: section (ESS: "s v" (skip to $\underline{\text{value}}$), and then

Case study 2: The R Homepage Graphic Winner



Specific Hints, Tips:

- 1. Subsetting ("[..]"):
- (a) Matrices, arrays (& data.frames): Instead of x[ind ,], use x[ind, , drop = FALSE] !
- (b) tricky because of NAs

 $x[, \dots]$ For data frames (and vectors): Use subset(x, ...) instead of

which() Or, inside "[\dots]", often use match() or (a wrapper) %in% and

- 2. Not x == NA but **is** .na(x)3. Use '1:n' only when you *know* that n is positive: Instead of 1:length(obj), use seq(along = obj)

Case study 3: New boxplot() features

(in 'R-devel' or "R version 2.0.0 (<u>unstable</u>)"):

Using "local functions" for modularity and clarity

An e-mail exchange MM with Arni Magnusson (UW, Seattle)

```
4. Do not grow objects:
                                                                                                                                                                                                                                                                       À
                                                                                              instead of row by row:
                                                                                                                        and if n can be large, it will pay off creating the transpose, column by column
for(i in 1:n) {
   tmat[, i ] <- long.computation(i, .....)</pre>
                                                       tmat <- matrix (0., k, n)
                                                                                                                                                                                      for(i in 1:n) {
  rmat[i, ] <- long.computation(i, ....)</pre>
                                                                                                                                                                                                                                                                                                                                                                                     rmat <- NULL
                                                                                                                                                                                                                                                                                                                                                               for(i in 1:n)
                                                                                                                                                                                                                                             rmat <- matrix (0., n, k)
                                                                                                                                                                                                                                                                                                                                  rmat <- rbind(rmat, long.computation(i, .....))</pre>
```

5. Use lapply, sapply, the new mapply (Apply a function to multiple arguments), or sometimes the replicate() wrapper:

 $\begin{array}{lll} \textbf{sample} & < & \texttt{replicate} \ (1000 \, , \ \textbf{median} \ (\ \textbf{rt} \ (100 \, , \ \textbf{df} \! = \! 3))) \\ \textbf{hist} \ (\ \textbf{sample}) \end{array}$

- 6. Use with (<d.frame>,) and do not attach data frames
- 7. TRUE and FALSE, not 'T' and 'F'!
- 8. know the difference between '|' vs '||' and '&' vs '&&' and inside **if** (....) almost always use '||' and '&' vs '&&'!
- 9. use which.max(), . . . , findInterval()
- 10. Learn about 'Regular Expressions': ?regexp etc
- 11. (more if time permitted)

Handouts will be available from the useR! web page by next week.

That's all Folks!

.. wishing you joy in R Programming!

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