History and Ecology of R

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International Agency for Research on Cancer

ANF R avancé et performances
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Pre-history

Before there was R, there was S.
The S language

Developed at AT&T Bell laboratories by Rick Becker, John Chambers, Doug Dunn, Paul Tukey, Graham Wilkinson.

<table>
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<tbody>
<tr>
<td>Version 2</td>
<td>1980–1988</td>
<td>Unix; Macros, Interface Language</td>
</tr>
<tr>
<td></td>
<td>1984–</td>
<td>General outside licensing; books</td>
</tr>
<tr>
<td>Version 3</td>
<td>1988-1998</td>
<td>C-based; S functions and objects</td>
</tr>
<tr>
<td></td>
<td>1991–</td>
<td>Statistical models; informal classes and methods</td>
</tr>
<tr>
<td>Version 4</td>
<td>1998</td>
<td>Formal class-method model; connections; large objects</td>
</tr>
<tr>
<td></td>
<td>1991–</td>
<td>Interfaces to Java, Corba?</td>
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</tbody>
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The “Blue Book” and the “White Book”

Key features of S version 3 outlined in two books:

  - Functions and objects
- Chambers and Hastie (Eds), *Statistical Models in S* (1992)
  - Data frames, formulae

These books were later used as a prototype for R.
“We wanted users to be able to begin in an interactive environment, where they did not consciously think of themselves as programming. Then as their needs became clearer and their sophistication increased, they should be able to slide gradually into programming.” – John Chambers, *Stages in the Evolution of S*

This philosophy was later articulated explicitly in *Programming With Data* (Chambers, 1998) as a kind of mission statement for S

*To turn ideas into software, quickly and faithfully*
The “Green Book”

Key features of S version 4 were outlined in Chambers, *Programming with Data* (1998).

- S as a programming language
- Introduced formal classes and methods, which were later introduced into R by John Chambers himself.
S-PLUS

- AT&T was a regulated monopoly with limited ability to exploit creations of Bell Labs.
- S source code was supplied for free to universities
- After the break up of AT&T in 1984 it became possible for them to sell S.
- S-PLUS was a commercially available form of S licensed to Statistical Sciences (later Mathsoft, later Insightful) with added features:
  - GUI, survival analysis, non-linear mixed effects, Trellis graphics, ...
The Rise and Fall of S-PLUS

- 2008. Insightful sold to TIBCO. S-PLUS incorporated into TIBCO Spotfire.
How R started, and how it turned into an S clone
The Dawn of R

- Ross Ihaka and Robert Gentlemen at the University of Auckland
- An experimental statistical environment
- Scheme interpreter with S-like syntax
  - Replaced scalar type with vector-based types of S
  - Added lazy evaluation of function arguments
- Announced to s-news mailing list in August 1993.
A free software project

- June 1995. Martin Maechler (ETH, Zurich) persuades Ross and Robert to release R under GNU Public License (GPL)
- March 1996. Mailing list *r-testers* mailing list
  - Later split into three *r-announce*, *r-help*, and *r-devel*.
- Mid 1997. Creation of *core team* with access to central repository (CVS)
- 1997. Adopted by the GNU Project as “GNU S”. 

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The draw of S

“Early on, the decision was made to use S-like syntax. Once that decision was made, the move toward being more and more like S has been irresistible”
– Ross Ihaka, R: Past and Future History (Interface ’98)

R 1.0.0, a complete and stable implementation of S version 3, was released in 2000.
Packages

- Comprehensive R Archive Network (CRAN) started in 1997
  - Quality assurance tools built into R
  - Increasingly demanding with each new R release
- Recommended packages distributed with R
  - Third-party packages included with R distribution
  - Provide more complete functionality for the R environment
  - Starting with release 1.3.0 (completely integrated in 1.6.0)
Growth of CRAN

Source: Dataset CRANpackages in package Ecdat
The present era is characterized by

- A mature R community
- Large penetration of R in the commercial world ("data science", "analytics", "big data")
- Increasing interest in the R language from computer scientists.
Community

- UseR! Annual conference
  - Alternating between Europe and N. America
- R Journal.
  - Journal of record, peer-reviewed articles, indexed
  - Also Journal of Statistical Software (JSS) has many articles dedicated to R packages.
- Migration to social media
  - Stack Exchange/Overflow, Github, Twitter (#rstats)
Much important R infrastructure is now in package space

Source: www.kdnuggets.com/2015/06/top-20-r-packages.html
Commercial R

Several commercial organizations provide commercial versions of R including support, consulting, ...

- RStudio (2010–)
- Mango Solutions
Validation and Reliability

- *R: Regulatory Compliance and Validation Issues* guidance document by The R Foundation
- ValidR by Mango Solutions
- MRAN, a time-stamped version of CRAN
  - Allows analysis to be re-run with exactly the same package versions at a later date.
  - Used by Revolution R Open
**Attack of the Clones (and forks)**

<table>
<thead>
<tr>
<th>Name</th>
<th>Implementation</th>
<th>Commercial sponsor</th>
<th>Open source</th>
</tr>
</thead>
<tbody>
<tr>
<td>pqR</td>
<td>C fork</td>
<td></td>
<td>Yes</td>
</tr>
<tr>
<td>CXXR</td>
<td>C++ fork</td>
<td>Google</td>
<td>Yes</td>
</tr>
<tr>
<td>ORBIT</td>
<td>C fork</td>
<td>Huawei</td>
<td>Yes</td>
</tr>
<tr>
<td>Renjin</td>
<td>Java</td>
<td>BeDataDriven</td>
<td>Yes</td>
</tr>
<tr>
<td>FastR</td>
<td>Java (Truffle/Graal)</td>
<td>Oracle</td>
<td>Yes</td>
</tr>
<tr>
<td>Riposte</td>
<td>C++</td>
<td>Tableau Research</td>
<td>Yes</td>
</tr>
<tr>
<td>TERR</td>
<td>C++</td>
<td>TIBCO</td>
<td>No</td>
</tr>
</tbody>
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A number of projects have looked improving the efficiency of R, either by forking the original codebase or by re-implementing R.
The R Foundation for Statistical Computing

A non-profit organization working in the public interest, founded in 2002 in order to:

- Provide support for the R project and other innovations in statistical computing.
- Provide a reference point for individuals, institutions or commercial enterprises that want to support or interact with the R development community.
- Hold and administer the copyright of R software and documentation (This never happened)
In 2015, a group of organizations created a consortium to support the R ecosystem:

**R Foundation**  A statutory member of The R Consortium

**Gold members**  Microsoft, RStudio

**Silver members**  TIBCO

**Bronze members**  Alteryx, Google, Hewlett Packard, Ketchum Trading LLC, Mango Solutions, Oracle
The Future

“Prediction is very difficult, especially about the future”
– variously attributed to Niels Bohr, Piet Hein, Yogi Bera
Trends

We cannot make predictions, but some long-term trends are very visible:

- Average age of R Core Team?
- Younger R developers more closely associated with industry than academia
- R Consortium provides mechanism for substantial investment in R infrastructure
R language versus R implementation

- R has no formal specification
- R language is defined by its implementation ("GNU R")
- Long-term future of R may depend on formal specification of the language, rather than current implementation.
Simply start over and build something better

The $x$ in this function is randomly local or global

```r
f = function() {
  if (runif(1) > .5)
    x = 10
  x
}
```

“In the light of this, I’ve come to the conclusion that rather than “fixing” R, it would be better and much more productive to simply start over and build something better” – Ross Ihaka, Christian Robert’s blog, September 13, 2010
Ross Ihaka and Duncan Temple Lang propose a new language built on top of common lisp with:

- Scalar types
- Type hinting
- Call-by-reference semantics
- Use of multi-cores and parallelism
- More strict license to protect work donated to the commons
Julia (www.julialang.org)

“In Julia, I can build a package that achieves good performance without the need to interface to code written in C, C++ or Fortran – in the sense that my package doesn’t need to require compilation of code outside that provided by the language itself.

It is not surprising that the design of R is starting to show its age. Although R has only been around for 15-18 years, its syntax and much of the semantics are based on the design of “S3” which is 25–30 years old”

– Doug Bates, message to R-SIG-mixed-models list, December 9 2013
Resources

- Chambers J, Stages in the Evolution of S
- Becker, R, A Brief History of S
- Chambers R, Evolution of the S language
- Ihaka, R, Temple Lang, D, Back to the Future: Lisp as a Base for a Statistical Computing System