UNIVERSITY OF COPENHAGEN

DEPARTMENT OF BIOSTATISTICS



Faculty of Health Sciences

What we wish people knew more about when working with R

Peter Dalgaard Dept. of Biostatistics University of Copenhagen

- R has entered the mainstream, and a great many research projects in statistics now involve R programming or the writing of R packages
- Young researchers will typically need to be taught about relatively advanced aspects of R
- Consider planning, say, an advanced course on R programming
- Much will be pretty straightforward
- Not necessarily easy, but you know that you need to take the students from A to B along a path with certain twist and turns and stumbling stones



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- At some points, however, you find yourself facing a wall of ignorance
- There are things students just don't know the first thing about
- ▶ Say, you want to show how to speed up a slow piece of R code
- So you explain that they should rewrite parts of the code in C, compile it, and link it dynamically
 - ▶ What is C?
 - What is a compiler?
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- In order to explain Z, I must first tell them about Y, but that won't make sense to them because they never heard of X, etc.
- This is getting worse! A generic trend in computing is that more and more functionality gets hidden away.
- In some senses, this may be a good trend, making computers accessible by more people
- However, from a scientific point of view, it makes it harder to understand what is going on inside a computer
- (Car analogy: Making cars simpler and safer to operate does not make better car engineers)



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Is education deteriorating?

- Not really. If we look back, people who were into statistical computing were often not formally educated.
- Some people had switched from Computer Science to Statistics
- Others came out of the "Commodore 64" generation (typically teenagers from the 80s and 90s)
- At about the time R took off, there was the IT explosion and the whole Unix/Linux/Open Source culture around the turn of the millennium
- We are now moving from a relatively tight-knit subculture to a position in the mainstream, and this requires new thinking

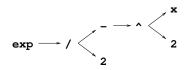
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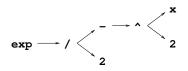
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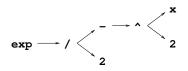
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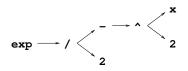
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A catalogue of ignorance

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- Interfacing to C
- Floating point issues
- Computational linear algebra
- Finer points in computer languages
- Obvious pitfall: Trying to explain in a 40 minute talk what I claim requires a significant chunk of a largish course
- Pitfall no. 2: The grumpy old man...
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- Needed in plotmath, model formulas
- Names and syntactical names
- ▶ Tokenizer, lexical analysis, (regular expressions)
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- Deeper issue: knowledge of bit-level storage and hardware
- IEEE standards
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- Modular programs, linking,.libraries
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- Memory consumption
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Need it for Rd format files

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- General idea that text is a computable quantity
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Programming language taxonomy

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- Late and early binding
- OOP concepts
- Lazy evaluation
- A better theoretical overview should help explaining why R sometimes behaves "strangely"



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R behaving badly

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curve(ll)
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- Project-based studying lets students satisfy their own needs, but it has the same issue as teaching: The sudden need for a large amount of knowledge in s short time
- It may well be the case that we need to rethink topics as part of a somewhat longer story, e.g. text processing, then lexical analysis, then parsing, then CAR et al.
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