

A Few Remarks About Debugging in R

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 - ▶ I like to use the same text editor for everything I do.

My Biases (cont'd.)

- ▶ Debugging is one of the most underrated software skills.

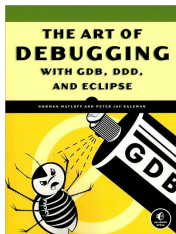
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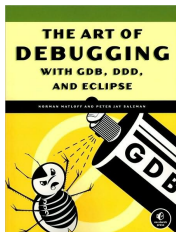
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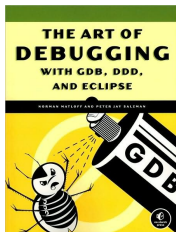


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- ▶ R's debugging tools have been its weakest link.
- ▶ I thus am delighted that REvolution Computing is stepping into the void. I hope they or others go to open source/cross platform.

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- ▶ Ability to debug parallel code (next slide).

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- ▶ Screen footprint problem: If have n processes, that means n windows. Problem is compounded if use GUI.
- ▶ Many existing parallel R platforms make parallel debugging very difficult, due to lack of terminals for the processes. (One of my Rdsm modes allows it.)

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 - ▶ Top-down approach: When debugging **f()** which calls **g()**, don't follow calls to **g()** at first. Check first whether the return value of **g()** is correct.
 - ▶ Use binary search: Say you have a syntax error that's baffling you. Comment-out half the code of the function, to see if the error disappears. Then comment-out half of the half that triggers the error, etc.

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- ▶ Use a good text editor, with syntax highlighting, matching for braces etc., infinite undo, comment/uncomment, etc. This saves typing, so you are distracted less from the task at hand.