Practices for Scientific Computation Principles, Corollaries, and Simple Applications

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https://github.com/psanan/practices_for_scientific_computation

Setting

Principles

"You will forget"

"Good practices are good science"

"Numerical codes are special"

"Less."

Practices

The art of the README Good login files Asking good technical questions Using version control

Setting

Motivation

- Scientists rely, increasingly, on computational tools, yet often feel frustrated by them
- ► People often repeat the same mistakes as they develop workflows based on short-term goals
- ► Later, I will tell you that you need to learn about version control (git). Why should you bother?

Assumed Audience

- You're a scientist who works with numerical, computational tools (simulation, data processing and analysis, etc.), beyond the (exclusive) use of commercial packages
- You know what "the command line" is
- ▶ You're interested in using the available tools more efficiently

Outline and Scope

- ► I will attempt to provide you with a few principles that I feel are often "learned the hard way"
- ▶ I will present a few concrete applications of these principles, focusing on common tasks often considered boring.

Beating the "Greedy Algorithm"

- Smart people working quickly tend to make similar choices when presented with the available tools
- ▶ Often, these work well, but not always, because they make "locally optimal", not "globally optimal" choices
- ► The principles that follow are about adding rules to try to avoid getting trapped in "local minima".

Principles

"You will forget"

Principle: "You will forget"

- After a given project leaves your immediate attention, you will remember few of the technical details
- The Greedy Algorithm:
 - Only consider the exact, current use case
 - Don't document the boring details
- Observations
 - Your own code, from a few months ago, looks like a stranger's code
 - Context switching has large overheads
 - "Getting it to run again" is often a very time-consuming and inspiration-sucking exercise.

Corollaries: "You will forget"

- State is your enemy
- Encapsulation is essential
- Document, but avoid documentation which you have to remember to update

"Good practices are good science"

Principle: "Good practices are Good Science"

- ► Treating computational tools as first-class parts of the scientific process is effective in increasing the quality of scientific output.
- ► The Greedy Algorithm
 - Treat computational methods as simply another tool in the toolbox, applying when needed
 - When presenting results, consider computational details to be uninteresting and trivial
- Observations
 - ► The "Third Pillar of Science" concept is a useful idea
 - It can be surprisingly difficult to reproduce computational results (including your own)
 - Applying scientific ethics to the use of computational tools can be effective

Corollaries: "Good practices are Good Science"

- Challenge your code like you challenge ideas: try to prove it wrong. Get rid of things that don't work.
- The value of clarity, reproducibility and transparency extends to your code
- Document your work as you progress

"Numerical codes are special"

Principle: "Numerical codes are special"

- Numerical codes present distinct challenges compared to both general computation / computer science, and general scientific endeavors; these need to be dealt with directly.
- ► The Greedy Algorithm:
 - If it seems to work, good enough
- Observations
 - ► Floating-point arithmetic, particularly in parallel, requires special thought
 - Seemingly-simple code can rely on a great deal of mathematical or physical expertise
 - ► Numerical methods are often not robust to seemingly-minor changes in the problem setting

Corollaries: "Numerical codes are special"

- ▶ "If you see something strange- there is a bug!" ¹
- ▶ It pays to learn the "Numerical facts of life" ², for example the fundamental limits of finite-precision arithmetic.
- Numerical codes need (easy-to-run) tests
- "Don't believe it until you can run it"3

¹Taras Gerya, "Numerical Geodynamic Modelling", Cambridge University Press, 2009

²Ed Beuler, "PETSc for Partial Differential Equations" (coming from SIAM Press)

³Matt Knepley (?)

"Less."

Principle: "Less."

- Complexity and volume of information inevitably creates work
- The Greedy Algorithm
 - Copy-paste instead of encapsulating and re-using
 - Multiple copies of the same data
 - Leave commented-out code, just in case
- Observations
 - It's easier to write code than read it
 - Unforeseen problems and difficult bugs become much more prevalent, the more complicated a system is
 - ► Code "rots"
 - ► Hierarchy, encapsulation and data-hiding make big things small

Corollaries: "Less."

- ► Treat code as a liability, as much as an asset
- Look out for ways to delete and encapsulate things
- ▶ Try to present work to other people in chunks of less than a "screen".

Practices

How can we apply our principles?

- 1. "You will forget"
- 2. "Good practices are good science"
- 3. "Numerical codes are special"
- 4. "Less."

The art of the README

Practice: The art of the README

- ► The common README file in the root directory of most software projects is a great example of application of "You will forget", and "Less.".
- ► This is your one and only change to say something to people when they first come across your project.
- A quickstart is incredibly valuable
 - Get a user to a "working" state as quickly as possible
 - Show, don't explain
 - Have copy-paste-able commands (test them, exactly, on more than one system)
 - Some expected output is very helpful

Good login files

Practice: Good login files

- "You will forget":
 - Avoid state
 - Be very careful about adding things to PATH, PYTHONPATH, LD_DYNAMIC_LIBRARY_PATH, etc.
 - Explicit (define helper functions) is better than implicit (hard-coding environment variables)
- "Less.": Use a single set of login files on all systems, for all projects
- "Good practices are good science": login files are very often undocumented state for your experiments.

Asking good technical questions

Practice: Asking good technical questions

- "You will forget": You will very likely come back to this question and answer again, later. Write it clearly.
- "Less.": Try to describe the problem as briefly as you can, while still being accurate. This very often leads you to the answer, yourself ("rubber ducking").
- "Numerical code is special":
 - Reproducibility is essential
 - "Bisectability" is important a similar, working state is invaluable
- "Good practices are good science":
 - State your assumptions to avoid the XY problem
 - Ask your question in public, so that others can learn

For more, see my post, "It doesn't work!", on the EGU blog.

Using version control

Practice: Using version control

Good use of version control helps satisfy all of our principles:

- "You will forget": keep track of past states, build repositories with documentation
- "Good practices are good science": Identify exact versions of software, distribute code, collaborate on code.
- "Numerical codes are special": Manage working states effectively, easily move to new machines
- "Less.": maintain a single, canonical history of a project.

For these and many other reasons, there is an entire git tutorial available at github.com/psanan/git_tutorial.