

# Effective Programming Practices for Economists

## 18. Programming environments and programming languages

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## Development environments

*A development environment is the whole collection of tools that people use to create software, not just a few tools that are specific to a particular programming language. Examples of these tools are version control tools [...], build tools [...], and bug tracking tools.*

Doar (2005)

- My guess is that most academic economists never thought consciously more than a couple of hours about these issues
  - So you're at the top of the distribution already
- Yet the choices, made consciously or not, can make a project break or succeed
- Doar (2005) is slightly outdated on specific tools, but still highly recommended!

# Research / development environments

Task	Naïve choice	Alternatives
Typesetting	Word	LaTeX, Scientific Workplace, LyX
Bibliography management	None or edit .bib-file directly	JabRef, Bibdesk
Source code editing	Word, Notepad	SublimeText, TextMate, WinEdt, Emacs, Vim, IDEs
Version control	None / manually	Git, Subversion, Mercurial
Debugging	None / print	GDB, PDB, IDEs
Issue tracking	None / pen+paper	Redmine, Sourceforge, GoogleCode, github, bitbucket
Testing	None	nose, Matlab xUnit / built-in (R2013a+)
Building the project	None / master do file or similar	Waf, SCons, make
Documenting the code	None	Sphinx, m2html, Sweave

# Choice of tools for mundane tasks

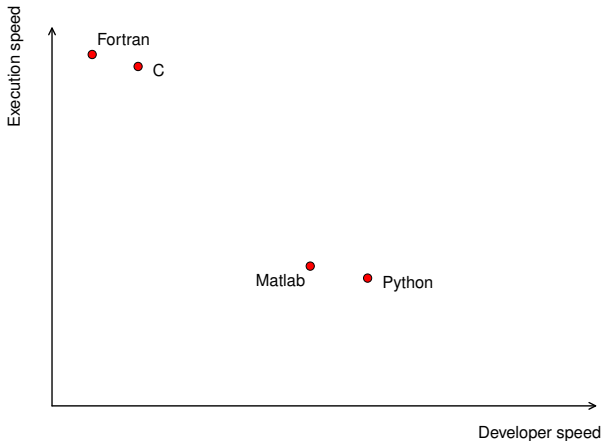
<b>Task</b>	<b>Naïve choice</b>	<b>Alternatives</b>
Create a simple figure	MS Excel	Stata, Matplotlib, Matlab
Plot a function	MS Excel	Matplotlib, Matlab, (Stata)
Quickly calculate sample statistics	MS Excel	Stata, Python, ...
Quickly clean some data	MS Excel	Stata, Python, ...
Check some theoretical result	Pen & paper (i.e. repeat)	Mathematica, Matlab, SimPy

# Why are we programming at all?

- Software developer: Creates tools to be used by others
- End user: Applies tools developed by others
- As researchers, we are often in the middle
- Developing a new estimator means that no professional software developer had the chance of implementing the corresponding code before
- Much of structural econometrics / macro: Model specifics and solution strategy are closely intertwined
  - Makes it hard to rely on generic programs
  - Code sharing would help, should improve (Barnes, 2010)

# Choice of programming language

## Speed in two dimensions



# Reminder of how the typical analysis proceeds

1. Data management
2. Actual analysis (estimation / simulation)
3. Visualisation and results formatting
4. Writing the paper

# Scenario 1

## Empirical project, red. form / “experiment”

- E.g. estimating the good old Mincer equation once more, using some novel covariate
- All estimators you'll ever need implemented in Stata (or R)
- Use it from beginning to end
  - Potentially Python for formatting of tables, if `estout` does not give you **directly** what you want
- Consider Python + SQL or SAS for data management . . .
  - . . . if your data do not fit into memory;
  - . . . if you need to describe complicated relations between observational units;
  - . . . or if they have multiple dimensions



## Scenario 2

# Developing an estimator

- Deriving the theoretical properties of an estimator will hardly be enough for publication nowadays
- Monte Carlo simulations are the absolute minimum
  - You really should provide a function which can be used by applied researchers (Koenker and Zeileis, 2009)
  - Especially if you want the estimator to be used
- Develop your code in Matlab, Python, or R
  - Fast development cycles (b/c of debugging and testing)
- When you're done (paper published? working paper polished?), port it to Stata
  - Close to trivial if you avoided too many higher-level constructs of languages (e.g. objects, dictionaries)

## Scenario 3

### (Macro) simulation / calibration

- You'll need some real data and lots of assumptions on distributions leading to simulated data
- Then you have a (potentially) computationally intensive component in the main analysis
- Do steps 1 and 3 in Python or Matlab
- Tool choice for Step 2 depends on computation time
  - Fairly small problem: Use Python or Matlab
  - Larger problem: Use Fortran or C
  - In some cases, a mix of Fortran or C with Python (f2py, Cython, etc.) or Matlab (.mex) might be useful

# Scenario 4

## Structural micro estimation

- The core problem is more or less the same as in scenario 3
  - Generate predictions about behaviour from economic theory, find the “right” parameter values for the theory
- Main differences: Data management is more involved, you must allow for heterogeneity, and you need standard errors
- Suggestions from previous scenario apply
  - Probably more arguments for mixing languages in step 2, as opposed to standalone Fortran or C
- Separate the estimation of parameters and the calculation of standard errors
  - Often you can't afford to wait for the estimation to complete before you debug your standard error code
  - Good tests might be a substitute, of course

# References I



Barnes, Nick (2010). “Publish Your Computer Code: It is Good Enough”. In: *Nature* 467, p. 753.



Doar, Matthew B. (2005). *Practical Development Environments*. Sebastopol, CA, USA: O'Reilly Media.



Koenker, Roger and Achim Zeileis (2009). “On Reproducible Econometric Research”. In: *Journal of Applied Econometrics* 24.5, pp. 833–847.

# Acknowledgements

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