Interactive scientific computing environments
IPython’s design and future directions

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Outline

1. IPython’s background and a few new features
   - A bit of background
   - Interactive demo

2. The future: IPython as a network-aware Python VM
   - The basic idea
   - Interlude: we won’t lose the ‘normal’ IPython
   - On to the network
   - Interactive demo

3. Scientific Notebooks in Python
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IPython: 2001-Today

- Nov. 2001: I discover Python. Fun, interactive, but I miss the Mathematica and IDL prompts.
- `sys.ps{1,2}` and `sys.displayhook`: the door to cached prompts.
- LazyPython (Nathan Gray, Caltech) and IPP - Interactive Python Prompt (Janko Hauser, at a German oceanographic institute).
- Six intense weeks and 7000 LOC later: IPython 0.2.0 is announced. A blend of my own IPython and LazyPython, inserted into IPP.
- IPP subclassed `code.InteractiveConsole`. So did we until v. 0.7.0.
Scientific computing is exploratory: a good interactive environment is a necessity.

What is IPython?

- Besides a (much) better interactive shell, with threading support (GTK, WX and Qt), system access, etc...
- It is a base layer for building customized interactive environments.

How?

- Input preprocessing: \(2/3 \rightarrow \mathbb{Z}_2(2)/\mathbb{Z}_2(3)\)
- Output preprocessing.
- Customized tab-completers: PyMad (Institut Laue Langevin-CEA Grenoble), tab-completion over the network for proxied objects.
- Customized exception handlers. And a lot more...

SAGE: the first widely available system to really take advantage this (others: Ganga/Clip-CERN, CASA-NRAO, iPymerase, PyMad,….)
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A few useful interactive tools

- `%edit`: call your favorite `EDITOR` on the spot.
- `%macro`: interactively recall groups of lines quickly (you can `%edit` them)
- `%save`: save a group of lines to a named file.
- `%store`: lightweight persistence for any variable (including macros).
- `%pdb`: automatic invocation of a debugger (IPython-enhanced pdb)
- Embedding IPython: open an interactive shell inside any program you want
- Shell access: direct access to the underlying OS. Use Python for shell-like tasks (much nicer syntax than bash).
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Lessons from IPython

- IPython has been pushed by some almost to replace Python as the user-visible system (better exceptions, control via `%magics`, etc.)

- If everyone wants it so bad, let’s give it to them!

- Any good interactive system should have two levels of operation:
  - The actual execution language: in our case, Python.
  - A control mechanism: the `%magics`.

- But we’ll make all of this available over the network.

- And it will be non-blocking (so your extension C code doesn’t freeze your sessions).

- We’re going to clarify, organize and improve all the public extension points, so extension authors (e.g. SAGE) have an easier time.
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The IPython Kernel

- The kernel is an IPython instance that listens on a network port rather than to an interactive prompt.
- It has a control protocol for commands.
- And it can also pass any object which can be serialized (pickle for now).
- Multi-threaded with an execution queue.
- Developed using Twisted and non-blocking sockets.
- Can be started at any time using various means (SSH, Xgrid, GridEngine, Condor, etc.)
- Eventually, this kernel will be the core of IPython.
IPython as we know it will continue to exist
But better, cleaner, and embeddable in GUIs

Today's IPython

- Terminal controller
  - In-process
  - Single-line (readline)
  - Multiline (curses)

  IPython Kernel engine
  - Single process
  - User namespace
  - No networking

What we wish we could do with today's IPython

- GUI environment
  - IDLE, Envisage,...
  - Still in-process
  - Different I/O

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A 2-process kernel

Why do we need this?

- The Python VM has a global lock (the Global Interpreter Lock – GIL).
- It protects the global state of the interpreter
  - Only one thread can execute Python code at the same time.
  - No Python variables may be modified without holding the GIL.
- Python *does* have threads: they work well for non-CPU bound tasks.
- **BUT**
  - Extensions (C, Fortran) can fully block the VM.
  - And poof goes all hope of the ability to control a cluster
A 2-process kernel (2)

The "IPython VM"

Kernel Controller
- Non-blocking
- World-visible

Private link

Kernel Engine
*MAY BLOCK!*

Twisted

Networks
Distributed/parallel computing

- Think of Python as 'the CPU'
- But these souped-up kernels let you talk to it conveniently.

Interactive demo
A cluster in San Francisco, monitored from Colorado

- 10 nodes (5 dual G5 Macs) running IPython kernels at the University of Santa Clara.
- I can connect to them from my office (U. Colorado, Boulder) and listen.
- Computation happens on the nodes.
- Results are collected for analysis on the controller.
- **Plan B:** if the network fails, we mimic this on my laptop (with a smaller calculation)
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Don’t come to a conference with an untested laptop...
Unless you bring Robert Kern as well

- I’ll let Robert present this part: since he actually did the real work, it’s only fair.
- And `import wx` explodes on my laptop right now...