

THE POWER OF PYTHON

IN SCIENCE AND EDUCATION

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About me



Researcher @ Simula Research Laboratory: \bullet

- Numerical solution of PDEs
- PDE-constrained optimisation
- Applications
- Teaching intermediate-level Python-course @ UiO \bullet
- Scientific software









Why should we teach Python?

| Programming Language | 2017 | 2012 | 2007 | 2002 | 1997 | 1992 | 1987 |
|----------------------|------|------|------|------|------|--------------|------|
| Java | 1 | 1 | 1 | 1 | 15 | - | - |
| с | 2 | 2 | 2 | 2 | 1 | 1 | 1 |
| C++ | 3 | 3 | 3 | 3 | 2 | 2 | 5 |
| C# | 4 | 4 | 7 | 14 | - | 8 - 8 | × |
| Python | 5 | 7 | 6 | 11 | 27 | - | - |

TIOBE Index - very Long Term History

Python is (relatively) easy to learn



Python has extensive set of scientific libraries

- Python
 PyPy
- NumpyCythonNumba
 - py.test

- Matplotlib
- Pandas
- Scipy
- xarray
- IPython
- Jupyter Notebook
- Pytables
- yt



- FEniCS
- Scikit-learn
- PyMC3
- SymPy
- networkX
- Sunpy

Python Package Index (pypi.python.org)

Python can be accelerated with mixed programming

Performance study of a 1D diffusion process





С

Python accelerates development by avoiding common "low-level" issues



Python accelerates development by avoiding common "low-level" issues



Teaching Python

My experience

- "Higher-level programming" bachelor/master course at University of Oslo
- Initiated by Hans-Petter Langtangen
- Students from CS/Physics/Maths/Chemistry

"Learning by doing and reviewing"

import numpy from ODESolver import RungeKutta4 def rhs(u, t): R = 1 return alpha*u*(1 - u/R) TEXTS IN COMPUTATIONAL SCIENCE $du' = \alpha v(1 - u)$ u(0) = 0.1 R = 1 $\alpha = 0.2$ $\alpha = 0.2$

Hans Petter Langtangen

A Primer on Scientific Programming with Python

Fifth Edition

Deringer

Editorial Board T. J. Barth M. Griebel D. E. Keyes R. M. Nieminen D. Roose T. Schlick

The goal of the course is to teach tools that make computational science more effective

Syllabus

- The Python language (3 week crash-course)
- Numerical Python with numpy/matplotlib
- Accelerating Python with mixed programming
- Pandas, flask, regular expressions
- Best practices: Git, documentation, testing

Coding assignments are the core of the course



Hans Petter Langtangen

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Assignments example: Fractal generator

Task:

- Implement a fractal generator
- Accelerate and compare timings between different versions:
 - Python
 - Python + Numpy
 - Cython
 - Pure C

Contest: best picture award



More assignments examples

File syntax highlighter

Core techniques taught:

• Regular Expressions

from my_unit_testing import UnitTest

def better_addition(a, b, num_rechecks=2):
 """Returns sum of a, b, but double checks answer several times."""
 sum_computations = [a + b for n in range(num_rechecks)]

for n in range(num_rechecks):
 if sum_computations[n] != sum_computations[n-1]:
 print("Hang on, let me recheck that")
 return better_addition(a, b, num_rechecks)

return sum_computations[0] # if all computations match, return whichever

Jupyter Notebook Clone

Core techniques taught:

- Graphical user interface (web)
- Advanced Python

```
range allows us to iterate over a sequence of numbers:
In [19]: for i in range(3):
    print(i)
0
1
2
```

Temperature/CO2 level analysis and predictions

Core techniques taught:

• Data analysis with Pandas

Good coding practices are enforced through test assignments and points on documentation

4.6 Testing the code (5 pt)

Write appropriate tests for 4.1 through 4.5. Depending on the problem choose either Pydoc-test or Py.test. At least one of each test must be included.

4.1 Download the page for reference:

http://www.islostarepeat.com/

Check if your program creates the same document.

4.2 Check if Hannestad creates the link



Students deliver assignments digitally



virtual-classroom

Peer-review of assignments

"Learning by doing and reviewing"> 300 students signed up for the course last year

Lectures are available as Jupyter notebooks and on Youtube



Guest lecturers



Students help each other



The coding assignments form the core of the course

- Two type of assignments:
 - Short (1 week)
 - Long (2-3 weeks), peer-reviewed
- Each student has their own private github repository
- Points are given for correctness and quality of **code and documentation**

Non peer-reviewed assignment



Peer-reviewed assignment



The peer-review is delivered as a Latex report or as a git pull-request

Peer-review of assignment 5 for INF3331-harad

November 12, 2016

1 Introduction

1.1 Goal

The review should provide feedback on the solution to the student. The main goal is to give constructive feedback and advice on how to improve the solution. You, the peer-review team, can decide how you organise the peer-review work between you.

1.2 Guidelines

For each (coding) exercise, one should review the following points:

- Is the code working as expected? For non-internal functions (in particular for scripts that are run from the command-line), does the program handle invalid inputs sensibly?
- Is the code well documented? Are there docstrings and are the useful?
- Is the code written in Pythonic way ¹? Is the code easy to read? Are the variable/class/function names sensible? Do you find overuse of classes or not sufficient use of functions or classes? Are there parts of the program that are hard to understand?

| LUIO-INF3331 / INF3331-harad Private ⇔ Code ① Issues ◎ | O Unwatch ▼ | 5 ★ Star 0 | Ϋ́Fork 2 |
|---------------------------------------------------------------------------------------------------------------------------------------------------------------------|--------------------|-------------------------------|-------------|
| Small changes here and there #1 Morged hardah merged 3 commits into U10-INF3331:master from signuns1:master on Dec 23 | , 2016 | | Edit |
| Conversation e ◆ Commits 3 D Files changed 5 | | | 129 -13 |
| sigmunsI commented on Dec 7, 2016 The program works more or less as it is supposed to, but I added some things here and t | + 🙂 🥒 | Reviewers No reviews—reque | ¢ |
| thought needed to be done. It is summarized in the commits | | Assignees No one—assign yo | ¢ urself |
| Pydoc.html created and will now be visualized when pressing documenta. Added support for titles. All plots will now be visualized with | d3c4b3a 8be1cc4 | Labels None yet | ¢ |
| title ->- 🕎 Now possible to change month from flask server | 1e2ba8c | Projects None yet | ¢ |
| N Andah merged commit 3e64354 into U10-INF3331:master on Dec 23, 2016 | Revert | Milestone | ¢ |

virtual-classroom manages the peer-review process

- Creates private repositories for every student in a course.
- Divides students into groups for exercise assessment.
- Openes up private repositories temporarily for assessment groups.

| UiO-INF3331 | |
|-------------------------------------------------------|-----------------|
| Repositories 12 People 296 M Teams 484 III Projects 0 | Settings |
| INF3331- Type: All - | Language: All - |
| 300 results for repositories matching INF3331- | Clear filter |
| student-resources-14 | |
| Resources for students in INF3331, 2014. | |
| C 🖈 1 😵 5 Updated on Nov 10, 2014 | |
| INF3331-simenrei Private | |
| INF3331 Resources | ~ |
| Python | |
| INF3331-youssebe Private | |
| INF3331-Assignments-2016 | Man |
| Python 91 Updated on Dec 9, 2016 | |

Scripts are available at https://github.com/hplgit/virtual-classroom

Jupyter notebook allows students to experiment with the slides



- Students can download slides, run and change them
- Lecturer can test that slides still work

Tipp: Use the RISE plugin to convert a Jupyter notebook to a slideshow

Guest lectures bring domain-experts into the classroom



Benjamin Ragan-Kelley Core developer of Jupyter Notebook

"Introduction to Jupyter Notebooks"



Jonathan Feinberg Data scientist at Expert Analytics

"Introduction to Regular Expression"

Piazza is a Q&A for classes that allows students to help each other

- Typically high-quality answers and fast response time
- Reduced load of teaching assistants
- Difficult topics become visible to teaching staff
- Allows students to suggest improvements/raise problems quickly

Using groups in regex

I have implemented a method using the group-functionality to regexes, e.g.

"^([^\#]?)(?P<string>\bimport\b)(?!\n)": keyword

in order to avoid matching with import when it's on a commented line (I'm replacing only the stuff in the string-group). This we to run my script with the example files it fails because the naython.syntax-file don't use the convention with giving names to supposed to have a script working with the naython-examples as they are or can I add my group-thing to it?



The Anaconda Python distribution is a good choice installation

- Works on Windows, Mac, Linux
- Can be installed locally or globally
- Provides a consistent Python installation across all students

Anaconda: Surprisingly few problems - except Cython on Windows machines



Summary

- Python is easy-to-learn, flexible and can be made performant
- Teaching Python tips:
 - Code peer-reviews allow to learn from others
 - Best practices can be taught "on the side"
 - Tools like github, virtual-classroom and piazza allow to scale the course

"Learning by doing and reviewing"

Course material (lecture slides, videos, assignments) are available on <u>goo.gl/SEfw1u</u> Email me (<u>simon@simula.no</u>) if you have any questions.



Python is (relatively) easy to learn

Crucial for student projects with students without a computer science background.

Less time coding/fixing code means more time doing research



Python for high-performance computing



Chris N. Richardson, Garth N. Wells, Parallel scaling of DOLFIN on ARCHER, 2015