

# Scientific Computing (Phys 2109/Ast 3100H)

## I. Scientific Software Development

SciNet HPC Consortium

University of Toronto

Winter 2013

# Part I

## Introduction to Software Development

# Lecture 8

Course project

Object-Oriented Programming in Python

Mixing C++ and Python

# Course project: Where are we going?

- ▶ Two dimensional diffusion equation for density field  $\rho(\mathbf{r}, \mathbf{t})$

$$\frac{\partial \rho}{\partial t} = \mathbf{D} \left( \frac{\partial^2 \rho}{\partial x^2} + \frac{\partial^2 \rho}{\partial y^2} \right).$$

- ▶ Tracer particle satisfies ODE

$$\mathbf{m}\ddot{\mathbf{R}} = \mathbf{F} - \alpha(\rho(\mathbf{R}))\dot{\mathbf{R}},$$

where  $\mathbf{m}$  is mass,  $\mathbf{F}$  is force and  $\alpha$  is viscosity.

- ▶ Ad hoc form for density dependent friction constant  $\alpha$ :

$$\alpha(\rho) = \alpha_0(1 + a\rho).$$

- ▶ Ad hoc form for force, like a constant electric field:

$$\mathbf{F} = q\mathbf{E}\hat{x}.$$

# Course project: Where are we going?

- ▶ Periodic boundary conditions in all directions

$$\mathbf{r} \sim \mathbf{r} + \mathbf{L}(\mathbf{k}\hat{x} + \mathbf{l}\hat{y}).$$

$\mathbf{L}$  is the length of the side of the box,  $\mathbf{k}$  and  $\mathbf{l}$  integer.

- ▶ Initial conditions:

$$\rho(\mathbf{r}) = \exp \left[ -\frac{\|\mathbf{r}\|^2}{2\sigma_0^2} \right],$$

$$\mathbf{R}(0) = \mathbf{R}_0,$$

$$\dot{\mathbf{R}}(0) = \mathbf{V}_0.$$

- ▶ Values for the parameters (arbitrary) are

$$\mathbf{D} = \mathbf{1}; \mathbf{m} = \mathbf{1}; \alpha_0 = \mathbf{1}; \mathbf{a} = \mathbf{15}; \mathbf{qE} = \mathbf{1}; \mathbf{L} = \mathbf{10};$$

$$\sigma_0 = \mathbf{1}; \mathbf{R}_0 = \mathbf{0}; \mathbf{V}_0 = \mathbf{10}\hat{y}$$

# Classes in Python

- ▶ As in C++, Python uses classes to group together data and code, accessing them with '.' operator
- ▶ We could also do this with modules. But there can be only one instance of a module, and many instances of a class.
- ▶ Inheritance: multiple base classes, derived class can override any methods of its base class or classes, and method can call a base class method with the same name.
- ▶ Objects can contain arbitrary amounts and kinds of data.
- ▶ Classes partake of the dynamic nature of Python: created at runtime, and can be modified further after creation.

# Easy cases

## Source 1

```
class Apple:  
    type = "Delicious"  
    colour = "Green"
```

- ▶ Collection of variables
- ▶ Source 1: apple1 and apple2 share colour (class variable); tricky.
- ▶ Source 2: works, but now we have to assign each member.
- ▶ Anything more workable requires writing a constructor.

# Easy cases

## Source 1

```
class Apple:  
    type = "Delicious"  
    colour = "Green"  
  
apple1 = Apple()  
apple2 = Apple()  
Apple.colour = "Golden"  
print apple1.colour  
[Golden]
```

- ▶ Collection of variables
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- ▶ Source 2: works, but now we have to assign each member.
- ▶ Anything more workable requires writing a constructor.



# Easy cases

## Source 1

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class Apple:
    type = "Delicious"
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Apple.colour = "Golden"
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[Golden]
```

- ▶ Collection of variables
- ▶ Source 1: apple1 and apple2 share colour (class variable); tricky.
- ▶ Source 2: works, but now we have to assign each member.
- ▶ Anything more workable requires writing a constructor.

## Source 2

```
class Apple:
    pass
```

# Easy cases

## Source 1

```
class Apple:
    type = "Delicious"
    colour = "Green"

apple1 = Apple()
apple2 = Apple()
Apple.colour = "Golden"
print apple1.colour
[Golden]
```

- ▶ Collection of variables
- ▶ Source 1: apple1 and apple2 share colour (class variable); tricky.

## Source 2

```
class Apple:
    pass

apple1 = Apple()
apple1.type = "Delicious"
apple1.colour = "Green"
apple2 = Apple()
apple2.type = "Delicious"
apple2.colour = "Golden"
print apple1.colour
[Green]
```

- ▶ Source 2: works, but now we have to assign each member.
- ▶ Anything more workable requires writing a constructor.

# Using a constructor

- ▶ Collection of variables
- ▶ Same `def` keyword to define methods.
- ▶ Constructor name is `__init__`

```
class Apple:
    def __init__(self):
        self.type = "Delicious"
        self.colour = "Green"

apple1 = Apple()
apple2 = Apple()
print apple1.colour
[Green]
```

# Class syntax in Python

- ▶ Methods take a first argument that is an instance of the class
- ▶ This argument is explicit (`self`) in definition but implicit in calls.
- ▶ In methods, refer to member fields as `self.field`.
- ▶ No separation interface/implementation

```
class Apple:
    def __init__(self):
        self.type = "Delicious"
        self.colour = "Green"

    def describe(self):
        print self.type,
        print self.colour

apple1 = Apple()
apple2 = Apple()
print apple1.colour
[Green]
apple1.describe()
[Delicious Green]
```

# More special methods

- ▶ `__del__`  
A kind of destructor.
- ▶ `__str__`  
Converts object to a string for output. Used by `print`.  
Intended to be readable by users.
- ▶ `__repr__`  
Returns a string representation for the object. Used by python (e.g., if you just type the name of an object).  
Intended to be understandable by developers.

# Example: Tracer Particle

```
class Tracer:
    def __init__(self, x0, y0, vx0, vy0):
        self.t = 0.0
        self.x = x0
        self.y = y0
        self.vx = vx0
        self.vy = vy0
    def timeStep(self, dt):
        self.t += dt
        self.x += dt*self.vx
        self.y += dt*self.vy
    def write(self):
        print self.t, self.x, self.y
```

```
tr = Tracer(0.0, 1.0, -1.0, 2.0)
while tr.t < 10.0:
    tr.timeStep(0.1)
    tr.write()
```

# Inheritance in Python

- ▶ Need to discuss this for completeness' sake
  - ▶ Put classes to derive from between parenthesis.
- 
- ▶ Two kinds of classes: old and new style
  - ▶ For multiple inheritance and operator overloading.
  - ▶ To get new style, inherit from object class

## Inheritance

```
class NamedTracer(Tracer):  
    def __init__(self, a, b, c, d, name):  
        Tracer.__init__(self, a, b, c, d)  
        self.name = name  
  
t = NamedTracer(1., 2., -1., 0., "A1")
```

# Inheritance in Python

- ▶ Need to discuss this for completeness' sake
  - ▶ Put classes to derive from between parenthesis.
- 
- ▶ Two kinds of classes: old and new style
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## Inheritance

```
class NamedTracer(Tracer):  
    def __init__(self, a, b, c, d, name):  
        Tracer.__init__(self, a, b, c, d)  
        self.name = name  
  
t = NamedTracer(1., 2., -1., 0., "A1")
```

## New style class

```
class Tracer(object):  
    #...
```



# Mixing C++ and Python

# Mixing C++ and Python

- ▶ Python is versatile and quick to write in
- ▶ C++ is fast
- ▶ Let's combine them: best of both worlds
- ▶ Ideally:
  - ▶ Have a blazingly fast module in C++
  - ▶ Compile it
  - ▶ Import it into Python, and start playing
  - ▶ Can then write test and driver code in Python
- ▶ Simple idea. Implementation is a harder. And non-unique.

# Why isn't this straightforward?

- ▶ Objects in Python very different from objects in C/C++
- ▶ The Python C-API exposes all the nitty gritty of making Python work.
- ▶ A .o file is not a Python module.
- ▶ C++ compiler and Python have to be binary compatible.

# What's involved in getting this to work?

- ▶ Need to create a 'Python extension module'
- ▶ That module needs to load a dynamic library (if it isn't a dynamic library itself).
- ▶ So we need to build a dynamic library from the C++ code.
- ▶ And we create a Python extension module.
- ▶ For which we'll have to write some wrapper code.

# Many automating frameworks...

- ▶ Python C-API
- ▶ SWIG
- ▶ Boost.Python
- ▶ Cython
- ▶ ...

This is getting hairy... and yet somehow this is very popular.

# Boost Python

- ▶ **Boost**: large collection of useful c++ libraries. (so useful that some parts have made it into the next c++ standard)
- ▶ **Boost Python**: framework for interfacing Python and C++.
- ▶ C++ specific, but same issues for other interfaces.
- ▶ Should be able to translate a C++ class structure into a python class structure.
- ▶ Boost likes the bjam automated build systems, but we can just use g++ or make.

# Boost Python - example 1

► C++ code:

```
//hi.h
#ifndef HIH
#define HIH
char const* greet();
#endif
```

```
//hi.cc
#include "hi.h"
char const* greet() {
    return "hi world";
}
```

► Python code:

```
#usehi.py
import hi
print hi.greet()
```

# Boost Python - example 1

► C++ code:

```
//hi.cc  
#include "hi.h"  
char const* greet() {  
    return "hi world";  
}
```



# Boost Python - example 1

- ▶ C++ code:

```
//hi.cc
#include "hi.h"
char const* greet() {
    return "hi world";
}
```

- ▶ Step 1: Write glue code for extension module:

```
//hix.cc
#include "hi.h"
#include <boost/python.hpp>
BOOST_PYTHON_MODULE(hi) {
    using namespace boost::python;
    def("greet", greet);
}
```

# Boost Python - example 1

- ▶ C++ code:

```
//hi.cc
#include "hi.h"
char const* greet() {
    return "hi world";
}
```

- ▶ Step 1: Write glue code for extension module:

```
//hix.cc
#include "hi.h"
#include <boost/python.hpp>
BOOST_PYTHON_MODULE(hi) {
    using namespace boost::python;
    def("greet", greet);
}
```

- ▶ Step 2: Compile

```
$ g++ -c hi.cc -fPIC
$ g++ -c hix.cc -fPIC -I/usr/include/python2.7
```

# Boost Python - example 1

- ▶ C++ code:

```
//hi.cc
#include "hi.h"
char const* greet() {
    return "hi world";
}
```

- ▶ The glue code:

```
//hix.cc
#include "hi.h"
#include <boost/python.hpp>
BOOST_PYTHON_MODULE(hi) {
    using namespace boost::python;
    def("greet", greet);
}
```

- ▶ Step 3: Create a dynamically loadable library

```
$ g++ -o hi.so hi.o hix.o -shared -lboost_python
```

# Boost Python - example 1

- ▶ C++ code:

```
char const* greet() {  
    return "hi world";  
}
```

- ▶ Python code:

```
#usehi.py  
import hi  
print hi.greet()
```

- ▶ Step 4: Use it

```
$ python usehi.py  
hi world
```

# Boost Python - example 2

► C++ code:

```
//tracer.h
#ifndef TRACERH
#define TRACERH
class Tracer {
public:
    Tracer(float x, float y, float vx, float vy);
    void timeStep(float dt);
    void write();
    float t;
    ...
};
#endif
```

## Boost Python - example 2

► C++ code:

```
//tracer.h
#ifndef TRACERH
#define TRACERH
class Tracer {
public:
    Tracer(float x, float y, float vx, float vy);
    void timeStep(float dt);
    void write();
    float t;
    ...
};
#endif
```

► Python code:

```
#usetracer.py
from tracer import Tracer
tr = Tracer(0.0,1.0,-1.0,2.0)
while tr.t < 10.0:
    tr.timeStep(0.1)
    tr.write()
```

## Boost Python - example 2

► C++ code:

```
class Tracer {  
    public:  
        Tracer(float x, float y, float vx, float vy);  
        void timeStep(float dt);  
        void write();  
        float t;  
};
```

## Boost Python - example 2

► C++ code:

```
class Tracer {
public:
    Tracer(float x, float y, float vx, float vy);
    void timeStep(float dt);
    void write();
    float t;
};
```

► Glue code:

```
#include "tracer.h"
#include <boost/python.hpp>
BOOST_PYTHON_MODULE(tracer) {
    using namespace boost::python;
    class_<Tracer>
        ("Tracer", init<float ,float ,float ,float
        >()) .def("timeStep",&Tracer::timeStep)
        .def("write",&Tracer::write)
        .def_readonly("t", &Tracer::t);
}
```



# Compile and use...

```
$ g++ tracer.cc -fPIC
$ g++ tracerx.cc -fPIC -I/usr/include/python2.7
$ g++ -o tracer.so tracer.o tracerx.o -shared -lboost_python
$ python
>>> from tracer import Tracer
>>> tr = Tracer(0.0, 1.0, -1.0, 2.0)
>>> while tr.t < 10.0:
...     tr.timeStep(0.1)
...     tr.write()
... 
```

# Good as long as it works...

- ▶ One wrapper, one .so
- ▶ Need to remember -fPIC
- ▶ If there's something wrong, hard to figure out where.
- ▶ Some things are still hard in Boost Python, such as passing back numpy arrays.
- ▶ Still requires substantial amount of glue.
- ▶ Other approaches may need less glue at first (SWIG), but if you want anything that is not yet automated, you are still glueing.

Scientific software development:  
What have we learned?

# Recap Part I of Scientific Computing

- ▶ Choose the tools for the jobs: C++ for performance, python for flexibility, fast development, and visualization.
- ▶ Version control
- ▶ Modular programming
  - ▶ header files/implementation files
  - ▶ make
  - ▶ object-oriented programming
- ▶ Defensive programming (assert)
- ▶ Unit testing
- ▶ Debugging