

National Energy Research Scientific Computing Center (NERSC)

PyROOT Developments

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Outline

- **Introduction**
- **Developments since ROOT'05**
- **Ongoing developments**
 - TTree ease-of-use
 - Prototypes: cross-inheritance, Reflex
 - Interoperability with externals
- **Optimizing Python code**
- **Conclusion**
 - Future plans, further resources



Introduction

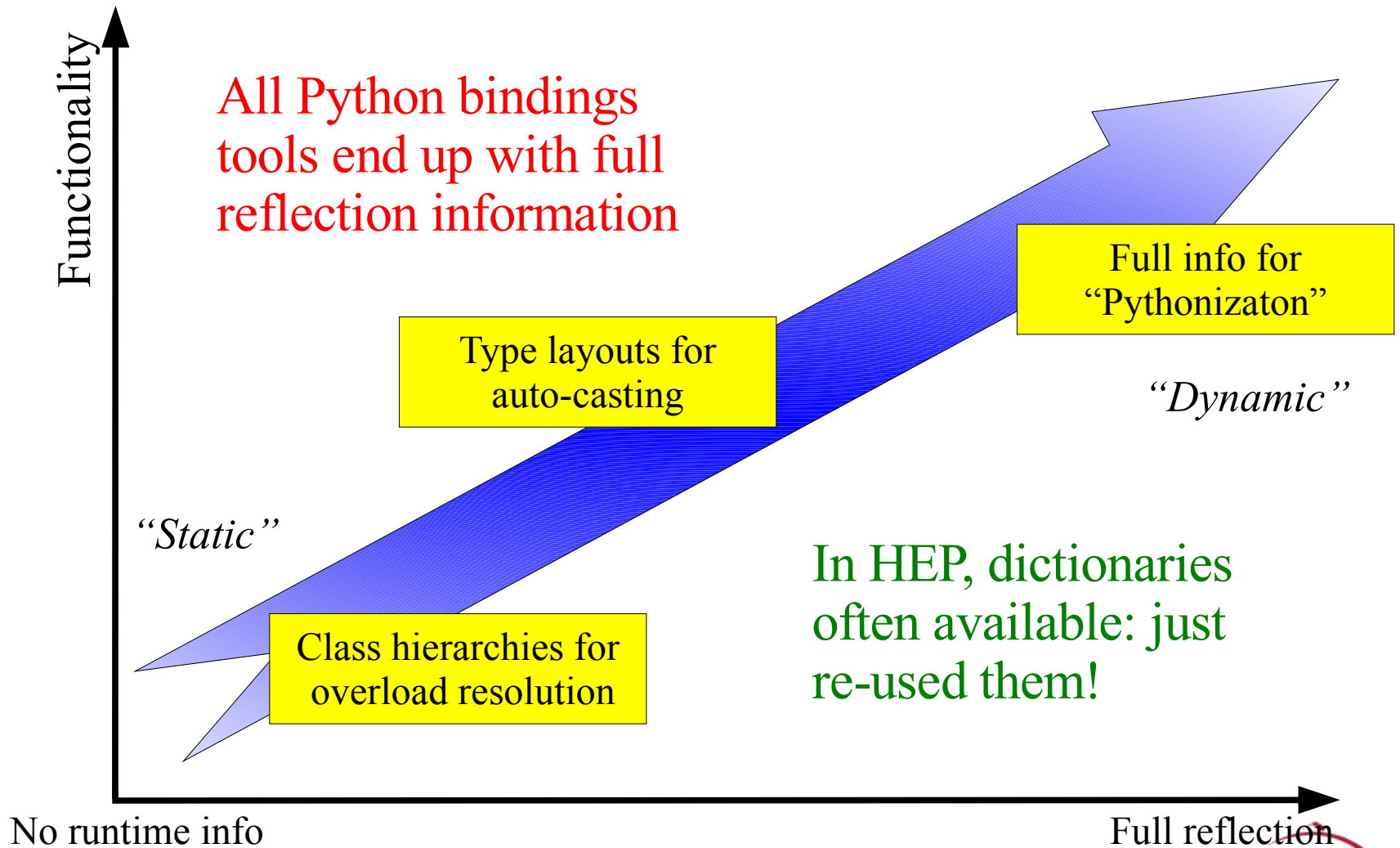


Overview

- **Python bindings to ROOT**
 - Python is a very popular dynamic language
 - Every app/lib out there has Python bindings
 - Including LHCb/Atlas framework: Gaudi/Athena
- **Two-way: access to Python from RINT**
 - E.g. ATLAS framework from CINT: athena.C
 - Interactive mixing of interpreters
- **Fully dictionary-based**
 - Often available, i.e. zero end-user effort



Functionality v.s. Available Runtime Language Info



- **Pere Mato's RootPython (07/02)**
 - Based on boost.python v1, in Gaudi CVS
- **Rewrite: PyROOT in SEAL (03/03)**
 - Based on boost.python v2, in SEAL CVS
- **Python C-API based PyROOT (02/04)**
 - Released with ROOT 4.00/04 and later
- **Optimize and finish edges (06/05)**
 - Current core, satisfy Cintex/Reflex
- **Pythonizations (today)**
 - Support and consolidation

Interactive analysis of $Z \rightarrow ee$ events

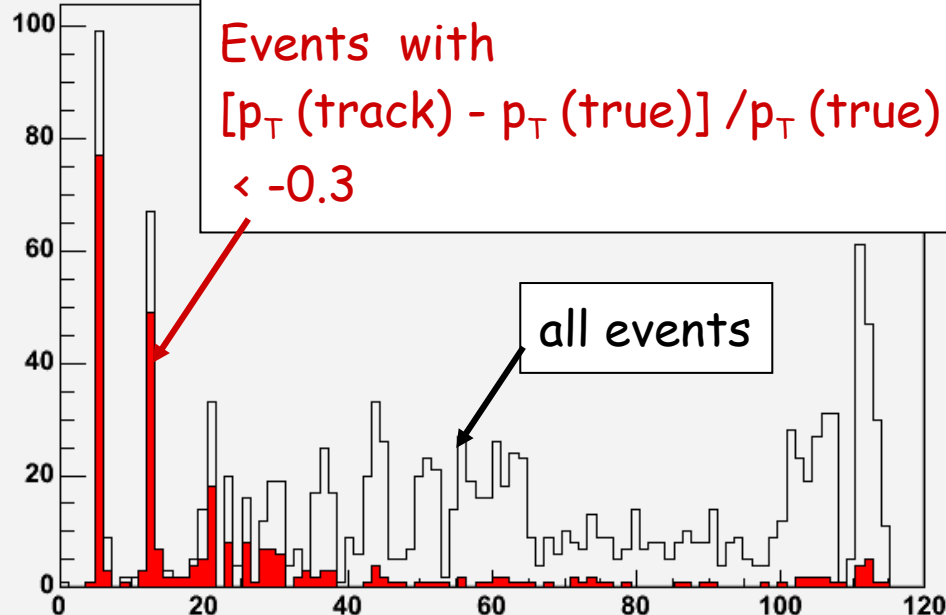
PyROOT

```
import ROOT
import math
#
theApp.initialize()

h16 = ROOT.TH1F ("h16",
                'R G4 Brem photons',100, 0., 120.)
for i in range(5000):
    theApp.nextEvent()
    scon=PyParticleTools.getTruthParticles("SpclMC")

    for p in scon:
        t=p.getGenParticle()
        tver=t.production_vertex()
        if tver :
            R=math.pow(tver.point3d().y(),2)\
              +math.pow(tver.point3d().x(),2)
            R=math.sqrt(R)/10.

        if p.pdgId()==22 and math.fabs(t.barcode()) > 10000.:
            if math.fabs(p.eta())< 1.0:
                h16.Fill(R)
```



R (leading Brem photon) cm

Access to Gaudi/Athena
framework data objects
from analysis tools

Example: Python from CINT/C++

```
class MyPyClass:  
    def __init__( self ):  
        print 'in MyPyClass.__init__'  
    def gime( self, what ):  
        return what
```

```
root [0] TPython::LoadMacro( "MyPyClass.py" );  
root [1] MyPyClass m;  
in MyPyClass.__init__  
root [2] char* s = m.gime( "aap" );  
root [3] s  
(char* 0x41ee7754) "aap"  
root [4] int i = m.gime( 2 );  
root [5] i  
(int) 2
```




Supported Features

- **C++ types**
 - All C++ primitive and most of Python builtin types
 - Templates, inner classes, incomplete types
- **C++ namespaces**
 - Mapped onto Python classes
 - One global namespace (“ROOT”)
- **Class methods and functions**
 - Global, class static, and member functions
 - Arguments by value or by reference; defaults
 - Overloading through sequential dispatch, after sorting
 - Matches are cached based on hash of args types
 - Auto-casting of return values to dynamic type



Supported Features (2)

- **Additional supported features**
 - Public data members accessible as properties
 - Enums (const), typedefs (refs), global variables (properties)
 - Doc strings created from signatures
 - Settable operator[](int), smart pointers, etc.
 - C++ operators mapped to Python equivalents (+ extras)
- **Emulation of Python containers**
 - STL containers => Python collections (iterators, slicing)
 - Automatic tupling of pairs when looping over maps
- **Memory management**
 - Two schemes (heuristic and strict) + callbacks
 - Fine-tunable by the user (take, relinquish ownership)

Mapping C++ to Python

C++ construct	Python equivalent	Example
Primitive types: bool, char, short, int, long, unsigned long, float, double, char*, std::string	Converted to: bool, int, int, int, long, long, float, float, string, string	
Namespace separation (::)	scope separation (.)	<code>Gaudi.Time</code>
Global namespace (::)	ROOT, gaudimodule.gbl	<code>gbl.Gaudi.Time</code>
Template class <...>	<...> replaced by (...)	<code>std.vector(float)</code>
NULL pointer	None	<code>func(None, None)</code>
Dynamic cast	Always dynamic type	<code>tk = event('track')</code>
Complex mix of object value, pointers and references	Always object references	
Iterators	Iteration protocol	<code>for o in vector: ...</code>



Developments since ROOT'05

Lots of Minor Improvements

- **Handling of fringe cases**
 - Missing dicts, creation order, shutdown sequence, double imports, null pointers, spurious lookups, float/double overloads
- **Python and C++ features:**
 - Reference types, smart pointers, data type limits, repr strings, char \Leftrightarrow string, settable operator[]
- **New/improved pythonizations:**
 - TClass casts, TClonesArray filling, TTree branch access, std::map loops, safe std::vector indexing
- **Python 2.5 and 64bit support**
- **400+ unit/regression tests and counting**

- **Python for close-out/post-mortem**
 - Often, C++ memory issues are constrained
 - E.g. at start of function => no/small side effects
 - Print error/stack trace and set exception

```
>>> Tstring().Puts(0)                # expects FILE* (opaque)
*** Break *** segmentation violation
Generating stack trace...
0x402035bb in _IO_fputs + 0x2b from /lib/tls/libc.so.6
0x40604c5f in TString::Puts(_IO_FILE*) + 0x21 from lib...
0x4088bd03 in <unknown> from libCore.so
Traceback (most recent call last):
  File "<stdin>", line 1, in <module>
SystemError: problem in C++; program state has been reset
>>>                                  # <= back at normal python prompt
```

```

>>> from ROOT import *
>>> mymap = std.map( int, int )()
>>> for i in range( 3 ):
...     mymap[i] = i                               # __setitem__
...
>>> for key, value in mymap:                       # __iter__ and unpacking
...     print key, value                          # of pair<int,int>s
0 0
1 1
2 2
>>> cr = TClassRef( "TObject" ) # smart pointer object
>>> print cr.GetListOfAllPublicMethods.__doc__
TList* TClass::GetListOfAllPublicMethods()
>>> print len( cr.GetListOfAllPublicMethods() )
90                                               # from TClass object
>>>

```

```

>>> from ROOT import *
>>> c = TClonesArray( "TVector3" )
>>> c[ 0 ] = TVector3()      # takes ownership of temporary
>>> c[ 1 ] = TVector3()
>>> v = TVector3()         # not a temporary
>>> c[ 1 ] = v              # calls dtor on old TVector3
>>> c[ 1 ] = TVector3()    # v is now destroyed
>>> print v
None
>>> print c[8]             # out-of-range (empty memory)
None
>>> print list(c)         # iterable-safe
[<ROOT.TVector3 object ("TVector3") at 0x86c9530>,
 <ROOT.TVector3 object ("TVector3") at 0x86c96d8>]

```

**=> NOTE: this is just to make TClonesArray usable,
the performance benefits are lost!**


```

>>> f = TFile( 'test.root', 'recreate' )
>>> t = TTree( 'mytree', '' )
>>> v = std.vector( float )()           # std::vector< float >
>>> t.Branch( 'data', v )               # one branch "data"
>>> for i in range(10):
...     v.push_back( i )
...
>>> t.Fill()                             # write 0.0 ... 9.0
>>> f.Write()

>>> f = TFile( 'test.root' )           # mytree implicit
>>> for event in mytree:                # loop over entries in tree
>>>     for i in event.data:            # access data as if member
>>>         print i                    # pythonized vector access
0.0
[...]
```

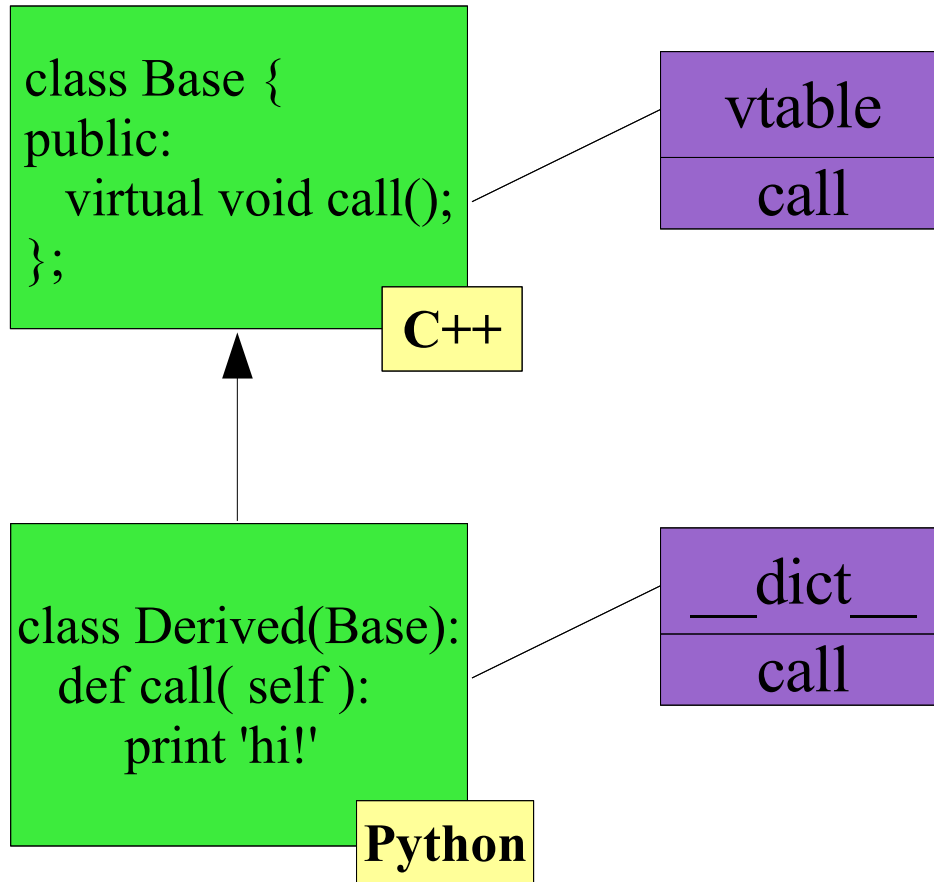
**Optimizations needed: read branch on access only,
removal of layers, loop optimizations**



Ongoing Developments

- **Treat TTree as Python-style container**
 - Loop over TTree entries with *for*-loop ✓
 - Bounds and read-sanity checks ✓
 - Select slices (ranges)
- **Treat TTree as C-style struct**
 - Access branches as data members ✓
- **Optimize Python access and I/O**
 - Judicious use of caches
 - Read branches only on-demand

Cross-Inheritance

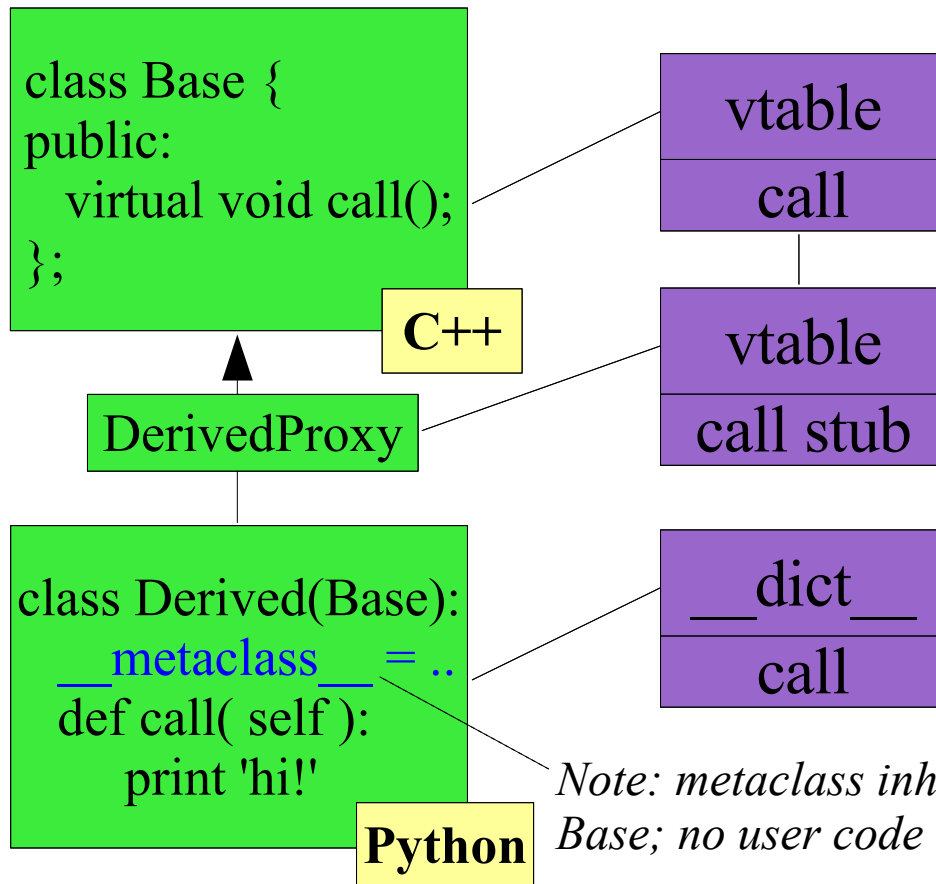


C++ sees only base class method “call”, which has an entry in the vtable
=> *no override*

Python sees both base and derived methods “call”, in the respective `__dict__`s
=> *override works*

Different results when calling from Python or C++!

Cross-Inheritance



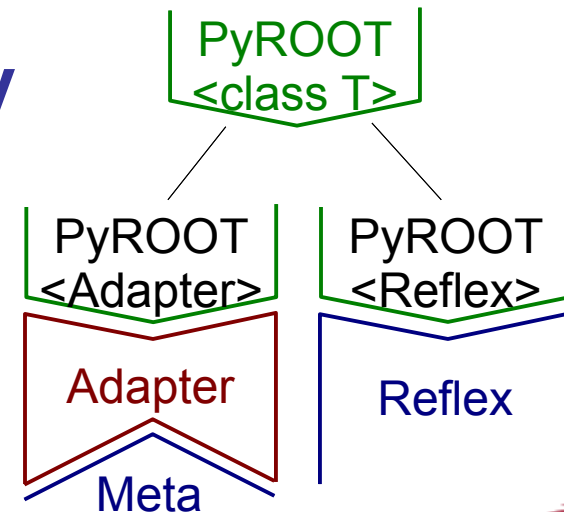
C++ DerivedProxy with stubs generated by `__metaclass__`, then compiled with ACLiC

C++ calls DerivedProxy through normal vtable mechanism, which calls into Python through stub

Same results from C++ and Python!

Prototype

- **Implementation of Reflex support:**
 - Templated most of PyROOT
 - Put adapters on top of root/meta
 - Closely follow Reflex API (“as necessary”)
 - Two instantiations
 - No change to CINT entry
 - Reflex by callback
 - Activated with a flag
- **Basic classes only**
 - To be continued ...





Interfacing External C/C++ Libs

- **Many different Python bindings**
 - SIP, SWIG, Boost.Python, C-API, etc.
- **Communication via opaque pointers**
 - “Trust the developer”
 - Currently not well supported in PyROOT
 - Prototype with CObject derived
- **PyROOT doesn't release GIL**
 - Need to experiment with allowing threads



Optimizing Python Code



Optimize What?

- **Flexibility is great, if it is needed**
 - W/o language support *you* have to write it!
 - You're unlikely to do better than the language
- **Flexibility is a burden, if unneeded**
 - You would pay for what you don't use
 - C++: many complex trade-offs possible
 - Python: typically one, straightforward way
- **In inner loops, typically:**
 - No flexibility needed
 - Constrained block of code

=> Optimization

```
>>> from ROOT import gRandom, TCanvas, TH1F
>>> c1 = TCanvas('c1', 'Example', 200, 10, 700, 500)
>>> hpx = TH1F('hpx', 'px', 100, -4, 4)
>>> for i in xrange(25000):
...     px = gRandom.Gaus()
...     hpx.Fill(px)
...
>>> hpx.Draw()
>>> c1.Update()
```

} => inner loop

- Normal, straightforward Python code
- With (readable) tricks: gain ~20%

Note: simplistic example, could use `TH1F::FillRandom('gaus', 25000)`

```

>>> fname = __file__[:-3]+'.C'
>>> open( fname, 'w' ).write( """#include "TRandom.h"
#include "TH1F.h"

void speed2( TH1F* h, Long_t nmax ) {
    for ( Long_t i = 0; i < nmax; ++i ) {
        double px = gRandom->Gaus();
        h->Fill( px );
    }
}
""" )
>>> gROOT.LoadMacro( fname + '+' )
>>> from ROOT import speed2
>>> hpx = TH1F('hpx', 'px', 100, -4, 4)
>>> speed2( hpx, 250000 )

```

Standard Python way:

- 1) Develop code in Python
- 2) Move slow parts to C/C++

- Pro: 20x speed-up
- Con: more code to write

```

>>> from ROOT import gRandom, TCanvas, TH1F
>>> c1 = TCanvas('c1', 'Example', 200, 10, 700, 500)
>>> hpx = TH1F('hpx', 'px', 100, -4, 4)
>>> for i in xrange(25000):
...     px = gRandom.Gaus()
...     hpx.Fill(px)
...
>>> hpx.Draw()
>>> c1.Update()

```

Annotations for the code above:

- Iterator temporary** (purple text) points to `i` in `xrange(25000)`.
- Method lookups** (red text) points to `gRandom.Gaus()` and `hpx.Fill(px)`.
- Object temporary** (blue text) points to `px` in `px = gRandom.Gaus()`.
- Bound method temporary** (green text) points to `hpx.Fill(px)`.
- inner loop** (green text) is indicated by a large green bracket on the right side of the loop body.

=> Python creates many temporaries

=> No type optimizations applied

Note: simplistic example, could use `TH1F::FillRandom('gaus', 25000)`



Optimization in PyROOT?

- **Main ingredients in inner loop codes:**
 - Numeric: math + builtins + arrays
 - Use NumPy with Psyco (JIT, x86 only)
 - ROOT extension library calls
 - Use dictionary info for static optimization
 - Dynamically change internal call settings
 - No autocast, return in local buffer, remove checks, etc.
- **Need fixed block of python code**
 - User defined, different optimization levels
 - But also such as THn::Fit and TFn::Draw



Prototyping Results

- **Effectiveness varies wildly ...**
 - Optimizations on builtins: no effect
 - Shortcircuit call stack: 45%
 - No check/cast on object ptrs: 10%
 - Drop bound method alloc: 25%
- **Effects are independent, so cumulative**
 - Total gain of about a factor of 3 in speed
- **Perhaps can be offered outside blocks**
 - Define configuration interface (or API)



Conclusion



Future Plans

- **Finish prototypes and release them**
 - Cross-inheritance, TTrees, Reflex
- **API to Converters/Executors needed**
 - Allow user to handle specific/new types
 - Possible today with ACLiC, but clumsy
- **User-side Python code-optimizations**
 - Especially for fixed/inner loops
- **Improve dependencies**
 - Load less libraries on startup

- **Documentation**
 - Chapter 20 of the ROOT User's Guide
 - <http://cern.ch/wlav/pyroot>
- **Examples**
 - `$ROOTSYS/tutorials/pyroot/*.py`
- **Code Repository**
 - root.cern.ch/viewcvs/pyroot
- **Python optimizations**
 - <http://wiki.python.org/moin/PythonSpeed/>
 - <http://www.scipy.org/>