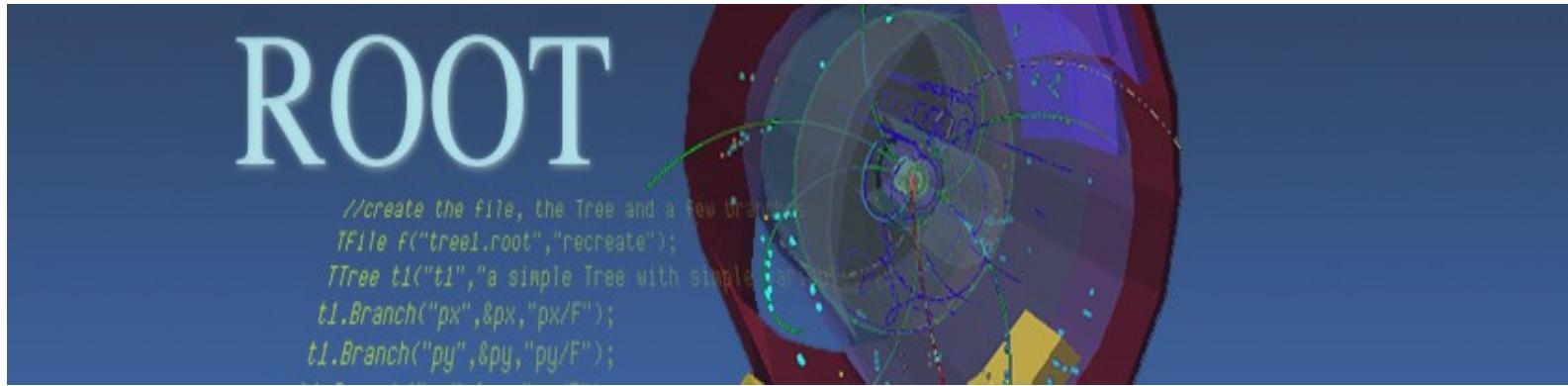


# Data Analysis Frameworks

ROOT Data Analysis Frameworks  
Computational Physics

Prof. Paul Eugenio  
Department of Physics  
Florida State University  
April 04, 2019

**http://root.cern.ch**

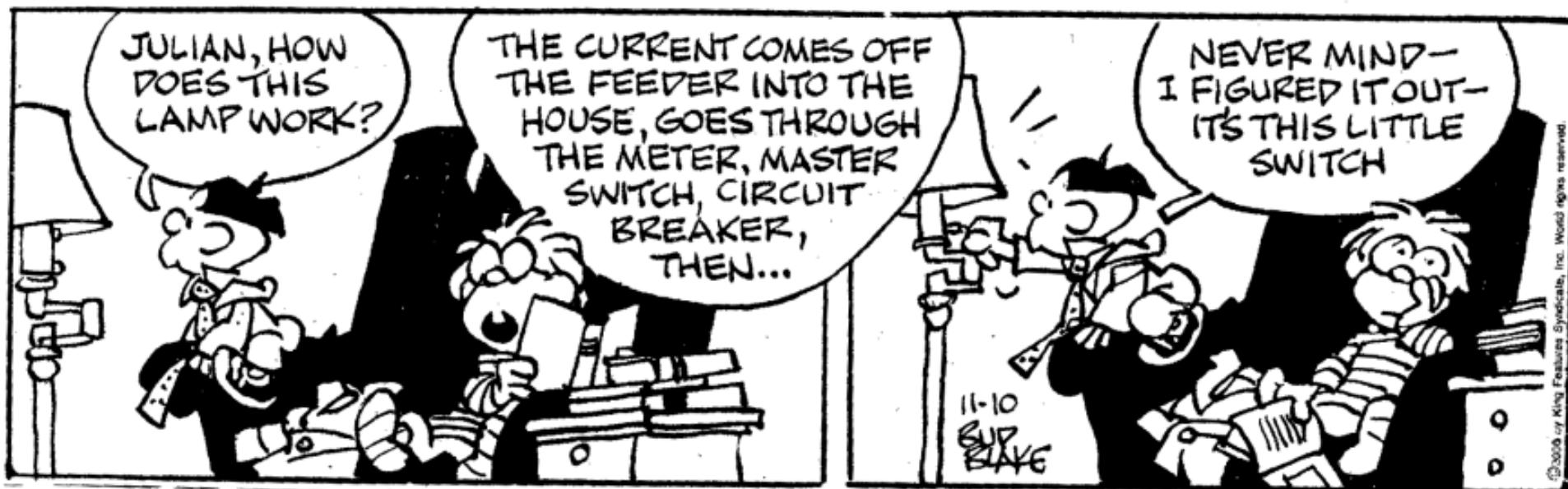


ROOT is an object-oriented framework  
aimed at solving the data analysis challenges  
of today's high-demand computing in physics

# A Framework

provides utilities and services.

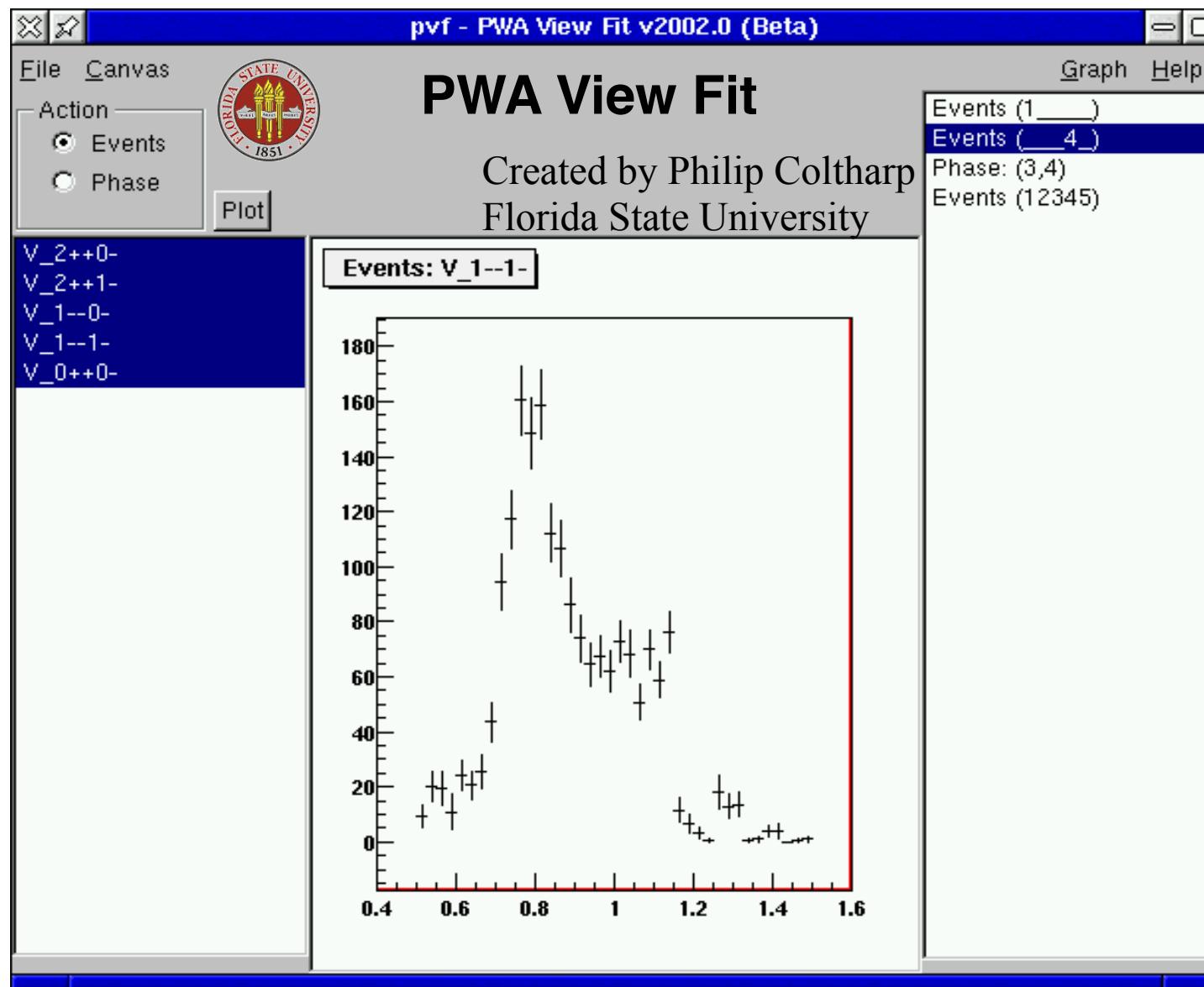
**TIGER** By Bud Blake



# ROOT's Services/Utilities

- Histogramming and Fitting
- Graphics (2D, 3D)
- I/O to file or socket: specialized for histograms, Ntuples (Trees)
- Collection Classes and Run Time Type Identification
- User Interface
  - GUI: Browsers, Panels, Tree Viewer
  - Command Line interface: C++ interpreter CINT
  - Script Processor (C++ compiled  $\leftrightarrow$  C++ interpreted)

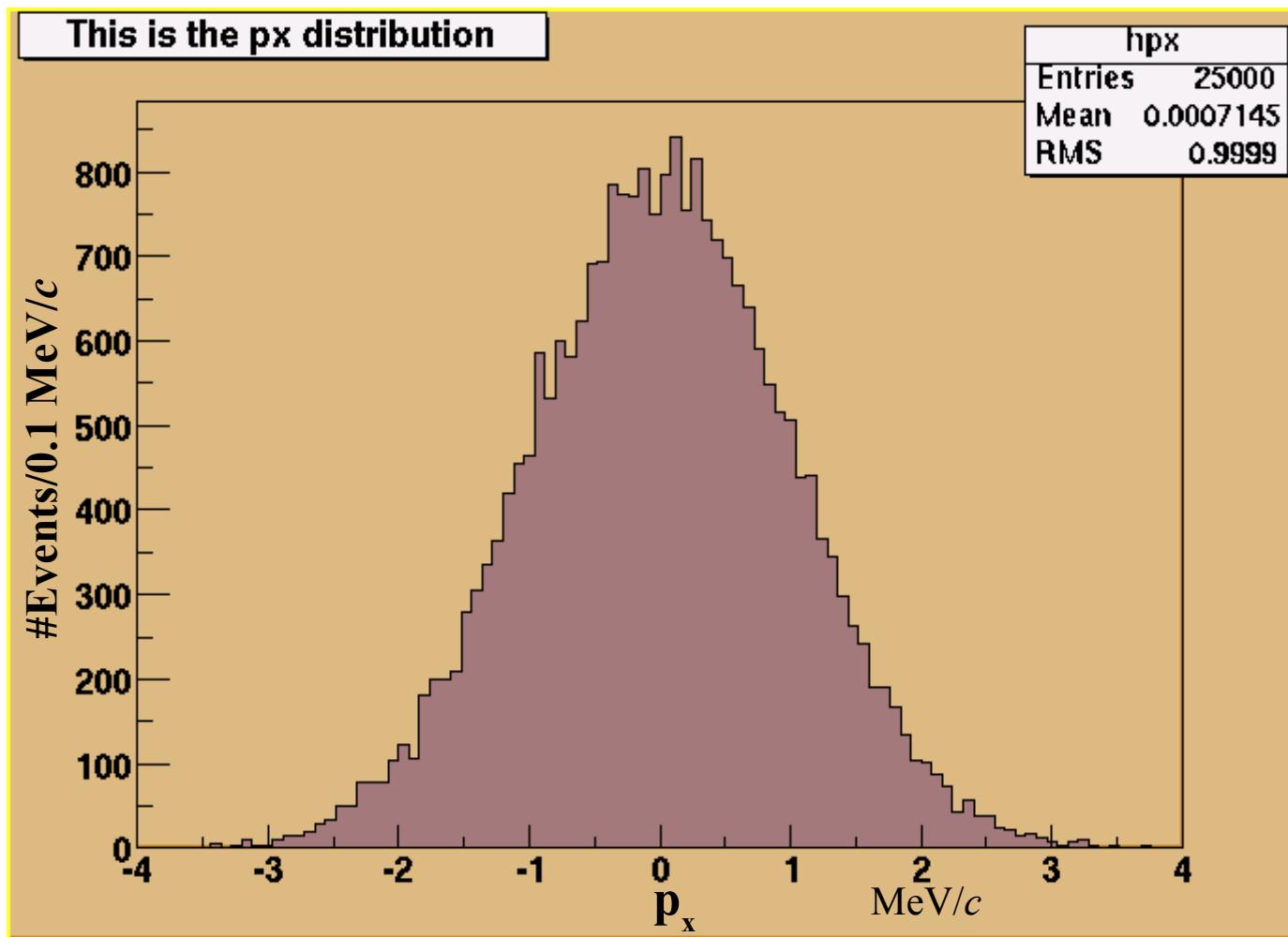
# Example GUI Application



# Data Analysis & Histograms

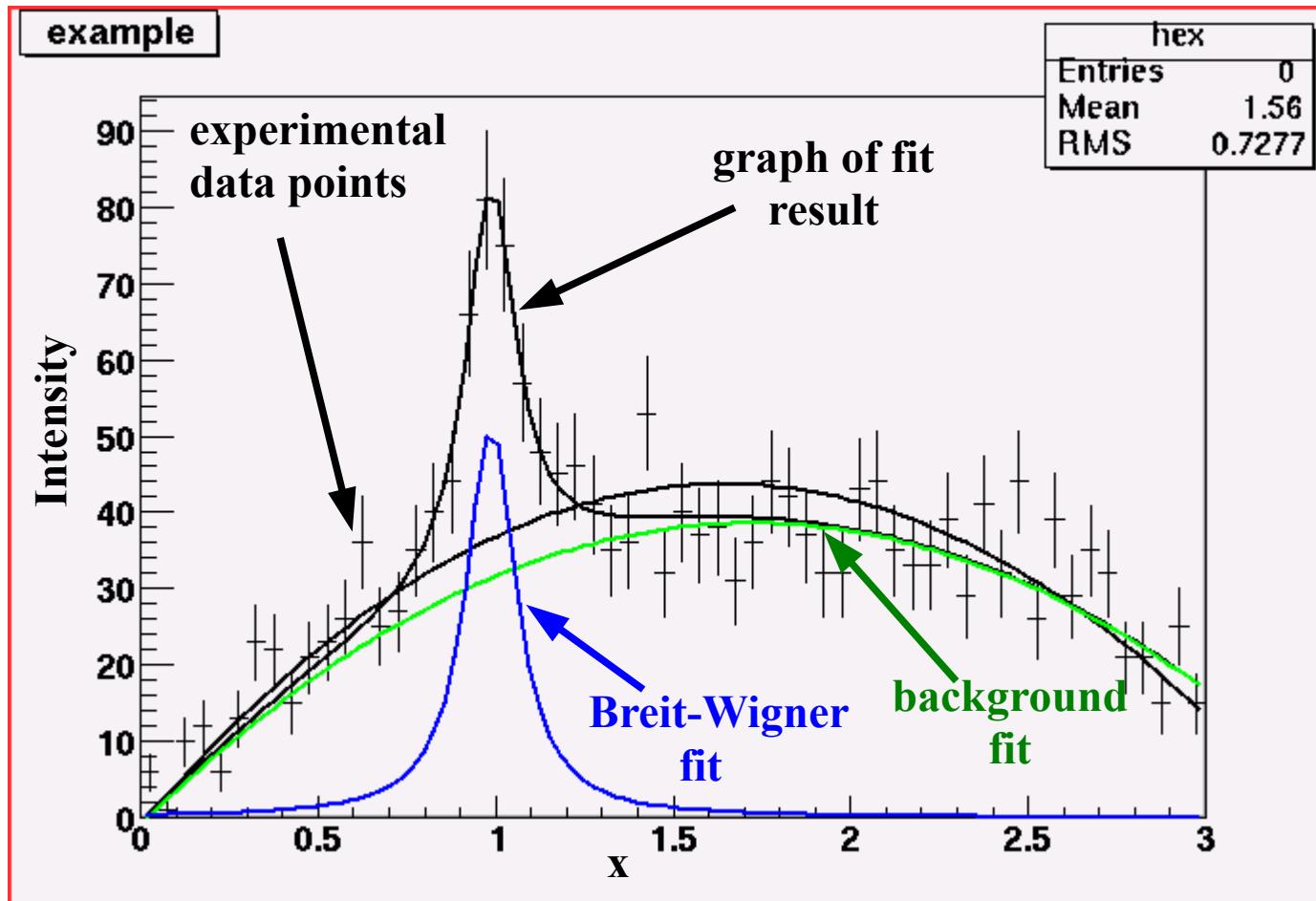
a graph representing a statistical distribution;

- projections from large volumes of data
- heights of the bars represent observed yields



# Fitting Histogram Data

Breit-Wigner Resonance plus a polynomial background

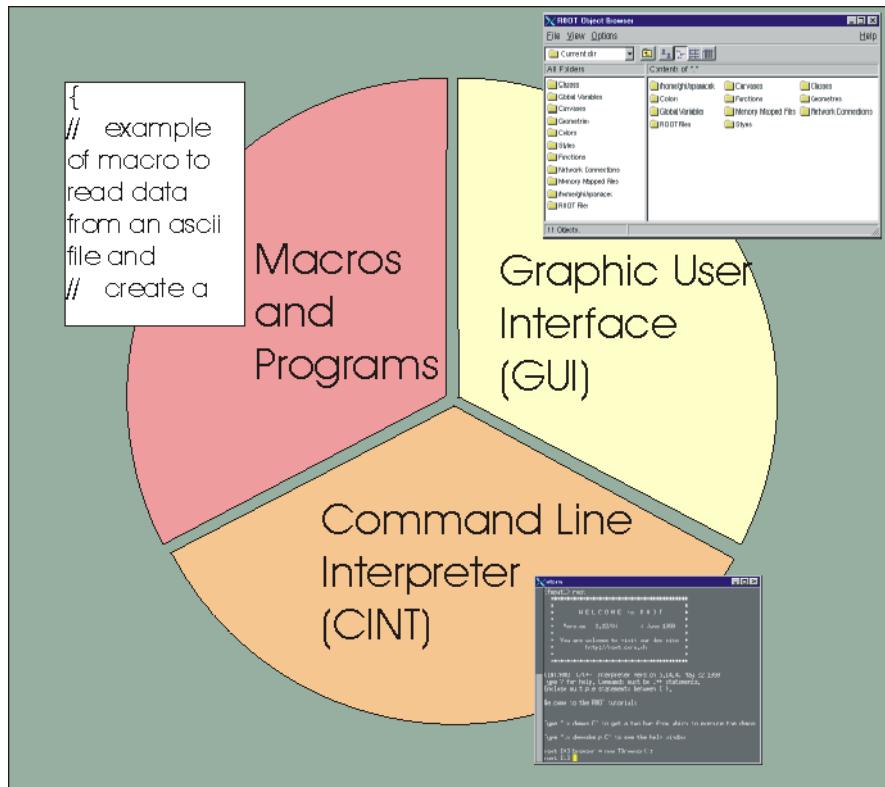


$$BreitWigner(x) = \frac{1}{2\pi} \frac{I_o \Gamma}{(x - M_o)^2 + 0.24 \Gamma_o^2}$$

$$Background(x) = a_o + b_o x + c_o x^2$$

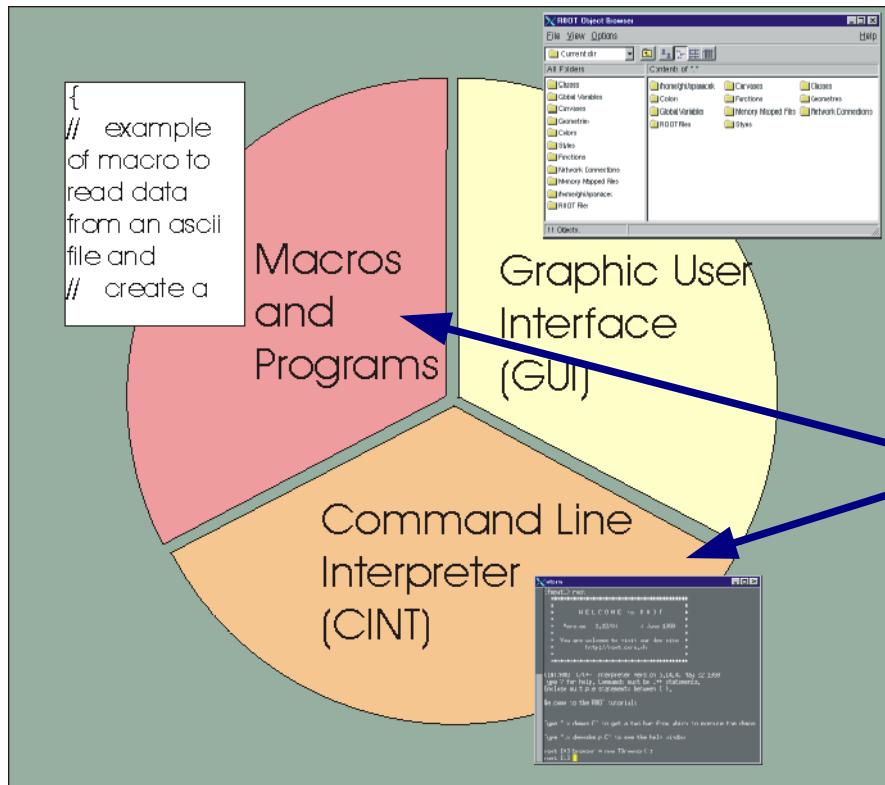
parameters of the fit:  $a_o, b_o, c_o, I_o, M_o, \Gamma_o$

# User Interfaces



- ◆ GUI  
windows, buttons, menus
- ◆ Root Command line  
CINT (C++ interpreter)
- ◆ Macros, applications,  
libraries (C++ compiler and  
interpreter)

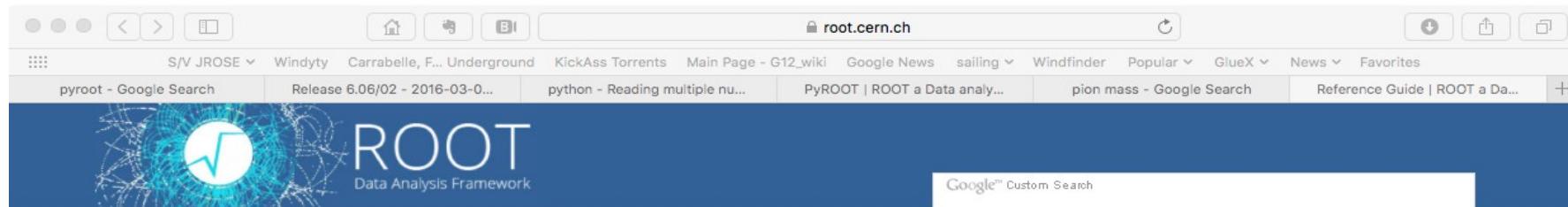
# User Interfaces



- ◆ GUI  
windows, buttons, menus
- ◆ Root Command line  
CINT (C++ interpreter)
- ◆ Macros, applications,  
libraries (C++ compiler and  
interpreter)
- ◆ PyROOT *Python* module  
allows for command line  
usage via iPython,  
applications and macros  
through module import  
ROOT and high  
performance run-time  
bindings to original C++

# ROOT Online Reference Guide

<https://root.cern.ch/>



Home > Documentation

## Reference Guide

The Reference Guide is available for all major ROOT releases, and for the current development snapshot in subversion:

- [HEAD of the git master](#)
- [6.04](#)
- [6.02](#)
- [5.34](#)

Additionally, the source code is accessible via:

- [Cross-Reference of Sources using LXR](#)
- [Browsing the Git repository using gitweb](#)

### QUICK LINKS

- [Jenkins Service](#)
- [Jenkins How To](#)
- [CDash](#)
- [Coverity](#)
- [Github](#)
- [GitWeb](#)
- [LXR](#)
- [Jira](#)
- [ROOT Logos](#)
- [Upgrade of ROOTbinder](#)

### SITEMAP

#### Download

- [Download ROOT](#)
- [All Releases](#)

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- [Reference Manual](#)
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<https://root.cern.ch/pyroot>

The screenshot shows the official ROOT website at https://root.cern.ch. The header features the ROOT logo (a stylized 'W' inside a circle) and the text "ROOT Data Analysis Framework". A "Google™ Custom Search" bar is present. A "Menu" dropdown is open, showing "Home" and "Interpreter". Below the header, the URL "https://root.cern.ch/pyroot" is visible. The main content area has a dark grey background with the title "PyROOT" in large, bold, black font. Below it, a section titled "How to use ROOT with Python (PyROOT)" is described. To the right, a sidebar titled "NAVIGATE THROUGH THIS BOOK" contains a list of links related to PyROOT.

# PyROOT

## How to use ROOT with Python (PyROOT)

PyROOT is a [Python](#) extension module that allows the user to interact with any ROOT class from the Python interpreter. This is done generically using the ROOT dictionary, therefore there is no need to generate any Python wrapper code to include new ROOT classes. At the same time PyROOT offers the possibility to execute and evaluate any Python command or start a Python shell from the ROOT/CINT prompt. Further details are available in the [PyROOT manual](#).

### More pythonistic PyROOT: [rootpy](#)

The generality with which PyROOT creates bindings based on dictionaries makes that it is close to the original C++, which is great for e.g. sharing documentation. However, where it is possible to do so automatically, e.g. for handling of container classes, "pythonizations" are available. If that is not enough for your needs, then check out the [rootpy](#) project for a more pythonistic PyROOT.

### High performance PyROOT: [cppyy](#)

A new approach is based on [cppyy](#), a run-time bindings generator like PyROOT for the [PyPy](#) project. It has both a CINT and a pure-Reflex back-end and is, depending on use, 50x-100x faster than PyROOT. A pre-installed version based on the CINT backend is available on /afs as [pypyroot](#).

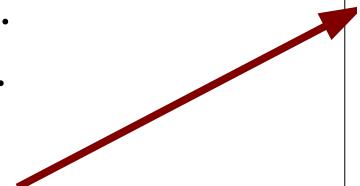


# ROOT Online C++ Guide

<https://root.cern.ch/doc/master/classTLorentzVector.html>

## Index of PHYSICS classes

TFeldmanCousins .....  
TGenPhaseSpace .....  
TLorentzRotation .....  
TLorentzVector .....  
TRotation .....  
TVector2 .....  
TVector3 .....



**TLorentzVector Class Reference**

[List of all members](#) | [Public Types](#) | [Public Member Functions](#) | [Private Attributes](#) | [List of all members](#)

**TLorentzVector** is a general four-vector class, which can be used either for the description of position and time ( $x,y,z,t$ ) or momentum and energy ( $px,py,pz,E$ ).

**Declaration**

`TLorentzVector v1; // initialized by (0., 0., 0., 0.)`  
`TLorentzVector v2(1., 1., 1., 1.);`  
`TLorentzVector v3(v1);`  
`TLorentzVector v4(TVector3(1., 2., 3.),4.);`

For backward compatibility there are two constructors from an Double\_t and Float\_t C array.

**Access to the components**

There are two sets of access functions to the components of a LorentzVector: `X()`, `Y()`, `Z()`, `T()` and `Px()`, `Py()`, `Pz()` and `E()`. Both sets return the same values but the first set is more relevant for use where `TLorentzVector` describes a combination of position and time and the second set is more relevant where `TLorentzVector` describes momentum and energy:

```
Double_t xx = v.X();
...
Double_t tt = v.T();
Double_t px = v.Px();
...
Double_t ee = v.E();
```

The components of `TLorentzVector` can also accessed by index:

```
xx = v(0);      or      xx = v[0];
yy = v(1);      or      yy = v[1];
zz = v(2);      or      zz = v[2];
tt = v(3);      or      tt = v[3];
```

You can use the `Vect()` member function to get the vector component of `TLorentzVector`:

```
TVector3 p = v.Vect();
```

For setting components also two sets of member functions can be used:

```
v.SetX(1.);      or      v.SetPx(1.);
...
v.SetT(1.);      or      v.SetE(1.);
```

# ROOT Online C++ Guide

<https://root.cern.ch/doc/master/classTLorentzVector.html>

**PyROOT provides access to the ROOT C++ objects**

```
from ROOT import TLorentzVector
```

```
piPlus = TLorentzVector(-0.12, -0.19, 1.68, 1.70)
```

```
piMinus = TLorentzVector()
```

```
piMinus.SetPxPyPzE(0.56, 0.24, 1.9, 2.1)
```

```
twoPions = piPlus + piMinus
```

```
print("The 2 pion invariant mass is ", twoPions.Mag(), "GeV/c**2." )
```

```
The 2 pion invariant mass is 1.19 GeV/c**2.
```

*Using ROOT, TNtuples, & TFiles*

# Data Trees & Ntuples

Get src at

<http://hadron.physics.fsu.edu/~eugenio/comphy/examples/ntp.py>

Create a data table of the function

$$f(x) = e^{-x} \sin^2(3x)$$

for  $x$  between 0 and 5 in steps of 0.01

# Data Trees & Ntuples

```
"""
from __future__ import division, print_function
import numpy as np
import ROOT

def func( aX ):
    """
    ...
    return np.exp( -aX ) * np.sin( 3.0 * aX )**2

xMin = 0.0
xMax = 5.0
deltaX = 0.01

# Create an instance of a TNtuple object
ntuple = ROOT.TNtuple("ntp1", "My 1st Ntuple", "x:y")

for x in np.arange( xMin, xMax, deltaX ):
    ntuple.Fill( x, func(x) )

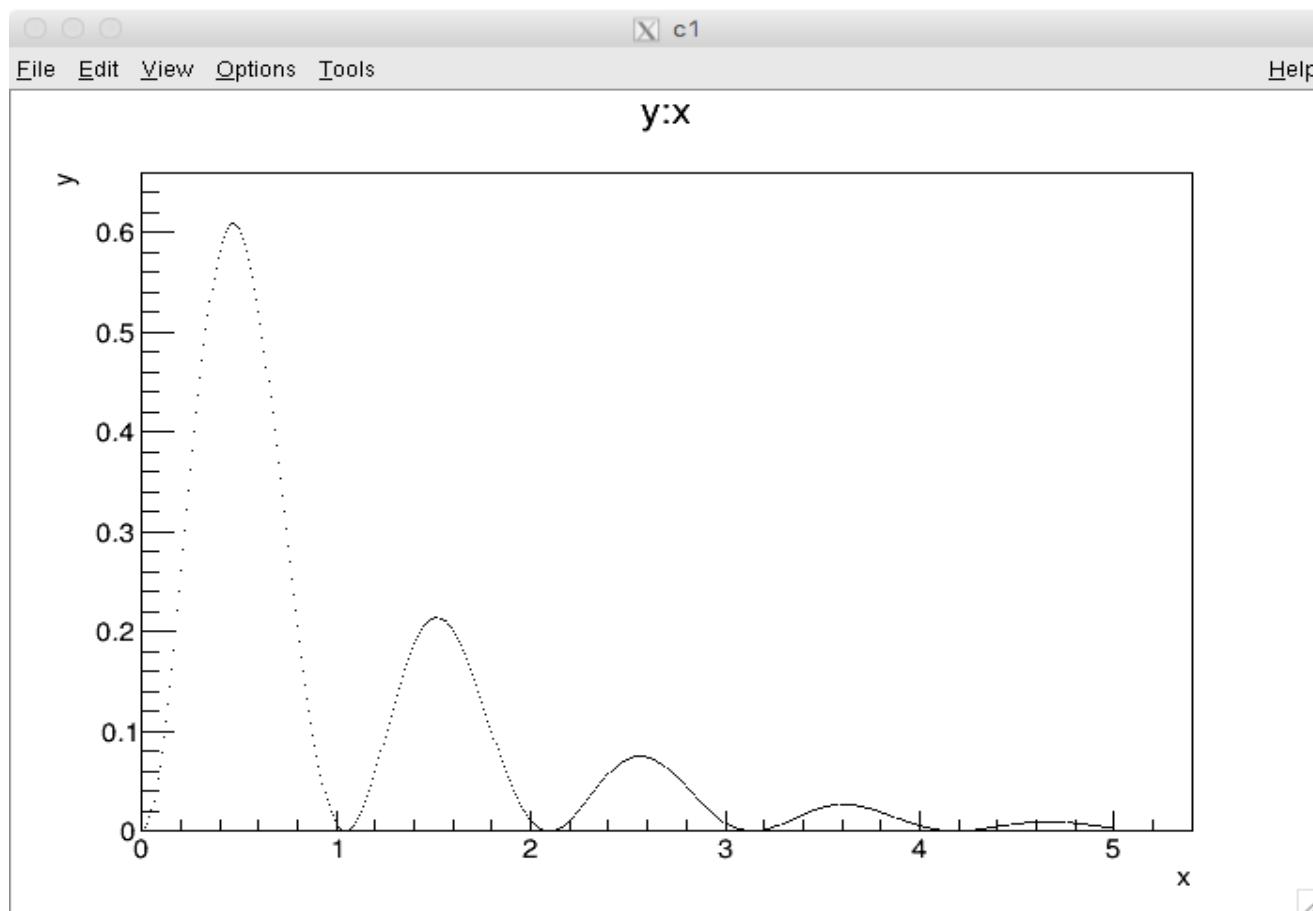
# Create a plot of func(x) vs x
ntuple.Draw("y:x")

raw_input("Enter [return] to exit")
```

**ntuple** is a data container object with name of "ntp1", title of "My 1<sup>st</sup> Ntuple", and two data elements: x, y

# Example: npt.py

```
hpc-login-39 79% npt.py
Info in <TCanvas::MakeDefCanvas>: created default TCanvas with name c1
Enter [return] to exit
```



# Saving Root Objects in a ROOT File

Get src at

<http://hadron.physics.fsu.edu/~eugenio/comphy/examples/ntpSaved.py>

```
#!/usr/bin/env python
"""
ntpSaved.py: PyROOT example of saving ROOT objects for later use

"""

from __future__ import division, print_function
import numpy as np
import ROOT

def func( aX ):
    """
    ...
    return np.exp( -aX ) * np.sin( 3.0 * aX )**2

# open a ROOT TFile
rootFile = ROOT.TFile("ntpData.root","RECREATE")
# Create an instance of a Ttuple object
ntuple = ROOT.TNtuple("ntp1", "My First Ntuple", "x:y" )

xMin = 0.0
xMax = 5.0
deltaX = 0.01

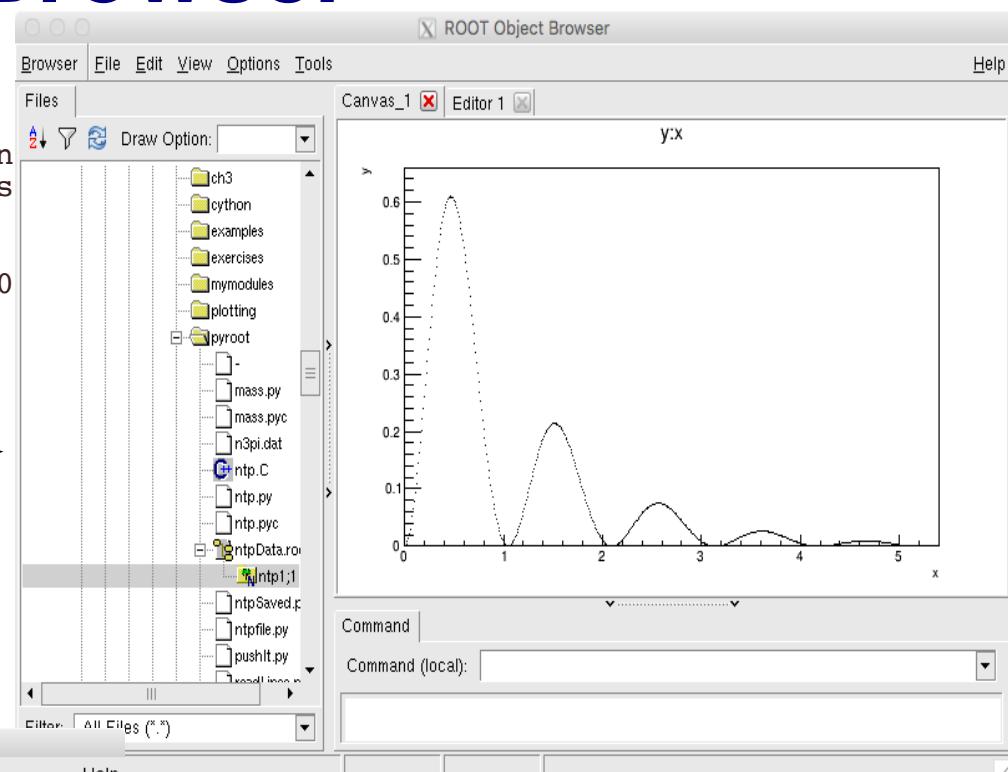
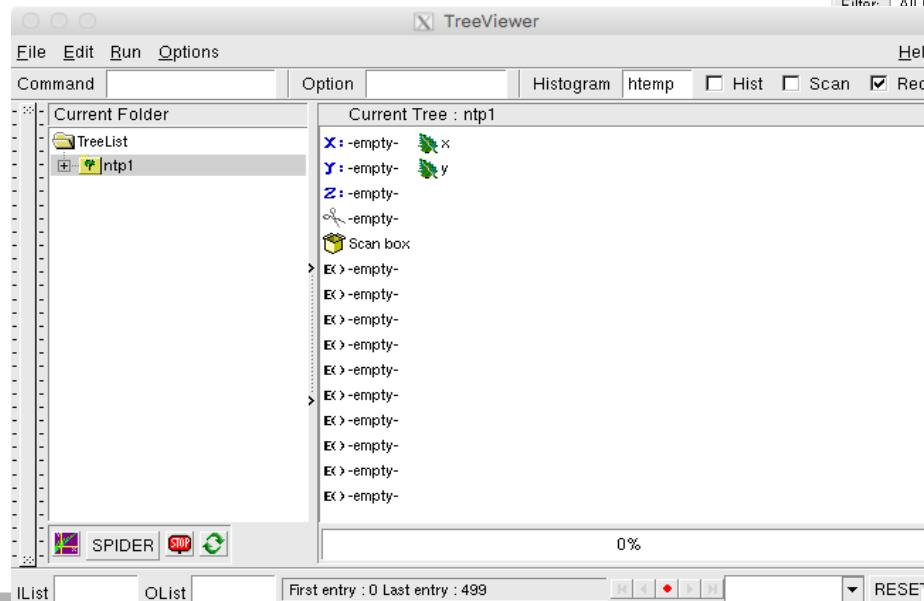
for x in np.arange( xMin, xMax, deltaX ):
    ntuple.Fill( x, func(x) )

# Save the ROOT Tfile containing ROOT objects
rootFile.Write()
```

# Running PyRoot Interactively via TBrowser

```
hpc-login-39 92% python
Python 2.7.5 (default, Nov 6 2016, 07:46:25)
[GCC 4.8.5 20140120 (Red Hat 4.8.5-11)] on lin
Type "help", "copyright", "credits" or "licens
>>> import ROOT
>>> ROOT.TBrowser()
<ROOT.TBrowser object ("Browser") at 0x282e650
>>> (TFile *) 0x7f9790112240
```

From TBrowser open root file nptData.root  
Then right click over "ntp1" and select "StartViewer"



# Getting Started

- ◆ Environment
  - ◆ Edit your “`~/.cshrc`” file

Add these lines near the end of file:

```
# set up for ROOT
setenv ROOTSYS ~eugenio/root
setenv LD_LIBRARY_PATH "${LD_LIBRARY_PATH}:$ROOTSYS/lib"
set path=( $path $ROOTSYS/bin )

# set up for pyROOT module
setenv PYTHONPATH "${ROOTSYS}/lib:${HOME}/python/mymodules:/mymodules"
```

These should exist

# Getting Started

Open new terminal session and Check python

**Open an interactive python session and try**

```
hpc-login-25 515% python
>>> import ROOT
>>>
```

No error messages after delay,  
then all is working



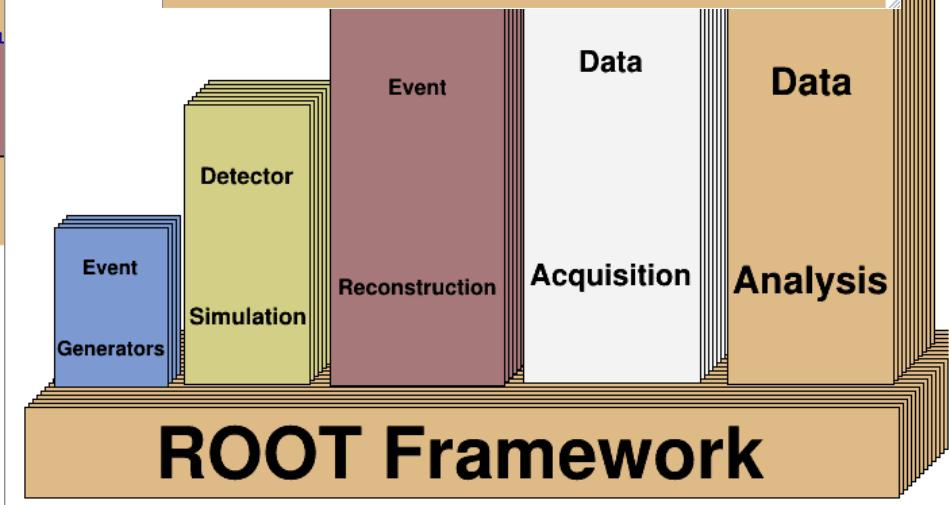
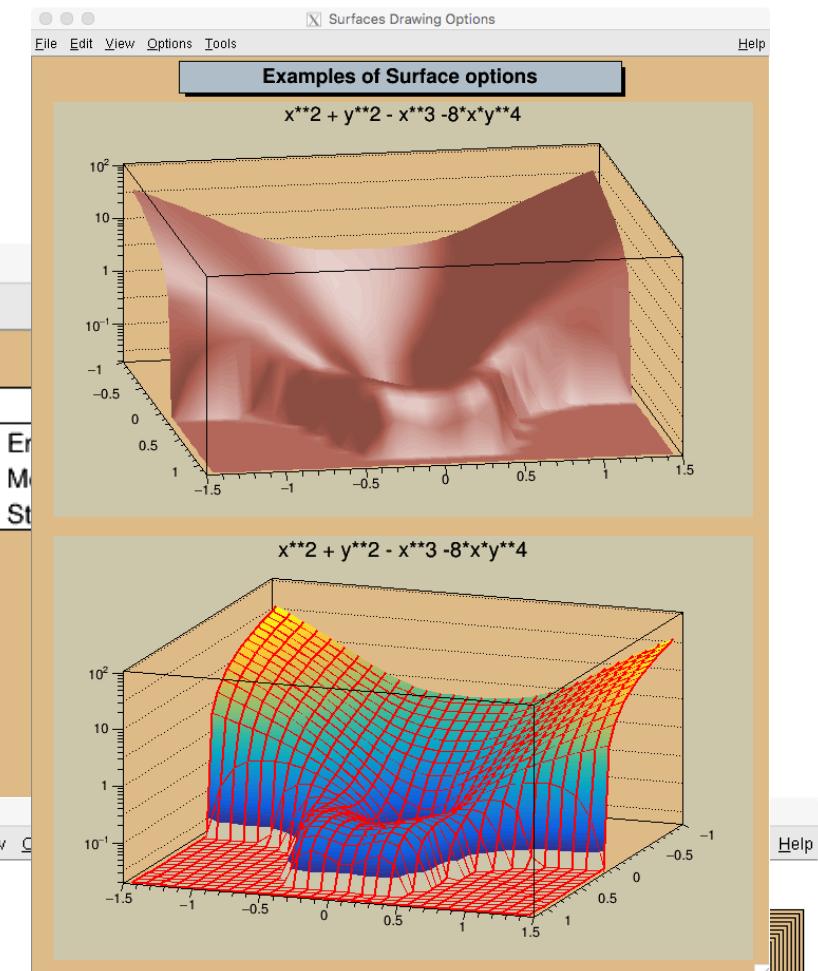
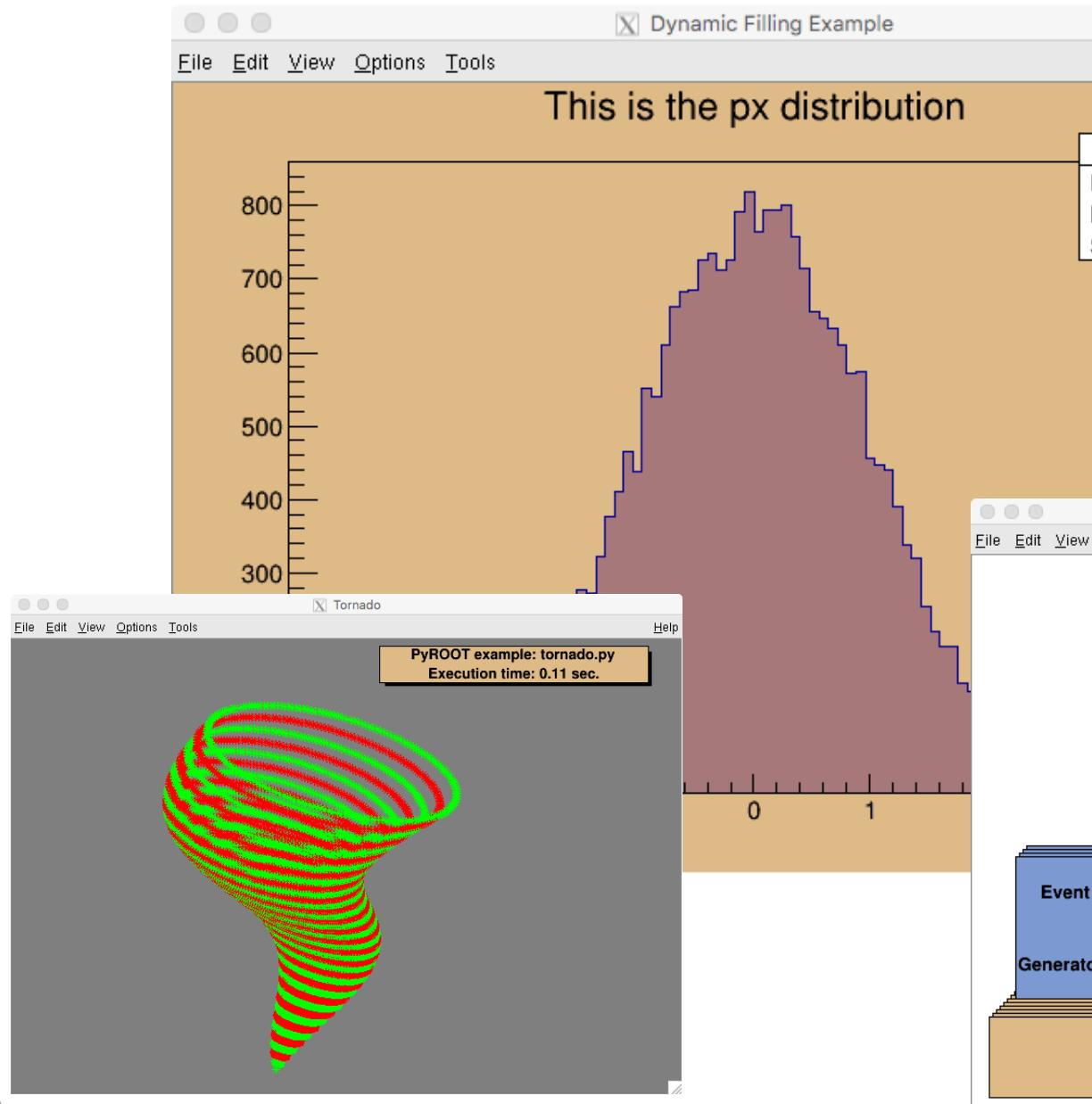
**Get my examples online and give PyROOT a test run**

```
75% wget http://hadron.physics.fsu.edu/~eugenio/comphy/examples/ntp.py
76% wget http://hadron.physics.fsu.edu/~eugenio/comphy/examples/ntpSaved.py
77% chmod +x ntp.py ntpSaved.py
78% ntp.py
```

**Exit from python and copy over the pyroot examples**

```
physics 71% mkdir pyroot-examples/
physics 72% cd pyroot-examples/
physics 73% cp $ROOTSYS/tutorials/pyroot/* .
physics 74% python demo.py
```

# Let's get working



Let's get rolling

