

# ROOT and statistics tutorial

## Exercise: Discover the Higgs, part 1



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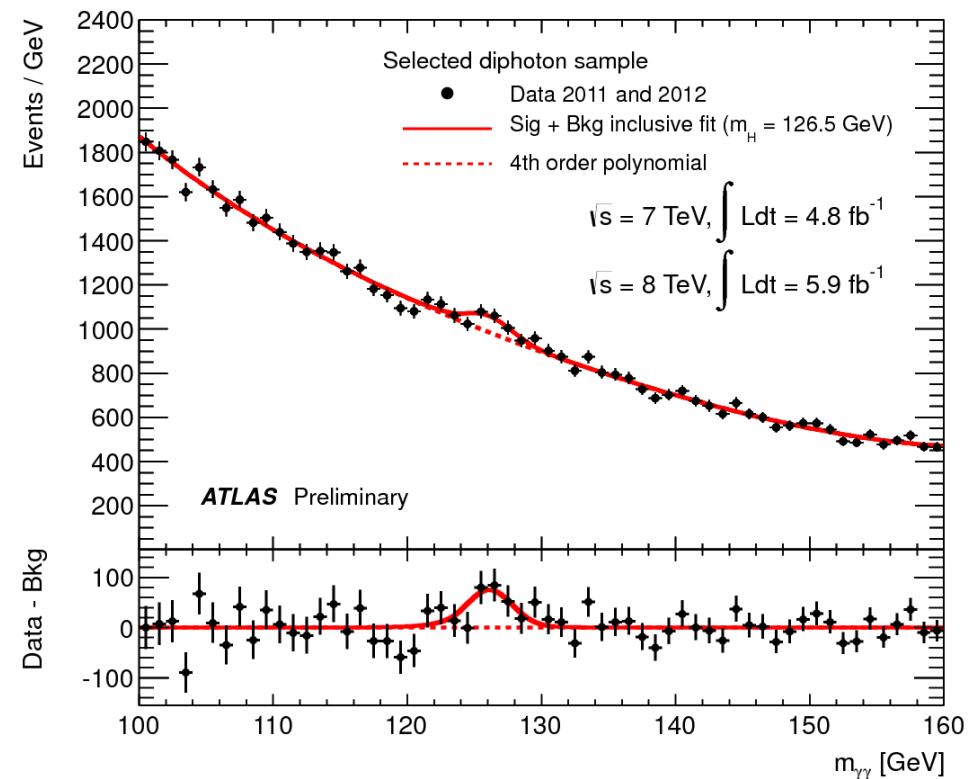
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# Outline

- What will we do today:
  - **Discover the Higgs boson of course!** ...in a small toy simulation ☺
- What we will learn!
  - Opening and read a root file
  - Fill an histogram with  $\gamma\gamma$  invariant masses
  - Fit this histogram with increasing level of complexity:
    1. Estimate resolution from simulation
    2. Understand background shape
    3. Look at a “data” sample:  
where is the Higgs boson?
- For people running fast:
  - Signal strength plot
  - Solve using RooFit (or PyROOT)



# What's in the TTree

- Download from the indico page the zip file containing the material for this exercise: **Exercise\_Hgamgam.zip**. Pick up **Higgs130.root**
  - This file contains 10000 simulated photon pairs coming from a Higgs with mass  $m_H=130$  GeV. For each pair it contains  $E_T$ ,  $\eta$ ,  $\phi$  of the leading and sub-leading  $\gamma$ s.

• Enter in Root

• Open the file:

```
TFile* f = TFile::Open("Higgs130.root");
```

• List the file content:

```
f->ls();
```

• You can see there is a TTree called tree.

To see its content, open it in a viewer:

```
tree->StartViewer();
```

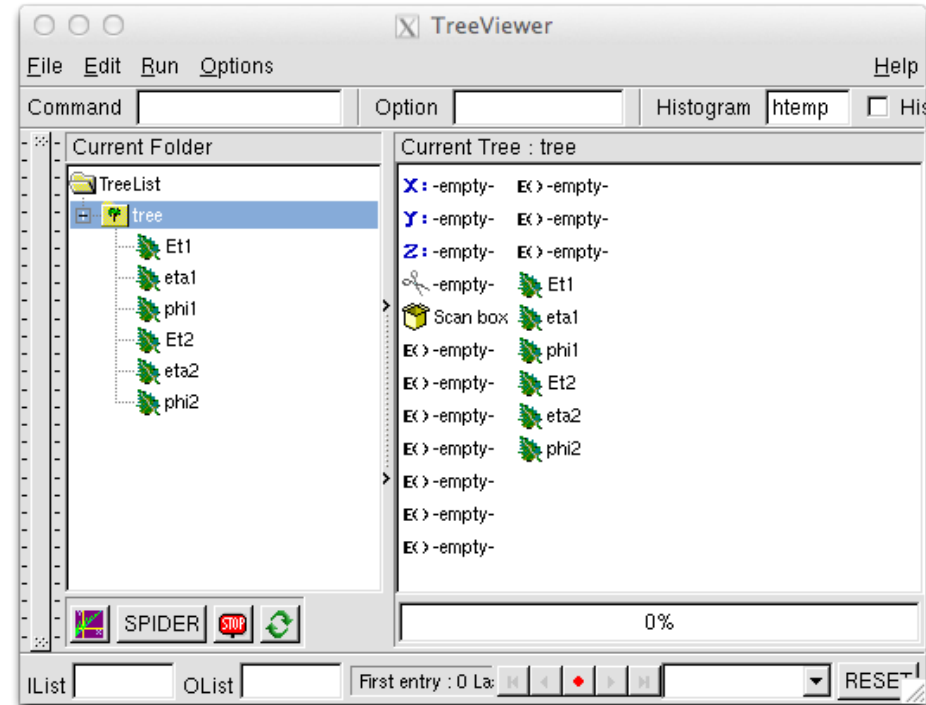
In *interactive* ROOT you can use

**object names as pointers.**

**But do not try to use that in a macro!**

• To see the content of the variables, either double click on them or use the Draw method:

```
tree->Draw("phi2:phi1", "abs(eta1)<1.");
```

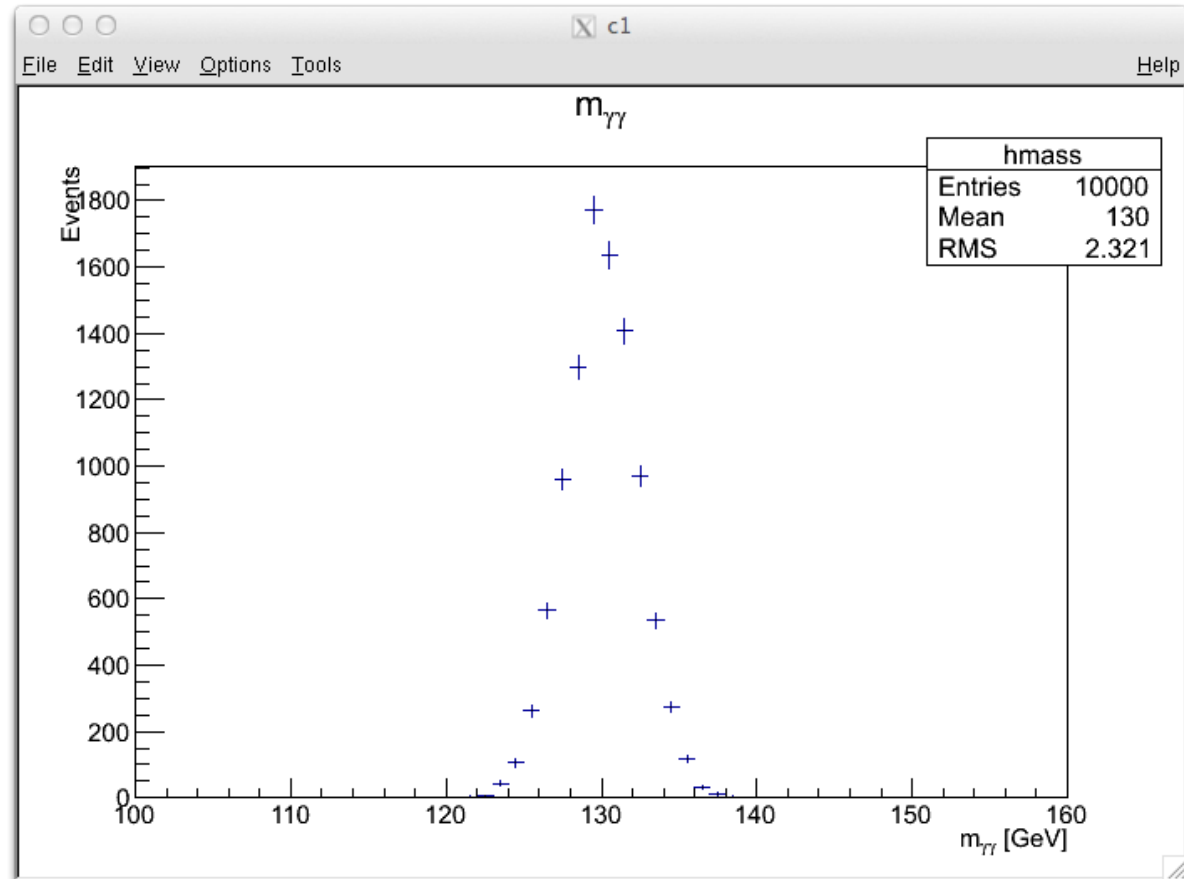


# More complex operations

- To do any more serious manipulation on the TTree content, one needs to use at least a macro.
- Among the downloaded files there is a small macro example: `readTree_basic.C`

- Execute this macro:  
`root -l -x readTree_basic.C`  
it will display the distribution of  $\gamma\gamma$  invariant mass.

- **Let's see what's inside!**



# The basic macro: part 1

```
void readTree_basic() {  
    Char_t *filename = "Higgs130.root";  
    // Retrieve the TTree  
    TFile* myFile = TFile::Open(filename);  
    TTree* tree = (TTree*)(myFile->Get("tree"));  
    Double_t Et1, eta1, phi1, Et2, eta2, phi2;  
    tree->SetBranchAddresses("Et1", &Et1);  
    tree->SetBranchAddresses("eta1", &eta1);  
    tree->SetBranchAddresses("phi1", &phi1);  
    tree->SetBranchAddresses("Et2", &Et2);  
    tree->SetBranchAddresses("eta2", &eta2);  
    tree->SetBranchAddresses("phi2", &phi2);  
    // Book histograms  
    TH1F* hmass = new TH1F("hmass", "m_{#gamma#gamma}", 60, 100., 160.);  
    hmass->GetXaxis()->SetTitle("m_{#gamma#gamma} [GeV]");  
    hmass->GetYaxis()->SetTitle("Events");  
}
```

To executed automatically  
same name as file

File to read  
(it changes during the exercise)

In a macro need to retrieve  
the object properly (still  
using their names

This is where information  
read from file is stored

Book the histogram

Label the axes!  
(otherwise old professors  
complain)



# The basic macro: part 2

```
// Loop over the events
Long64_t events = tree->GetEntries();
for (int i=0; i<events; i++) {
    tree->GetEntry(i);
    TLorentzVector g1,g2;
    g1.SetPtEtaPhiM(Et1,eta1,phi1,0.);
    g2.SetPtEtaPhiM(Et2,eta2,phi2,0.);
    TLorentzVector gg=g1+g2;
    hmass->Fill( gg.M() );
}
hmass->Draw("e");
}
```

Get the number of events in the TTree

Load the event i in memory

TLorentzVector is a powerful class, implementing the whole Lorentz vector algebras and many, many useful methods.

See all of them at:  
<http://root.cern.ch/root/html/TLorentzVector.html>

Fitting is easy when using some predefined functions, like a Gaussian.  
Add before:  
`hmass->Fit("gaus");`  
Get the resolution of  $\gamma\gamma$  mass reconstruction.



# Step 1: which is the resolution on $m_{\gamma\gamma}$ ?

- Compute the resolution on the mass peak for the following samples (the file name indicates the simulated Higgs boson mass):
  - Higgs110.root
  - Higgs120.root
  - Higgs130.root
  - Higgs140.root

- After the fit the resulting parameters can be retrieved by the instructions:

```
hmass->GetFunction("gaus")->GetParameter(2);  
hmass->GetFunction("gaus")->GetParError(2);
```



- Provide a reasonable parameterization of the mass resolution as a function of the  $m_H$ .

## Hint

In this mass region the Higgs boson is a narrow resonance, so its observed mass is dominated by the experimental resolution.

$$m_H = \sqrt{2E_{g1}E_{g2}(1 - \cos\theta_{g1,g2})}$$

The main contribution is the uncertainty in energy reconstruction, which is usually parameterized as:

$$\frac{S_E}{E} = A \oplus \frac{B}{\sqrt{E}} \oplus \frac{C}{E}$$



In our simulation one of these three terms will dominate.



# Background model

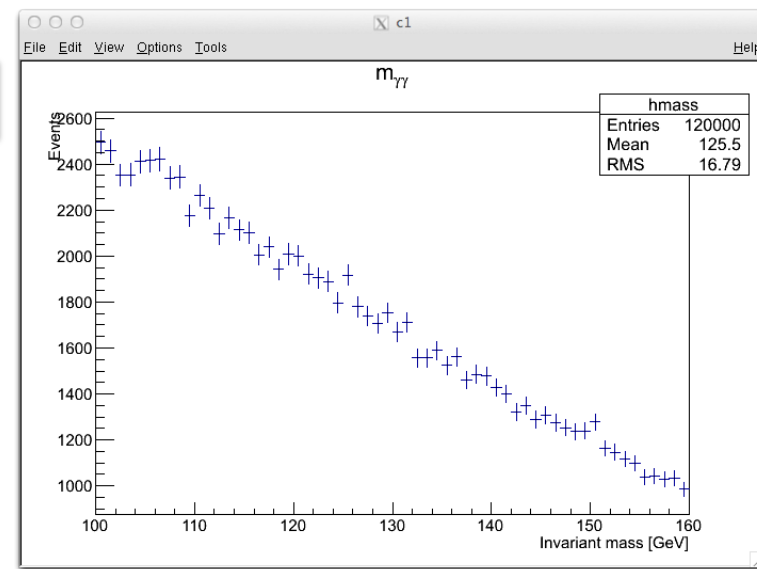
- Use the file: **Background.root**
- Content of this file are di-photons from background events: our aim is to define a model for their  $m_{\gamma\gamma}$  distribution.
- Let's fit the resulting histograms with different functions:
  - Exponential  $p_0 * \exp(-m_{\gamma\gamma}/p_1)$
  - 1<sup>st</sup>, 2<sup>nd</sup> and 3<sup>rd</sup> degree polinomial
- Use a more general approach:

```
TF1* myF = new TF1("myF", "[0]*exp(-x/[1])", 100., 160.);  
myF->SetParameter(0, 1000.);  
myF->SetParameter(1, 30.);  
hmass->Fit(myF);
```

Parameters

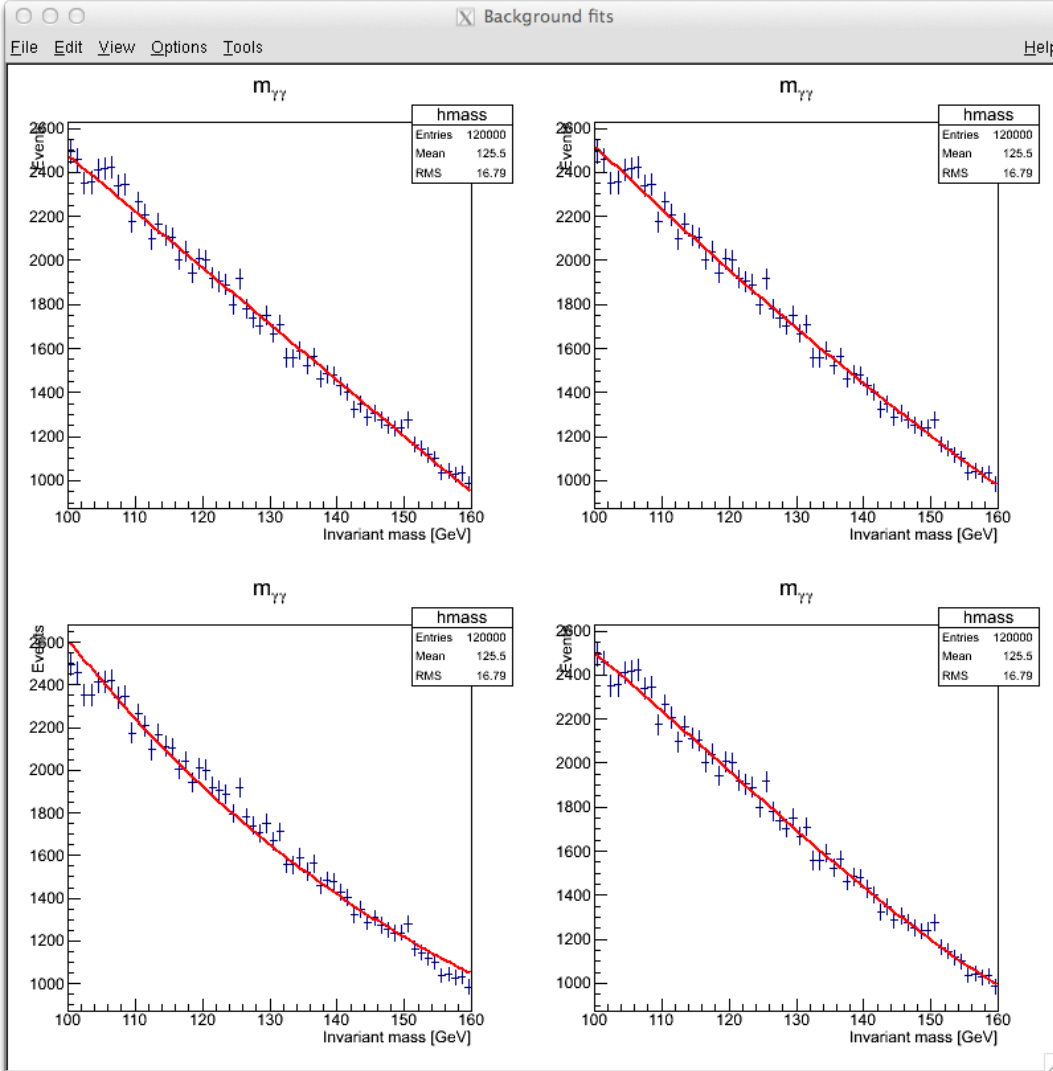
Need to set initial values for all parameters

Fit using a pointer to the TF1 fit function





# How to discriminate these models?



## Hint

If wanting to have multiple plots of the same histogram, use the method `DrawClone` instead of `Draw`.

You need a `TCanvas` for each clone:

```
TCanvas *c1 = new TCanvas();  
hmass->Fit(myF1);  
hmass->DrawClone("e");  
TCanvas *c2 = new TCanvas();  
hmass->Fit(myF2);  
hmass->DrawClone("e");
```

Or to divide a `TCanvas` in zones:

```
TCanvas *c1 = new TCanvas();  
c1->Divide(2,2);  
c1->cd(1)  
hmass->Fit(myF1);  
hmass->DrawClone("e");  
c1->cd(2);  
hmass->Fit(myF2);  
hmass->DrawClone("e");
```



# Step 2: choose the background model.

- When invoked with option "S", the `Fit` method gives back a pointer to a `TFitResult` object:  

```
TFitResultPtr fit1 = hmass->Fit(myF1,"S");
```

- This object has many accessors to the result and quality of the fit:

```
- Double_t par = fit1->Parameter(0);  
- Double_t spar= fit1->ParError(0);  
- Double_t chi2= fit1->Chi2();  
- Int_t NDF = fit1->Ndf();
```

- The function

```
TMath::Prob(chi2,NDF)
```

provides the p-value for the  $\chi^2$  fit (probability that, if the distribution follows the given parameterization, the  $\chi^2$  will be worse than the observed one).

- Which function will you choose?

## Rules of thumb

- The p-value of the  $\chi^2$  fit must be reasonable (it cannot be perfect if we don't know the real functional form of the background.)
- If there are parameters compatible with 0, it indicates they are not useful in improving quality of the data description.

Retrieve the value of fitted parameter

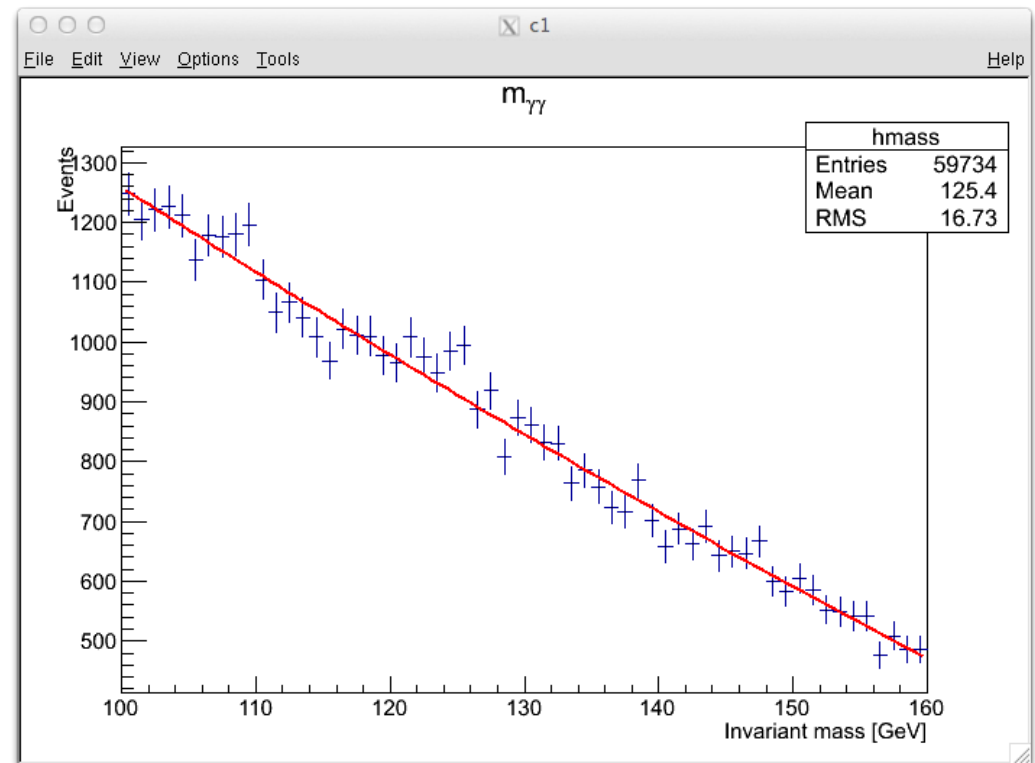
Get its uncertainty

$\chi^2$  and number of degrees of freedom of the fit



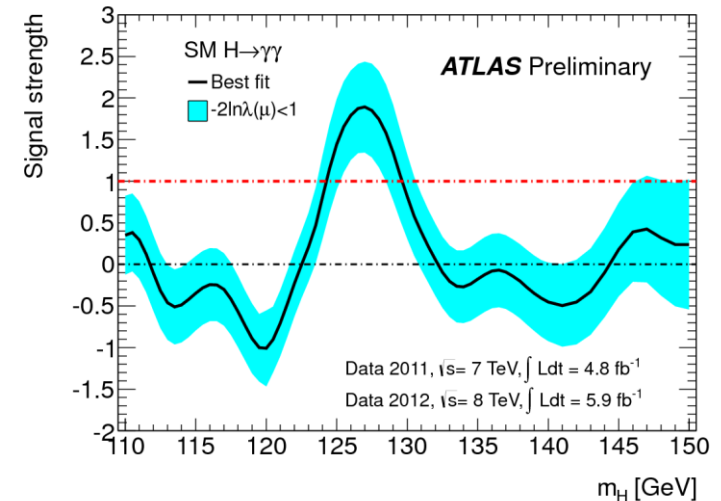
# Opening the black box

- Use the file: **Data.root**
- Content of this file are di-photons with both signal and background:
  - But you do not know the mass, nor the amount of the signal (it may be zero).
- First, fit it just with the background model found in the previous step:
  - What's the value of the  $\chi^2$  and its p-value?
- Fit adding to your background a Gaussian whose width depends on  $m_H$  (from your initial study)
  - Be careful in setting initial values of the parameters!
  - To be more specific:
    - How much is the mass of the excess about 110 GeV?
    - How much is its significance? (as significance take the amplitude of the fitted Gaussian divided by its uncertainty)



# The signal strength plot

- A more systematic way to proceed is the so-called signal strength:
  - Fix a mass hypothesis
  - Fit the shape for that hypothesis
  - Look at the signal amplitude vs. mass hypothesis
  - *Normally divided for expected signal amplitude* (so that our model as strength=1): we do not do it here.

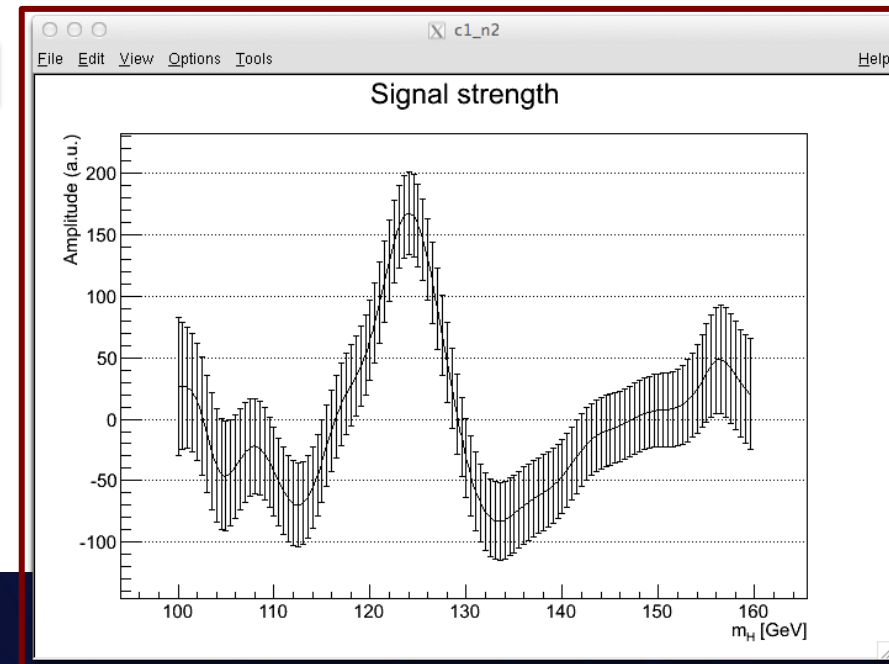


```

TGraphErrors* myGraph = new TGraphErrors();
for (Int_t i=0; i<120; i++) {
    ...
    myHiggs->FixParameter(4, mH);
    TFitResultPtr result = hmass->Fit(myHiggs, "SQ");
    myGraph->SetPoint(i, mH, result->Parameter(3));
    myGraph->SetPointError(i, 0., result->ParError(3));
    ...
}
myGraph->Draw("ACP");
    
```

Fix mass parameter

Retrieve amplitude and its error



# If using RooFit

- You can use the same approach, but before fitting you need to translate the **TH1** histogram with the mass distribution in a **RooDataHist** object.
- To fix a **RooRealVar** (you may need that in a loop):  
`Variable = value;`  
`Variable.setConstant(true);`

