### Working with Collie: A Confidence Level Limit Evaluator

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## Outline

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## What is Collie?

- Collie is a software suite designed to generate Confidence Levels (CL) which is used to calculate upper limits for TEST and NULL hypothesis.
  - TEST hypothesis: Signal + background hypothesis, i.e. new Physics.
  - NULL hypothesis: background only.
- This tool tries to separate TEST and NULL hypothesis in a way to get observed and expected limits with ± 1 / 2 sigmas.
- $\chi^2$  fits are applied to compare data/MC considering:
  - Gaussian statistics
  - Poisson likelihood statistics
- Limits are calculated for the minimum  $\chi^2$  value

## Collie inputs and Effects from Systematics

- Hight Energy Physics search analysis often has a final variable chosen to be sensitive to a parameter of the search system.
- This final variable is composed by signal, background and data distributions.
- Measurements are affected by nuisance parameters.
  - Nuisance parameters are not parameters of interest, but somehow affect measurements.
  - Example of nuisance parameters: luminosity, efficiencies, background cross sections.
- Nuisance parameters have systematic uncertainties which can degrade the sensitive of the final variable.
- So Collie tries to reduce the effects from systematics.

### **Example of Collie input**

### Final variable from TMVA analysis



## **Creating a Collie IO file**

- int main(int argc, char\* argv[]) {
- CollieIOFile\* cfile = new CollieIOFile();

//outputfile and channel name

- cfile->initFile("exampleCollieIOfile.root", "Test Channel");
- cfile->setInputHist(0.0,1.0,20);
- cfile->setSmooth(false);
- //Define backgrounds
- vector<string> bkgdNames;
- bkgdNames.push\_back("Bkgd1");
- bkgdNames.push\_back("Bkgd2");
- cfile-> createChannel(bkgdNames);

//Define your input histograms

//Option to smooth histograms

## ...creating collie IO file

#### // Get inputs from a file:

- TFile infile("myInputFile.root");
- TH1D\* data = (TH1D\*)infile.Get("data");
- TH1D\* signal = (TH1D\*)infile.Get("signal");
- TH1D\* bkgd1 = (TH1D\*)infile.Get("bkgd1");
- //Backgrounds are passed in via vector
- vector<TH1D\*> vbkgd;
- vbkgd.push\_back(bkgd1);
- vbkgd.push\_back(bkgd2);
  - // Mass points are passed here
- cfile->createMassPoint(100, data, sig, 1,vbkgd,valpha);

## ...creating IO files

//Add systematics...either flat or by shape (ie, function of final variable)

// if by shape, must supply a histogram of the values in percent(%)
fluctuations...

// Signal requires no index, but backgrounds must be specifically indexed (0>N bkgds)

- cfile->createFlatSigSystematic("Lumi",0.06,0.06,100);
- cfile->createShapeSigSystematic("SigShape",sigSystP,sigSystN,100);
- cfile->createFlatBkgdSystematic(0,"Lumi",0.06,0.06,100);
- cfile->createFlatBkgdSystematic(1,"Lumi",0.06,0.06,100);
- ///store channel
- cfile->storeFile();
- •

### Log Likelihood Ratio distributions

## • $1 - Cls = 1 - \alpha = confidence level$



## **Confidence level calculations**

- Confidence level can be evaluated by 4 different kinds of tools:
  - CLfast: fast tool, but ignores systematics
  - CLsyst: standard gaussian including systematics
  - CLfit: single likelihood fit, maximized over systematics
  - CLfit2: double likelihood fit, maximized over systematics



# $\chi^2$ formulas

$$\chi^{2} = \sum_{i}^{N^{\text{bins}}} \frac{(d_{i} - p_{i})^{2}}{\sigma_{i}^{2}} = -2\ln\left(\frac{\mathcal{L}}{\mathcal{L}_{0}}\right)$$
$$\mathcal{L} = \prod_{i}^{N^{\text{bins}}} \left(\frac{1}{\sigma_{i}\sqrt{2\pi}}\right) \exp^{-\frac{(d_{i} - p_{i})^{2}}{2\sigma_{i}^{2}}}$$
$$\mathcal{L}_{0} = \prod_{i}^{N^{\text{bins}}} \left(\frac{1}{\sigma_{i}\sqrt{2\pi}}\right)$$

$$\mathcal{L}^{P} = \prod_{i}^{N^{\text{bins}}} \frac{p_{i}^{d_{i}} \exp^{-p_{i}}}{d_{i}!}$$
$$\mathcal{L}_{0}^{P} = \prod_{i}^{N^{\text{bins}}} \frac{d_{i}^{d_{i}} \exp^{-d_{i}}}{d_{i}!}$$

$$\chi^{2} = -2 \ln \left(\frac{\mathcal{L}^{P}}{\mathcal{L}_{0}^{P}}\right)$$
$$= -2 \ln \prod_{i}^{N^{\text{bins}}} \left(\frac{p_{i}}{d_{i}}\right)^{d_{i}} \exp^{(d_{i}-p_{i})}$$
$$= 2 \sum_{i}^{N^{\text{bins}}} (p_{i}-d_{i}) - d_{i} \ln \left(\frac{p_{i}}{d_{i}}\right)$$

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## $\chi^2$ fit results



1.11

3-C sty FL 340 sty Fit to D at

5+3 Fe to Data

N-Sigma

### **Matrix correlation between systematics**

