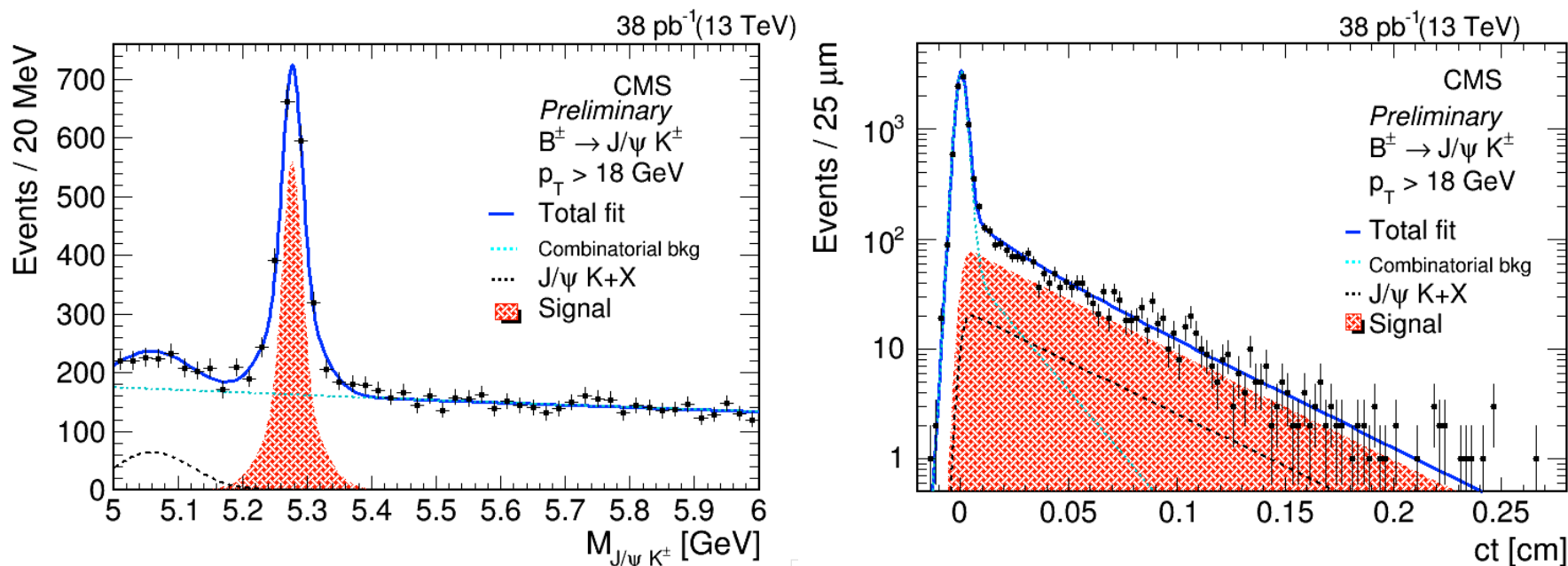


INTERPOLAZIONI BIDIMENSIONALI con ROOFIT

LEZIONE PRATICA per il Corso di Dottorato

Docente: A.Pompili – 8 ottobre 2015 [15.30-19.30]



Questi sono *approved plot* di CMS con i primi dati a $\sqrt{s} = 13\text{TeV}$ (ringrazio Monika Sharma di CMS) ma non saranno oggetto di pubblicazione poiché sono ottenuti con un trigger inclusivo di J/ψ e non con un trigger J/ψ displaced (meno fondo!).

Si vuole interpolare contemporaneamente due osservabili:

- la massa invar. $J/\psi(\mu^+\mu^-)K^\pm$ con segnale del mesone B^\pm ($B^\pm \rightarrow J/\psi K^\pm$)
- il tempo proprio del suddetto spettro

Il fine e' la stima della vita media del mesone B^\pm .

Si ricordi che:

tempo di volo
distanza di volo

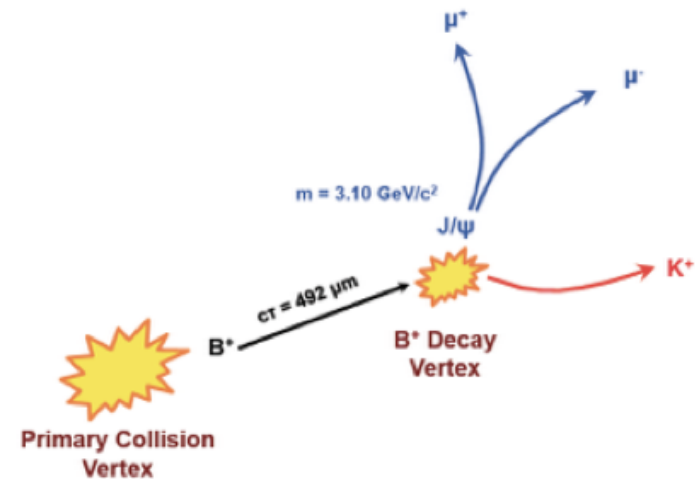
tempo proprio : $t = \frac{t_{LAB}}{\gamma} = \frac{1}{\gamma} \cdot \frac{l_{DEC}}{\beta c}$ \Rightarrow $ct = \frac{l_{DEC}}{\beta\gamma} \equiv \frac{l_{DEC}}{\beta\gamma} \cdot \frac{m_{B^+}^{PDG}}{m_{B^+}^{PDG}} = m_{B^+}^{PDG} \cdot \frac{l_{DEC}}{p_{B^+}}$

Quindi, a seconda che la distanza di volo sia 3D o nel piano trasverso, si ha:

$$ct = m_{B^+}^{PDG} \cdot \frac{l_{DEC}}{p_{B^+}} = m_{B^+}^{PDG} \cdot \frac{l_{DEC}^\perp}{p_{B^+}^\perp}$$

Si ricordi che, indicata con τ la vita media, si ha, per il B^\pm :

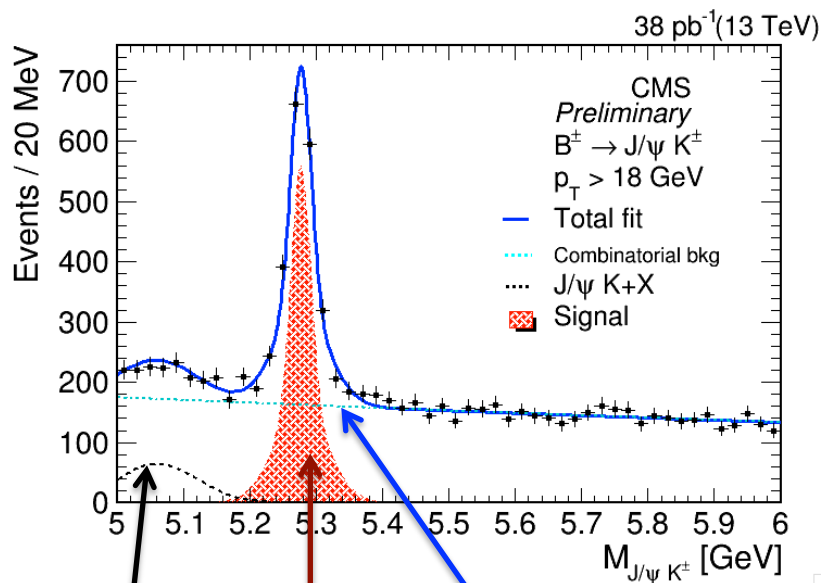
$$c\tau_{B^+} \cong 492 \mu m$$



Prima di passare al dettaglio implementativo in RooFit cerchiamo di capire il modello fisico che definiremo per l'interpolazione.

Segnale : decadimenti $B^\pm \rightarrow J/\psi K^\pm$

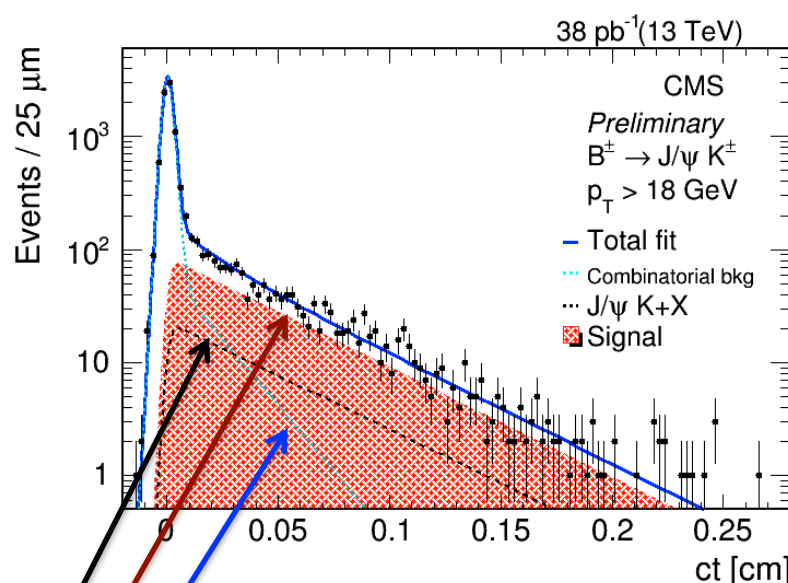
Fondo : $\left\{ \begin{array}{l} \text{combinatorio (dominato da prompt } J/\psi \text{ + traccia random)} \\ \text{fisico (decadimenti del tipo } B \rightarrow J/\psi K + X \text{ con } X \text{ non ricostruito)} \end{array} \right.$



Gaussiana

Esponenziale

Doppia Gaussiana



Gaussiana prompt + Esponenziale

Esponenziale

Esponenziale

convoluta con gaussiana di risoluzione; incertezza evento-per-evento

ROOT macro per il fit bidimensionale: *myfitter2d.cc*

```
#include <TStyle.h>
#include <TAxis.h>
#include <TLatex.h>
#include <TPaveText.h>
#include <TFile.h>
#include <TTree.h>
#include <TCanvas.h>
#include <TNTupleD.h>
#include <TH1D.h>
//
#include <RooRealVar.h>
#include <RooDataSet.h>
#include <RooGaussian.h>
#include <RooChebychev.h>
#include <RooExponential.h>
#include <RooAddPdf.h>
#include <RooProdPdf.h>
#include <RooDecay.h>
#include <RooGaussModel.h>
#include <RooAddModel.h>
#include <RooPlot.h>
//
#include "myloop.h"
#include "plotDressing2D.h"
using namespace RooFit;
// General fitting options
#define NUMBER_OF_CPU 1
#define DO_MINOS kTRUE
// 0 - w/o DISPLAY
// 1 - w/ DISPLAY
#define DISPLAY 1
#define MASS_MIN 5.0
#define MASS_MAX 6.0
#define MASS_PEAK BP MASS
#define SOURCE "myloop.root"
```

Typical service ROOT classes included

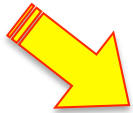
ROOTFit classes to build fit mode included

Inclusione di file esterni

Istruzione necessaria per usare RooFit

Intervallo di valore di massa & massa nominale del B+ (PDG) [definita in *myloop.h*]

Rootupla di input: *myloop.root*



***plotDressing2D.h* definisce
opzioni per la canvas e i plot**

***myloop.h* definisce la classe per
leggere la rootupla in input !**

**Viene generata con i comandi *makeClass*
(o *makeSelector*) di ROOT.**

**Nel caso specifico si tratta della
classe *ReducedBranches* :**

**Nella prima parte riportata c'e' l'insieme
delle dichiarazioni delle variabili contenute
nella rootupla (che puo' essere ispezionata
nel solito modo: con il *TBrowser*).**

**A mano l'analista puo'
aggiungere altre dichia-
razioni di visibilita' (*scope*)
generale, come, p.es.,
delle costanti :**

```
#define MUON_MASS 0.10565837
#define PION_MASS 0.13957018
#define KAON_MASS 0.493677
#define KSHORT_MASS 0.497614
#define KSTAR_MASS 0.89594
#define PHI_MASS 1.019455
#define JPSI_MASS 3.096916
#define PSI2S_MASS 3.686109
#define PROTON_MASS 0.938272046
#define LAMBDA_MASS 1.115683
#define EP_MASS 5.27926
#define BU_MASS 5.27958
#define BS_MASS 5.36677
#define BC_MASS 6.2756
#define LAMBDA_B_MASS 5.6195
```

```
class ReducedBranches{
public:
int run;
int event;

int type; // B hadron information
double mass;
double pt;
double eta;
double phi;
double y;
double vx;
double vy;
double vz;
double lxy;
double lxyz;
double erxxy;
double erxpy;
double vttxprob;
double cosa1pha2d;
double cosa1pha3d;
double ctau2d;
double ctau3d;
double ctau2derr;
double ctau3derr;

double ujm; // dimuon information
double ujpt;
double ujeta;
double ujphi;
double ujy;
double ujvttxprob;

double tktkmass; // ditrack information
double tktkpt;
double tktketa;
double tktkphi;
double tktky;
double tktkvttxprob;
double tktklxy;
double tktklxyz;
double tktkerxxy;
double tktkerxpy;
double tktkerxyz;
double tktkblxy;
double tktkblxyz;
double tktkberxxy;
double tktkberxpy;
double tktkberxyz;

int mu1idx;
double mu1pt;
double mu1eta;
double mu1phi;
int mu2idx;
double mu2pt;
double mu2eta;
double mu2phi;

int tk1idx;
double tk1pt;
double tk1eta;
double tk1phi;
int tk2idx;
double tk2pt;
double tk2eta;
double tk2phi;

int nhlthook; // triggers
int hltbook[N_HLT_BOOKINGS];

void reqTree(TTree *root){
root->Branch("run",&run,"run/I");
root->Branch("event",&event,"event/I");
root->Branch("type",&type,"type/I");
root->Branch("mass",&mass,"mass/D");
root->Branch("pt",&pt,"pt/D");
root->Branch("eta",&eta,"eta/D");
root->Branch("phi",&phi,"phi/D");
root->Branch("y",&y,"y/D");
}
```



La prima parte di *myfitter2d.cc* legge la rootupla per ricavare terne di valori (una terna per candidato B^+). La terna consiste nei valori di :
 1) *massa*, 2) tempo proprio (*ct*), 3) errore su tempo proprio (*cterr*).

```

void myfitter2d()
{
  // define variables: mass, proper time and error on proper tim:
  RooRealVar mass("mass", "mass", MASS_MIN, MASS_MAX);
  RooRealVar ct("ct", "ct", -0.02, 0.28);
  RooRealVar cterr("cterr", "cterr", 0.0001, 0.008);

  //output
  TFile *fout = new TFile("myfitter2d.root", "recreate"); // output file
  TNtupleD *_nt = new TNtupleD("_nt", "_nt", "mass:ct:cterr"); // output ntuple

  // input
  TFile *fin = new TFile(SOURCE);
  TTree *tin = (TTree*)fin->Get("ntkp");

  // setting up rootuple for reading
  ReducedBranches br;
  br.setbranchadd(tin);

  // reading rootuple
  for (int evt=0; evt<tin->GetEntries(); evt++)
  {
    tin->GetEntry(evt);

    // cuts to select events/cands
    if (br.hltbook[HLT_Dimuon16_Jpsi_v1]!=1) continue;
    if (br.vtxprob<=0.15) continue;
    if (br.tklpt<=2.0) continue;

    // filling the 3D vector in the output ntuple
    double var[3];
    var[0] = br.mass;
    var[1] = br.ctau2d;
    var[2] = br.ctau2derr;
    _nt->Fill(var);
  }
  fin->Close();

  // the dataset contains only the 3 variables of interest
  RooDataSet *data = new RooDataSet("data", "data", _nt, RooArgSet(mass, ct, cterr));
}
  
```

Rootupla di output:
myfitter2D.root

Rootupla di input

Ulteriore selezione di eventi/candidati

La ntupla nel file di output viene riempita

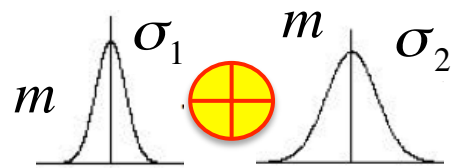
RootDataSet con la terna di variabili

Costruzione della PDF di segnale :

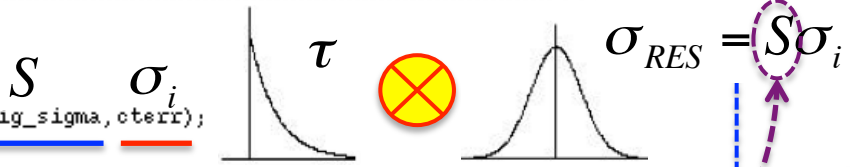
**Doppia Gaussiana con media comune (e larghezza diversa);
Trattasi di *somma (RooAddPdf)* con coefficiente pari alla "frazione"**

```

// signal PDF
// =====
// double gaussian for the signal in mass
RooRealVar m_mean("m_mean","m_mean",MASS_PEAK,MASS_MIN,MASS_MAX);
RooRealVar m_sigma1("m_sigma1","m_sigma1",0.016,0.001,0.045);
RooRealVar m_sigma2("m_sigma2","m_sigma2",0.035,0.001,0.090);
RooRealVar m_fraction("m_fraction","m_fraction",0.5);
//
RooGaussian m_gaussian1("m_gaussian1","m_gaussian1",mass,m_mean,m_sigma1);
RooGaussian m_gaussian2("m_gaussian2","m_gaussian2",mass,m_mean,m_sigma2);
//
RooAddPdf pdf_m_signal("pdf_m_signal","pdf_m_signal",RooArgList(m_gaussian1,m_gaussian2),RooArgList(m_fraction));
//
// exponential convoluted with gaussian resolution for the signal in ct
RooRealVar res_sig_mean("res_sig_mean","res_sig_mean",0.0,-1.,1.);
RooRealVar res_sig_sigma("res_sig_sigma","res_sig_sigma",1.0,0.3,2.0);
RooGaussModel res_signal("res_signal","res_signal",ct,res_sig_mean,res_sig_sigma,cterr);
//
RooRealVar ctau("ctau","ctau",0.04911,0.010,0.090);
RooDecay pdf_t_signal("pdf_t_signal","pdf_t_signal",ct,ctau,res_signal,RooDecay::SingleSided);
//
// bidimensional signal pdf
RooProdPdf pdf_signal("pdf_signal","pdf_signal",RooArgSet(pdf_m_signal, pdf_t_signal));
//
    
```



**coefficiente :
 $cG_1 + (1-c)G_2$**



**Esponenziale convoluta con gaussiana di
risoluzione sperimentale in tempo proprio**

**PDF bidimensionale del segnale
(*RooProdPdf* delle due PDF per
le due variabili)**

**Scale Factor to take into account eventual
systematic under/over-estimation of
proper-time event-by-event error**

```

class RooDecay: public RooAbsAnaConvPdf
{
public:
    virtual ~RooDecay ()
    static TClass* Class ()
    virtual TObject* clone (const char* newname) const
    virtual Double_t coefficient (Int_t basisIndex) const
    virtual void generateEvent (Int_t code)
    virtual Int_t getGenerator (const RooArgSet& directVars, RooArgSet& generateVars, Bool_t staticInitOK = kTRUE) const
    virtual TClass* IsA () const
    RooDecay& operator= (const RooDecay&)
    RooDecay ()
    RooDecay (const RooDecay& other, const char* name = 0)
    RooDecay (const char* name, const char* title, RooRealVar& t, RooAbsReal& tau, const RooResolutionModel& model, RooDecay::DecayType type)
    virtual void ShowMembers (TMemberInspector& insp) const
    virtual void Streamer (TBuffer&)
    void StreamerNVirtual (TBuffer& ClassDef_StreamerNVirtual_b)

protected:

Data Members

public:
    static RooDecay::DecayType DoubleSided
    static RooDecay::DecayType Flipped
    static RooDecay::DecayType SingleSided

protected:
    Int_t _basisExp
    RooRealProxy _t
    RooRealProxy _tau
    RooDecay::DecayType _type
}

```

Single or double sided decay function that can be analytically convolved with any RooResolutionModel implementation

Function Members (Methods)

```

public:
    virtual ~RooDecay ()
    static TClass* Class ()
    virtual TObject* clone (const char* newname) const
    virtual Double_t coefficient (Int_t basisIndex) const
    virtual void generateEvent (Int_t code)
    virtual Int_t getGenerator (const RooArgSet& directVars, RooArgSet& generateVars, Bool_t staticInitOK = kTRUE) const
    virtual TClass* IsA () const
    RooDecay& operator= (const RooDecay&)
    RooDecay ()
    RooDecay (const RooDecay& other, const char* name = 0)
    RooDecay (const char* name, const char* title, RooRealVar& t, RooAbsReal& tau, const RooResolutionModel& model, RooDecay::DecayType type)
    virtual void ShowMembers (TMemberInspector& insp) const
    virtual void Streamer (TBuffer&)
    void StreamerNVirtual (TBuffer& ClassDef_StreamerNVirtual_b)

```

protected:

Data Members

```

public:
    static RooDecay::DecayType DoubleSided
    static RooDecay::DecayType Flipped
    static RooDecay::DecayType SingleSided

```

protected:

```

    Int_t _basisExp
    RooRealProxy _t
    RooRealProxy _tau
    RooDecay::DecayType _type

```

Documentazione:
- roofit.sourceforge.net
- <https://root.cern.ch/root/html/>

RooGaussModel 
res_signal 

Il costruttore della classe *RooDecay* e':

`RooDecay (const char* name, const char* title, RooRealVar& t, RooAbsReal& tau, const RooResolutionModel& model, RooDecay::DecayType type)`

SingleSided 

variabile *ct* 

parametro τ 

class RooGaussModel: public RooResolutionModel



Class RooGaussModel implements a RooResolutionModel that models a Gaussian distribution. Object of class RooGaussModel can be used for analytical convolutions with classes inheriting from RooAbsAnaConvPdf

Function Members (Methods)

public:

```
virtual ~RooGaussModel ()
void advertiseAymptoticIntegral (Bool_t flag)
void advertiseFlatScaleFactorIntegral (Bool_t flag)
virtual Double_t analyticalIntegral (Int_t code, const char* rangeName) const
virtual Int_t basisCode (const char* name) const
static TClass* Class ()
virtual TObject* clone (const char* newname) const
virtual void generateEvent (Int_t code)
virtual Int_t getAnalyticalIntegral (RooArgSet& allVars, RooArgSet& analVars, const char* rangeName = 0) const
virtual Int_t getGenerator (const RooArgSet& directVars, RooArgSet& generateVars, Bool_t staticInitOK = kTRUE) const
virtual TClass* IsA () const
RooGaussModel& operator= (const RooGaussModel&)
RooGaussModel ()
RooGaussModel (const RooGaussModel& other, const char* name = 0)
RooGaussModel (const char* name, const char* title, RooRealVar& x, RooAbsReal& mean, RooAbsReal& sigma)
RooGaussModel (const char* name, const char* title, RooRealVar& x, RooAbsReal& mean, RooAbsReal& sigma,
RooAbsReal& msSF)
RooGaussModel (const char* name, const char* title, RooRealVar& x, RooAbsReal& mean, RooAbsReal& sigma,
RooAbsReal& meanSF, RooAbsReal& sigmaSF)
virtual void ShowMembers (TMemberInspector& insp) const
virtual void Streamer (TBuffer&)
void StreamerNVirtual (TBuffer& ClassDef_StreamerNVirtual_b)
```

protected:

```
static complex<Double_t> evalCerf (Double_t swt, Double_t u, Double_t c)
static complex<Double_t> evalCerfApprox (Double_t swt, Double_t u, Double_t c)
complex<Double_t> evalCerfInt (Double_t sign, Double_t wt, Double_t tau, Double_t umin, Double_t umax, Double_t c) const
virtual Double_t evaluate () const
```

Data Members

-
-
-

Uno dei costruttori della classe **RooGaussModel** e' :

```
RooGaussModel (const char* name, const char* title, RooRealVar& x, RooAbsReal& mean, RooAbsReal& sigma,
RooAbsReal& msSF) ct  $\bar{t}_{RES}$  S
```

cterr

Costruzione della PDF del **fondo combinatorio** (traccia random):

```
// combinatorial background PDF (prompt or non-prompt J/psi + random track)
//-----
// exponential for the combinatorial background in mass
//
RooRealVar m_par1("m_par1", "m_par1", -0.3, -2., +2.);
RooExponential pdf_m_combinatorial("pdf_m_combinatorial", "pdf_m_combinatorial", mass, m_par1);
//
// exponential convoluted with gaussian resolution for the non-prompt background in ct
RooRealVar ctau_nonprompt("ctau_nonprompt", "ctau_nonprompt", 0.0500, 0.0010, 0.1000);
RooDecay pdf_t_nonprompt("pdf_t_nonprompt", "pdf_t_nonprompt", ct, ctau_nonprompt, res_signal, RooDecay::SingleSided);
//
// Sum of gaussian resolution function (res_signal) for prompt background in ct and the previous exponential for NP-bkg
//
RooRealVar prompt_fraction("prompt_fraction", "prompt_fraction", 0.5, 0.0, 1.0);
RooAddPdf pdf_t_combinatorial("pdf_t_combinatorial", "pdf_t_combinatorial", RooArgList(res_signal, pdf_t_nonprompt), RooArgList(prompt_fraction));
//
// bidimensional combinatorial-bkg pdf
//
RooProdPdf pdf_combinatorial("pdf_combinatorial", "pdf_combinatorial", RooArgSet(pdf_m_combinatorial, pdf_t_combinatorial));
//
```

Vita media
del fondo
combinatorio

Si ricorre alla **stessa**
funzione di risoluzione
gaussiana usata per il
segnale: **res_signal**

Costruzione della PDF del **fondo fisico**:

Si ricorre alla **stessa** funzione di risoluzione gaussiana usata per il segnale ed il fondo combinatorio NP: **res_signal**

```
//  
// B->J/psi+track+X background PDF  
//=====  
//  
// single gaussian for the physical background in mass  
//  
RooRealVar m_jpsix_mean("m_jpsix_mean", "m_jpsix_mean", 5.1, 5.0, 5.3);  
RooRealVar m_jpsix_sigma("m_jpsix_sigma", "m_jpsix_sigma", 0.05, 0.01, 0.10);  
RooGaussian pdf_m_jpsix("pdf_m_jpsix", "pdf_m_jpsix", mass, m_jpsix_mean, m_jpsix_sigma);  
//  
// exponential convoluted with gaussian resolution for the physical background in ct  
//  
RooRealVar ctau_jpsix("ctau_jpsix", "ctau_jpsix", 0.0500, 0.0010, 0.1000);  
RooDecay pdf_t_jpsix("pdf_t_jpsix", "pdf_t_jpsix", ct, ctau_jpsix, res_signal, RooDecay::SingleSided);  
//  
// bidimensional physical-bkg pdf  
//  
RooProdPdf pdf_jpsix("pdf_jpsix", "pdf_jpsix", RooArgSet(pdf_m_jpsix, pdf_t_jpsix));  
//
```

Vita media
del fondo
fisico

Costruzione del modello 2D complessivo (segnale+2fondi) :

```
// FULL MODEL (SIGNAL + 2 BKGS)
//
// define coefficients for addition of the 3 pdfs
//
RooRealVar n_signal("n_signal", "n_signal", n_signal_initial, 0., data->sumEntries());
RooRealVar n_combinatorial("n_combinatorial", "n_combinatorial", n_combinatorial_initial, 0., data->sumEntries());
RooRealVar n_jpsix("n_jpsix", "n_jpsix", 200., 0., data->sumEntries());
//
RooAddPdf model("model", "model",
                RooArgList(pdf_signal, pdf_combinatorial, pdf_jpsix),
                RooArgList(n_signal, n_combinatorial, n_jpsix));
//
```

C_1 C_2 C_3

RooAddPdf is an efficient implementation of a sum of PDFs of the form

$c_1 * PDF_1 + c_2 * PDF_2 + \dots + c_n * PDF_n$

or

$c_1 * PDF_1 + c_2 * PDF_2 + \dots + (1 - \sum(c_1 \dots c_{n-1})) * PDF_n$

The first form is for extended likelihood fits, where the expected number of events is $\sum(i) c_i$. The coefficients c_i can either be explicitly provided, or, if all components support extended likelihood fits, they can be calculated the contribution of each PDF to the total number of expected events.

In the second form, the sum of the coefficients is enforced to be one, and the coefficient of the last PDF is calculated from that condition.

Il # di candidati di segnale e di fondo combinatorio vengono in precedenza dichiarati ed inizializzati

```
// initialization
//
double n_signal_initial = data->sumEntries(TString::Format("abs(mass-%g)<0.015", MASS_PEAK))
- data->sumEntries(TString::Format("abs(mass-%g)<0.030&&abs(mass-%g)>0.015", MASS_PEAK, MASS_PEAK));
//
double n_combinatorial_initial = data->sumEntries() - n_signal_initial;
//
```

Interpolazione (e plotting) !

Extended(kTRUE) ? NON SERVE !

```
// finally go for fitting !
model.fitTo(*data, Minos(DO_MINOS), NumCPU(NUMBER_OF_CPU), Offset(kTRUE));
// go to display plots with fits superimposed on data distributions
#if DISPLAY
// Display mass plots
//-----
//
TCanvas *c1 = canvasDressing("c1");
//
RooPlot* frame_m = mass.frame();
//
TH1D* histo_data_m = (TH1D*)data->createHistogram("histo_data_m", (mass) Binning(50, mass.getMin(), mass.getMax()));
//
•
•
•
// Display c*proper-time plots
//-----
//
TCanvas *c2 = canvasDressing("c2");
//
RooPlot* frame_t = ct.frame();
//
TH1D* histo_data_t = (TH1D*)data->createHistogram("histo_data_t", (ct) Binning(120, ct.getMin(), ct.getMax()));
//
•
•
•
```

Nota bene: il fit e' automaticamente del tipo EXTENDED !

Infatti:

- If **RooAddPdf** is given N coefficients instead of N-1 fractions
 - **RooAddPdf** is automatically extended
 - coefficients represent the expected #events for each PDF comp.

[da: http://roofit.sourceforge.net/docs/tutorial/intro/roofit_tutorial_intro.pdf]

Per eseguire la macro: ***.x myfitter2d.cc***

Oltre ad ottenere il plot della slide iniziale si provi a commentare il risultato del fit.

```
*****
** 23 **MINOS      7500
*****
FCN=-2992.64 FROM MINOS      STATUS=SUCCESSFUL  4324 CALLS      6110 TOTAL
          EDM=5.11676e-05  STRATEGY= 1      ERROR MATRIX ACCURATE
EXT PARAMETER          PARABOLIC          MINOS ERRORS
NO.  NAME      VALUE      ERROR      NEGATIVE      POSITIVE
 1  ctau      4.44363e-02  1.25997e-03  -1.23372e-03  1.28786e-03
 2  ctau_jpsix  4.56622e-02  2.73766e-03  -2.61995e-03  2.87062e-03
 3  ctau_nonprompt  1.86478e-02  1.67187e-03  -1.73138e-03  1.71269e-03
 4  m_jpsix_mean  5.06123e+00  6.43382e-03  -7.33523e-03  5.85437e-03
 5  m_jpsix_sigma  6.06444e-02  5.98874e-03  -5.38280e-03  6.85032e-03
 6  m_mean      5.27737e+00  6.90799e-04  -6.93813e-04  6.88152e-04
 7  m_par1     -2.69325e-01  4.14541e-02  -4.14491e-02  4.14688e-02
 8  m_sigma1    4.09537e-02  3.02175e-03  -2.71070e-03  3.87860e-03
 9  m_sigma2    1.50309e-02  6.81301e-04  -6.68188e-04  6.96192e-04
10  n_combinatorial  7.67237e+03  9.21780e+01  -9.20165e+01  9.23685e+01
11  n_jpsix     4.13610e+02  2.59086e+01  -2.54124e+01  2.64232e+01
12  n_signal    1.54505e+03  4.63785e+01  -4.56911e+01  4.72517e+01
13  prompt_fraction  9.41981e-01  4.97410e-03  -5.06926e-03  4.87957e-03
14  res_sig_mean  2.27907e-01  1.68816e-02  -1.68765e-02  1.68933e-02
15  res_sig_sigma  1.28223e+00  1.33976e-02  -1.32768e-02  1.35262e-02
          ERR DEF= 0.5
```