

# **Examples of analyzing MPGD data**

**with emphasis on precise timing**

# PART I

- Prelude
- Introduction
- Evaluate the number of pes per muon

# Prelude

## ***Paradigm:***

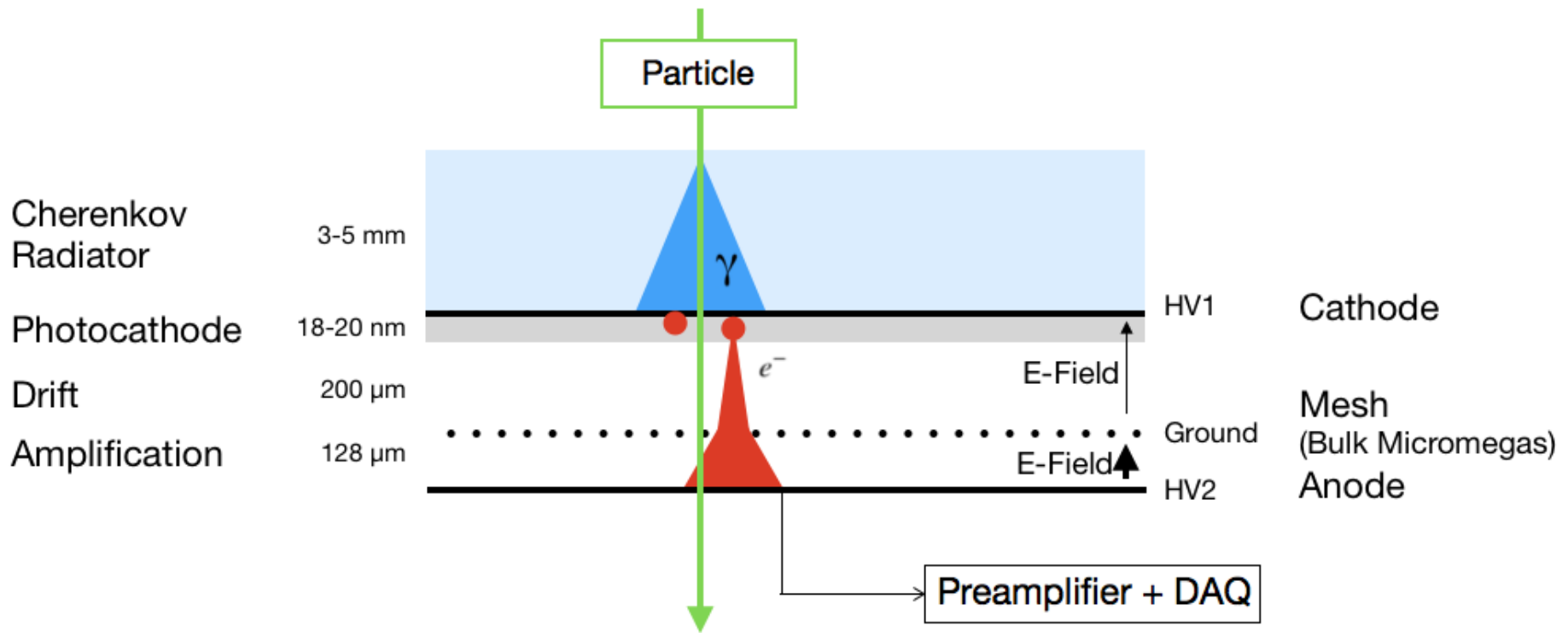
*The historian of science Thomas Kuhn gave it its contemporary meaning when he adopted the word to refer to the set of concepts and practices that define a scientific discipline at any particular period of time. In his book *The Structure of Scientific Revolutions* (first published in 1962), Kuhn defines a scientific paradigm as: "universally recognized scientific achievements that, for a time, provide model problems and solutions for a community of practitioners, i.e.,*

- what is to be observed and scrutinized*
- the kind of questions that are supposed to be asked and probed for answers in relation to this subject*
- how these questions are to be structured*
- what predictions made by the primary theory within the discipline*
- how the results of scientific investigations should be interpreted*
- how an experiment is to be conducted, and what equipment is available to conduct the experiment.*

**Paradigm comes from Greek παράδειγμα (paradeigma), "pattern, example, sample" from the verb παραδείκνυμι (paradeiknumi), "exhibit, represent, expose" and that from παρά (para), "beside, beyond" and δείκνυμι (deiknumi), "to show, to point out"**

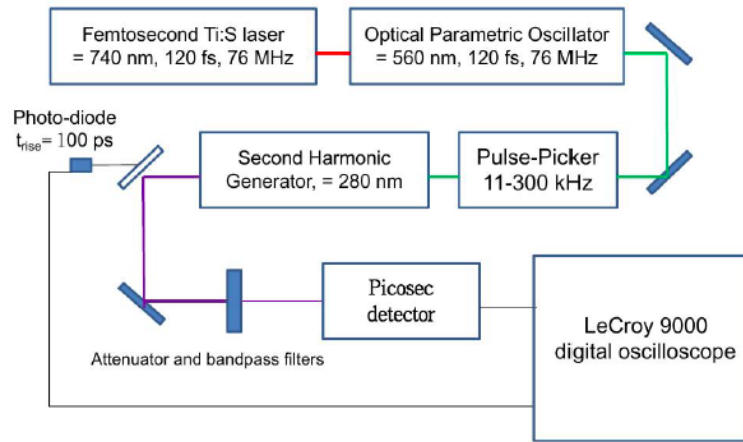
**Examples of analyzing MPGD data  
with emphasis on precise timing**

# Introduction



“Compass gas” ( $\text{Ne}+10\%\text{C}_2\text{H}_6+10\%\text{CF}_4$ ) at 1 bar.

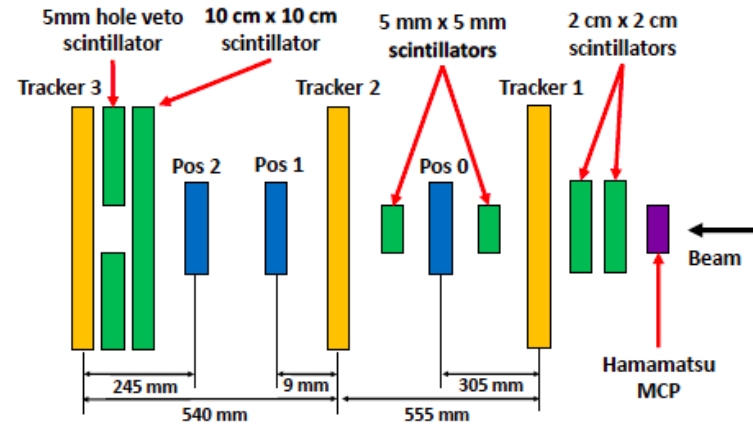
$\text{CF}_4+20\%\text{C}_2\text{H}_6$  at 0.5 bar .



## Laser calibration

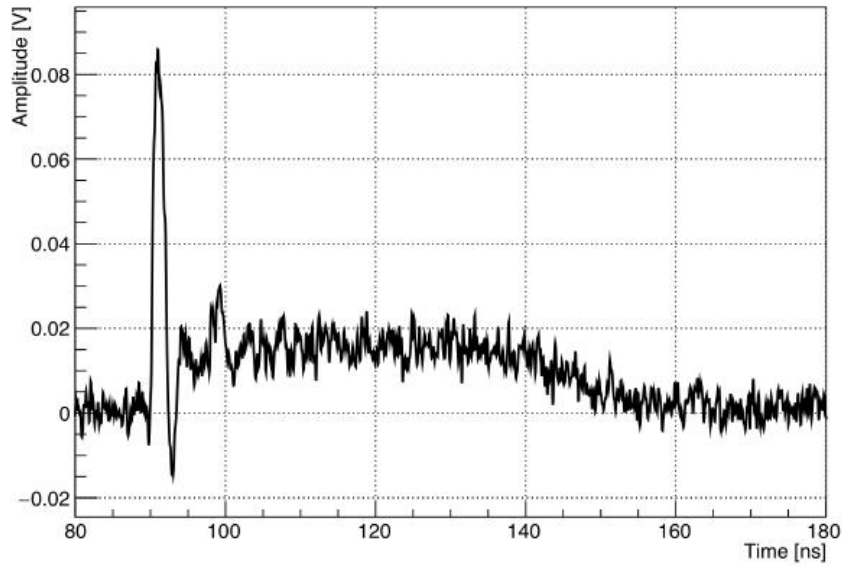
Figure 4: Schematic of the experimental setup during the laser tests, described in detail in the text.

## Muon test beam calibration

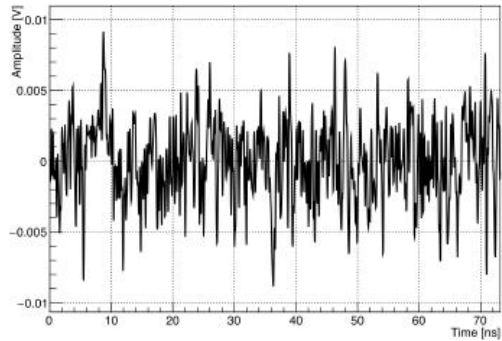


**Timing Reference ( $T_0$ ) Accuracy:  $\sim 5$ ps**

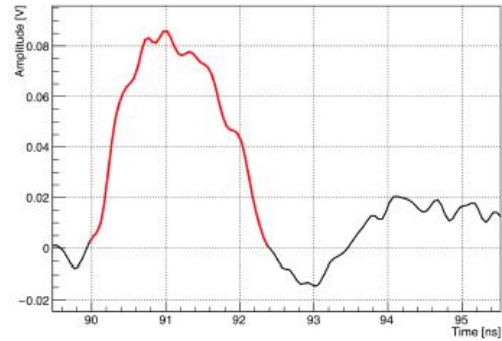
# Waveform (Laser Test), Anode: 650, Drift: -450



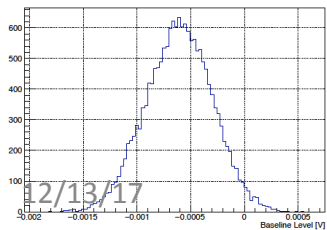
Noise Baseline (Laser Test), Anode: 650, Drift: -450



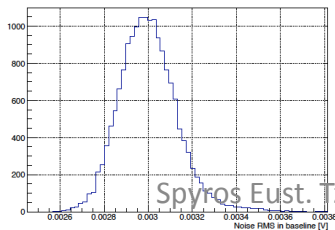
Electron Peak (Laser Test), Anode: 650, Drift: -450



Baseline, Anode: 650V, Drift: -450V



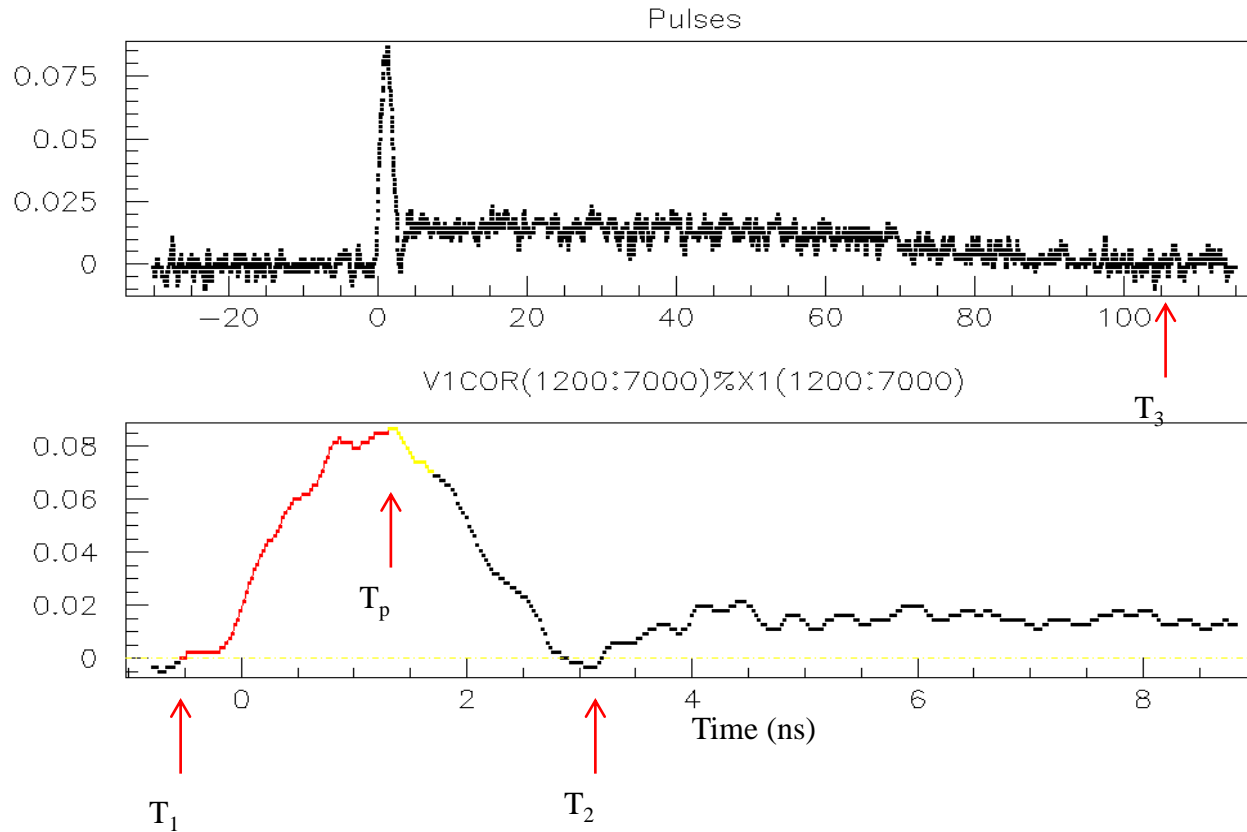
Noise RMS, Anode: 650V, Drift: -450V



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**Recognize the “start” and “end” of the e-peak, as well as the “end” of the ion tail**



Evaluate charge by integrating the relevant part of the waveform

# Definition of the e-peak Arrival Time

## Fit the e-peak Leading Edge

Fit the e-peak leading edge in order to neutralize noise effects.

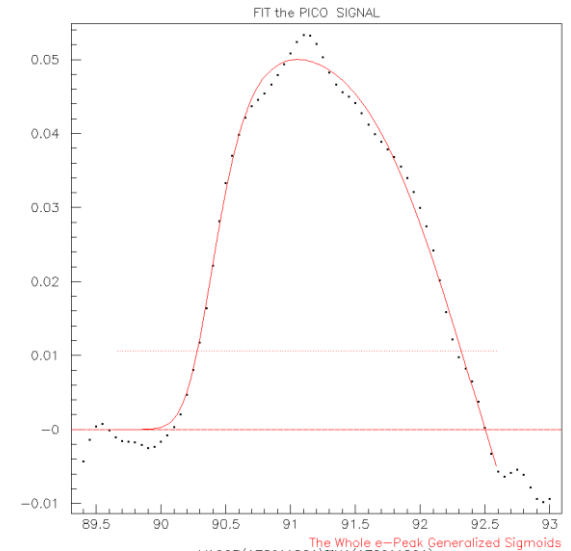
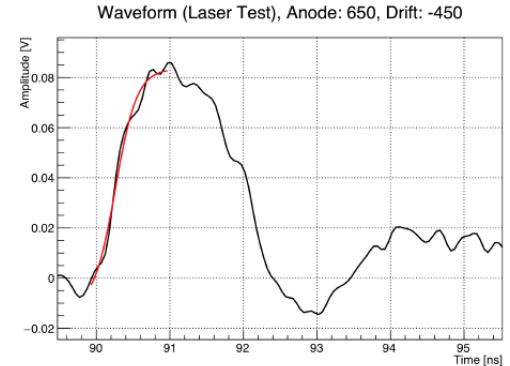
Several Functions have been used in the fits, including quadratic and cubic polynomials as well as logistic and generalized logistic functions

$$\frac{P_0}{1 + \exp[-P_2(x - P_1)]} + P_3, \quad \frac{P_0}{(1 + \exp[-P_2(x - P_1)])^3}$$

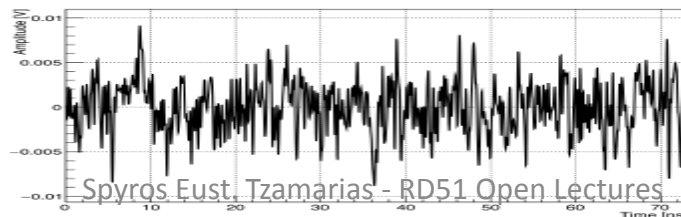
A fit of the whole e-peak was also tried using the difference of two logistic functions

$$f(t; p_0, p_1, p_2, p_3, p_4, p_5, p_6) = \frac{p_0}{(1 + e^{-(t-p_1)p_2})^{p_3}} - \frac{p_0}{(1 + e^{-(t-p_4)p_5})^{p_6}}$$

The results of these fit is also used to define the “start” and ”end” points of the e-peak waveform, to estimate charge and it is also used for timing

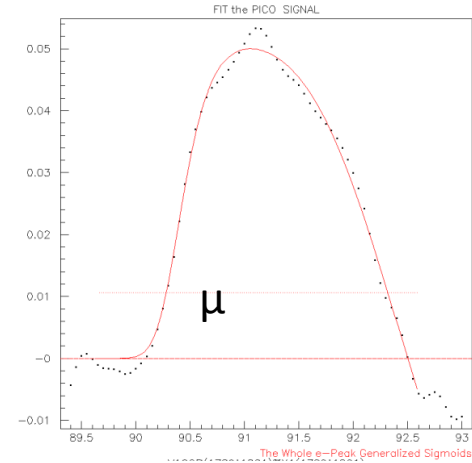
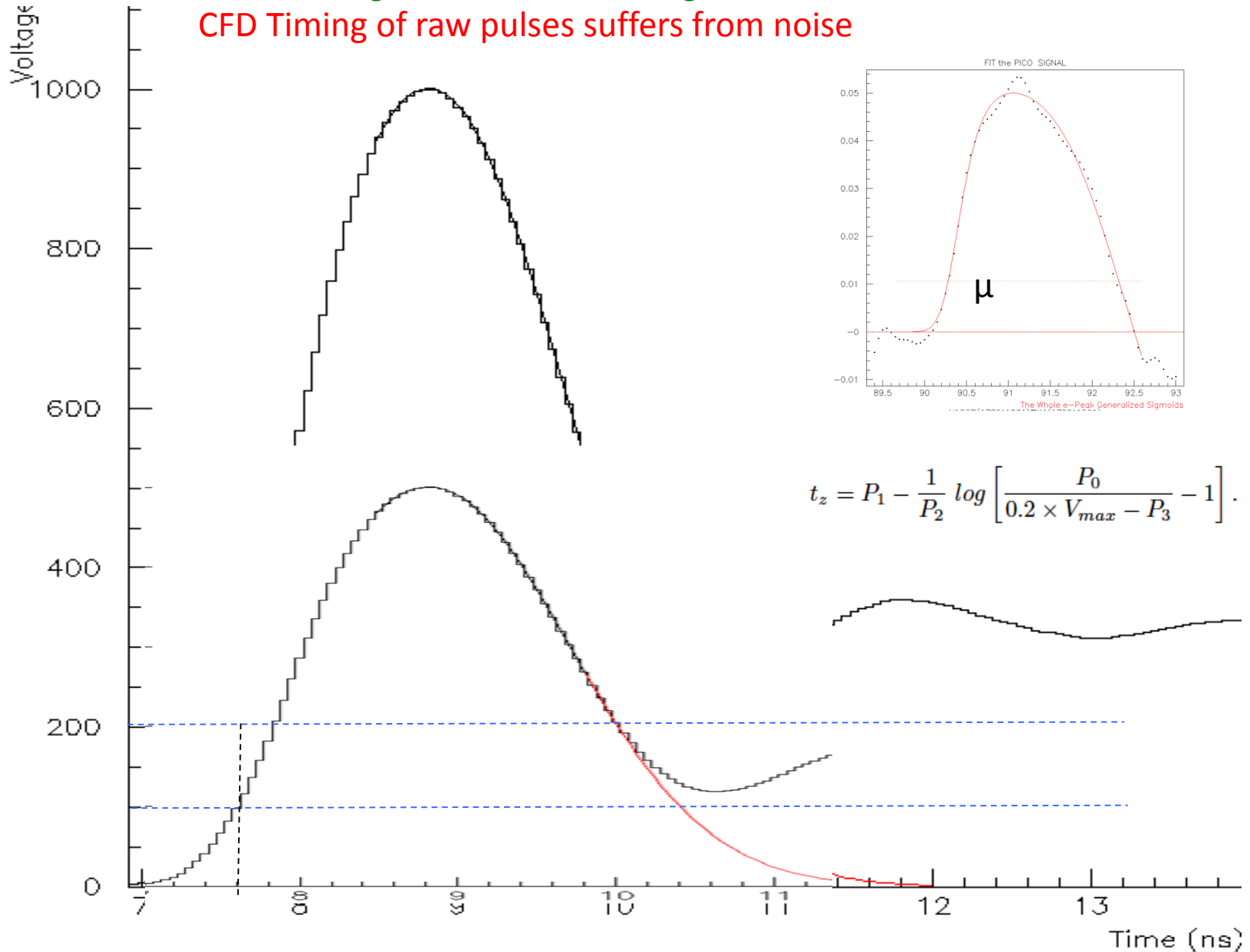


*\* The autocorrelation function, evaluated for a time interval  $\Delta t \sim 5$  ns is almost zero*



Define the e-peak arrival time at a Constant Fraction of the peak maximum  
 CFD Timing minimizes “slewing effects”

CFD Timing of raw pulses suffers from noise



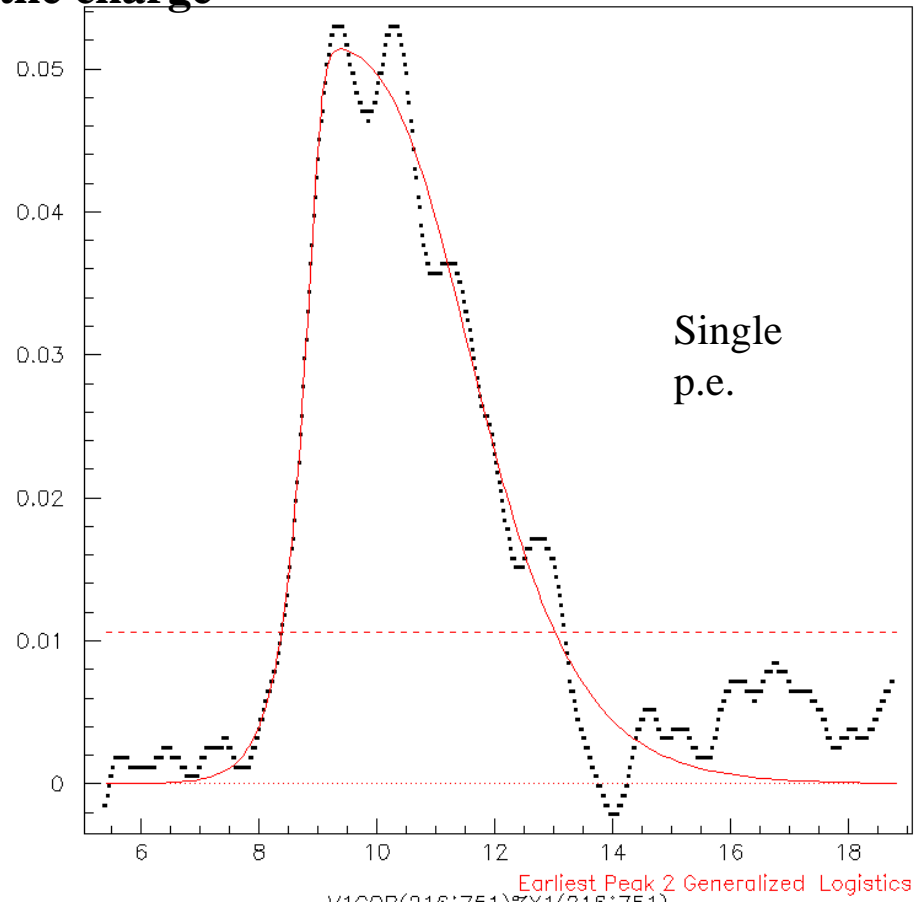
$$t_z = P_1 - \frac{1}{P_2} \log \left[ \frac{P_0}{0.2 \times V_{max} - P_3} - 1 \right].$$

# Fitting the e-peak waveform helps to estimate the charge in “impossible” cases

**Example: LED calibration – small pulses**

**Define the start and the end of the e-peak**

**Estimate the charge**

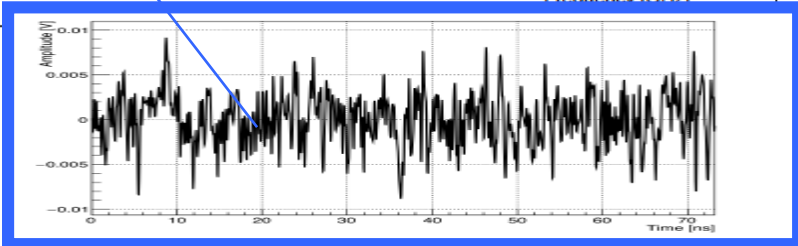
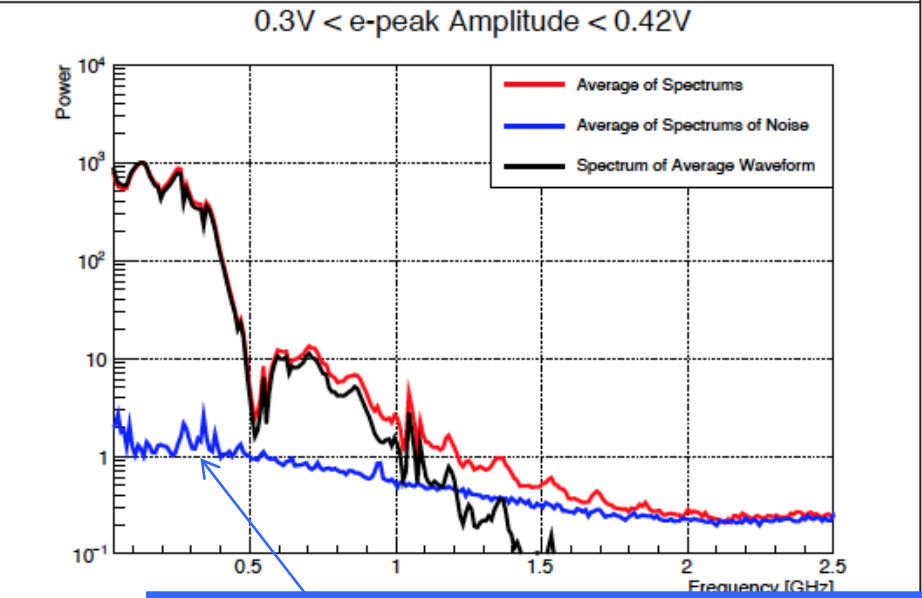
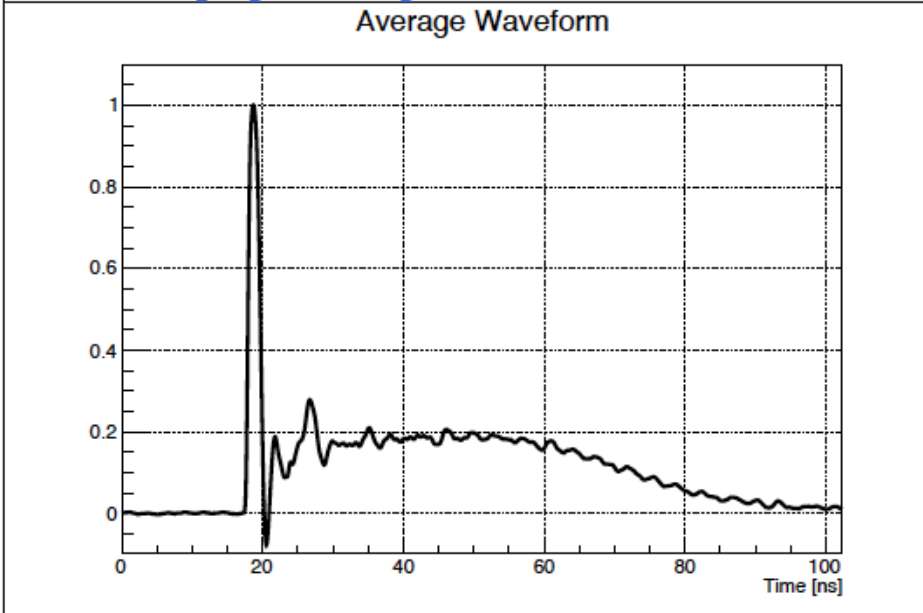


# Is it possible to filter-out the noise ?

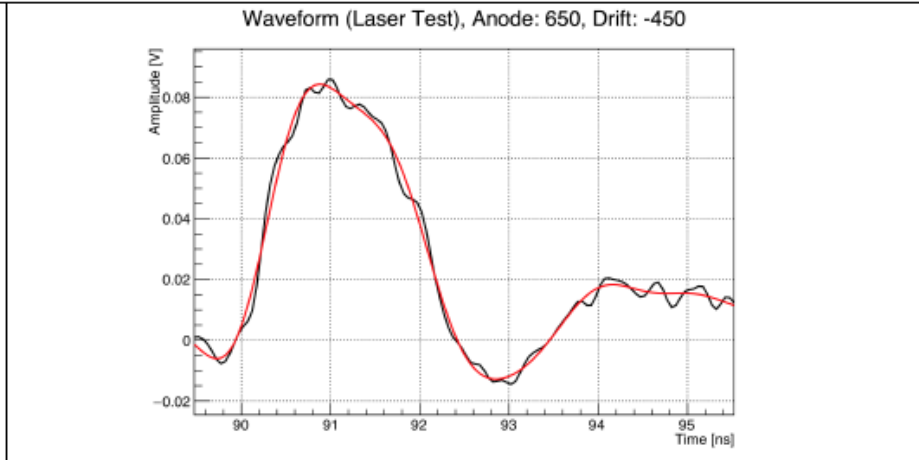
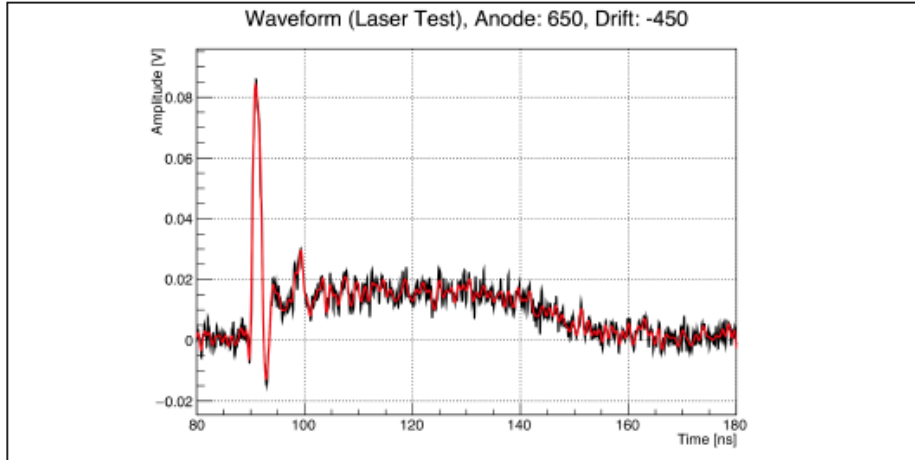
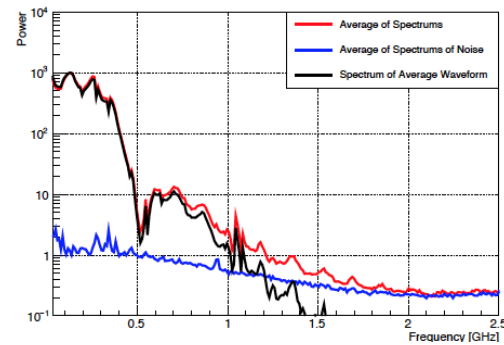
The power spectrum of the “average waveform” is free of random (uncorrelated) noise

The average power spectrum of individual waveforms includes the random noise

The average power spectrum of individual “noise waveforms” is the random noise

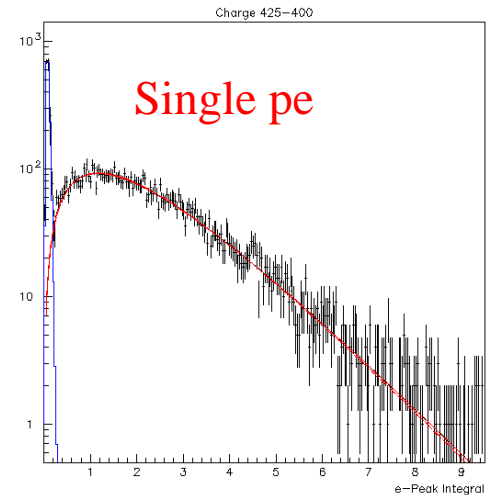
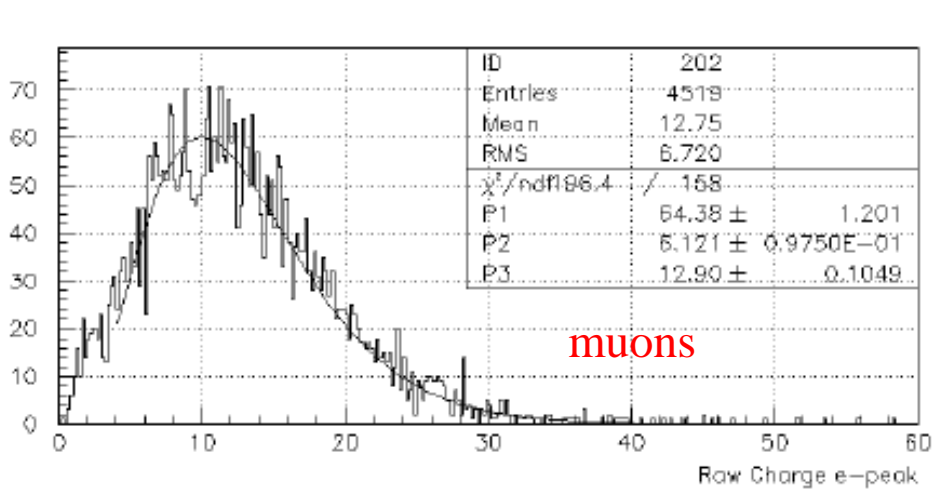


## An example of filtering out the noise (cut at 1.5 GHz)



In these examples (PICOSEC-MicroMegs), the use of filtering before fitting the leading edge of the pulse DOES NOT improve the timing resolution, i.e. a conservative frequency cut does not improve the timing resolution and a strong frequency cut deforms the rising edge of the pulse worsening the time resolution

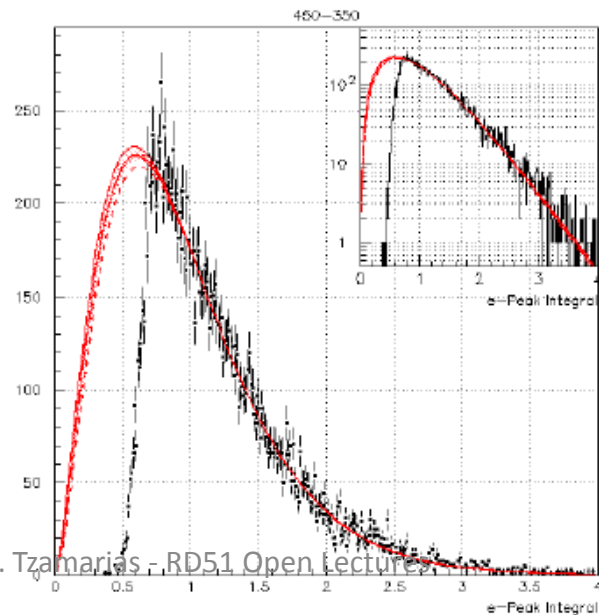
# The Charge Distribution



Can we express the e-peak charge distribution of a single p.e. by a Polya function?

Usually, we accumulate signals using an event trigger that rejects noise.

Can we estimate the mean and RMS of the distribution ?



The Polya distribution is defined by the following (normalized to unity) function:

$$P_{spe}(Q; a = b = \theta + 1, \bar{Q}_e) dQ = \frac{1}{\bar{Q}_e} \frac{(\theta + 1)^{(\theta + 1)} (Q / \bar{Q}_e)^\theta}{\Gamma(\theta + 1)} e^{-(\theta + 1)Q / \bar{Q}_e} dQ$$

$$E[Q_{spe}] = \bar{Q}_e = \langle Q_e \rangle$$

$$V[Q_{spe}] = \frac{1}{\theta + 1} \langle Q_e \rangle^2 = RMS^2$$

When fitting experimental distributions, we have to normalize the Polya function to the number of observed events, i.e. we fit with the function

$$F(Q; C, RMS, \langle Q_e \rangle) = \frac{C}{\bar{Q}_e} \frac{(\theta + 1)^{(\theta + 1)} (Q / \bar{Q}_e)^\theta}{\Gamma(\theta + 1)} e^{-(\theta + 1)Q / \bar{Q}_e}$$

$$\left. \begin{array}{l} \bar{Q}_e = \langle Q_e \rangle \\ \theta = \frac{\langle Q_e \rangle^2}{RMS^2} - 1 \end{array} \right\}$$

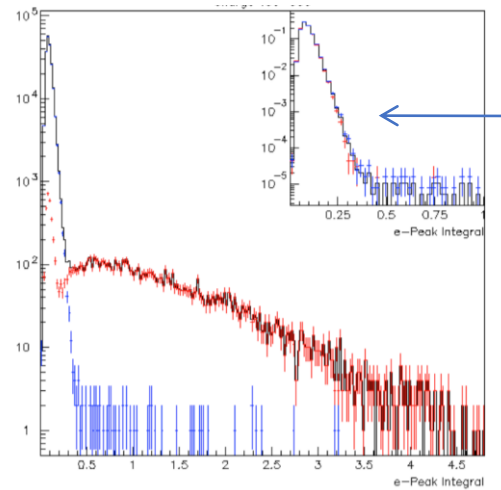
**The normalization factor, the mean and the RMS of the distribution as the free parameters to be estimated by the fit**



# Does the “Polya” shape describes the e-peak charge and amplitude distributions?

## Laser beam tests

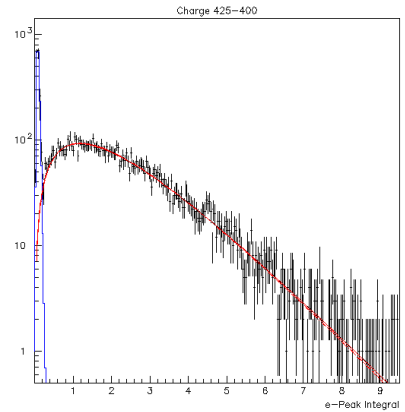
Use data sets collected without any threshold on the picosec-MM signal to test the “Polya Hypothesis”



Use out-of-time events to model the noise

$$F(Q; C, \theta, \bar{Q}_e) = \frac{C}{Q_e} \frac{(\theta + 1)^{(\theta + 1)} (Q / \bar{Q}_e)^\theta}{\Gamma(\theta + 1)} e^{-(\theta + 1)Q / \bar{Q}_e}$$

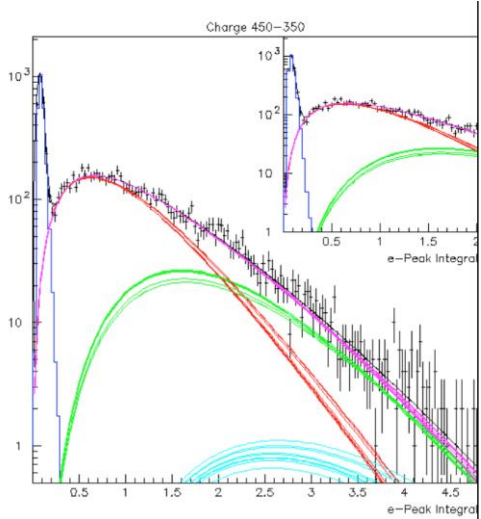
Fit the charge spectrum produced by a single photoelectron



$$G(Q; C_1, C_2, \dots, C_k, RMS_e, < Q_e >) = \sum_{N=1}^k \frac{C_N}{\bar{Q}_e} \frac{(\theta + 1)^{N(\theta + 1)} (Q / \bar{Q}_e)^{N(\theta + 1) - 1}}{\Gamma(N(\theta + 1))} e^{-(\theta + 1)Q / \bar{Q}_e}$$

$$number\ of\ events = \sum_{N=1}^k C_N$$

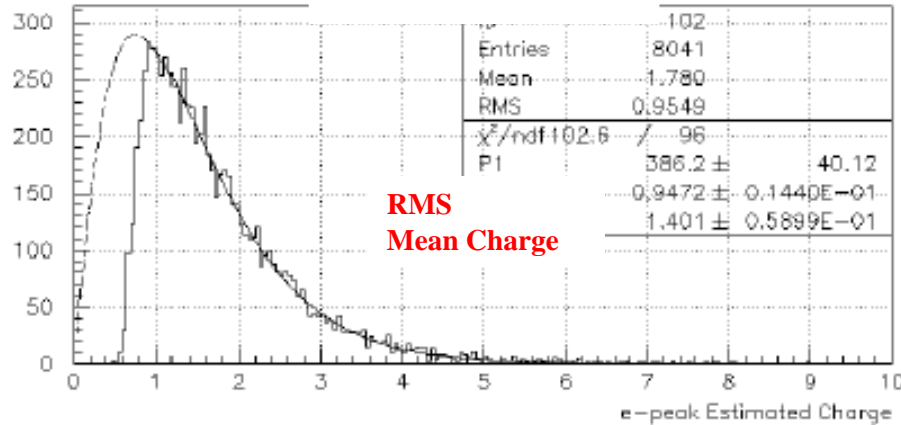
Fit the charge spectrum produced by several photoelectrons



# Evaluate the mean number of pes per muon

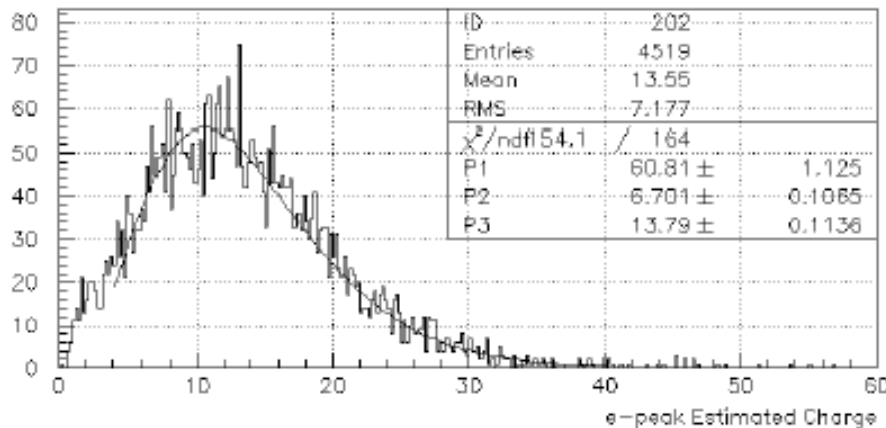
The last Christmas ghost

**Rule of thumb:** Sir Francis Buller ruling that a man may legally beat his wife provided that he used a stick no thicker than his **thumb**.



## Laser Calibration

Fit by Polya the (truncated) single-pe charge spectrum to estimate the mean charge and the RMS. **Evaluate the systematical errors.**



## Muon Test Beam

The beam trigger hodoscope was align to select muons passing through the active area (?) of the PICOSEC

Then...  $N_{pe} = 13.55/1.4 \sim 9.7pe/\mu\text{on}$

Can I also use the RMS values of the charge distributions in order to improve the estimation of  $N_{pe}$  ?

Let us assume that the single pe's charge distribution is given by:

$$P_e(Q; \bar{Q}_e, V_e) = \begin{cases} a \text{ positive function for } Q \geq 0 \\ 0 \text{ for } Q < 0 \end{cases} \quad (1)$$

where Q is the accumulated charge and

$$\bar{Q}_e = \langle Q \rangle = \int_{-\infty}^{\infty} Q P_e(Q; \bar{Q}_e, V_e) dQ \quad (2)$$

$$V_e = \langle Q^2 \rangle - \bar{Q}_e^2 = \int_{-\infty}^{\infty} (Q - \bar{Q}_e)^2 P_e(Q; \bar{Q}_e, V_e) dQ$$

The pdf for the charge which is produced by n pe's (i.e. produced by a single track) will be:

$$P_{ne}(Q_n; \bar{Q}_e, V_e) = \underbrace{P_e(Q; \bar{Q}_e, V_e) \otimes P_e(Q; \bar{Q}_e, V_e) \cdots \otimes P_e(Q; \bar{Q}_e, V_e)}_{n \text{ times}} \quad (3)$$

$$\int_{-\infty}^{\infty} P_{ne}(Q_n; \bar{Q}_e, V_e) dQ_n = 1$$

The expected value and variance of  $Q_n$  can be calculated from (3), but it is easier to consider that  $Q_n = x_1 + x_2 + \dots + x_n$  (where  $x_i$  is the charge produced by the  $i$ th photon and it is distributed according to (1)) and that  $x_i$  ( $i = 1, 2, 3, \dots, n$ ) are mutually independent. Then

$$\bar{Q}_{ne} = \langle Q_n \rangle = \int_{-\infty}^{\infty} Q_n P_{ne}(Q_n; \bar{Q}_e, V_e) dQ_n = n \cdot \bar{Q}_e \quad (4)$$

$$V_{ne} = \int_{-\infty}^{\infty} (Q_n - \bar{Q}_{ne})^2 P_{ne}(Q_n; \bar{Q}_e, V_e) dQ_n = n \cdot V_e$$

Let us also assume that there is a noise contribution  $P_{0e}(Q; \bar{Q}_e, V_e) = f(Q)$  for zero pe charge, with mean 0 and variance  $s^2$  (this is for completeness)

Consider now muons producing  $n$  pes, where the variable  $n$  is following some pdf  $g(n; \mu, \vec{M})$  (could be Poissonian), with

$$\mu = \langle n \rangle = \sum_{n=0}^{\infty} n \cdot g(n; \mu, \vec{M}) \quad (5)$$

$$V_g = \langle n^2 \rangle - \langle n \rangle^2 = \sum_{n=0}^{\infty} (\mu - n)^2 \cdot g(n; \mu, \vec{M})$$

and  $\vec{M}$  is a vector of several other parameters which are relevant for the above pdf.

Then the total accumulated charge (that is proportional to the integral of the corresponding waveform) is distributed according to:

$$G(Q; \mu, \bar{Q}_e, V_e, \vec{M}) = \sum_{n=0}^{\infty} g(n; \mu, \vec{M}) \cdot P_{ne}(Q; \bar{Q}_e, V_e) \quad (6)$$

$$\int_{-\infty}^{\infty} G(Q; \mu, \bar{Q}_e, V_e, \vec{M}) dQ = 1$$

The total charge has an expectation value which is given by

$$\begin{aligned} E[Q] &= \int_{-\infty}^{\infty} Q \cdot G(Q; \mu, \bar{Q}_e, V_e, \vec{M}) dQ = \sum_{n=0}^{\infty} g(n; \mu, \vec{M}) \cdot \int_{-\infty}^{\infty} Q \cdot P_{ne}(Q; \bar{Q}_e, V_e) dQ \\ &= \sum_{n=0}^{\infty} g(n; \mu, \vec{M}) \cdot n \cdot \bar{Q}_e = \mu \cdot \bar{Q}_e \end{aligned} \quad (7)$$

The variance of the total charge should be

$$\begin{aligned}
 V[Q] &= \int_{-\infty}^{\infty} (Q - \mu \cdot \bar{Q}_e)^2 \cdot G(Q; \mu, \bar{Q}_e, V_e, \vec{M}) dQ = \sum_{n=0}^{\infty} g(n; \mu, \vec{M}) \cdot \int_{-\infty}^{\infty} (Q - \mu \cdot \bar{Q}_e)^2 \cdot P_{ne}(Q; \bar{Q}_e, V_e) dQ \\
 &= \sum_{n=0}^{\infty} g(n; \mu, \vec{M}) \cdot \int_{-\infty}^{\infty} \left\{ Q^2 + (\mu \cdot \bar{Q}_e)^2 - 2Q\mu \cdot \bar{Q}_e \right\} \cdot P_{ne}(Q; \bar{Q}_e, V_e) dQ \\
 &= \sum_{n=0}^{\infty} g(n; \mu, \vec{M}) \left\{ \underbrace{\int_{-\infty}^{\infty} Q^2 \cdot P_{ne}(Q; \bar{Q}_e, V_e) dQ}_{V_{ne} + \bar{Q}_{ne}^2} + (\mu \cdot \bar{Q}_e)^2 \underbrace{\int_{-\infty}^{\infty} P_{ne}(Q; \bar{Q}_e, V_e) dQ}_1 - 2\mu \cdot \bar{Q}_e \underbrace{\int_{-\infty}^{\infty} Q P_{ne}(Q; \bar{Q}_e, V_e) dQ}_{\bar{Q}_{ne}} \right\} \quad (8) \\
 &= \sum_{n=0}^{\infty} g(n; \mu, \vec{M}) \left\{ nV_e + n^2 \bar{Q}_e^2 + (\mu \cdot \bar{Q}_e)^2 - 2\mu \cdot n \cdot \bar{Q}_e^2 \right\} = \sum_{n=0}^{\infty} g(n; \mu, \vec{M}) \left\{ nV_e + \bar{Q}_e^2 (\mu - n)^2 \right\} \\
 &= V_e \sum_{n=0}^{\infty} g(n; \mu, \vec{M}) n + \bar{Q}_e^2 \sum_{n=0}^{\infty} g(n; \mu, \vec{M}) (\mu - n)^2
 \end{aligned}$$

$$= \mu V_e + \bar{Q}_e^2 V_g$$

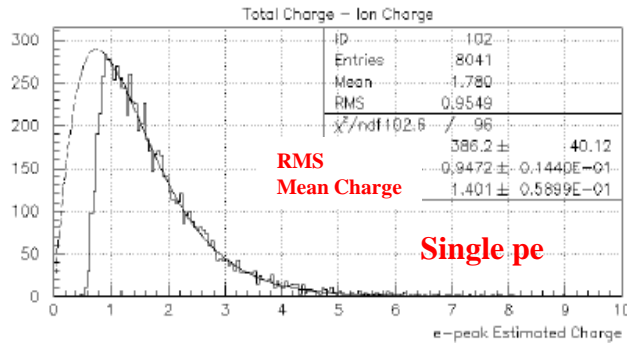
**The variance of muon charge distribution is equal to (mean number of pes) x (variance of single pe charge) + (the square of the single pe mean charge) x (the variance of the number of pes)**

If we assume that the number of pe's is following Poissonian statistics then  $V_g = \mu$  and (8) is getting the simple form:

$$V[Q] = \mu V_e + \bar{Q}_e^2 V_g = \mu V_e + \mu \bar{Q}_e^2 = \mu (V_e + \bar{Q}_e^2) \quad (9)$$

We have also found  $E[Q] = \mu \cdot \bar{Q}_e \quad (7)$

Let us apply (7) and (9) to the experimental distributions



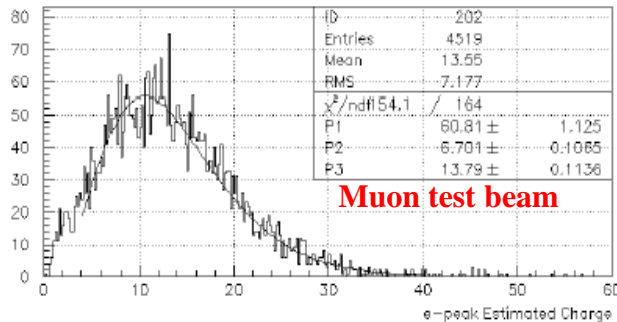
With  $E[Q]=13.55$  and  $Q_e=1.4$  we got  $\mu=9.7$

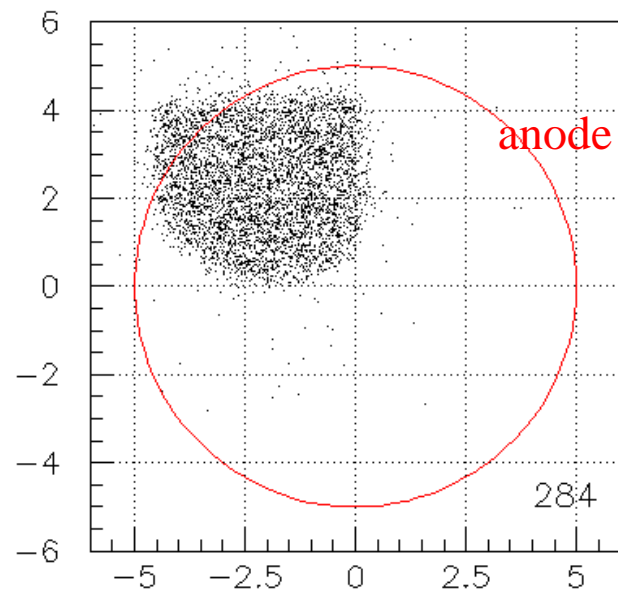
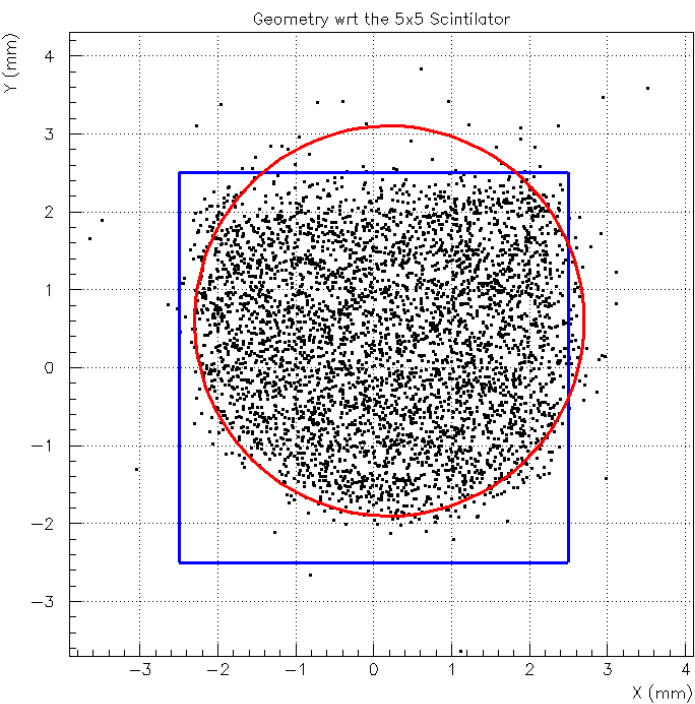
Then, eq. (9) with  $V_e=(0.95)^2$  predicts that  $V[Q]$  should be 27.8 or that the RMS of the muon charge distribution should be 5.3.

**BUT THE RMS OF THE MUON CHARGE DISTRIBUTION IS 7.2**

The discrepancy could not be explained as statistical or even systematical error in estimating the relevant mean and RMS values.

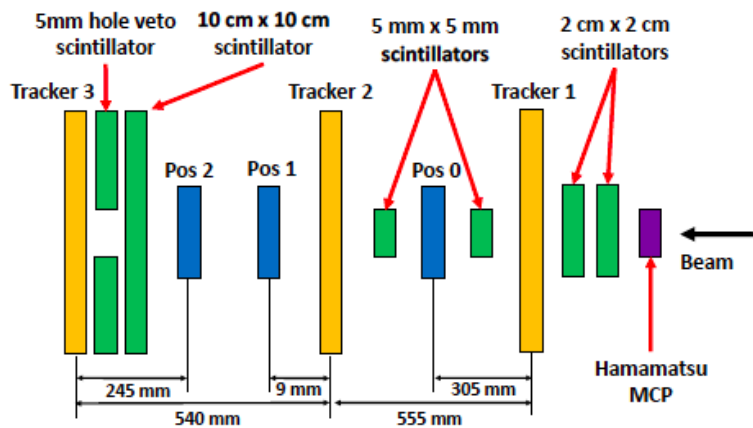
The discrepancy was an artifact of the detector misalignment with respect to the beam profile !!!





The accepted beam profile

The accepted beam profile relative to the anode





## We fit to align the detector and to estimate the mean number of pes per muon

The PDF describing the PICOSEC e-peak charge distribution related to a muon is:

$$F(Q, x, y; \mu, \delta x, \delta y) = \sum_{N=1, \infty} \frac{(\mu \varepsilon(r))^N e^{-\mu \varepsilon(r)}}{N!} P_{Npe}(Q; RMS, \bar{Q}_e)$$

$$r = \sqrt{(x - \delta x)^2 + (y - \delta y)^2}$$

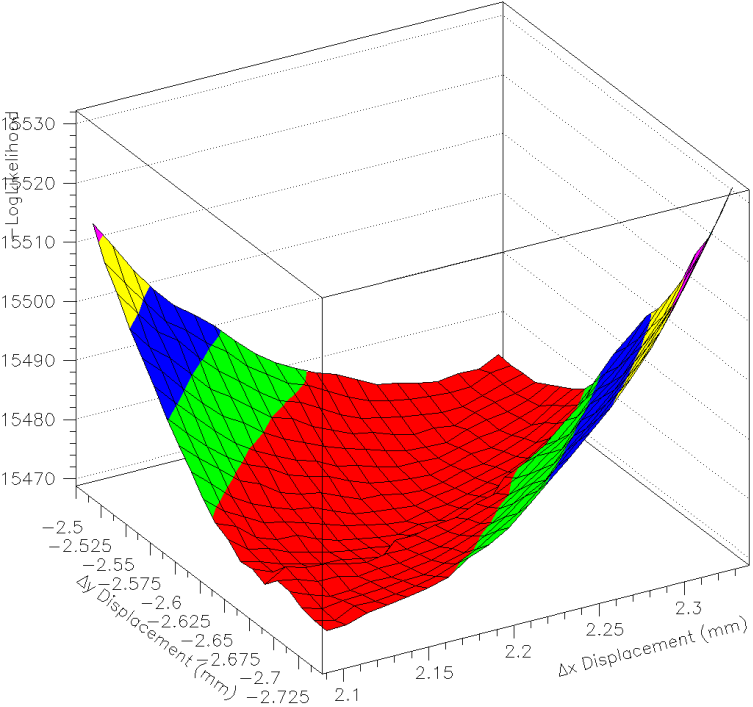
where  $Q$  is the charge of the observed PICOSEC pulse, produced by a muon with impact parameter  $r$  (wrt the centre of the anode), whilst  $\delta x$  and  $\delta y$  are the coordinates of the anode' center. The mean number of pes per muon track is  $\mu$ ,  $P_{Npe}$  is the Gamma distribution for  $N$  pes whilst  $RMS$  and  $\langle Q_e \rangle$  are the  $RMS$  and mean charge of the Polya distribution related to a single photoelectron.

$$P_{Npe}(Q; N, \theta, \bar{Q}_e) = \underbrace{P_{spe} \otimes P_{spe} \cdots \otimes P_{spe}}_{N \text{ times}} = \frac{1}{\bar{Q}_e} \frac{(\theta+1)^{N(\theta+1)} (Q/\bar{Q}_e)^{N(\theta+1)-1}}{\Gamma(N(\theta+1))} e^{-(\theta+1)Q/\bar{Q}_e}$$

The function  $\varepsilon(r)$  is the geometrical acceptance, i.e. the percentage of pes, produced by a track with impact parameter  $r$ , which are produced inside the fiducial limits of the detector.

Then the likelihood function for a set of  $M$  events is

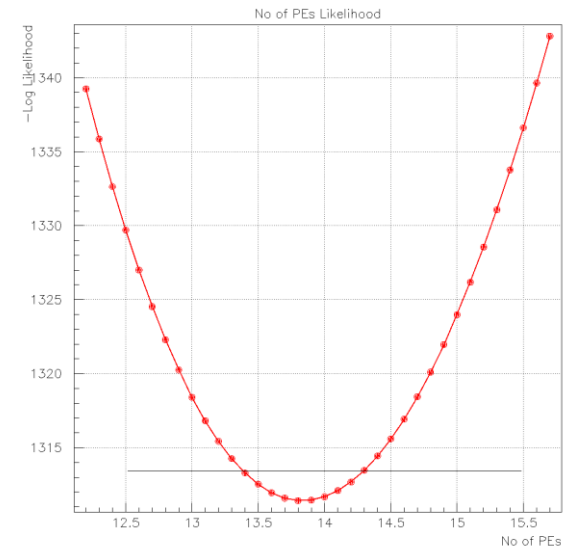
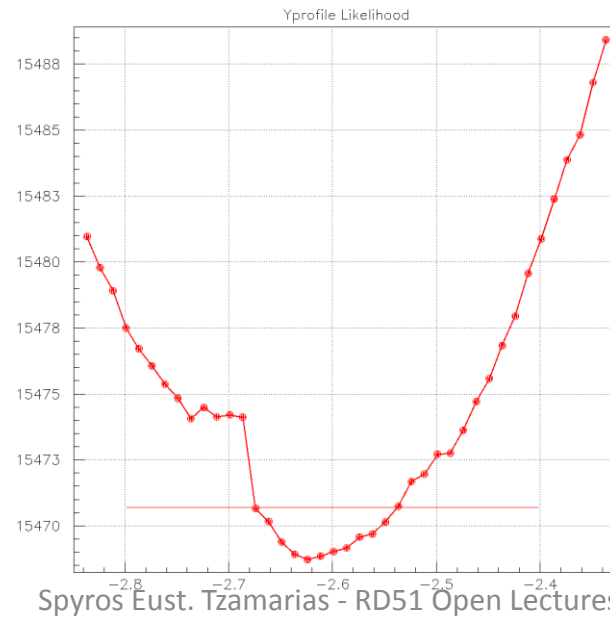
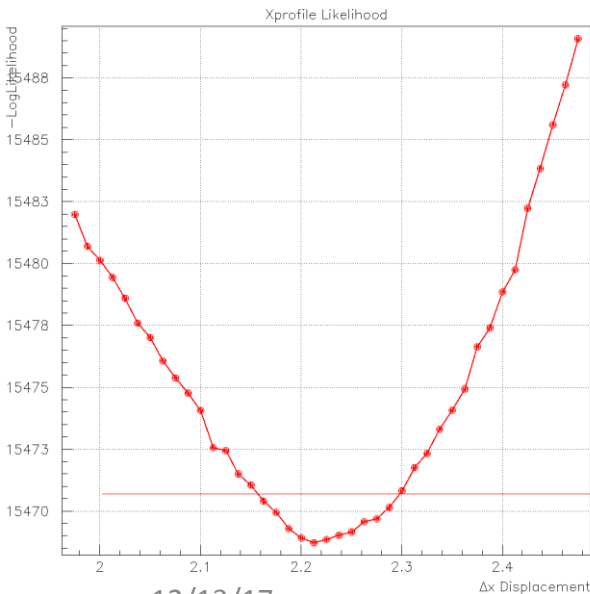
$$L(\mu, \delta x, \delta y) = \prod_{i=1}^M F(Q_i, x_i, y_i; \mu, \delta x, \delta y)$$



Fix the  $\mu$  to the previously estimated value and perform an unbinned likelihood fit to estimate  $\delta x$  and  $\delta y$

Fix  $\delta x$  and  $\delta y$  to the previous estimated values and perform a likelihood fit to estimate  $\mu$

Stop when the procedure has converged

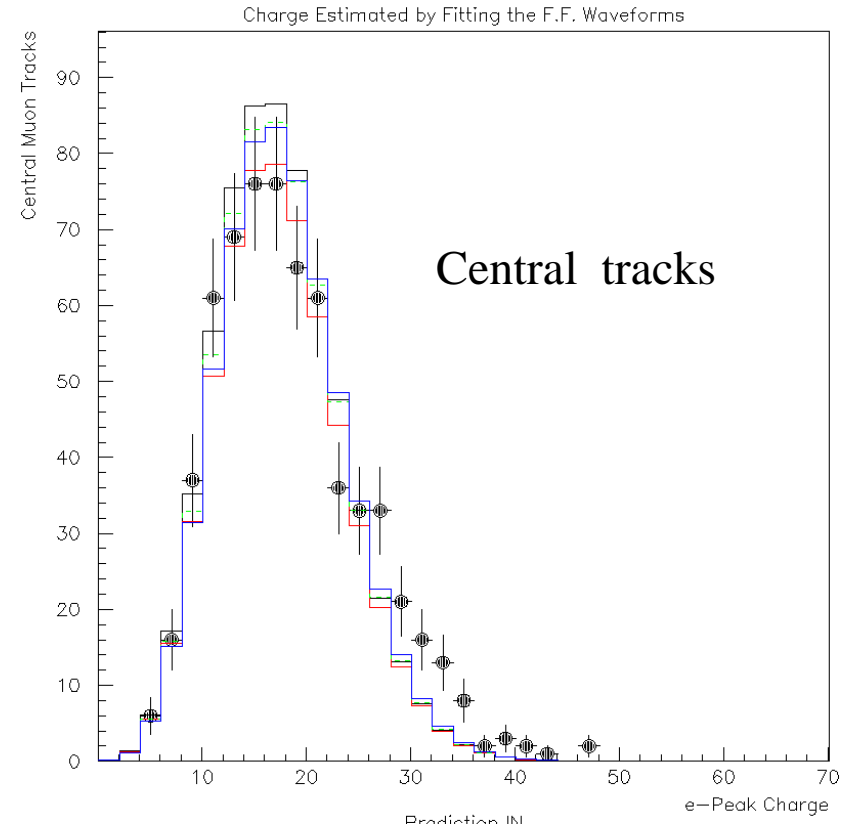
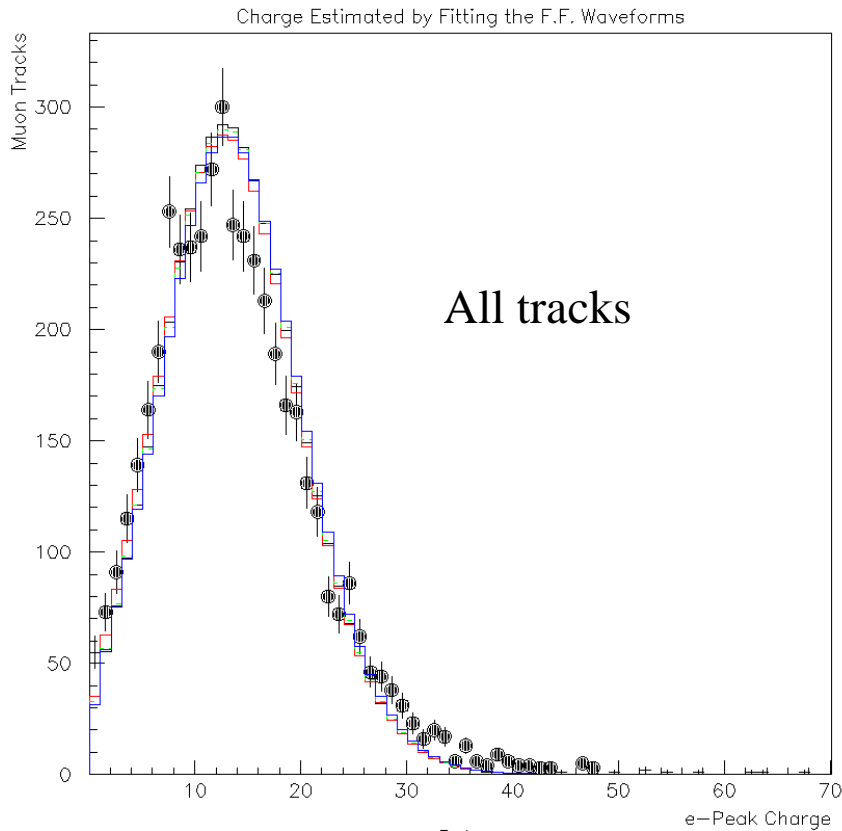


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The MINOS statistical errors (at 95.5% CL) are of the order 0.5 for the  $\mu$  and 0.1 mm for the displacements

SPE charge mean	SPE Charge RMS	$\mu_0$	$\delta x$ (mm)	$\delta y$ (mm)
1.34	0.9137	13.024	2.11	-2.52
1.39	0.9087	12.63	2.16	2.51
1.322	0.9164	13.31	2.16	-2.51
1.365	0.9109	13.02	2.15	-2.52
1.408	0.9070	12.73	2.082	-2.507
1.383	0.9095	13.0	2.095	-2.47
1.368	0.9113	13.03	2.10	-2.457
1.347	0.9150	13.3	2.01	-2.52

# Comparison of the experimental distributions with the “fit results” (different colors correspond to different Polya parameters)

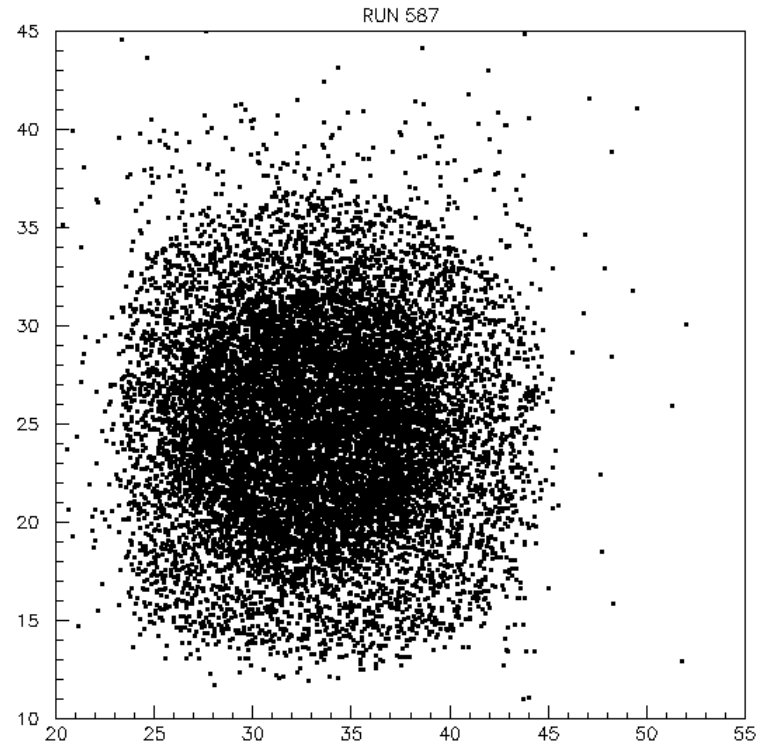
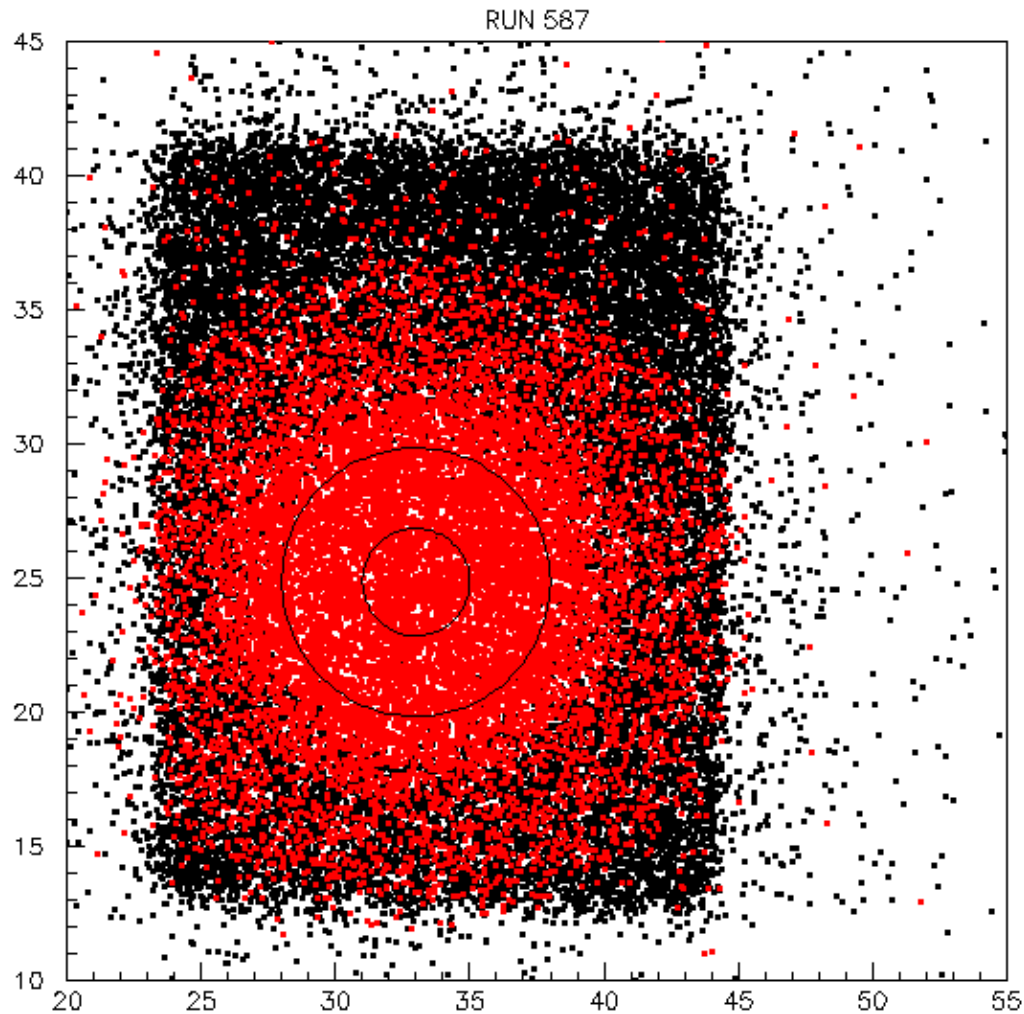


**Each track, contributes to all the charge bins the histogram with weights given by:**

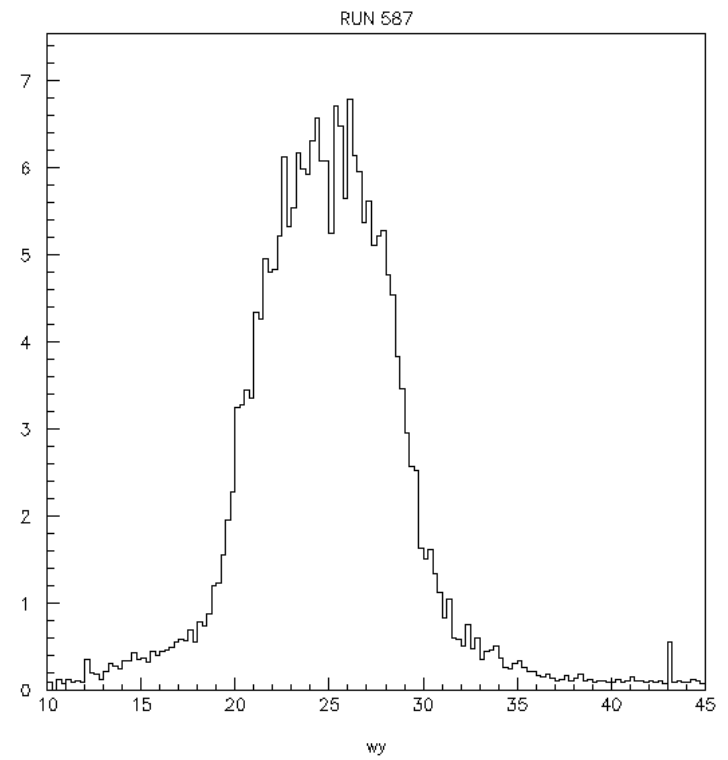
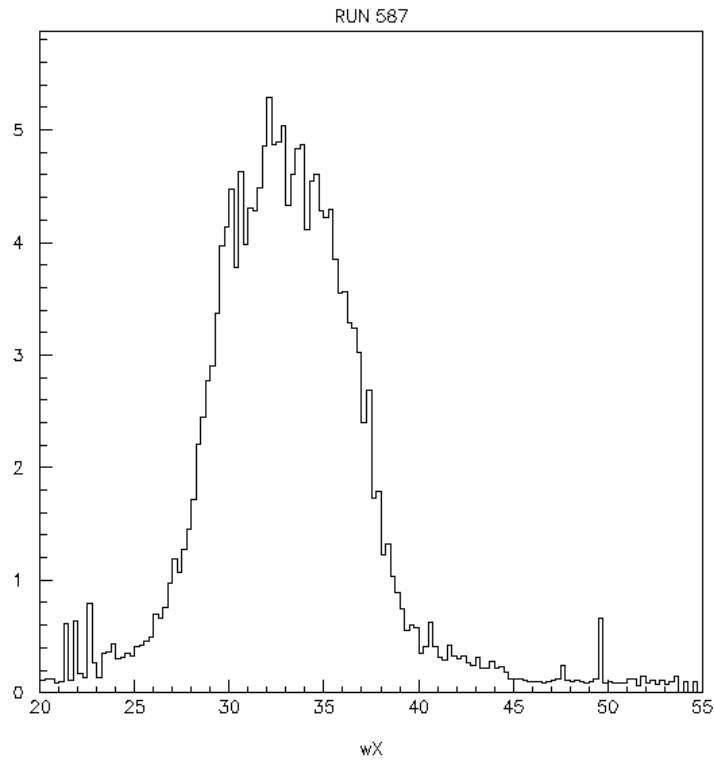
$$F(Q, x, y; \mu, \delta x, \delta y) = \sum_{N=1, \infty} \frac{(\mu \epsilon(r))^N e^{-\mu \epsilon(r)}}{N!} P_{Npe}(Q; RMS, \overline{Q_e})$$

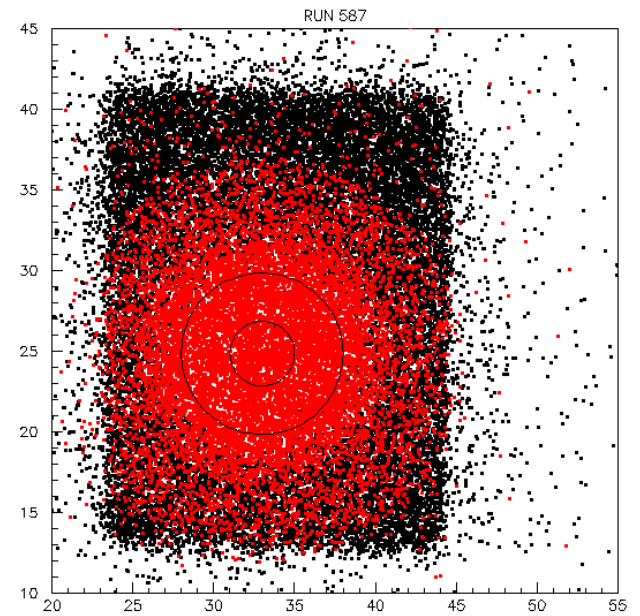
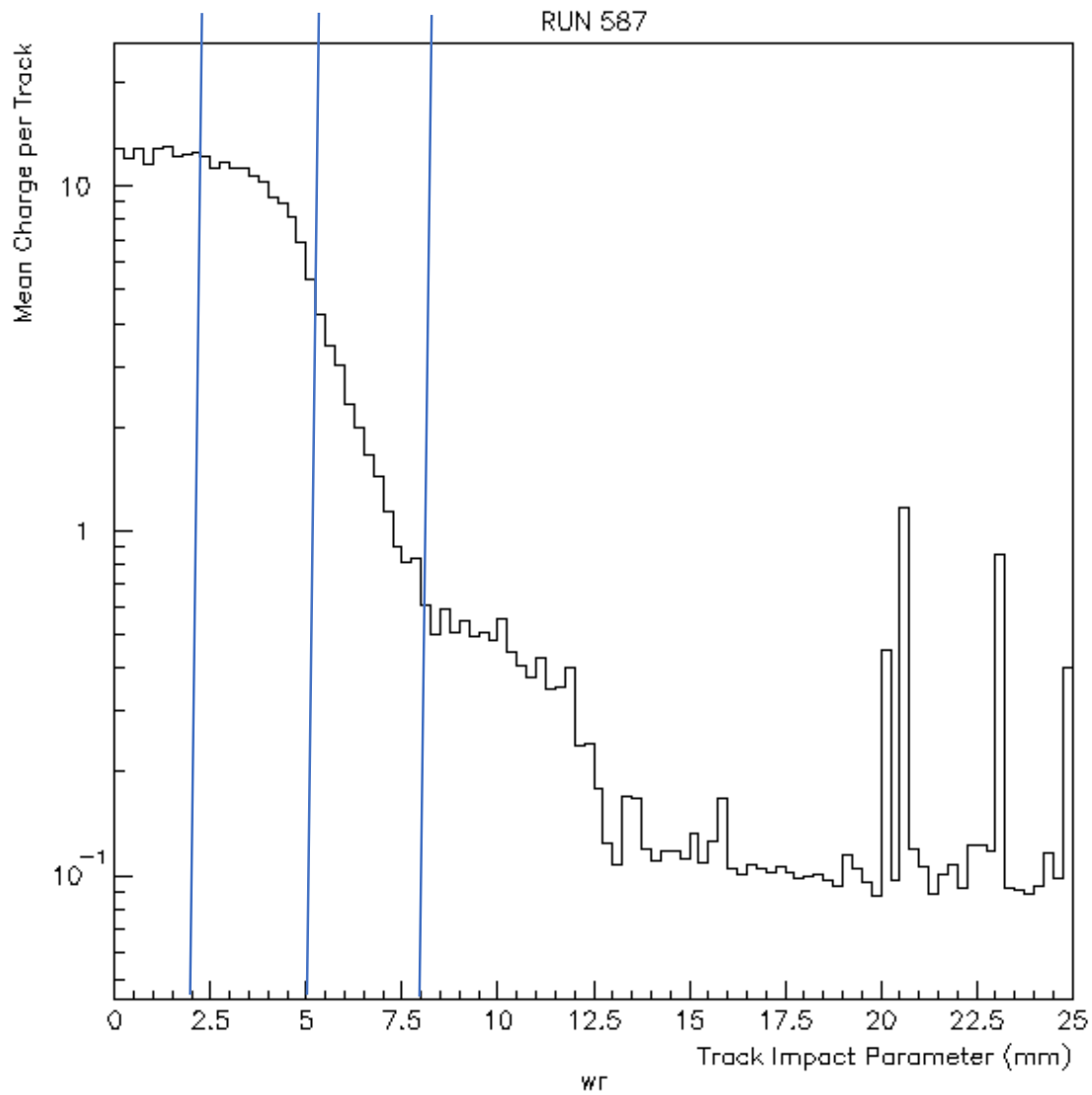
$$r = \sqrt{(x - \delta x)^2 + (y - \delta y)^2}$$

# The importance to include all the effects in the estimators



# Mean Charge per Track vs X (Y) Track Impact Coordinate





Absorption=0%  
Reflectivity=22%

