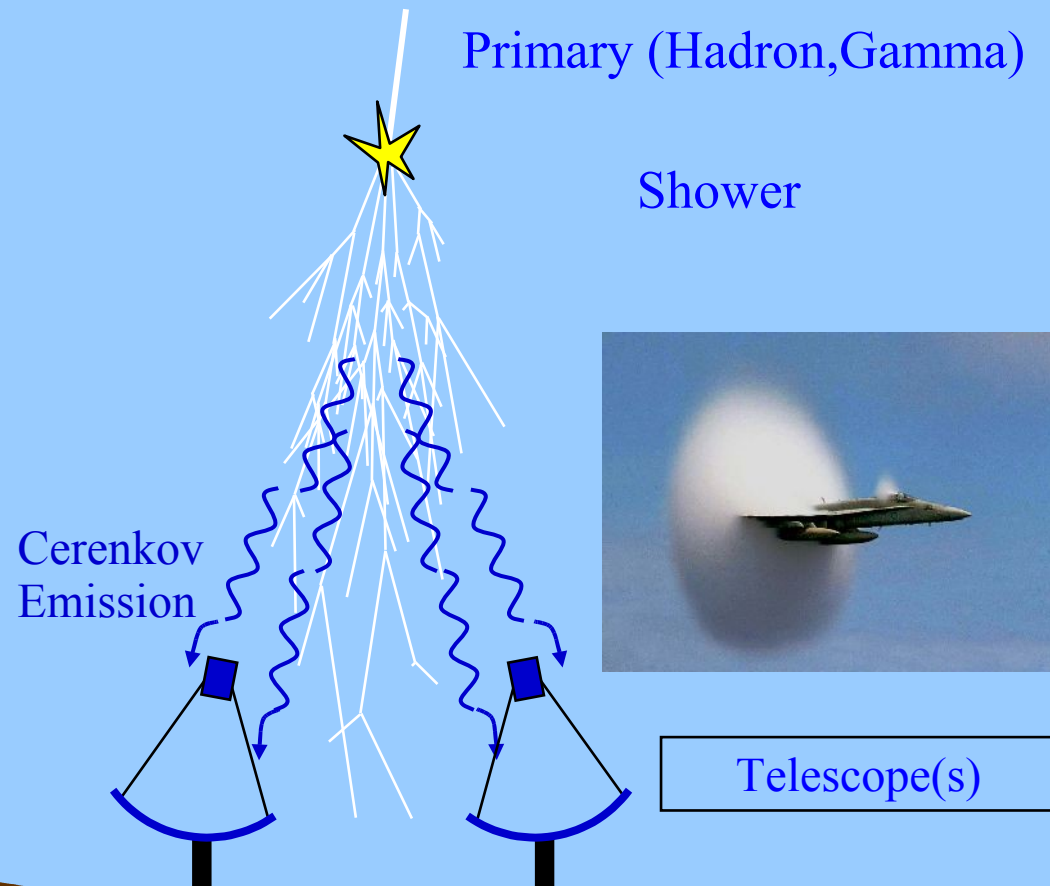


Analysis techniques for HESS

Mathieu de Naurois, LPNHE - CNRS/Universités VI/VII
denauroi@in2p3.fr

- ❑ Reminder about Atmospheric Cerenkov Technique
- ❑ Reconstruction techniques
 - ❑ Hillas parameters based techniques
 - ❑ More elaborated reconstruction techniques
- ❑ Background subtraction
- ❑ Toward diffuse emission analysis?

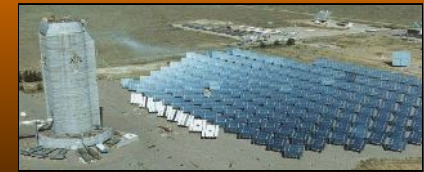
Crab > 1 TeV : $\sim 1 \gamma/\text{century}/\text{m}^2$
Need for huge collection area



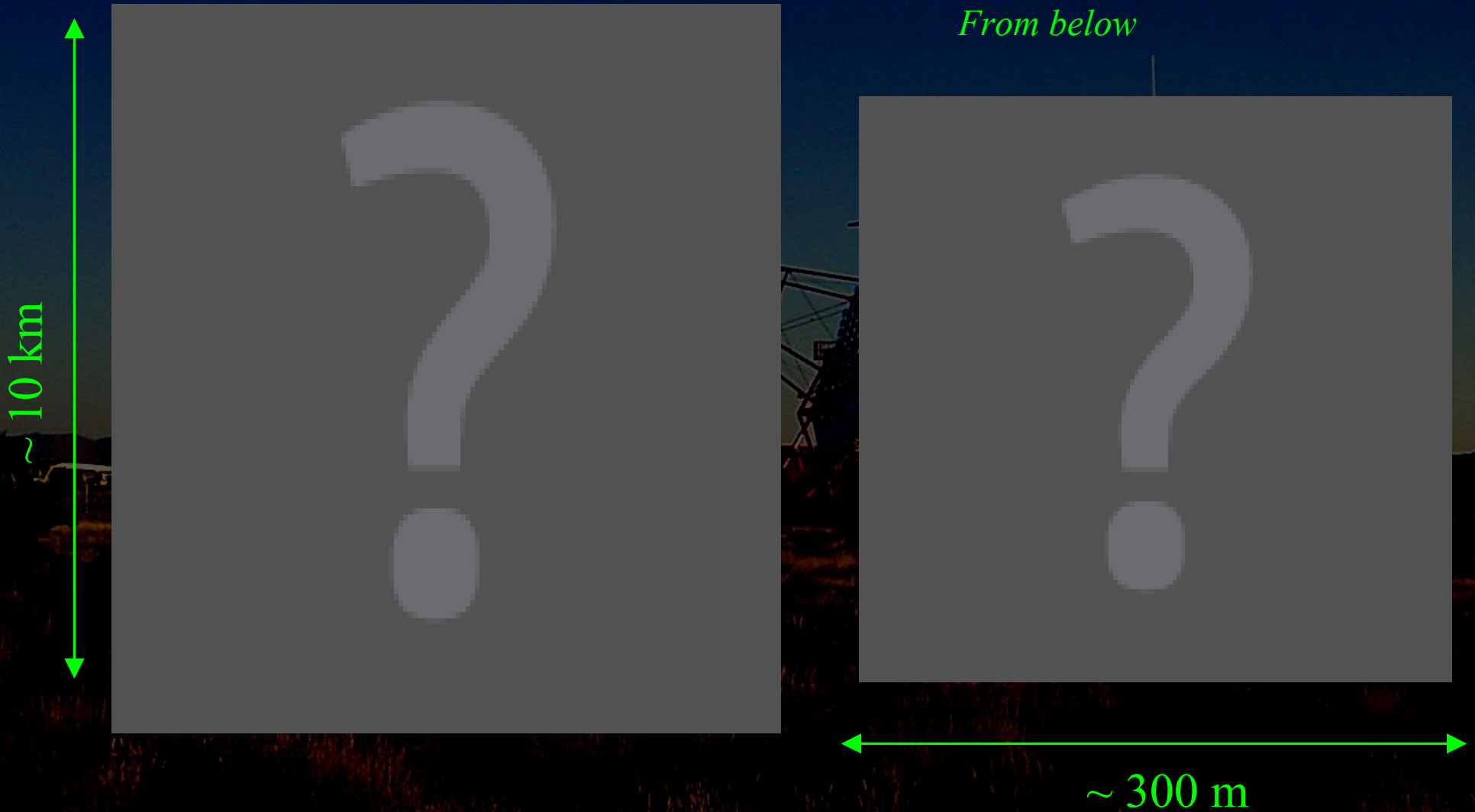
HESS, VERITAS, MAGIC, CANGAROO



STACEE, CELESTE, SOLAR II, GRAAL



An electromagnetic shower



Variability of showers

γ , 100 GeV

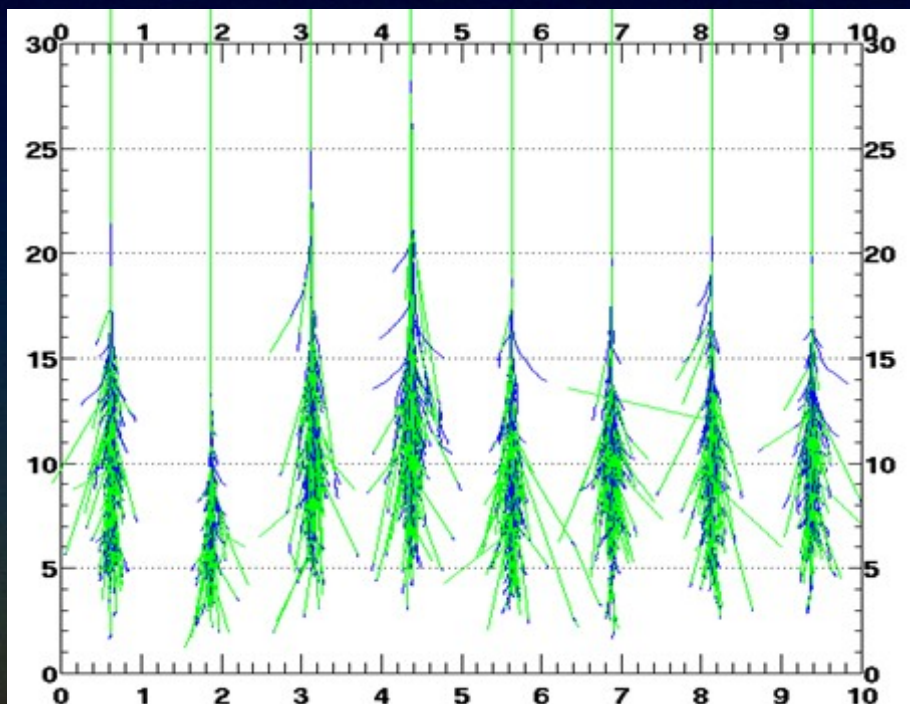


Protons, 500 GeV

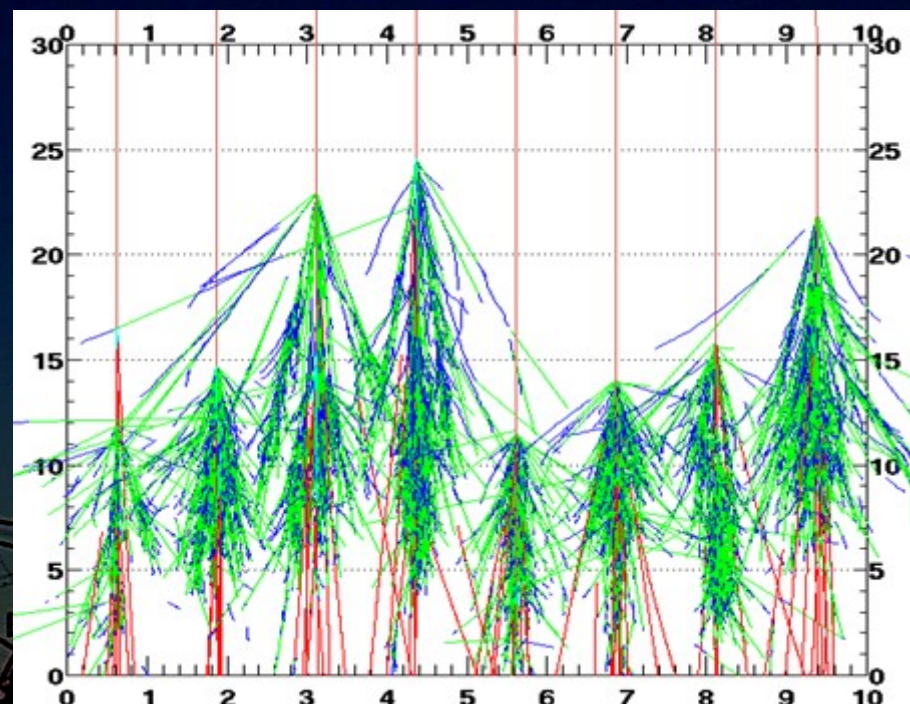


Variability of showers

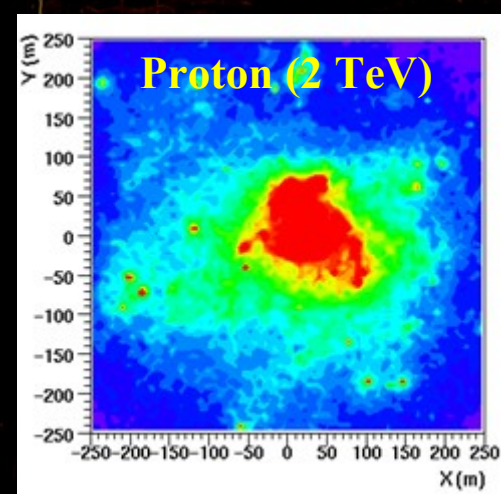
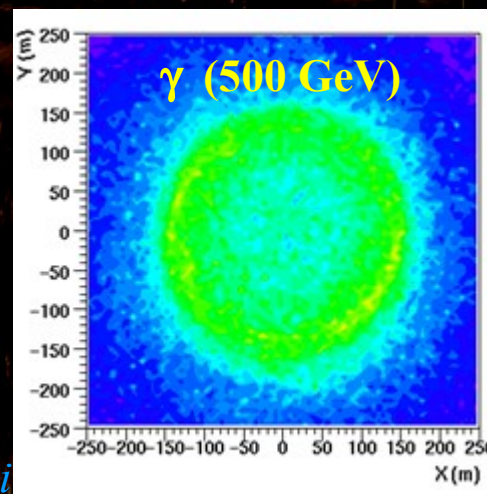
γ , 100 GeV



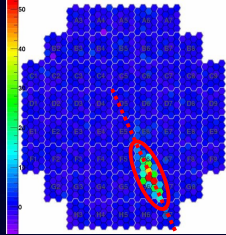
Protons, 500 GeV



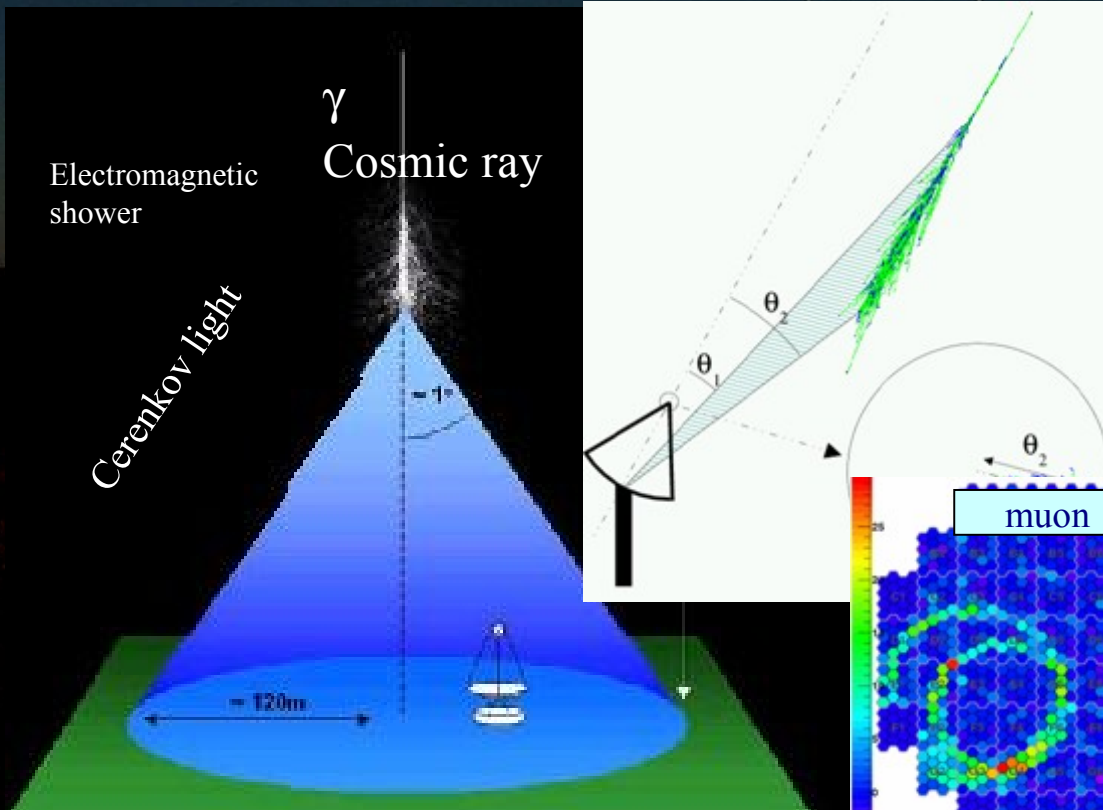
- Hadronic showers fluctuate more (Good for discrimination)
- Contain some muons



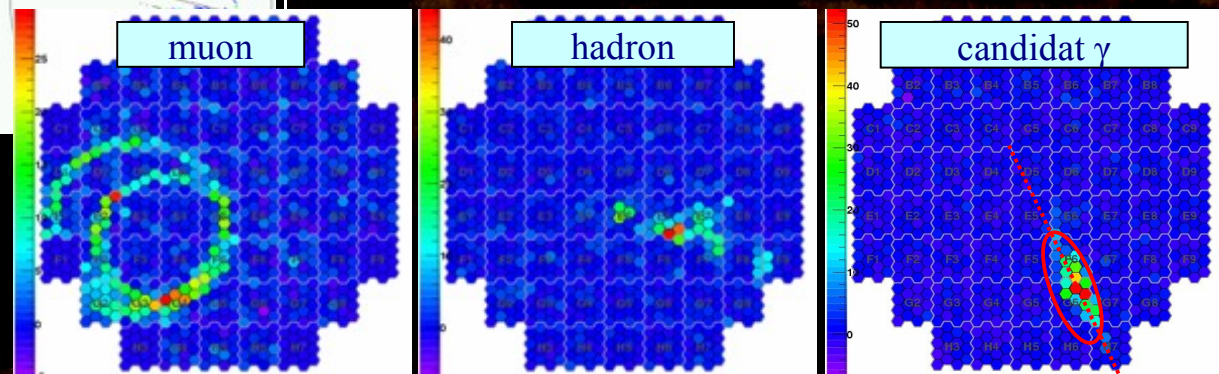
Atmospheric Cherenkov Imaging



- Cherenkov flash spread over ~ 120 m r. r
- Image the shower on a very fast camera ($\Delta T \sim 2$ ns)
- Large effective area (10^5 m²) even with modest size telescopes



- Key point : speed (< 10 ns)
- Image shape used in γ /hadrons separation



I – "Hillas Parameters" based techniques

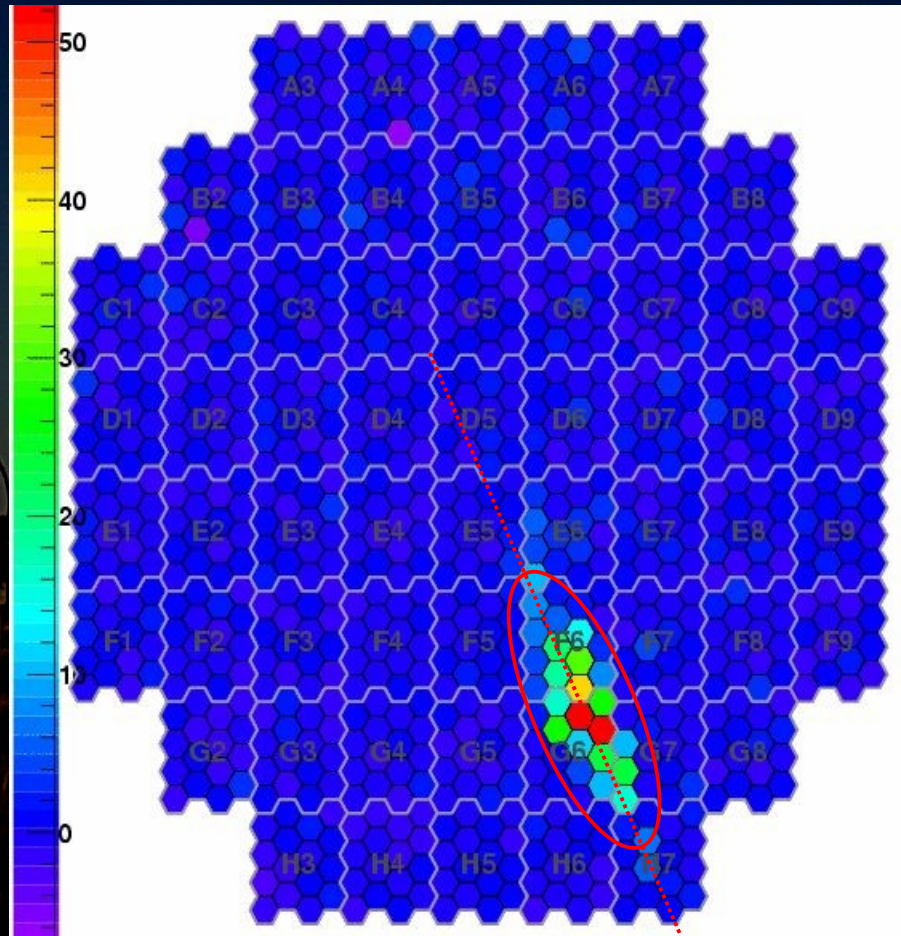
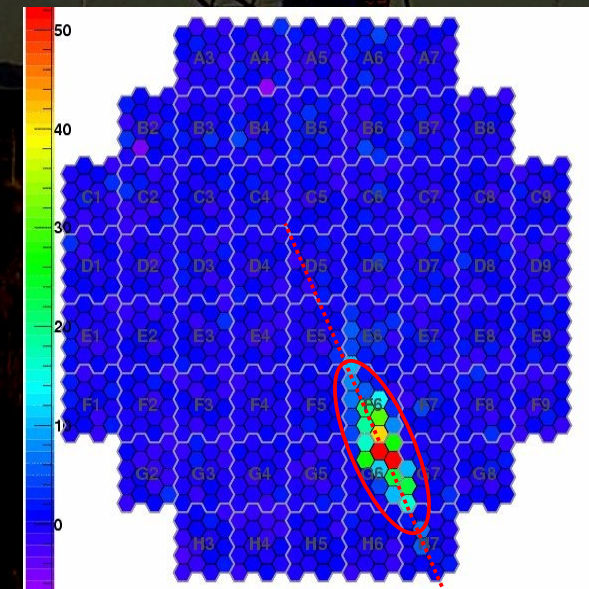
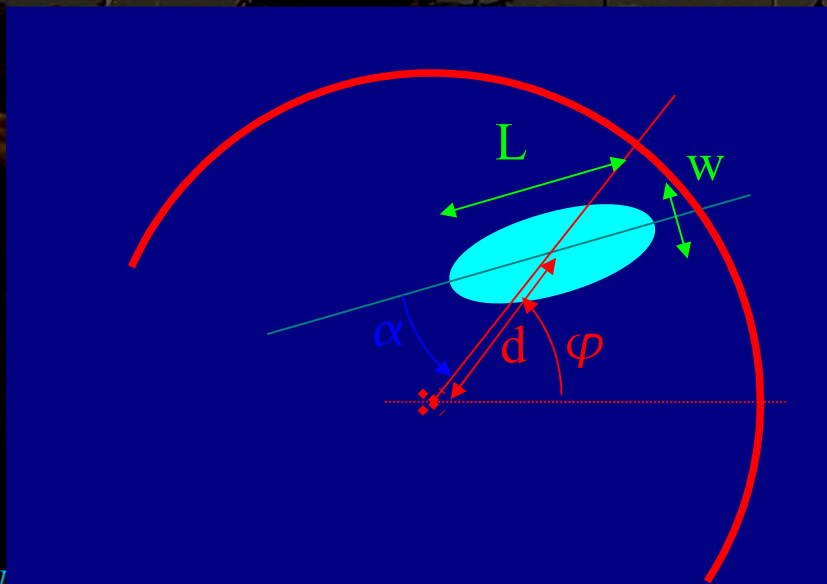
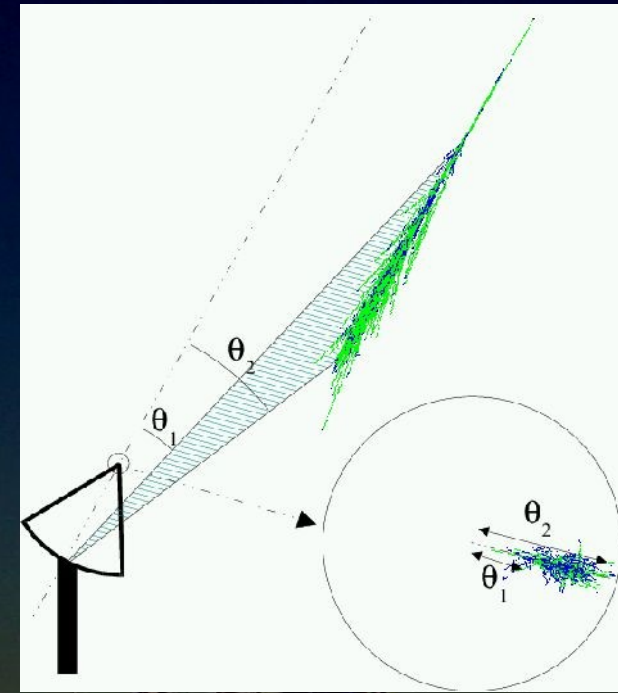


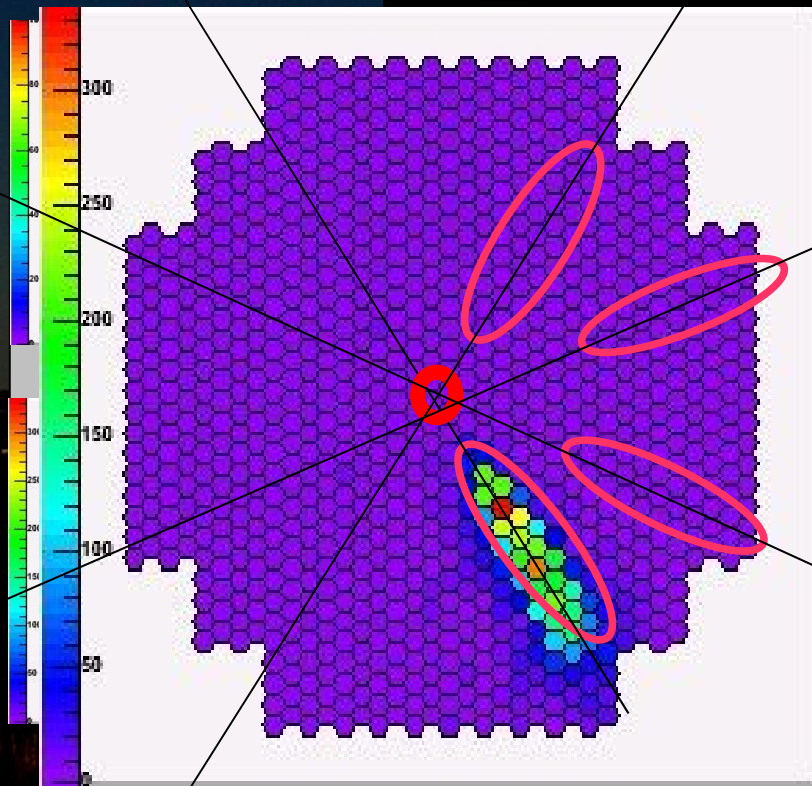
Image parametrisation

- Hillas Parameters (1984):
 - γ images are \sim elliptical
 - \Rightarrow reduce information to a few numbers:
 - Length (L) & Width (w)
 - Amplitude (size)
 - Nominal Distance (d)
 - Azimuthal Angle (φ), pointing angle (α)
- Additional parameters : asymmetry, ...
- Need pixel-in-shower identification (cleaning)

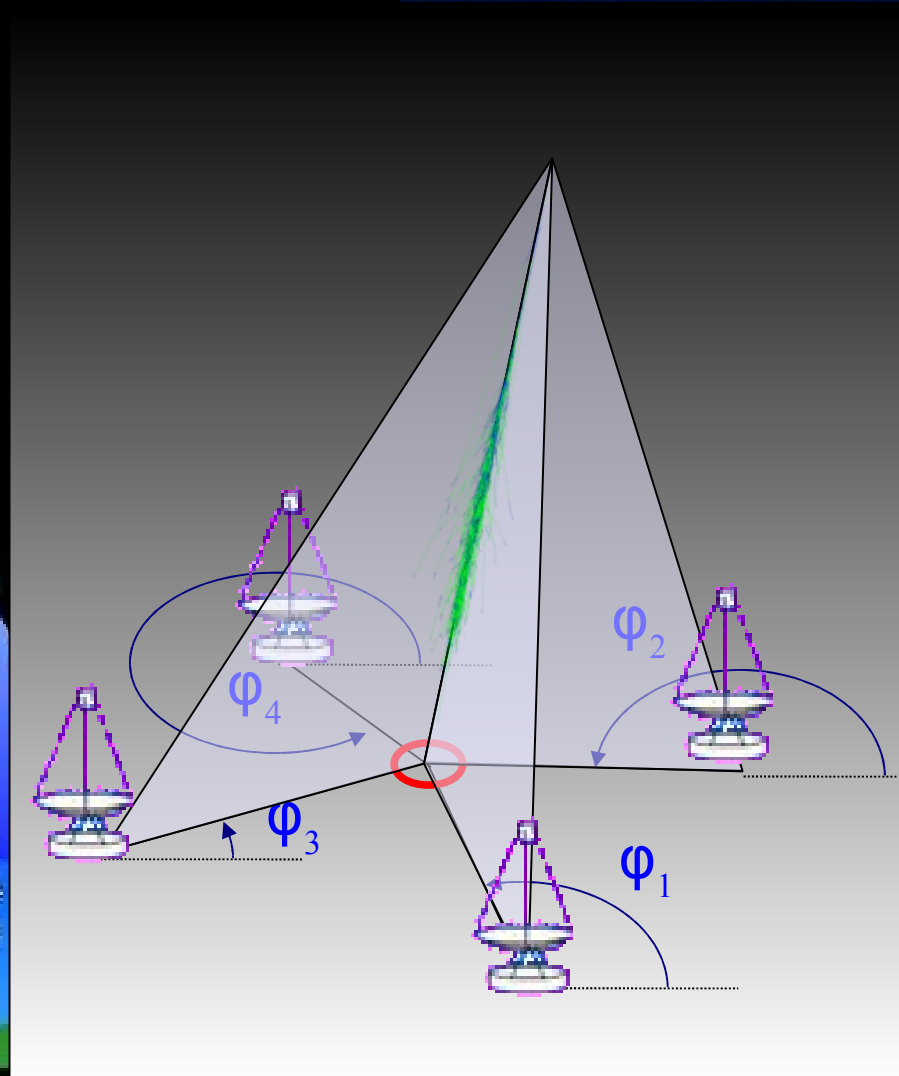
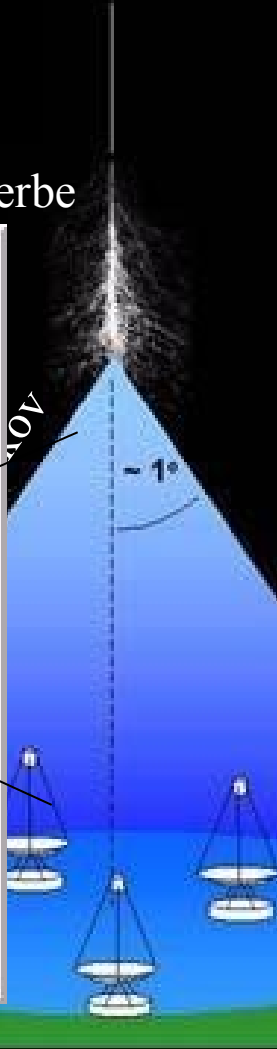


Stereoscopy

- Direction reconstruction: intersection of image main axis (angular space)
- Impact reconstruction: plane intersection (Telescope, φ_i) on ground



Gerbe



γ/h Separation – Energy reconstruction

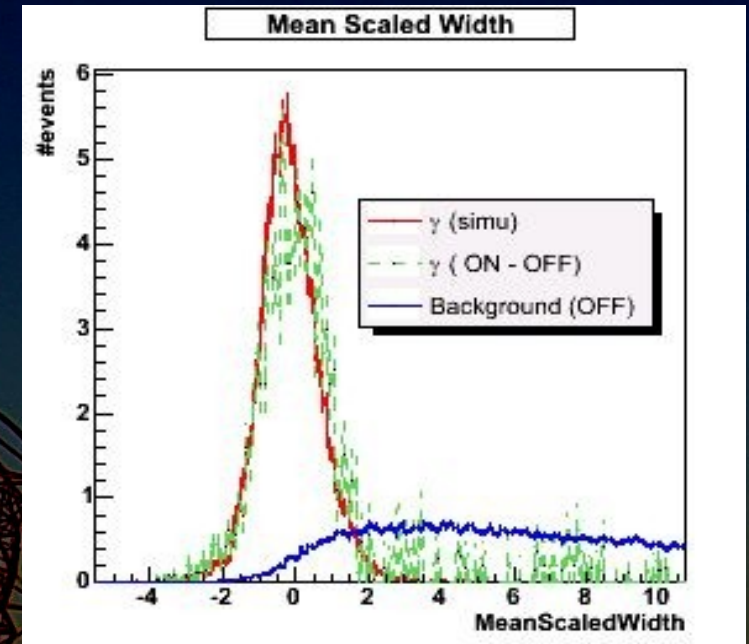
- MC => lookup table
(width, length = f(impact, size))
 $\langle w \rangle(\rho, I), \sigma_w(\rho, I)...$

- Normalized parameter,
averaged over
telescopes

$$S_w = \frac{(w - \langle w \rangle)}{\sigma_w}$$

$$MSW = \sum_{tels} S_w / \sqrt{ntels}$$

- MeanScaledWidth and MeanScaledLength
most discriminant (factor ~ 100)



- Energie : Similar technique : Lookup tables (Image Size, Impact distance)
 \Rightarrow Energy and σ_{Energy}

- Resolution 20 - 25%

- Can be improved using additional variables
e.g. Depth of shower maximum

Possible improvements

❑ Some possible improvements in reconstruction

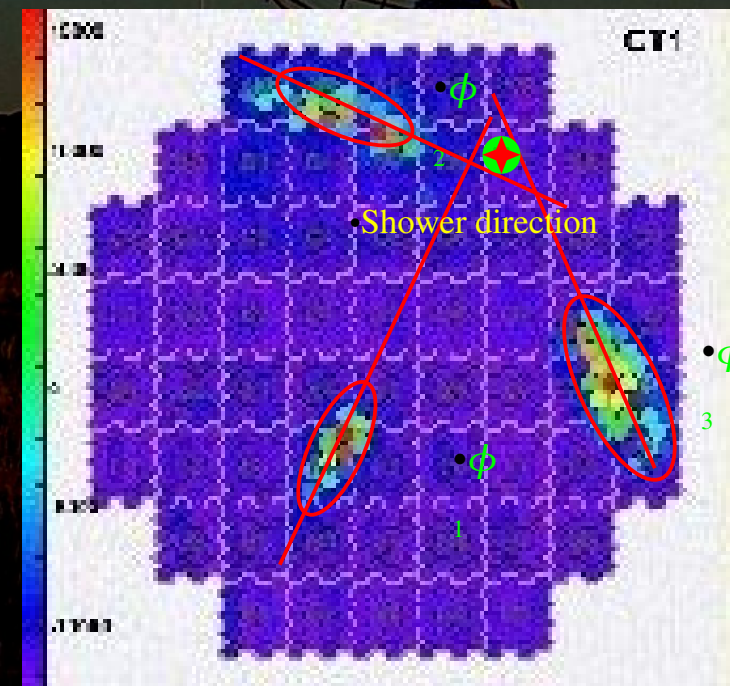
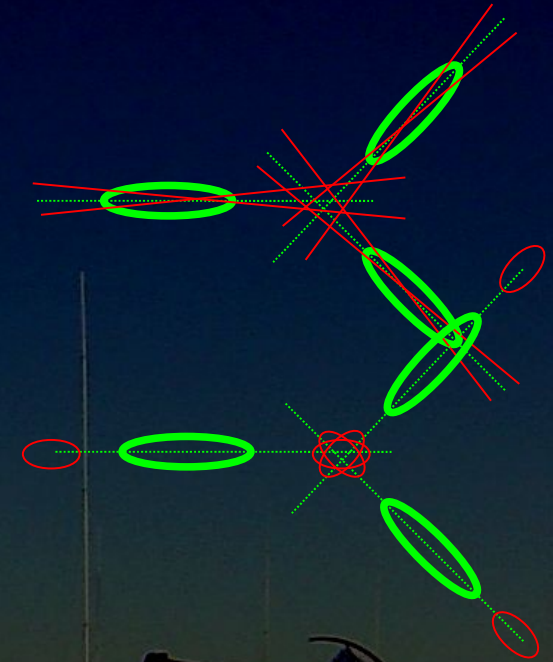
(Hofmann et al, 1999)

- ❑ Uncertainty on Hillas Parameters
- ❑ Constrains on nominal distance

❑ Discrimination: additional informations can help

- ❑ Depths of shower maximum
- ❑ Consistency between telescopes (i.e. energy reconstruction)
- ❑ Temporal structure (time gradient in images)

❑ Significant improvement (~ 2) only in single telescope mode



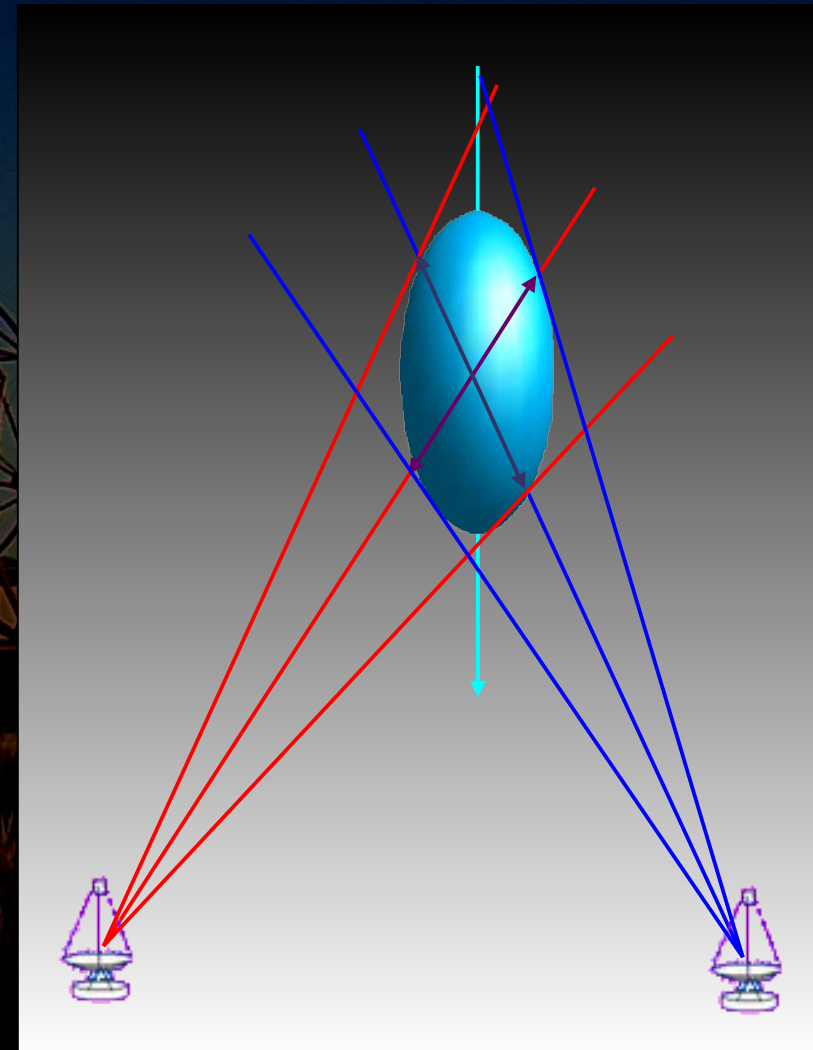
3D Model Analysis

- ❑ Principle: extend Hillas parameters using correlations between several telescopes
- ❑ Model the shower by a 3D Gaussian photosphere
- ❑ Intensity in each pixel : line of sight integral of photosphere
- ❑ Fit model to actual images (after cleaning) (log-likelihood)

8 parameters fit

Altitude, impact, direction,
width, length, brightness

*Lemoine-Goumard, Degrange, Tluczykont,
Astropart Phy 25 (2005)*



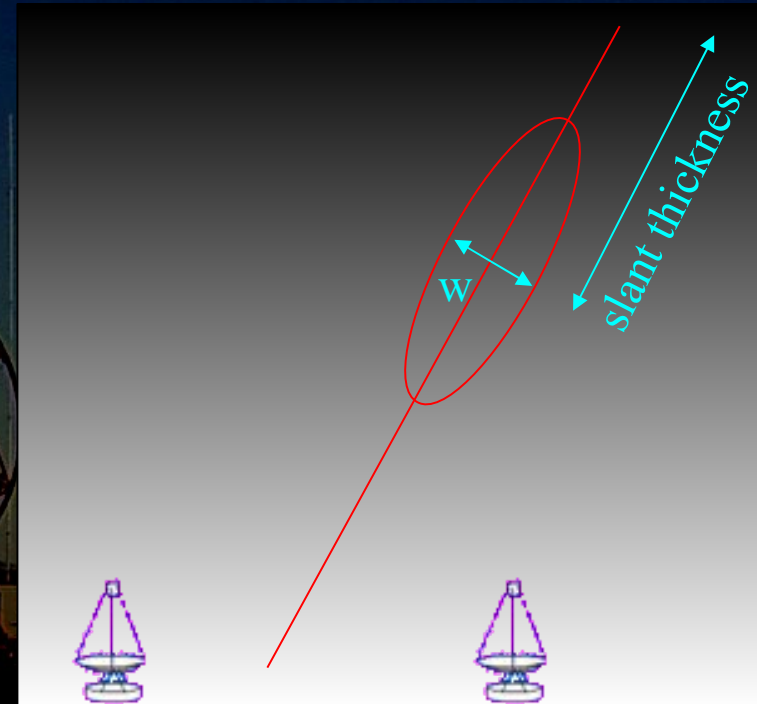
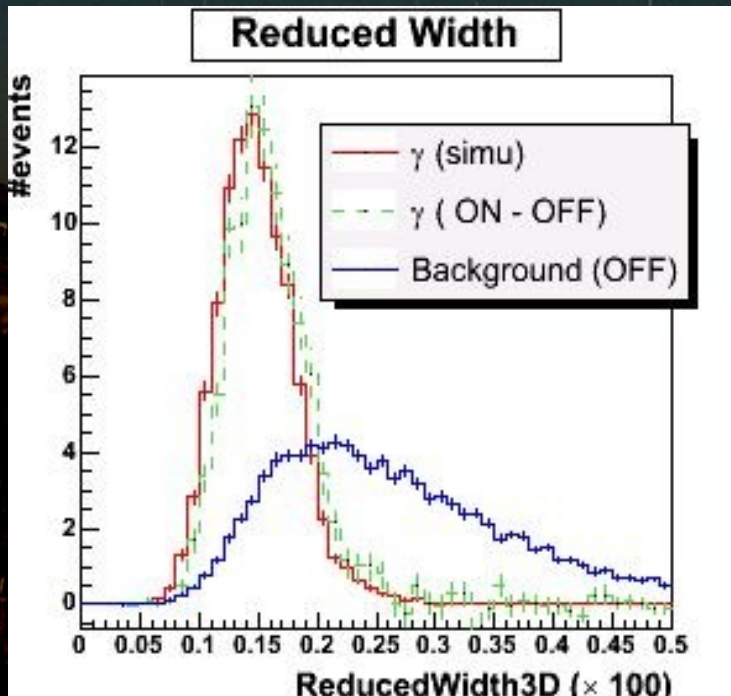
Discrimination

□ Width (en units or radiation length)
proportional to slant thickness

□ Reduced width:

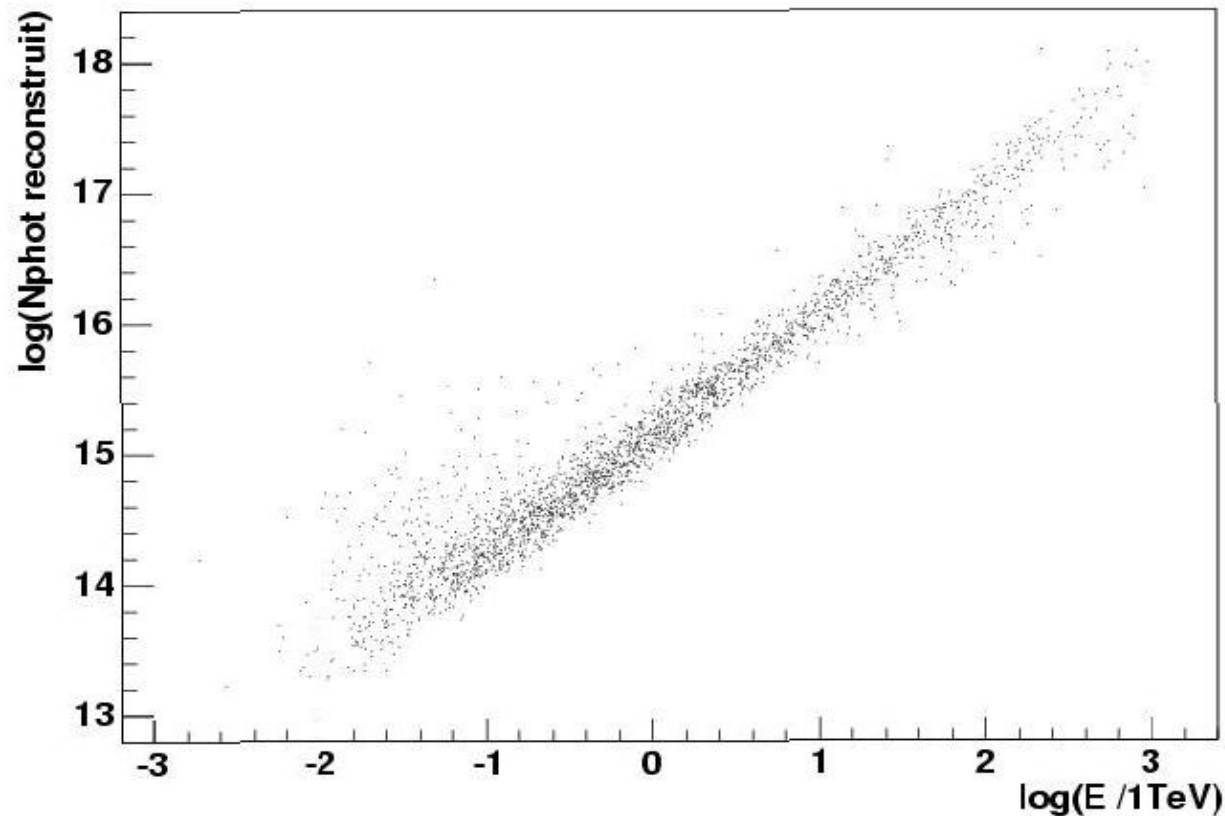
□ Rejection factor O(100)

$$\omega = \frac{w \times \rho(z_{max})}{thickness}$$

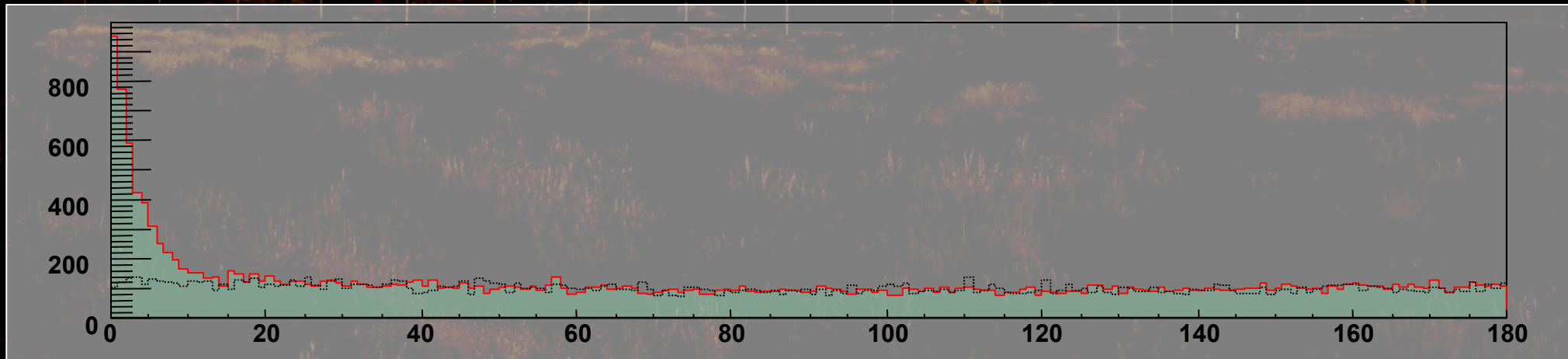
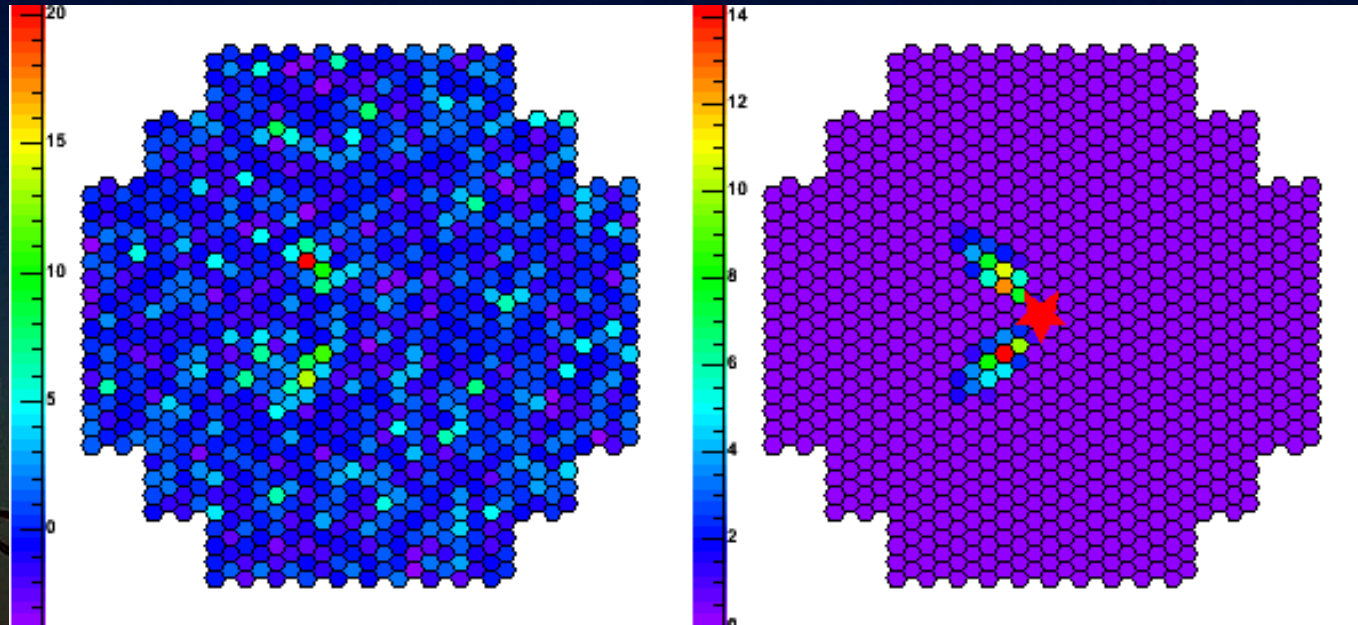


Energy reconstruction

- ❑ Result of shower fit: number of photons in shower
- ❑ Empirical relation to energy : $\ln(E) = a + b * \ln(N_{\text{phot}})$
a and b function of zenith angle (from MC)
- ❑ Resolution < 15% in [800 GeV – 50 TeV], no bias, worsen at lower energies



III – Model Analysis



Principles

- Fit the raw (uncleaned) images to a precalculated shower model
 - Semi-analytical shower model, function of shower true parameters (energy, direction, impact,...), done once for all
 - Log-likelihood fit, using actual noise distribution in every pixel (=> more precise)

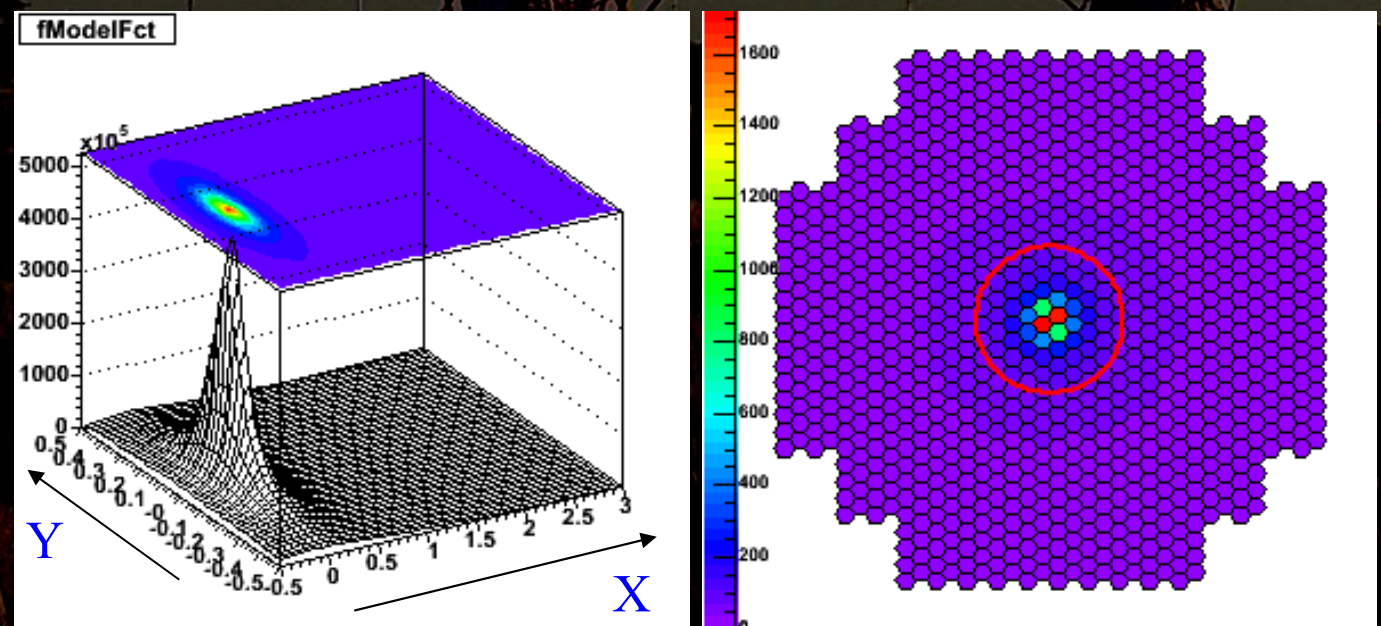
Prob. of observing x
when μ is expected

$$P_{df}(x, \mu, \sigma_p) = \sum_n \frac{\mu^n e^{-\mu}}{n! \sqrt{\pi(\sigma_p^2 + n \sigma_y^2)}} \exp\left(\frac{-(x-n)^2}{\pi(\sigma_p^2 + n \sigma_y^2)}\right)$$

$\sigma_p = \text{Pedestal width (NSB+electronic noise)}$
 $\sigma_y = \text{PMT resolution}$

Model image for each

- zenith angle
- energy
- impact distance
- first interaction depth



Discrimination: goodness-of-fit

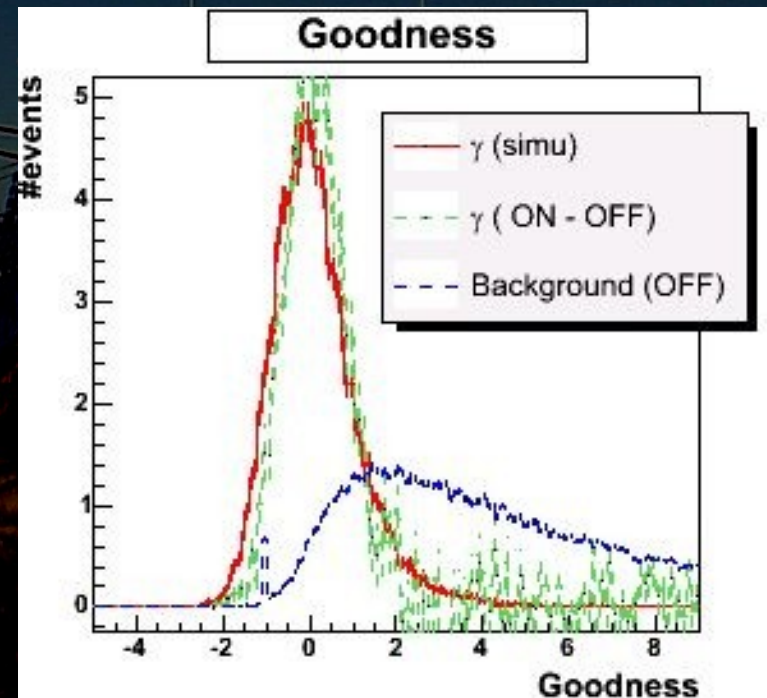
- ❑ NOT a likelihood ratio (no alternate hypothesis)
- ❑ Comparison of actual log-likelihood with expectation value (analytically calculated)

$$\langle \ln L \rangle = \int_x \ln \left(P_{df} (x, \mu, \sigma_p) \right) \times P_{df} (x, \mu, \sigma_p) \times dx$$

- ❑ Goodness-of-fit

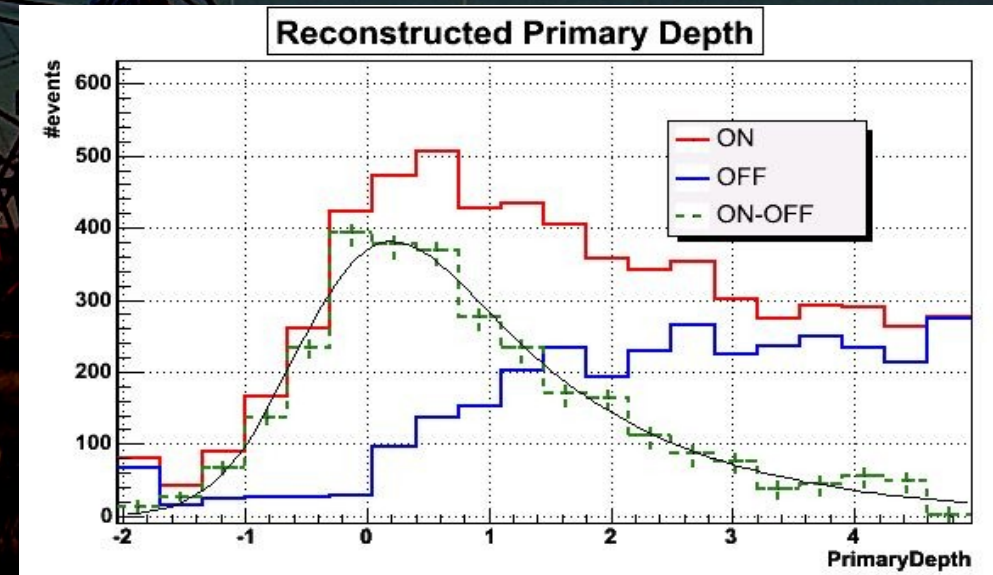
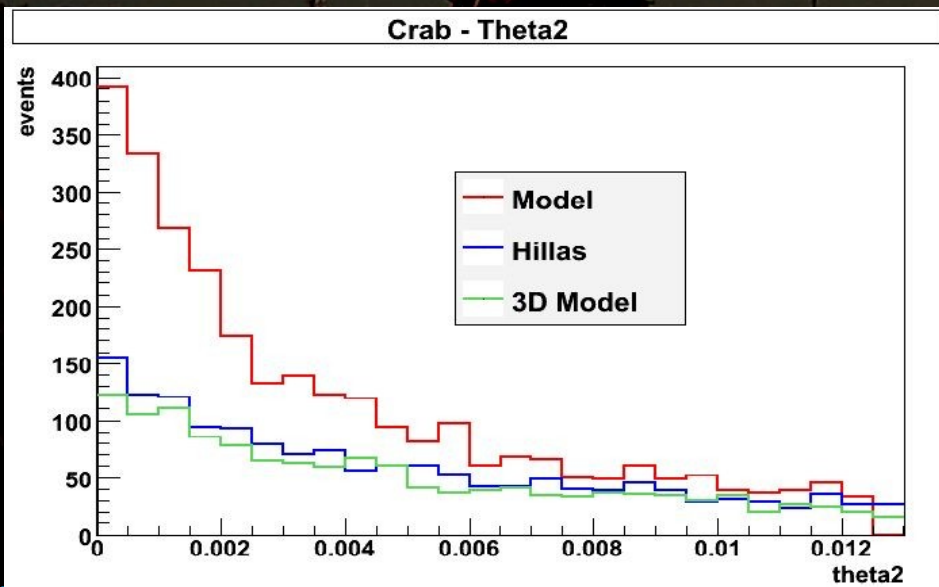
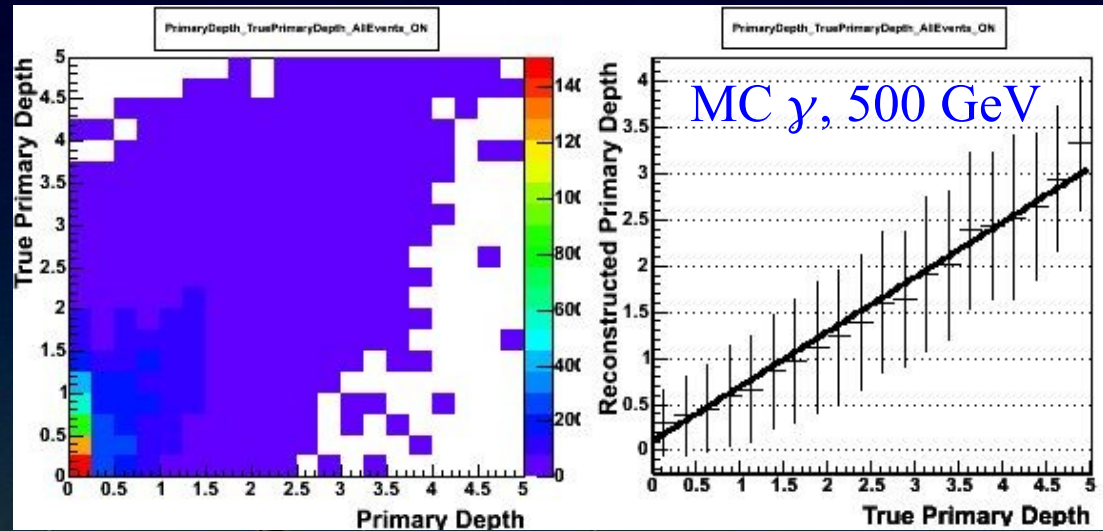
$$g = - \left(\frac{\ln L - \langle \ln L \rangle}{\sqrt{\quad} \times NDof} \right)$$

(~ normal variable)



Performances

- Resolution on first interaction point $\sim 0.5 X_0$
- Good energy resolution
15% @ 80 GeV, 8% @ 2 TeV
- Improved angular resolution
- Improved rejection, in particular at low energy



Conclusion on reconstructions

- 3 different techniques:
 - Hillas / Scaled cuts : robust, quite stable and fast
 - 3D Model : improved performances at high energy
 - Model : improved efficiency (at low energy), improved resolution and separation at the expense of a much larger computing time
- Quite different assumptions:
 - Scaled cuts : selects the « most frequent showers », according to MC, in parameter space. Shower fluctuations taken into account, but not correlation between telescopes.
 - Model analysis : selects the shower looking the most « similar » to a model, even if they are rare. Includes telescope correlations, and partially shower fluctuation (first interaction depth).
- Quite different sensitivity to external (atmosphere state, nsb, ...) parameters. Good for investigation of systematics

A photograph of a radio telescope array at dusk. The sky is a deep, dark blue, and the ground is covered in tall, dry grass. Several large, complex metal structures, which are the radio telescopes, are visible. They are mounted on tall, thin poles and have large, curved metal frames. The central telescope is the most prominent, with its structure clearly visible against the dark sky. The text "Background subtraction" is overlaid in the center of the image in a light orange color.

Background subtraction

Foreword

□ Trigger rate:

□ HESS : 300 Hz in $\sim 5^\circ$ FOV \Rightarrow raw rate $\sim 10 \text{ s}^{-1} \text{ deg}^{-2}$

□ Chandra : ACIS $7.5' \times 7.5'$ FOV \Rightarrow raw rate $\sim 10 \text{ s}^{-1} \text{ deg}^{-2}$

□ Photon rate:

□ HESS : $\sim 10^{-2} \gamma/\text{s}$ (10% Crab)

□ X-Ray : $\sim 1 \text{ count/s}$ for similar sources

□ \Rightarrow IACTS are **background dominated**

□ Background rejection is essential & challenging (factor $> 10^2$ needed)

□ Remaining irreducible background,
 \Rightarrow statistical determination of signal $N_{\text{exc}} = N_{\text{On}} - \alpha \times N_{\text{Off}}$

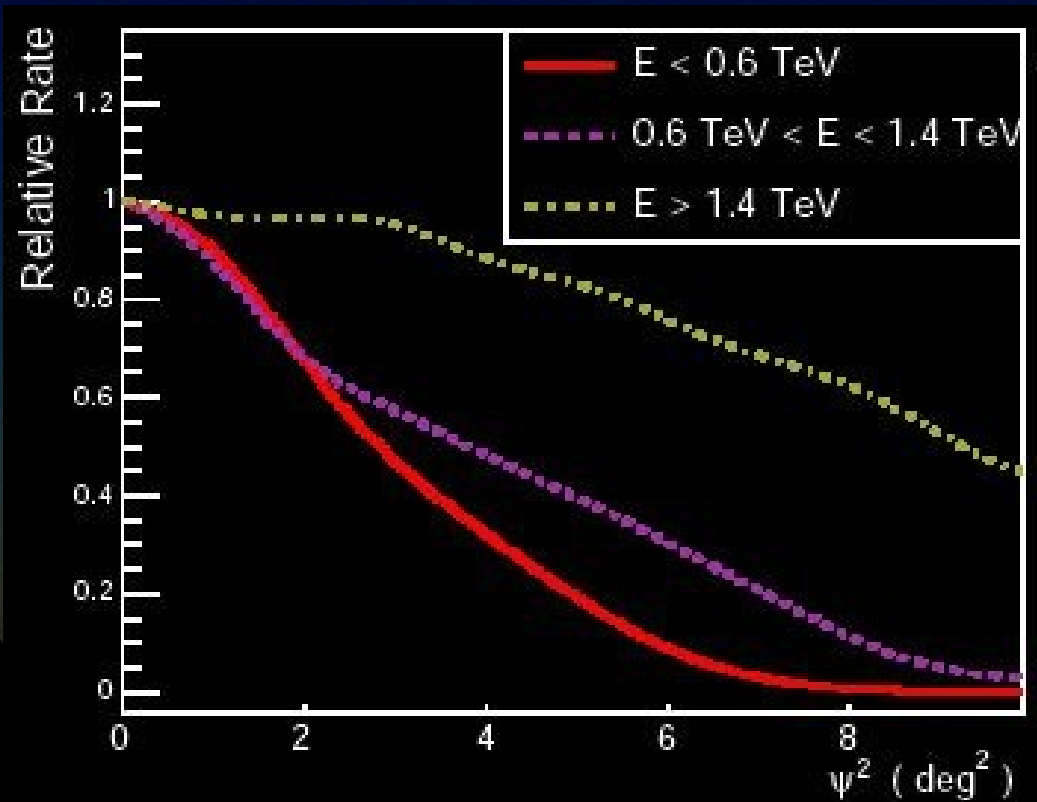
□ Background subtraction essential part of business. Must be controlled at $\sim 1\%$ (faintest HESS sources) \Rightarrow **acceptance determination (background model)**

Background model?

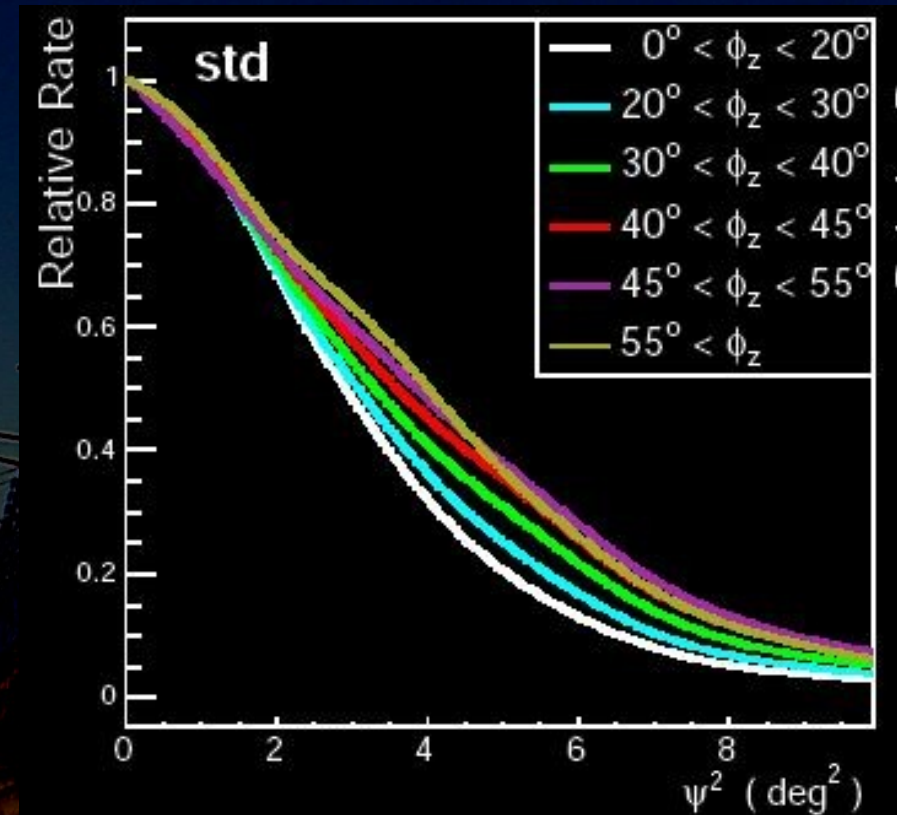
- Acceptance (= expected background) depends on:
 - zenith angle (atmospheric depth)
 - primary energy
 - distance to FOV centre (off-axis angle)
 - azimuthal angle (for array without azimuthal symmetry)
 - primary nature (and discrimination cuts)
 - ...
 - atmospheric transparency
 - night sky background (NSB) intensity
 - instrument status (gains, reflectivity, missing pixels,...)
 - ...

 Acceptance determination on same data as signal extraction!

Radial (= off-axis) acceptance



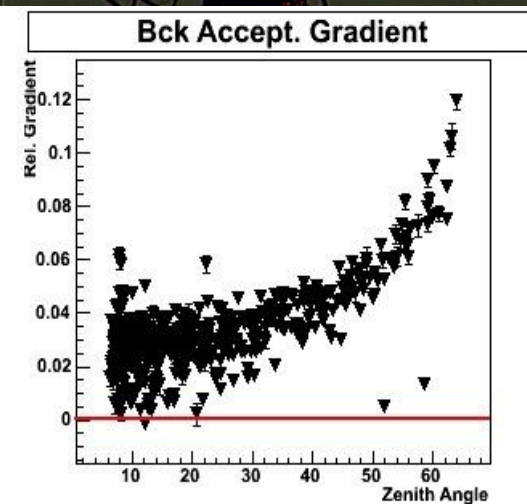
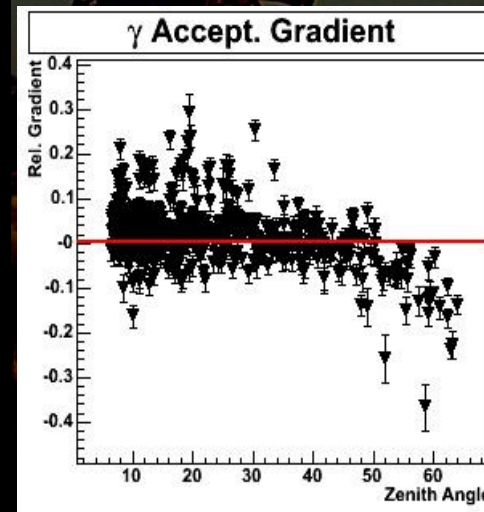
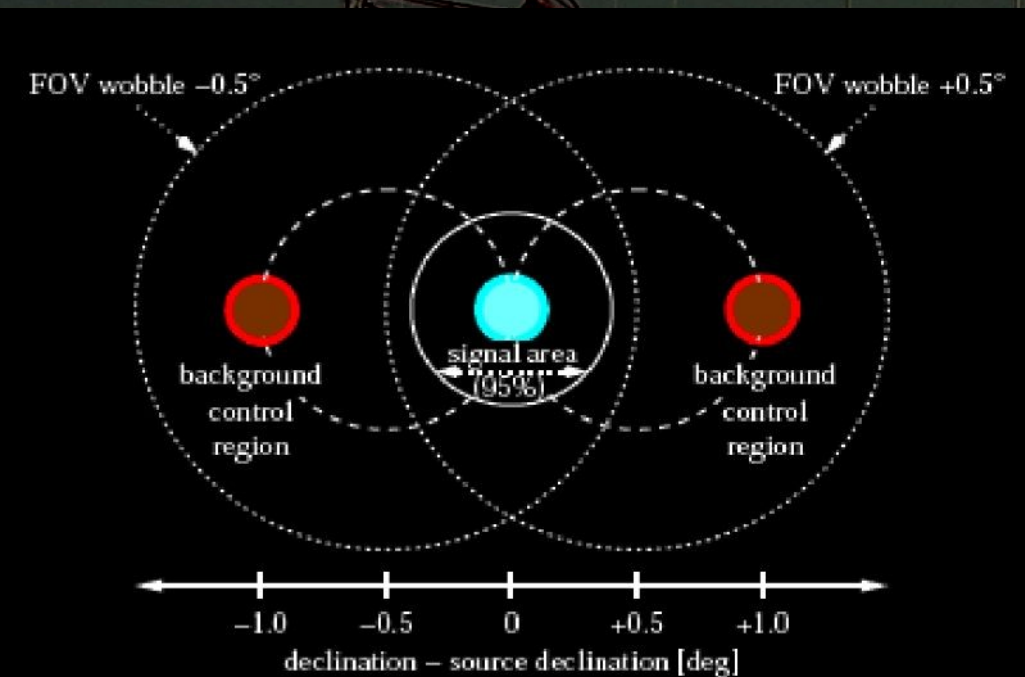
As function of energy



As function of zenith angle

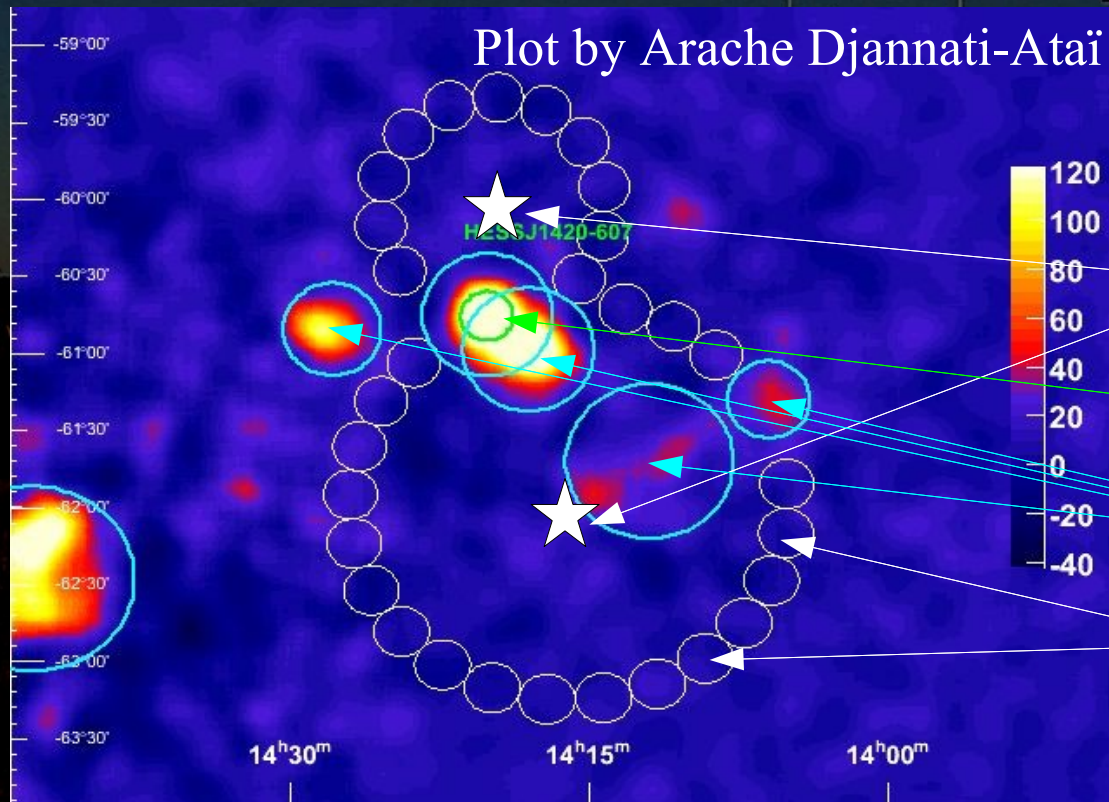
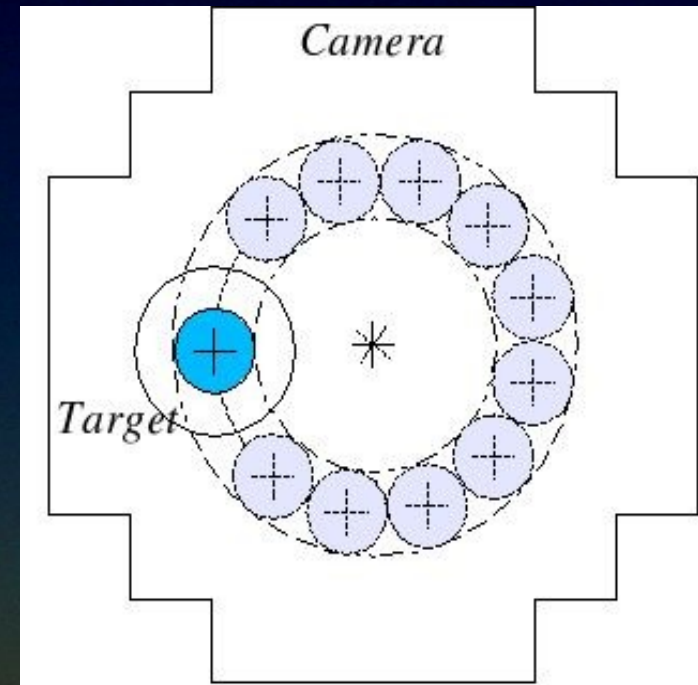
Wobble observation mode

- ❑ Pioneered by Whipple / HEGRA
 - ❑ Alternating observation position, shifted in FOV ($\pm 0.5^\circ$)
 - ❑ Background from mirror region in FOV
 - ❑ Rely on azimuthal symmetry of acceptance. \sim True in single telescope, not in stereo. Zenith angle gradient.
 - ❑ Can derive a signal, a spectra, but not map (no mirror for centre)



Multiple Off Background

- Extension of wobble mode:
 - Several OFF regions distributed at equal distance to camera centre
 - a priori* exclusion of known source (iterative process)
 - No map...



pointing

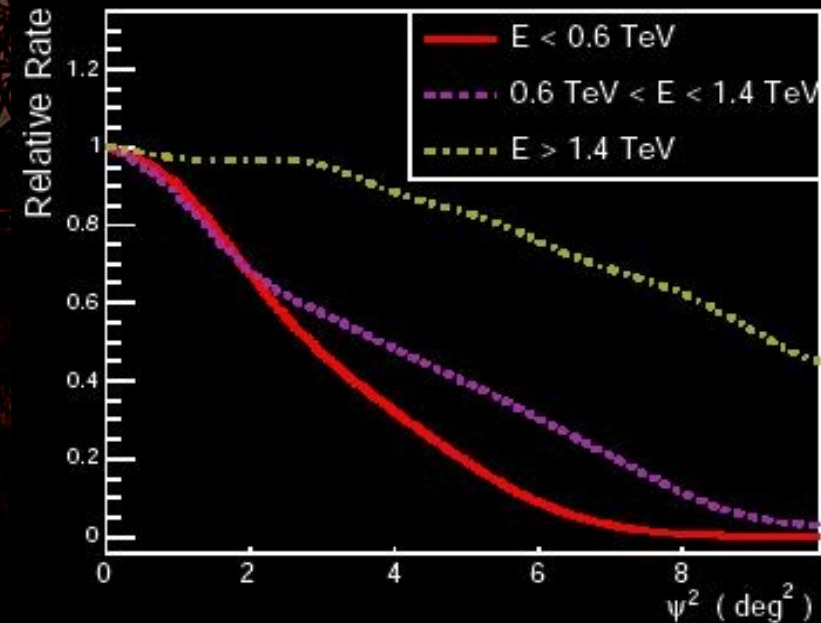
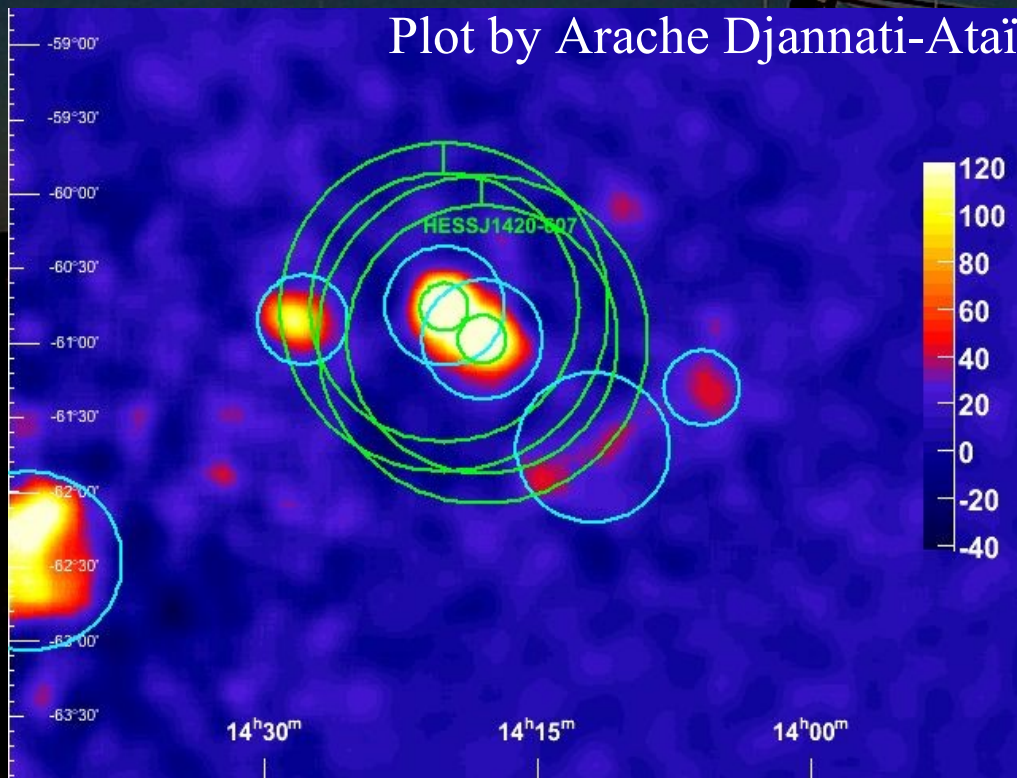
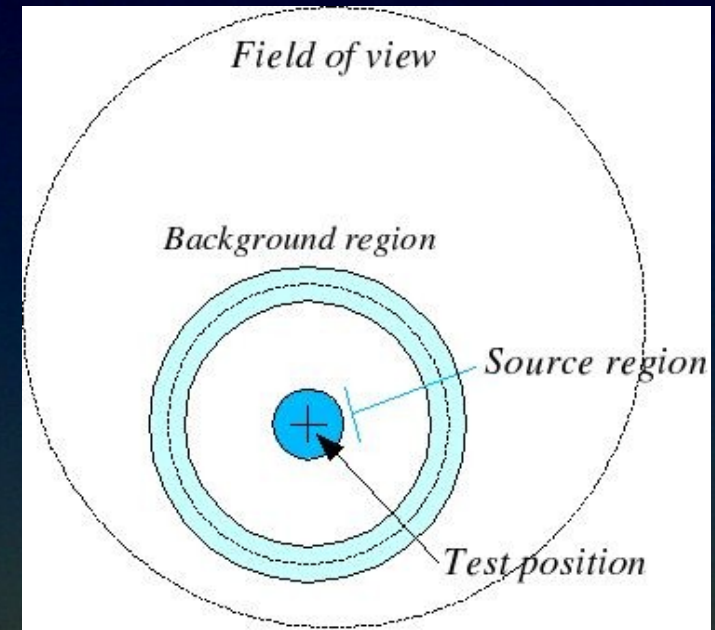
Target Region

Excluded Regions

OFF Regions

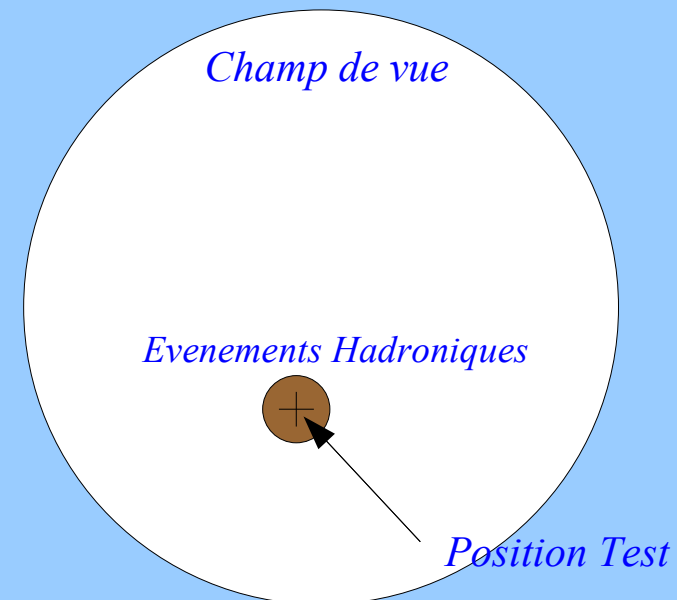
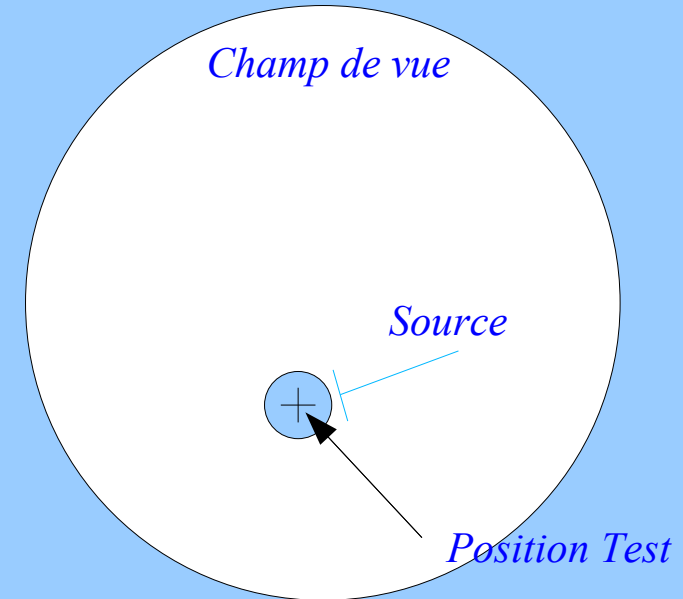
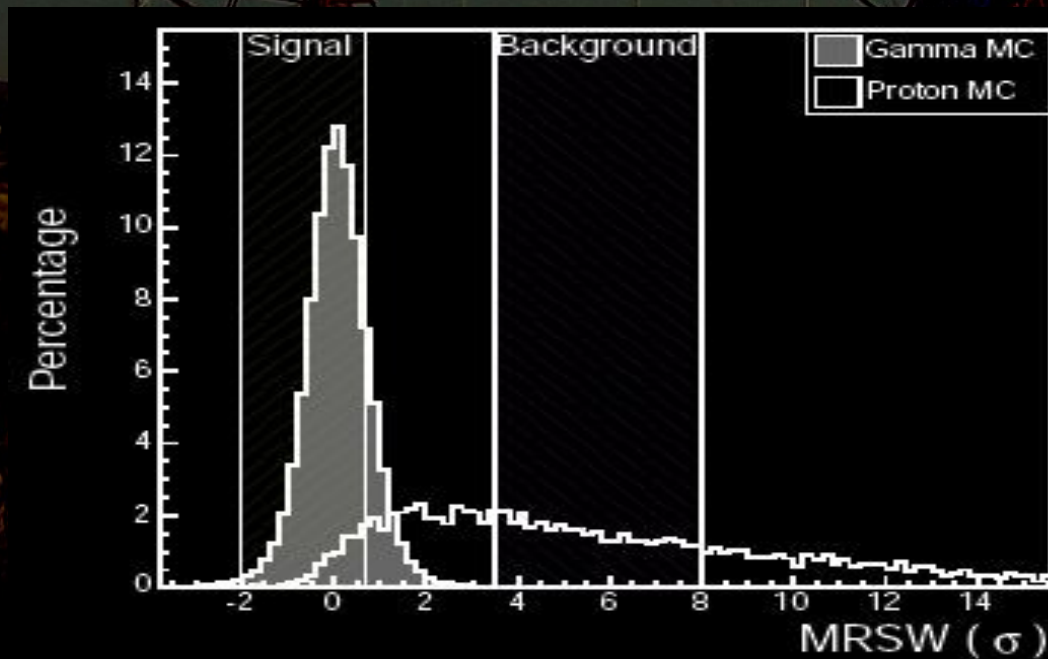
Ring Background

- ❑ Background from a ring centred on each test position. Not at equal distance to centre
- ❑ Radial acceptance correction (averaged)
- ❑ Energy dependency of radial acceptance not taken into account (yet) \Rightarrow no spectra, just maps



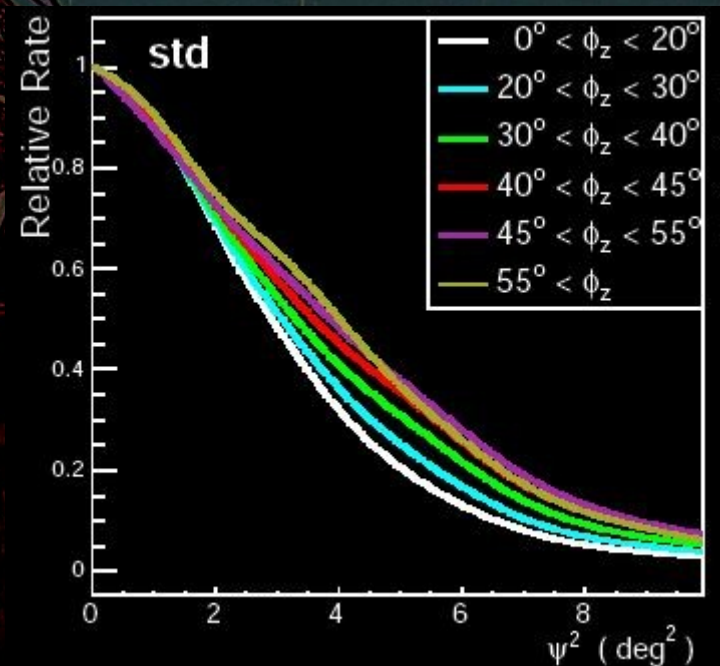
Template Model

- ❑ Use an alternate (“hadron-like”) population at the same position
- ❑ ⇒ Acceptance needed for both populations
- ❑ Only map (energy badly controlled for hadrons)
- ❑ Good for large sources and/or crowded FOV (RXJ 1713,...)



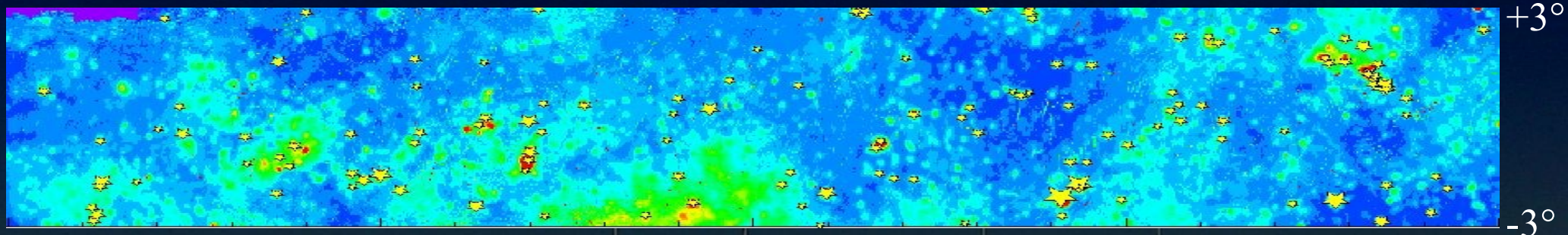
Field-of-view background Toward diffuse emission?

- ❑ To be able to detect large structure, one need to derive the acceptance from alternate data (or MC)
 - ❑ Precalculated acceptance curves (as function of zenith)
 - ❑ Still need normalisation on a fraction of FOV (absolute level)
 - ⇒ signal free region needed in FOV
- ❑ Good for large sources (and for diffuse?)
- ❑ But control of systematics (NSB,...) very tricky, not reliable yet for faint sources
- ❑ Need large amount of data taken with similar conditions (NSB, reflectivity, ...) and without source



Night sky background measurement (NSB)

- HESS estimation from pedestal width (noise dist. in PMTs)



20°

0°

-20°

- Good correlation with optical



20°

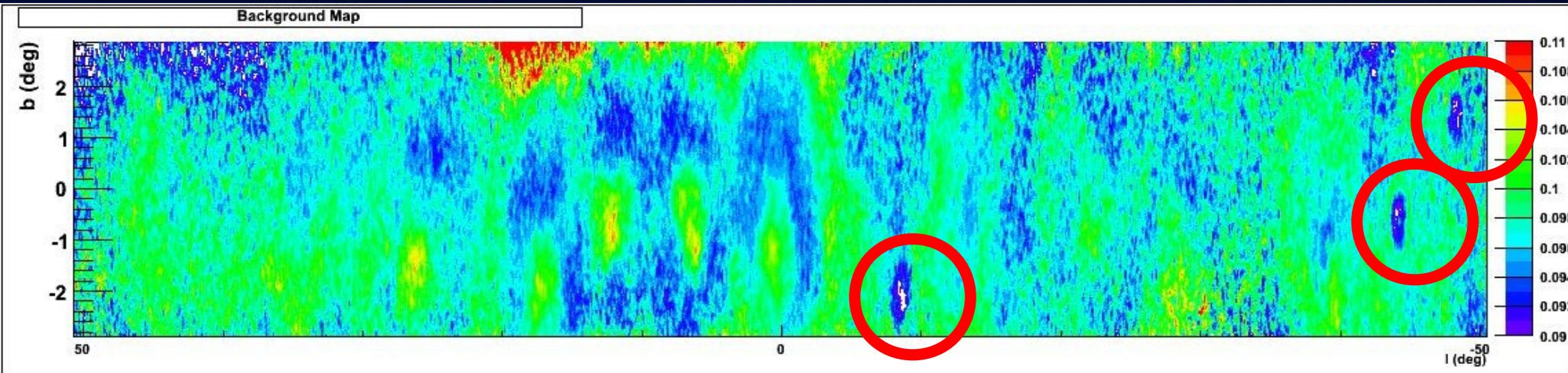
0°

Plot: Aldée Charbonnier

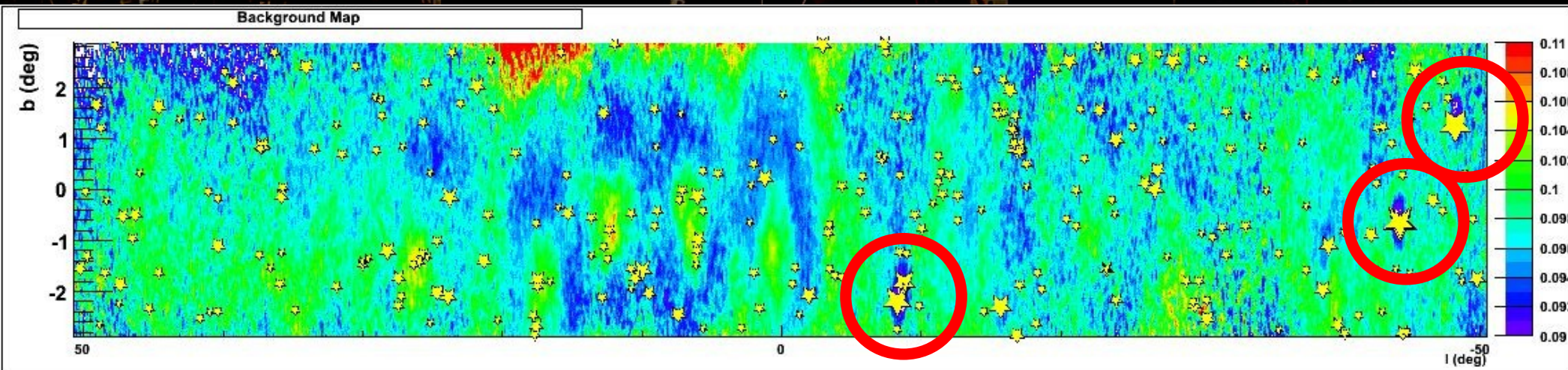
-20°

NSB anisotropies effect

- Acceptance to hadrons in Galactic plane: $\pm 3\%$ (RMS) fluctuations

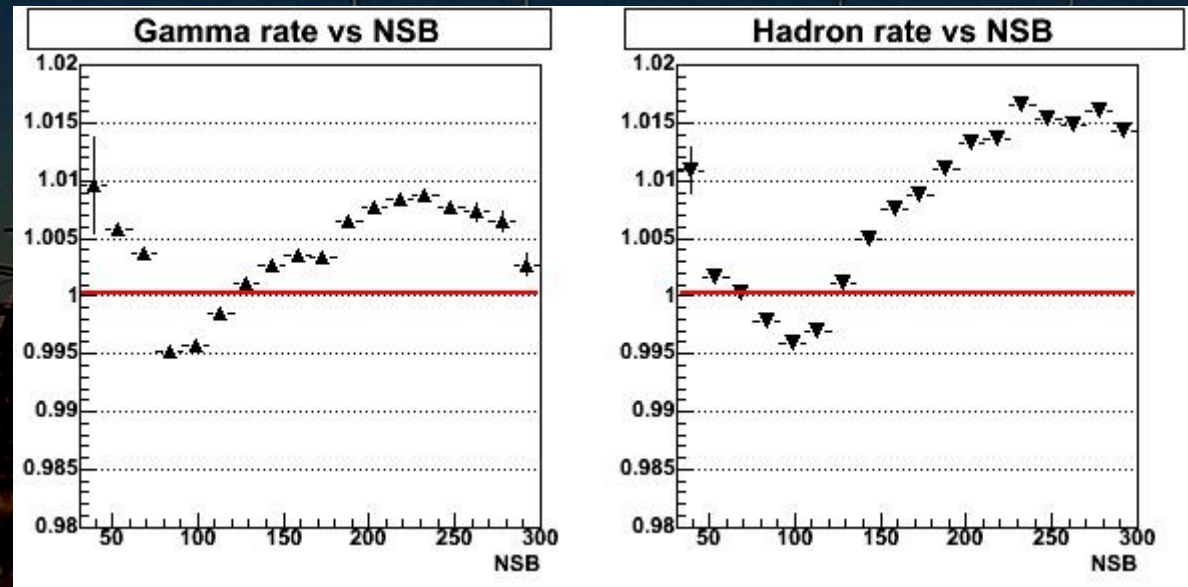


- some “holes”
- ... correlated with bright stars : pixels switched off



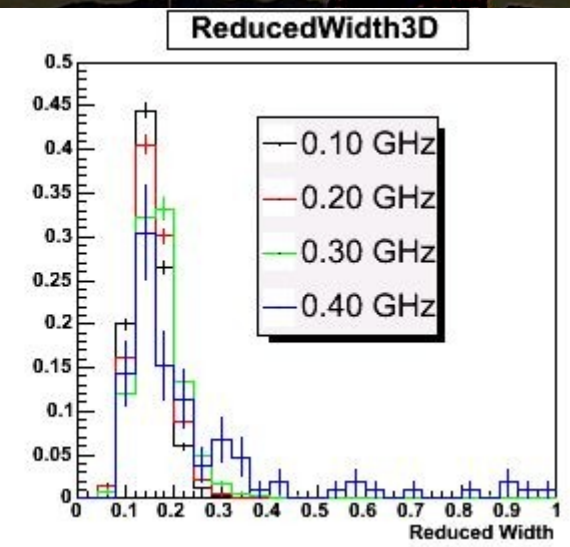
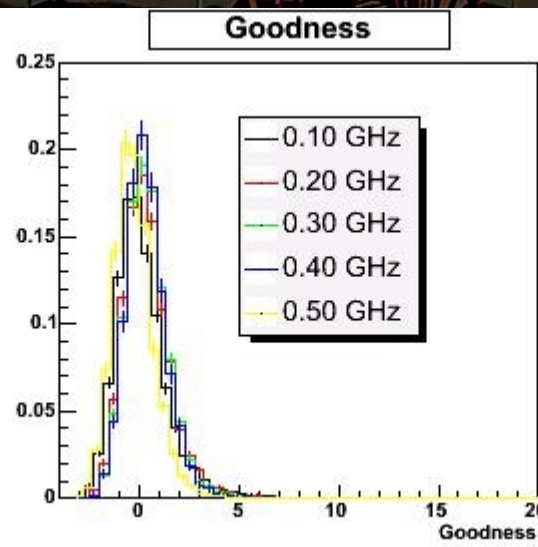
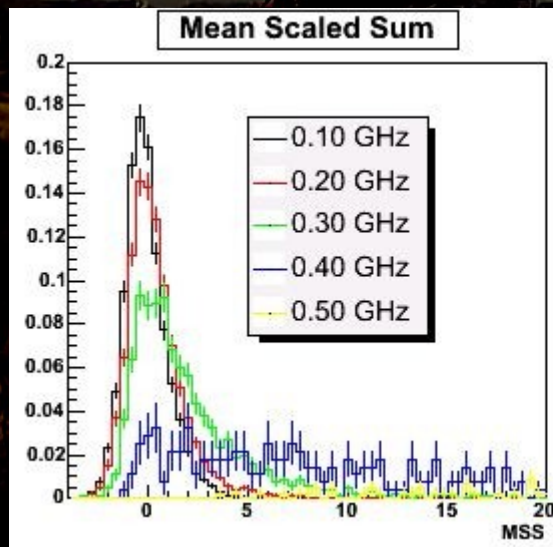
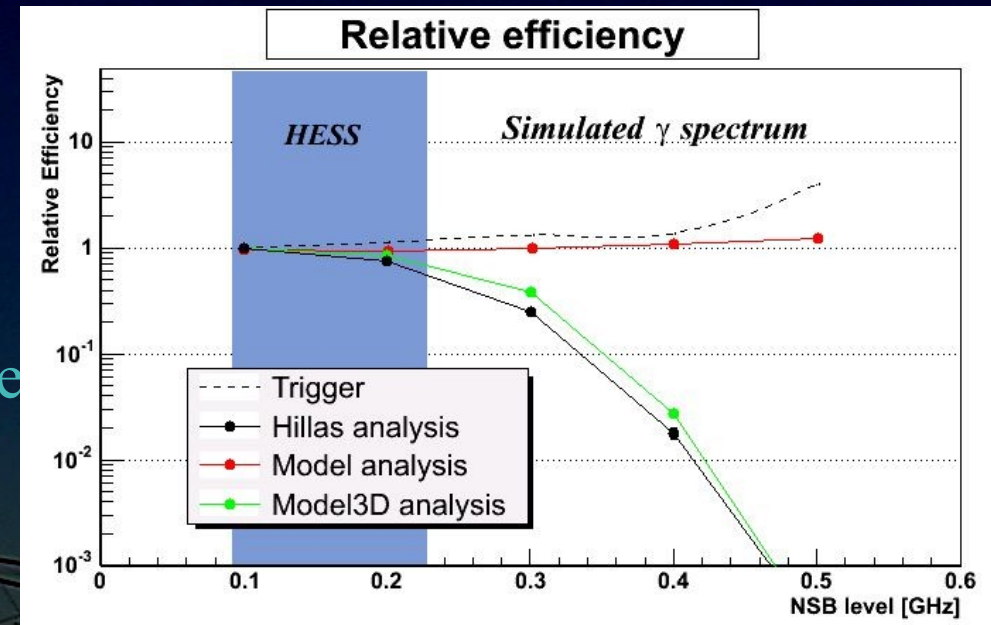
NSB effect on event rate in cuts

- ❑ Correlated fluctuations at the level of 1%
- ❑ Does not account for all discrepancies...



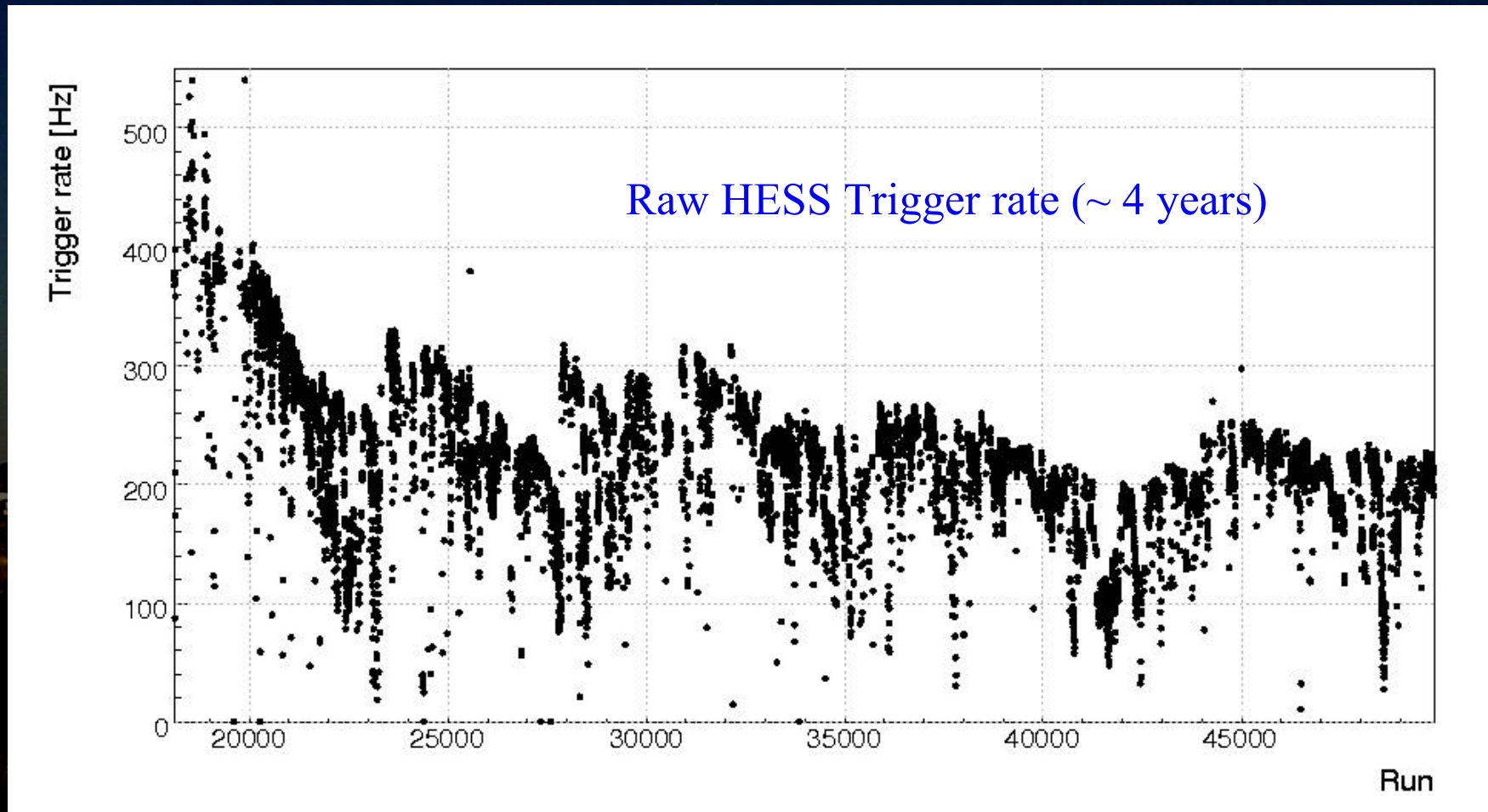
NSB effect on discrimination

- Effect on acceptance to γ
 - Hillas: Scaled parameters degraded
 - Model : goodness stable
 - Model 3D : worse fit convergence
- Quite similar effect on hadrons



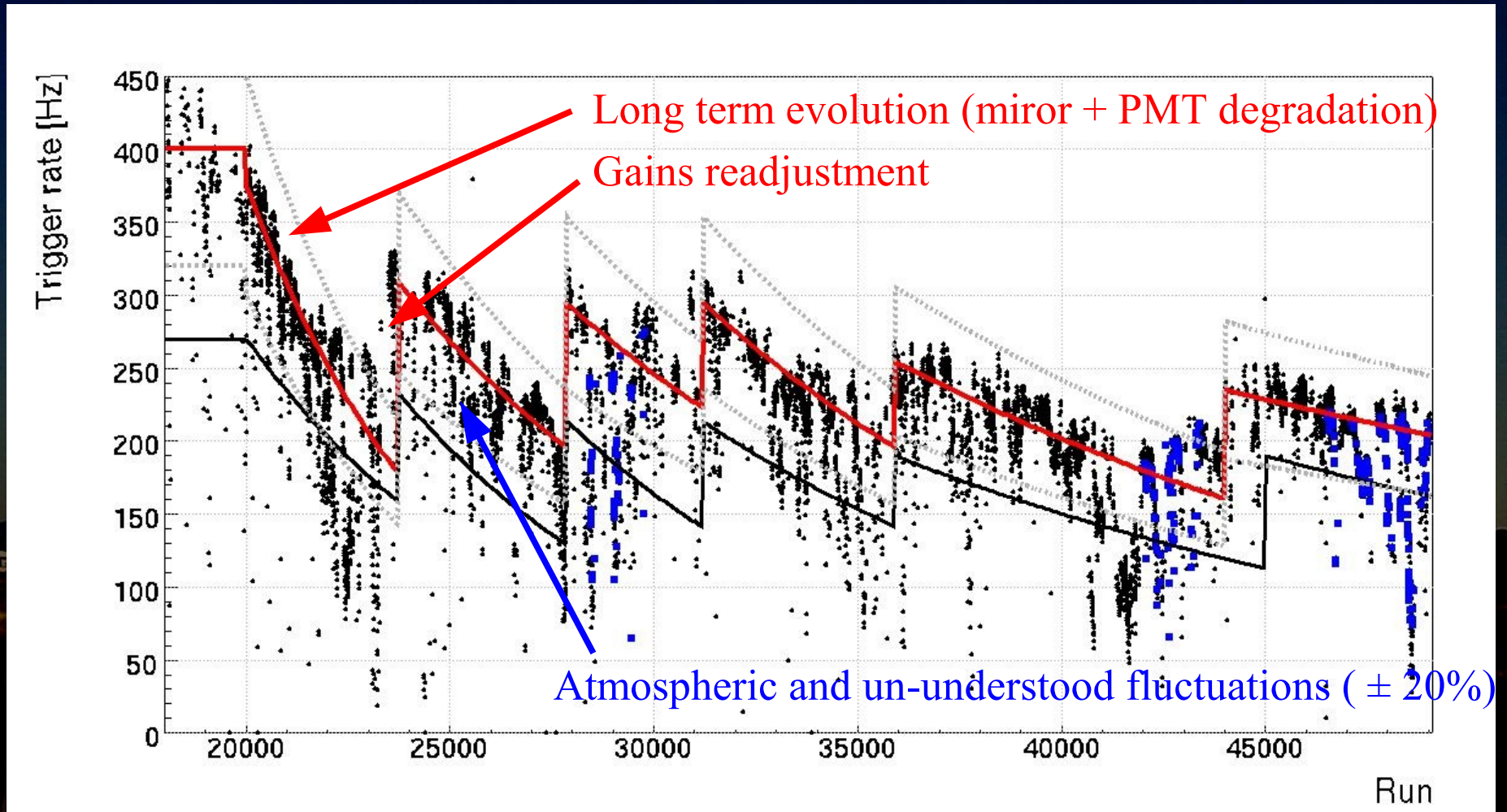
Toward a diffuse emission analysis

- Is diffuse emission analysis possible?
- i.e. Do we understand the instrument enough ?



Trigger rate

- With zenith angle correction



- Only partially correlated with meteorological measurement (backscattered light, radiometers, ...)

Conclusions

- ❑ Various reconstruction techniques (different performances and sensitivity to systematics)
- ❑ Various background determination techniques (making different assumptions – symmetries)
 - ❑ Using part of the FOV as normalisation: a few % precision. Reliable techniques for extended sources up to $\sim 1^\circ$ scale
 - ❑ But absolute background controlled only at $\sim 20\%$ \Rightarrow not suitable yet for diffuse ($> \text{FOV}$) emission
- ❑ Trying to detect extended, faint sources, is very challenging.
 - ❑ Acceptance determination needed at 1% or better (absolute)
 - ❑ Huge work needed to fully understand effect of NSB, stars, atmospheric transparency, ...