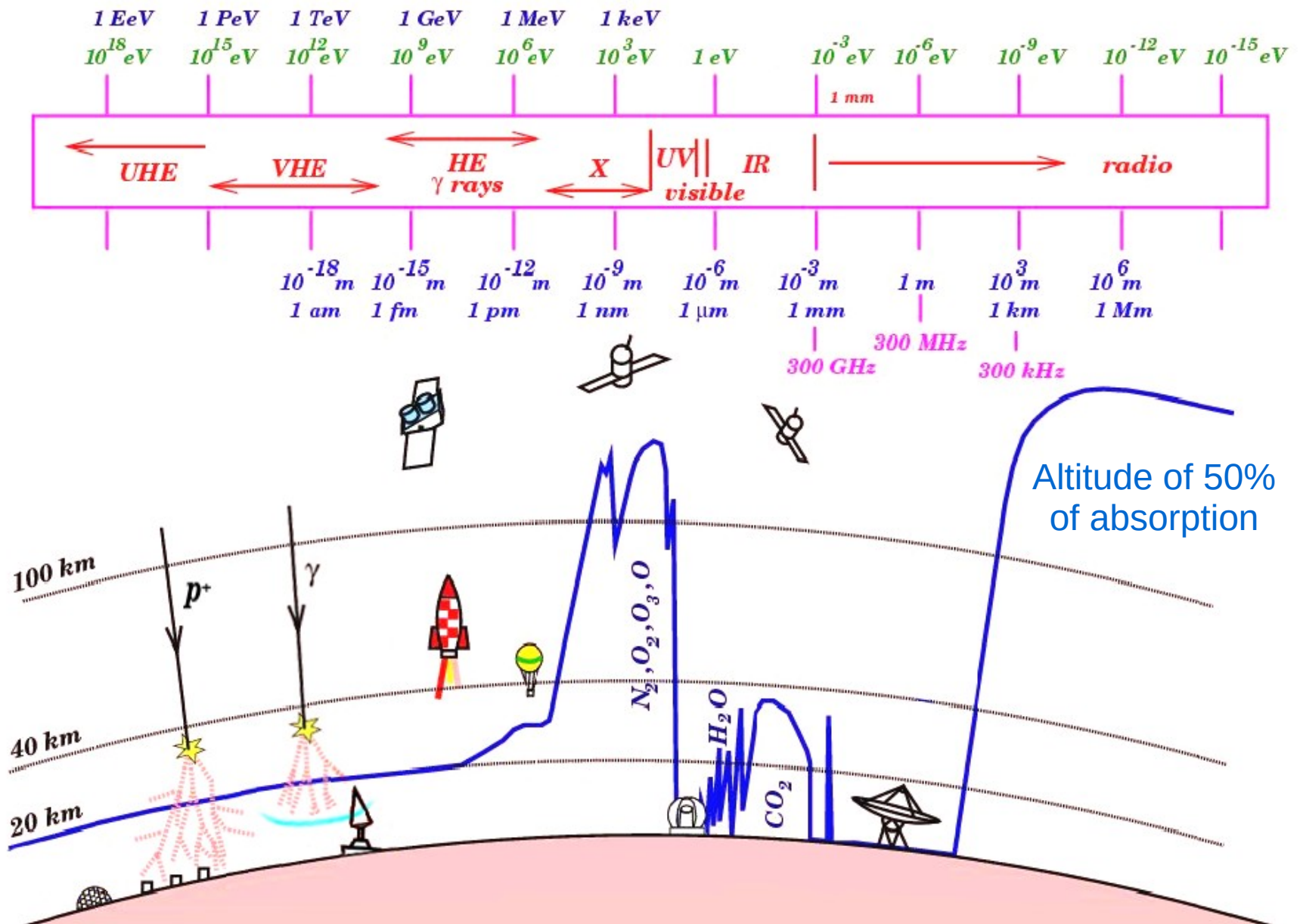
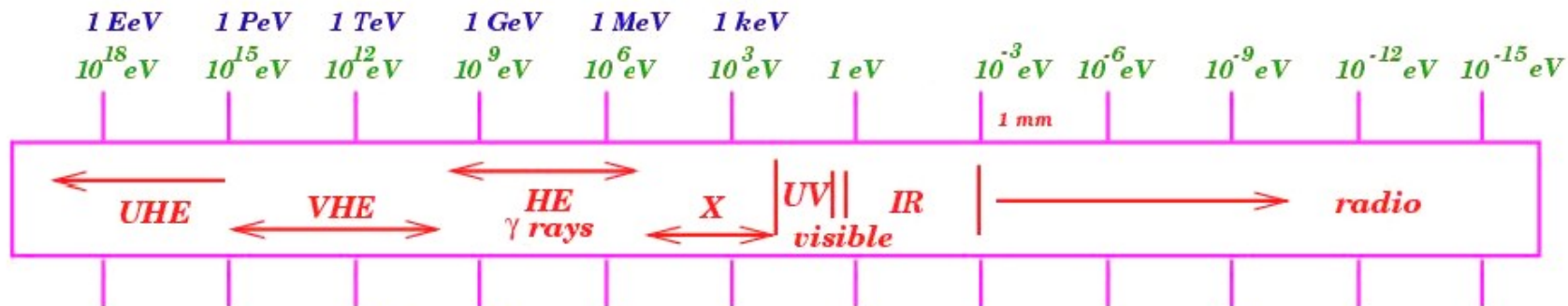


# Imaging Atmospheric Cherenkov Telescopes: Analysis I(I)

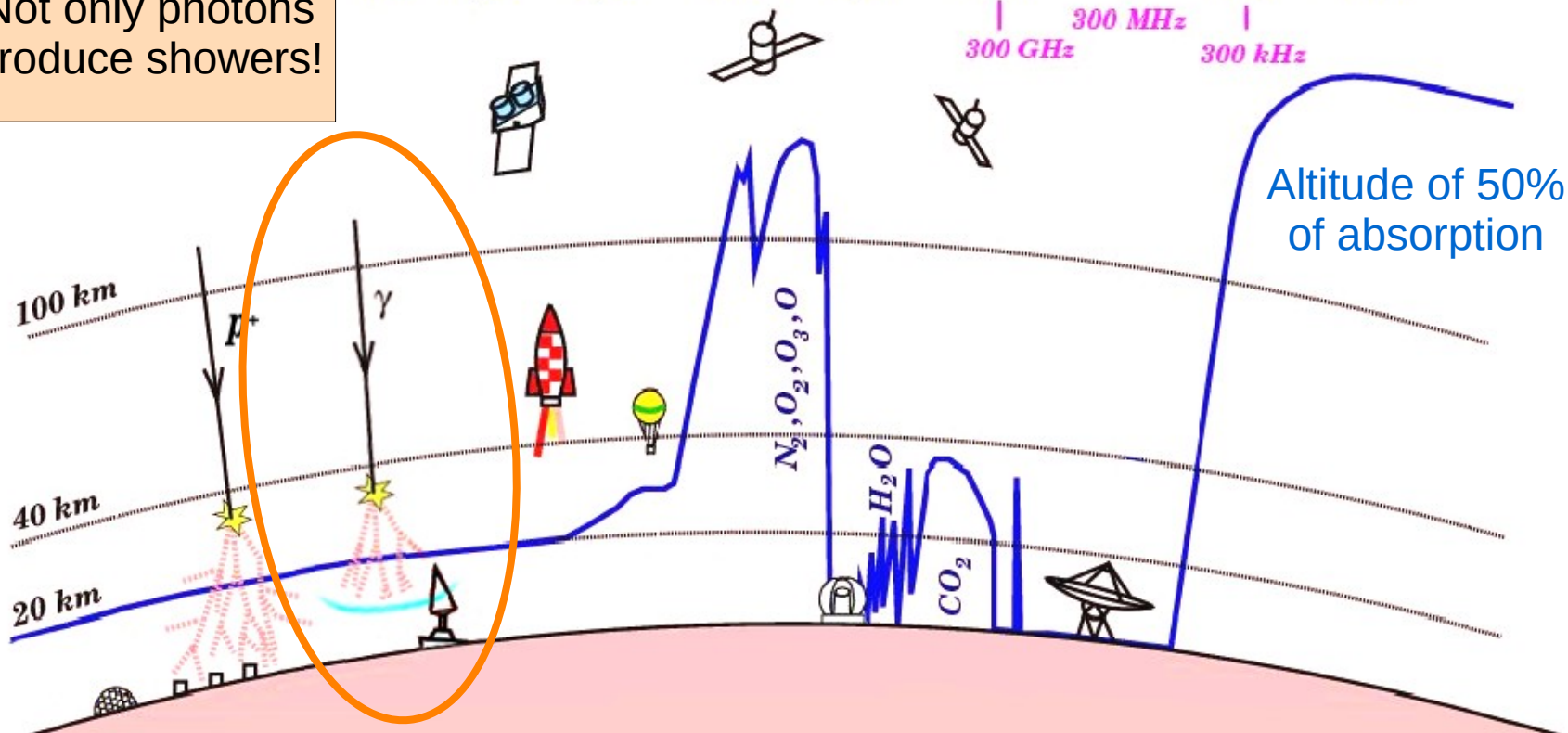
Tarek Hassan  
DESY







Not only photons produce showers!

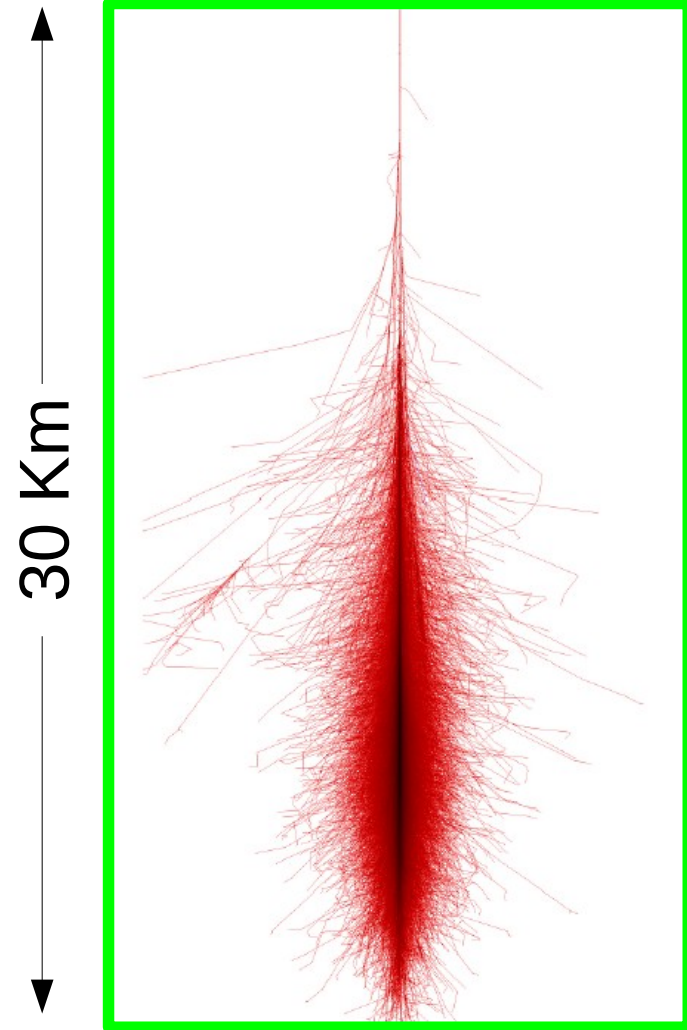




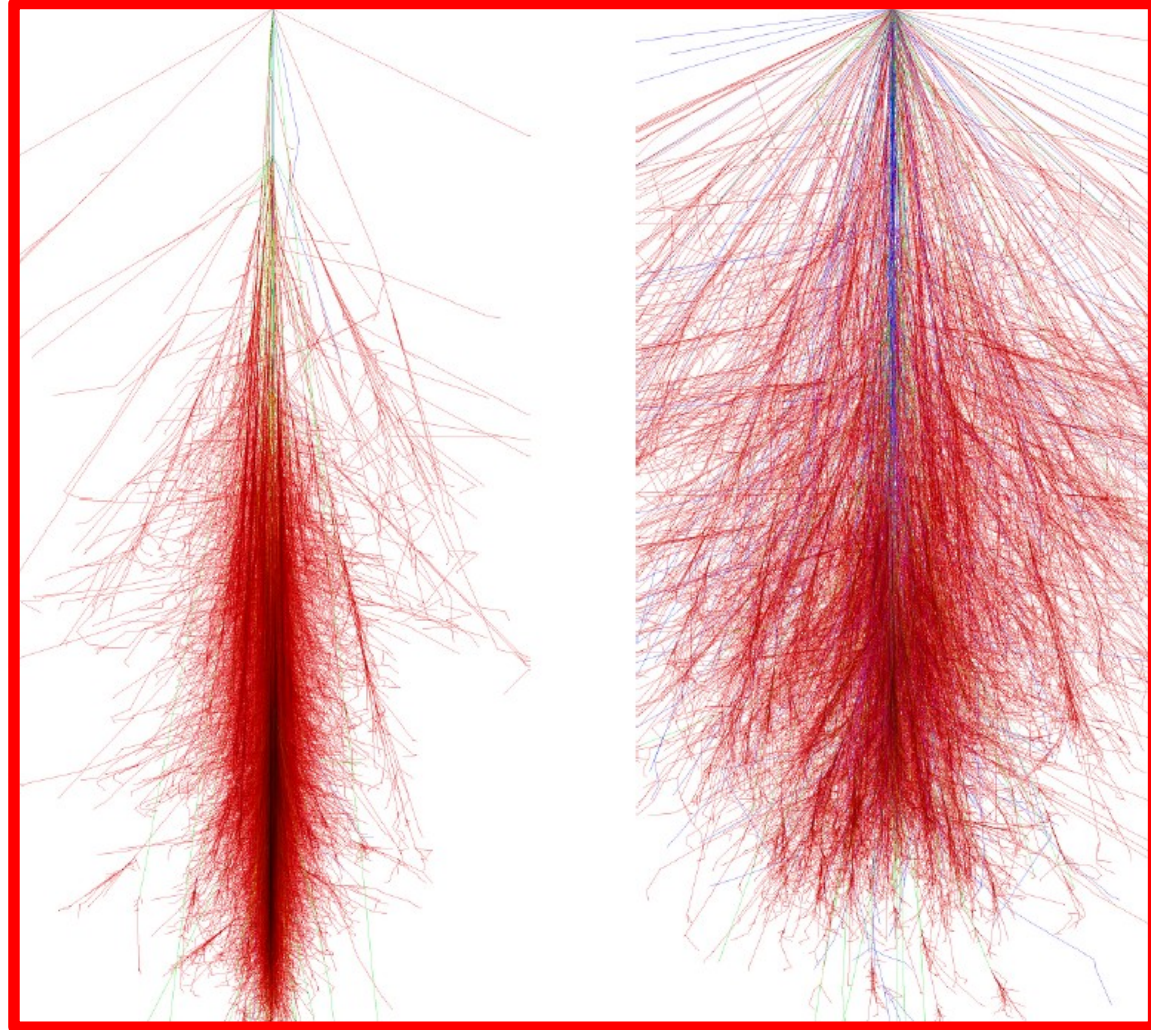
# IACT technique – Signal and background

Signal

Background



1 TeV  $\gamma$ -Ray



1 TeV proton

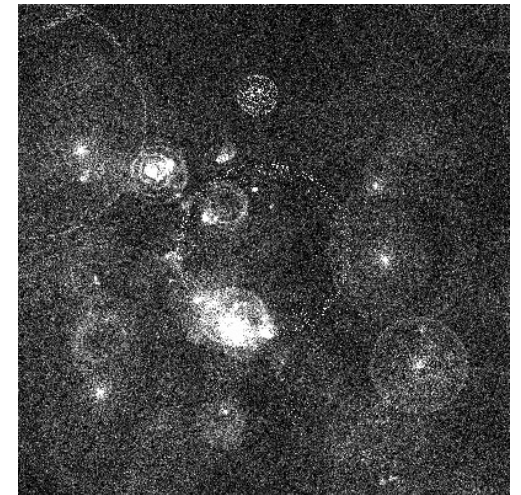
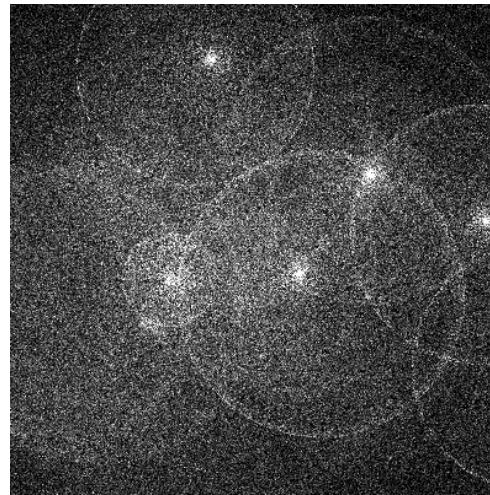
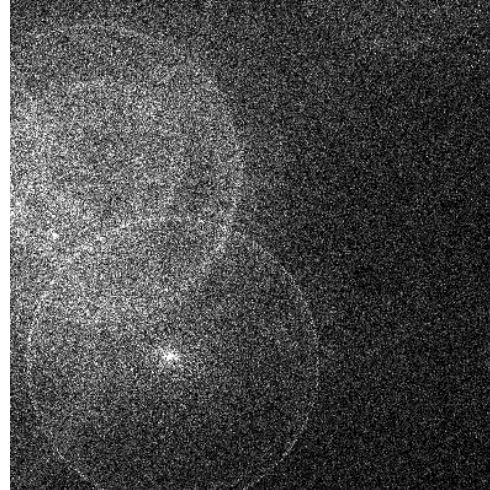
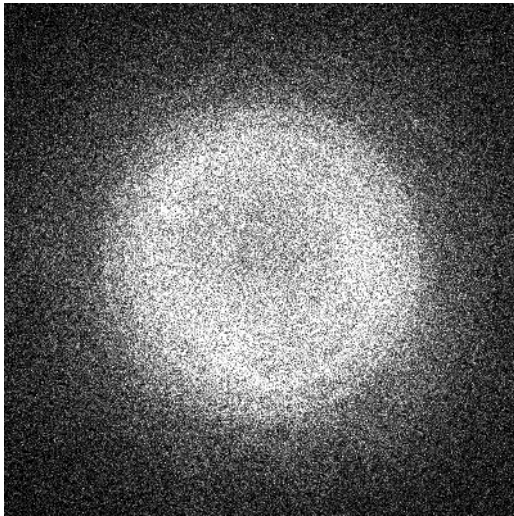
1 TeV iron



# IACT technique – Signal and background

Signal

Background

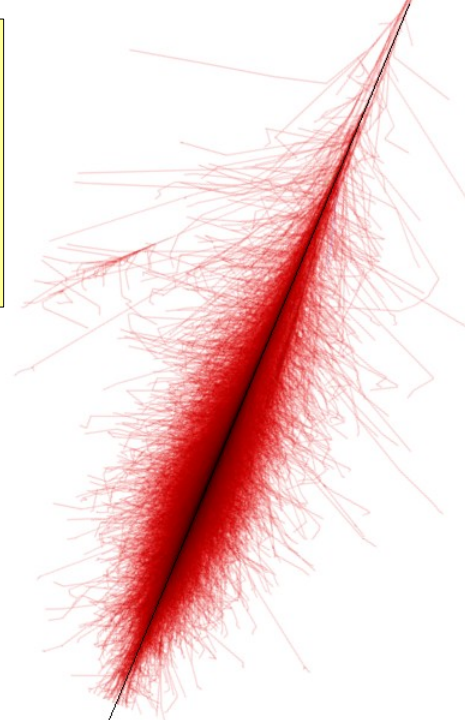


1 TeV  $\gamma$ -Ray

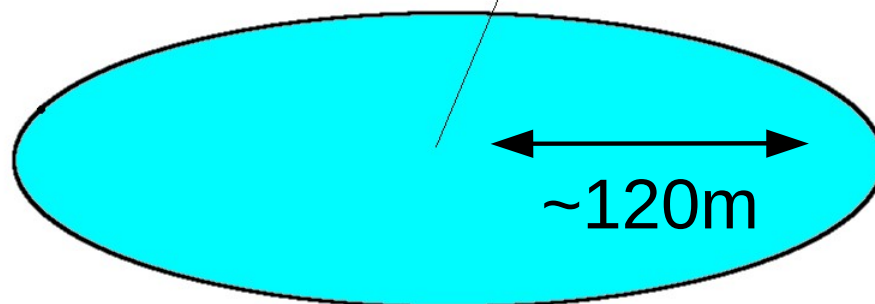
1 TeV proton

1 TeV iron

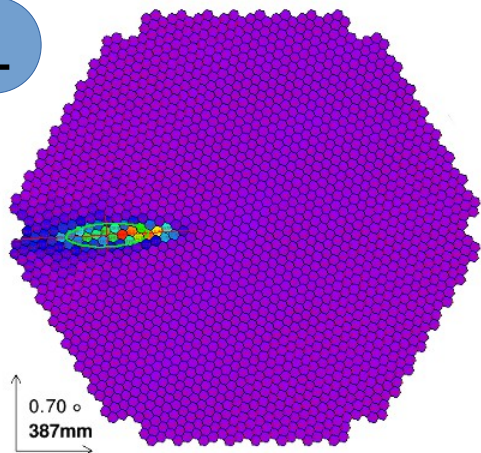
Crab  
 $\gamma$ -ray  
1 TeV



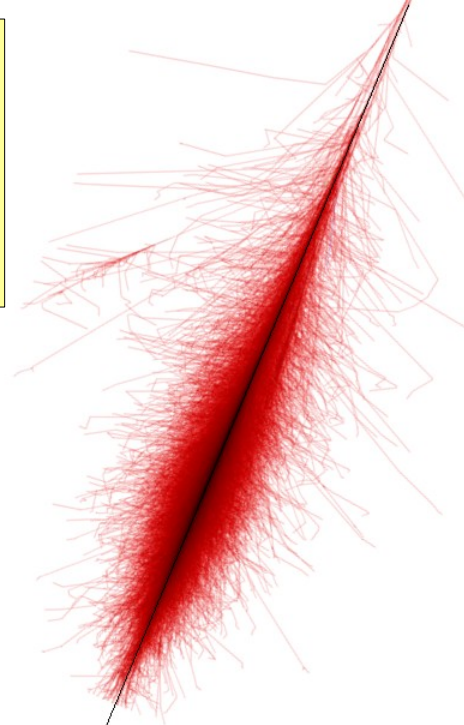
Direction	=	$\hat{z}$ ?
Particle	=	$\hat{z}$ ?
Energy	=	$\hat{z}$ ?



1

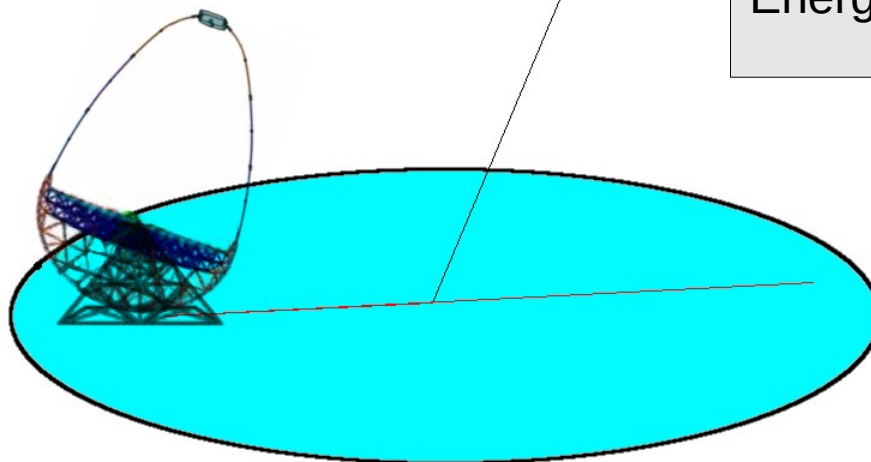


Crab  
 $\gamma$ -ray  
1 TeV



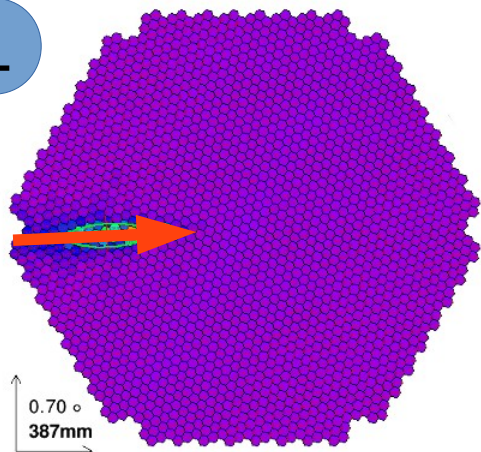
Direction	=	$\zeta?$
Particle	=	$\zeta?$
Energy	=	$\zeta?$

1

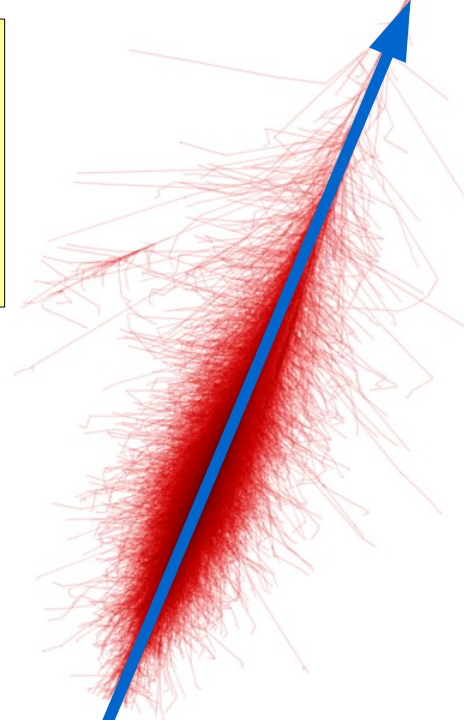




1

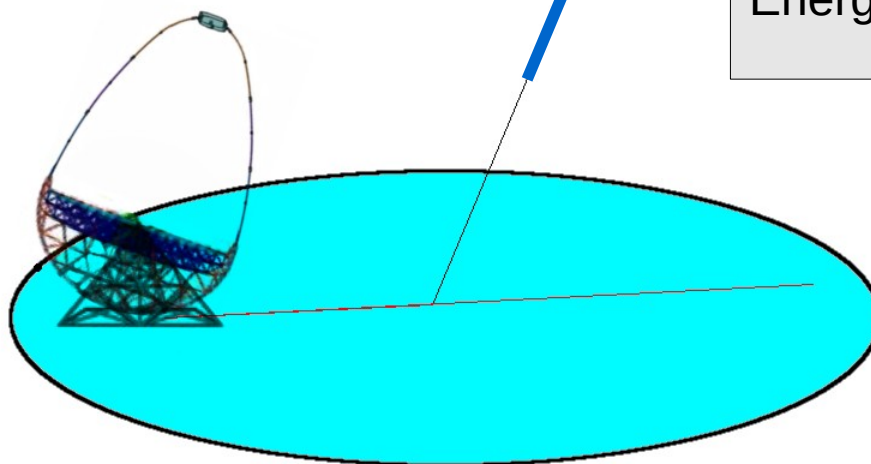


Crab  
 $\gamma$ -ray  
 1 TeV



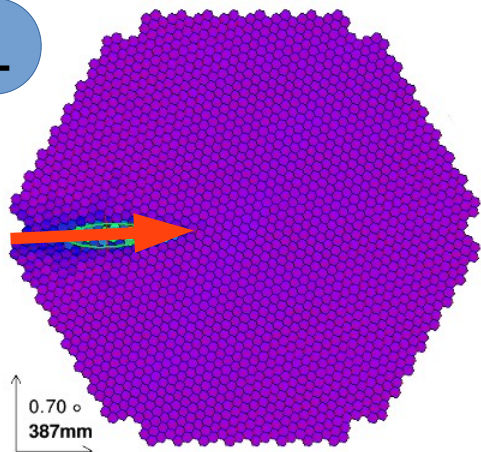
Direction	=	$\zeta?$
Particle	=	$\zeta?$
Energy	=	$\zeta?$

1

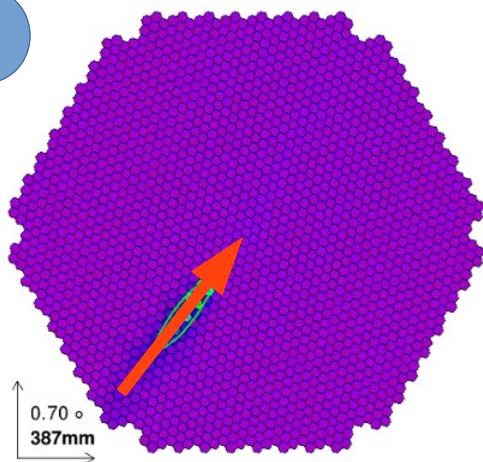




1



2



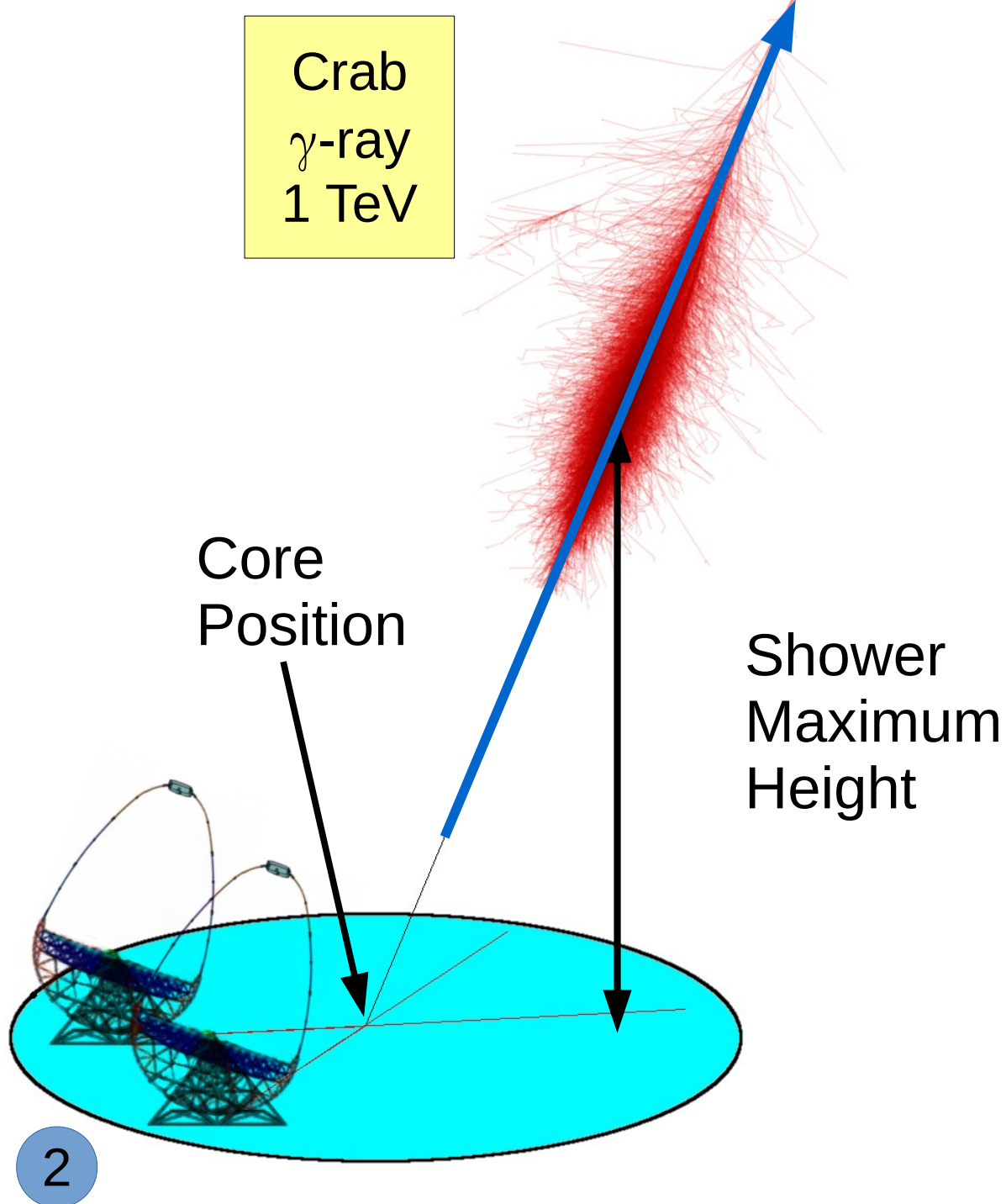
Crab  
 $\gamma$ -ray  
1 TeV

Core  
Position

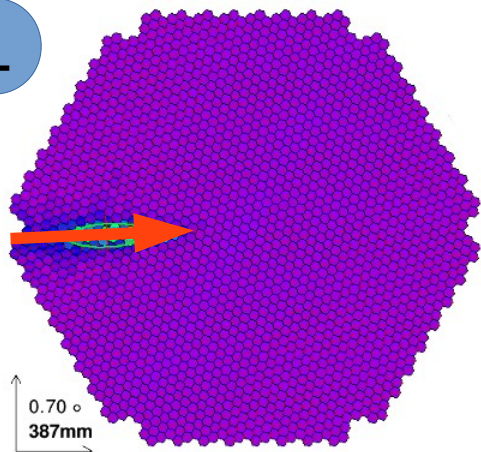
Shower  
Maximum  
Height

1

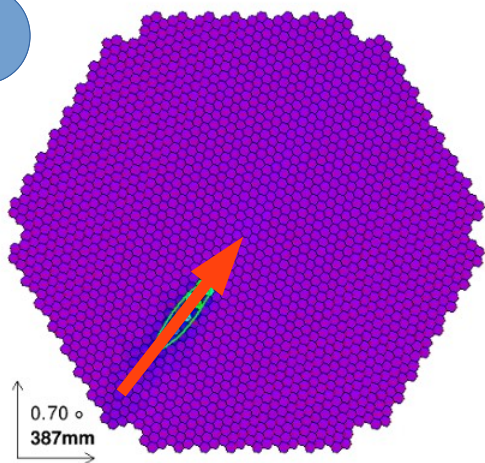
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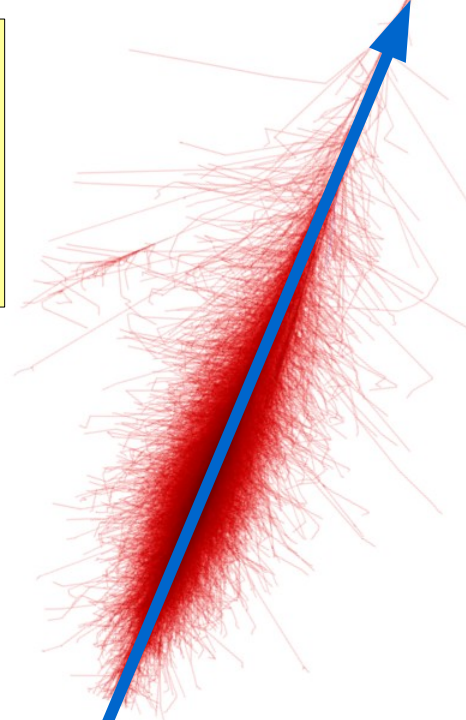
1



2

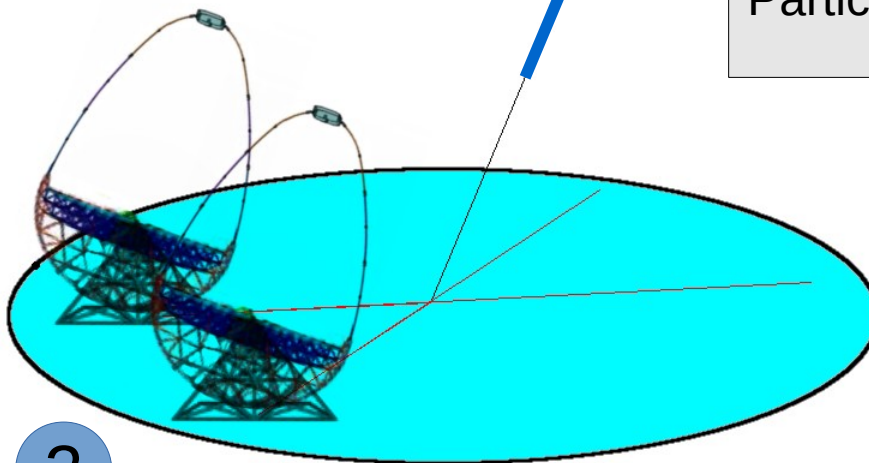


Crab  
 $\gamma$ -ray  
1 TeV



Direction	= Crab
Energy	= 1 TeV
Particle	= $\gamma$ -ray

1



2

# IACT technique – The MAGIC telescopes



2 IACTs – 17 m diameter

Dominated by **hadronic background**

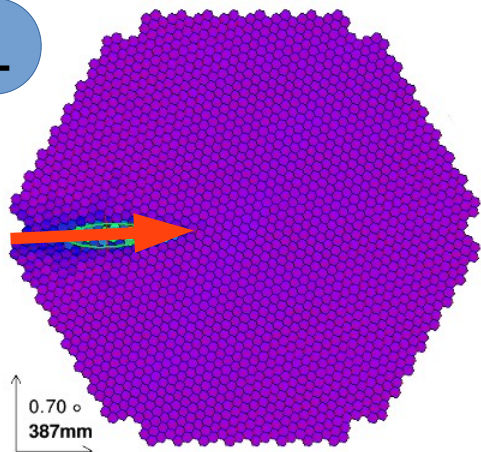
$\text{FoV} = \sim 3.5^\circ$

$\text{Eff Area} \sim 10^5 \text{ m}^2$

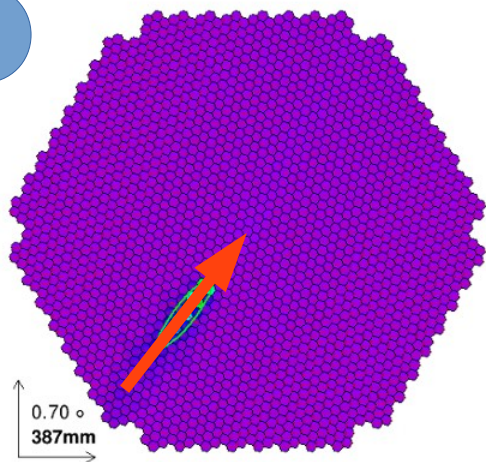




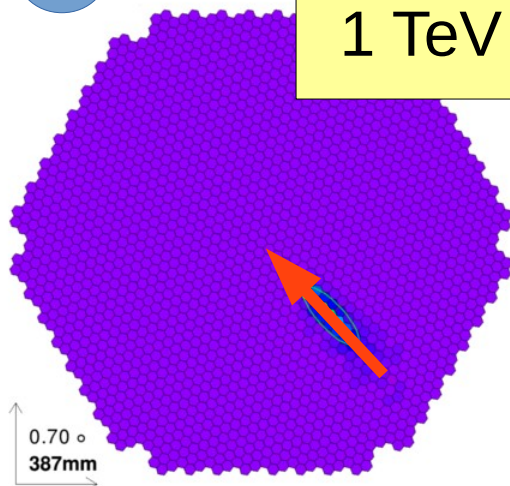
1



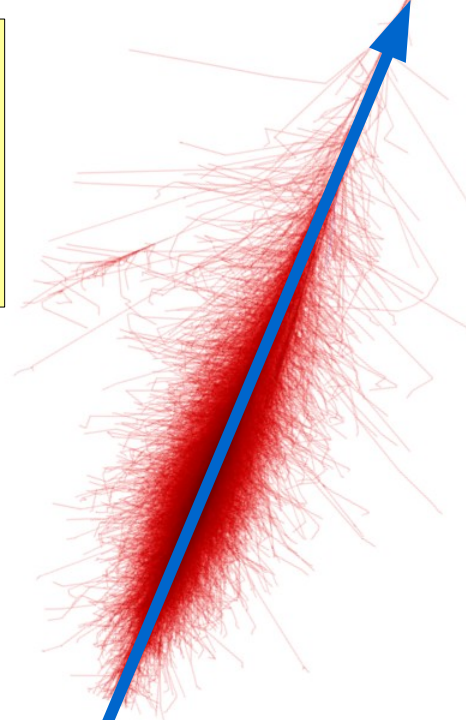
2



3

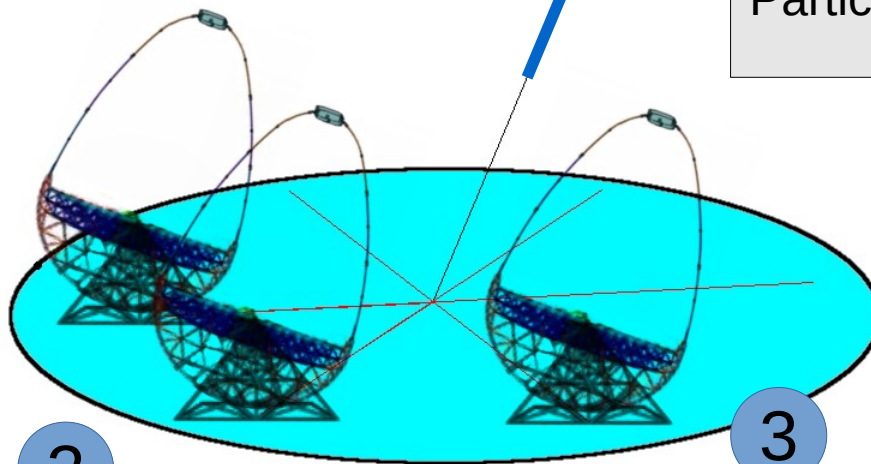


Crab  
 $\gamma$ -ray  
1 TeV



Direction	= Crab!
Energy	= 1 TeV!
Particle	= $\gamma$ -ray!

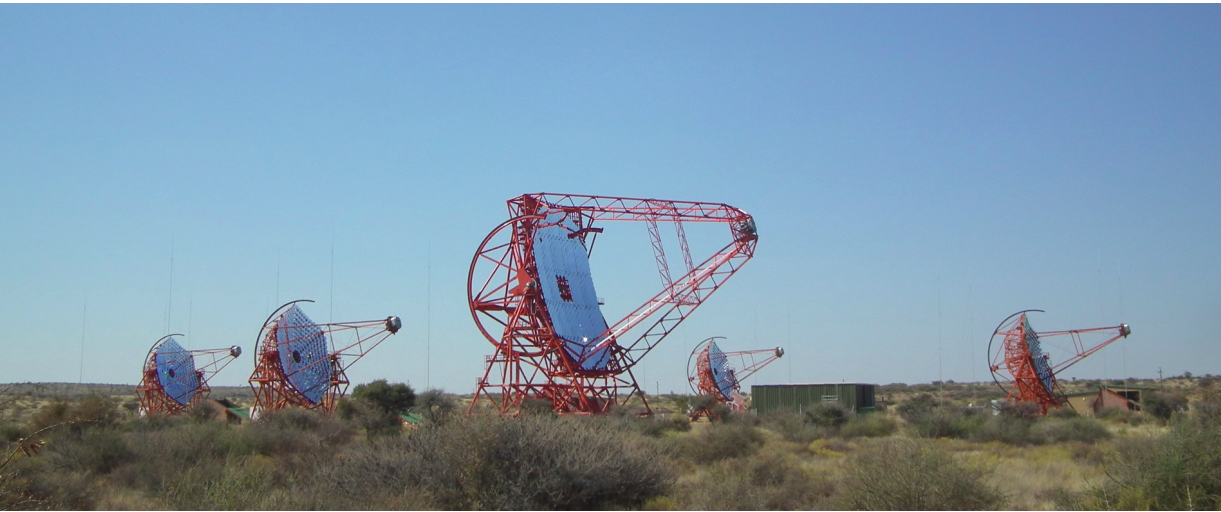
1



2

3

# IACT technique – HESS and VERITAS



H.E.S.S.

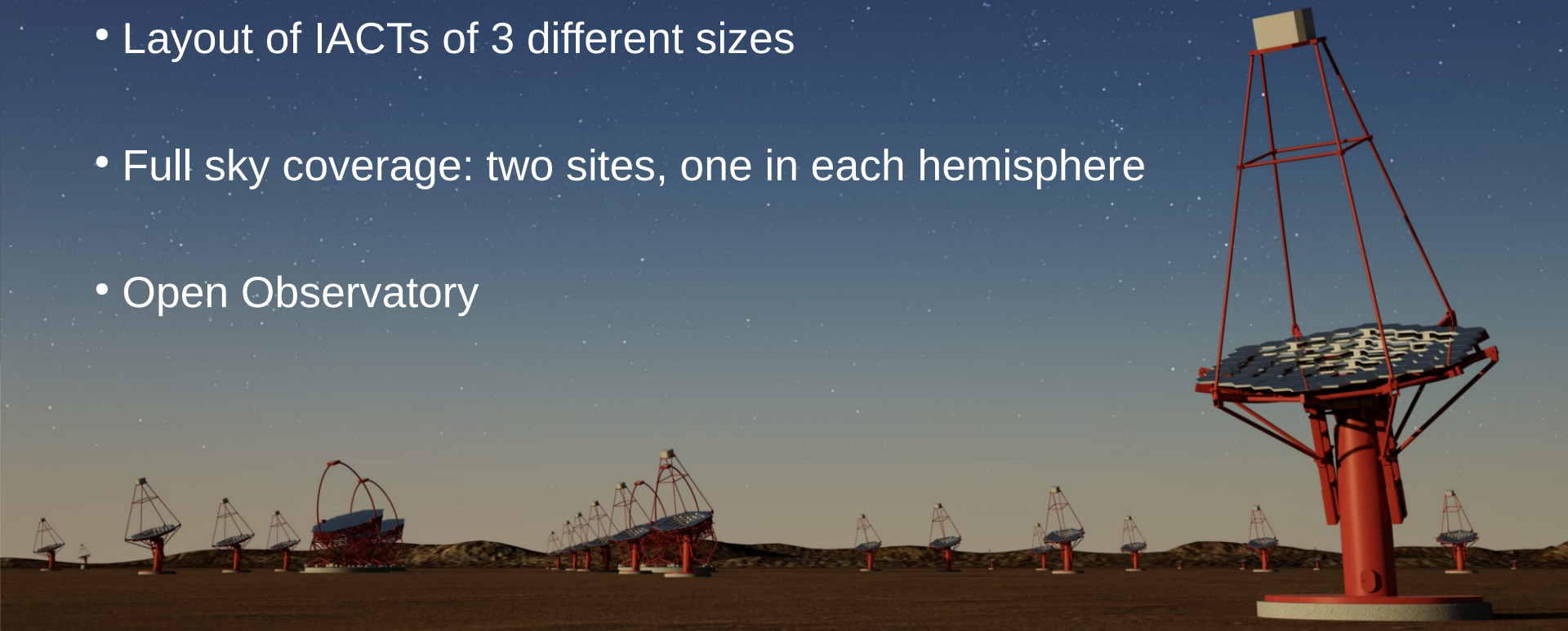
VERITAS



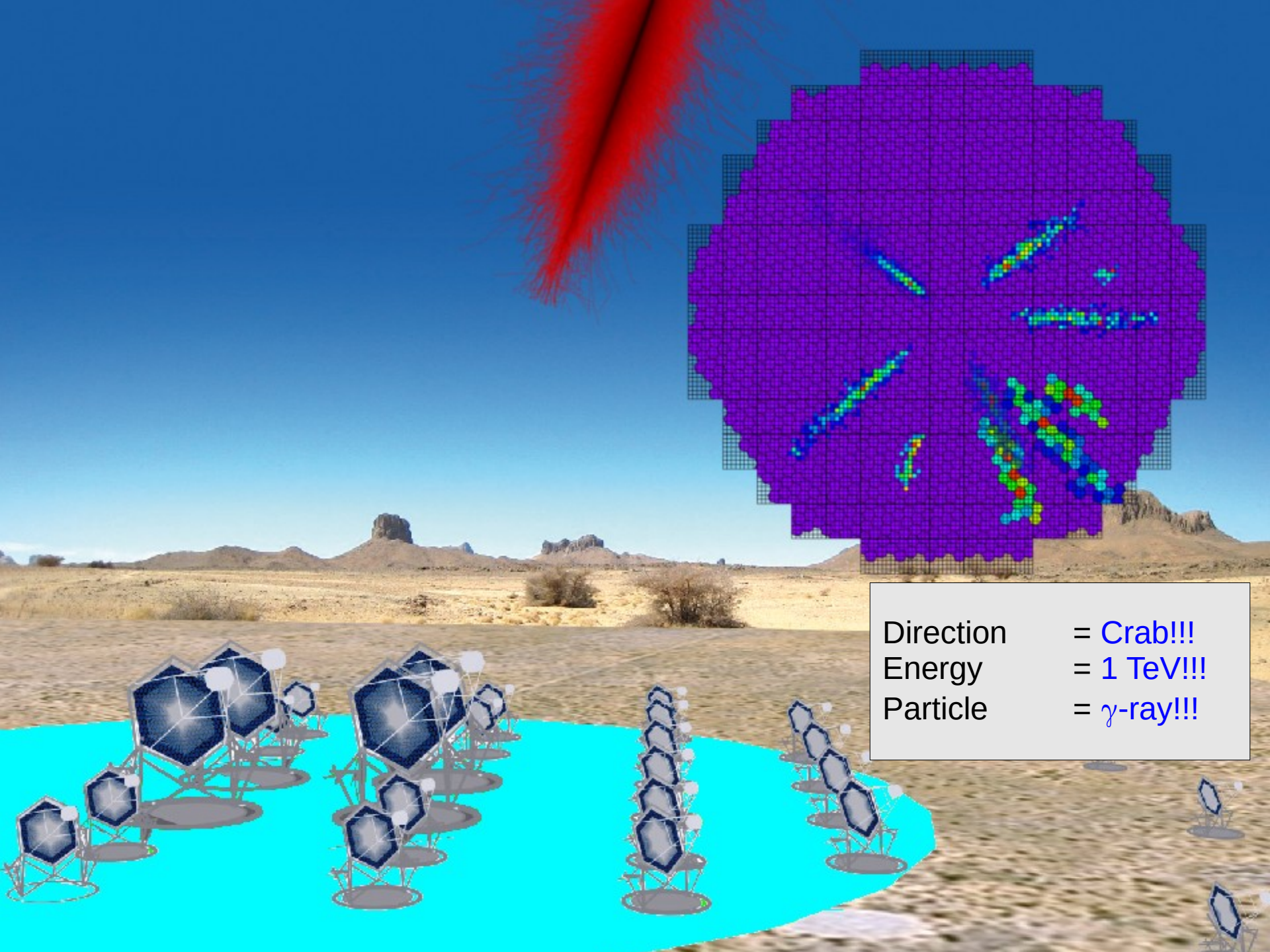


# IACT technique – CTA

- The next generation of VHE gamma-ray detectors
- 4 decades of energy range:  $\sim 20$  GeV  $\rightarrow$   $\sim 300$  TeV
- Layout of IACTs of 3 different sizes
- Full sky coverage: two sites, one in each hemisphere
- Open Observatory







Direction	= Crab!!!
Energy	= 1 TeV!!!
Particle	= $\gamma$ -ray!!!

# IACT technique – Analysis

- Low-level analysis: Infer from the measured “light flashes”:
  - **Classify** the shower as a gamma-ray
  - The original **energy** of the gamma-ray
  - The original **direction** of the gamma-ray
- High-level analysis: infer from the measured photons, of “known” direction and energy...
  - Detection of VHE sources
  - Measured flux (spectrum, lightcurves)
  - Morphology (skymaps)

# IACT technique – Analysis

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- Detection of VHE sources
- Measured flux (spectrum, lightcurves)
- Morphology (skymaps)

This talk is focused on this analysis!

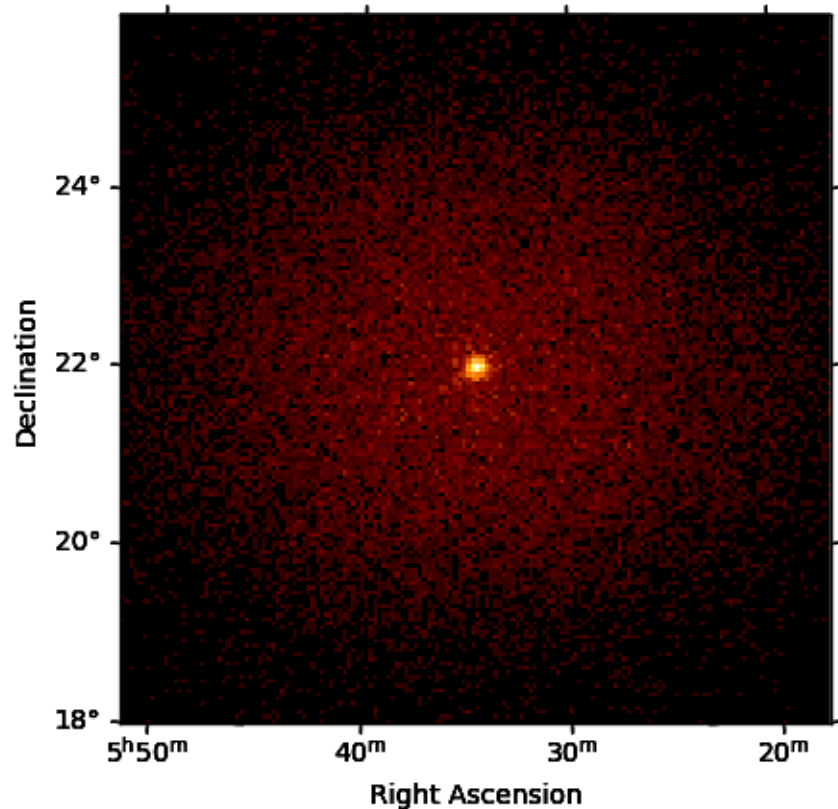


# IACT technique – Low-level analysis

- Outline of a classical IACT analysis:
  - Signal extraction from measured charge
  - Image cleaning and parameterization
  - Estimate the **direction** of the gamma-ray
  - **Classify** the shower  
(gamma/hadron separation)
  - Estimate the **energy** of the shower

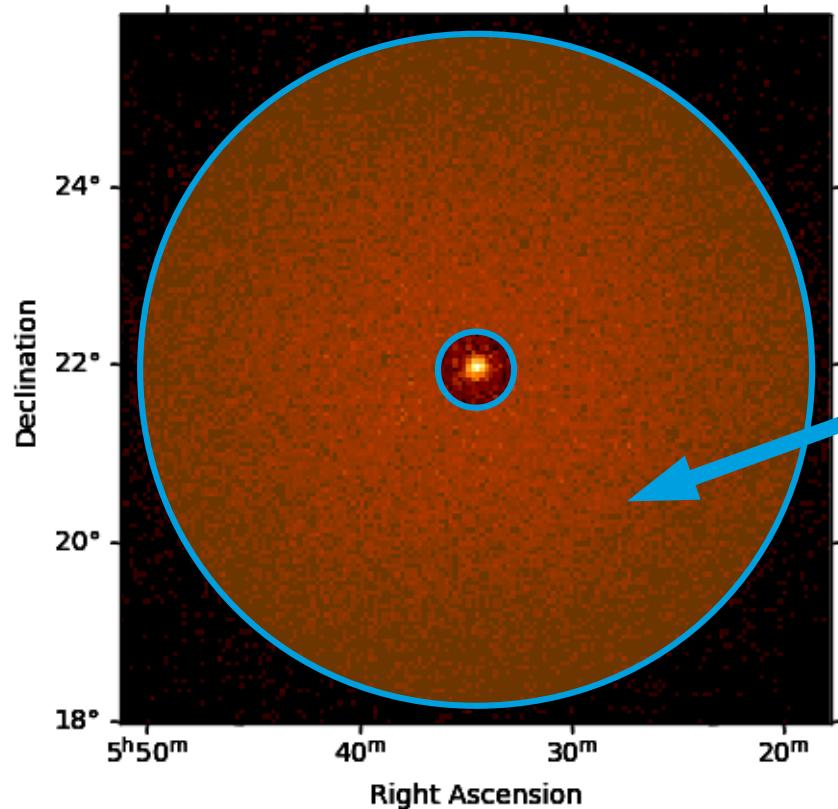
# IACT technique – High-level data products

- After the low-level analysis, we get something like this:



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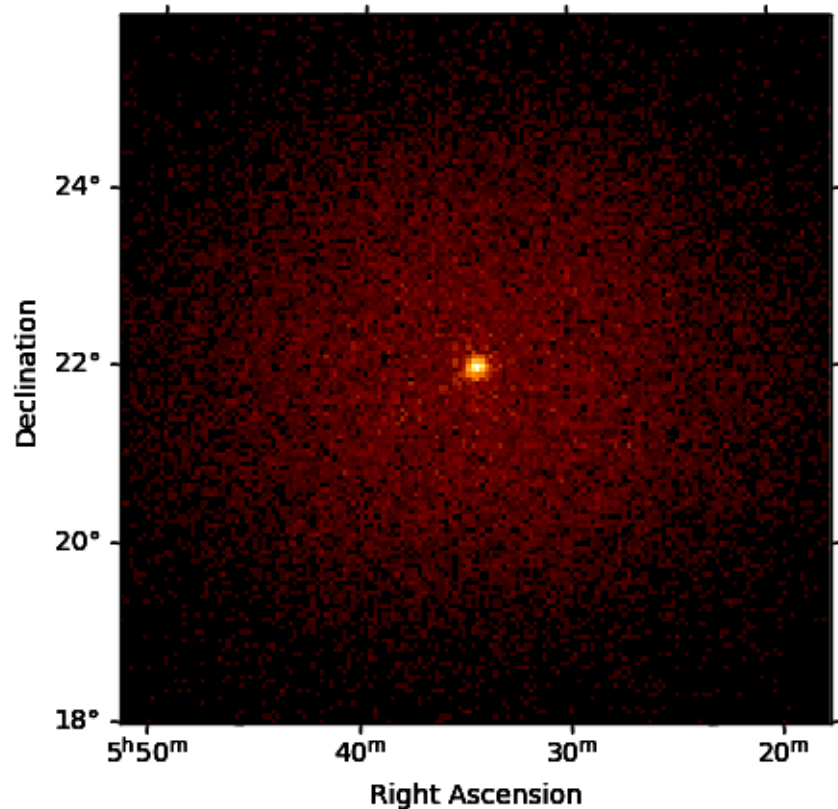


- First question: What is **all this**?



# IACT technique – High-level data products

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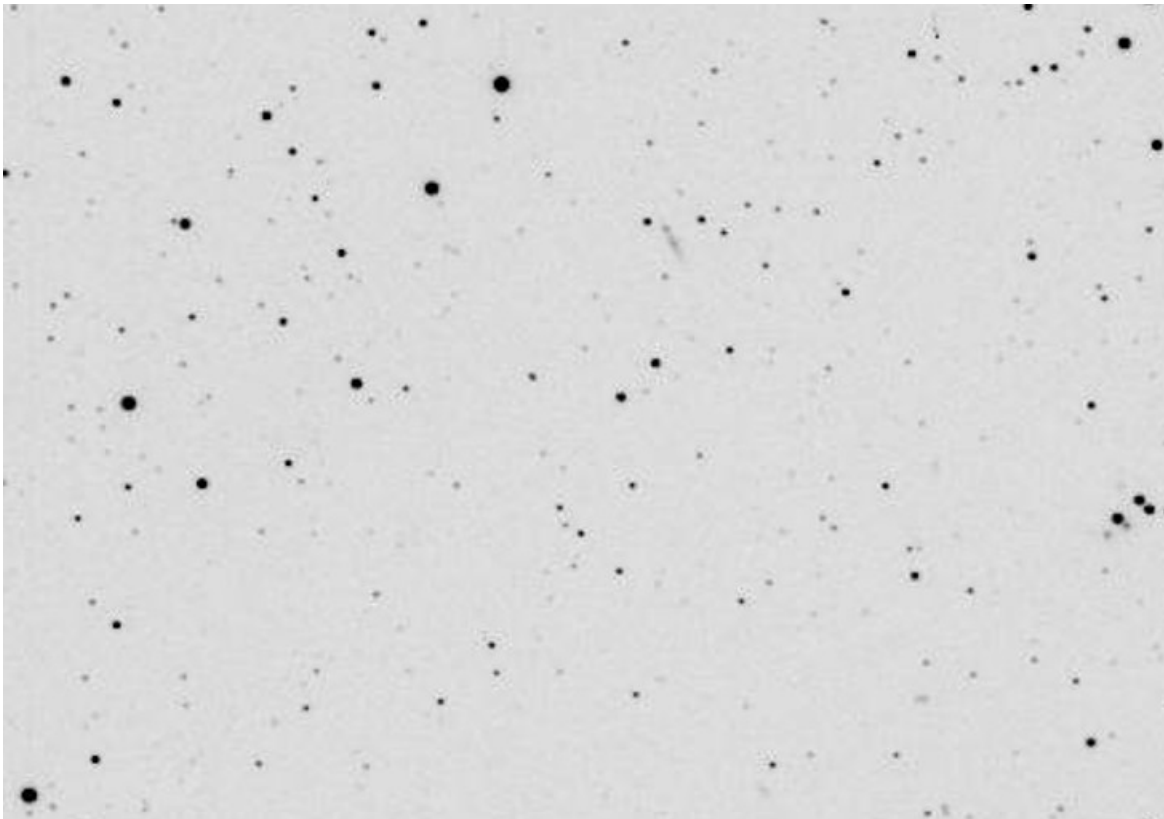
**cosmic-ray background**

dominates many of our observations (specially at low energies)

Even if our gamma-hadron rejection power is good, there will be many cosmic-rays that will look identical to gamma-ray showers

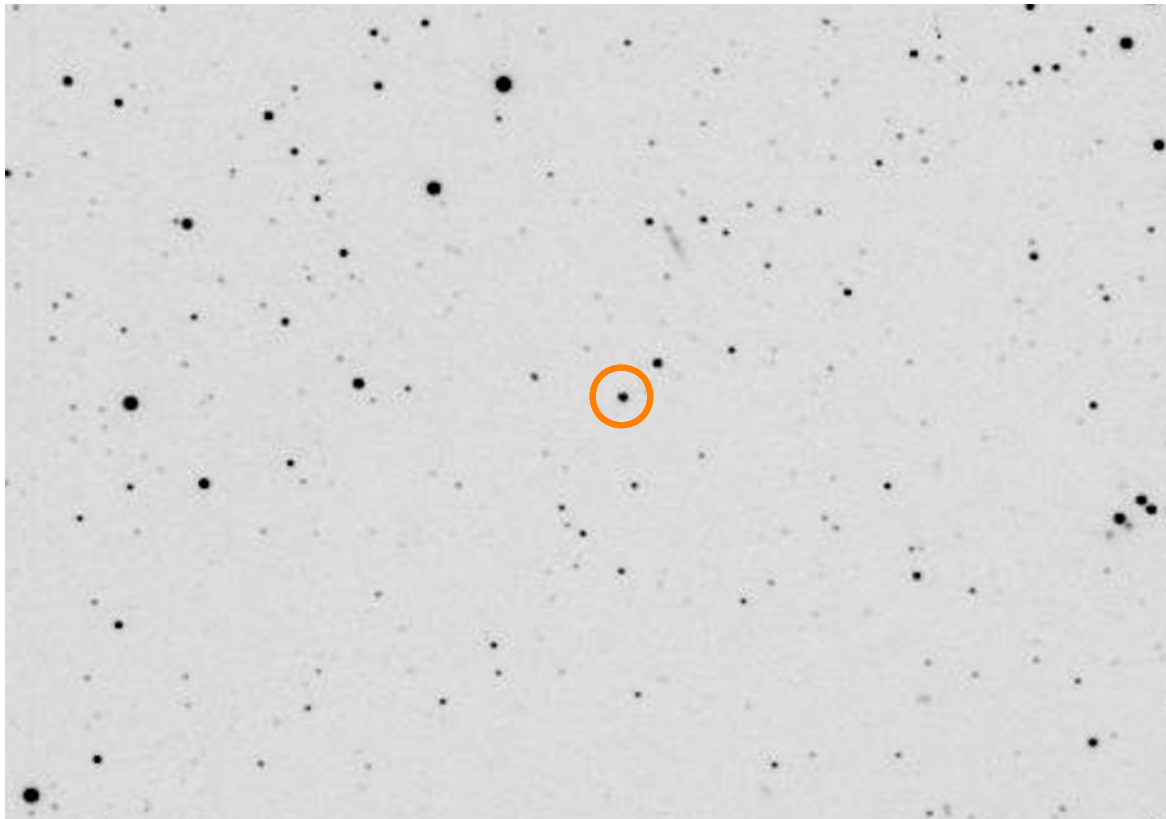
# Analysis in astronomy – Optical

- In classical photometry analysis, the following method is usually used:



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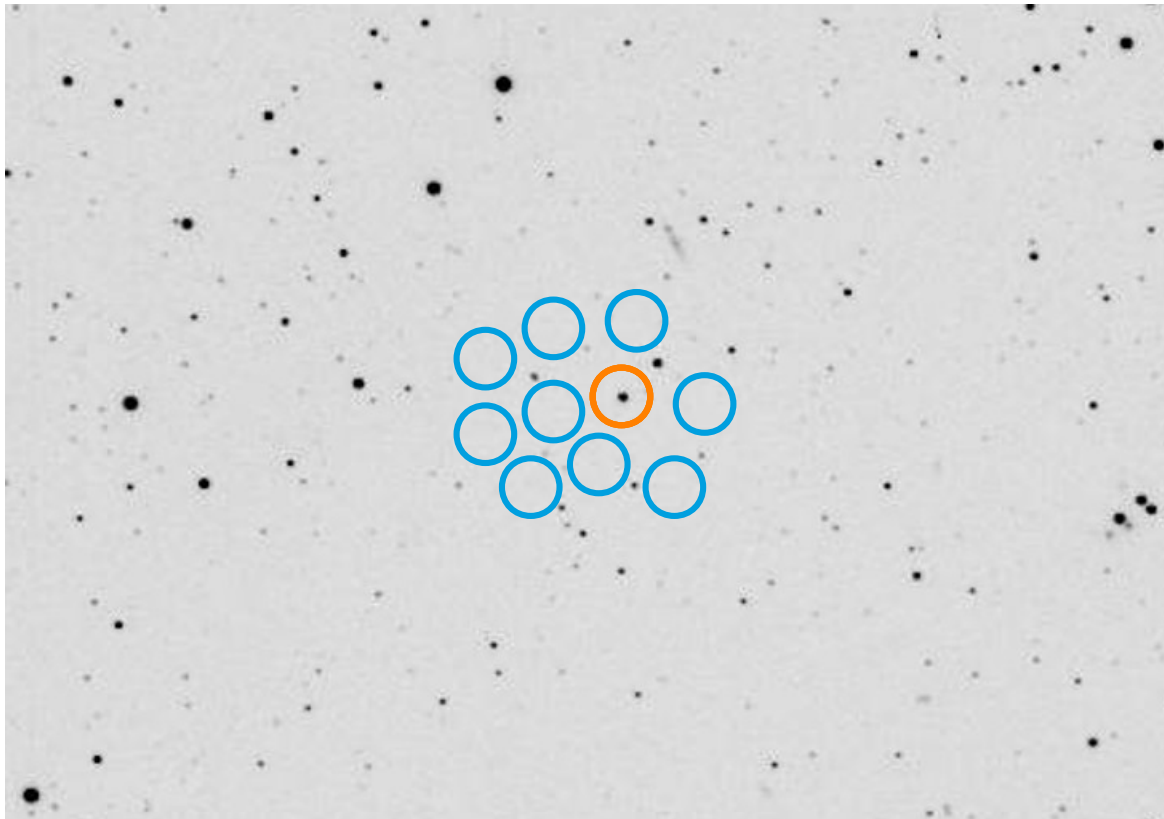


- Decide the size of your ON-region



# Analysis in astronomy – Optical

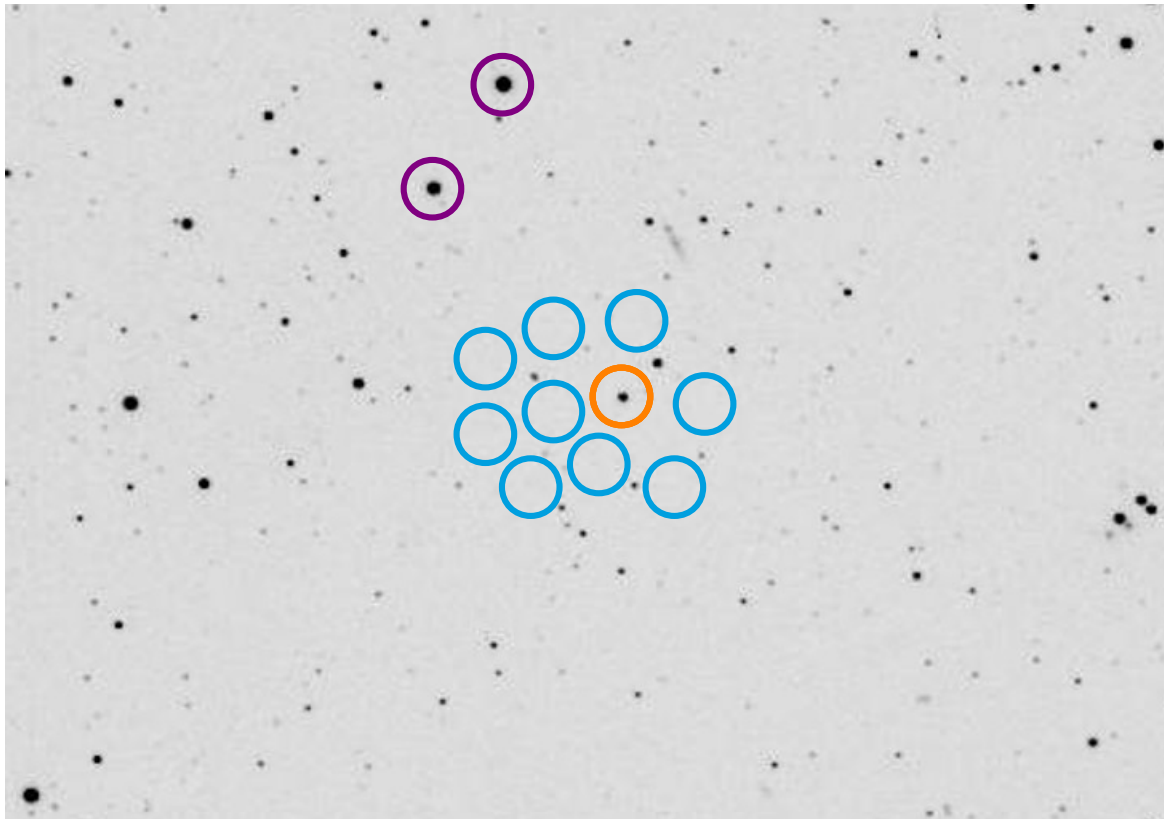
- In classical photometry analysis, the following method is usually used:



- Decide the size of your **ON region**
- Calculate the expected background from star-free **OFF regions**

# Analysis in astronomy – Optical

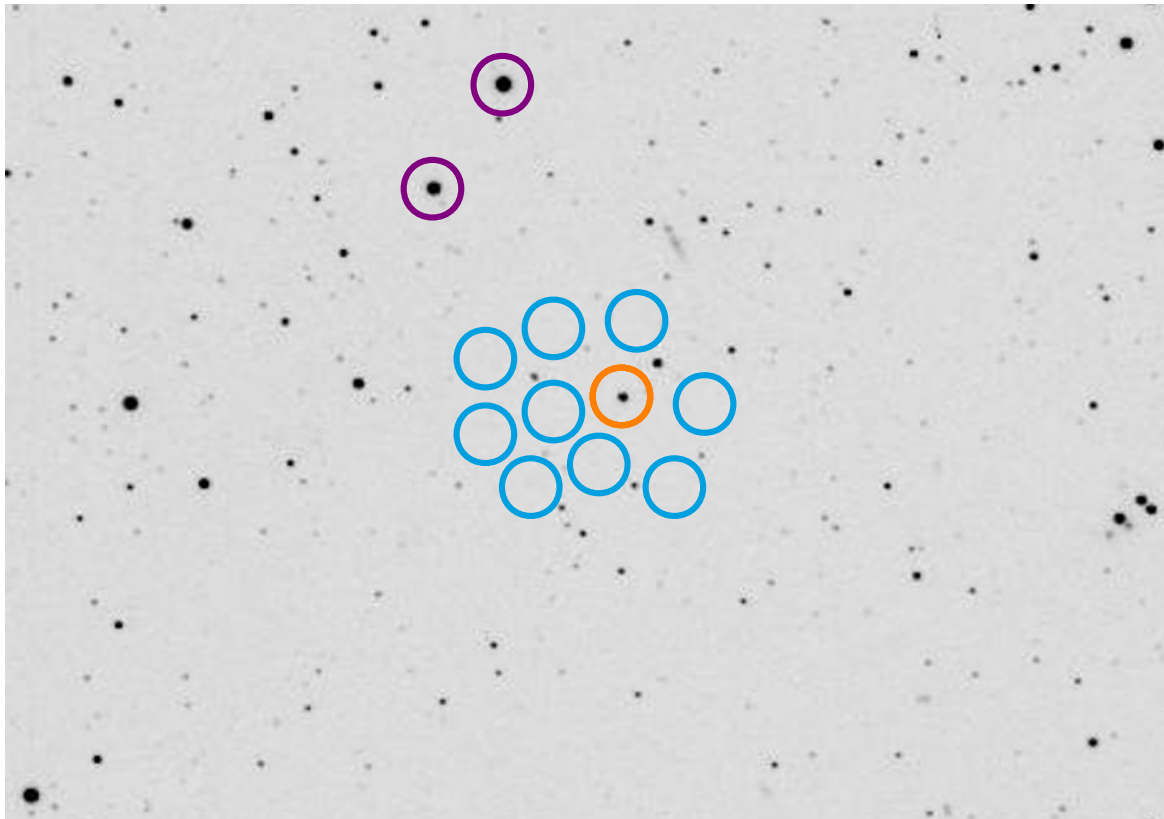
- In classical photometry analysis, the following method is usually used:



- Decide the size of your **ON region**
- Calculate the expected background from star-free **OFF regions**
- Flux is usually calculated by comparing counts with respect to known **reference stars** in the FoV

# Analysis in astronomy – Optical

- In classical photometry analysis, the following method is usually used:



## Why so easy?!?

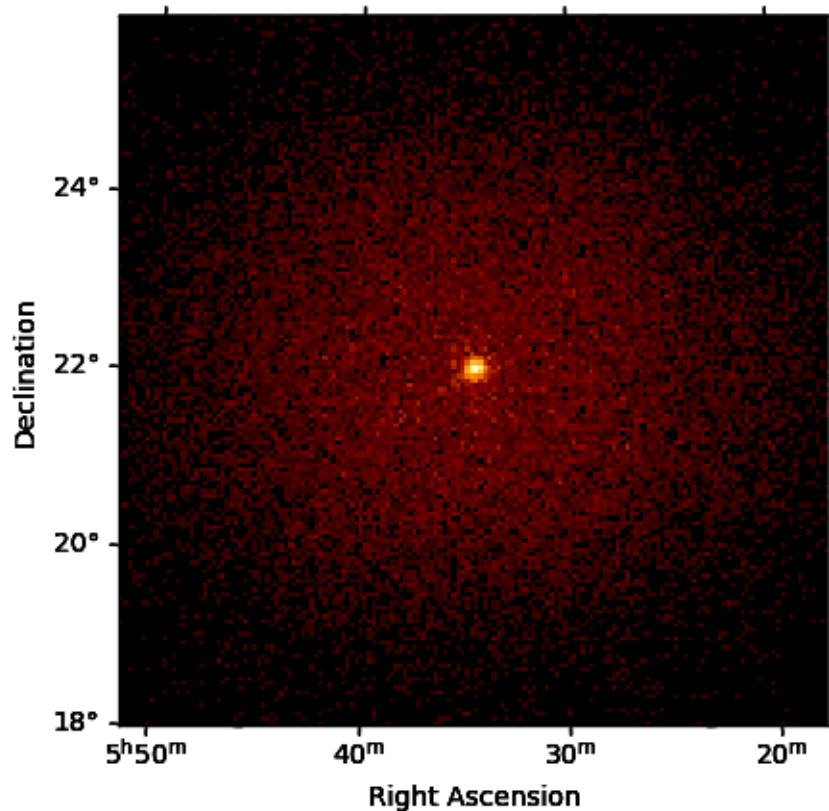
- The detection efficiency across the CCD camera FoV is  $\sim$  constant
- CCD cameras operate under **very stable** conditions
- CCD cameras are calibrated in the lab
- Great knowledge we have on standard candles allow calibration



# Analysis in astronomy – VHE energy

- In VHE, it's not so simple!

Why **not** so easy?!?

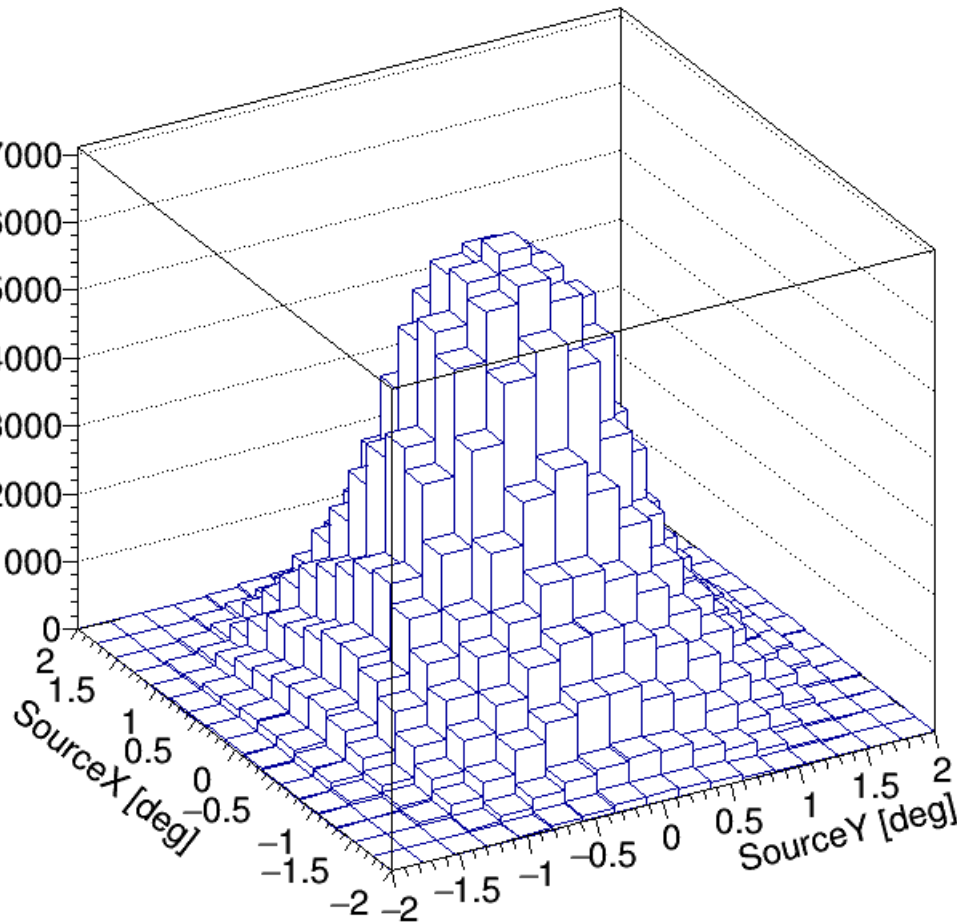


- The detection efficiency across an IACT FoV is **definitely** not constant

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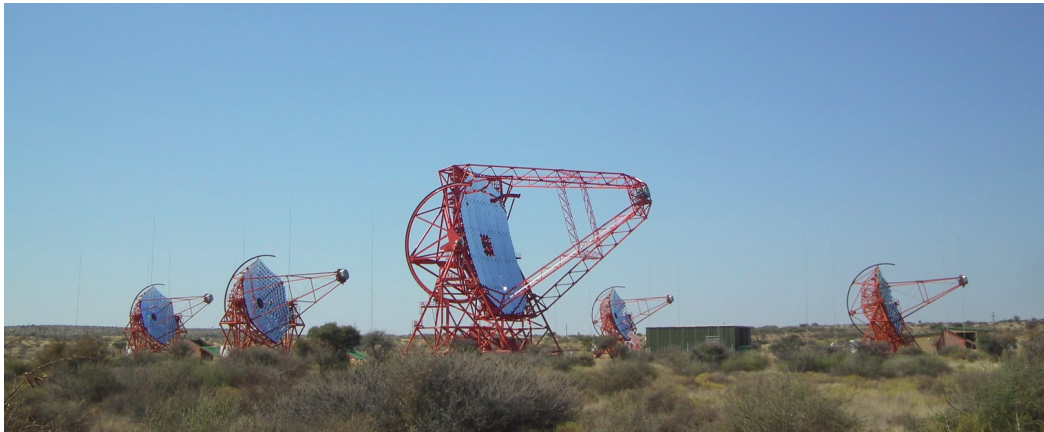


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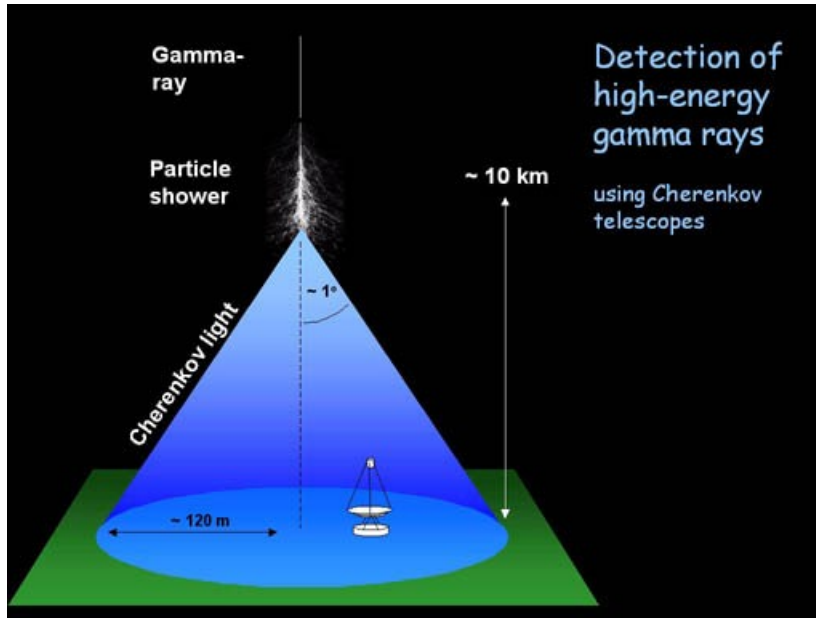
- The detection efficiency across an IACT FoV is **definitely** not constant

- IACTs operate under **very unstable** conditions



# Analysis in astronomy – VHE energy

- In VHE, it's not so simple!



Why **not** so easy?!?

- The detection efficiency across an IACT FoV is **definitely** not constant
  - IACTs operate under **very unstable** conditions
- The atmosphere is part of our detector, and it heavily influences our performance. We are also affected by the moon, the weather...
  - Performance also depends on the direction we look at (zenith and azimuth), as well as the night sky background intensity



# Analysis in astronomy – VHE energy

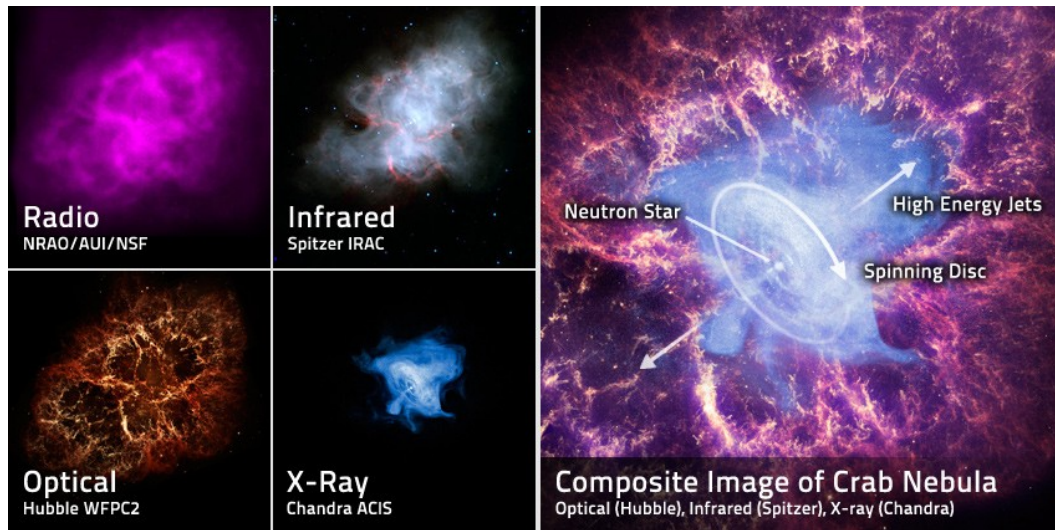


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# Analysis in astronomy – VHE energy

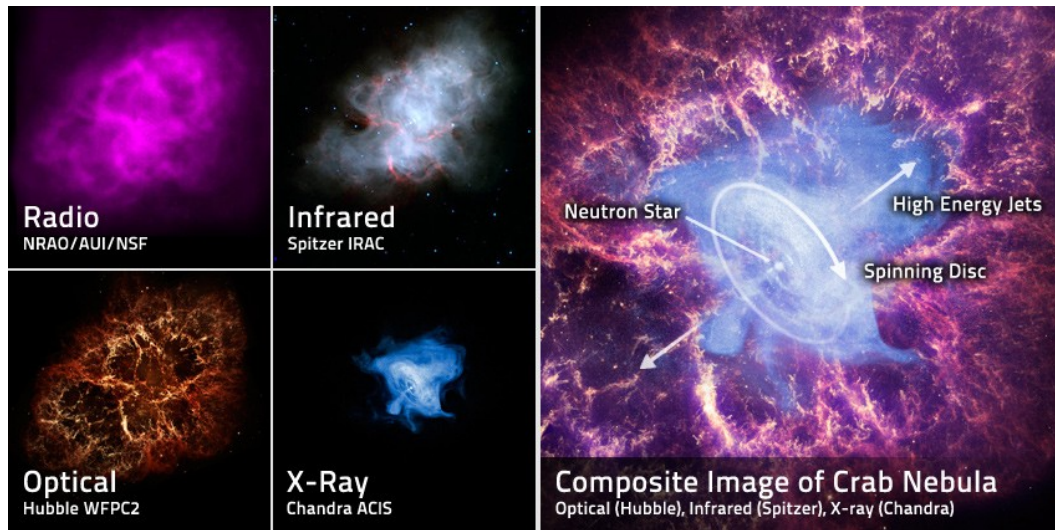


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# Analysis in astronomy – VHE energy



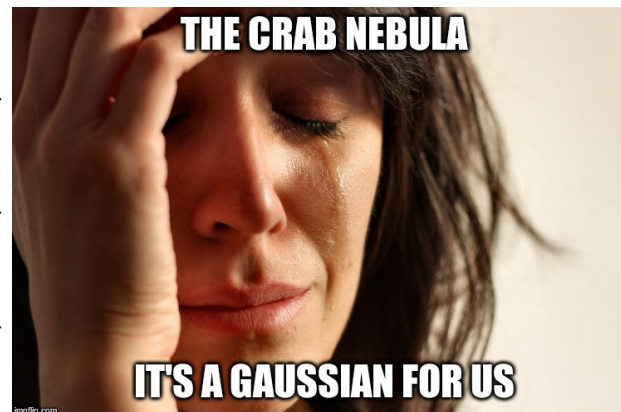
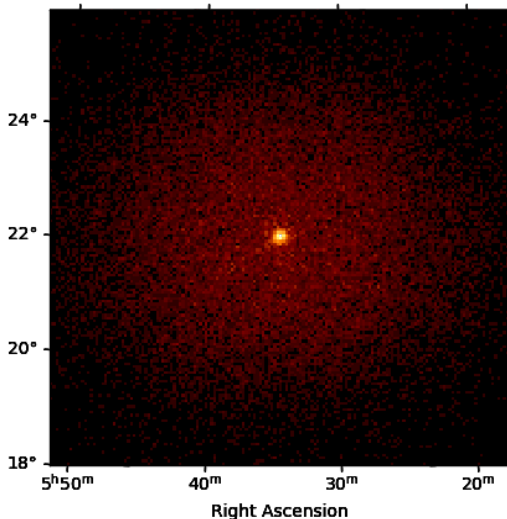
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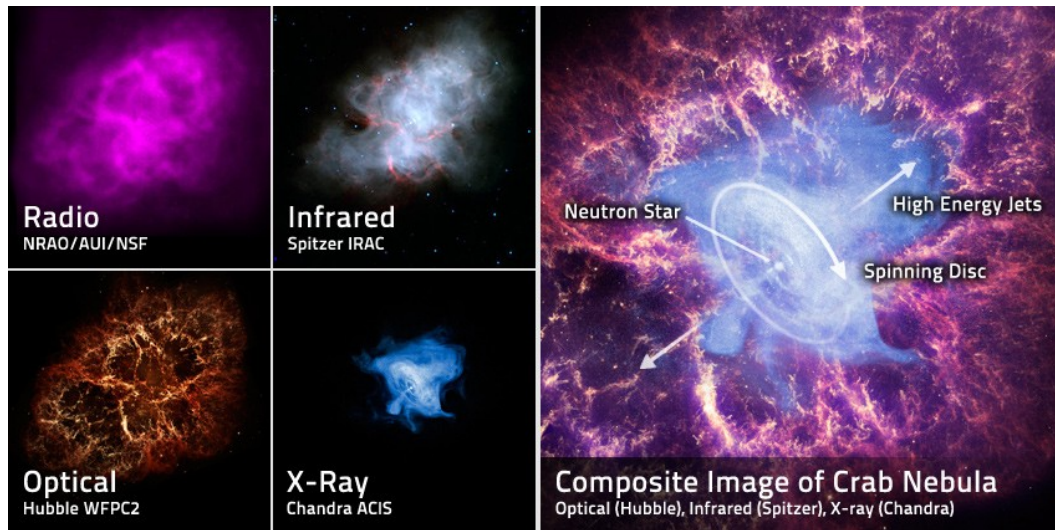
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# Analysis in astronomy – VHE energy



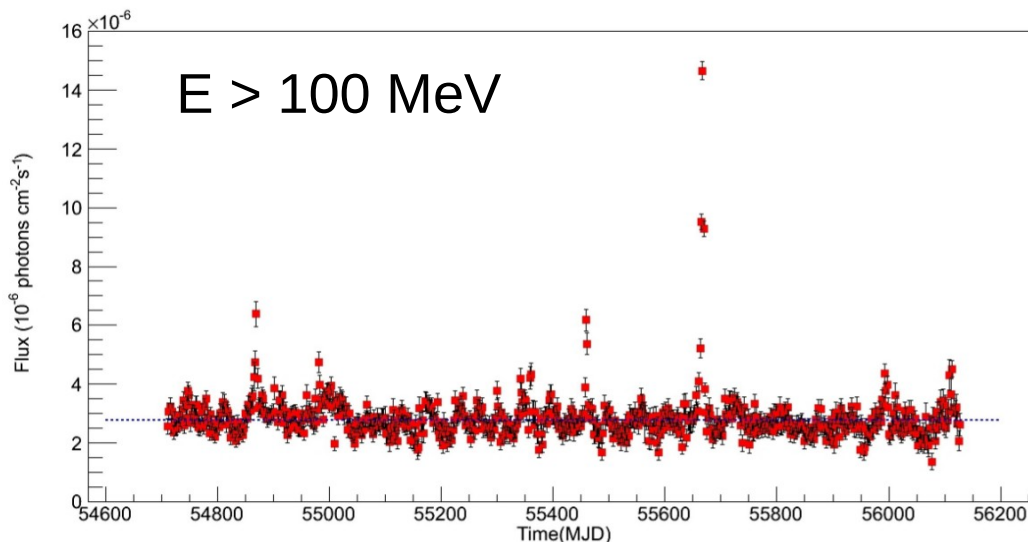
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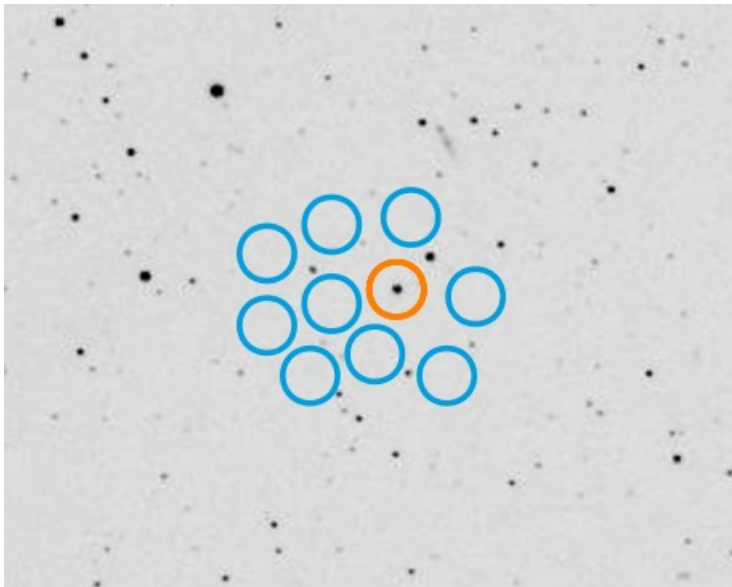
- Hey, it's not so bad! We do have a **standard candle**! Remembering it is also a **variable source**...





# Analysis in VHE – Source detection

- The simplest analysis in VHE astronomy is to detect sources:
  - Statistically prove with **confidence** that in a given position, there is a gamma-ray source above the cosmic-ray background



- In other wavelengths, statistical treatment may be simpler, mainly because the quantity of photons
- A high confidence detection in VHE astronomy may come from just **10 excess events**!

# Analysis in VHE – Source detection

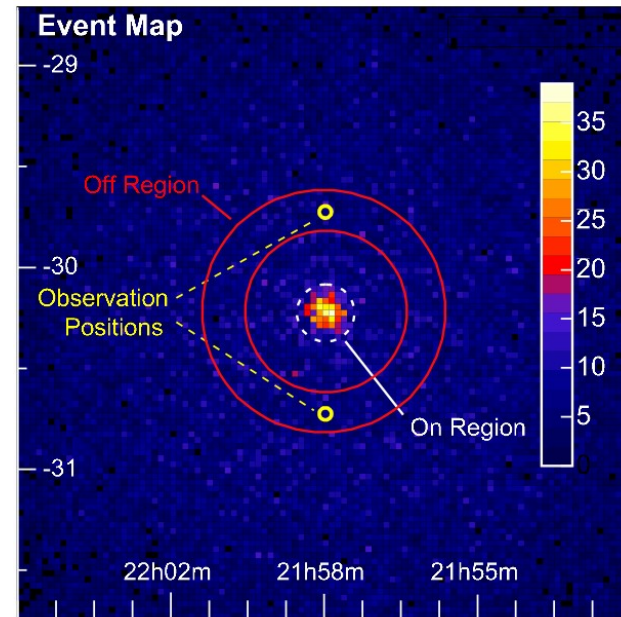
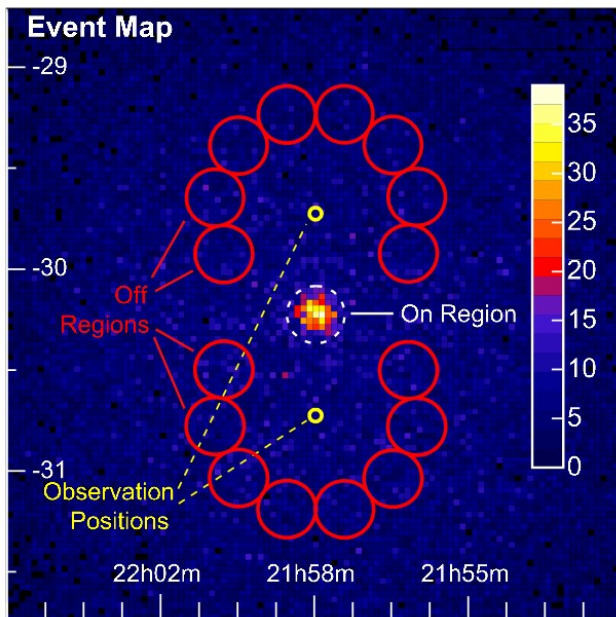
- The simplest analysis in VHE astronomy is to detect sources:
  - Statistically prove with **confidence** that in a given position, there is a gamma-ray source above the cosmic-ray background
  - The most generalized statistical method for source detection is described in [Li & Ma 1983](#)
    - Calculate the probability of observing X amount of events assuming there is only background
    - The simplest method to understand it is by plotting the  $\theta^2$  distribution

# Analysis in VHE – Source detection

- The detection efficiency across an IACT FoV is not constant

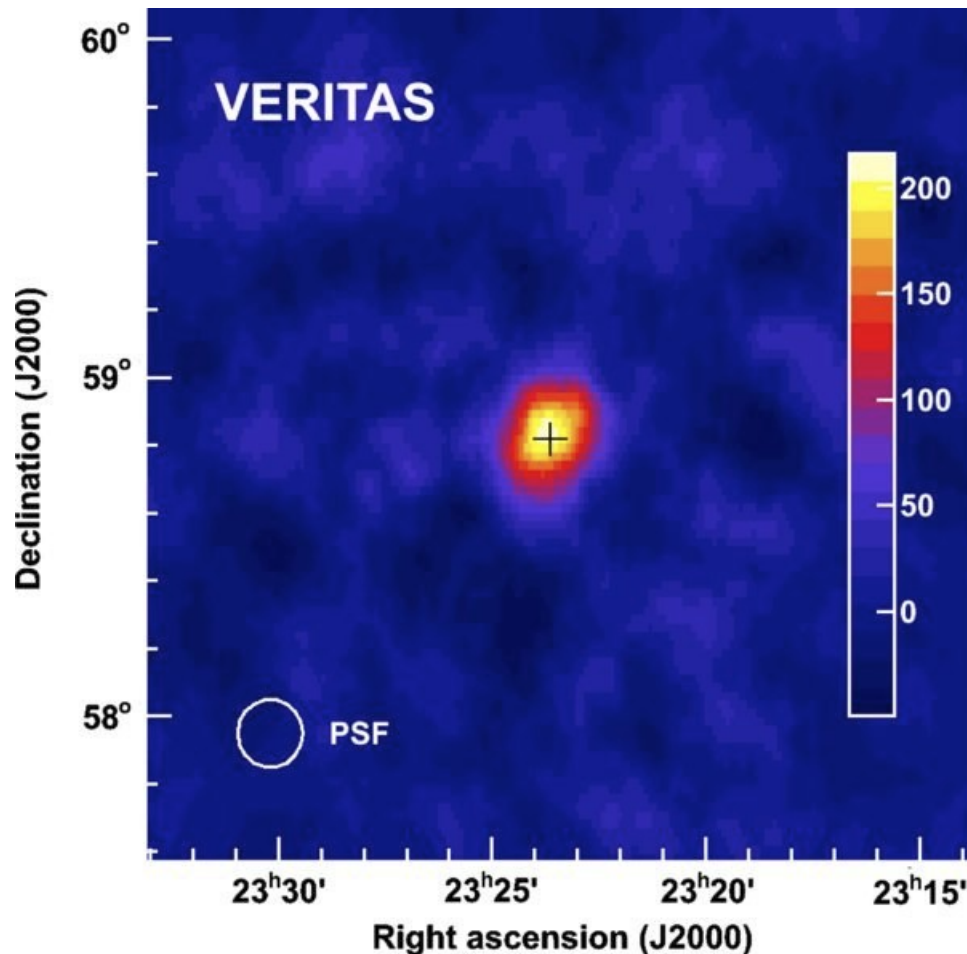
Make sure your OFF regions have identical acceptance

Understand how acceptance changes over the FoV



# Analysis in VHE – Source detection

- An easy way to understand this is the  $\theta^2$  plot

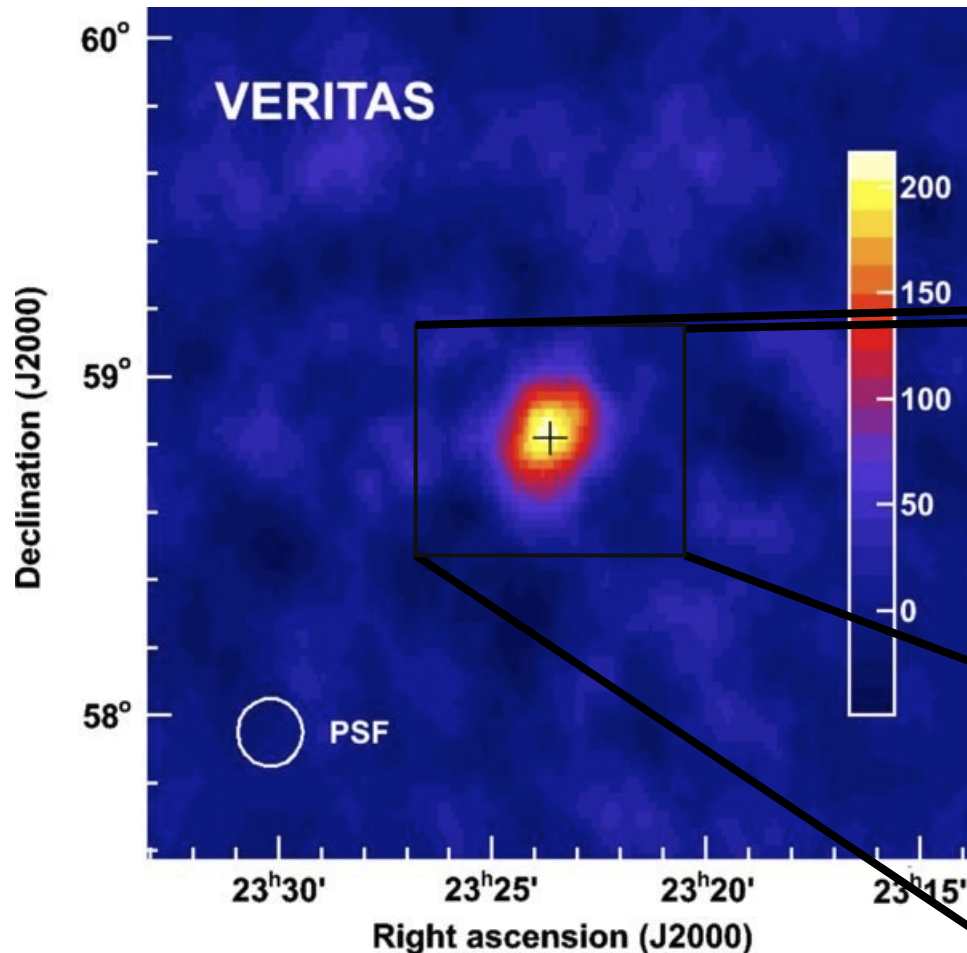


- Counts for a ring around the source, of constant area

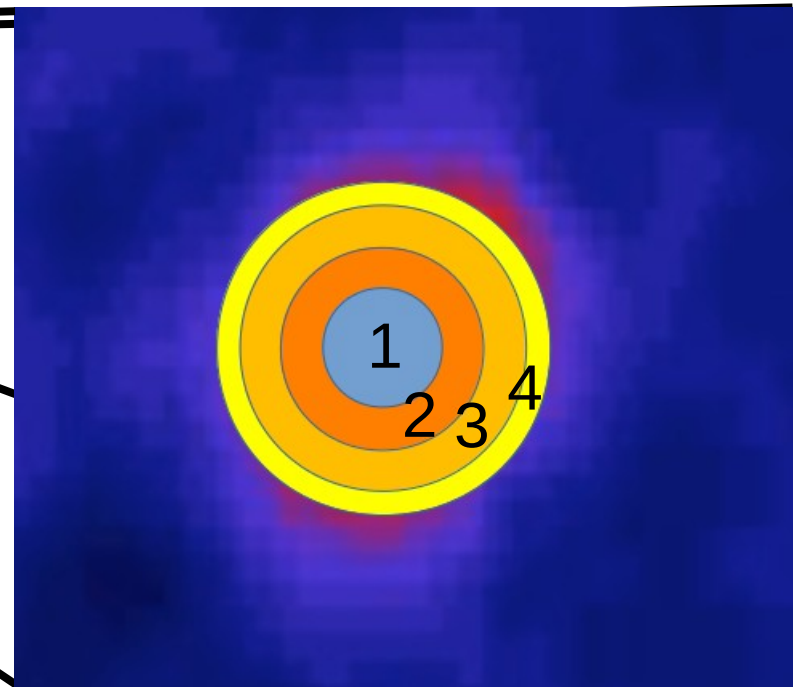


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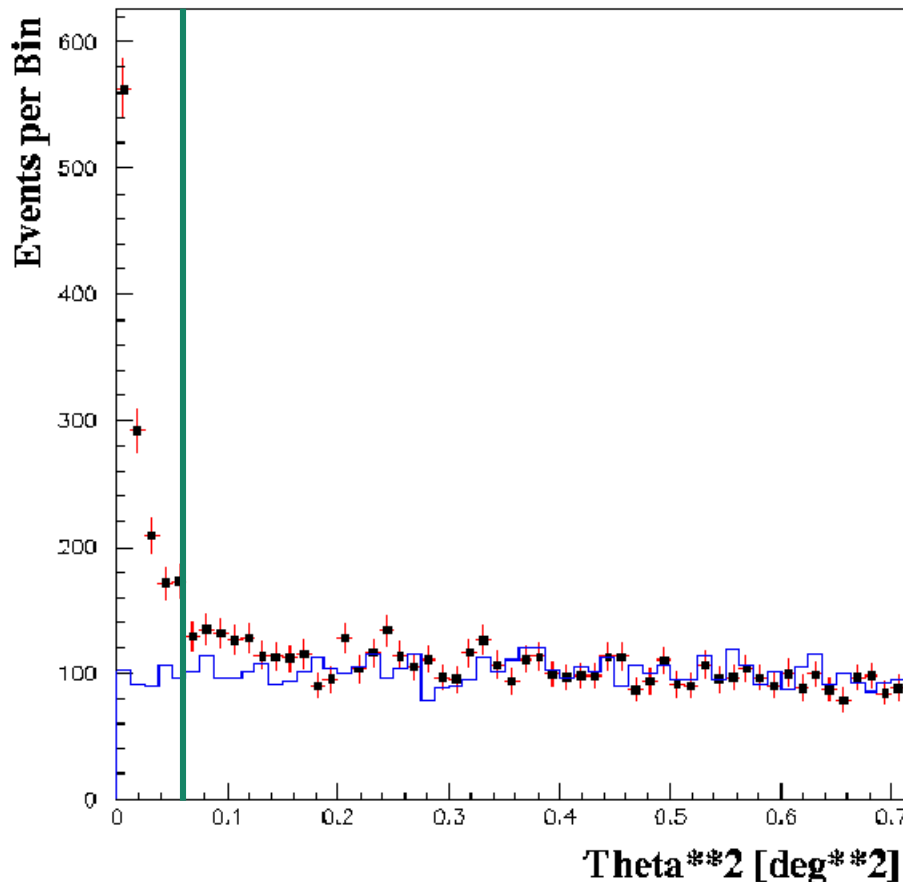
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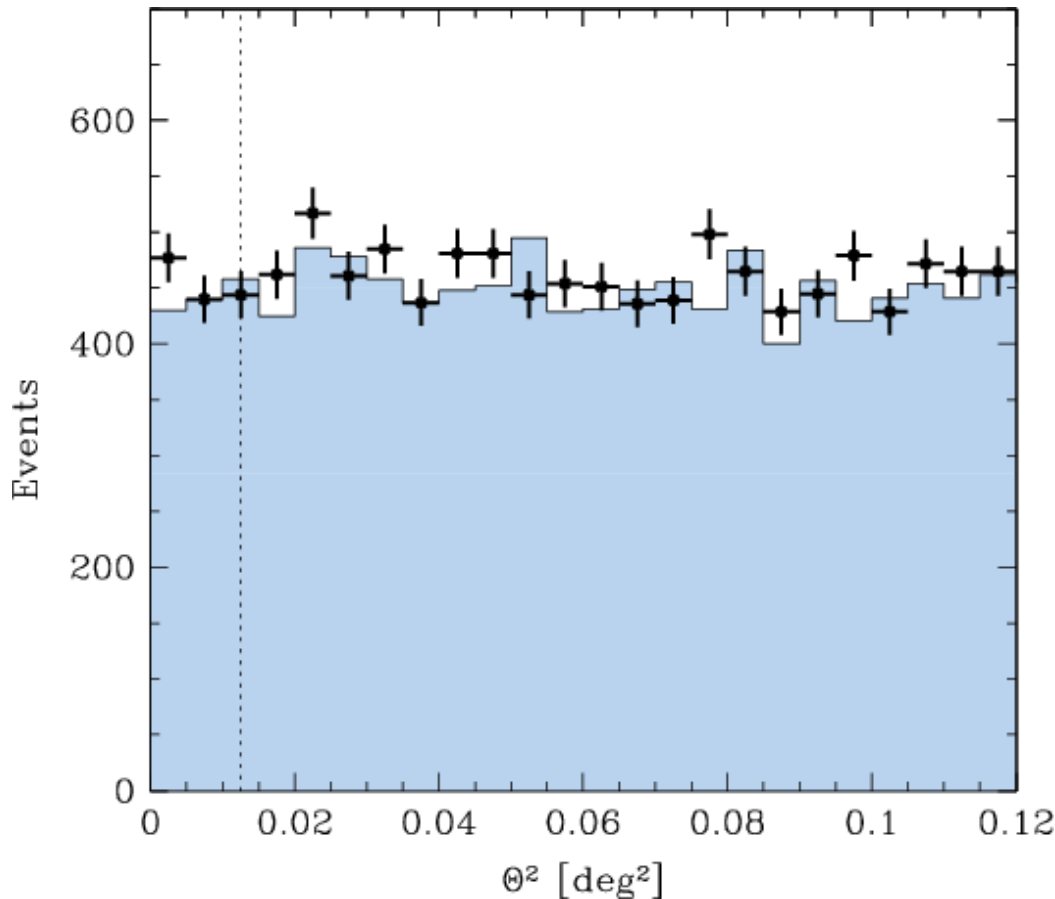
**Crab Nebula ( 11.7 hours ON)**



- Counts for a ring around the source, of constant area
- The same done around **OFF regions**
- Test, after applying a **pre-defined cut**, the significance of detection

# Analysis in VHE – Source detection

- An easy way to understand this is the  $\theta^2$  plot



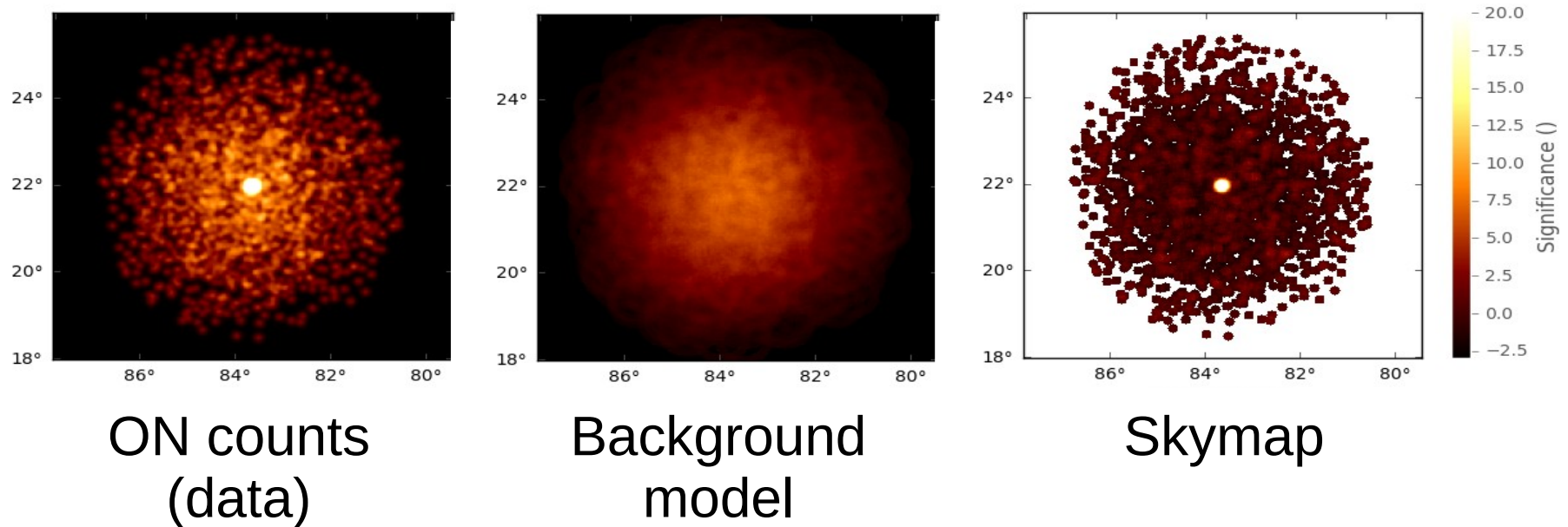
- Counts for a ring around the source, of constant area

- The same done around **OFF regions**

- Test, after applying a **pre-defined cut**, the significance of detection

# Analysis in VHE – Source detection

- If you do that for every point of an observation: skymap



- Not as easy to calculate flux (e. g. a spectrum, integral flux...)
- Also, not easy to study morphology



# Analysis in astronomy – VHE energy

Remember our problems?!?

- Direct calibration is **not possible**
- IACTs operate under **very unstable** conditions

# Analysis in astronomy – VHE energy

Remember our problems?!?

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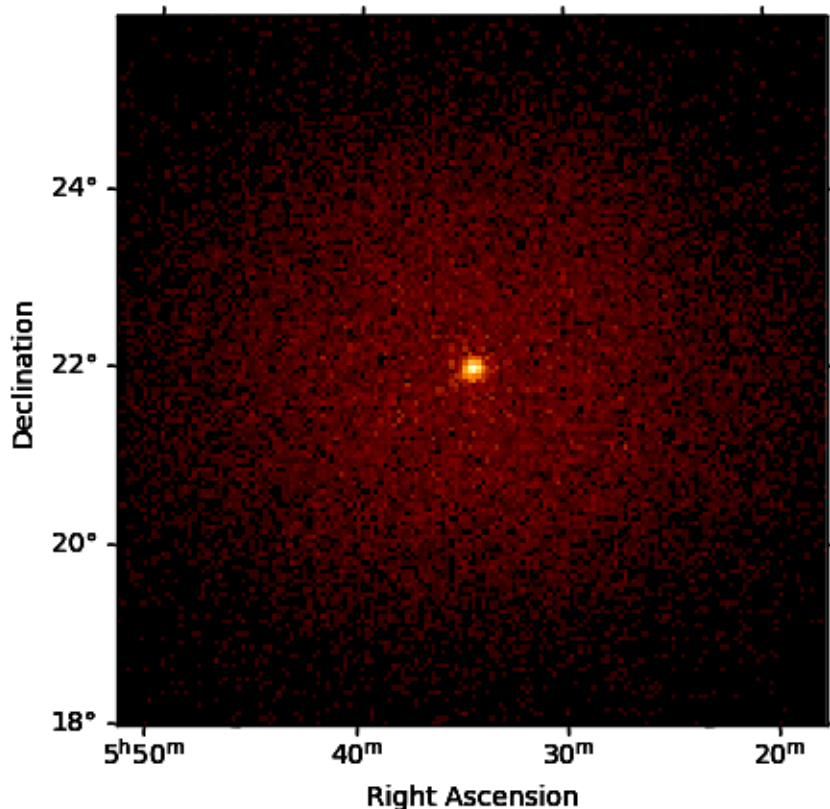
## Monte Carlo simulations

- IACTs operate under **very unstable** conditions

## More Monte Carlo simulations!

# IACT technique – MC simulations

- After a normal IACT observation, we get this data (direction, time of arrival and energy of gamma-like events)



- How do we convert from **observed** number of photons to **flux**, if we cannot calibrate our instrument and the conditions are changing?
- We define the **Instrument Response Function** that relates “reconstructed” quantities with the “true” emitted photons

# IACT technique – MC simulations

- The Instrument Response Function relates the array reconstructed quantities with the parameters of the source emitted photons

$$R_{\gamma}(\theta', \phi', E' | \theta, \phi, E) = A_{\gamma}(\theta, \phi, E) \times PSF(\theta', \phi' | \theta, \phi, E) \times D(E' | \theta, \phi, E)$$

- The IRF elements are:
  - Effective area
  - Energy dispersion
  - Direction dispersion (PSF)
  - Hadronic background “acceptance”



# IACT technique – MC simulations

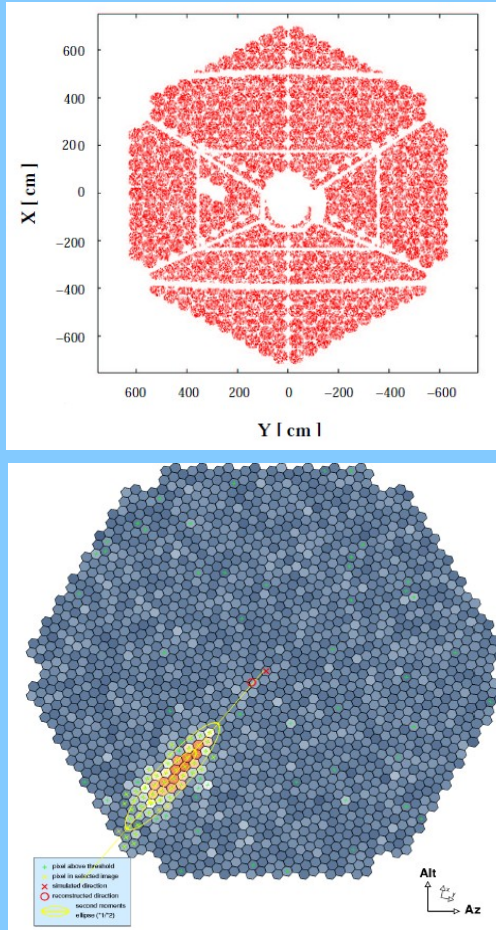
1

Shower  
simulation



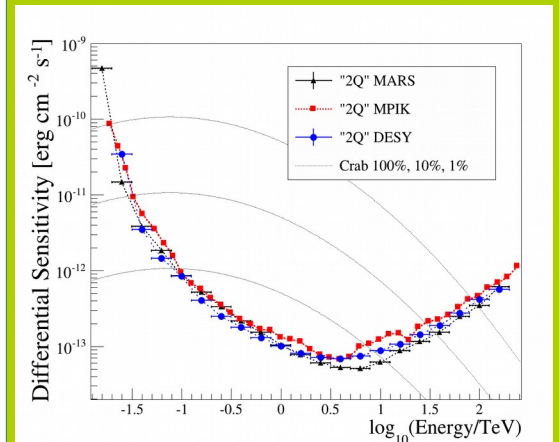
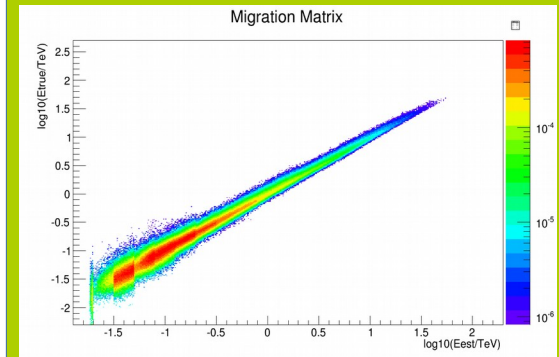
2

Telescope  
simulation



3

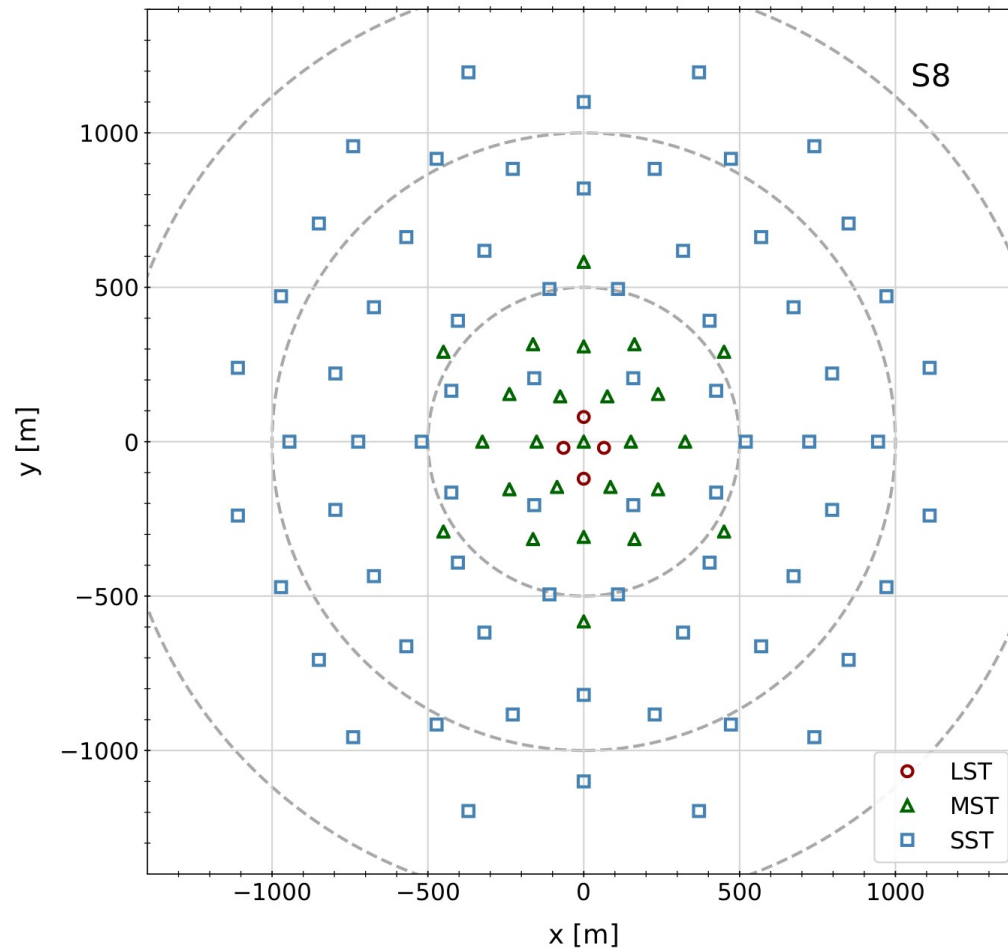
Performance  
analysis



# IACT technique – MC simulations

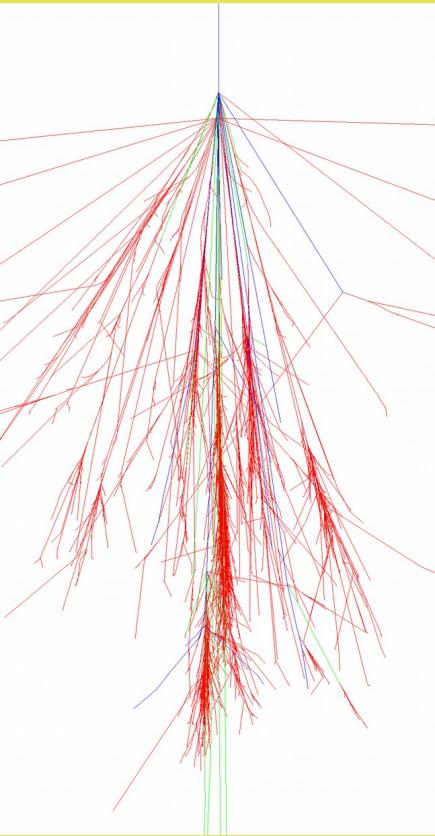
Shower  
simulation

- First, define a layout of telescopes

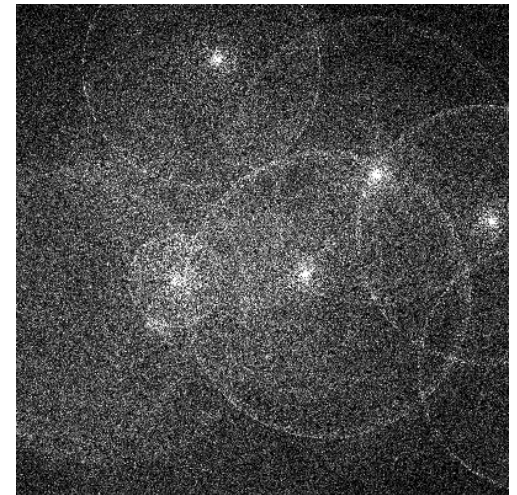
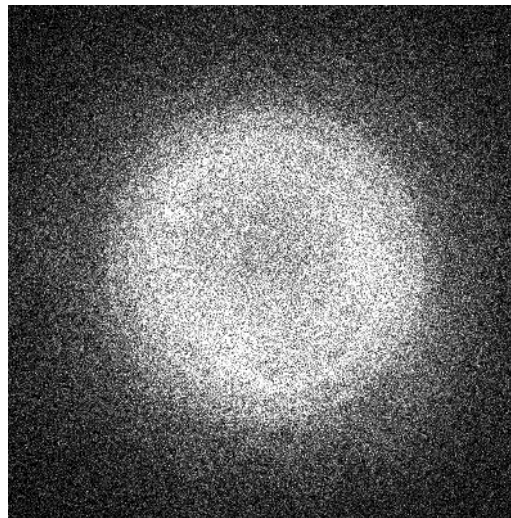


# IACT technique – MC simulations

Shower  
simulation



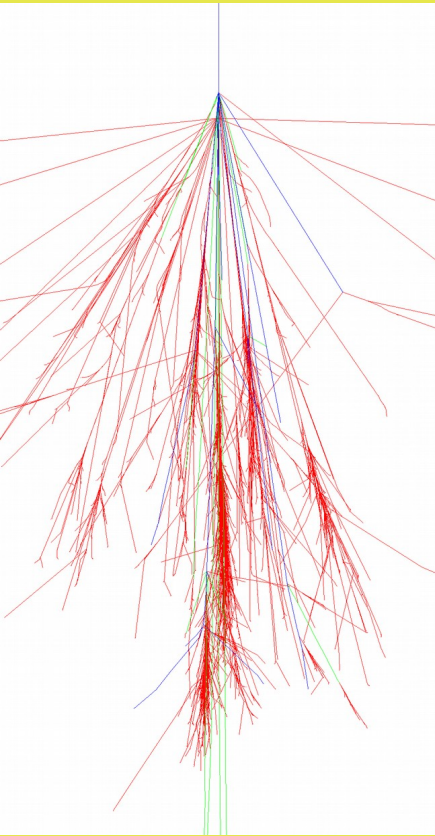
- First, define a layout of telescopes
- Gamma, cosmic-ray nuclei and electron showers are generated (CORSIKA)





# IACT technique – MC simulations

Shower  
simulation

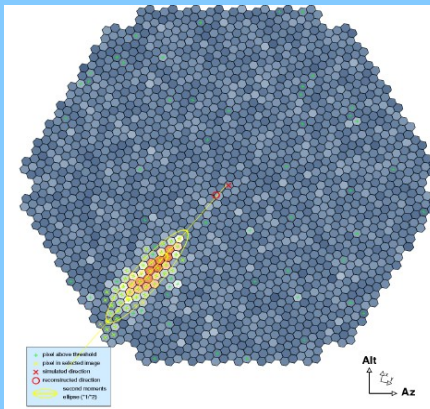
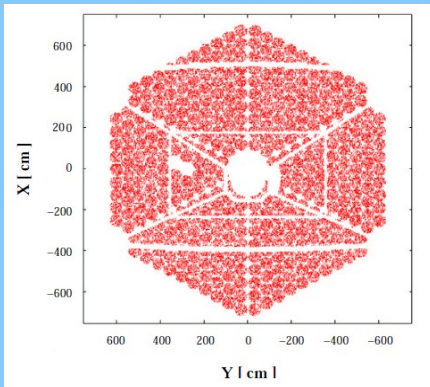


- First, define a layout of telescopes
- Gamma, cosmic-ray nuclei and electron showers are generated (CORSIKA)
- With the direction and timing of all photons from the air showers, the **telescope simulation** begins



# IACT technique – MC simulations

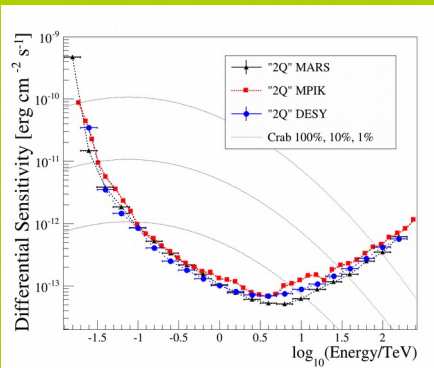
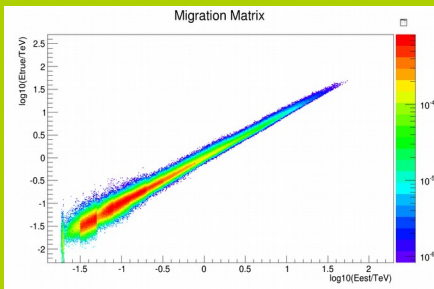
## Telescope simulation



- Each IACT uses their own simulation software to mimic their optical system and ray tracing, electronics, trigger system, camera response...
- In CTA, telescope response is simulated using `sim_telarray` (K. Bernlöhr)
- Simulates the ray tracing, electronics and camera response of several telescope types

# IACT technique – MC simulations

## Performance analysis



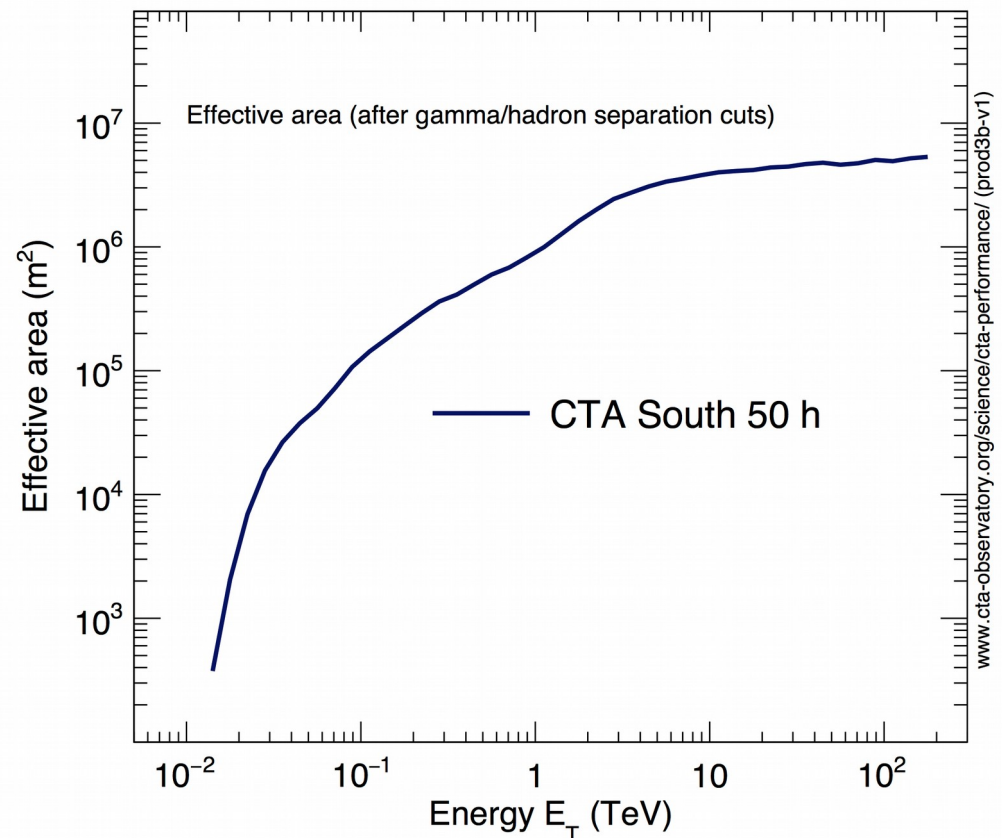
- MC generated data should be as close as possible to real data
- The IACT technique relies on MC simulations for both the low and high-level analyses:
  - Gamma-hadron separation
  - Energy reconstruction
  - Direction reconstruction
  - Performance evaluation (IRFs)

# IACT IRFs – Effective area

- If we detect X amount of gammas during Y amount of time...  
What is the flux of the source? → Need effective area

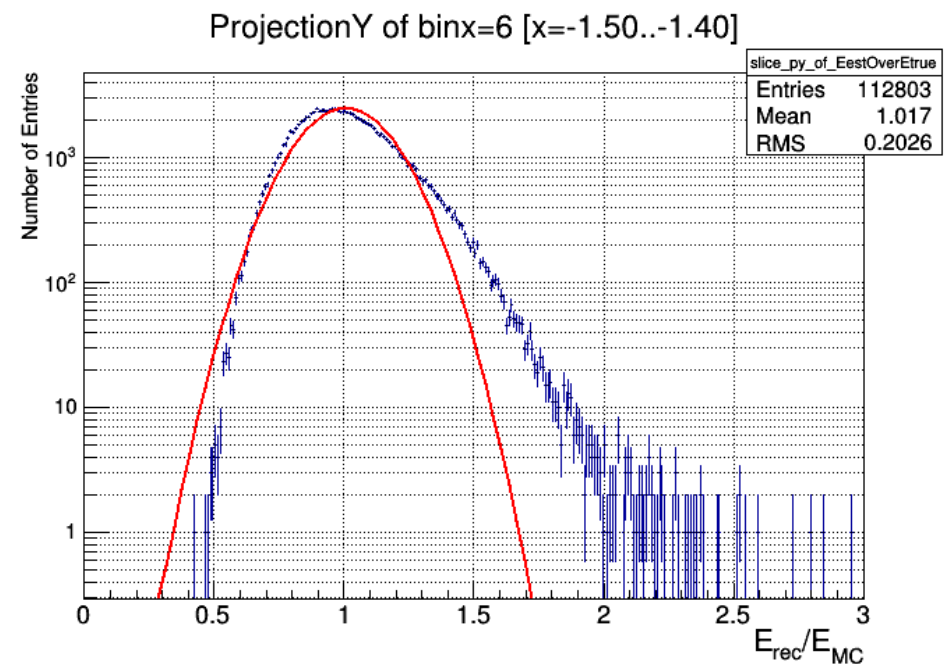
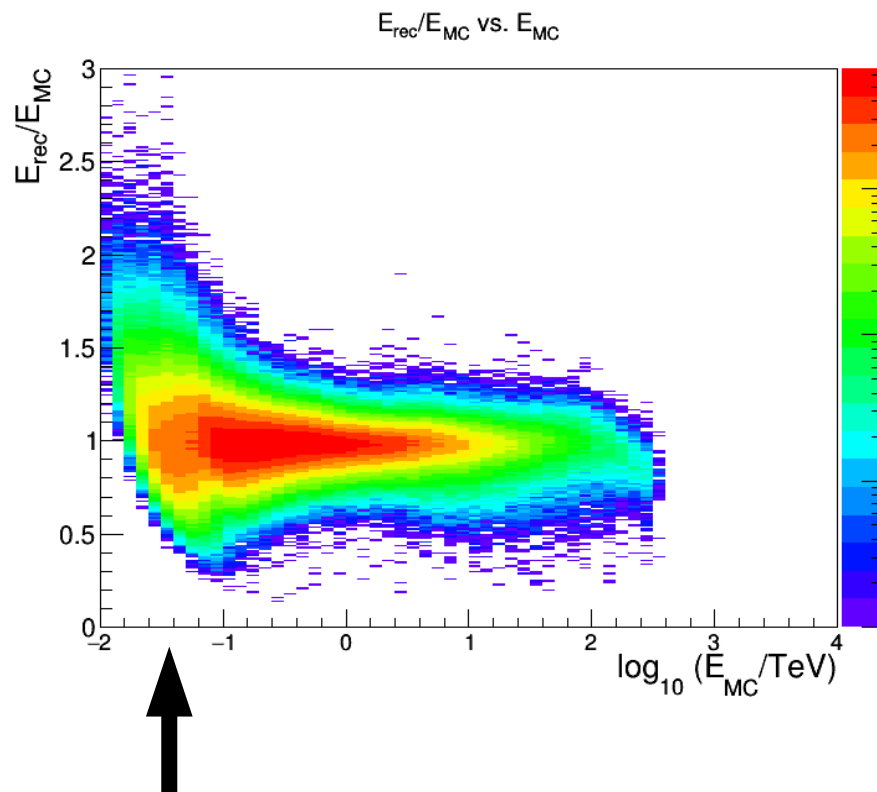
- $A_{\text{sim}} * N_{\text{analysis}}(E) / N_{\text{sim}}(E)$

- Strongly affected by  
the low-level analysis



# IACT IRFs – Energy migration

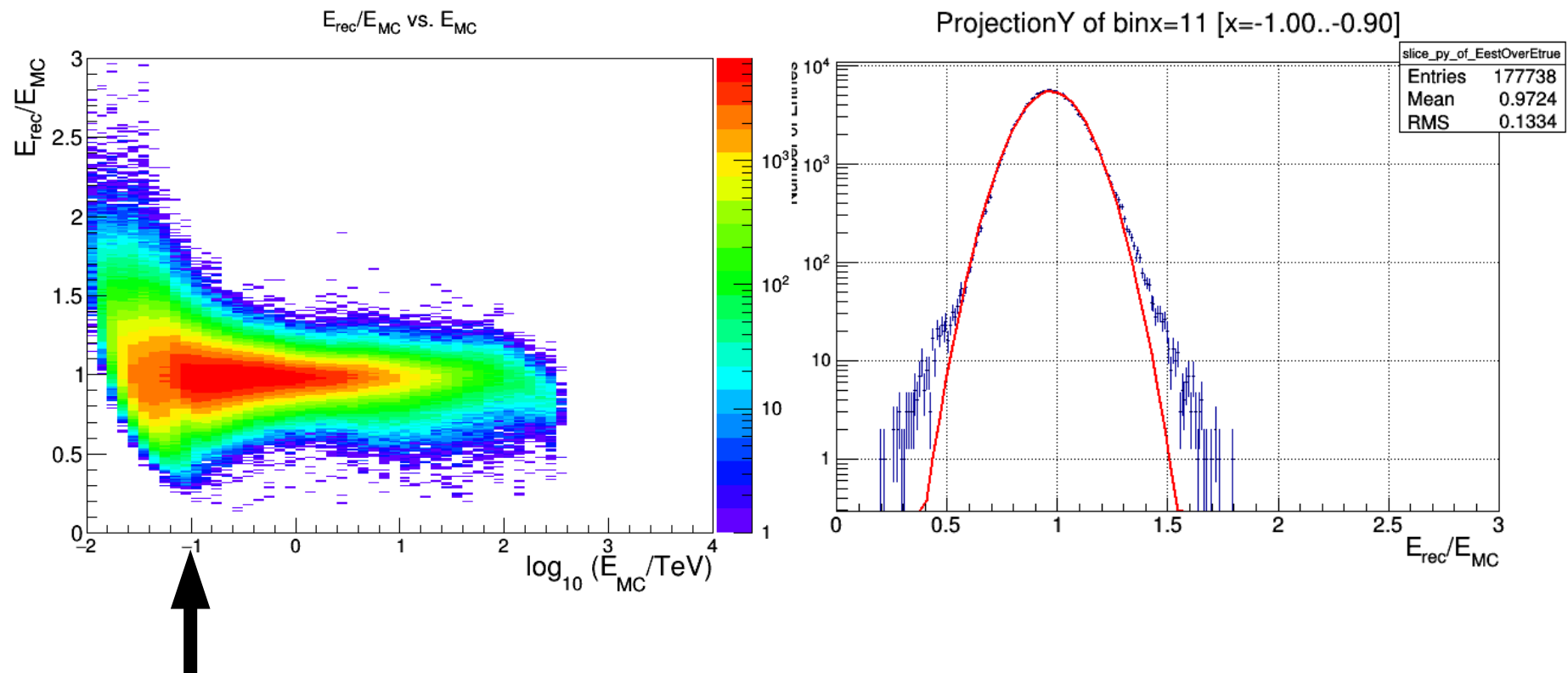
- Energy reconstruction is not perfect (actually, it's pretty bad...)
- Need to take into account it's dispersion in the analysis





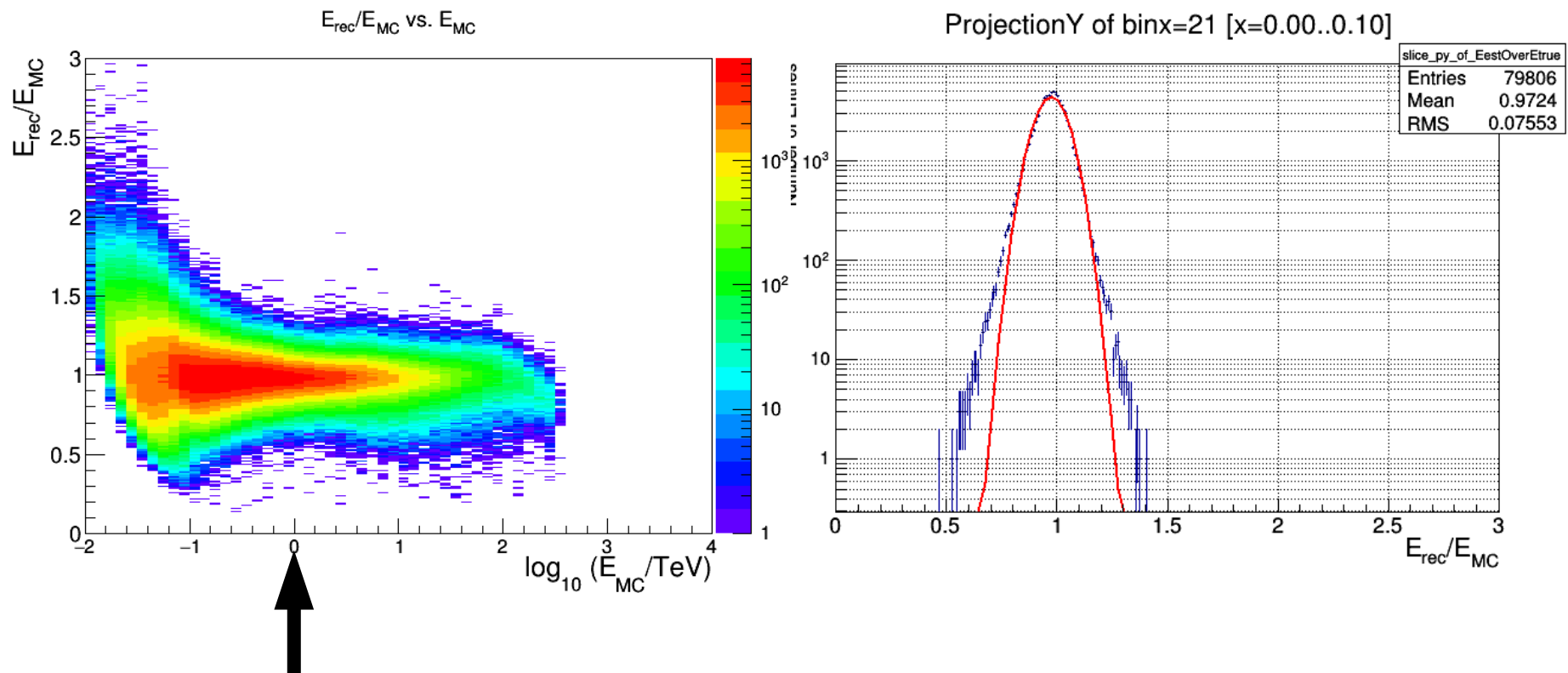
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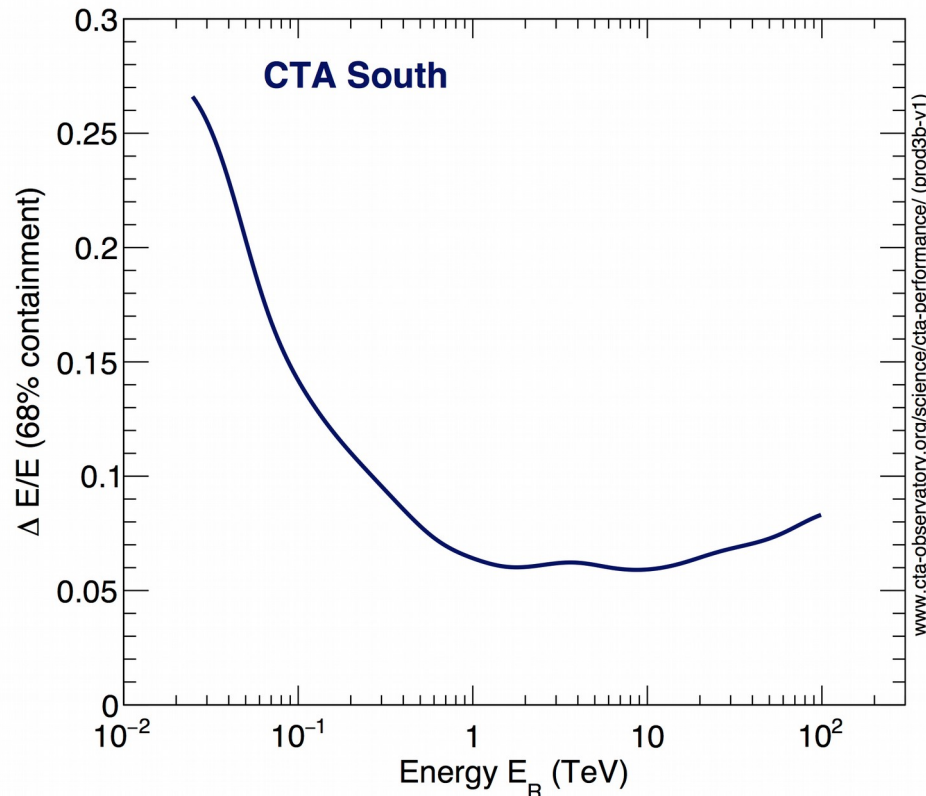
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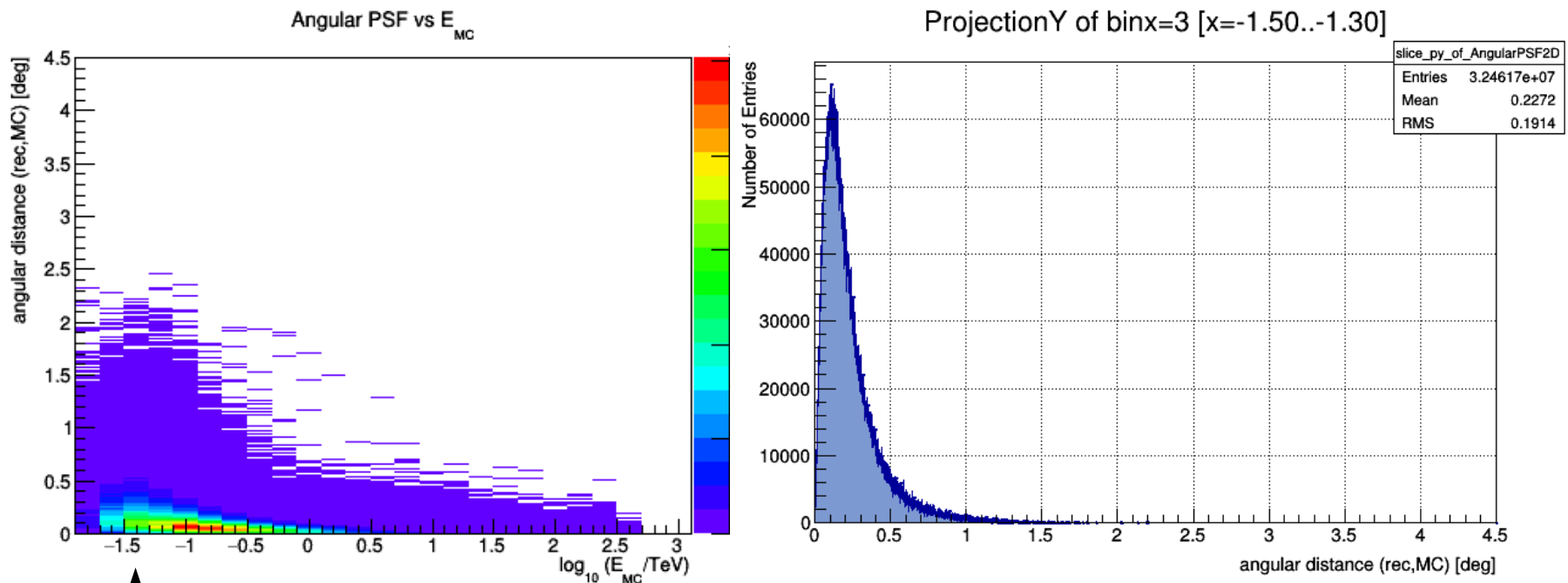
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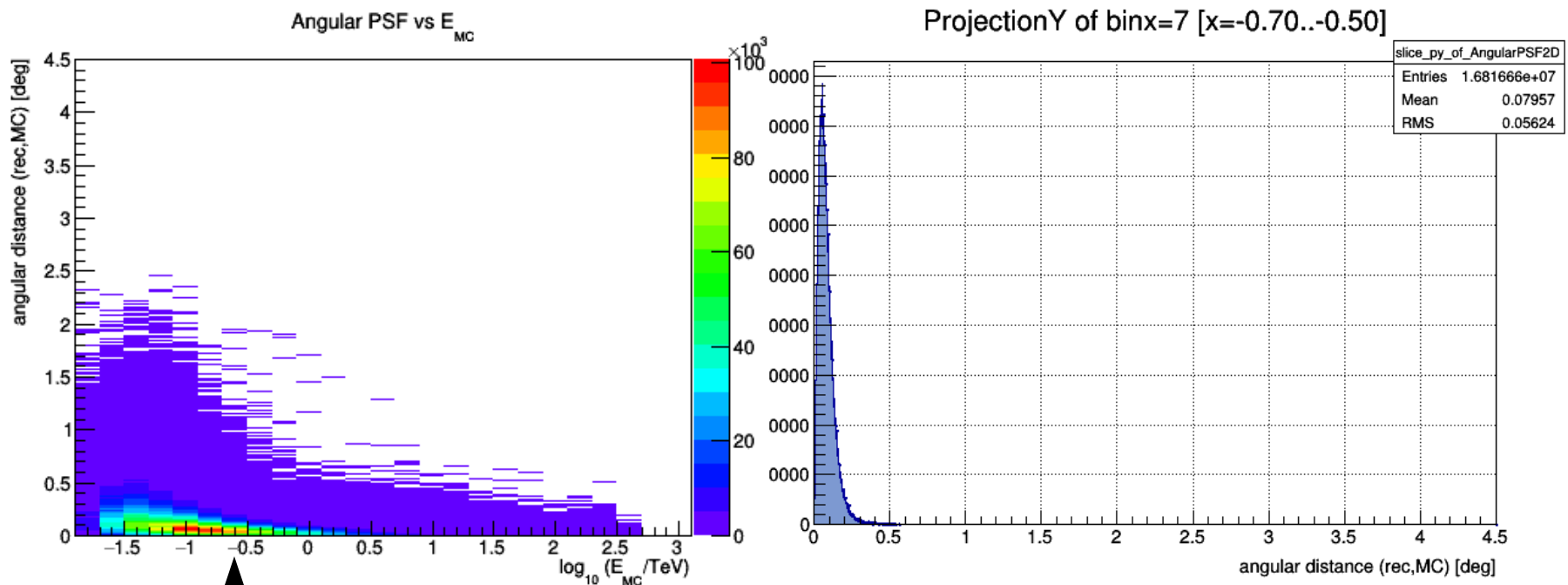
# IACT IRFs – Direction reconstruction

- Direction reconstruction is not perfect either
- To study source morphology, it's crucial to understand our **point spread function** (PSF)



# IACT IRFs – Direction reconstruction

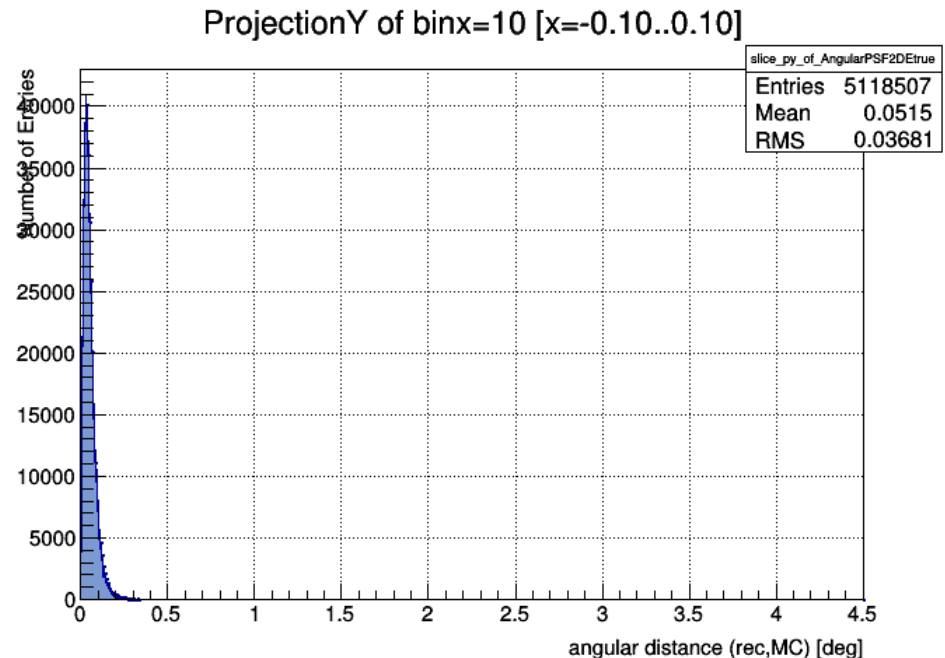
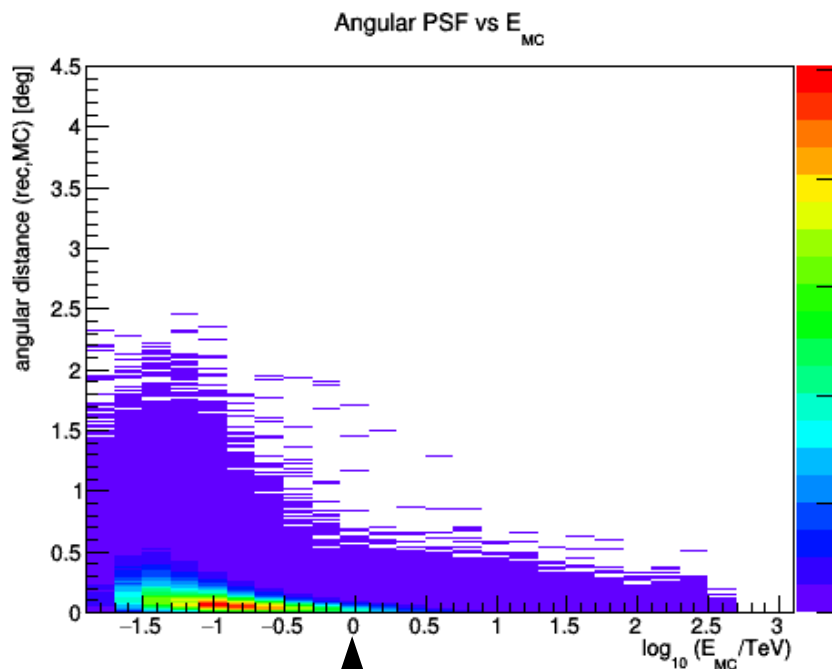
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# IACT IRFs – Direction reconstruction

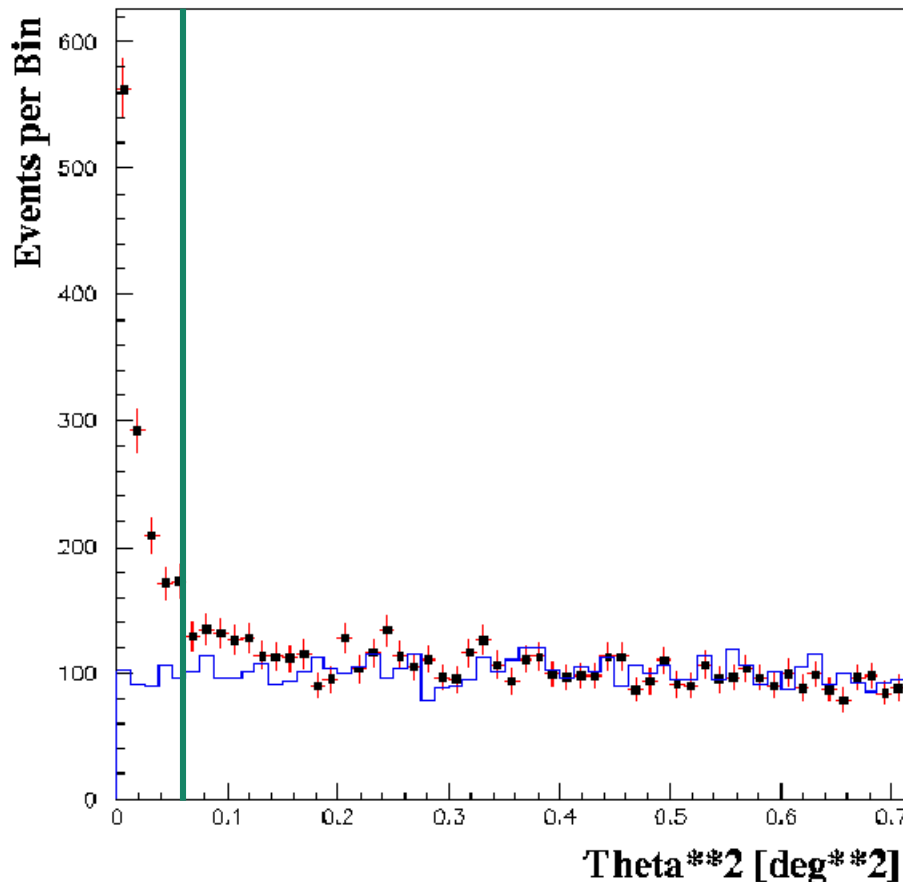
- Direction reconstruction is not perfect either
- To study source morphology, it's crucial to understand our **point spread function** (PSF)



# Analysis in VHE – Spectra

- Applying the same data analysis to our Monte Carlo events:

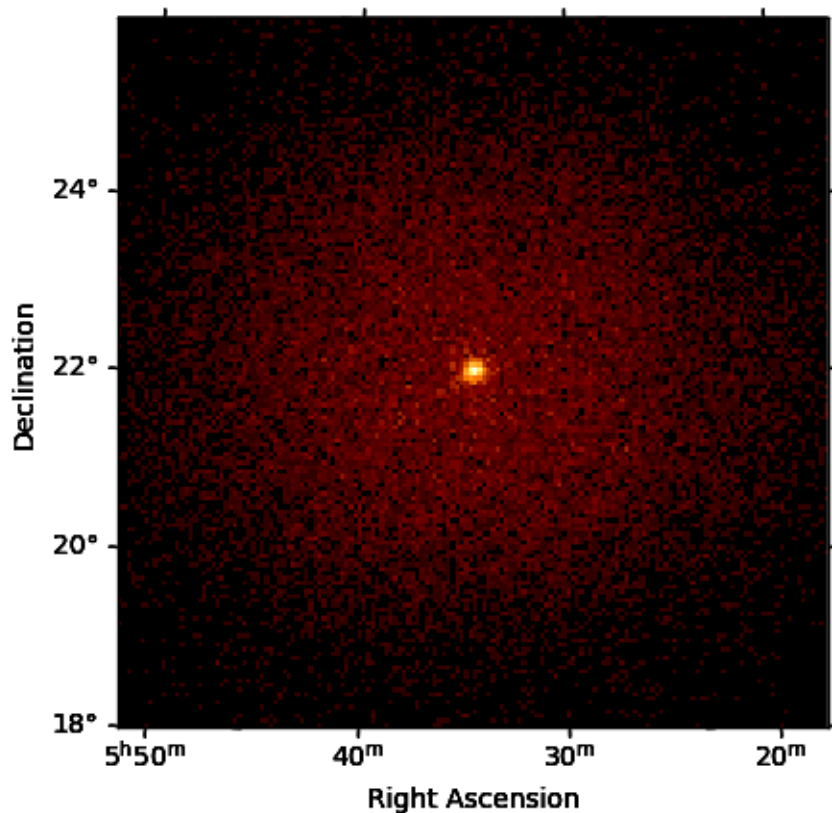
## Crab Nebula (11.7 hours ON)



- Knowing the effective area, we can relate the number of gammas **we detect**, with the number of gammas that were emitted (vs energy)
- Knowing the energy dispersion, we correct the spectrum with the inferred energy migration
- If MC and real data are not matching, **systematic errors** will arise

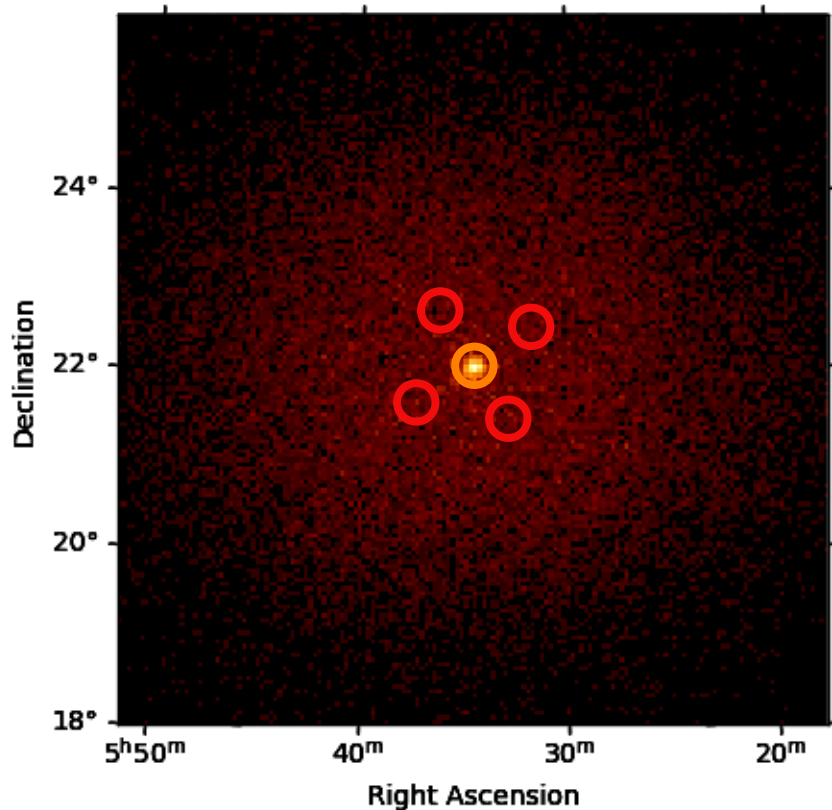
# IACT analysis – Classical spectral analysis

- The classical analysis for the last 20 years goes like this:



# IACT analysis – Classical spectral analysis

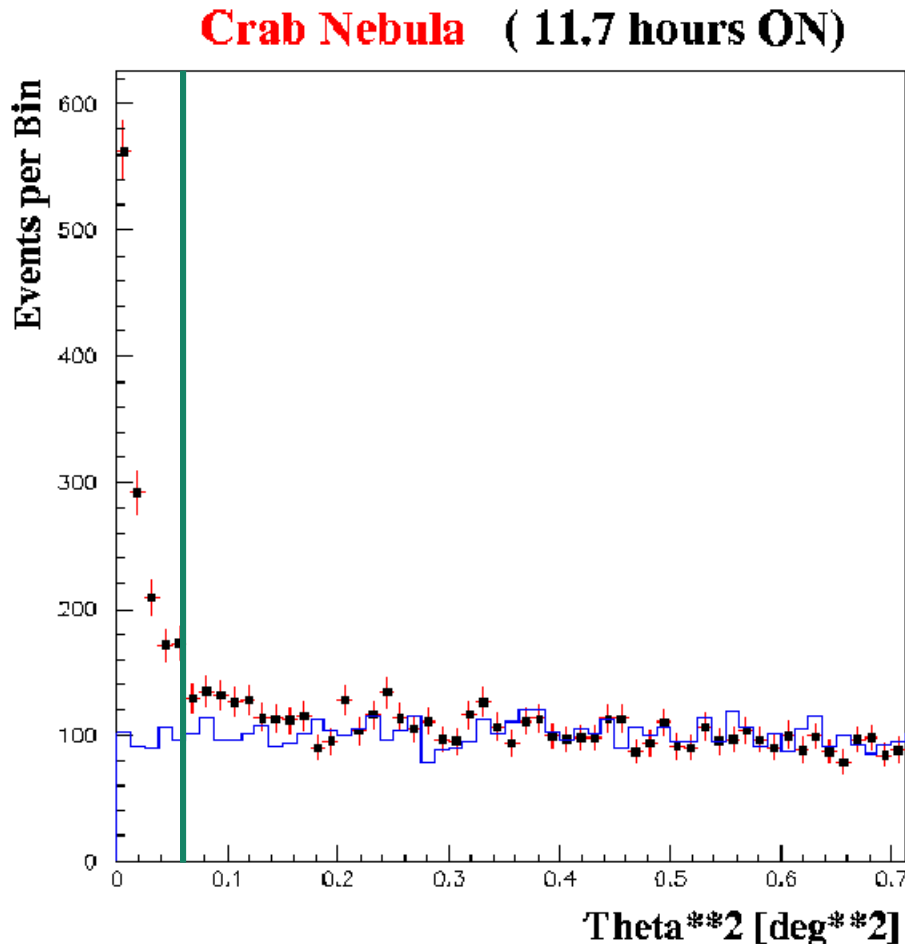
- The classical analysis for the last 20 years goes like this:



- **Fix** ON region, a background evaluation method, and calculate significance

# IACT analysis – Classical spectral analysis

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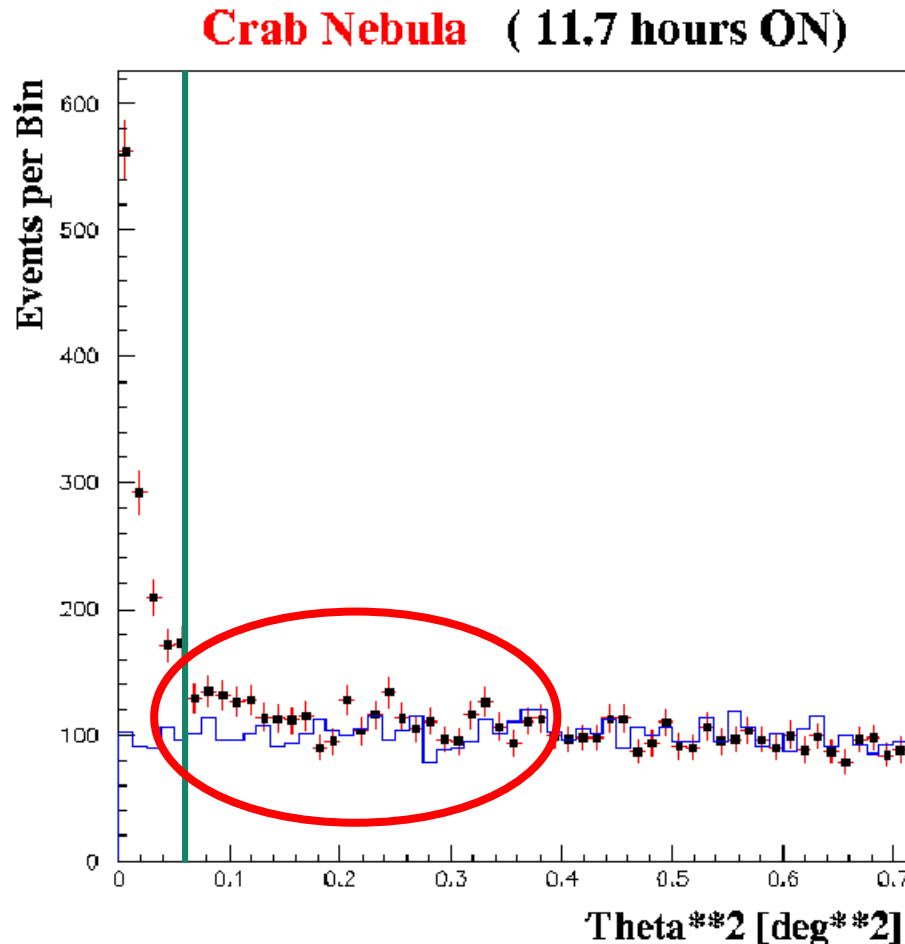


- Fix ON region, a background evaluation method, and calculate significance
- For **that ON region**, calculate IRFs through MC simulations
- With the effective area, we calculate flux vs energy
- With a known energy dispersion, we “correct” the spectrum



# IACT analysis – Classical spectral analysis

- The classical analysis for the last 20 years goes like this:



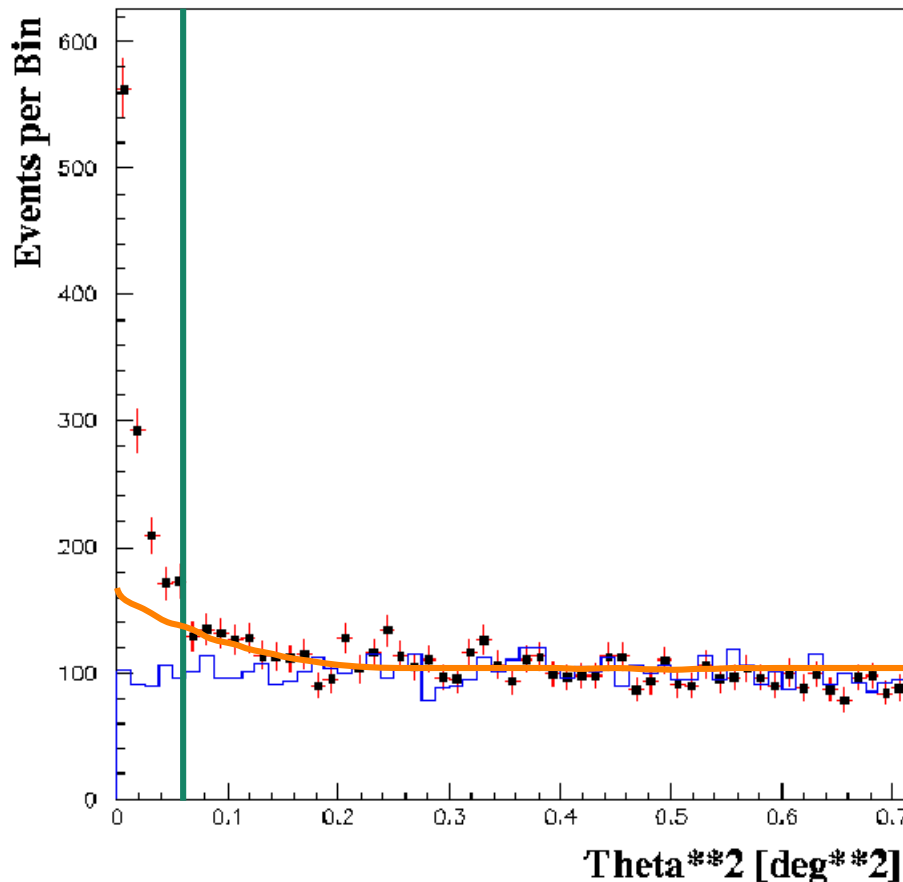
What can we improve?

- By fixing the ON region, we “throw away” the rest
- Ignore the #events vs energy for testing detection significance
- Ignore our **understanding** of our instrument (e.g. the size of the PSF vs energy)

# CTA analysis – Likelihood analysis

- The analysis currently proposed for CTA solved this problem:

**Crab Nebula (11.7 hours ON)**



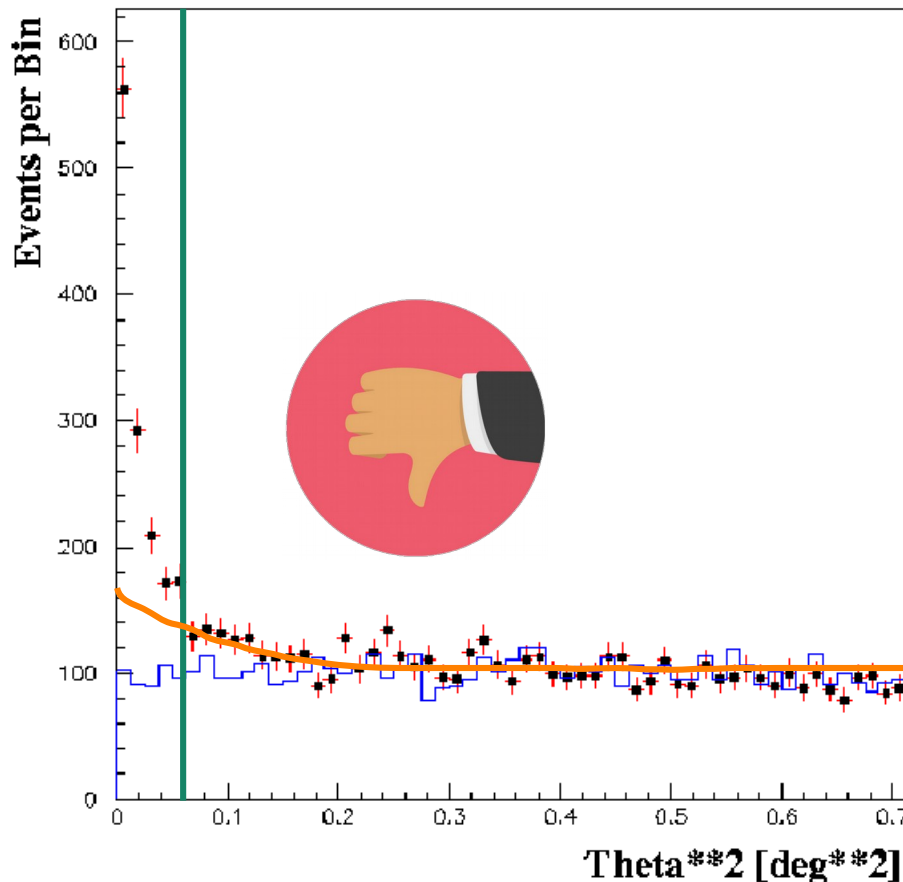
1) Assume a model:  
(e.g. point-like source)

2) **Simulate** the number of  
events + background

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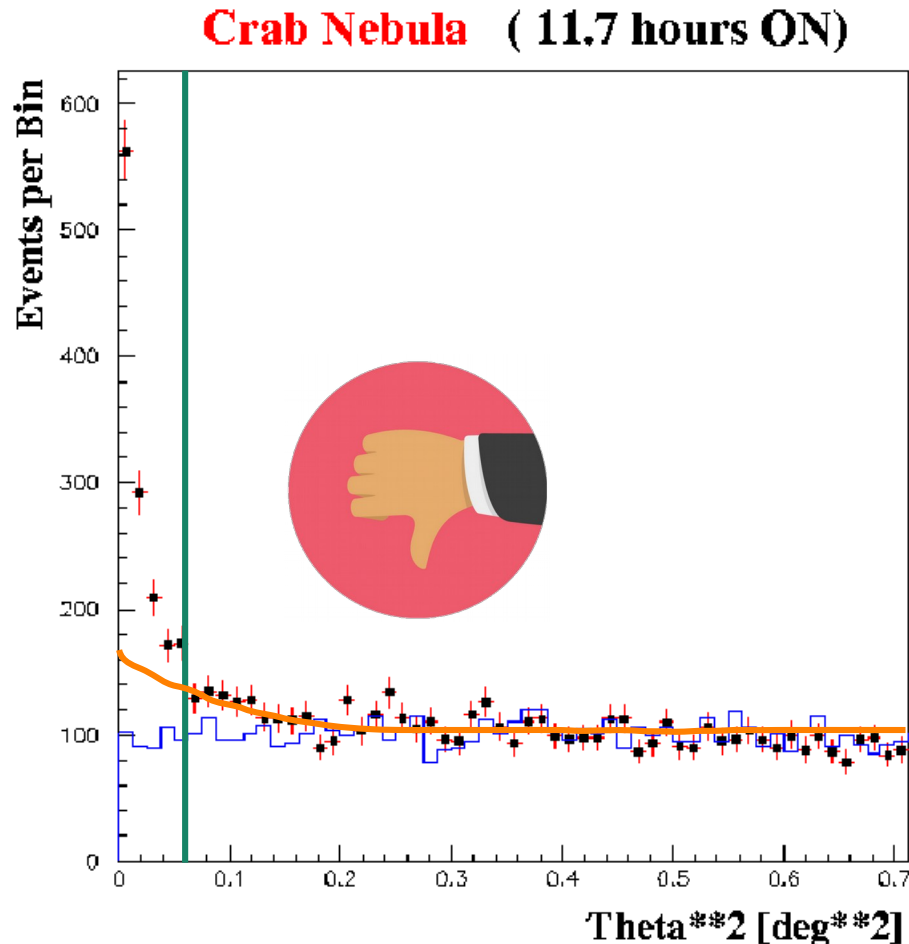
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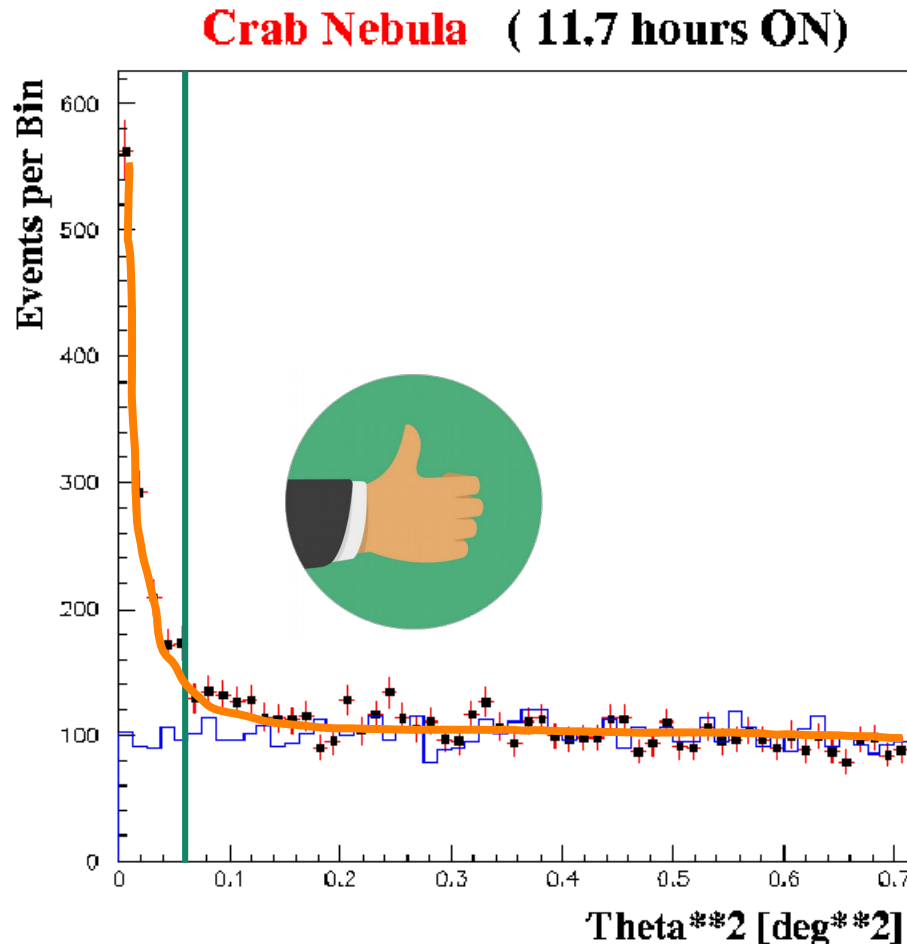


- 1) Assume a model:  
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- 4) Iteratively repeat steps 1, 2 and 3, until you find the model better matching the data



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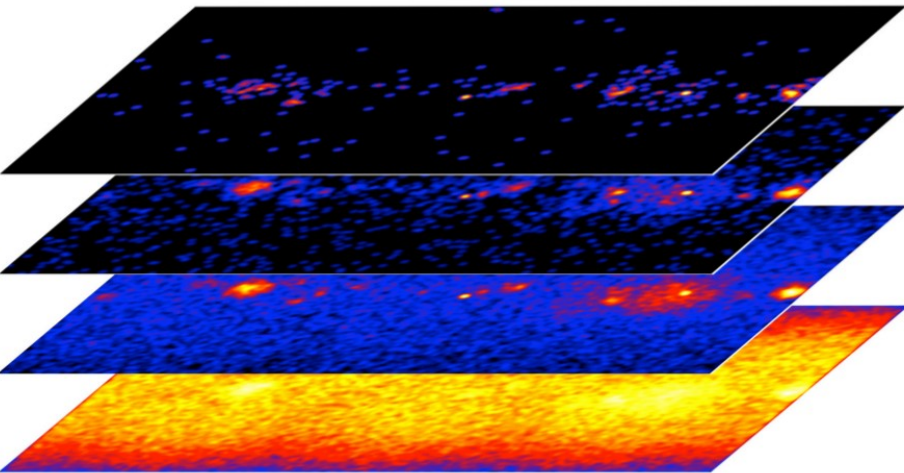


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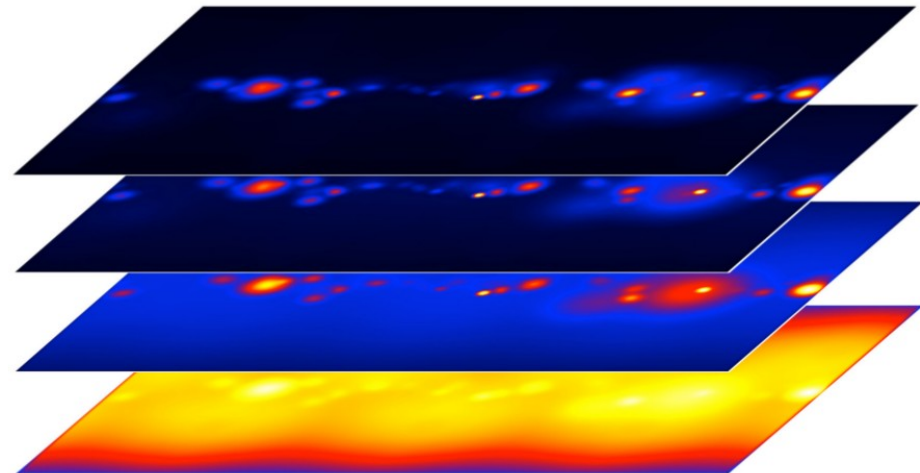
# CTA analysis – Likelihood analysis

- The analysis currently proposed for CTA solved this problem:

Counts cube



Model cube(s)



- Remember: For this analysis, understanding your instrument (correct IRFs) is key!
- Good news: CTA will take care of (almost!) everything

# CTA analysis – Introduction to DL3

- DL3 is the “high-level” product (FITS format) resulting from the analysis of collected data containing:
  - Event lists (event-wise energy, RA, DEC, time) of **gamma-like events**
  - IRFs describing the instrument performance (Eff. Area, BG rate, direction/energy dispersion)
  - TECH data describing details of the observations (pointing, obs. conditions, etc..)

$$\text{DL3} = \text{EVT3} + \text{IRF3} + \text{TECH3}$$

# CTA analysis – Introduction to DL3

DL3

Fermi-LAT

+



By J. Knödlseider et al.

Science tools



By C. Deil et al.

Data Selection

Light Curves  
Counts Maps  
Spectra

Likelihood  
Analysis

Timing  
Analysis

# IACTs high-level analysis – Summary

- The high-level analysis of IACTs comprises all the methods used to study source properties from the measured (reconstructed) events:
  - Source detection, skymaps and studying morphology, spectra, lightcurves...
- The high-level analysis planned for CTA is similar to other operating instruments (X-rays and gamma-rays)
- The main differences:
  - Very limited event statistics (every photon is important!)
  - Instrument with time evolving performance





