

CTAO

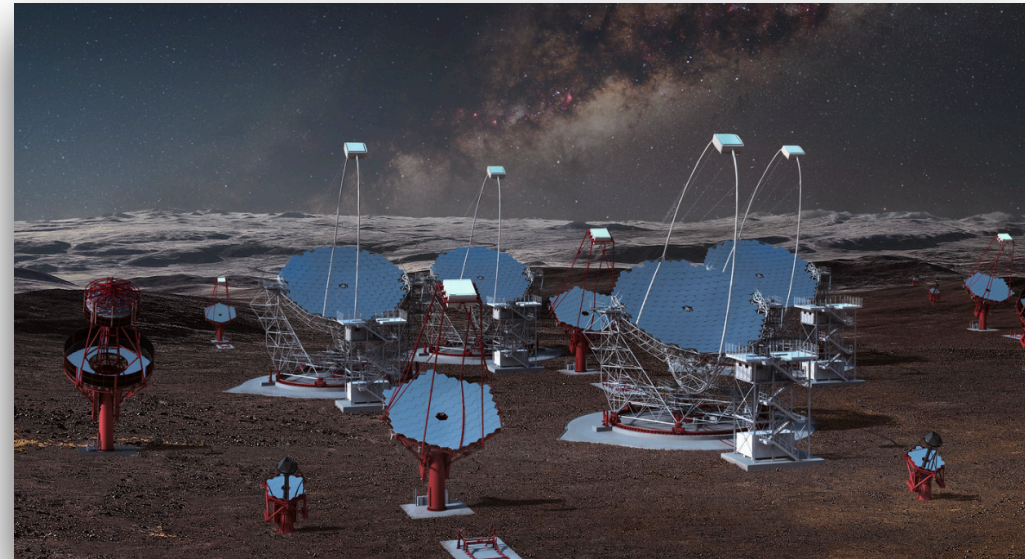
# IACT Fundamentals & Air Showers

Kathrin Egberts, University of Potsdam



# Who am I?

- Since 2005 H.E.S.S. member, since 2009 CTAO member
- Main passion: complex data analyses at the detection threshold
- Scientific focus: Galactic science, diffuse phenomena, cosmic rays, population synthesis
- Development of the software component responsible for transient follow-up observations with CTAO



# Outline

## **Day 1: Introduction**

- Basic considerations
- Detection principles
- Development of the field

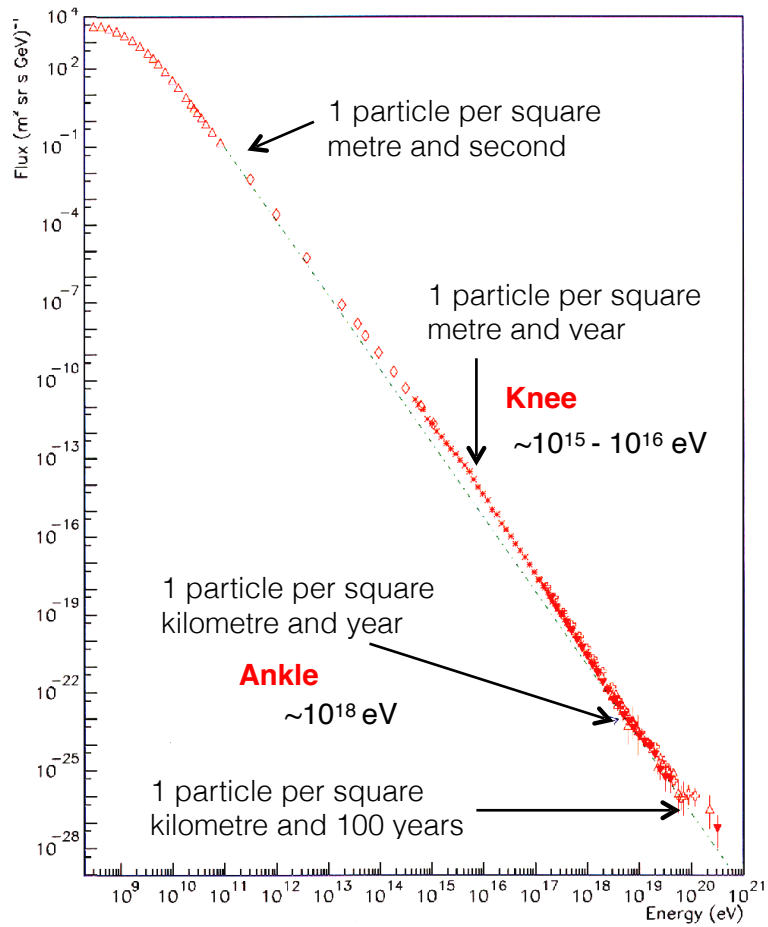
## **Day 2: Everything about Air Showers**

- Particle interactions in matter
- Electromagnetic & hadronic air showers
- Air-shower simulations

## **Day 3: IACTs**

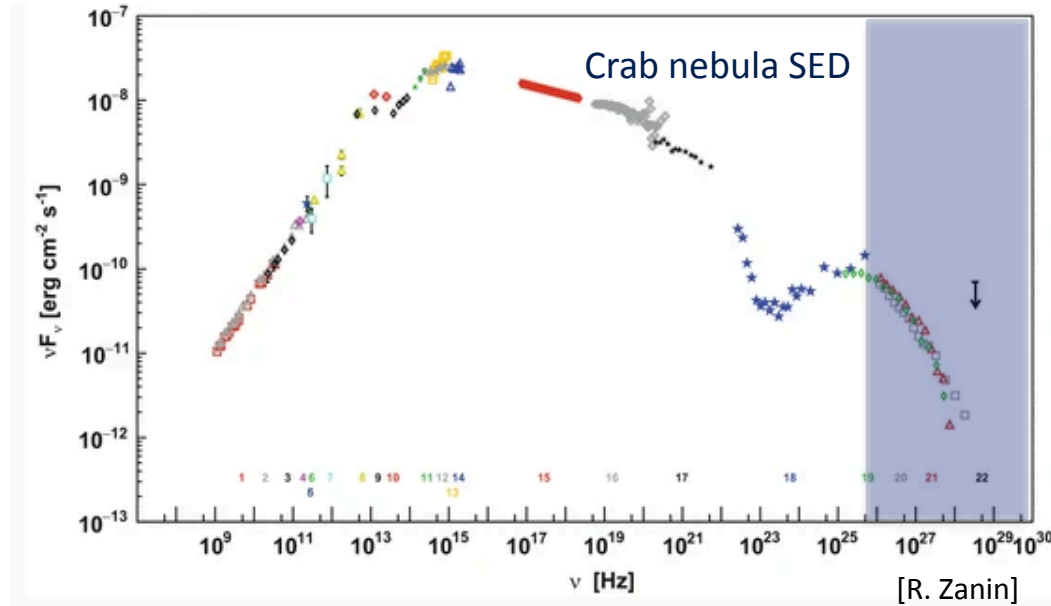
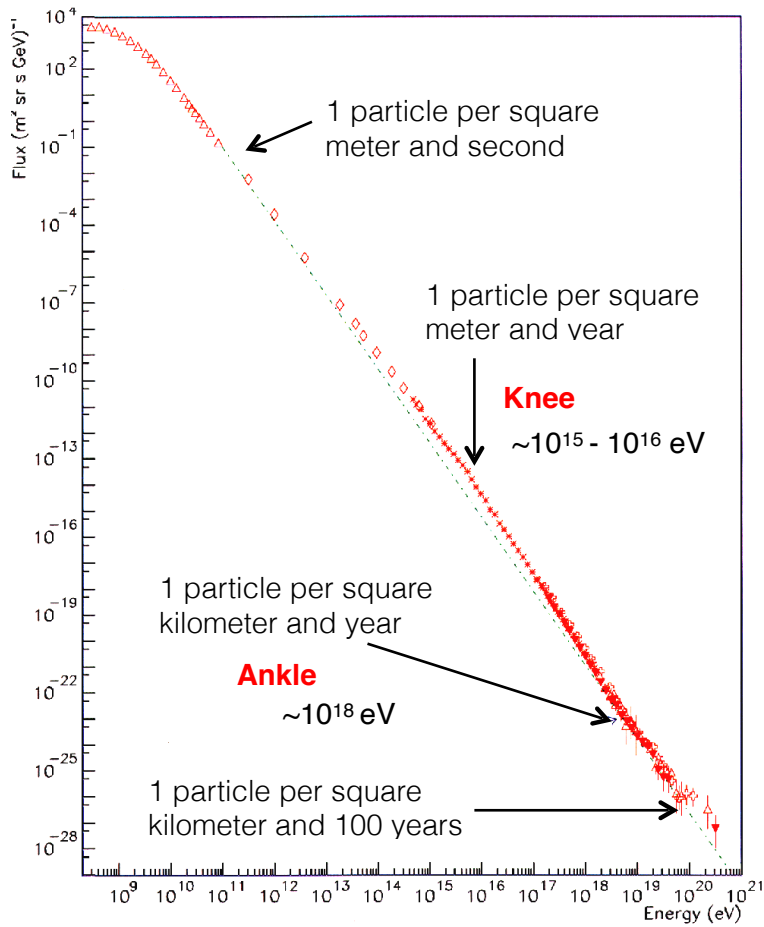
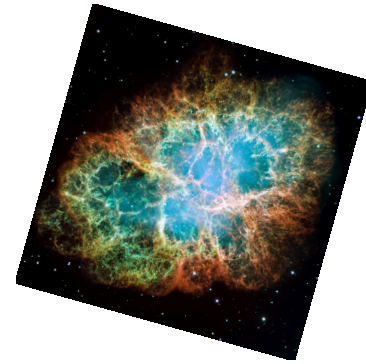
- The IACT principle
- Gamma-hadron separation & backgrounds
- Current and future instruments & their sensitivities

# Fluxes & Counts



$$\Phi = \frac{d^4 N}{dA dt dE d\Omega} = C \left( \frac{E}{E_0} \right)^{-\alpha}$$

# Fluxes & Counts



- spectral energy distribution (SED): energy flux per decade of energy

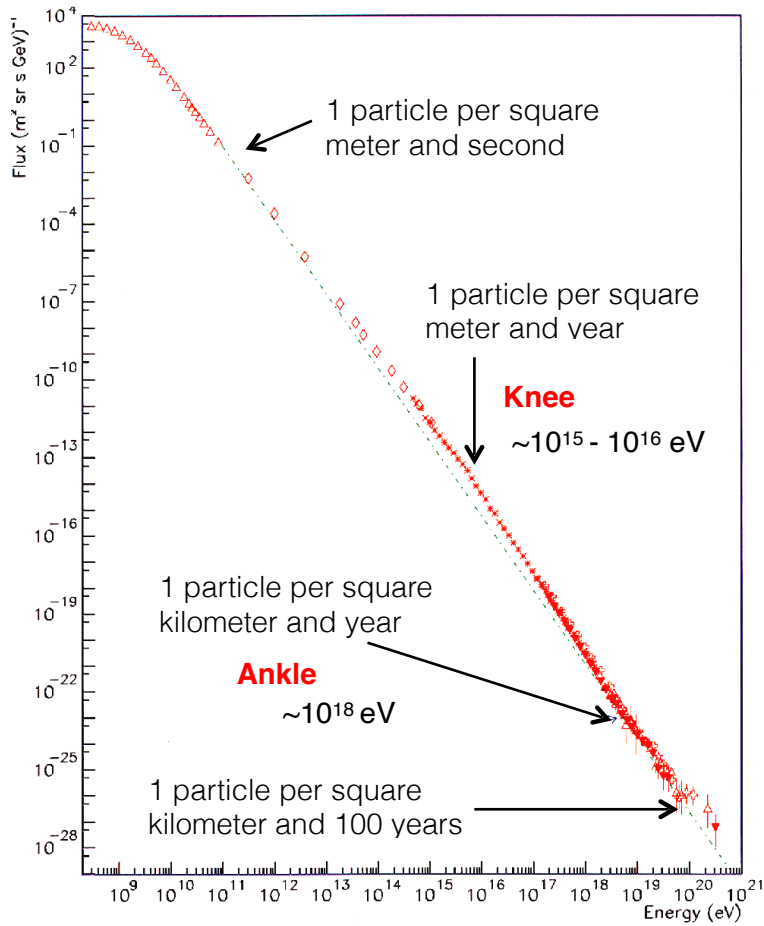
$$E^2 \frac{dN}{dE} = E \frac{dN}{d \log E}$$

- sometimes also written as

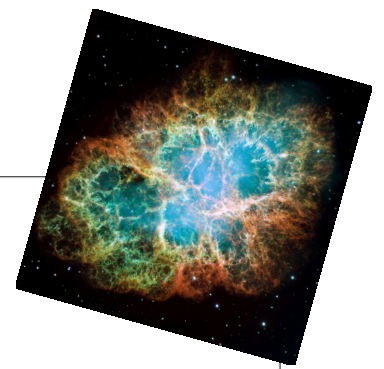
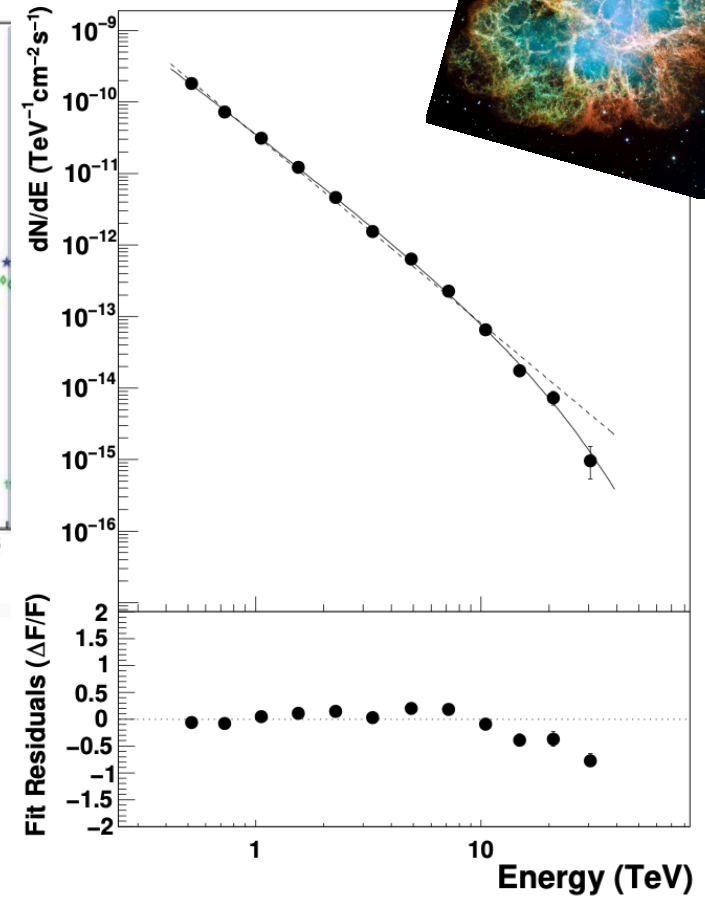
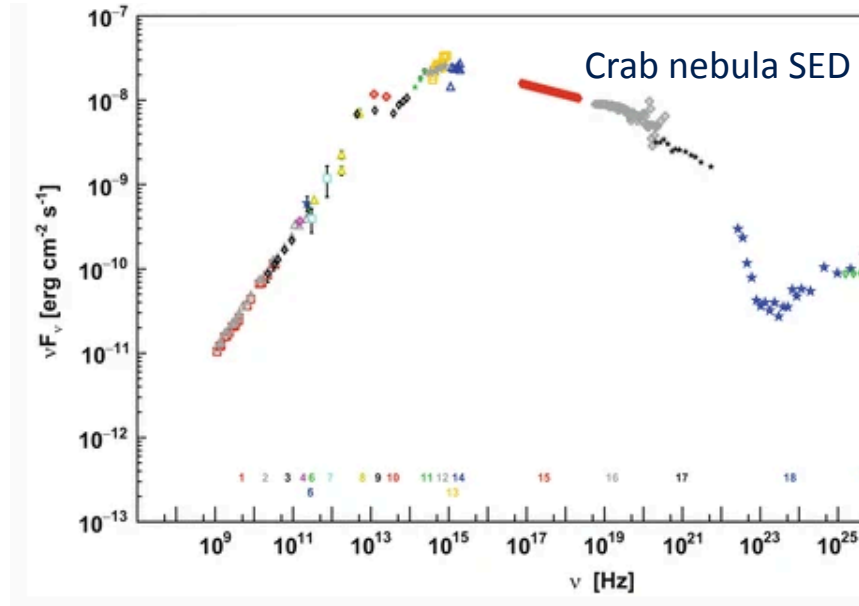
$$\nu F_\nu(\nu) = \nu \frac{dE}{d\nu}$$

$$\Phi = \frac{d^4 N}{dA dt dE d\Omega} = C \left( \frac{E}{E_0} \right)^{-\alpha}$$

# Fluxes & Counts



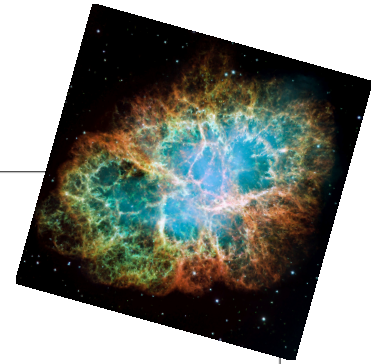
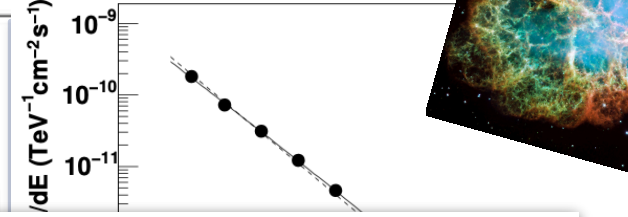
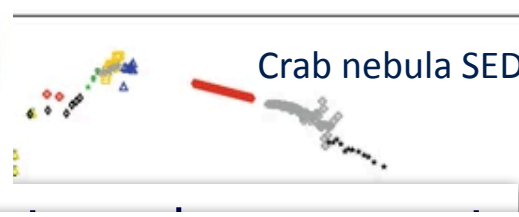
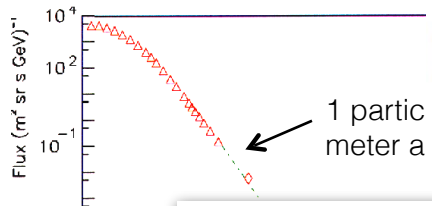
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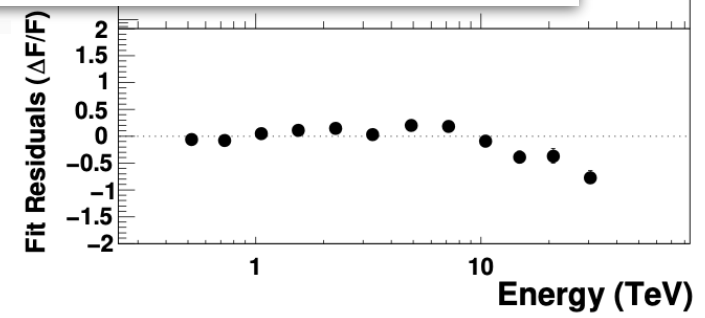
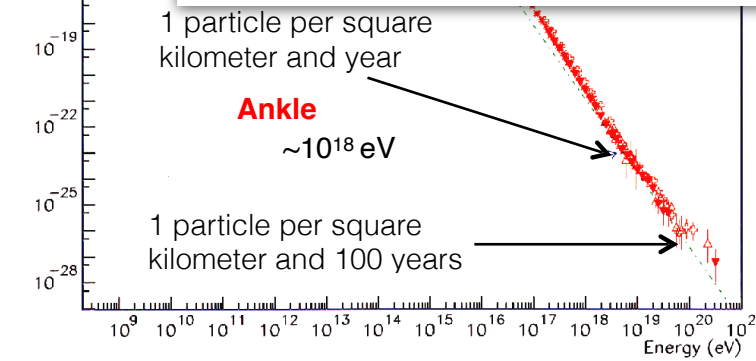
$$\Phi = \frac{d^3 N}{dA dt dE} = C \left( \frac{E}{E_0} \right)^{-\alpha}$$

# Fluxes & Counts

**YOUR TURN**



**How many photons do we see at 1 TeV? How many at 10 TeV?**  
**For simplicity, consider a pure power law with  $C = 3.45 \cdot 10^{-11} \text{ cm}^{-2} \text{ s}^{-1} \text{ TeV}^{-1}$  and spectral index 2.6**



$$\Phi = \frac{d^4 N}{dA dt dE d\Omega} = C \left( \frac{E}{E_0} \right)^{-\alpha}$$

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# Fluxes & Counts

**YOUR TURN**



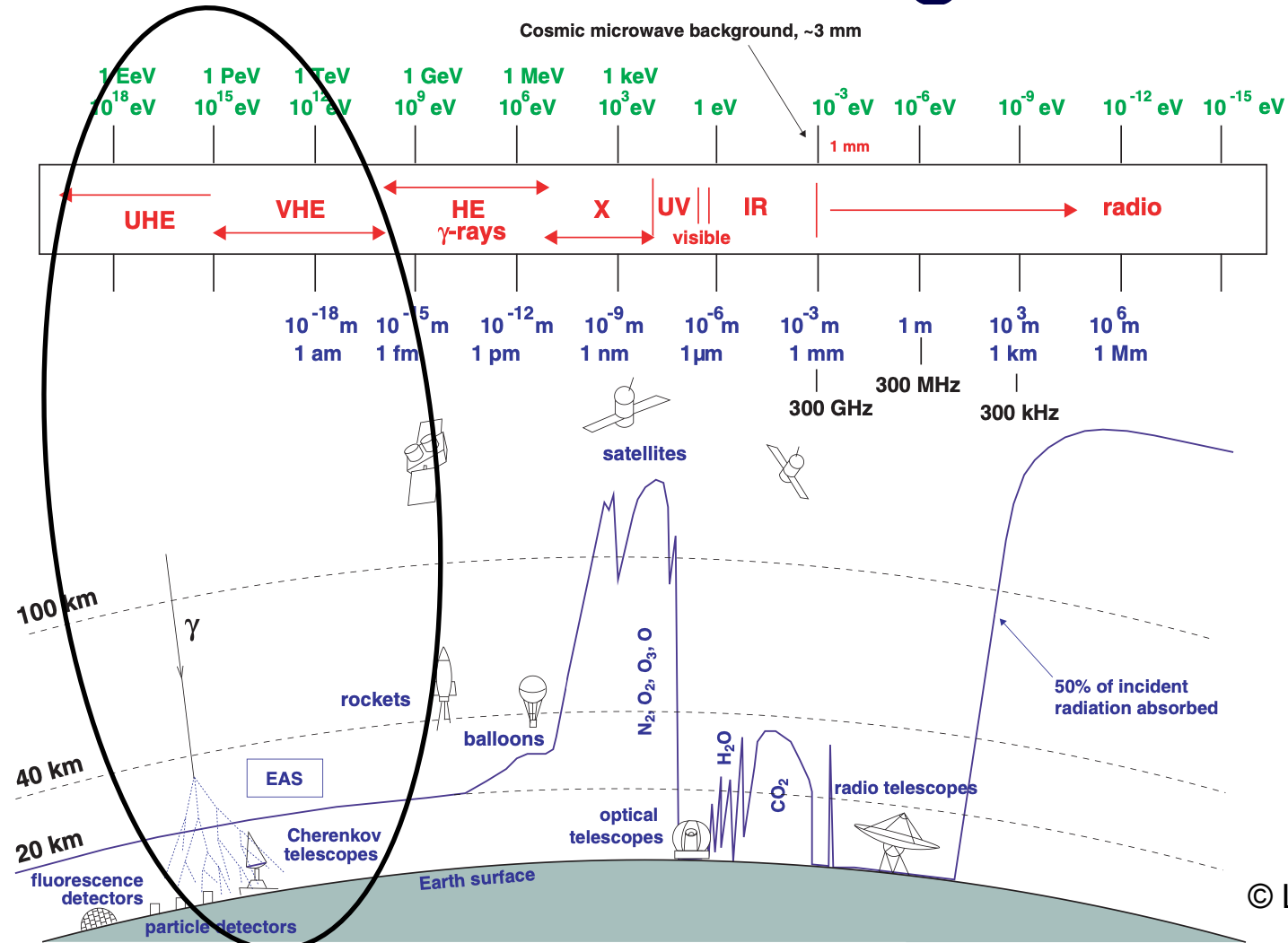
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**For simplicity, consider a pure power law with  $C = 3.45 \cdot 10^{-11} \text{ cm}^{-2} \text{ s}^{-1} \text{ TeV}^{-1}$  and spectral index 2.6**

- at 1 TeV:  $\sim 0.03$  photons per square metre and day / 1 photon per square metre and month!
- at 10 TeV:  $\sim 0.0001$  photons per square metre and day
- in comparison, a CR proton has  $C \sim 10^{-5} \text{ cm}^{-2} \text{ s}^{-1} \text{ sr}^{-1} \text{ TeV}^{-1}$ , giving 10 000 particles per square metre and day
- within 0.1 deg radius: 0.1 particle per square metre and day

→ Requires large detectors

# Absorption in the Electromagnetic Spectrum



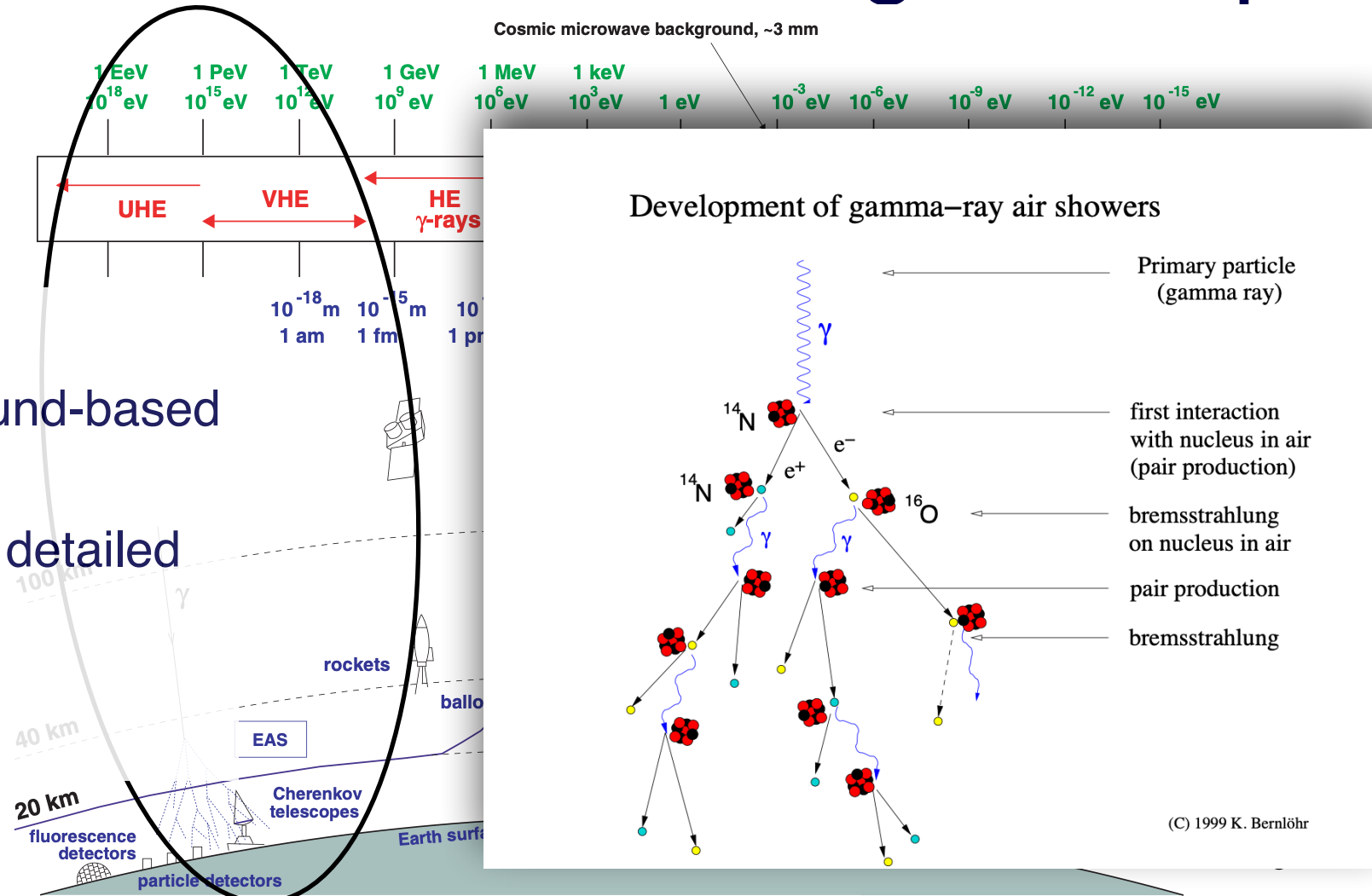
© Longair

low fluxes + absorption in the atmosphere = indirect measurements via air showers

# Absorption in the Electromagnetic Spectrum

## Air Showers

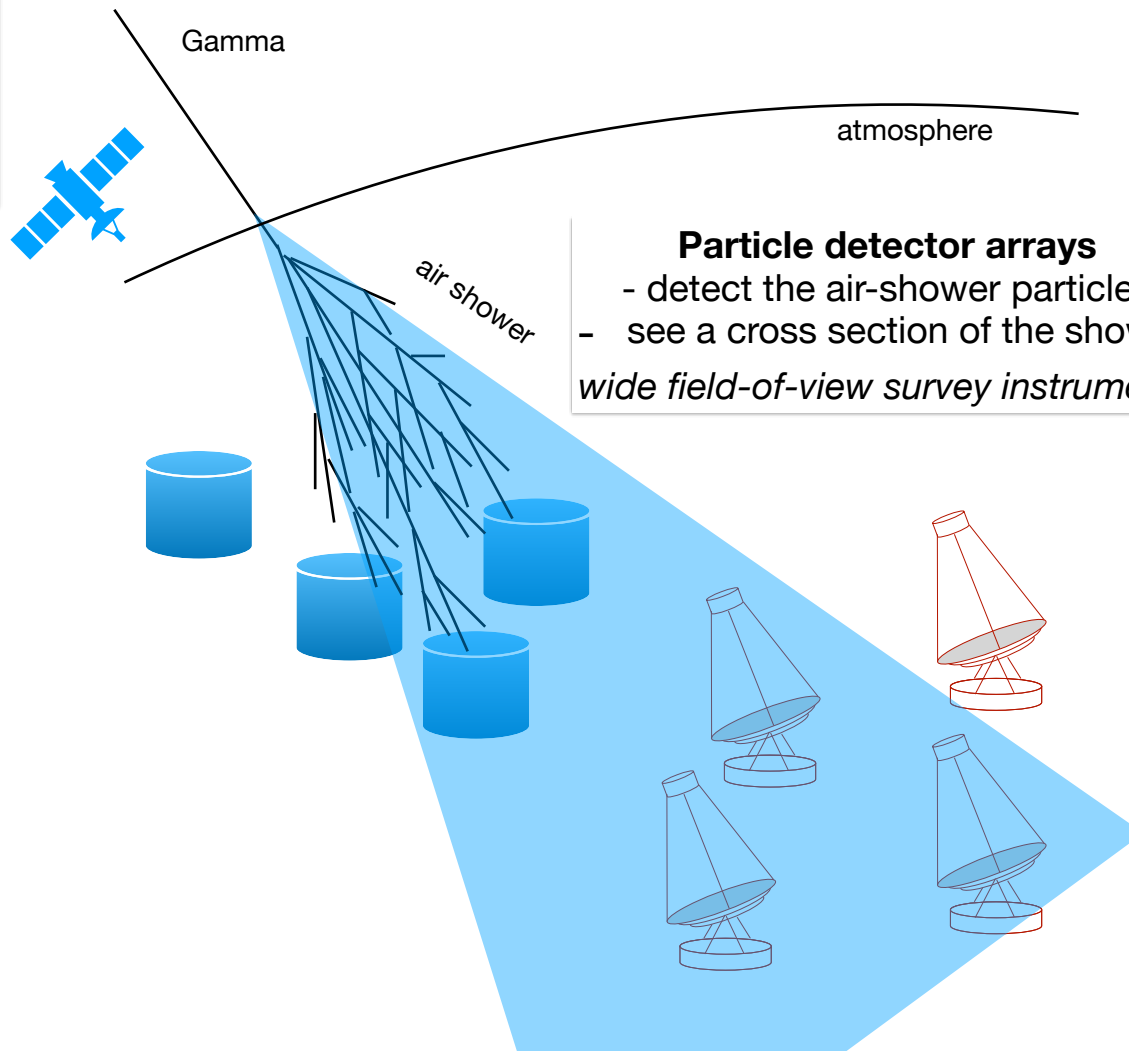
- Crucial for ground-based measurements
- We will have a detailed look tomorrow



low fluxes + absorption in the atmosphere = indirect measurements via air showers

# Measurement Principles & Instruments

**Satellite instruments**  
- direct detection  
- excellent particle ID and energy reconstruction  
*lower energies up to ~1 TeV*



**Particle detector arrays**  
- detect the air-shower particles  
- see a cross section of the shower  
*wide field-of-view survey instruments*

**Imaging atmospheric Cherenkov telescopes (IACTs)**  
- detect the Cherenkov light of the shower  
- see the entire shower  
*pointed precision instruments*

# Two Techniques for Ground-Based Observations

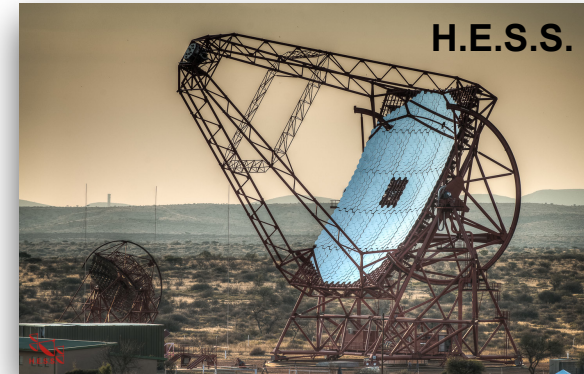


## Particle Detector Arrays

Cherenkov light in water

24/7 observations

observation of full sky above detector



## Imaging Atm. Cherenkov Telescopes

Cherenkov light in atmosphere

(moon-less) night observations

pointed observations

# Two Techniques for Ground-Based Observations



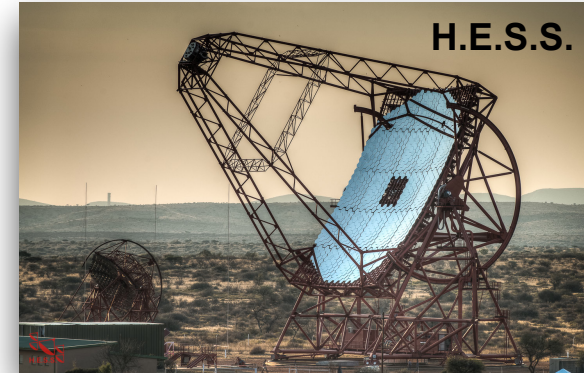
## Particle Detector Arrays

Angular resolution of  $\sim 0.5$  deg

Wide fields of view

Large duty cycle

Survey instruments at somewhat higher energies



## Imaging Atm. Cherenkov Telescopes

Angular resolution of  $\lesssim 0.1$  deg

Small fields of view

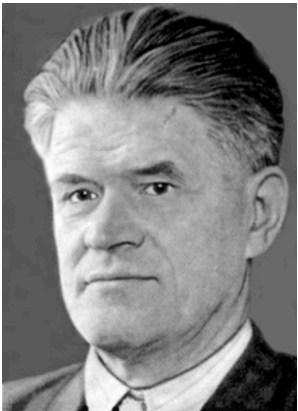
Larger instantaneous sensitivity  
(put into perspective by small FoV  
and low duty cycle)

Pointed precision instruments with somewhat lower energy threshold

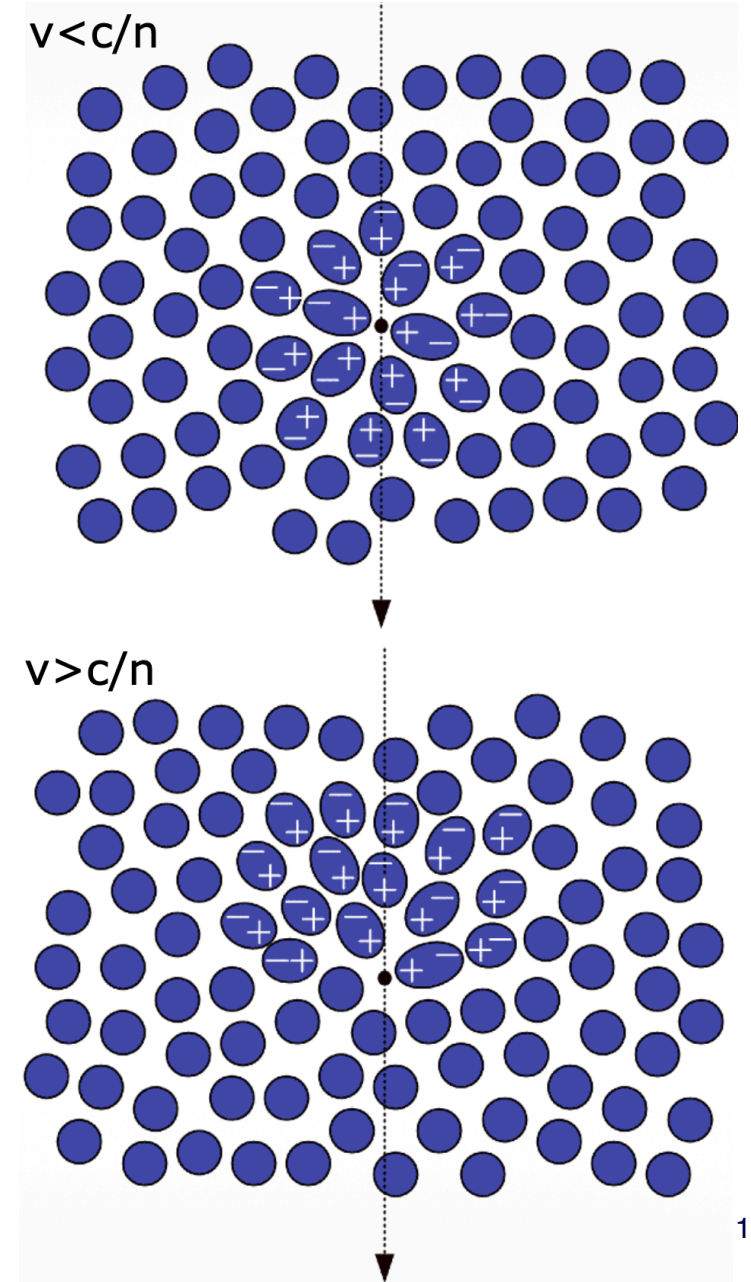
**Very strong complementarity!**

# Cherenkov Radiation

- A charged particle moves faster than the speed of light through a dielectric medium ( $c_n = c/n$ )
- Atoms get polarised. These atoms emit photons when they return to the ground state
- When the particle moves quickly, the polarisation is not symmetrical along the axis of motion, resulting in constructive interference



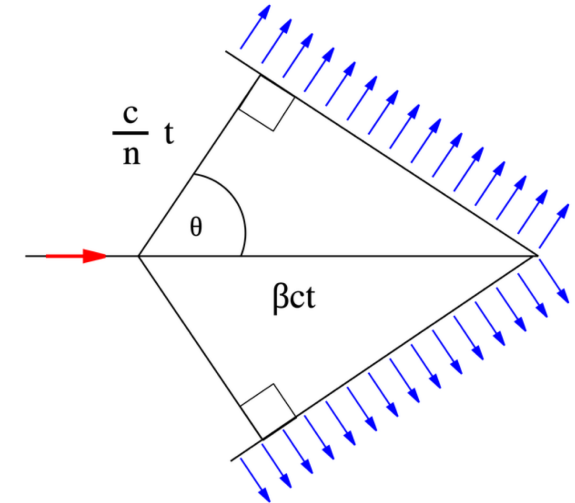
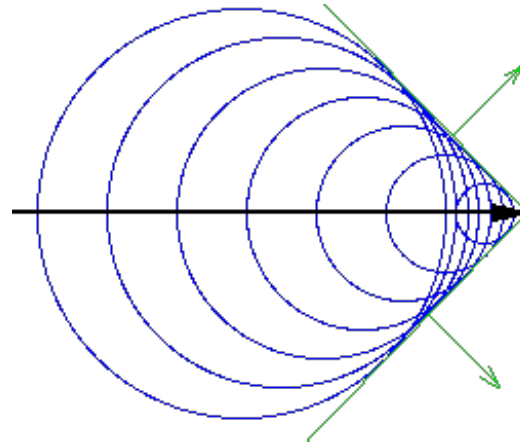
Pavel Alexeyevich Cherenkov  
(Nobel Prize in 1958)



# Cherenkov Radiation

- Charged particle moving with  $v > c/n$  emits Cherenkov light
- Emission angle:

$$\cos \theta_c = \frac{1}{n\beta}$$



- Charged air-shower particles can emit Cherenkov light either in the **air** or in a suitable medium like **water**
- $\theta_c \sim 1^\circ$  in air,  $\sim 40^\circ$  in water



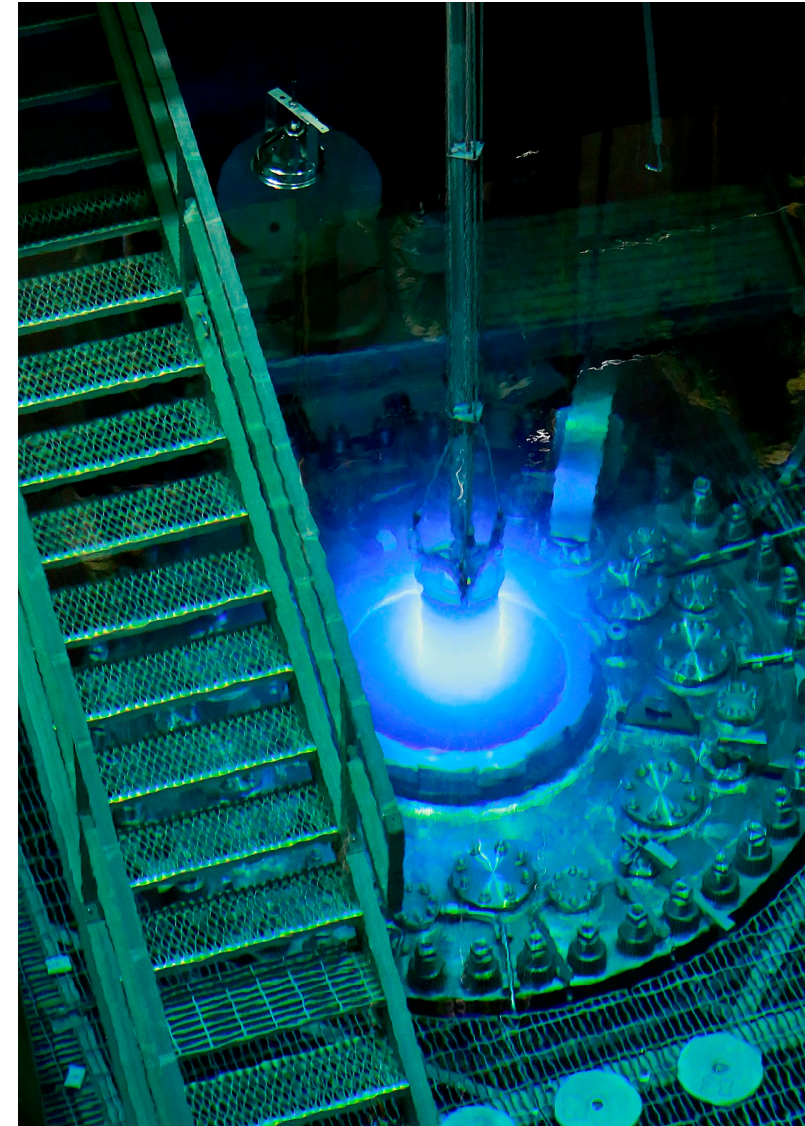
optical equivalent to sonic boom

# Cherenkov Radiation

- Dominated by small wavelengths  
→ blue light

$$\frac{d^2 N}{dx d\lambda} \propto \lambda^{-2}$$

- No emission in X-rays because refractive index depends on wavelength



# Cherenkov Radiation in the Atmosphere

Refractive index changes with altitude  $h$ :

$$n = 1 + 0.000283 \rho(h)/\rho(0)$$



**What is the threshold for Cherenkov emission for electrons at sea level ( $h = 0$  m)? Consider that to emit Cherenkov radiation, the electrons have to move faster than the speed of light in the medium ( $c_n = c/n$ ).**

# Cherenkov Radiation in the Atmosphere

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$$n = 1 + 0.000283 \rho(h)/\rho(0)$$



**What is the threshold for Cherenkov emission for electrons at sea level ( $h = 0$  m)? Consider that to emit Cherenkov radiation, the electrons have to move faster than the speed of light in the medium ( $c_n = c/n$ ).**

$$\beta = \frac{v}{c} = \frac{c/n}{c} = 1/n$$

$$\gamma = \sqrt{\frac{1}{1 - \beta^2}}$$

$$E = \gamma m_0 c^2 = 42 * 0.511 MeV \approx 20 MeV$$

At sea level, the threshold is  $E = 20$  MeV

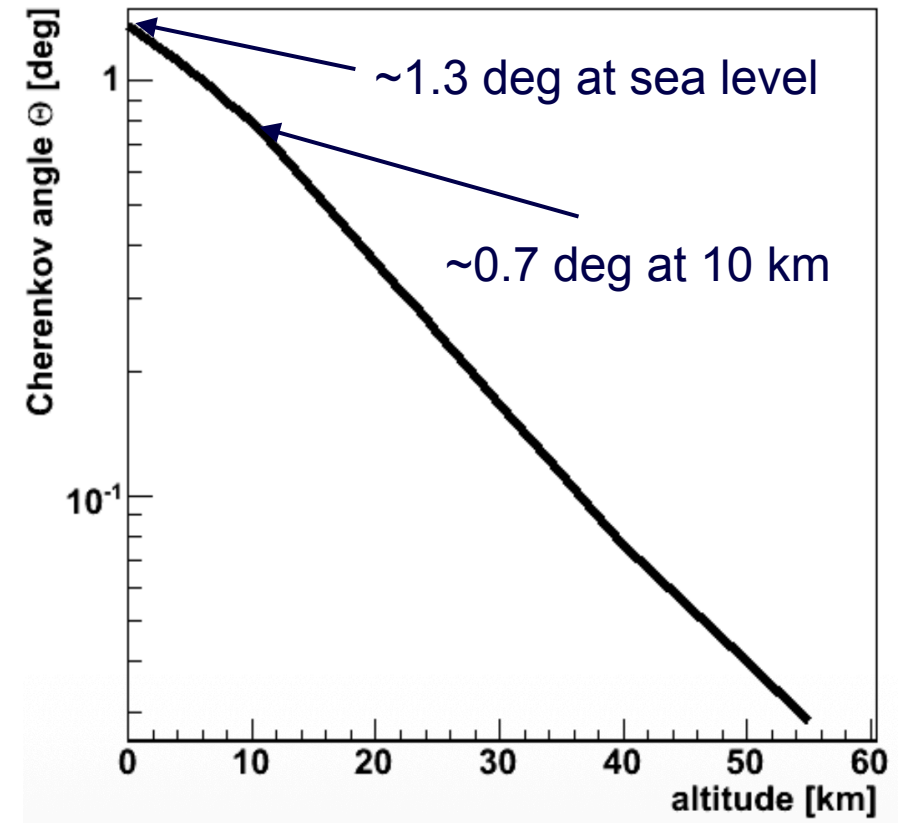
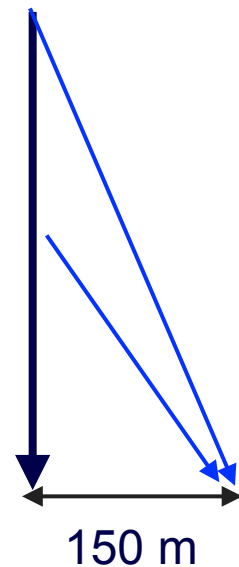
At 10 km height (where we have our air showers): 40 MeV

# Cherenkov Radiation in the Atmosphere

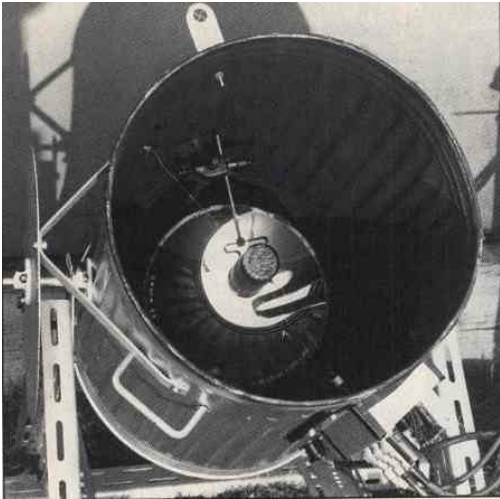
Opening angle changes due to density changes in the atmosphere

$$n = 1 + 0.000283 \rho(h)/\rho(0)$$

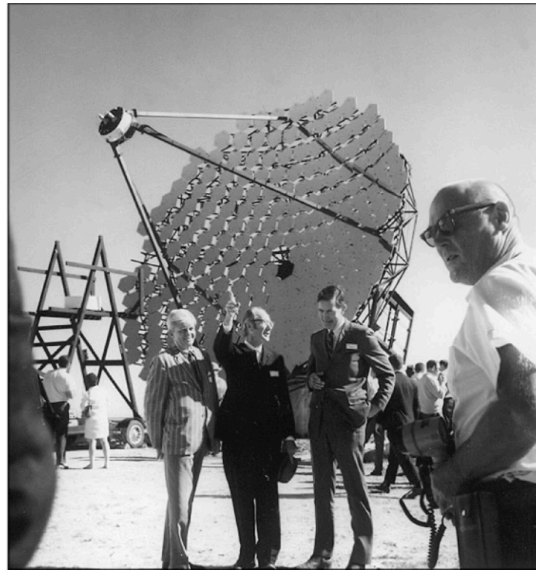
charged particle



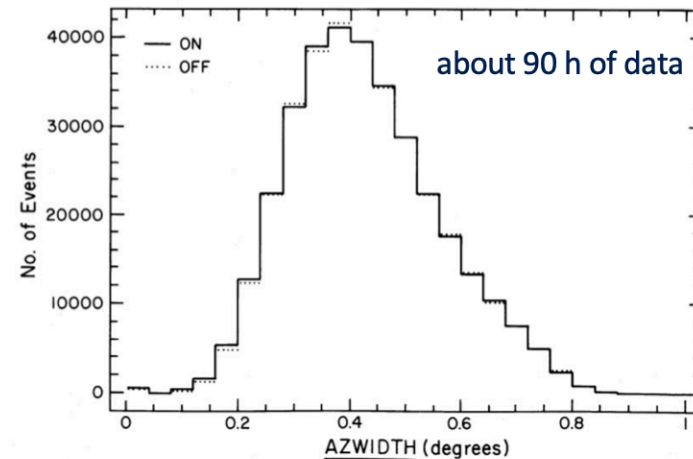
# The Beginning...



**1953:** with a garbage can and a 60 cm  $\emptyset$  mirror first measurement of atmospheric Cherenkov light

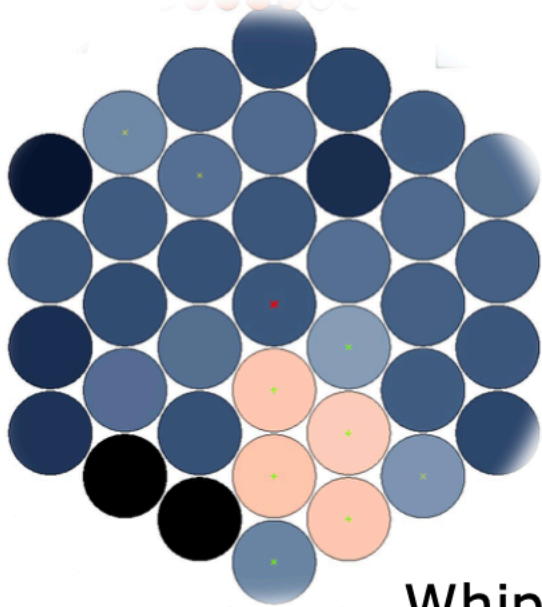


**1968:** Whipple telescope (10 m  $\emptyset$  mirror)

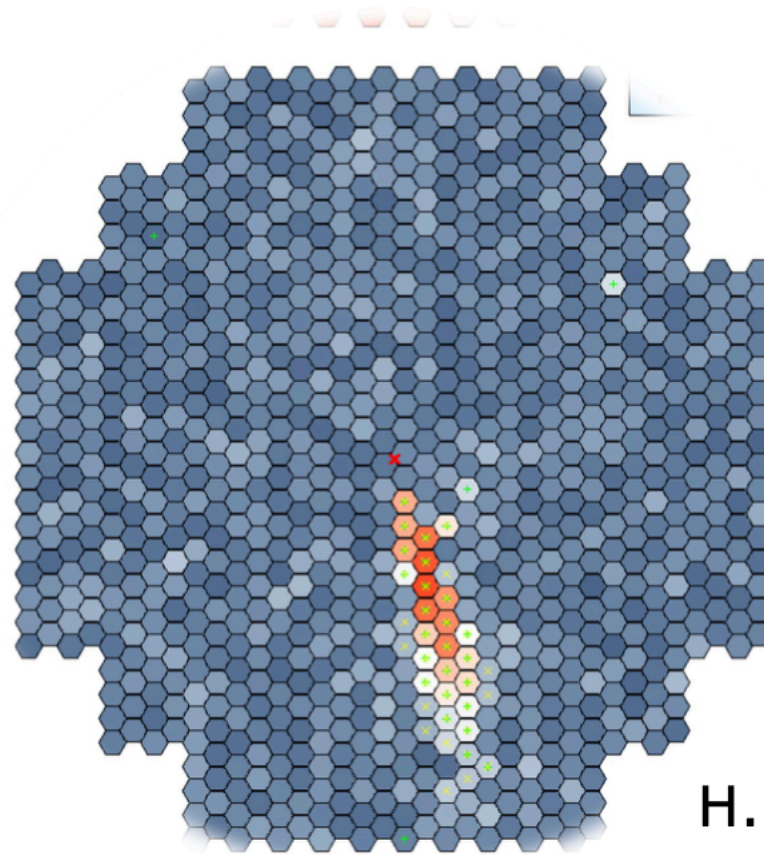


**1989:** First detection of the Crab nebula at  $5\sigma$

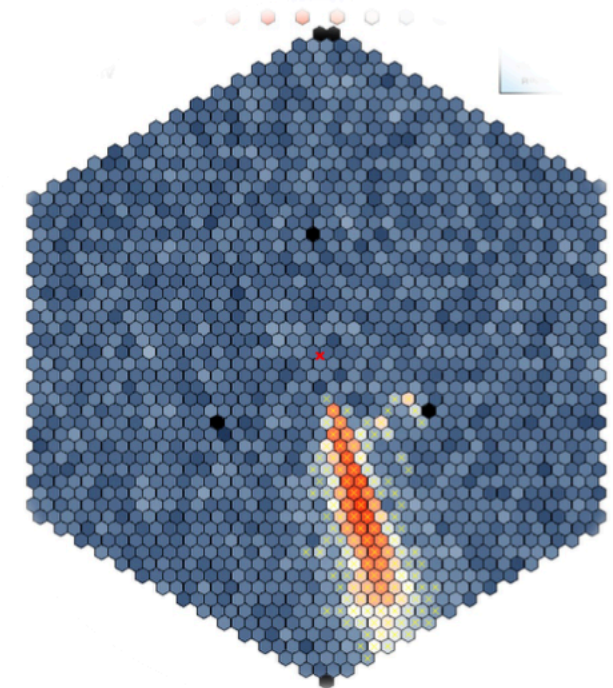
# Technology Advances



Whipple  
1989



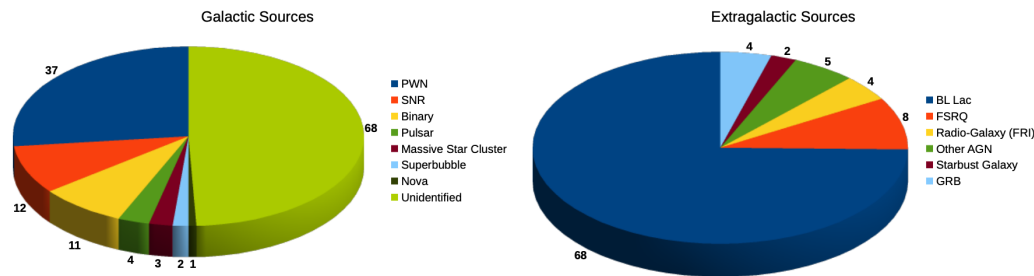
H.E.S.S. I



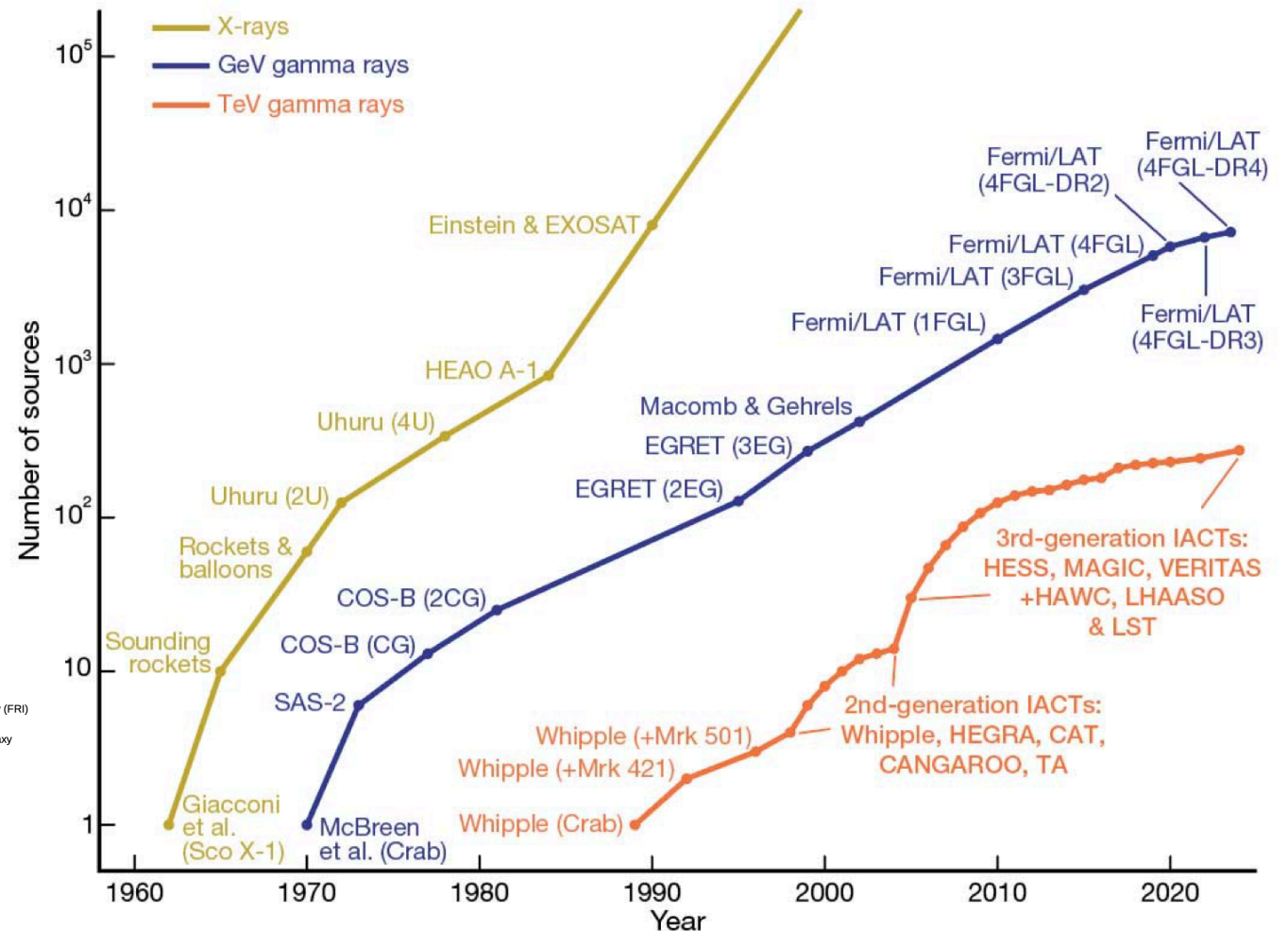
H.E.S.S. II

from K. Bernlöhner

# Rapid Development in the Past Years



with a large variety in sources!



# Outline

## **Day 1: Introduction**

- Basic considerations
- Detection principles
- Development of the field

## **Day 2: Everything about Air Showers**

- Particle interactions in matter
- Electromagnetic & hadronic air showers
- Air-shower simulations

## **Day 3: IACTs**

- The IACT principle
- Gamma-hadron separation & backgrounds
- Current and future instruments & their sensitivities

# Particle Interactions in Matter

Particle interactions give rise to

- change of energy
- change of direction
- secondary particles

# Particle Interactions in Matter

## Interactions with electrons (atomic shell):

- Ionisation:  $\mu^- + \text{atom} \rightarrow \mu^- + \text{atom}^+ + e^-$  **energy loss**
- Excitation:  $\mu^- + \text{atom} \rightarrow \mu^- + \text{atom}^*$  **scintillation light emission**  
 $\text{atom}^* \rightarrow \text{atom} + \gamma$

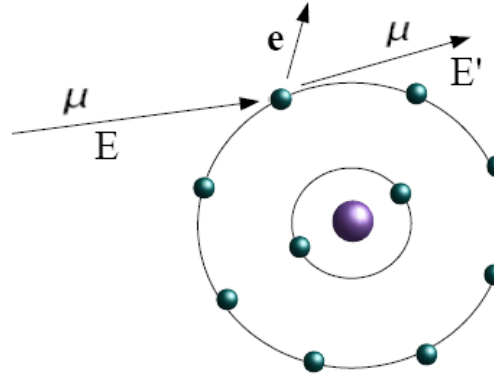
## Interactions with nuclei:

- Bremsstrahlung **energy loss/light emission**

## Polarisation:

- Cherenkov radiation **light emission**
- Transition radiation **light emission**

# Ionisation



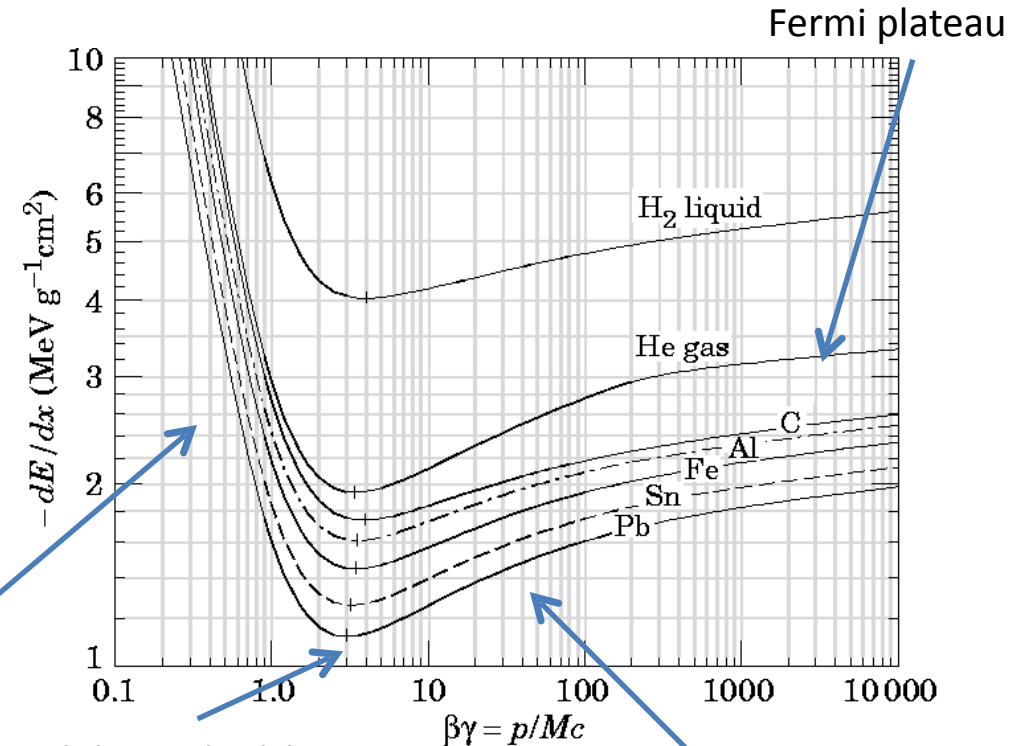
- $\mu^- + \text{atom} \rightarrow \mu^- + \text{atom}^+ + e^-$
- Average energy loss described by Bethe-Bloch formula:

$$-\frac{dE}{dx} = 4\pi N_A r_e^2 m_e c^2 Z^2 \frac{Z}{A} \frac{1}{\beta^2} \left[ \ln \frac{2m_e c^2 \gamma^2 \beta^2}{I^2} - \beta^2 - \frac{\delta}{2} \right]$$

- $dE/dx$  in  $[\text{MeV g}^{-1} \text{cm}^2]$ :  
Distance  $dx$  measured in  $\text{g/cm}^2$ ,  
 $dx = \rho \cdot ds$  (grammage)

Kinematic term

$$\frac{dE}{dx} \propto \frac{1}{\beta^2}$$



Minimum ionising particles:  $\beta\gamma \approx 4$

Relativistic rise  
 $\frac{dE}{dx} \propto \ln \beta^2 \gamma^2$

[Formula valid for “heavy” particles ( $m \geq m_\mu$ ), electrons require modifications because of the equal masses of the collision partners]

# Bremsstrahlung

- Deceleration in the Coulomb field of the nucleus
- $dE/dx \propto E$ :

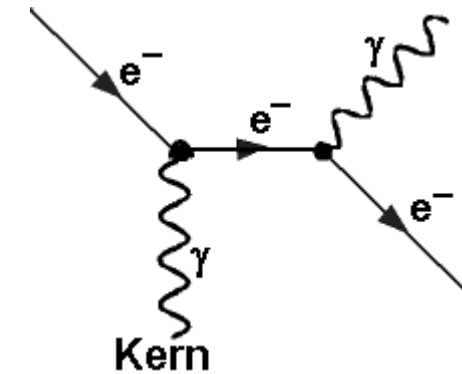
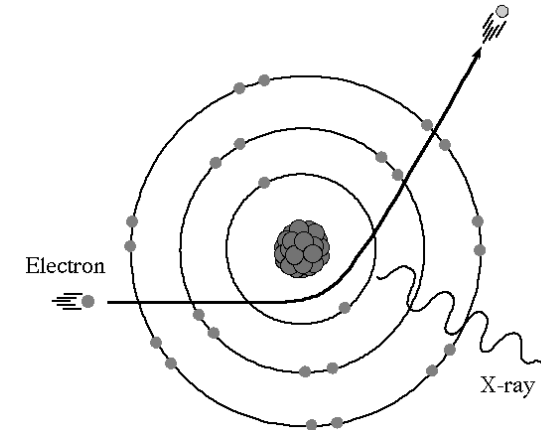
$$\frac{dE}{dx} = \frac{E}{X_0} \Rightarrow E = E_0 \exp\left(-\frac{x}{X_0}\right)$$

where  $X_0$  is radiation length,  $X_0 \propto m^2$

- The radiation length depends on the target properties and is usually defined for electrons

$$X_0 = \frac{716.4 \text{ g cm}^{-2} A}{Z(Z+1) \ln(287/\sqrt{Z})}$$

- Distance over which the energy is reduced by a factor of  $1/e$
- $X_0 \propto m^2 \rightarrow$  important for small masses, electrons



in the atmosphere:

$$X_0(\text{N}_2) = 716.4 \text{ g/cm}^{-2} \cdot 14 / (7 \cdot (1+7) \cdot \ln(287/\sqrt{7})) = \sim 37 \text{ g/cm}^2$$

# Critical Energy

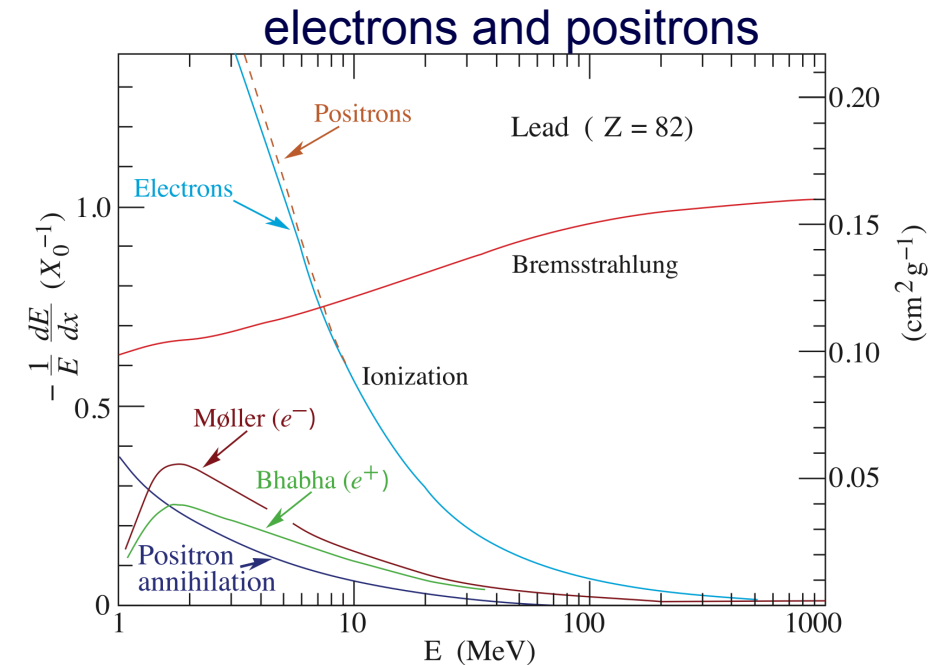
- Energy dependence of ionisation at high energies is  $\propto \ln \gamma^2 \rightarrow$  basically flat!
  - Energy dependence of bremsstrahlung is  $\propto E$
- $\rightarrow$  bremsstrahlung takes over at some point

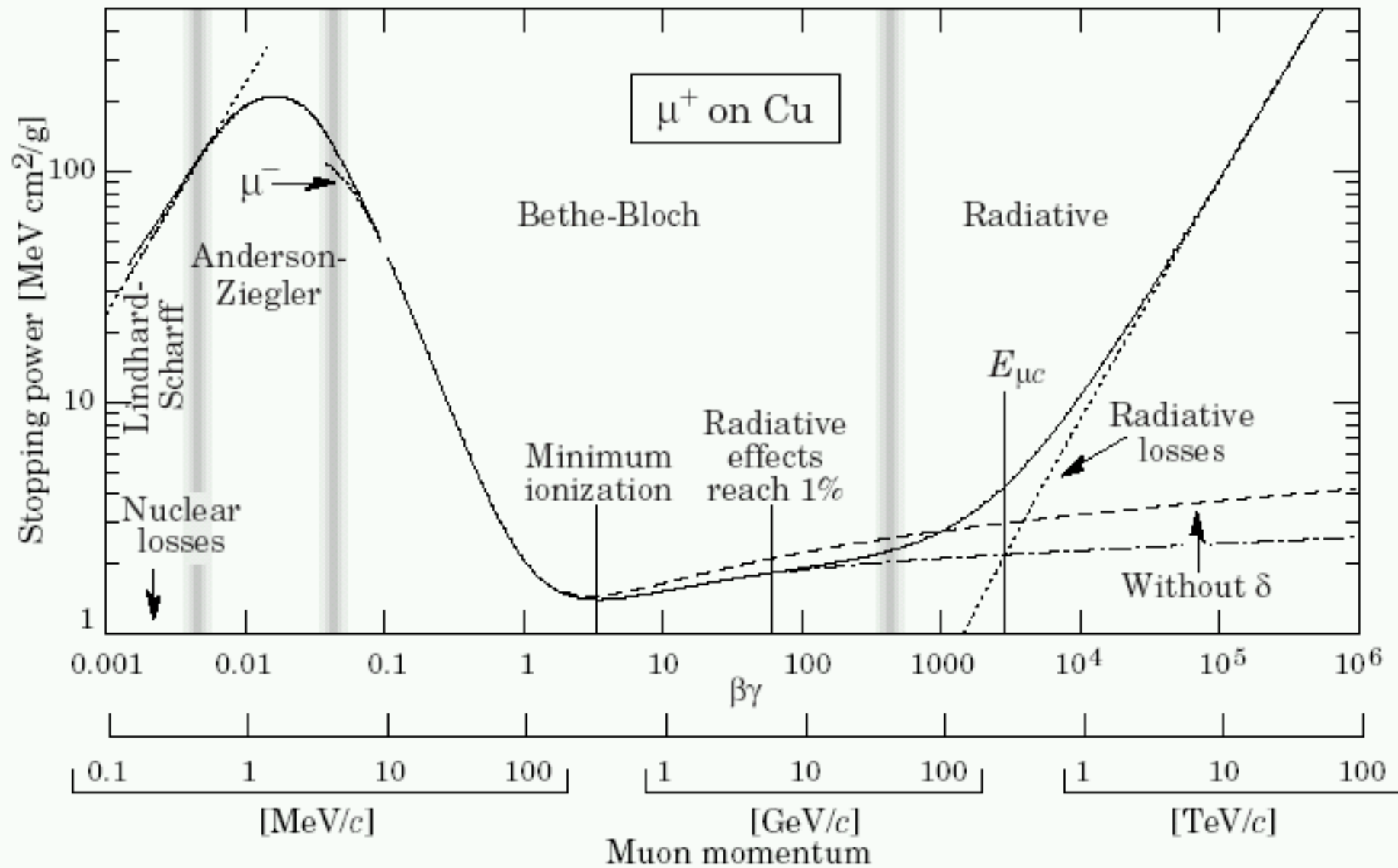
**critical energy  $E_c$ :** energy at which energy losses of ionisation and bremsstrahlung are the same:

$$\left. \frac{dE}{dx} (E_c) \right|_{\text{Ionisation}} = \left. \frac{dE}{dx} (E_c) \right|_{\text{bremsstrahlung}}$$

for electrons:  $E_c \sim 560 \text{ MeV}/Z$

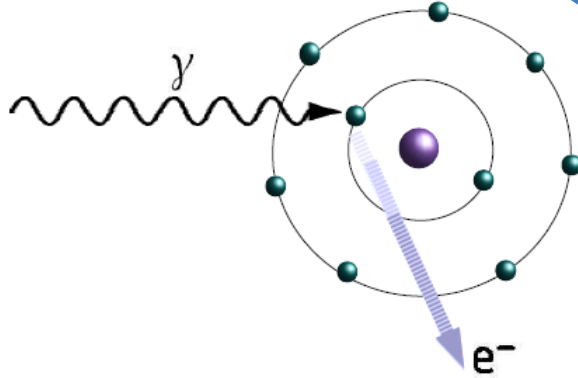
electrons in the atmosphere:  
 $E_c \sim 560 \text{ MeV}/7 = 80 \text{ MeV}$



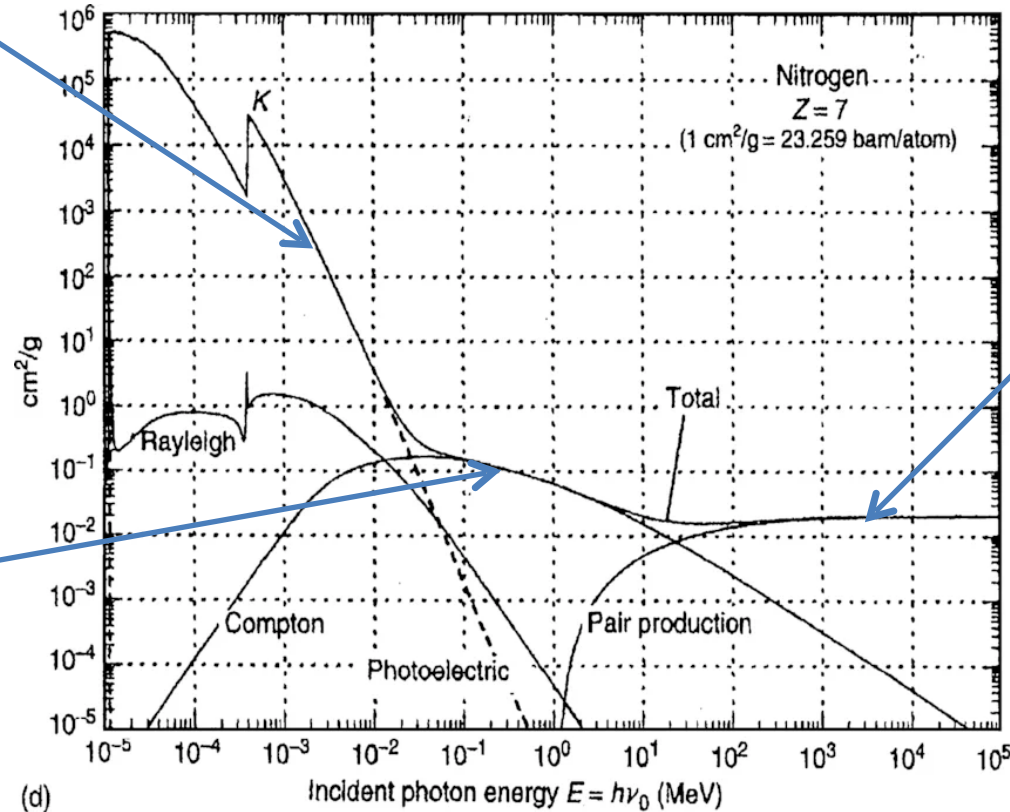
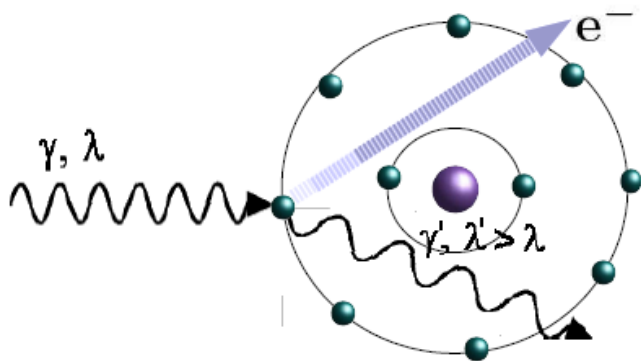


# Photon Interactions with Matter

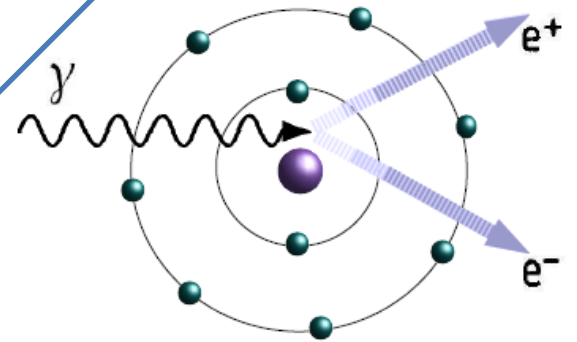
photoelectric effect



Compton scattering



pair production



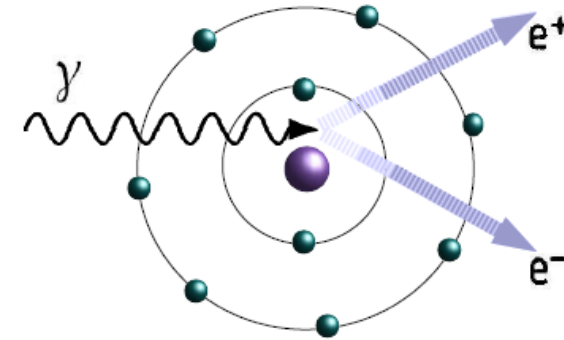
(d)

# Pair Production

- $\gamma + \text{nucleus} \rightarrow \text{nucleus} + e^- + e^+$

$$E_\gamma \geq 2m_e c^2 + 2 \frac{m_e^2}{m_{\text{nucleus}}} c^2$$

- Threshold energy:
- After an attenuation length  $\lambda \cong 7/9 X_0$ , a photon beam intensity has dropped to  $I_0/e$
- Notice the difference to the definition for electrons, where the energy is reduced by a factor of  $1/e$ ! Photon loss is catastrophic



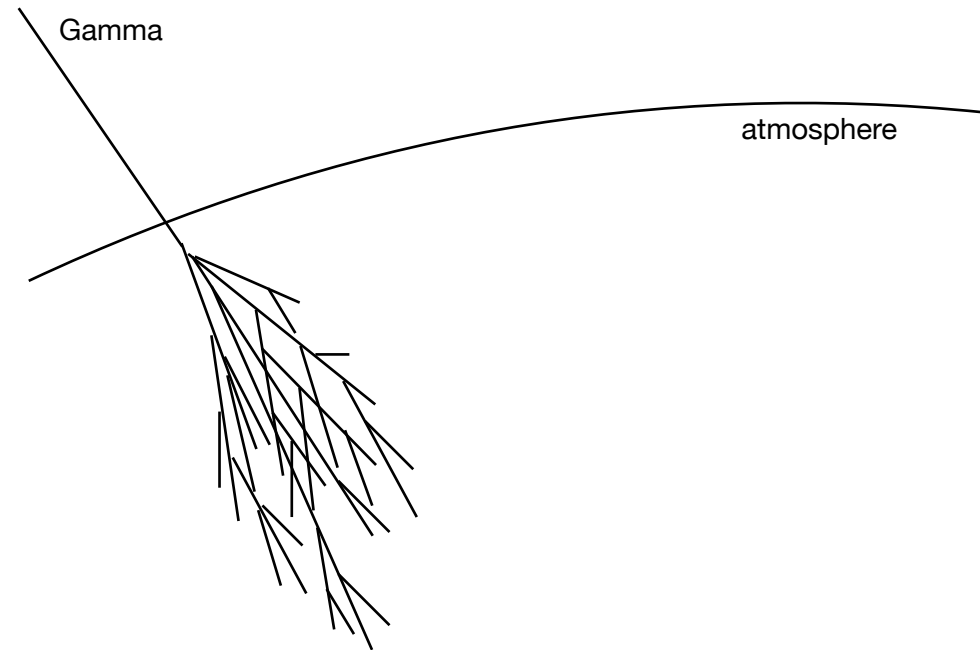
That's what energetic gamma rays do in the atmosphere!

# Air Showers

When a charged particle or a photon enters the atmosphere, it interacts and produces a cascade of secondary particles

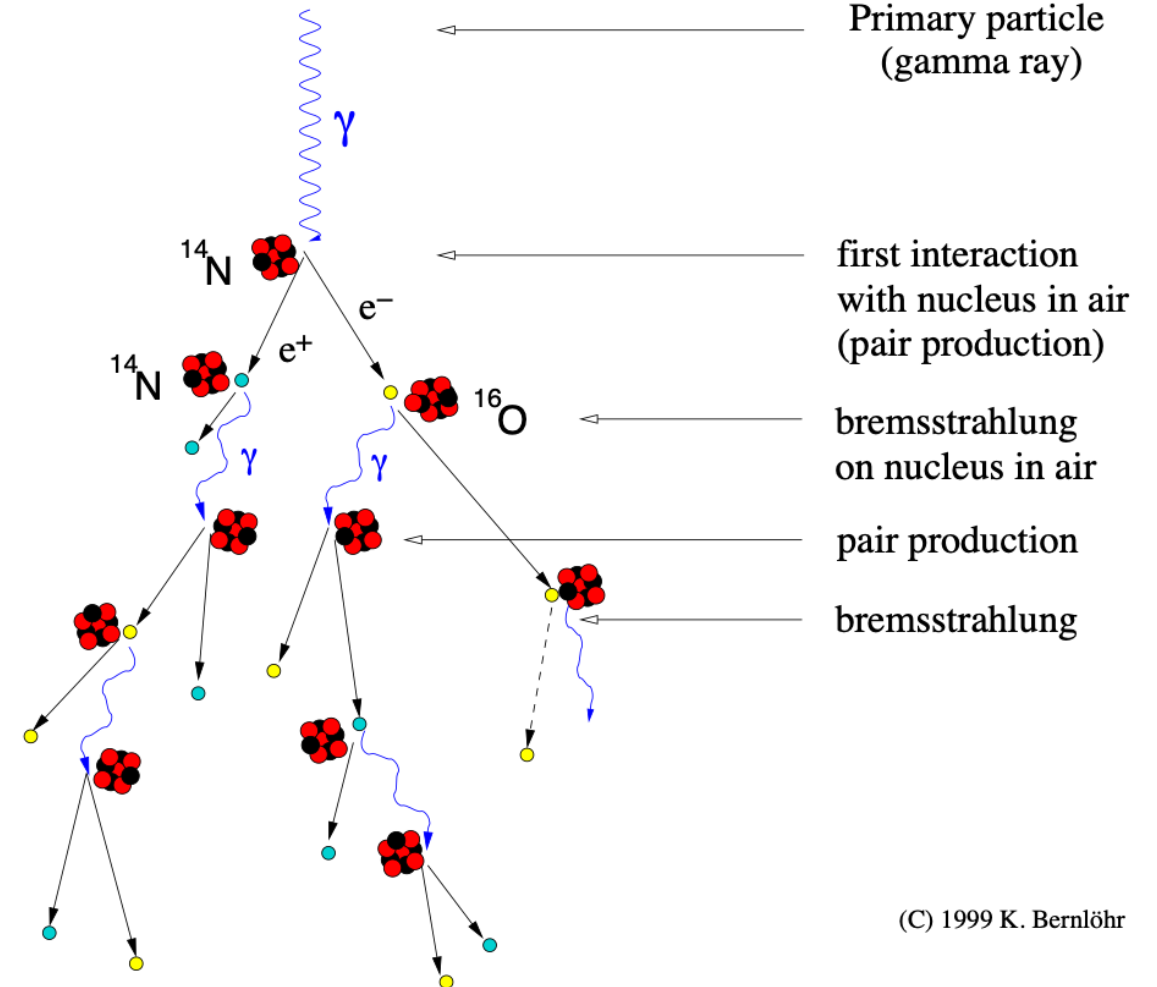
→ an air shower

Succession of particle interactions that give the observable quantity



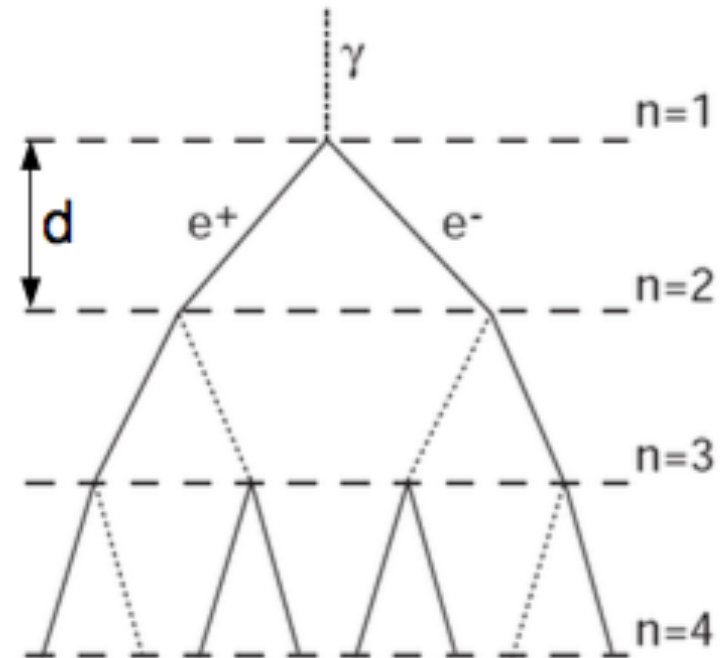
# Electromag. Air Showers

- Iteration of **pair production**  
 $\gamma + \text{nucleus} \rightarrow e^- + e^+ + \text{nucleus}$   
 and **bremsstrahlung**  
 $e^- + \text{nucleus} \rightarrow e^- + \gamma + \text{nucleus}$
- Increase in particle counts in every interaction
- Until ionisation starts to dominate, then air shower fades out



# Heitler Model

- Every interaction happens after one splitting length  $d$
- The energy is split into half:  
 $E_{n=1} = E_{n=0} / 2$
- Process stops when the individual particle's energy drops below  $E_c$



# Heitler Model

**YOUR TURN**

What is the splitting length  $d$  expressed in radiation length  $X_0$ ?

After  $n$  splitting lengths, what is the energy  $E_n$  of the particles and what is the number  $N_n$  of particles?

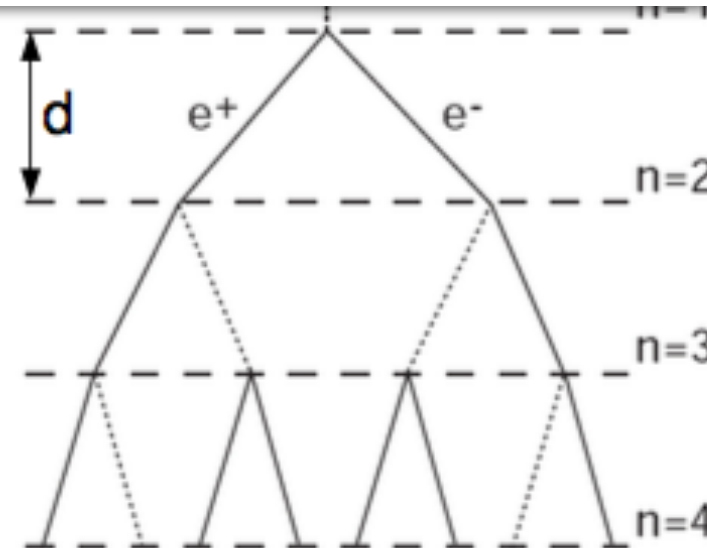
What is the number of particles at the shower maximum  $N_{\max}$ ?

What is the depth of the shower maximum  $X_{\max}$  expressed in  $X_0$ ?

With  $E_c \sim 80$  MeV, what are  $N_{\max}$  and  $X_{\max}$  for a 1 TeV gamma ray?

$$\frac{dE}{dx} = \frac{E}{X_0} \Rightarrow E = E_0 \exp\left(-\frac{x}{X_0}\right)$$

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**YOUR TURN**

What is the splitting length  $d$  expressed in radiation length  $X_0$ ?

After  $n$  splitting lengths, what is the energy  $E_n$  of the particles and what is the number  $N_n$  of particles?

What is the number of particles at the shower maximum  $N_{\max}$ ?

What is the depth of the shower maximum  $X_{\max}$  expressed in  $X_0$ ?

With  $E_c \sim 80$  MeV, what are  $N_{\max}$  and  $X_{\max}$  for a 1 TeV gamma ray?

- one splitting length  $d$  is:

$$\frac{dE}{dx} = \frac{E}{X_0} \Rightarrow E = E_0 \exp\left(-\frac{x}{X_0}\right)$$

$$E(d) = E_0/2$$

$$d = \ln 2 \cdot X_0$$

- after  $n$  splitting lengths:

$$N_n = 2^n$$

$$E_n = E_0/N_n$$

$$X_n = n \ln 2 \cdot X_0$$

- at shower maximum:

$$N_{\max} = E_0/E_c$$

$$X_{\max} = \log_2 N_{\max} \cdot \ln 2 \cdot X_0$$

$$= \log_2 \frac{E_0}{E_c} \cdot \ln 2 \cdot X_0$$

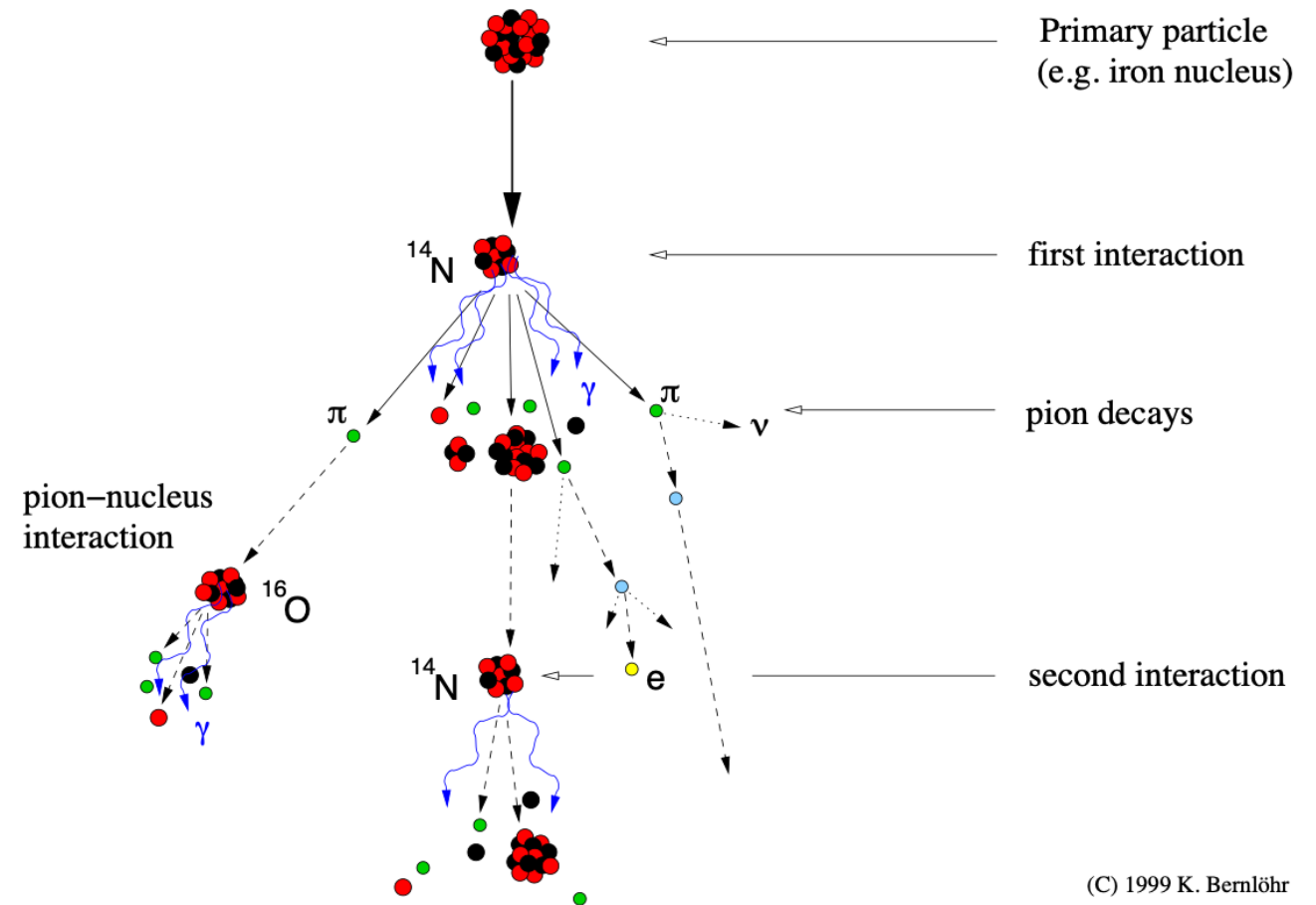
$$= \ln \frac{E_0}{E_c} \cdot X_0$$

At 1 TeV:  $N_{\max} \sim 12500$  particles and  $X_{\max} \sim 9 X_0 \sim 300$  g/cm<sup>2</sup>

# Hadronic Air Showers

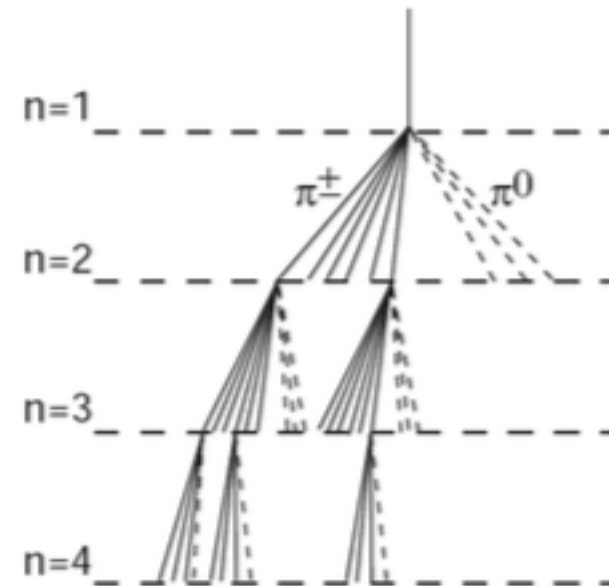
- Fragmentation
- Strong interactions producing hadrons (pions, but also heavier particles), which will decay/interact further
- El.-mag. sub-cascades from neutral pions

Development of cosmic-ray air showers



# Matthews-Heitler Model

- Every interaction produces  $M$  pions ( $\pi^+$ ,  $\pi^-$ ,  $\pi^0$  in equal quantities)
- Charged pions interact and initiate a secondary cascade
- Neutral pions decay immediately and initiate electromagnetic shower
- Cascade stops when decay length is reached, i.e. the pions decay into muons



# Matthews-Heitler Model

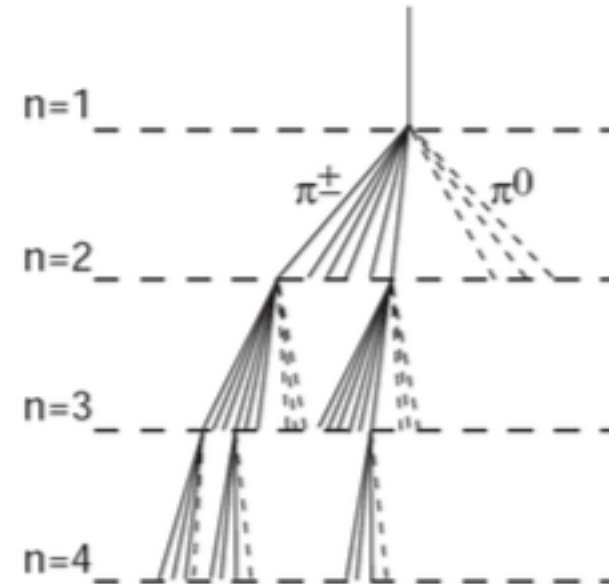
- Number of charged pions at level  $n$ :  

$$N_n = (2/3 M)^n$$
- Energy of charged pion at level  $n$ :  

$$E_n = E_0/M^n$$
- Total energy in charged pions:  

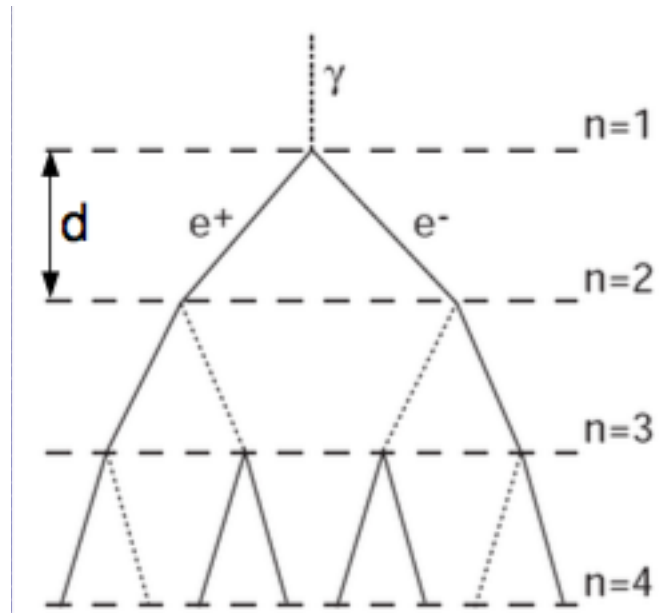
$$E_\pi = (2/3)^n E_0$$
- Total energy in elmag component:  

$$E_{\text{elmag}} = (1 - (2/3)^n) E_0$$
- Elmag. component larger with larger initial energy (corresponding to larger  $n_{\text{max}}$ )
- At IACT energies around 70% of energy in elmag. sub-showers



# Comparison Elmag/Hadronic Showers

## Electromagnetic

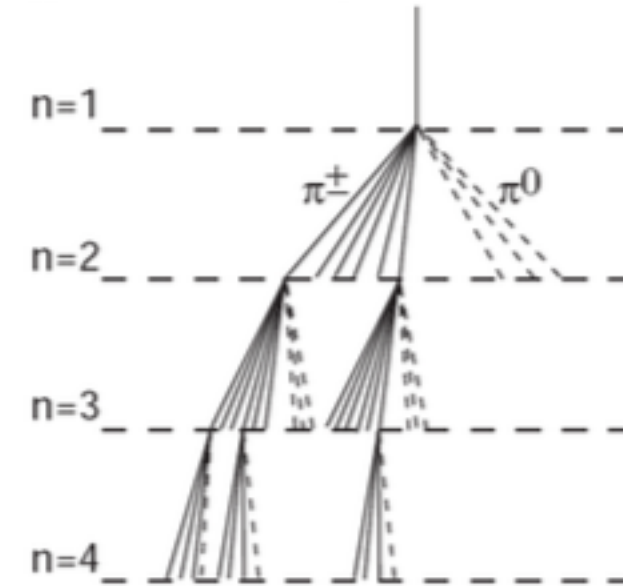


Radiation length

$$X_0 = 37 \text{ g/cm}^2$$

$$X_{\text{atm}} = 27 X_0$$

## Hadronic



Nuclear interaction length

$$\lambda_1 = 90 \text{ g/cm}^2$$

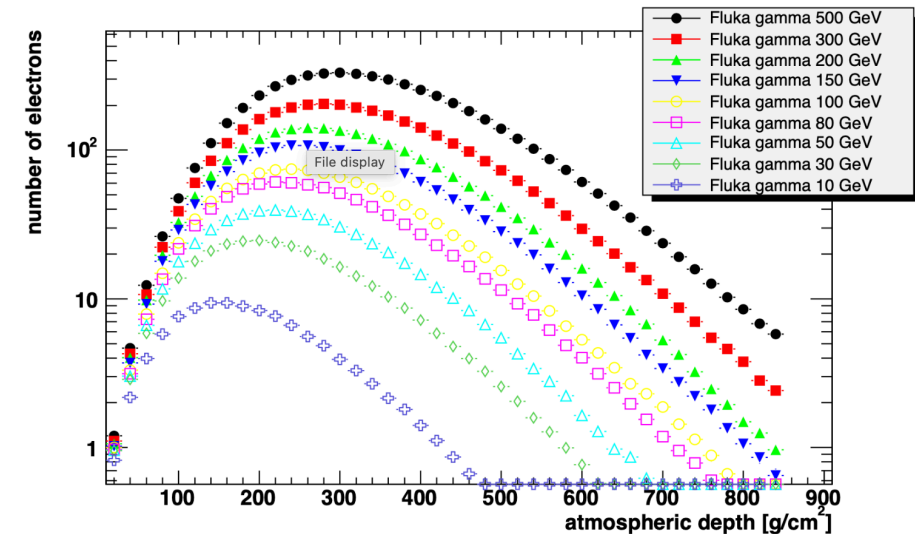
$$X_{\text{atm}} = 11 \lambda_1$$

$$X_{\text{atm}} \approx 1000 \text{ g/cm}^2$$

# Analytical models vs. reality

Analytical models describe qualitative behaviour of air showers

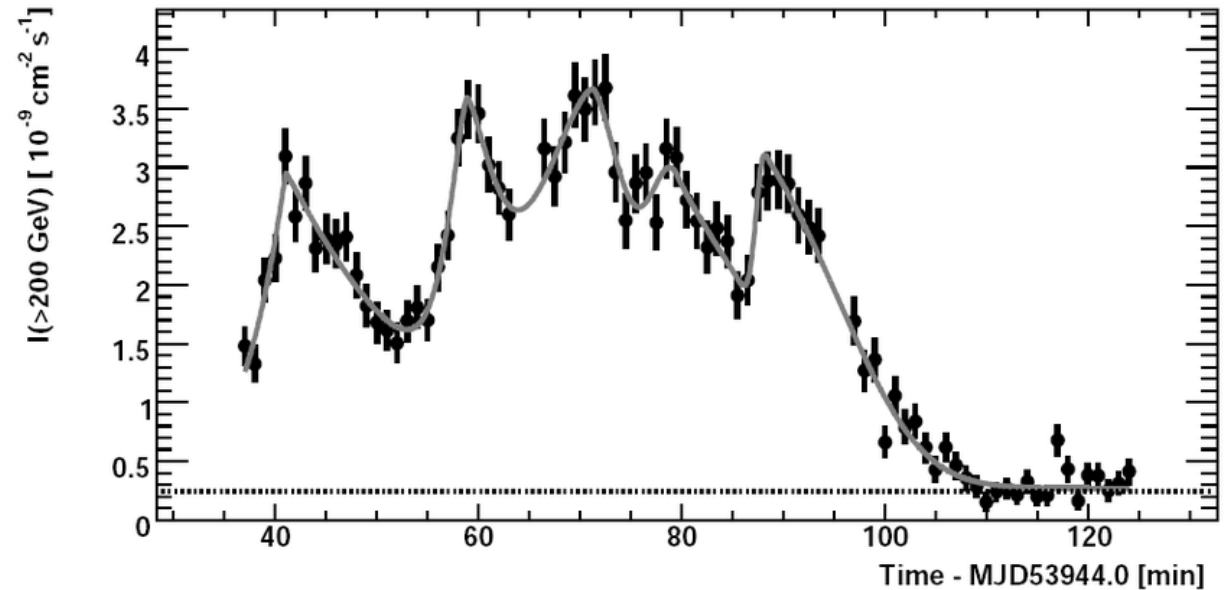
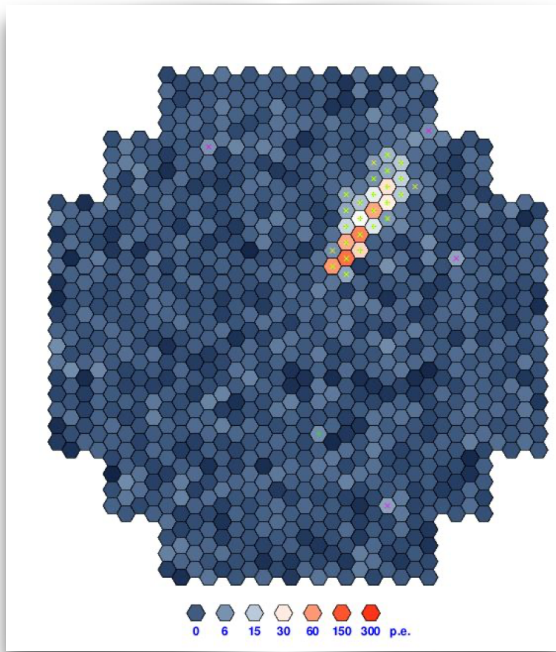
- For elmag. showers:
  - $X_{\max} \sim \ln E_0$
  - $N_{\max} \sim E_0$
- For hadronic showers:
  - Elmag component larger with larger initial energy (corresponding to larger  $n_{\max}$ )
  - At IACT energies around 70% of energy in elmag sub showers



© G. Maier [Gamma Picturebook](#)

Details require the **simulation** of all processes in the atmosphere

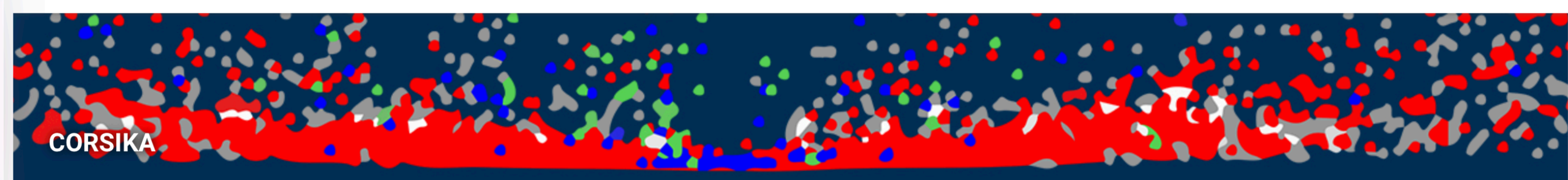
# Why do we need air-shower simulations?



Determine from secondary products  
primary-particle properties (reconstruction) and physical quantities

Often for air showers CORSIKA is used, for telescope response Sim\_telarray

# CORSIKA



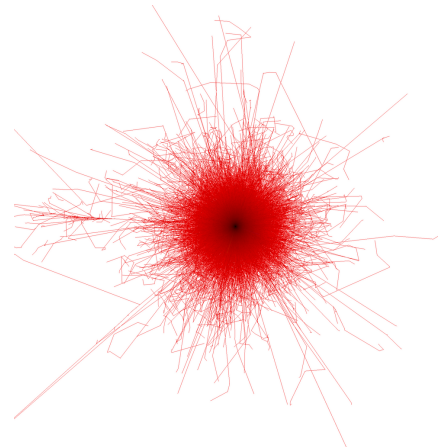
- CORSIKA (COsmic Ray Simulations for KAscade) is a program for detailed simulation of extensive air showers
- Particles are tracked through the atmosphere until they undergo reactions with the air nuclei or decay
- Plug-in of interaction models

Electromagnetic interactions can be modelled to high precision (QED),  
for hadronic interactions (QCD) interaction models are required:  
GEISHA, FLUKA, UrQMD (low energies) and  
VENUS, QGSJET, DPMJET, SIBYLL, EPOS (high energies)

# Shower Simulations

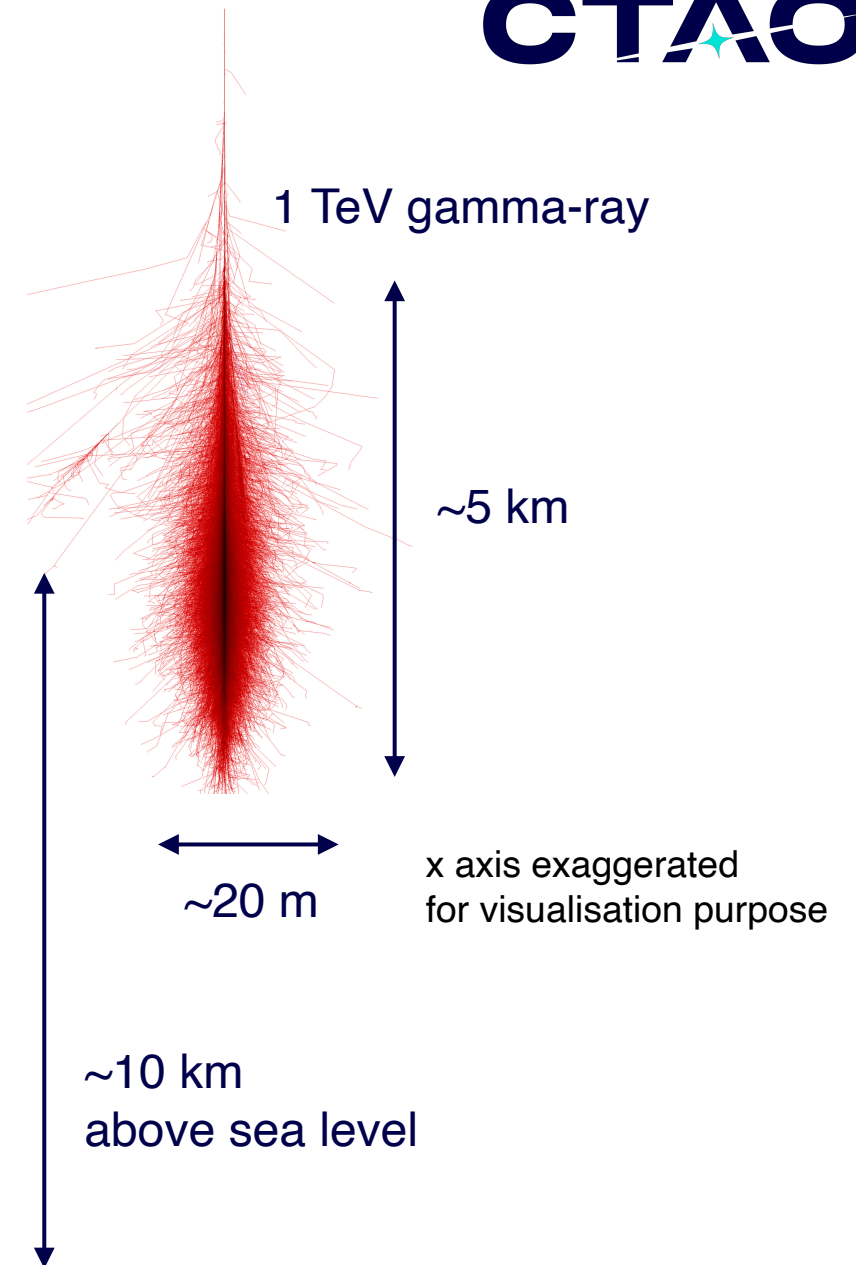
Particle type is encoded in track color:

- red = electrons, positrons, gammas
- green = muons
- blue = hadrons

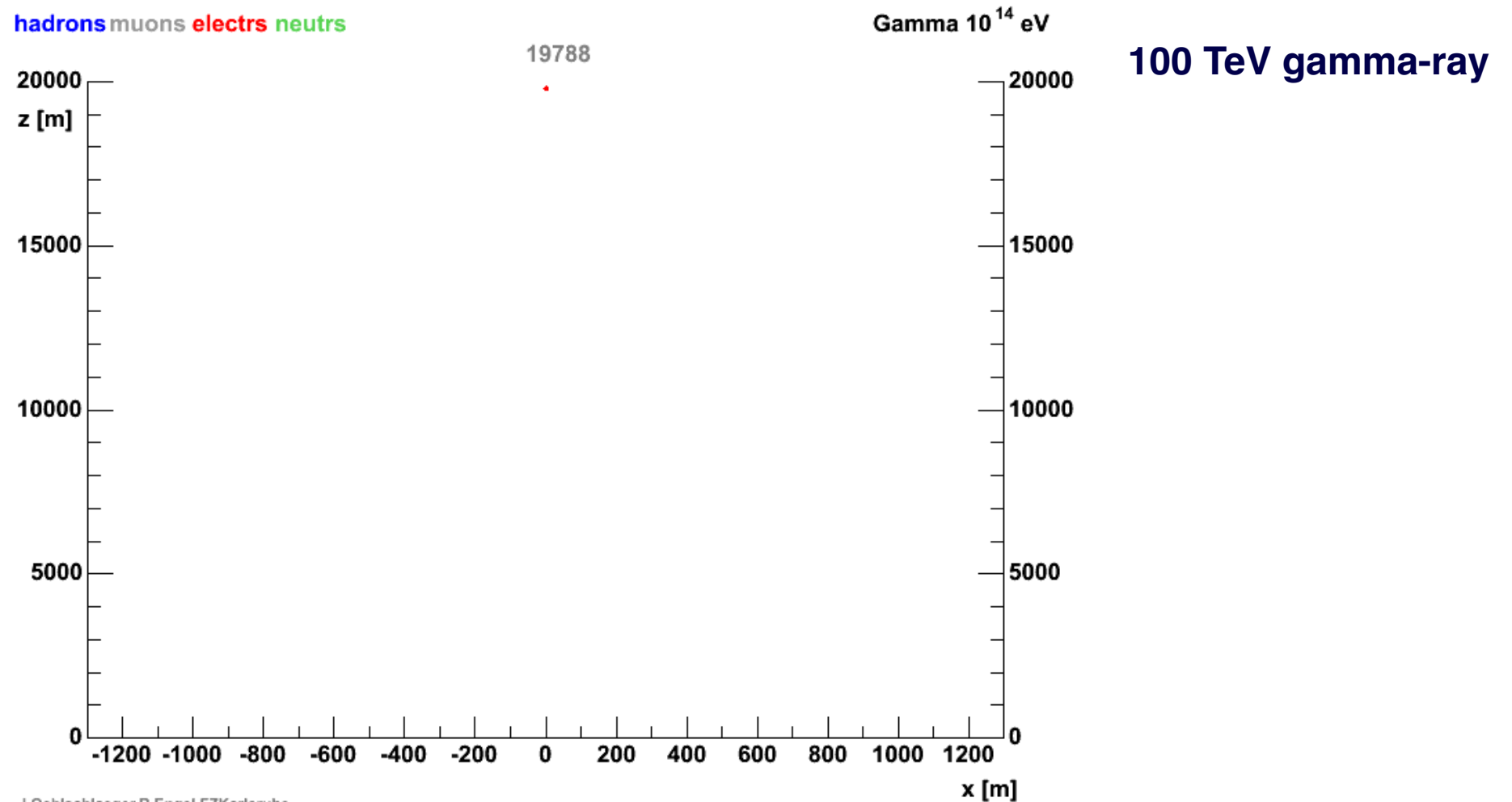


projection on the ground plane

longitudinal projection



# Gamma Shower Development

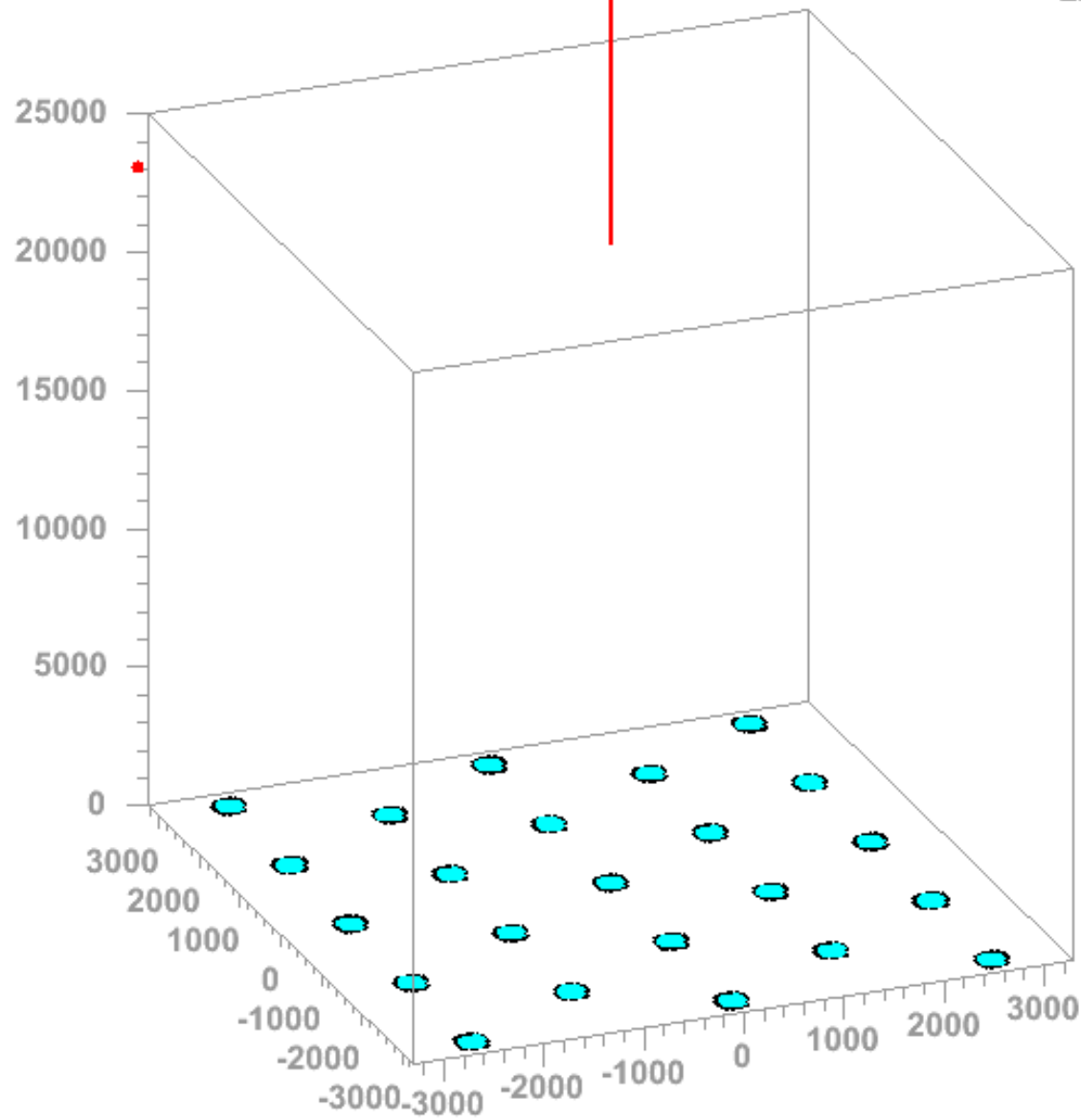


hadrons muons electrs neutrs

$0.00 \cdot 10^{-6}$  sec

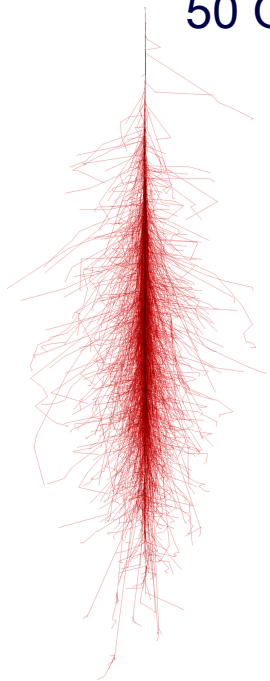
Gamma  $10^{15}$  eV  
22984 m

## 1 PeV gamma-ray

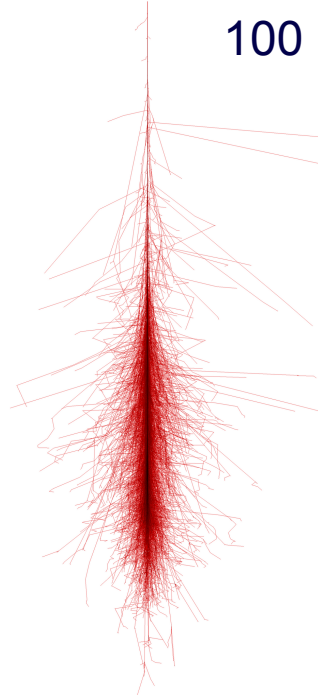


# Gamma Simulations

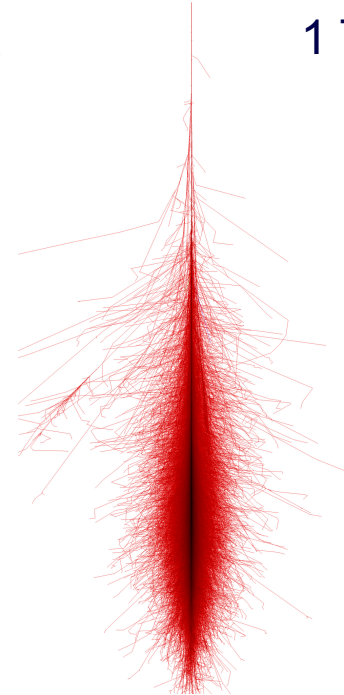
50 GeV gamma



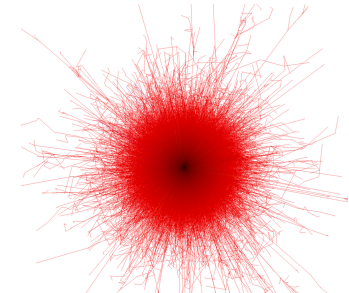
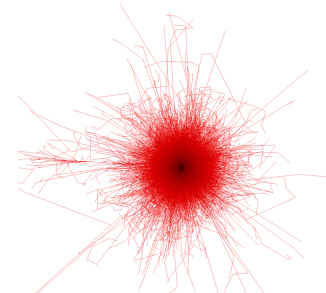
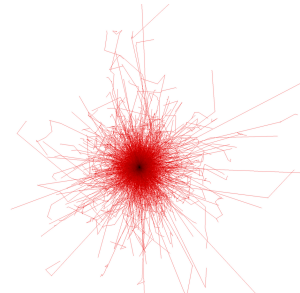
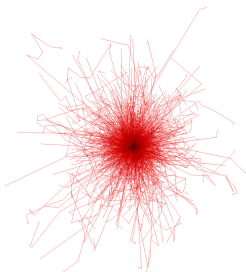
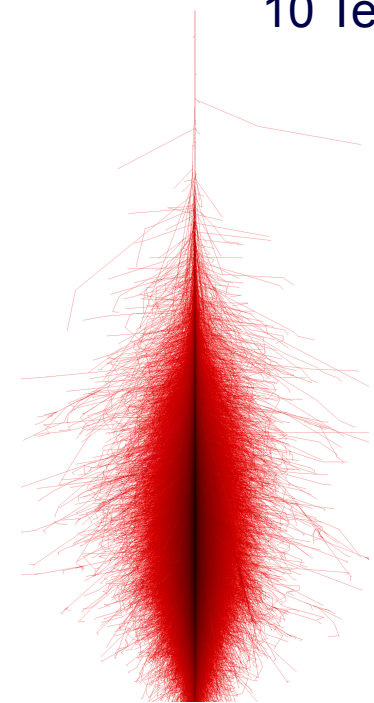
100 GeV gamma



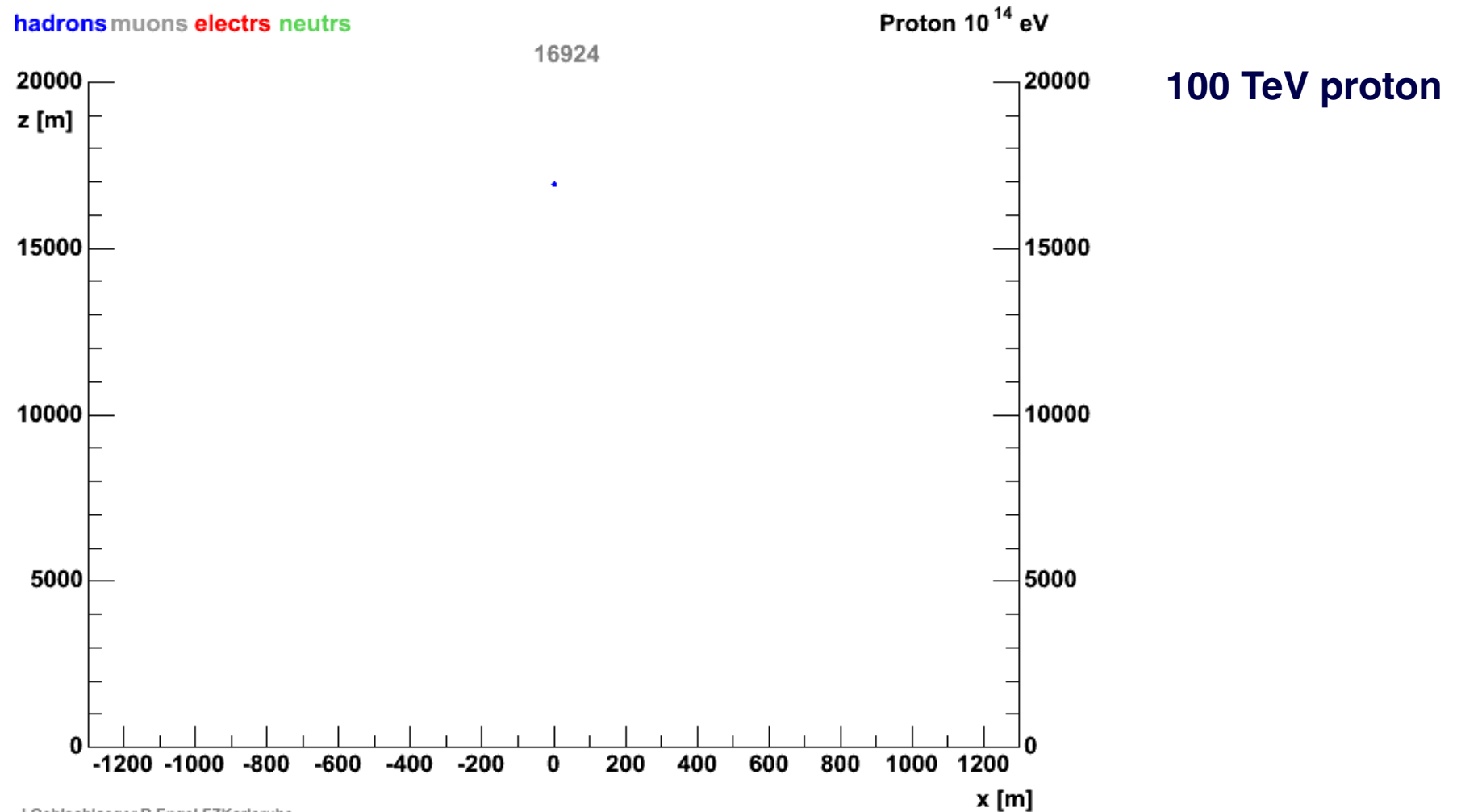
1 TeV gamma



10 TeV gamma



# Proton Shower Development

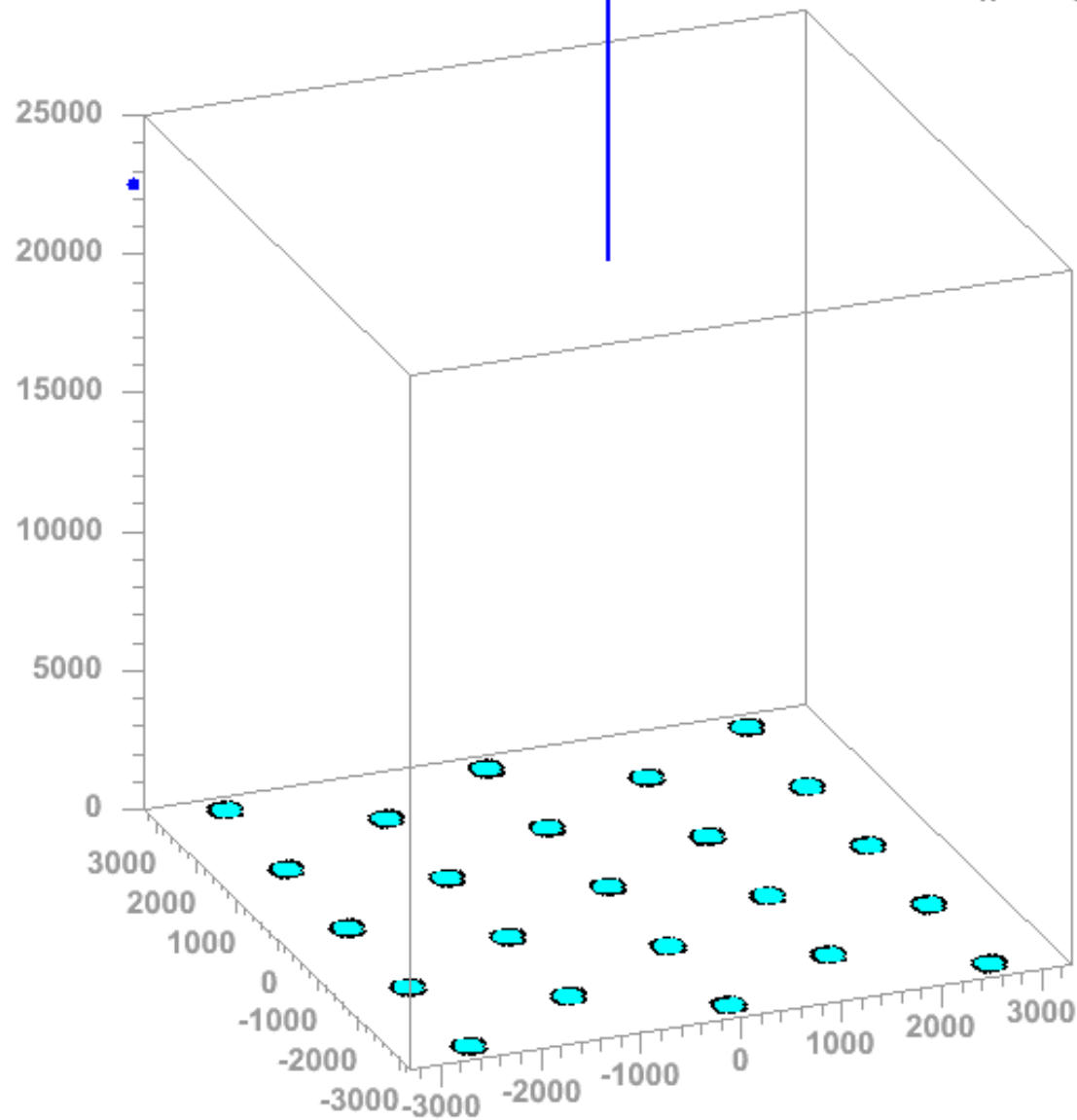


hadrons muons **electrs** neutrts

0.00 · 10<sup>-6</sup> sec

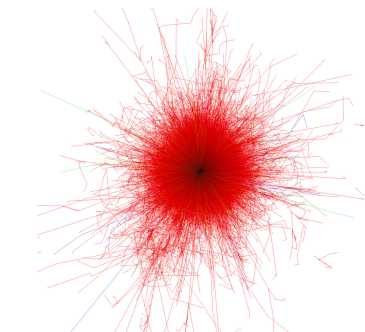
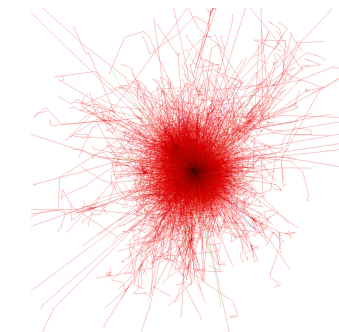
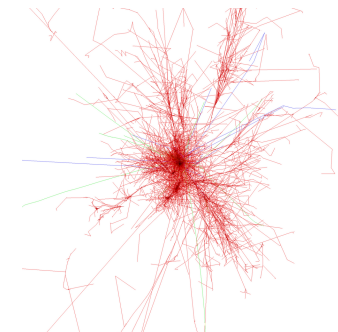
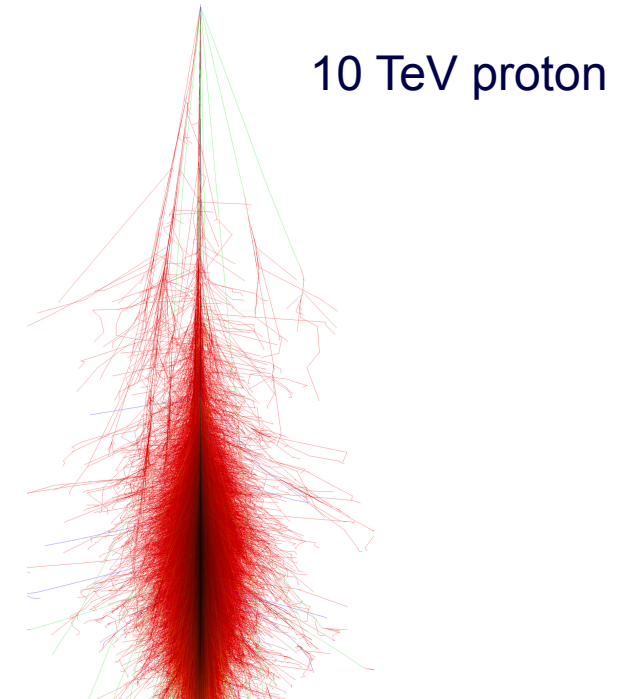
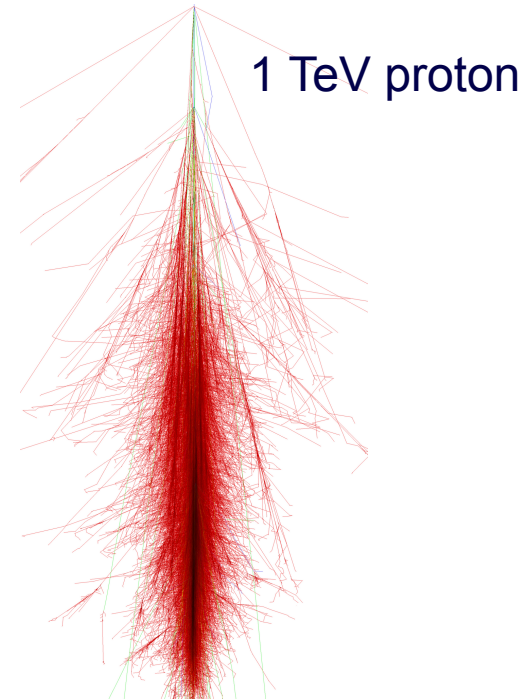
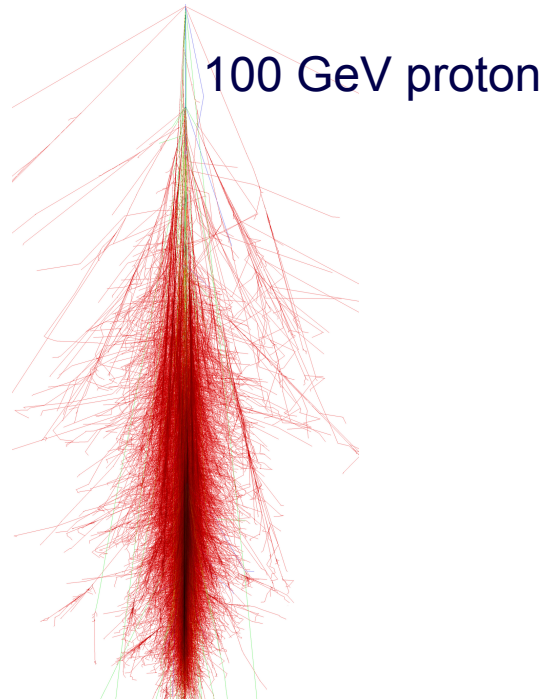
Proton 10<sup>15</sup> eV

h<sup>1st</sup> = 22489 m

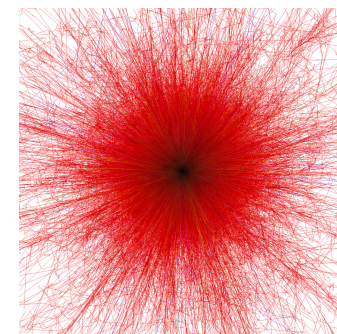
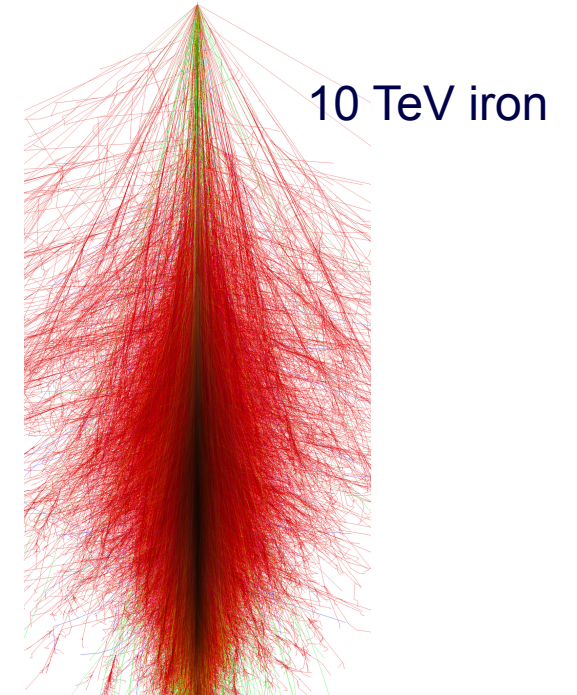
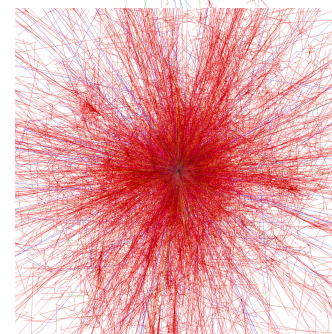
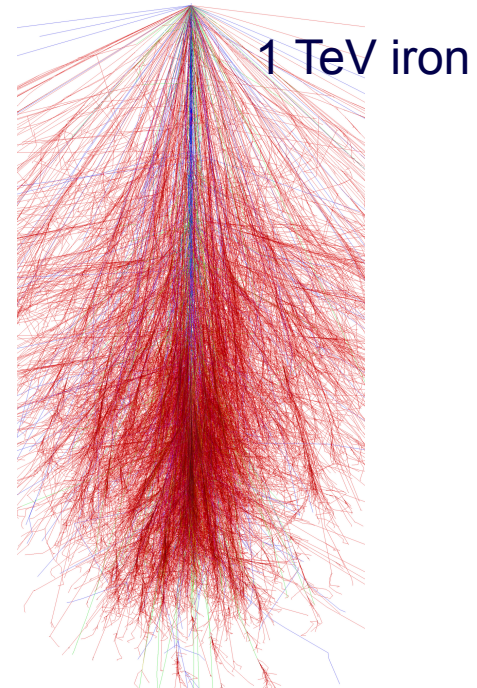
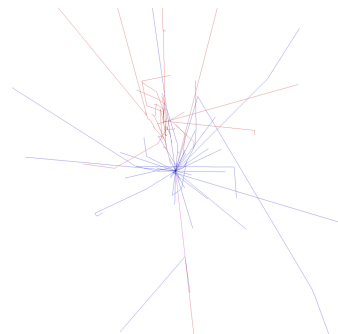
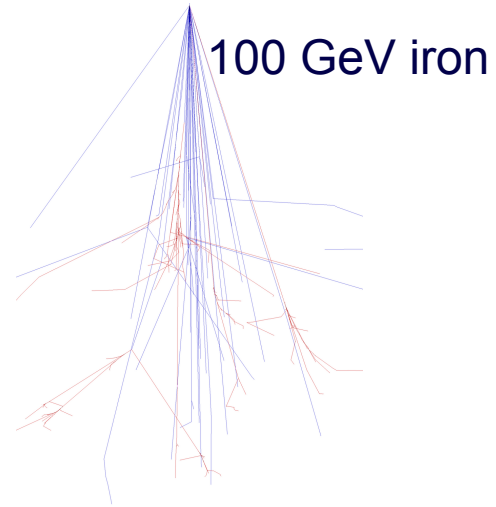


1 PeV proton

# Proton Simulations

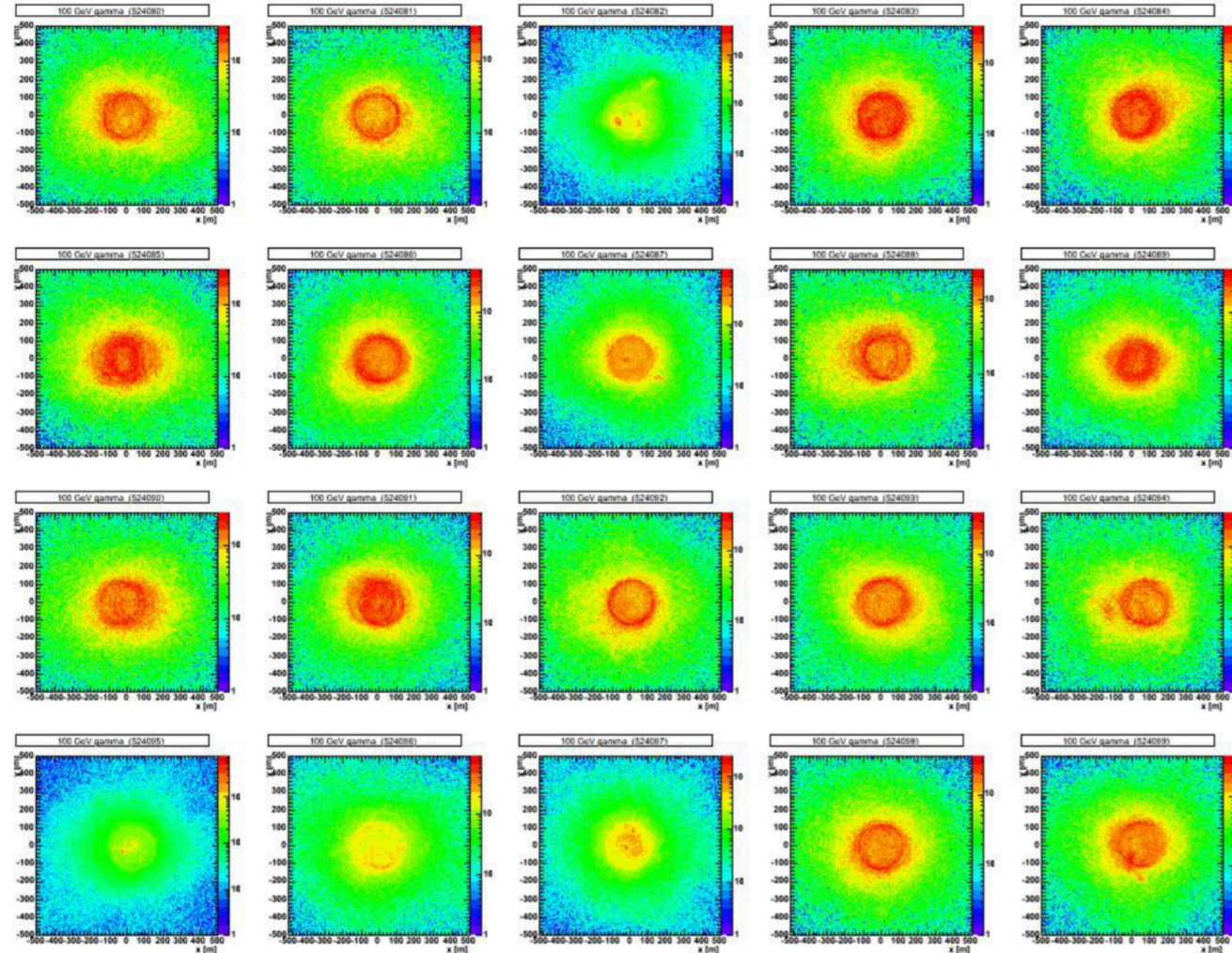


# Iron Simulations



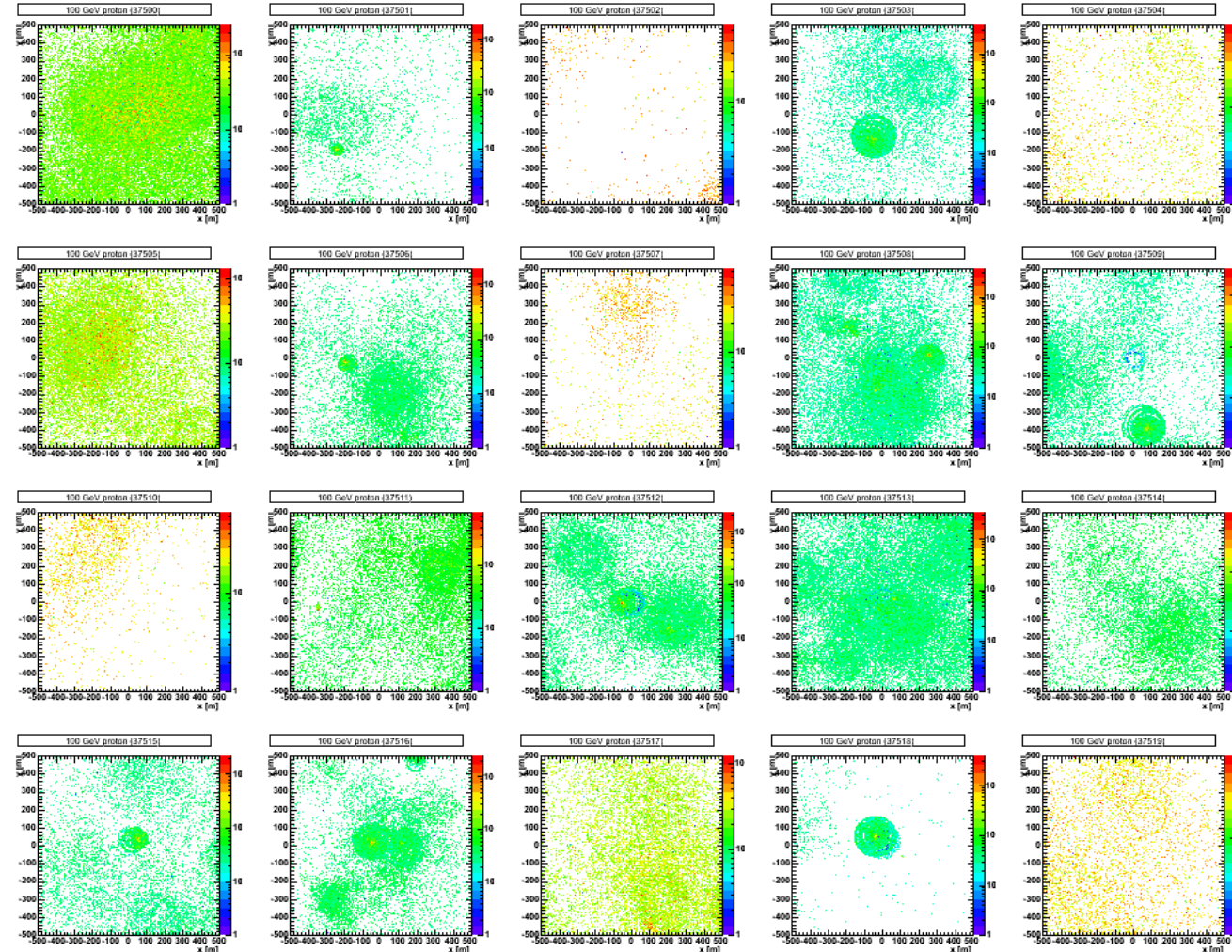
# Cherenkov light on the ground

100 GeV gamma-ray



# Cherenkov light on the ground

100 GeV proton



# Outline

## **Day 1: Introduction**

- Basic considerations
- Detection principles
- Development of the field

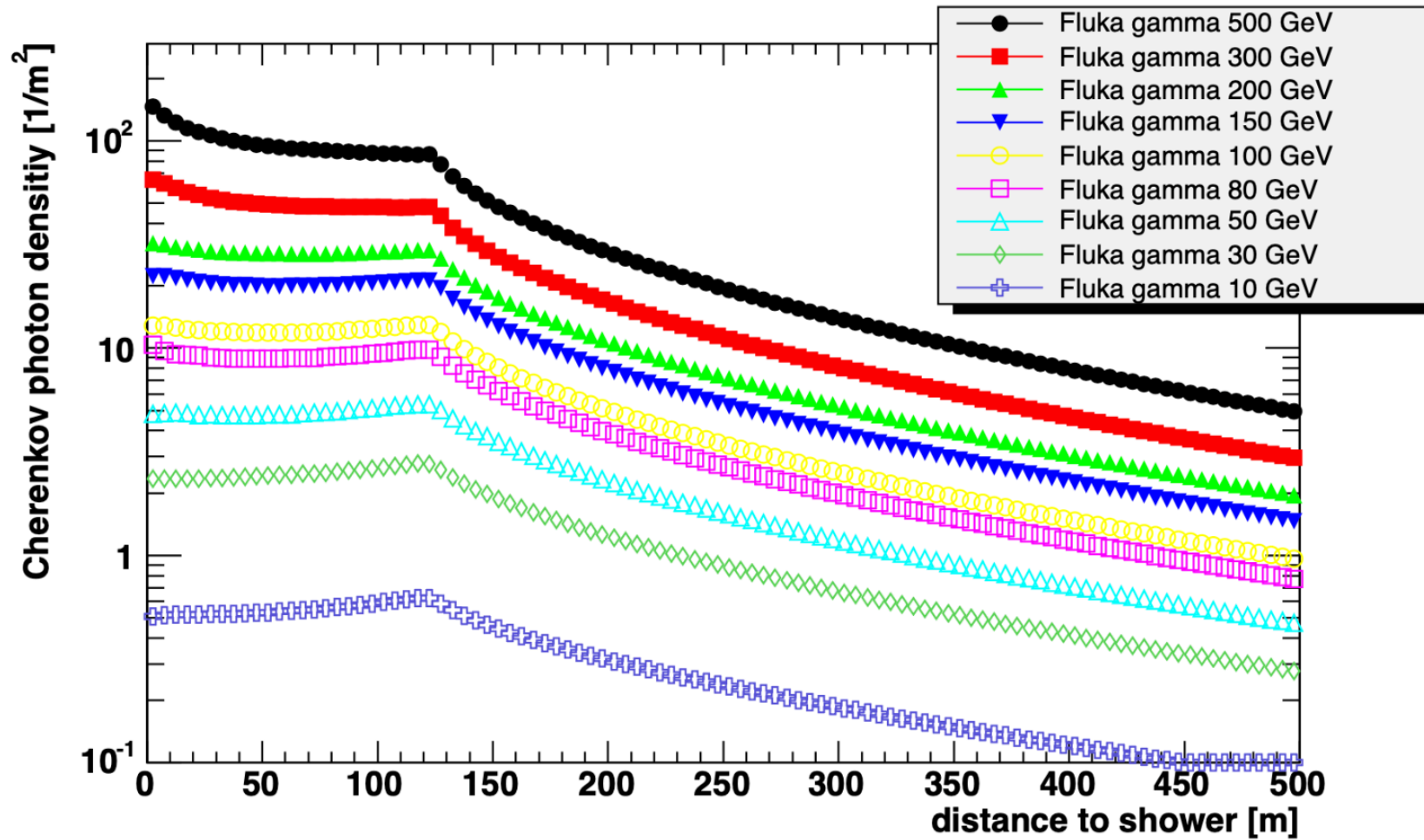
## **Day 2: Everything about Air Showers**

- Particle interactions in matter
- Electromagnetic & hadronic air showers
- Air-shower simulations

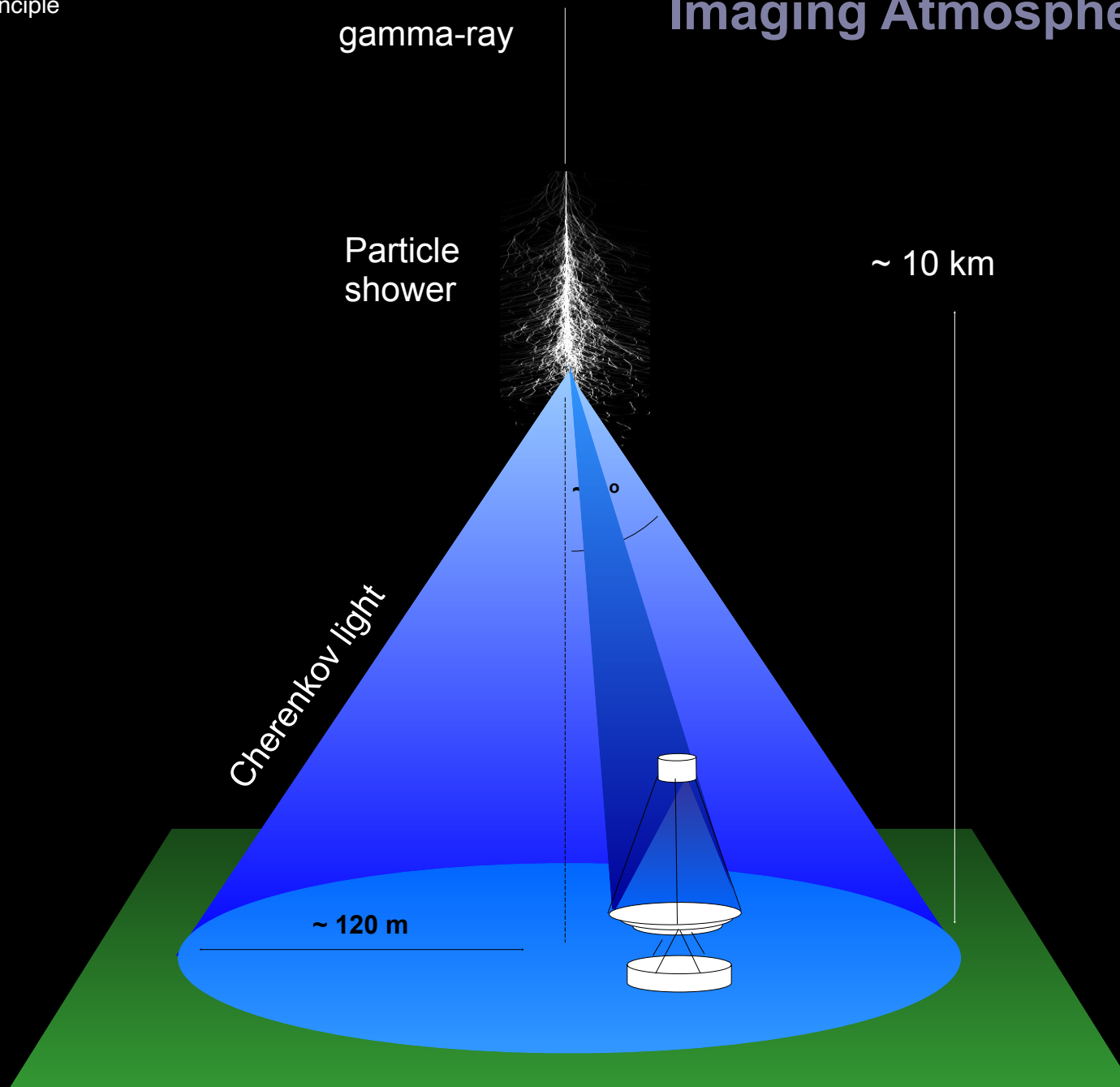
## **Day 3: IACTs**

- The IACT principle
- Gamma-hadron separation & backgrounds
- Current and future instruments & their sensitivities

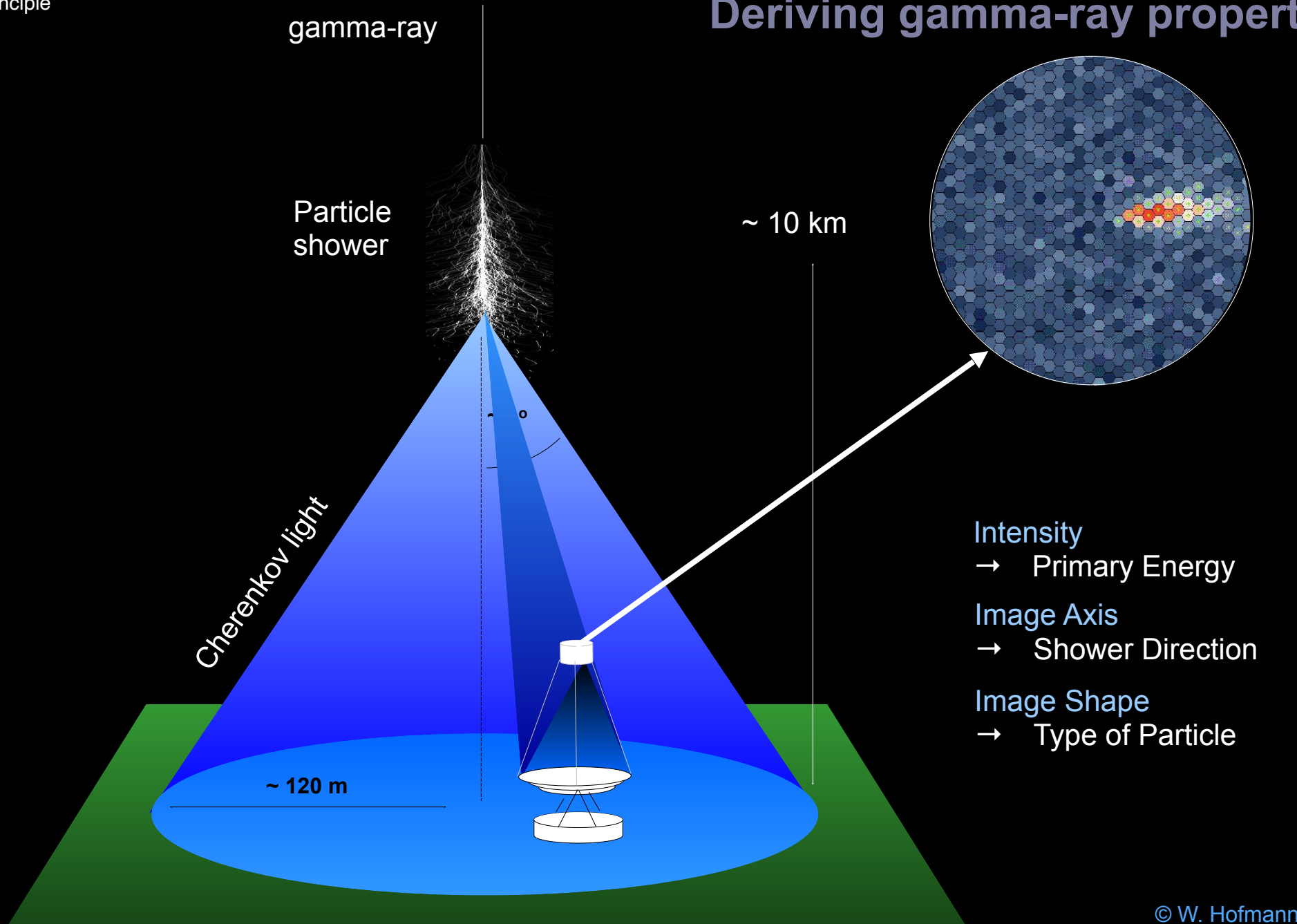
# Cherenkov light on the ground

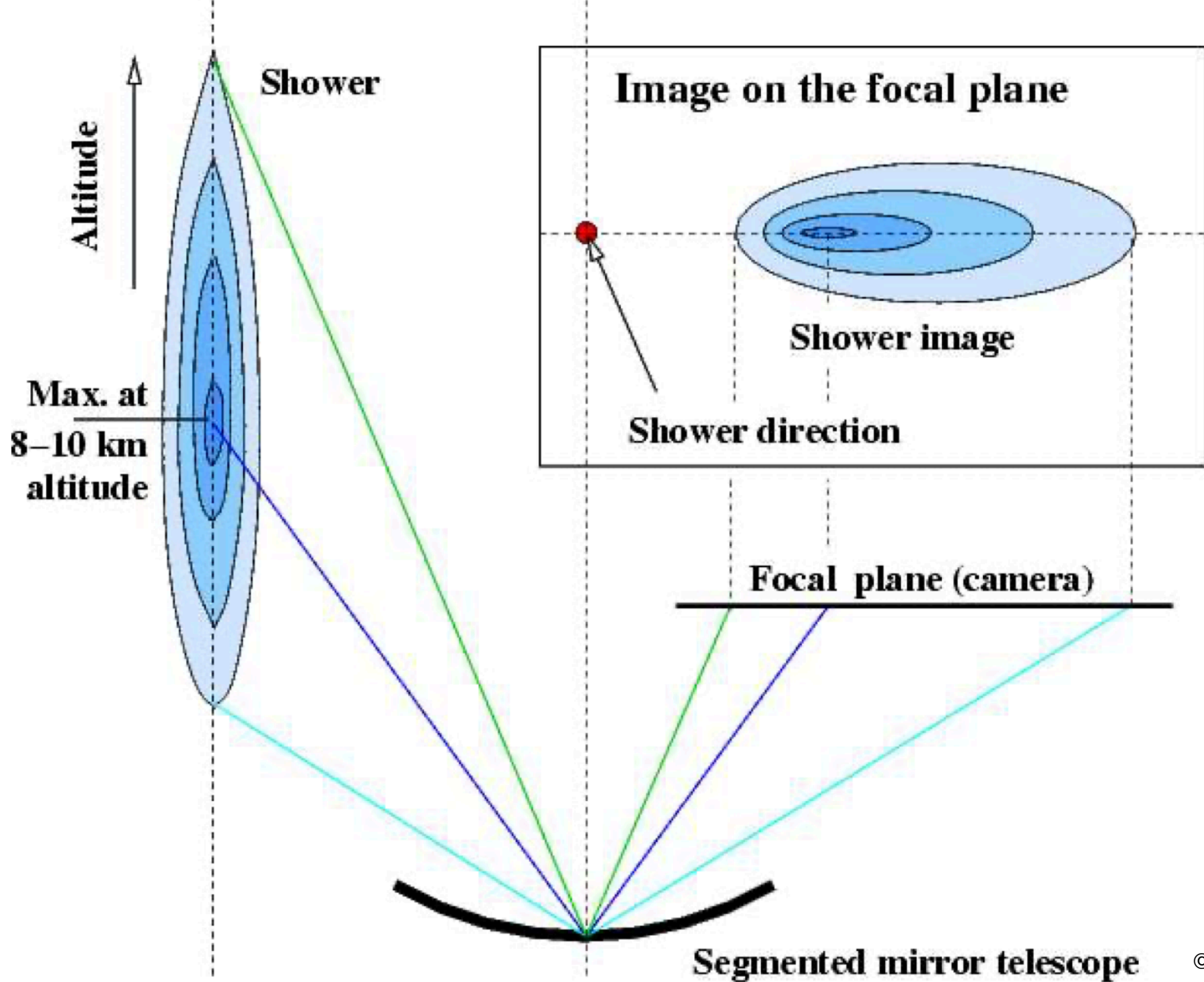


# Imaging Atmospheric Cherenkov Telescopes



# Deriving gamma-ray properties





# Stereoscopy for better direction reconstruction

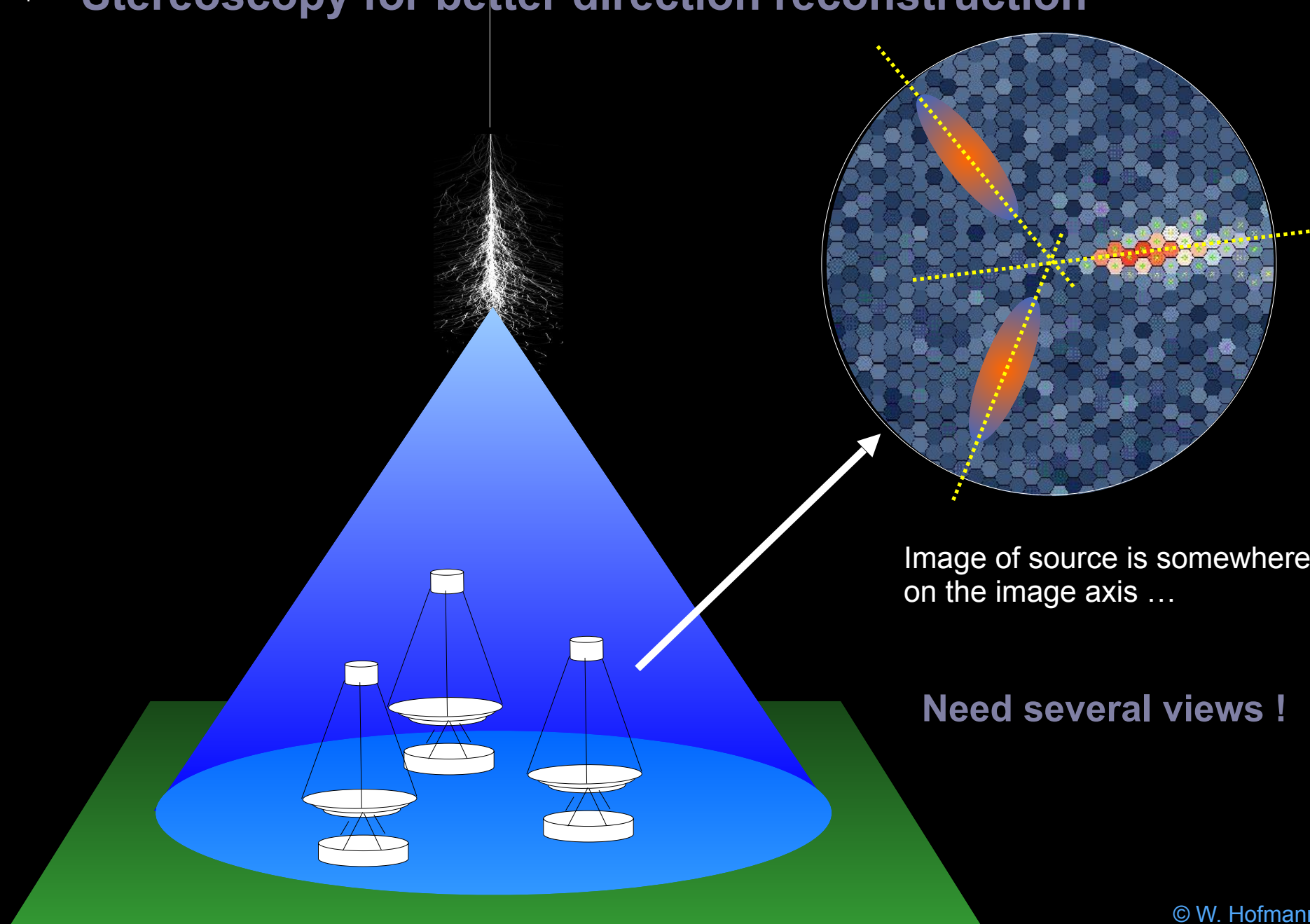
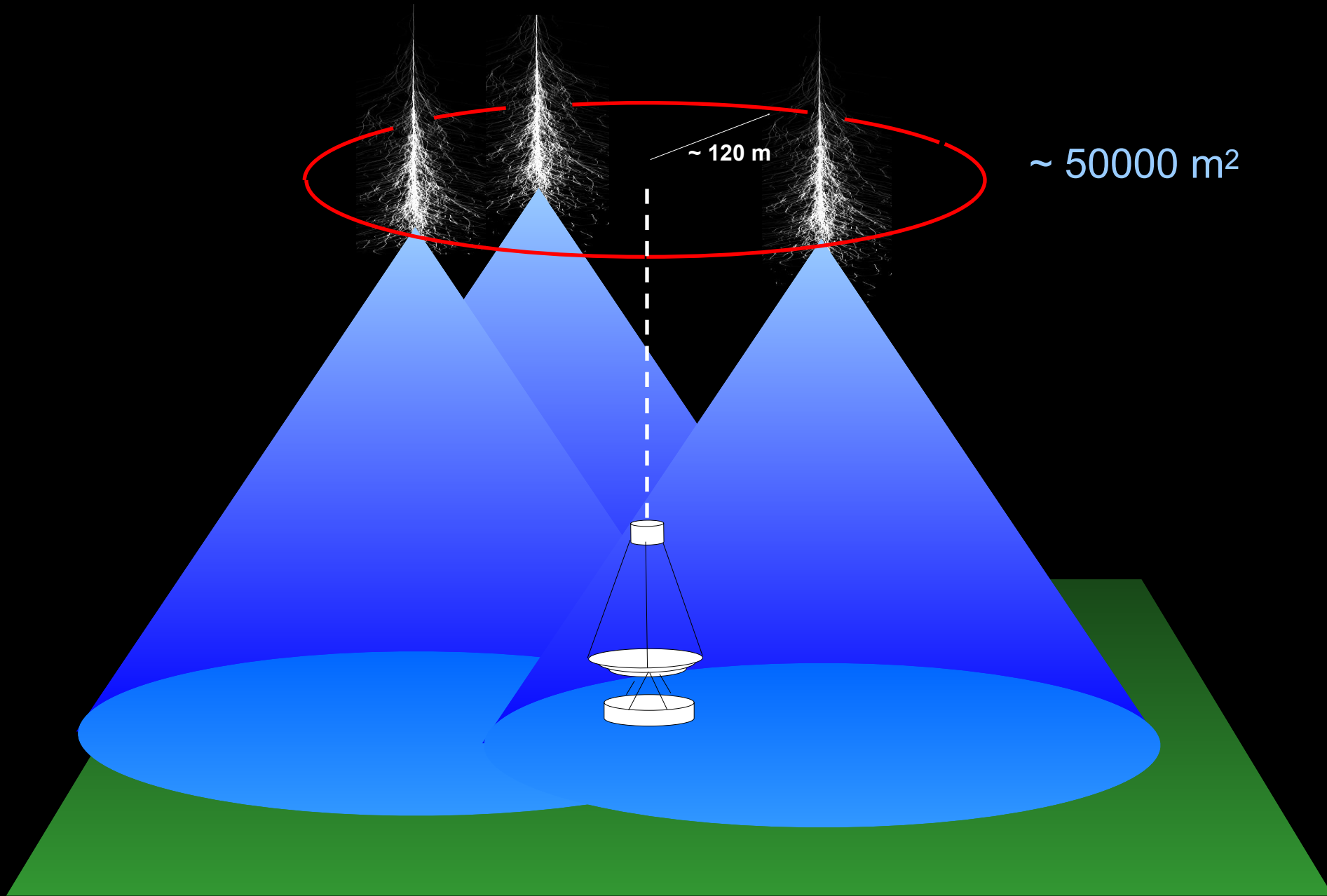


Image of source is somewhere on the image axis ...

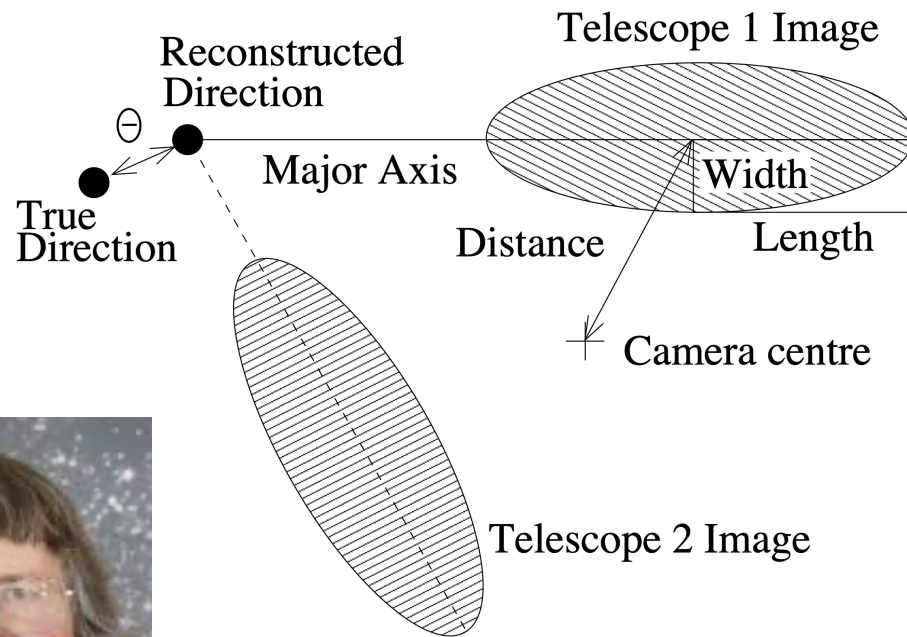
**Need several views !**

# Detection area for Cherenkov telescopes



# Reconstruction: Hillas Parameters

[the classical approach, robust and simple]



Michael Hillas  
1932 - 2017

- In first approximation, elmag shower images are elliptical
- Fit gives width, length, distance, size

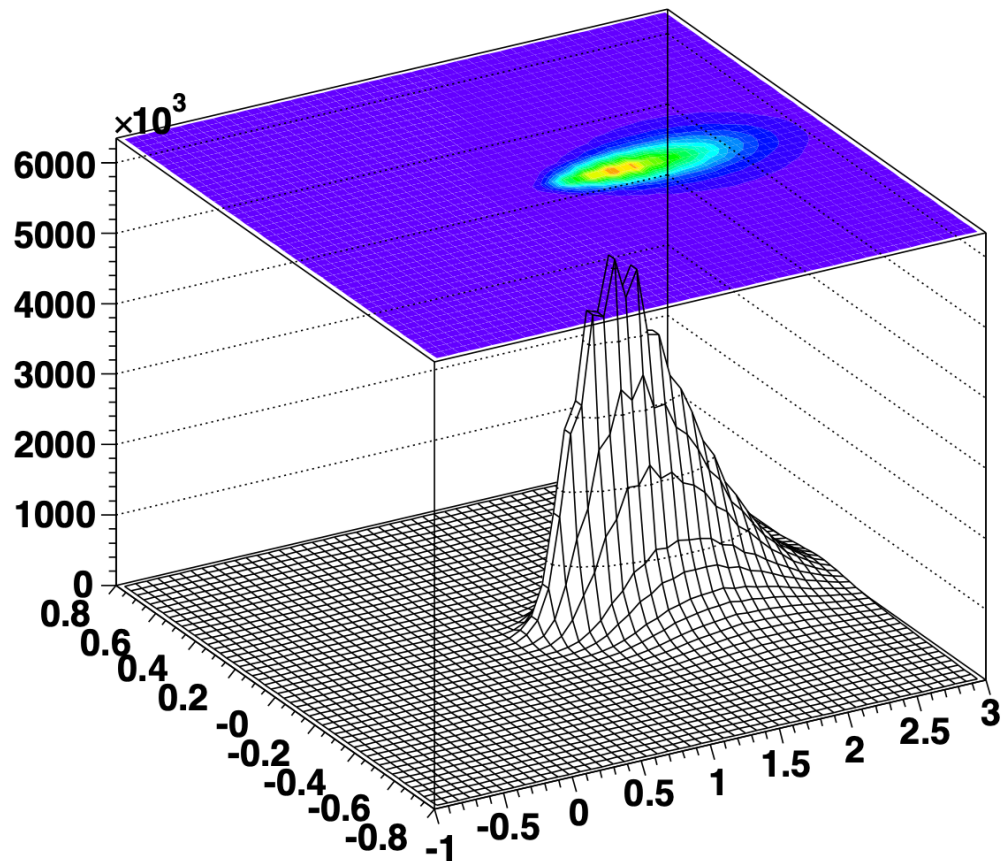
Reduction of shower image to a few parameters

- Comparison with (tabulated) simulations gives derived parameters like *mean scaled width*

$$MSCW = \frac{1}{N_{tel}} \sum \frac{width_i - \langle width_i \rangle_{MC}}{\sigma_i}$$

# Models of Shower Development

[the modern approach, computationally expensive and more sensitive]



With increasing computing power, we aim to make use of all image information available

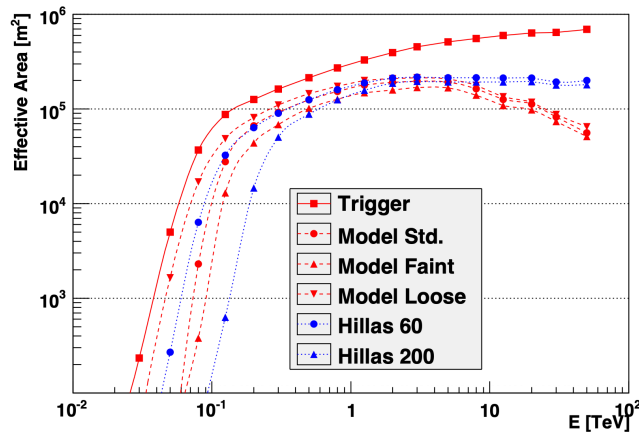
use models: either semi-analytical or entirely simulation based

Shower templates as function of energy, impact distance, primary interaction depth and zenith angle (interpolate)

Pixel per pixel comparison of observed intensity with shower model in a likelihood fit

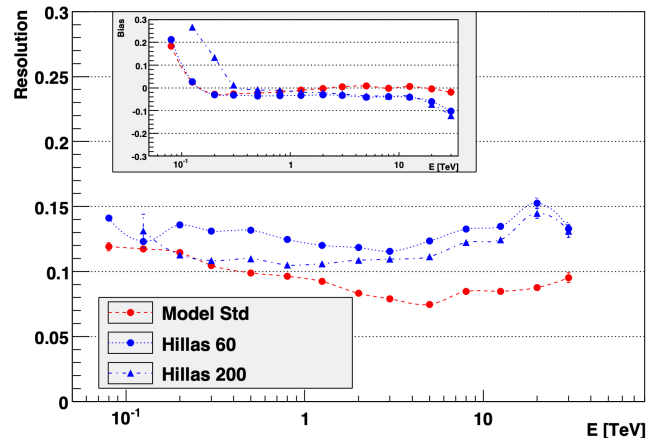
# Models of Shower Development

[the modern approach, computationally expensive and more sensitive]



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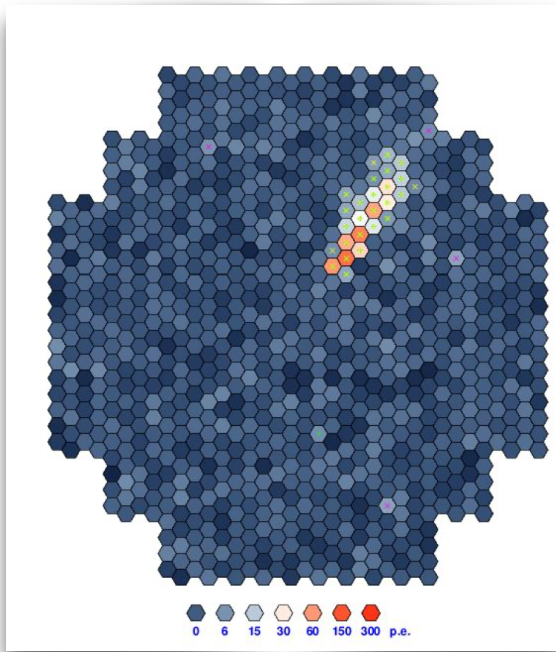
use models: either semi-analytical or entirely simulation based



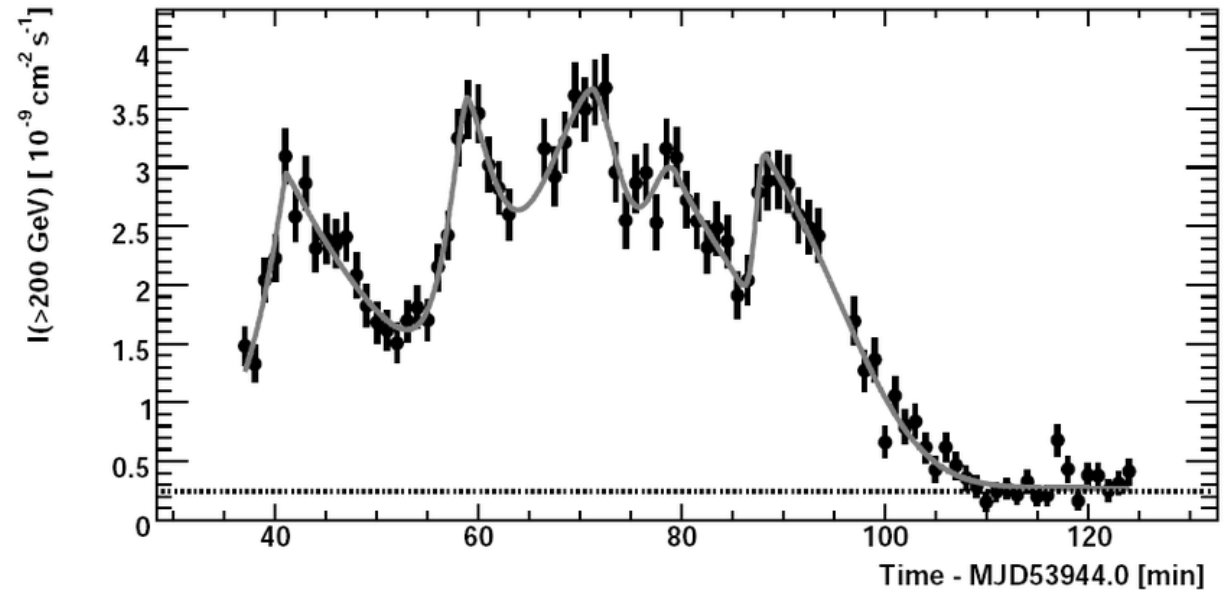
Shower templates as function of energy, impact distance, primary interaction depth and zenith angle (interpolate)

Pixel per pixel comparison of observed intensity with shower model in a likelihood fit

# From Measurement to Physics



Counts as function of reconstructed energy, direction and time



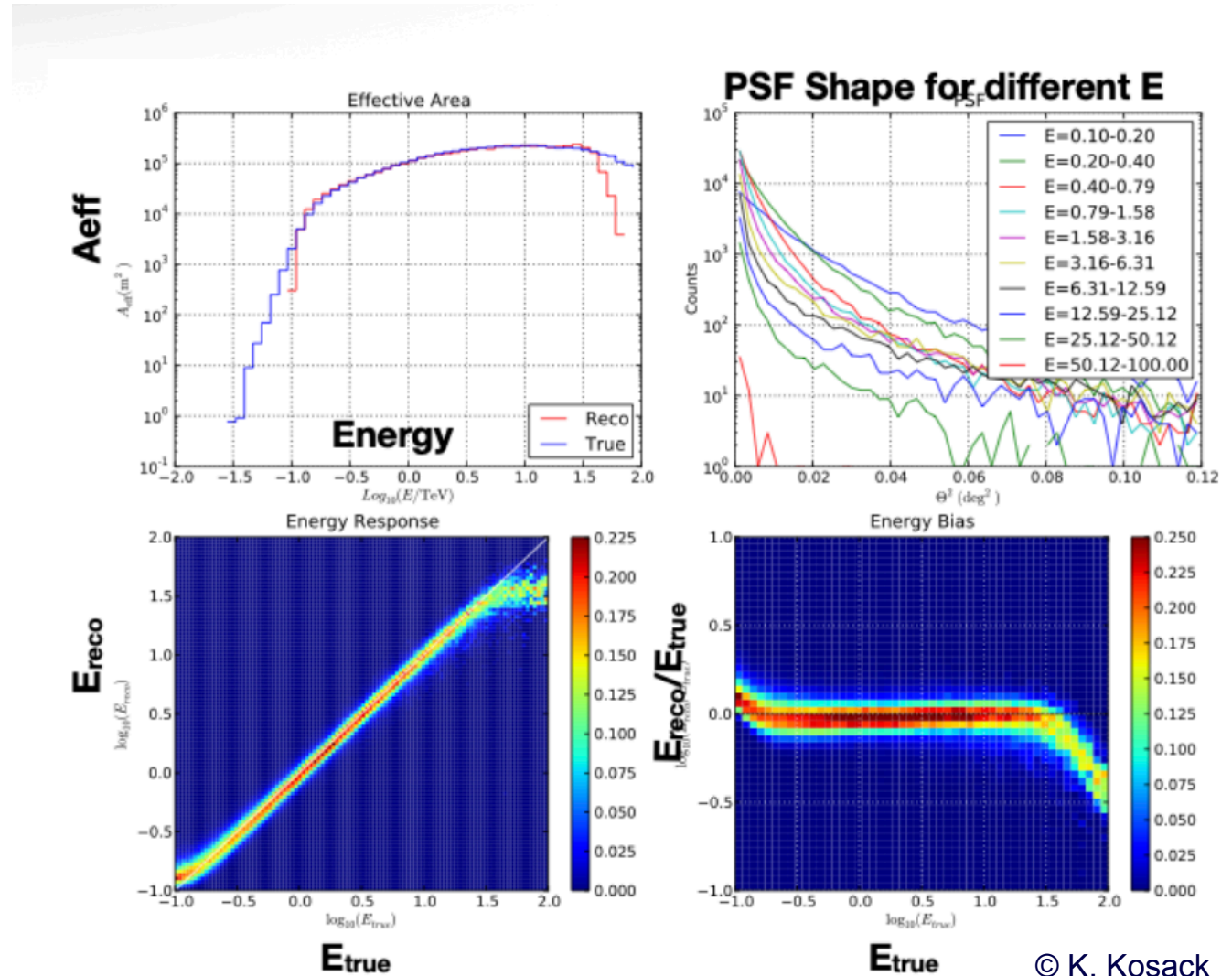
Flux as function of true energy, direction and time

**Instrument Response Functions** enable transition from measured to true quantities

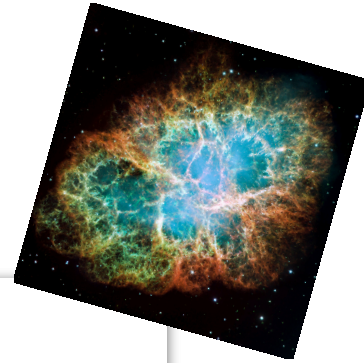
Generated from **air-shower simulations** where you have both the measured and the true quantities!

# Instrument Response Functions

- **Point Spread Function**
  - what is the system response to a perfect point in space?
- **Energy Migration Matrix**
  - what is the system response to a mono-energetic source?
  - consists of energy bias and energy resolution
- **Effective Area**
  - how many gamma-rays are really detected in a certain area?



# Cosmic-Ray Background



**How many photons do we see at 1 TeV? How many at 10 TeV?**

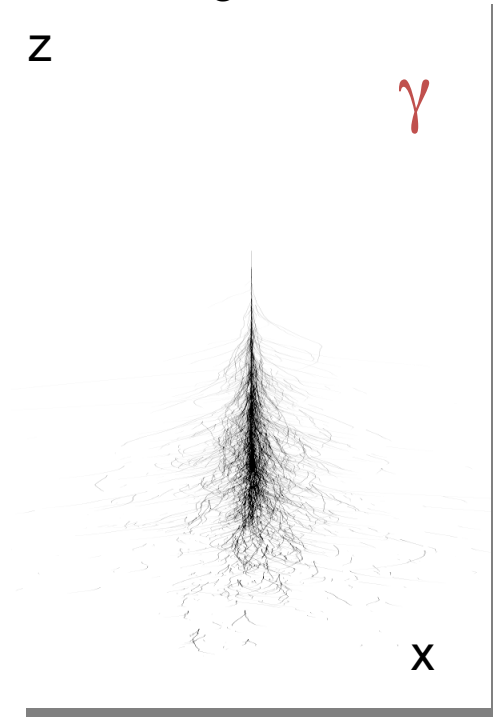
**For simplicity, consider a pure power law with  $C = 3.45 \cdot 10^{-11} \text{ cm}^{-2} \text{ s}^{-1} \text{ TeV}^{-1}$  and spectral index 2.6**

- at 1 TeV:  **$\sim 0.03$  photons per square metre and day!**
- at 10 TeV:  $\sim 0.0001$  photons per square metre and day
- in comparison, a CR proton has  $C \sim 10^{-5} \text{ cm}^{-2} \text{ s}^{-1} \text{ sr}^{-1} \text{ TeV}^{-1}$ , giving **10 000 particles per square metre and day**
- within 0.1 deg radius: **0.1 particle per square metre and day**

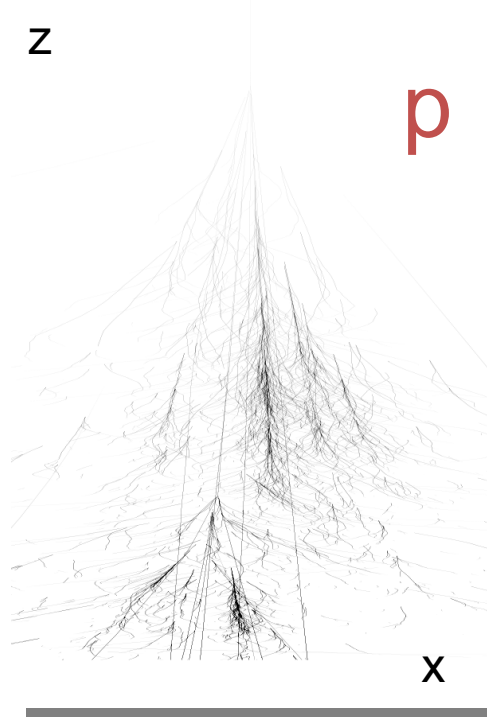
The number of cosmic-ray showers in a given region of the sky can be orders of magnitude more than for gamma rays

Rejecting them is critical

Electromagnetic shower

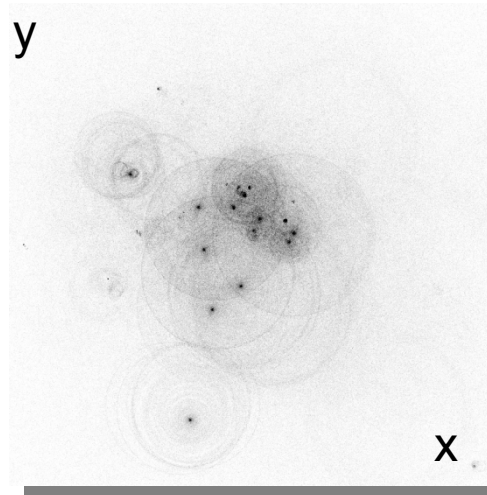
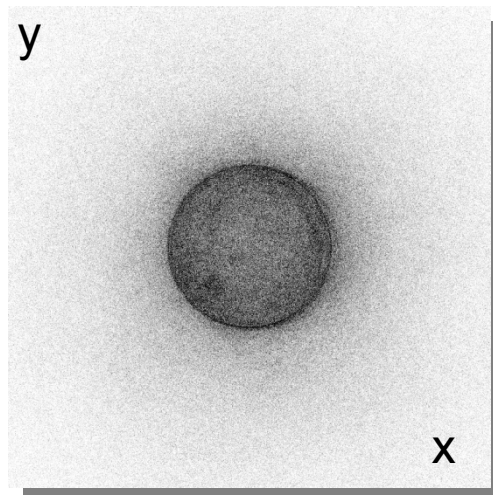


Hadronic shower



Electromagnetic and hadronic showers look on average different

Use this difference to separate them



### Electromagnetic shower

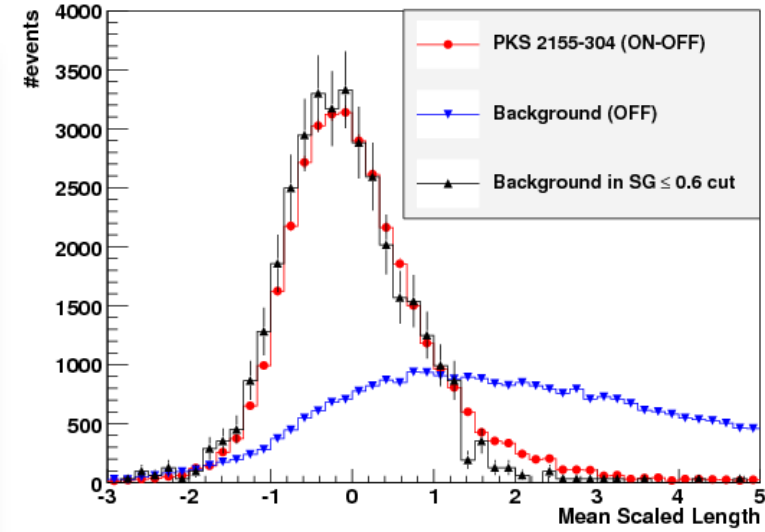
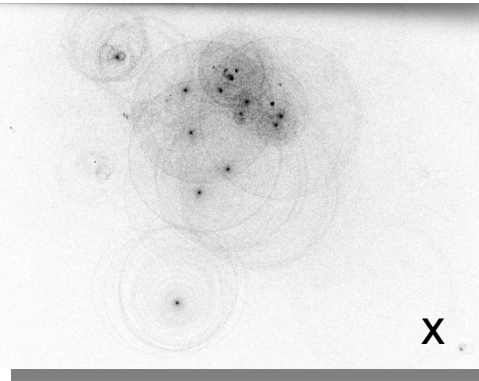
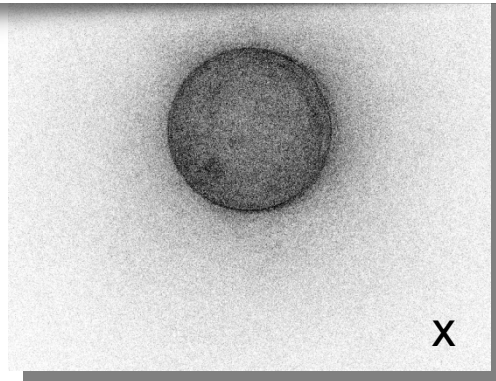
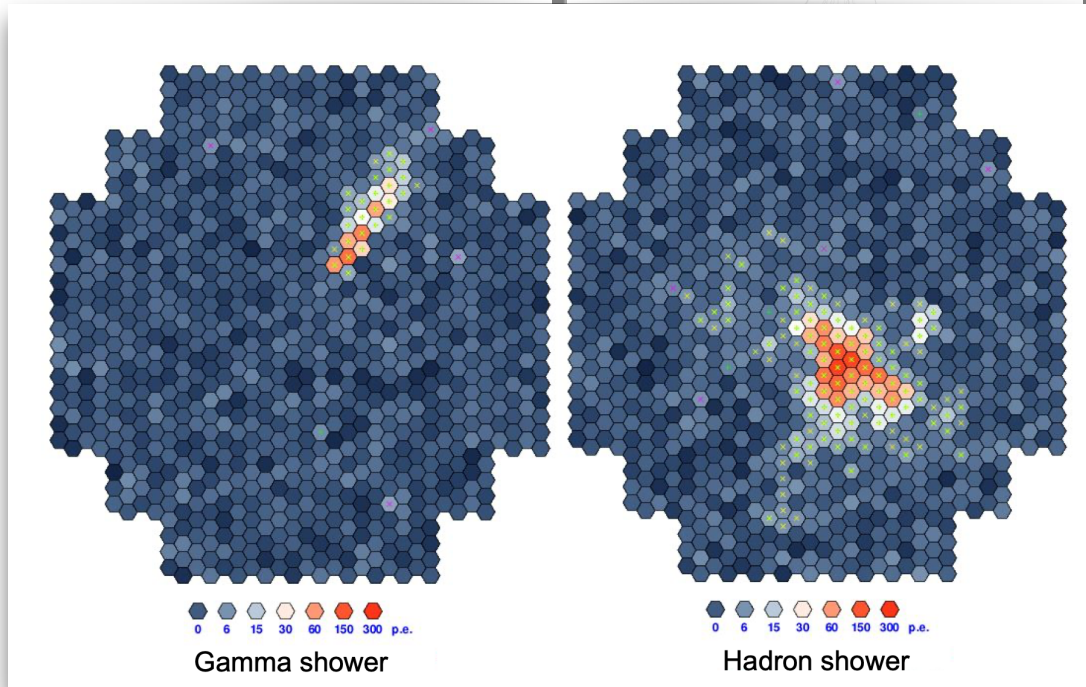
### Hadronic shower

z

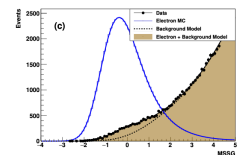
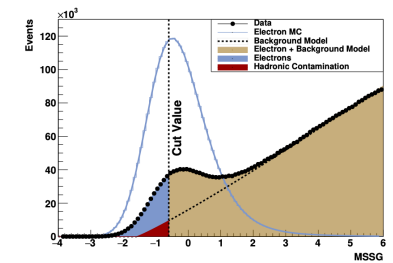
$\gamma$

z

p

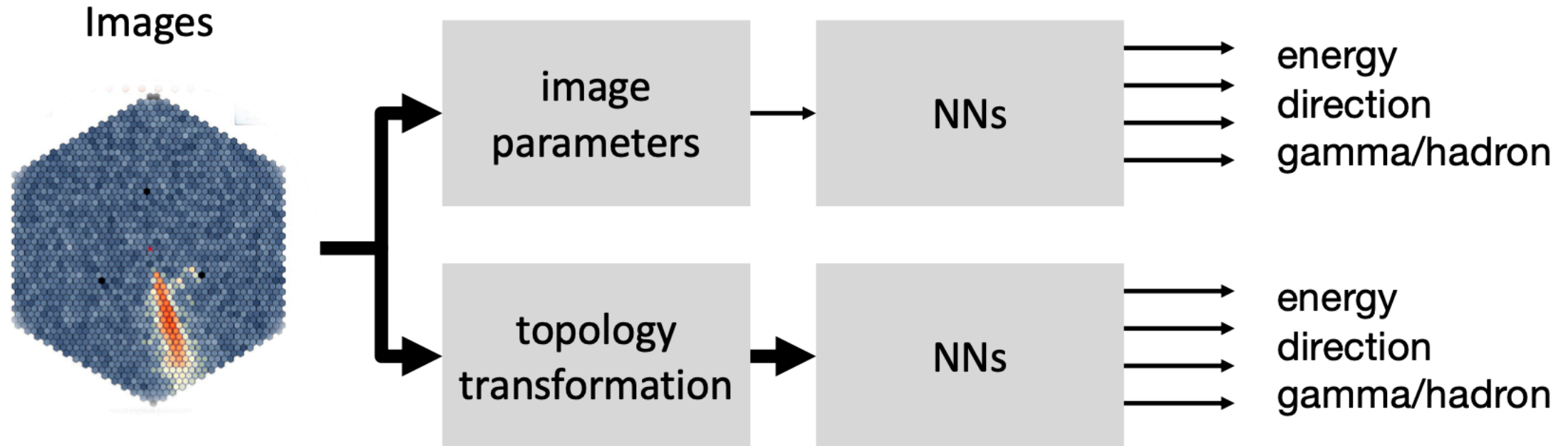


Width of the camera image  
(or the goodness of fit)  
normalised to corresponding  
value in simulations



## Gamma-hadron separation

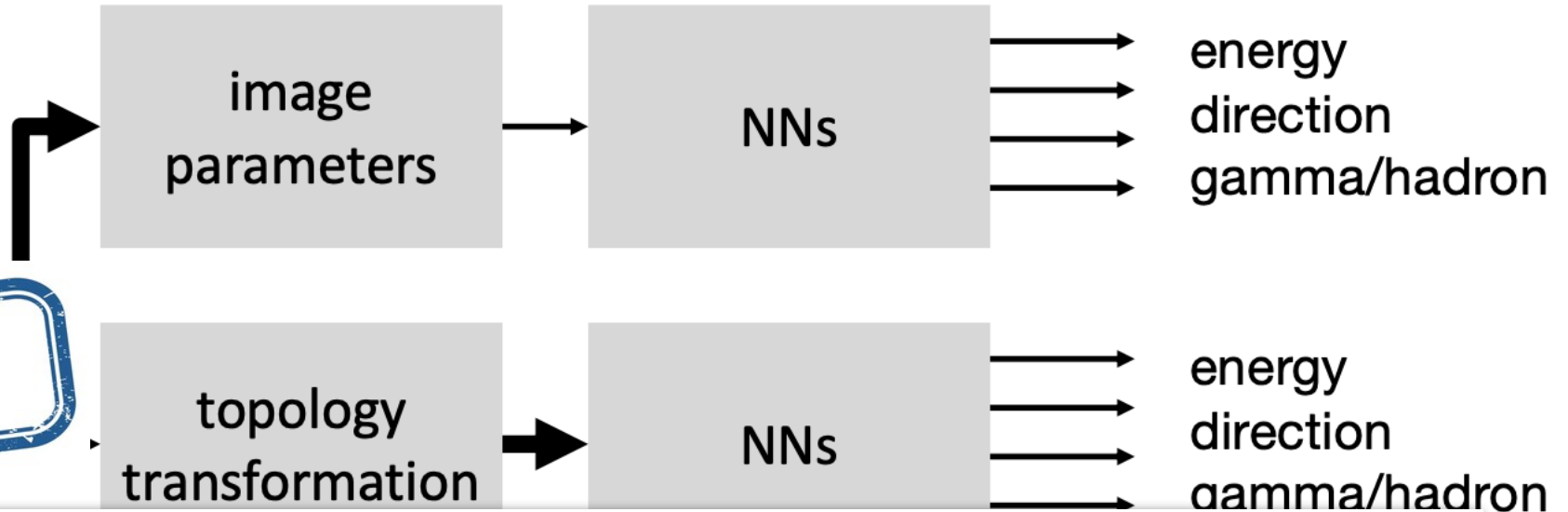
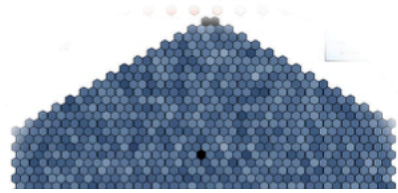
# MACHINE LEARNING EVERYWHERE



- Setting up a NN and getting some output is easy
- Making it perform at least as well as classical methods is non-trivial
- Making it perform reliably and stable on real-world data is very hard work

# MACHINE LEARNING EVERYWHERE

Images



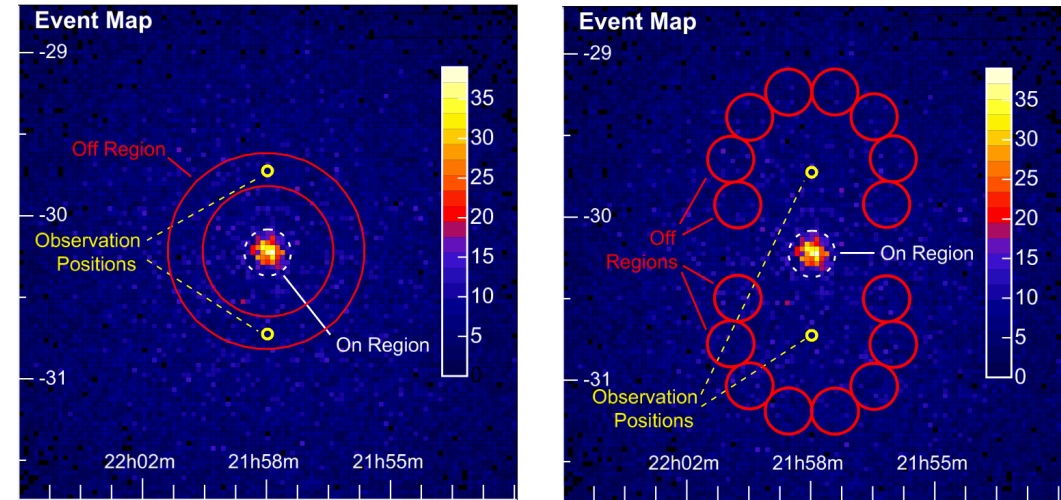
**YOUR TURN**

**What do you think makes it so hard to apply a neural network to real-world data?**

**Which of the two approaches is more promising in terms of**  
**(a) information content used**  
**(b) reliability?**

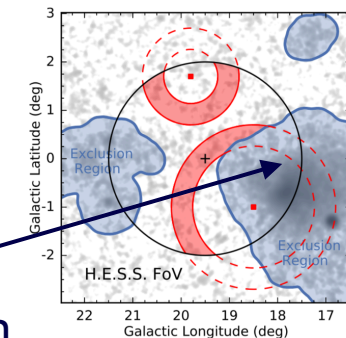
# Background Subtraction

- Necessary because of imperfect gamma/hadron separation
- Performed in background measurements in the FoV (+ assumption on **system response**)
- Iterative exclusion of regions with gamma-ray emission
- *Advantage*: 1st order cancelation of systematics related to condition of instrument and atmosphere
- *Disadvantage*: Only moderately suited for larger regions, results in subtraction of signal together with the background



**Background Modelling in Very-High-Energy  $\gamma$ -ray Astronomy**

D. Berge<sup>1,2</sup>, S. Funk<sup>1,3</sup>, and J. Hinton<sup>1,4,5</sup>



exclusion regions  
= regions with gamma-ray emission

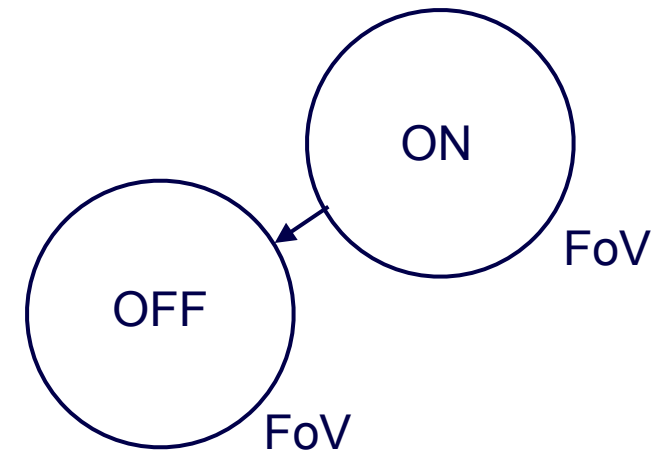
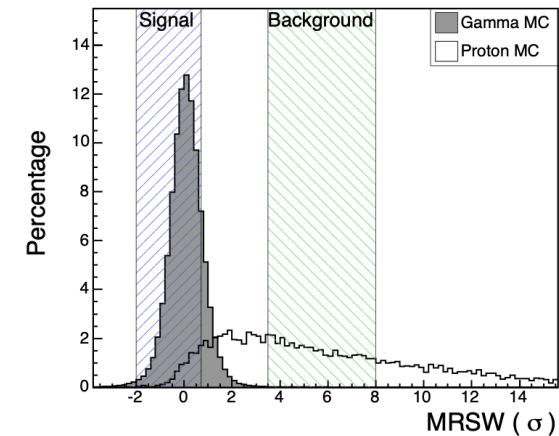
# Alternatives

## OFF regions in parameter space:

- still requires regions to determine the shape of the background distribution
- simulations? not very reliable

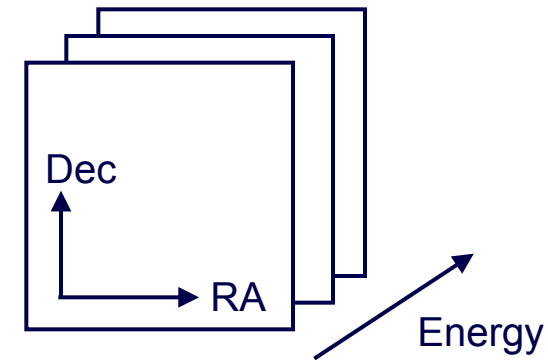
## ON-OFF observations:

- go back in RA to observe dedicated OFF field
- duplicates observation time



# Background Models

- Usage of old observations with no/easily excludable sources
- Use atmosphere calibration info and average over many blank fields in zenith and azimuth
- Control region in the field of view for verification/fitting
- Have a binned background model in 3D:  
2 spatial coordinates and energy

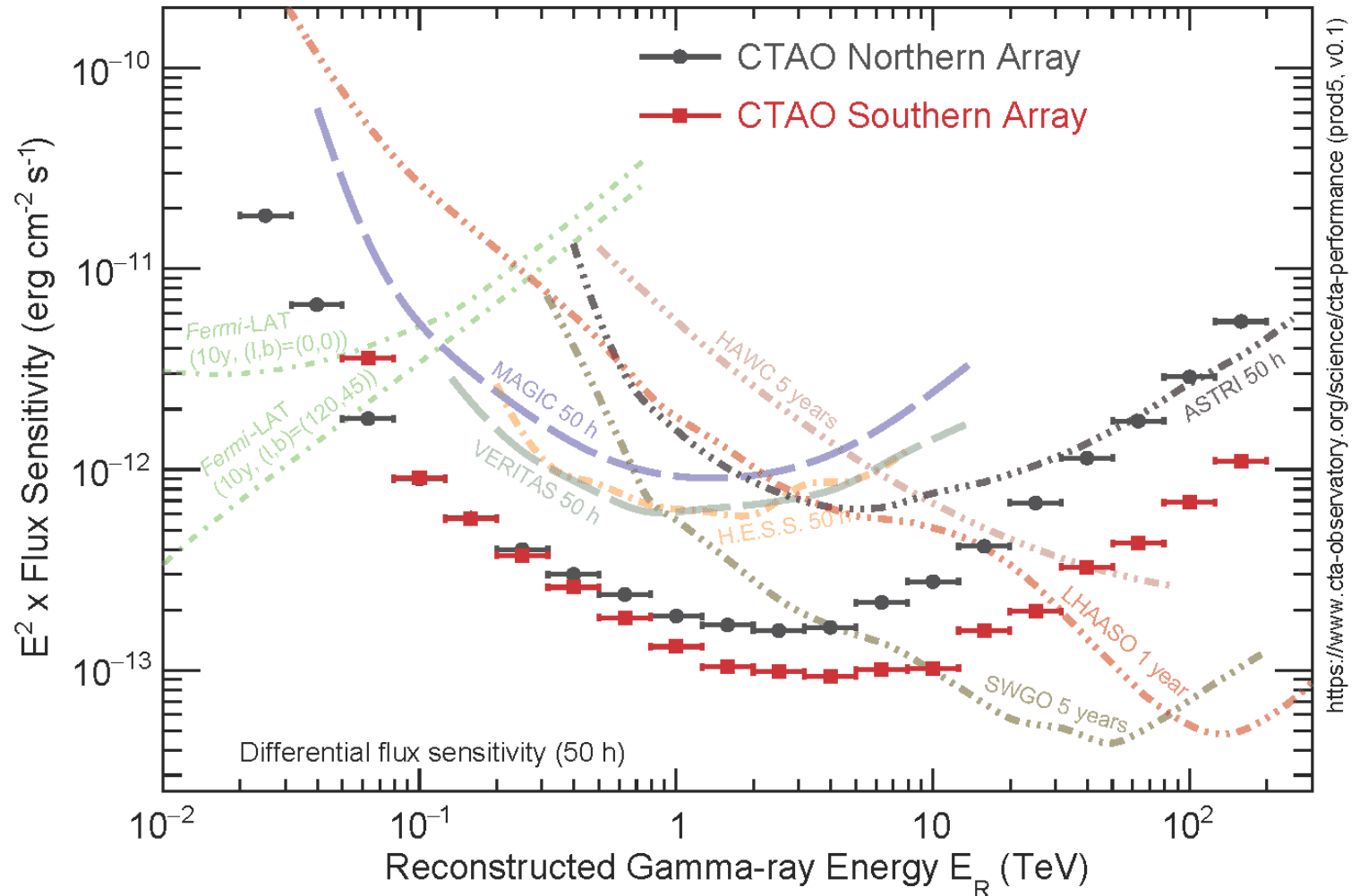


# Sensitivities

Sensitivity curves serve as easy figure to compare between instruments

Which minimum flux is still significantly detectable in a certain time of observation

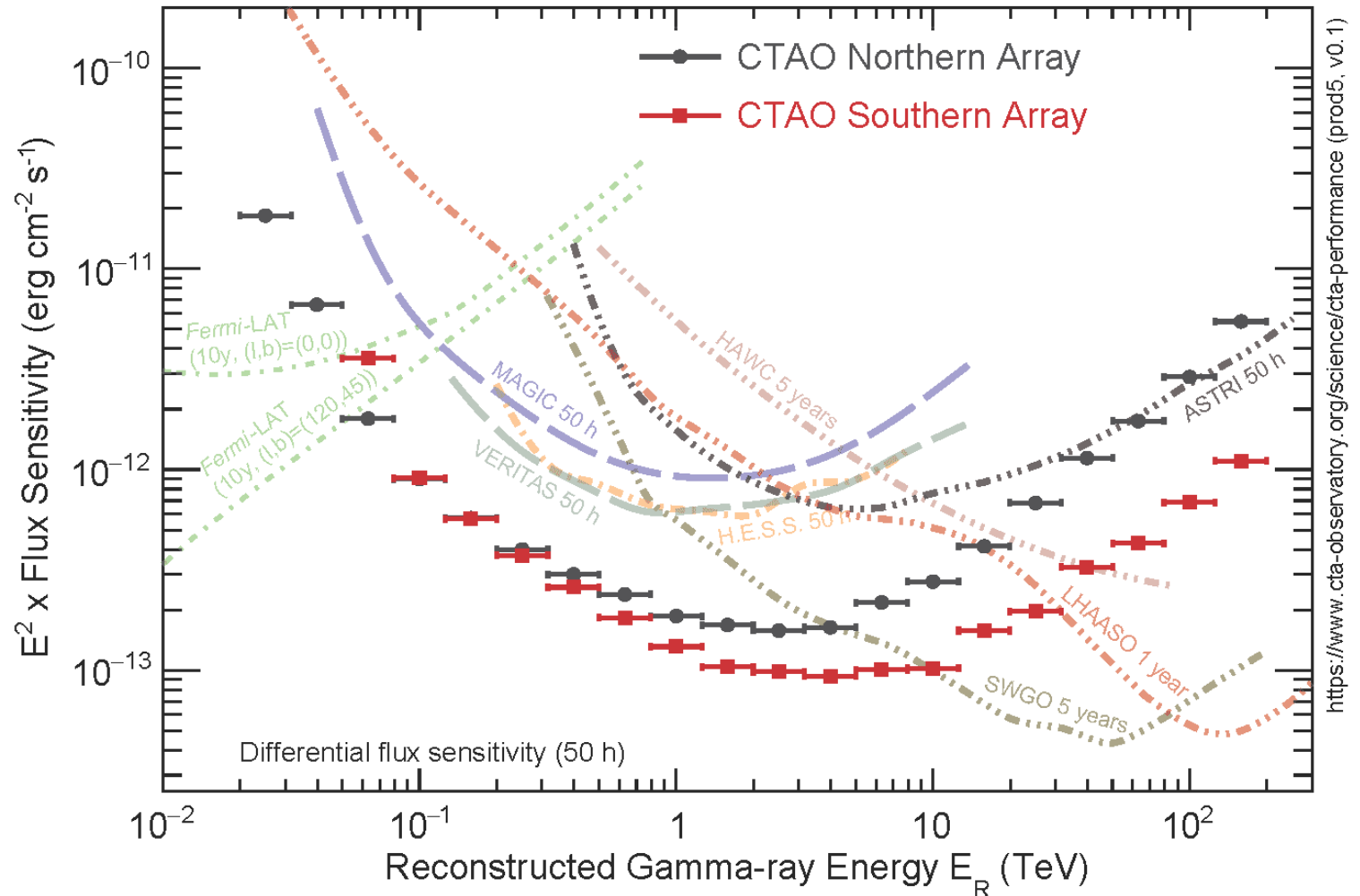
the lower, the better!



# Sensitivities

Careful in the comparison of  
different instrument types  
→ some element of  
arbitrariness

Does not reflect other  
performance indicators like  
resolution



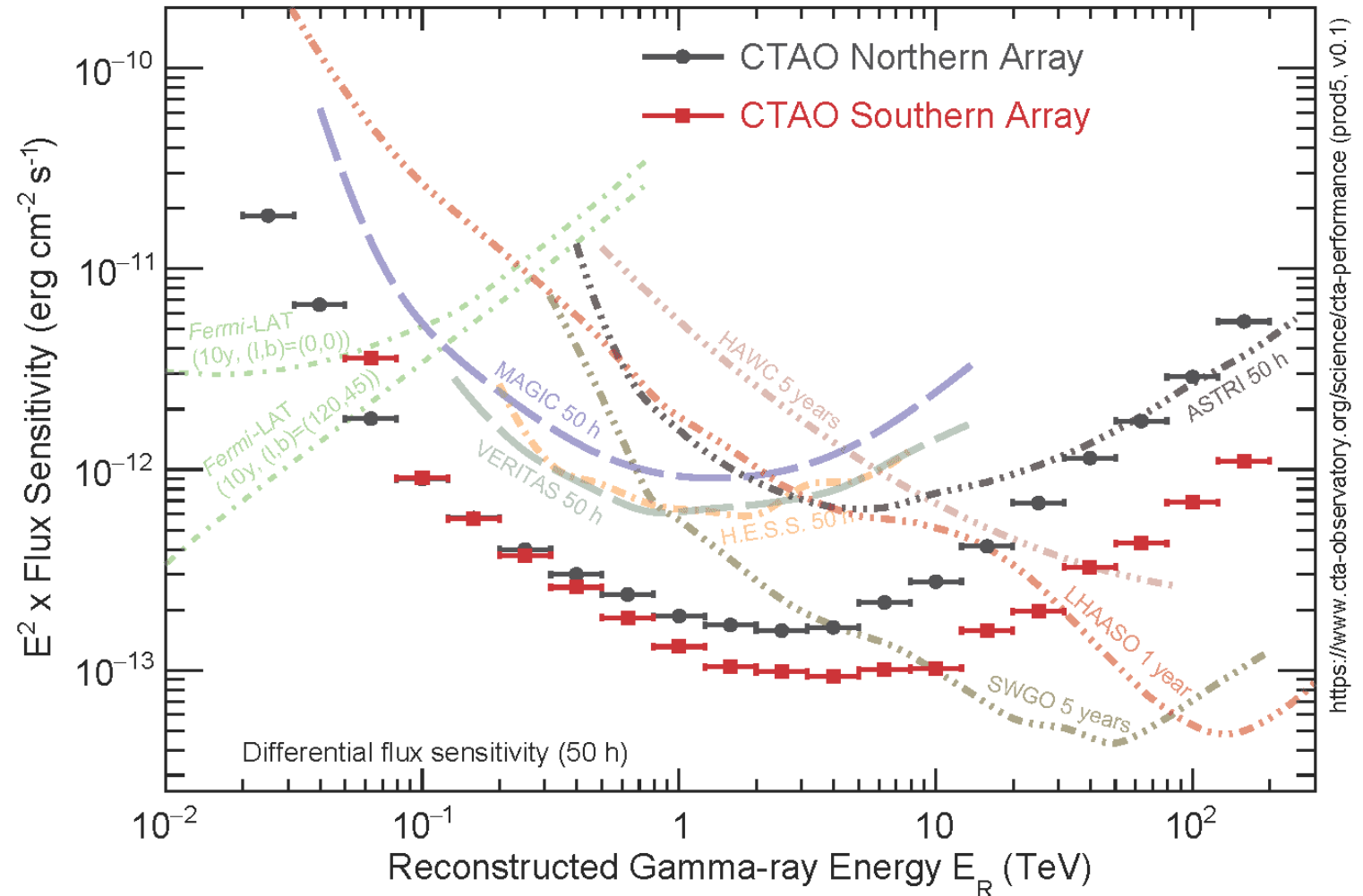
# Sensitivities

at low energies: trigger on upward fluctuations

at intermediate energies: background-limited region

in first order  $S \sim \text{signal}/\text{bkg}^{1/2}$

at high energies: statistics-limited region



# Sensitivity for IACTs and PDAs

**YOUR TURN**

**Assume that in 20 hours we can detect a point-like source significantly in the background-limited regime with an angular resolution of 0.1deg. How does this time change if we have an angular resolution of 0.5 deg like many particle detector arrays?**

**Is this relevant, given the different observation modes of IACTs and PDAs?**

**Discuss: Which advantages do you see for IACTs for the observation of time-variable point-like sources and for steady and extended sources?**

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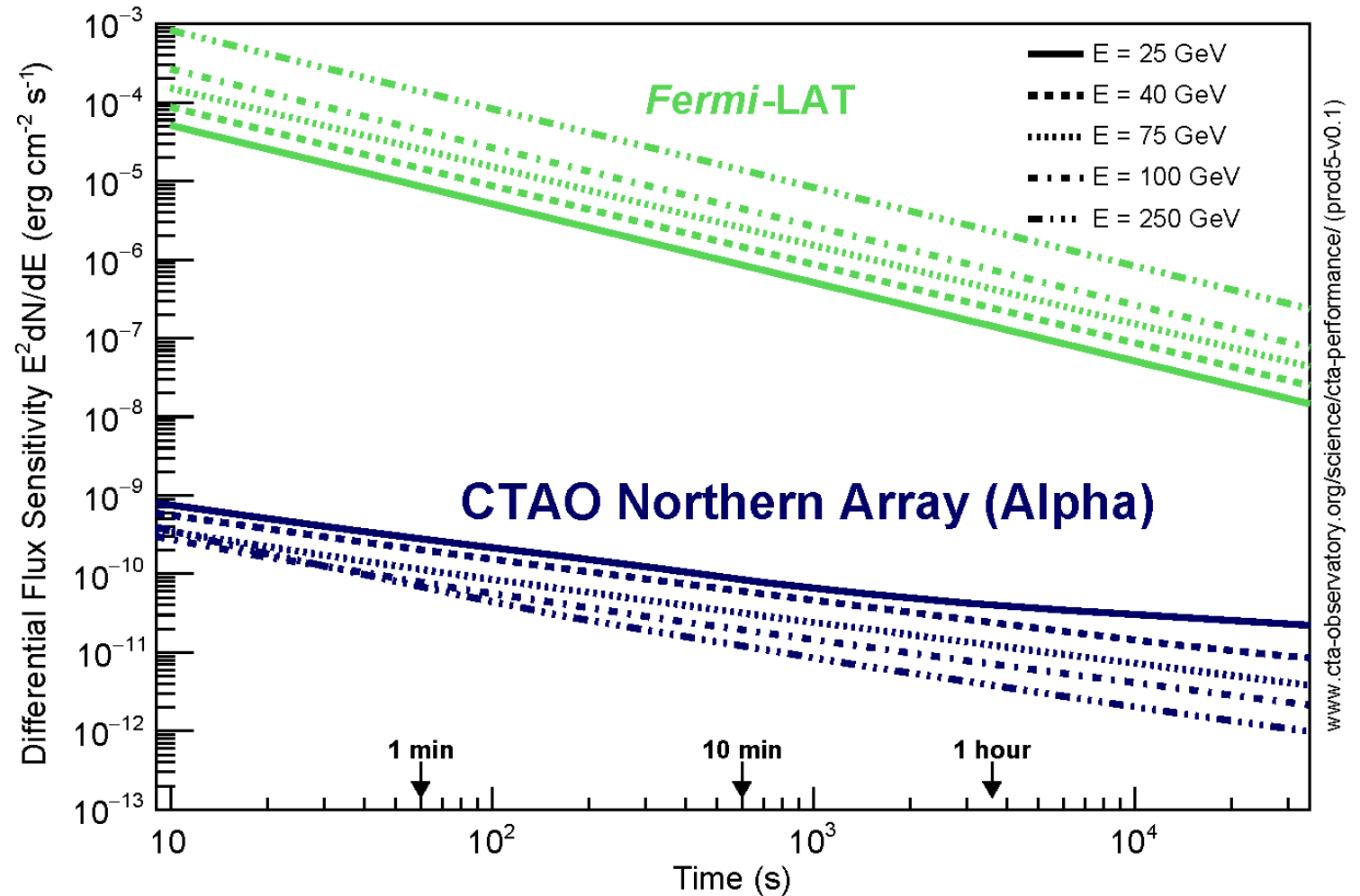
- The new background count per time is  $n_{\text{bkg}} = (0.5\text{deg}/0.1\text{deg})^2 n_{\text{bkg},0} = 25 n_{\text{bkg},0}$
- If  $n_{\text{signal},0}/\sqrt{n_{\text{bkg},0}}$  is not supposed to change, we need to increase the time by factor of  $x$ :  
 $n_{\text{signal},0}/\sqrt{n_{\text{bkg},0}} \neq n_{\text{signal},0} * x / \sqrt{25 n_{\text{bkg},0} * x}$
- Solving for  $x$  gives  $x/\sqrt{x} = \sqrt{25} \rightarrow x = 25$ ,  $t = x * 20 \text{ hours} = 500 \text{ hours}$

# Sensitivities

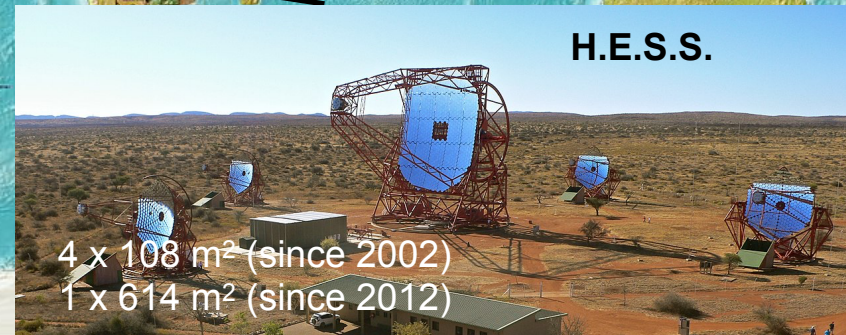
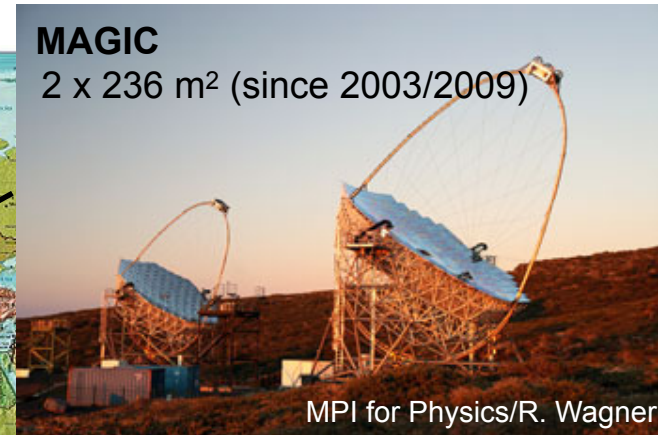
Alternative way of looking at things:

sensitivity vs. time

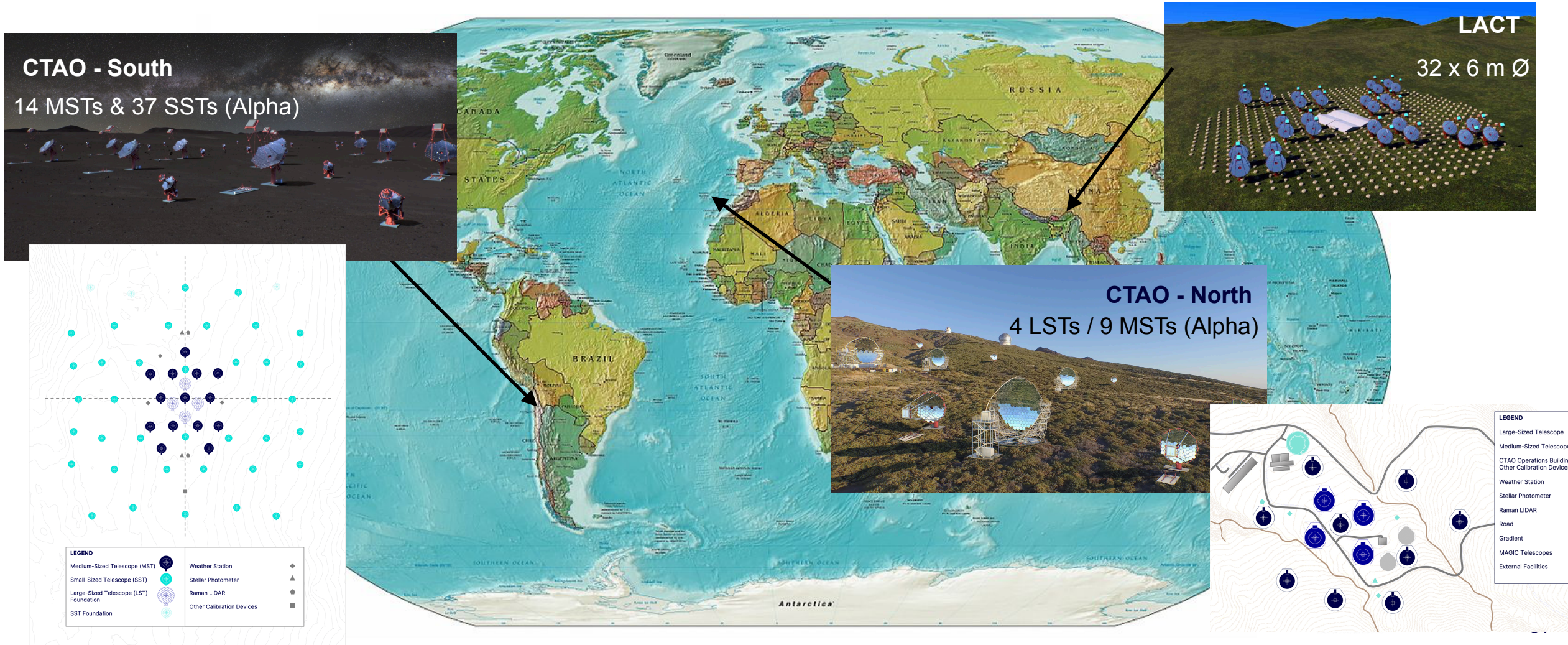
Demonstrates the possibilities to do time-resolved astrophysics at a fixed energy  
transient phenomena



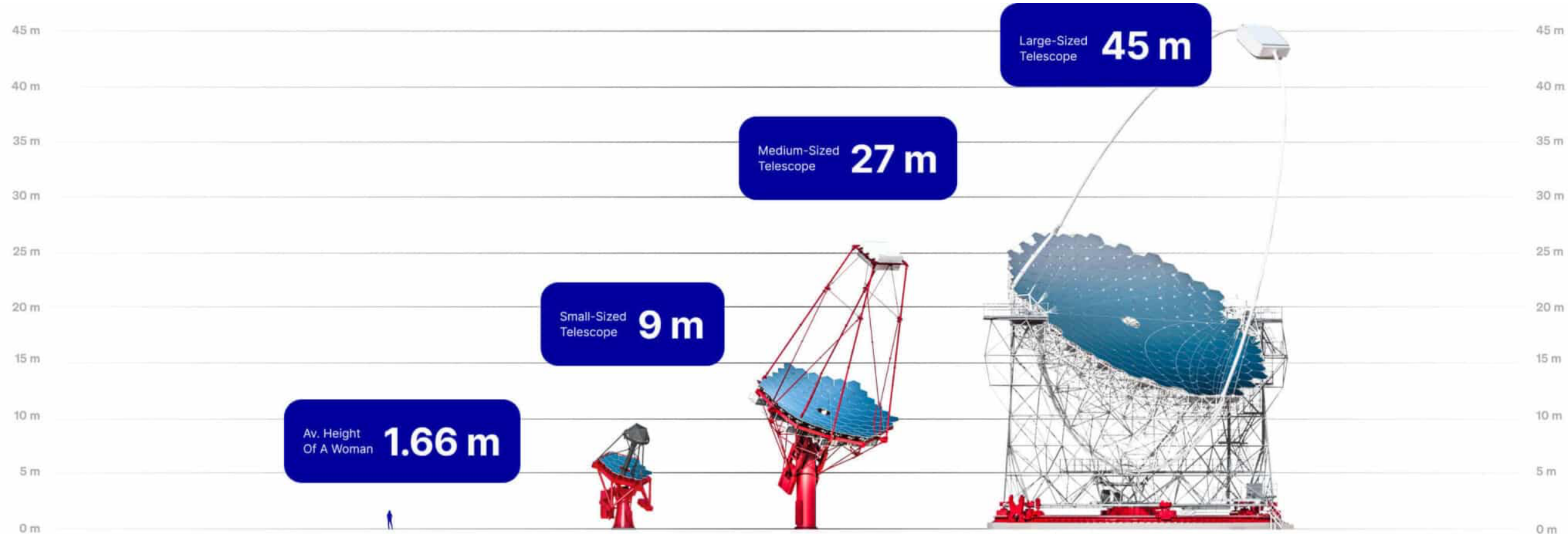
# Current IACT Instruments



# Next-Generation IACT Instruments



# Different telescopes for a larger dynamical range

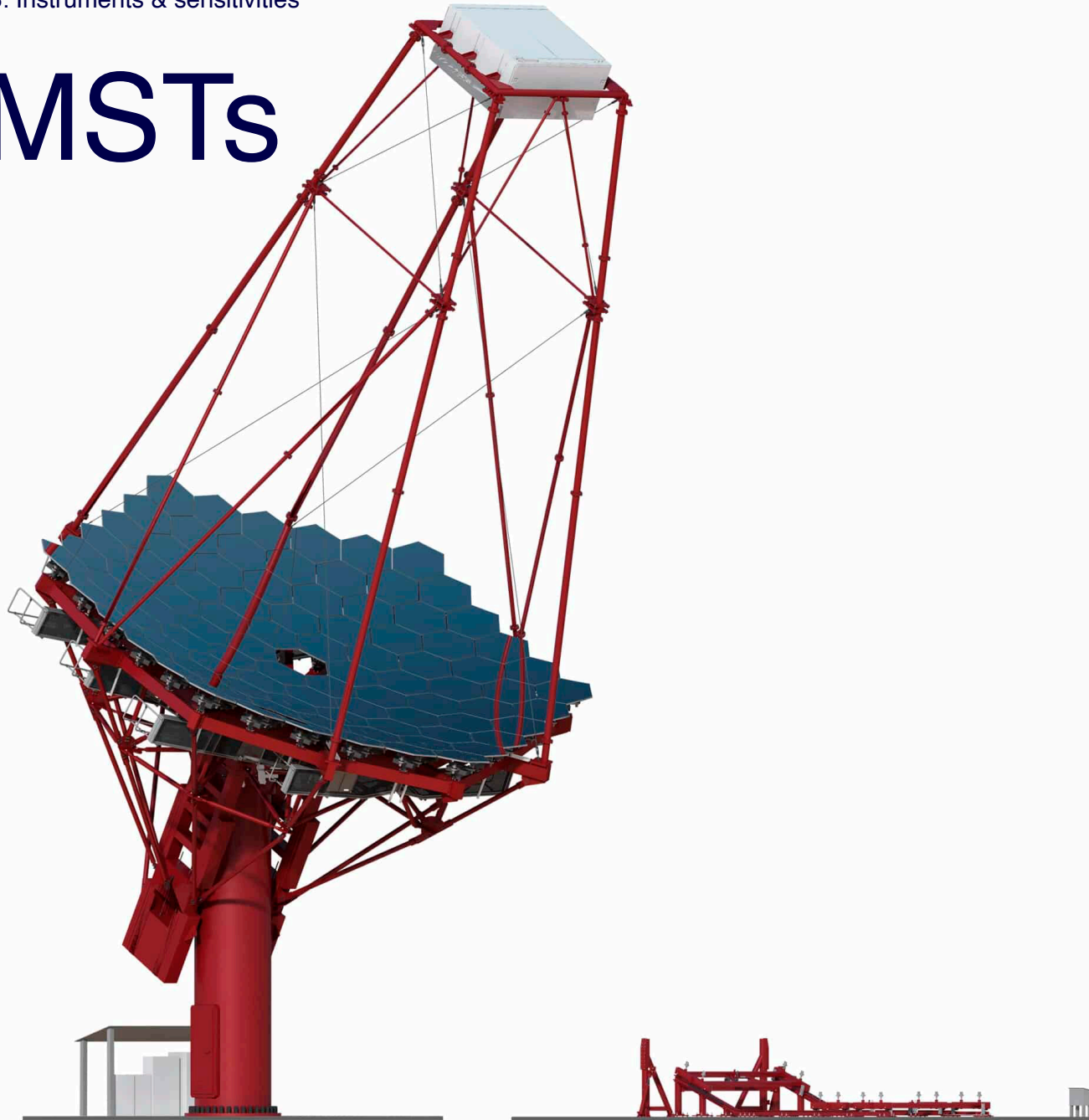


# SSTs



	Small-Sized Telescope (SST)
Energy range (in which sensitivity is optimized)	2 TeV – 300 TeV
Number of SST telescopes	37 (South)
Optical design	Modified Schwarzschild-Couder
Primary reflector diameter	4.3 m
Secondary reflector diameter	1.8 m
Effective mirror area (including shadowing)	>5 m <sup>2</sup>
Focal length	2.15 m
Total weight	17.5 t
Field of view	8.8 deg
Number of pixels	2048
Pixel size (imaging)	0.16 deg
Photodetector type	SiPM
Telescope readout event rate (before array trigger)	600 Hz
Telescope data rates (readout of all pixels; before array trigger)	2.55 Gb/s
Positioning time to any point in the sky (>30° elevation)	70 s
Pointing precision	<7 arcseconds
Observable sky	Any astrophysical object with elevation > 24 degrees

# MSTs



	Medium-Sized Telescope (MST)
Energy range (in which sensitivity is optimized)	80 GeV – 50 TeV
Number of MST telescopes	14 (South) 9 (North)
Optical design	Modified Davies-Cotton
Reflector diameter	11.5 m
Effective mirror area (including shadowing)	88 m <sup>2</sup>
Focal length	16 m
Total weight	89 t
Field of view (FlashCam / NectarCAM)	7.5 deg / 7.7 deg
Number of pixels (FlashCam / NectarCAM)	1764 / 1855
Pixel size (imaging)	0.17 deg
Photodetector type	PMT
Telescope readout event rate before array trigger (FlashCam / NectarCAM)	>6 kHz / >7.0 kHz
Telescope data rates (readout of all pixels; before array trigger)	12 Gb/s
Positioning time to any point in the sky (>30° elevation)	90 s
Pointing precision	<7 arcseconds
Observable sky	Any astrophysical object with elevation > 20 degrees

# LSTs



	Large-Sized Telescope (LST)
Energy range (in which sensitivity is optimized)	20 GeV – 3 TeV
Number of LST telescopes	4 (North)
Optical design	Parabolic
Primary reflector diameter	23.0 m
Effective mirror area (including shadowing)	370 m <sup>2</sup>
Focal length	28 m
Total weight	103 t
Field of view	4.3 deg
Number of pixels	1855
Pixel size (imaging)	0.1 deg
Photodetector type	PMT
Telescope readout event rate after array trigger	>7.0 kHz
Telescope data rates (readout of all pixels; before array trigger)	24 Gb/s
Positioning time to any point in the sky (>30° elevation)	30 s
Pointing precision	<14 arcseconds
Observable sky	Any astrophysical object with elevation > 24 degrees

# Thank you for your attention

and my apologies for all the topics I had to leave out  
and that you would have liked to learn more about