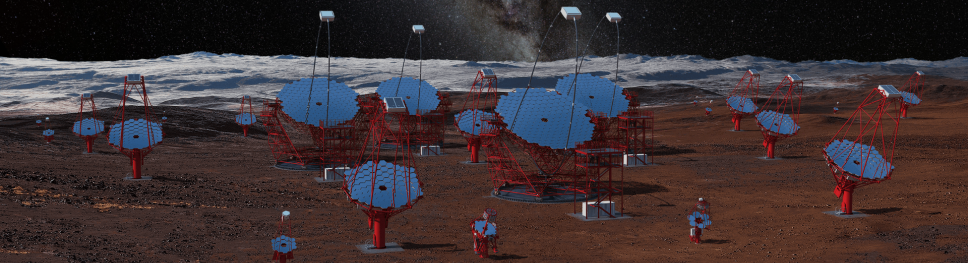


Towards precision VHE gamma-ray astronomy in the CTA-LST era

Christian Fruck (fruck@mpp.mpg.de)

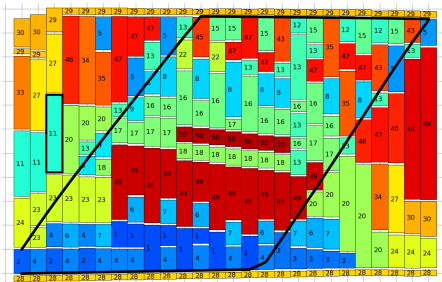
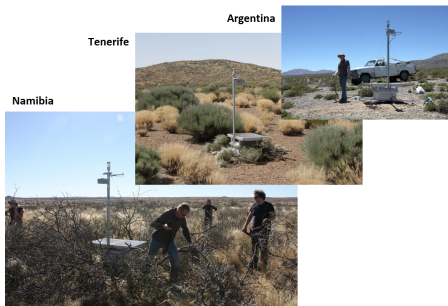
Max-Planck-Institut für Physik

Munich - January 31st 2017

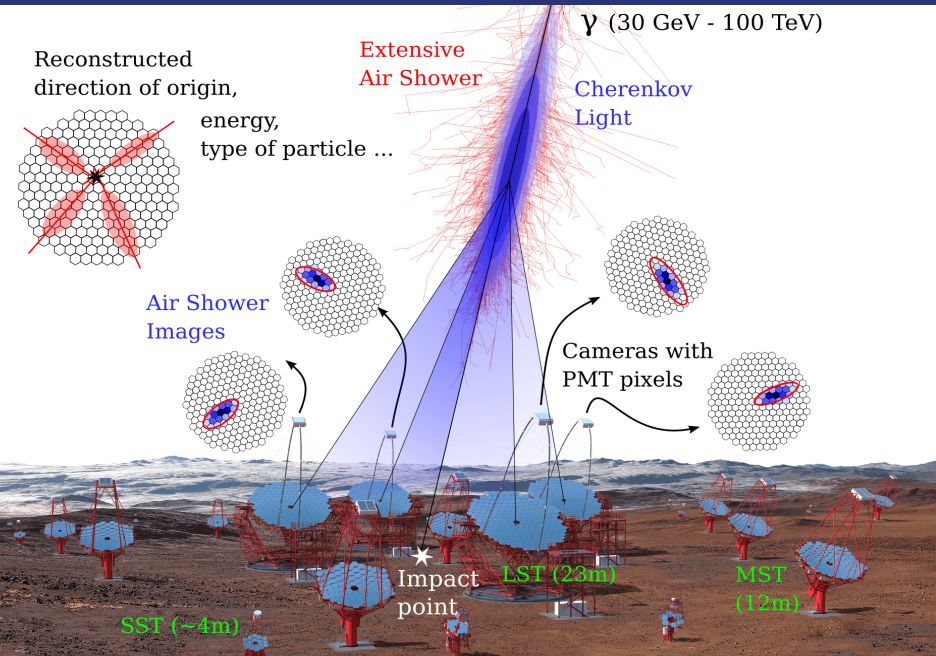


My past/current activities in gamma-ray astronomy – outline of this talk

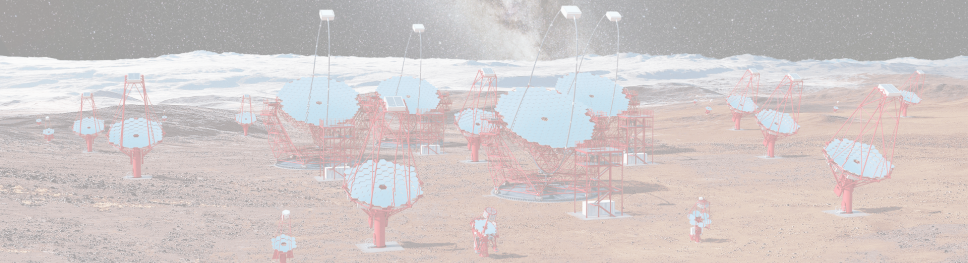
- **ATMOSCOPE** (CTA site evaluation, 9 candidate sites, 6 countries)
- ▶ **MAGIC LIDAR** system
- ▶ **Atmospheric calibration** method for MAGIC
- ▶ multi-year obs. campaign of **Galactic Center**
- ▶ **Analysis software for extended sources**
- **Observation scheduler** for MAGIC
- **Convener** of **ATCA** and **Galactic WG**



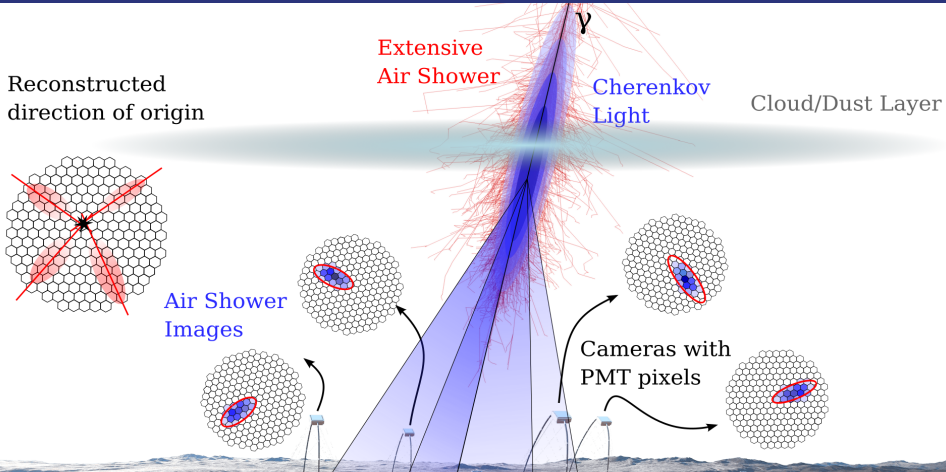
Imaging Air Cherenkov Telescopes and CTA in a nutshell



Atmospheric calibration using LIDAR measurements



The effect of clouds/aerosols in the field of view



Consequences for the reconstruction:

- 0th order: energy threshold increased
- 1st order: energy bias proportional to transmission for Cherenkov light and instrument response (trigger efficiency, A_{eff}) changed
- 2nd order: shower reconstruction biased (classification, direction, ...)

The MAGIC LIDAR system (measuring transmission)

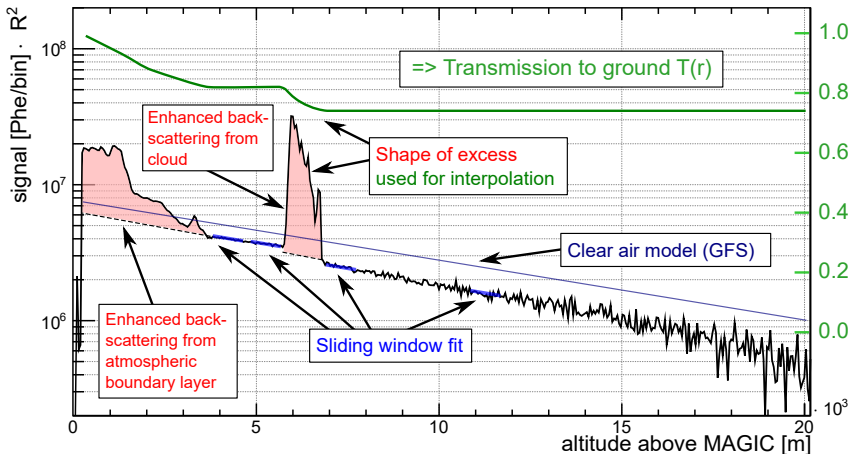


- ▶ Light Detection And Ranging (LIDAR) system operating alongside with MAGIC
- ▶ Using $25 \mu\text{J}$ pulse energy, 532nm pulsed laser ('micro'-LIDAR)
- ▶ Hybrid Photo Detector (HPD) for single photon counting
- ▶ GAsP photocathode for high QE ($> 50\%$)
- ▶ Automatically slave-tracking MAGIC coordinates on robotic mount

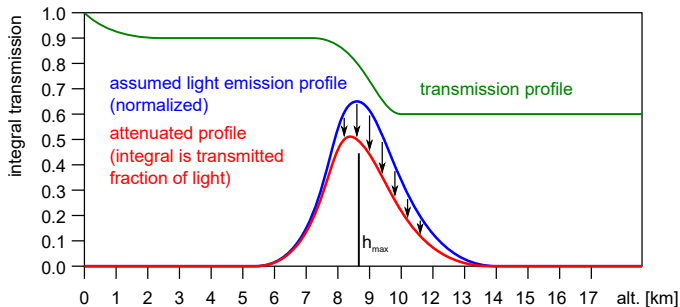
image credit: Robert Wagner, Matthias Bergmann

New analysis technique for elastic LIDAR measurements

- ▶ Plot: solid angle corrected back-scattered **ph.e. counts** v.s. **altitude**
- ▶ Example: **real data** with **cloud** and **aerosol layer** (small zenith distance)
- ▶ Assumption: clear air regions with **dominant Rayleigh scattering** (532 nm)
- ▶ Method: **fitting/comparing** Rayleigh **model** to LIDAR data in sliding window
- ▶ Final result: integral **transmission** to ground



Event wise energy correction strategy:

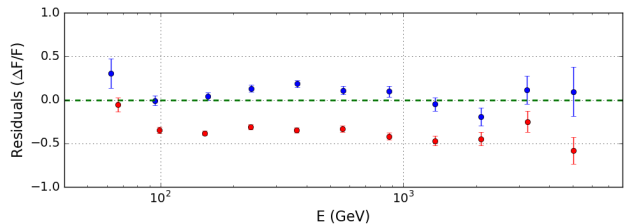
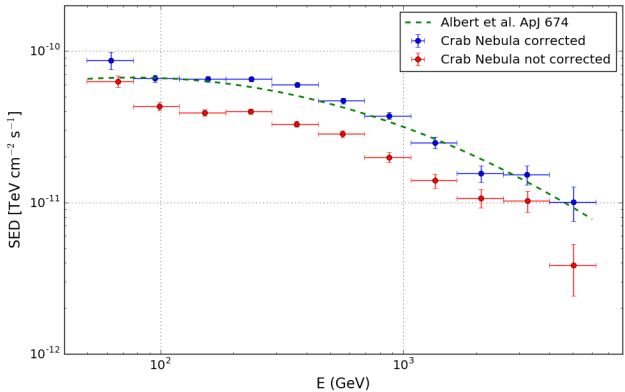


$$\bar{\tau} = \int_0^{h_{max}} \epsilon(h) \cdot T_{aer}(h) dh, \quad (1)$$

$$E_{true} = \frac{E_{obs.}}{\bar{\tau}} \quad (2)$$

1st order: instrument response is function of observed energy $A(E_{obs.})$

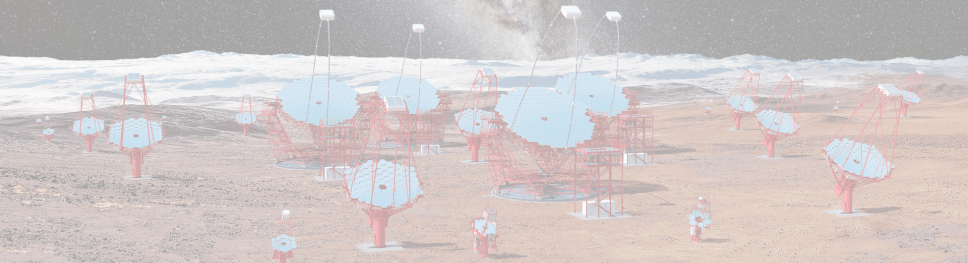
Correcting Crab Nebula data (7h low transmission sample, unfolded)



- ▶ Crab Nebula spectrum (standard candle, ApJ 674, not a fit!)
- ▶ Before correction: flux underestimated by ~ 40%
- ▶ After correction: good match, considering the bad quality of the data

- ▶ **First successful** atmospheric correction method for IACTs based on LIDAR
 - ▶ Presented at several conferences:
[arXiv:1403.3591](#), [EPJ Web of Conferences 89, 02003 \(2015\)](#)
 - ▶ Paper currently being finalized (together with Markus Gaug)
- ▶ First papers **applying** the method to **scientific data**:
 - ▶ [Mrk501 MWL campaign](#) (Furniss et al, *ApJ*, 812 (2015) 65)
only 5h of 22h surviving standard cuts, 10 more h recovered using this method
 - ▶ [V339 Del nova outburst](#) (Ahnen et al. *A&A*, (2015), 582, A67)
adjustment of upper limits
- ▶ Plans for future (CTA):
 - ▶ Implement for use with first (LST) science data
 - ▶ Adapt/improve (new instruments, [Raman LIDAR](#), better calibration)
 - ▶ Explore more sophisticated methods ([tailored Monte Carlo](#))

Studying the VHE emission from the Galactic Center



The Galactic Center: in 20cm, 1.1mm, IR

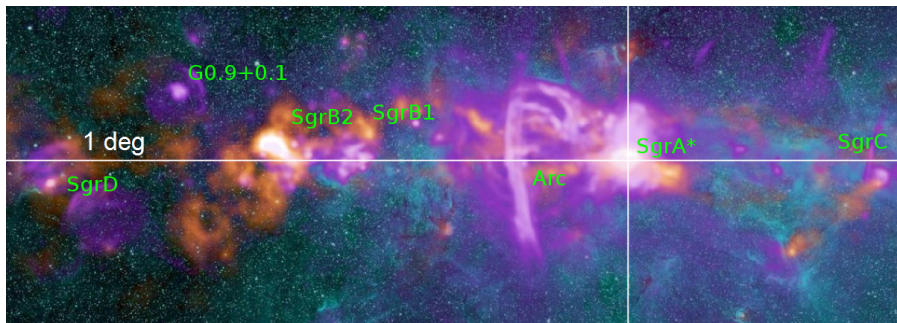


image source: <http://images.nrao.edu>

- ▶ GC hosts **Super Massive Black Hole (SMBH)** ($4 \cdot 10^6 M_{\odot}$)
- ▶ very dense and active **astrophysical environment**
- ▶ considered good place to search for **DM** annihilation/decay

G2 gas cloud falling onto the Galactic Center

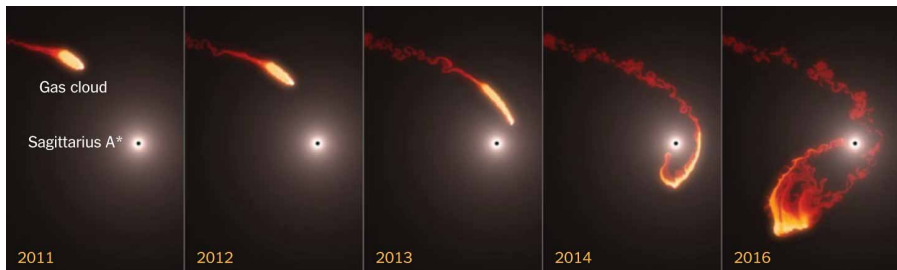
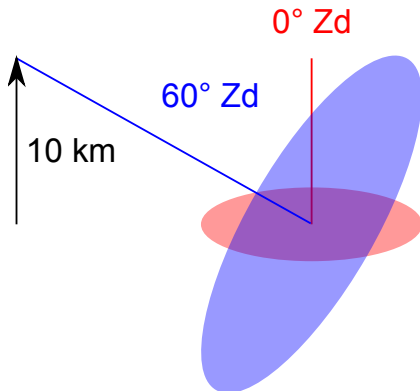


image source: ESO

- ▶ Gas cloud of $3 m_{\odot}$ on its way towards SgrA* (S. Gillessen et al. 2012)
 - ▶ Pericentre passage 2013-2014, at $\sim 2000 r_g$ (S. Gillessen et al. 2013)
 - ▶ Possible interaction with the SMBH
- ⇒ Monitoring campaigns triggered in nearly all wavelengths (radio to γ rays)
- ▶ Observations by MAGIC in 2012 - 2015 (and also 2016)
 - ▶ Publishing paper in A&A (accepted for publication, arXiv:1611.07095)

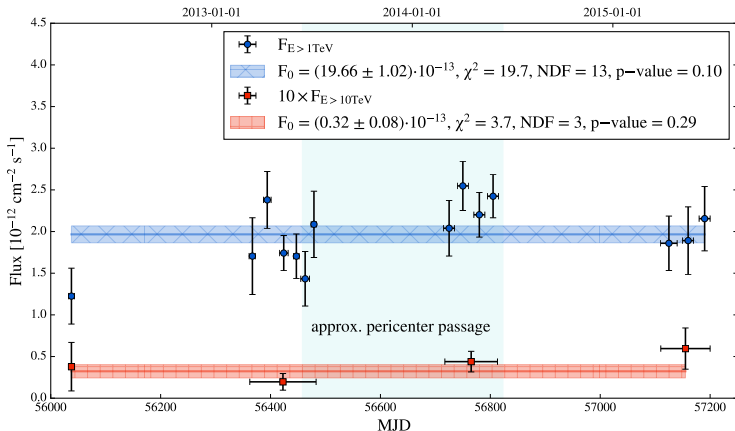
Observation conditions (large zenith distance)

- ▶ Culmination: $\sim 58^\circ$ Zd
- ▶ Observation between 58° and 70°
- ▶ Larger light pool size
- ▶ Cherenkov light diluted
- ▶ Enhanced absorption
- ▶ Energy threshold $\times 4$ to 10
- ▶ Collection area $\times 4$ to 10



Light curve during G2 pericentre passage

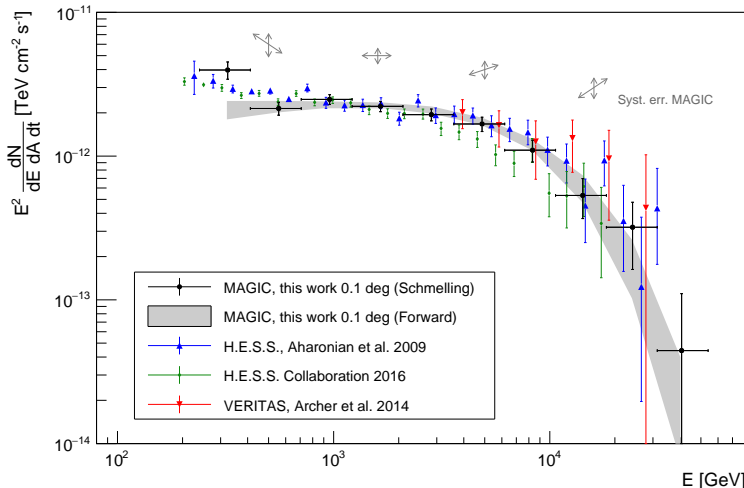
- ▶ MAGIC light curve for the central point-like (SgrA*) source: $E > 1$ TeV, $E > 10$ TeV
- ▶ Integration radius 0.1° around SgrA*
- ▶ Only very good quality 2012/13/14/15 data (~ 67 h)
- ▶ Flux compatible with constant in all energy bands
- ▶ Also no reports about unusual flux variability in other wavebands



Spectral energy distribution (SED)

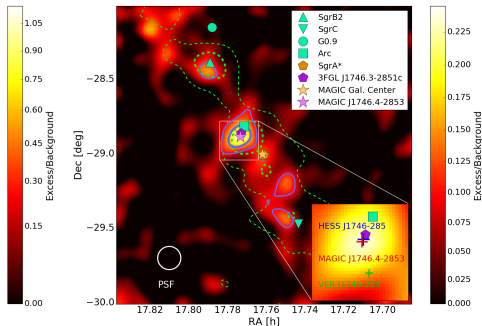
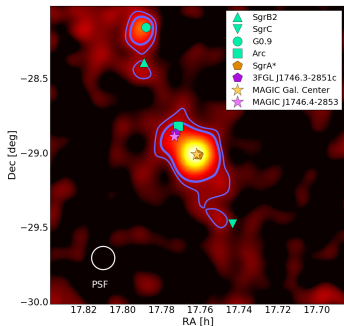
- ▶ MAGIC SED compared to other previous measurements
- ▶ Integration radius 0.1° around SgrA*, $\sim 67\text{h}$ of very good quality 2012/13/14/15 data
- ▶ Power law with exponential cutoff fit (forward folding):

$$\frac{dF}{dE} = (7.26 \pm 0.89) \text{cm}^{-2} \text{s}^{-1} \text{TeV}^{-1} \left(\frac{E}{2 \text{TeV}} \right)^{(-1.85 \pm 0.13)} \exp\left(-\frac{E}{(7.57 \pm 2.29) \text{TeV}}\right)$$

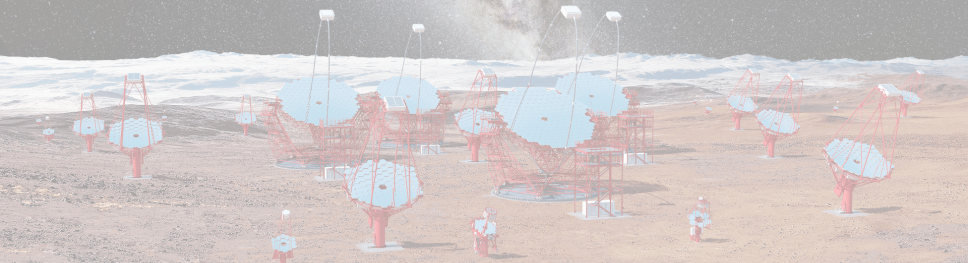


Sky Map of the GC region – fitting/subtracting known sources

- ▶ Excess in units of background $(N_{on} - N_{off})/N_{off}$ with TS significance contours
- ▶ Point-like emission from the locations of SgrA* and G0.9+0.1 (left: fitted/subtracted)
- ▶ Diffuse emission from along the Gal. plane (ridge seen by H.E.S.S.)
- ▶ New source MAGIC J1746.4-2853 at location of radio Arc
- ▶ Possible coincidence with 3FGL J1746.3-2851c, HESS J1746-285 and VER J1746-289
- ▶ Possible counterparts/scenarios:
 - ▶ Bremsstrahlung from cosmic electrons in MCs? (Yusef-Zadeh et al., 2013)
 - ▶ CRs (past activity of SgrA* or Supernovae) interacting with MC (Oka et al. 2001)?
 - ▶ PWN candidate at location of the source (Lemiere et al. 2015)
- ▶ Complex morphology, difficult to analyze with available software (opt. for point srcs.!).

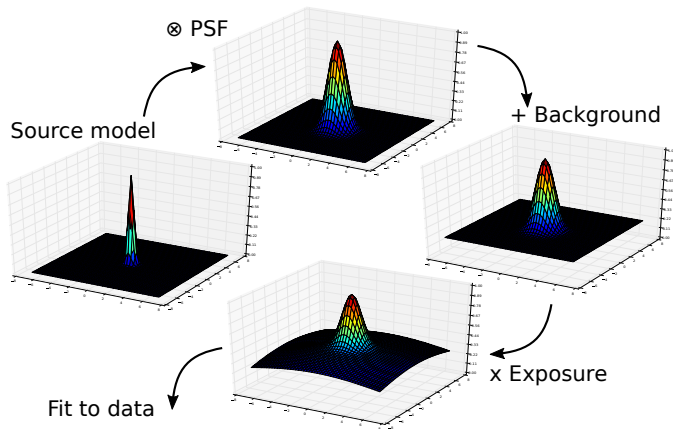


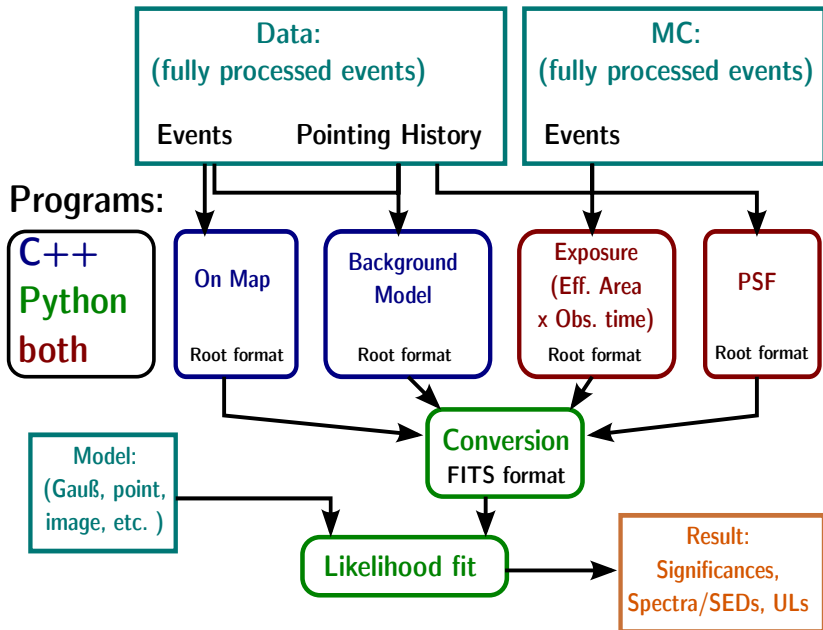
New software tools for extended sources



Motivation and concept

- ▶ Energy spectra from arbitrary morphology and sky pos.
- ▶ Spatially overlapping components \Rightarrow simultaneous fit required!
- ▶ Developing software tools with levgen Vovk and Marcel Strzys
- ▶ Energy bin-wise Poissonian likelihood fit
- ▶ Similar to Fermi analysis





The ingredients for the fit

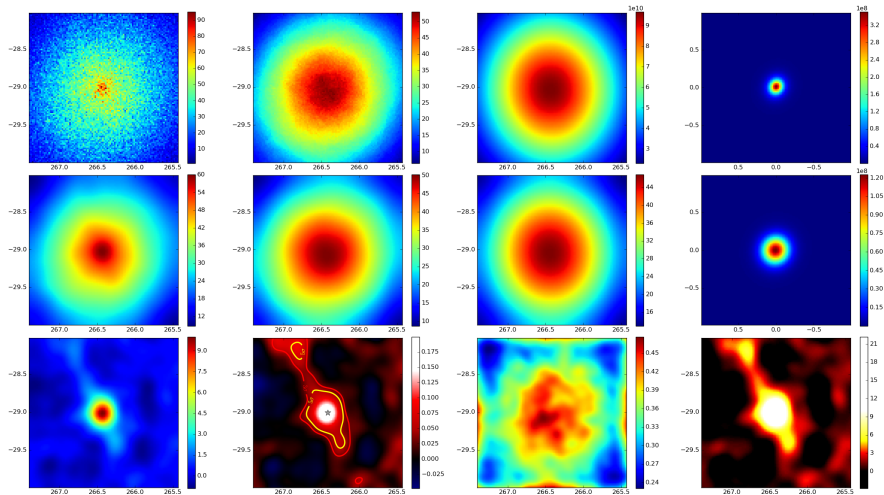
On-events

Background model

γ -Exposure (MC)

PSF (MC)

$500\text{GeV} < E < 1\,250\text{GeV}$



Excess-events

Rel. Flux and sign. cont.

Test statistic std.

TS value map

The ingredients for the fit

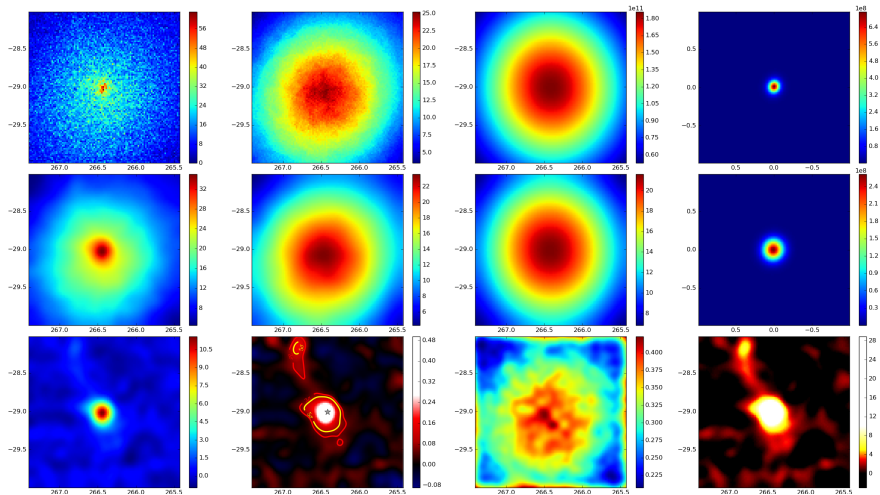
On-events

Background model

γ -Exposure (MC)

PSF (MC)

$1\ 250\text{GeV} < E < 3\ 150\text{GeV}$



Excess-events

Rel. Flux and sign. cont.

Test statistic std.

TS value map

The ingredients for the fit

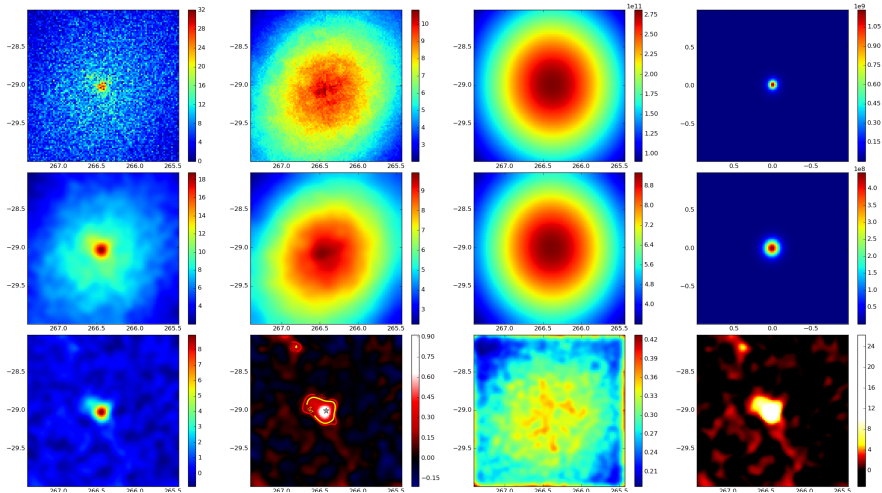
On-events

Background model

γ -Exposure (MC)

PSF (MC)

$3150\text{GeV} < E < 7900\text{GeV}$



Excess-events

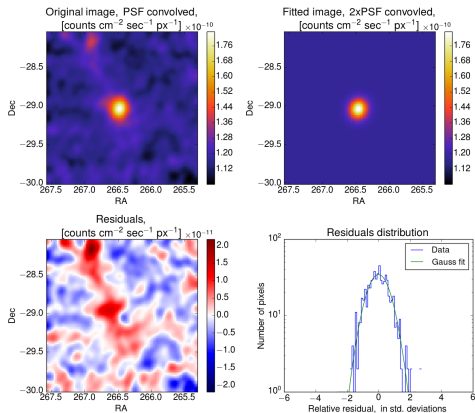
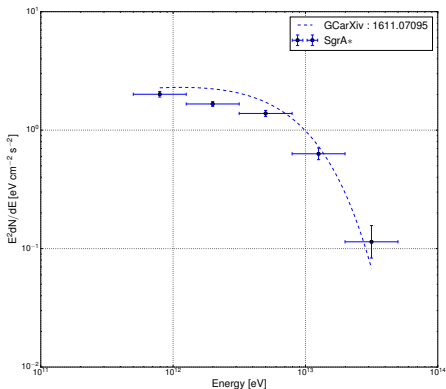
Rel. Flux and sign. cont.

Test statistic std.

TS value map

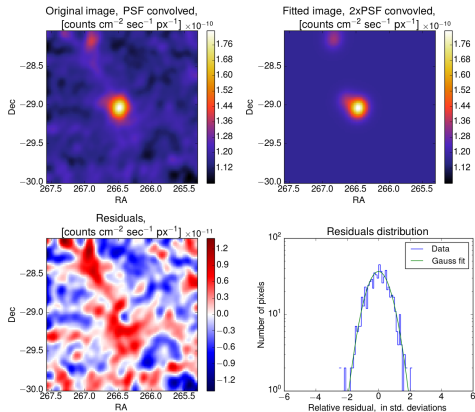
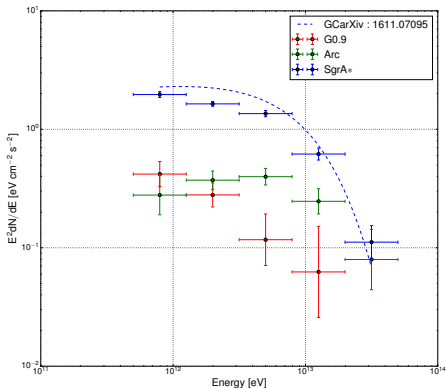
Modeling the emission form the GC region

- ▶ Fitting single point source at position of SgrA* (left: SED, right: observation/model/residuals for 2nd E bin)
- ▶ All results are still preliminary!



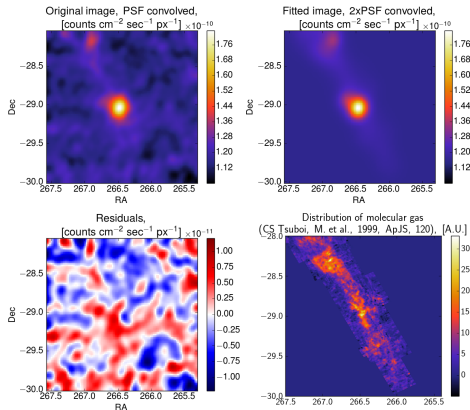
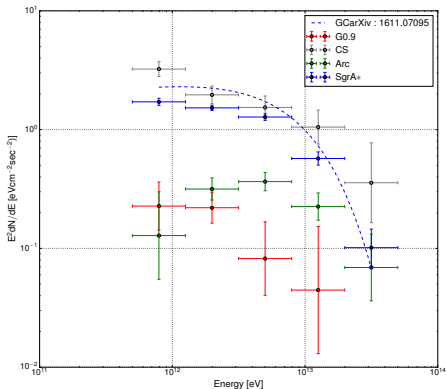
Modeling the emission form the GC region

- ▶ Including point sources at position of radio Arc and G0.9
- ▶ All results are still preliminary!



Modeling the emission from the GC region

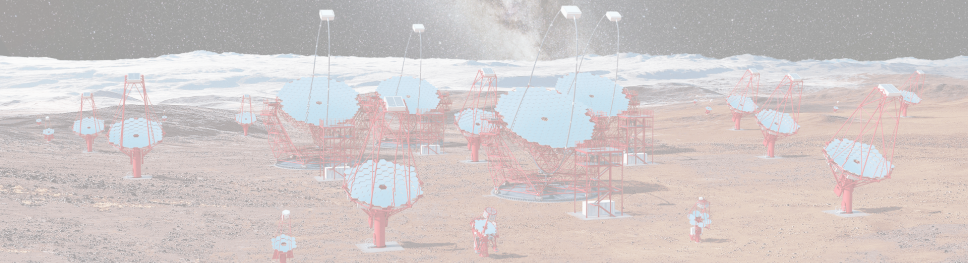
- ▶ Including also CS dist. (tracer for dense molecular material → CR target)
- ▶ All results are still preliminary!



- ▶ Developed new **LIDAR** based technique for **calibrating IACT data**
 - ▶ Method performs well and **reduces systematic errors**
 - ▶ Can be implemented for **CTA-LSTs**, especially for first science data
 - ▶ **Plans for CTA**: implementation, **improvements**, **new instruments**, **new techniques**
- ▶ Observing **GC** with **MAGIC** during **G2 fly-by** (since 2012)
 - ▶ Paper accepted by A&A ([arXiv:1611.07095](https://arxiv.org/abs/1611.07095))
 - ▶ Detailed study of spectrum and light curve (**no variability**)
 - ▶ New emission region close to **radio Arc** of unknown nature
 - ▶ **Complex morphology** needs new analysis tools
 - ▶ **Plans for CTA**: GC is important target, LSTs can continue HZD study from LP
- ▶ Developing **new analysis software** with levgen Vovk and Marcel Strzys
 - ▶ **Likelihood fit** of spatial model to sky maps in spectral bins
 - ▶ First results look promising, final **release within few months**
 - ▶ Second publication on **GC diffuse emission** in the pipeline
 - ▶ **Plans for CTA**: mandatory for **Gal. science**, already collaborating with **DL3 WG**
- ▶ Other activities for **MAGIC** and **CTA**:
 - ▶ **ATMOSCOPEs** for site selection ([Fruck et al., J. Inst. 10, P04012 \(2015\)](https://doi.org/10.1088/0004-6370/812/1/P04012))
 - ▶ **Scheduler** for MAGIC observations (in team of 3)
 - ▶ **Convener** of the **Gal. physics WG** (4) and **ATCA WG** (2)
- ▶ **Plan for MAGIC**: investigate possibility of making operation (semi)-robotic

Thanks for your attention!

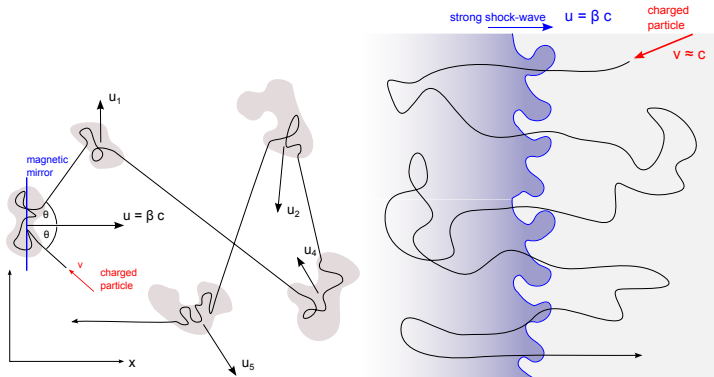
Backup



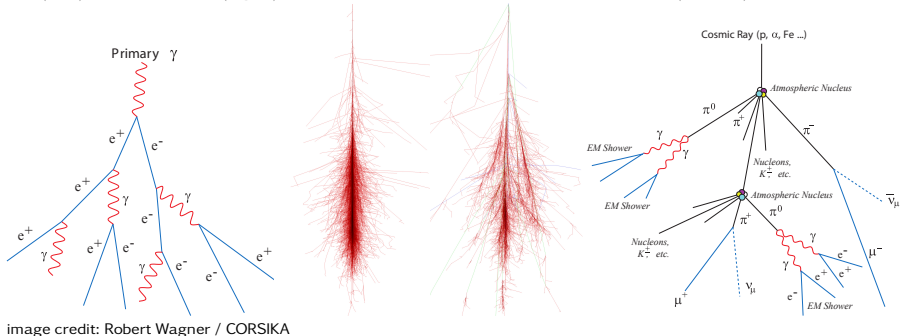
General Background

Short excursion: How are VHE γ -rays produced?

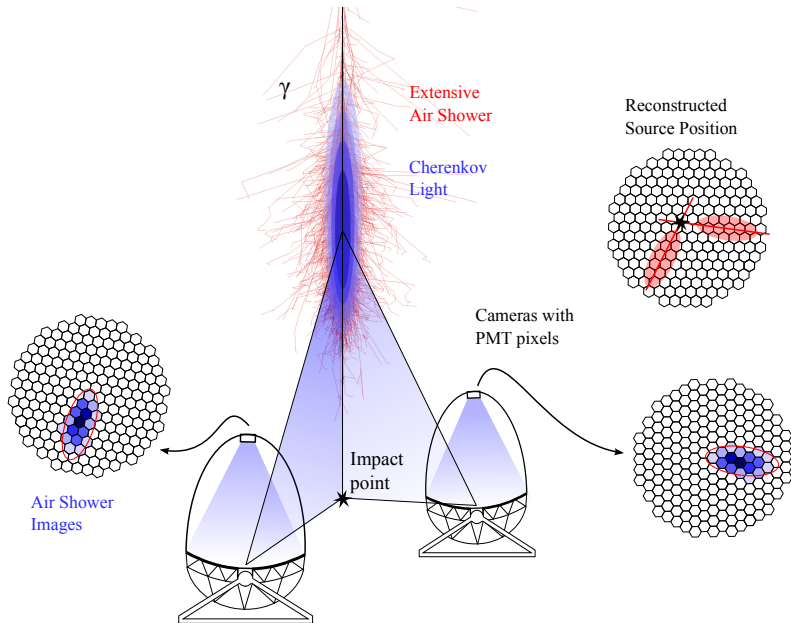
- ▶ γ -rays in the TeV regime are exclusively of non-thermal origin.
- ▶ They are always produced as a by-product of the acceleration of charged particles to VHE
- ▶ The favored acceleration scenarios are: Diffusive shock acceleration and acceleration in rotating magnetic fields (Pulsars, BH plerions)
- ▶ Leptonic γ prod.: Bremsstrahlung, Curvature radiation, Inverse Compton scattering (IC) – mostly on synchrotron radiation produced by the same population (SSC)
- ▶ Hadronic γ prod.: decay of π^0 from pp interaction



EM (left) and hadronic (right) shower and Atmospheric MC simulations (center)

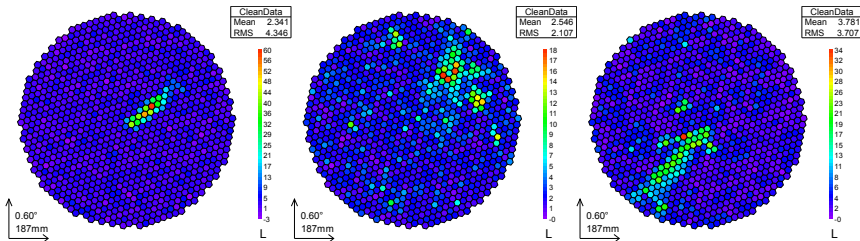


Detection technique – Imaging Air Cherenkov Telescopes



Images recorded by the cameras of the MAGIC telescopes

- ▶ The two cameras consist of 1039 photomultiplier pixels each (3.5° FoV)
- ▶ Events last only a few ns
- ▶ Different coincidence criteria (charge concentration in small region of camera in one and simultaneous such events in both telescopes) required for the events to be recorded
- ▶ Typical CR event rate 300 Hz
- ▶ Event classification offline via Random Forests



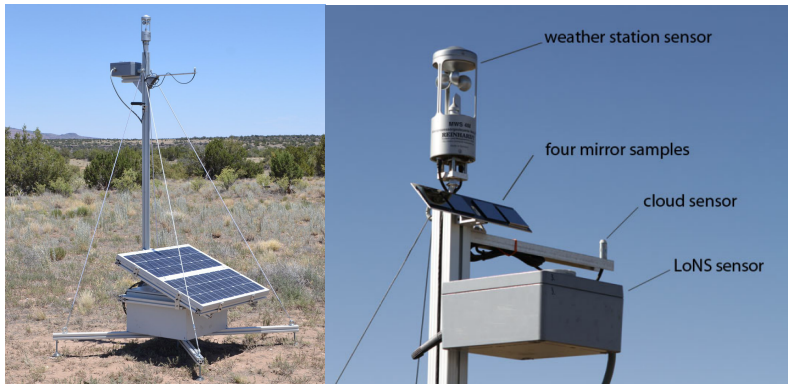
The MAGIC telescopes

- ▶ Imaging Air-shower Cherenkov Telescopes for observing γ -rays from 80 GeV to 30 TeV
- ▶ located on the Roque de los Muchachos (at 2200 m a.s.l.) on the Canary island La Palma
- ▶ two 17m diameter parabolic dish, $f/D = 1$, telescopes
- ▶ photomultiplier (PMT) cameras with 1039 pixels recording at 2GS/s
- ▶ support structure from carbon fiber



image credit: Robert Wagner

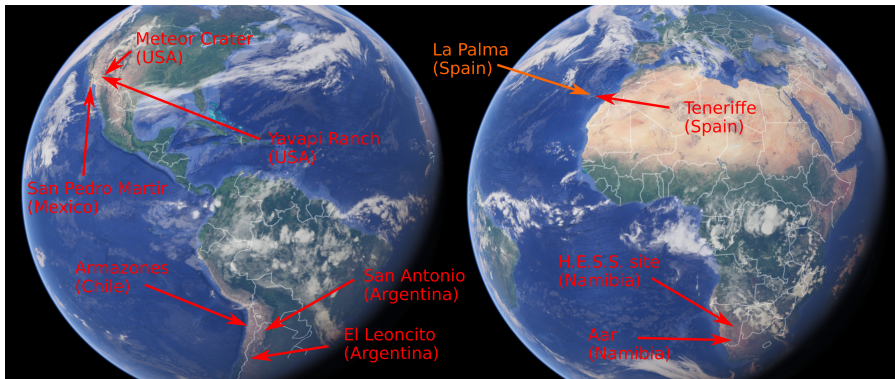
ATMOSCOPE



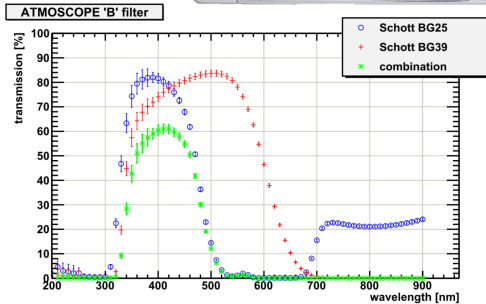
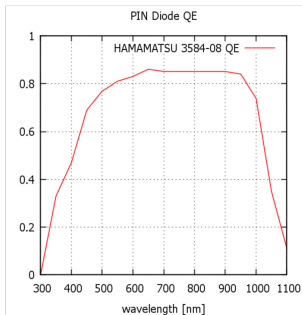
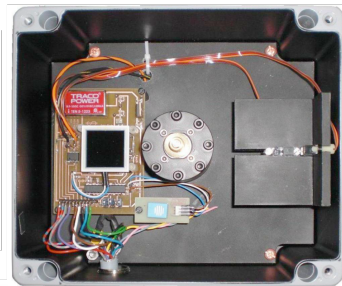
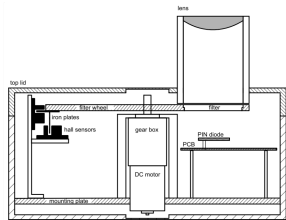
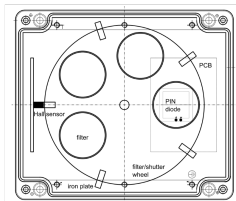
- ▶ Autonomous Tool for Measuring Observatory Site COnditions PrEcisely
- ▶ deployed at several CTA site candidates and taking data since ~ 2 years
- ▶ paper published in JINST (Instrumentation for comparing night sky quality and atmospheric conditions of CTA site candidates, Fruck et al. 2015)

ATMOSCOPE deployment sites

- ▶ Total of 9 ATMOSCOPEs deployed in 6 countries
- ▶ One LONS-only in La Palma

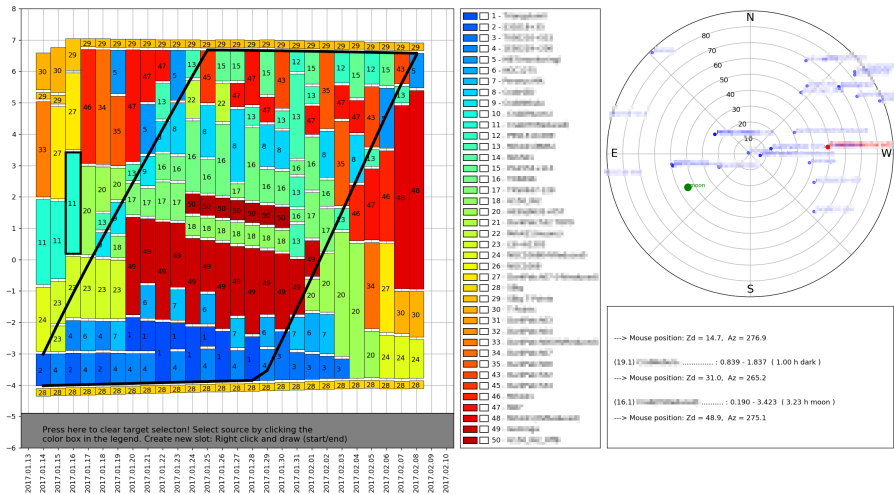


ATMOSCOPE LoNS sensor

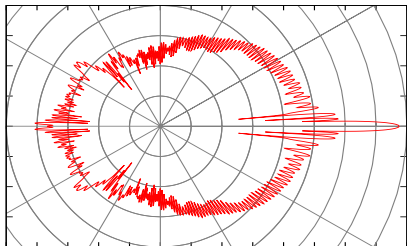
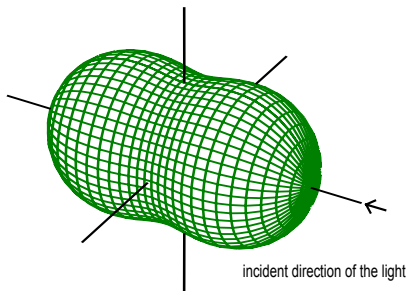


Scheduling

Scheduling GUI program



LIDAR



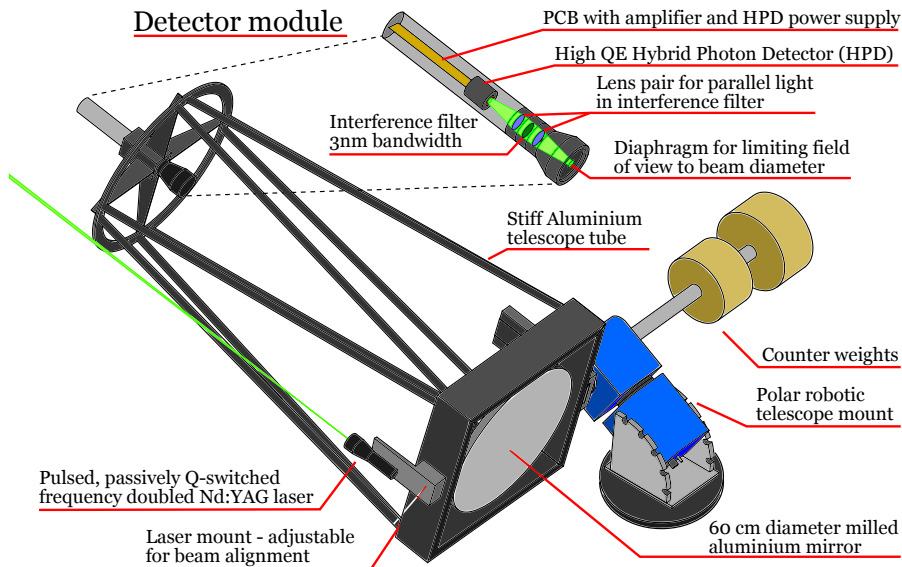
Rayleigh scattering

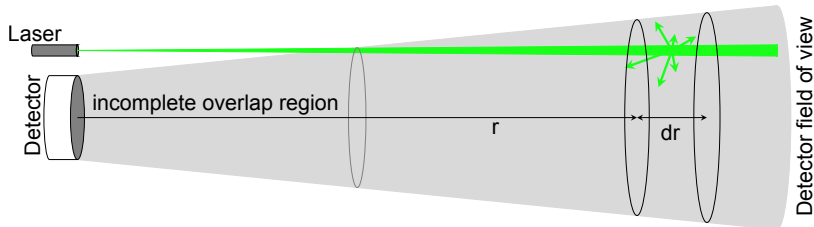
- ▶ always present
- ▶ scattering on **molecular dipoles**
- ▶ λ^{-4} dependency

Mie/aerosol scattering

- ▶ only important in **boundary layer** and inside **clouds**
- ▶ scattering on water droplets or aerosol/ice particles
- ▶ (comparably) **weak wavelength dependency**
- ▶ **enhanced** cross-section for **forward scattering**
- ▶ plot: example for a dielectric water sphere of $d = 10\lambda$

The MAGIC LIDAR system

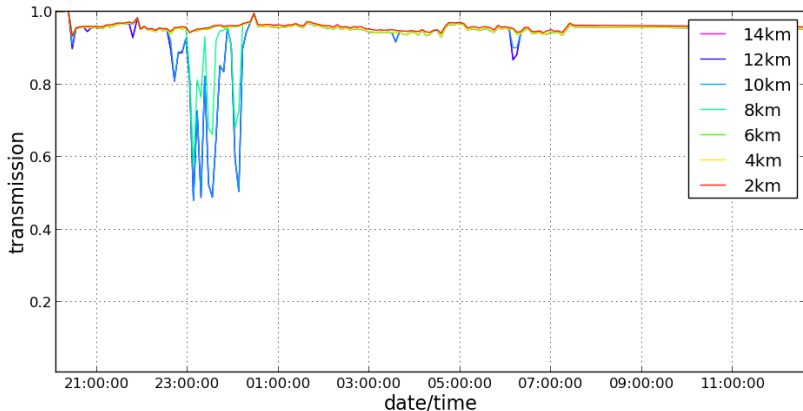


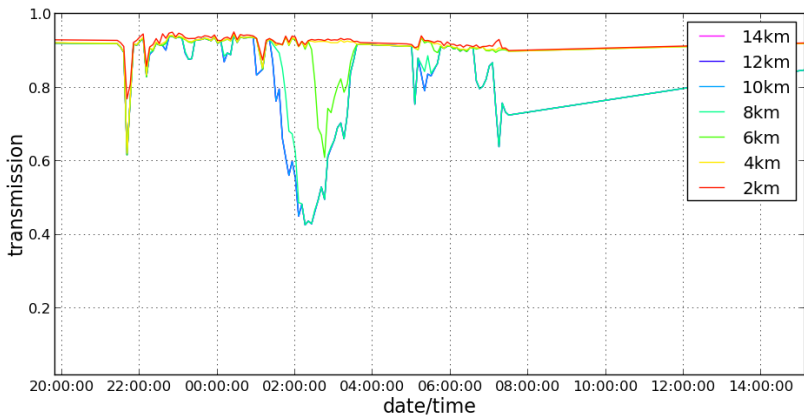


$$dN(r) = N_0 C G(r) \frac{A}{r^2} \beta(r) dr \exp\left(-2 \int_0^r \sigma(r') dr'\right)$$

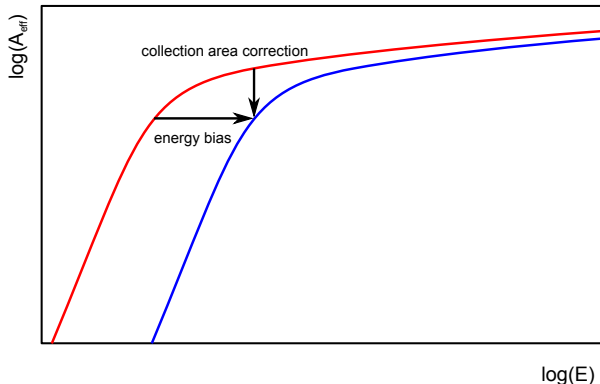
- ▶ $N_0, dN(r)$: photons: in laser pulse, in range bin
- ▶ $C, G(r)$: overall efficiency, overlap (laser-FOV) and focus effects
- ▶ $\frac{A}{r^2}$: solid angle (detector seen from location of scattering)
- ▶ $\beta(r) dr$: volume backscattering coefficient times range bin length
- ▶ $\exp\left(-2 \int_0^r \sigma(r') dr'\right)$ total attenuation on the way
- ▶ two unknown functions: $\beta(r)$ and $\sigma(r)$
- ▶ $\frac{1}{r^2}$ dependency demands for high dynamic range

Examples: Few high altitude clouds



Examples:
Mid altitude cloudsExamples:
Thick low and mid altitude clouds

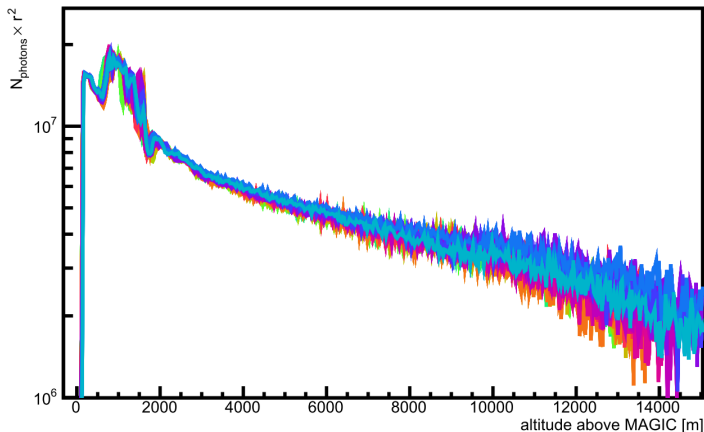
Collection area correction strategy:



- ▶ only correcting the energy is not sufficient: A_{eff} (from MC) is still wrong
- ▶ $A_{\text{eff}} = A_{\text{sim}} \cdot N_{\text{rec}}/N_{\text{sim}}$ is estimated using MC assuming optimal conditions
- ▶ events affected by atmospheric extinction “mimic an events of lower energy”
- ▶ energy correction + binning → migration matrix
- ▶ recalculating A_{eff} by applying matrix to vector of inverse A_{eff} from MC

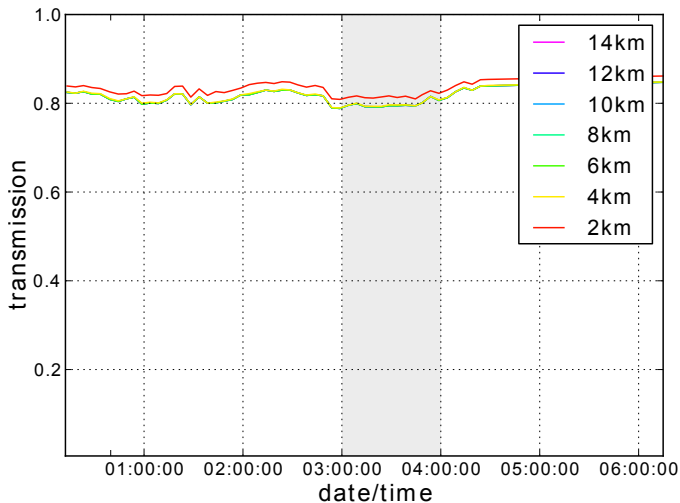
Some corr. examples:

LIDAR: range corrected photon counts



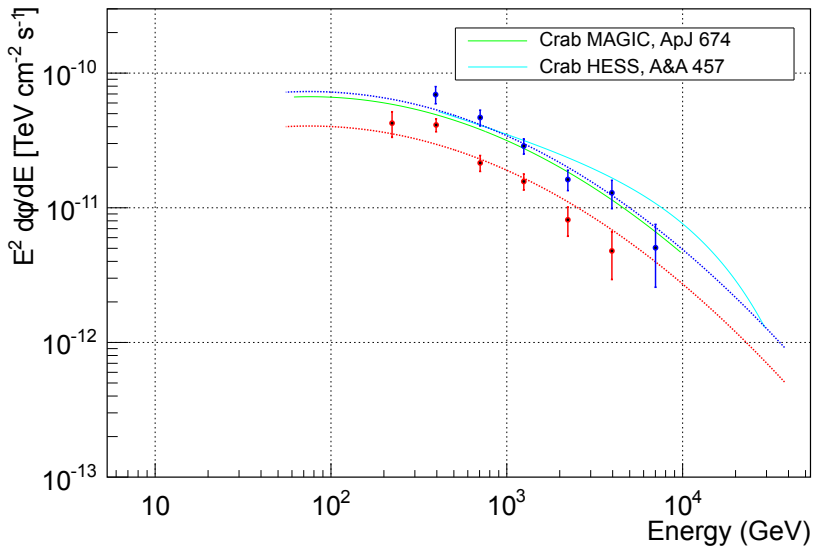
- ▶ last days with “Calima” (Sahara dust intrusion) in beginning of September 2013
- ▶ should be easy to correct since shower is not “deformed” by aerosol layer

Correcting Crab Nebula data

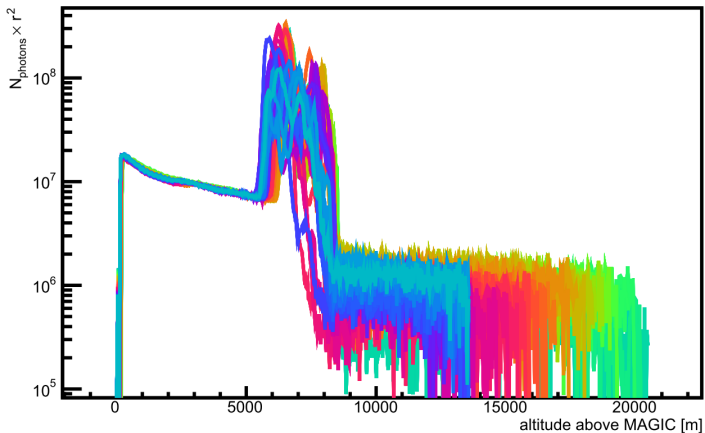


- ▶ transmission is at constantly $\sim 80\%$
- ▶ about 20% upscaling of the energy will be needed ...

Correcting Crab Nebula data

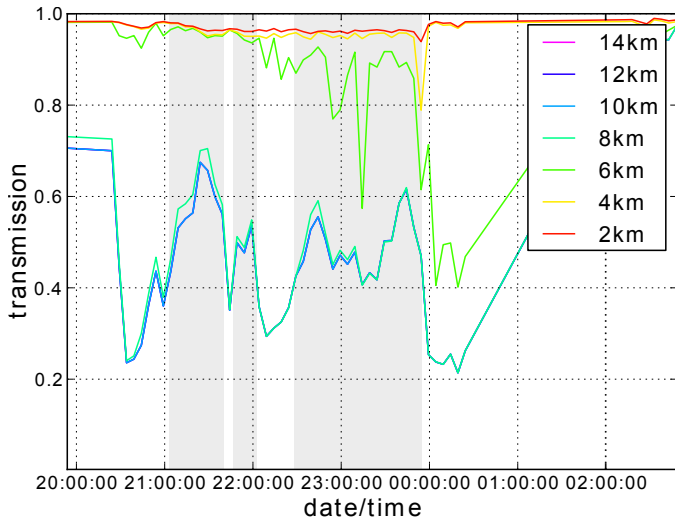


LIDAR: range corrected photon counts



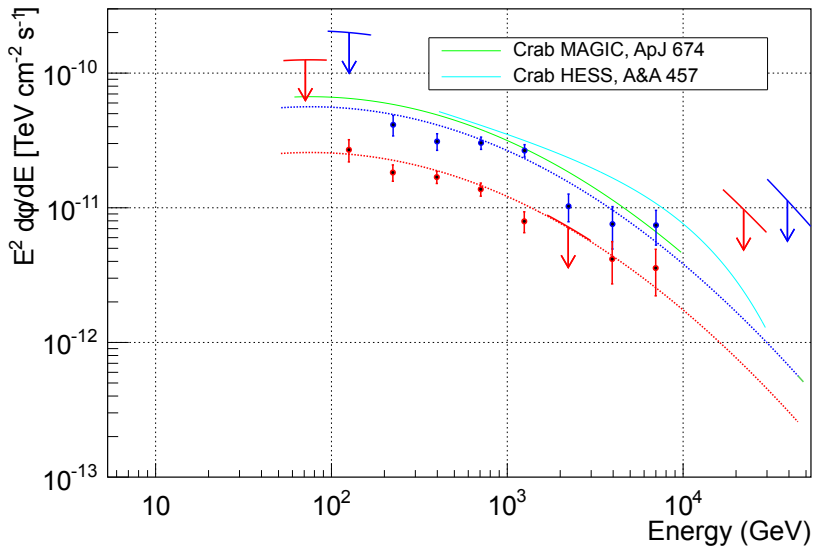
- ▶ this is a “horrible” example of cloudy sky conditions that can occur on La Palma from time to time
- ▶ it is hard to believe that IACTs can work properly under such conditions

Correcting Crab Nebula data

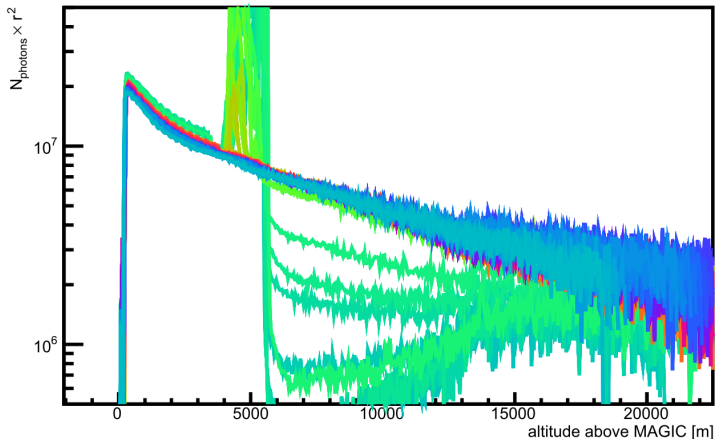


- ▶ actually part of the data (>50%) had to be removed because the transmission was below 40% for the given sample
- ▶ here air-showers get “truncated” and therefore the “hadronnes”

Correcting Crab Nebula data

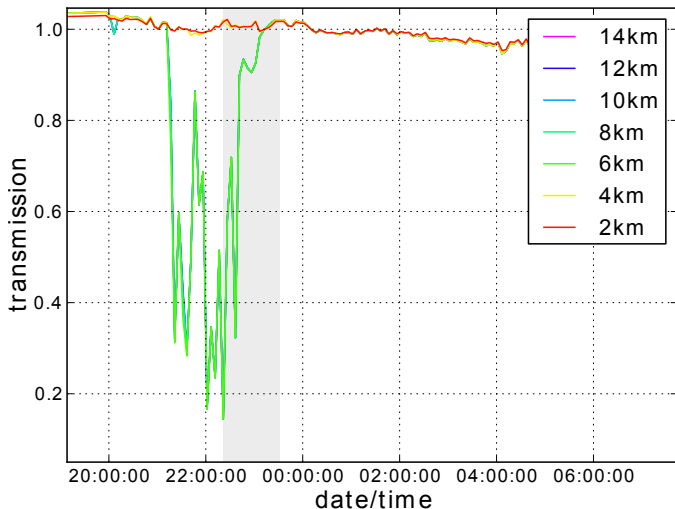


LIDAR: range corrected photon counts



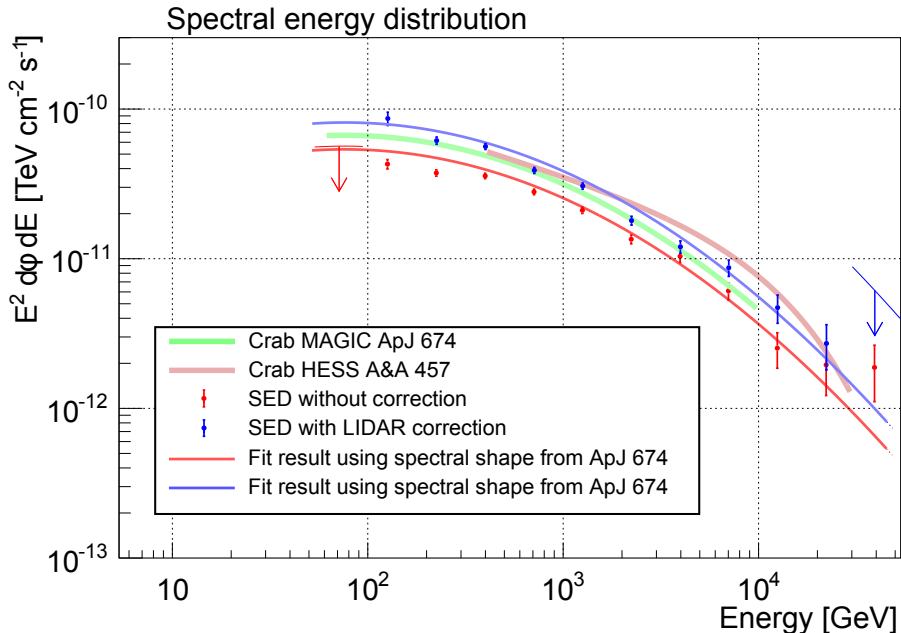
- ▶ another quite cloudy example from Dec 24th 2013
- ▶ this time medium level clouds of quite high opacity

Correcting Crab Nebula data

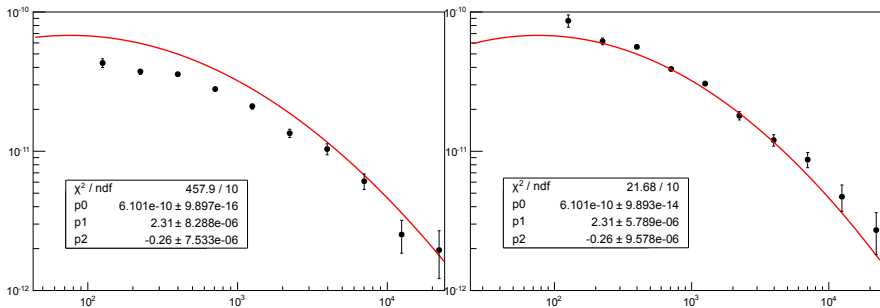


- ▶ another quite cloudy example from Dec 24th 2013
- ▶ this time medium level clouds of quite high opacity

Larger data sample:



Correcting Crab Nebula data



- ▶ Degree of improvement becomes clear only when comparing the χ^2 values in respect to the spectrum published in ApJ 674
- ▶ Before correction: 458 with 7 degrees of freedom
- ▶ After correction: 22 with 7 degrees of freedom

Galactic Center

Milky Way galaxy:



- ▶ disk (30 kpc x 0.3 kpc): young stars, gas, molecular clouds, dust
- ▶ bar (4.5 kpc) and bulge (1.5 kpc): old stars low star formation
- ▶ Galactic Center (250 pc): dense molecular clouds high star formation rate

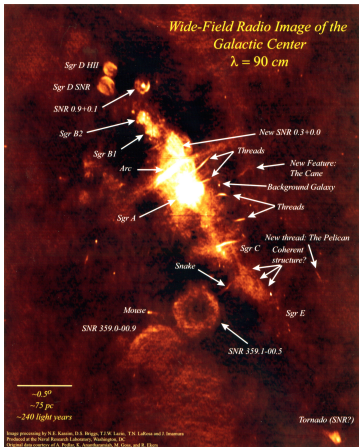
image source: ESO/S. Brunier



- ▶ VLA (20cm): H II regions that are illuminated by hot, massive stars, supernova remnants, and synchrotron emission
- ▶ Caltech Submillimeter Observatory (1.1mm): cold (20-30 K) dust associated with molecular gas
- ▶ Spitzer (IR): primarily emission from stars and from polycyclic aromatic hydrocarbons

image source: <http://images.nrao.edu>

Radio sources SgrA and SgrA*



- ▶ bright point-like radio source
- ▶ at the center of SgrA-West (Mini-Spiral)
- ▶ at the edge of SNR SgrA-East
- ▶ thought to be SMBH
- ▶ from stellar motions: $\approx 4 \cdot 10^6 M_{\odot}$

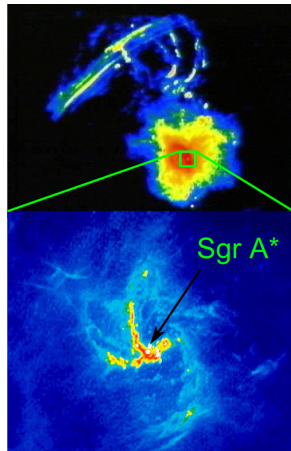
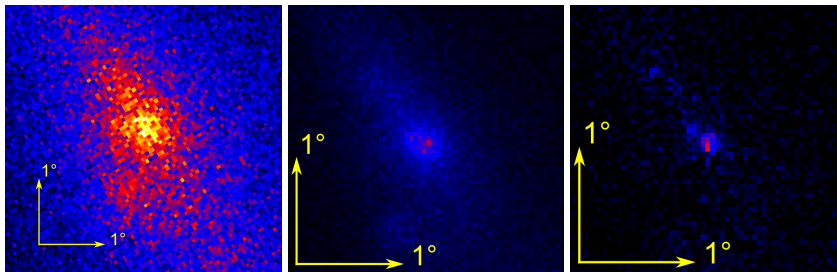
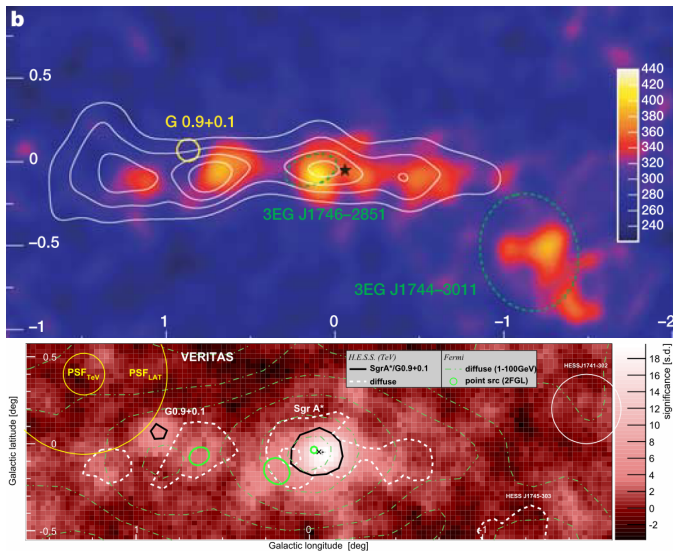


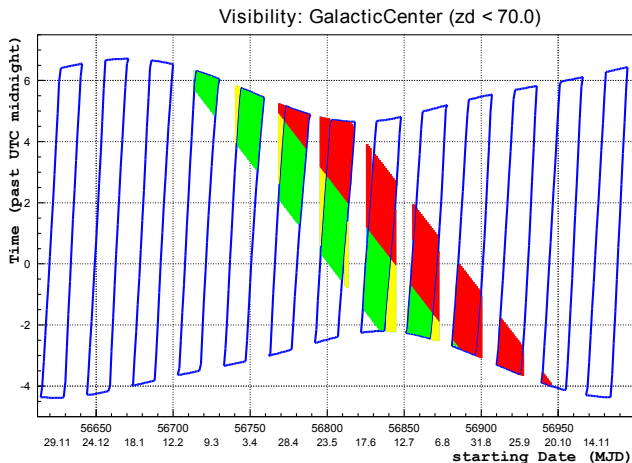
image source (left): N. E. Kassim, D. S. Briggs, T. J. W. Lazio, T. N. LaRosa, J. Imamura (NRL/RSD)
 image source (right): astro.ucla.edu



- ▶ resolution only reasonable for $E > 1\text{GeV}$
- ▶ hint for G0.9+01, Arc?



- ▶ Total observability throughout the year (only about 1/3 of the year available for monitoring)

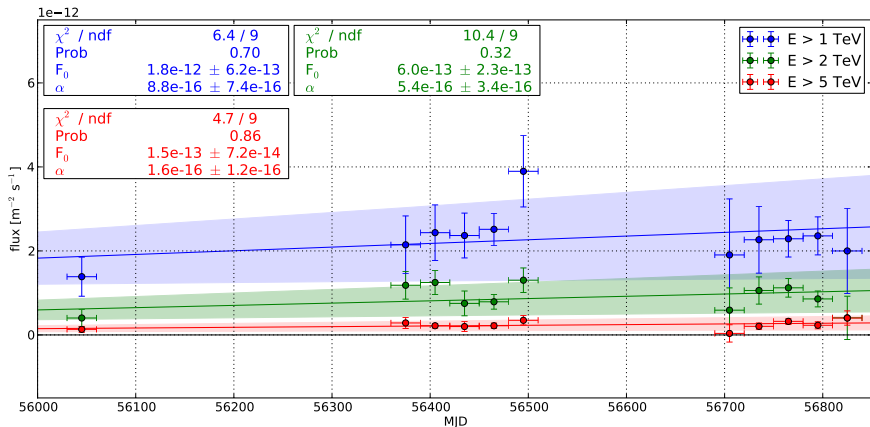


- ▶ Due to limited trigger delay between both telescopes, part of the observable window is lost

- ▶ Collection area increases with $1/\cos(Zd)^2$
 $A_{col,60^\circ Zd}/A_{col,0^\circ Zd} \approx 4$
 $A_{col,70^\circ Zd}/A_{col,0^\circ Zd} \approx 9$
- ▶ Influence of the Atmosphere is increasing → need good weather conditions
- ▶ Need dark conditions for reasonable energy threshold
- ▶ Stereo power is decreasing?
- ▶ Focusing?
- ▶ MAGIC standard analysis is not optimized for HZD? However, the analysis seems to work quite well!

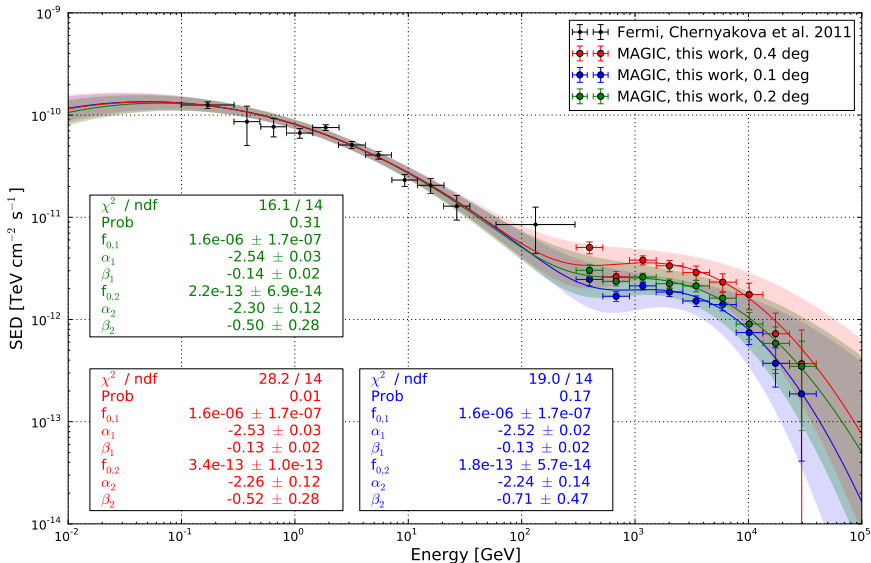
Lightcurve fitted with:

$$F(t) = F_0 + \alpha(t[\text{MJD}] - 56000)$$

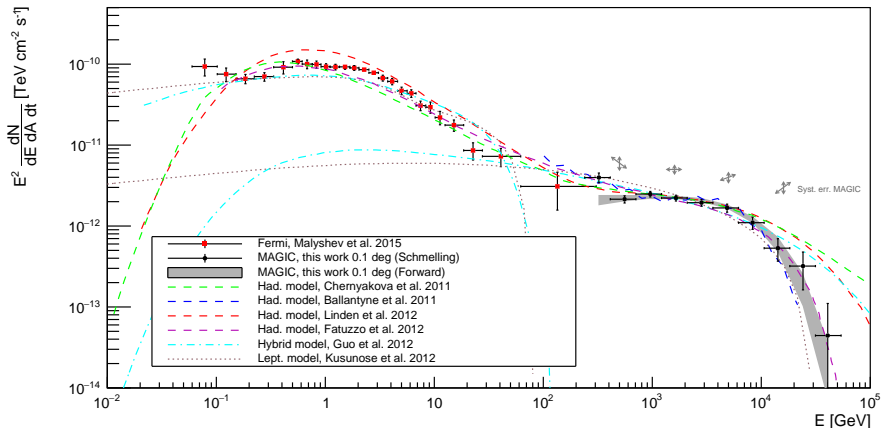


Spectral Energy Density (SED) – MAGIC + Fermi

► Correlated fit: $\frac{dF}{dE} = f_{0,1} \left(\frac{E}{5\text{GeV}}\right)^{\alpha_1 + \beta_1 \log\left(\frac{E}{5\text{GeV}}\right)} + f_{0,2} \left(\frac{E}{3\text{TeV}}\right)^{\alpha_2 + \beta_2 \log\left(\frac{E}{3\text{TeV}}\right)}$



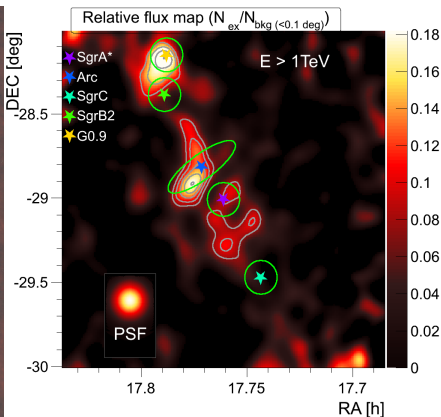
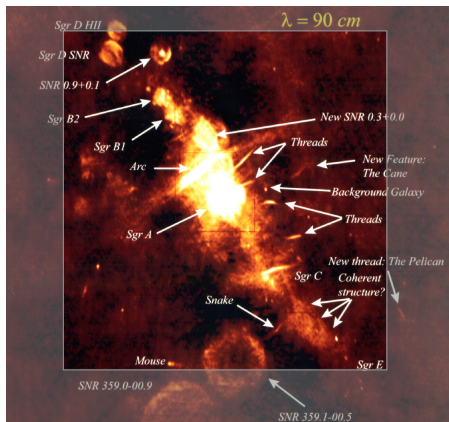
SED including 2015 Fermi data and models



- ▶ peculiar 2-bump structure – none-trivial for modeling
- ▶ hadronic scenarios are exploiting **morphology (target)** and **time variability (source)**
- ▶ leptonic models have problems explaining the spectral shape with single source
- ▶ the available data does not yet allow discrimination of models

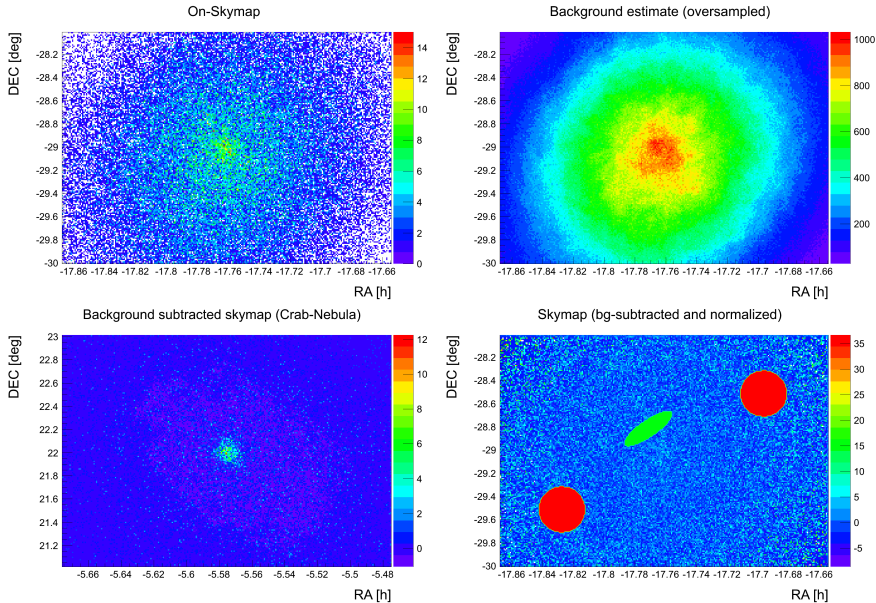
Origin of the extended emission

- ▶ good correlation between 90 cm radio image and TeV skymap
- ▶ G0.9 is known TeV source (Aharonian et al., 2005)
- ▶ radio Arc has TeV counterpart (not previously studied in TeV, Fermi GeV data available)
- ⇒ developed method for calculating spectrum from the **elliptical** region defined by the radio image



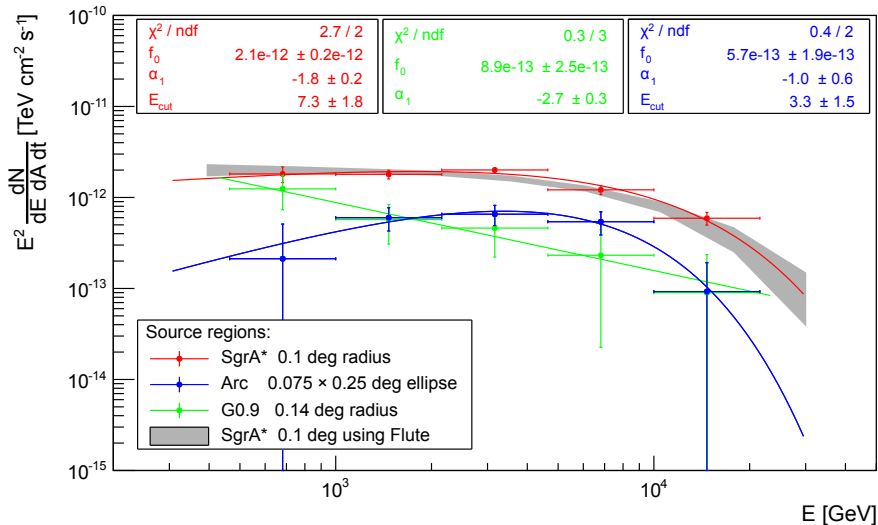
radio image: N. E. Kassim, D. S. Briggs, T. J. W. Lazio, T. N. LaRosa, J. Imamura (NRL/RSD)

Attempting to calculate spectrum of the Arc

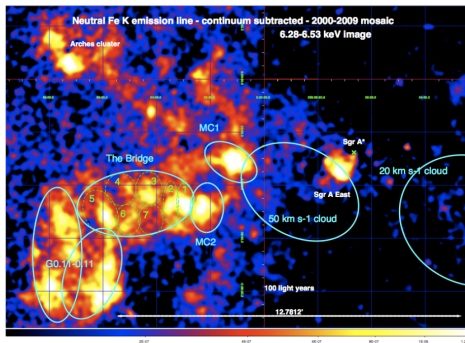
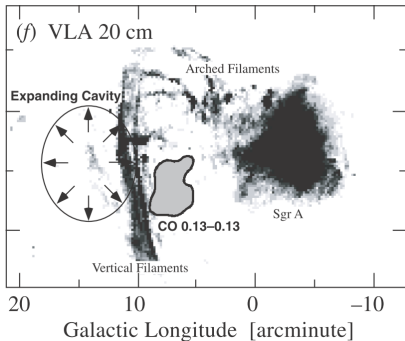


Calculating the spectrum of the "Arc"

SEDs from skymap regions



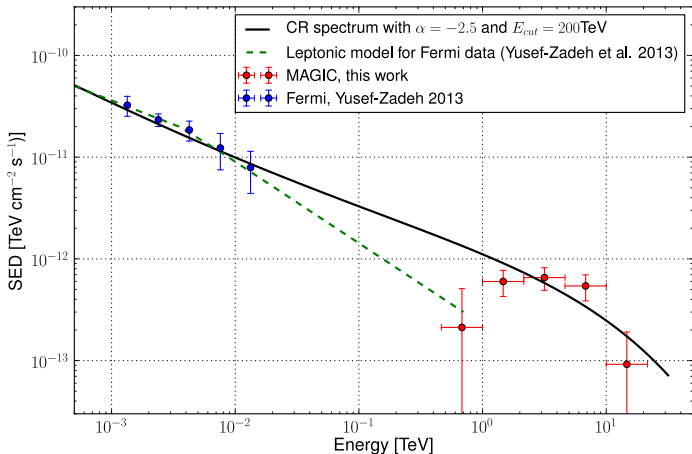
Source candidates for extended emission



- ▶ Expanding giant molecular cloud G0.11-0.11 exactly matching the coordinates of MAGIC excess (M. Tsuboi et al. 1997) — possible origin: 10 - 100 SNE
- ▶ Possible origin of Arc γ -radiation from GMC G0.11-0.11 - maybe interaction of linear filaments and expanding GMC?
- ▶ Fe K $_{\alpha}$ emission either X-ray echo of SgrA* (M. Clavel et al. 2013) flare or excited by CRs (F. Yusef-Zadeh et al. 2013)
- ▶ Are same CRs also producing the TeV emission?

Simple hadronic model for GeV-TeV emission from the Arc

- ▶ Yusef-Zadeh et al., 2013 modeling Fermi data with e^- -Bremsstrahlung
- ▶ are γ rays from π_0 decay also possible? (formul.: Aharonian et al., 2013)
- ▶ assuming CR interaction with G0.11-0.11 ($6.3 \cdot 10^5 M_\odot$) (Handa et al. 2006)
- ▶ single power-law spectrum with exponential cut-off (for protons)



- ▶ Flux for the central object (GC/SgrA*):

$$F_{E>1\text{TeV}} \approx 2 \cdot 10^{-12} \text{ cm}^{-2} \text{ s}^{-1},$$

$$F_{E>2\text{TeV}} \approx 1 \cdot 10^{-12} \text{ cm}^{-2} \text{ s}^{-1},$$

$$F_{E>5\text{TeV}} \approx 2 \cdot 10^{-13} \text{ cm}^{-2} \text{ s}^{-1}$$

- ▶ This corresponds to ≈ 20 evts/h, ≈ 15 evts/h, ≈ 7 evts/h in case of MAGIC taking into account the average effective collection areas

- ▶ The observations are of course not background free

⇒ We are quite statistics limited, especially at high energies

- ▶ Also, because of the detection technique the angular resolution is always worse than 0.05°

Systematics

- ▶ What changes when going to large Z_d ?



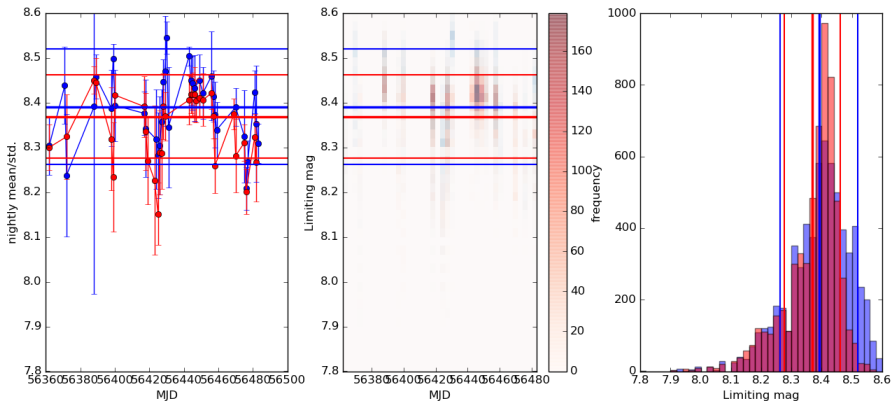
Systematic effect	Uncertainty
F-Factor	10% ES
atmospheric transmission	$\lesssim 10\%$ ES  15%
mirror reflectivity	8% ES
PMT electron collection efficiency	5% ES
light collection in a Winston Cone	5% ES
PMT quantum efficiency	4% ES
signal extraction	3% ES
temperature dependence of gains	2% ES
charge flat-fielding	2-8% ES FN
analysis and MC discrepancies	$\lesssim 10\text{-}15\%$ FN  ?
background subtraction	1-8% FN
broken channels/pixels	3% FN
mispointing	1-4% FN
NSB	1-4% FN
trigger	1% FN
unfolding of energy spectra	0.1 SL
non-linearity of readout	0.04 SL

Table: J. Aleksic et al. 2012, Astroparticle Physics 35, 2012, 435448

Systematics (atm. trans.)

- ▶ LIDAR cannot be used at large Zd.
- ▶ Starguider as alternative?
- ▶ Limiting magnitude of identified stars as indicator for changes in atm. trans.
- ▶ The std. of relative spread within one year is between 11% and 14%.
- ▶ Nearly (> 90%) of the daily averages lie in this range.
- ▶ Zd ranges: < 64 deg, > 64 deg



Systematics – flux and energy scale

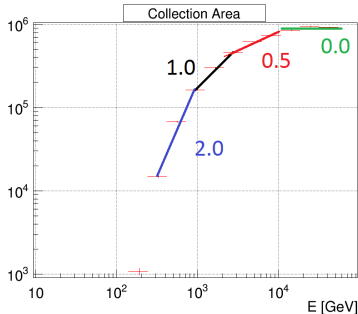
- ▶ How do errors propagate into $d\phi/dE$ or SED?
- ▶ Error in flux normalization: Easy, always linearly in Y-Axis direction.
- ▶ Error in energy scale: Not that easy ...

$$\left(\frac{d\phi}{dE}\right)_{\text{assumed}} = \frac{N}{\Delta E \cdot A_{\text{eff}}(E) \cdot T_{\text{eff}}}$$

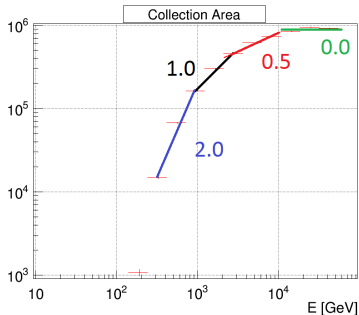
Energy scale wrong by factor α ($E \rightarrow \alpha E$)

$$\left(\frac{d\phi}{dE}\right)_{\text{true}} = \frac{N}{(\alpha \cdot \Delta E) \cdot A_{\text{eff}}(\alpha \cdot E) \cdot T_{\text{eff}}}$$

Approximate A_{eff} as power law, locally



Approximate A_{eff} as power law with index β , locally

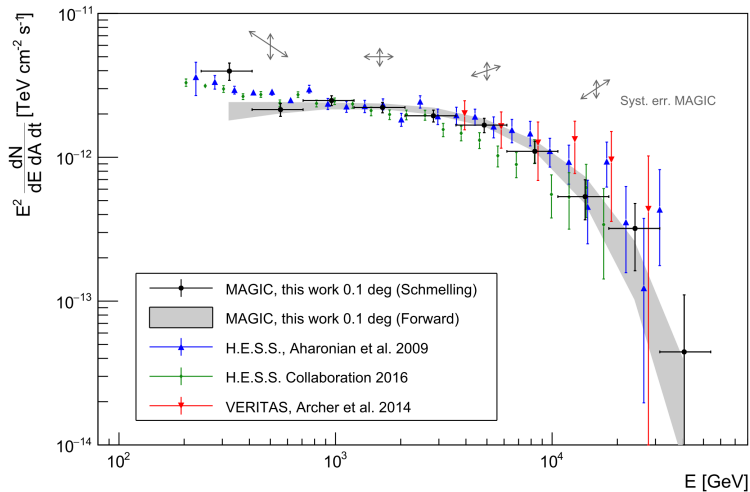


$$\left(\frac{d\phi}{dE}\right)_{true} = \frac{N}{(\alpha \cdot \Delta E) \cdot A_{eff}(\alpha \cdot E) \cdot T_{eff}} = \alpha^{-1-\beta} \cdot \left(\frac{d\phi}{dE}\right)_{assumed}$$

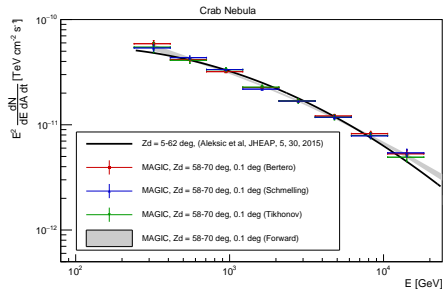
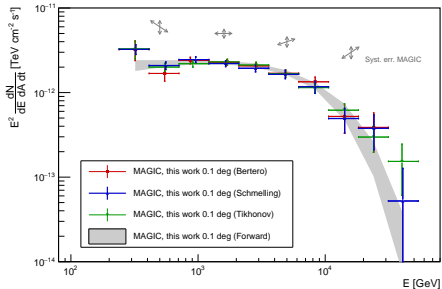
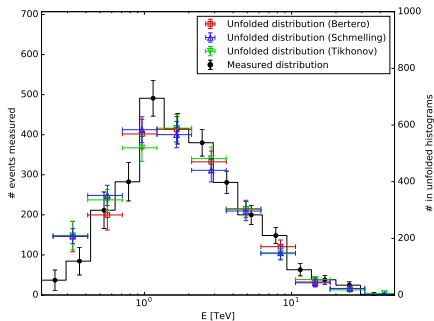
$$SED_{true} = \frac{(\alpha \cdot E)^2 \cdot N}{(\alpha \cdot \Delta E) \cdot A_{eff}(\alpha \cdot E) \cdot T_{eff}} = \alpha^{1-\beta} \cdot SED_{assumed}$$

Systematics – flux and energy scale (GC)

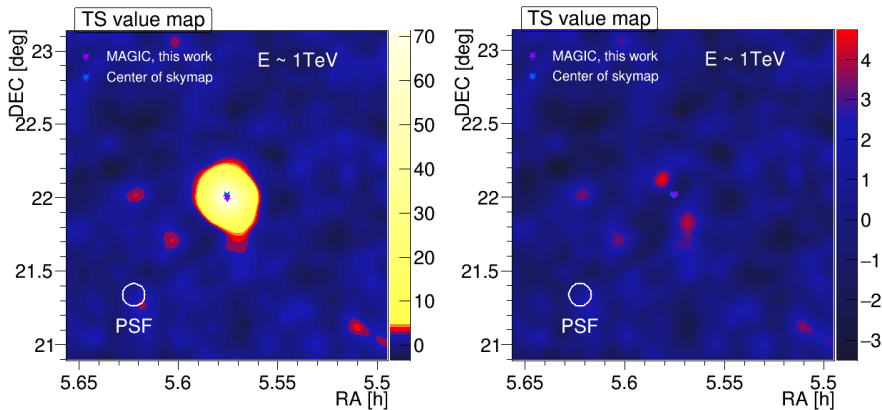
And this is how it would look like for the GC ...



Systematics – unfolding methods (spectral deconvolution)

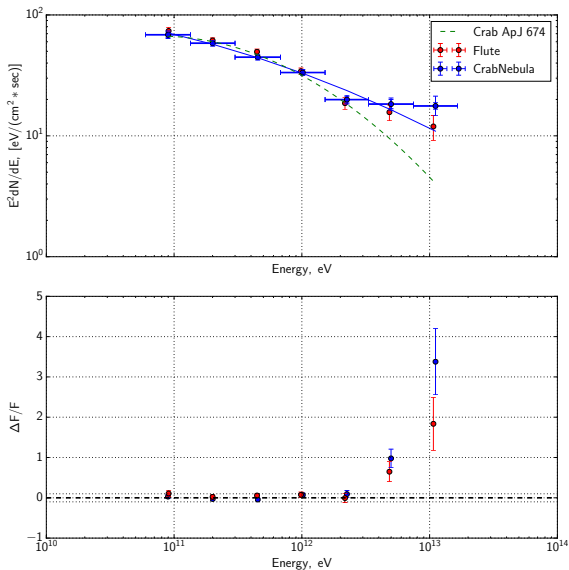


PSF Model subtracted from Crab Nebula sky map

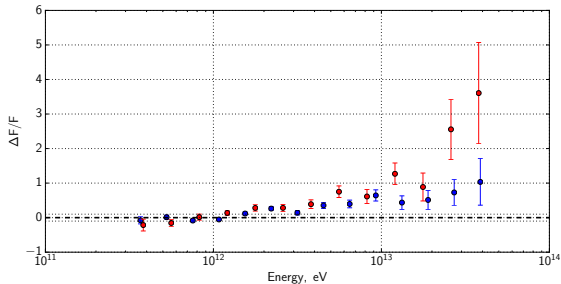
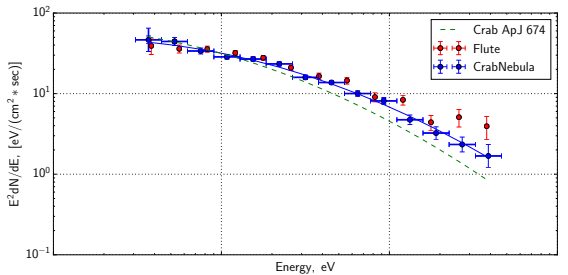


SkyPrism (Likelihood code)

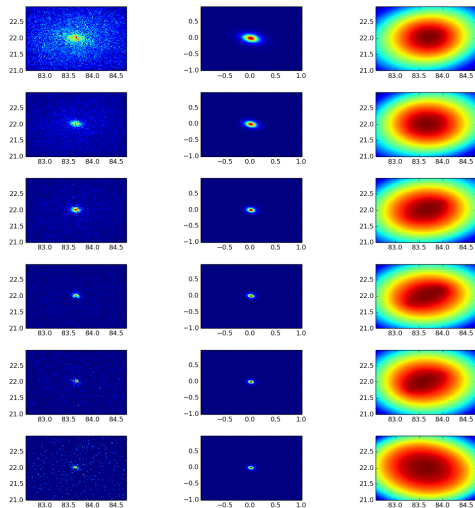
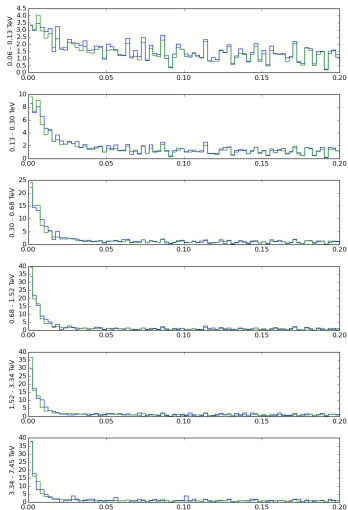
Low Zd



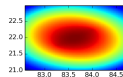
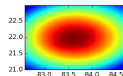
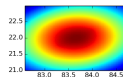
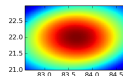
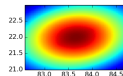
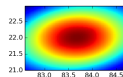
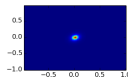
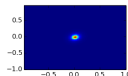
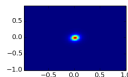
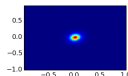
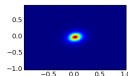
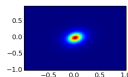
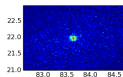
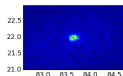
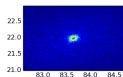
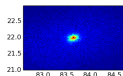
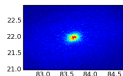
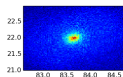
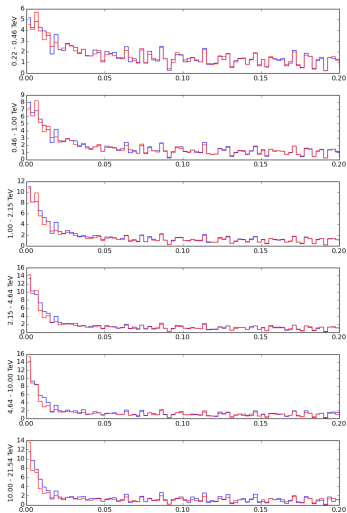
High Zd



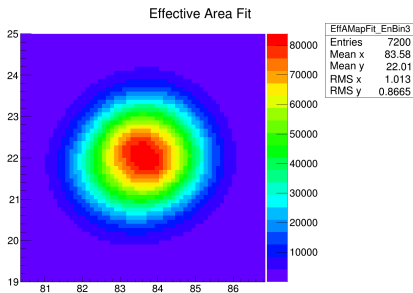
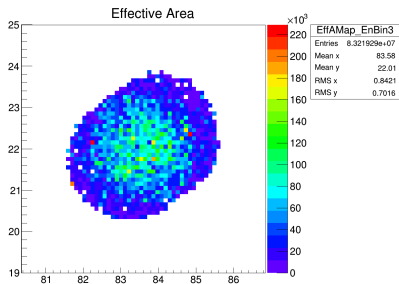
Low Z_d



High Zd



- ▶ MC statistics require special strategy for coll. area map
- ▶ Applying multi-component fit using binomial statistics
- ▶ Error is propagated by creating 100 random maps based on fit parameters and errors



MCMC

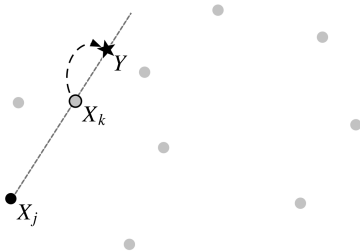
Select new position in parameter space according to:

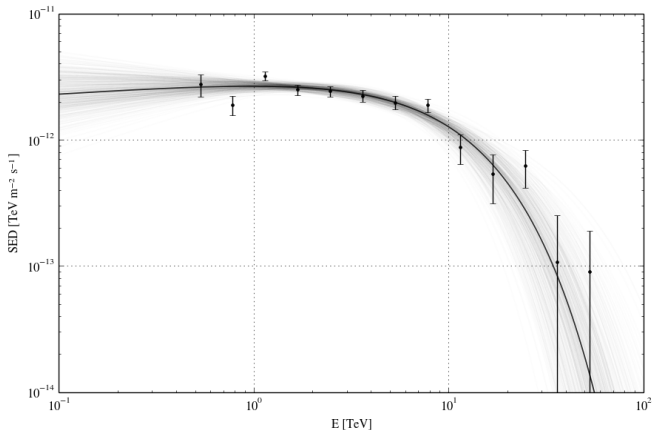
$$X_k(t) \rightarrow Y = X_j + Z(X_k(t) - X_j), j \neq k$$

Z is a random scaling factor which is distributed like:

$$g(Z) \propto \begin{cases} \frac{1}{\sqrt{Z}} & , Z \in [\frac{1}{a}, a] \\ 0 & , \text{else} \end{cases}$$

a is the only parameter, on which to tune (eventually)

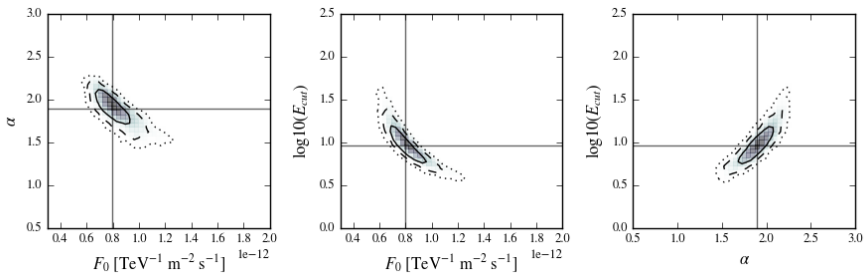




Model:

$$\frac{dF}{dE} = f_0 \left(\frac{E}{E_0} \right)^{-\alpha} \exp\left(-\frac{E}{E_{cut}}\right)$$

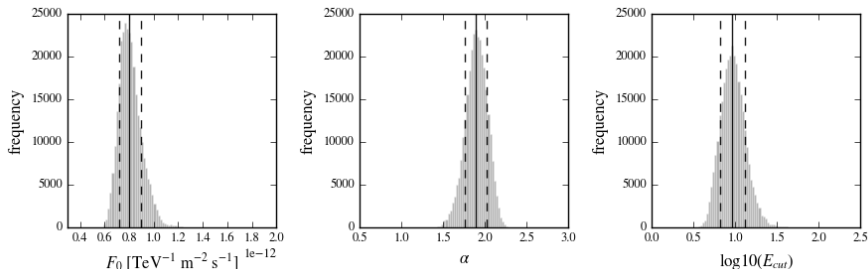
Parameter covariance using emcee:



Model:

$$\frac{dF}{dE} = f_0 \left(\frac{E}{E_0} \right)^{-\alpha} \exp\left(-\frac{E}{E_{cut}}\right)$$

"All very nice, but I want to state numbers and errors in my paper!"

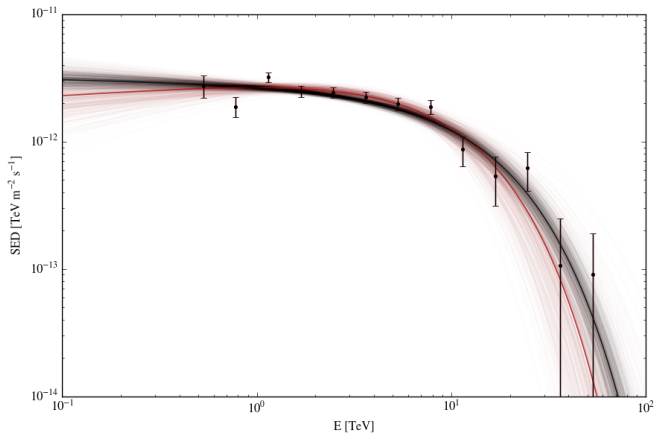


These histograms are literally showing you how likely a parameter value is to appear in the posterior distribution!

Parameters:

$$F_0 = 7.95^{+1.022}_{-0.766} \times 10^{-13}, \alpha = 1.89^{+0.126}_{-1.31}, \log_{10}(E_{cut}) = 0.962^{+0.150}_{-0.140}$$

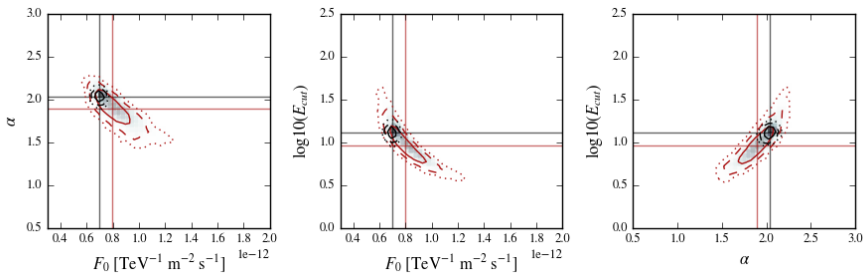
SED sampled with emcee using HESS+VERITAS spectrum as prior [Archer et al. 2016](#)



Model:

$$\frac{dF}{dE} = f_0 \left(\frac{E}{E_0} \right)^{-\alpha} \exp\left(-\frac{E}{E_{cut}}\right)$$

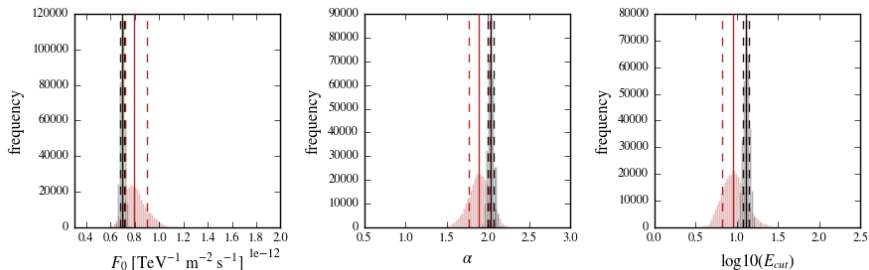
Parameter covariance using HESS+VERITAS spectrum as prior [Archer et al. 2016](#):



Model:

$$\frac{dF}{dE} = f_0 \left(\frac{E}{E_0} \right)^{-\alpha} \exp\left(-\frac{E}{E_{cut}}\right)$$

HESS+VERITAS spectrum as prior



Parameters:

$$F_0 = 6.97_{-0.169}^{+0.168} \times 10^{-13}, \alpha = 2.03_{-0.033}^{+0.033}, \log_{10}(E_{cut}) = 1.12_{-0.042}^{+0.038}$$

Search for spectral variability – MCMC sampling of SED par. space

