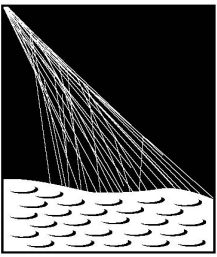


Constraining the sources of ultra-high-energy cosmic rays

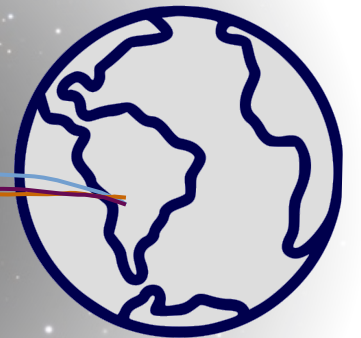
with arrival direction, spectrum, and composition
data measured at the Pierre Auger Observatory

Teresa Bister for the Pierre Auger Collaboration
17.05.2023, Cosmic ray anisotropy workshop, Chicago



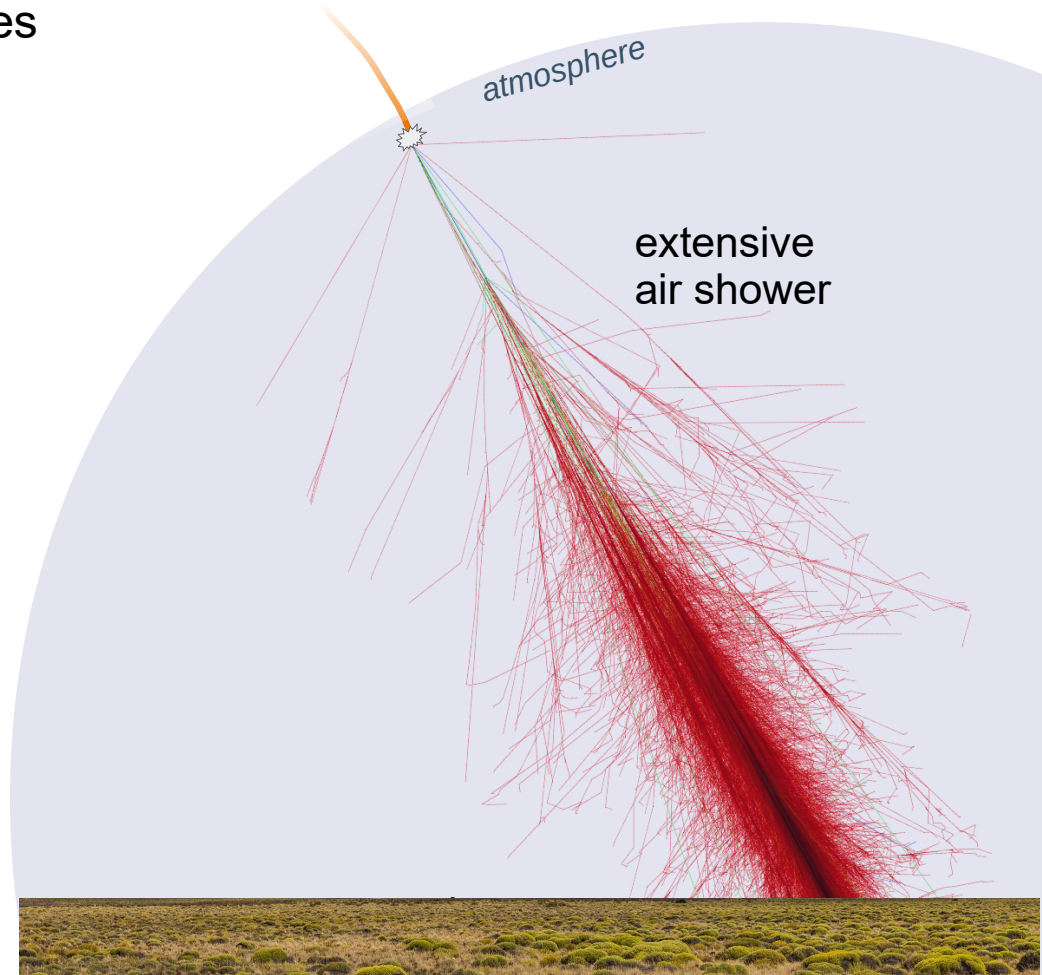
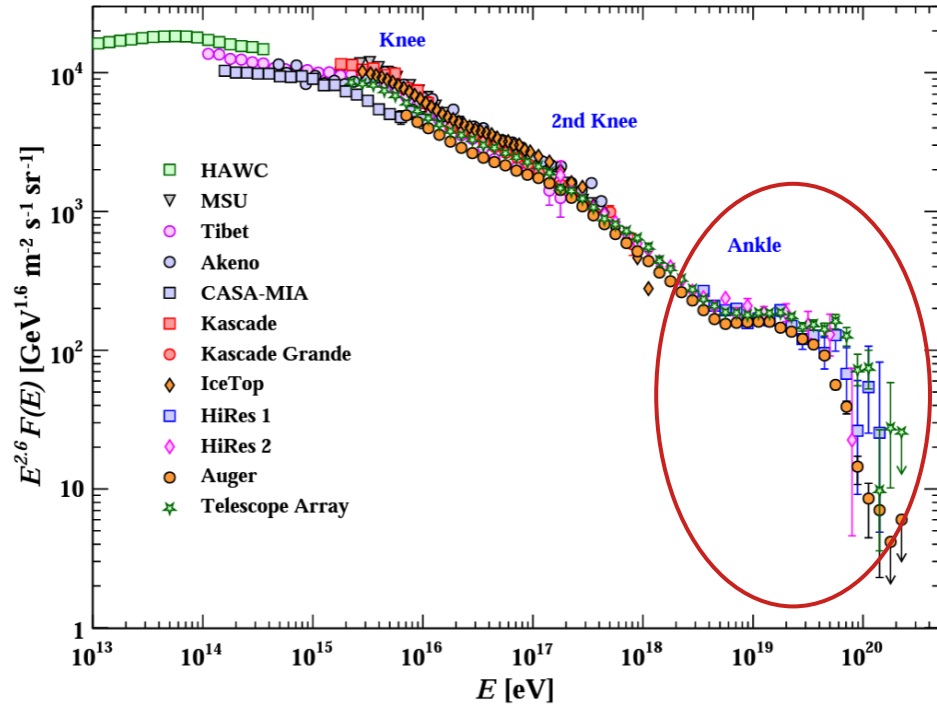
PIERRE
AUGER
OBSERVATORY

Radboud University



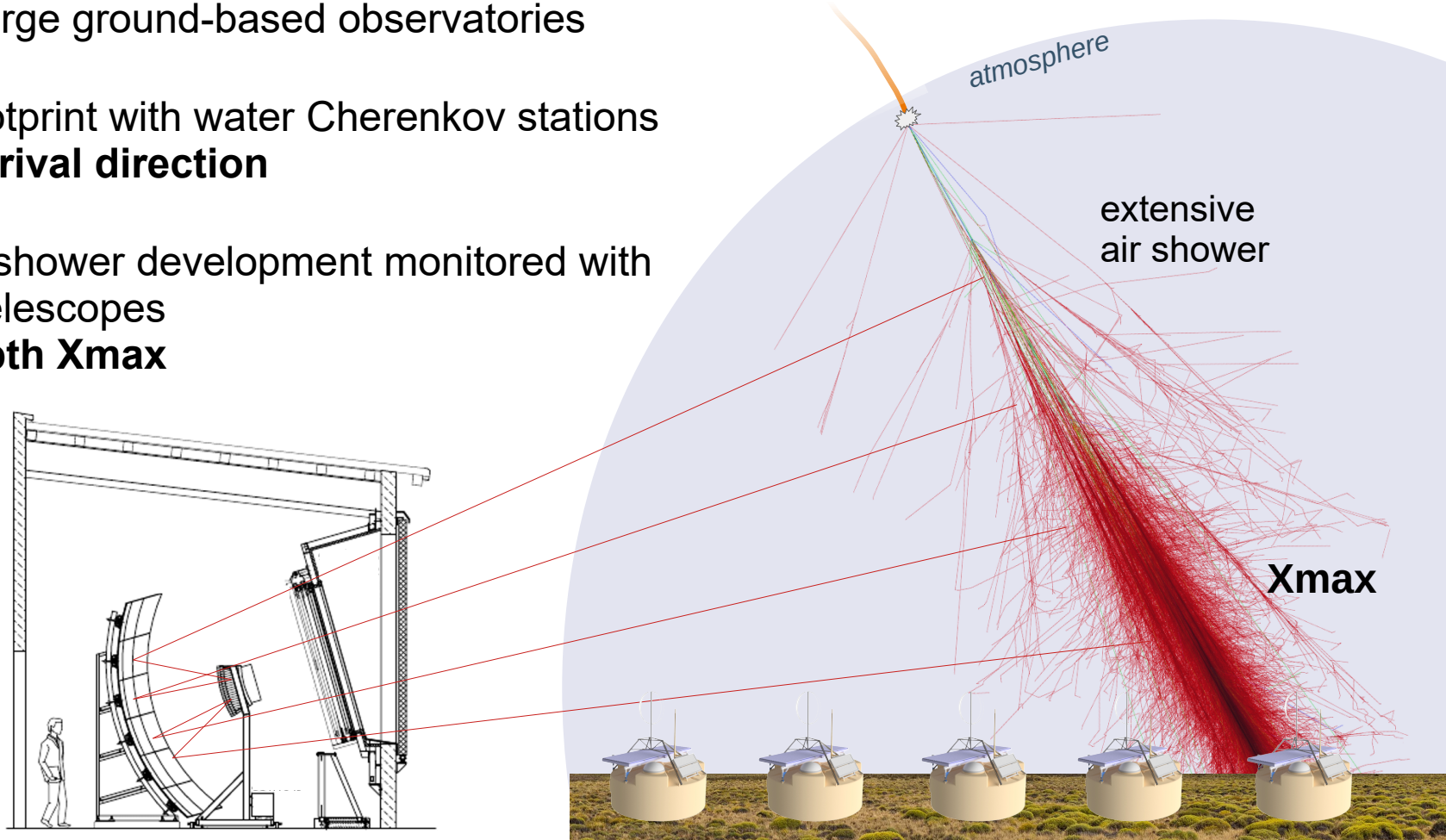
Measurement of UHECRs

- ultra-high-energies: flux only few particles per century per km²
→ need very large ground-based observatories



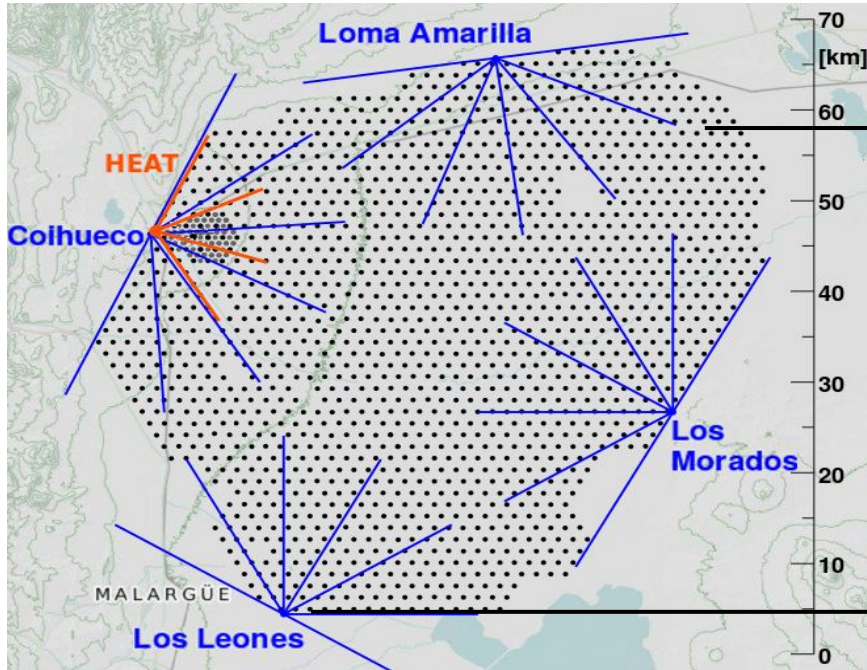
Measurement of UHECRs (on the example of the Pierre Auger Observatory)

- ultra-high-energies: flux only few particles per century per km^2
→ need very large ground-based observatories
- detection of footprint with water Cherenkov stations
→ **energy + arrival direction**
- in dark nights: shower development monitored with fluorescence telescopes
→ **shower depth X_{max}**



The Pierre Auger Observatory

- largest observatory for UHECRs in the world (3000 km²)
- located in Argentina, close to Malargüe



hybrid detection:

1660 water cherenkov detectors (SD)

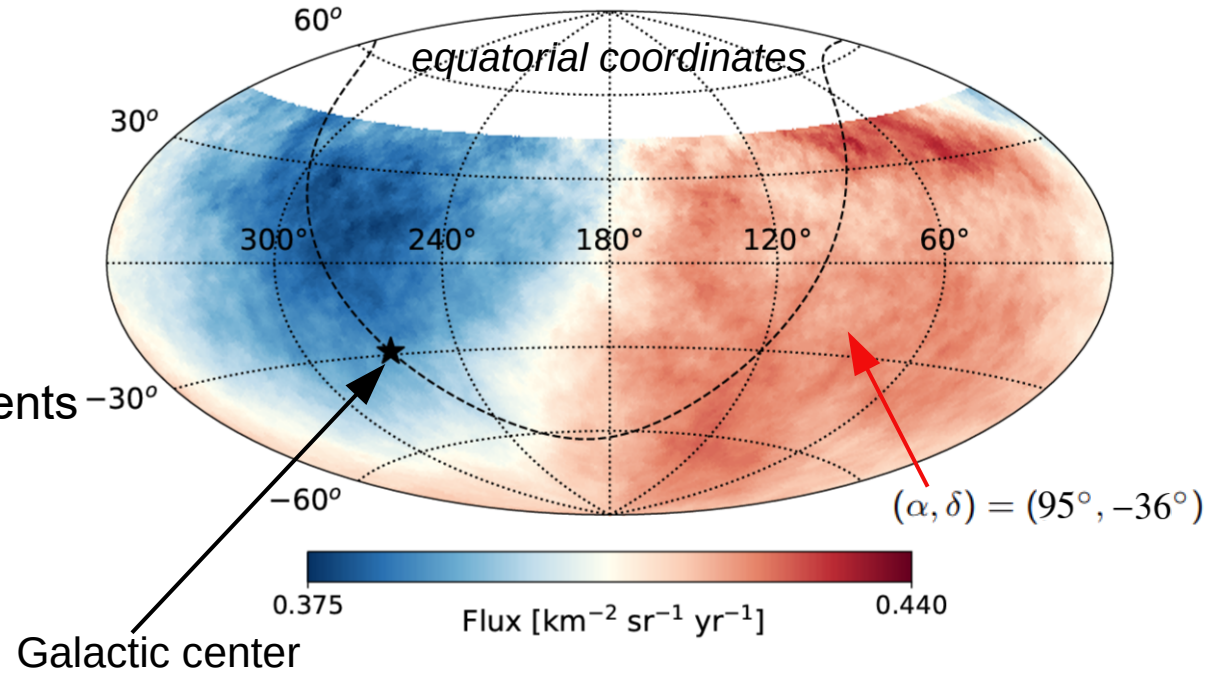
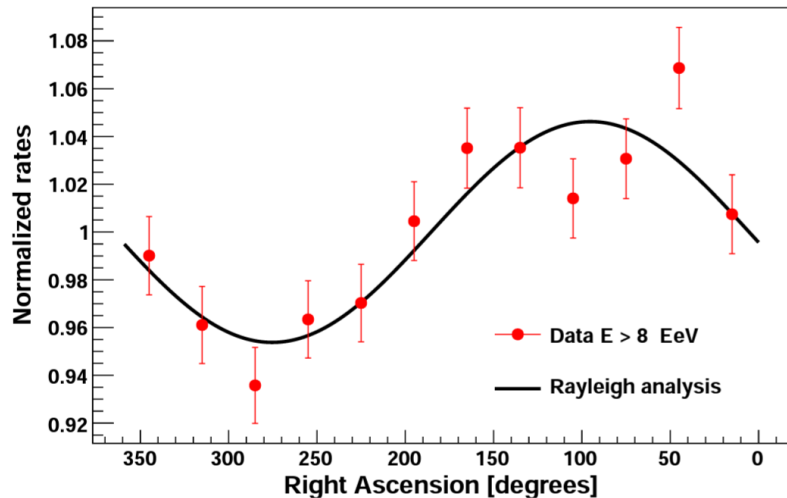
27 fluorescence telescopes (FD)

AugerPrime upgrade



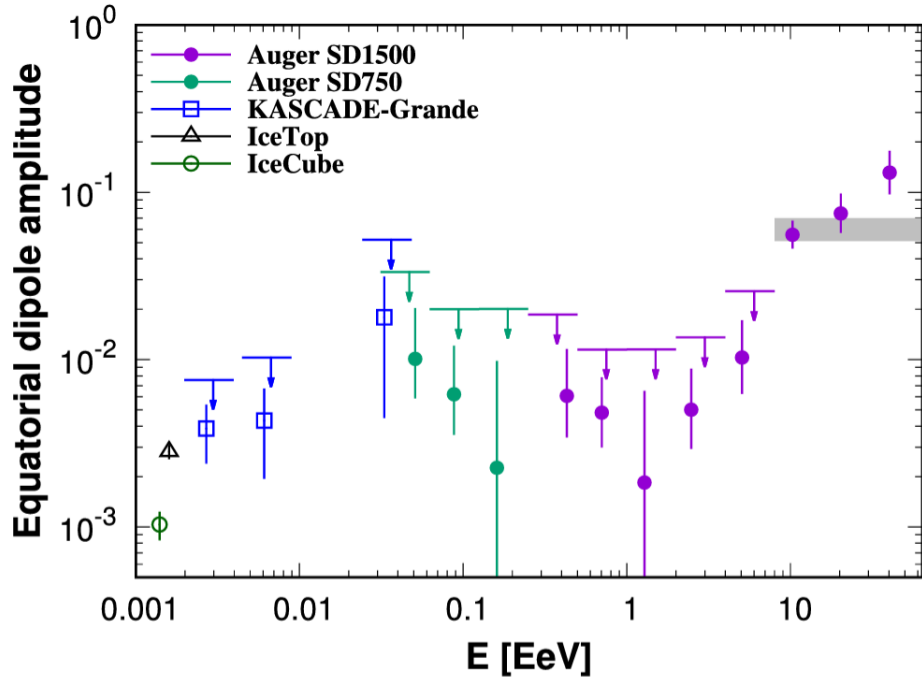
Large-scale anisotropy

- harmonic analysis in right ascension
→ **dipolar modulation**
- data above 8 EeV:
 - significance $> 5\sigma$
 - amplitude $\sim 7\%$
 - no significant quadrupolar components

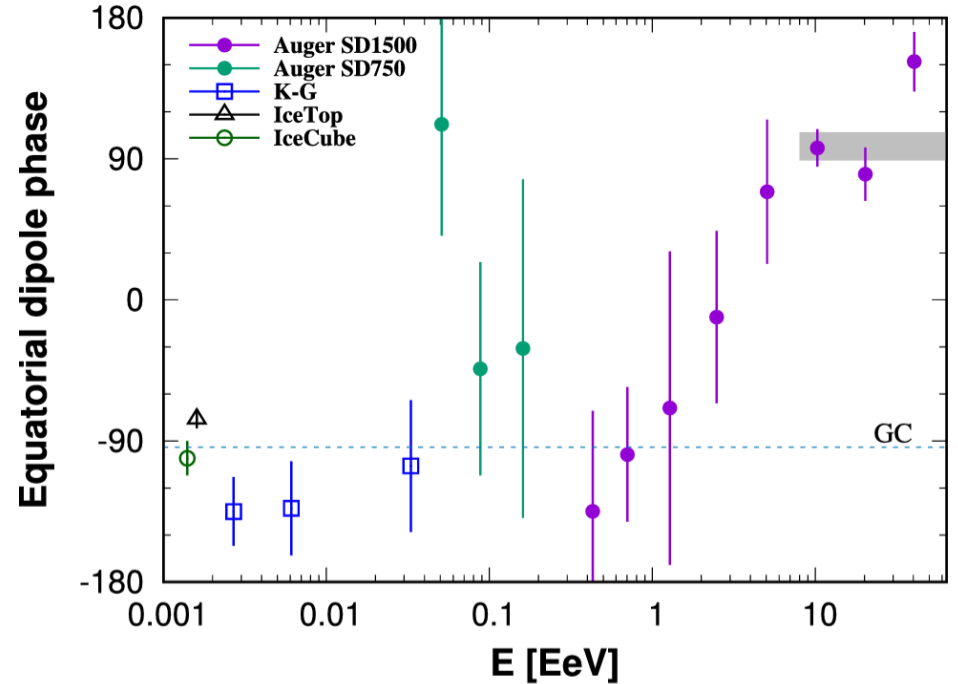


dipole points 115° away from Galactic center
→ indication for **extragalactic origin of UHECRs**

Large-scale anisotropy: energy dependency



amplitude grows with energy
(lower energy amplitudes not significant)



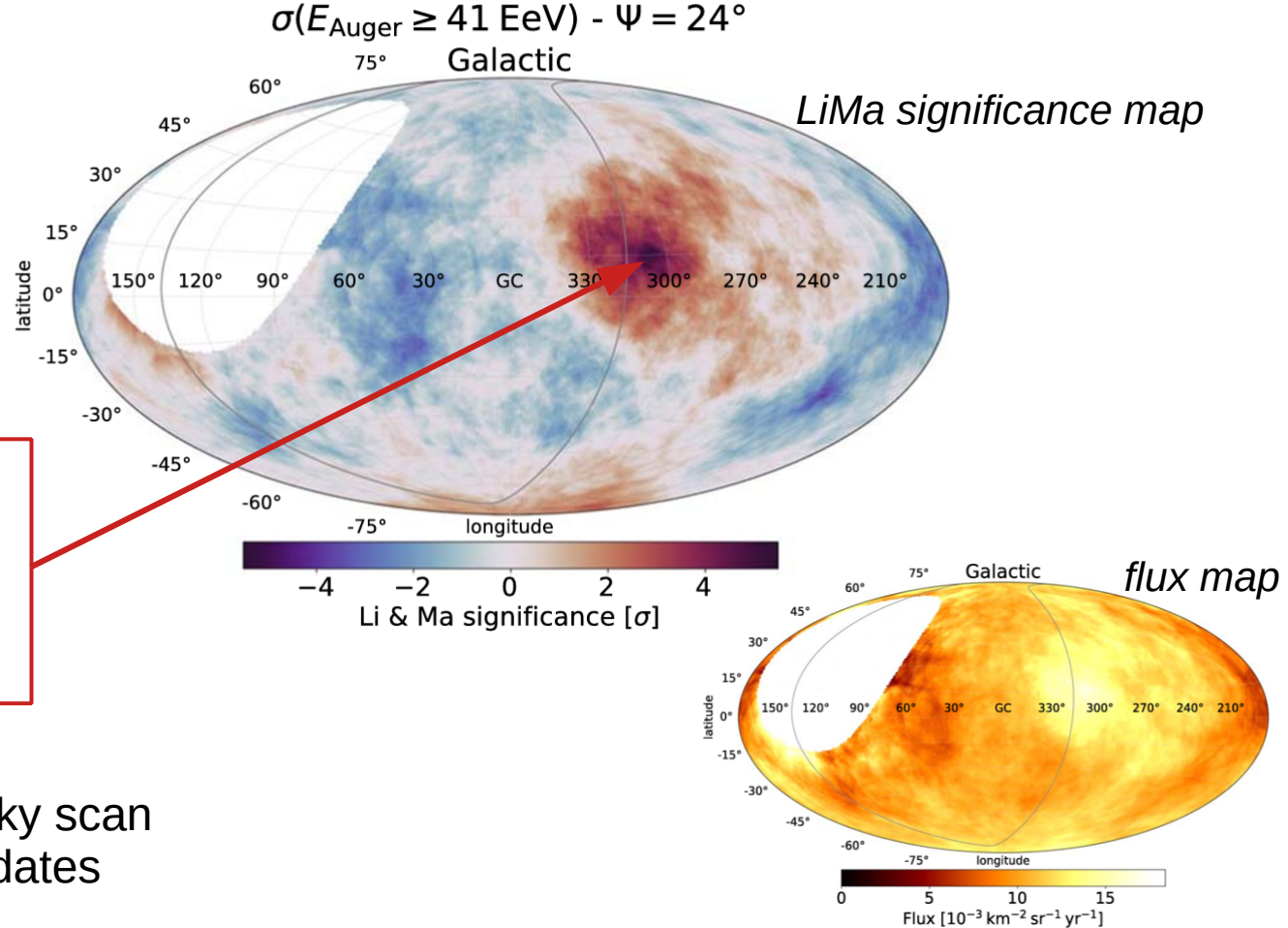
phase moves from Galactic center to opposite
transition from Galactic to extragalactic
injection at few EeV

Small-scale anisotropies

- **blind search** over 1° pixels
- 2 scan parameters:
 - energy threshold
 $32 \text{ EeV} \leq E_{\text{th}} \leq 80 \text{ EeV}$
 - circular tophat window
 $1^\circ \leq \psi \leq 30^\circ$

most significant excess:
local Li-Ma significance 5.4σ
post-trial **p=3%**

large trial factor due to whole-sky scan
→ comparison to source candidates

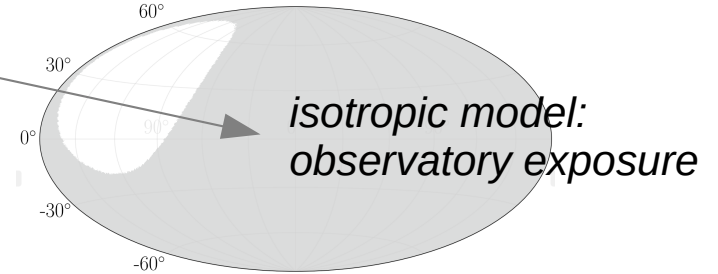


Correlations with source candidates

comparison of measured ADs with model flux maps:

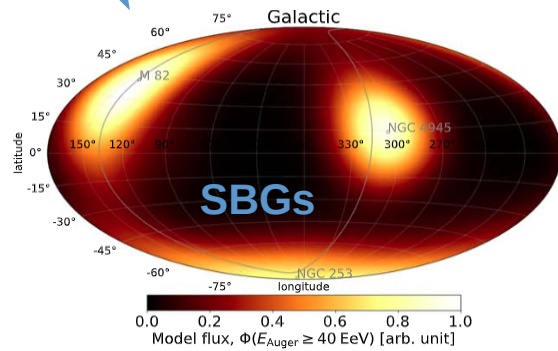
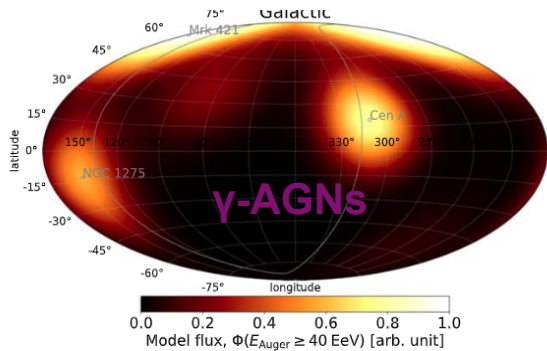
$$\text{pdf}_{\text{AD-only}} = f_{\text{AD-only}} \cdot S_{\delta_{\text{AD-only}}} + (1 - f_{\text{AD-only}}) \cdot B$$

signal fraction
magnetic field blurring



jetted active galactic nuclei
 γ -AGNs

starburst galaxies
SBGs



likelihood function:

$$\mathcal{L}_{\text{AD-only}}(f_{\text{AD-only}}, \delta_{\text{AD-only}}) = \prod_i \text{pdf}_i(\vec{v}_i)$$

test statistic:

$$\text{TS}_{\text{AD-only}} = 2 \log \frac{\mathcal{L}_{\text{AD-only}}(f_{\text{AD-only}}, \delta_{\text{AD-only}})}{\mathcal{L}_{\text{AD-only}}(f_{\text{AD-only}} = 0)}$$

Correlations with source candidates

comparison of measured ADs with model flux maps:

$$\text{pdf}_{\text{AD-only}} = f_{\text{AD-only}} \cdot S_{\delta_{\text{AD-only}}} + (1 - f_{\text{AD-only}}) \cdot$$

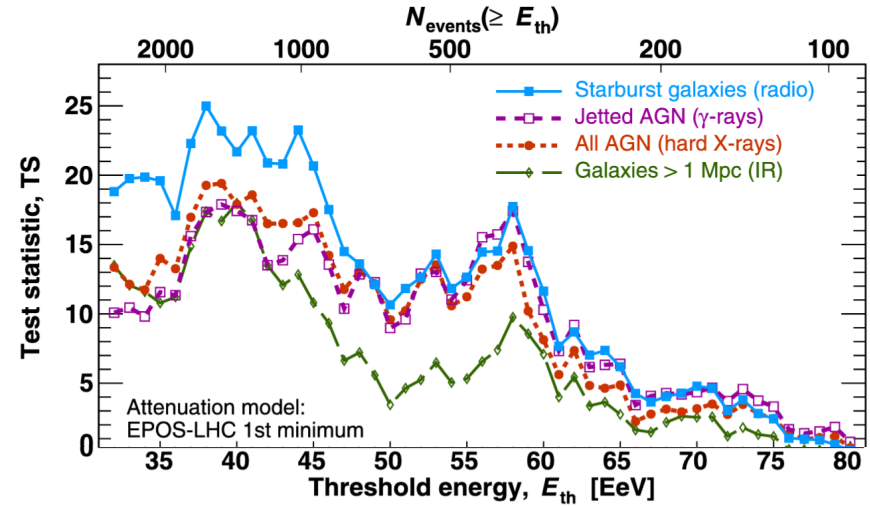
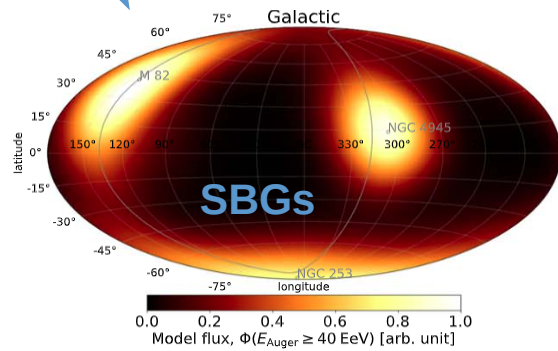
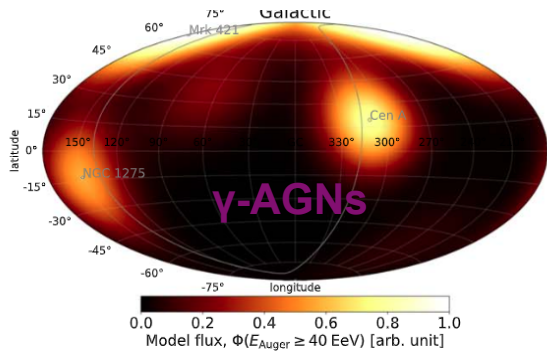
signal fraction
magnetic field blurring



jetted active galactic nuclei
γ-AGNs

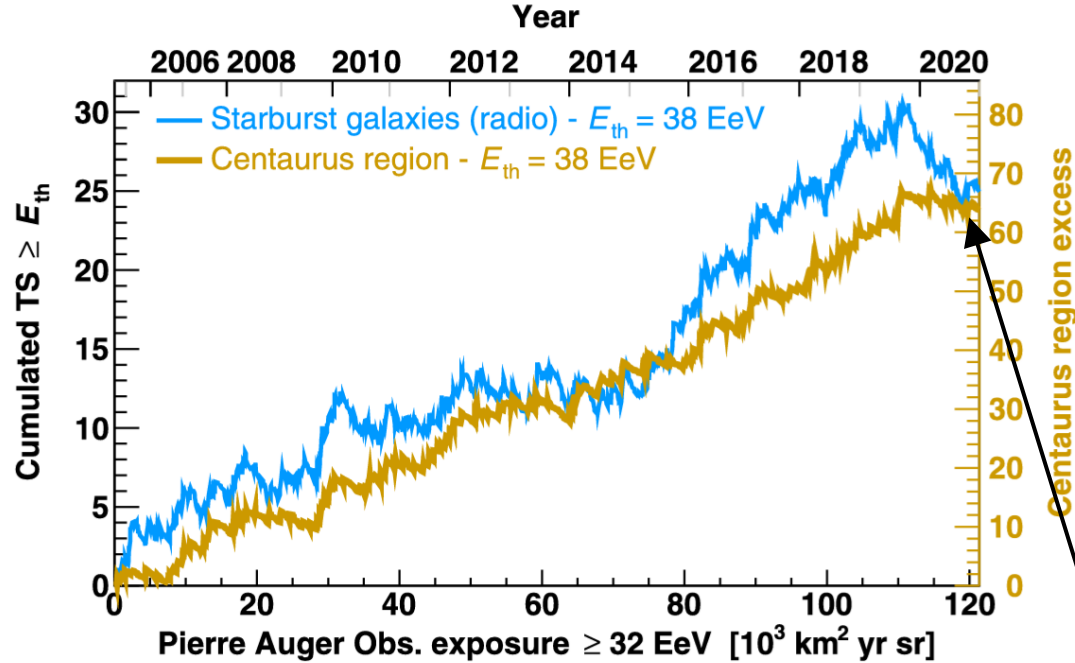


starburst galaxies
SBGs



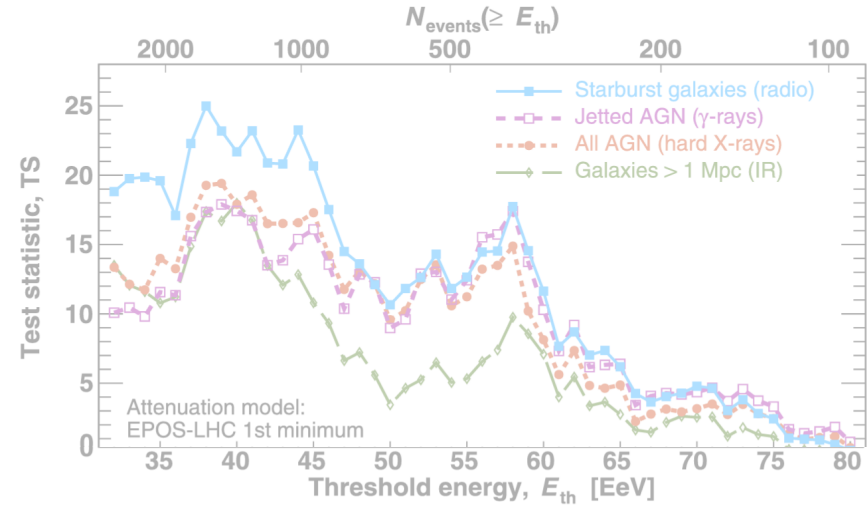
- SBG with largest significance
→ **4.0σ , $\delta=15^\circ$, $f=9\%$**
- large contribution from
NGC 4945 / Cen A region
- cannot distinguish catalogs
significantly

Correlations with source candidates



$$p_{\text{CenA}} = 4.5 \times 10^{-5}$$

$$p_{\text{SBG}} = 3.2 \times 10^{-5}$$

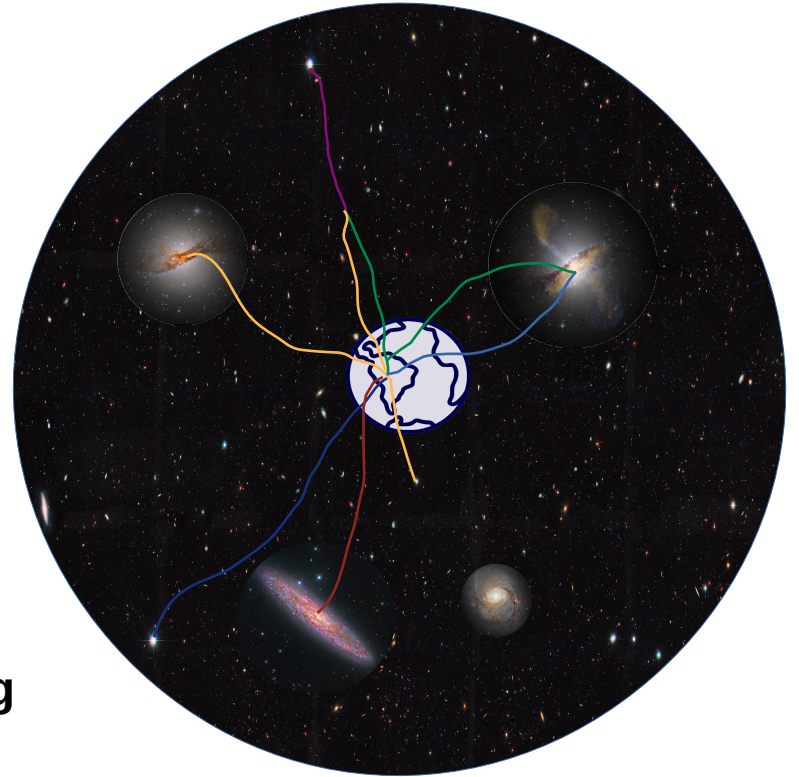


- SBG with largest significance
→ 4.0σ , $\delta=15^\circ$, $f=9\%$
- large contribution from
NGC 4945 / Cen A region
- cannot distinguish catalogs
significantly

Idea of the combined fit

of arrival directions + spectrum + composition

- investigate scenario: source candidates as sources of the medium-scale overdensities around them
 - investigate SBGs / γ -AGNs / Centaurus A
 - include also spectrum and composition data
- **model whole process:**
source emission + propagation + detection
 - possibility to constrain parameters of sources
 - contribution of each source shaped by flux weight + propagation influence
 - include **rigidity-dependent magnetic field blurring**
- **explain arrival directions + spectrum + composition with one model!**



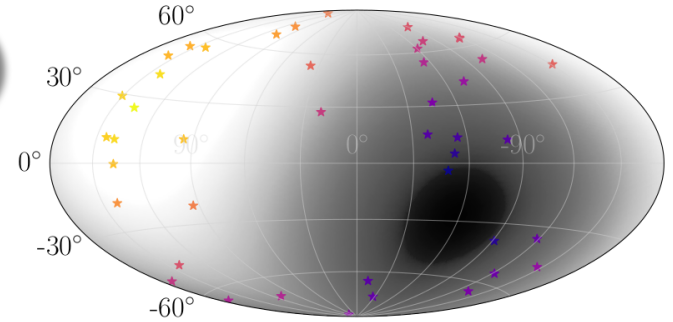
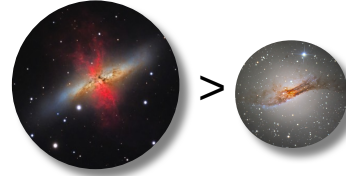
The astrophysical model: setup

inject UHECRs
from candidate
sources



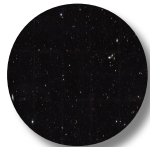
include effects of:

1. distance
2. flux weight
3. direction

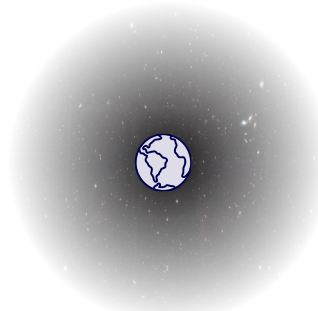


+

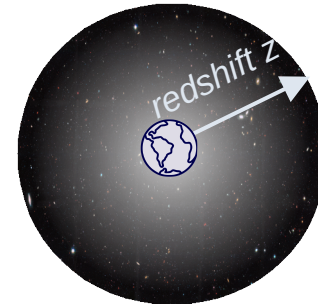
homogeneous
background
sources



include effect of
source evolution:



less sources in past



more sources in past

$$\propto (1+z)^m$$

for SBGs: $m \sim 3.4$
for AGNs: $m \sim 5.0$

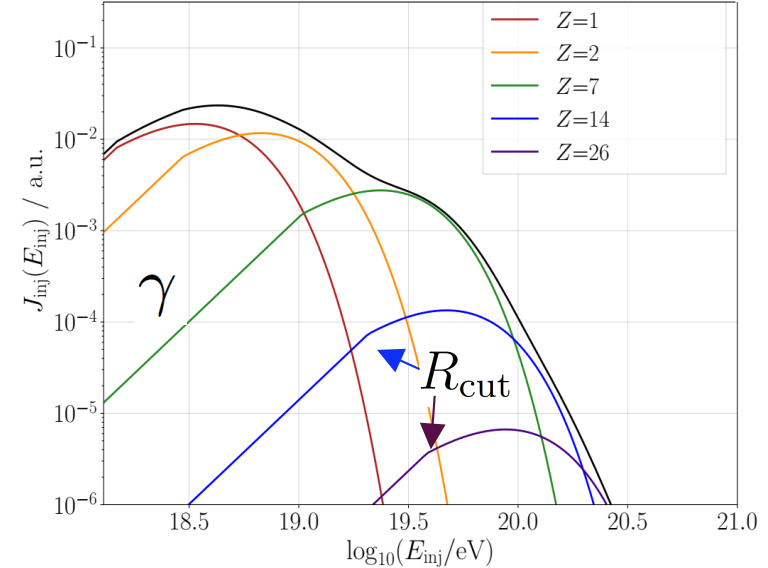
The astrophysical model: source injection

5 species:

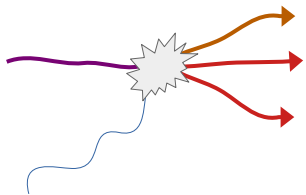
→ **injection** (same for all sources+background):

$$J_{\text{inj}}(E_{\text{inj}}, A_{\text{inj}}) = J_0 \cdot a_A \cdot \left(\frac{E_{\text{inj}}}{10^{18} \text{ eV}}\right)^\gamma f_{\text{cut}}\left(\frac{E_{\text{inj}}}{Z_A R_{\text{cut}}}\right)$$

free model parameters



→ **propagation** (from sources to Earth):



- simulate “**propagation database**“ with **CR/Propa**
- maps injected energies & masses to detected ones at Earth

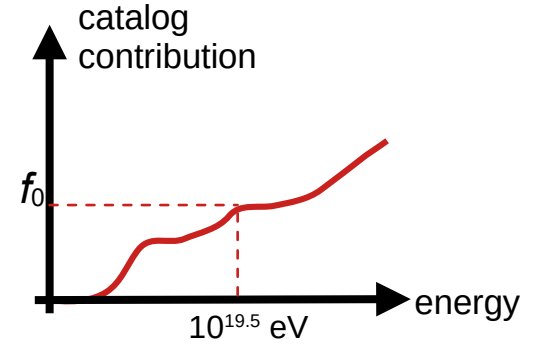
$$P(E_{\text{inj}}^h, A_{\text{inj}}^i, E_{\text{det}}^e, A_{\text{det}}^k, d^l)$$

Signal fraction & arrival directions

→ define signal fraction:

weight catalog and background

- catalog contribution shaped by propagation
- define signal fraction f_0
- free model parameter



→ calculate arrival directions:

- arrival direction blurring anti-prop. to rigidity:
$$\delta = \frac{\delta_0}{R/10 \text{ EV}}$$
- for each source in each energy bin: add Fisher distribution & weight with contribution

example:

Fe + Si + N

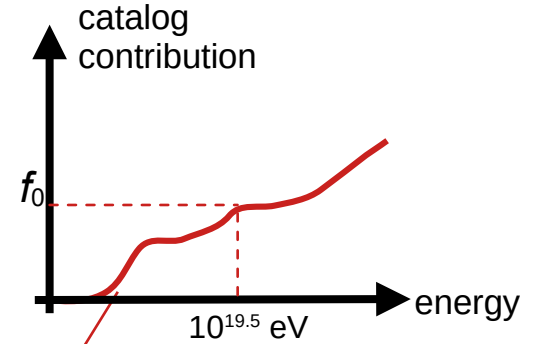


Signal fraction & arrival directions

→ define signal fraction:

weight catalog and background

- catalog contribution shaped by propagation
- define signal fraction f_0
- free model parameter



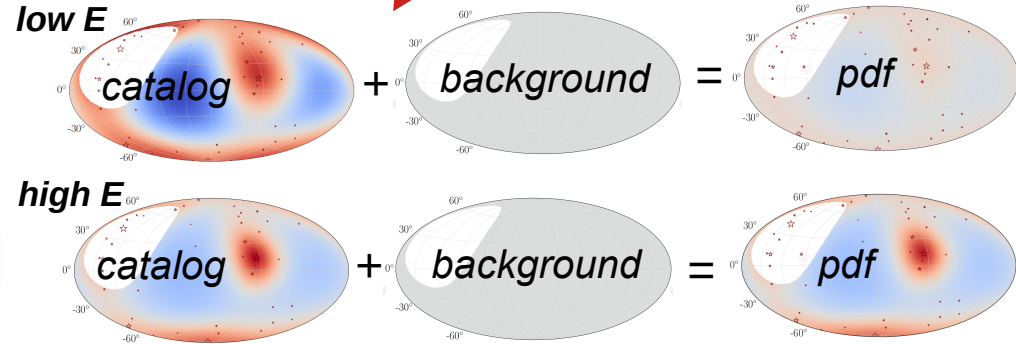
→ calculate arrival directions:

- arrival direction blurring anti-prop. to rigidity:

$$\delta = \frac{\delta_0}{R/10 \text{ EV}}$$

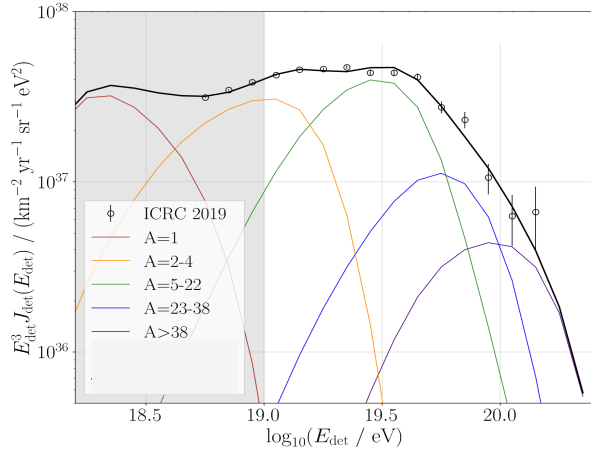
- for each source in each energy bin: add Fisher distribution & weight with contribution

example:
Fe + Si + N



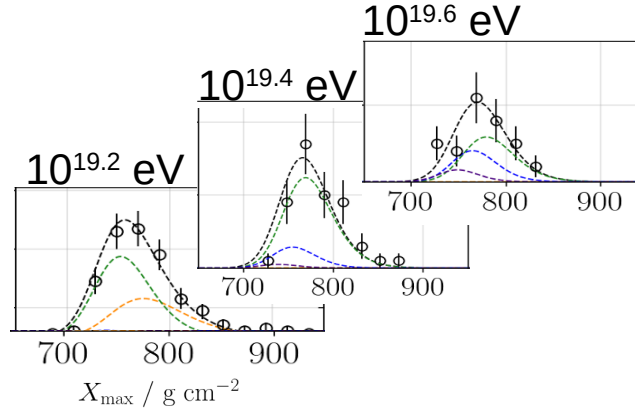
Modeling 3 observables

energy spectrum



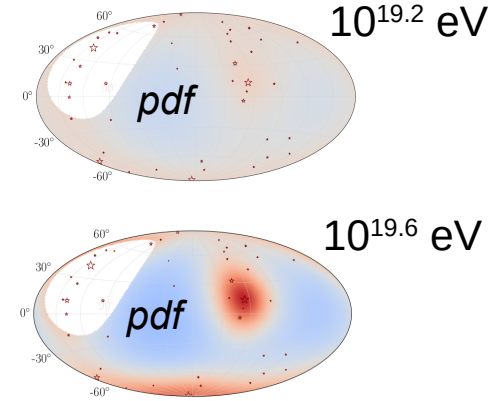
- energy spectrum
= sum over detected particles
- fold with detector resolution
- Poissonian likelihood

shower depth distributions



- parameterize with Gumbel distributions (EPOS-LHC)
- fold with detector resolution & acceptance
- Multinomial likelihood function

arrival directions



- likelihood function similar to previous analysis
- but: pdf energy dependent
- in healpy pixels p :

$$\mathcal{L}_{AD} = \prod_e \prod_p \text{pdf}^{e,p}(v^{e,p})$$

Results

Paper to be uploaded to
arXiv within the next days

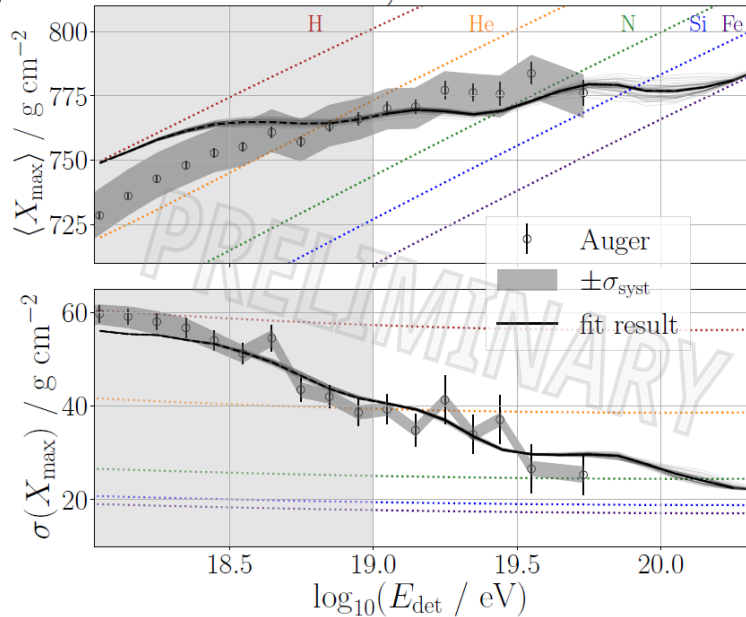
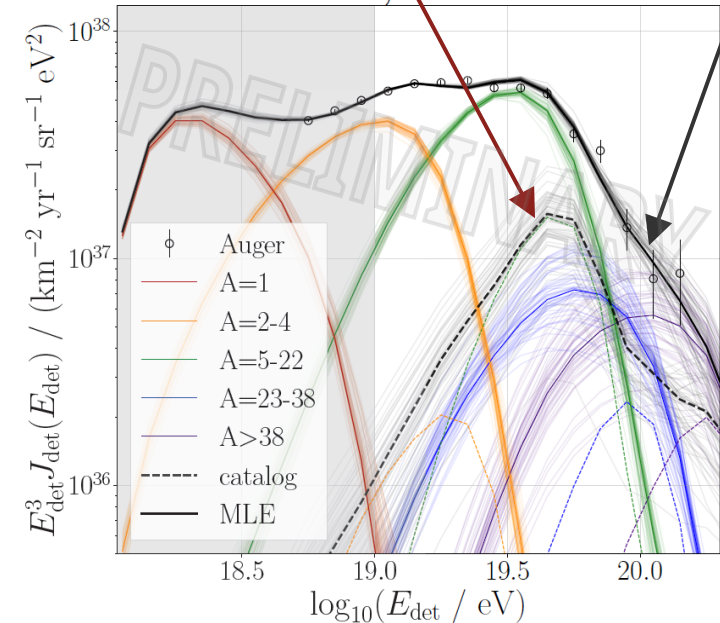
PRELIMINARY

Starburst Galaxy model: results

- hard emission spectrum, nitrogen-dominated
- signal fraction: $f_0 \sim 20\%$ at 40 EeV
- magnetic field blurring: $\delta_0 \sim 20^\circ$ for 10 EV

	posterior	MLE
γ	$-2.77^{+0.27}_{-0.29}$	-2.67
$\log_{10}(R_{\text{cut}}/V)$	$18.13^{+0.02}_{-0.02}$	18.13
f_0	$0.17^{+0.06}_{-0.08}$	0.19
$\delta_0/^\circ$	$22.2^{+5.3}_{-4.0}$	24.3
I_H	$6.4^{+1.3}_{-6.4} \cdot 10^{-3}$	$4.3 \cdot 10^{-5}$
I_{He}	$1.7^{+0.3}_{-0.4} \cdot 10^{-1}$	$1.8 \cdot 10^{-1}$
I_N	$7.4^{+0.3}_{-0.3} \cdot 10^{-1}$	$7.4 \cdot 10^{-1}$
I_{Si}	$5.7^{+2.5}_{-3.1} \cdot 10^{-2}$	$5.4 \cdot 10^{-2}$
I_{Fe}	$2.5^{+0.8}_{-0.9} \cdot 10^{-2}$	$2.3 \cdot 10^{-2}$

dashed line = catalog contribution
thin lines = uncertainties

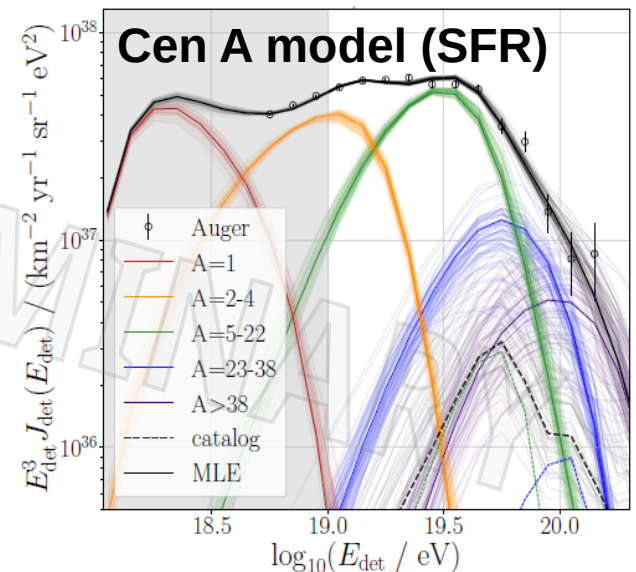
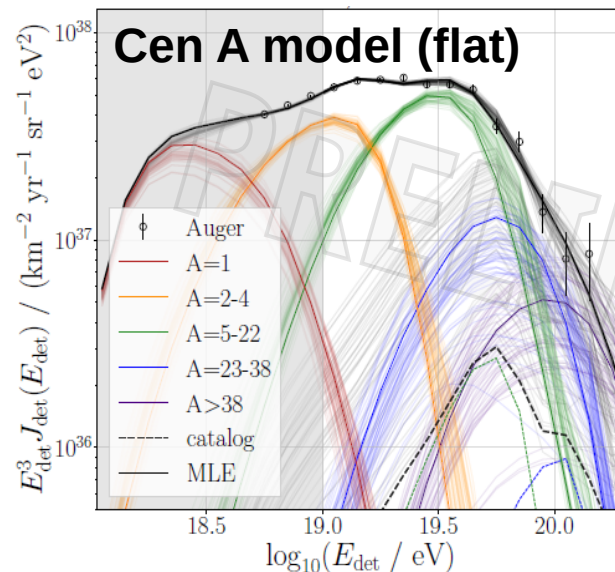
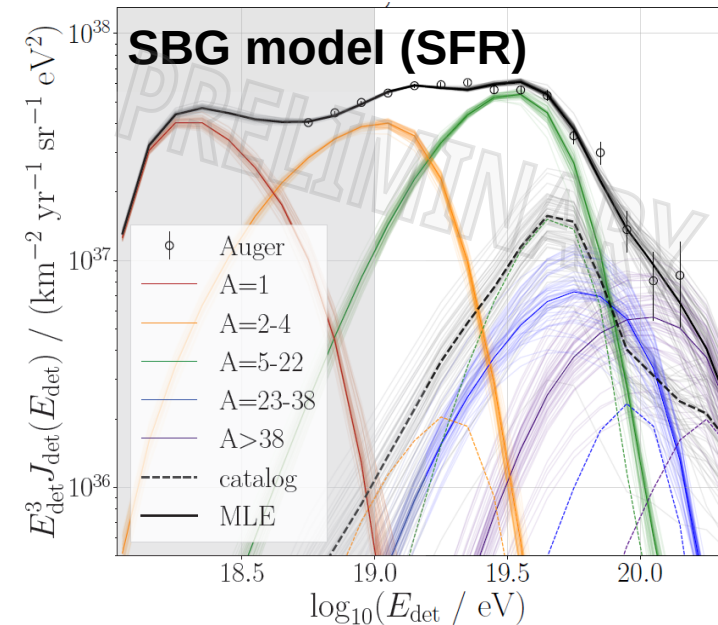


accordance with measured data increases when including a systematic shift of the X_{max} scale of around -1.5σ
→ see backup for systematics study

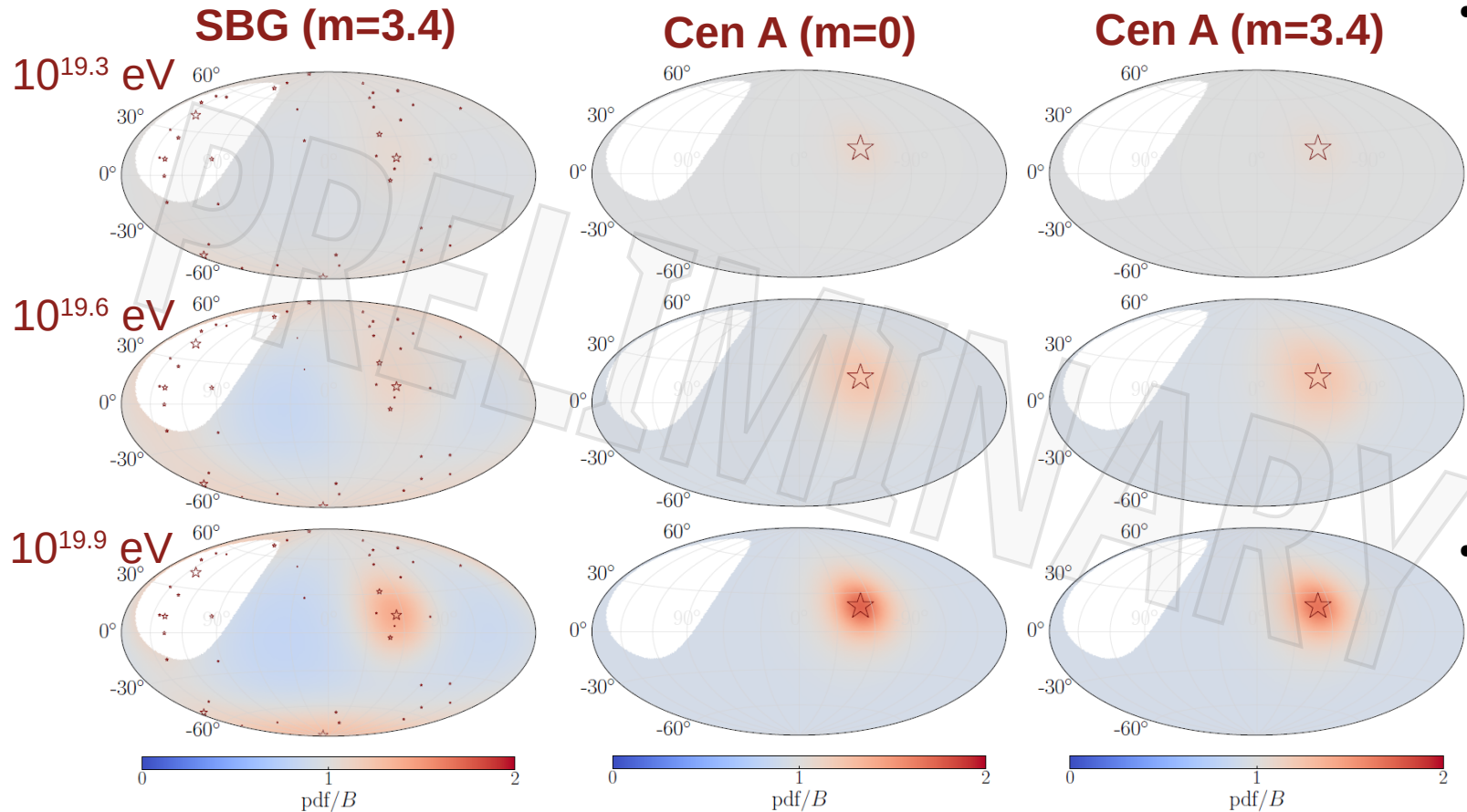


Starburst Galaxy \leftrightarrow Centaurus A model

- Cen A region spectrum fitted consistently
 - independent of evolution & systematics $f_0 \sim 3\%$
 - Cen A region contribution also similar in SBG model
- in all models: **nitrogen** up to high energies with $R \sim 10$ EV
 - light elements cut off above ~ 30 EeV due to hard spectrum



SBG & Centaurus A models: arrival directions



- level of anisotropy rises with energy
 - signal fraction increases (propagation effect)
 - blurring decreases (rigidity dependency)
- Cen A / NGC 4945 region modeled consistently

Likelihood ratio / test statistic



How much better do models with catalog sources fit than a model with only homogeneous background sources?

	SBG, $m = 3.4$		Cen A, $m = 0.0$		Cen A, $m = 3.4$	
	+ syst		+ syst		+ syst	
TS_{tot}	27.6	25.6	22.8	17.3	22.2	19.7
TS_E	-5.2	-0.5	-0.1	-1.4	-0.4	2.9
$TS_{X_{\text{max}}}$	6.2	0.1	1.9	0.2	1.8	-0.9
TS_{ADs}	26.6	27.1	20.9	18.7	20.8	19.0

arrival directions most important for source identification

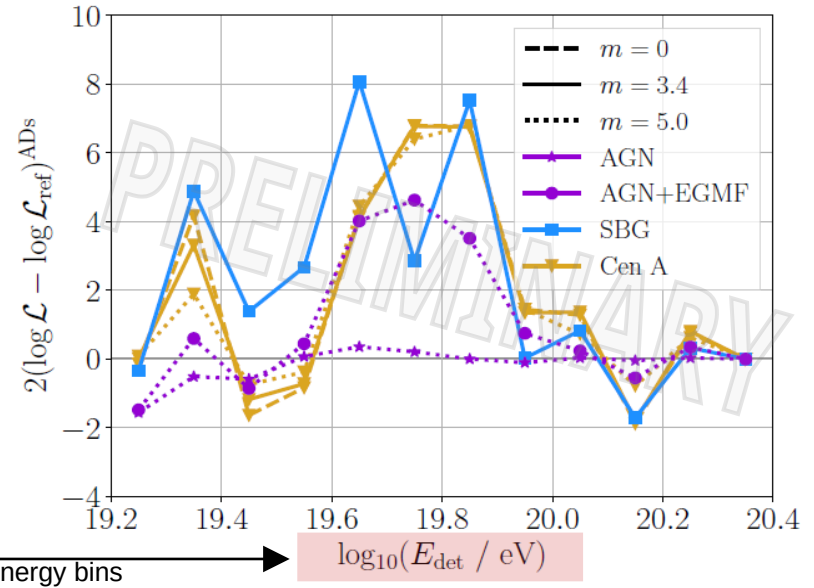
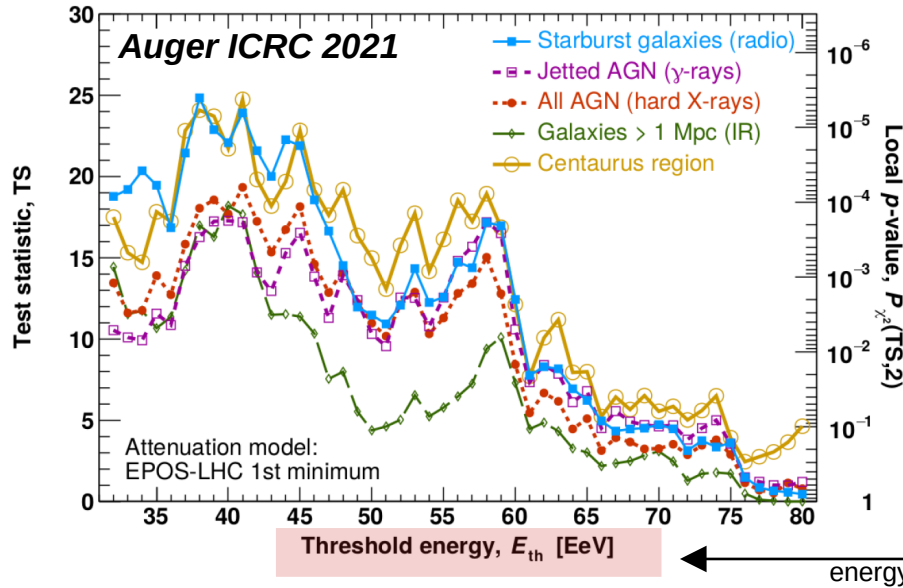
SBG model has **highest $TS=27.6 \leftrightarrow 4.7\sigma$**

- **4.5σ with systematics**
- increase compared to AD-correlation analysis: 4.0σ (all 1-sided)

Cen A region contributes dominant part with $TS\sim 20$

- despite small $f_0=3\%$

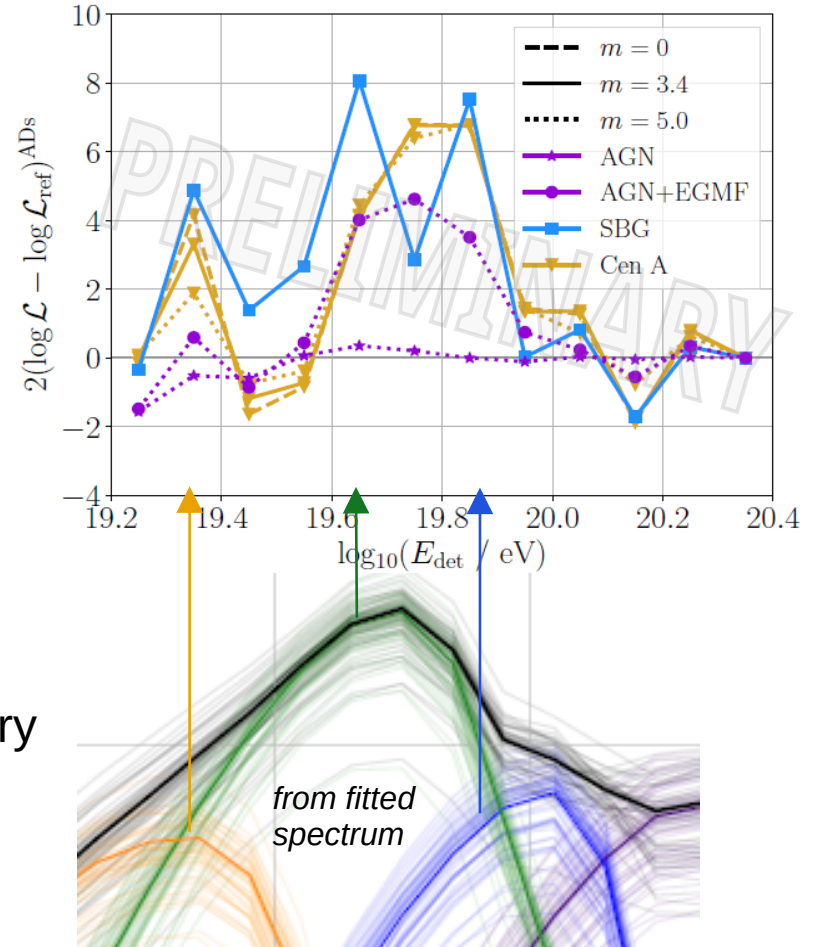
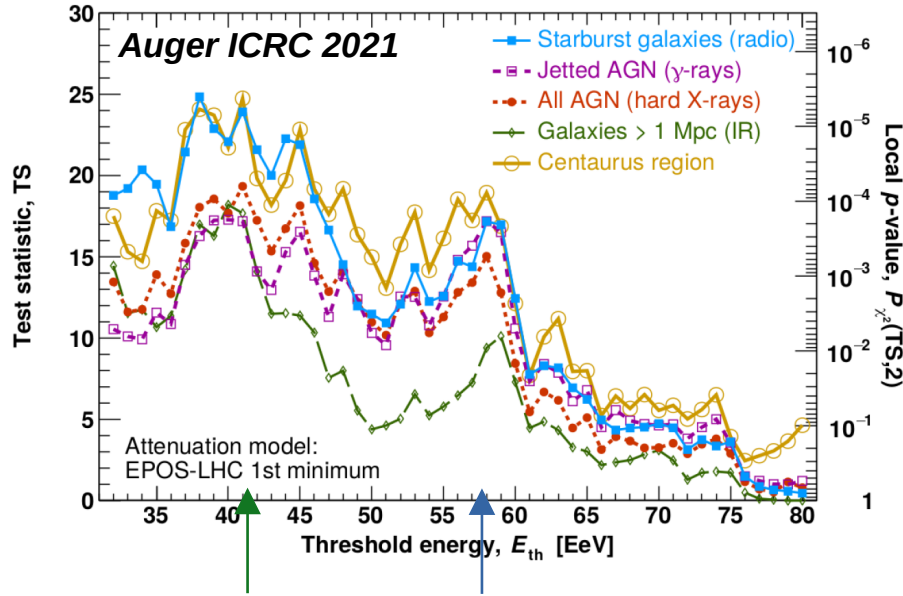
Arrival directions TS energy dependency



energy dependency of AD test statistics

- sum over all bins gives TS_{tot} → no scan necessary
- catch whole signal by rigidity-dependency

Arrival directions TS energy dependency

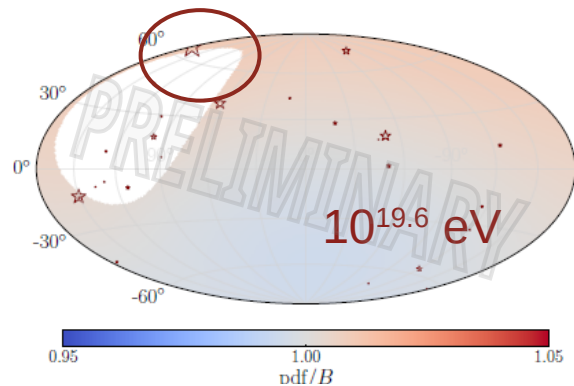
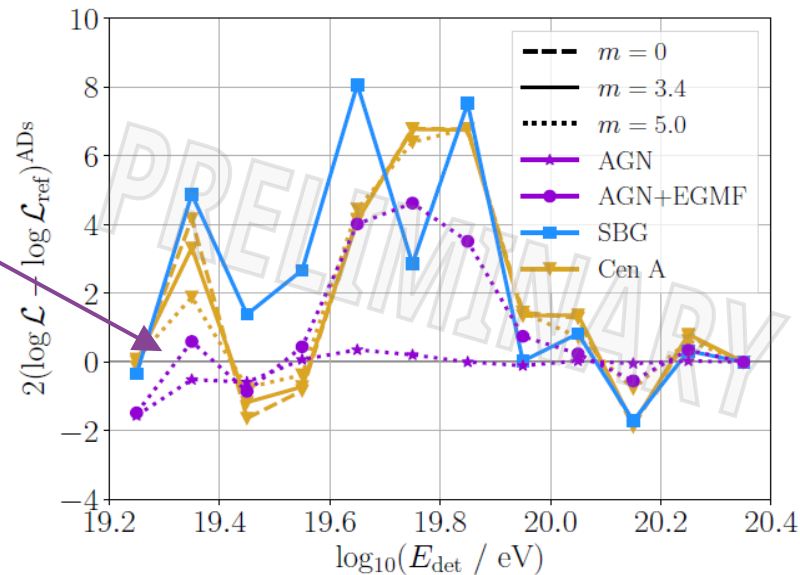


energy dependency of AD test statistics

- sum over all bins gives TS_{tot} → no scan necessary
- peaks: could correspond to **He, N, Si** peak
- but: statistical fluctuations of TS large
(→ UHECR 2022 Symposium [EPJ Web Conf. 283 03008 \(2023\)](https://www.epj-conferences.org/doi/10.1051/epjconf/202328303008))

The γ -AGN model with strong evolution ($m=5.0$)

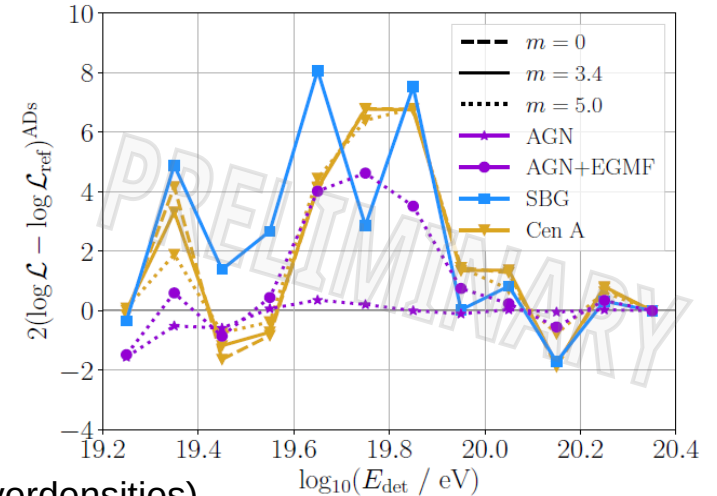
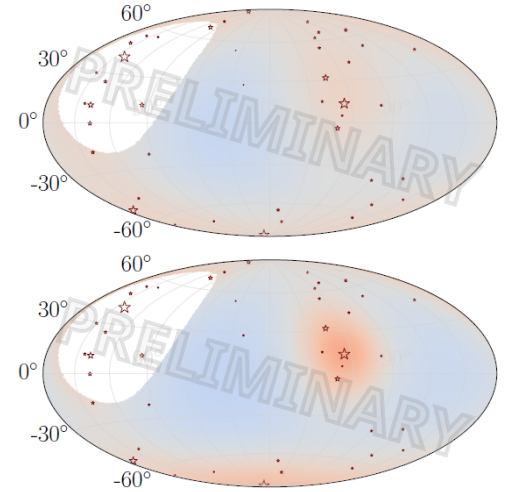
- arrival directions TS negative
- flux dominated by faraway **blazar**
Markarian 421 (~ 130 Mpc)
 - catalog based on γ -ray flux (favors blazars)
 - not compatible with Auger data
- influence of EGMF?
 - best-fit is extremely strong field strength
 - ADs still not well enough described



→ **discard γ -AGN model with flux \propto γ -ray emission**

Conclusion

- first-time combination of all 3 observables in 1 model
- **SBG model: increase of significance (4.5σ including syst.)** compared to arrival-directions-only analysis (4.0σ)
 - E-dependency of catalog contribution, propagation, R-dependent blurring...
 - main contribution to TS (~ 20 of 27.6) from Cen A / NGC 4945 region
 - 20% signal fraction at 40 EeV, hard spectrum, N-dominated, 20° blurring at 10 EV
- **γ -AGN catalog can be discarded** for the first time
 - CR flux proportional to γ -ray flux disfavored
- results under assumption of **turbulent » coherent GMF** (at least in source directions, only then source candidates can explain overdensities)

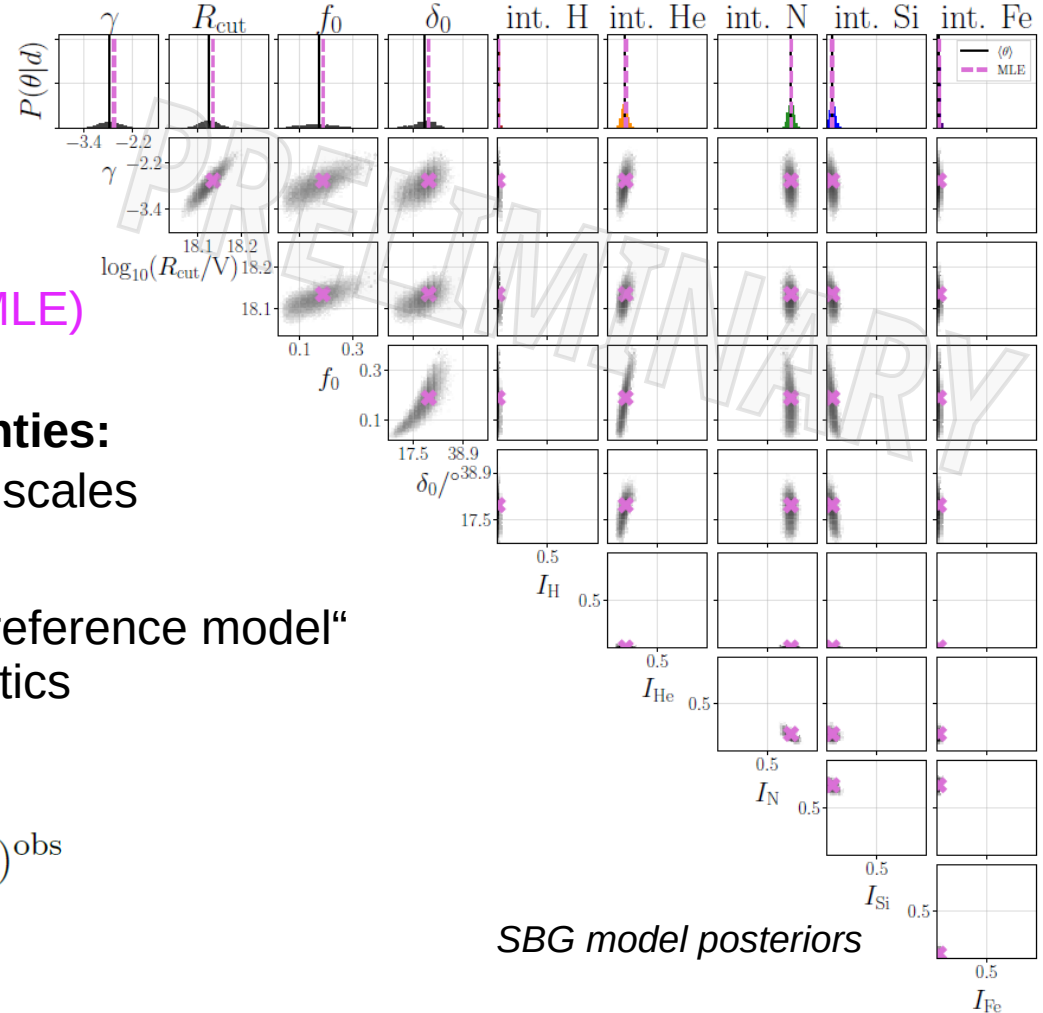


Backup

Fit method

- for each model:
 - MCMC sampler for uncertainties
 - gradient-based minimizer for best-fit (MLE)
- estimate influence of **systematic uncertainties**:
 - let fit determine best shift of E & Xmax scales
- compare model with catalog sources to a „reference model“ with same source evolution & (no) systematics
 - calculate **test statistic**:

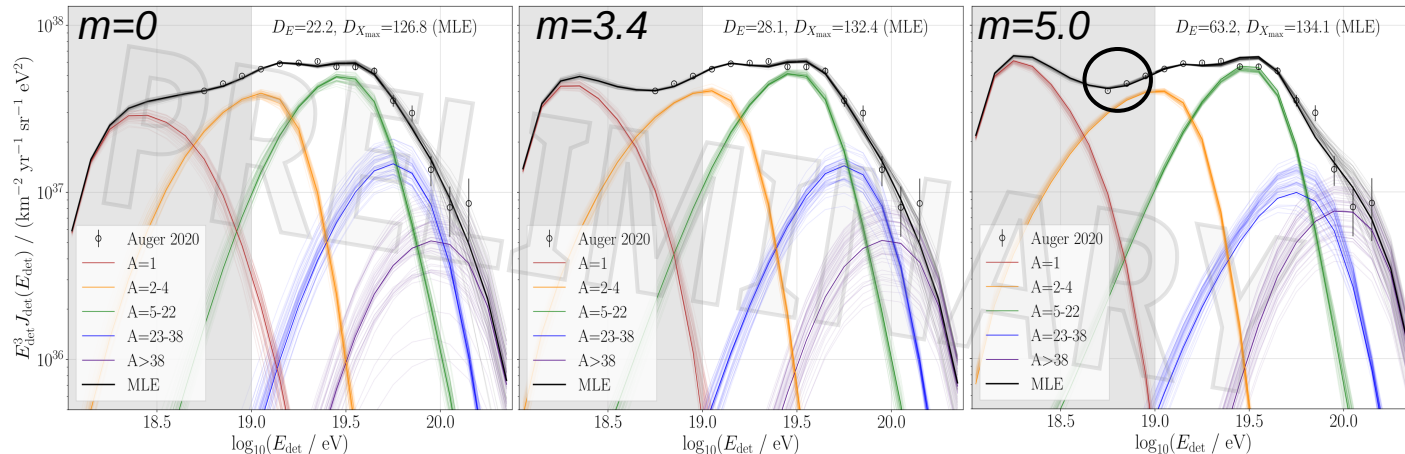
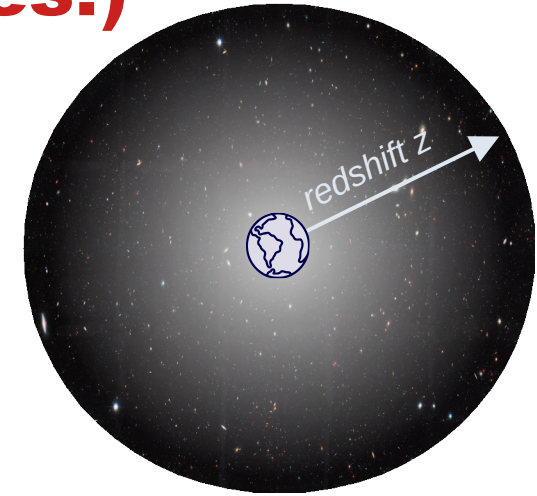
$$\text{TS}_{\text{tot}} = \sum_{\text{obs}=E, X_{\text{max}}, \text{ADs}} 2(\log \mathcal{L}^{m=x} - \mathcal{L}_{\text{ref}}^{m=x})^{\text{obs}}$$



SBG model posteriors

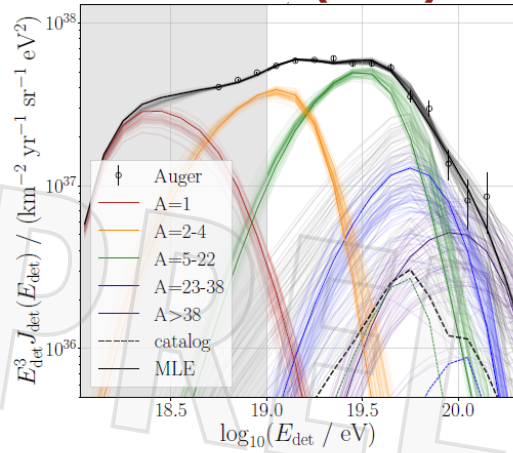
Reference models (no catalog sources!)

- hard injection spectrum, small R_{cut} , N-dominated
 - in **agreement with other Auger results**
[link to combined fit across the ankle \(Auger 2023\)](#)
- **strong evolution discarded:**
 - too many low-energy secondaries
- with **experimental systematics** (as nuisance parameters):
 - best shift of X_{max} scale by -10 to -15 g/cm² → D decreases by ~20

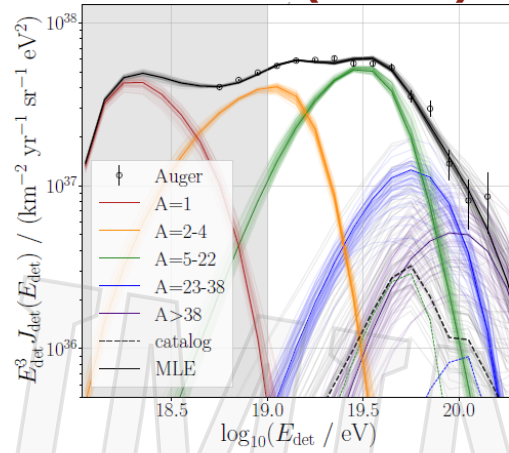


SBG & Centaurus A models: spectra

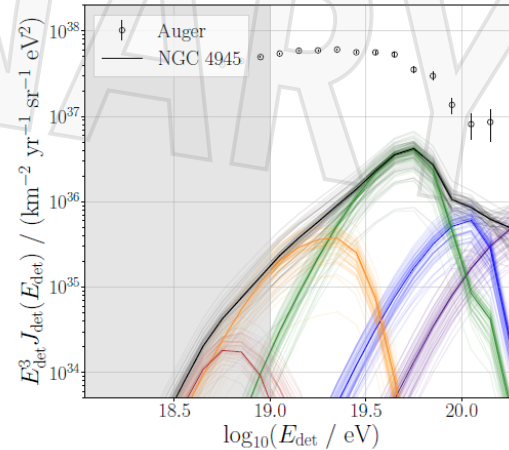
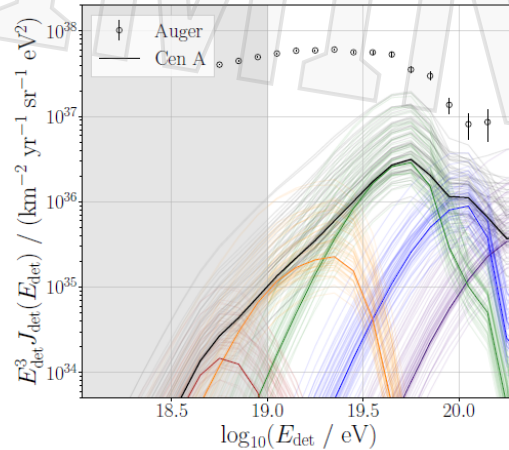
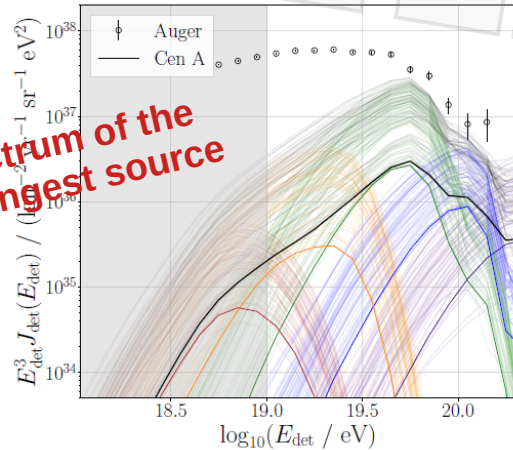
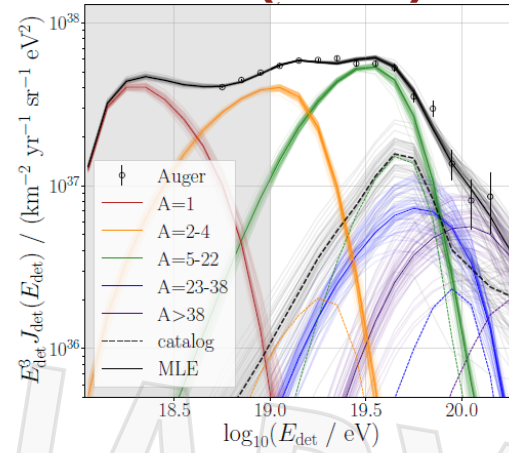
Cen A (m=0)



Cen A (m=3.4)



SBG (m=3.4)

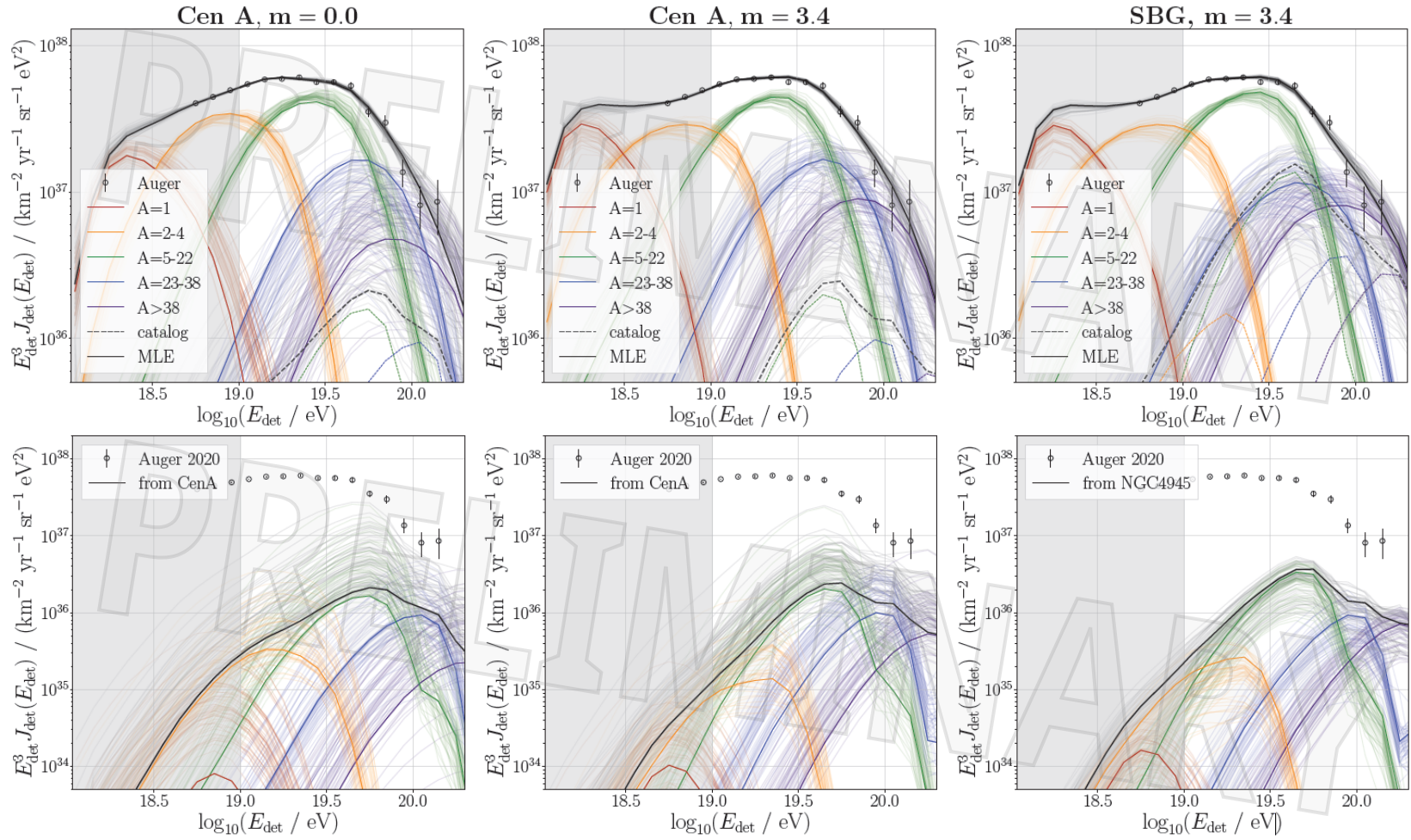


**Cen A spectrum =
NGC 4945 spectrum**

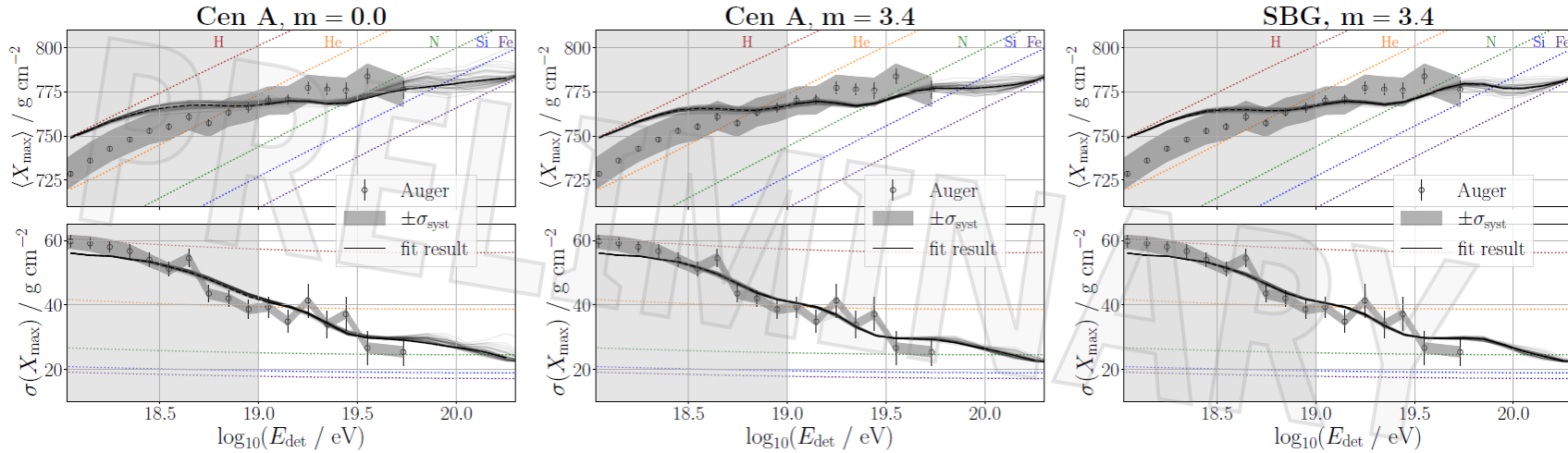
→ flux from that sky
region modeled
consistently

**spectrum of the
strongest source**

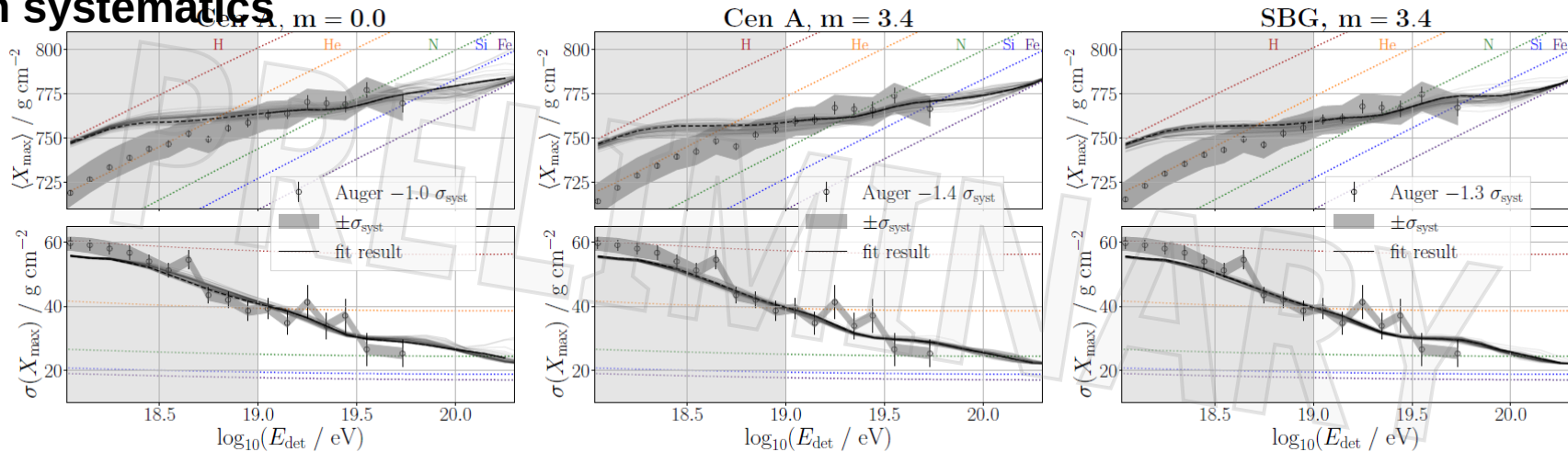
Including systematics: spectra



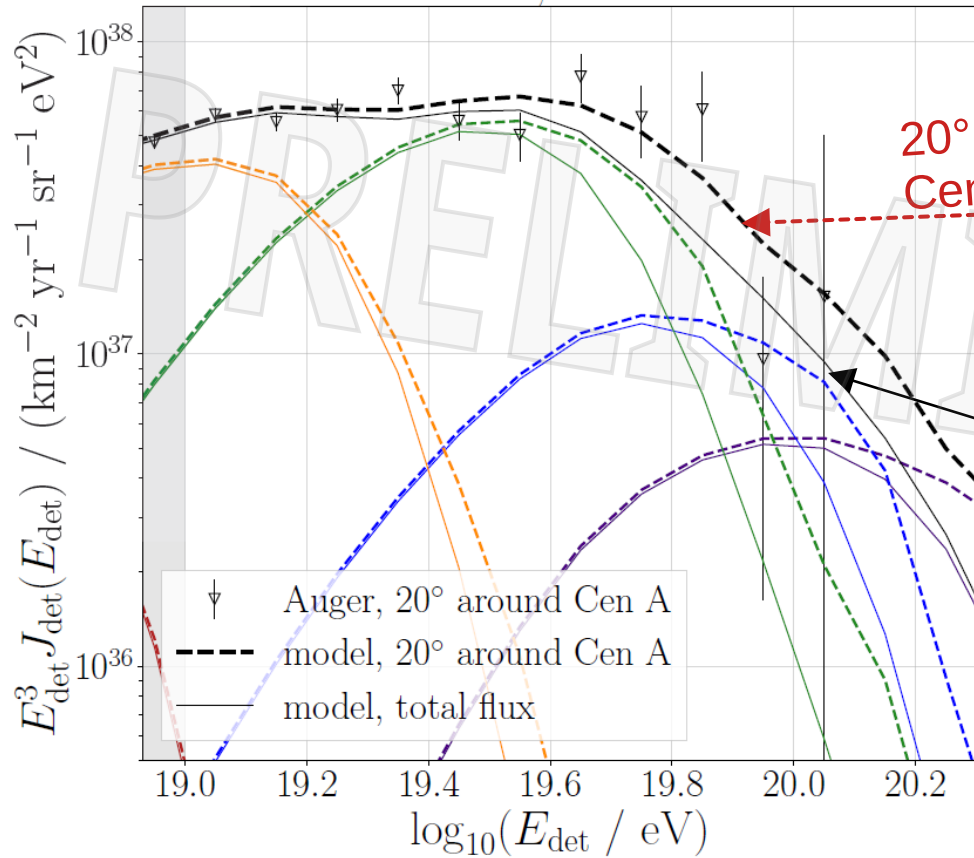
Xmax moments



with systematics

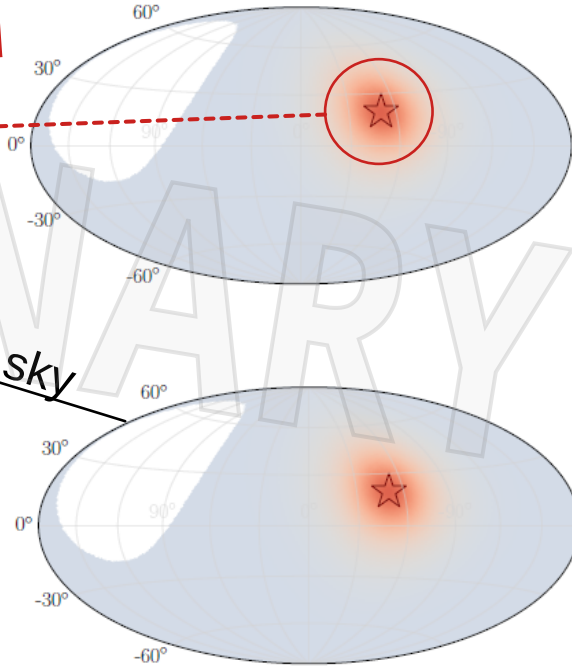


Spectrum in Cen A region



20° around
Cen A

whole sky



**better χ^2
by 10% - 40%**

for all angles,
Cen A & SBG
models

Fit parameters

	Cen A, $m = 0$ (flat)		Cen A, $m = 3.4$ (SFR)		SBG, $m = 3.4$ (SFR)	
	posterior	MLE	posterior	MLE	posterior	MLE
γ	$-1.67^{+0.48}_{-0.47}$	-2.21	$-3.09^{+0.23}_{-0.24}$	-3.05	$-2.77^{+0.27}_{-0.29}$	-2.67
$\log_{10}(R_{\text{cut}}/V)$	$18.23^{+0.04}_{-0.06}$	18.19	$18.10^{+0.02}_{-0.02}$	18.11	$18.13^{+0.02}_{-0.02}$	18.13
f_0	$0.16^{+0.06}_{-0.14}$	0.028	$0.05^{+0.01}_{-0.03}$	0.028	$0.17^{+0.06}_{-0.08}$	0.19
$\delta_0/^\circ$	$56.5^{+29.4}_{-12.8}$	16.5	$27.6^{+2.7}_{-16.3}$	16.8	$22.2^{+5.3}_{-4.0}$	24.3
I_{H}	$5.9^{+2.5}_{-1.7} \cdot 10^{-2}$	$7.1 \cdot 10^{-2}$	$8.3^{+2.0}_{-8.3} \cdot 10^{-3}$	$1.6 \cdot 10^{-5}$	$6.4^{+1.3}_{-6.4} \cdot 10^{-3}$	$4.3 \cdot 10^{-5}$
I_{He}	$2.3^{+0.3}_{-0.5} \cdot 10^{-1}$	$1.9 \cdot 10^{-1}$	$1.3^{+0.2}_{-0.2} \cdot 10^{-1}$	$1.4 \cdot 10^{-1}$	$1.7^{+0.3}_{-0.4} \cdot 10^{-1}$	$1.8 \cdot 10^{-1}$
I_{N}	$6.3^{+0.3}_{-0.3} \cdot 10^{-1}$	$6.2 \cdot 10^{-1}$	$7.4^{+0.3}_{-0.3} \cdot 10^{-1}$	$7.3 \cdot 10^{-1}$	$7.4^{+0.3}_{-0.3} \cdot 10^{-1}$	$7.4 \cdot 10^{-1}$
I_{Si}	$6.5^{+3.6}_{-3.3} \cdot 10^{-2}$	$9.9 \cdot 10^{-2}$	$9.2^{+3.2}_{-2.3} \cdot 10^{-2}$	$1.1 \cdot 10^{-1}$	$5.7^{+2.5}_{-3.1} \cdot 10^{-2}$	$5.4 \cdot 10^{-2}$
I_{Fe}	$1.6^{+0.7}_{-1.0} \cdot 10^{-2}$	$2.0 \cdot 10^{-2}$	$2.5^{+0.8}_{-0.9} \cdot 10^{-2}$	$2.3 \cdot 10^{-2}$	$2.5^{+0.8}_{-0.9} \cdot 10^{-2}$	$2.3 \cdot 10^{-2}$
$\log b$	-132379.6 ± 0.2		-132388.2 ± 0.2		-132382.5 ± 0.1	
D_E		22.3		28.5		33.3
$D_{X\text{max}}$		124.9		130.6		126.2
D		147.2		159.1		159.5
$\log \mathcal{L}_{\text{ADs}}$		-132105.1		-132105.2		-132102.3
$\log \mathcal{L}$		-132354.7		-132360.7		-132358.0

Table 1. Fit results for the Centaurus A and SBG models. The best-fit (MLE) parameters and the corresponding deviance and likelihood values are stated. Also, the posterior mean and highest posterior density interval from the MCMC sampler are given (see text).

Fit parameters with systematics included as nuisance parameters

	Cen A, $m = 0$ (flat)		Cen A, $m = 3.4$ (SFR)		SBG, $m = 3.4$ (SFR)	
	posterior	MLE	posterior	MLE	posterior	MLE
γ	$-0.89^{+0.37}_{-0.33}$	-0.65	$-1.19^{+0.45}_{-0.39}$	-1.41	$-1.02^{+0.43}_{-0.36}$	-1.25
$\log_{10}(R_{\text{cut}}/V)$	$18.20^{+0.04}_{-0.05}$	18.23	$18.21^{+0.04}_{-0.05}$	18.20	$18.24^{+0.04}_{-0.06}$	18.22
f_0	$0.07^{+0.01}_{-0.05}$	0.029	$0.07^{+0.01}_{-0.05}$	0.031	$0.19^{+0.07}_{-0.11}$	0.23
$\delta_0/^\circ$	$30.5^{+2.0}_{-20.2}$	14.4	$27.4^{+4.2}_{-17.0}$	14.3	$18.8^{+5.9}_{-3.6}$	21.9
I_{H}	$5.8^{+2.9}_{-2.6} \cdot 10^{-2}$	$4.2 \cdot 10^{-4}$	$1.2^{+0.2}_{-1.2} \cdot 10^{-2}$	$3.0 \cdot 10^{-4}$	$1.2^{+0.1}_{-1.2} \cdot 10^{-2}$	$1.0 \cdot 10^{-4}$
I_{He}	$2.7^{+0.4}_{-0.4} \cdot 10^{-1}$	$3.5 \cdot 10^{-1}$	$9.9^{+3.8}_{-2.9} \cdot 10^{-2}$	$1.2 \cdot 10^{-1}$	$1.1^{+0.3}_{-0.4} \cdot 10^{-1}$	$1.4 \cdot 10^{-1}$
I_{N}	$5.6^{+0.4}_{-0.4} \cdot 10^{-1}$	$5.0 \cdot 10^{-1}$	$6.7^{+0.7}_{-0.7} \cdot 10^{-1}$	$6.8 \cdot 10^{-1}$	$7.2^{+0.6}_{-0.6} \cdot 10^{-1}$	$7.3 \cdot 10^{-1}$
I_{Si}	$9.0^{+3.9}_{-3.4} \cdot 10^{-2}$	$1.4 \cdot 10^{-1}$	$1.5^{+0.5}_{-0.6} \cdot 10^{-1}$	$1.6 \cdot 10^{-1}$	$1.2^{+0.5}_{-0.5} \cdot 10^{-1}$	$9.8 \cdot 10^{-2}$
I_{Fe}	$2.3^{+0.9}_{-1.2} \cdot 10^{-2}$	$1.8 \cdot 10^{-2}$	$5.1^{+1.5}_{-1.8} \cdot 10^{-2}$	$4.4 \cdot 10^{-2}$	$4.7^{+1.3}_{-1.7} \cdot 10^{-2}$	$3.8 \cdot 10^{-2}$
ν_E/σ	$1.24^{+0.68}_{-0.50}$	1.35	$-0.23^{+0.42}_{-0.60}$	-0.13	$-0.35^{+0.44}_{-0.65}$	-0.40
$\nu_{X_{\text{max}}}/\sigma$	$-0.94^{+0.29}_{-0.24}$	-0.97	$-1.60^{+0.30}_{-0.25}$	-1.45	$-1.55^{+0.26}_{-0.25}$	-1.33
$\log b$	-132370.2 ± 0.1		-132380.1 ± 0.2		-132374.18 ± 0.2	
D_{syst}		2.8		2.1		1.9
D_E		13.6		21.9		25.3
$D_{X_{\text{max}}}$		107.4		113.6		112.7
D		123.8		137.7		139.4
$\log \mathcal{L}_{\text{ADs}}$		-132106.2		-132106.1		-132102.1
$\log \mathcal{L}$		-132344.1		-132350.9		-1323348.0

Table 2. Centaurus A and SBG models with experimental systematic uncertainties included as nuisance parameters

Test statistic

	Cen A, $m = 0.0$		Cen A, $m = 0.0$		SBG, $m = 3.4$		γ AGN, $m = 5.0$		γ AGN+EGMF**, $m = 5.0$	
		+ syst		+ syst		+ syst		+ syst		+ syst
TS _{tot}	22.8	17.3	22.2	19.1	27.6	25.0	23.9*	9.8*	34.3*	33.2*
TS _E	-0.1	-1.4	-0.4	-1.1	-5.2	-4.5	26.8	3.9	18.2	8.4
TS _{X_{max}}	1.9	0.2	1.8	1.0	6.2	2.0	-0.8	6.4	4.4	14.7
TS _{ADs}	20.9	18.7	20.8	19.0	26.6	27.1	-2.1	-3.0	11.7	8.6

Table 3. Overview of test statistic values for the tested models. In the case with systematics, the contribution from eq. 3.6 is taken into account additionally in TS_{tot}. *Note that the test statistic of each model is always calculated with respect to the reference model with the same source evolution and (no) systematics. This implies that e.g. the test statistics of the γ -AGN model is large only due to the poor fit of the reference model with $m = 5.0$ (compare to Fig. 8). **Note also that the model with EGMF has an additional fit parameter β_e compared to the other models.

The γ -AGN model with EGMF / distance-dependent blurring

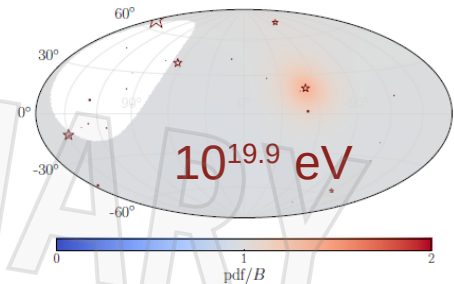
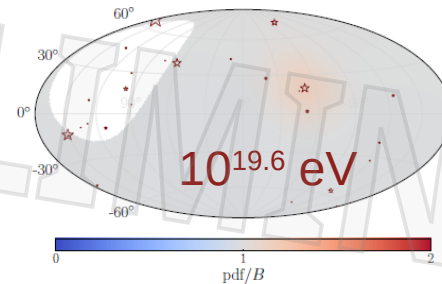
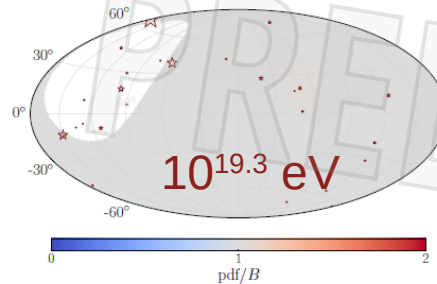
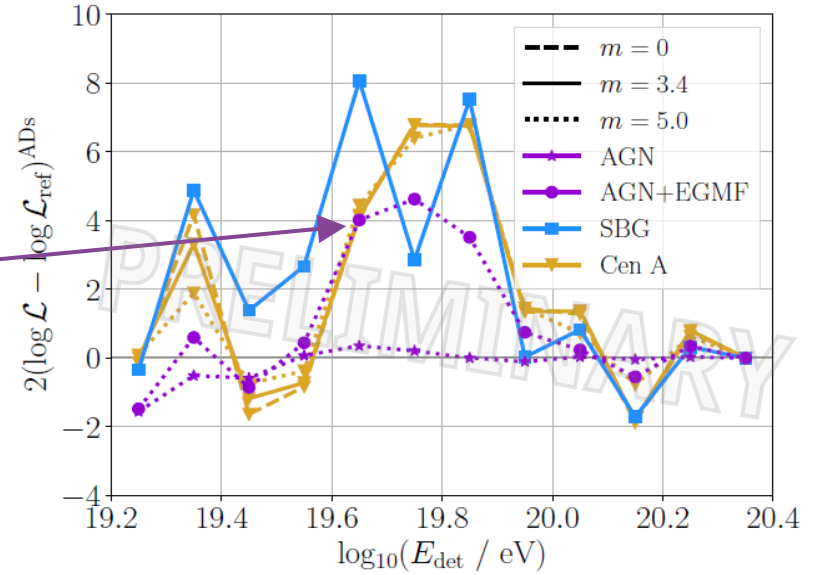
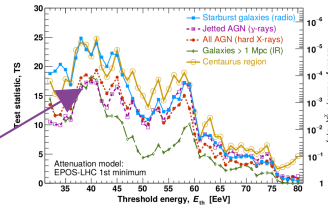
- include **distance-dependent blurring**:

$$\delta_{\text{tot}} = \frac{\sqrt{\delta_0^2 + \beta_e^2 d/\text{Mpc}}}{R/10 \text{ EV}}$$

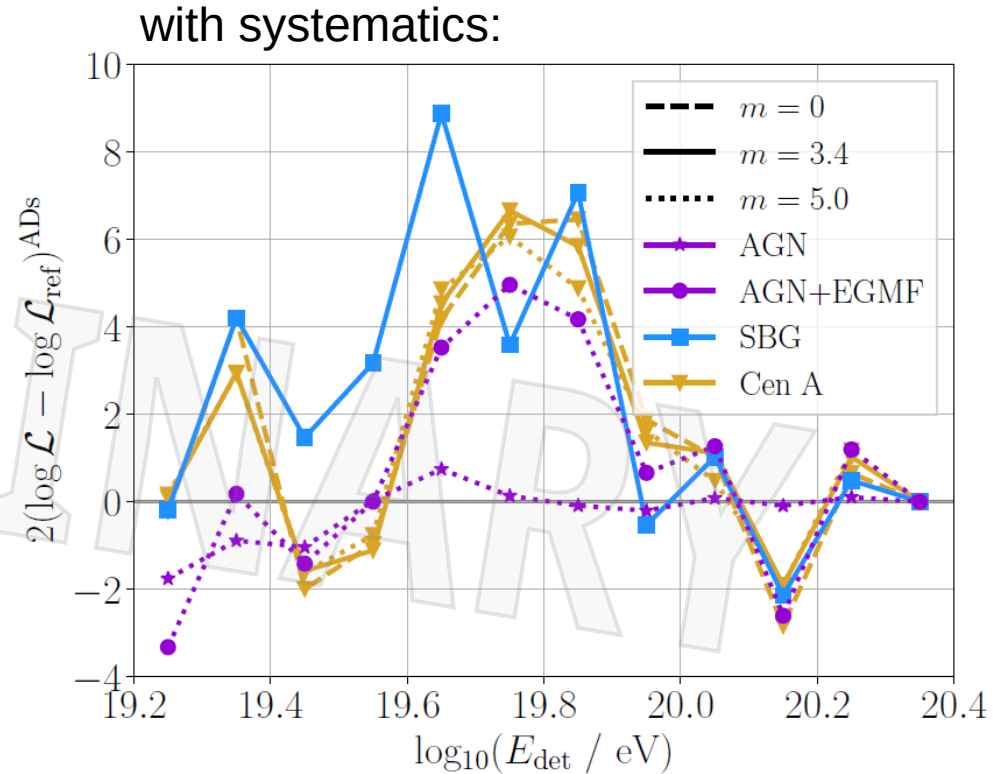
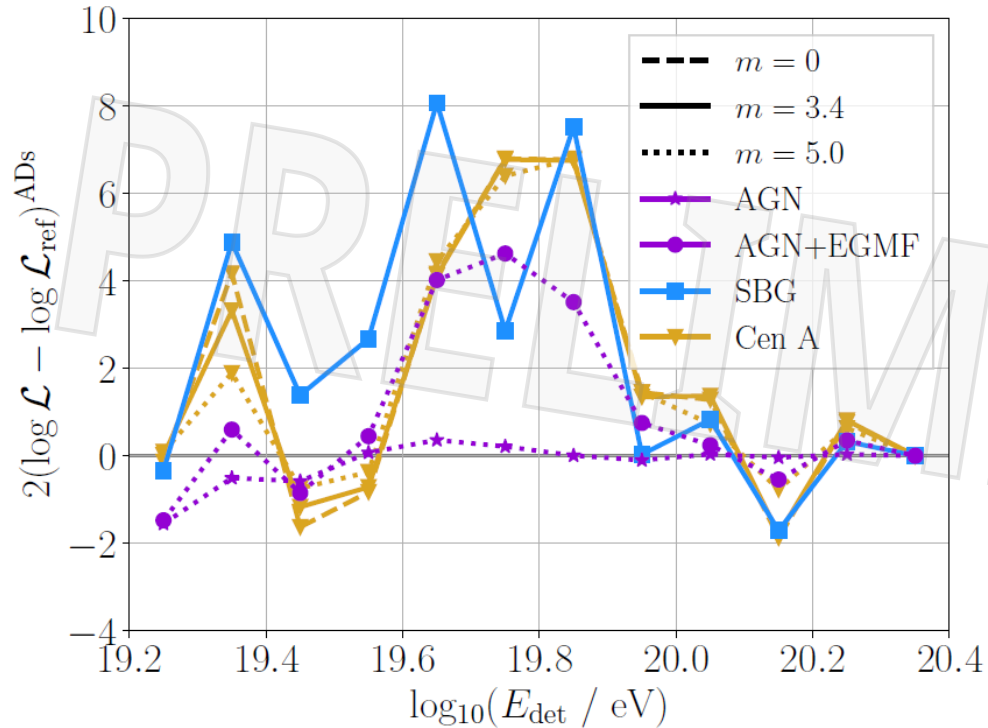
- arrival directions now $>$ isotropy: **TS_{AD}=11.7**

- but:

- model cannot reproduce
- need extremely **strong EGMF** (not compatible with limits in voids)
- arrival directions dominated by Cen A,
 - better as a single source



Arrival directions test statistic



Source contributions to TS



Cen A region contributes $TS_{AD} \sim 20$

Which other sources are how important?

→ test by removing from the catalog:

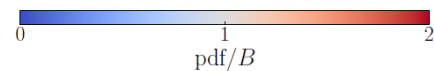
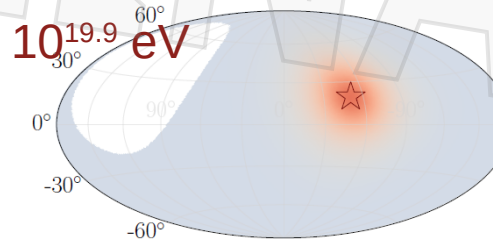
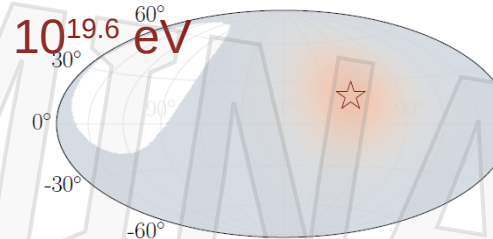
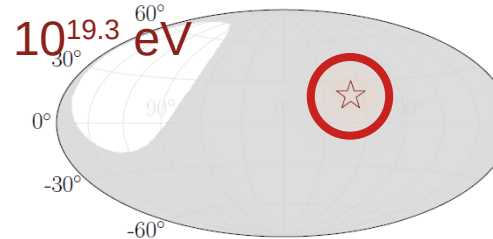


NGC 253 contributes $TS_{AD} \sim 4-5$



NGC 1068 contributes $TS_{AD} \sim 1$

Cen A ($m=3.4$)



SBG ($m=3.4$)

