## **Constraining the sources of ultra-high-energy cosmic rays**

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

Teresa Bister, June 2023 27th Symposium on Astroparticle Physics in the Netherlands











search for overdensities in the UHECR flux measured at the Pierre Auger Observatory



 intermediate-scale anisotropies in UHECR flux correlate with catalogs of source candidates



search for overdensities in the UHECR flux measured at the Pierre Auger Observatory



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- Idea: investigate possibility of SBGs / y-AGNs / Cen A as sources of overdensities
  - build one coherent model for injection  $\rightarrow$  propagation  $\rightarrow$  detection
  - describe arrival directions + spectrum + composition data at the same time

injection:  $\left(\frac{E_{\rm inj}}{10^{18} \text{ eV}}\right) \xrightarrow{\gamma}_{f_{\rm cut}} \left(\frac{E_{\rm inj}}{Z_A R_{\rm cut}}\right)$  $Q_{\rm inj}(E_{\rm inj}, A_{\rm inj}) \neq Q_0 a_A$ 

injection:  $\left(\frac{E_{\rm inj}}{0^{18} \, {\rm eV}}\right)$  $Q_{\rm inj}(E_{\rm inj},A_{\rm inj}) \neq Q_0 a_A$ 

#### 3d setup:

homogeneous background
 → SFR or flat evolution





#### 3d setup:

- homogeneous background
   → SFR or flat evolution
- + catalog sources (SBGs / γ-AGNs / Cen A)



distance, flux weight, direction



#### 3d setup:

- homogeneous background
   → SFR or flat evolution
- + catalog sources
   (SBGs / γ-AGNs / Cen A)
- weight with signal fraction (f<sub>0</sub> (defined at 40 EeV)



#### 3d setup:

- homogeneous background
   → SFR or flat evolution
- + catalog sources
   (SBGs / γ-AGNs / Cen A)
- weight with signal fraction  $f_0$



- database <u>CR</u>/Propa 1d + reweighting
- rigidity-dependent magnetic field blurring



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#### 3d setup:

- homogeneous background
   → SFR or flat evolution
- + catalog sources
   (SBGs / γ-AGNs / Cen A)
- weight with signal fraction  $f_0$







#### propagation:

 database <u>CR</u>/Propa 1d + reweighting

 rigidity-dependent magnetic field blurring





800

900

 $X_{\rm max}$  / g cm<sup>-2</sup>

-9<u>0</u>0



Likelihood function:  $\rightarrow$  determine free parameters  $\log \mathcal{L} = \log \mathcal{L}_E + \log \mathcal{L}_{X_{\max}} + \log \mathcal{L}_{ADs}$ 

#### modeled observables: (include detector effects) arrival directions shower depth distributions energy spectrum 18.5 800 700 $\log_{10}(E_{\text{det}} / \text{eV})$ 700800

#### 3d setup:

- homogeneous background  $\rightarrow$  SFR or flat evolution
- + catalog sources (SBGs / y-AGNs / Cen A)
- weight with signal fraction  $f_0$

propagation:

 database CR/Propa 1d + reweighting

 rigidity-dependent magnetic field blurring





### **Best-fit arrival directions**



## **Fitted energy spectra**



- hard injected spectrum  $\infty E^1$ , dominant N contribution, small maximum energy ~2 EeV
- contribution of Cen A region fitted consistently:  $f_0 \sim 3\%$ 
  - → independent of systematics & evolution

### **Significance**



"How much better does the model with catalog sources fit than one with just homogeneous background?"

## Significance



"How much better does the model with catalog sources fit than one with just homogeneous background?"

- → SBG model fits best (≙4.5σ significance)
- main contribution from well described arrival directions in Cen A region-

### The y-AGN model with strong evolution $\infty(1+z)^5$

• arrival directions test statistic negative



## The y-AGN model with strong evolution $\infty(1+z)^5$

- arrival directions test statistic negative
- flux dominated by faraway blazar Markarian 421 (~130 Mpc)
  - → catalog based on γ-ray flux (favors blazars)
  - not compatible with Auger data



## The y-AGN model with strong evolution $\infty(1+z)^5$

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#### influence of EGMF?

- → best-fit extremely strong
- arrival directions still not well enough described
- → mainly Cen A present
- $\rightarrow\,$  discard y-AGN model with flux  $\propto$  y-ray emission



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#### Conclusion

- first-time combination of all 3 observables in 1 model
- **SBG model: 4.5**σ (including exp. syst. uncertainties)
  - → main contribution to TS (~20 of 26) from Cen A region

- **y-AGN catalog can be discarded** for the first time
  - CR flux proportional to γ-ray flux disfavored
- results under assumption of turbulent » coherent
   Galactic magnetic field (at least in source directions)
- publication submitted to JCAP, available at: arXiv: 2305.16693



#### **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

 $P(\theta|d)$ 

→ calculate test statistic:

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



## **Modeling 3 observables**

#### energy spectrum

#### shower depth distributions

#### arrival directions



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

$$\log \mathcal{L}_E = \sum_e k^e \log(p^e) - \log(k^e!) - p^e$$



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

$$\mathcal{L}_{\mathrm{Xmax}} = \prod_{\tilde{e}} k^{\tilde{e}}! \prod_{x} \frac{(p^{\tilde{e},x})^{k^{\tilde{e},x}}}{k^{\tilde{e},x}!}$$



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

 $\mathcal{L}_{\mathrm{AD}} = \prod_{e} \prod_{p} \mathrm{pdf}^{e,p}(v^{e,p})$ 

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## **Signal fraction & arrival directions**



# **Reference models:** results

	Reference, m	n = 0 (flat)	Reference, $m = 3.4$ (SFR)		Reference, $m = 5.0$ (AGN-like)	
	posterior	MLE	posterior	MLE	posterior	MLE
$\gamma$	$-2.18^{+0.31}_{-0.33}$	-2.25	$-3.23^{+0.24}_{-0.21}$	-3.09	$-3.92^{+0.01}_{-0.08}$	-4.0
$\log_{10}(R_{\rm cut}/{\rm V})$	$18.18^{+0.03}_{-0.03}$	18.17	$18.09^{+0.02}_{-0.02}$	18.10	$18.04^{+0.01}_{-0.01}$	18.04
$I_{ m H}$	$6.5^{+2.0}_{-1.6}  imes 10^{-2}$	$7.0 imes10^{-2}$	$9.0^{+2.2}_{-9.0}  imes 10^{-3}$	$< 10^{-10}$	$1.8^{+0.3}_{-1.8}  imes 10^{-3}$	$< 10^{-10}$
$I_{ m He}$	$2.0^{+0.3}_{-0.3} \times 10^{-1}$	$2.0\times 10^{-1}$	$1.3^{+0.2}_{-0.2} \times 10^{-1}$	$1.4  imes 10^{-1}$	$4.5^{+1.8}_{-1.8} \times 10^{-2}$	$< 10^{-10}$
$I_{ m N}$	$6.0^{+0.4}_{-0.3}  imes 10^{-1}$	$6.0 imes10^{-1}$	$7.2^{+0.3}_{-0.3}  imes 10^{-1}$	$7.1  imes 10^{-1}$	$8.1^{+0.3}_{-0.3}  imes 10^{-1}$	$8.8  imes 10^{-1}$
$I_{ m Si}$	$1.2^{+0.2}_{-0.3} \times 10^{-1}$	$1.2\times 10^{-1}$	$1.2^{+0.3}_{-0.2} \times 10^{-1}$	$1.3  imes 10^{-1}$	$1.0^{+0.3}_{-0.3} \times 10^{-1}$	$8.2 \times 10^{-2}$
$I_{\mathrm{Fe}}$	$2.1^{+0.6}_{-0.9}\times10^{-2}$	$1.9\times 10^{-2}$	$2.6^{+0.7}_{-0.9}\times10^{-2}$	$2.3\times 10^{-2}$	$3.8^{+1.1}_{-1.1} \times 10^{-2}$	$3.6 \times 10^{-2}$
$\log b$	$-270.6\pm0.2$		$-277.7\pm0.3$		$-297.0\pm1.3$	
$\boldsymbol{D}_{\boldsymbol{E}} \ (N_J = 14)$		22.2		28.1		63.2
$D_{X_{\max}}$ $(N_{X_{\max}} = 74)$		126.8		132.4		134.1
D		149.0		160.5		197.3
$\log \mathcal{L}_{ m ADs}$		0		0		0
$\log \mathcal{L}$		-250.5		-256.2		-274.6

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Table 4. Results for the reference models of only homogeneously distributed sources.

	Reference, $m = 0$ (flat)		Reference, $m = 3.4 \; (SFR)$		Reference, $m = 5.0$ (AGN-like)	
	posterior	MLE	posterior	MLE	posterior	MLE
$\gamma$	$-1.01^{+0.41}_{-0.33}$	-1.13	$-1.34_{-0.50}^{+0.63}$	-1.39	$-1.19^{+0.41}_{-0.34}$	-1.40
$\log_{10}(R_{\rm cut}/{\rm V})$	$18.19_{-0.05}^{+0.03}$	18.19	$18.20_{-0.06}^{+0.05}$	18.19	$18.25_{-0.05}^{+0.04}$	18.25
$I_{\mathrm{H}}$	$4.8^{+2.3}_{-3.2}  imes 10^{-2}$	$5.1  imes 10^{-2}$	$1.1^{+0.1}_{-1.1}  imes 10^{-2}$	$< 10^{-10}$	$1.1^{+0.2}_{-1.1}  imes 10^{-2}$	$3.5  imes 10^{-8}$
$I_{\mathrm{He}}$	$2.9^{+0.4}_{-0.4}  imes 10^{-1}$	$2.9\times 10^{-1}$	$1.1^{+0.4}_{-0.3}\times10^{-1}$	$1.3  imes 10^{-1}$	$3.5^{+0.8}_{-3.5}  imes 10^{-2}$	$5.7  imes 10^{-4}$
$I_{\rm N}$	$5.3^{+0.4}_{-0.4}  imes 10^{-1}$	$5.2\times10^{-1}$	$6.4^{+0.7}_{-0.7}  imes 10^{-1}$	$6.4 \times 10^{-1}$	$5.9^{+0.7}_{-0.5}  imes 10^{-1}$	$6.8  imes 10^{-1}$
$I_{\rm Si}$	$1.2^{+0.4}_{-0.4}  imes 10^{-1}$	$1.2  imes 10^{-1}$	$1.8^{+0.6}_{-0.5}\times10^{-1}$	$1.8  imes 10^{-1}$	$2.8^{+0.5}_{-0.5}  imes 10^{-1}$	$2.4  imes 10^{-1}$
$I_{\rm Fe}$	$2.2^{+0.9}_{-1.1}  imes 10^{-2}$	$1.7\times 10^{-2}$	$5.7^{+1.4}_{-2.2}  imes 10^{-2}$	$4.8\times10^{-2}$	$9.3^{+1.9}_{-2.2}  imes 10^{-2}$	$8.3\times 10^{-2}$
$\nu_E/\sigma$	$-1.43^{+0.57}_{-0.67}$	-1.37	$0.19\substack{+0.39\\-0.60}$	0.18	$1.21^{+0.29}_{-0.30}$	1.17
$\nu_{ m Xmax}/\sigma$	$-0.88^{+0.33}_{-0.28}$	-0.78	$-1.62\substack{+0.34\\-0.36}$	-1.53	$-2.23^{+0.27}_{-0.24}$	-2.00
$\log b$	$-257.9\pm0.1$		$-267.0\pm0.1$		$-280.3\pm1.6$	
$D_{ m syst}$		2.5		2.4		5.4
$D_E \ (N_J = 14)$		12.2		20.8		21.8
$D_{X_{\text{max}}}$ $(N_{X_{\text{max}}} = 74)$		107.6		114.6		123.4
D		122.3		137.8		150.6
$\log \mathcal{L}_{ m ADs}$		0		0		0
$\log \mathcal{L}$		-237.2		-244.9		-251.3

Table 5. Results for the reference models of only homogeneously distributed sources including experimental systematic uncertainties as nuisance parameters.



# Source models: results

	Cen A, $m = 0$ (flat)		Cen A, $m =$	<b>3.4</b> (SFR)	${\rm SBG},m=3.4\;({\rm SFR})$		
	posterior	MLE	posterior	MLE	posterior	MLE	
$\gamma$	$-0.89^{+0.37}_{-0.33}$	-0.65	$-1.19^{+0.45}_{-0.39}$	-1.41	$-1.02^{+0.43}_{-0.36}$	-1.25	
$\log_{10}(R_{\rm cut}/{\rm V})$	$18.20^{+0.04}_{-0.05}$	18.23	$18.21_{-0.05}^{+0.04}$	18.20	$18.24_{-0.06}^{+0.04}$	18.22	
$f_0$	$0.07\substack{+0.01\\-0.05}$	0.029	$0.07^{+0.01}_{-0.05}$	0.031	$0.19\substack{+0.07\\-0.11}$	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	
$I_{ m H}$	$5.8^{+2.9}_{-2.6}  imes 10^{-2}$	$4.2\times 10^{-4}$	$1.2^{+0.2}_{-1.2} \times 10^{-2}$	$3.0  imes 10^{-4}$	$1.2^{+0.1}_{-1.2} \times 10^{-2}$	$1.0  imes 10^{-4}$	
$I_{ m He}$	$2.7^{+0.4}_{-0.4}  imes 10^{-1}$	$3.5  imes 10^{-1}$	$9.9^{+3.8}_{-2.9} \times 10^{-2}$	$1.2\times 10^{-1}$	$1.1^{+0.3}_{-0.4} \times 10^{-1}$	$1.4  imes 10^{-1}$	
$I_{ m N}$	$5.6^{+0.4}_{-0.4}  imes 10^{-1}$	$5.0 imes10^{-1}$	$6.7^{+0.7}_{-0.7} \times 10^{-1}$	$6.8  imes 10^{-1}$	$7.2^{+0.6}_{-0.6}  imes 10^{-1}$	$7.3 imes10^{-1}$	
$I_{ m Si}$	$9.0^{+3.9}_{-3.4}\times10^{-2}$	$1.4\times 10^{-1}$	$1.5^{+0.5}_{-0.6} \times 10^{-1}$	$1.6\times 10^{-1}$	$1.2^{+0.5}_{-0.5} \times 10^{-1}$	$9.8\times10^{-2}$	
$I_{ m Fe}$	$2.3^{+0.9}_{-1.2}\times10^{-2}$	$1.8  imes 10^{-2}$	$5.1^{+1.5}_{-1.8} \times 10^{-2}$	$4.4  imes 10^{-2}$	$4.7^{+1.3}_{-1.7} \times 10^{-2}$	$3.8  imes 10^{-2}$	
$ u_E/\sigma$	$-1.24^{+0.68}_{-0.50}$	-1.35	$0.23^{+0.42}_{-0.60}$	0.13	$0.35_{-0.65}^{+0.44}$	0.40	
$\nu_{X\max}/\sigma$	$-0.94^{+0.29}_{-0.24}$	-0.97	$-1.60^{+0.30}_{-0.25}$	-1.45	$-1.55^{+0.26}_{-0.25}$	-1.33	
$\log b$	$-254.6\pm0.1$		$-264.5\pm0.2$		$-258.6\pm0.2$		
$D_{ m syst}$		2.8		2.1		1.9	
$\boldsymbol{D}_{\boldsymbol{E}}~(N_J=14)$		13.6		21.9		25.3	
$D_{X_{\text{max}}}$ $(N_{X_{\text{max}}} = 74)$		107.4		113.6		112.7	
D		123.8		137.7		139.9	
$\log \mathcal{L}_{\mathrm{ADs}}$		-9.4		-9.5		-13.5	
$\log \mathcal{L}$		-228.51		-235.3		-232.4	

=	<b>3.4</b> (SFR)		Cen A, $m$ :	= 0 (flat)	Cen A, $m =$	3.4 (SFR)	SBG, $m = 3$	<b>3.4</b> (SFR)
	MLE		posterior	MLE	posterior	MLE	posterior	MLE
	-1.25	$\gamma$	$-1.67^{+0.48}_{-0.47}$	-2.21	$-3.09^{+0.23}_{-0.24}$	-3.05	$-2.77^{+0.27}_{-0.29}$	-2.67
	18.22	$\log_{10}(R_{\rm cut}/{\rm V})$	$18.23_{-0.06}^{+0.04}$	18.19	$18.10^{+0.02}_{-0.02}$	18.11	$18.13_{-0.02}^{+0.02}$	18.13
	0.23	$f_0$	$0.16^{+0.06}_{-0.14}$	0.028	$0.05^{+0.01}_{-0.03}$	0.028	$0.17^{+0.06}_{-0.08}$	0.19
0	21.9	$\delta_0/^\circ$	$56.5^{+29.4}_{-12.8}$	16.5	$27.6^{+2.7}_{-16.3}$	16.8	$22.2_{-4.0}^{+5.3}$	24.3
)-2	$1.0 \times 10^{-4}$	$I_{ m H}$	$5.9^{+2.5}_{-1.7} \times 10^{-2}$	$7.1  imes 10^{-2}$	$8.3^{+2.0}_{-8.3} \times 10^{-3}$	$1.6\times 10^{-5}$	$6.4^{+1.3}_{-6.4} \times 10^{-3}$	$4.3\times 10^{-5}$
)-1	$1.4 \times 10^{-1}$	$I_{ m He}$	$2.3^{+0.3}_{-0.5} \times 10^{-1}$	$1.9  imes 10^{-1}$	$1.3^{+0.2}_{-0.2} \times 10^{-1}$	$1.4  imes 10^{-1}$	$1.7^{+0.3}_{-0.4} \times 10^{-1}$	$1.8  imes 10^{-1}$
) -1	$7.3 \times 10^{-2}$	$I_{ m N}$	$6.3^{+0.3}_{-0.3}  imes 10^{-1}$	$6.2  imes 10^{-1}$	$7.4^{+0.3}_{-0.3}  imes 10^{-1}$	$7.3  imes 10^{-1}$	$7.4^{+0.3}_{-0.3}  imes 10^{-1}$	$7.4 imes10^{-1}$
$)^{-2}$	$3.8 \times 10^{-2}$	$I_{ m Si}$	$6.5^{+3.6}_{-3.3} \times 10^{-2}$	$9.9  imes 10^{-2}$	$9.2^{+3.2}_{-2.3} \times 10^{-2}$	$1.1  imes 10^{-1}$	$5.7^{+2.5}_{-3.1}  imes 10^{-2}$	$5.4  imes 10^{-2}$
, 	0.40	$I_{ m Fe}$	$1.6^{+0.7}_{-1.0} \times 10^{-2}$	$2.0  imes 10^{-2}$	$2.5^{+0.8}_{-0.9} \times 10^{-2}$	$2.3  imes 10^{-2}$	$2.5^{+0.8}_{-0.9}  imes 10^{-2}$	$2.3  imes 10^{-2}$
	-1.33	$\log b$	$-264.0 \pm 0.2$		$-272.6 \pm 0.2$		$-266.9\pm0.1$	
2		$\boldsymbol{D_E} \ (N_J = 14)$		22.3		28.5		33.3
	1.9	$D_{X_{\text{max}}}$ $(N_{X_{\text{max}}} = 74)$		124.9		130.6		126.2
	25.3	D		147.2		159.1		159.5
	112.7	$\log \mathcal{L}_{ m ADs}$		-10.5		-10.4		-13.3
	139.9	$\log \mathcal{L}$		-239.1		-245.1		-242.4
	10 5						•	

## **Source contributions to TS**



Cen A region contributes TS<sub>AD</sub> ~ 20

Which other sources are how important?

→ test by removing from the catalog:



NGC 253 contributes TS<sub>AD</sub> ~ 4-5



NGC 1068 contributes TS<sub>AD</sub> ~ 1



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## The y-AGN model with EGMF / distance-dependent blurring

include distance-dependent blurring: 8  $\delta_{\rm tot} = \frac{\sqrt{\delta_0^2 + \beta_e^2 \ d/{\rm Mpc}}}{R/10 \ {\rm EV}}$  ${\rm og}\, {\cal L}_{\rm ref})^{\rm ADs}$ 6 arrival directions now > isotropy: TS<sub>AD</sub>=11.7 2  $2(\log \mathcal{L}$ but: model cannot reproduce →  $^{-4}_{19.2}$ 19.419.6 19.8 20.0 $\log_{10}(E_{\text{det}} / \text{eV})$ need extremely strong EGMF (not compatible with limits in voids) → arrival directions dominated by Cen A,

10<sup>19.3</sup> eV

pdf/B

 better as a single source

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10<sup>19.6</sup> eV

pdf/B

m = 0

m = 3.4

m = 5.0

AGN+EGMF

20.2

10<sup>19.9</sup> eV

pdf/B

20.4

AGN

SBG

Cen A

### **SBG & Centaurus A models: spectra**



#### **Including systematics: spectra**



#### **Xmax distributions**



## **Spectrum in Cen A region**



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#### **Test statistic**

#### compare likelihood to ref. model (just background -> backup)

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

	<b>SBG</b> , $m = 3.4$		Cen A, $m = 0.0$		Cen A, $m = 3.4$		
		+ syst		+ syst		+ syst	
$\mathrm{TS}_{\mathrm{tot}}$	27.6	25.6	22.8	17.3	22.2	19.1	
$\mathrm{TS}_E$	-5.2	-4.5	-0.1	-1.4	-0.4	-1.1	
$\mathrm{TS}_{X_{\mathrm{max}}}$	6.2	2.0	1.9	0.2	1.8	1.0	
$\mathrm{TS}_{\mathrm{ADs}}$	26.6	27.1	20.9	18.7	20.8	19.0	

#### SBG model has highest TS=25.6 $\leftrightarrow$ 4.5\sigma

- increase compared to AD-only correlation
- Centaurus region contributes dominant part: TS~20
- → (E-dependent) arrival directions most important



- sum over E bins gives total TS
  - no E<sub>thresh</sub> scan!
- peaks could be from He, N, Si
  - → compare to spectrum
  - → but: large uncertainties

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## **The Pierre Auger Observatory**

- largest observatory for UHECRs in the world (3000 km<sup>2</sup>)
- located in Argentina, close to Malargüe



AugerPrime upgrade