#### The CR Proton Spectrum measured with GRAPES-3

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**KIT North campus** 

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#### Summary

#### Introduction to cosmic rays (CRs)



https://icecube.wisc.edu/news/view/455 (Juan Antonio Aguilar and Jamie Yang. IceCube/WIPAC)

- Cosmic Rays (CRs):
  - High-energy charged particles.
  - Energy:  $10^9 \text{ eV}$  to  $10^{20} \text{ eV}$ .
  - ~90% protons, ~9% He nuclei and rest heavy nuclei & e<sup>±</sup>.

▶ CRs diffuse by the interstellar magnetic field, not point back to sources.

▶ We lack the complete understanding of their sources and acceleration and propagation processes.

- Observables:
  - Energy spectrum.
  - Mass composition.
  - Anisotropy.
  - Multi-Messenger Astronomy.

#### CRs energy spectrum

It follows a power law,

$$\Phi(E) = \frac{dN}{dE \, dA \, d\Omega \, dt} = K E^{-\gamma} \quad m^{-2} s^{-1} s r^{-1} G e V^{-1}$$

- Well-known features,
  - Knee at ~  $10^{15}$  eV.
  - Ankle at  $\sim 10^{18}$  eV.
  - GZK cut-off at ~  $10^{20}$  eV.

J. Phys. G: Nucl. Part. Phys. 31 (2005) R95-R131

doi:10.1088/0954-3899/31/5/R02

TOPICAL REVIEW

# Can diffusive shock acceleration in supernova remnants account for high-energy galactic cosmic rays?

#### A M Hillas

School of Physics and Astronomy, University of Leeds, Leeds LS2 9JT, UK

The first lesson from figure 1 is that a single component of cosmic rays appears to extend from below 10<sup>10</sup> eV to at least 10<sup>16</sup> eV in proton energy. To a good approximation a uniform spectrum in rigidity,  $R^{-2.60}$ , consistent with the expectations of a single ('test particle') shock acceleration model, is quite acceptable: it fits also the total air shower flux around 10<sup>15</sup> eV, and



https://web.physics.utah.edu/whanlon/spectrum.html.

#### Motivation



> Hardening and softening of CRs proton spectrum contradict the long-held belief of single power law before the Knee.

P. Lipari and S. Vernetto, Astropart. Phys. 120 (2020) 102441.

#### Motivation



- ▶ Hardening and softening of CRs proton spectrum contradict the long-held belief of single power law before the Knee.
- ► Lack proton spectrum results from 100 TeV to PeV energy range.
- Non-unique extrapolation to higher energy.

P. Lipari and S. Vernetto, Astropart. Phys. 120 (2020) 102441.

#### The GRAPES-3 experiment

#### Location:

- Ooty, South India.
- 11.4° N, 76.7° E.
- 2200 m a.s.l.

- 400 plastic scintillation detectors cover an area of  $25,000 \text{ m}^2$ .
- Large tracking muon telescope of area 560 m<sup>2</sup>.
- $\sim 3 \times 10^6$  extensive air showers (EASs)/day in TeV PeV.

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#### Scintillator Detectors (SDs) array



#### EAS direction and parameters reconstruction



#### GRAPES-3 muon telescope (G3MT)



- Samples the muon component of EAS.
- ▶ 16 independent modules (35 m<sup>2</sup>); Total effictive area: 560 m<sup>2</sup>.
- ▶ Detector unit: proportional counters (PRCs).
- $\blacktriangleright$  4 adjacent modules (super-module) have separate DAQ but synchronized with EAS trigger.
- ▶ Concrete absorber (550 g cm<sup>-2</sup>).
- ▶ Energy threshold:  $1 \text{ GeV} \times \sec \theta_{\mu}$ , where  $\theta_{\mu}$ : muon incident angle.



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#### GRAPES-3 muon telescope (G3MT)

- ▶ PRC dimension: 6 m×0.1 m×0.1 m.
- Four orthogonal layers of PRCs.
- Layer-1 & 3 → X-Z plane; Layer-0 & 2 → Y-Z plane.
- ▶ Discriminator threshold: 0.2 minimum ionizing particle (~4 keV).
- ▶ PRCs hit info → number of tracks/multiplicity  $(N_{\mu})$  → mass composition.
- ▶ Upper layer is scanned for a PRC hit starting from PRC number 0.
- $\blacktriangleright$  Corresponding PRC hit in the bottom layer (according to projection of shower axis in the plane), along with  $\pm\,1$  PRC, is checked.
- Clustering of PRCs is considered once.





## Monte Carlo (MC) simulations

- Detailed MC simulation study is done, which broadly involves,
  - 1. EAS development simulation in Earth's atmosphere using the CORSIKA package.
  - 2. Simulation of the EAS particles in the SDs to estimate their corresponding  $\rho$  and t.
  - 3. Detailed simulation of the EAS particles response in the G3MT using the GEANT4 package.
- ▶ EAS development simulation at GRAPES-3 site,
  - CORSIKA v7.6900 package.
  - QGSJET-II-04/FLUKA as high/low-energy hadronic interaction model.
  - H, He, N, Al and Fe.
  - E: 1 TeV to 10 PeV, with  $E^{-2.5}$  spectral slope.
  - $\theta$ : 0° to 45°.
  - $6.1 \times 10^7$  EASs for each element.

- Simulation of the EAS particles in the SDs,
  - Analyzed with an in-house developed software framework.
  - Two datasets: dataset-1 with random core distributed within 150 m from array center for entire energy range, dataset-2 with 60 m from the center array for *E* > 100 TeV.
  - Each EAS used ten times with a random core location to improve statistics.
  - $t \leftarrow CORSIKA$  output.
  - $\rho \leftarrow \text{GEANT-4}$  simulation of plastic SDs.
  - Generate EAS trigger and EAS parameters.

> Datasets with  $E^{-2.7}$  spectral slope and proposed by GST and H4a composition models are derived.

#### Geant-4 simulation of G3MT: Geometric reconstruction

- ▶ GEANT4 simulation of G3MT involves,
  - Geometric modeling of the G3MT (PRCs and concrete absorber).
  - Passing sample of EAS particles from CORSIKA, followed by tracking and recording the energy deposited by the particle in the detector volume.





F. Varsi et al., JINST, 18 P03046 (2023).

#### Geant-4 simulation of G3MT: EAS particles response



- Muons below 1 GeV× sec  $\theta$  threshold absorb in the absorber.
- Muons above 1 GeV× sec  $\theta$  threshold make a clear passage through the module.
- ▶ Energy deposited by single muons in PRC peaks at 20.7 keV; consistent with experimental value of ~20 keV.

#### Geant-4 simulation of G3MT: EAS particles response



- ▶ Electromagnetic and low energy hadronic components get absorbed.
- ▶ High energy hadrons generate an EAS in the absorber, make complex PRC hits pattern.
- ▶ Multiple discrete PRC hits: more than one track.
- Clustering of PRC hits.



#### Hadron punch-through



Distance from center of muon module [m]

θ: [0.0°, 24.6°]

н

#### Selection quality cuts and data summary

GRAPES-3 data: 1 January 2014 to 26 Oc			
Quality cut	Number of surviving EASs	% of surviving EASs	50
1. Triggered	$1.75 \times 10^{9}$	100.0	
2. Abnormal days based on $N_e$ spectrum	$1.58{ imes}10^{9}$	90.0	
3. Successful event matching & muon	$1.17{ imes}10^{9}$	66.8	
tracking			
4. Angle and NKG reconstruction	$8.47 \times 10^{8}$	48.3	
5. Shower age (s) between 0.02 and 1.98	$8.41 \times 10^{8}$	48.0	
6. Circular area within 50 m radius	$3.96 \times 10^{8}$	22.6	60 m <sup>*</sup> ************
7. Zenith angle < 17.8 $^{\circ}$	$1.33 \times 10^{8}$	7.5	
8. Hadron punch-through < 2%	$6.27 \times 10^{7}$	3.6	
9. $10^{4.0} \le$ Shower size $(N_e) < 10^{6.0}$	$7.81 \times 10^{6}$	0.4	X [m]

▶ Fiducial area: 4123 m<sup>2</sup>

#### Observed shower size distribution and live time

For live time ( $T_{live}$ ) calculation: distribution of inter-event time separation ( $\Delta t$ ) fit with exponential function.

$$f(\Delta t) = Ae^{-R\Delta t}$$
$$T_{live} = N/R,$$

where R: time rate of the EAS passing the selection quality cuts, A: intercept and  $N = 6.27 \times 10^9$  is the total number of EAS after the selection quality cuts.



#### Trigger efficiency, total efficiency and acceptance of the GRAPES-3 array



 $\triangleright$   $\varepsilon_T$  reaches 90% at nearly 40 TeV, 45 TeV, 60 TeV, 70 TeV and 80 TeV for H, He, N, Al and Fe, respectively.

- ▶  $\varepsilon_R$  nearly 100% above 200 TeV and total efficiency ( $\varepsilon_{tot}$ ) =  $\varepsilon_T \times \varepsilon_R$ .
- Acceptance of GRAPES-3 array,

$$A_{\Omega}(E_i) = \frac{\pi A}{2} \varepsilon_{tot}(E_i) (\cos 2\theta_I - \cos 2\theta_u)$$

where  $[\theta_l, \theta_u]$ : upper and lower zenith angle range and A is fiducial area.

- $A_{\Omega} = \sim 1200 \text{ m}^2 \text{ sr for } \varepsilon_{tot} = 100\%.$
- $\blacktriangleright$  Error in fit parameters are used to calculate the systematic uncertainty in the estimation of  $A_{\Omega}$ .

#### Energy calibration and resolution



▶ Datasets with -2.7 spectral slope splited into 2 parts and first part was used for  $N_e$  and energy relation.

Modeled with linear function on log-log scale.

$$\log E = p0 \times \log N_e + p1$$

- Second parts was used to calculate distribution of  $\frac{E_{reco} E_{true}}{E_{true}}$ .
- ▶ energy bias = Median  $\left(\frac{E_{reco}-E_{true}}{E_{true}}\right)$ . ▶ energy resolution =  $\sigma\left(\frac{E_{reco}-E_{true}}{E_{true}}\right)$ .
- $\blacktriangleright$  Bias within ±3% and resolution is 60% at 50 TeV and 35% at 1.3 PeV.

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#### Muon multiplicity distribution (MMD)



> The muon multiplicity distribution (MMD) is sensitive to the composition of the PCRs.

Simulated MMDs fitted with negative binomial distribution (NBD).

$$NBD(N_{\mu};\mu,\sigma) = \frac{\Gamma\left(N_{\mu} + \frac{\mu^{2}}{\sigma^{2}-\mu}\right)}{\Gamma(N_{\mu}+1)\Gamma\left(\frac{\mu^{2}}{\sigma^{2}-\mu}\right)} \left(\frac{\mu}{\sigma^{2}}\right)^{\frac{\mu^{2}}{\sigma^{2}-\mu}} \left(\frac{\sigma^{2}-\mu}{\sigma^{2}}\right)^{N_{\mu}},$$

 $\blacktriangleright$  where  $\mu$  is the mean value and  $\sigma$  is standard deviation of the MMD.

#### Paramterization of MMD



•  $\mu$  and  $\sigma$  of observed data MMD is confined between corresponding fitted  $\mu$  and  $\sigma$  for simulated proton and iron (extreme limits) primaries.

 $\blacktriangleright$   $\mu$ : Linear function.

 $\log \mu = A + B \times \log N_e.$ 

 $\triangleright$   $\sigma$ : Quadratic function.

 $\log \sigma = C + D \times \log N_e + E \times (\log N_e)^2.$ 

#### Mass composition: Gold's Unfolding algorithm

- Gold's unfolding procedure is employed twice.
  - Estimation of relative composition of each primary group from observed MMD for each shower size bin.
  - Estimation of the CR proton energy spectrum from the corresponding shower size distribution.

▶ For each N<sub>e</sub> bin,

- Response matrix (R1) generated from parameterization of MMDs.
- Gold's iterative unfolding algorithm is used.

$$\begin{split} n(A_i^{k+1}) &= n(A_i^k) \frac{(\mathbf{R_1}^T \mathbf{C}^T \mathbf{C} \vec{N}_{\mu})_i}{\sum_j (\mathbf{R_1}^T \mathbf{C}^T \mathbf{C} \mathbf{R_1})_{ji} n(A_j^k)} \end{split}$$
  
where  $C_{\alpha\beta} &= \frac{\delta_{\alpha\beta}}{\sqrt{n(N_{\mu})}}. \end{split}$ 

- Composition proposed by GST composition model used as prior.
- Optimal stopping iteration: minimum of WMSE.



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#### Relative composition of proton primary

- Relative composition of proton primary (a1)
  - 1.  $65 \pm 0.3^{+4.9}_{-6.8}$ % at Ne =  $10^{4.1}$ .
  - 2.  $47 \pm 3.5^{+6.3}_{-10.5}$ % at Ne =  $10^{5.9}$ .

- ▶ Contribution from the following sources of systematic uncertainty is calculated.
  - 1. Unfolding algorithm (within 0% to 2%).
  - 2. Initial prior  $\vec{A}$  (within ±1%).
  - 3. Bias from unfolding procedure (within -0.15% to +0.18%).
  - 4. Different spectral profiles to generate the response matrix (within +3.7%/-5.8% to +0%/-7.6%).
  - 5. Smoothing algorithm (within +0.7% to -4.1%).
  - 6. Limited statistics of MC simulations (from 3.2% to 6.0%).



#### Proton size distribution and unfolding

 $\blacktriangleright$  Observed  $N_e$  distribution ( $N_e^{obs}$ ): convoluted distribution of different primaries.

▶ Proton  $N_e$  distribution ( $N_{e1}$ ): Each bin of  $N_e^{obs}$  weighted with proton composition ( $a_1$ ) in corresponding bin.

- $\blacktriangleright$  Response matrix  $(R_2)$  generated using simulation data with spectral slope of -2.7.
- Gold's algorithm is used iteratively as,

$$n(\boldsymbol{E}_{i}^{k+1}) = n(\boldsymbol{E}_{i}^{k}) \frac{(\mathbf{R}_{2}^{T} \mathbf{C}^{T} \mathbf{C} \vec{N}_{e})_{i}}{\sum_{j} (\mathbf{R}_{2}^{T} \mathbf{C}^{T} \mathbf{C} \mathbf{R}_{2})_{ji} n(\boldsymbol{E}_{j}^{k})}$$

- Initial prior selected with a spectral hardening near 200 TeV.
- Smoothing is applied on the  $\vec{E}$  after each iteration.
- Optimal stopping iteration: minimum of WMSE.
- ▶ The final proton energy spectrum is not smoothened.



#### Proton energy spectrum



▶ Proton energy spectrum: 50 TeV to 1.3 PeV.

▶ The differential flux  $(\Phi(E)_i)$  for  $i^{th}$  energy bin is calculated from,

$$\Phi(E)_i = \frac{1}{T_{live}} \left( \frac{n(E_i)}{\Delta E_i \cdot A_{\Omega,i}} \right)$$

where  $n(E_i)$ : number of EAS in  $i^{th}$  energy bin,  $\Delta E_i$ : bin-width of  $i^{th}$  energy bin,  $A_{\Omega}$ : acceptance of GRAPES-3 array,  $T_{live}$ : live-time of GRAPES-3 data taking for this analysis.

Scale with a factor of  $E^{2.7}$  to show the spectral hardening near 165 TeV.

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#### Proton energy spectrum

 Contribution from following sources of systematic uncertainty is calculated.

- 1. Unfolding algorithm (within -0.02% to +0.11%).
- 2. Initial prior  $\vec{E}$  (within -0.73% to +1.20%).
- 3. Bias from unfolding procedure (within  $\pm 0.40\%$ ).
- 4. Acceptance of GRAPES-3 EAS array (from 2.05% to 0.04%).
- 5. Different spectral profiles to generate the response matrix (within -4.15% to +0.71%).
- 6. Limited statistics of MC simulations (from 0.42% to 2.06%).
- Systematic uncertainty in relative proton composition (from +3.97%/-6.49% to +10.75%/-12.37%).



#### Modeling the spectral hardening

▶ Modeled with smoothly broken power law (SBPL), given as,

$$\Phi_{S}(E) = \Phi_{0} \left(\frac{E}{50 \ TeV}\right)^{\gamma_{1}} \left[1 + \left(\frac{E}{E_{b}}\right)^{\frac{1}{w}}\right]^{(\gamma_{2} - \gamma_{1})w}$$

where  $\Phi_0$ : flux normalization constant at 50 TeV,  $E_b$ : energy corresponding to position of spectral break,  $\gamma_1$  and  $\gamma_2$ : spectral indices before and after  $E_b$ , w: smoothness parameter for the spectral break.

▶ By considering only the statistical uncertainties during the modeling,

$$\begin{split} \Phi_0 &= (1.370 \pm 0.005) \times 10^4 \ m^{-2} \ sr^{-1} \ s^{-1} \ GeV^{-1} \\ E_b &= 166.4 \pm 7.9 \ TeV, \\ \gamma_1 &= -3.12 \pm 0.02, \\ \gamma_2 &= -2.56 \pm 0.02, \\ w &= 0.22 \pm 0.06, \end{split}$$

with  $\chi^2 / \text{ndf} = 3.36/3$ .



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#### Significance the spectral hardening

Null hypothesis: Modeled with single power law (PL), given as,

$$\Phi_P(E) = \Phi_0 \left(\frac{E}{50 \ TeV}\right)^2$$

- Alternate hypothesis: Modeled with SBPL.
- Test statistics (TS):  $\chi_P^2$   $\chi_S^2$  with 3 dof.
- For statistical uncertainties only,
  - $\chi^2_P = 897.90$  and  $\chi^2_S = 3.36$ .
  - TS = 894.54 with 3 dof.
  - p-value =  $1.35 \times 10^{-193}$ .
  - significance  $(\sigma) = \phi^{-1}(1 p) = 29.7\sigma$ . where  $\phi^{-1}$ : inverse of the cumulative distribution of the standard Gaussian.
- For statistical and systematic uncertainties,
  - $\chi^2_P = 18.67$  and  $\chi^2_S = 0.16$ .
  - TS = 18.51 with 3 dof.
  - $p = 3.45 \times 10^{-4}; \sigma = 3.6\sigma.$



#### Proton energy spectrum



F. Varsi et al., Phys. Rev. Lett. 132, 051002 (2024).

## Summary

- > This work used MC simulation data based on QGSJET-II-04/FLUKA hadronic interaction models.
- For H,  $A_{\Omega}$  saturates to ~1200 m<sup>2</sup> sr for  $\theta < 17.8^{\circ}$  and fiducial area used in this analysis.
- ▶ Energy resolution for H is 60% at 50 TeV which improves to 35% at 1.3 PeV.
- ▶ The data recorded by GRAPES-3 from 1 January 2014 to 26 October 2015 was used, which contains 7.81×10<sup>6</sup> events after selection cuts.
- ▶ Proton energy spectrum is presented from 50 TeV to 1.3 PeV, providing the connection between direct and indirect measurements.
- ▶ Proton energy spectrum has a good overlap with direct experiments (ISS-CREAM. CREAM-I+III, DAMPE) at low energy and indirect experiment (KASCADE QGSJET 01) at high energy.
- Evidence of spectral hardening near 165 TeV is presented with a significance of  $29.7\sigma$  by considering the statistical uncertainties and  $3.6\sigma$  by considering the statistical and systematic uncertainties.



## **Backup slides**

#### Composition: Unfolding Vs Chi-Square minimization



#### Gaussian randomization test: Simulation



#### Gaussian randomization test: Data



#### Muon saturation for different zenith angle and primaries



#### Muon saturation for different zenith angle and primaries



#### Hadron punch-through for different zenith angle and shower size bin



#### Core resolution



#### Reconstruction efficiency



#### GST model



T. K. Gaisser, T. Stanev, and S. Tilav, Front. Phys., 2013, 8(6).

#### H4A model



$$\phi_i(E) = \sum_{j=1}^3 a_{i,j} E^{-\gamma_{i,j}} \times \exp\left[-\frac{E}{Z_i R_{c,j}}\right].$$

	р	He	CNO	Mg-Si	Fe
Pop. 1:	7860	3550	2200	1430	2120
$R_c = 4 \text{ PV}$	1.66	1.58	1.63	1.67	1.63
Pop. 2:	20	20	13.4	13.4	13.4
$R_c = 30 \text{ PV}$	1.4	1.4	1.4	1.4	1.4
Pop. 3:	1.7	1.7	1.14	1.14	1.14
$R_c = 2 \text{ EV}$	1.4	1.4	1.4	1.4	1.4
Pop. 3(*):	200	0.0	0.0	0.0	0.0
$R_c = 60 \text{ EV}$	1.6				

T.K. Gaisser, Astropart. Phys. 35 (2012) 801.

#### Check reliability of response matrix



#### Propagation of systematic error in proton relative composition into energy spectrum

$$\frac{\partial E_{0,1}^{k+1}}{\partial a_{0,\alpha}} = E_{0,1}^{k+1} \left[ \frac{1.0}{E_{0,1}^k} \frac{\partial E_{0,1}^{k}}{\partial a_{0,\alpha}} + \frac{1.0}{N_{eff}^k} \left( \sum_j \frac{R_{ij} R_{ai}}{\partial a_{Nj} a_{0,3}^2 (1 - f_{fab,\beta})} E_{0,j}^k - \sum_j R_{C,j} \frac{\partial E_{0,j}^k}{\partial a_{0,\alpha}} \right) \right],$$
  

$$\delta E_{0,i}^{k_0} = \sqrt{\sum_{\alpha} e^{i\varphi} \delta a_{0,\alpha}^2 \left( \frac{\partial E_{0,j}^{k_0}}{\partial a_{0,\alpha}} \right)^2},$$
(7.21)