Telescope Array Hybrid Composition and Auger-TA Composition Comparison

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ISVHECRI 2018 - 名古屋市 日本 - 21 May 2018

TA Observatory



~700 km² $\rightarrow \leq$ *land* area of New York City.

Millard County, Utah

39° 17' 48.90457" 112° 54' 31.43708" 1370 m

876 g/cm² vertical depth

507 Scintillator surface counters
48 Air fluorescence telescopes
25 kW radar transmitter
Lightning detection array
40 MeV linear accelerator

Hybrid Reconstruction Method



3

TA Hybrid High Energy Event





Data/MC Comparison

	Bias	Res
X _{max} (g/cm²)	-1.1	17.2
Energy (%)	1.7	5.7
θ (deg)	0.014	0.337
ϕ (deg)	-0.020	0.410
ψ (deg)	0.074	0.397
<i>R</i> _p (m)	18.9	39.8
X _{core} (m)	-3.6	49.8
Y _{core} (m)	8.7	42.9













Below 10^{19} eV data X_{max} has a deep X_{max} tail resembling light composition (proton or helium).

Above 10^{19} eV, the deep X_{max} tail disappears in the data. Does this happen due to composition or detector acceptance? As shower energy grows zenith angle acceptance decreases because X_{max} occurs closer to the ground. So we must be able to see further inclined tracks for full acceptance. This analysis is limited by the constraint of SD coincidence.



</ A max > and $\sigma(X_{max})$ of TA hybrid data and QGSJet II-04 Monte Carlo

ApJ 858 (2018) 76



 $< X_{max} >$ and $\sigma(X_{max})$ of TA hybrid data and QGSJet II-04 Monte Carlo

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Conservative lower bounds on uncertainties from total cross-section, multiplicity, and elasticity dependence.

Hadronic models are still subject to large uncertainties as related to air shower observables.

Ulrich, Engel, & Unger¹ investigated the dependence of several UHECR-induced air shower observables e.g., $\langle X_{max} \rangle$ and σ (X_{max}), by varying fundamental hadronic model parameters such as cross-section, multiplicity, elasticity using CONEX/SYBILL at 10^{19.5} eV.

Abbasi & Thomson² extended that work to measure $\langle X_{max} \rangle$ uncertainty for CONEX & four different models (QGSJet01c, QGSJet II-03/04, & EPOS-LHC) at 10¹⁷ and 10^{19.5} eV.

¹ <u>Phys.Rev.D83:054026 (2011)</u> ² <u>arXiv:1605.05241 (2016)</u>



Morphological test of composition

Assume composition consists primarily of a single element.

Monte Carlo and reconstruct those elements as observed by TA.

How can we compare the data and models given large potential systematic uncertainties in $< X_{max} >$ of either?

For a given energy bin systematically shift the data X_{max} distribution, compute the log likelihood of observing the data, under the assumption the true distribution is pure QGSJet II-04 protons, or helium, or nitrogen, or iron.

For the shift which provides the maximum likelihood, calculate the probability of observing a ML at least as extreme as observed in the shifted data.

Test of Data vs. Models



For a given energy bin, if the *p*-value is less than 0.05 we reject the data and Monte Carlo as being compatible.

If it is greater than 0.05, we fail to reject the model and data as compatible. In other words, given this test we can not exclude the possibility that data and Monte Carlo are compatible at the 95% confidence level.

This figure shows that for all energy bins after systematic shifting of X_{max} distributions, TA data fails to exclude QGSJet II-04 protons as being compatible with observations. Above 10^{19} eV, helium, nitrogen, and iron fail to be excluded but large systematic shifts are needed for iron.

TA BR/LR Hybrid <X_{max}>



8.5 years of TA BR/LR hybrid data. First X_{max} results from the BR/LR FD stations.

3330 events in the BR/LR hybrid set. This is TA's highest statistics measure of X_{max} .

Other methods, hybrid and stereo, using other fluorescence detector provide very similar results.

Stereo FD X_{max} will provide more statistics at high energies because we can extend the analysis to higher zenith angles.

<u>ApJ 858 (2018) 76</u>

TA-Auger Composition Comparison



Parable of the blind men COSMIC RAY PHYSICISTS and the elephant.















Abbasi, et al., <u>ApJ 858 (2018) 76</u>

Bellido, Depth of maximum of air-shower profiles at the Pierre Auger Observatory: Measurements above 10^{17.2} and Composition Implications (ICRC 2017)



Abbasi, et al., <u>ApJ 858 (2018) 76</u>

Auger data is unbiased through event selection.

TA data is biased mostly by detector acceptance.

"Disagreement" of Auger and TA results mainly from the interpretation of what happens to observed X_{max} relative to single species X_{max} expectation.

Above ~10^{18.3} eV Auger $\langle X_{max} \rangle$ begins to fall away from proton expectation and X_{max} fluctuations narrow.

TA is systematically shifted from protons but shows no break in the slope and fluctuations look like protons. Above 10¹⁹ eV TA <u>hybrid</u> has insufficient exposure to make a meaningful measurement of either.

TAx4, stereo, 1 SD hybrid will provide more statistics.

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- TA reconstructs X_{max} distributions as seen by the detector.
 - TA imposes minimal cuts.
 - FD reconstruction causes acceptance bias through loss of events in the tails of the distributions.
 - Reconstruction bias is controlled by accurate reconstruction, choice of quality cuts.
 - TA Monte Carlo simulates these biases.
 - Why like this? This best represents *how the detector actually sees cosmic ray distributions* with minimal altering of the data.
- Auger reconstructs X_{max} distributions as seen in the atmosphere.
 - Through simulation find event geometries and energies that allow selection of events that upon reconstruction cause no distortion of the X_{max} distributions.
 - Auger accepted and reconstructed X_{max} distributions minimize bias from thrown cosmic ray distributions.
 - Auger can directly compare reconstructed X_{max} distributions with those thrown straight out of an air shower generator. Their distributions are corrected for acceptance in a similar way spectrum measurements are corrected for individual detector exposure and aperture.
 - In theory if all experiments did this, then all X_{max} measurements could be directly compared regardless of size.
 - Need good statistics for this approach though, especially at the highest energies.



Geometry, energy, particle mass, and atmospheric mass overburden limit ability to observe and reconstruct X_{max} . Vertical showers of sufficient energy can hit shower maximum in the ground. Inclined showers provide sufficient atmosphere to allow shower max in air, but geometry, distance, and field of view limit reconstruction here as well.



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Acceptance and reconstruction bias turns thrown X_{max} from this:







 $10^{18} eV$

31°

ŝ

0²⁰

10¹⁹ eV

31° $10^{18} eV$ ŝ ŝ 10¹⁹ (0²⁰ 17° 3° e of of 17° X_{ma} ٦° Geometry, energy, particle mass, and atmospheric mass overburden limit ability to observe and reconstruct X_{max} . Vertical showers of sufficient energy can hit shower maximum in the ground. Inclined showers provide sufficient atmosphere to allow shower max in air, but geometry, distance, and field of view limit reconstruction here as well.

to this:





31° 10¹⁸ eV ŝ 10^{19} 0²⁰ 17° to this: ٦° $19.2 \le \log_{10}(E_{thrown}/eV) < 19.4$ hXmaxThrownEbin 09 hXmaxReconEbin 09 Entries 29241 Entries 35 791.8 Mean 30 RMS 59.9 RMS 52.41 25 20 40°00° 20 10 17° 700 750 800 850 900 950 1000 1050 1100 700 X_{max} (q/cm²) Thrown and recon proton $X_{\rm ma}$ ٦°

Geometry, energy, particle mass, and atmospheric mass overburden limit ability to observe and reconstruct X_{max} . Vertical showers of sufficient energy can hit shower maximum in the ground. Inclined showers provide sufficient atmosphere to allow shower max in air, but geometry, distance, and field of view limit reconstruction here as well.



Resolution broadens shallow X_{max} tail slightly. For protons, which penetrate more deeply than iron, the deep tail is more heavily affected. Proton $\Delta < X_{max} > = -15 \text{ g/cm}^2$.



Abbasi, et al., <u>ApJ 858 (2018) 76</u>

Below $10^{18.5}$ eV TA and Auger observe $\sigma(X_{max})$ consistent with protons.

From 10^{18.5} - 10^{19.0} eV a North/South discrepancy is observed, with TA remaining consistent with pure protons and Auger trending towards heavier elements.

Above 10^{19.0} eV, TA has insufficient statistics to interpret $\sigma(X_{max})$.

Moments of distributions require many events, this is even more so true when dealing with skewed distributions. A fluctuation of even two or three events in the tails of a distribution of N = 100, is enough to cause $\sigma(X_{max})$ to fluctuate by 10 g/cm².

Bellido, Depth of maximum of air-shower profiles at the Pierre Auger Observatory: Measurements above 10^{17.2} and Composition Implications (ICRC 2017)

How to compare TA & Auger X_{max} distributions

- Auger data is unbiased compared to thrown mixtures of X_{max} distributions.
- Auger fits their data to an ad-hoc mixture of proton, helium, nitrogen, and iron.
 - EPOS-LHC reduces discrepancies of models and is their preferred model.
 - QGSJet II-04 slightly worse but this is the Monte Carlo TA has readily available.
- Auger provides the energy dependent 4-component mixture fractions to TA.
- TA generates a Monte Carlo data set of the mixture.
- Check if the TA *thrown* mix agrees with Auger *reconstructed* data.
 - Because of the previous explanation Auger reconstructed data should be directly comparable to a thrown CORSIKA X_{max} distribution.
- Reconstruct the mix through TA's standard analysis chain.
- This imposes acceptance and reconstruction bias of the TA detector on the mixture.
- Compare the biased mixture to TA biased reconstructed data.
- If the mixture, after TA detector acceptance, looks like TA data, then we say TA data and Auger data are in agreement (at some level...)
- Prior to 2017, we check agreement by looking at the means.
- In 2017, we checked agreement through more rigorous tests.





- TA generates a Monte Carlo data set of the mixture.
- Check if the TA *thrown* mix agrees with Auger *reconstructed* data.

TA successfully generates a simulation that uses the prescribed mixture that fits their data. Before it is reconstructed and subjected to detector acceptance and bias, we verify that it agrees with Auger <u>data</u>.

*TA/Auger X*_{max} - UHECR 2016



JPS Conf.Proc. 19 (2018) 011013

TA and Auger data can not be directly compared because they use different approaches to data analysis.

We can indirectly compare our data by using a composition mixture made up of proton, helium, nitrogen, and iron that is fit to their data. Then TA generates and reconstructs a Monte Carlo data set using the same composition mix. This simulates acceptance and biases of the TA detector and reconstruction algorithms.

Compare the agreement of this reconstructed mix to TA data.

TA and Auger data are in agreement within systematic uncertainties.

TA/Auger X_{max} - ICRC 2017



Generate and reconstruct the Auger mix, biasing it through TA acceptance and reconstruction.

Compare the entire *distributions* of TA data (black) and TA reconstructed Auger mix (blue).

Shift the entire Monte Carlo distribution by the difference in mean X_{max} of data and MC.

Calculate the test statistics of Kolmogorov-Smirnov (KS) and Anderson-Darling (AD) tests.

Sample the MC distributions 10⁵ times to find the probability of measuring a test statistic at least as extreme as found for the data.

The same test of data and pure QGSJet II-04 protons was also performed.

All tests: $\log_{10}(E/eV) < 19.0$.

V. De Souza, Testing Agreement of X_{max} Between Auger and TA, ICRC 2017

	No $X_{\rm max}$ shift		TA & Auger mix		TA & QGSJet II-04 proton			
log ₁₀ (E/eV)	KS prob	AD prob	<i>∆X</i> (g/cm²)	KS prob	AD prob	<i>∆X</i> (g/cm²)	KS prob	AD prob
18.2-18.3	< 10 ⁻⁵	< 10 ⁻⁵	-23	0.35	0.65	-31	0.14	0.21
18.3-18.4	< 10 ⁻⁵	< 10 ⁻⁵	-26	0.61	0.95	-33	0.99	0.99
18.4-18.5	< 10 ⁻⁵	< 10 ⁻⁵	-16	0.65	0.87	-22	0.57	0.62
18.5-18.6	9 × 10 ⁻⁵	1.1 × 10 ⁻⁴	-12	0.43	0.48	-21	0.41	0.53
18.6-18.7	0.014	0.0019	-12	0.97	0.98	-24	0.92	0.95
18.7-18.8	0.018	0.043	-6	0.39	0.49	-20	0.67	0.88
18.8-18.9	0.065	0.0085	-15	0.37	0.47	-31	0.55	0.26
18.9-19.0	0.49	0.5	-4	0.85	0.88	-20	0.98	0.98

V. De Souza, Testing Agreement of X_{max} Between Auger and TA, ICRC 2017



Auger fits their unbiased data to a composition mixture of proton, helium, nitrogen, iron \rightarrow TA reconstructs this mixture \rightarrow exposure to full detector and reconstruction \rightarrow now we can compare for compatibility.

Nonparametric tests (KS and AD) fail to reject the null hypothesis at the 90% confidence level.

Below 10¹⁹ eV:

TA data agrees with Auger data within systematic uncertainties.

TA and pure QGSJet II-04 protons show a similar level of compatibility.

Statement approved by TA and Auger collaborations - ICRC 2017.



V. De Souza, Testing Agreement of X_{max} Between Auger and TA, ICRC 2017

Summary

- First results of TA BR/LR hybrid X_{max} published this month. <u>ApJ 858 (2018) 76</u>
- This is TA's highest statistical measure of X_{max} , but other methods are required to reach above 10¹⁹ eV, e.g., stereo.
- TA tests compatibility of observed X_{max} distributions by finding the systematic X_{max} shift required to maximize the likelihood between data and Monte Carlo, then measuring the probability of observing a likelihood of observing a likelihood at least this extreme from the single element reconstructed MC.
 - TA $\langle X_{max} \rangle$ systematic uncertainty: ±17.4 g/cm².
 - QGSJet II-04 $\langle X_{max} \rangle$ systematic uncertainies: $\sim \pm 3$ g/cm² ± 18 g/cm² from 10¹⁷ 10^{19.5} eV.
- Below 10^{19} eV, TA full X_{max} distributions are compatible with QGSJet II-04 protons.
- Above 10¹⁹ eV, TA can not rule out single element models such as QGSJet II-04 helium, nitrogen, and iron.
- Further work measuring upper bounds on elements such as iron, mixtures, and EPOS-LHC generation to follow.
- TA and Auger $\langle X_{max} \rangle$ plots can not be directly compared as they are published.
- Each experiment has different analysis approach.
 - TA: loose cuts and simulate acceptance effects by Monte Carlo.
 - Auger: tight cuts ro remove acceptance effects as much as possible.
- We test compatibility by processing MC mixture through TA analysis exposing to detector acceptance and bias.
- When this is done, observed <X_{max}> and shapes of distributions agree within systematic uncertainties of the two experiments.
- And the shapes of TA distributions agree within systematic uncertainties of QGSJet II-04 protons.
- Possible North/South discrepancy? More TA data is required, especially above 10¹⁹ eV.
- TA and Auger are advancing our understanding of composition at the highest energies through improved statistical power and analysis \rightarrow moving beyond the first two moments of the X_{max} distributions.



The blind men COSMIC RAY PHYSICISTS are touching the same elephant. They just need to talk to each other to figure this out! And build larger detectors... And meet grant deadlines...







Hybrid X_{max} acceptance as a function of zenith angle in three energy ranges.

Low zenith angle events (near vertical) have lower acceptance. This will mostly affect deeply penetrating events (low mass primaries). X_{max} must be bracketed to ensure a profile fit with small ΔX_{max} .

We have a steeply falling spectrum, higher energy events on average penetrate deeper, statistics are rapidly depleted for $E > 10^{19}$ eV.

TA needs greater exposure for accurate measurement of composition for $E > 10^{19}$ eV. Nearly 9 years of data $\Rightarrow 133$ events above 10^{19} eV.

TAx4 will give us the exposure needed to measure composition here. ⁴³



















Can poor X_{max} resolution cause heavier elements to look like protons in TA's detector? In other words can resolution be smearing shallow events up into the deep X_{max} tail, increasing the widths of the distributions to look like protons?

No. TA requires resolutions 3-4 times worse than what calculate what we simulate to make tails of helium X_{max} distribution look like QGSJet II-04 protons for $E < 10^{19.0}$ eV. Nitrogen and iron require much worse resolution to populate the proton X_{max} tails.



TA Expansion (TA × 4)

Fourfold increase in the size of the TA SD array.

Add 500 scintillator SDs @ 2.08 km spacing.

Add 2 FD stations, 28 telescopes

Get 20 TA years of data by 2020.

Increased statistics for highest energy range (> 57 EeV) to answer the question of the hotspot.



Analysis Methodology



- Fiducial volume cuts based on shower geometry are applied to select showers with minimum resolution bias and covers the full *X*_{max} distribution.
- Moments of the unbiased X_{max} distribution are obtained.
- X_{max} moments can be directly compared to unbiased, thrown distributions from models.
- Identical reconstruction procedure, software, and event selection algorithm.



- Simulate X_{max} biases via detailed detector Monte Carlo
- Compare measured X_{max} distributions with Monte Carlo predictions including effects of detector biases.
- Identical reconstruction procedures, software, & cuts are applied to data and Monte Carlo.
- Biases in data and MC due to unique aperture, efficiency, & reconstruction shown.



 $X_{\rm max}$ measurements over the past 25 years.

Even without correcting for acceptance of the individual experiments such as Auger does most experiments agree very well in their overlap regions.