

# The depth of the shower maximum of air showers measured with AERA

ICRC2021 | CRI | Cosmic Ray Indirect



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*Pierre Auger Collaboration*

# Talk overview

## 1. Introduction:

‘How to measure the cosmic-ray particle types with radio antennas?’

## 2. Method:

‘How do we determine this as accurately as possible at AERA?’

## 3. Results:

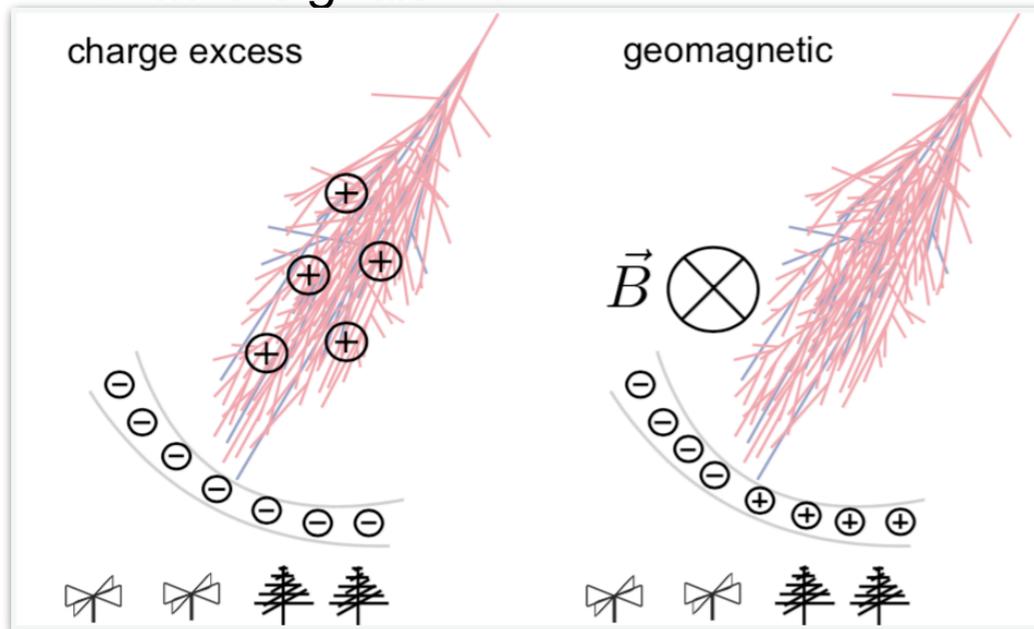
‘What is the cosmic-ray mass composition?’

‘How does this compare to the Auger fluorescence and other measurements?’

# Introduction: *Depth of the shower maximum ( $X_{\max}$ ) as 'mass composition'*

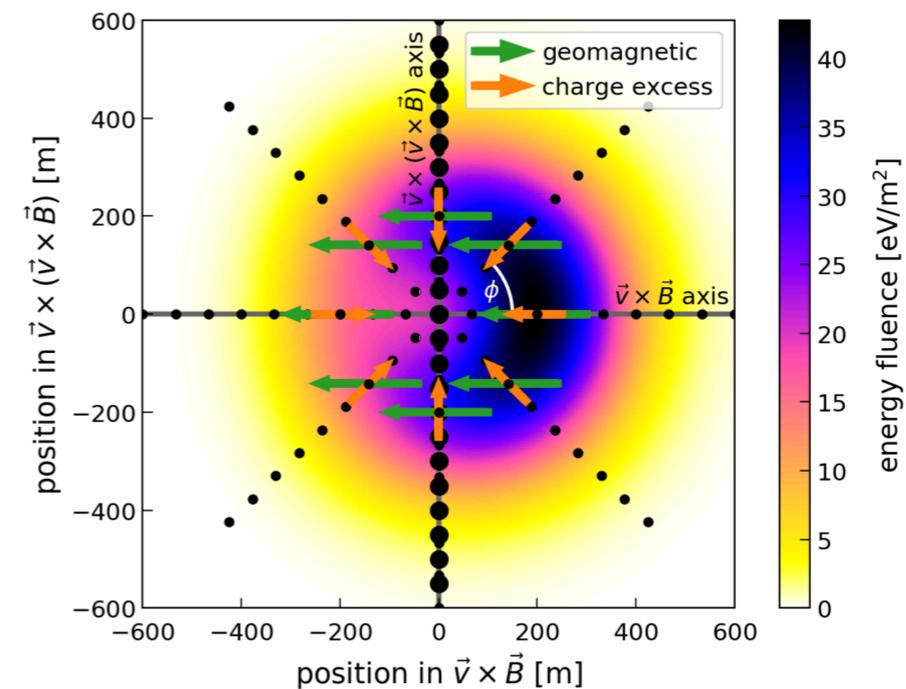
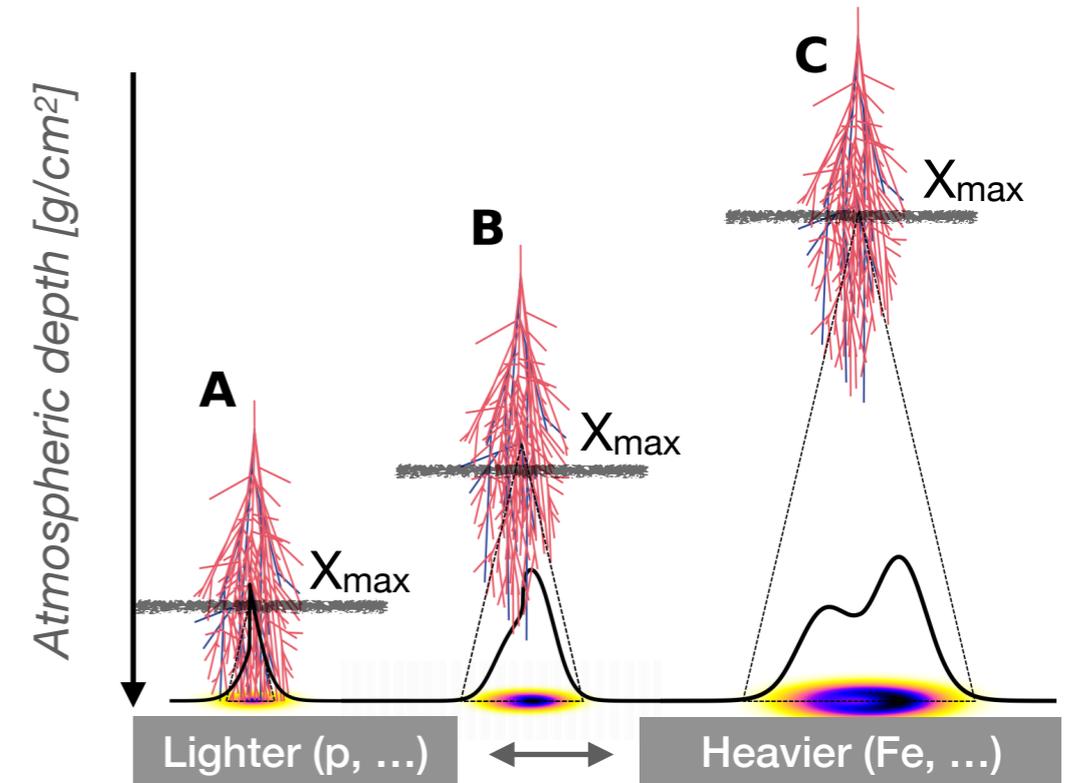
1. Heavy particles interact earlier than light  
 —> **Depth of the shower maximum ( $X_{\max}$ ) is probe for cosmic-ray mass.**

2. MHz radio signals from:



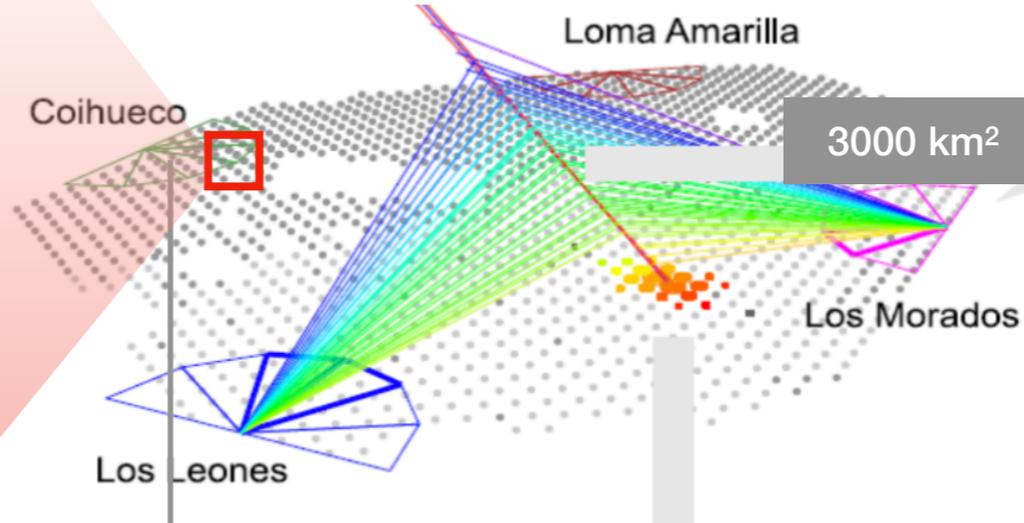
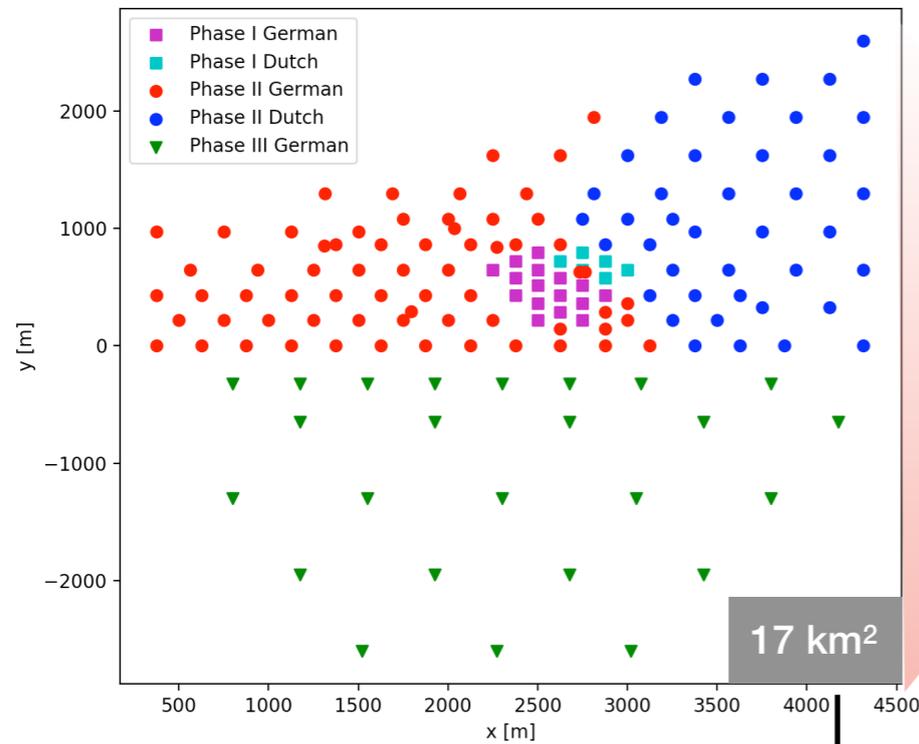
3. Radio emission footprint on the ground is sensitive to  $X_{\max}$ .

4. Compare measured footprint to footprint from CORSIKA air shower simulation  
 —> minimise for  $X_{\max}$  of measured shower.



# Introduction: **AERA** at the **Pierre Auger Observatory**

Auger Engineering Radio Array (AERA):  
153 autonomous radio antennas



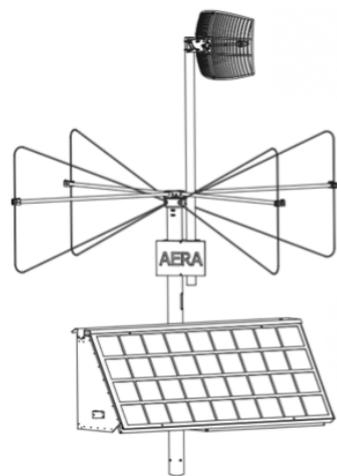
**Radio**



**Fluorescence**



Both measure mass composition of cosmic ray



# Introduction: Motivation for AERA $X_{\max}$

## 1) AERA: largest radio array for cosmic-ray detection

Statistics in transition Galactic/Extra-galactic ( $10^{17}$ - $10^{19}$  eV)

## 2) Discrepancy at $10^{17}$ - $10^{18}$ eV?

- AERA method similar to LOFAR/Tunka-Rex.
- AERA shares systematic effects and events with Auger FD.

→ AERA can give new insights.

### Approach:

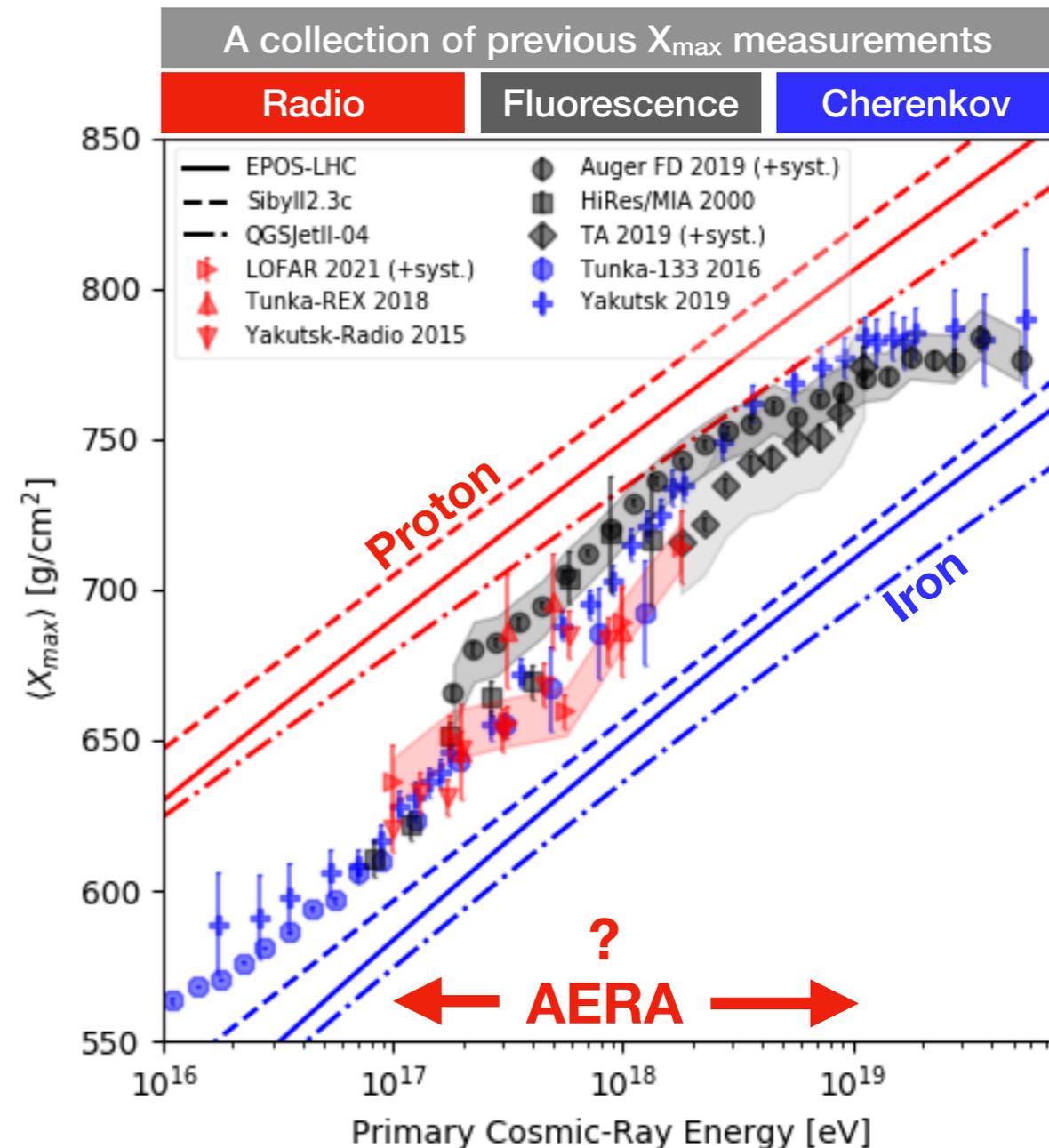
Derive AERA  $X_{\max}$  by comparing measured AERA signals to set of CoREAS/Corsika simulations.

### Measured air showers (2013-2019)

- ~600 after all reconstruction-, quality-, and anti-bias cuts.
- ~60 measured in hybrid with Auger fluorescence.

### Simulation dataset:

- Simulations of each event:  
CORSIKA/CoREAS v7.7100 + QGSJETII-04 + GDAS atmosphere.
- 15 p + 12 Fe covering  $X_{\max}$  distribution in nature (Gumbel).



# Method: $X_{\max}$ from data-sim matching

**Step 1)** comparing measured AERA signals to simulated and Offline-reconstructed signal.

$$\chi^2 = \sum_{\text{AERA Stations}} \left( \frac{u_{\text{data}} - S \cdot u_{\text{sim}}(\Delta \vec{r}_{\text{core shift}})}{\sigma u_{\text{data}}} \right)^2$$

$u$  : energy density [eV/m<sup>2</sup>]

$S$  : scale factor for syst. & SD energy uncertainty

$\Delta r$  : shift for AERA core uncertainty

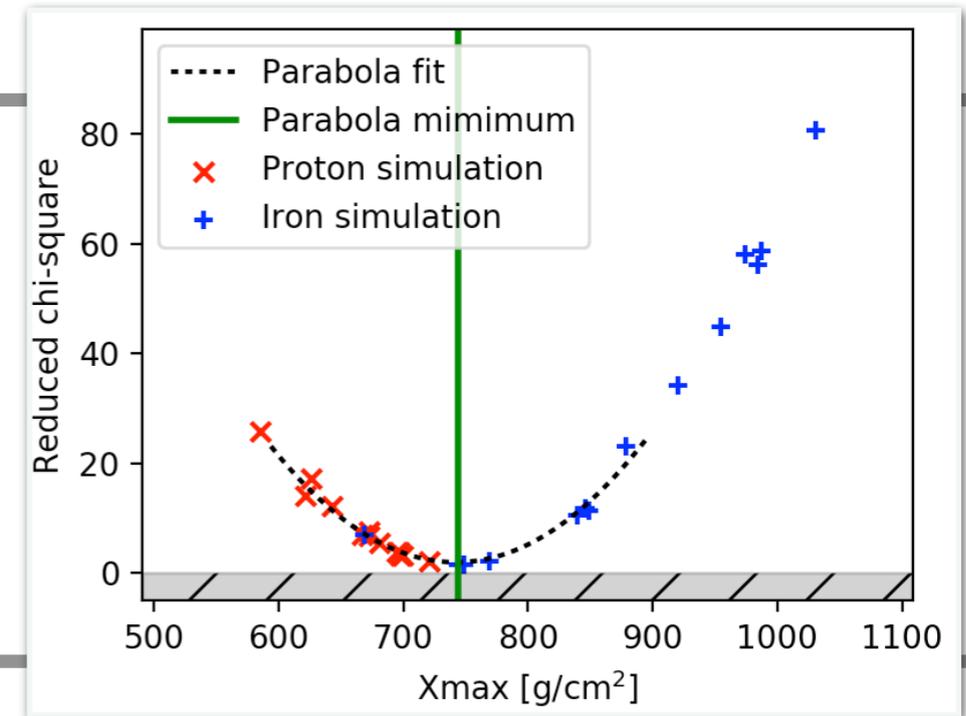
(based on 'Lofar method'. Buitink et al. 2014)

**Step 2)**

- Fitting  $\chi^2/\text{ndf}(X_{\max})$  of (12Fe+15p) simulations with parabola.
- Chi-squared minimisation procedure with free core shift ( $\Delta r$ ) and Energy scaling ( $S$ )

→  $X_{\max}$  of measurement at the minimum.

But, parabola- $X_{\max}$  estimator is a biased estimator!



**Step 3) Q: "How well can the method reconstruct MC truth for this event?"**

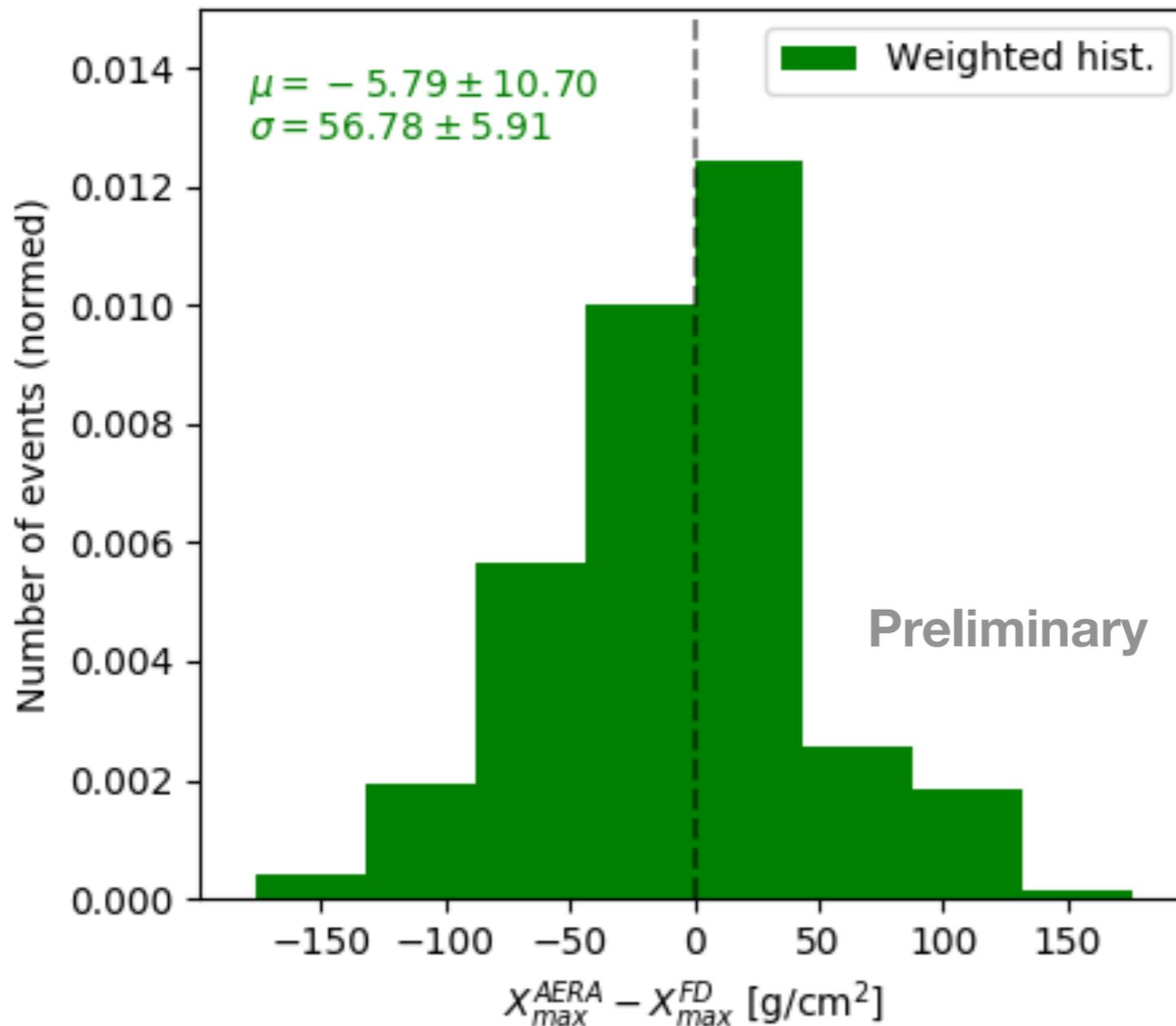
Designed procedure for:  $X_{\max}$  uncertainty estimation and bias estimation using reconstruction of simulated showers

**Result**

$$X_{\max}^{\text{AERA}} = \left( X_{\max}^{\text{Parabola}} + \Delta X_{\max}^{\text{bias}} \right) \pm \sigma X_{\max}$$

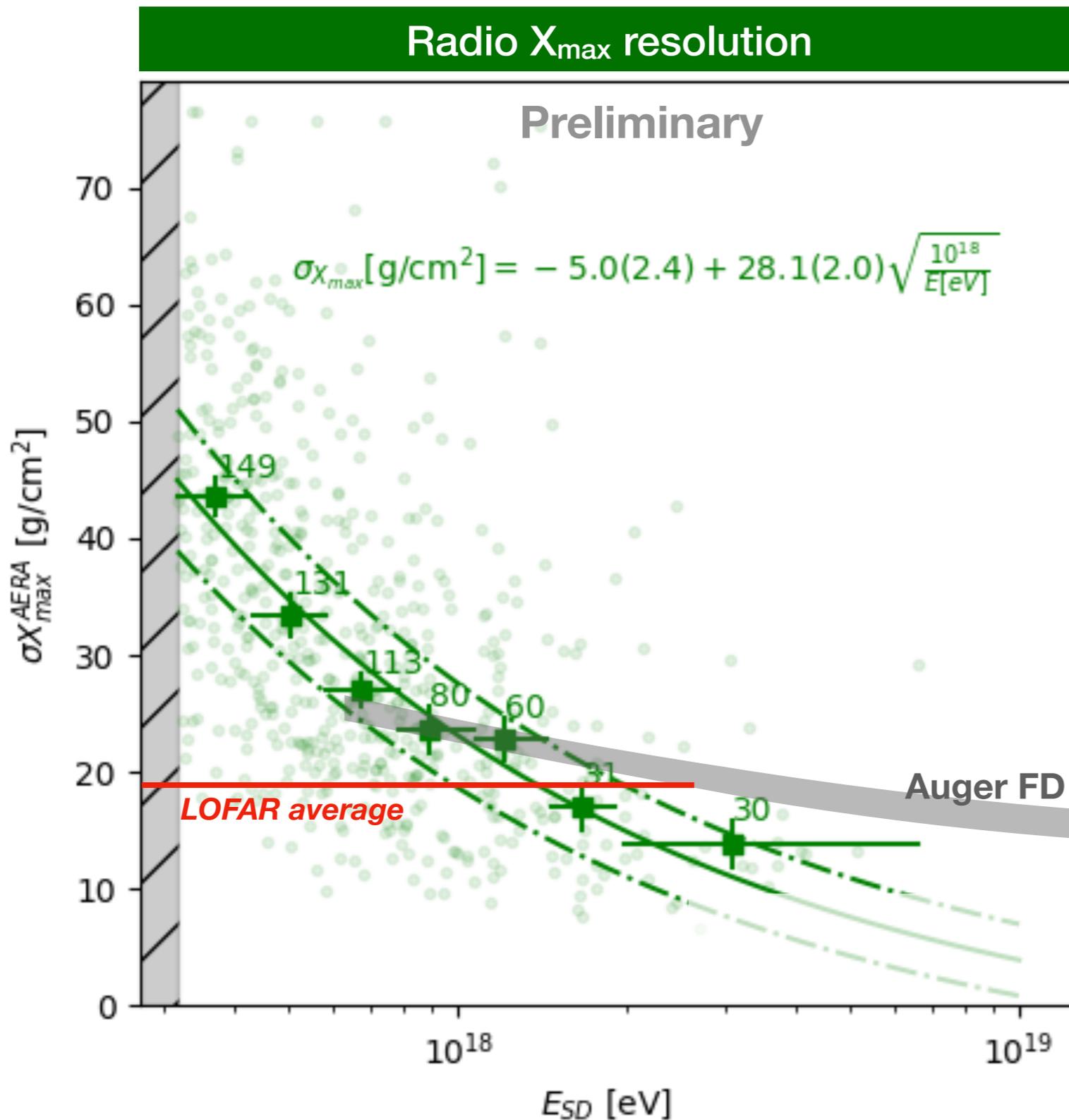
# Results: Event-by-event FD vs AERA $X_{\max}$

Histogram of AERA-FD difference



- 60 showers with AERA and FD;  
(Are independent observations!)
- No significant bias radio  $X_{\max}$  w.r.t. fluorescence  $X_{\max}$ .
- Provides independent checks:
  - consistency  $X_{\max}$  methods
  - probing different shower physics

# Results: Resolution of AERA $X_{\max}$ method



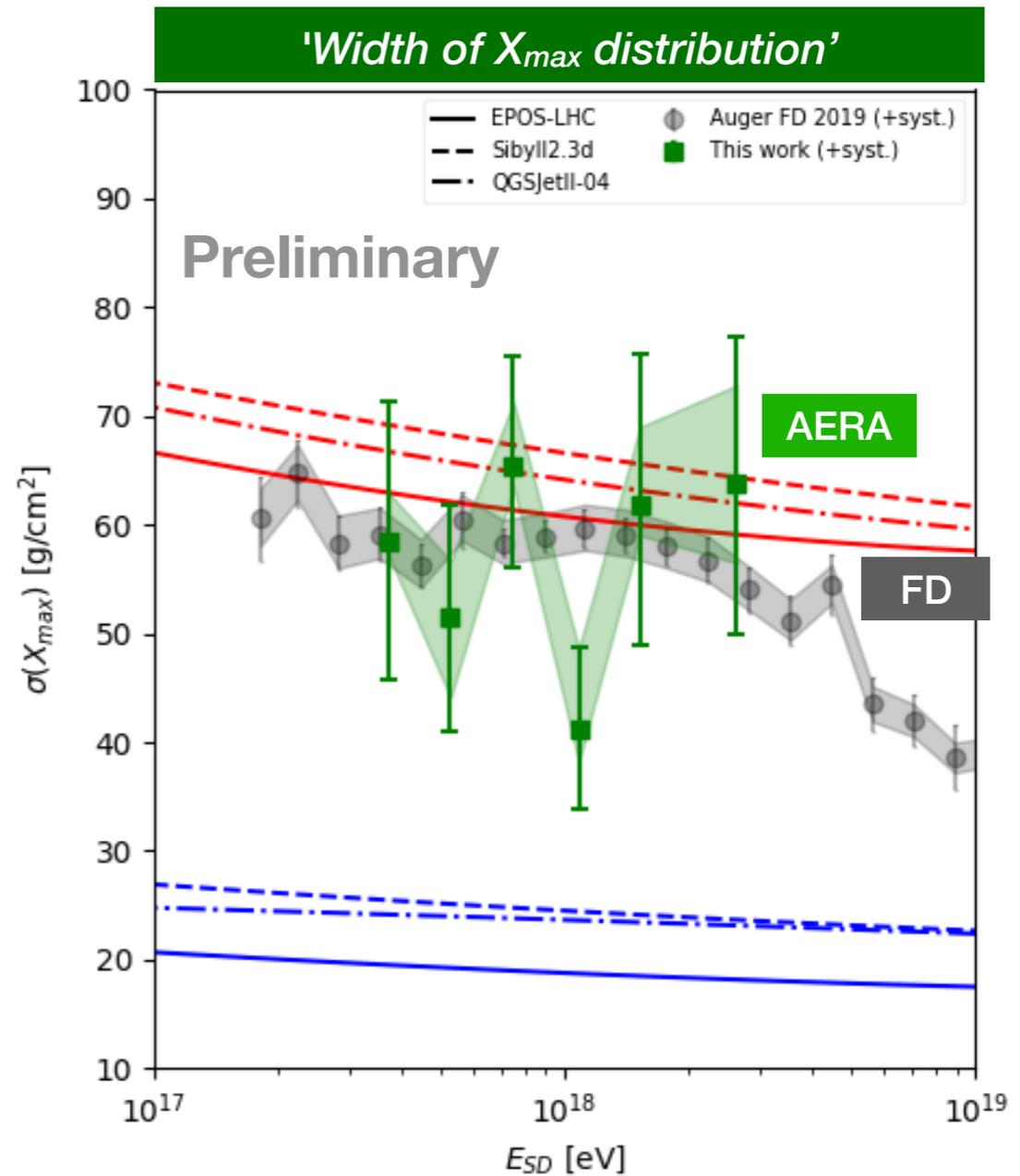
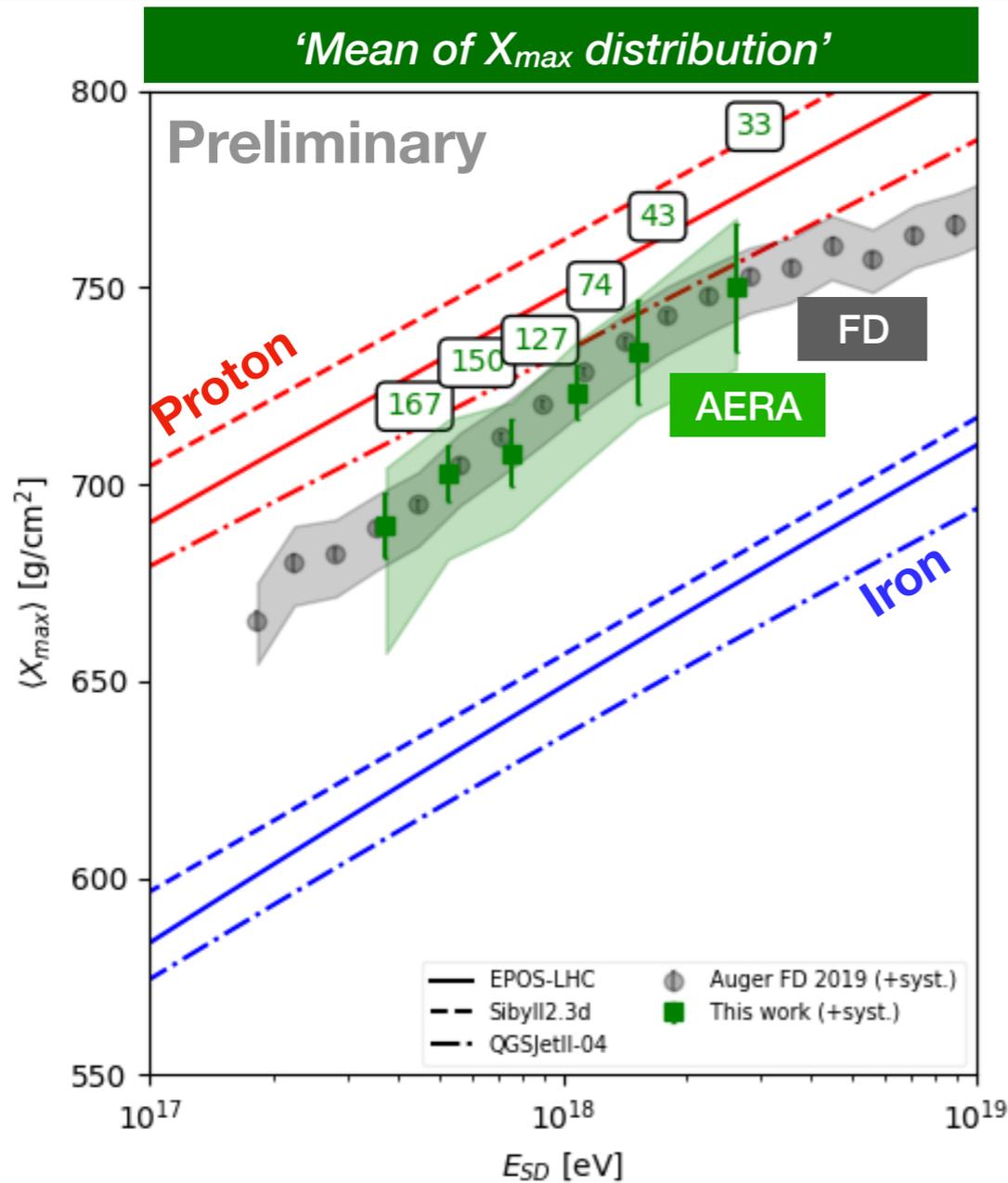
Resolution improves with energy.

- Roughly follows  $1/\sqrt{E}$
- Driven by SNR increasing with  $E$ .

Resolution competitive with e.g.:

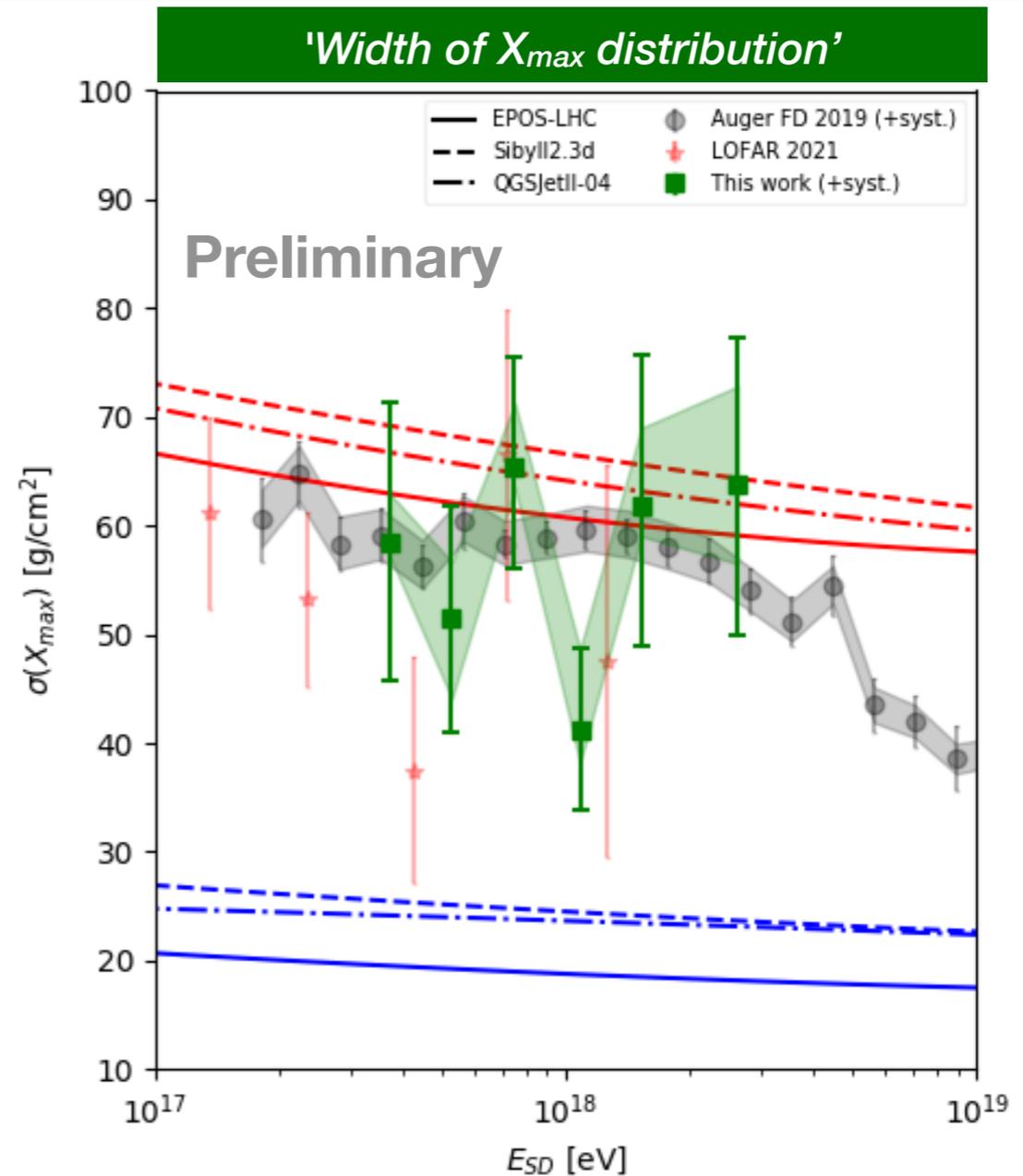
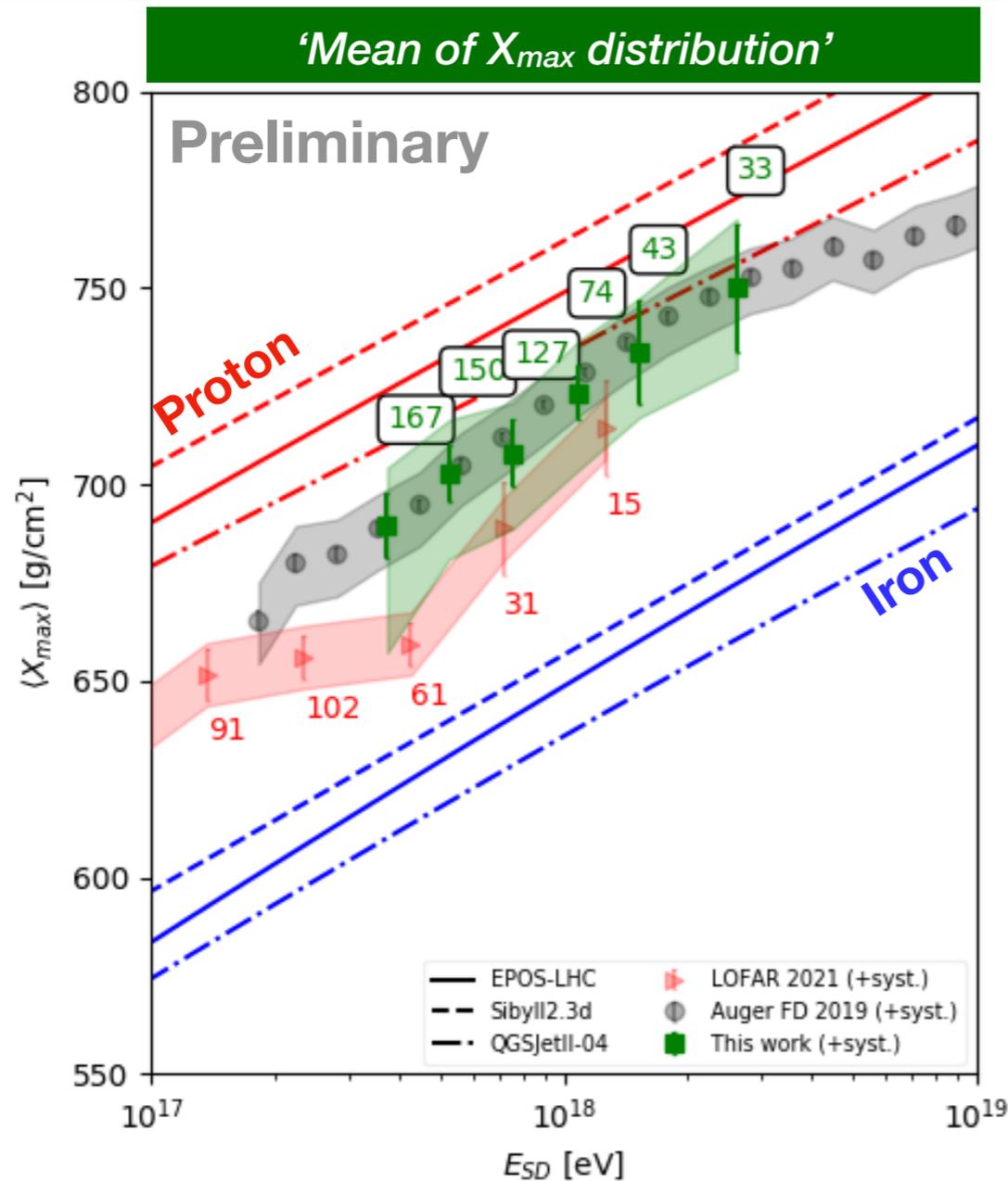
- Auger fluorescence  
25-17  $\text{g/cm}^2$  [arxiv:1409.4809].
- LOFAR radio ( $E=10^{16.8\dots 18.3}\text{eV}$ )  
<19  $\text{g/cm}^2$ > [arxiv:2103.12549v2]  
(smaller but much denser array)

# Results: Measured AERA $X_{max}$ distribution



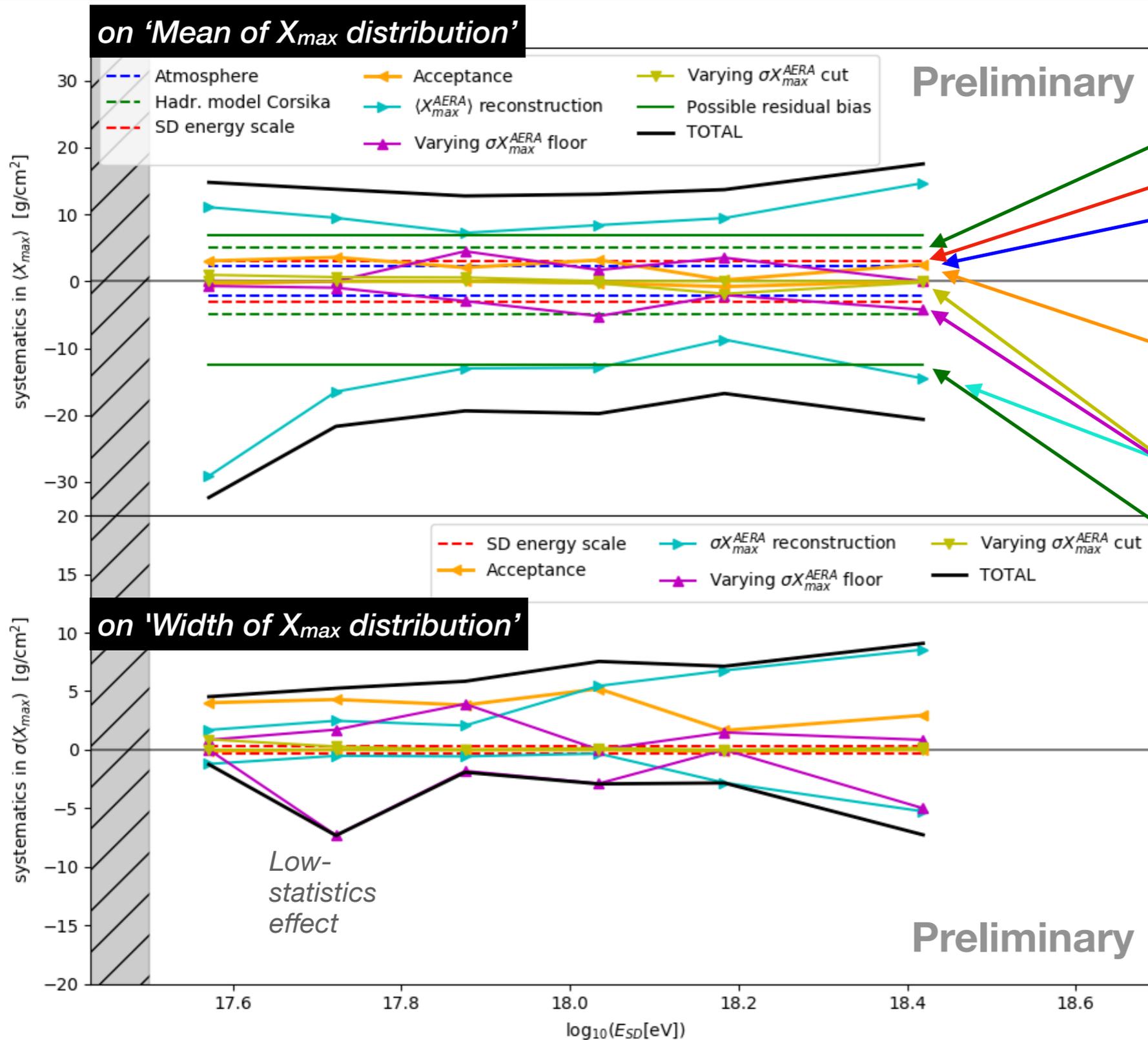
- **Light composition** (p-He mix) at  $E=10^{17.5}$  eV, becoming lighter (mostly p) towards  $E=10^{18.5}$  eV.
- **Supports e.g. Auger FD** (in mean, width, and general shape of  $X_{max}$  distribution).

# Results: Measured AERA $X_{max}$ distribution



- No general 'radio-bias' w.r.t. other methods such as fluorescence.
- Study of systematic uncertainties similar to LOFAR.
  - Cross-checks have not found single simple cause.
  - Differences to be found in study of systematic uncertainties.
  - Physical origin difficult to propose.

# Results: Systematic uncertainties on AERA $X_{max}$



## General systematic uncertainties

- CORSIKA hadr. model.
- Auger energy scale
- Atmosphere

## Method/data systematics

- Selection bias/Acceptance  
*Evaluated using reconstruction of simulated showers.*
- $X_{max}$ -method bias  
*Evaluated using reconstruction of simulated showers.*
- Possible residual bias  
*Quantified possible residual trends in  $X_{max}$  vs geometry (shower core position, azimuth angle, and zenith angle).*

## Note:

*mass-dependent terms (acceptance & method bias) are estimated conservatively. Possible to reduce them with further study.*

# Take home messages

## Conclusions:

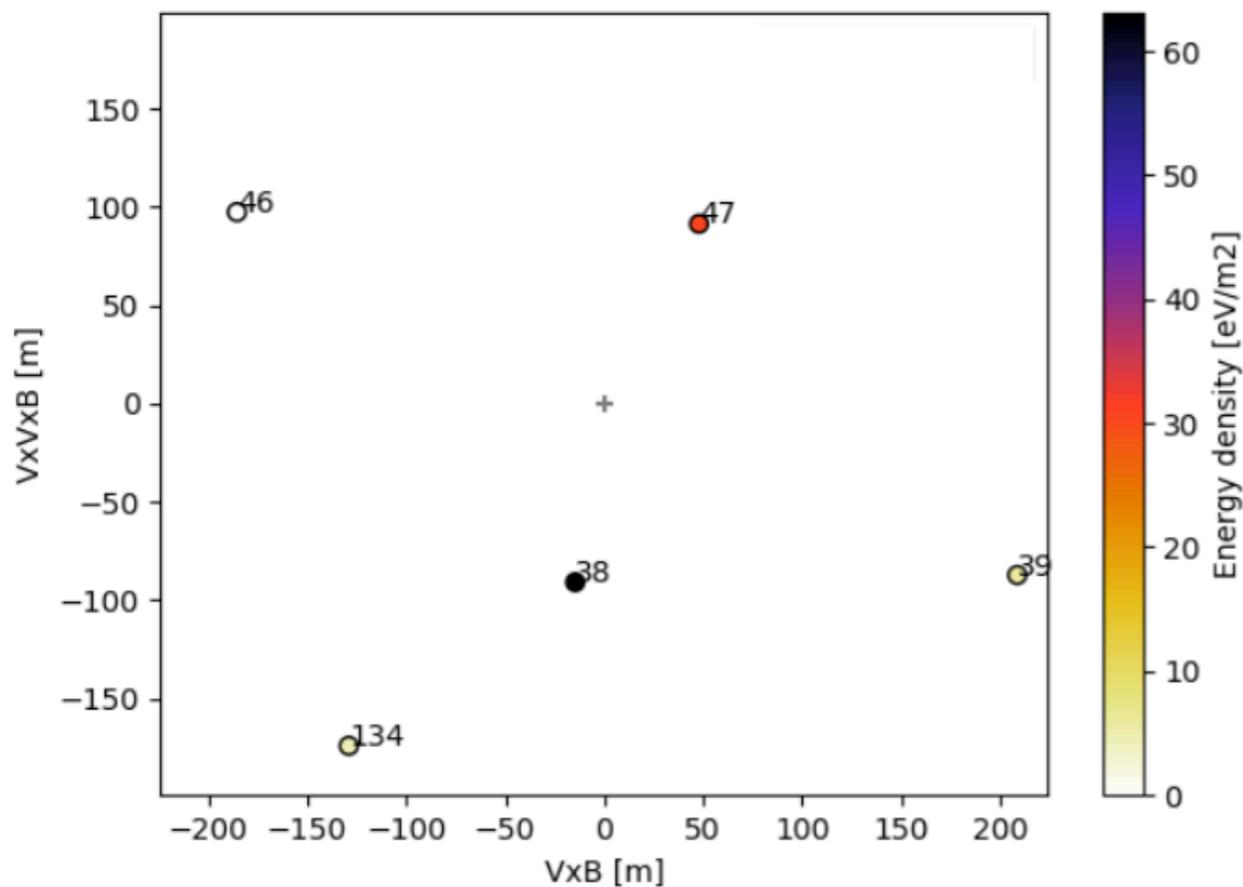
1. Developed an **improved method to reconstruct  $X_{\max}$**  with AERA.
  - Can account for sparse and irregular radio arrays.
  - Method applicable to other arrays.
2. AERA  $X_{\max}$  **systematic uncertainties** quantified.
  - Data-driven method applicable to other arrays. —> way to study discrepancies.
3. **Competitive AERA  $X_{\max}$  resolution, following  $\sim 1/\sqrt{E}$ .**
  - Should be considered when quoting/interpreting single resolution values.
4. AERA  $X_{\max}$  **compatible with Auger Fluorescence** on event-to-event basis.
  - Independent support to our understanding of shower physics.
5. AERA mass composition supports **light (mixed) composition in transition region.**
  - In agreement with with full Auger FD dataset.
  - No hints of general radio- $X_{\max}$ -specific bias.
  - Stresses the need for careful systematic uncertainty study.

# Backup

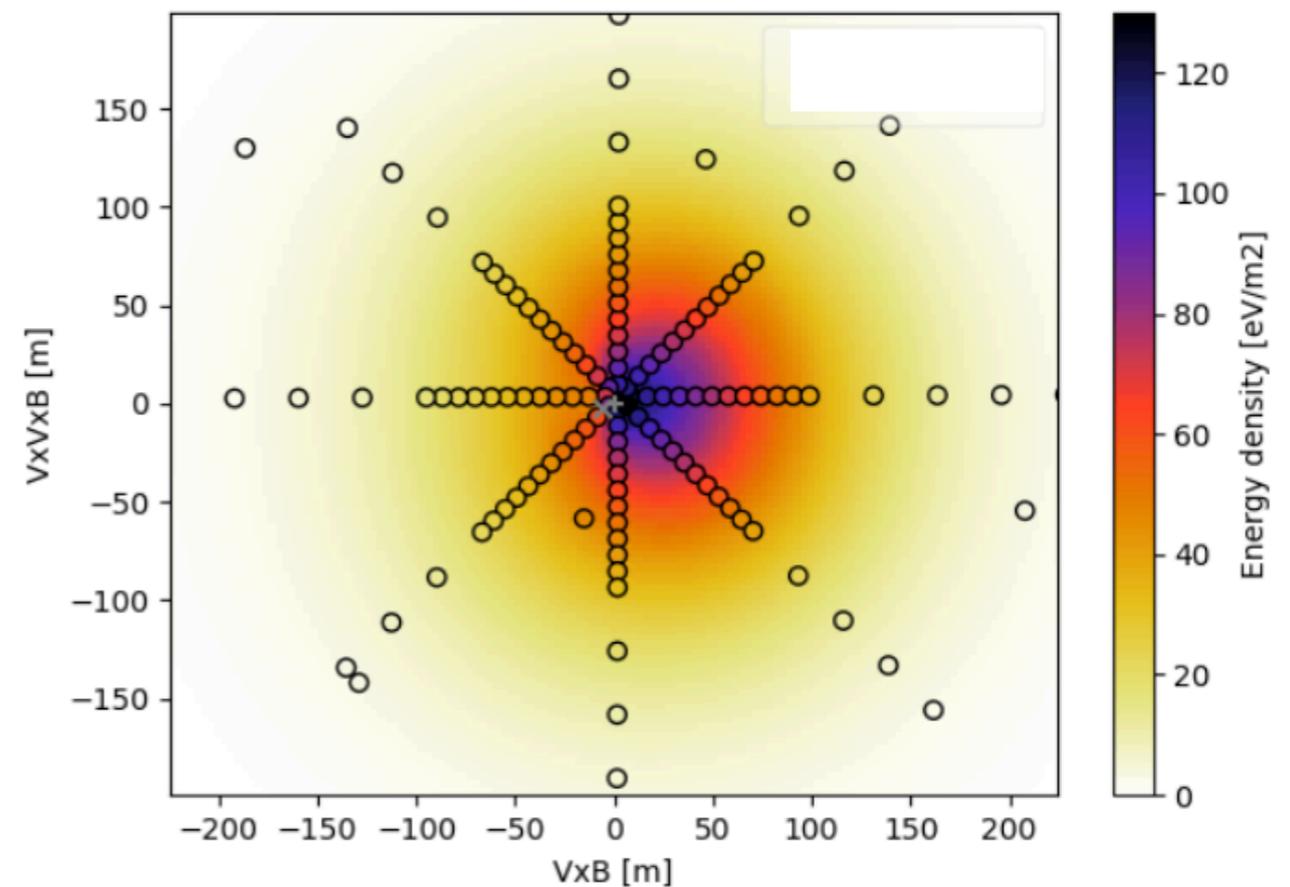
# Method: Xmax from data-sim matching

**Step 1/3)** comparing measured AERA signals to simulated and Offline-reconstructed signal.

measured AERA event: signals in shower plane



Simulated stations (+ signal interpolation)



Compare with: Chi-squared of energy density ( $u$ ); allowing core shift ( $\Delta r$ ) and energy shift ( $S$ ):

$$\chi^2 = \sum_{\text{AERA Stations}} \left( \frac{u_{\text{data}} - S \cdot u_{\text{sim}}(\Delta \vec{r}_{\text{core shift}})}{\sigma u_{\text{data}}} \right)^2$$

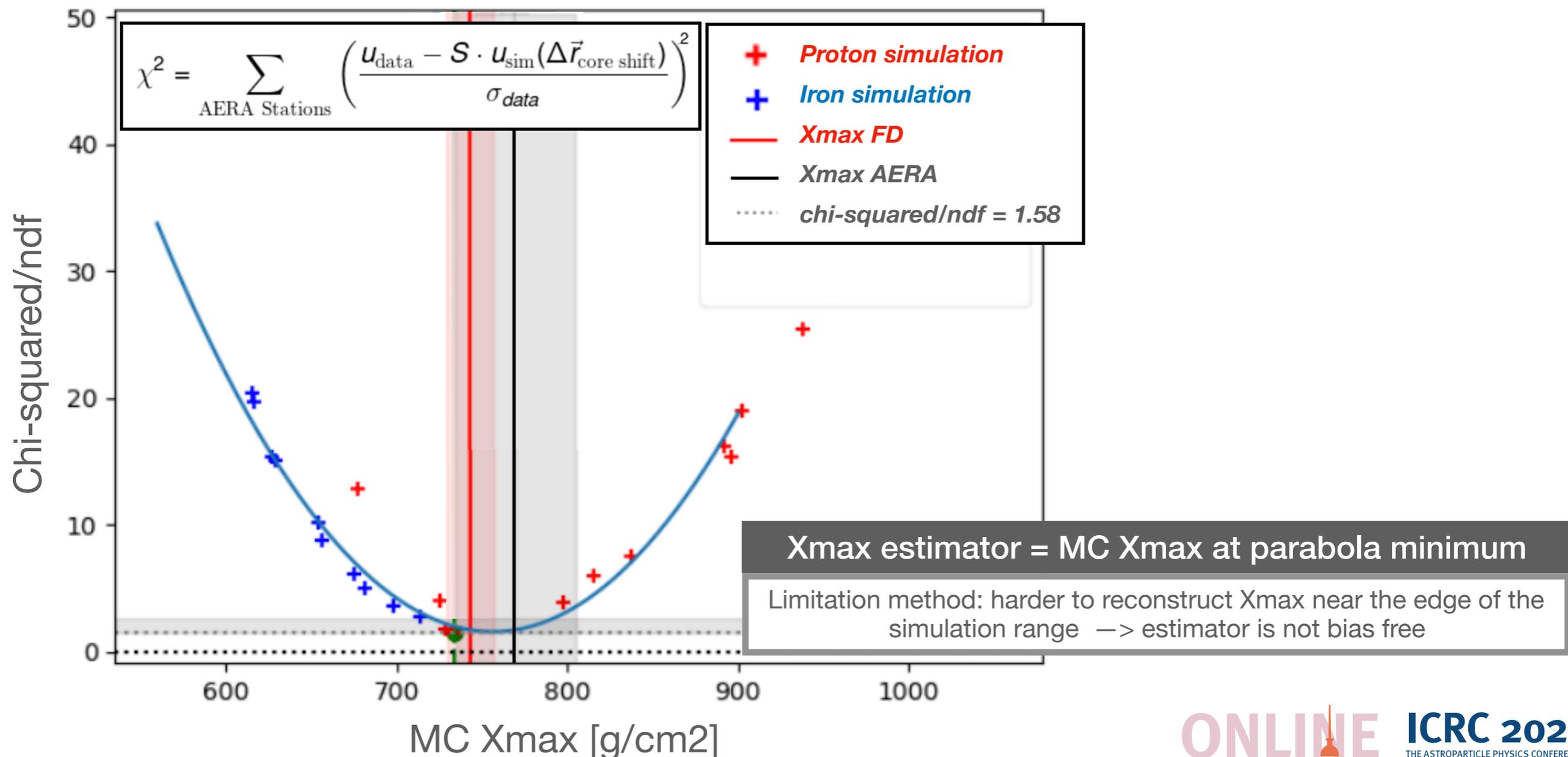
$u$  : energy density [eV/m<sup>2</sup>]

$S$  : scale factor for syst. & SD energy uncertainty

$\Delta r$  : shift for AERA core uncertainty

# Method: Xmax from data-sim matching

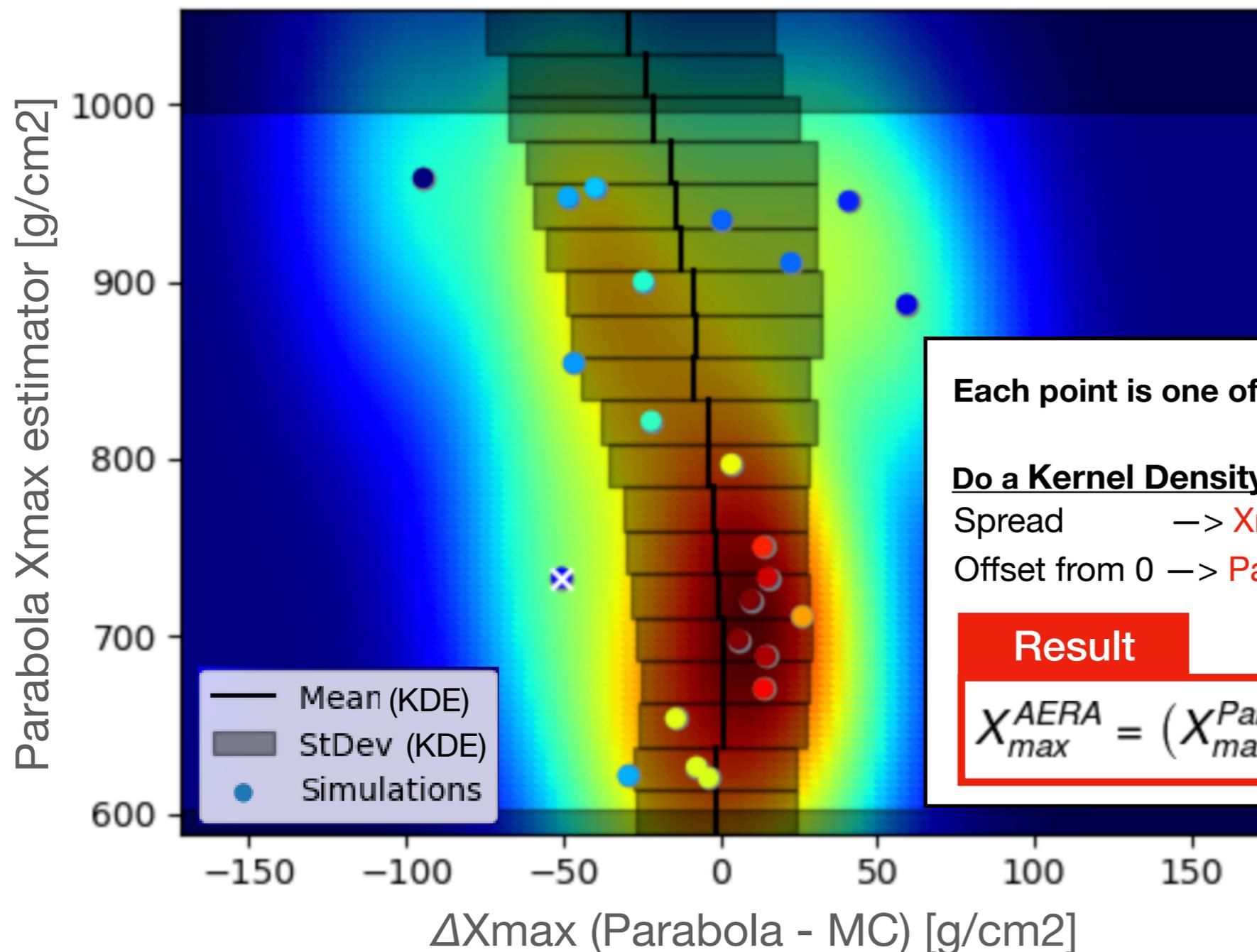
**Step 2/3) Chi-squared minimisation** procedure with free *core shift* ( $\Delta r$ ) and *Energy scaling* ( $S$ )  
Fit parabola around the minimum. (based on 'Lofar method'. Buitink et al. 2014)



# Method: Xmax from data-sim matching

**Step 3/3) Q: “How well can the method reconstruct MC truth for this event?”**

**Error estimation** and **Parabola-bias estimator** from reconstruction of each of the 10Fe+15p simulations (*including measured Noise*) just like data would be reconstructed.



Each point is one of 10Fe+15p simulations reconstructed.

**Do a Kernel Density Estimator:**

Spread → Xmax uncertainty estimator  $\sigma X_{max}^{KDE}$

Offset from 0 → Parabola-Xmax-bias correction  $\Delta X_{max}^{KDE}$

**Result**

$$X_{max}^{AERA} = (X_{max}^{Parabola} + \Delta X_{max}^{KDE}) \pm \sigma X_{max}^{KDE}$$