

**PIERRE  
AUGER**  
OBSERVATORY

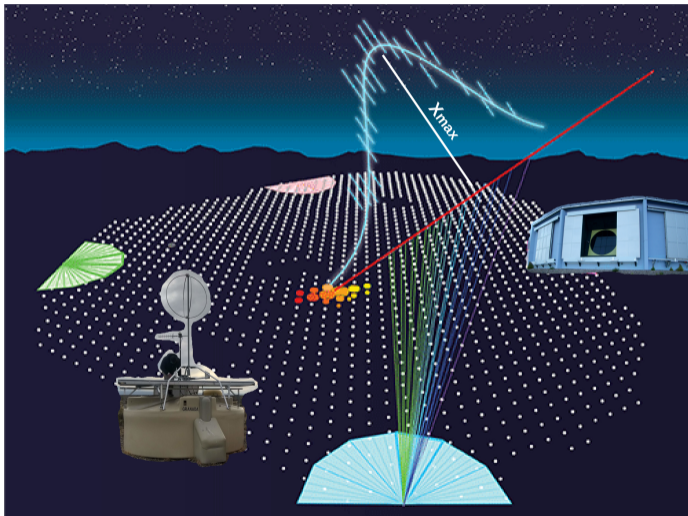
# Mass composition of Ultra-High Energy Cosmic Rays

► latest results from Pierre Auger Observatory

ICHEP 2024 - Prague  
July 20

**Thomas Fitoussi** on behalf of the Pierre Auger Collaboration

# Pierre Auger Observatory



## Hybrid detection

- ▶ Fluorescence Detector (FD)
  - ▶ 27 fluorescence telescopes at 4 different places
  - ▶  $4 \times 6$  looking "down" → high energy
  - ▶ 3 looking "up" (HEAT) → high energy
- ▶ Surface Detector (SD)
  - ▶ 1660 water tanks with photo-multipliers
  - ▶ Auger Prime upgrade: scintillators + radio detectors for SD

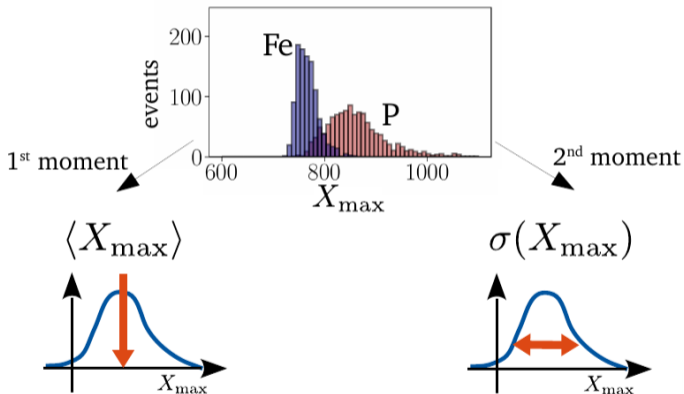
# Inferring mass composition

## Mass composition

$$X_{\max} \sim \ln A$$

## But ...

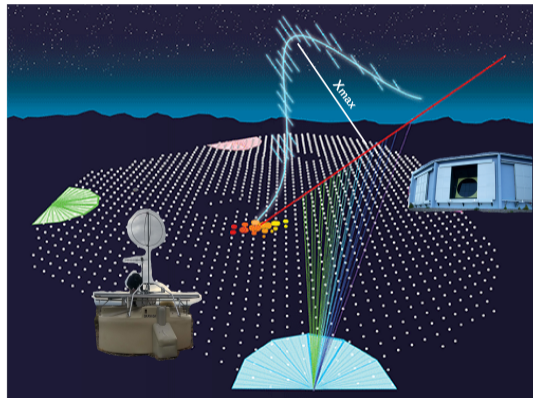
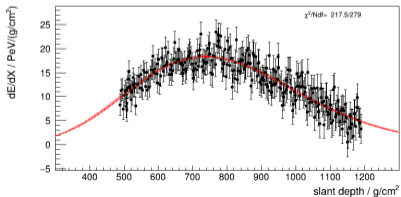
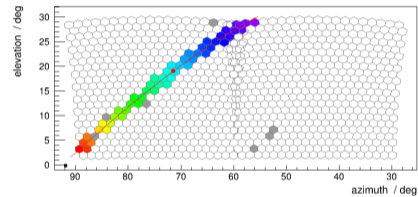
- ▶ Shower-to-shower fluctuations  $\Rightarrow X_{\max}$  vary for the same particle
- ▶ can only infer  $\langle X_{\max} \rangle \sim \langle \ln A \rangle$  and  $\sigma^2(X_{\max}) \sim \sigma^2(\ln A)$



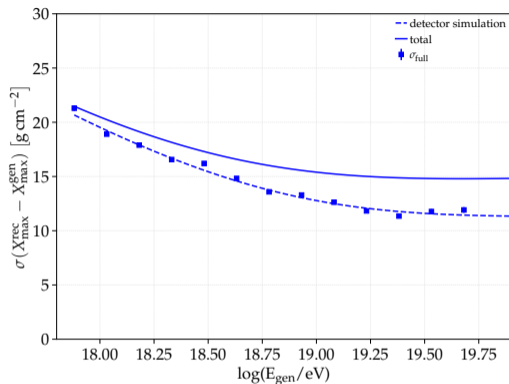
# Reconstructing $X_{\max}$

## With FD

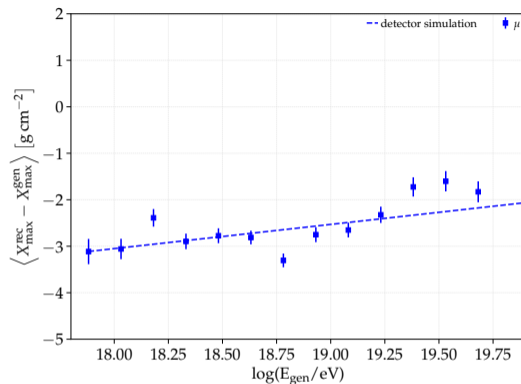
- ✓ Direct access to  $X_{\max}$
- ✗ Duty cycle 10-15% → limited statistic



# $X_{\max}$ bias and resolution

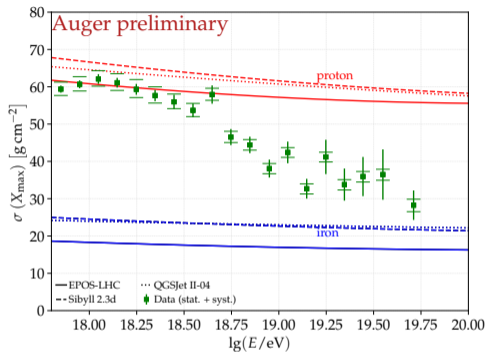
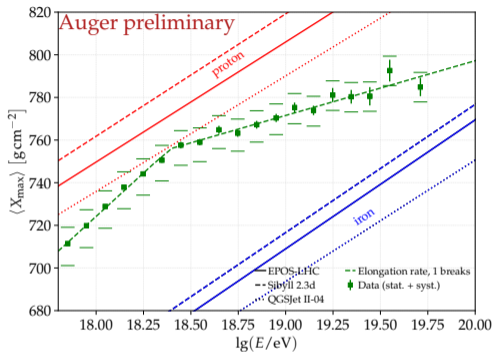


► Total resolution 10  $\rightarrow$  23  $\text{g cm}^{-2}$



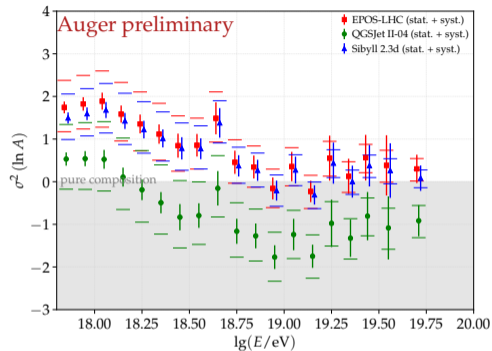
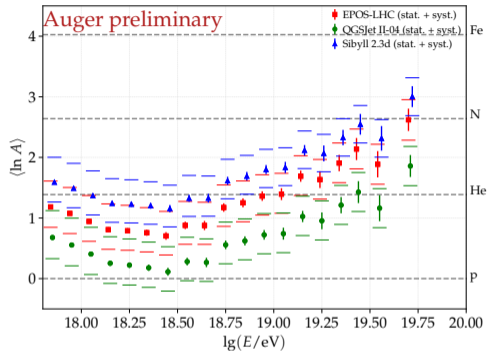
- $X_{\max}$  bias  $\sim -2 / -3 \text{ g cm}^{-2}$
- Systematic uncert.  $\sim \pm 10 \text{ g cm}^{-2}$   
 $\Rightarrow$  small fluctuations of  $X_{\max}$  bias negligible

# Composition from FD



- ▶ ICRC23 results (75210 events)
- ▶ Elongation rate best fitted with 1 break at  $\sim 10^{18.4} \text{ eV}$

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- ▶ ICRC23 results (75210 events)
- ▶ Elongation rate best fitted with 1 break at  $\sim 10^{18.4}\text{eV}$
- ▶ QGSJet II-04 in tension with data

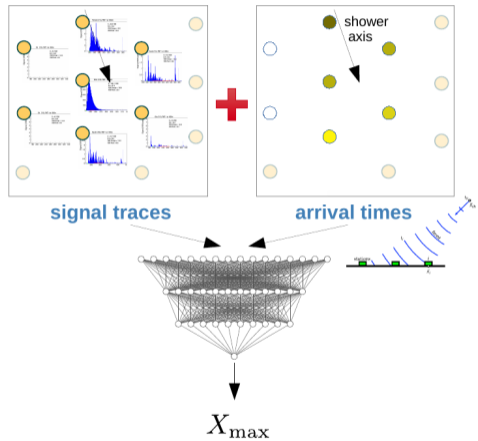
# Reconstructing $X_{\max}$

## With SD

- ✗ No direct access to  $X_{\max}$
- ✓ Duty cycle  $\sim 100\%$   $\rightarrow$  large statistic
- ▶ Reconstruct  $X_{\max}$  on event level
- ▶ Cross-calibration with FD
- ▶ Train using MC library (EPOS-LHC)

## DNN architecture

- ▶ process time-dependent signal traces using recurrent networks (LSTMs)
- ▶ process shower footprint  $\rightarrow$  exploit symmetry of the SD using hexagonal convolutions





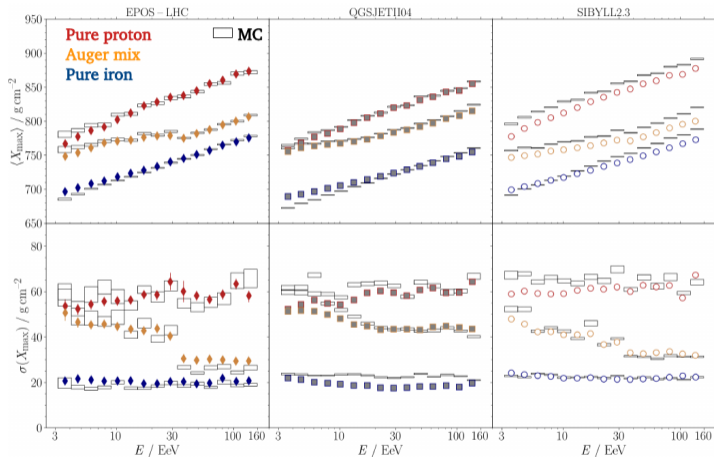
# Performance on simulations

## Interaction model bias

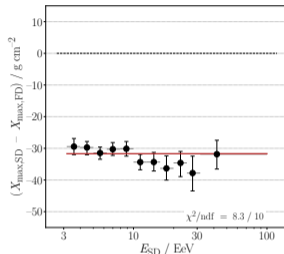
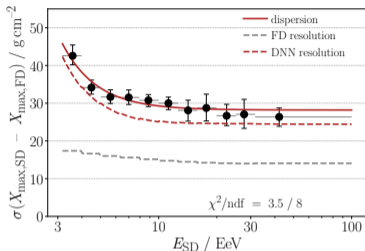
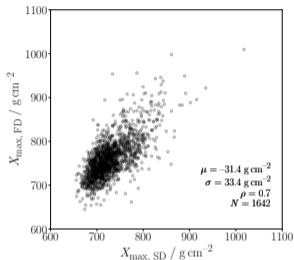
- ▶ 1<sup>st</sup> moment
  - ▶ QGSJet  $-5\text{g}/\text{cm}^2$
  - ▶ Sybill 2.3d  $-12\text{g}/\text{cm}^2$
- ▶ 2<sup>nd</sup> moment
  - ▶ no strong dependency

## Composition bias

- ▶ small for Auger mix
- ▶ for proton and iron, small beyond 10EeV



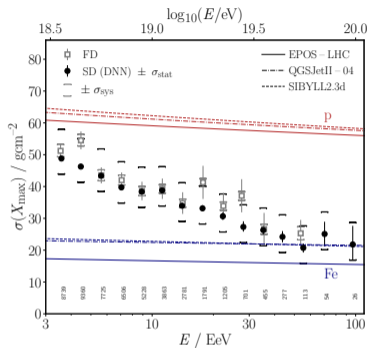
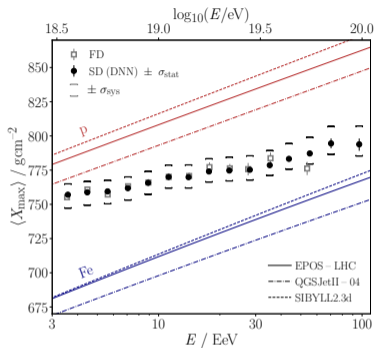
# Calibration to hybrid data



- ▶ Calibration of DNN predictions using Golden hybrid data (1642 events)
- ▶ Strong correlation ( $\rho = 0.7$ )
- ▶ Resolution  $40 \rightarrow 25 \text{ g/cm}^2$

- ▶ Bias between SD and FD  $\sim -30 \text{ g/cm}^2$ 
  - ▶ larger than expected from simulations
  - ▶ could be due to 'muon puzzle' / detector simulations
  - ▶ perform energy-independent calibration

# Application to SD-1500 data

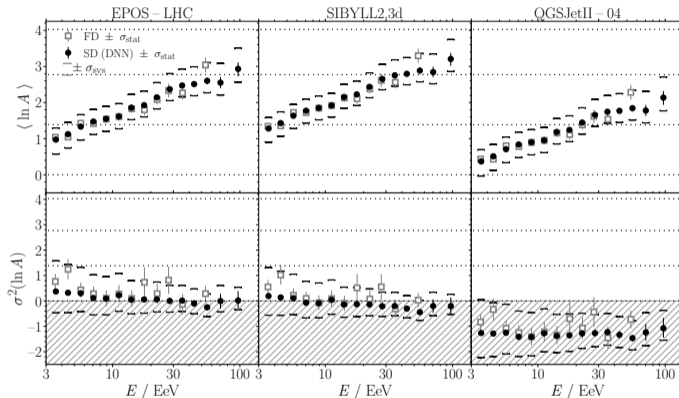


## SD-1500 data

- ▶ High-quality selection
- ▶ 48824 events ( $\times 10$  FD in the same energy range)

- ▶ Excellent agreement with FD
- ▶ transition from lighter to heavier and purer composition

# Interpretation using interaction models



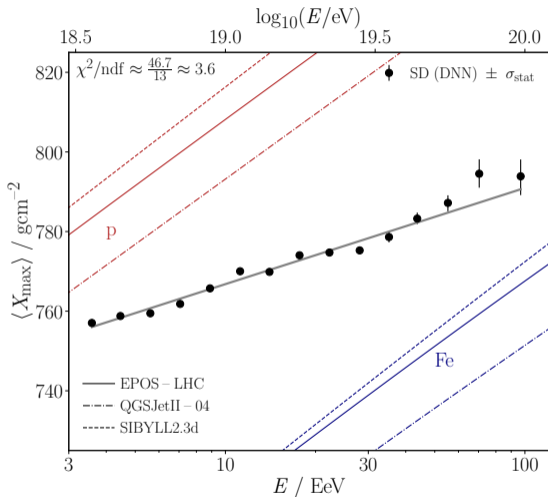
► Sybill 2.3 and EPOS-LHC

► consistent with SD and FD

► QGSJet II-04

► Disfavored by SD and FD

# Indication for changes in the elongation rate

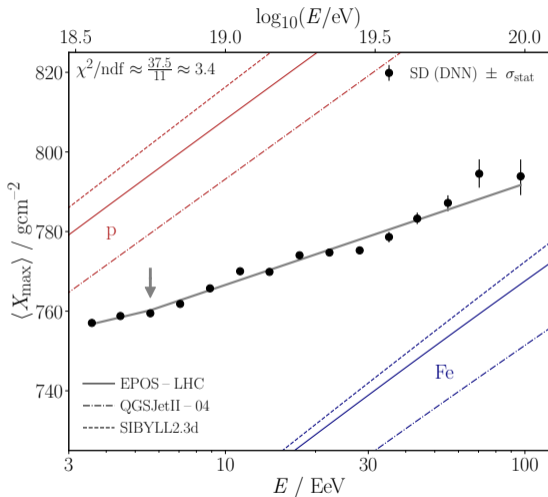


► Constant elongation rate compatible with FD results

$$D_{10,SD} = 24.1 \pm 1 \text{g/cm}^2,$$

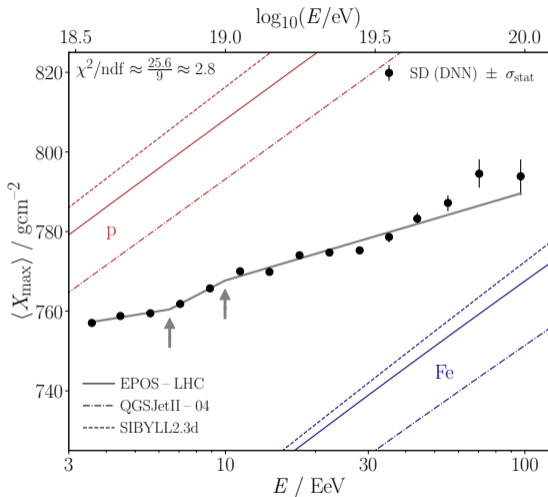
$$D_{10,FD} = 25.6 \pm 2 \text{g/cm}^2$$

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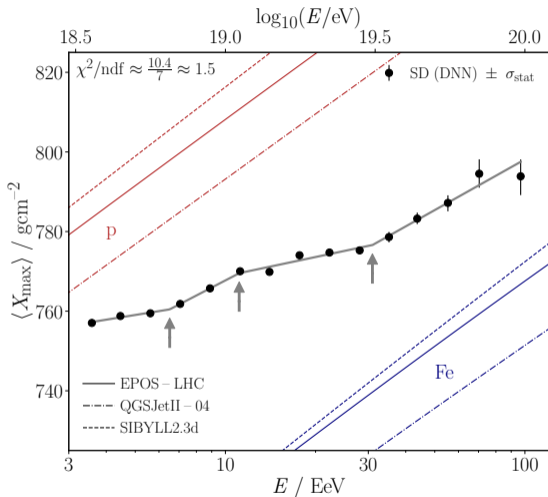
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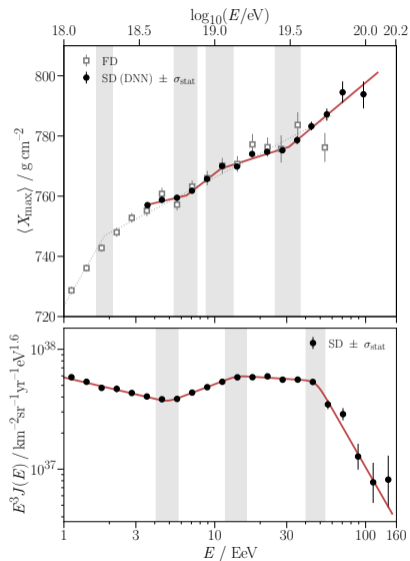
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- ▶ Evidence for structure beyond
- ▶ Constant elongation rate rejected with  $4.6\sigma$
- ▶ One break rejected with  $4.4\sigma$
- ▶ Two breaks rejected with  $3.3\sigma$

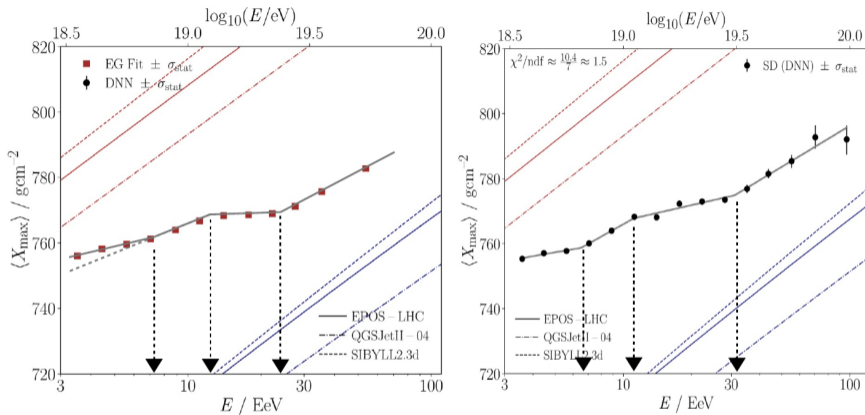


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- ▶ Evidence for structure beyond
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- ▶ Found kinks coincide with spectrum features

# Comparison to astrophysical model



- ▶ Extragalactic fit of Auger data (JCAP05(2023)024)
- ▶ Prediction from astrophysical model derived with FD data
- ▶ Find similar breaks, position of measured features agrees with predictions

# Summary

- ▶ Derive UHECR composition using FD and SD  $X_{\max}$ 
  - ▶ FD and SD measurement are in good agreements
  - ▶ transition from light to heavy with mixed composition ( $< 10^{18.4}$  eV, FD)
  - ▶ transition to heavier and purer composition ( $> 10^{18.4}$  eV, FD and SD)
- ▶ Measurement of  $X_{\max}$  with SD statistics
  - ▶ 10-fold increase in statistics beyond 5 EeV compare to FD
  - ▶ evidence: structure beyond constant elongation rate ( $4.6\sigma$ )
  - ▶ found kinks positioned at energy spectrum breaks

## Further information

- ▶ SD  $X_{\max}$ :  
[10.48550/arXiv.2406.06319](https://arxiv.org/abs/10.48550)  
[10.48550/arXiv.2406.06315](https://arxiv.org/abs/10.48550)
- ▶ FD  $X_{\max}$  paper soon to be published

