

# Introduction to projects

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# Data Analysis

- These slides are on indico!
- The Pierre Auger Collaboration has released 10% of its data for the general public.
- If this was an independent detector, it would be the 3<sup>rd</sup> largest cosmic ray observatory ever built (almost as much data as the telescope array has taken)
- <https://opendata.auger.org>

# What you will do in groups of 4-5

- Use Jupyter notebooks to perform analyses on:
  - The energy calibration
  - The energy spectrum
  - The depth of maximum of shower development
  - The proton air cross section
  - The ultra high energy cosmic-ray sky
- Naturally we expect you to read and understand the corresponding papers and go beyond the standard analyses in the prepared notebooks!
- You will have 2 hours today, 2.5 hours tomorrow and 1 hour on Wednesday to work on the project
- Finally, each group will discuss its results in 5 minute presentations on Wednesday
  - The discussions will be evaluated and eternal fame and small prizes will be available to the winning group!

# Groups and Projects

Angevaare, Joran Bianchi, Antonella Boer, Bob Gupta, Vikas	Hoeve, Jaco ter Maggiore, Ricardo Meijer, Quirijn Missio, Marion Moskvitina, Polina	Ó Fearraigh, Brían Rosas Torres, Francisco Tapia, Enzo Hofman, Bas Seneca, Jordan	Ammerman, Juan Arneman, Dylan van Barel, Marten Biolchini, Alice Boer, Jan de	Bolognani, Carolina Brookes, Emily Degens, Jordy Dongen, Jesse van Eeden, Thijs Juan van
Feng, Zhuoran Flierman, Maricke Galati, Maria Domenica Gatius, Clara Greeven, Lex	Gupta, Pawan Janquart, Justin Jung, Bouke Karkout, Osama Kip, Jochem	Kortmann, Bryan Leinonen, Walter Lukashenko, Valeriia Magni, Giacomo Mitchell, Alexandra	Muller, Rasa Narola, Harsh Pang, Peter Perry, Jon Puecher, Anna	Qiu, Shi Rehult, Anders Saharan, Mohit Weelden, Gijs van Wolfs, Zef
The energy calibration	The energy spectrum	The depth of maximum of shower development	The proton air cross section	The ultra high energy cosmic-ray sky

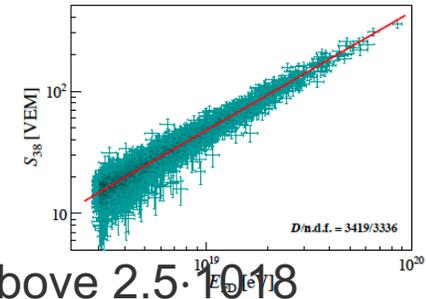
## Energy Calibration:

### 1. Read the paper (up to section IV)

Pierre Auger Collaboration [A. Aab et al.], "A measurement of the cosmic ray energy spectrum above  $2.5 \cdot 10^{18}$  eV using the Pierre Auger Observatory", Phys. Rev. D. 102 (2020) 062005. DOI:

<https://doi.org/10.1103/PhysRevD.102.062005>

arXiv: <https://arxiv.org/abs/2008.06486>



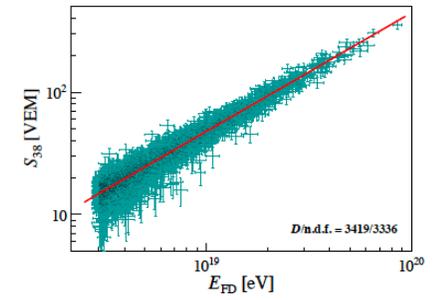
### 2. Explore the notebook:

Q1: What are the  $S(1000)$  and  $S_{38}$  parameters? Which one is a better energy estimator and why? Why 1000 and 38 and not some other numbers?

Q2: What energy is “missed” in the FD calorimetric energy ( $fd\_calEnergy$ ), on which shower observables does it depend? Make a plot of the missed energy as a function of these variables. What particles are missed in FD energy but not (so much) in SD?

Q3: A parametrization of the shower-to-shower fluctuations in SD is given as a function of FD energy. Make a plot of this variable and comment on the shape. Where do these fluctuations come from?

## Energy Calibration:



### 3. Extend the notebook:

Q4: Can you observe any bias of the SD energy with respect to  $X_{max}$  as measured by the FD? If so, what would be the explanation?

### 4. Reflect on results:

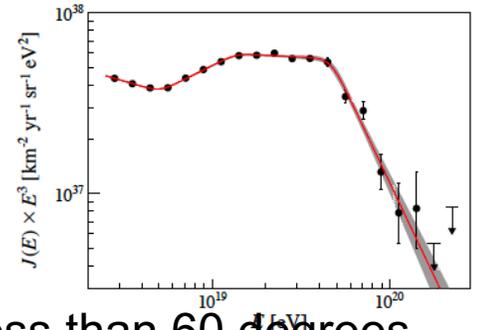
Q5: Can you do a better energy calibration? What would you need for that?

Q6: How could the AugerPrime upgrade (with a scintillator detector and a radio detector on top of the water Cherenkov detectors) help with the energy calibration?

# The Energy Spectrum

Read the paper: Phys. Rev. D 102, 062005 (2020)

<https://journals.aps.org/prd/pdf/10.1103/PhysRevD.102.062005>



## Preliminaries:

Q1: Calculate the aperture of a single hexagon in Auger, given that the zenith angle is less than 60 degrees

Q2: Calculate the full exposure of 1 year of Auger, assuming no holes in the detector

## Explore the notebook:

Q3: Familiarize yourself with S1000 and S38; Show that S1000 is not a good energy estimator for the surface detector and S38 is

Q4: Verify that S38 does not change over time. Why is this important?

Q5: Create the energy spectrum; see if you can fit this according to the 6-parameter fit described in the article (eqn 8) What is the significance of the dropoff at the highest energies?

## Beyond the notebook:

Q6: Create the spectrum for different zenith angles, similar to Fig 11 of the spectrum article. Is there a dependence of the spectrum wrt the zenith angle?

Q7: Create a spectrum for the Galactic plane, and compare this off-plane. Discuss the results and why this could be interesting

## The Future

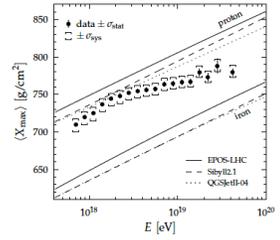
Q8: How can this measurement be improved using the upgraded Pierre Auger Observatory (with a scintillator detector and a radio detector on top of the water Cherenkov detectors)?

## Depth of the Shower Maximum:

Read the paper:

[Physical Review D 90 \(2014\) 122005 \(arxiv\)](https://arxiv.org/abs/1308.1713)

<https://journals.aps.org/prd/abstract/10.1103/PhysRevD.90.122005>



Explore the notebook:

Systematic checks:

Q1: Does the  $X_{\text{max}}$  measurement depend on the zenith angle In the lowest energy bin?

Q2: Apply the correction for the FD acceptance as a function of  $X_{\text{max}}$  and energy to the  $X_{\text{max}}$  distributions and show the  $X_{\text{max}}$  and  $\sigma(X_{\text{max}})$  distributions including this correction.

## Depth of the Shower Maximum:

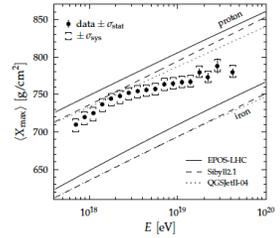
### Extend the notebook:

#### Interpretation:

Q3: The  $X_{\max}$  and  $\sigma(X_{\max})$  data points above  $E > 10^{19}$  eV are neither on the proton, nor on the Fe curves. What are the possible scenarios for the composition in that case? Are the scenarios compatible between the  $X_{\max}$  and  $\sigma(X_{\max})$  measurements?

Q3: Assume a pure composition in terms of one nucleus type. Determine the nucleus type as a function of energy and as a function of EPOS-LHC, Sybill2.3c and QGSJetII-04 hadronic interaction models, for both  $X_{\max}$  and  $\sigma(X_{\max})$ . Are the  $X_{\max}$  and  $\sigma(X_{\max})$  results compatible?

Q4: Assume a composition of only proton and iron nuclei. Determine the fractions of p and Fe nuclei as a function of energy and as a function of EPOS-LHC, Sybill2.3c and QGSJetII-04 hadronic interaction models, for both  $X_{\max}$  and  $\sigma(X_{\max})$ . Are the  $X_{\max}$  and  $\sigma(X_{\max})$  results compatible?



### Reflect on the results:

Q5: Devise a composition scenario that is compatible with both  $X_{\max}$  and  $\sigma(X_{\max})$  measurements.

### The future:

Q6: What is needed to extend the  $X_{\max}$  measurement to higher energies?

Q7: What is needed to extend the composition measurement to higher energies?

## p-Air cross section:

Read the paper: Phys.Rev.Lett. 109 (2012), 062002

<https://journals.aps.org/prl/abstract/10.1103/PhysRevLett.109.062002>

### Explore the data:

Q1: Show the acceptance of the fluorescence telescopes as a function of atmospheric depth for several energy ranges and explain what you see.

Q2: Show the mean of the distribution of  $X_{\max}$  as a function of energy and compare it to the publications of the Pierre Auger Observatory on this topic.

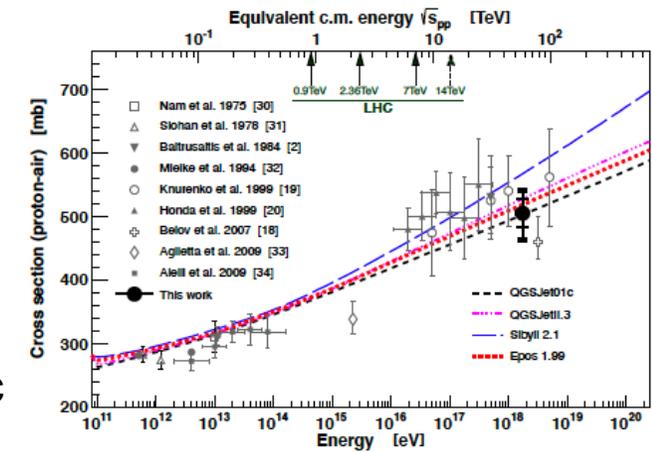
### Systematic checks:

Q3: Repeat the analysis, but divide the zenith angle ( $\theta$ ) range in two sets  $\theta < 35$  degrees and  $\theta > 35$  degrees

Q4: In the notebook a fixed energy range is chosen, you could repeat the analysis for different energies. Scan with a fix-sliding window of  $\log_{10}(E/\text{eV}) = 0.2$  through the full energy range and repeat the analysis. What do you observe & why?

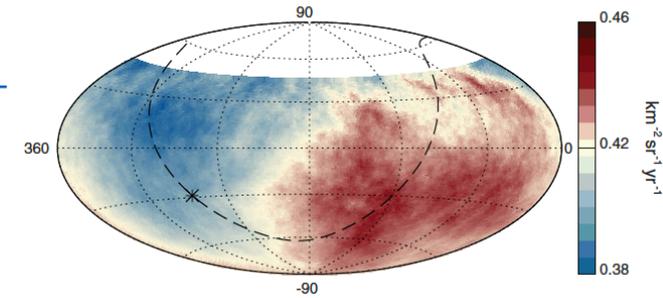
### The future:

Q5: What is needed to improve upon this measurement? Both consider experimental and theoretical arguments ...



## The ultra-high energy cosmic ray sky

Read the paper: [The Pierre Auger Collaboration \(2017\), Science 357, 6357, 1266](https://www.science.org/doi/10.1126/science.aan4338)  
<https://www.science.org/doi/10.1126/science.aan4338>



### Preliminaries

Q1: The relative exposure of Auger only depends on declination, why?

### Explore the data:

Q2: Try to see what happens with the significance of the Rayleigh analysis as function of the energy cut

Q3: What happens in the 2D-plot when you change the top-hat smearing?

### Beyond the notebook:

Q4: Create an analysis based upon the distance to CEN-A; modify opening angles and energy cuts within reason. Take exposure into account

Q5: Using the optimal cuts of the previous analysis what significance do you get in the 2D plot in Galactic coordinates.

Q6: Try to estimate the maximum significance, taking the “look elsewhere” effect into account

### The Future:

Q7: How can this measurement be improved using the Auger upgrade (with a scintillator detector and a radio detector on top of the water Cherenkov detectors)?