

Università degli Studi di Torino Scuola di Scienze della Natura Dipartimento di Fisica



Tesi di Laurea Magistrale

# Measurement of the energy spectrum of cosmic rays between 0.3 EeV and 30 EeV with data of the Infill array of the Pierre Auger Observatory

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# Outline

- Introduction about cosmic rays (CRs) and the energy spectrum
- The Pierre Auger Observatory (PAO) detectors
- SD event: energy reconstruction steps using Infill data of the PAO

  - Estimation of the shower size
     Correction for attenuation in atmosphere
     Energy Calibration

### Measurement of the energy spectrum

- $\begin{cases} \cdot & \text{Exposure computation} \\ \cdot & \text{Unfolding procedure} \rightarrow \text{Unfolded spectrum} \end{cases}$
- Evaluation of systematic uncertainties
- Combination of vertical spectra measured with the PAO ۶
  - $\rightarrow$  spectrum in the energy region of transition from galactic to extra-galactic CRs  $(\sim 10^{17} \text{ eV} - \sim 10^{19} \text{ eV})$

# **Cosmic rays**

Cosmic rays are particles that reach the Earth's upper atmosphere from outside

#### Primary cosmic rays:

- > p, e<sup>-</sup>, H<sup>+</sup>, He<sup>++</sup> and heavier elements,  $\gamma$ ,  $\nu$
- > Accelerated at astrophysical sources
- Energies up to ~10<sup>20</sup> eV
- Interaction with atmospheric nuclei and production of secondary cosmic rays
  - Extensive Air Showers (EAS)



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#### Secondary cosmic rays:

- Electromagnetic component: electrons, positrons and photons from decays of charged and neutral mesons.
- Muonic component: muons and muonic neutrinos from decays of K<sup>±</sup> and π<sup>±</sup>
- Hadronic component : fragments like p, n, π, K (remnants of the primary CR).



# **Physical quantities**

Information about sources and propagation of CRs obtained from 3 physical quantities

- Arrival direction : The flux is isotropic: charged CRs → deflected by magnetic fields in the interstellar medium (expecially at low energies)
- 2) <u>Mass composition</u>: Different abundances of light and heavy components at different energies
- 3) **Energy** : Energy spectrum reconstruction



# The energy spectrum

- Transition region between galactic and extra-galactic origin
- Onset of the extra-galactic (EG) component
- Theoretical models: different predicted transition energies  $\rightarrow$  open astrophysical problem



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#### Mixed composition model

Mixed composition E\_\_\_=Z.10<sup>20.5</sup> eV 10<sup>25</sup> E<sup>3</sup>Φ(E) (eV<sup>2</sup>m<sup>-2</sup>s<sup>-1</sup>sr1) 10<sup>24</sup> Uniform B=2.3 10<sup>23</sup> SFR 6=2.1 19 20 20.5 18.5 19.5 17.5 18 17 log<sub>10</sub>E eV

• EG component : mixed composition

- EG component : mainly protons ( <10-15% of heavier nuclei allowed)</li>
- Transition at ~ 7 · 10<sup>17</sup> eV

• Transition at ~  $3 \cdot 10^{18} \text{ eV}$ 

(similar to the galactic one)

**Hybrid detector** located in Argentina, near Malargue, studying ultra-high energy cosmic rays (**UHECR**)

Surface detector (SD) + Fluorescence detector (FD)



Surface detector (SD) + Fluorescence detector (FD)

duty cycle ~100%

duty cycle ~15%

#### Observables in a hybrid detector:



Hybrid events : those observed by both detectors

# **SD** event reconstruction

> EAS triggering the Infill array  $\rightarrow$  stations register sizes (S [VEM]) and times of signals



• Reconstruction of the Lateral Distribution Function (S vs radial distance from the core)

$$S(r) = S_{450} \frac{r}{450 m} \left( \frac{r + r_1}{450 m + r_1} \right)^{\beta} (\frac{r}{450 m + r_1})^{\beta}$$

signal at the optimal distance of  $r_{opt}$  = 450 m

# **SD** event reconstruction

> EAS triggering the Infill array  $\rightarrow$  stations register sizes (S [VEM]) and times of signals



• Correction for attenuation in atmosphere:

Costant Intensity Cut  $S_{450}(E,\theta) \longrightarrow estimator S_{35}(E)$ 

Energy calibration: S<sub>35</sub> → energy E

$$E(S_{35}) = A \cdot \left(\frac{S_{35}}{VEM}\right)^B$$
 A= 12.87 · 10<sup>15</sup> eV  
B= 1.0128

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# **Event selection**

Data used for this analysis:

#### Events collected with SD-750 from 01/08/2008 to 29/02/2016

#### Criteria of data section:

- Good reconstruction level
  - $\rightarrow$  well reconstructed lateral distribution function
- 6T5 trigger
  - → detector with the highest signal sourrounded by a working hexagon.



$\mathbf{Cuts}$	N. of events after cuts	
-	$2 \ 983 \ 081$	
RecLevel=3	$2 \ 976 \ 894$	
Τ4	$2 \ 976 \ 472$	
T5	1 814 083	
$\theta < 55^{\circ}$	1 771 158	
Bad Periods	1 695 363	

- Zenith angle  $\theta$  lower than 55°
  - $\rightarrow$  full efficiency above the  $E_{_{thr}}$  = 3  $\cdot\,10^{17}\,eV$
- Rejection of events in bad periods

#### 1 695 363 events for the updated Infill spectrum

# **Correction for attenuation in atmosphere**

# Attenuation of showers in atmosphere

**Isotropy of cosmic ray flux**  $\longrightarrow$  Above the full efficiency threshold  $E_{thr}$ :  $\frac{dI}{dcos^2\theta} = const$ 

 $S_{\rm 450}~$  is the shower size estimator from the LDF fit



The attenuation function  $CIC(\theta)$  is defined as third degree polynomial :

 $CIC(\theta) = 1 + a \cdot x(\theta) + b \cdot x^{2}(\theta) c \cdot x^{3}(\theta) \qquad x = \cos(\theta)^{2} - \cos(\theta_{ref})^{2} \qquad \theta_{ref} = 35^{\circ}$ 

- Events divided in 10 cos<sup>2</sup>θ bins of equal size
- A cut at **1500 events** is chosen  $\longrightarrow S_{450}^{cut}$ : 1500 events with  $S_{450} > S_{450}^{cut}$  in that bin



Integral event distributions :

The attenuation function  $CIC(\theta)$  is defined as third degree polynomial :

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#### Estimated parameters:

a	$1.62 \pm 0.04$	
b	$-1.486 \pm 0.103$	
С	$-2.0 \pm 0.5$	
$\mathbf{S}_{35}^{ ext{ cut}}$	$(45.2 \pm 0.2) \text{ VEM}$	
$\chi^2/ u$	0.69	



# Measurement of the energy spectrum

# **Geometrical exposure**

Above the energy threshold of full trigger efficiency  $(3 \cdot 10^{17} \text{ eV})$ :

• Hexagonal cell area (d=750 m) :

$$A = \frac{\sqrt{3}}{2}d^2$$

- Selection of events with zenith angle between  $0^\circ$  and  $55^\circ$  :

$$\Omega = \int_{0}^{2\pi} d\phi \int_{0^{\circ}}^{55^{\circ}} d\theta \cos(\theta) \sin(\theta)$$

• Effective cell area:

$$A_{6T5} = A \cdot \Omega = 1.02375 \ km^2 \cdot sr$$

• Integrating over time :

$$\Sigma = \int dt \, A_{6T5} \cdot N(t)$$

**Total exposure:** 

$$(192\pm 6)$$
 km<sup>2</sup>·sr·yr





### **Observed energy spectrum**

• Calibration :  $S_{35} \rightarrow energy$ 

$$J_{raw}(E) = \frac{dN}{\Sigma \cdot dlog_{10}(E)}$$

[*The Pierre Auger Observatory: Contributions to the 34th International Cosmic Ray Conference (ICRC 2015)*]



# **Observed energy spectrum**



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#### Unfolding procedure to obtain the unfolded flux



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 $J_{raw}^{theo}(E') = \int dE K(E, E', \sigma(E), \epsilon(E), bias(E)) \cdot J_{unfol}^{theo}(E)$ 

### Unfolding procedure to obtain the unfolded flux

$$J_{raw}(E') \xrightarrow{\text{fit}} J_{raw}^{theo}(E') \xrightarrow{K} J_{unfol}^{theo}(E) \xrightarrow{C(E)} J_{unfol}(E)$$

$$Migration matrix: K(E,E',\sigma(E),\epsilon(E)) = \frac{1}{\sqrt{2\pi}\sigma(E)} \cdot \exp(-\frac{1}{2}(\frac{E'-E}{\sigma(E)})^{2}) \cdot \epsilon(E)$$

$$J_{raw}^{theo}(E') = \int dE K(E,E',\sigma(E),\epsilon(E),bias(E)) \cdot J_{unfol}^{theo}(E)$$

$$\bullet \text{ Fit of } J_{raw} \xrightarrow{} \text{Parameters that minimize } -\log(L) = \sum_{i} \mu_{i} - n_{i} \log \mu_{i}$$
Bin i: n\_{i} observed number of events
$$\mu_{i} \text{ expected number of events in } J_{raw}^{theo}(E') \xrightarrow{} \text{Obtained inserting parameters in } J_{unfol}^{theo}(E)$$

$$\bullet J_{raw}^{theo}(E') = J_{unfol}^{theo}(E)$$

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$$\longrightarrow J_{raw}^{\text{theo}}(E') = J_{unfol}^{\text{theo}}(E)$$

• <u>Correction factor</u>:  $C(E) = \frac{J_{unfol}^{theo}(E)}{J_{raw}^{theo}(E')} = \frac{J_{unfol}(E)}{J_{raw}(E')} \longrightarrow J_{unfol}(E)$ 

### **Unfolded spectrum**



# **Systematic uncertainties**

### Energy dependent uncertainties:

• Systematic from unfolding correction :

the uncertainty on the correction factor C(E) propagates to the unfolded flux

 $J_{unfol}(E) = J_{raw}(E') \times C(E)$ 

### Statistical and systematic

#### uncertainties from calibration :

- From energy bias
  - From comparison with an alternative calibration function

[A. Schulz. for the Pierre Auger Collaboration, Internal note 2016]

### **Energy independent uncertainties:**

- Systematic from exposure : 3%
- Systematic from weather and geomagnetic corrections : 3.5%

Quadratic sum : Total systematic uncertainty



# **Vertical spectrum**



- Data from SD-1500 (main array)
- Collected between January 2004 and February 2016
- $E > 3 \cdot 10^{18} eV$ ,  $\theta < 60^{\circ}$
- Good statistics at the highest energies
- Exposure:

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 $(48000 \pm 2000) \, km^2 \cdot sr \cdot yr$ 

- Systematic uncertainties:
  - 5% from exposure
  - 3.5% from weather and geomagnetic correction

# **Vertical spectrum**



Fit function :

Broken power law with a smooth suppression at high energies

$$\int \begin{cases} J(E) = J_0 \left(\frac{E}{E_a}\right)^{-\gamma_1} & E < E_a \\ J(E) = J_0 \left(\frac{E}{E_a}\right)^{-\gamma_2} \left(1 + \left(\frac{E_a}{E_s}\right)^{\Delta \gamma}\right) \left(1 + \left(\frac{E}{E_s}\right)^{\Delta \gamma}\right)^{-1} & E > E_a \end{cases}$$

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# **Combination of vertical spectra**

Maximimum likelihood method to take into account the statistical and systematic uncertainties

Likelihood to maximize:

$$L = \prod_{k=1}^{2} \prod_{i=1}^{N_{k}} L_{k}^{Norm} \cdot L_{i,k}^{Poisson} \cdot L_{i,k}^{Nuisance} \qquad \begin{array}{c} \mathsf{k=1} & \mathsf{SD-750} \\ \mathsf{k=2} & \mathsf{SD-1500} \end{array}$$

$$L_k^{Norm} = \frac{1}{\sigma_k \sqrt{2\pi}} \cdot e^{-\frac{(a_k - 1)^2}{2\sigma_k^2}}$$

- $\sigma_{k} \rightarrow$  energy independent systematic errors
- $a_{\mu} \rightarrow normalization factor$



- $v_{i,k} \rightarrow$  nuisance parameters
- $n_{i,k} \rightarrow observed number of events$
- $\sigma_{i\,k} \rightarrow$  energy dependent systematic errors

### **Combined vertical spectrum**



- Combined flux J : weighted mean
- Systematic uncertainty : weighted mean
- Statistical uncertainty : propagation

$$J(E) = J_0 \left(\frac{E}{E_a}\right)^{-\gamma_1} \qquad E < E_a$$
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# **Conclusions and prospects**

• Infill spectrum reconstruction :

**Constant Intesity Cut** 

Energy calibration

**Unfolding**  $\rightarrow$  unfolded spectrum

*new parametrization already published* 

new

- Combination of vertical spectra taking into account the systematic uncertainties
  - energy spectrum from 3 · 10<sup>17</sup> eV to few 10<sup>20</sup> eV



- Describe the spectrum with a function with a smooth change of slope at the ankle energy
- Combination with the other data samples from Auger (inclined and hybrid spectra)
- Comparison with other experimental results (KG, lceTop, TA)

# **Conclusions and prospects**

• Infill spectrum reconstruction :

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# **Grazie per l'attenzione**

### Surface Detector (SD)

- $\rightarrow$  Estimation of arrival direction, shower core position and shower size
- Duty cycle of ~100 %
- SD calibration → signals expressed in VEM (Vertical Equivalent Muon)

#### **Fluorescence Detector (FD)**

- $\rightarrow$  Estimation of calorimetric energy and  $\mathbf{X}_{_{max}}$
- Duty cycle of ~15 % (clear and moonless nights)
- FD calibration : absolute and relative



Hybrid events : those observed by both detectors

The attenuation function  $CIC(\theta)$  is defined as third degree polynomial :

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The  $\cos^2\theta$  distribution is <u>uniform</u> selecting events above any  $S_{35}^{>}>S_{35}^{cut}$ 

• CIC performed at different cut values on the number of events

 $\rightarrow$  different energy (=S<sub>35</sub><sup>cut</sup>) values

•  $\cos^2\theta$  distributions for selected events





CIC parameters obtained with different cuts on the number of events (=  $S_{35}^{cut}$ )



### **Migration matrix parameters**



 Energy resolution: QGSJET-II.04 simulations with a 50/50 mix of proton and iron primaries

$$\frac{\sigma(E)}{E} = 0.078 + 0.165 / \sqrt{\frac{E}{10^{17 eV}}}$$

### **Raw and unfolded spectra**



## Infill spectrum: plots of residuals

$$J_{theo}(E) = J_0 \left(\frac{E}{E_a}\right)^{-\gamma_1} \qquad E < E_a$$
$$J_{theo}(E) = J_0 \left(\frac{E}{E_a}\right)^{-\gamma_2} \qquad E > E_a$$



# **Unfolding correction factors**



SD-750

## **Combined spectrum: plots of residuals**

$$J_{theo}(E) = J_0 \left(\frac{E}{E_a}\right)^{-\gamma_1} \qquad E < E_a$$
$$J_{theo}(E) = J_0 \left(\frac{E}{E_a}\right)^{-\gamma_2} \left(1 + \left(\frac{E_a}{E_s}\right)^{\Delta\gamma}\right) \left(1 + \left(\frac{E}{E_s}\right)^{\Delta\gamma}\right)^{-1} \qquad E > E_a$$



# Infille spectrum fit : residual plot

$$J_{theo}(E) = J_0 \left(\frac{E}{E_a}\right)^{-\gamma_1} \qquad E < E_a$$
$$J_{theo}(E) = J_0 \left(\frac{E}{E_a}\right)^{-\gamma_2} \qquad E > E_a$$



# **Combined spectrum: comparison with previous analyses**

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	This work	ICRC-2015	[A. Schulz. for the Pierre Auger Collaboration, Internal note 2016]
Combination	SD-750 + SD-1500	All the four spectra	SD-750 + SD-1500
$\log_{10}(\mathrm{E_a/eV})$	18.68 ± 0.01	18.683 ± 0.006	18.72 ± 0.01
$\gamma_1$	- 3.33 ± 0.02	- 3.29 ± 0.02	- 3.20 ± 0.01
$\gamma_2$	- 2.53 ± 0.04	- 2.60 ± 0.02	- 2.52 ± 0.03
$\log_{10}(\mathrm{E_s/eV})$	19.57 ± 0.03	19.624 ± 0.017	19.56 ± 0.03
$\Delta\gamma$	2.6 ± 0.2	3.14 ± 0.2	2.6 ± 0.2