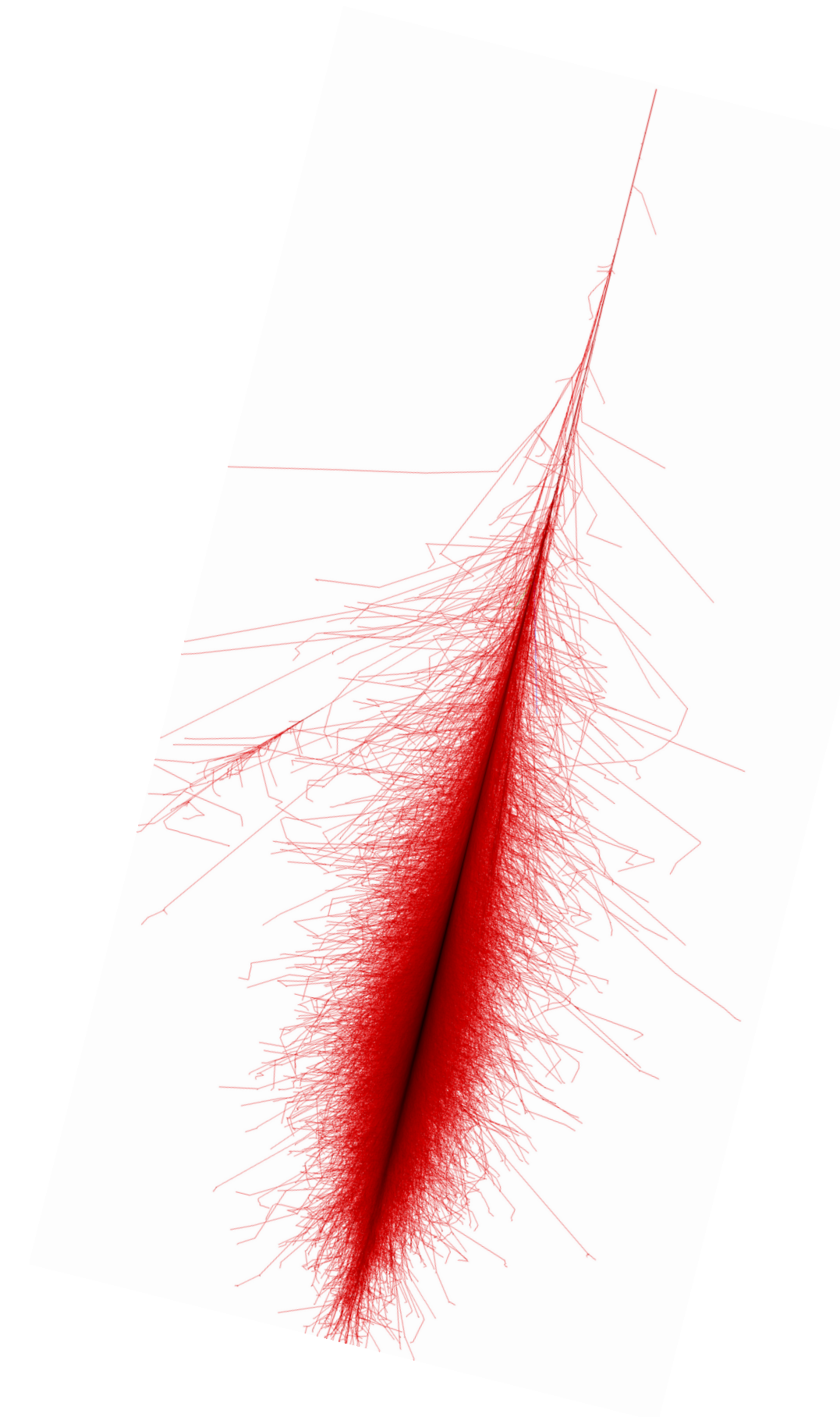


A server rack with blue lighting and fiber optic cables. The rack is filled with server units, each with multiple ports and indicator lights. The lights are predominantly blue, with some yellow and green lights visible. The cables are bundled and connected to the ports. The overall scene is a close-up of the server hardware.

EAS Simulations / Calculations

EAS Simulations

- ▶ Accurate predictions of EAS observables at the ground requires solving the cascade equations numerically or via Monte-Carlo methods
- ▶ Common simulation codes:
 - ▶ CORSIKA (**C**Osmic **R**ay **S**imulations for **K**Ascade)
<https://www.iap.kit.edu/corsika/>
 - ▶ CONEX
<https://www.iap.kit.edu/corsika/>
 - ▶ CoReas (**C**orsika-based **R**adio **E**mission from **A**ir **S**howers)
<https://www.huege.org/coreas/>
- ▶ Handle propagation of particles in the atmosphere
- ▶ Hadronic interactions simulated by "hadronic interaction models"
- ▶ Configuration of input parameters and output format
- ▶ Some inputs already configured during compilation, e.g. hadronic models



CORSIKA

- ▶ Example input/output parameters:
 - ▶ Input "steering file":
 - ▶ Primary energy (range) / mass
 - ▶ Zenith / azimuth (range)
 - ▶ Atmospheric model / depth
 - ▶ Earth magnetic field
 - ▶ ...
 - ▶ Output "DAT file":
 - ▶ Meta information
 - ▶ Particle content at observation level
 - ▶ Energy / momentum
 - ▶ Position
 - ▶ Particle type

```
RUNNR      1
EVTNR      1
NSHOW      1
PRMPAR     14
ESLOPE     -1.0
ERANGE     1e5  1e6
THETAP     0.0  65.0
PHIP       0.0  359.99
SEED       111   0   0
SEED       222   0   0
SEED       333   0   0
OBSLEV     2840.E2
ELMFLG     T   T
RADNKG     2.E5
ARRANG     -120.7
MAGNET     16.75  -51.96
HADFLG     0   1   0   1   0   2
SIBYLL     T   0
SIBSIG     T
ECUTS      0.05000  0.05000  0.01000  0.00200
MUADDI     T
MUMULT     T
LONGI      T   20.   T   F
MAXPRT     0
ECTMAP     100
STEPFC     1.0
DEBUG      F   6   F   1000000
DIRECT     ./
ATMOD      33
EXIT
```

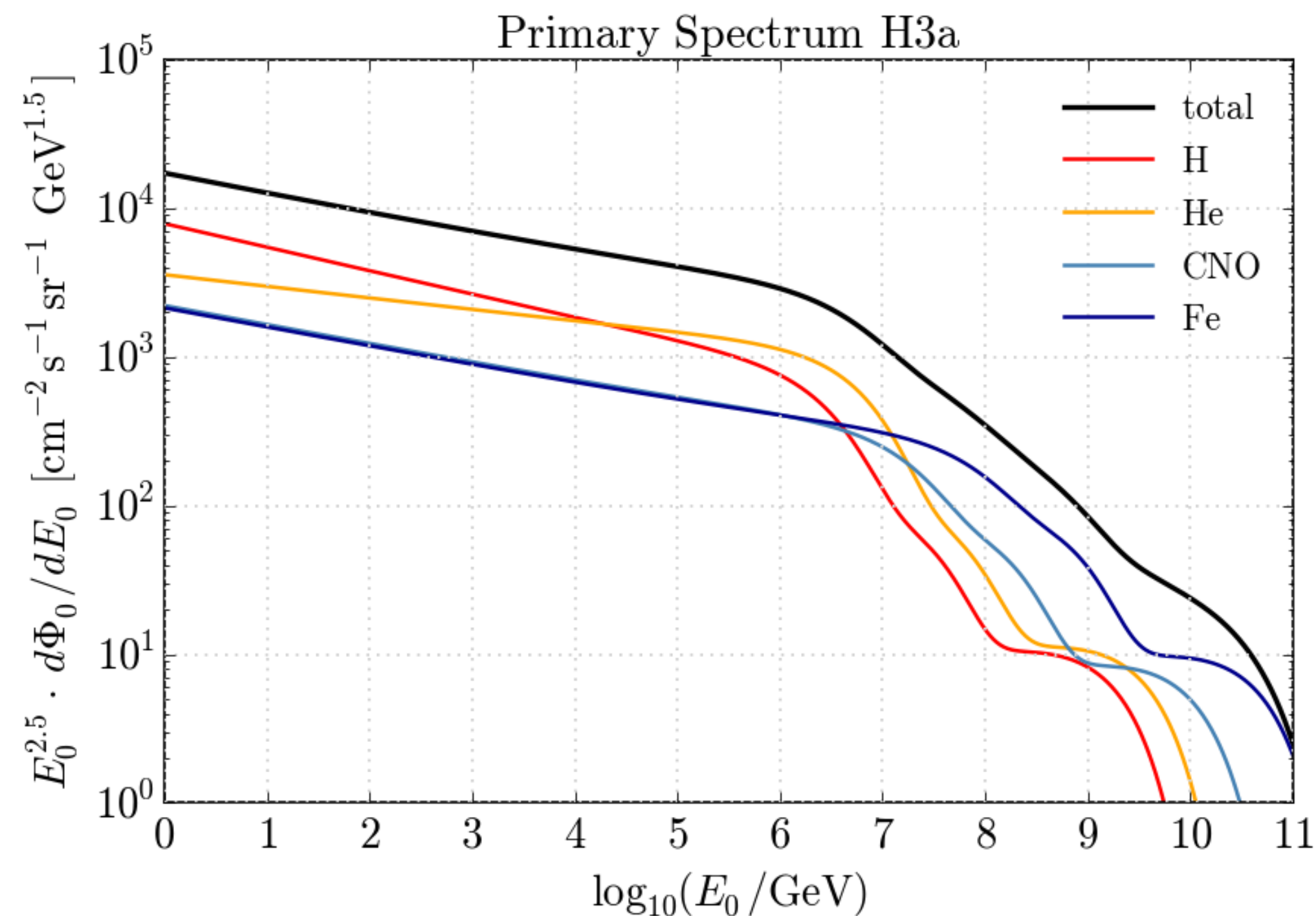
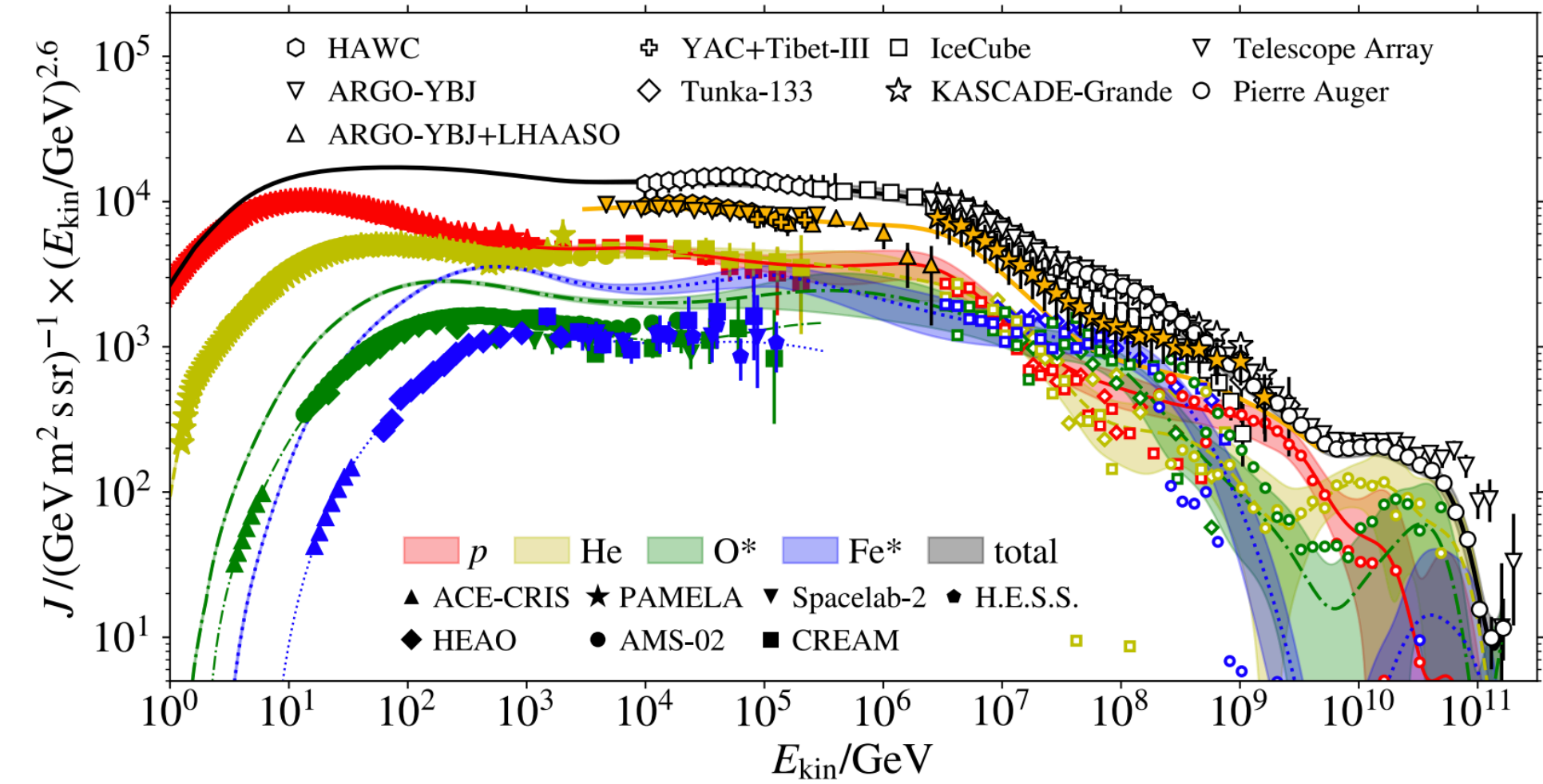
Hadronic Interaction Models

- ▶ Crucial part of EAS simulations is the treatment of hadronic interactions
- ▶ Multi-particle production in the forward region with low momentum transfer
 - ▶ Can not be computed using perturbative quantum chromodynamics (pQCD)!
- ▶ Forward region difficult to measure with current accelerators (too close to the beam)
- ▶ Phenomenological hadronic interaction models are needed!
- ▶ These models are tuned to data from collider/fixed-target experiments and extrapolated to the ranges of phase space relevant for EAS
- ▶ High-energy models ($E > 80 \text{ GeV}$):
 - ▶ Sibyll
 - ▶ EPOS
 - ▶ QGSJet
- ▶ Low-energy models ($E \leq 80 \text{ GeV}$):
 - ▶ Gheisha
 - ▶ Fluka
 - ▶ UrQMD

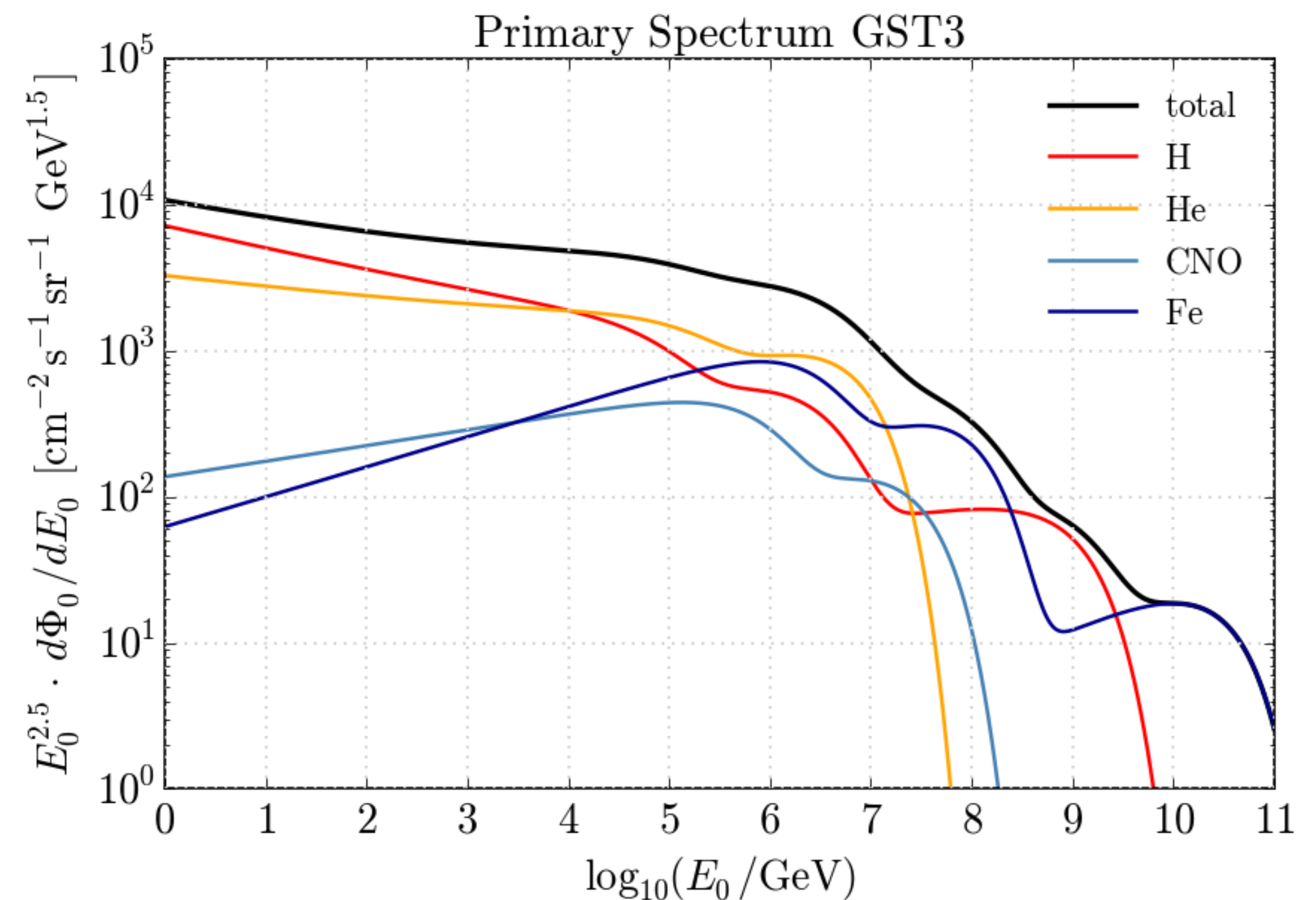
CR Flux Models

[H.P. Dembinski, R. Engel, A. Fedynitch, T. K. Gaisser, F. Riehn, T. Stanev, PoS ICRC2017 (2017) 533]

- ▶ CR flux is important input
- ▶ Models based on fits to data are used
- ▶ Examples: H3a/4a, GST3/4, GSF



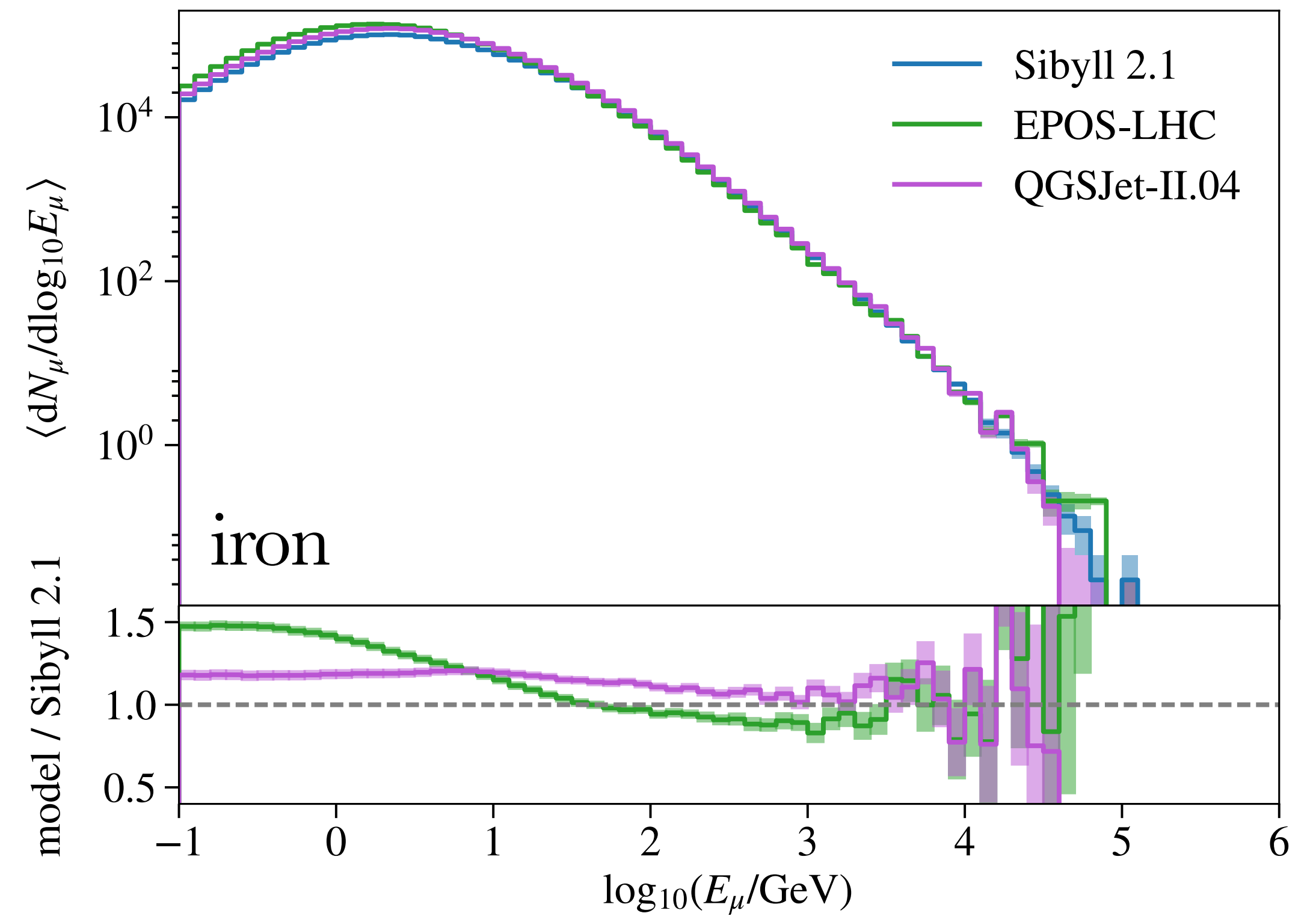
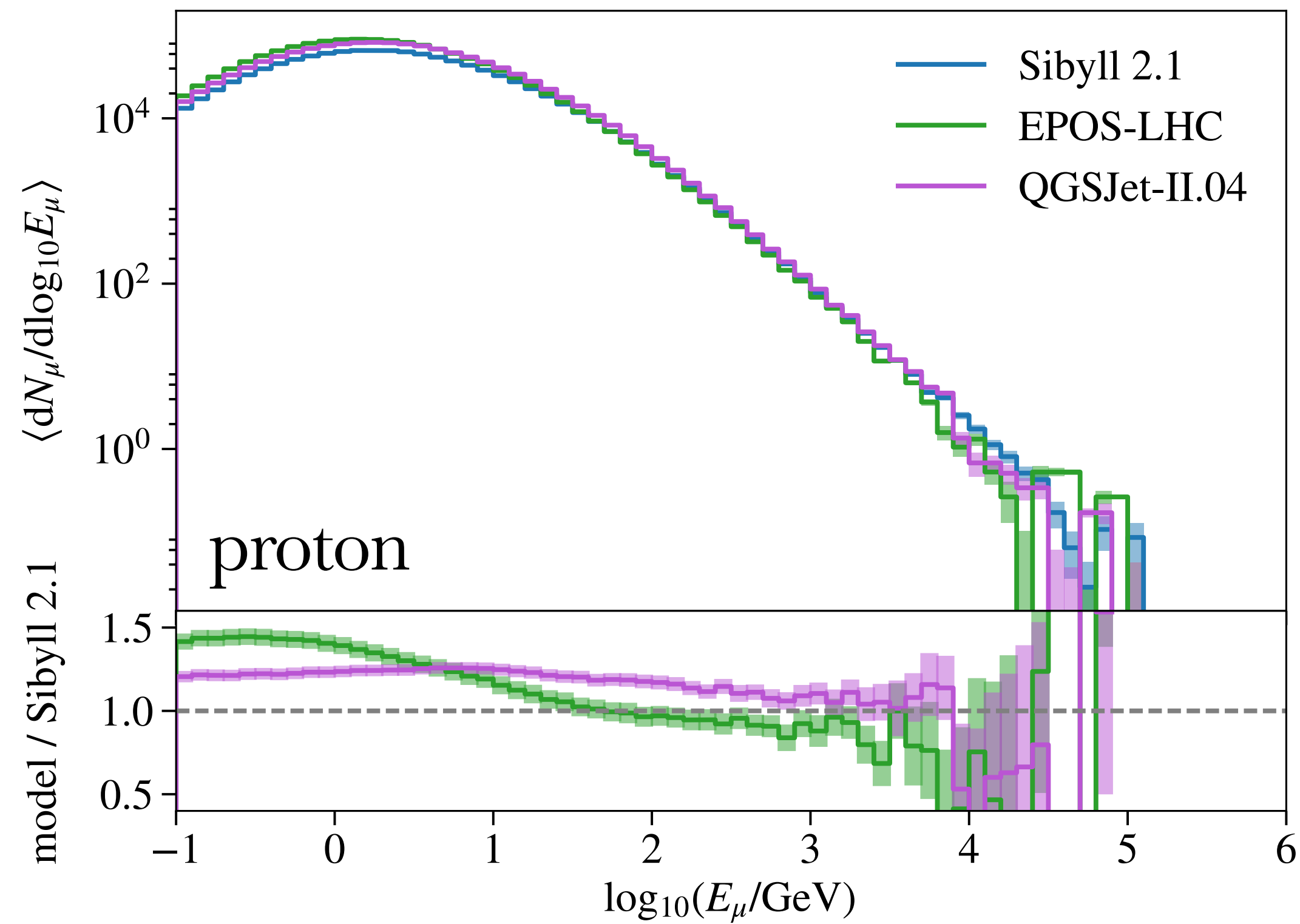
[T. K. Gaisser, Astropart. Phys. 35 (2012)]



[T. K. Gaisser, T. Stanev, S. Tilav, Front. Phys. China 8 (2013)]

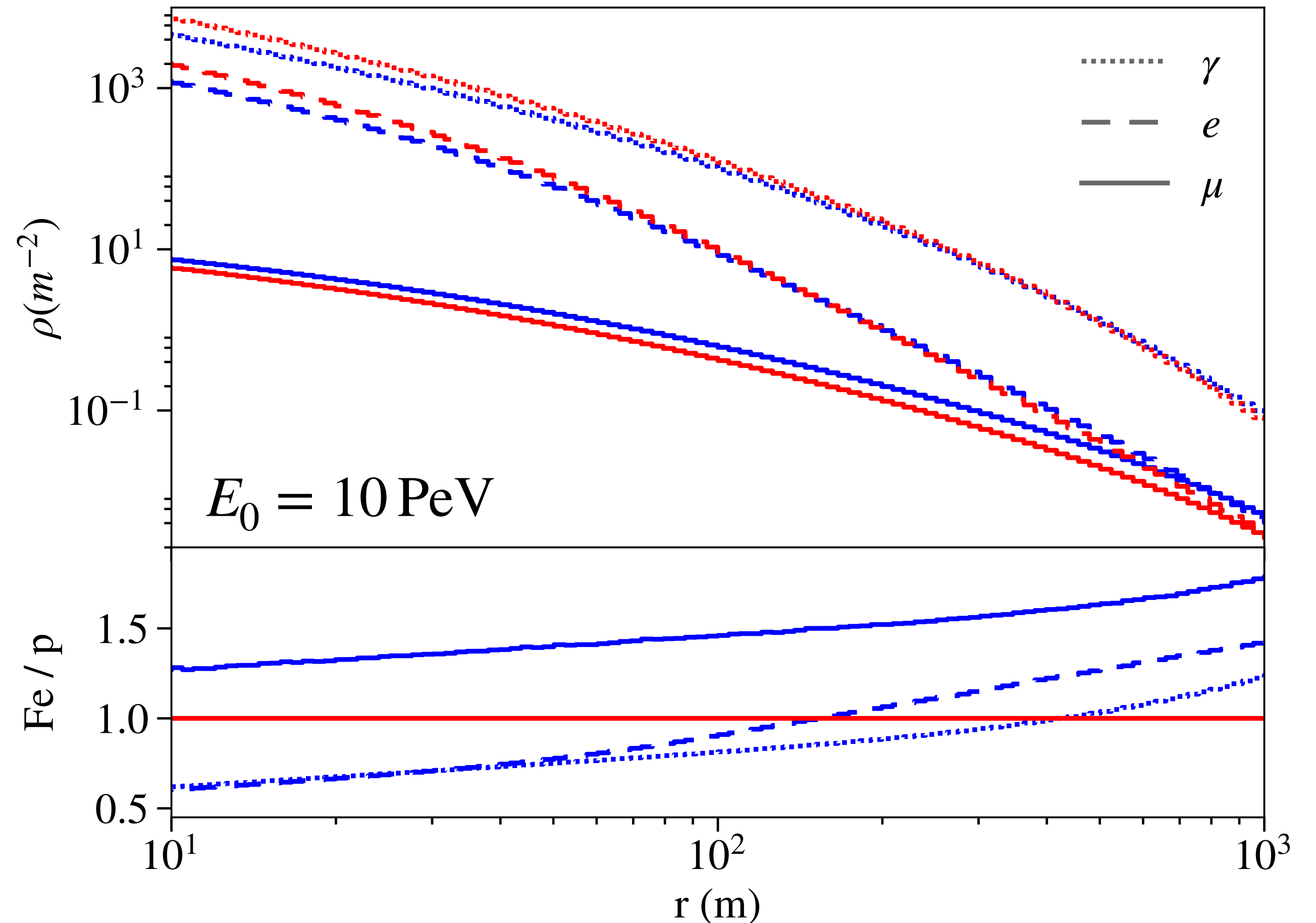
CORSIKA Simulations

- ▶ Muon energy spectra obtained from 3 hadronic interaction models (H3a flux)



CORSIKA Simulations

- ▶ Lateral distribution of
 - ▶ photons, γ
 - ▶ electrons, e^\pm
 - ▶ muons, μ^\pm
- ▶ Muon distribution flatter than EM!
- ▶ Muons dominate at large distances from the shower!
 - ▶ Can be used to select muons
- ▶ Iron showers produce more muons than proton showers!
 - ▶ Can be used to measure CR mass composition



Analytical Approximations

- ▶ Cascade equations can be solved with **Analytical Approximations (AA)**

$$\frac{d\Phi_h(E_h, X)}{dX} = - \left(\frac{1}{\lambda_{\text{int},h}} - \frac{1}{\lambda_{\text{dec},h}} \right) \cdot \Phi_h(E_h, X) + \sum_j \int \frac{E_j \cdot dN_j(E_h, E_j)}{E_h \cdot dE_j} \cdot \frac{\Phi_j(E_j)}{\lambda_{\text{int},j}} dE_j$$

- ▶ Calculation uses spectrum weighted moments ("Z-factors")
- ▶ Z-factors need to be obtained from hadronic interaction models (later more)
- ▶ First-order approximation:

$$\frac{d\Phi_\mu(E_\mu, \theta)}{dE_\mu} = \frac{0.14 \cdot E_\mu^{-2.7}}{\text{cm}^2 \text{ s sr GeV}^{-3.7}} \cdot \left[\left(\frac{1}{1 + 1.1 \cdot E_\mu \cdot \cos(\theta) / \xi_\pi} \right) + \left(\frac{0.054}{1 + 1.1 \cdot E_\mu \cdot \cos(\theta) / \xi_K} \right) + \left(\frac{9.1 \cdot 10^{-6}}{1 + E_\mu \cdot \cos(\theta) / \xi_{\text{prompt}}} \right) \right]$$

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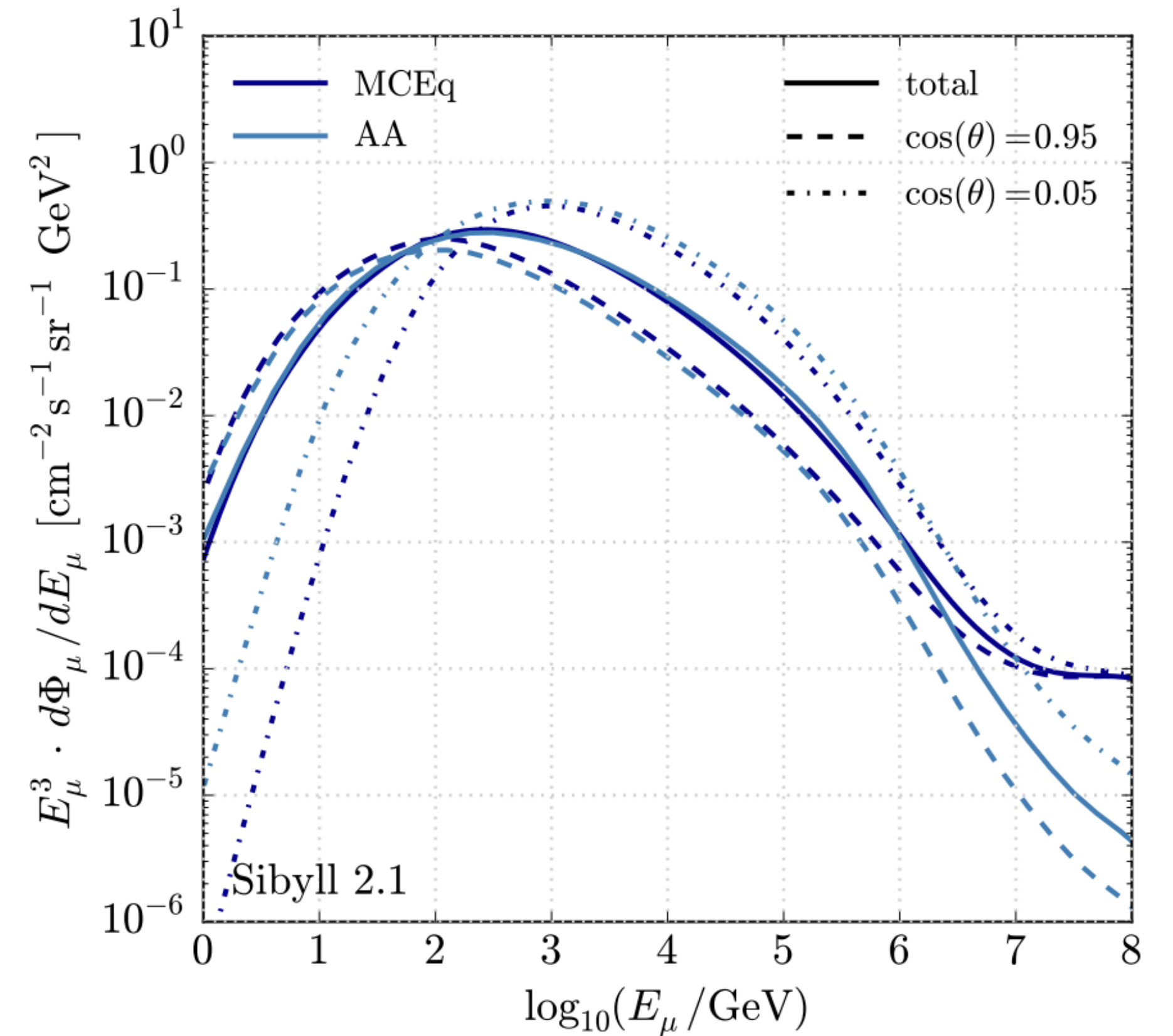
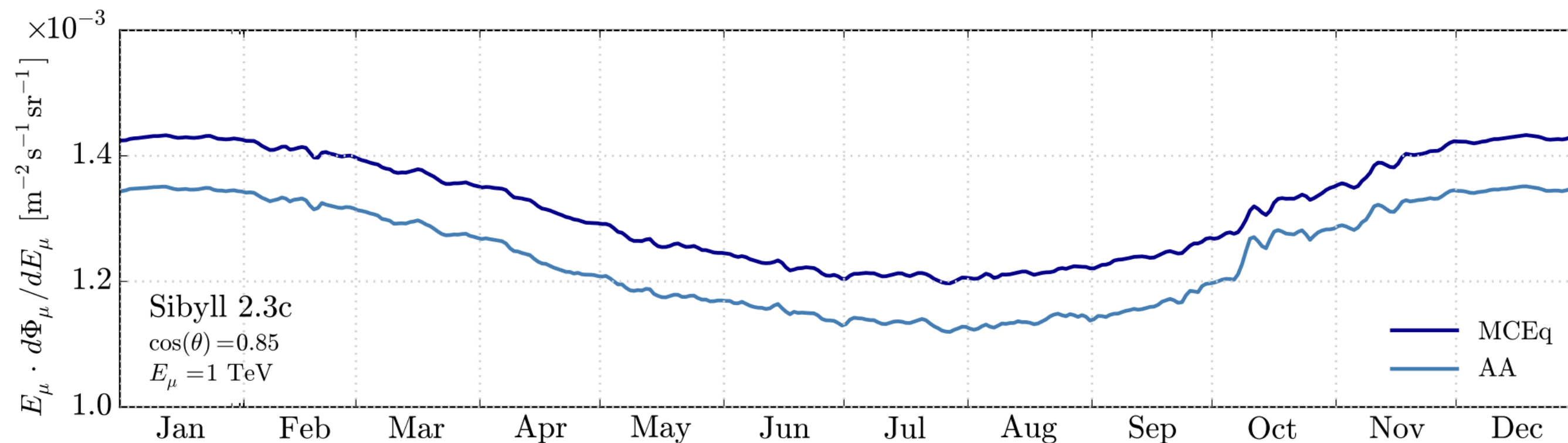
pions
kaons
prompt

conventional

power law!

MCEq

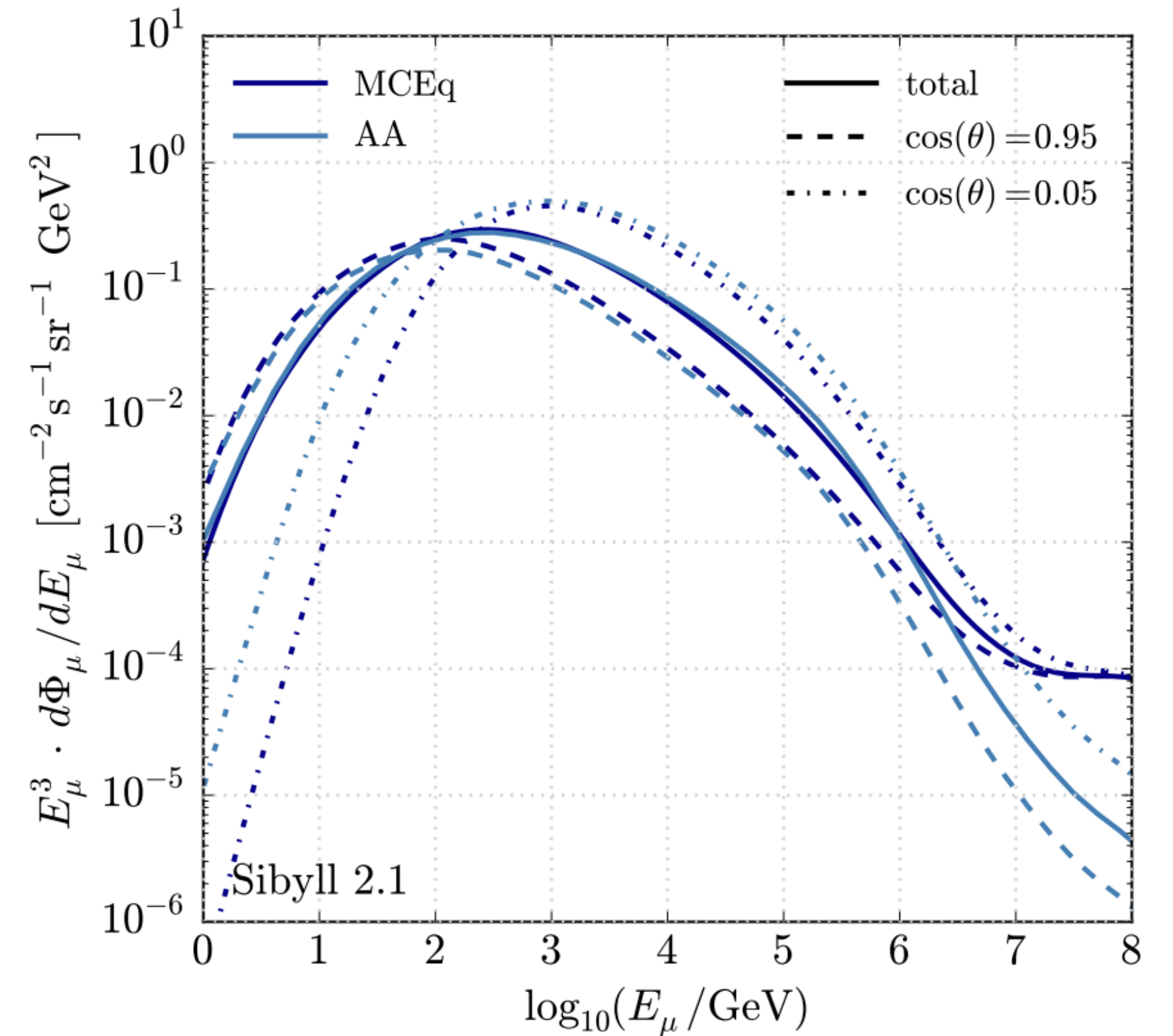
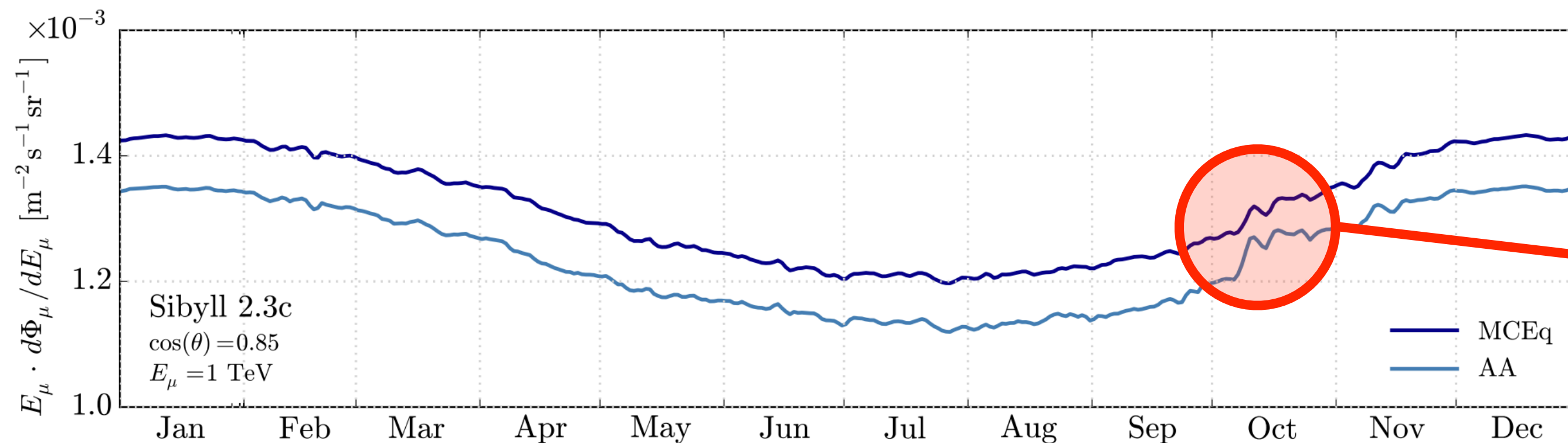
- ▶ **M**atrix **C**ascade **E**quation code (MCEq)
- ▶ Analytical solution of cascade equations
- ▶ Also relies on hadronic model predictions
- ▶ Provides parent particle information
 - ▶ Conventional muons: pion / kaon decays
 - ▶ Prompt muons: short-lived hadron decays
- ▶ "Fairly good" agreement between AA and MCEq



[TK Gaisser, D. Soldin, A. Crossman, A. Fedynitch, PoS ICRC2019 (2020) 893]

MCEq

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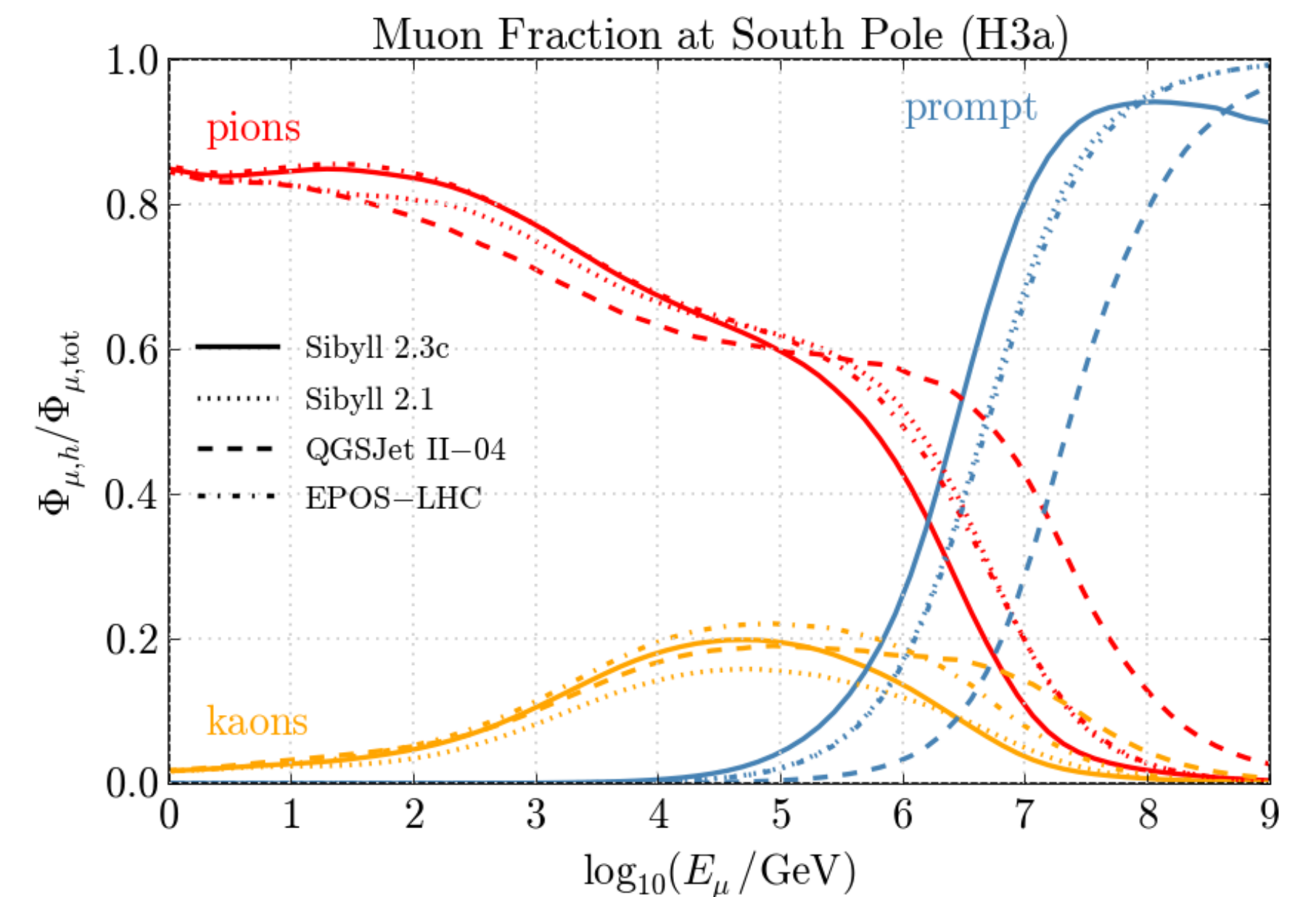
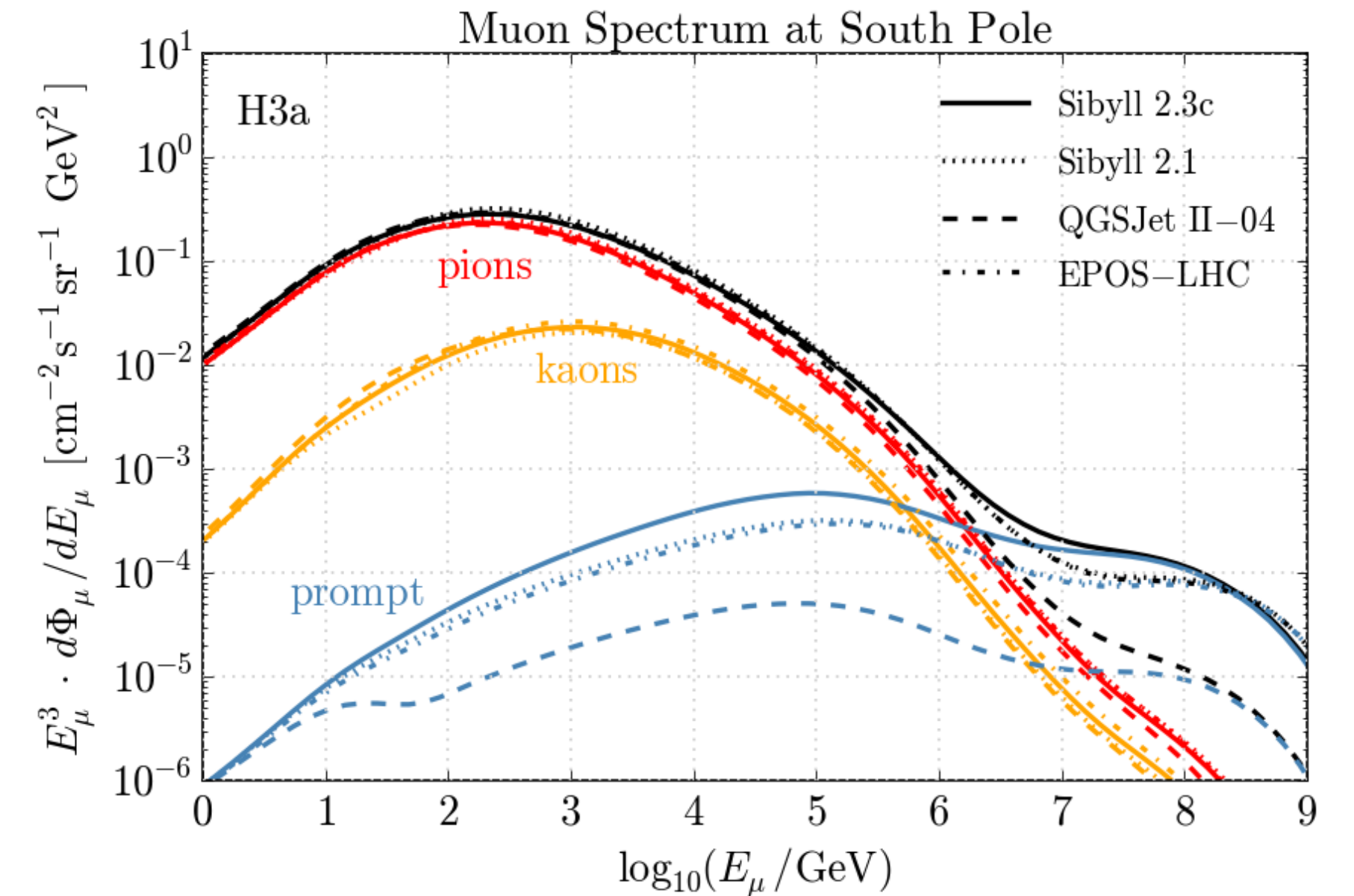
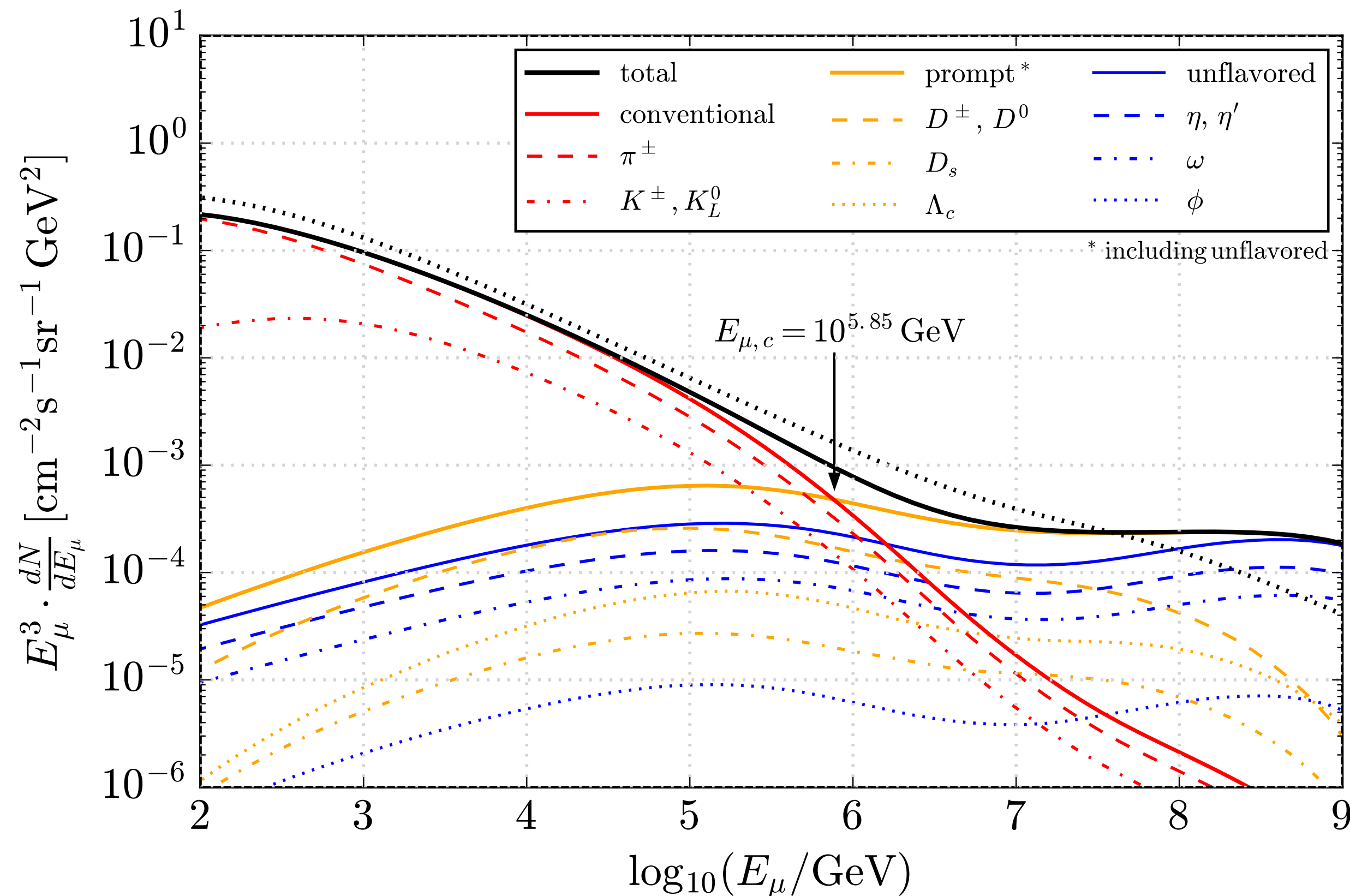


[TK Gaisser, D. Soldin, A. Crossman, A. Fedynitch, PoS ICRC2019 (2020) 893]

effects due to atmosphere!
(later more...)

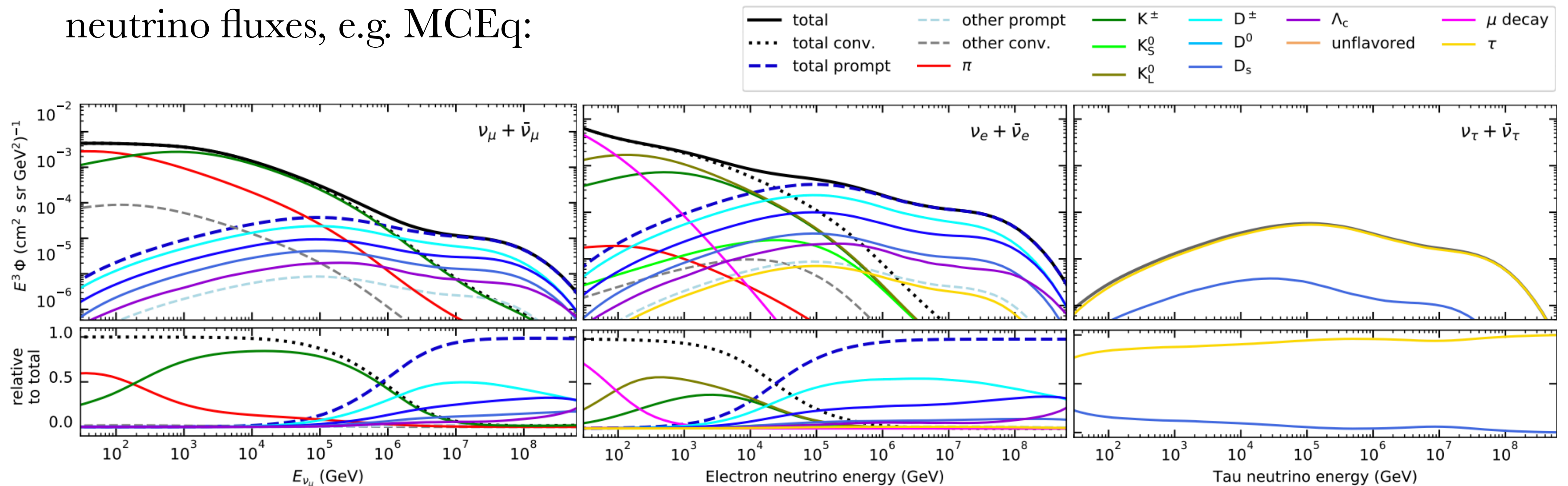
MCEq

- ▶ Conventional muons dominating up to ~ 1 PeV
- ▶ Prompt muons dominating above ~ 1 PeV
- ▶ Contribution from unflavored (vector-)mesons



A Note on Neutrinos in EAS

- ▶ Decays into muons also produce neutrinos
- ▶ However, electron and tau neutrinos are also produced and reach the ground
- ▶ Same calculations as for muons (no decay/energy losses)!
- ▶ Same tools yield atmospheric neutrino fluxes, e.g. MCEq:



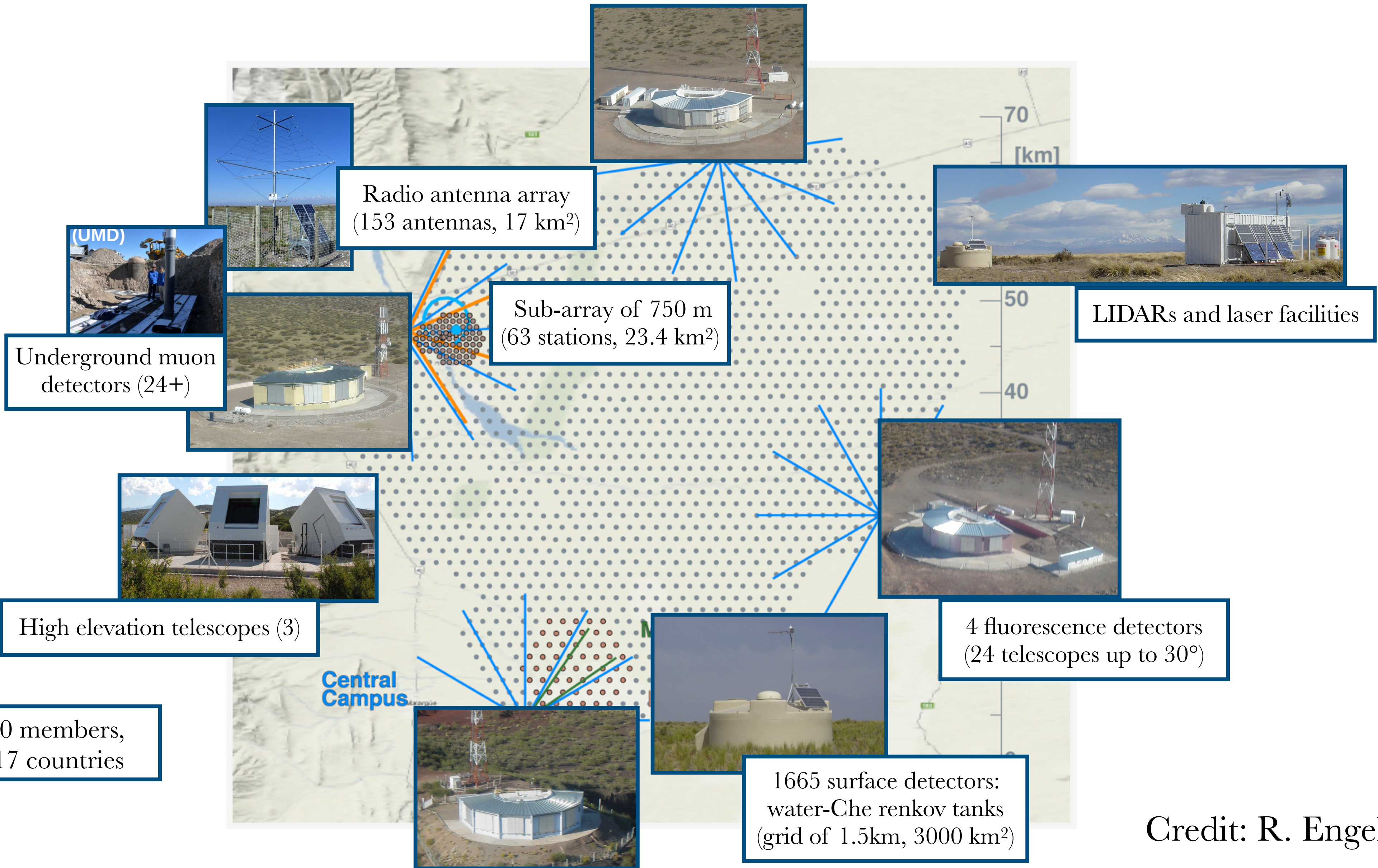
Indirect CR Detection (Selected Examples)



The Pierre Auger Observatory



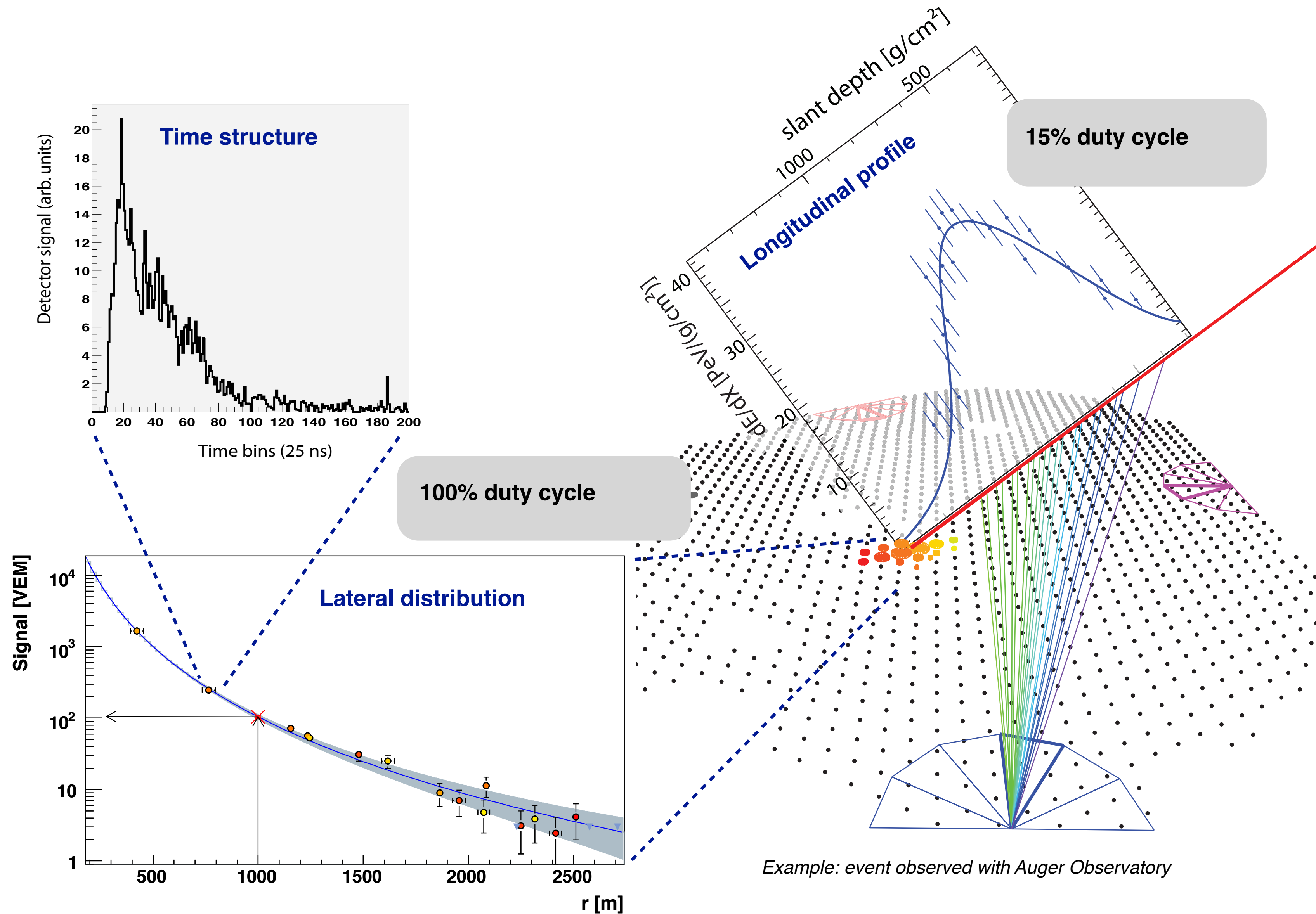
Pierre Auger Observatory
Province Mendoza, Argentina



More than 400 members,
98 institutes, 17 countries

Credit: R. Engel

The Pierre Auger Observatory



Credit: R. Engel

Highest Energies: Two Observatories

Telescope Array (TA)

Delta, UT, USA

507 detector stations, 680 km²

36 fluorescence telescopes

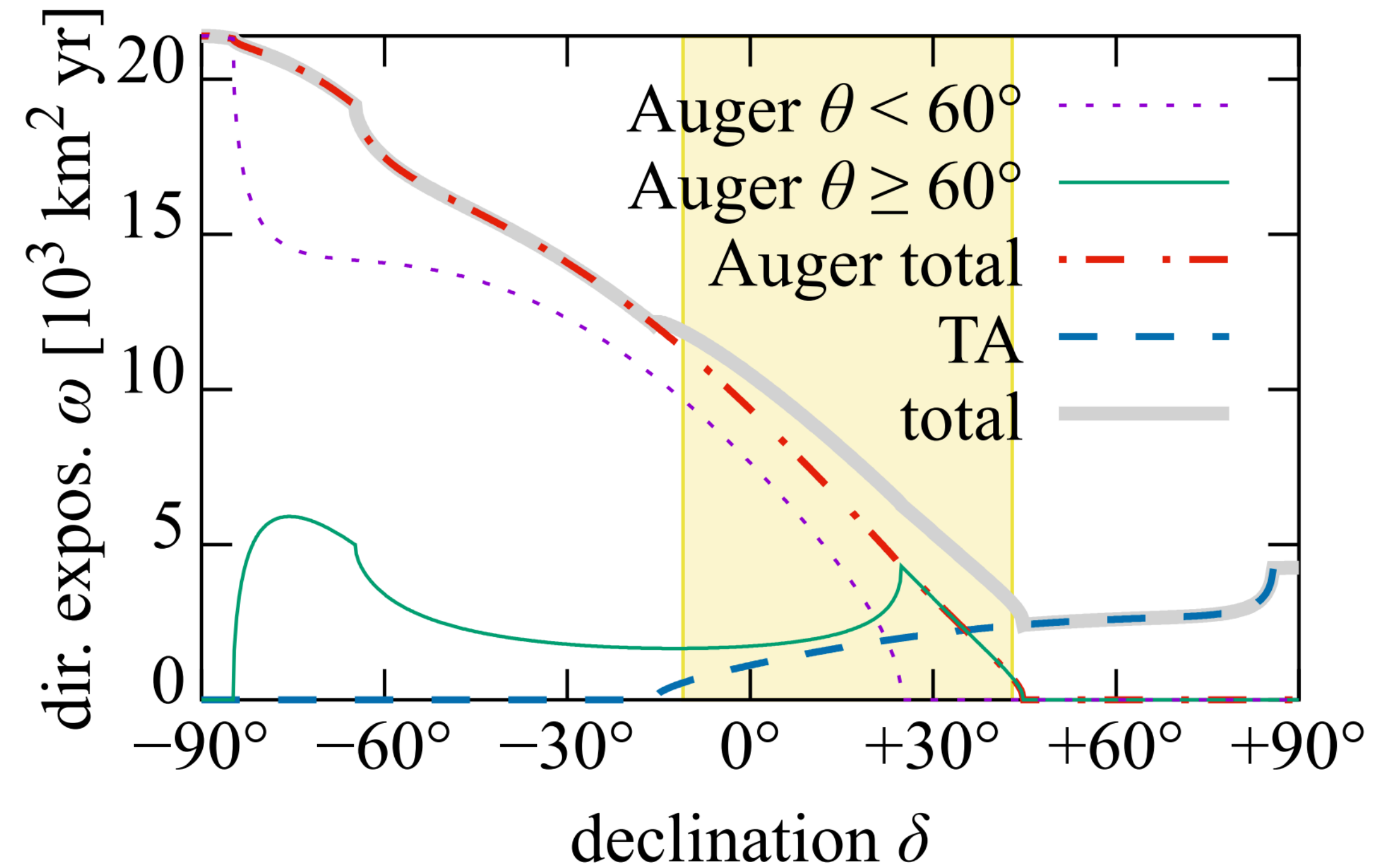


Pierre Auger Observatory

Province Mendoza, Argentina

1660 detector stations, 3000 km²

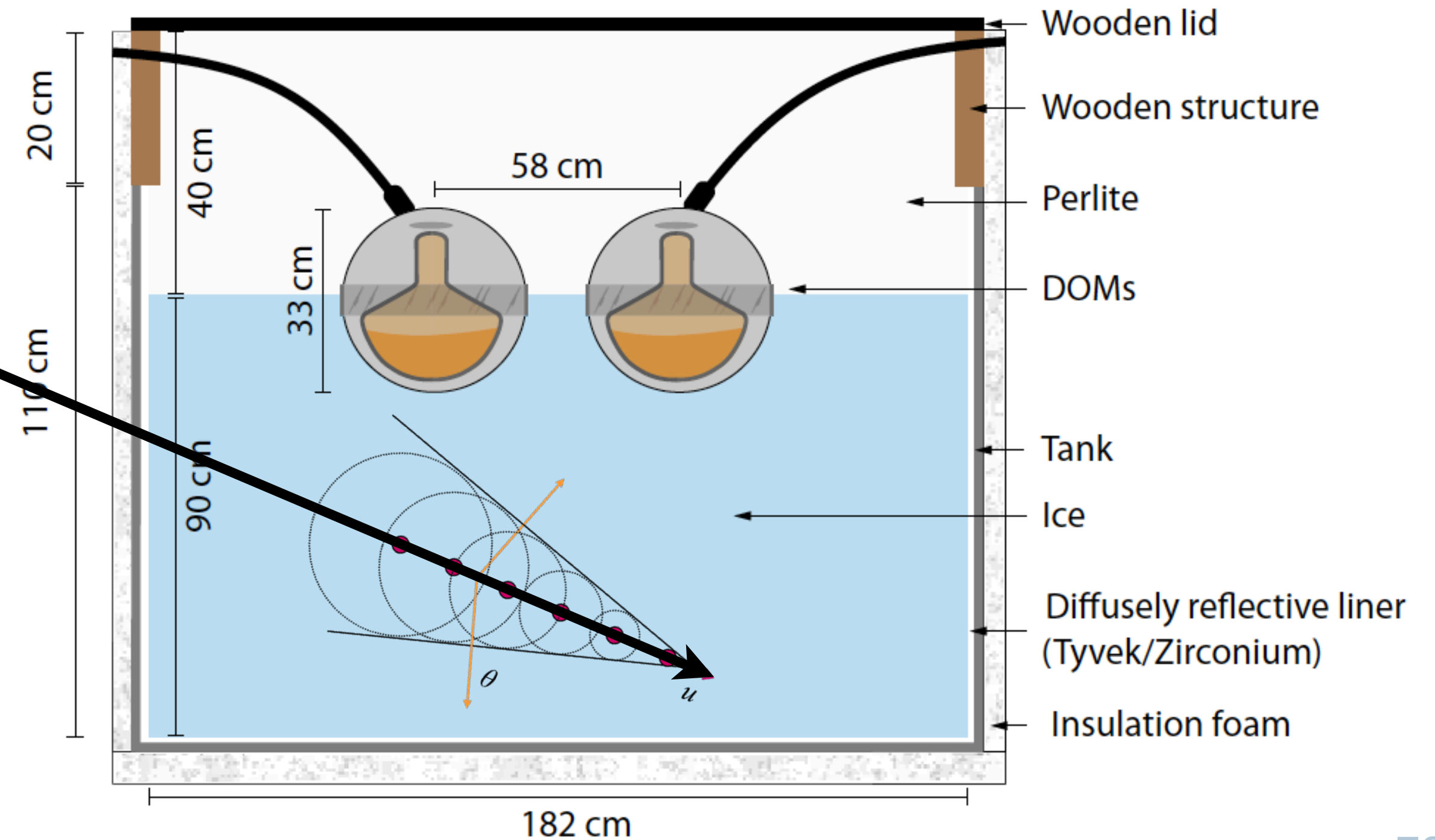
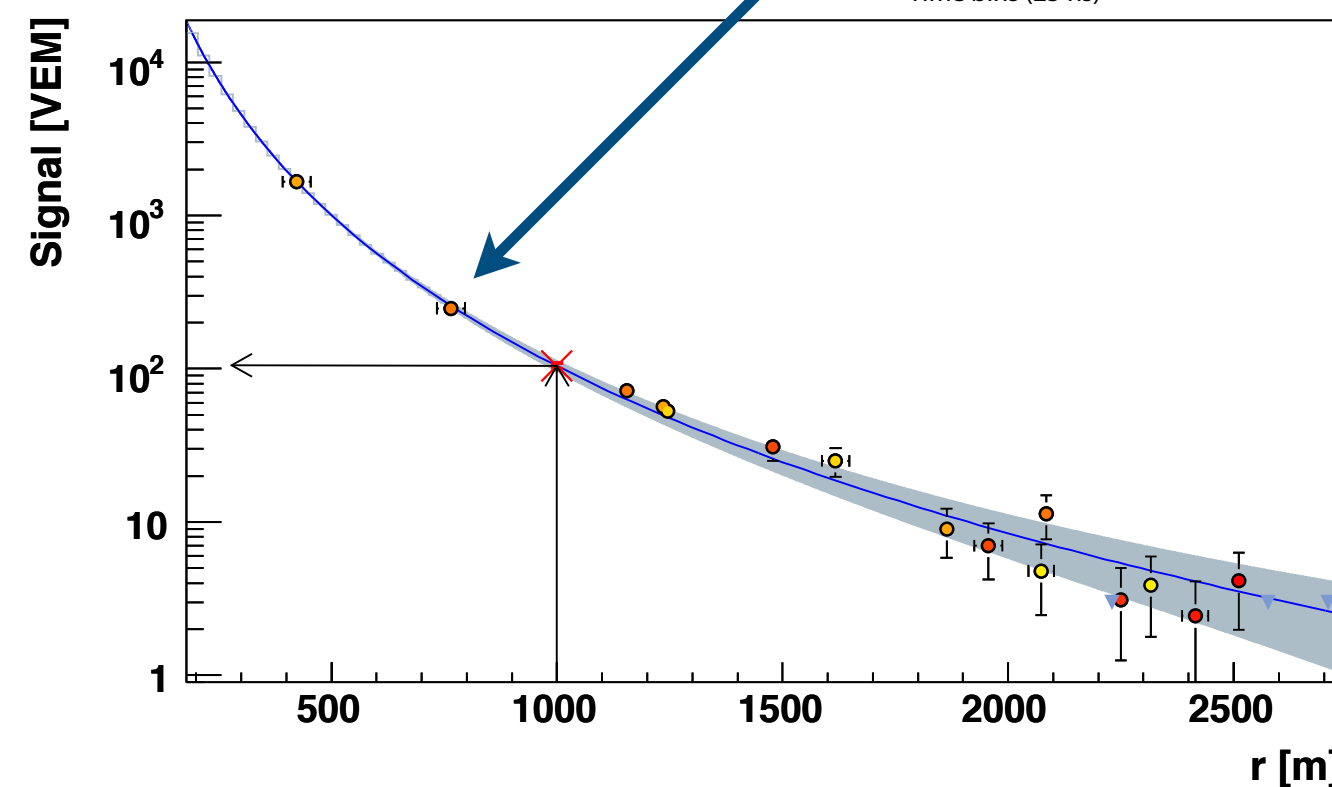
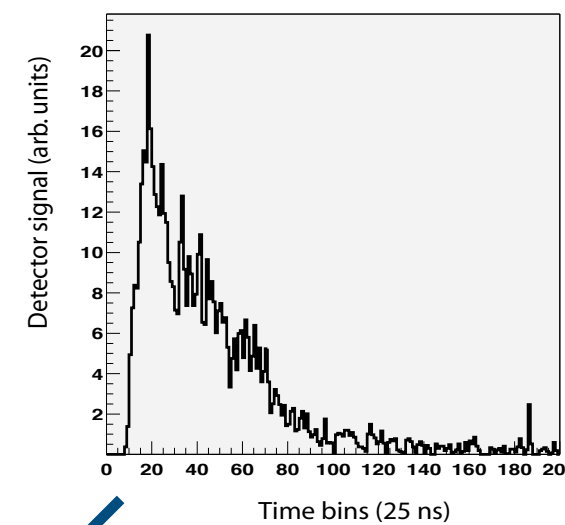
27 fluorescence telescopes



Credit: R. Engel

Water (Ice) Cherenkov Detectors

- ▶ Typically large particle detectors arrays equipped with water (ice) Cherenkov tanks
- ▶ Light sensors detect Cherenkov light from relativistic charged particles (next slide)
- ▶ Measures the lateral EAS profile
- ▶ Deposited energy, particle identification
- ▶ Examples:
 - ▶ Pierre Auger Observatory
 - ▶ IceTop



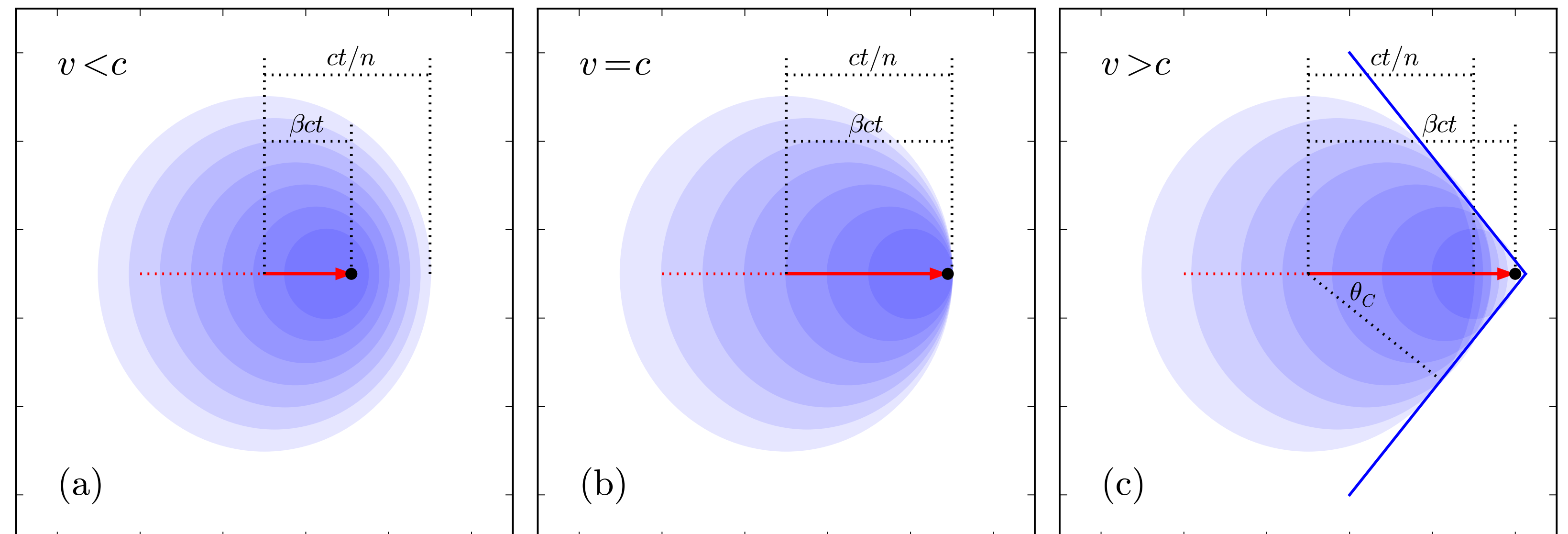
~100% duty cycle

Basics: Cherenkov Light

- ▶ Particle travels in dielectric medium (e.g. water) with refractive index n
- ▶ Speed of charged particle: $v_p = \beta c$
- ▶ Speed of electromagnetic wave (light) in medium: $v_{em} = c/n \equiv c_{\text{water}}$
- ▶ If $v_p > c_{\text{water}}$ (or $\beta n > 1$) constructive interference leads to an observed cone-like light signal at a characteristic angle
- ▶ Cherenkov angle:

$$\cos(\theta_C) = \frac{v_{em}}{v_p} = \frac{1}{\beta n}$$

- ▶ More in the exercise!



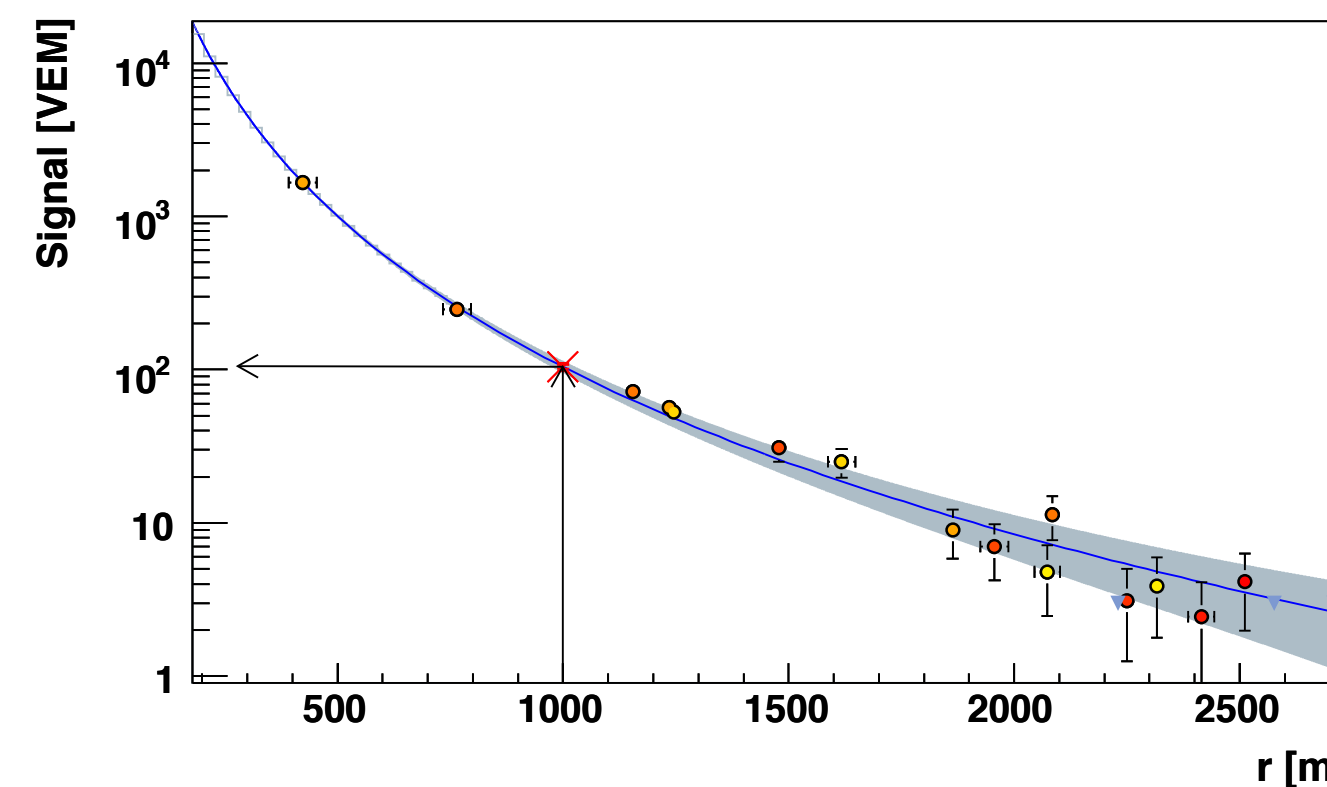
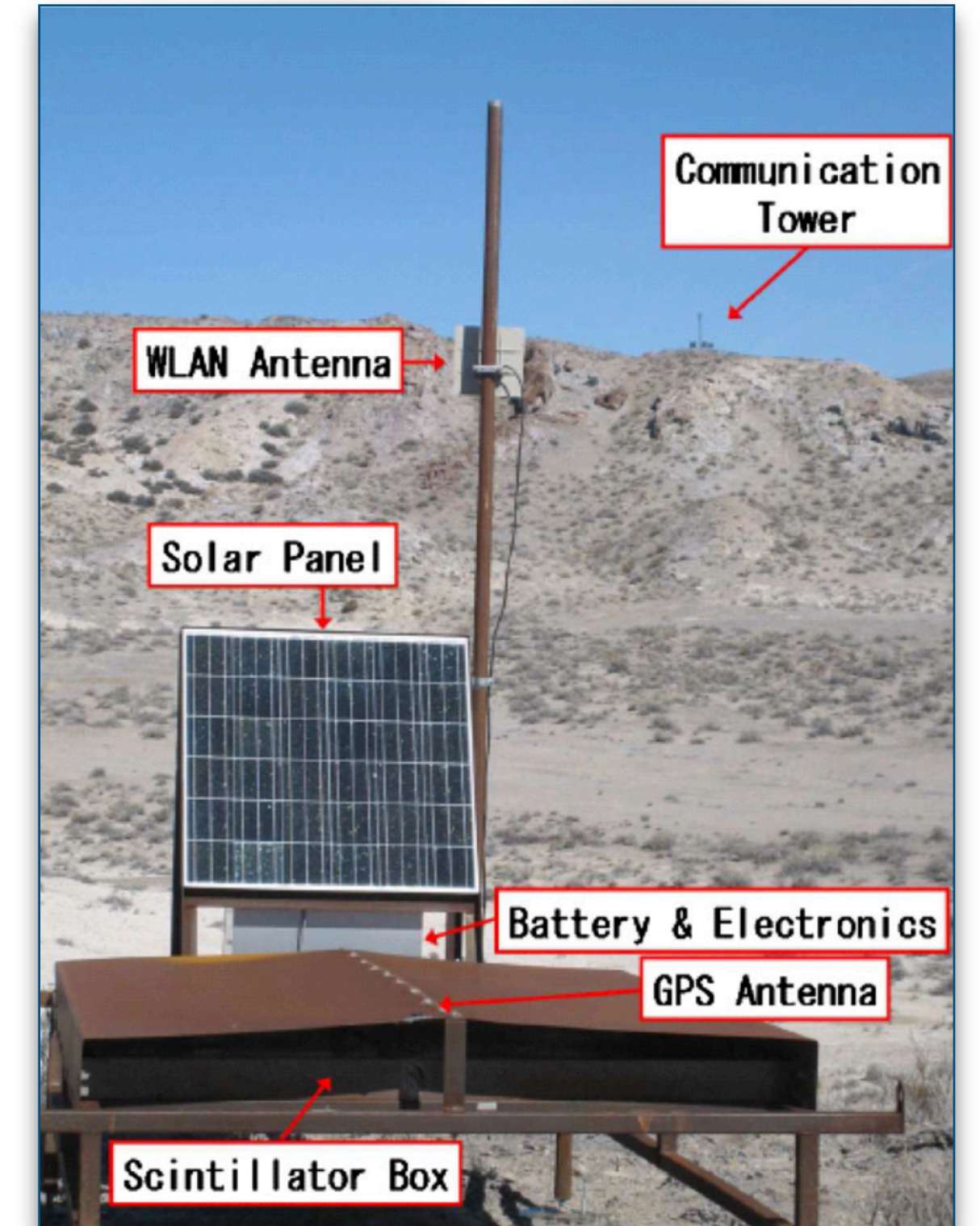




Scintillator Detectors

- ▶ Typically large particle detectors arrays equipped with scintillator panels
- ▶ Particles produce light in scintillator which is measured with light sensors (PMT, SiPM)
- ▶ Measures the lateral EAS profile
- ▶ Deposited energy, particle identification
- ▶ Examples:
 - ▶ Kascade-Grande
 - ▶ Telescope Array
 - ▶ IceTop Enhancement
 - ▶ AugerPrime

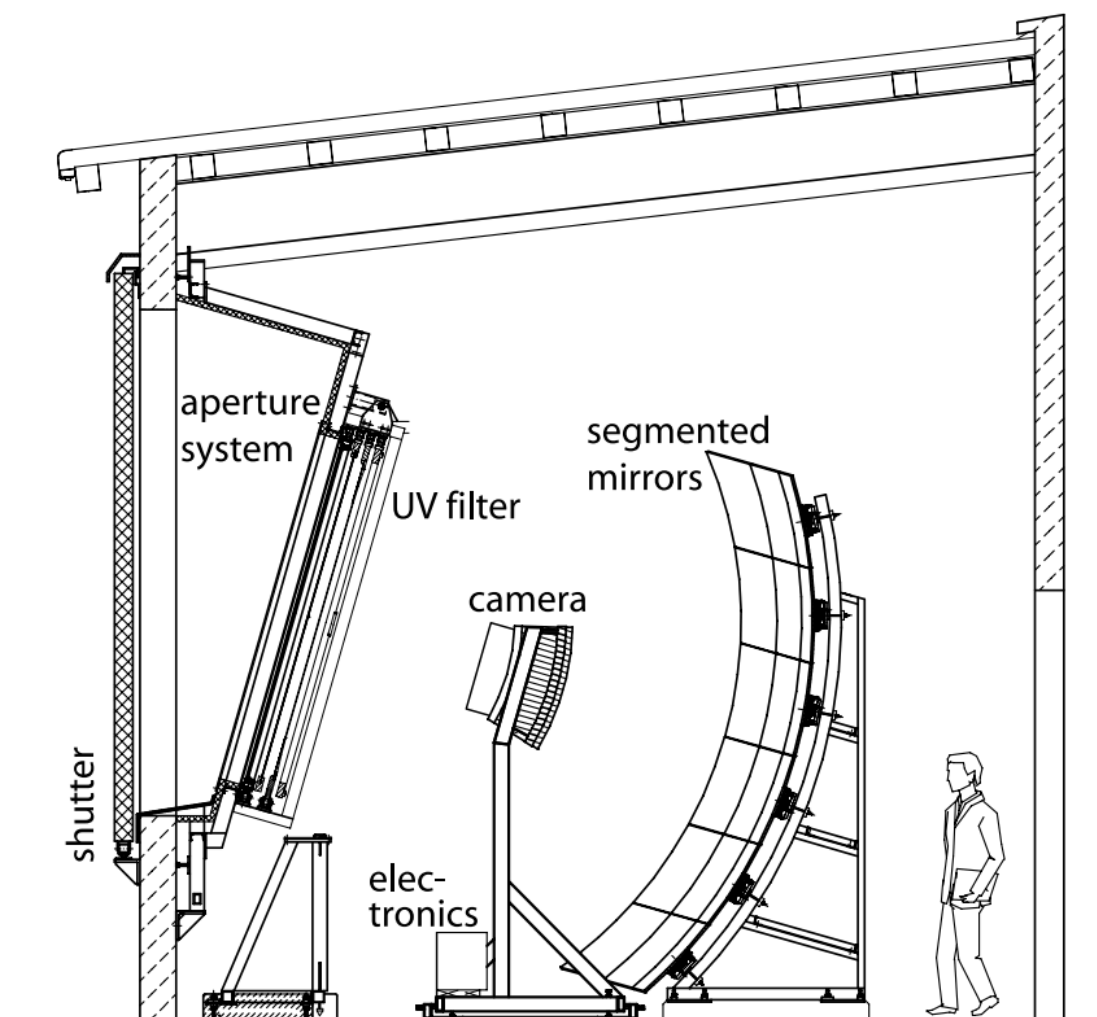
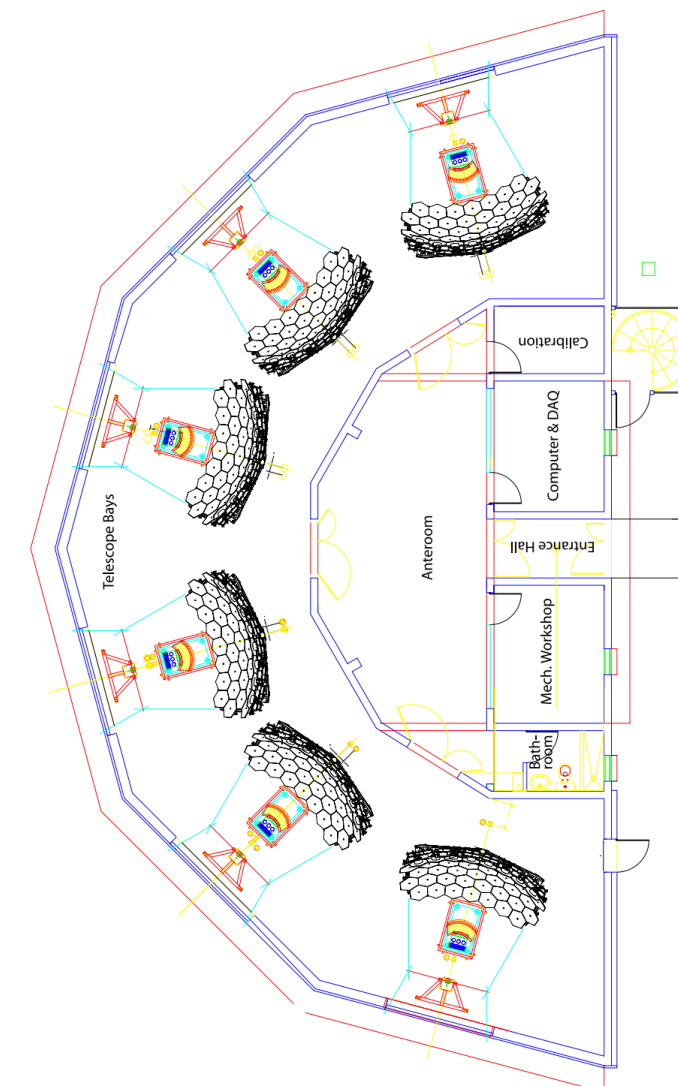
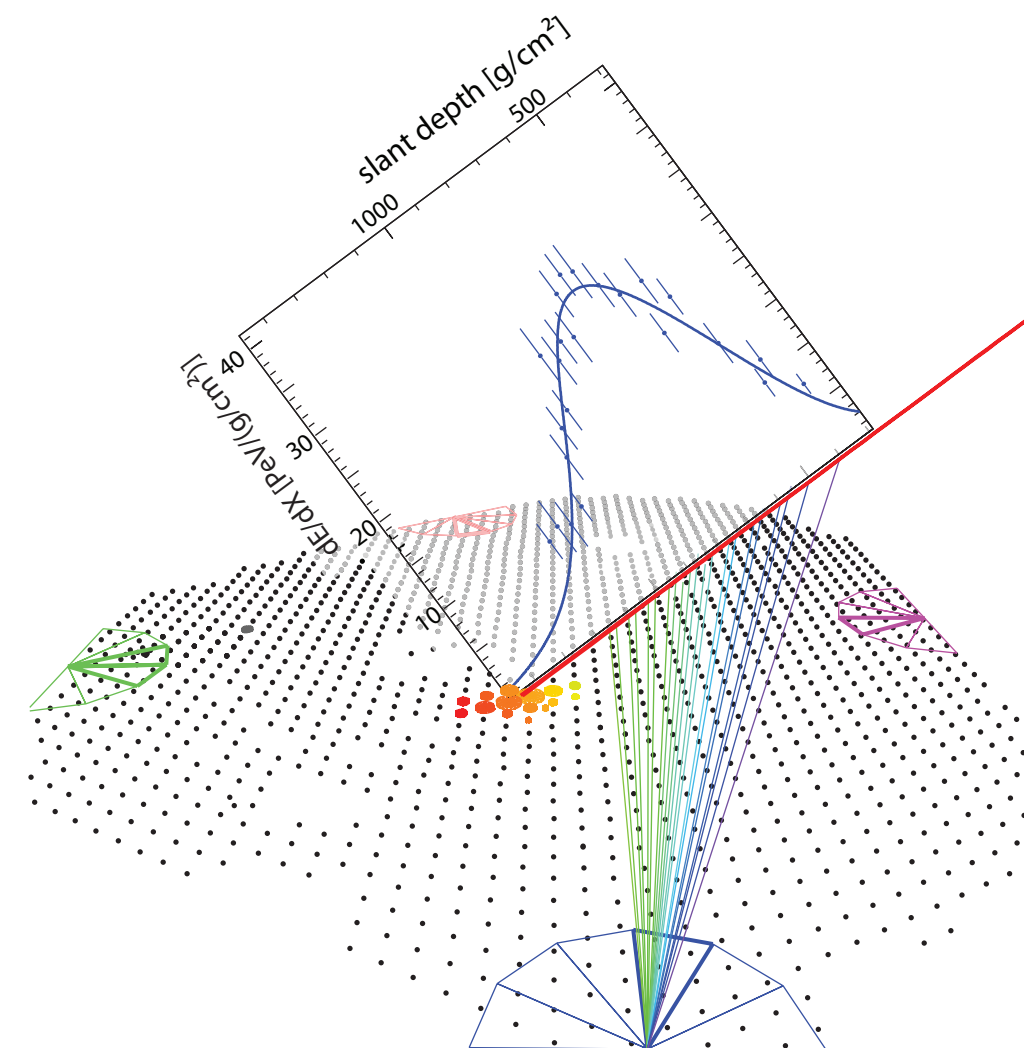
~100% duty cycle



Fluorescence Telescopes

- ▶ Charged particles excite atmospheric nitrogen molecules in the air
- ▶ These molecules then emit fluorescence light in the $\sim 300 - 430$ nm range
- ▶ Number of emitted fluorescence photons is proportional to the energy deposited in the atmosphere due to electromagnetic energy losses
- ▶ Measures the longitudinal EAS profile $dE(X)/dX$
- ▶ Examples:
 - ▶ Pierre Auger Observatory
 - ▶ Telescope Array

$\sim 15\%$ duty cycle



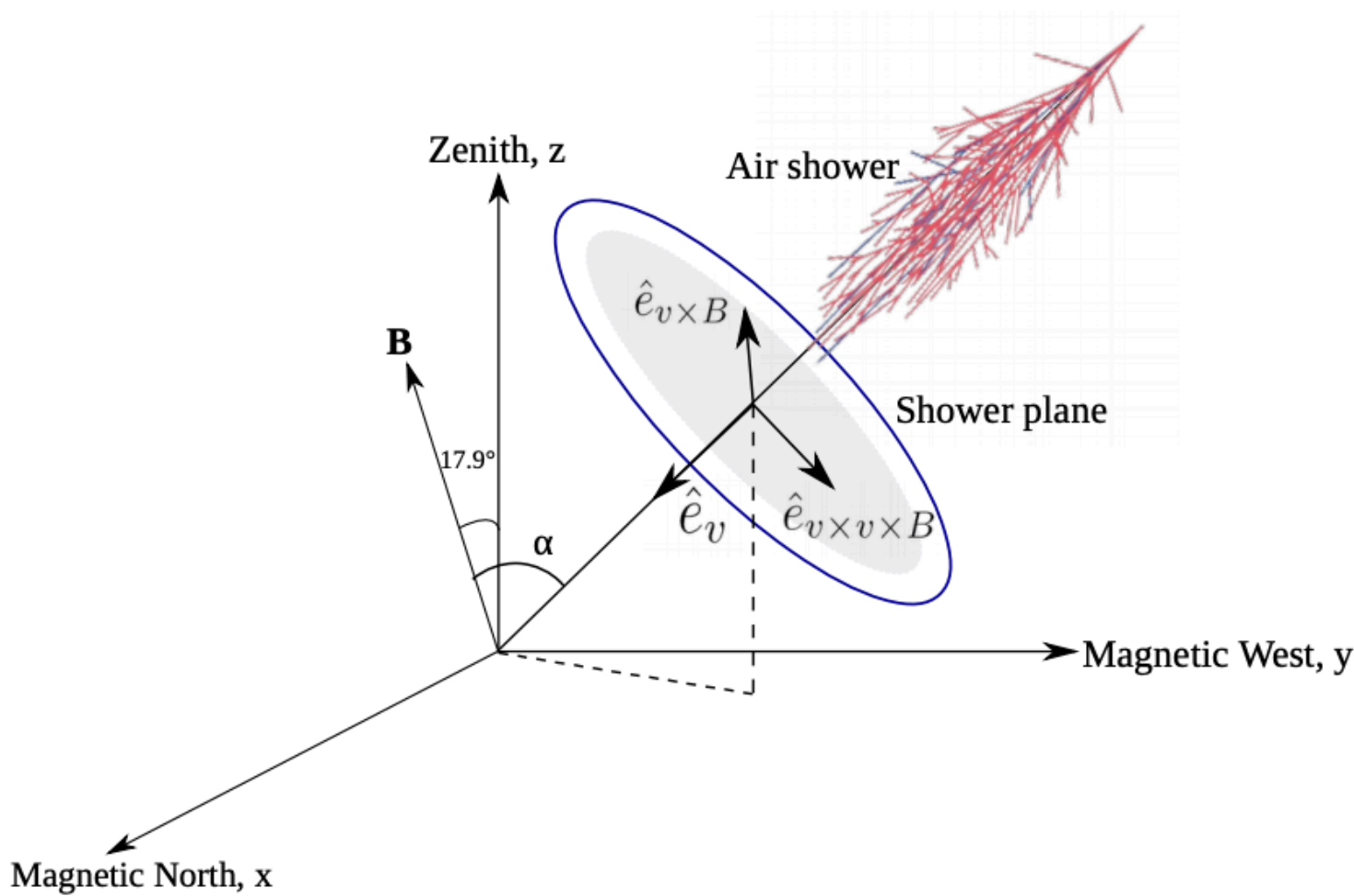
Radio Detection of EAS

- ▶ Two main mechanisms in EAS to produce radio emission:

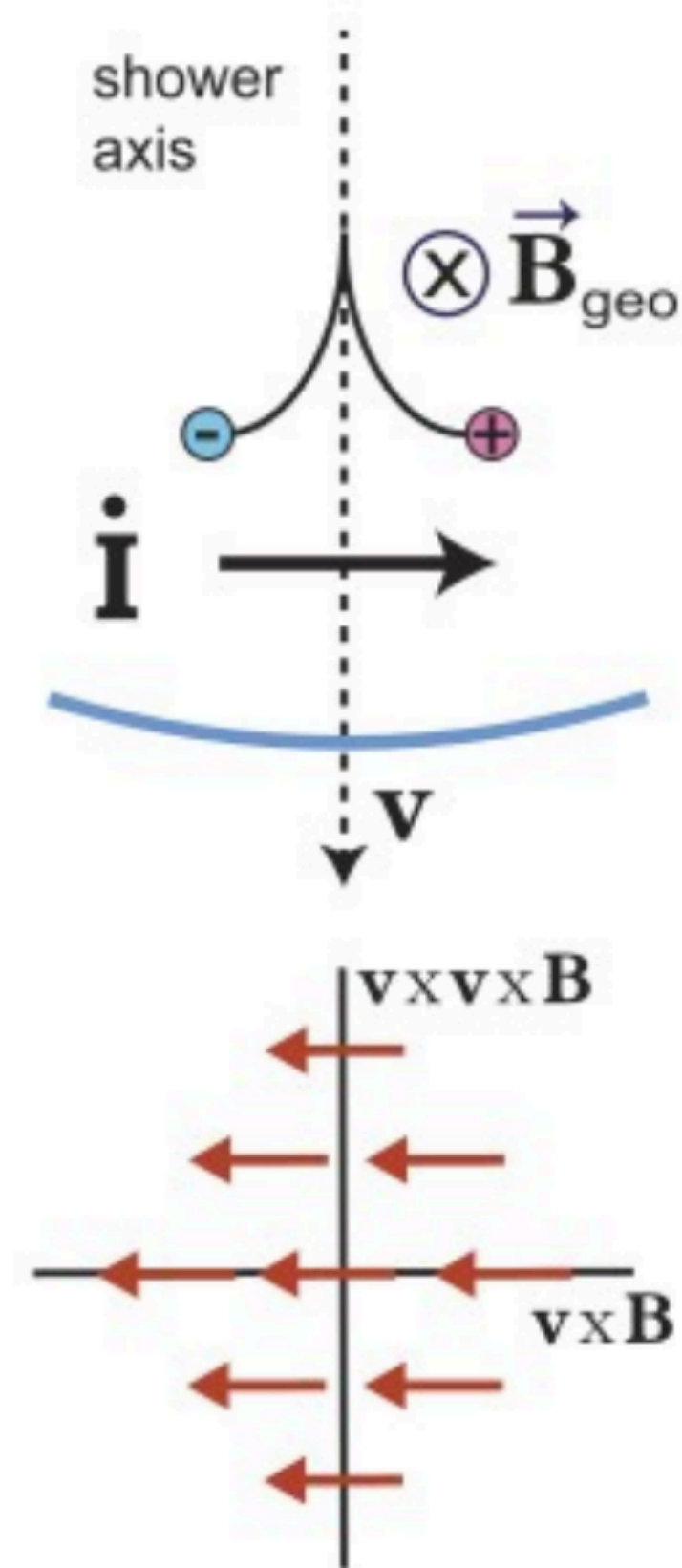
Geomagnetic emission

Askaryan emission

shower coordinates

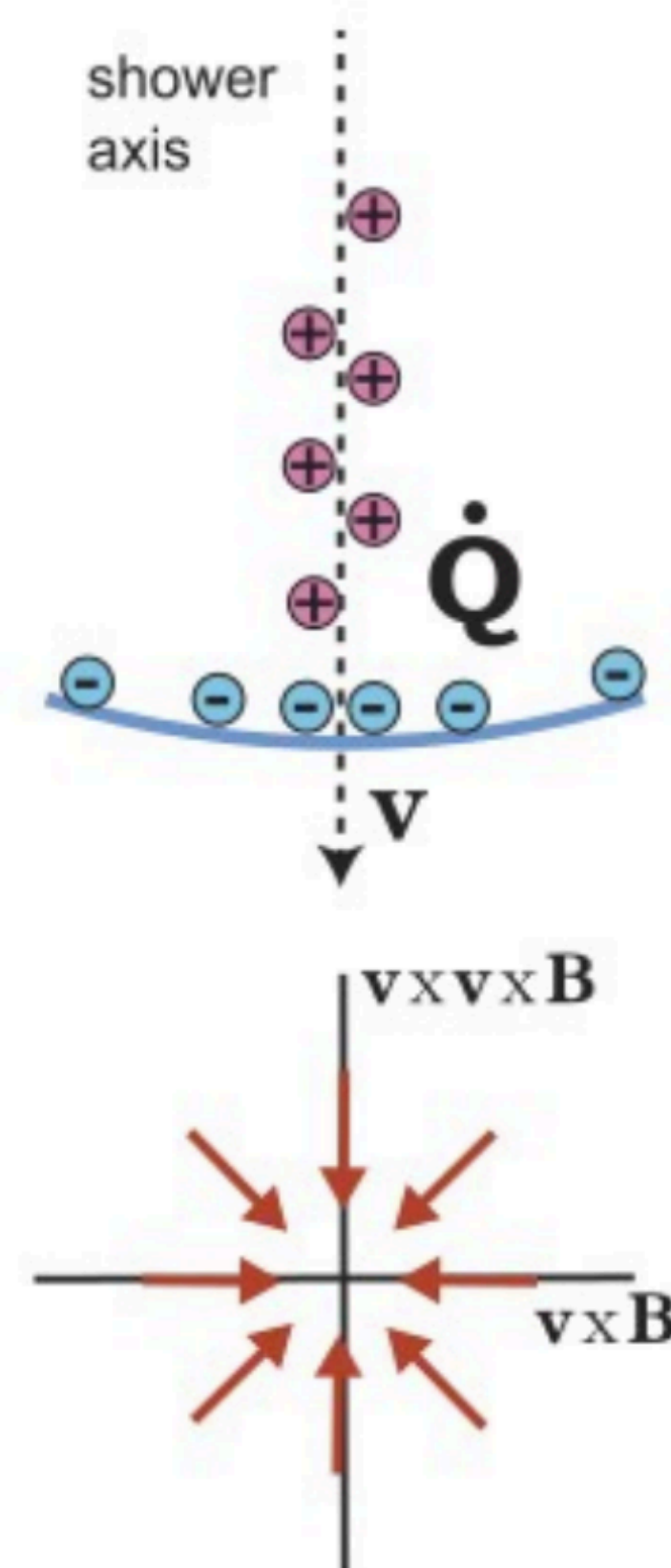


~100% duty cycle



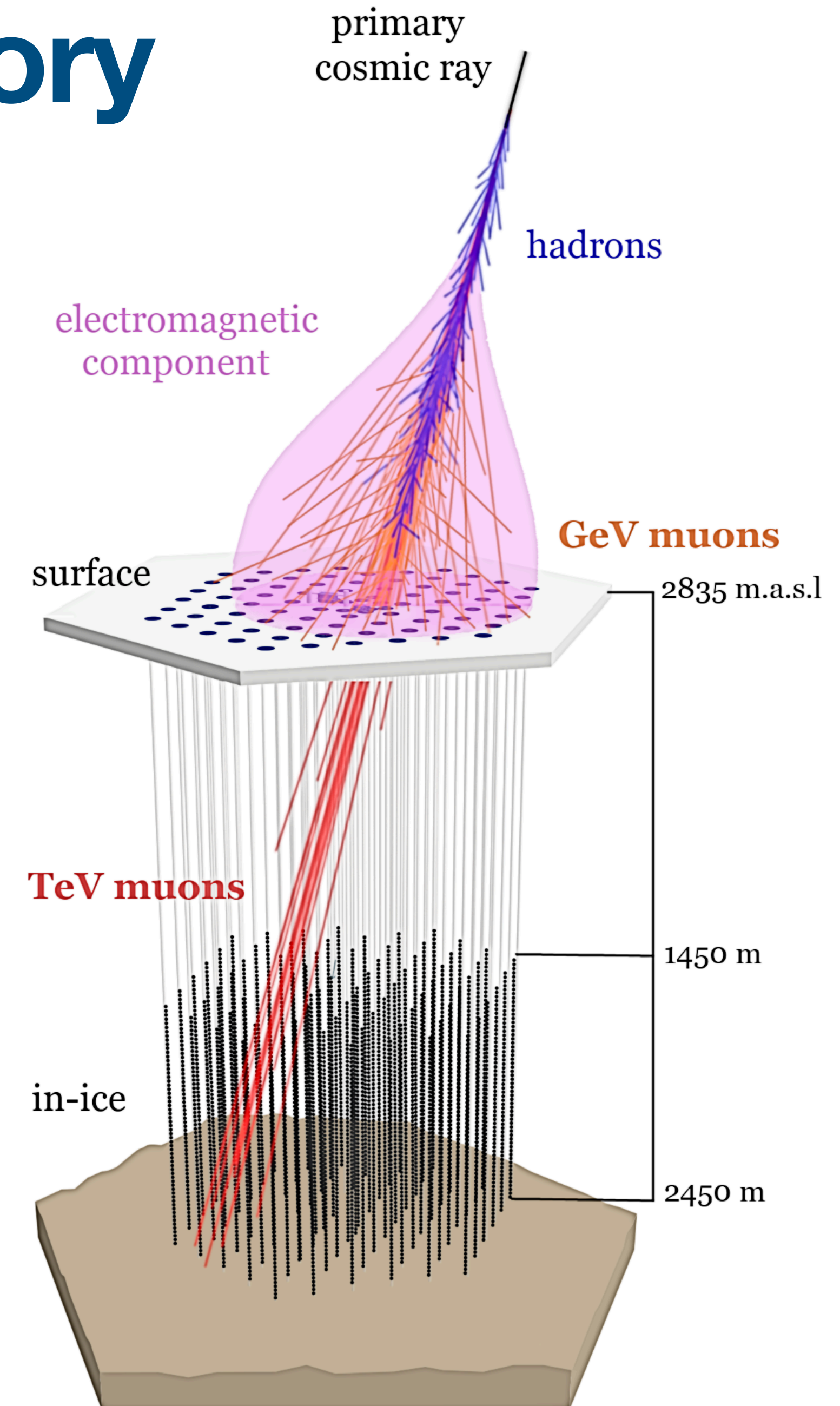
shower front

polarization in shower plane at detector



The IceCube Neutrino Observatory

- ▶ Hybrid cubic-kilometer particle detector at South Pole
- ▶ Surface detector, IceTop, measures:
 - ▶ Electromagnetic EAS component (EAS energy)
 - ▶ GeV muon content
- ▶ In-ice detector measures:
 - ▶ TeV (up to several PeV) muon content
- ▶ Coincident measurements possible!
- ▶ Ideal facility to study lepton production in EAS!
- ▶ New surface detectors under construction
 - ▶ Scintillator panels
 - ▶ Radio antennas
 - ▶ Imaging Cherenkov telescopes



The IceCube Neutrino Observatory

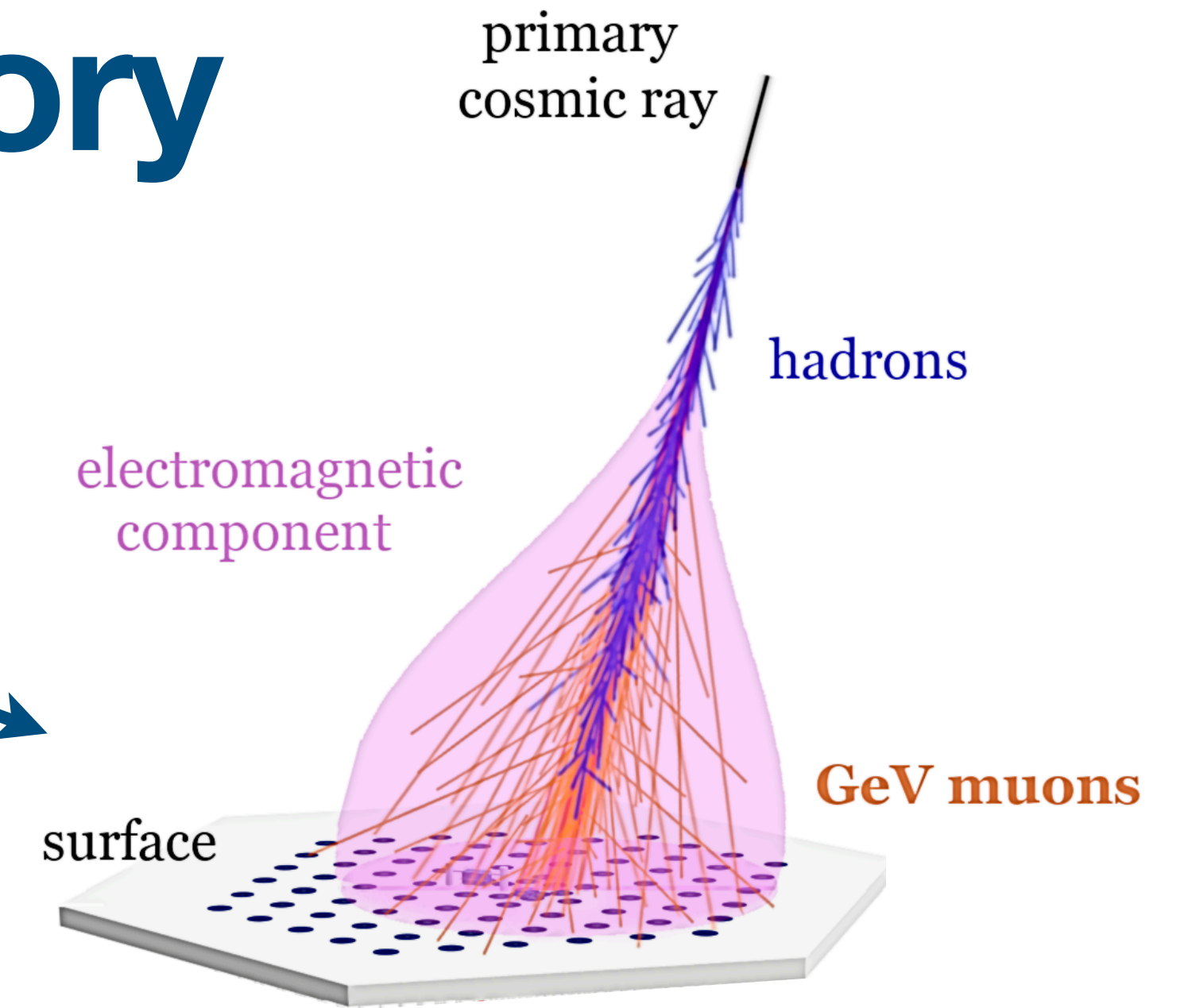
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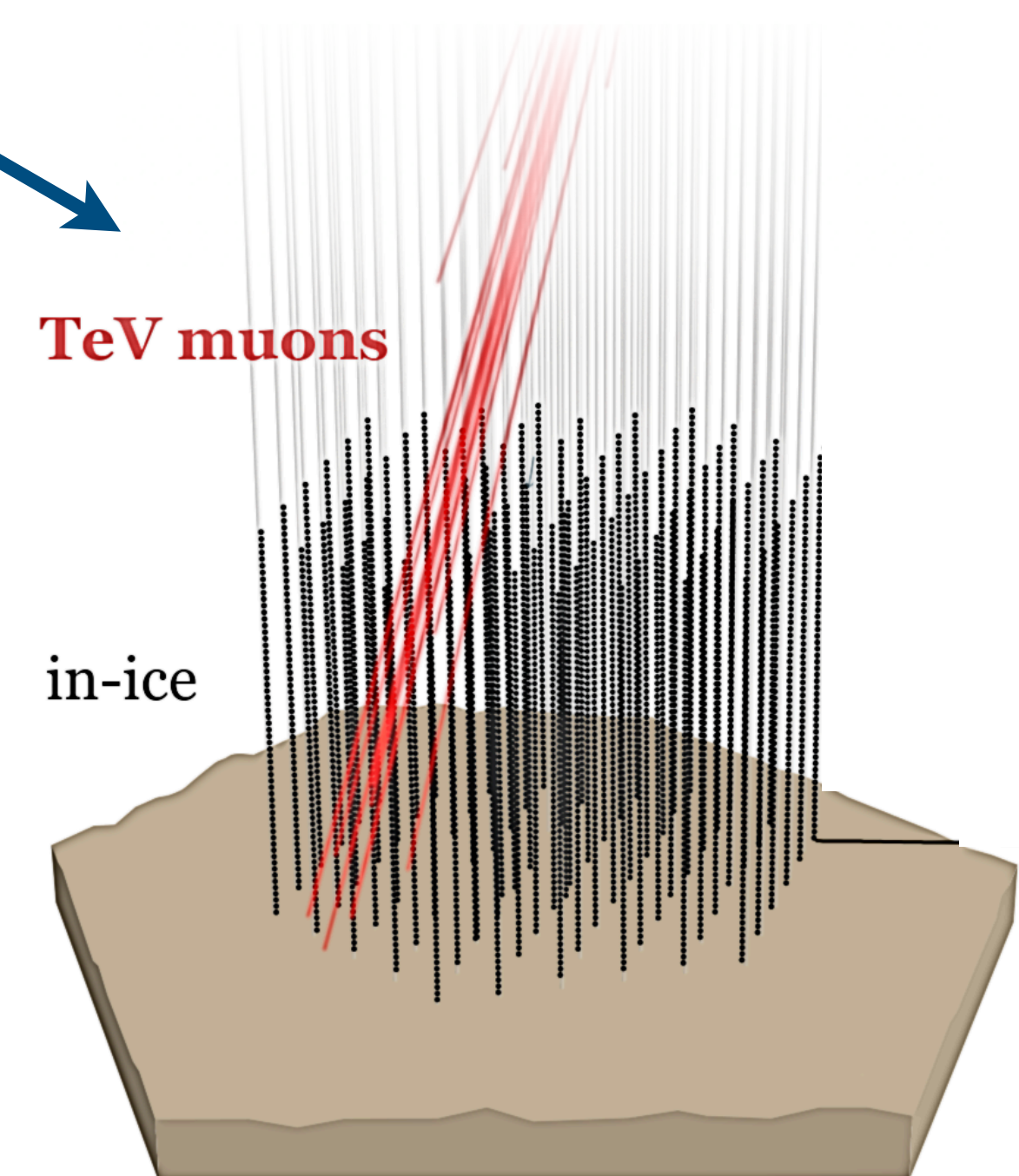
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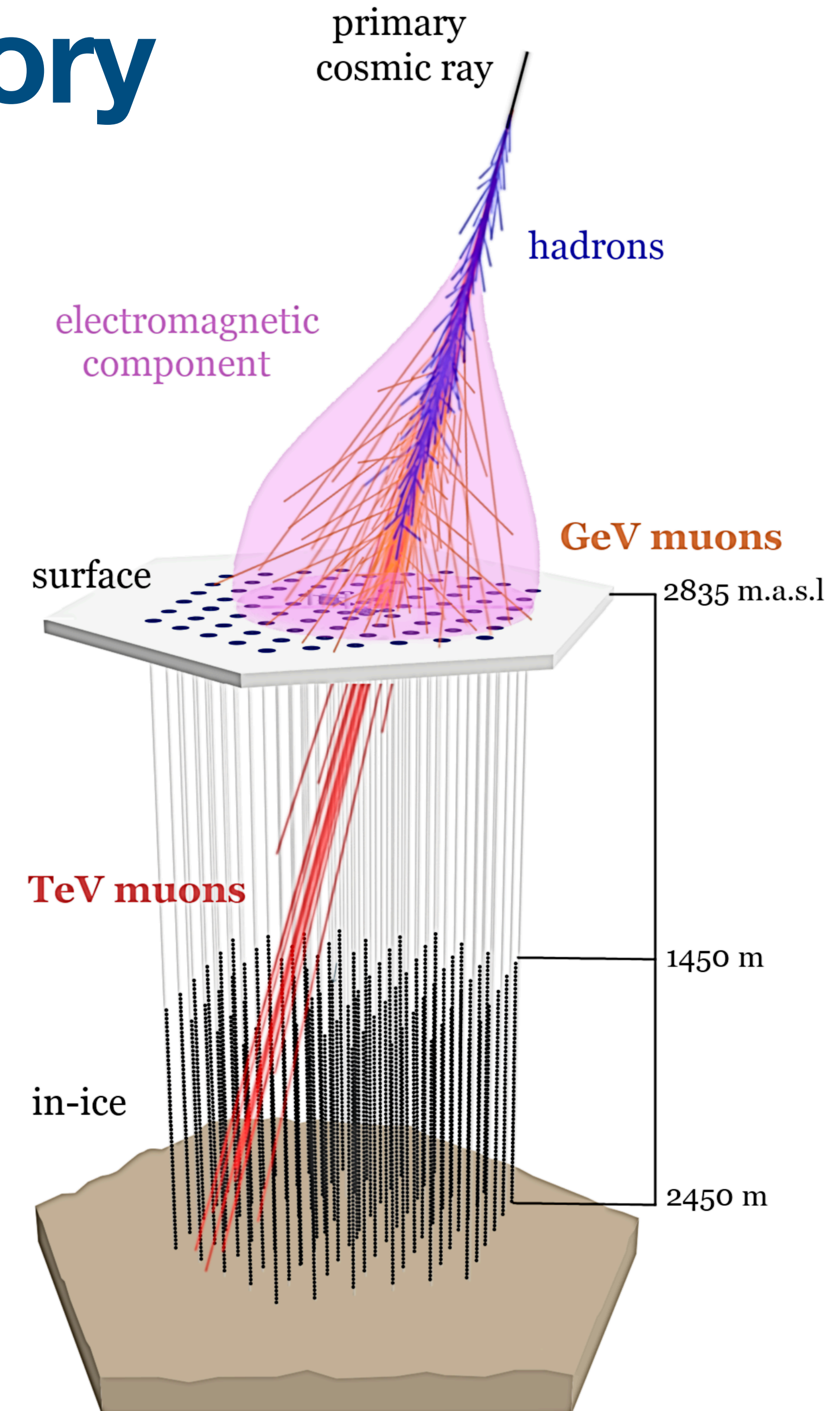
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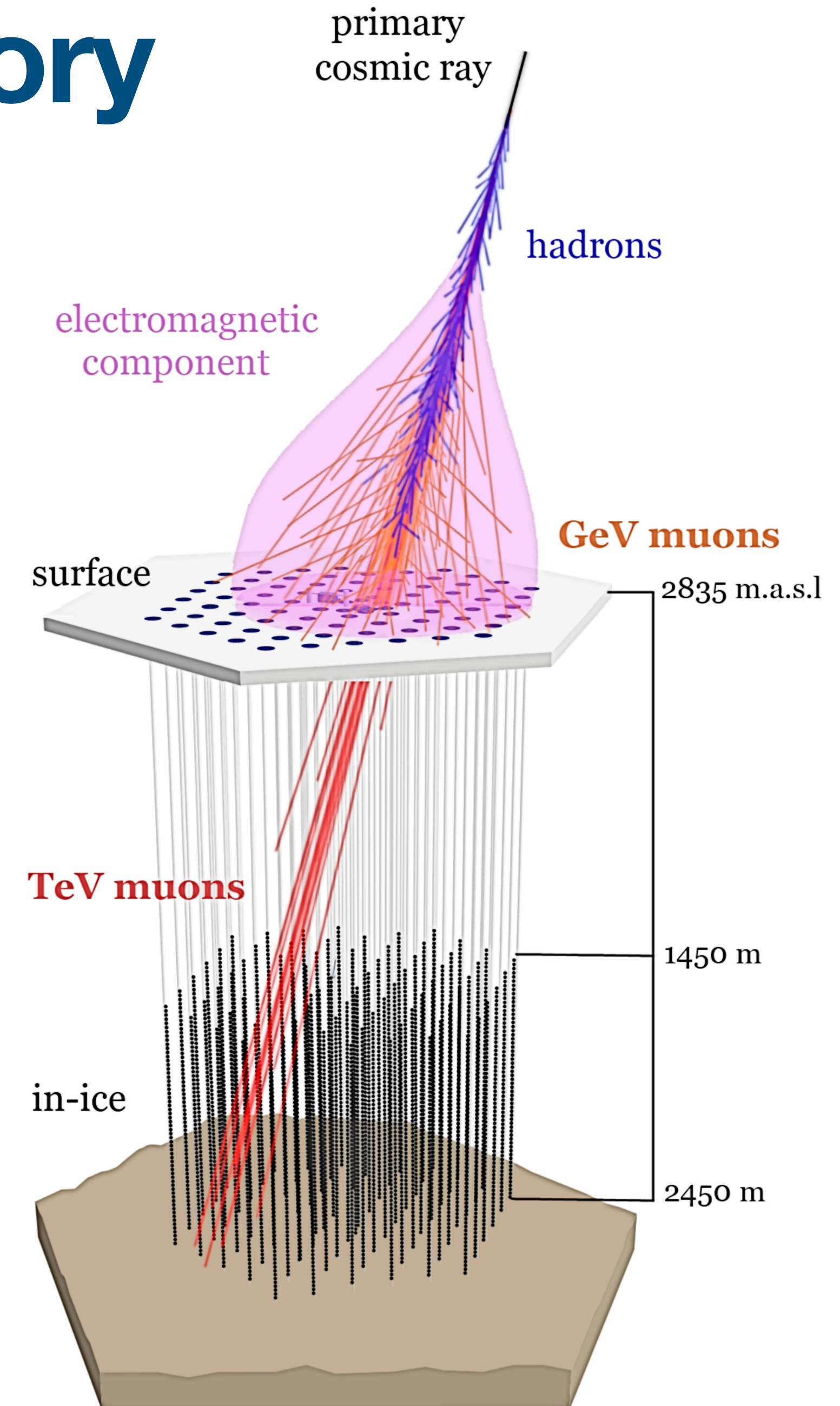
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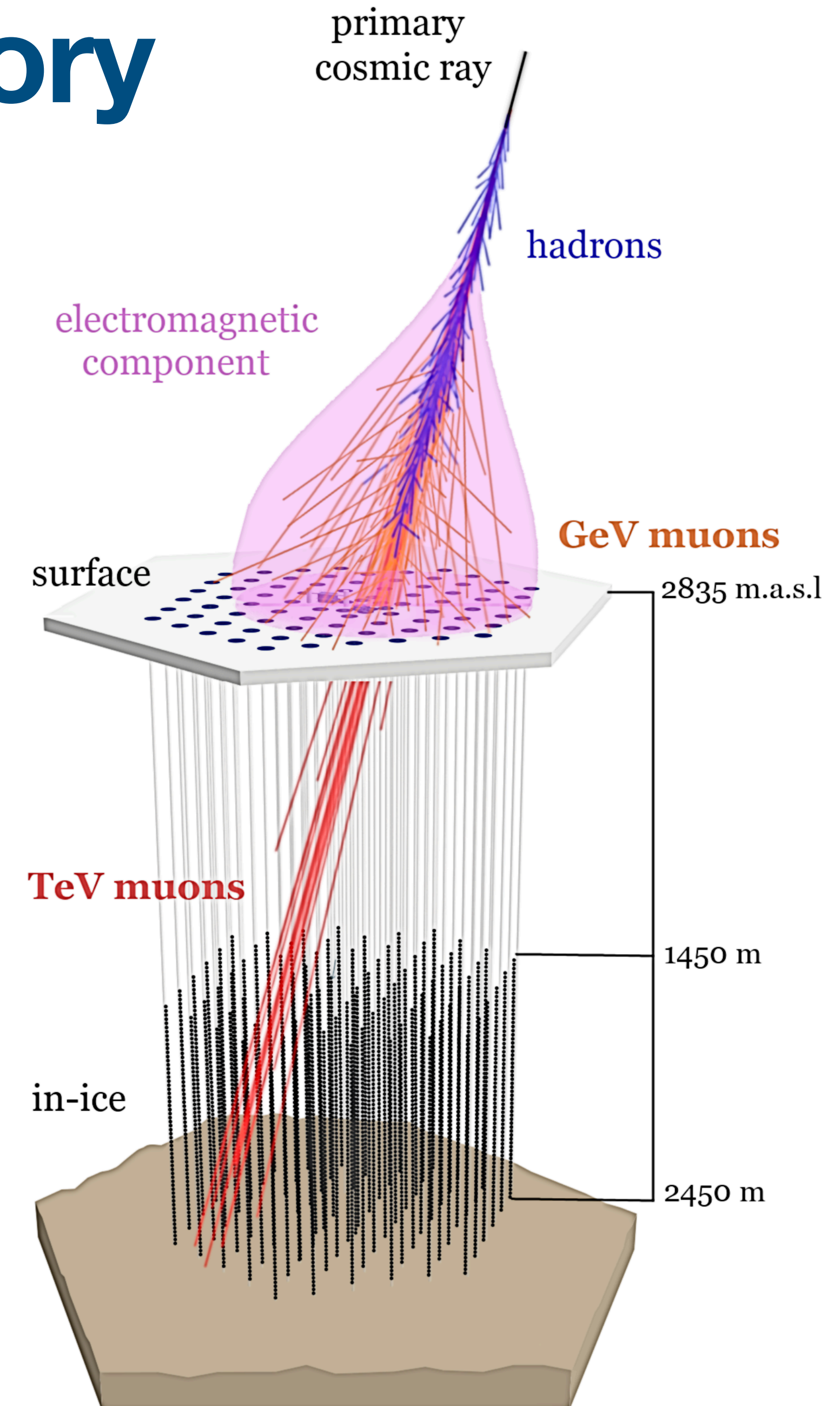
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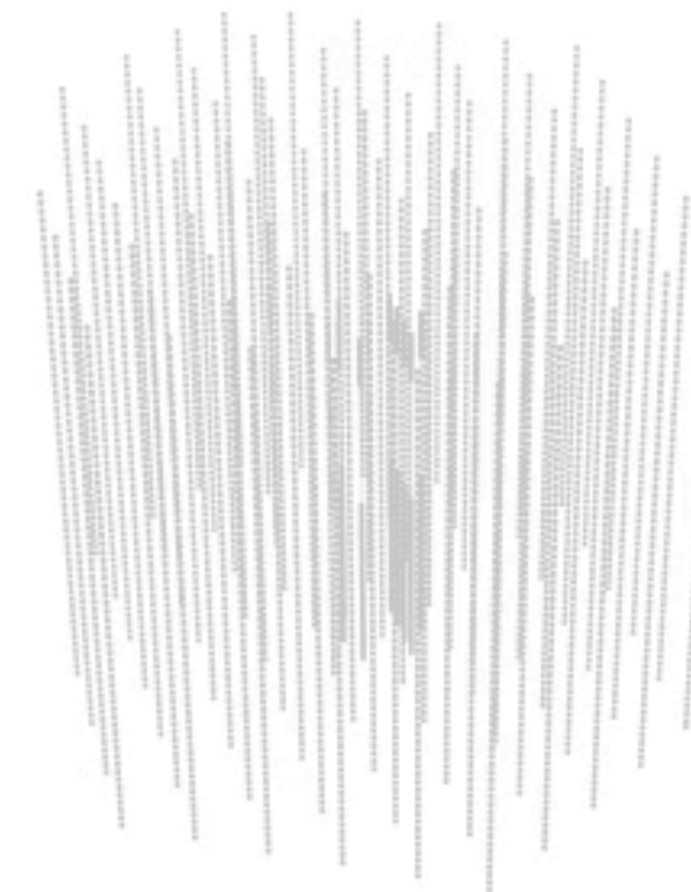
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EAS Measurements with IceCube

- ▶ Example: experimental data event (2012)
- ▶ Color-coding of time:
 - ▶ From red (early) to blue (late)
- ▶ Sizes of "blobs":
 - ▶ Amount of detected light by each DOM
- ▶ The red line indicates the reconstructed event trajectory



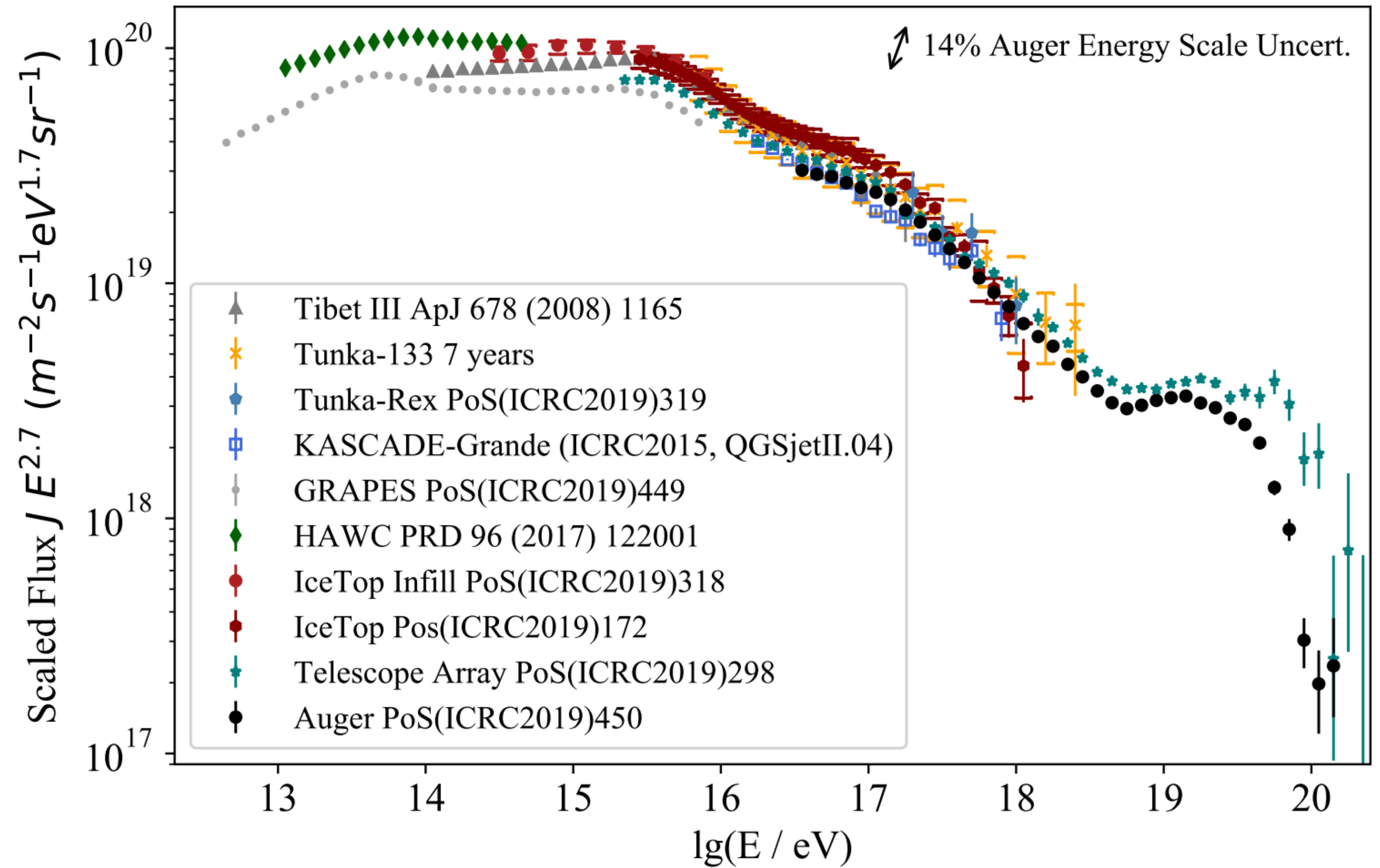


Recent Selected Results

Cosmic Ray Spectrum and Mass Composition

Cosmic Ray Spectrum

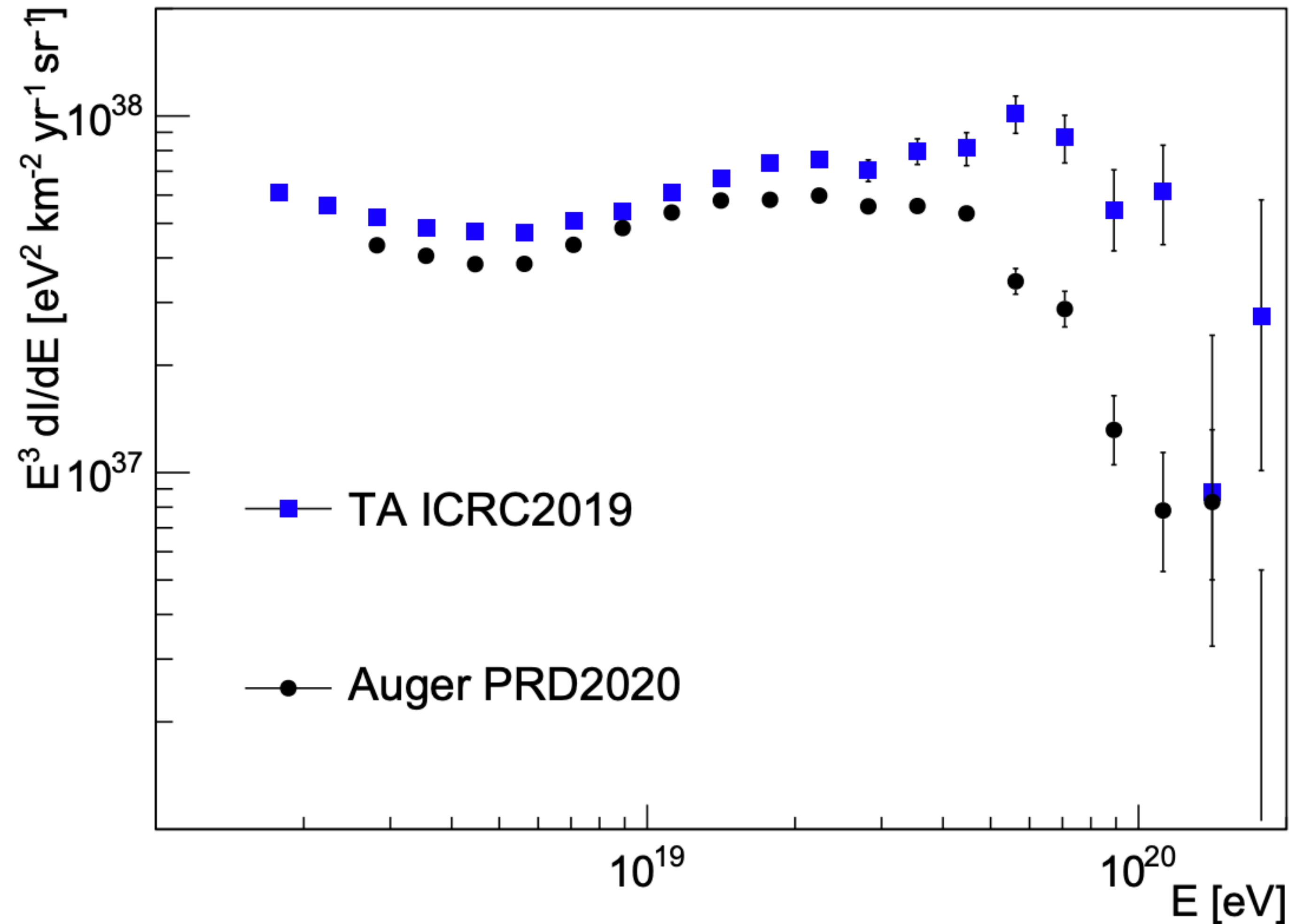
- ▶ Qualitative agreement between experiments
- ▶ Several features observed by all experiments
 - ▶ Sources?
 - ▶ Propagation?
- ▶ Energy offsets between experiments visible
- ▶ Tension between Auger and TA at the highest energies



Cosmic Ray Spectrum

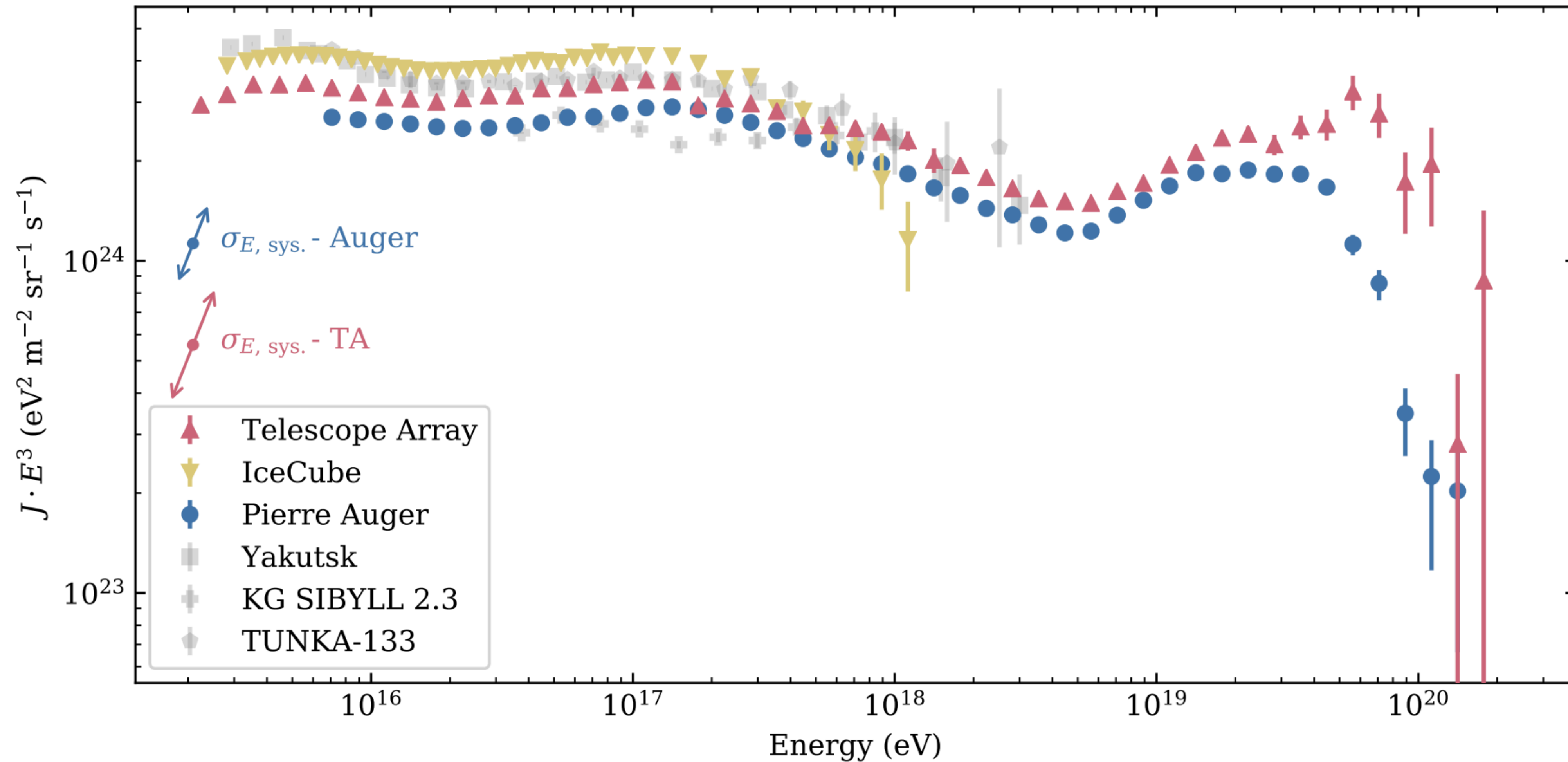
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[A. Coleman et al., *Astropart. Phys.* 147 (2023)]



Cosmic Ray Spectrum

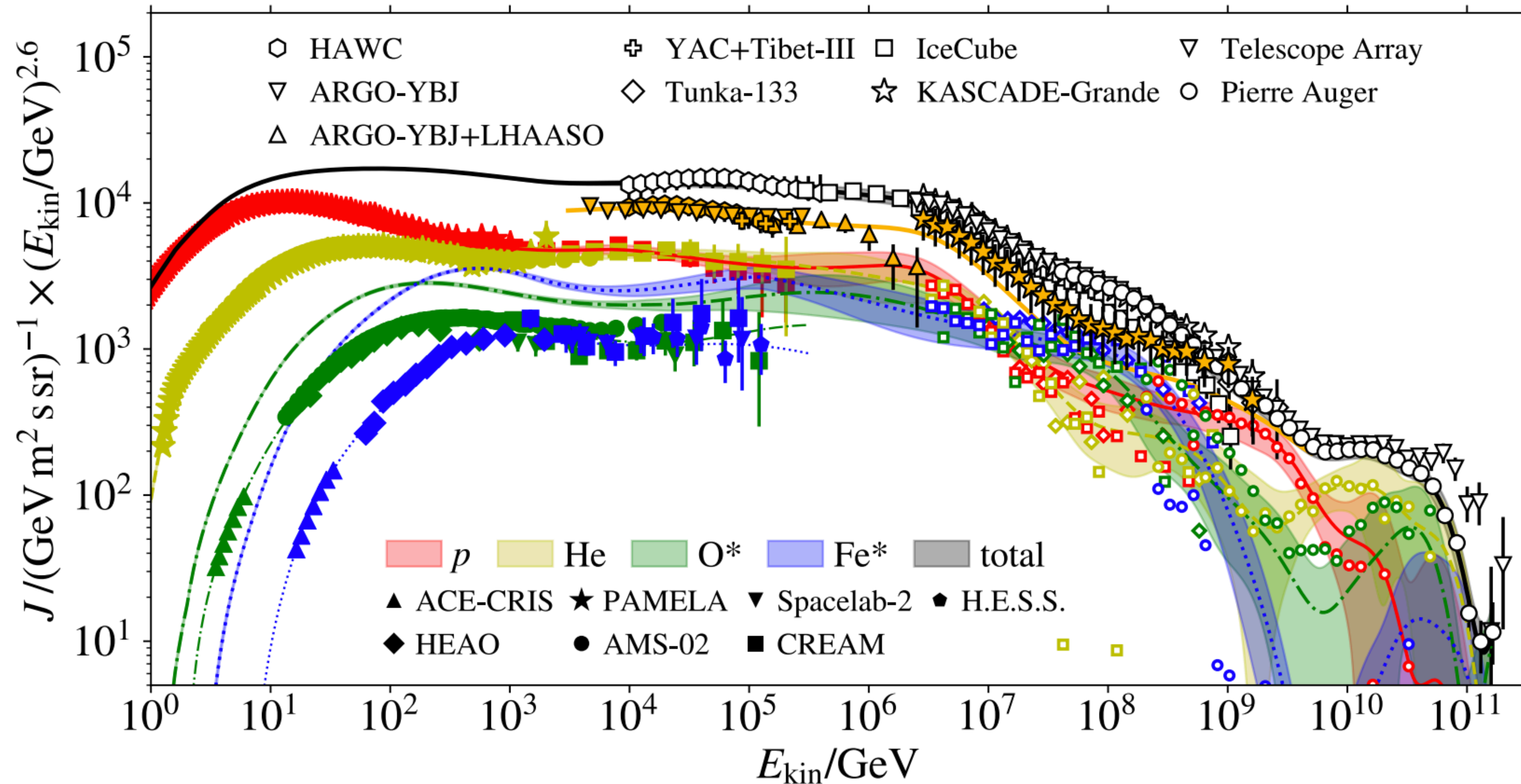
[A. Coleman et al., *Astropart. Phys.* 147 (2023)]



Cosmic Ray Mass Composition

► Global Spline Fit (GSF) flux model

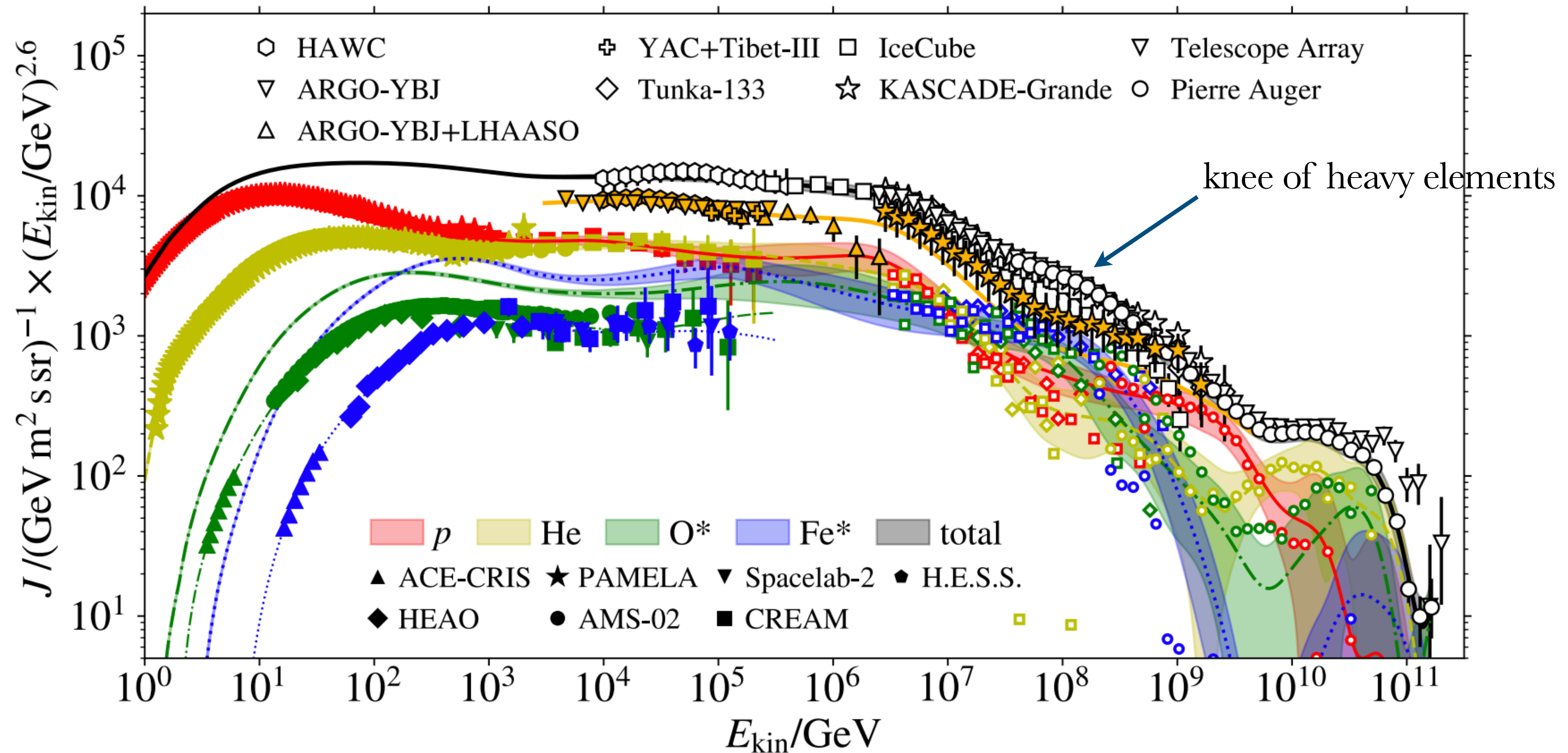
[H.P. Dembinski, R. Engel, A. Fedynitch, T. K. Gaisser, F. Riehn, T. Stanev, PoS ICRC2017 (2017) 533]



Cosmic Ray Mass Composition

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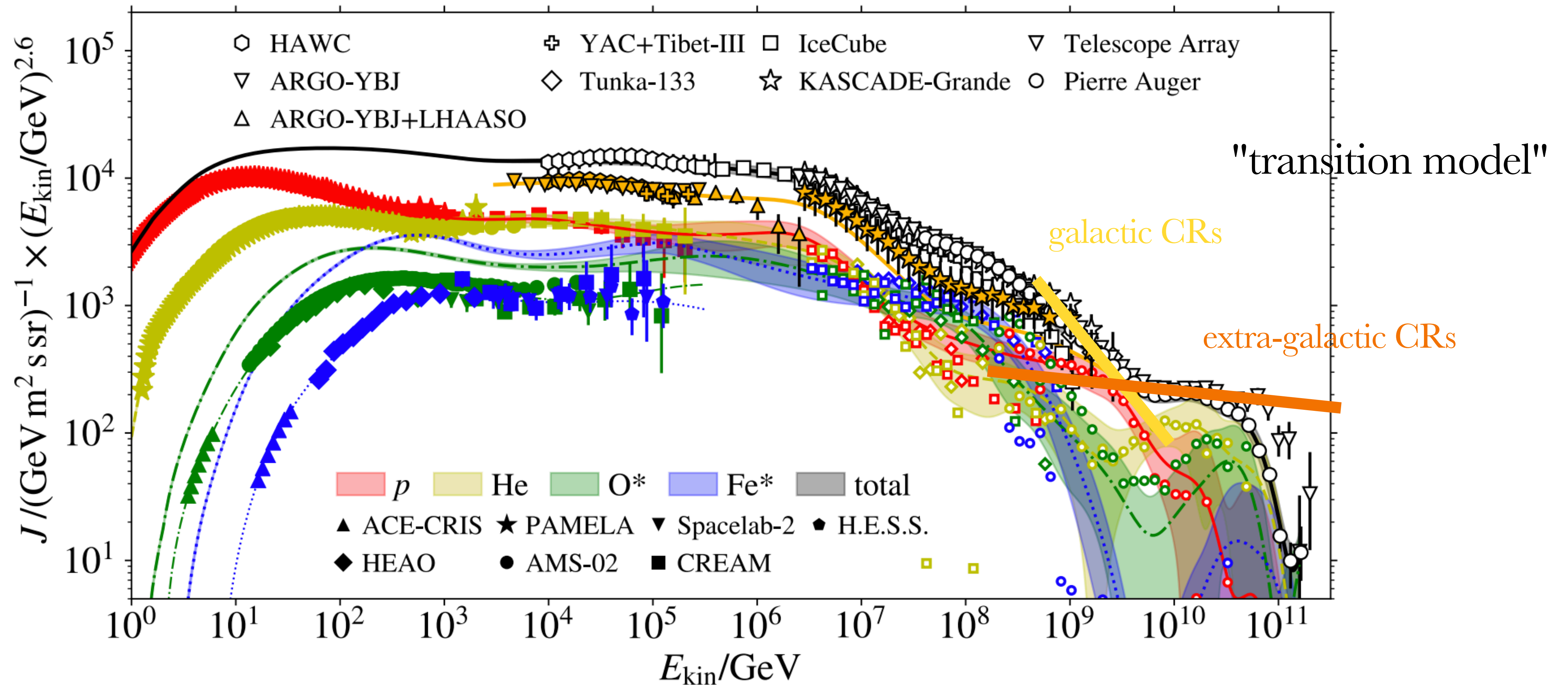
[H.P. Dembinski, R. Engel, A. Fedynitch, T. K. Gaisser, F. Riehn, T. Stanev, PoS ICRC2017 (2017) 533]



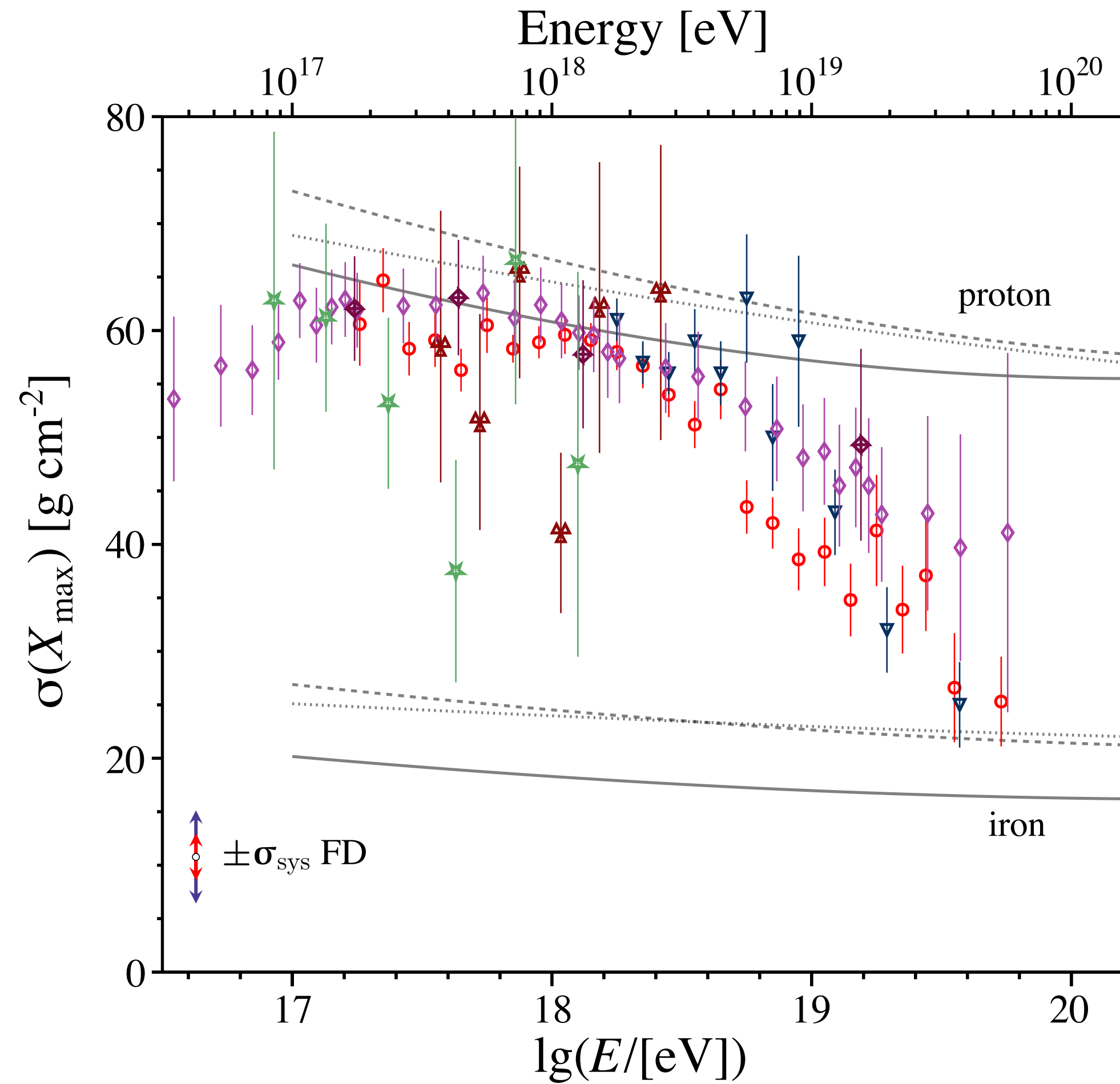
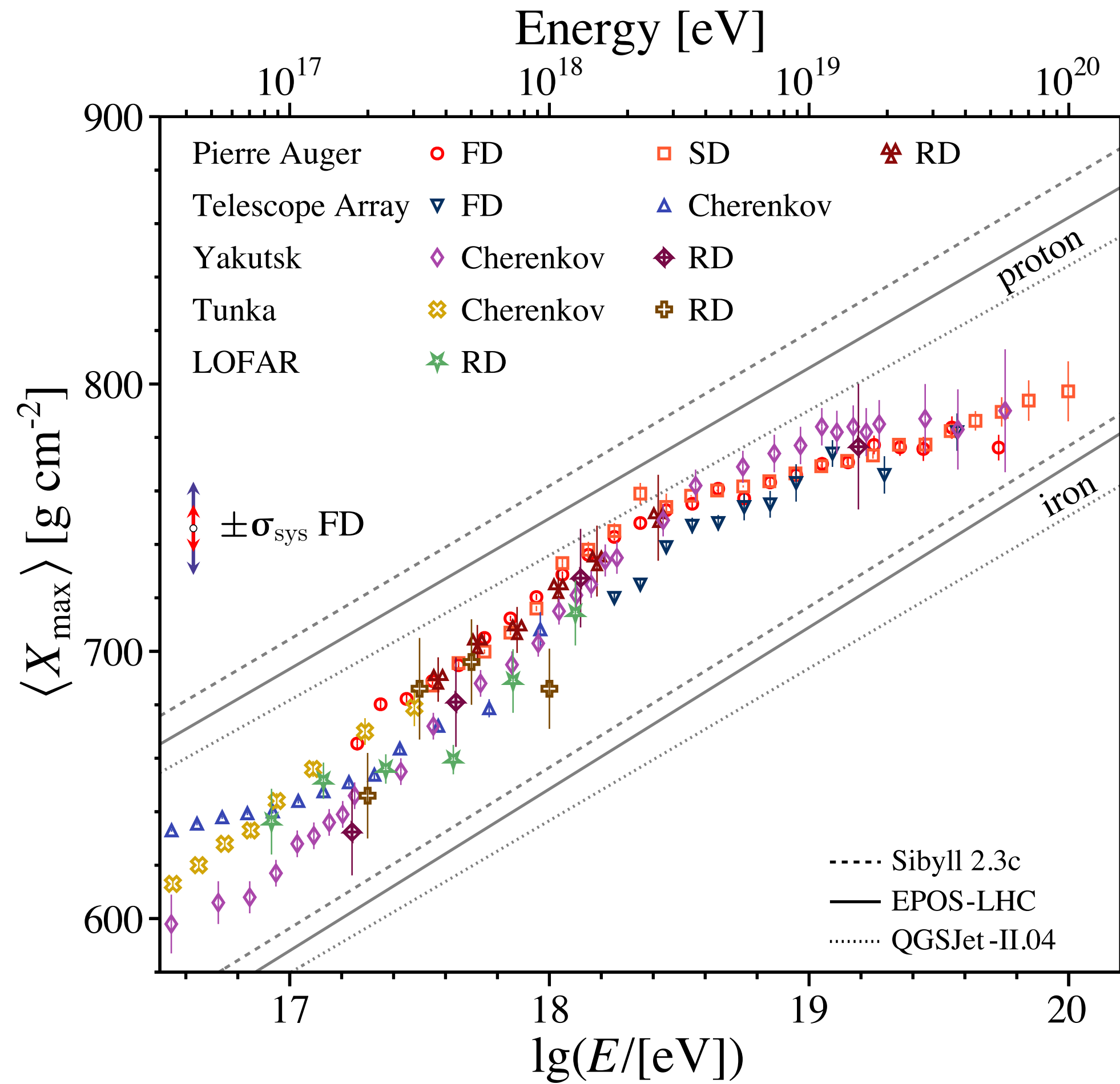
Cosmic Ray Mass Composition

► **Global Spline Fit (GSF) flux model**

[H.P. Dembinski, R. Engel, A. Fedynitch, T. K. Gaisser, F. Riehn, T. Stanev, PoS ICRC2017 (2017) 533]



Cosmic Ray Mass Composition



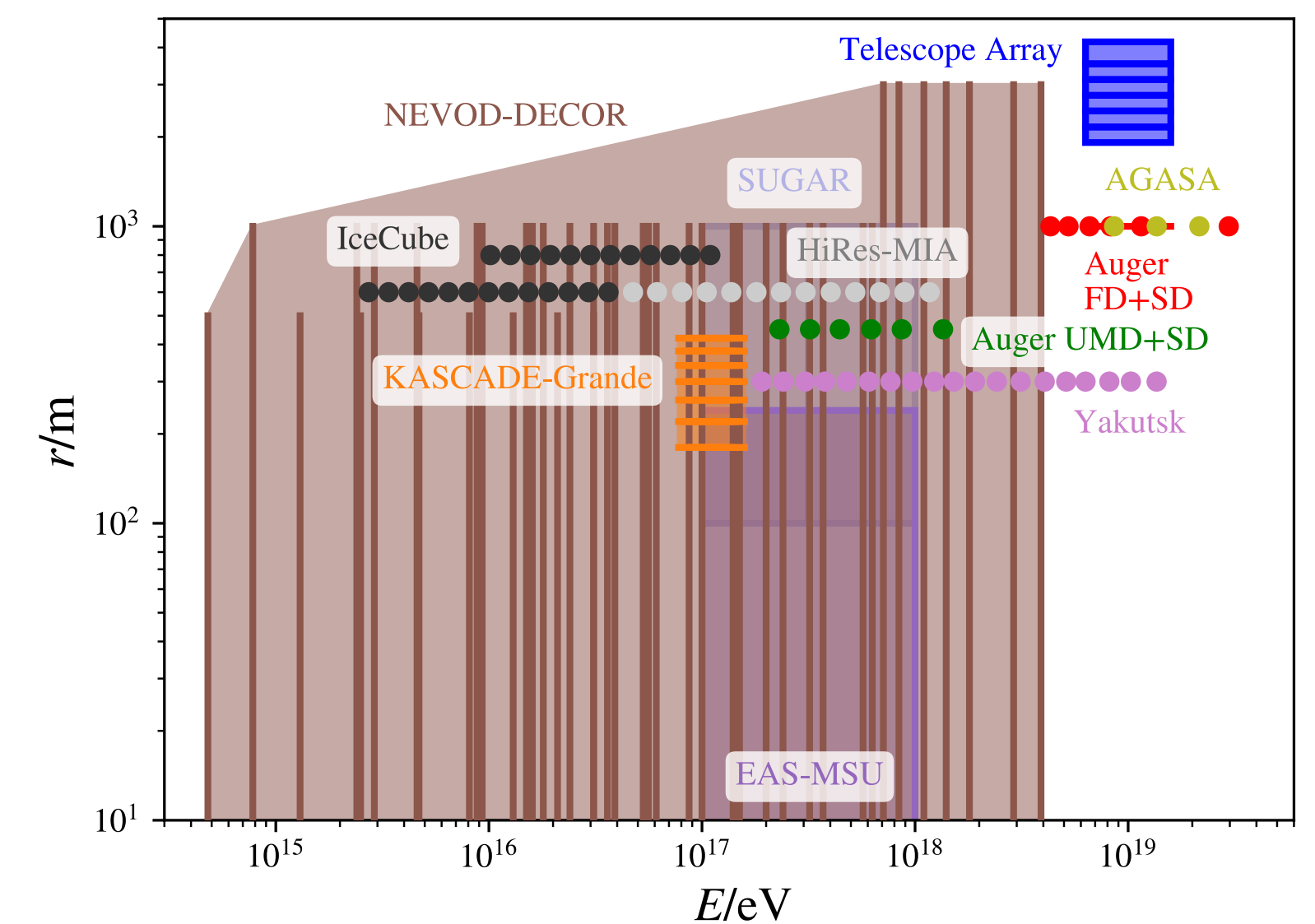
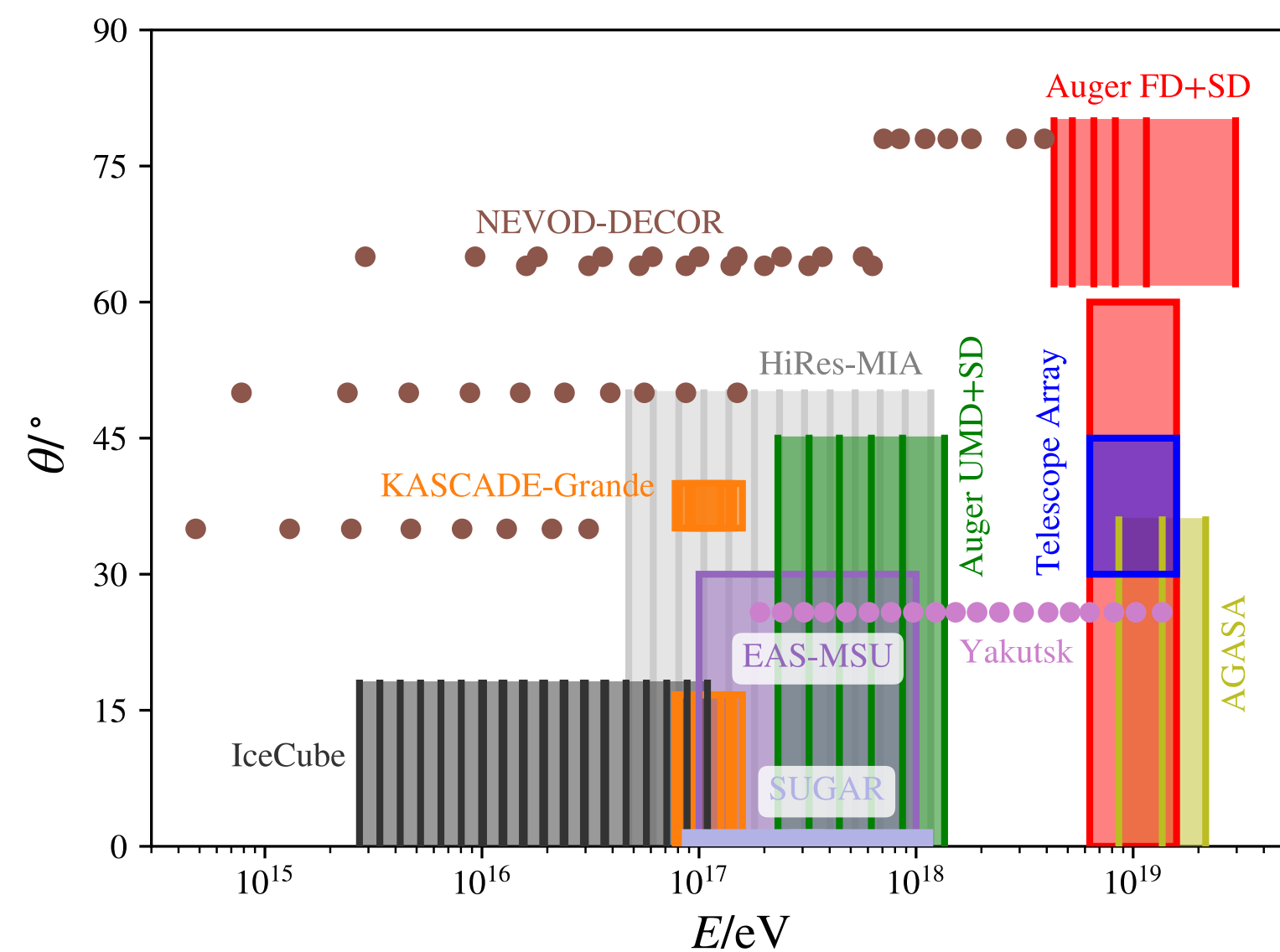
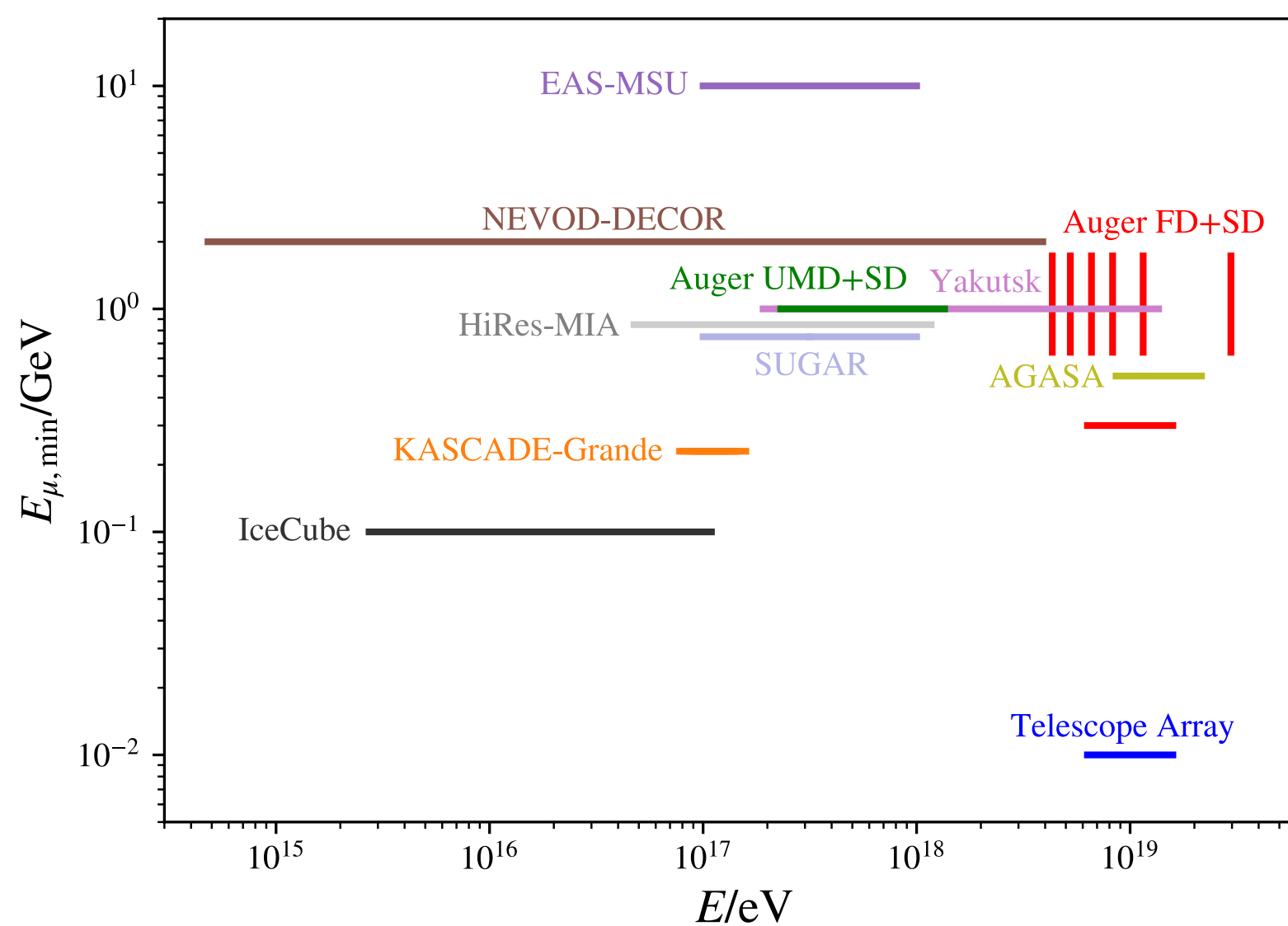
Muon Measurements

Global Muon Measurements

- ▶ Data taken over large parameter space under very different experimental conditions!
- ▶ Muon content is expressed in terms of z -scale:

$$z = \frac{\ln(N_{\mu}^{\text{det}}) - \ln(N_{\mu,p}^{\text{det}})}{\ln(N_{\mu,Fe}^{\text{det}}) - \ln(N_{\mu,p}^{\text{det}})}, \quad z = 0: \text{proton}, \quad z = 1: \text{iron}$$

- ▶ N_{μ}^{det} : muon content measured in the detector
- ▶ $N_{\mu,p}^{\text{det}}, N_{\mu,Fe}^{\text{det}}$: muon content in simulated EAS (proton/iron) at the detector



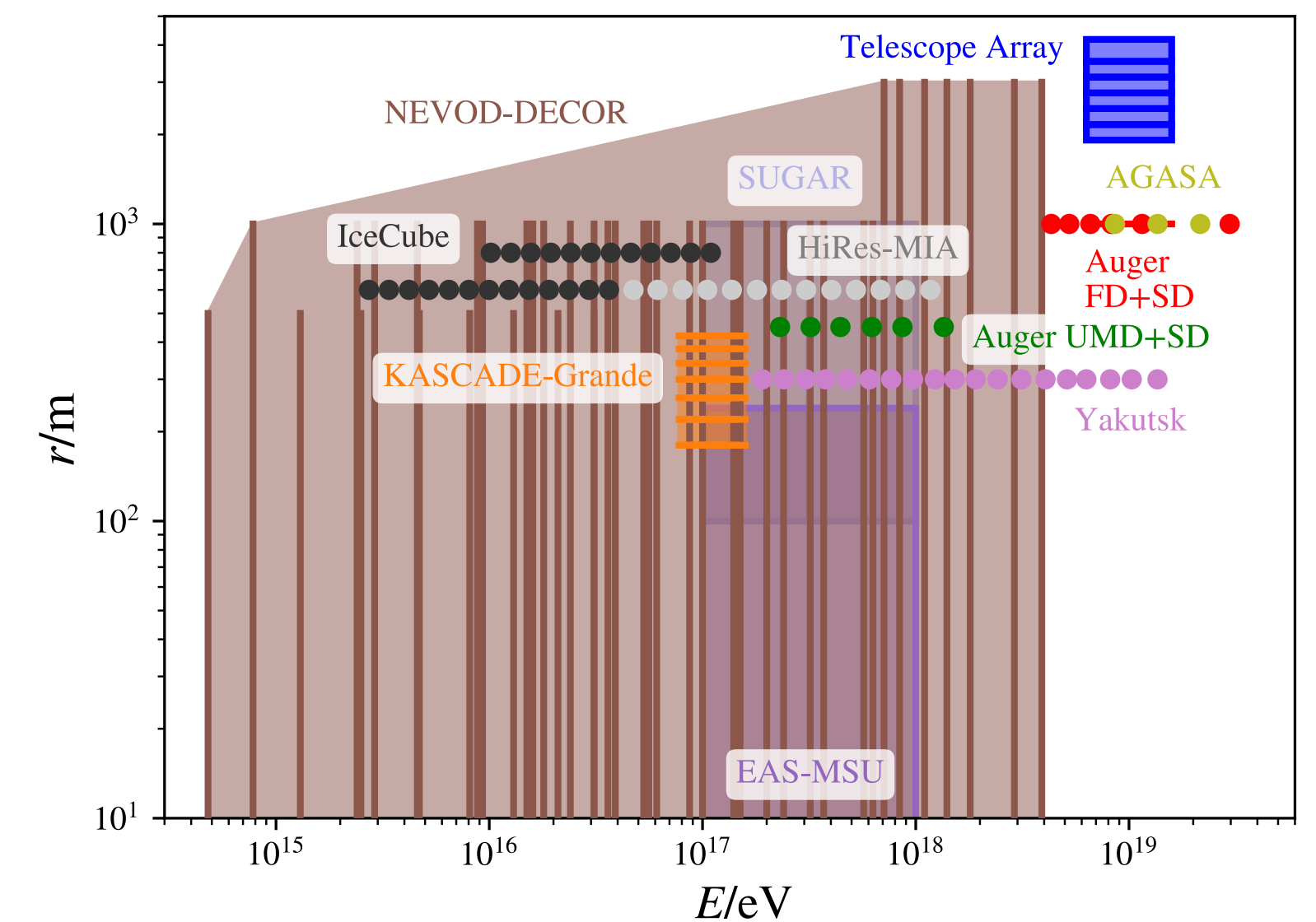
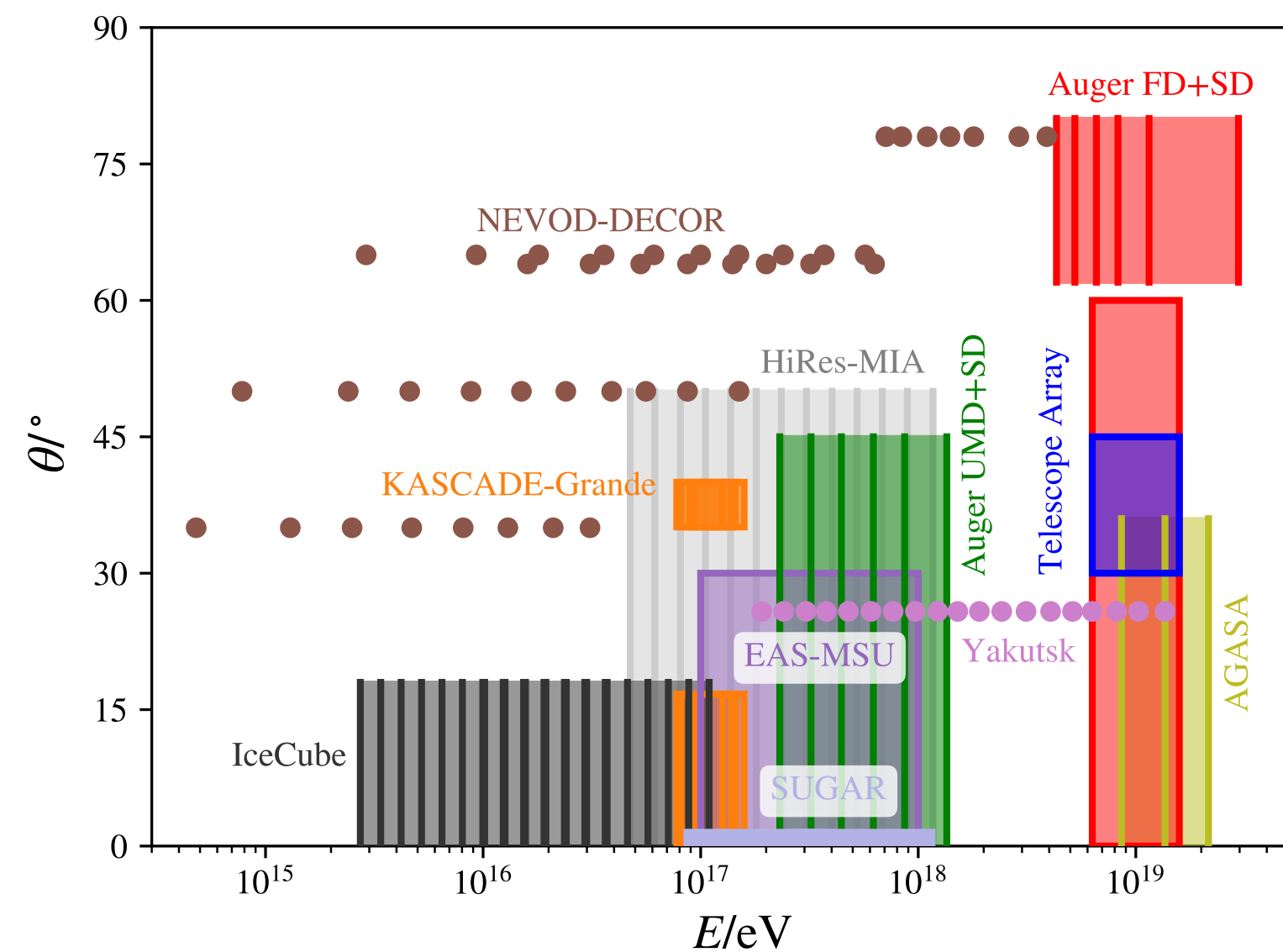
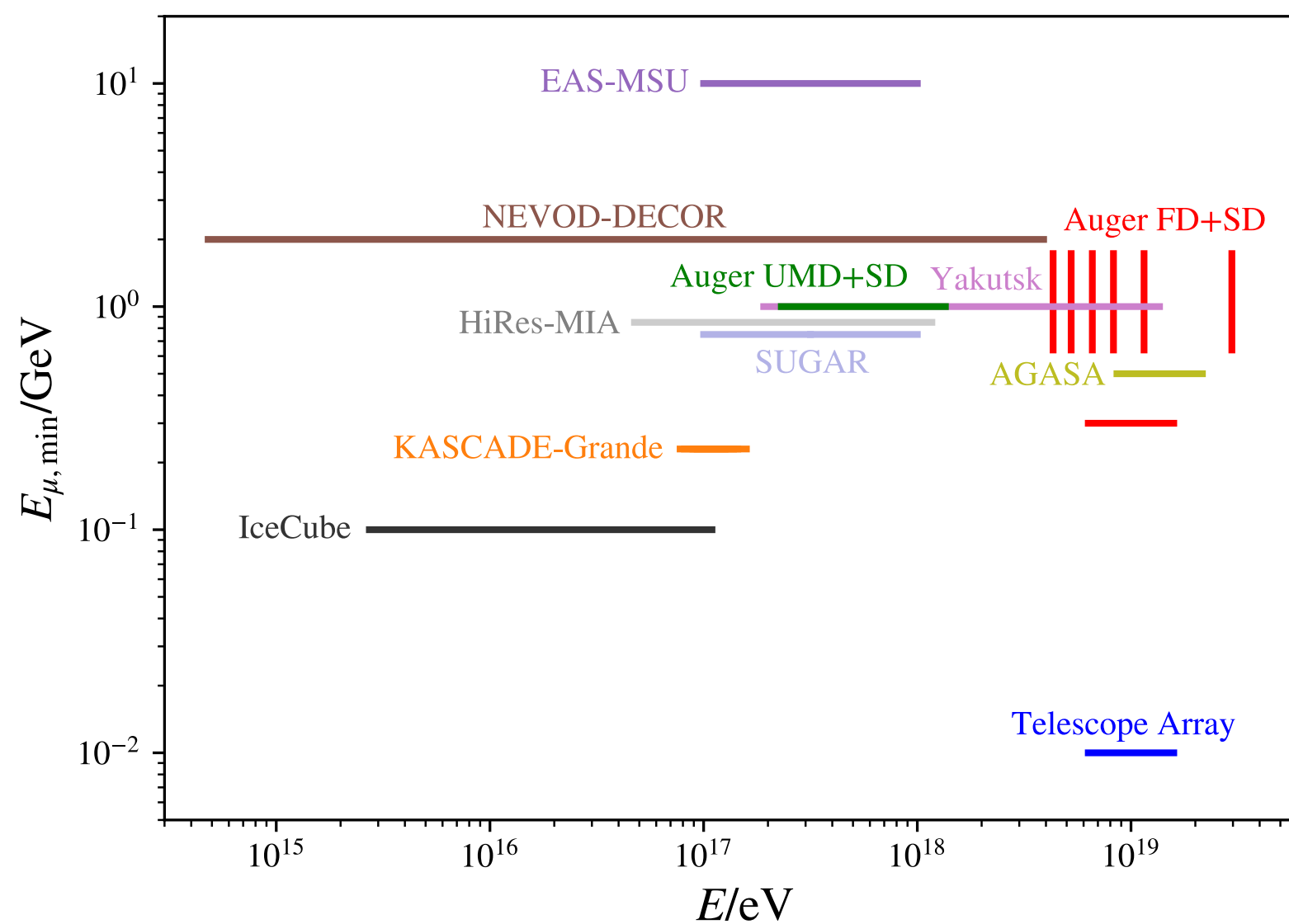
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Depends on hadronic interaction models!

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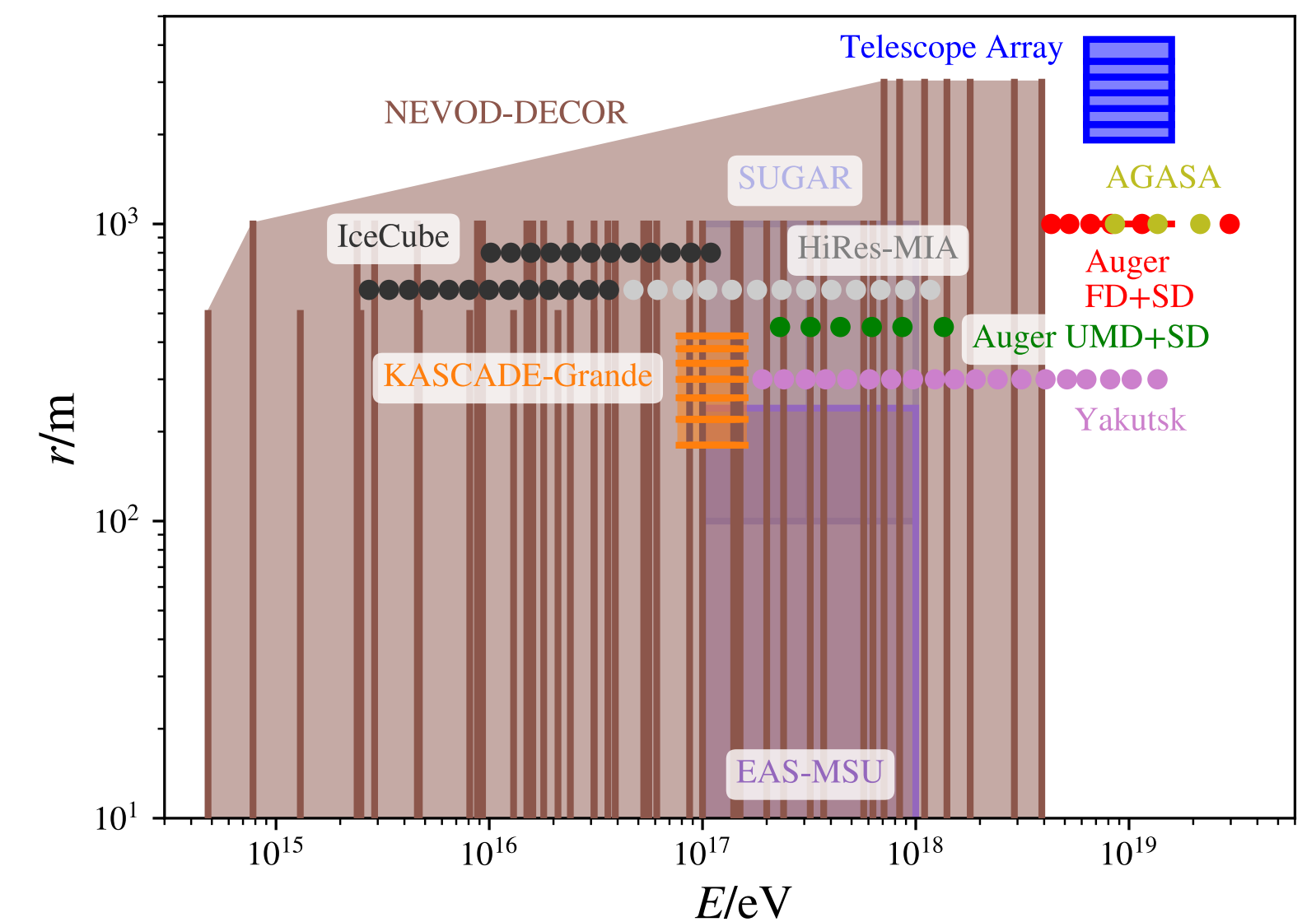
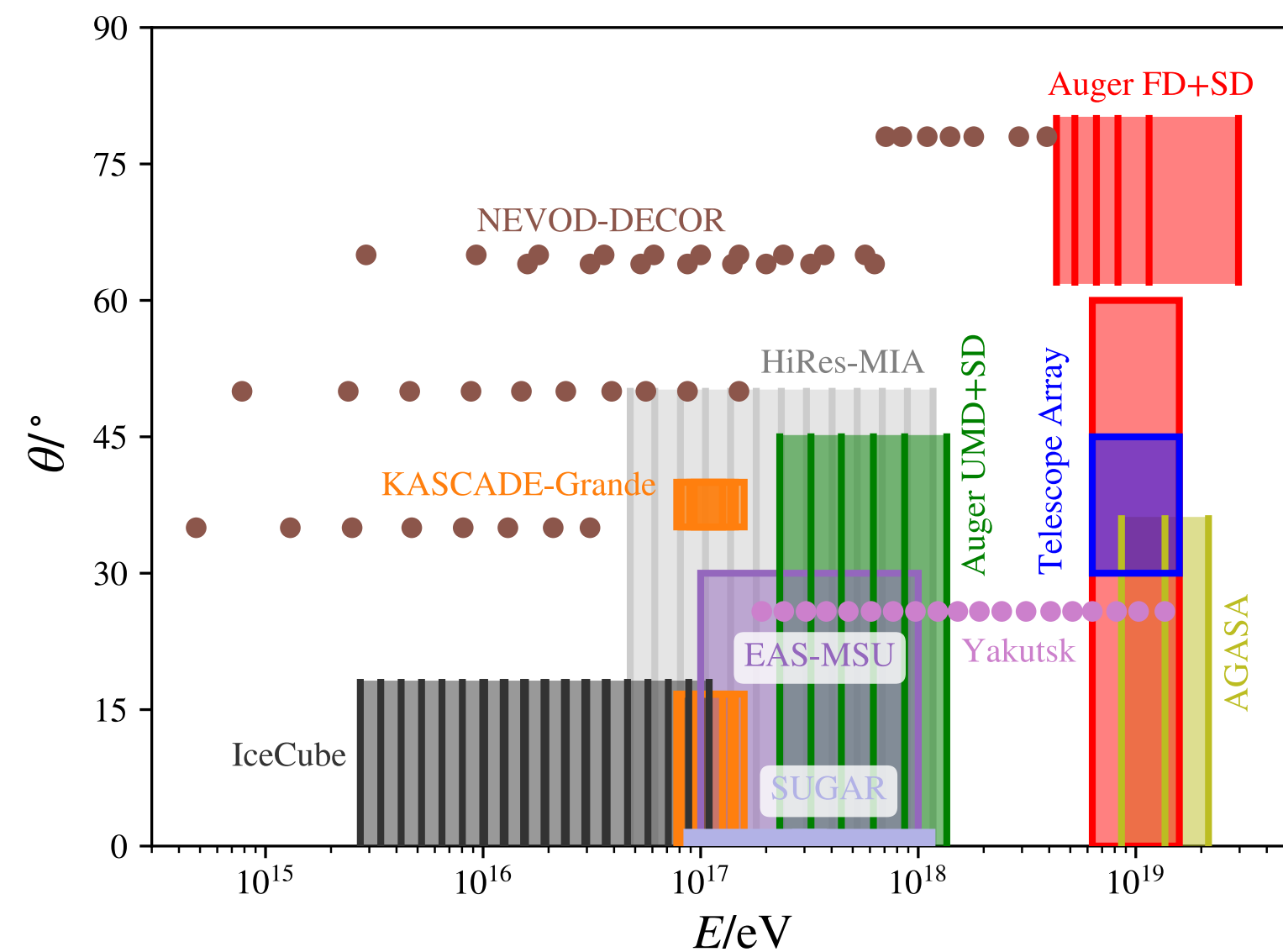
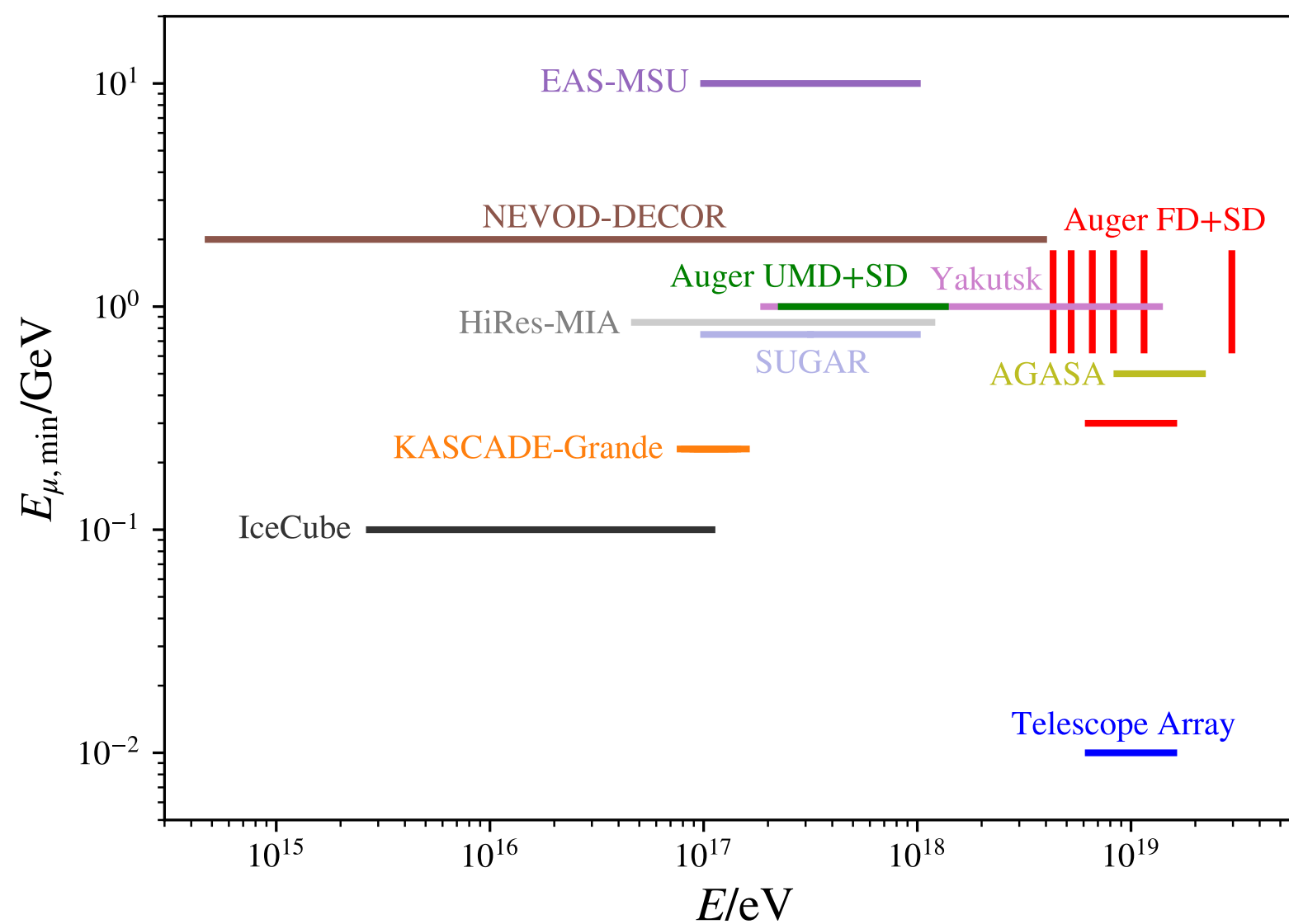
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Depends on hadronic interaction models!

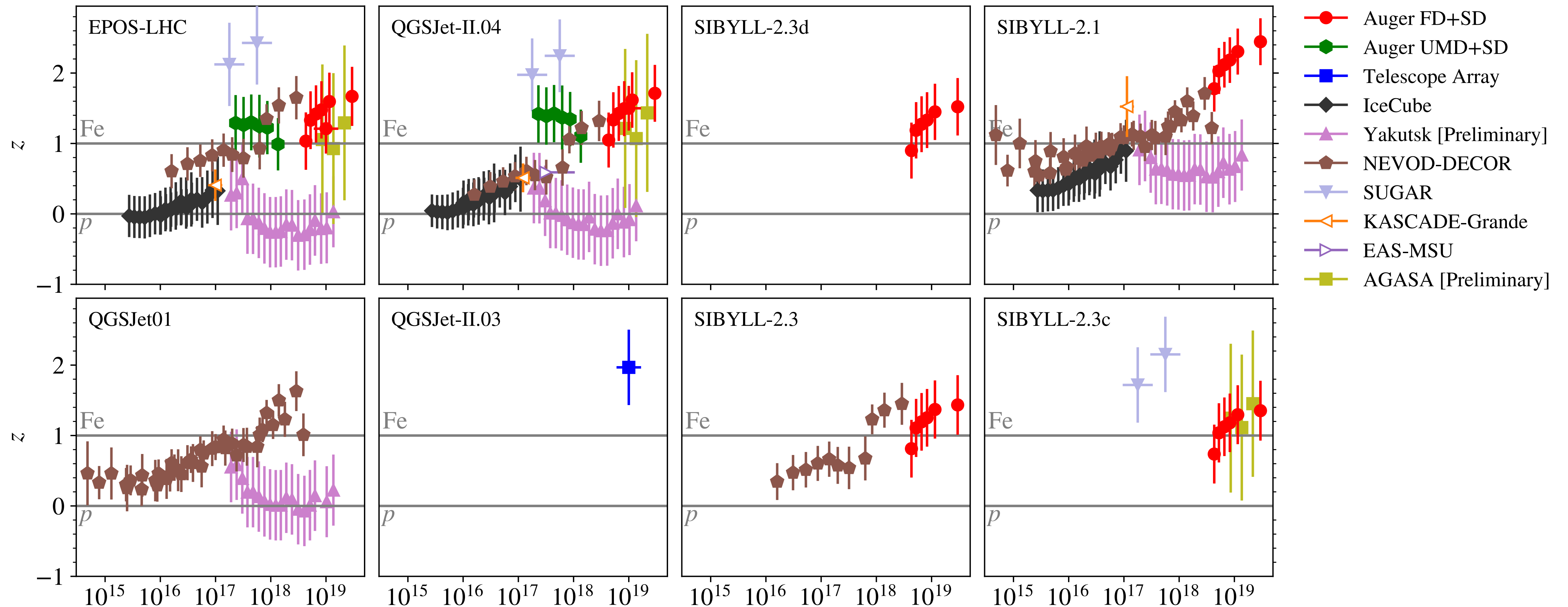
- ▶ N_{μ}^{det} : muon content measured in the detector
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Global Muon Measurements

► Muon measurements by 9 EAS experiments

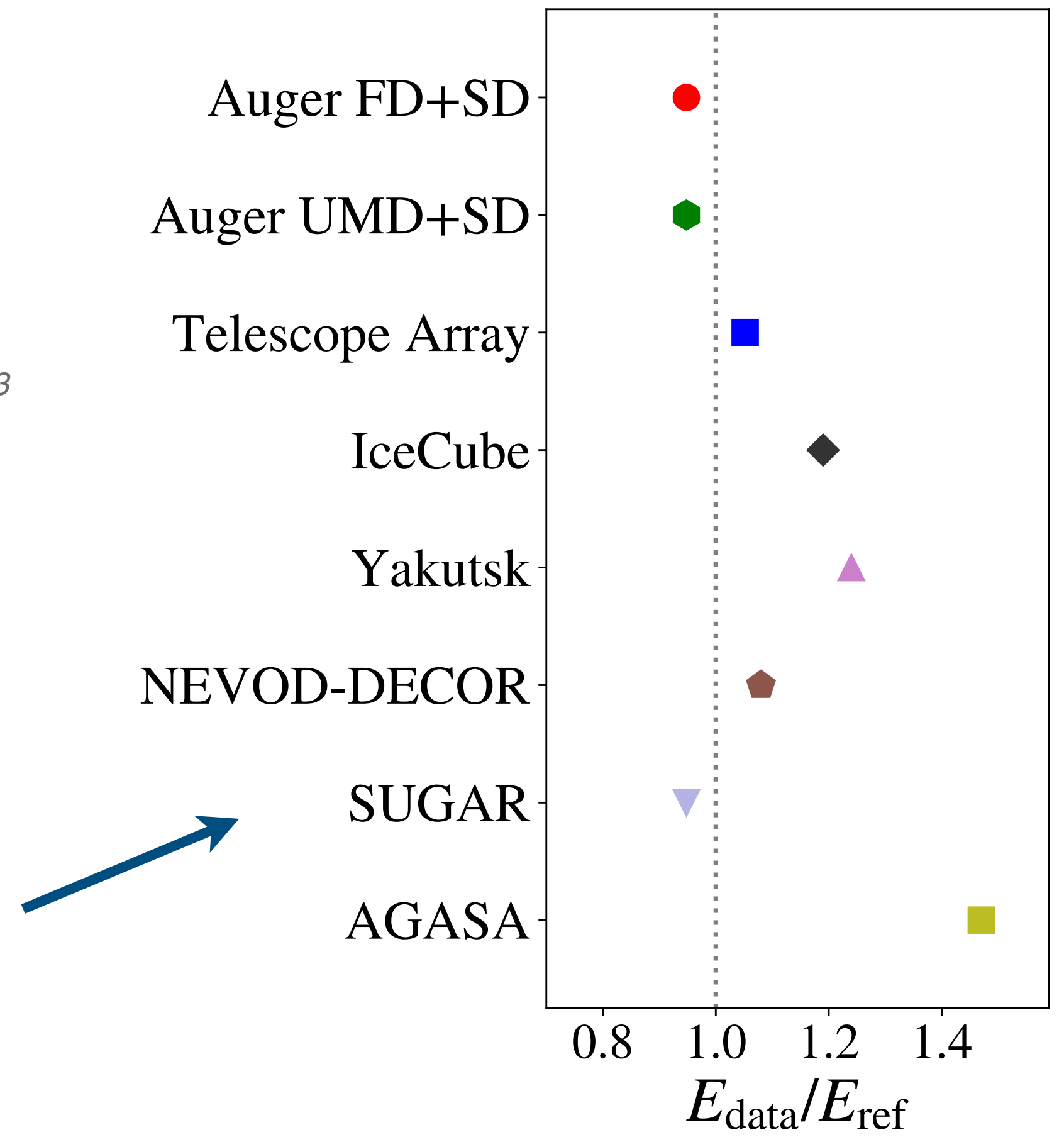
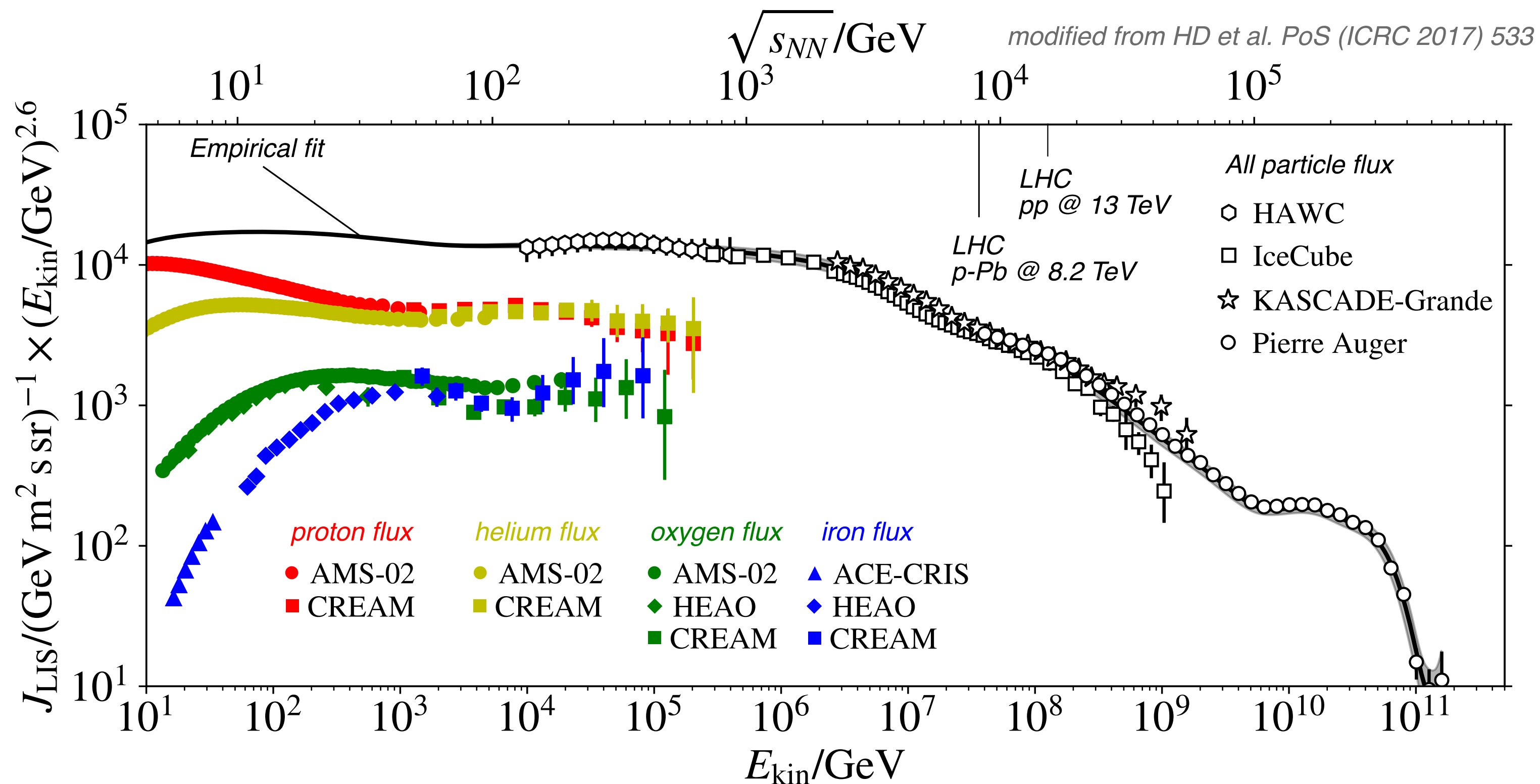
[D. Soldin et al., PoS ICRC2021 (2021) 349]



Energy-Rescaling

- ▶ Known energy-scale offsets between EAS experiments!
- ▶ 20% offset in energy causes 18% shift in muons!
- ▶ Energy rescaling required!
- ▶ Reference model: Global-Spline Fit Model (GSF)

$$N_{\mu} = A \cdot \left(\frac{E_0}{A \cdot \xi_C} \right)^{\beta}$$

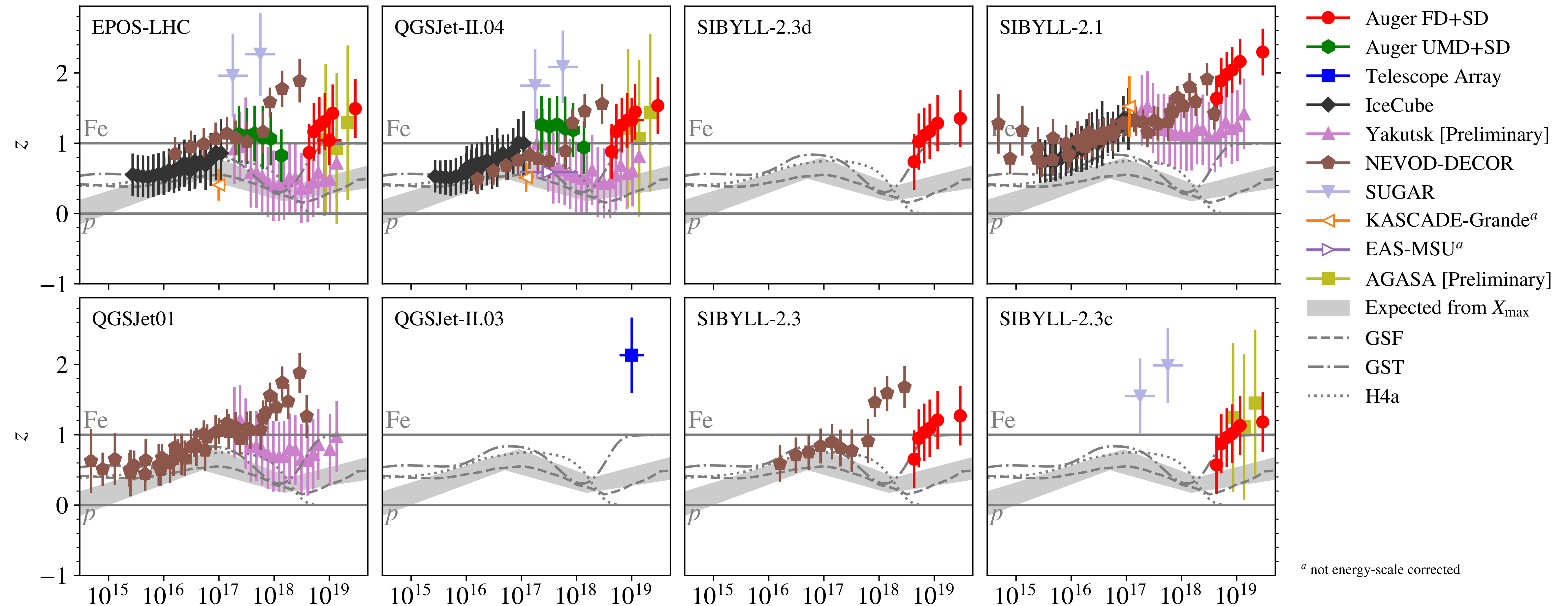


[H.P. Dembinski et al., PoS(ICRC2017)533]

The Muon Puzzle

► Muon lateral density after cross-calibration of the energy-scales

[D. Soldin et al., PoS ICRC2021 (2021) 349]



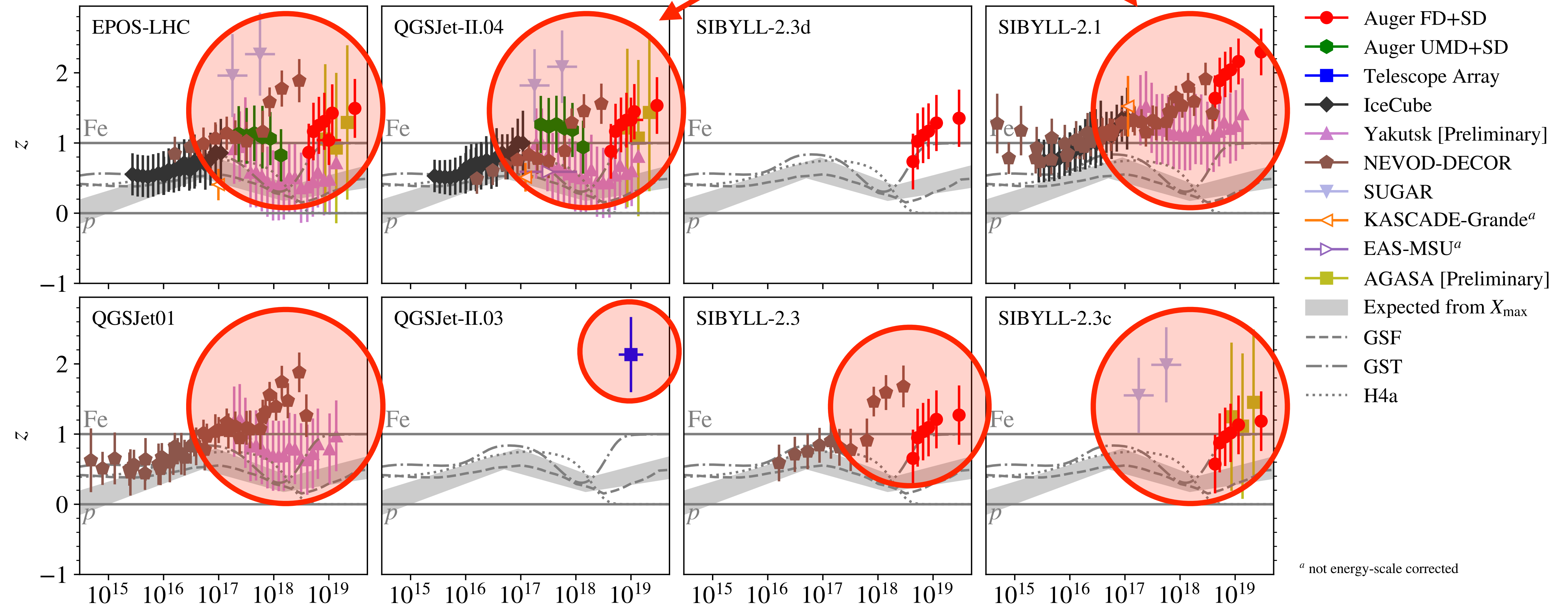
► Muon measurements indicate mass composition heavier than iron at high E_0 !

The Muon Puzzle

Muon Puzzle in EAS

► Muon lateral density after cross-calibration of the energy-scales

[D. Soldin et al., PoS ICRC2021 (2021) 349]



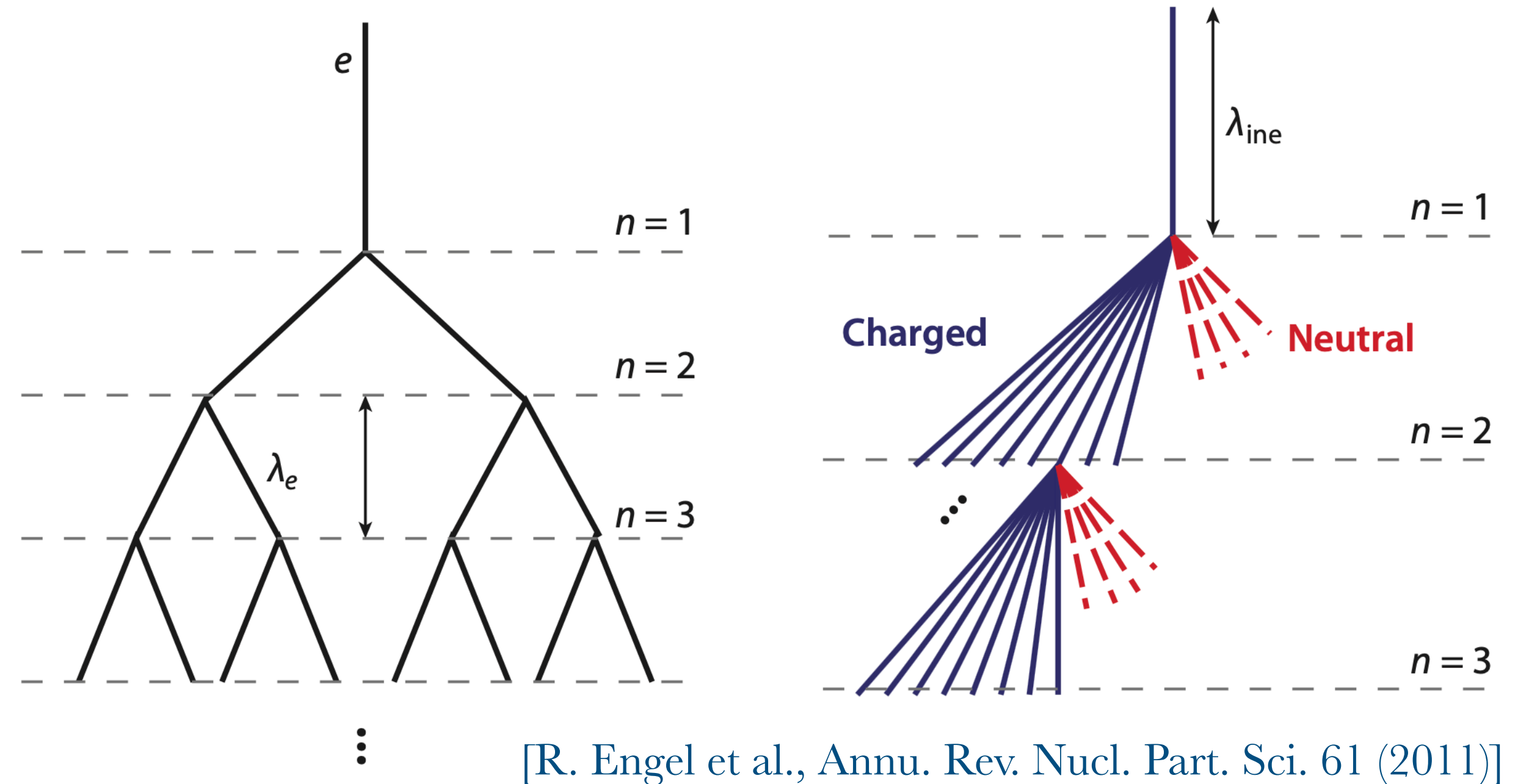
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Mass Dependence

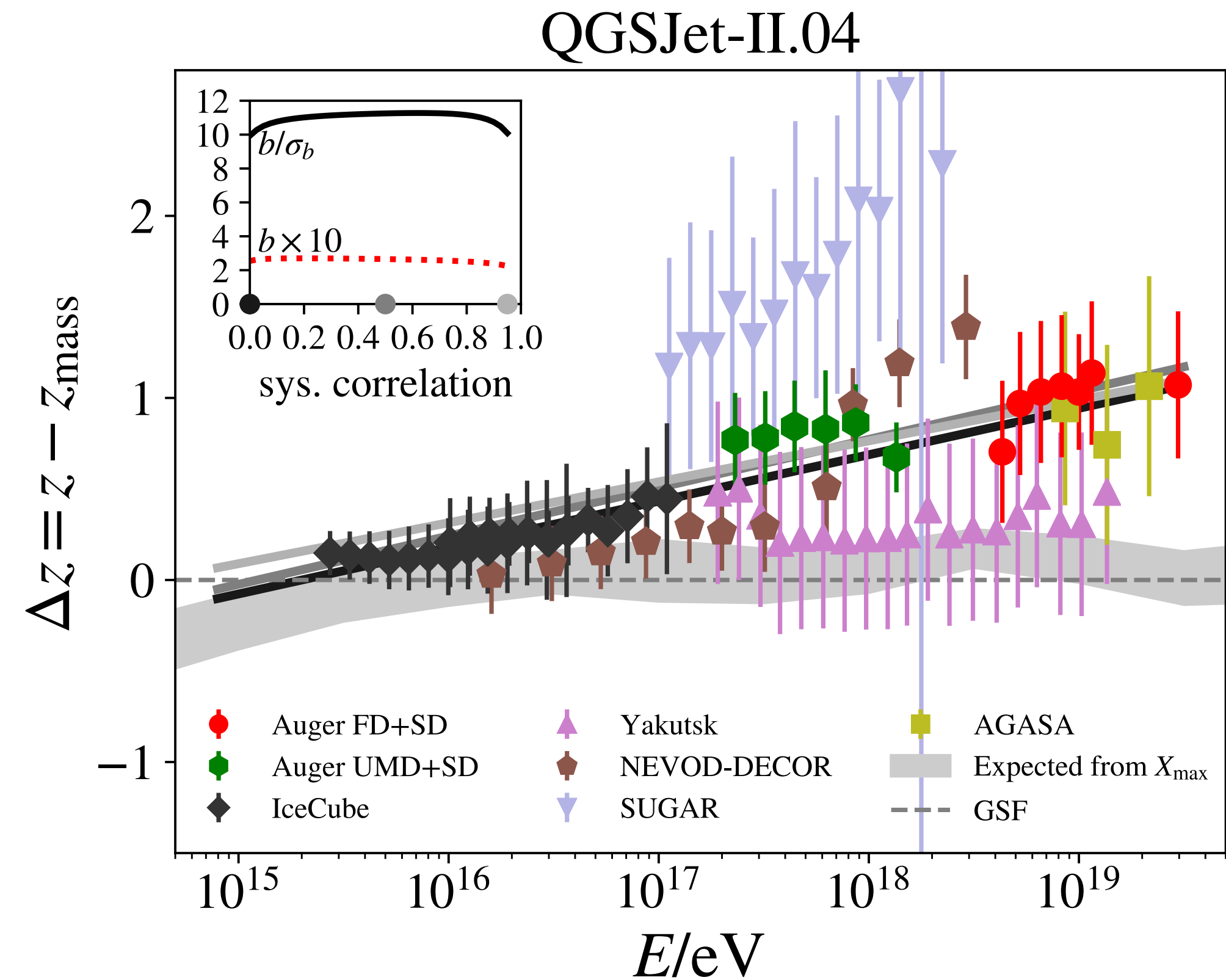
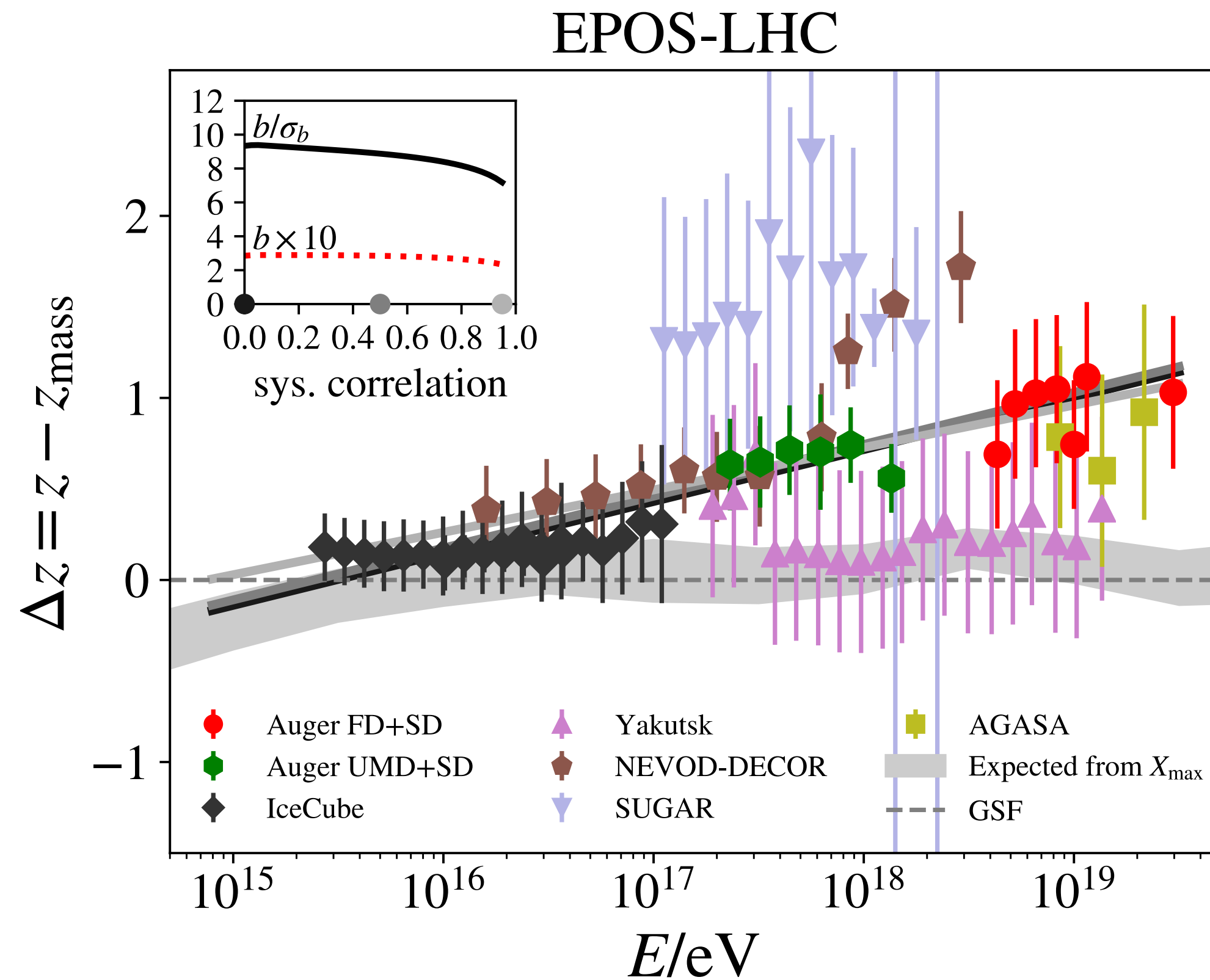
- ▶ Number of muons is described by the Heitler-Matthews model:

$$N_{\mu} = A^{1-\beta} \cdot \left(\frac{E}{\xi_C} \right)^{\beta}, \quad \beta \simeq 0.9$$

- ▶ E : primary cosmic ray energy
 - ▶ A : primary mass number
 - ▶ ξ_C : energy constant
- ▶ When studying the energy-dependent trend in the muon measurements, the cosmic ray mass need to be taken into account!
 - ▶ Mass dependence can be removed by subtracting z_{mass} based on the GSF model, i.e. in the plot on the previous slide "subtract the GSF line from the data points"

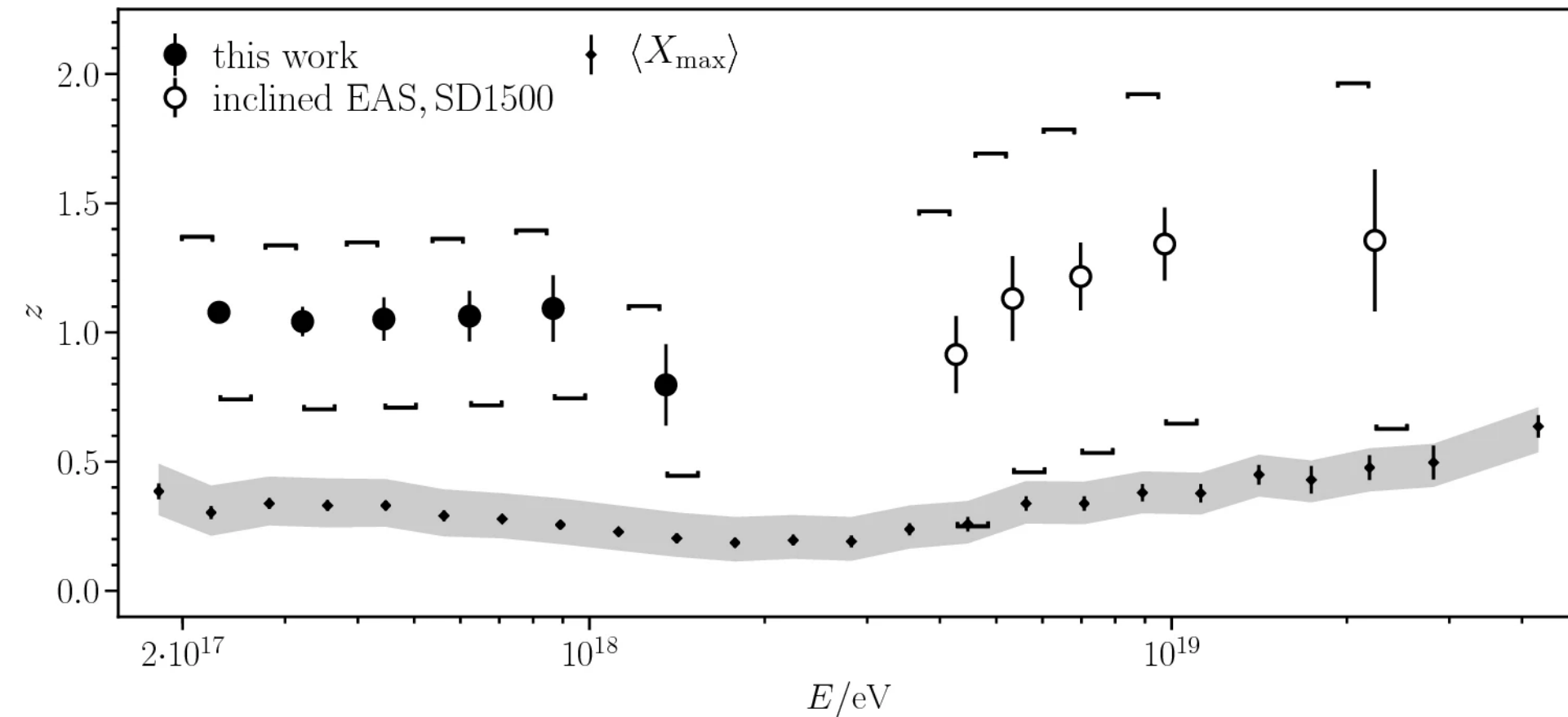


Mass-Corrected z-Scale

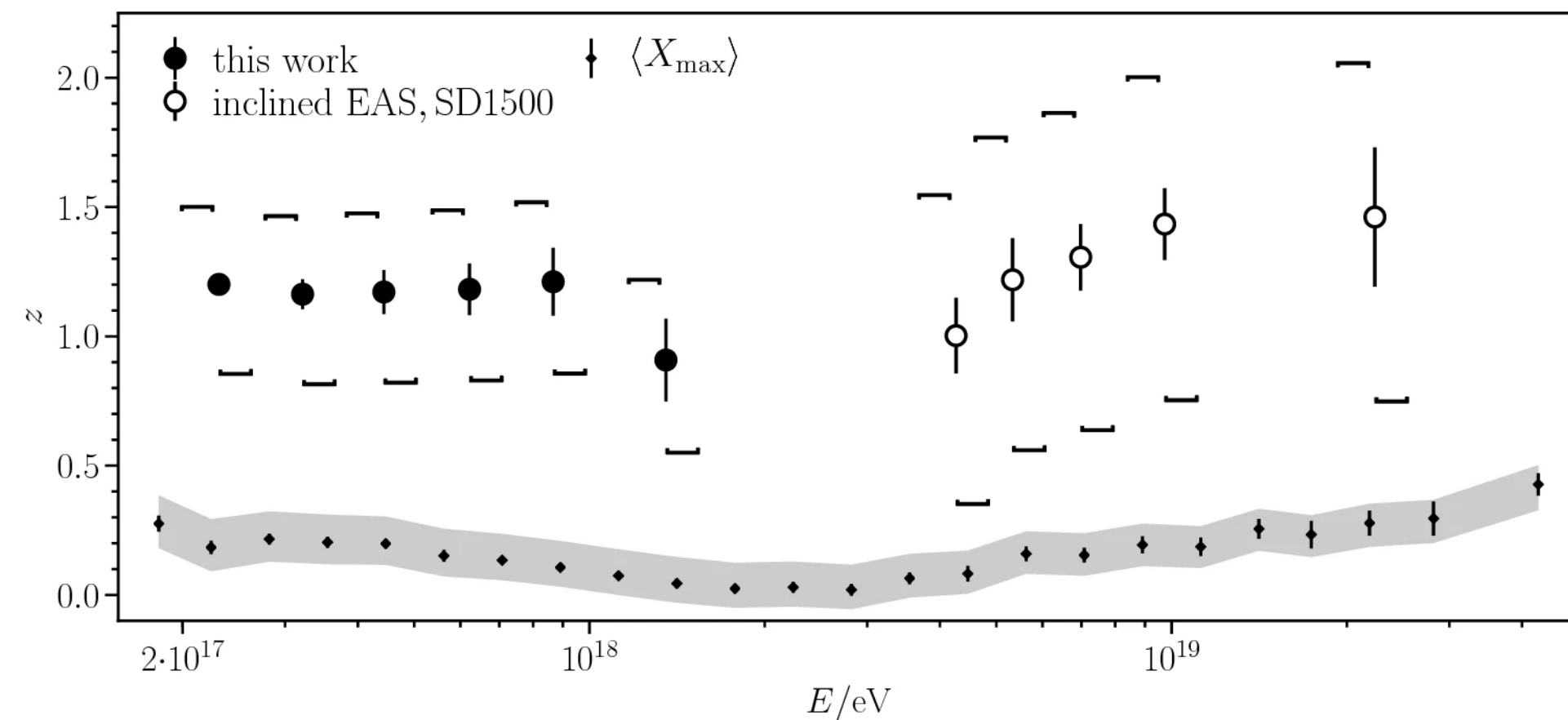


- ▶ Fit depends on assumption of correlation, α , between systematic uncertainties
- ▶ Slope of the fit: $b = 0.23 - 0.29$ (EPOS-LHC), $b = 0.22 - 0.25$ (QGSJet-II.04)
- ▶ Significance of the slope: $\sim 7\sigma - 9\sigma$ (EPOS-LHC), $\sim 10\sigma - 11\sigma$ (QGSJet-II.04)

Muon Measurements at High Energies



(a) EPOS-LHC



(b) QGSJETII-04

In range $2 \cdot 10^{17}$ eV to $2 \cdot 10^{19}$ eV simulations don't reproduce muon densities!

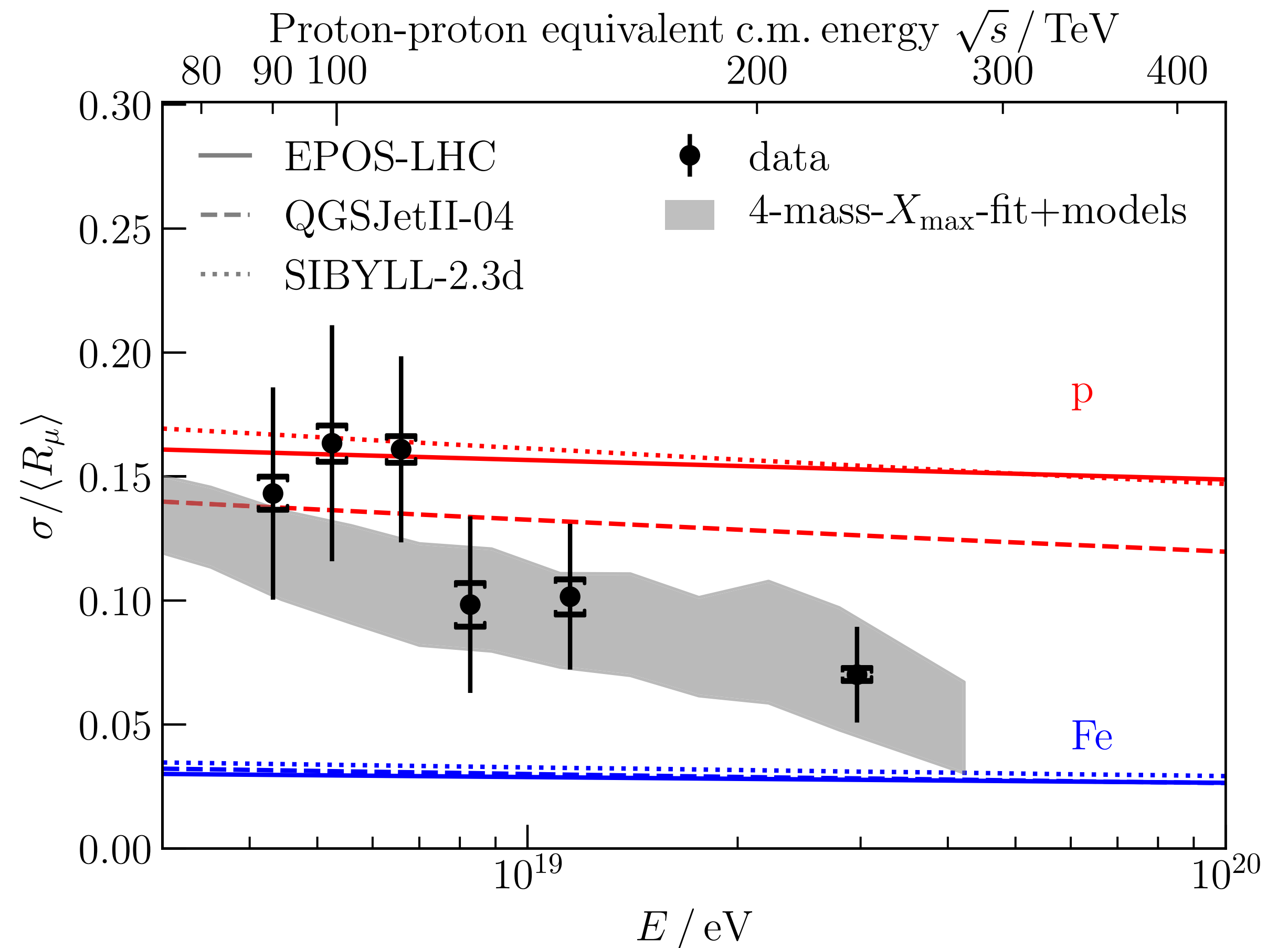
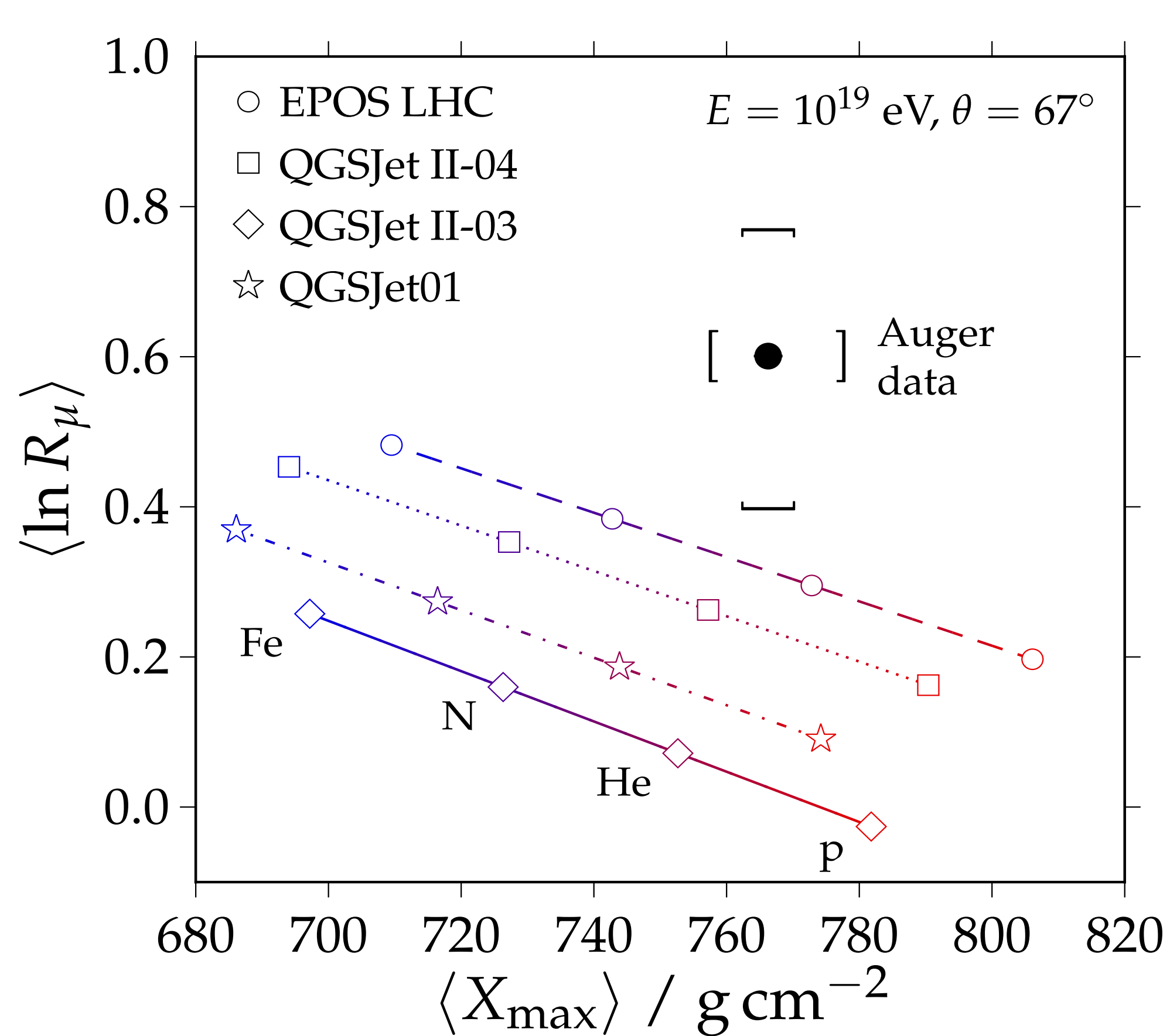
40% (50%) increase in $\langle N_\mu \rangle$ at 10^{18} eV needed for EPOS-LHC (QGSJet-II.04)

[A. Aab et al. (Pierre Auger Collaboration), Phys. Rev. D91 (2015)]

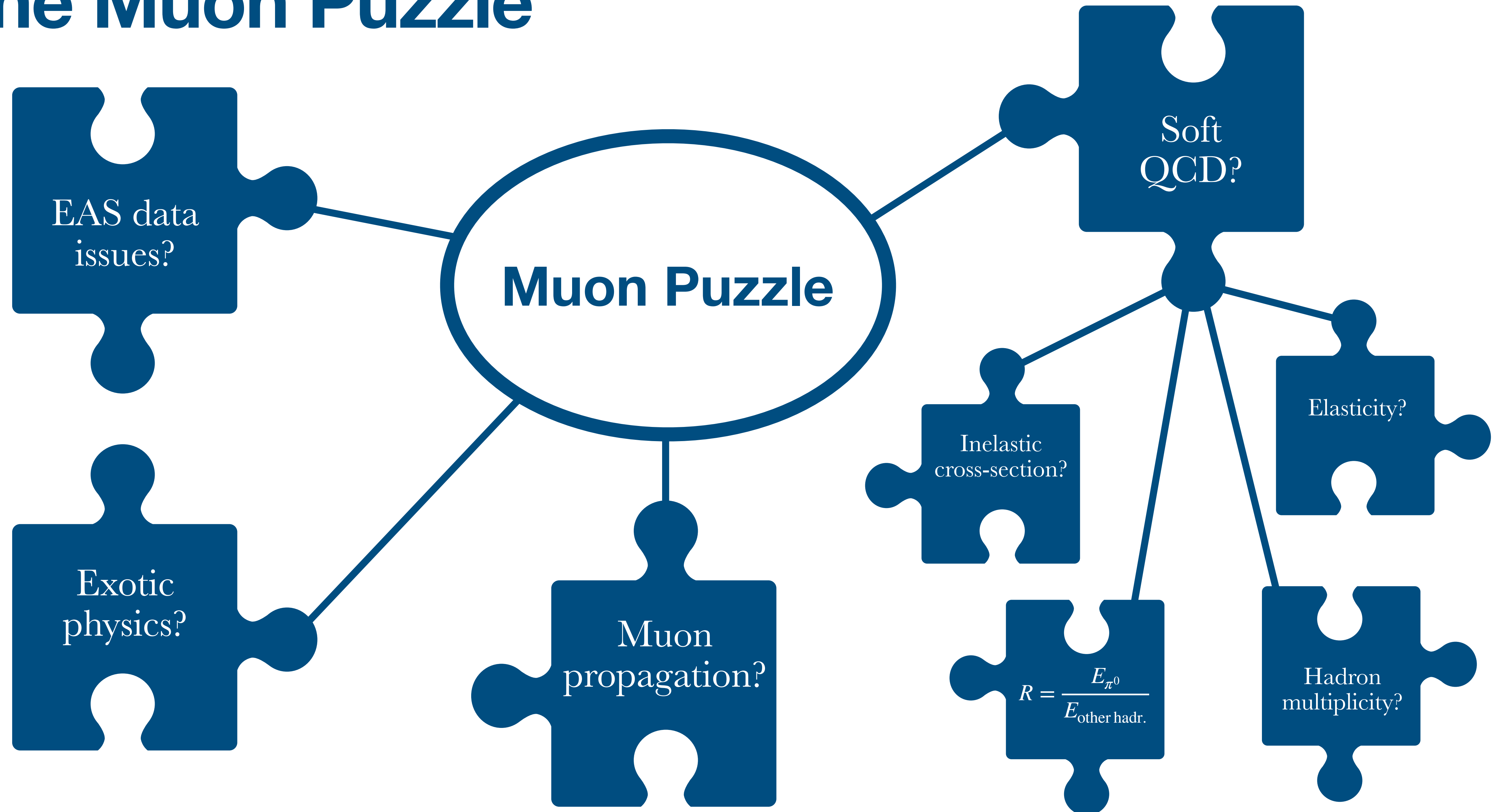
[A. Aab et al. (Pierre Auger Collaboration), Eur. Phys. J. C 80 (2020)]

Muon Measurements at High Energies

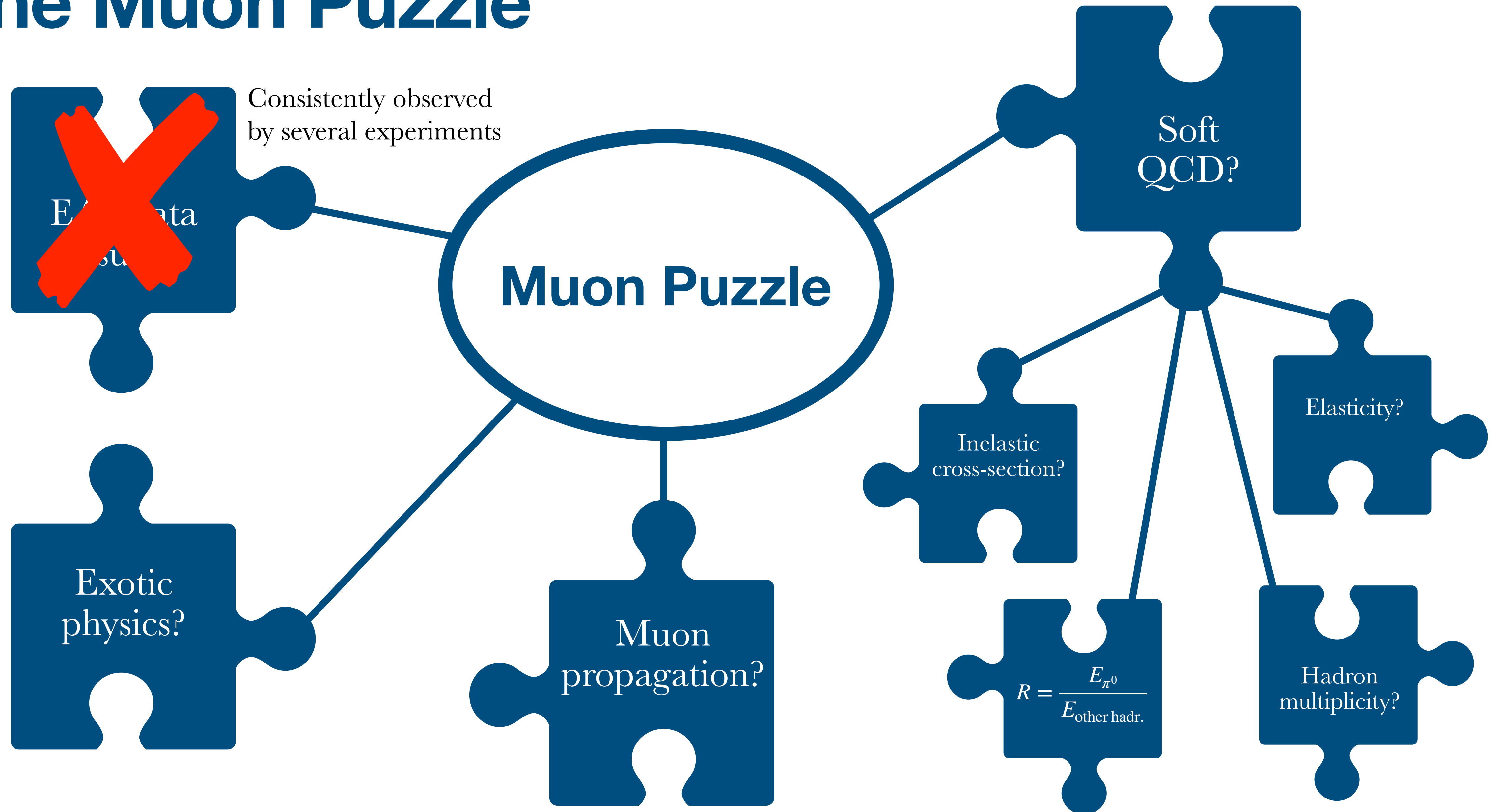
- ▶ Discrepancy in number of muons but relative fluctuations as expected!



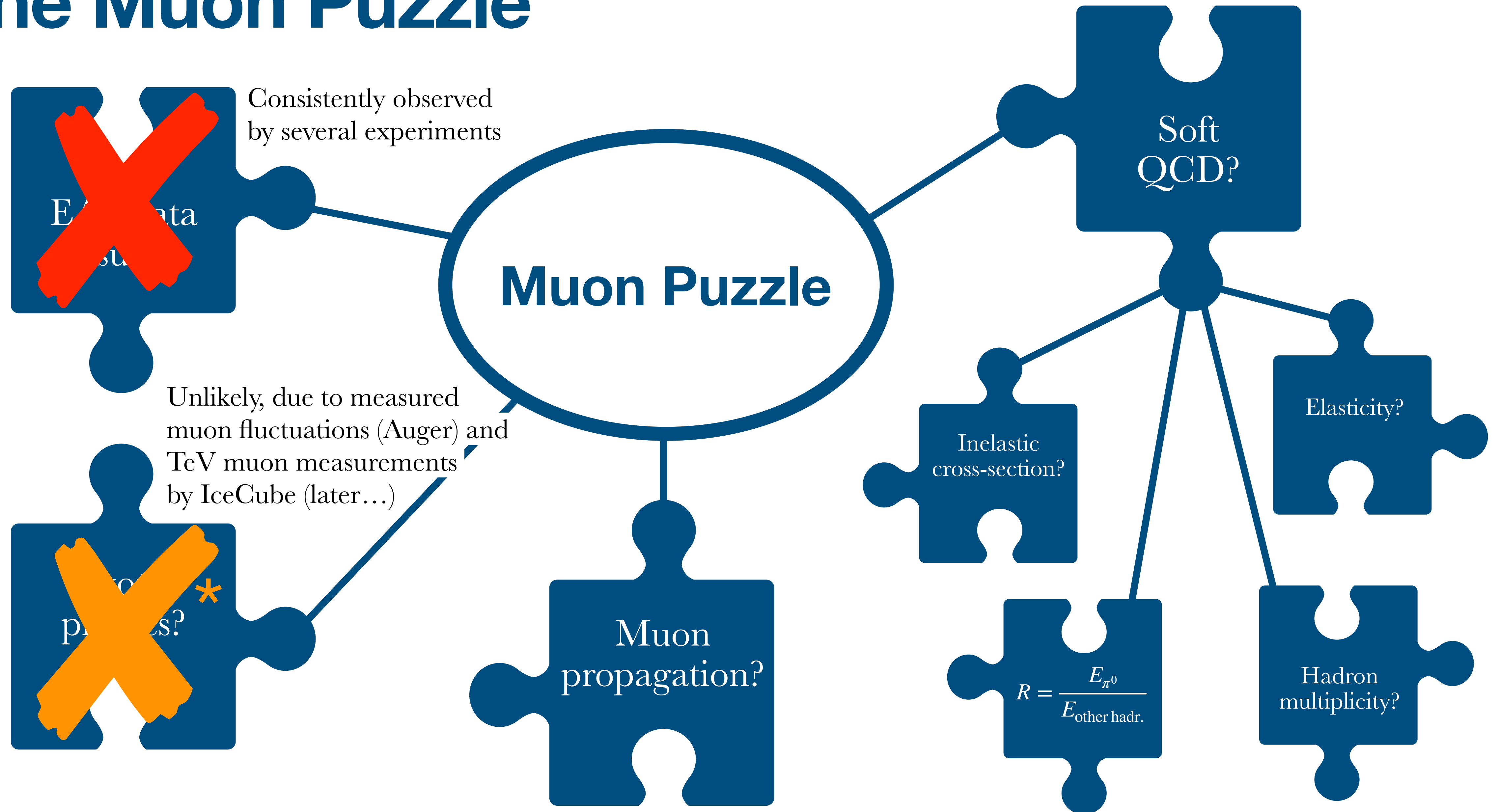
The Muon Puzzle



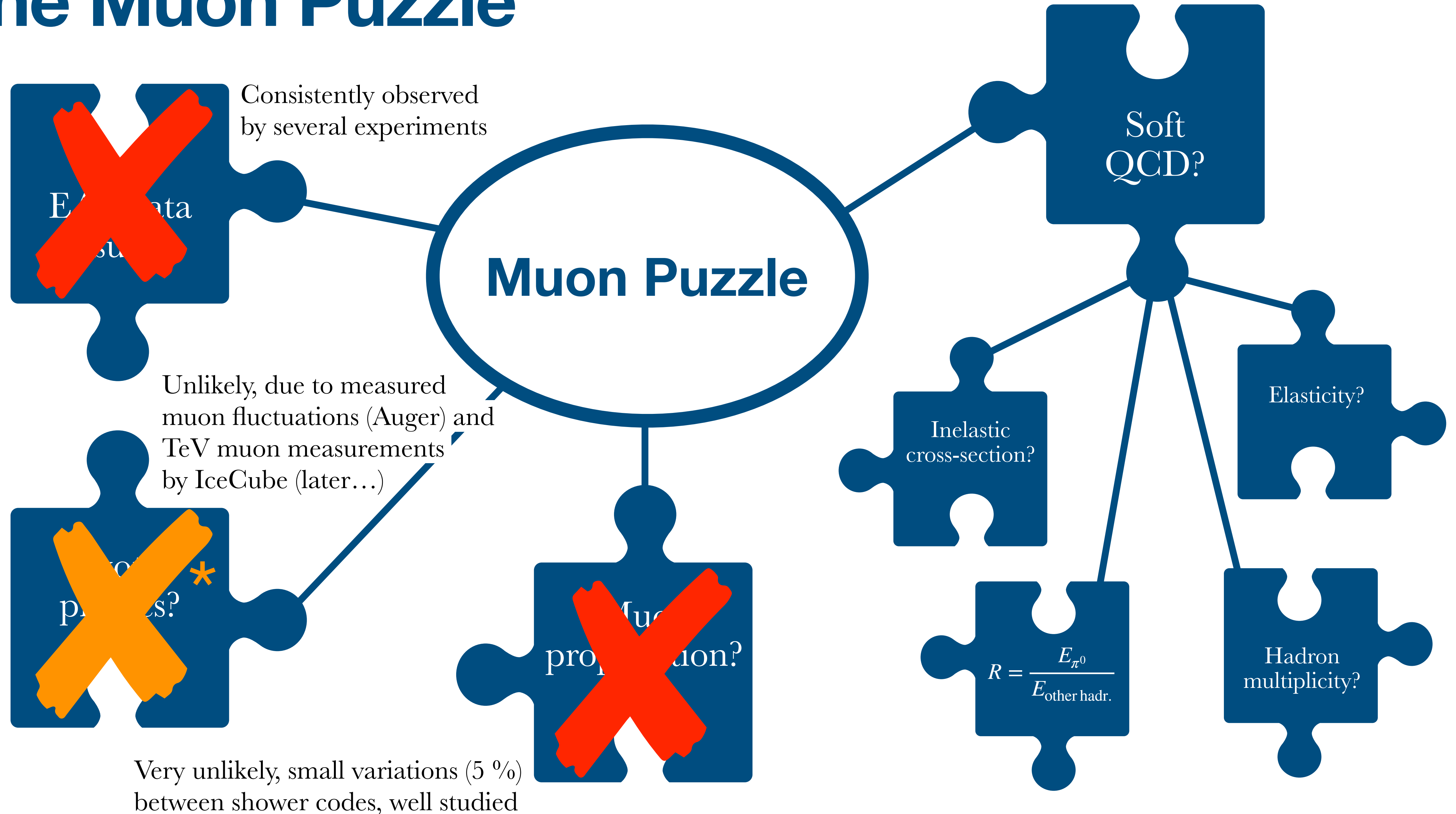
The Muon Puzzle



The Muon Puzzle



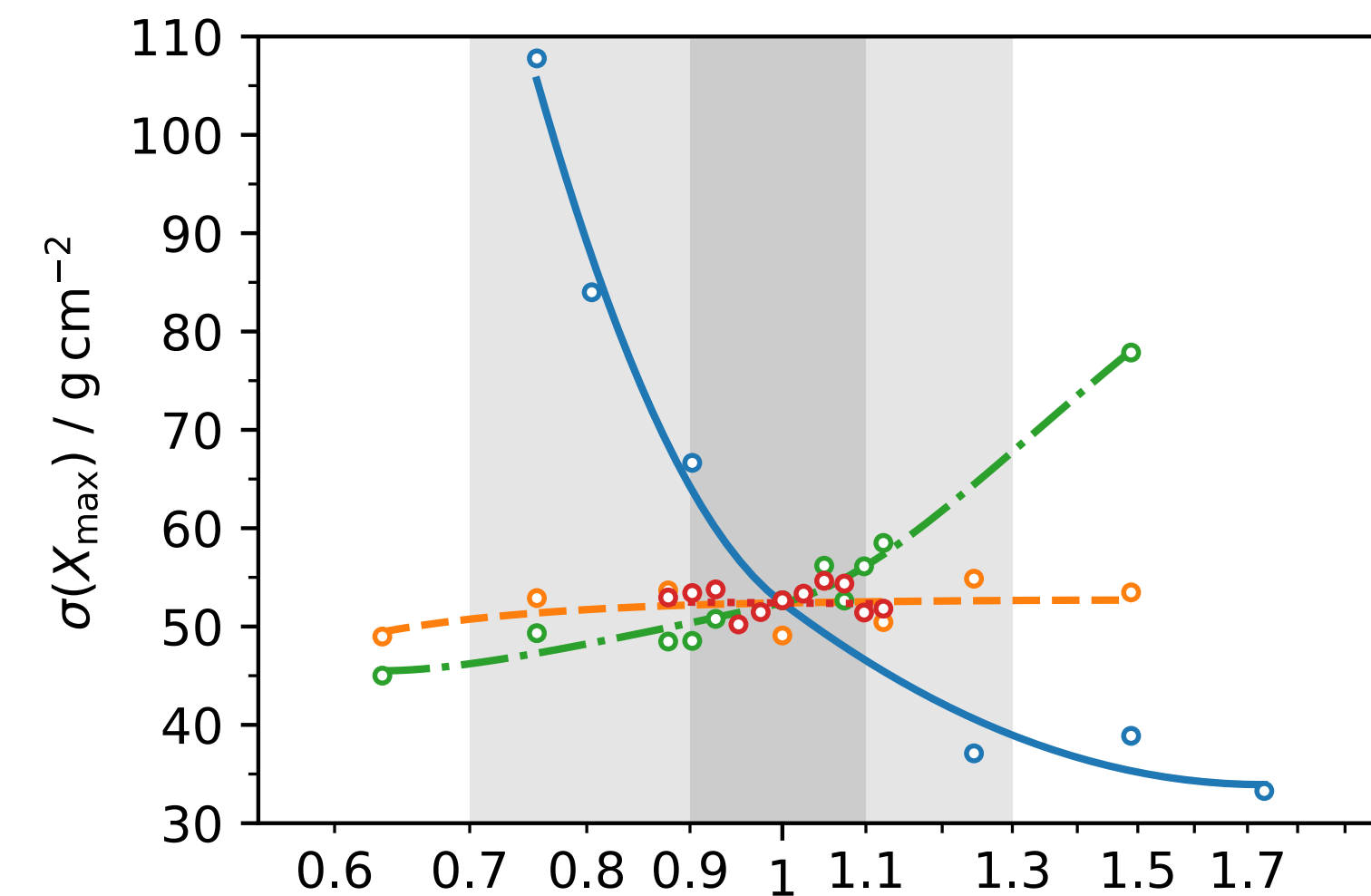
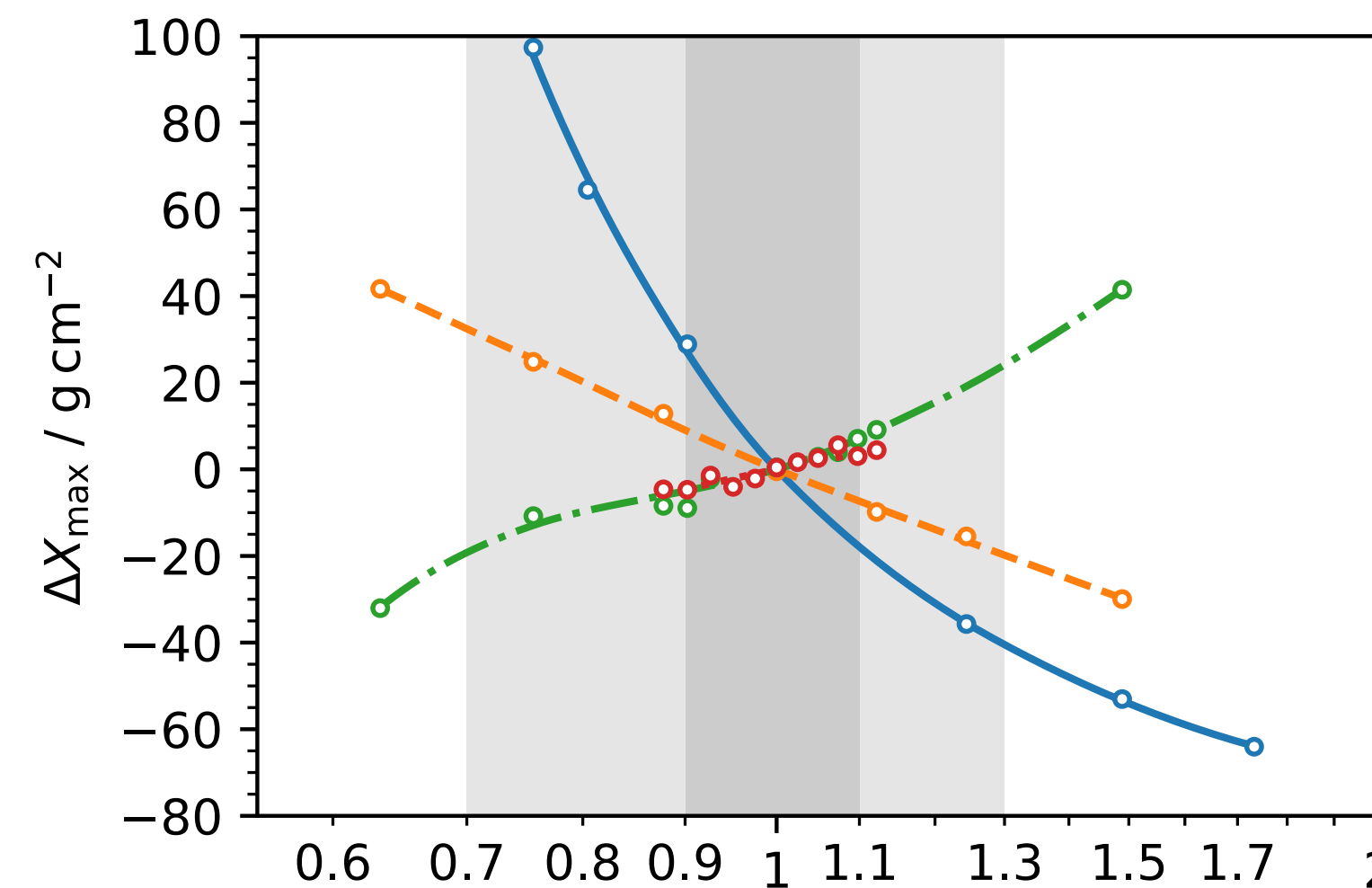
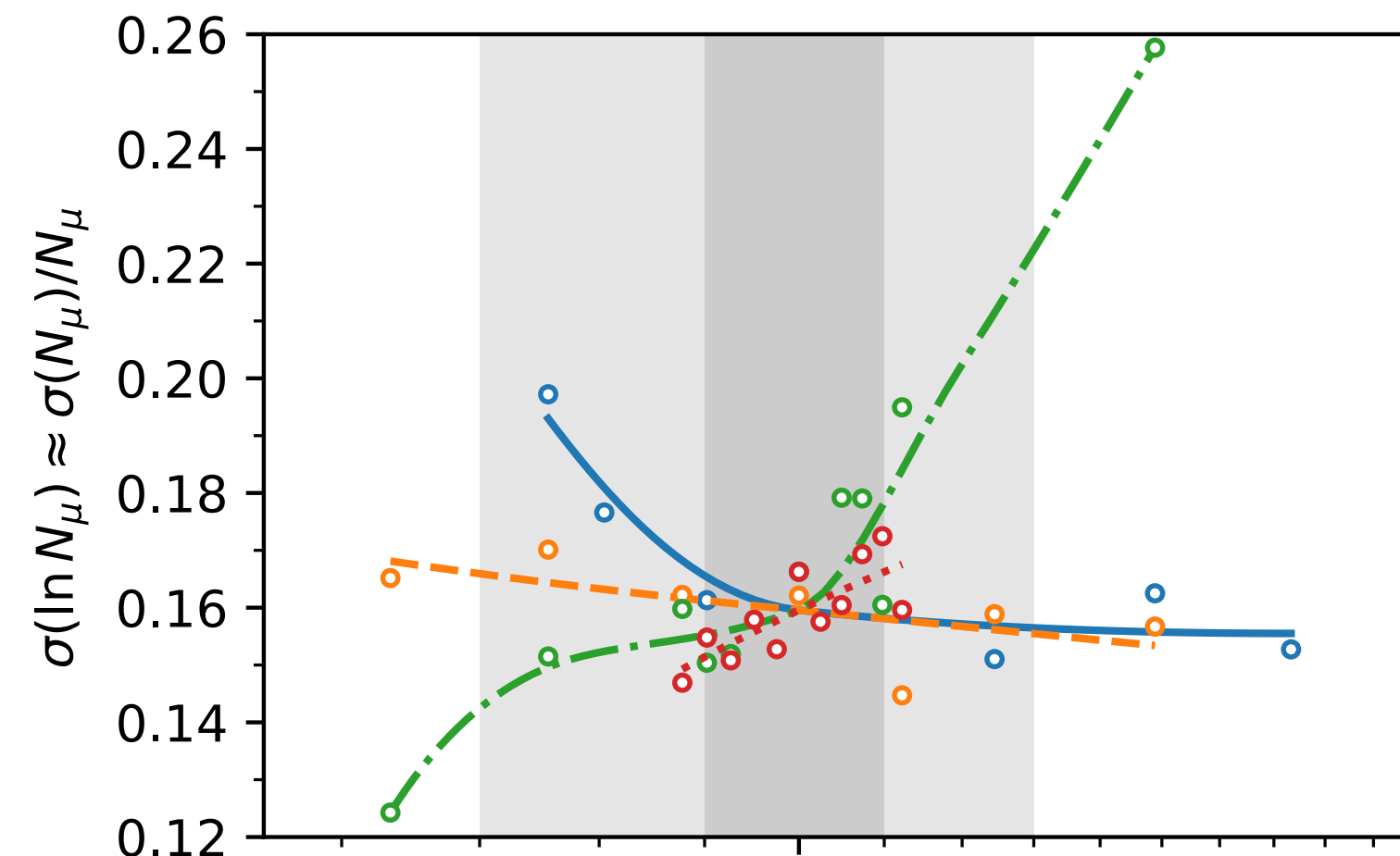
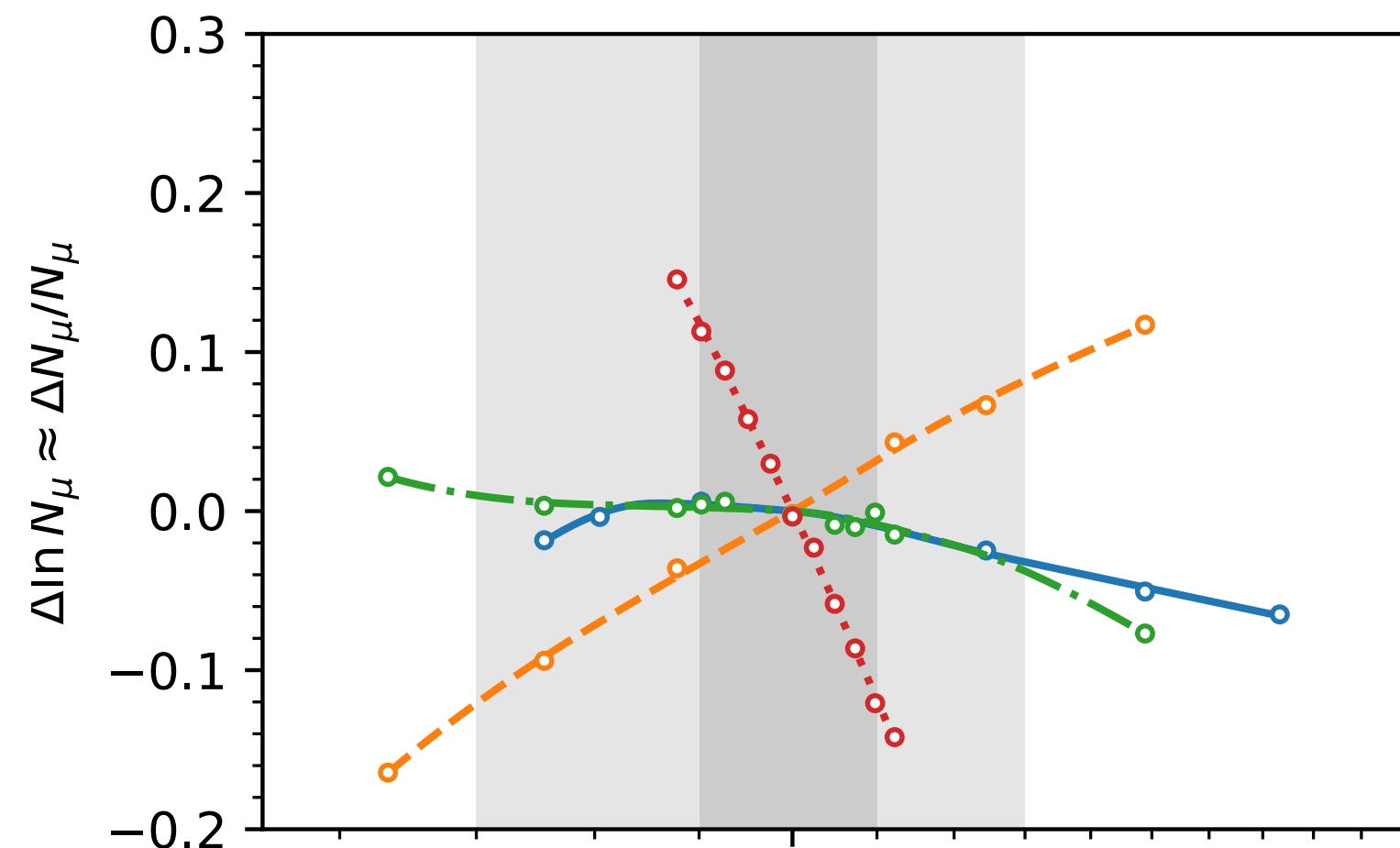
The Muon Puzzle



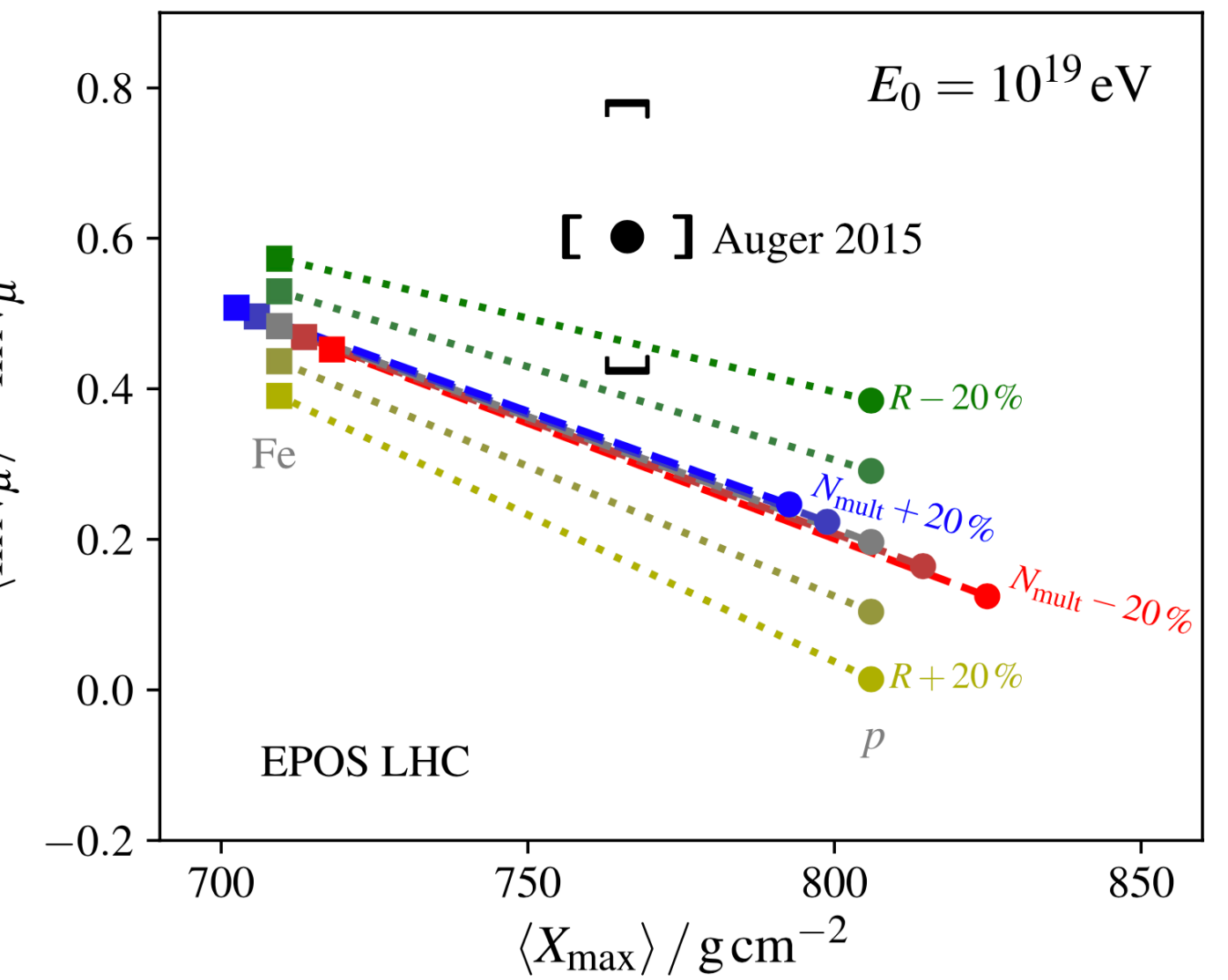
Study of Shower Impact Parameters

CONEX SIBYLL-2.1 p @ $10^{19.5}$ eV

— cross-section - - - multiplicity - · - · elasticity ····· π^0 -fraction

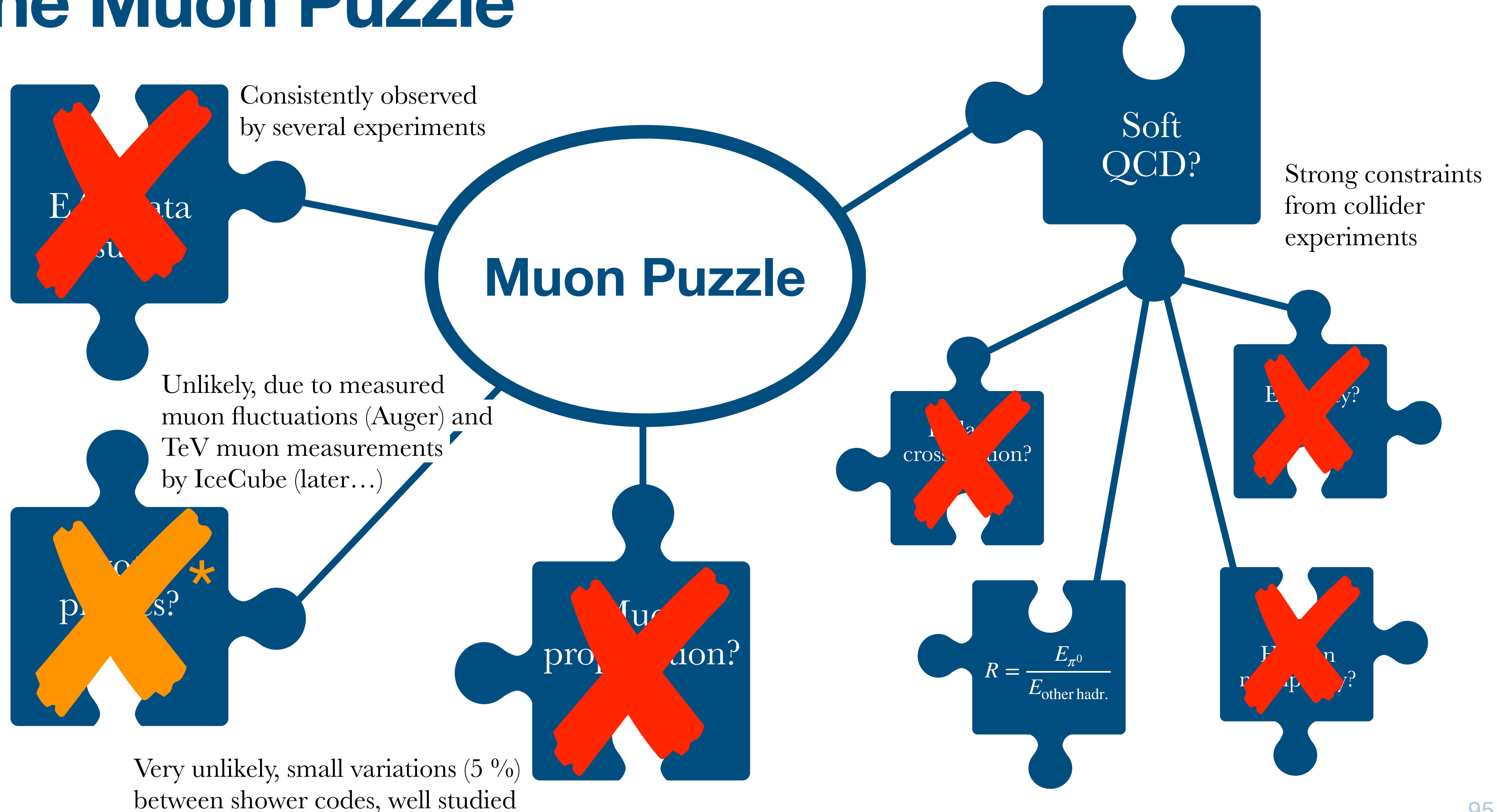


[S. Baur et al., arXiv:1902.09265 (2019)]



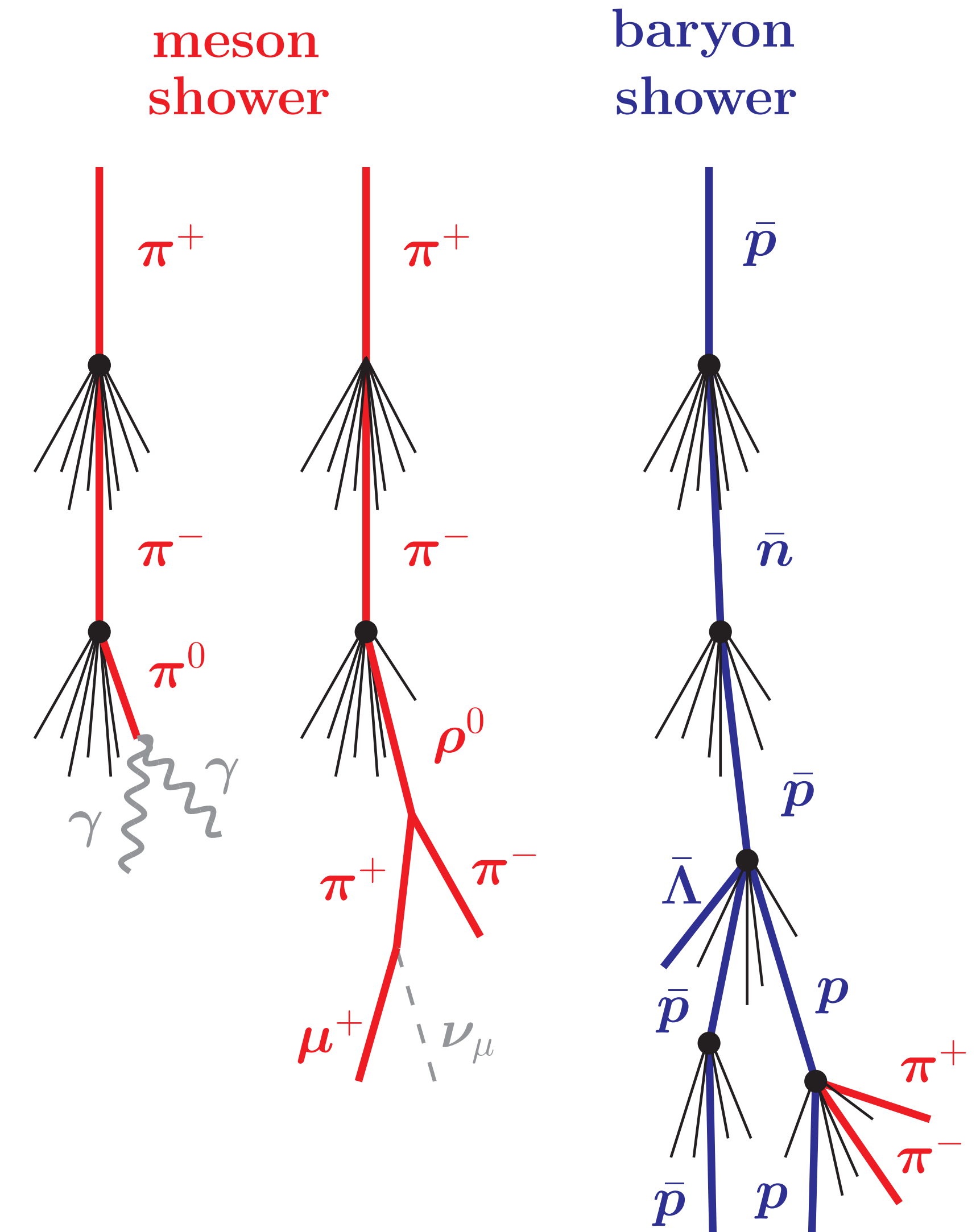
Strong constraints
from collider
experiments!

The Muon Puzzle



The Muon Puzzle

- ▶ Possible explanations for the Muon Puzzle:
 - ▶ Neutral rho meson enhancement, e.g. [1]
 - ▶ Leading particle in meson shower could be ρ_0
 - ▶ Decay of ρ_0 via charged pions into muons
 - ▶ Muon production at all energies
 - ▶ Baryon enhancement, e.g. [2]
 - ▶ Baryon anti-baryon production
 - ▶ Many re-interactions, low-energy particles
 - ▶ Mainly low-energy muons
 - ▶ New physics, e.g. [3]
 - ▶ Hadronic physics at high energies
- ▶ Different predicted muon spectra!



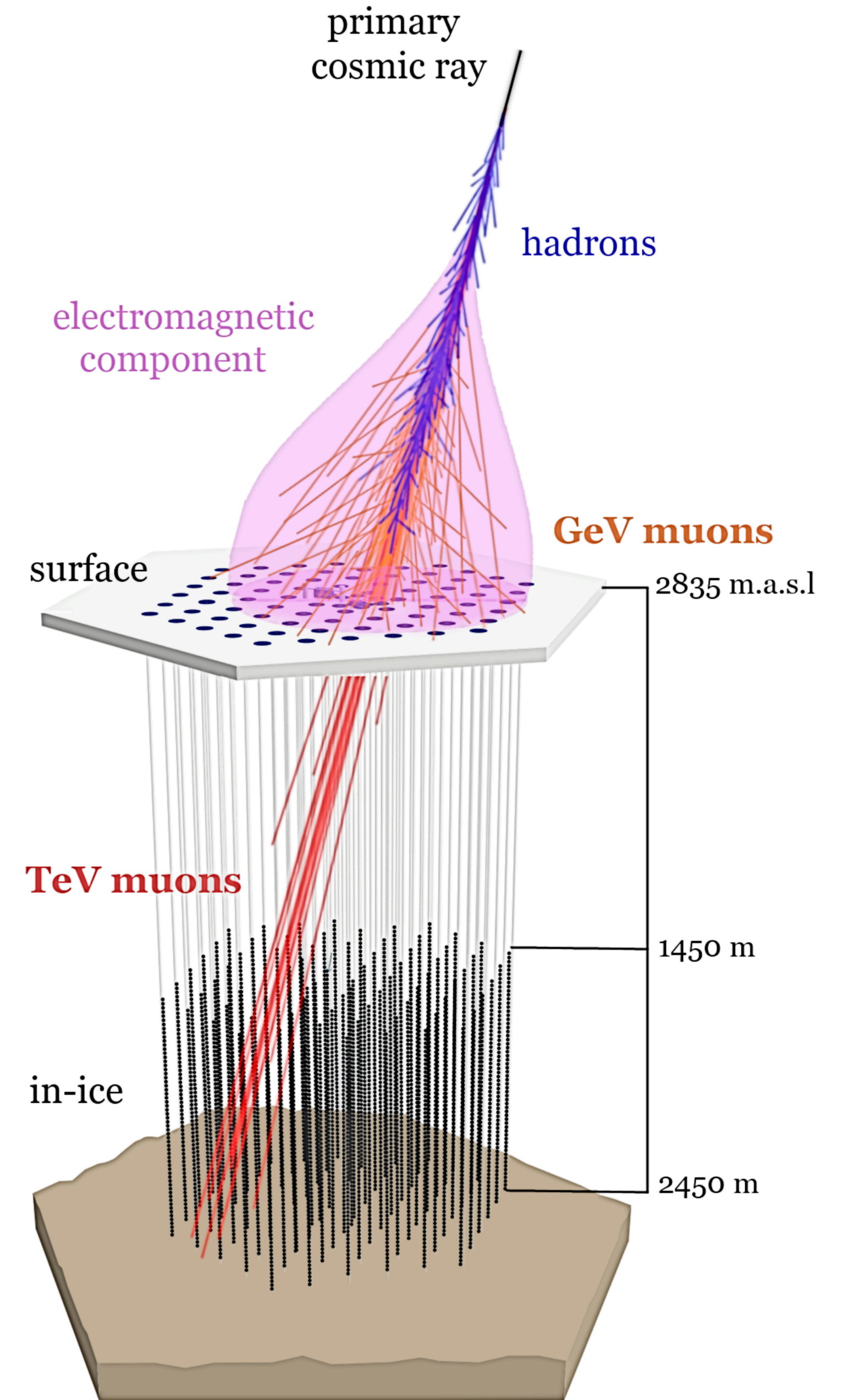
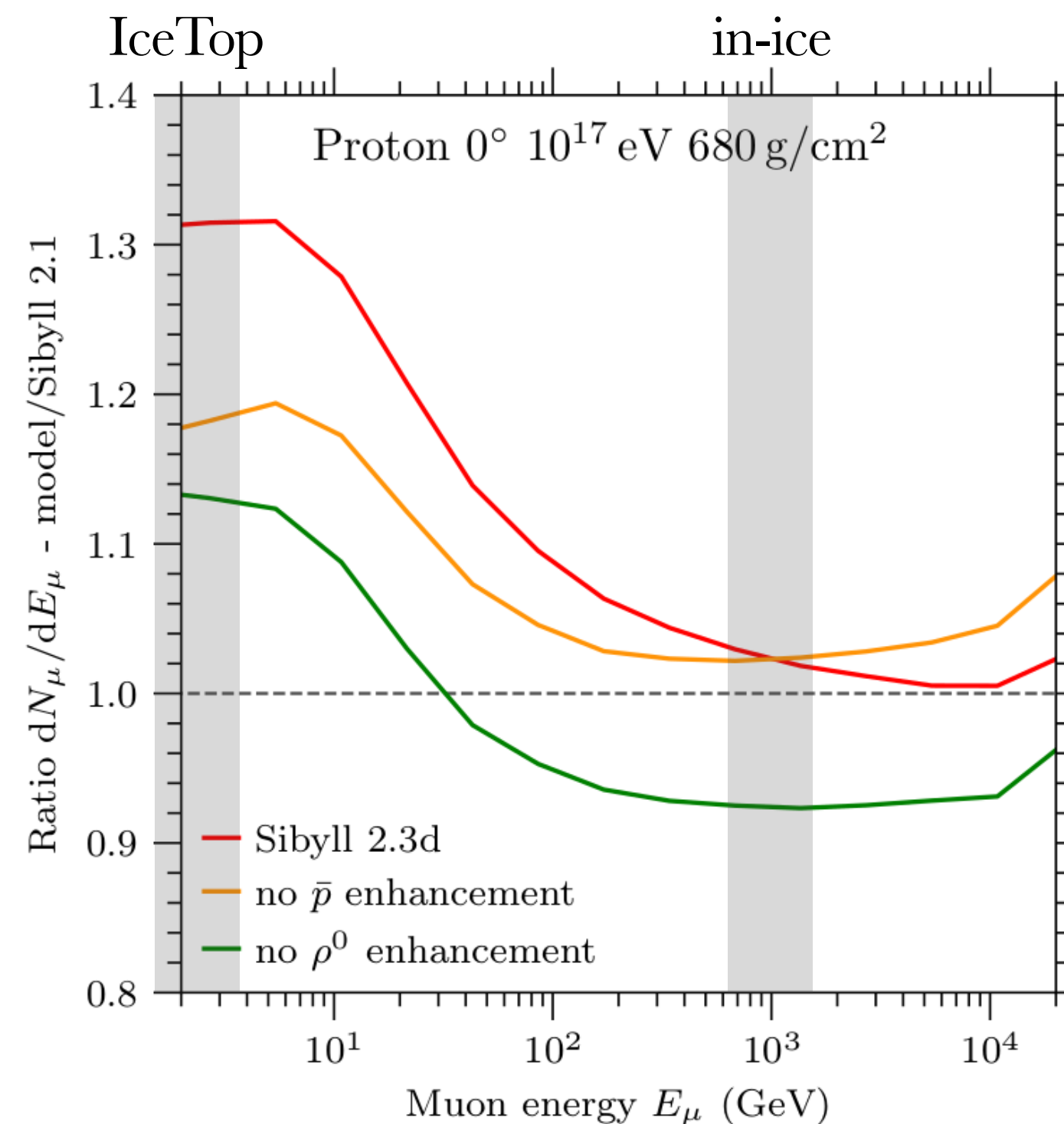
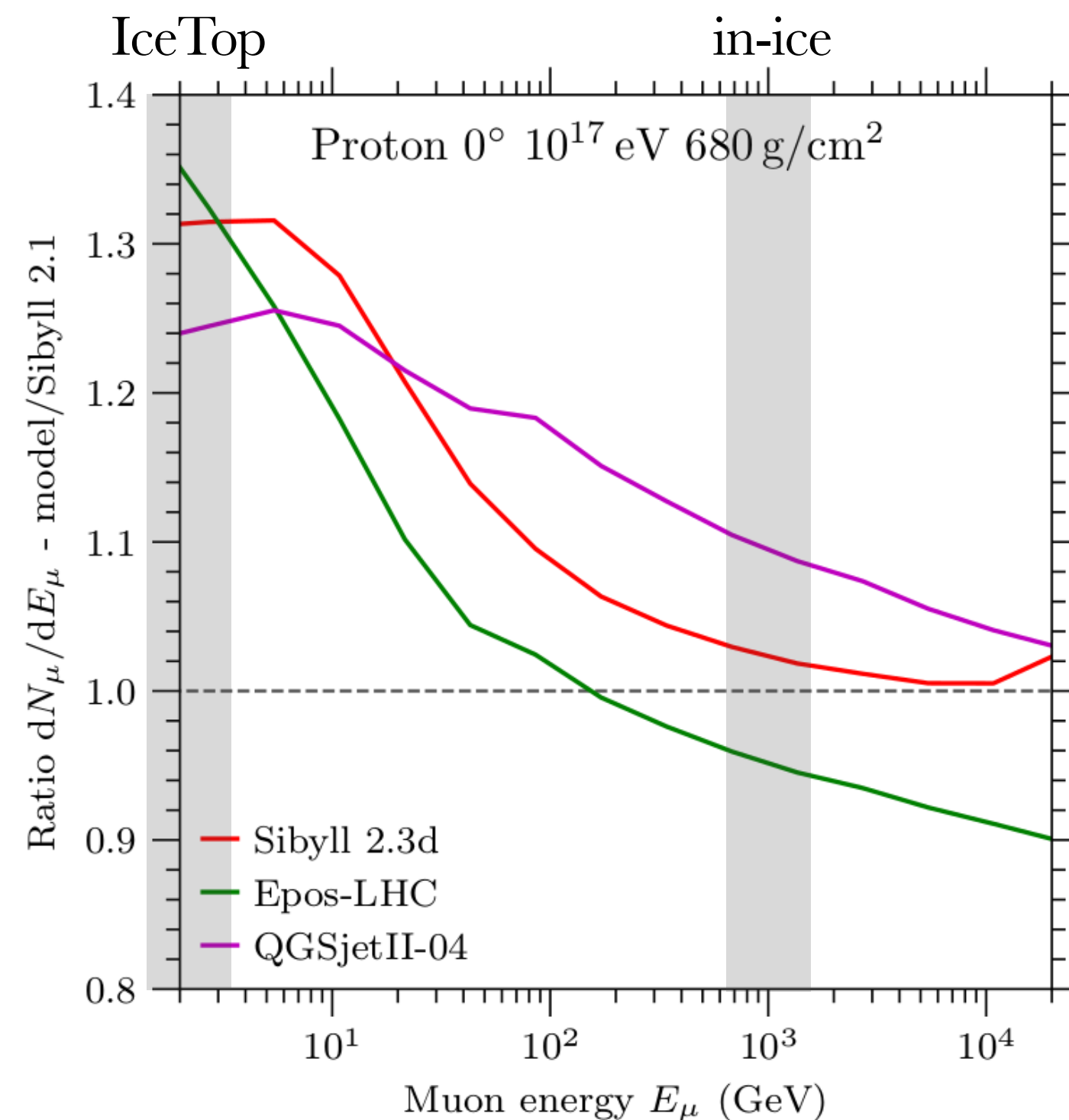
[1]: See e.g. [F. Riehn et al., Phys. Rev. D102 (2020)]

[2]: See e.g. [T. Pierog, K. Werner, Phys. Rev. Lett., 101 (2008)]

[3]: See e.g. [G. R. Farrar, J. D. Allen, EPJ Web Conf., 53 (2013)]

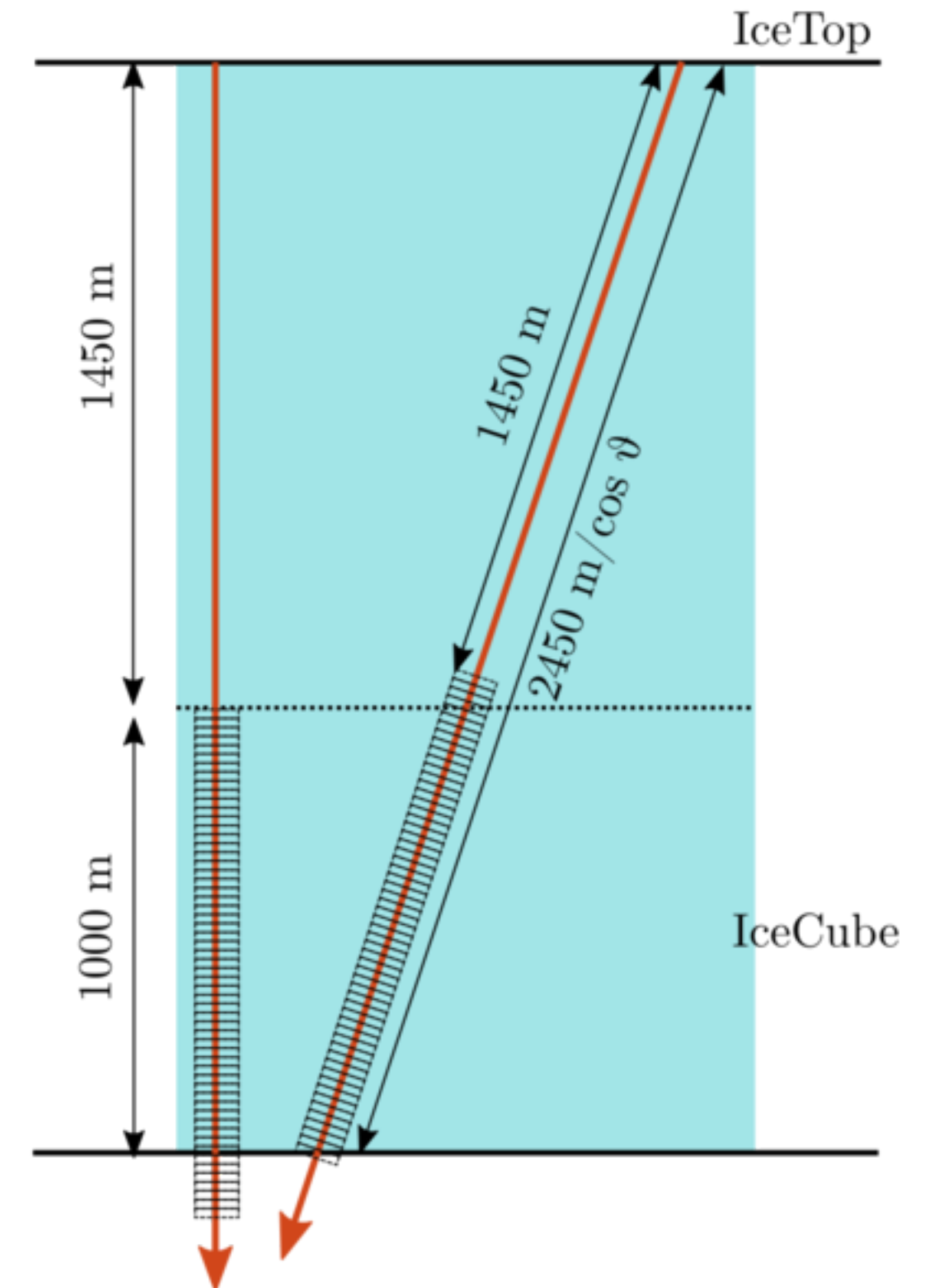
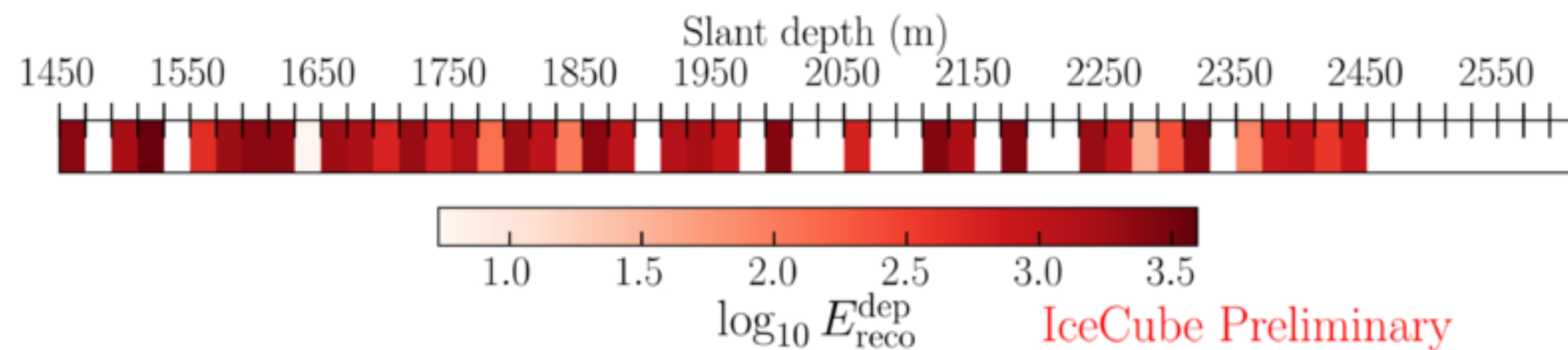
The Muon Puzzle and IceCube

- ▶ Multiple (two+) muon energy regimes in IceCube!
- ▶ Coincident measurements provide spectral muon information
- ▶ Unique tests of multi-particle production (forward region)
- ▶ EAS energy from EM component



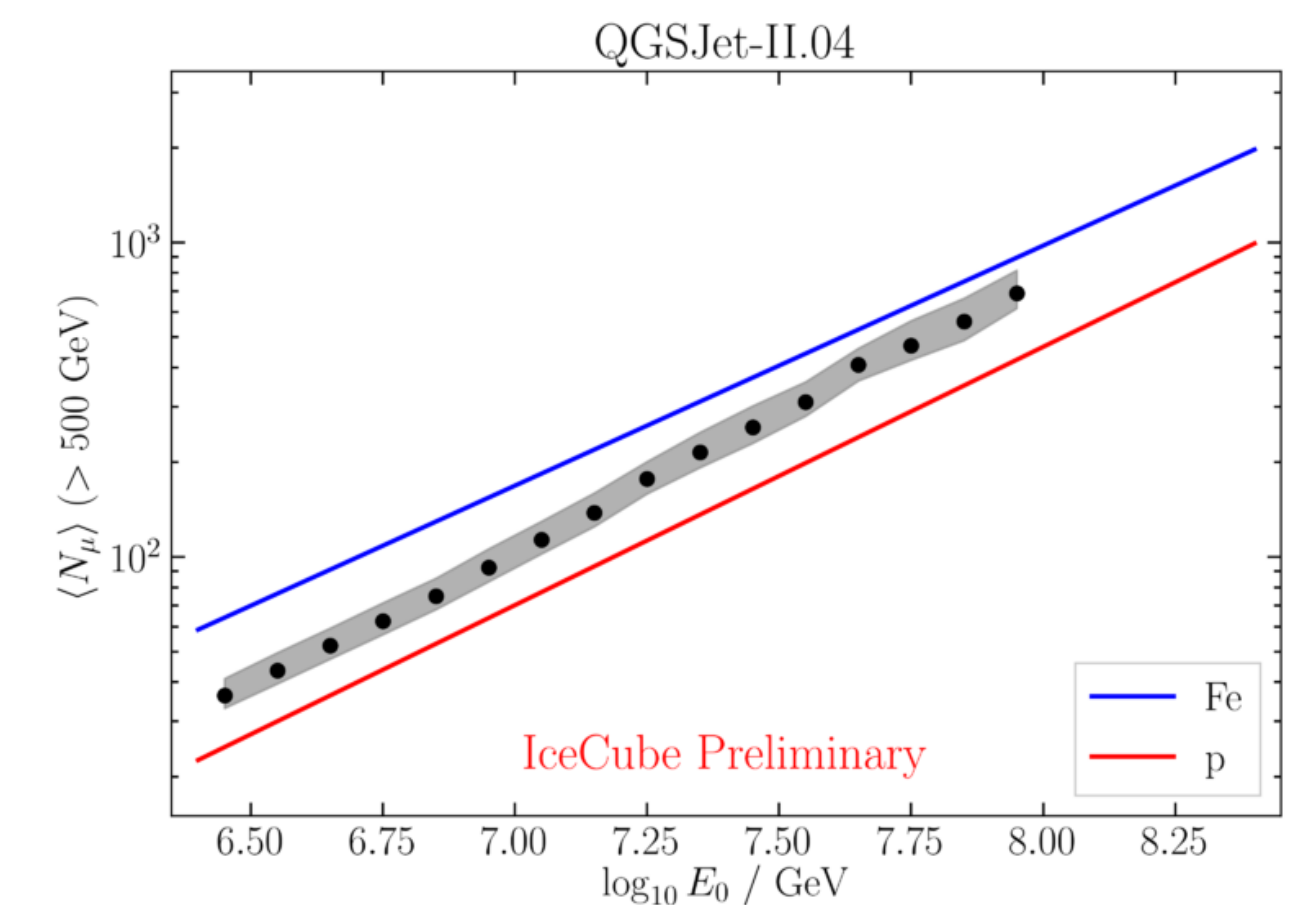
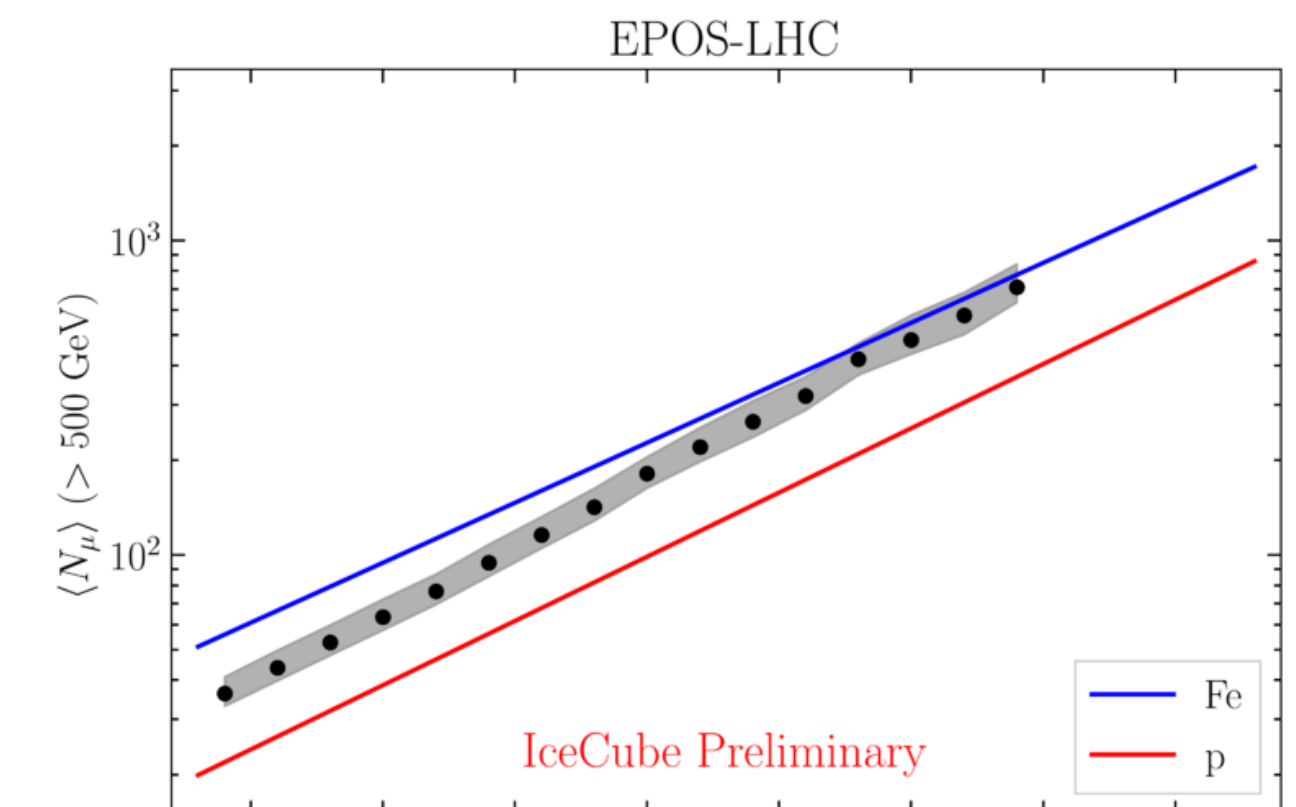
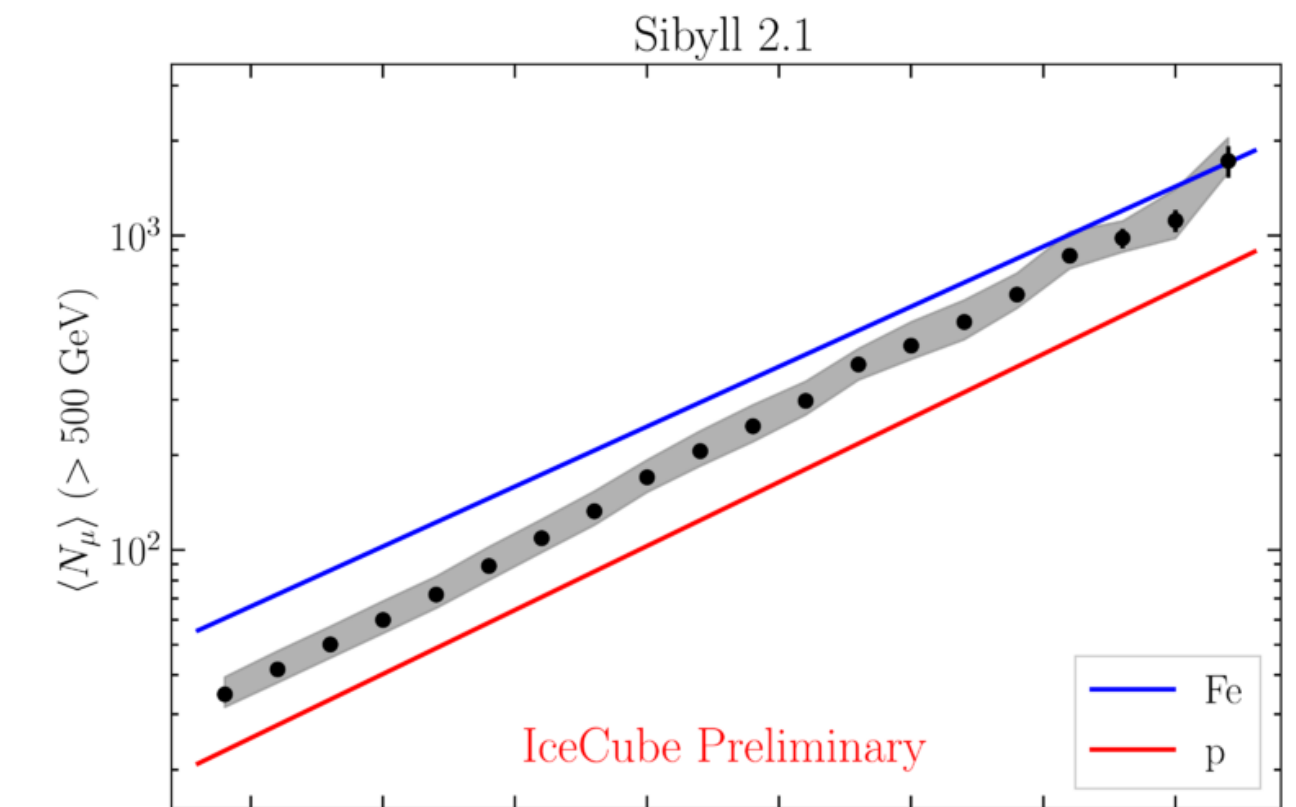
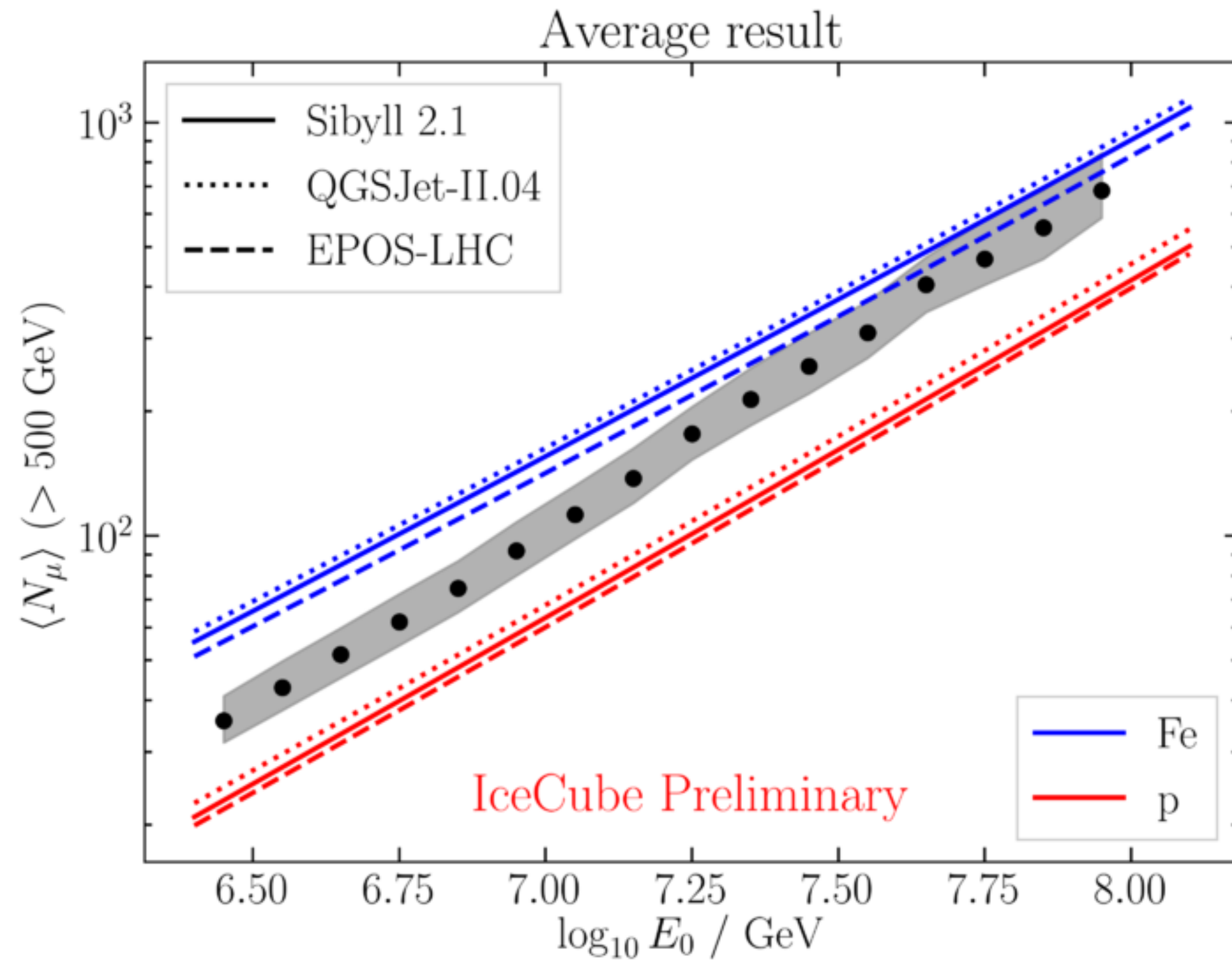
TeV Muon Multiplicity

- ▶ Coincident machine learning analysis using IceTop and in-ice
- ▶ Neural network inputs:
 - ▶ IceTop: zenith angle, energy proxy S125 (laputop)
 - ▶ In-ice: energy loss profile vector (millipede)
- ▶ Neural network outputs:
 - ▶ Primary CR energy
 - ▶ Multiplicity of in-ice muons above 500 GeV



TeV Muons in IceCube

- ▶ Muon bundle multiplicity compared to model predictions



- ▶ How does the data compare to CR flux models?

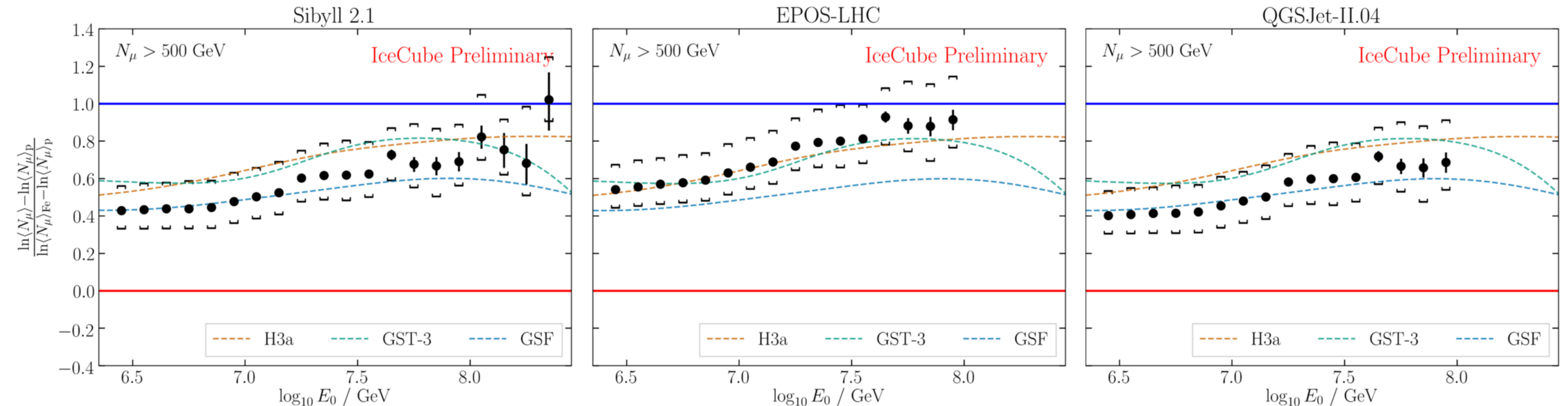
TeV Muons in IceCube

- ▶ Reminder z-scale:

$$z = \frac{\ln(\rho_\mu) - \ln(\rho_{\mu,p})}{\ln(\rho_{\mu,Fe}) - \ln(\rho_{\mu,p})}, \quad \text{proton: } z = 0, \text{ iron: } z = 1$$

- ▶ No significant discrepancies between MC and data for TeV muons!

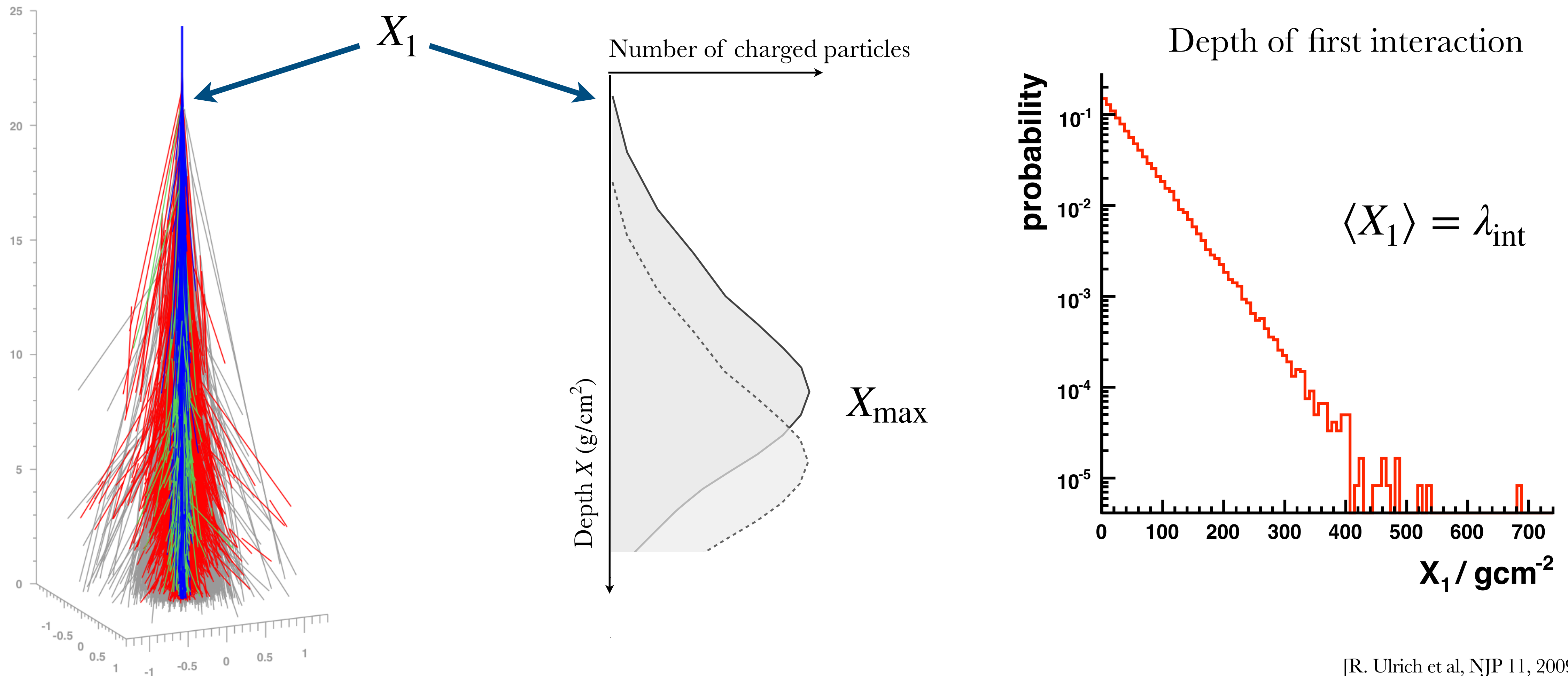
[S. Verpoest (IceCube Collaboration), ECRS2022 (proceedings in preparation)]



Cross Section Measurements

Distribution of Point of First Interaction

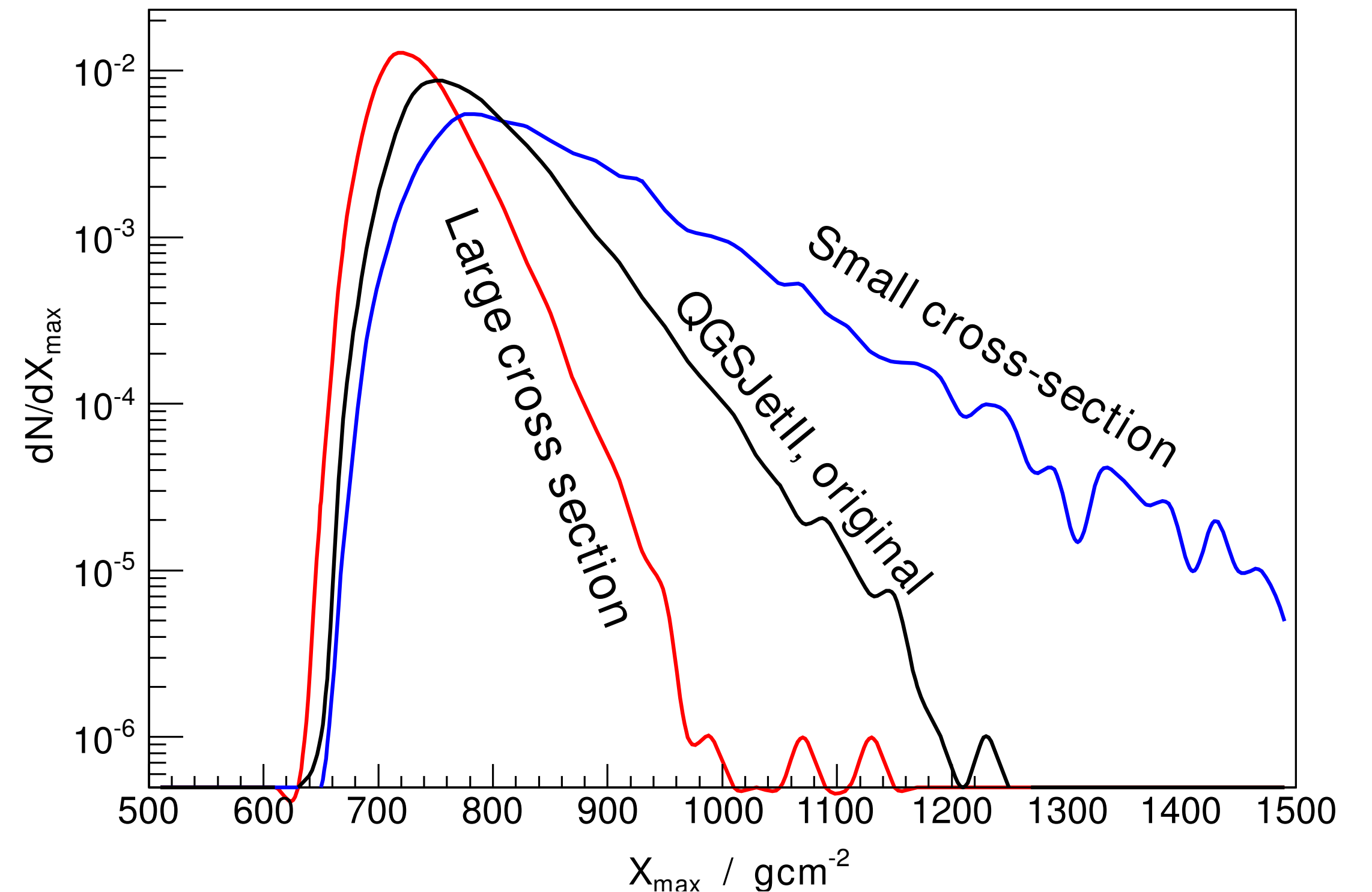
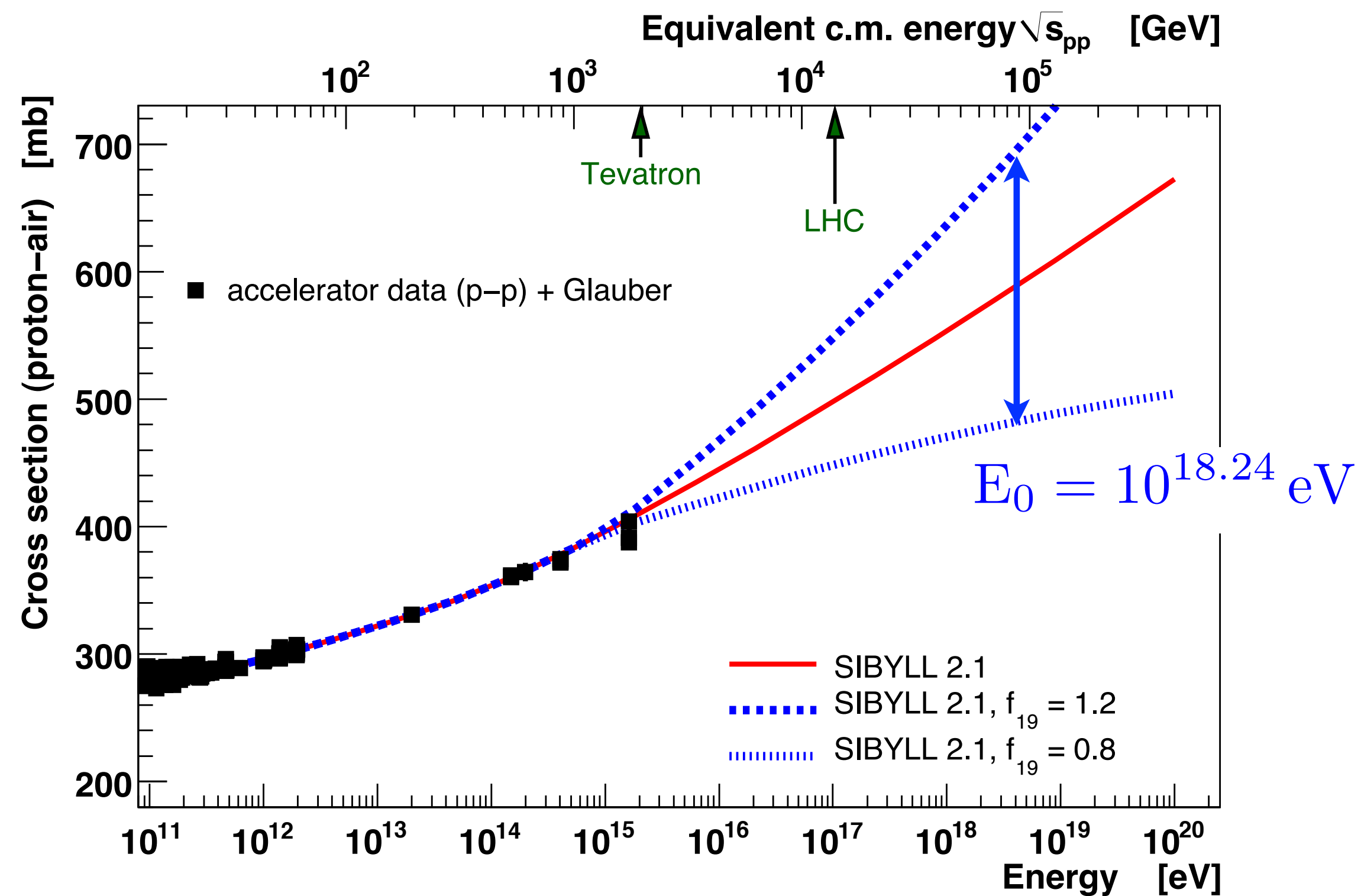
- ▶ X_1 is the point of first interaction



[R. Ulrich et al, NJP 11, 2009]

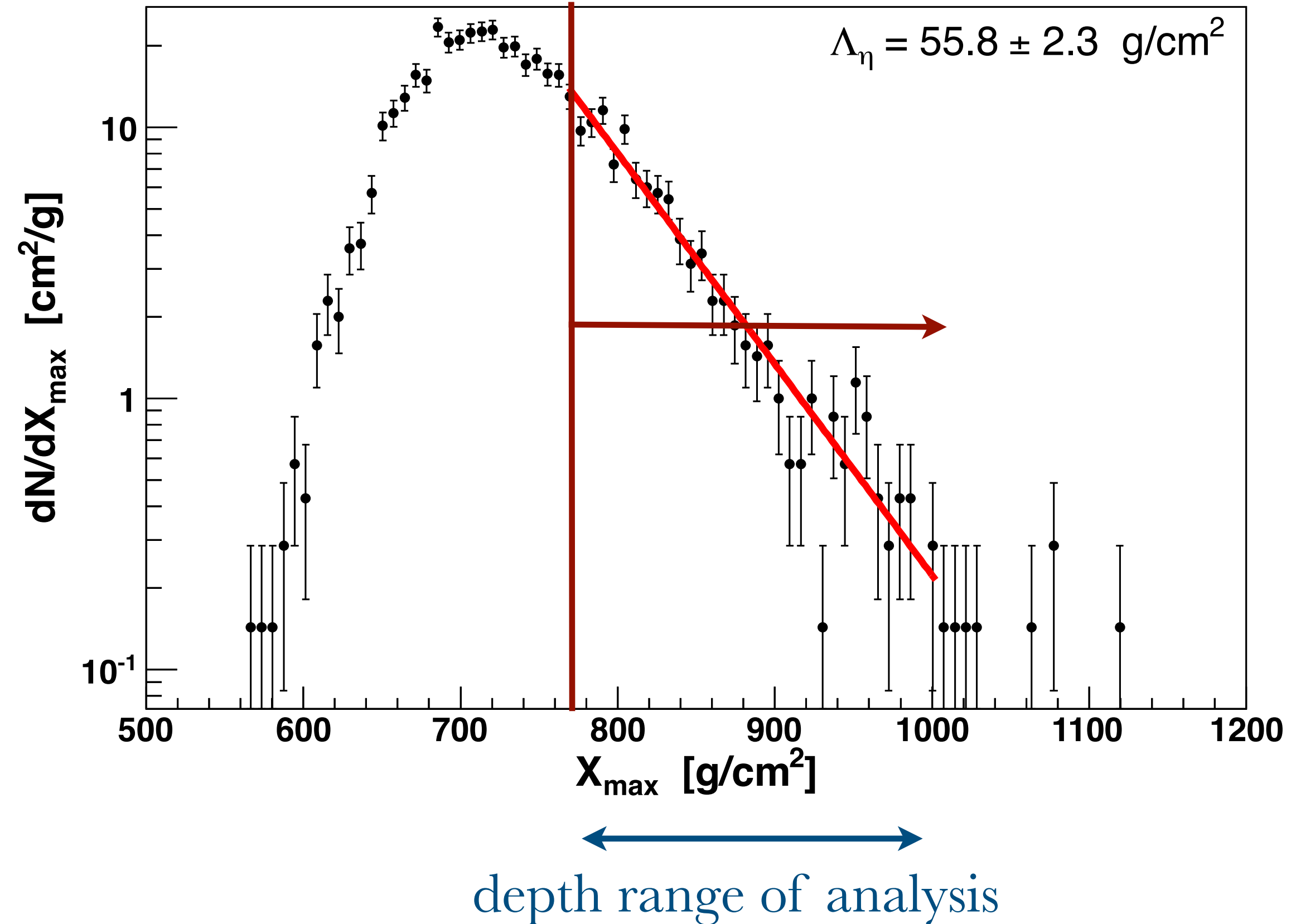
Cross Section Measurement

- ▶ Simulation of proton showers with different cross sections
- ▶ Very good sensitivity of tail of distribution!
- ▶ Cross section accepted if simulated slope fits measured slope of X_{\max} distribution



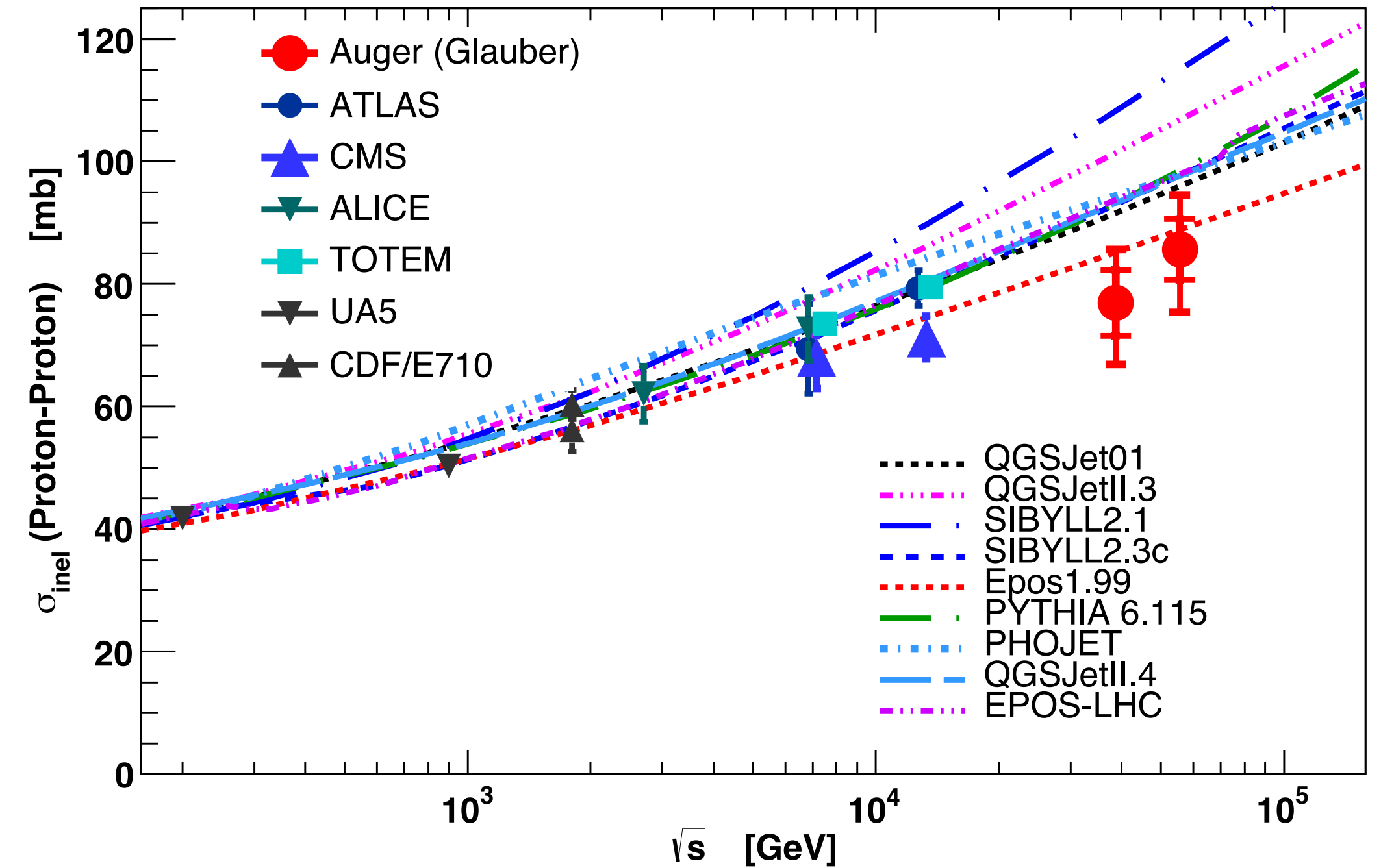
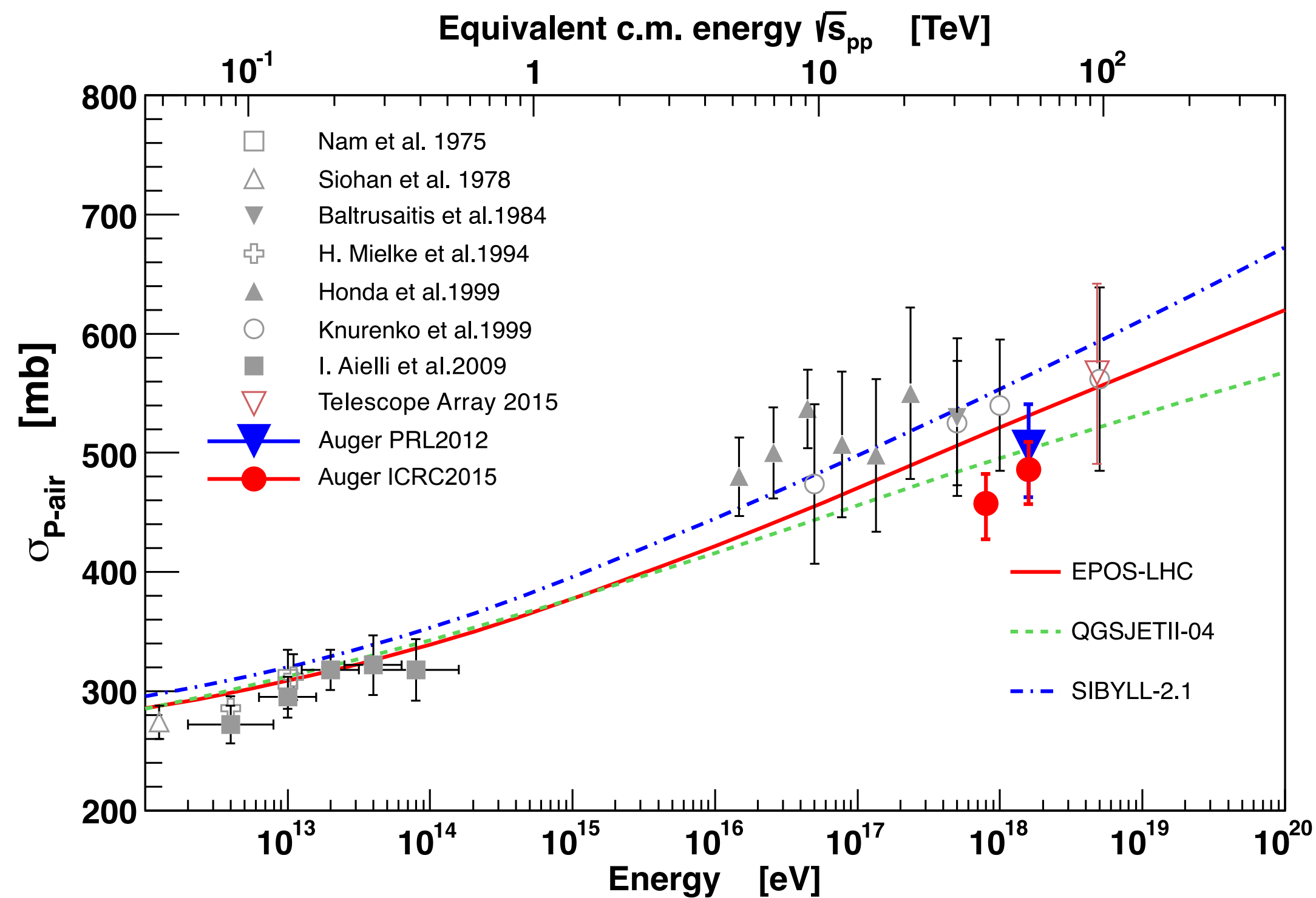
Cross Section Measurement

- ▶ Only deep showers are used in analysis to enhance proton fraction in data sample
- ▶ Effective slope of X_{\max} measured after event selection



Cross Section Measurement

- ▶ Only deep showers are used in analysis to enhance proton fraction in data sample
- ▶ Effective slope of X_{\max} measured after event selection



Glauber model

Seasonal Variations of TeV Muons

Seasonal Variations of TeV Muons

- ▶ If a particle h decays or re-interacts in the atmosphere depends on its

- ▶ decay length:

$$\lambda_{\text{dec},h}(E_h, X) = c \cdot \tau_h \cdot \beta \cdot \gamma \cdot \rho(X)$$

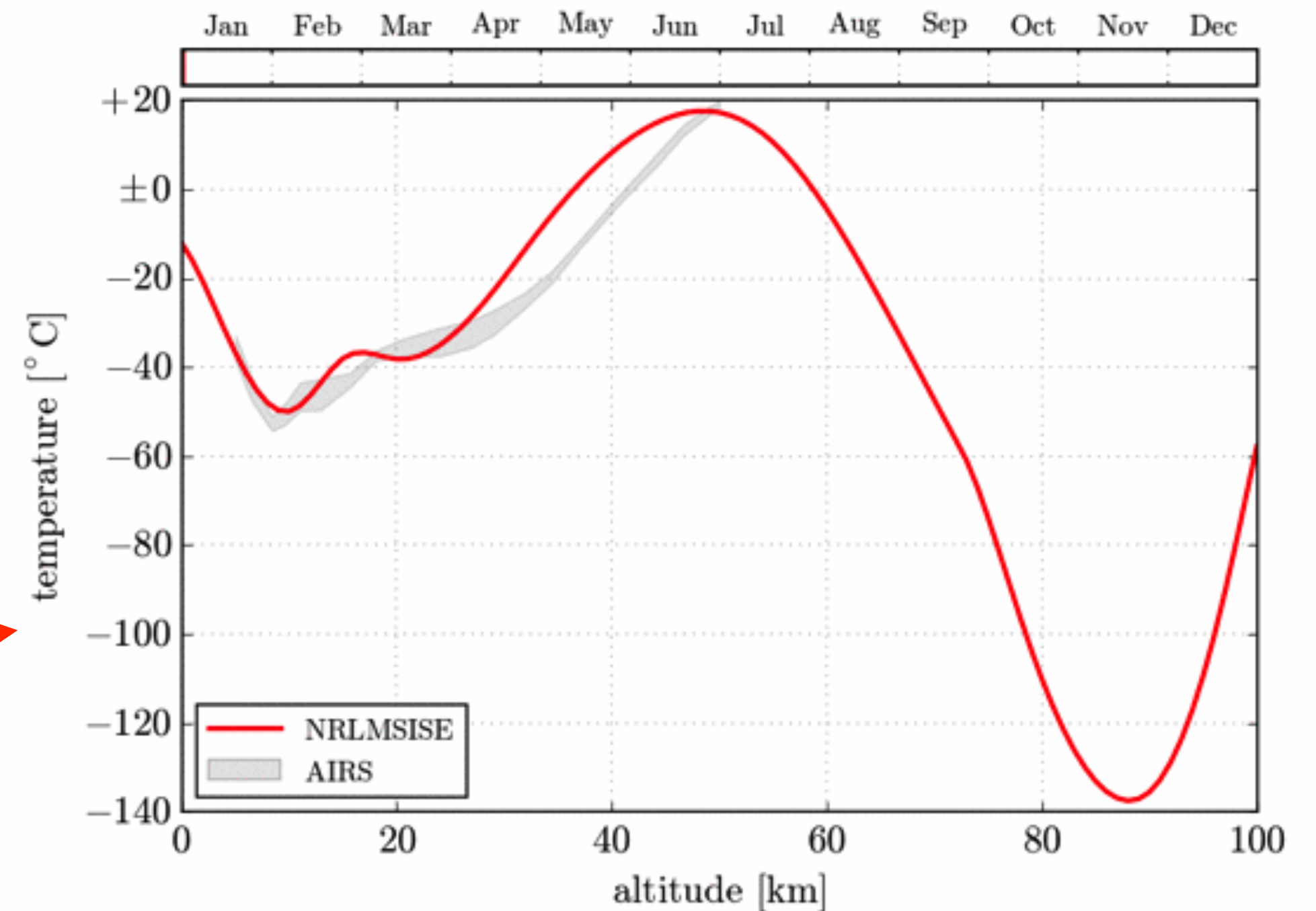
- ▶ interaction length:

$$\lambda_{\text{int},h}(E_h, X) = \frac{\rho(X)}{\sum_A \sigma_{hA}(E_h) \cdot n_A(X)}$$

- ▶ Propagation described by coupled cascade equations:

$$\frac{d\Phi_h(E, X)}{dX} = - \left(\frac{1}{\lambda_{\text{int},h}} - \frac{1}{\lambda_{\text{dec},h}} \right) \cdot \Phi(E, X) + \sum_h \int \frac{F_{hj}(E_h, E_j)}{E_h} \cdot \frac{\Phi_j(E_j)}{\lambda_{\text{int},j}} dE_j$$

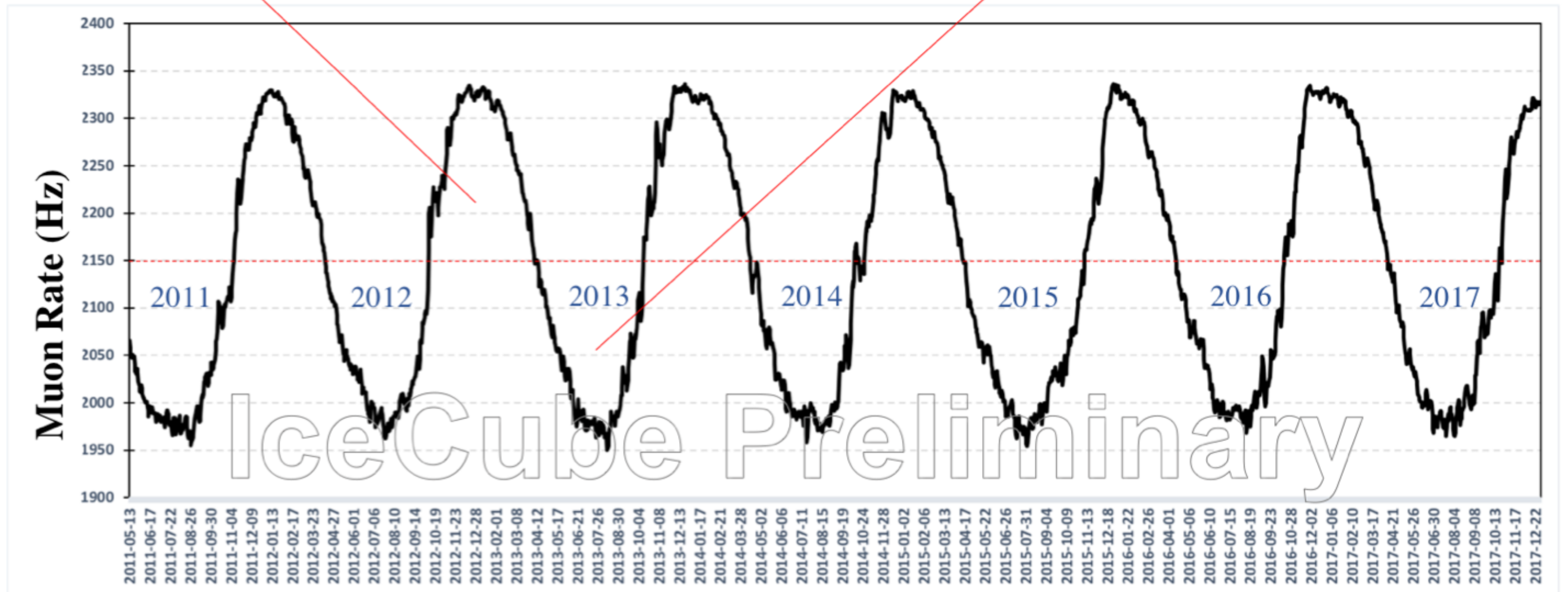
- ▶ Atmospheric muon flux depends on atmospheric density (temperature, pressure)!



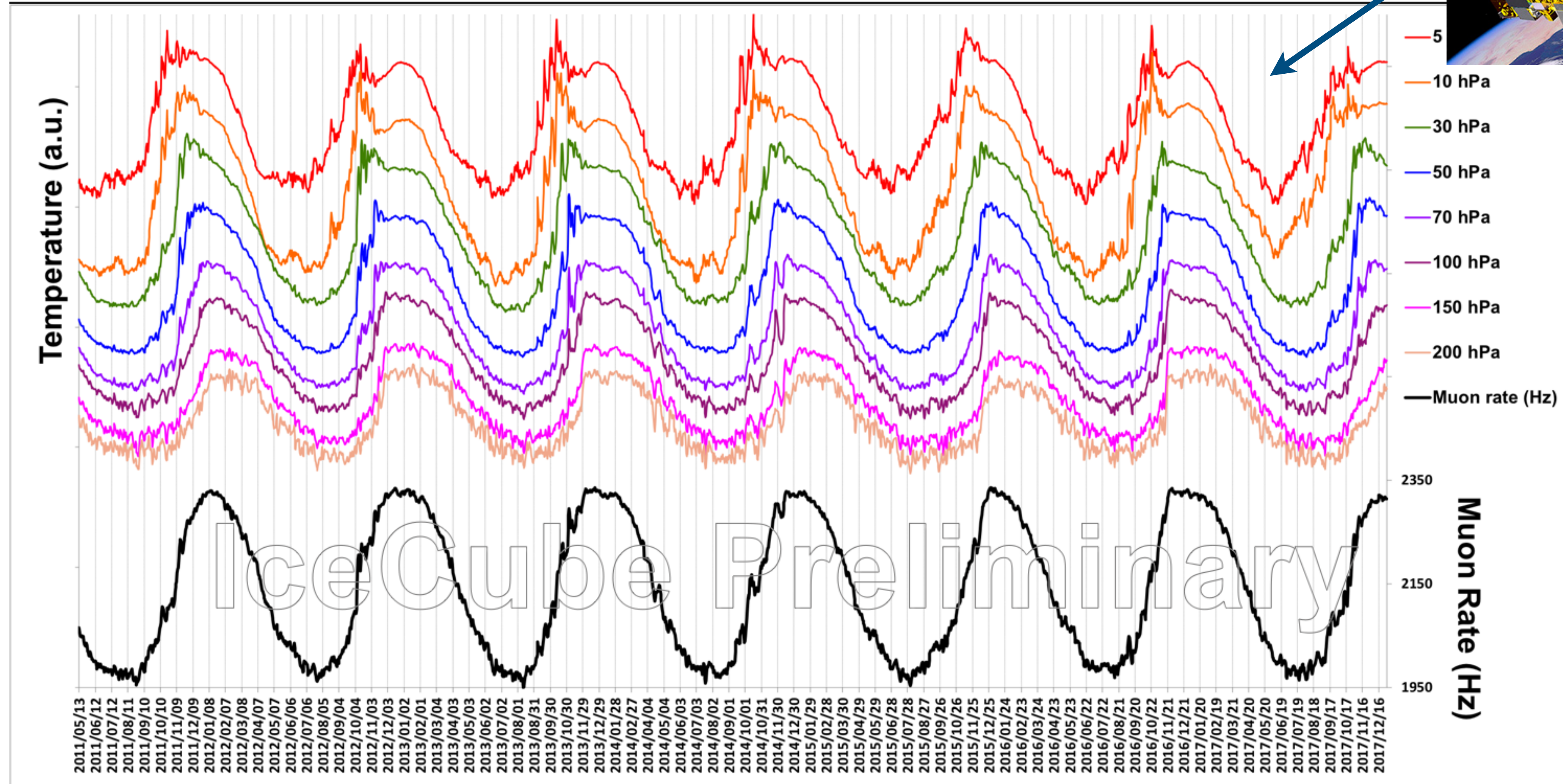
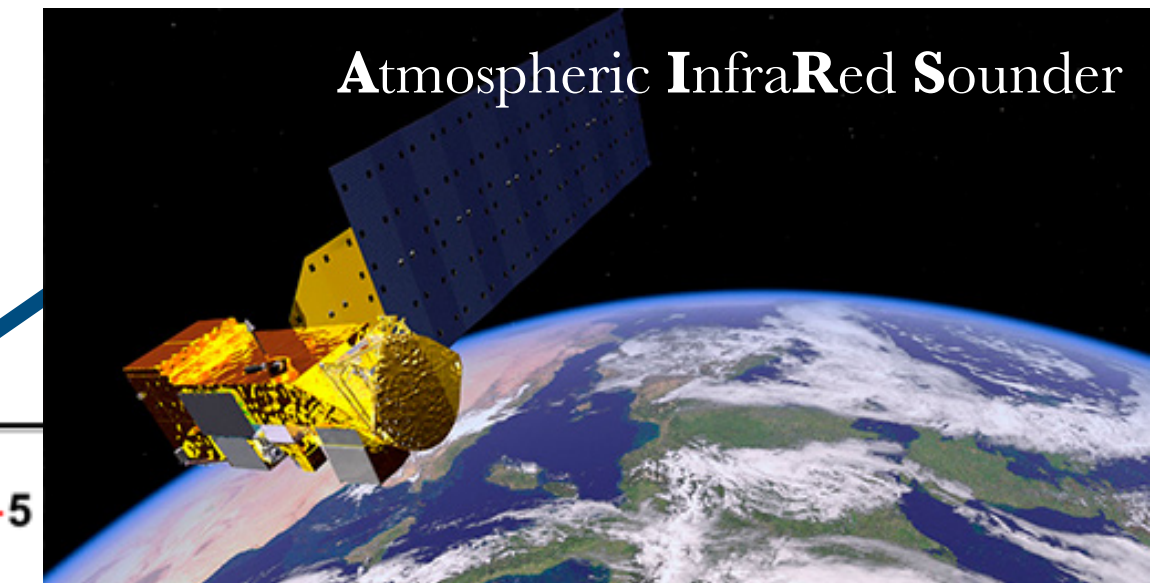
Seasonal Variations of TeV Muons

Summer atmosphere
warmer => less dense => pions decay to muons

Winter atmosphere
colder => more dense => pions interact



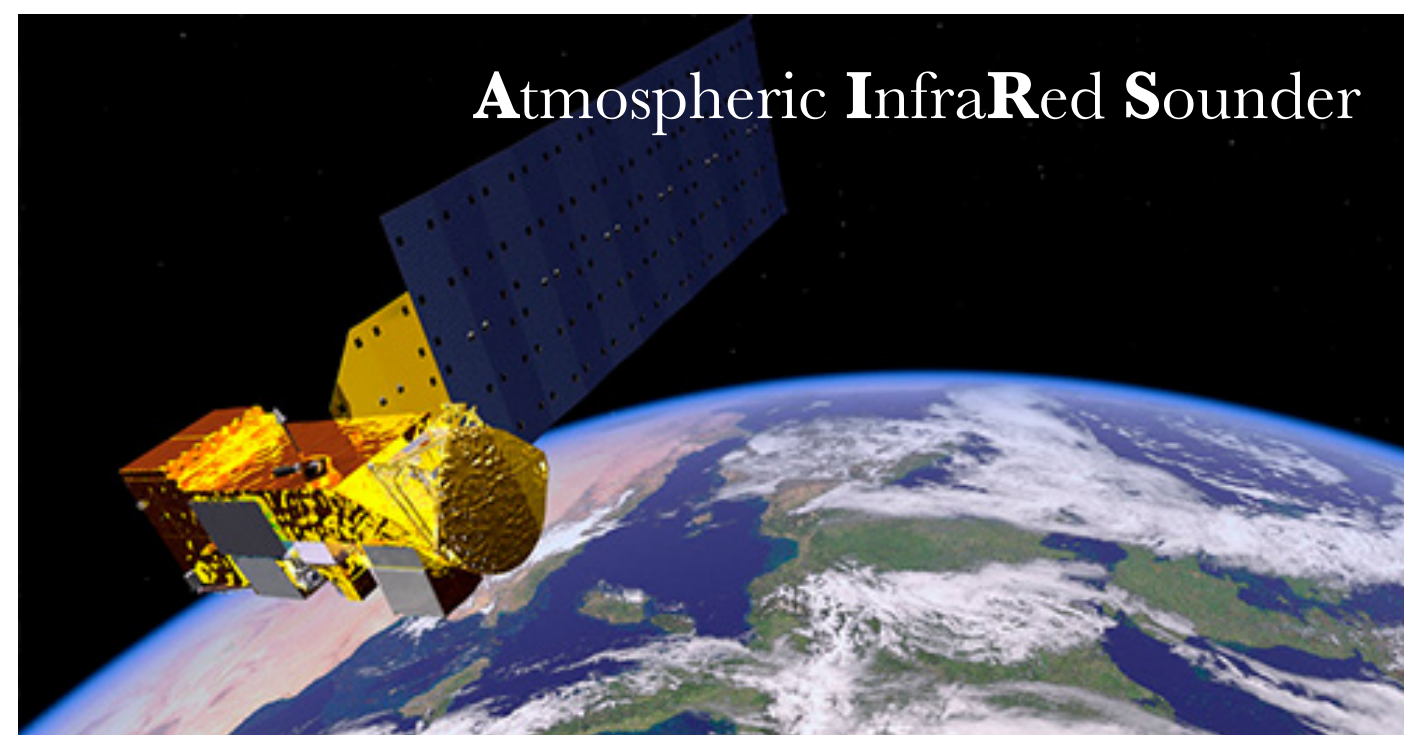
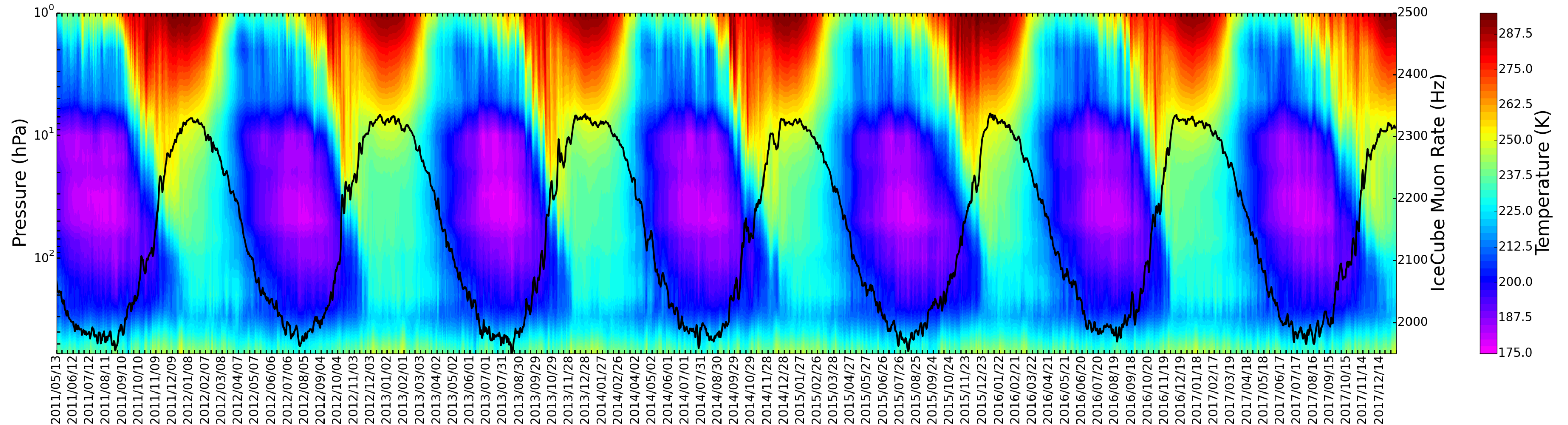
Seasonal Variations of TeV Muons



[S. Tilav, T.K. Gaisser, D. Soldin, P. Desiati, PoS ICRC2019 (2020) 894]

Seasonal Variations of TeV Muons

[S. Tilav, T.K Gaisser, D. Soldin, P.Desiati, PoS ICRC2019 (2020) 894]

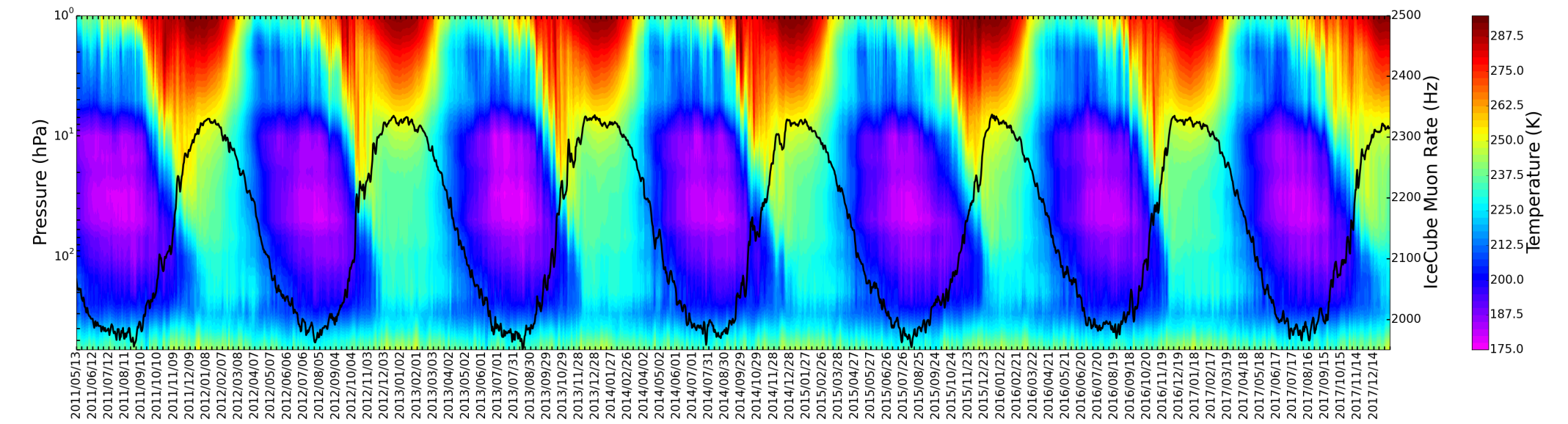
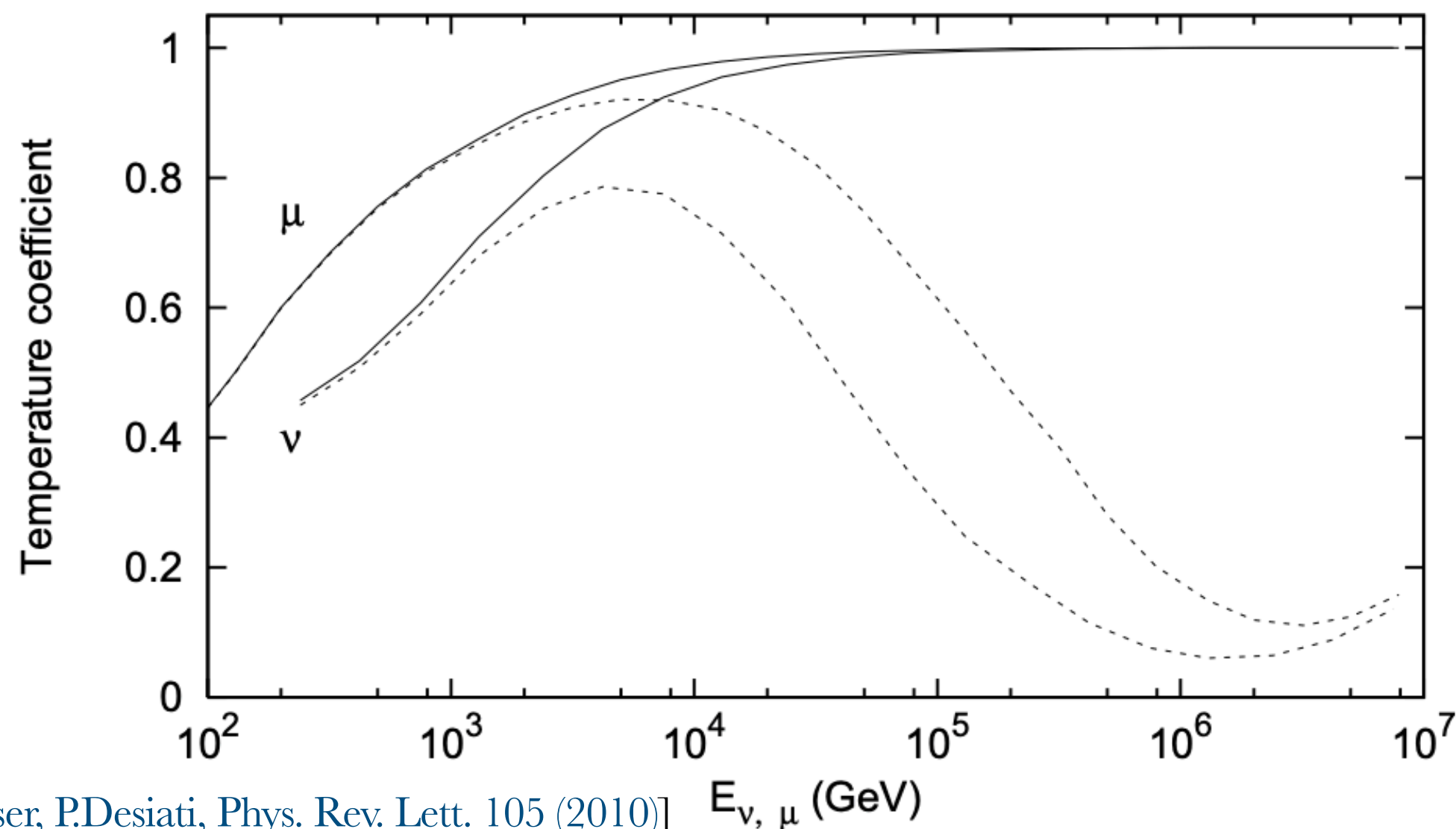


Seasonal Variations of TeV Muons

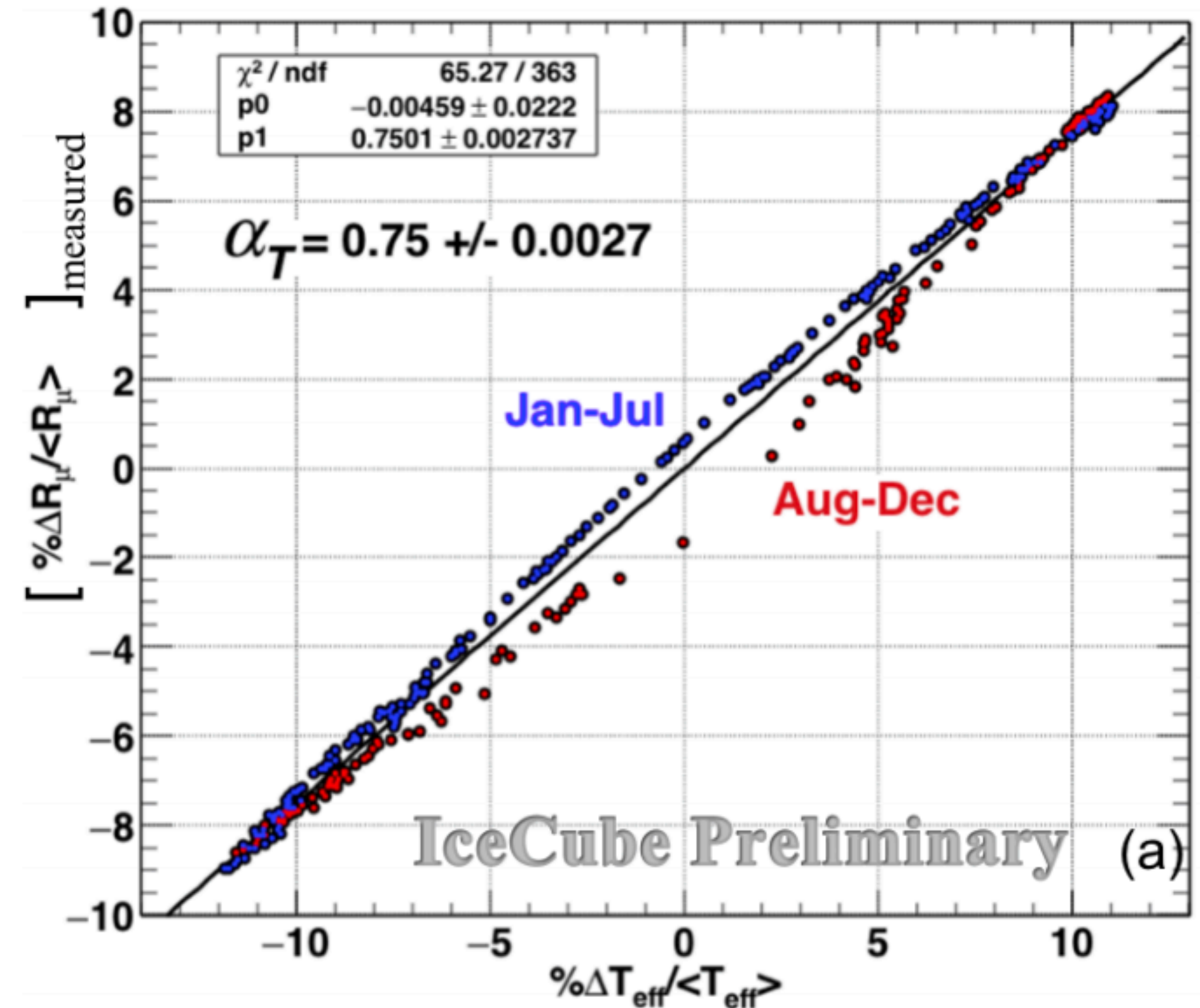
- ▶ Temperature coefficient, α :

$$\frac{R}{\langle R \rangle} = \alpha \cdot \frac{T_{\text{eff}}}{\langle T_{\text{eff}} \rangle}$$

- ▶ "Effective temperature", T_{eff}
- ▶ Temperature of average layer where muons are produced
- ▶ Estimate of the K/π -ratio (+prompt)



[S. Tilav, T.K Gaisser, D. Soldin, P.Desiati, PoS ICRC2019 (2020) 894]





(Almost) The End

A Few Final Remarks

- ▶ I will upload my slides to the indico tonight
- ▶ I'll leave on Wednesday around noon, until then, please feel free to ask any questions!
- ▶ If you have any questions at a later point, please contact me at soldin@kit.edu
- ▶ However, we will also have a discussion session tomorrow!
- ▶ If you have any questions, this will be the opportunity to have an informal discussion
- ▶ Also, if you already have questions, please don't hesitate to catch me during breaks / dinner and I will try to address them
- ▶ We will also solve some problems related to the topics discussed during lectures!
- ▶ This will be done "old" school, i.e. please bring pen and paper!



The End