

CR proton flux towards PeV energies with DAMPE

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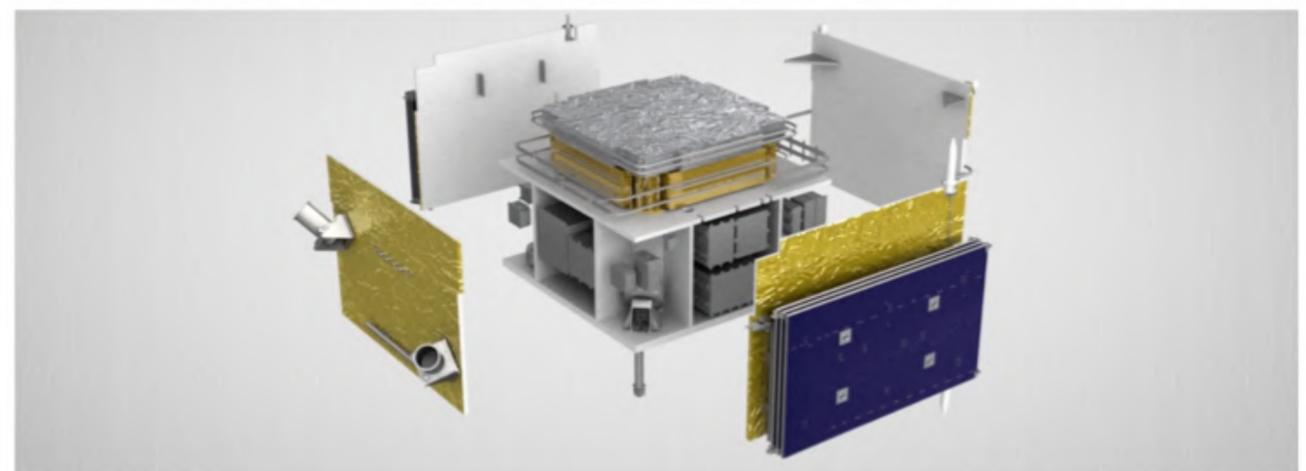
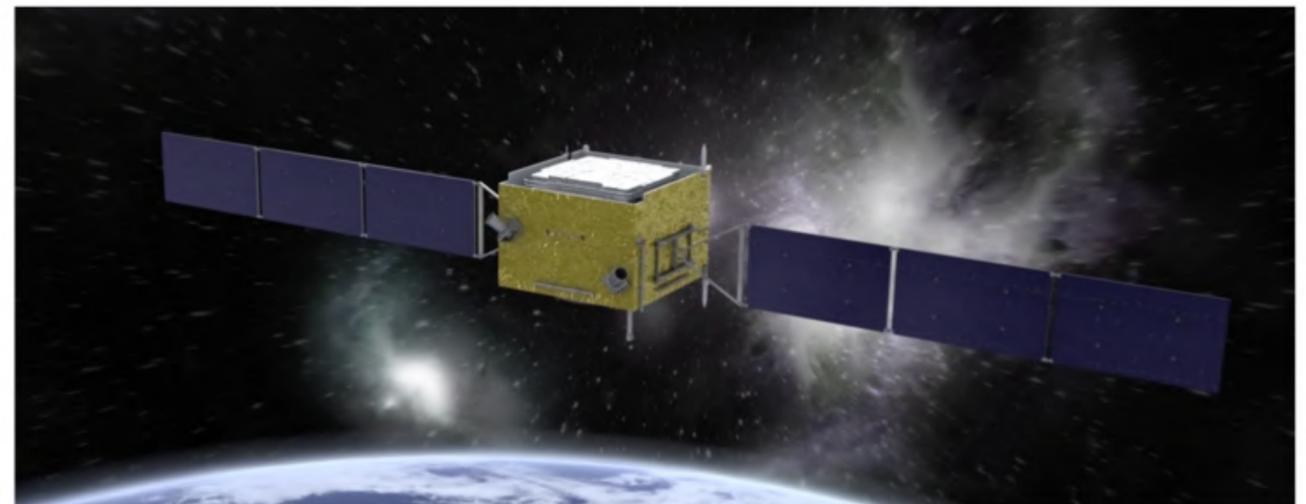


(for the DAMPE collaboration)

DARK MATTER PARTICLE EXPLORER (DAMPE)

- Launched in **Dec 2015**
- Orbit: sun-synchronous, **500 km**
- Period: **95 min**
- Payload: **1.4 Tonn**
- Power: **~ 400 W**
- Data: **~ 12 GByte / day**

Collaboration



DARK MATTER PARTICLE EXPLORER (DAMPE)

PSD

- Z identification up to *Ni* ($Z=28$)
- γ anti-coincidence signal

STK

- Position solution ~ 50 micron
- γ angular resolution $0.5^\circ - 0.1^\circ$ (GeV – TeV)
- Absolute Charge (Z) identification

BGO

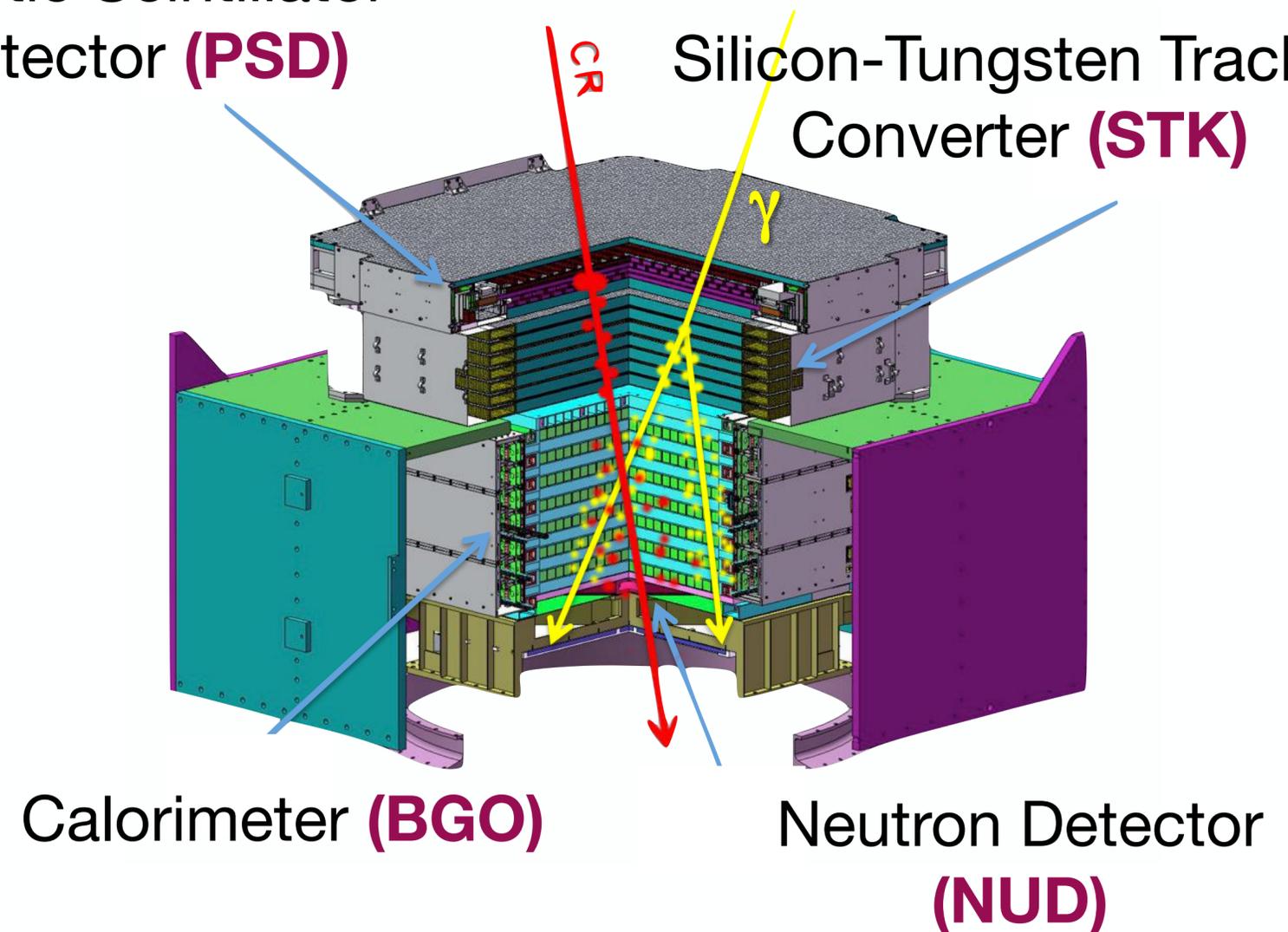
- $31 X_0$ – thickest in space
- e/γ detection up to **10 TeV**
- p/ions up to **50 GeV – 500 TeV**

NUD

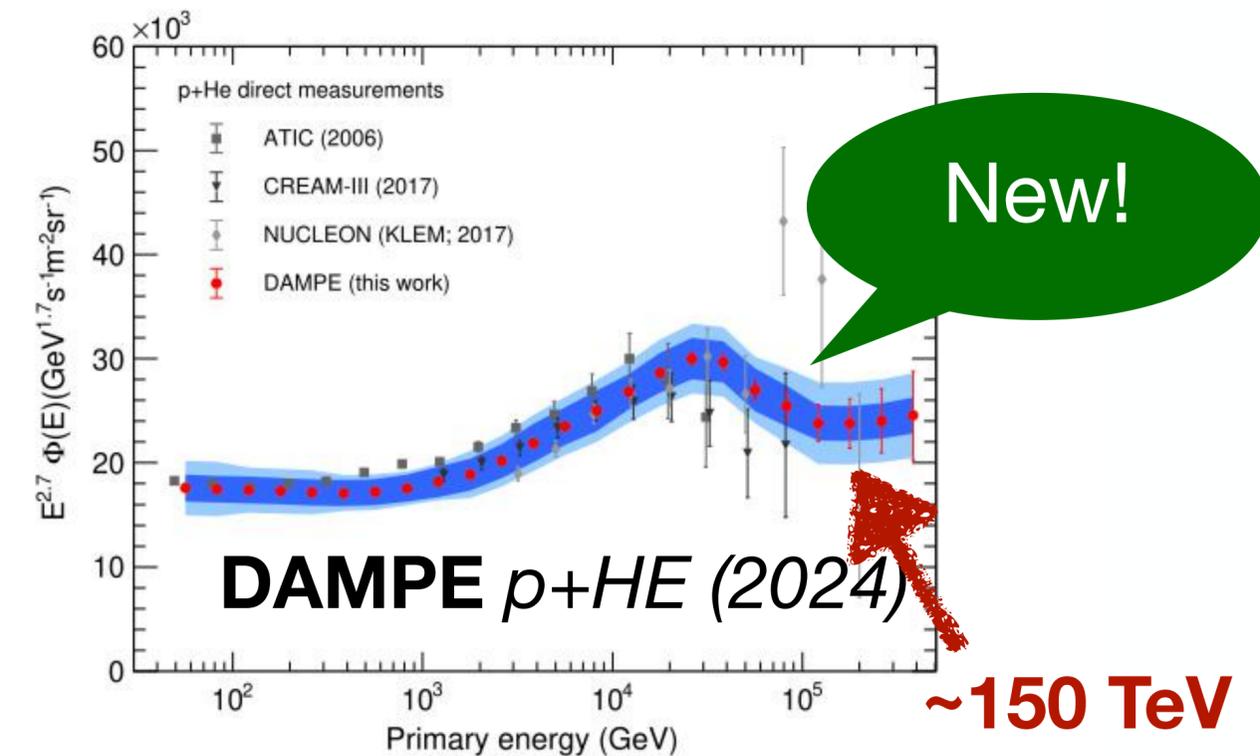
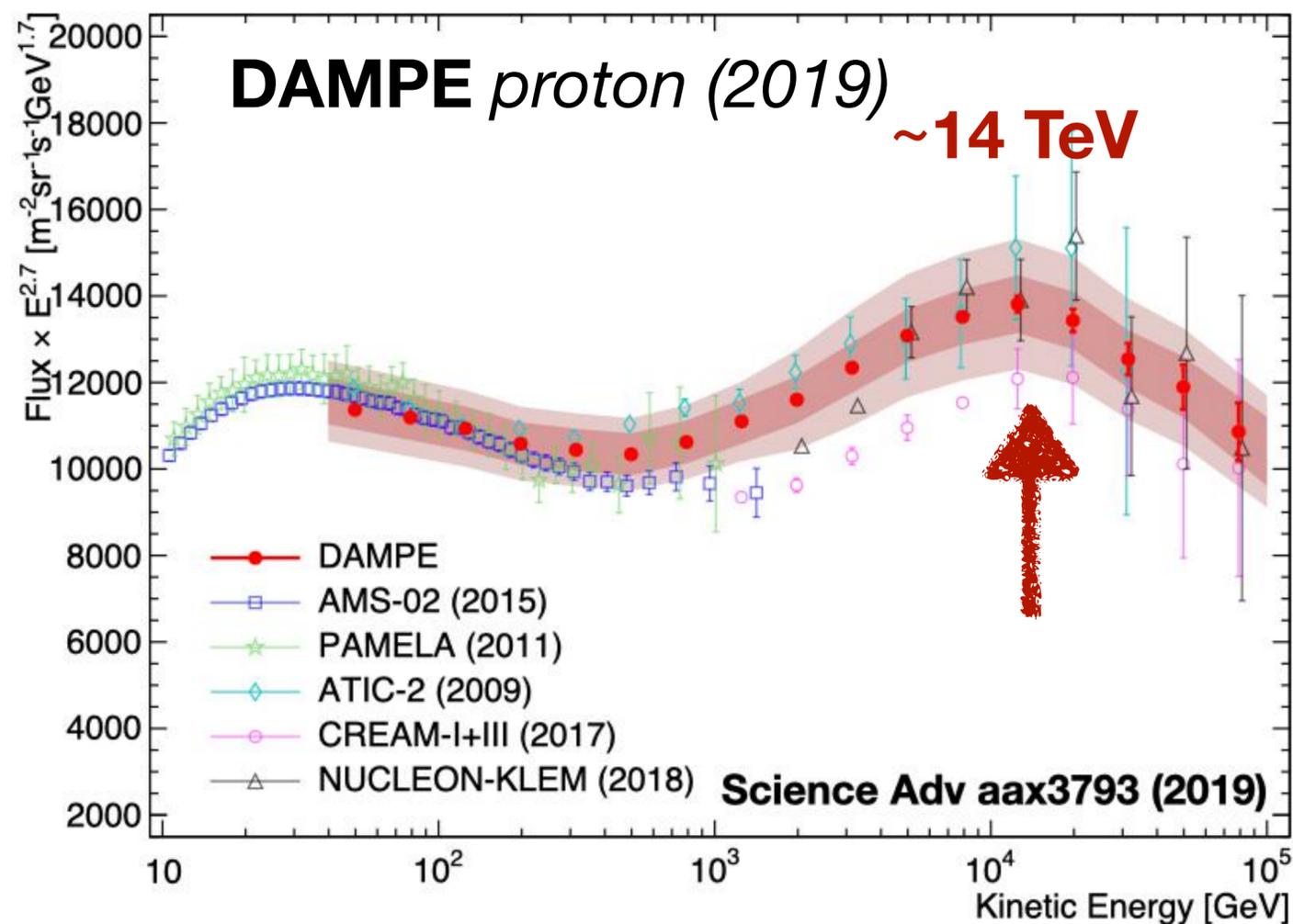
- Additional e/p rejection capability

Plastic Scintillator
Detector (**PSD**)

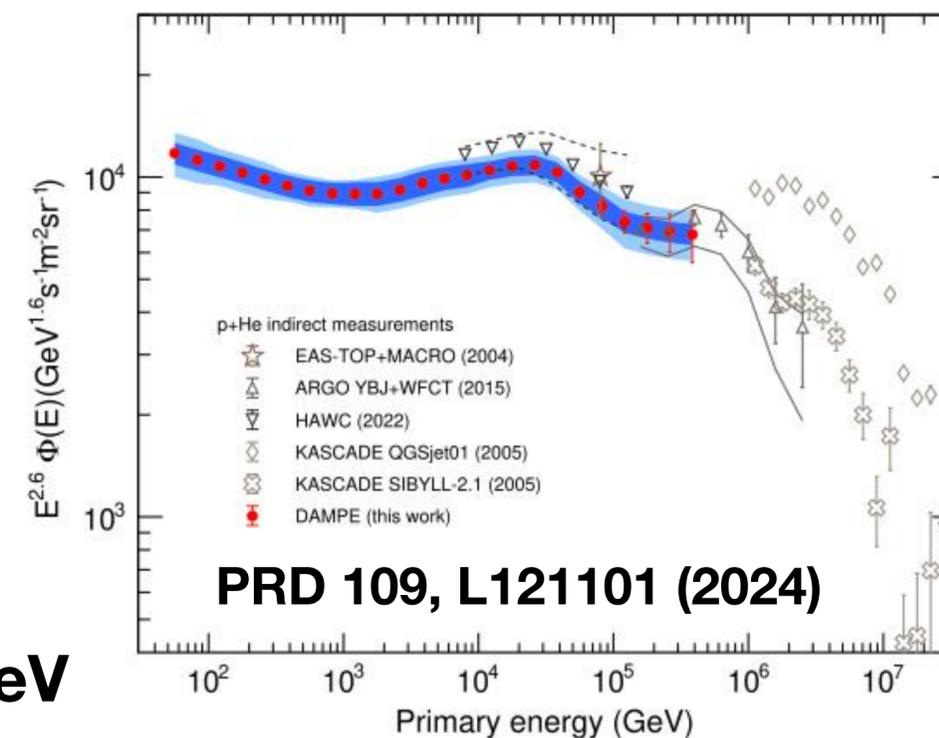
Silicon-Tungsten Tracker
Converter (**STK**)



Motivation



- Proton – most abundant CR and the only CR with $Z=A$
- Previous individual CR proton measurement reaching 100 TeV
→ limited by statistics and particle ID
- **p+He spectrum (2024) suggests a new hardening at ~ 150 TeV**



Challenge: track reconstruction

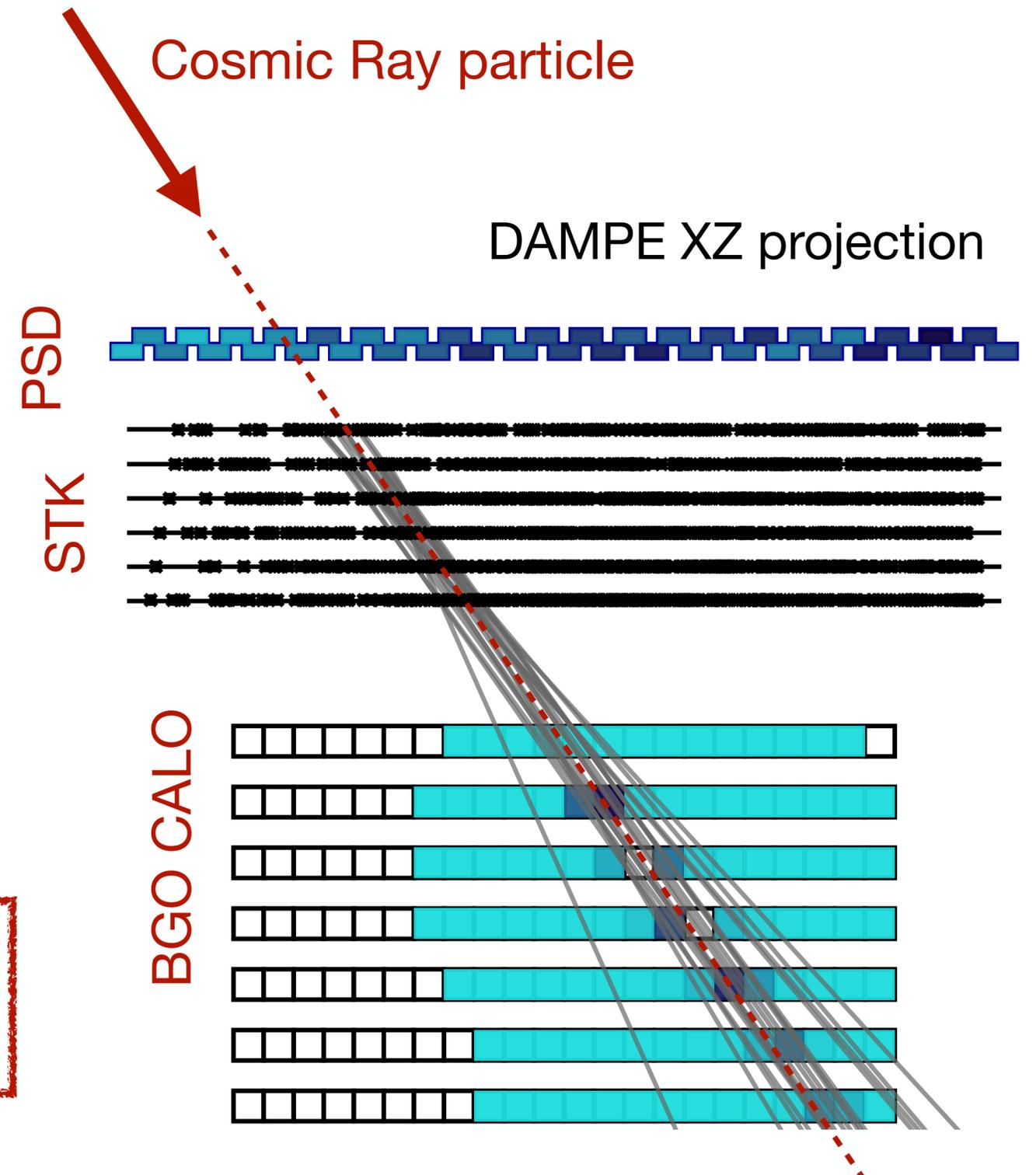
Conventional track reconstruction:

- Shower axis from CALO as a seed
- Kalman fitting
- Combinatorial track finding
- XZ and YZ fitted separately,
- ... then combined in 3D tracks

Problems:

- Selection needed to find **the ONLY track**
- Efficiency drops at high hit multiplicity

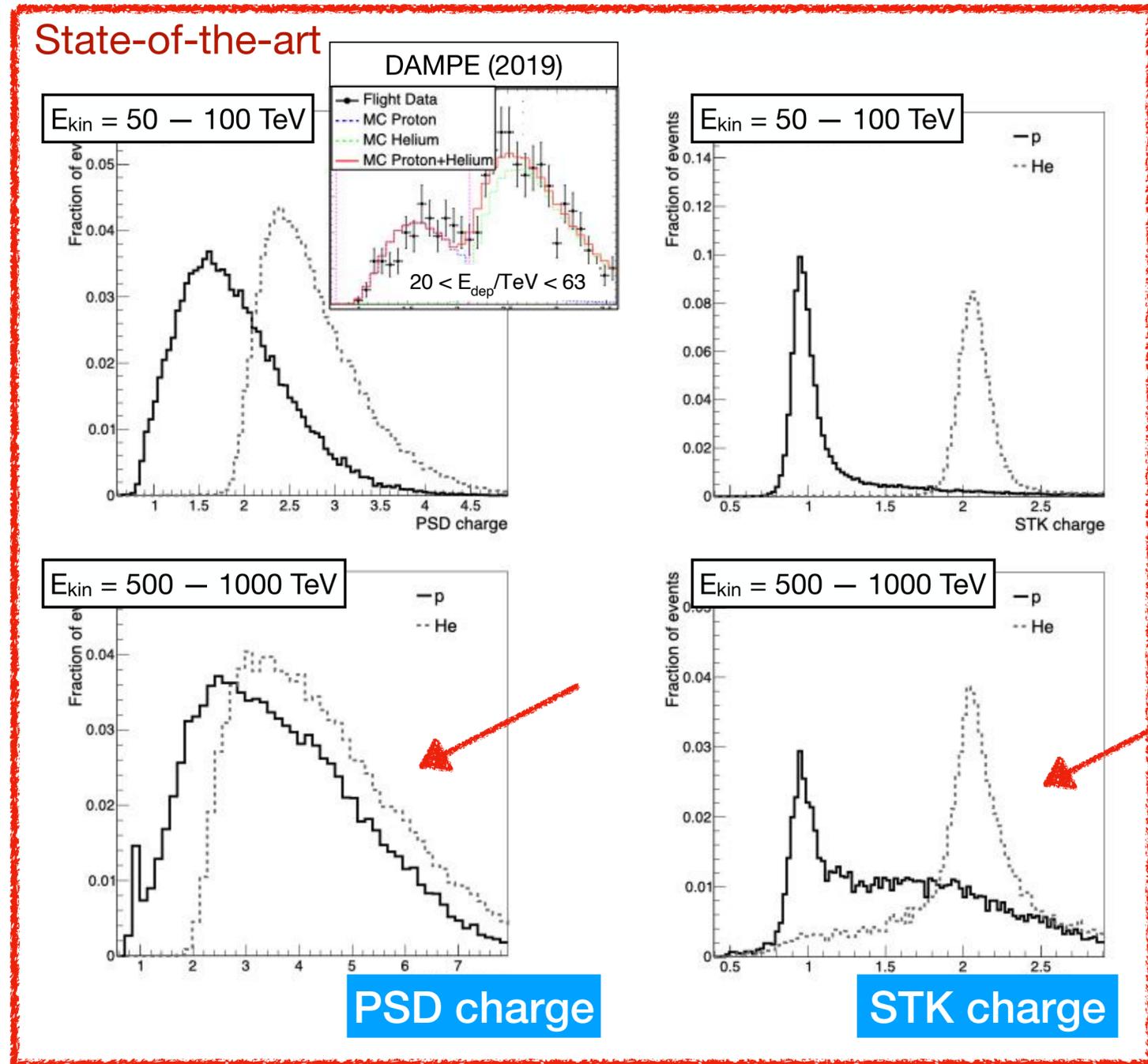
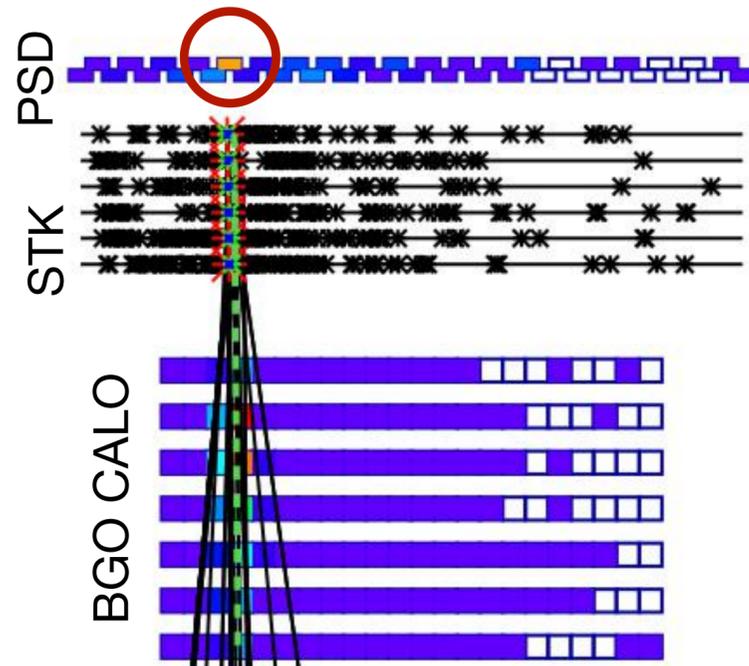
At TeV— PeV hit multiplicity increases dramatically →
Track reconstruction & identification is a key challenge!



Challenge: charge identification

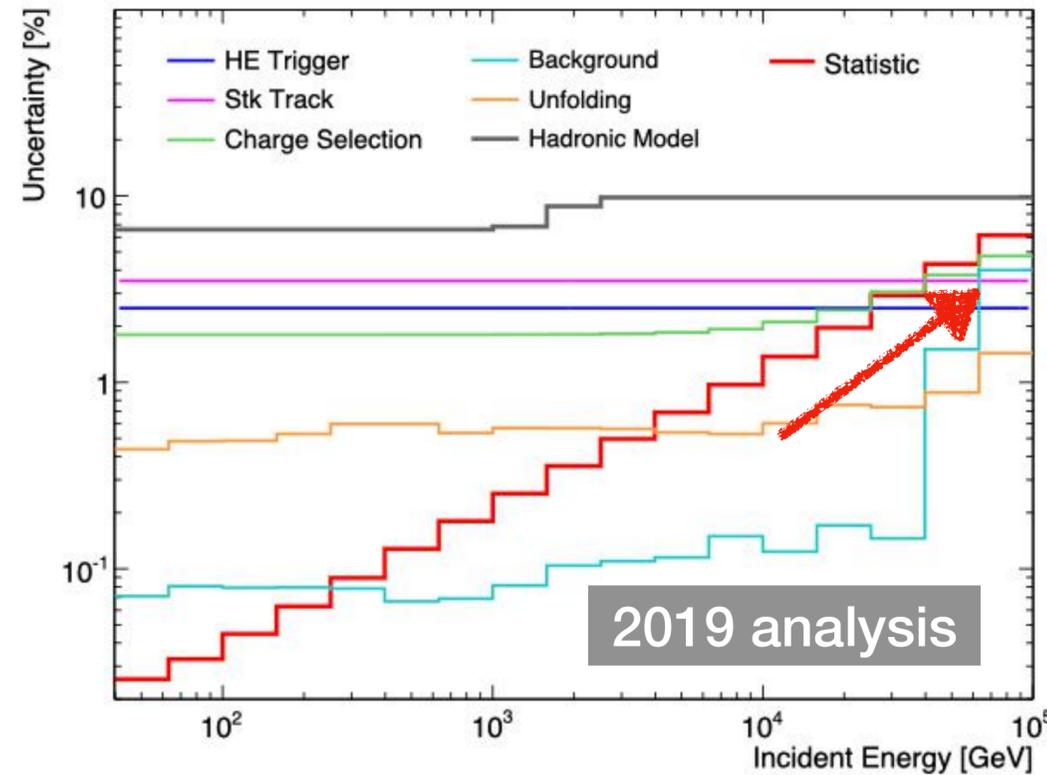
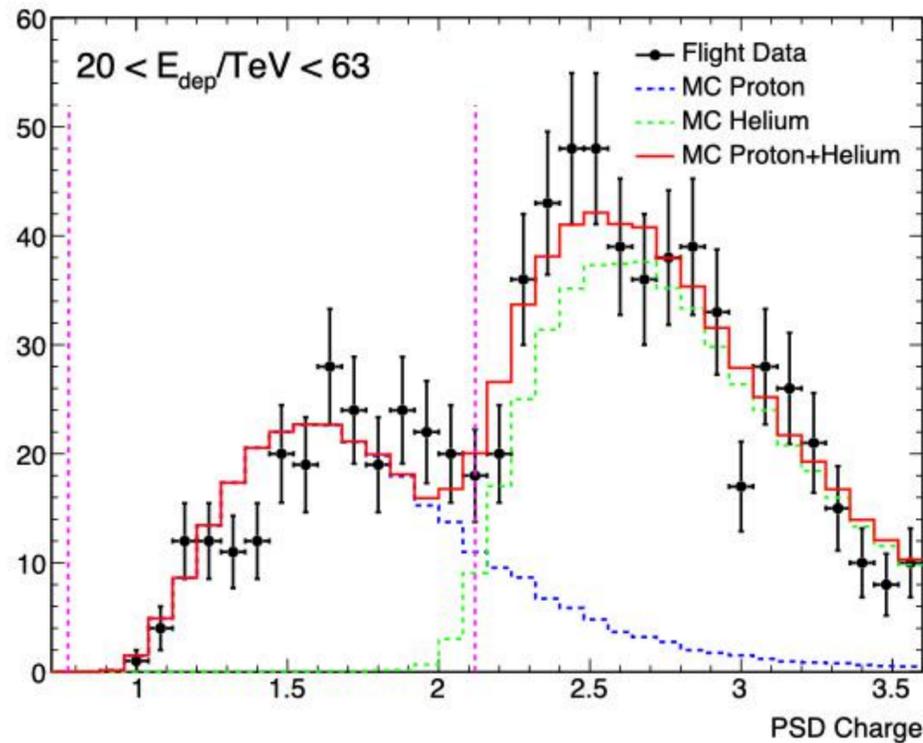
- Charge ID conventional done in PSD
- Track used as a pointer to PSD
- Tolerant to track mis-identification, however:

***p* and *He* peaks “washed out”
at high energies!**

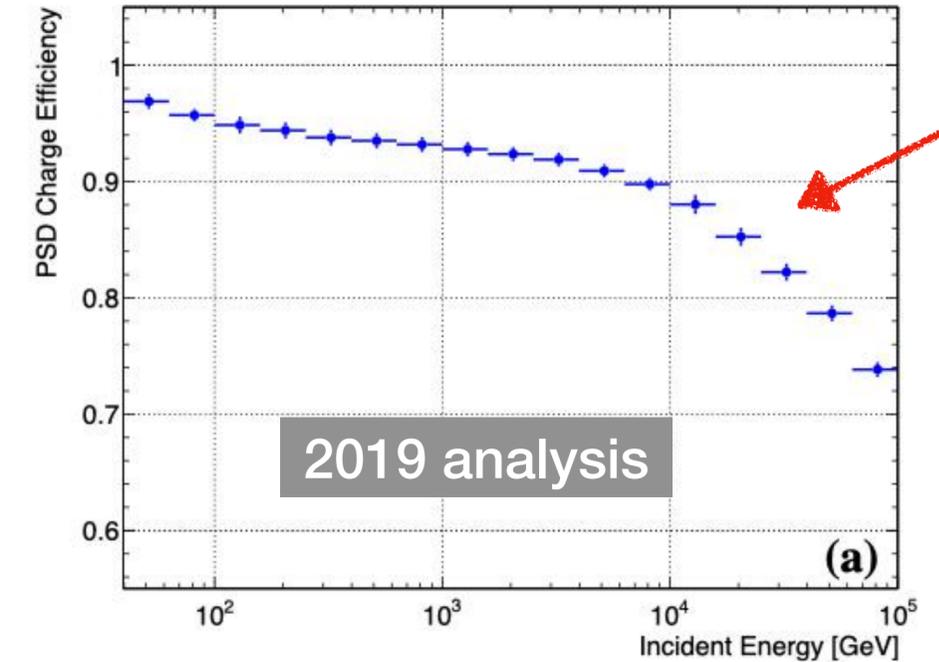


Challenge: tracking & charge ID

Statistical & Systematic errors



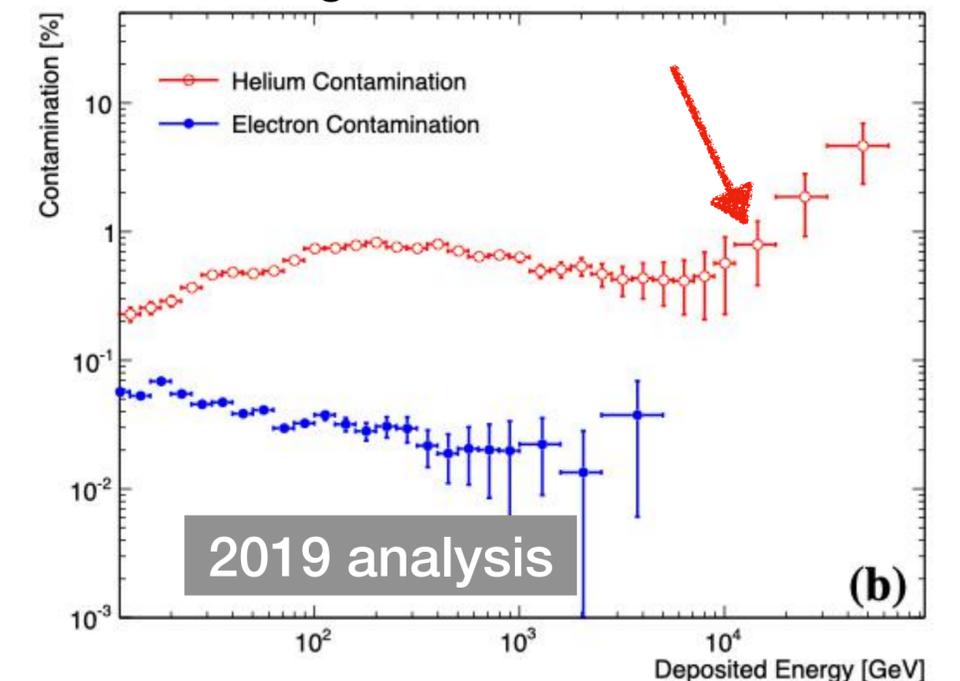
p charge selection efficiency



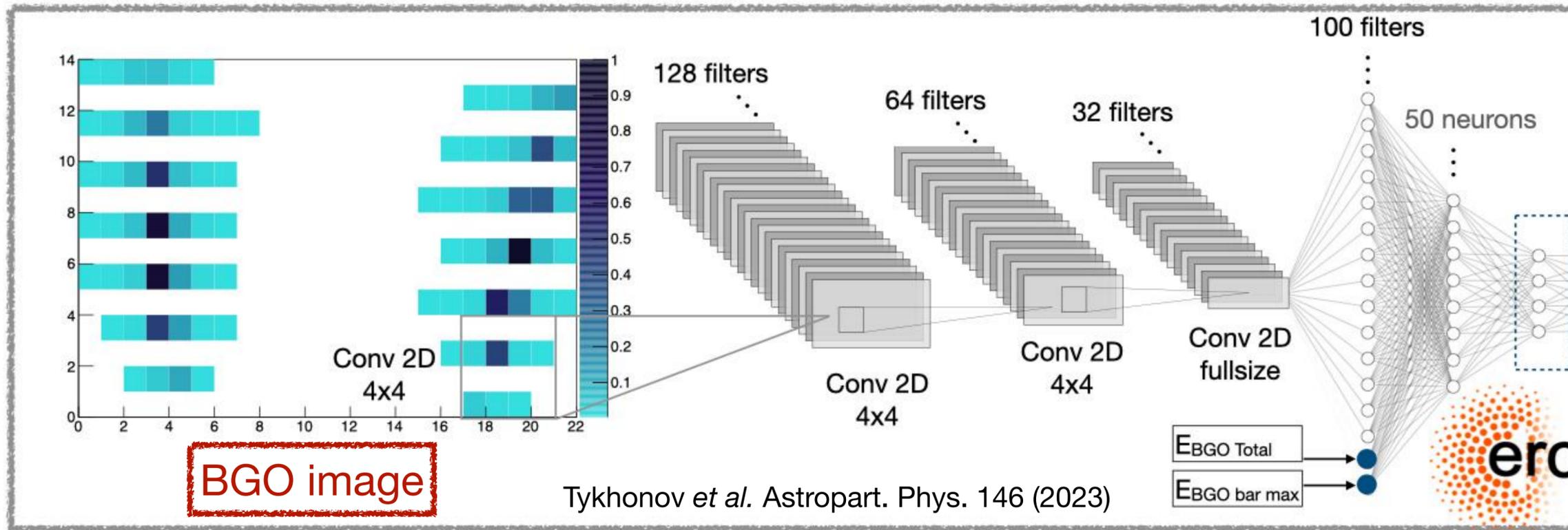
- Track reconstruction + proton charge identification + background contamination — dominating uncertainty at high energies!

New tracking algorithm required for \sim PeV measurements!

Background contamination

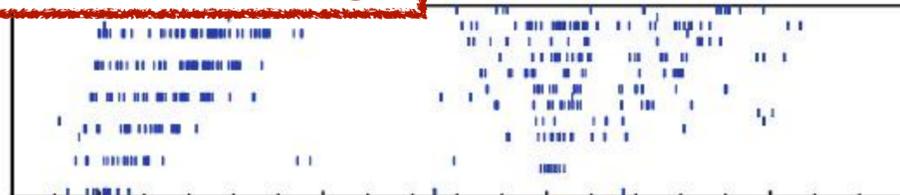


New track reconstruction & ML



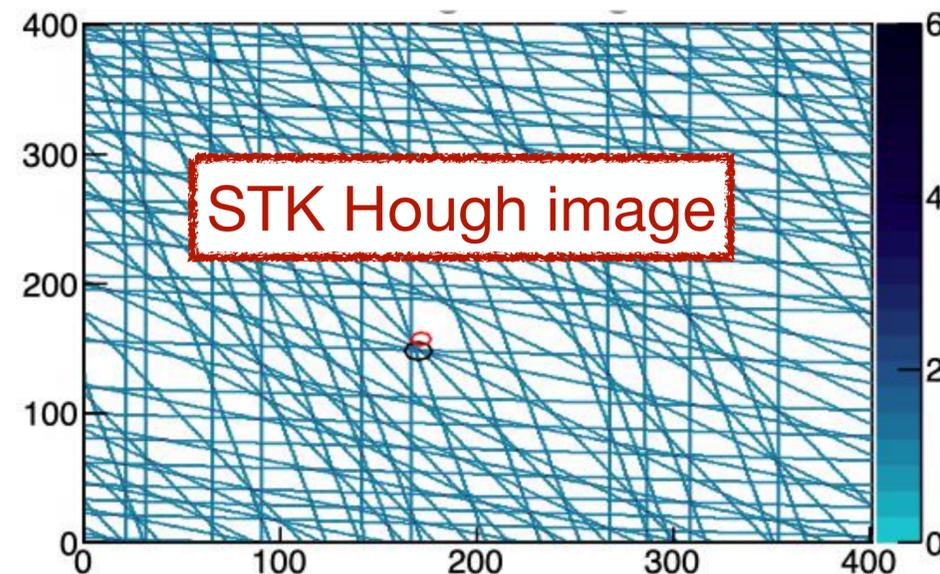
We employ **Convolutional Neural Networks (CNNs)** to boost the accuracy of track reconstruction & identification @ DAMPE

STK raw image



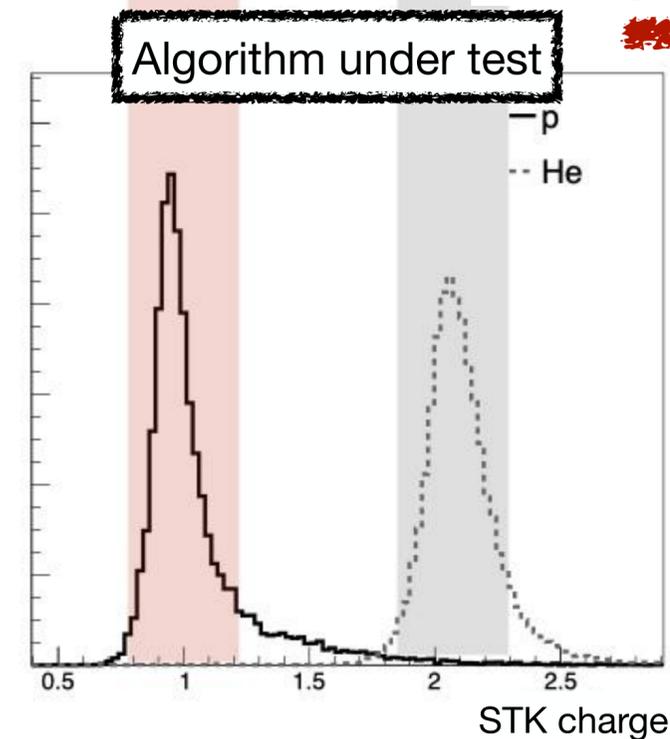
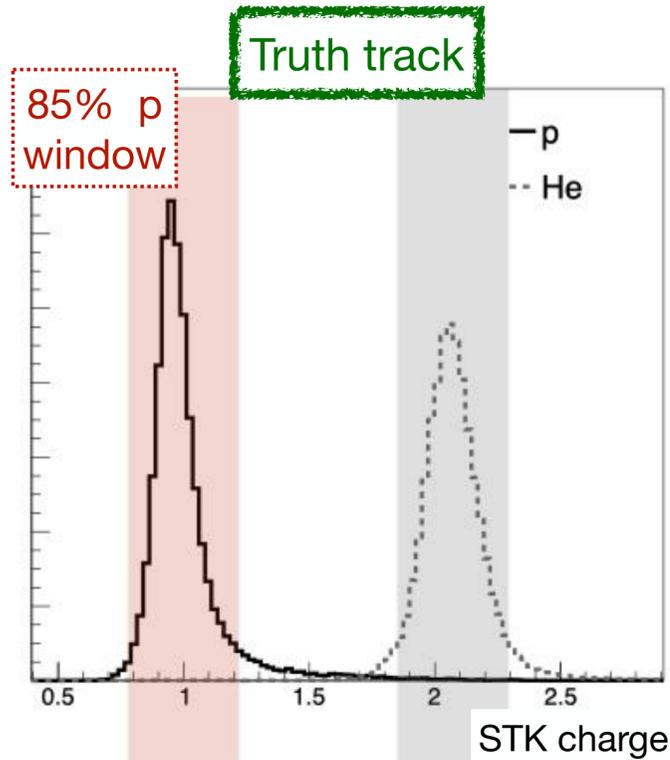
+

STK Hough image

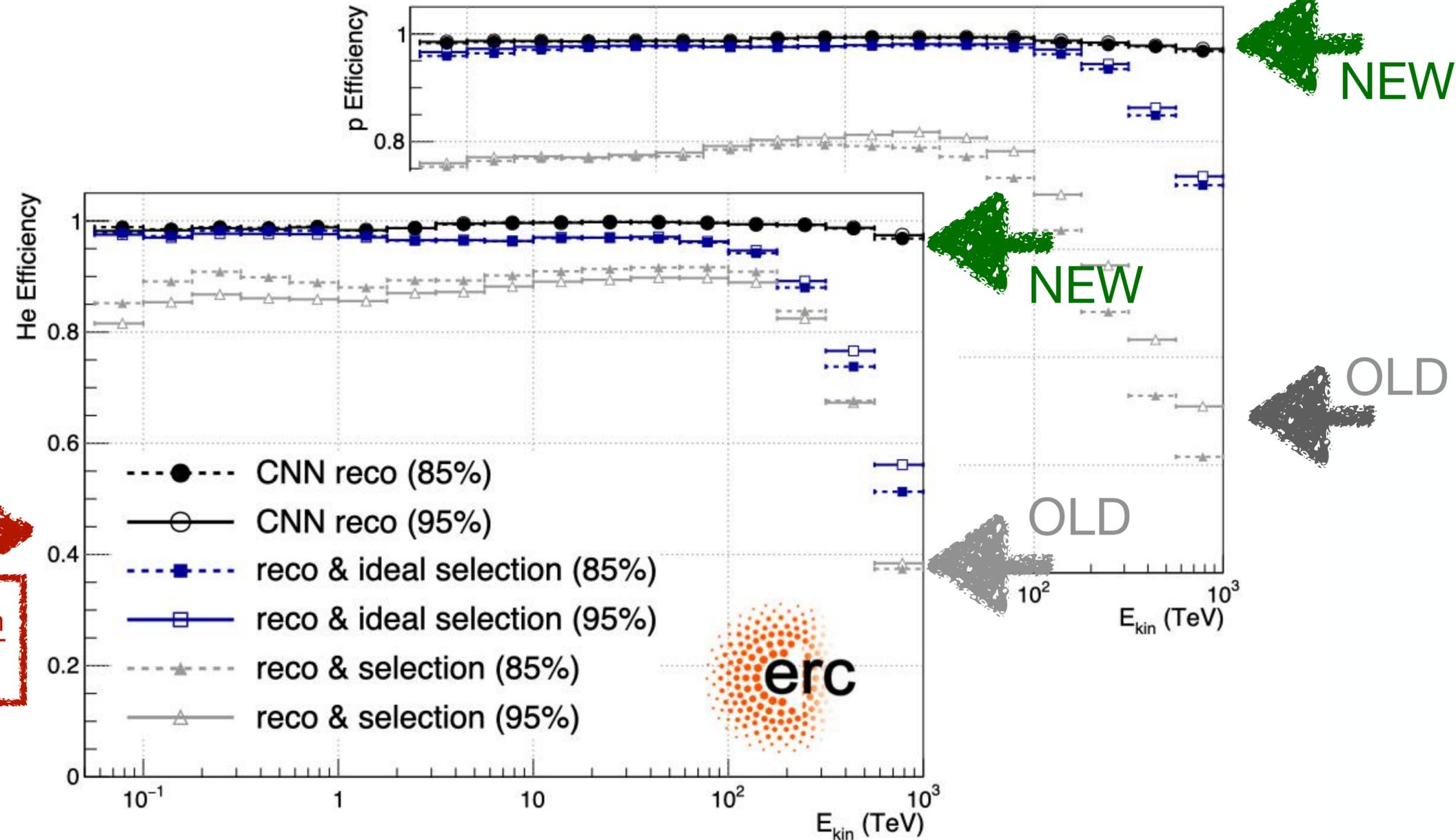


CALO & Tracker “images” used as input, regression type of problem — returns particle direction as an output (no track selection needed)

New track reconstruction & ML



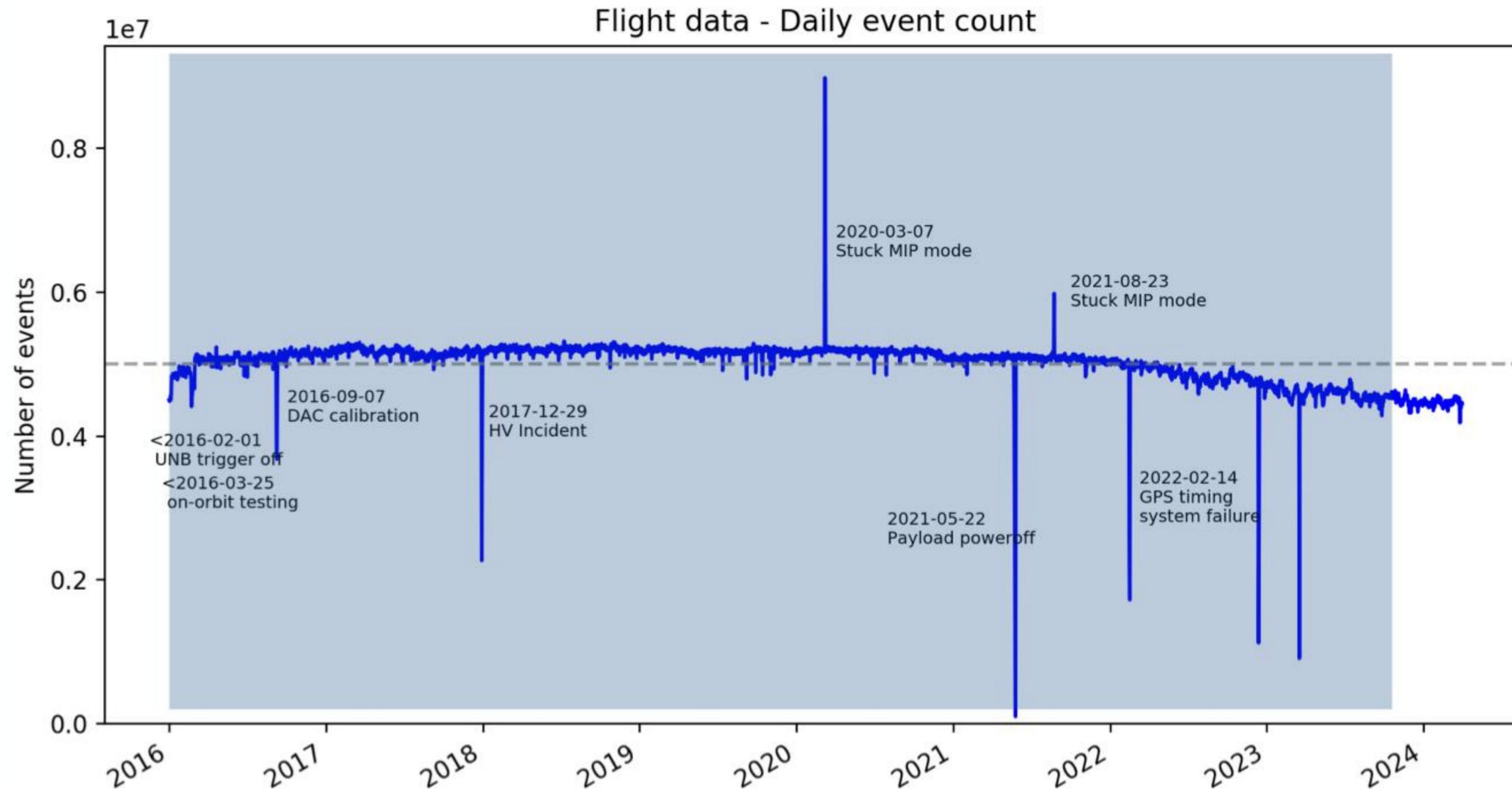
$$\text{Eff} = \frac{N_{\text{algorithm}}}{N_{\text{true}}}$$



Tykhonov *et al.* Astropart. Phys. 146 (2023)

CNN tracking efficiency = **98-99%** up to 500 TeV (**> 96%** @ PeV)

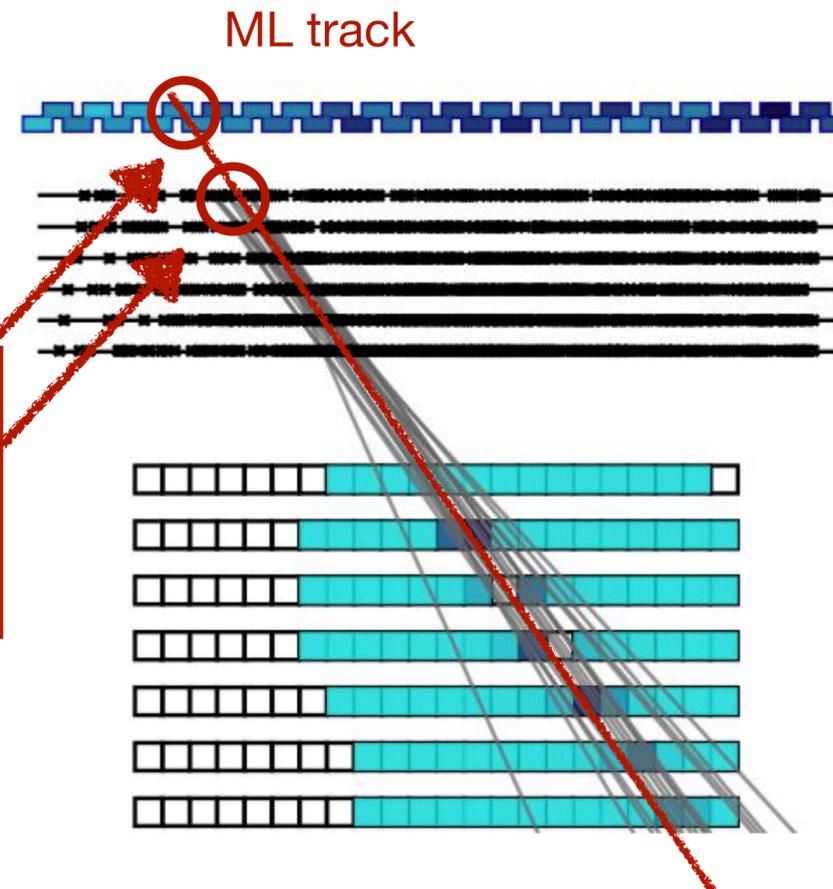
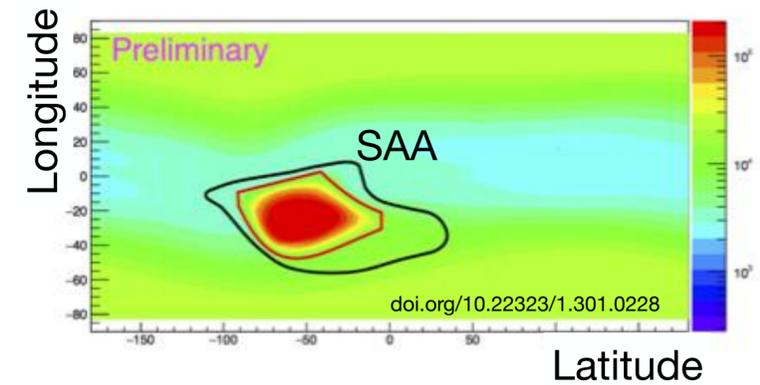
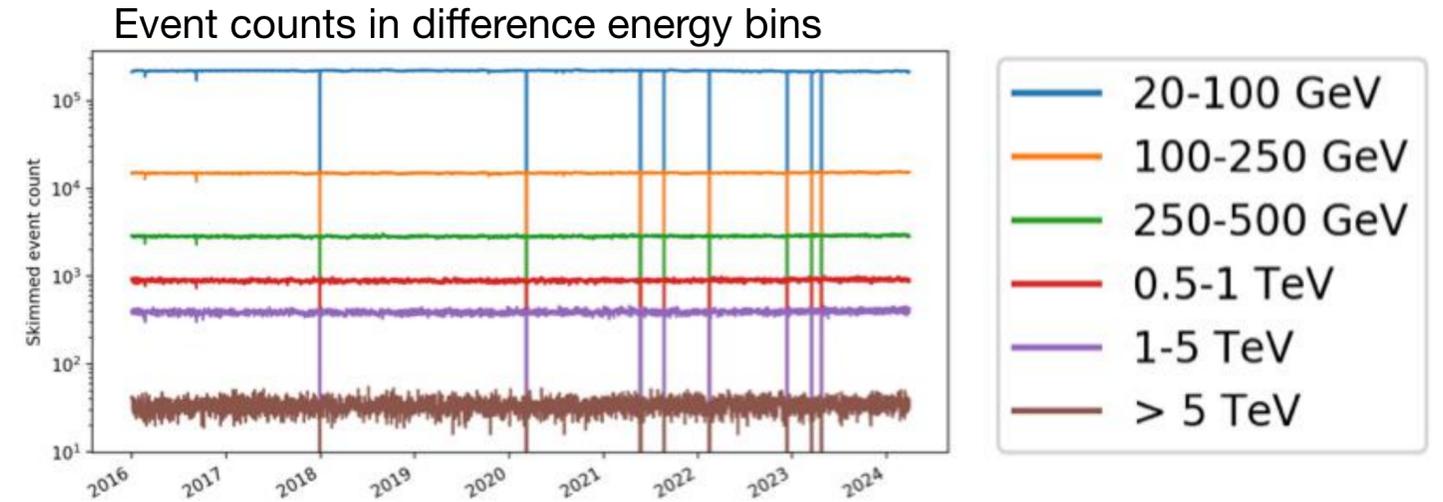
Data



- **92 months of data**
- **14 billion events**
- **Livetime:**
183698199 seconds
(76%)

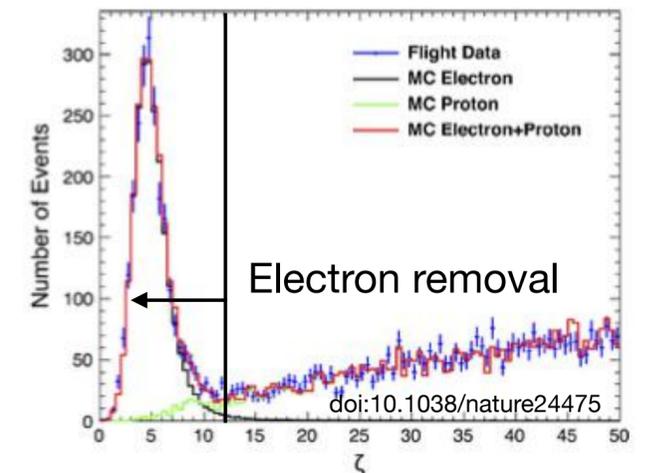
Event selection

- **Pre-selection:**
 - Ensure well-reconstructed and fully-contained events in the detector
- **Selection:**
 - High-energy trigger
 - Deposited energy > 20 GeV
 - Removal of SAA region
 - Electron removal (ζ classifier)
 - ML track reconstruction

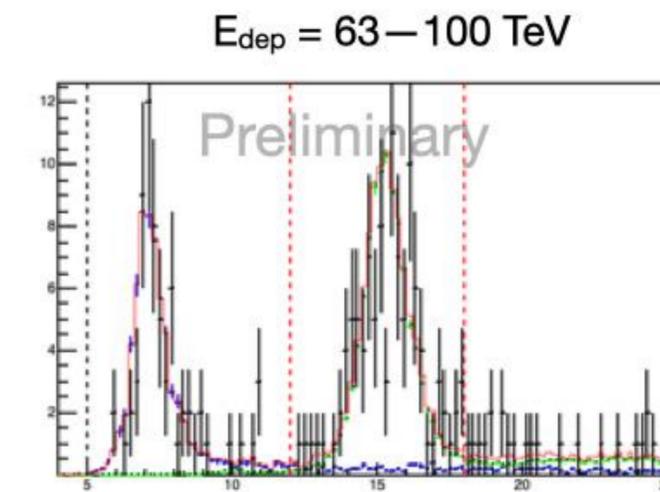
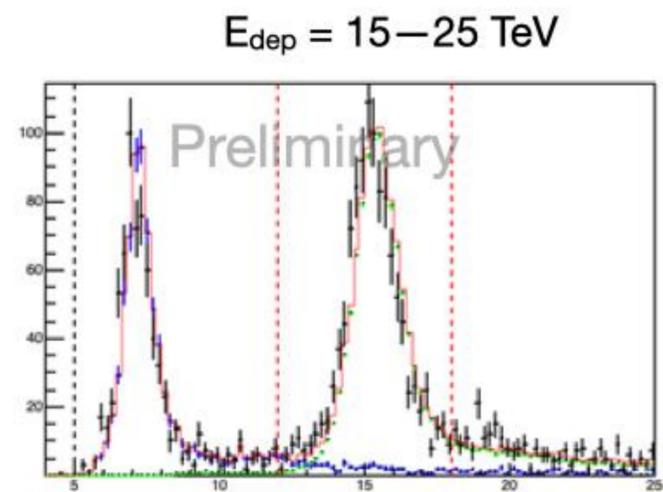
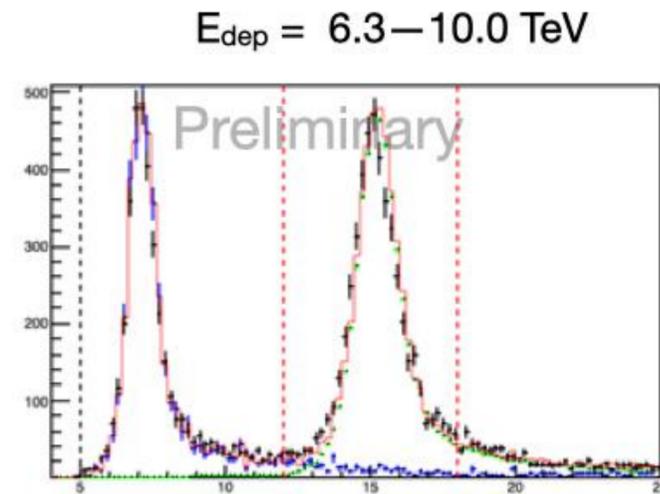
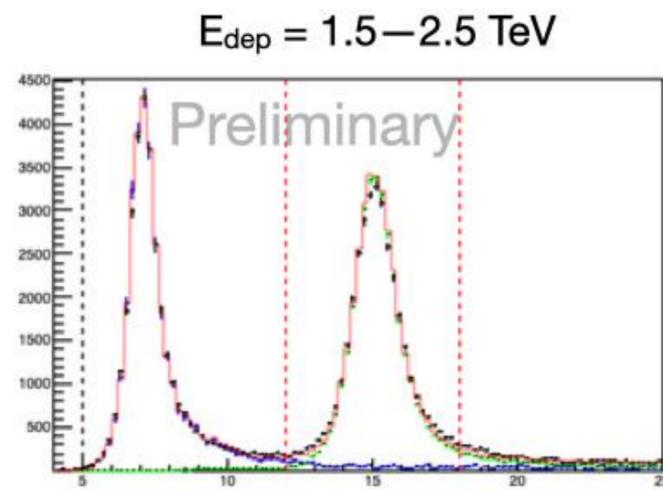


Combined charge selection =

- PSD charge if CR interacts before STK
- STK charge if CR interacts after PSD

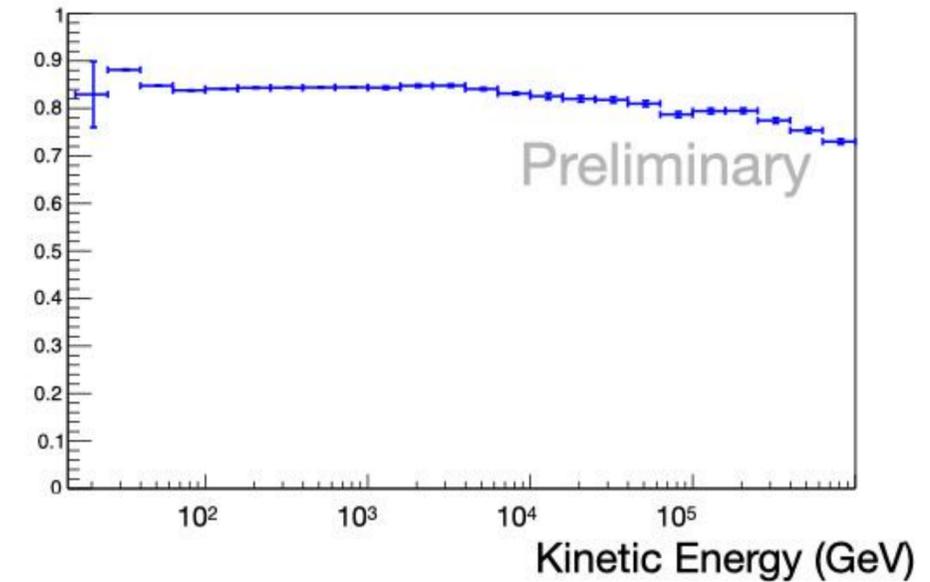


Charge selection

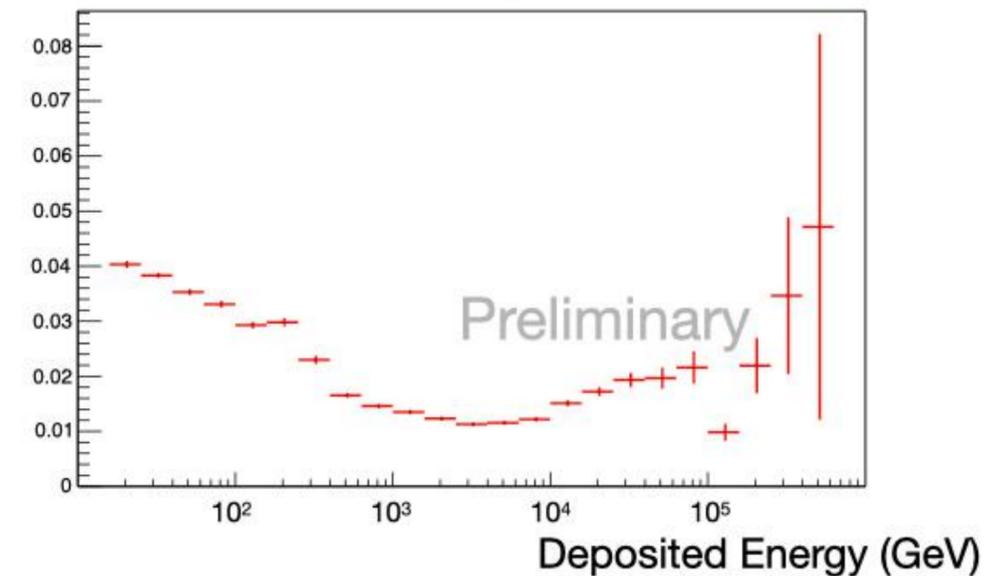


Combined charge (arbitrary units)

Charge selection efficiency

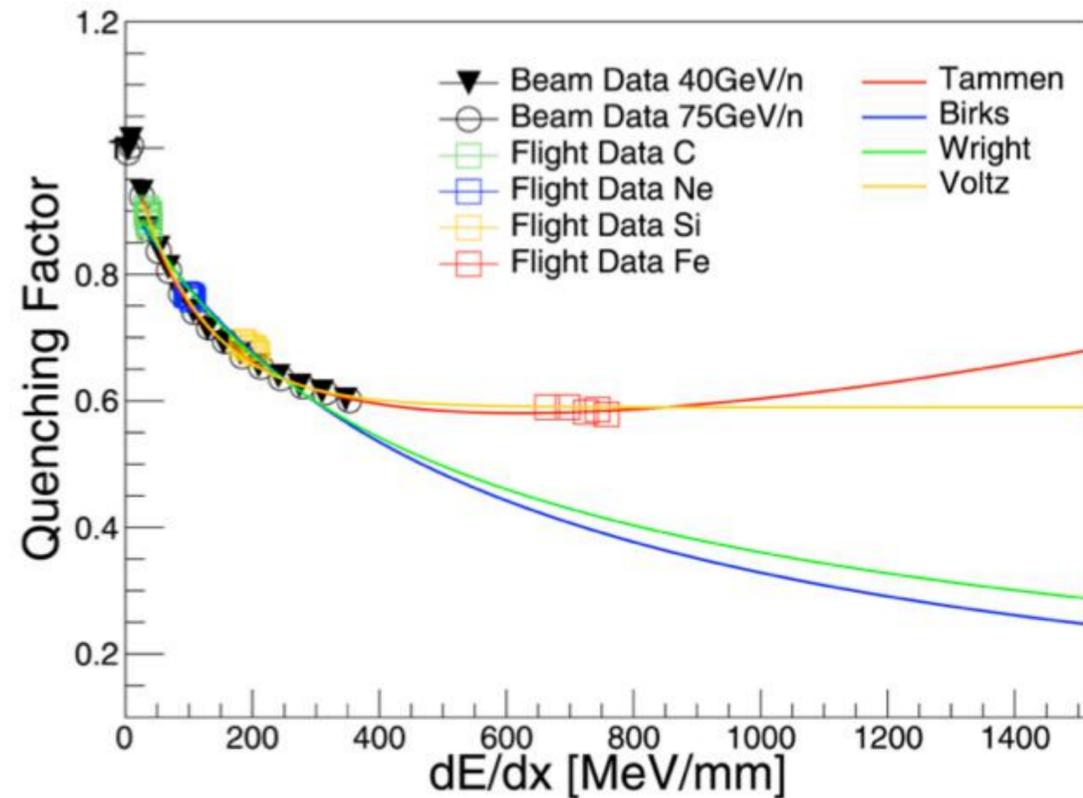


Residual *He* background fraction



- He background below $\sim 4\%$ up to $\sim 500 \text{ TeV}$
- Charge selection efficiency above 80% up to $100 \sim \text{TeV}$, 73% at $\sim \text{PeV}$

BGO quenching and saturation corrections



Y. Wei et al., Transactions on Nuclear Science, 67/6 (2020), Y.-F. Wei et al. NIM A 922 (2019), Z.-F. Chen et al. NIM A 1055 (2023)

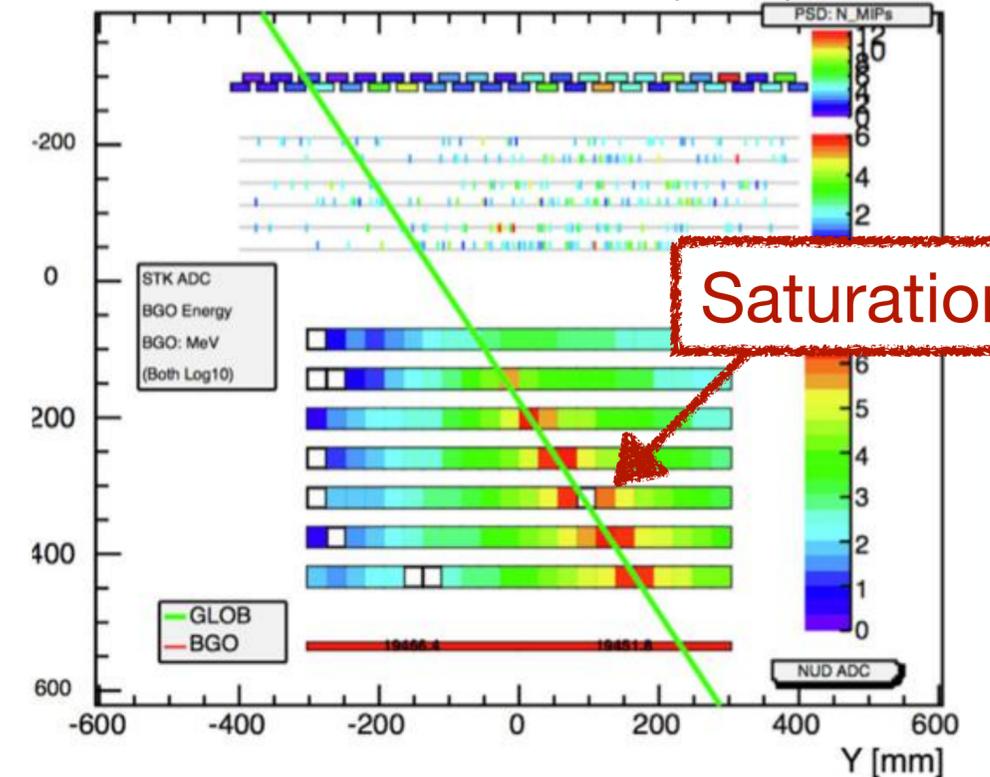
Quenching — nonlinear fluorescence response of BGO for large ionization

- correction derived from beam test and flight data
- implemented in the detector simulation, ~3% effect for p at 10 GeV

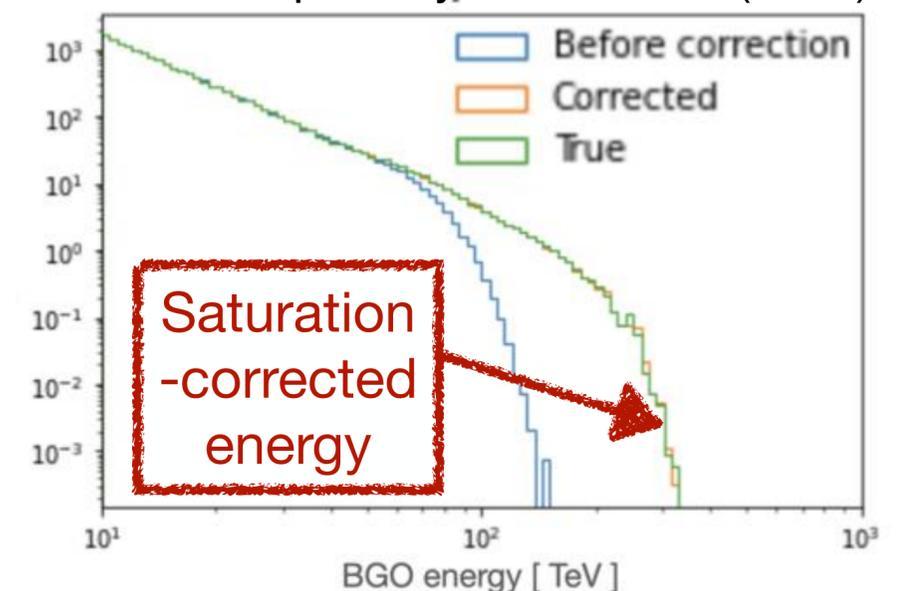
Saturation of BGO bars at ~100 TeV CR kinetic energy:

- corrections derived using analytical and ML methods

C. Yue et al. NIM, A 984 (2020) 164645



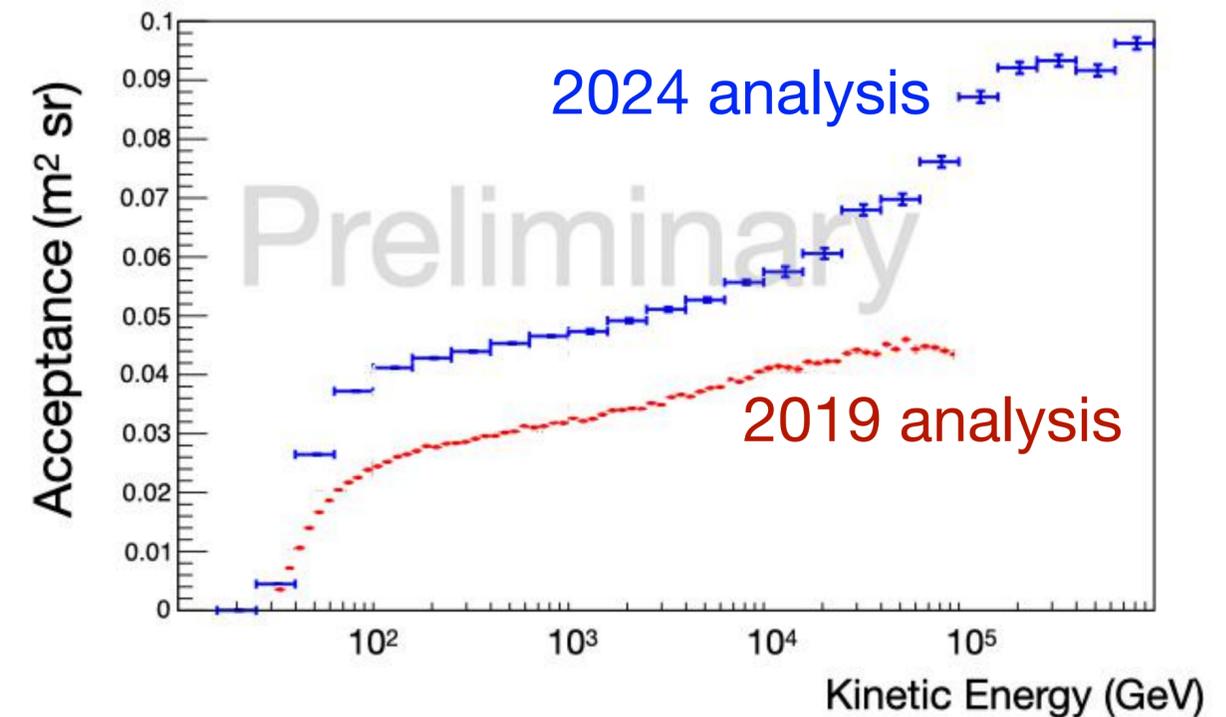
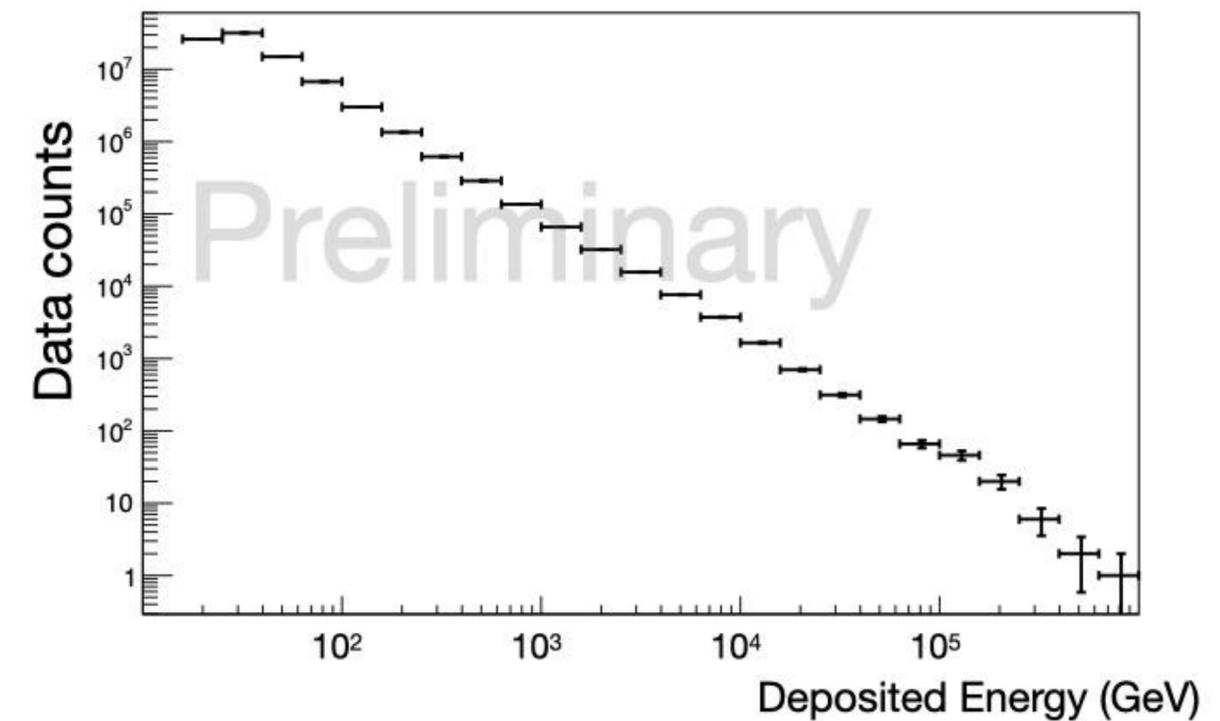
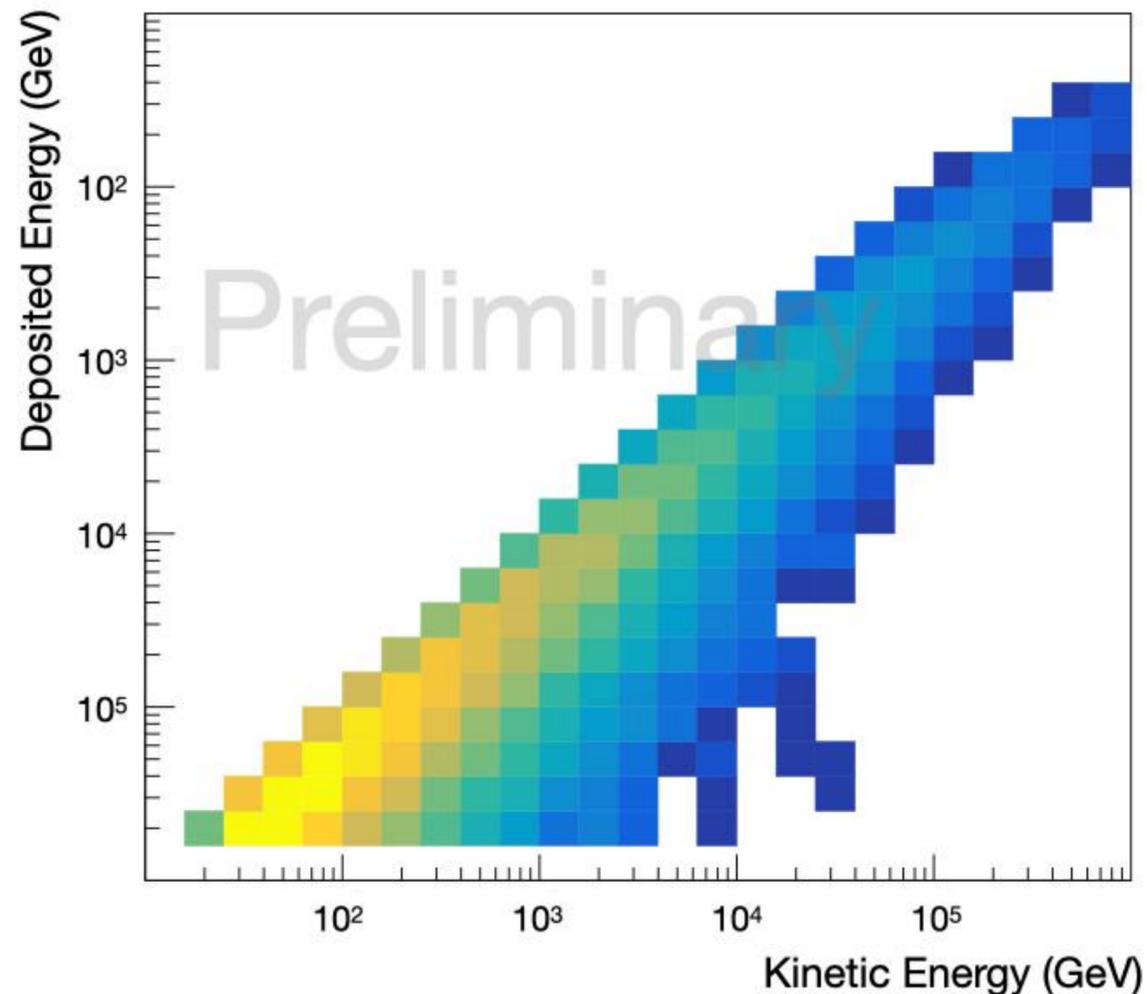
M. Stolpovskiy et al. JINST (2022)



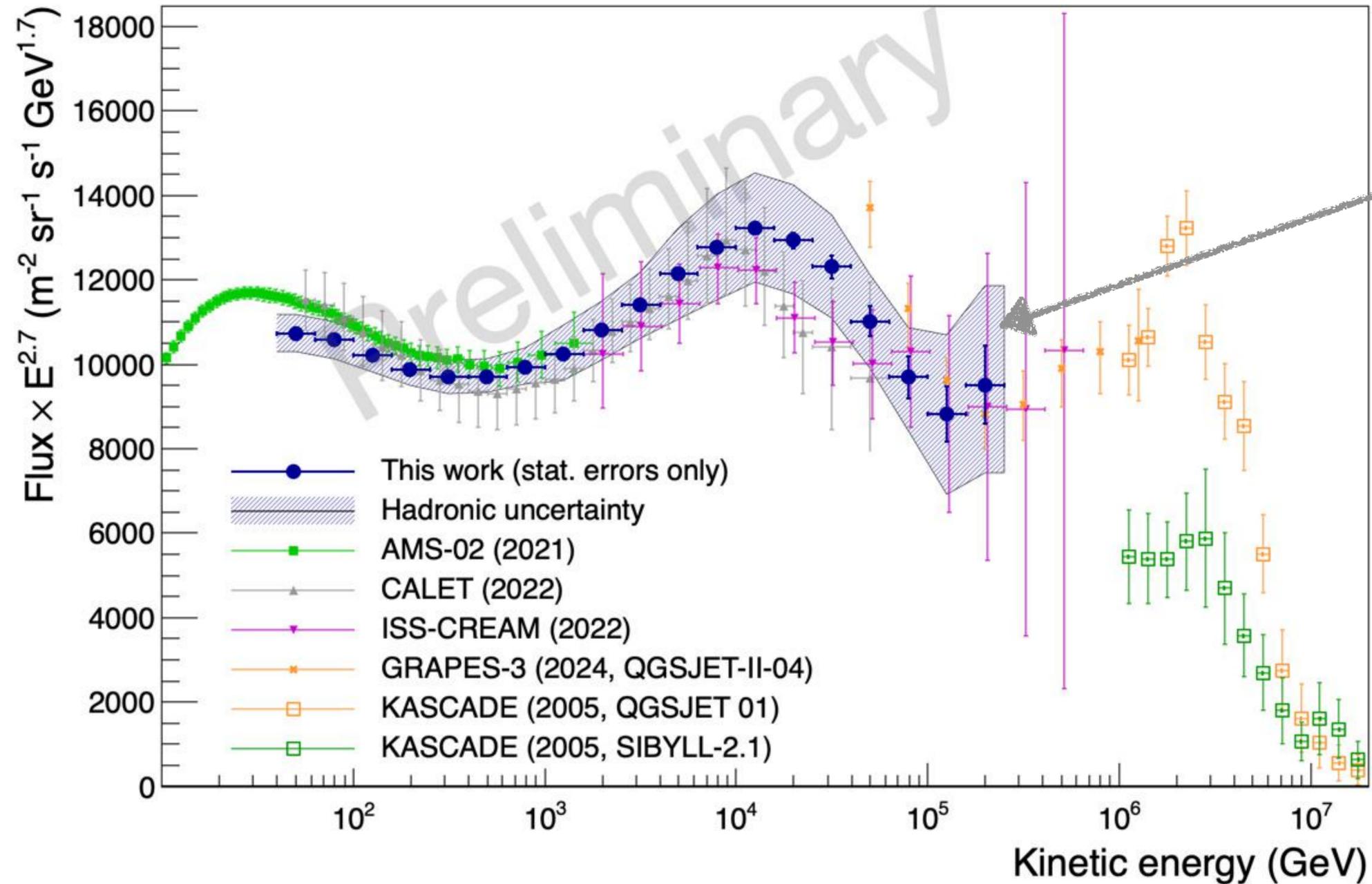
Event counts, energy unfolding

- Bayesian unfolding used to obtain event counts as a function of CR kinetic energy

$$P(E_{\text{true},j} | E_{\text{meas},i}) = \frac{P(E_{\text{meas},i} | E_{\text{true},j}) P(E_{\text{true},j})}{\sum_k P(E_{\text{meas},i} | E_{\text{true},k}) P(E_{\text{true},k})}$$



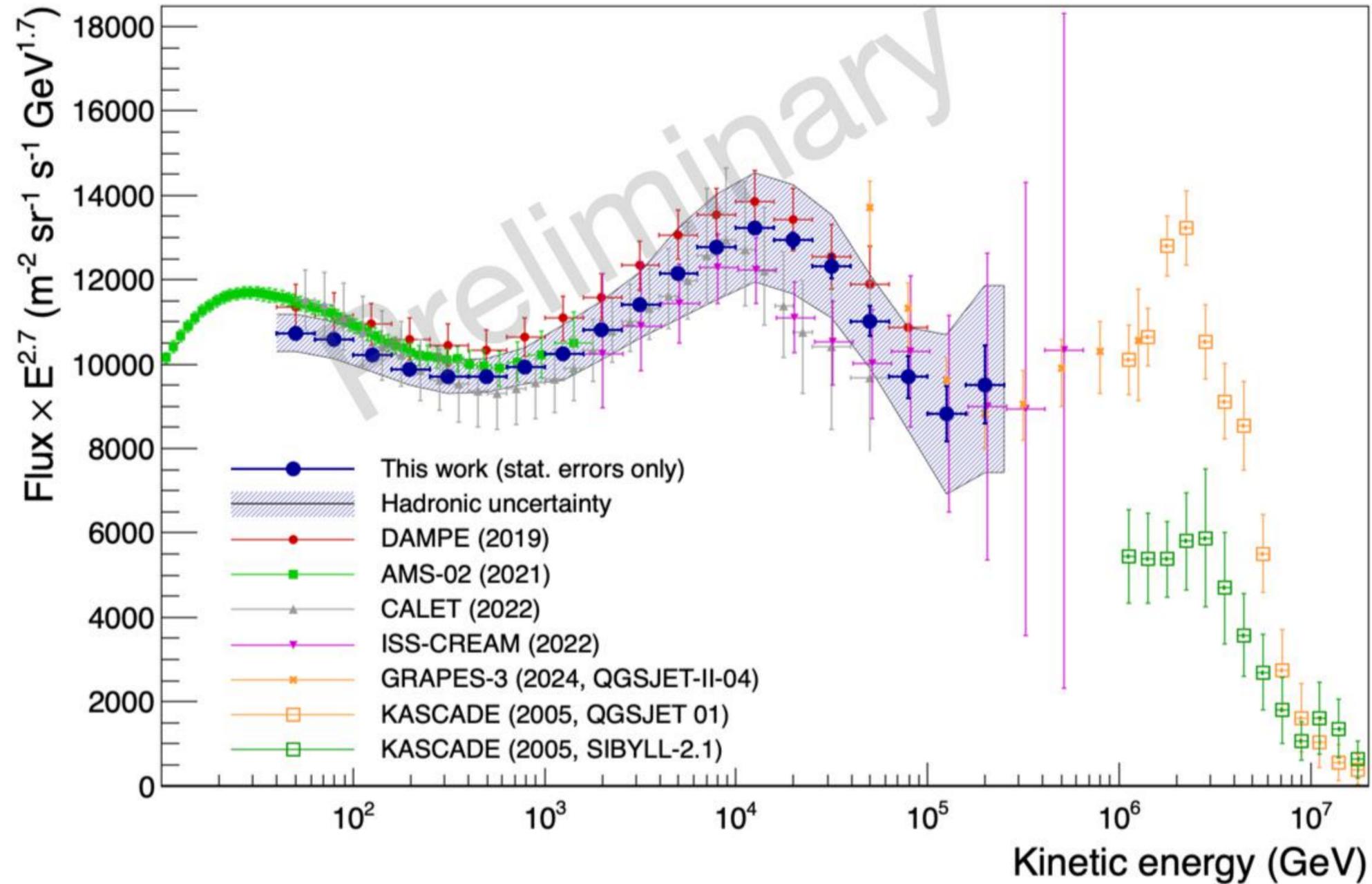
Flux



Hadronic errors:

- Estimated from Geant4 vs FLUKA comparison
- Mostly affect normalization
- Minor effect on flux shape

Flux



Good agreement with 2019 result within the analysis errors

Estimation of systematics in process, dominating factors: charge selection for PSD-interacting events, BGO saturation, quenching, ...

Next steps: hadronic cross sections

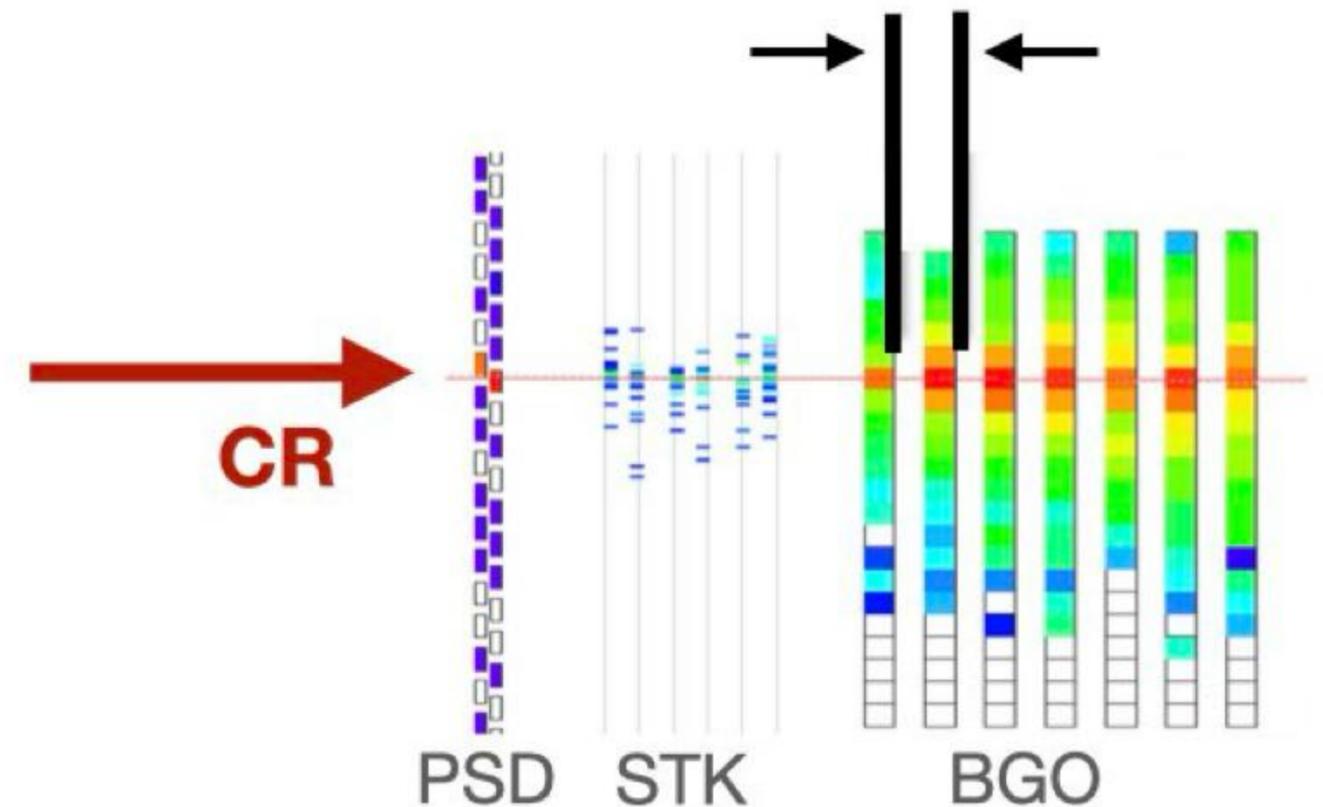
Hadronic cross section affecting:

- 1) Acceptance
- 2) Energy response matrix

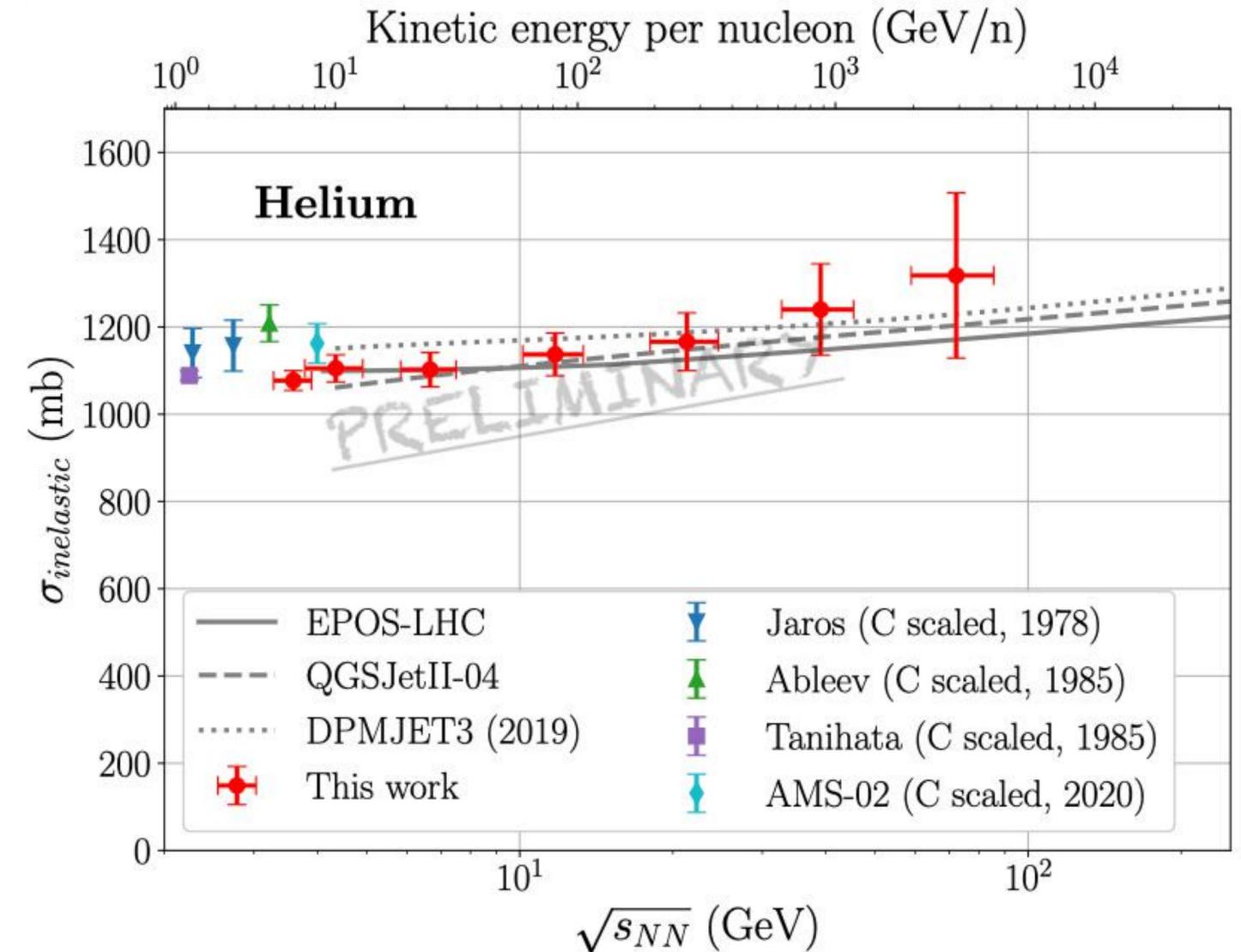
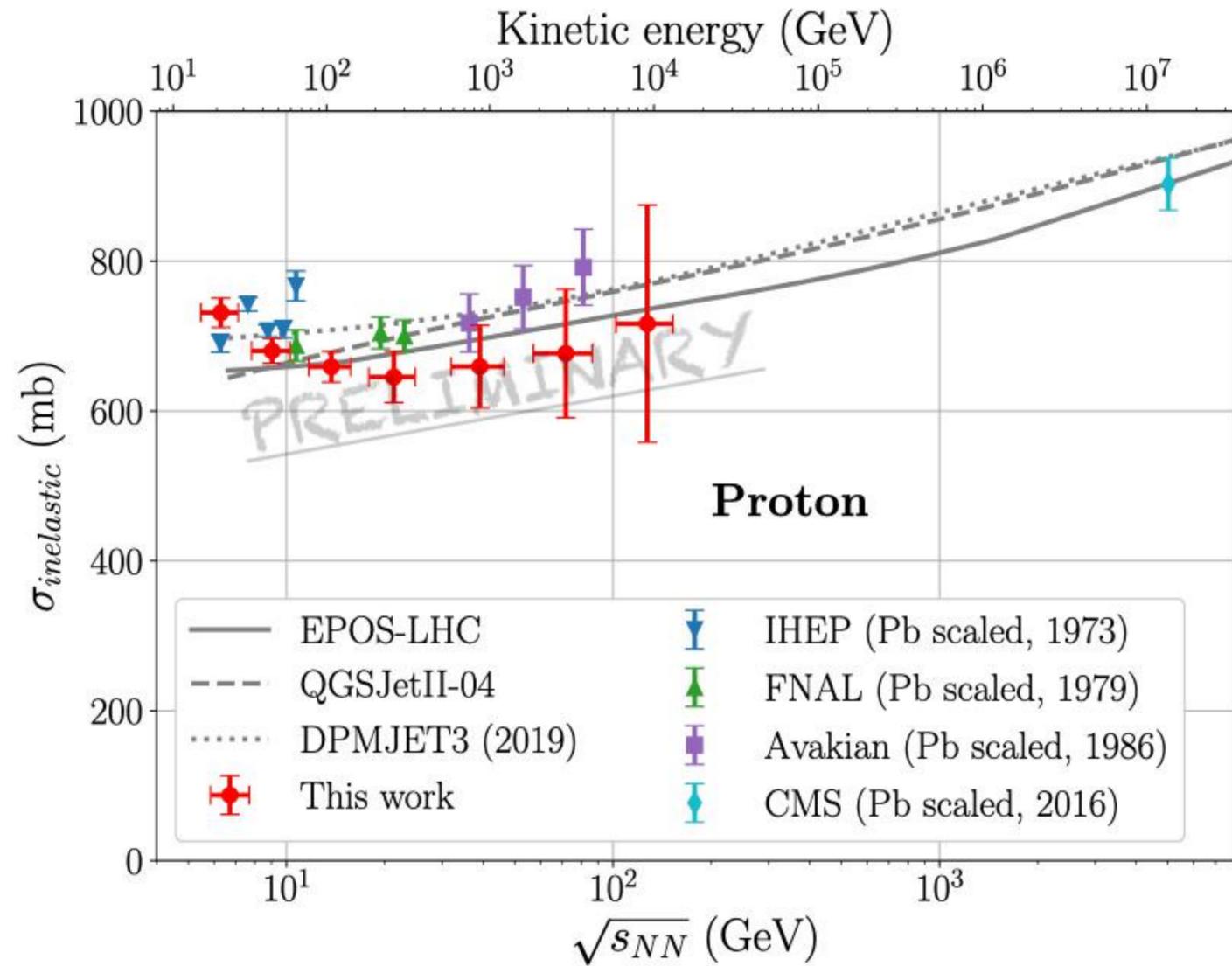
Good segmentation of BGO calorimeter and new AI tracking allows to use DAMPE for cross-section measurements:

$$\Phi(E \rightarrow E + \Delta E) = \frac{N}{A_{eff} \cdot \Delta E \cdot \delta t}$$

$$P(E_{true,j} | E_{meas,i}) = \frac{P(E_{meas,i} | E_{true,j}) P(E_{true,j})}{\sum_k P(E_{meas,i} | E_{true,k}) P(E_{true,k})}$$



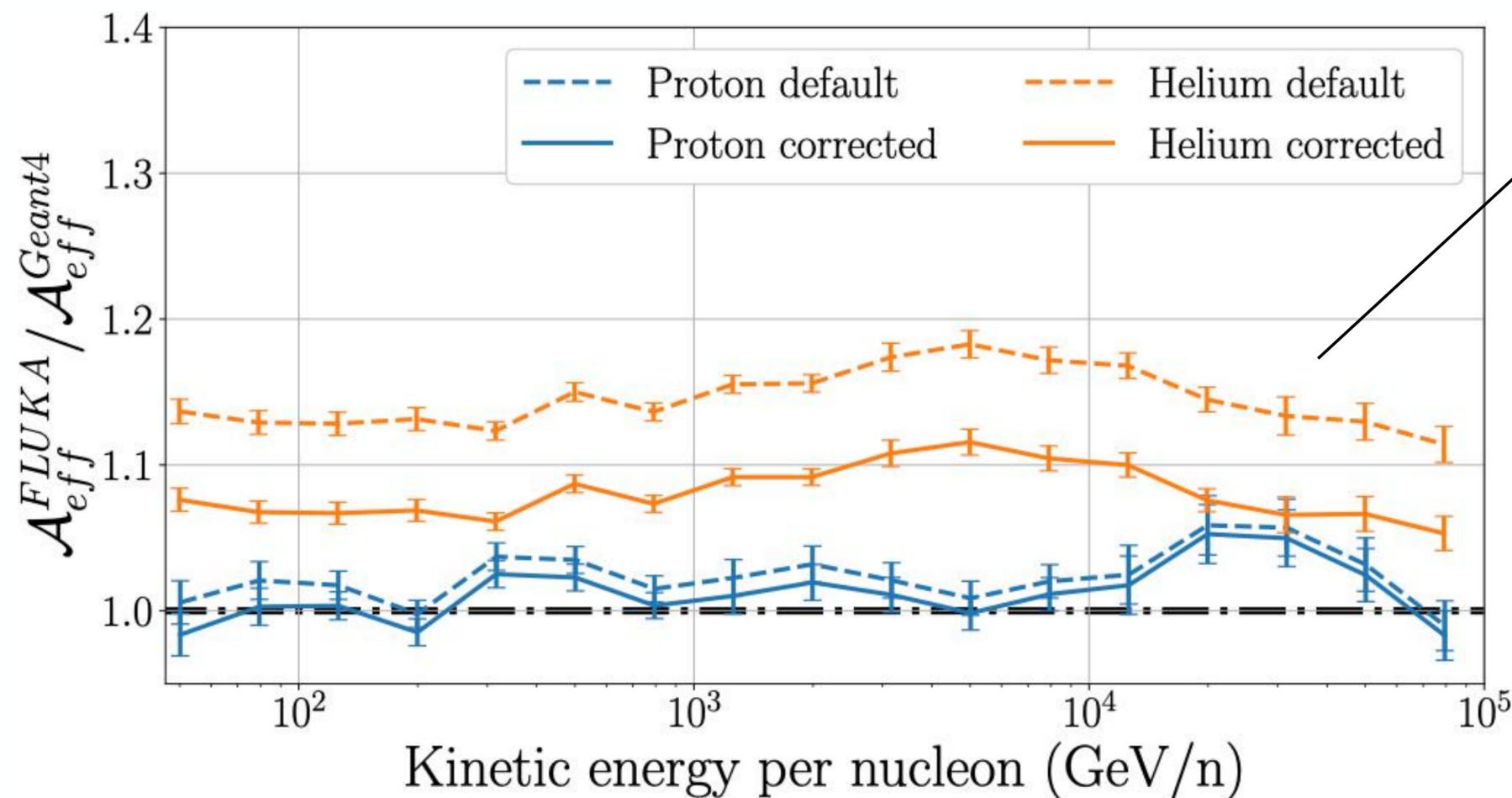
Next steps: hadronic cross sections



Paper coming soon ...

Next steps: hadronic cross sections

Acceptance Geant4 vs FLUKA
(before and after correcting to the data):



Helium: 15% → 8 %
Proton: 2.3% → 1.2%

Dedicated work on hadronic measurements & corrections, see **XSCRC2024: Cross sections for Cosmic Rays @ CERN this October!**

Conclusions

Motivation

- First publication of proton flux in 2019 (30 months data)
- Classical analysis limited to ~ 100 TeV by \sim particle ID
- Hints of new feature in combined p+He at ~ 150 TeV



New result

- 92 months of data
- Based on ML tracking
- Increased acceptance and improved particle ID
- Careful systematics study in process
- Dedicated work on hadronic measurements

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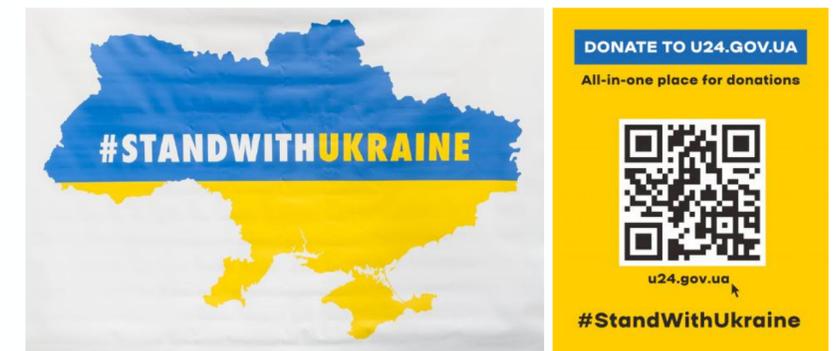
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To be continued



Thank You!