

# Measurement of Inelastic Hadronic Cross Sections in Space with DAMPE



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(for the DAMPE collaboration)

# The DAMPE experiment



- Also called *Wukong*
- Satellite launched in December 2015
- Sun-synchronous orbit  
(Altitude - 500 km, Period - 95 minutes, Oriented toward zenith)
- Records  $\sim 5 \times 10^6$  events per day
- Large effective area and deep calorimeter (32 radiation lengths)
  - Electrons / photons:  
5 GeV to 10 TeV ; acceptance  $\sim 0.3 \text{ m}^2 \text{ sr}$
  - CR ions:  
10 GeV to  $\sim 500 \text{ TeV}$ ; acceptance  $\sim 0.1 \text{ m}^2 \text{ sr}$

Collaboration between :

#### China

- Purple Mountain Observatory, CAS, Nanjing
- University of Science and Technology of China, Hefei
- Institute of High Energy Physics, CAS, Beijing
- Institute of Modern Physics, CAS, Lanzhou
- National Space Science Center, CAS, Beijing



#### Switzerland

- University of Geneva



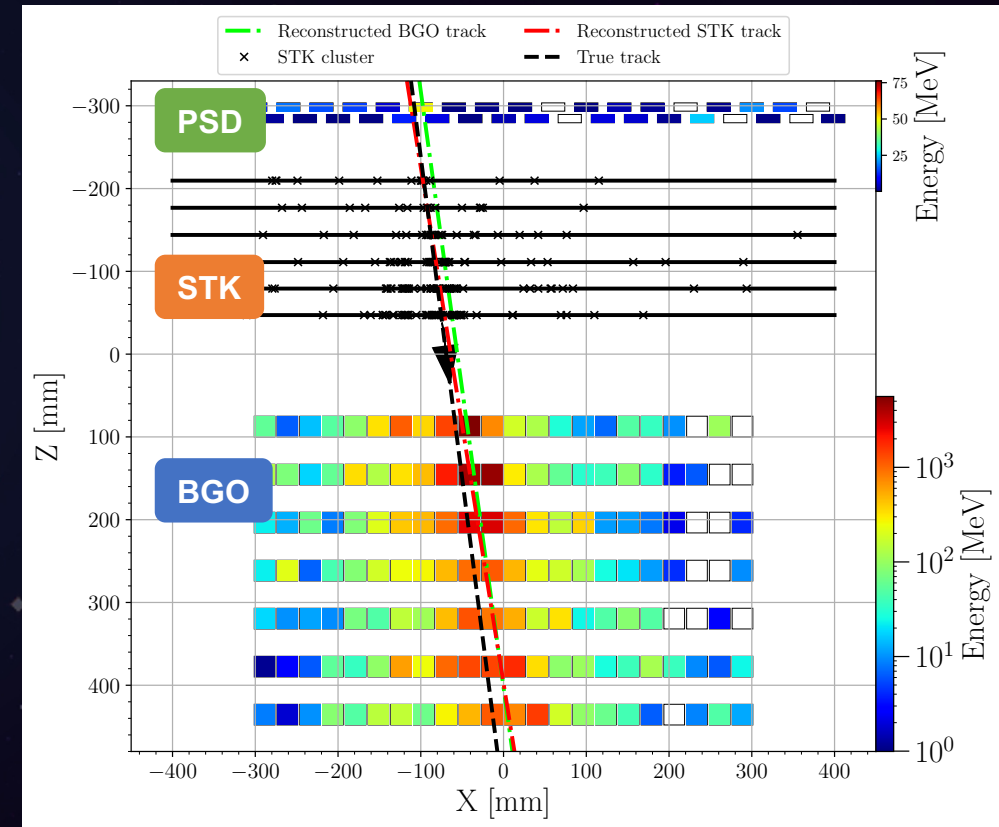
#### Italy

- INFN Perugia and University of Perugia
- INFN Bari and University of Bari
- INFN-LNGS and Gran Sasso Science Institute
- INFN Lecce and University of Salento



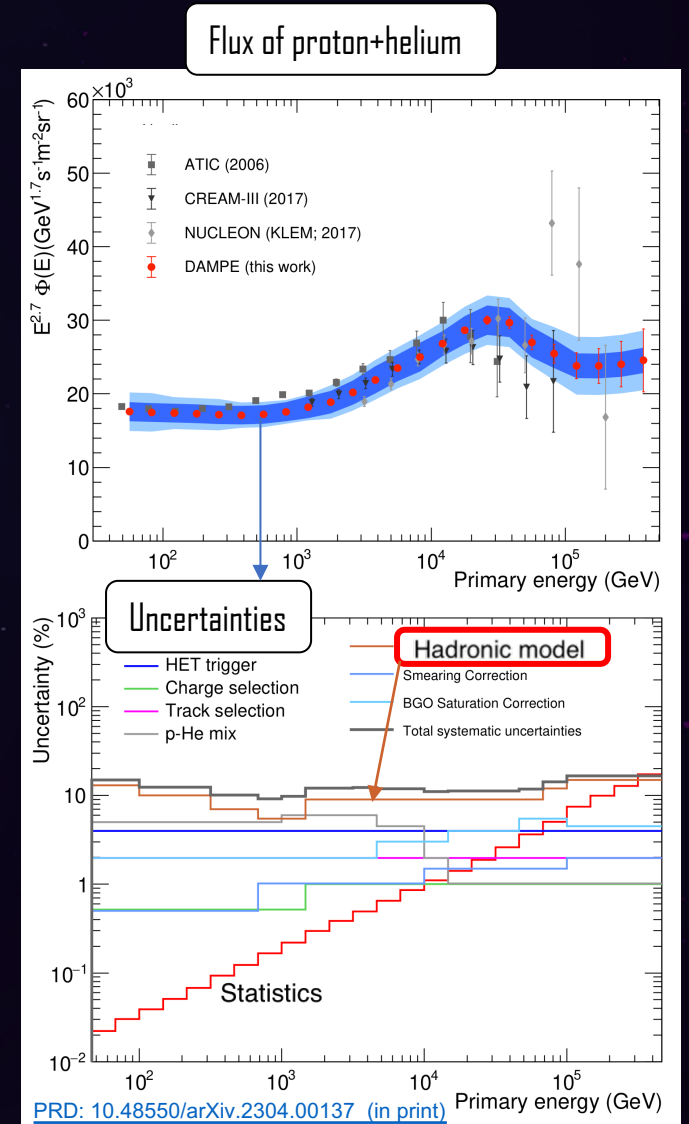
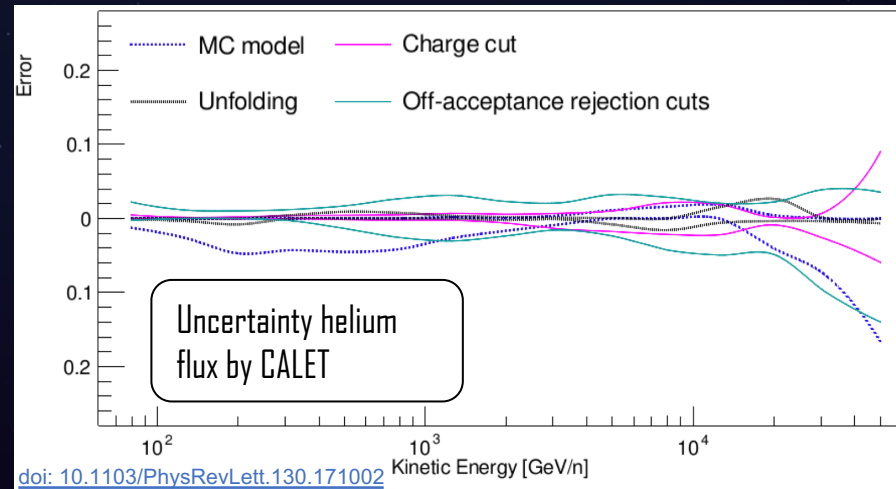
# The DAMPE experiment

- Layered design with 4 sub-detectors:
  - Plastic scintillator detector (PSD)
    - Charge measurement primary CR
  - Silicon-Tungsten tracker-converter (STK)
    - Measures track & charge primary CR
    - Converts photons into EM shower
  - Calorimeter (BGO)
    - Measures shower energy deposition
  - (NeUtron detector, NUD)
    - Differentiate EM from hadronic showers, not used in this work.



# CR ion flux measurements

- Excellently equipped for the direct measurement of CR ions
  - Proton+helium flux up to 0.5 PeV
  - Also heavier ions (carbon, oxygen, etc.)
- Accuracy ion fluxes limited by hadronic model
- For DAMPE and other experiments equally so
- Cross sections unmeasured...

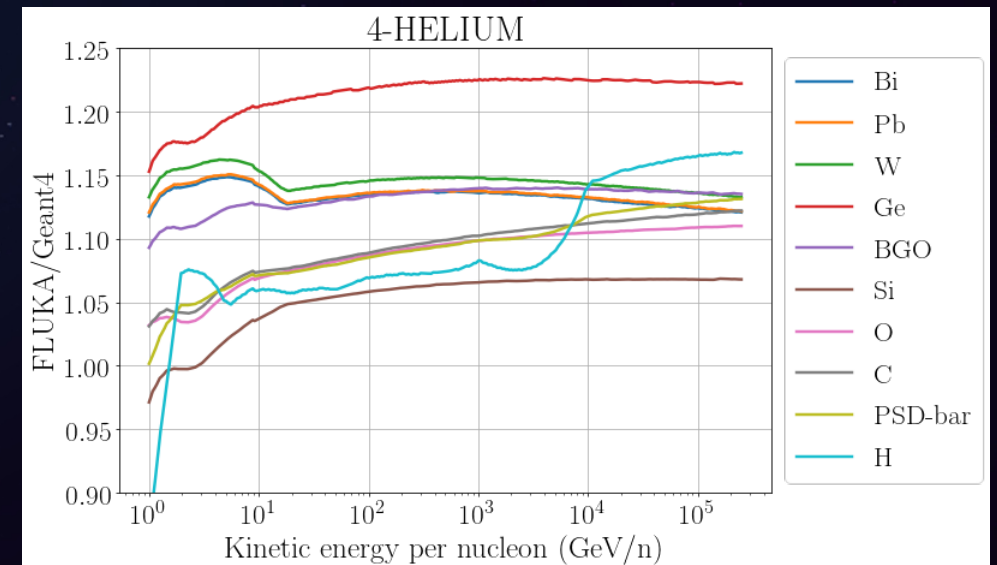


# Inelastic hadronic cross sections

## Experimental constraints:

- Protons → Can rely on measurements by colliders. For instance, LHC measurements:
  - Proton-Proton at  $\sqrt{s} = 13$  TeV  
[10.1016%2Fj.physletb.2016.06.027](https://arxiv.org/abs/10.1016%2Fj.physletb.2016.06.027)  
 →  $\gg$  PeV energy in fixed target equivalent
  - Proton-Lead at  $\sqrt{s_{NN}} = 5$  TeV  
[10.1007/JHEP07\(2018\)161](https://arxiv.org/abs/10.1007/JHEP07(2018)161)
- Ions heavier than proton:
  - Measurements very limited, and usually sub-GeV
  - Rely on phenomenological model (e.g. Glauber or Gribov–Regge)

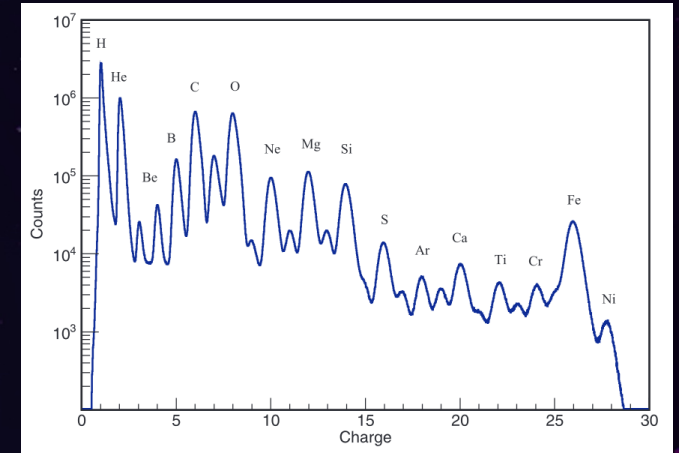
[10.1103/PhysRev.100.242](https://arxiv.org/abs/10.1103/PhysRev.100.242)  
[10.1016/0550-3213\(70\)90511-0](https://arxiv.org/abs/10.1016/0550-3213(70)90511-0)  
[1968JETP...26..414G](https://arxiv.org/abs/1968JETP...26..414G)



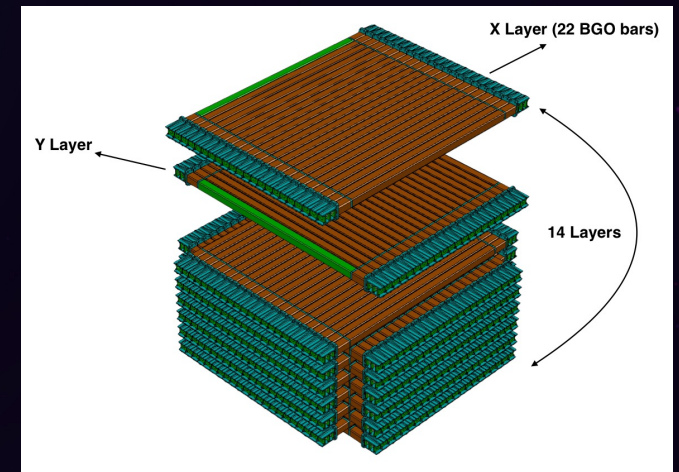
# Cross sections with DAMPE

- Data:
  - Good statistics (88 months in this work)
  - Energy range: ~10 GeV up to few hundred TeV
  - CR ions from proton up to Nickel
- Measurement (this work):
  - Inelastic hadronic cross section
  - Proton and helium primary
  - $\text{Bi}_4\text{Ge}_3\text{O}_{12}$  target (calorimeter)

⇒ First step is to create proton (helium) sample

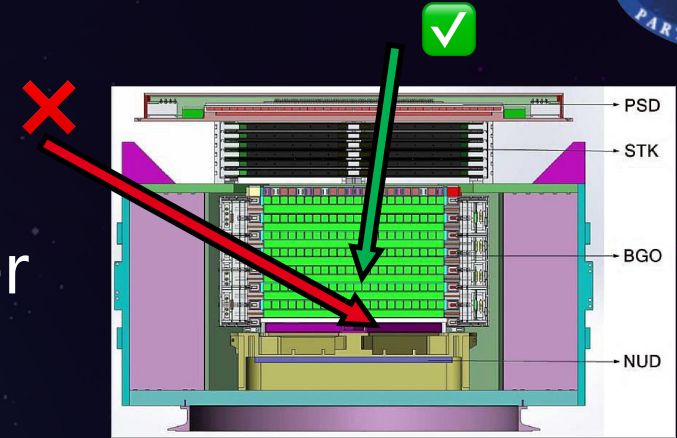


[10.1134/S106377882113007X](https://doi.org/10.1134/S106377882113007X)



# Event selection

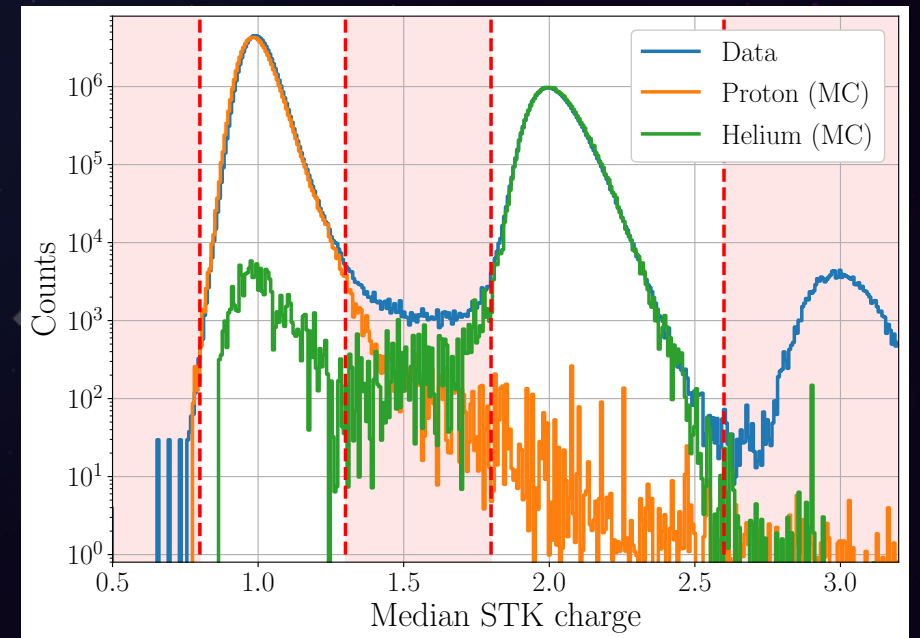
1. Trigger: Events with MIP energy or higher
2. Pre-cuts → contained events  
→ using ML based track reconstruction



3. Select events that:
  1. Satisfy basic quality cuts
  2. Removal electron background
  3. Removal events interacting in PSD
  4. Fall in the proton or helium charge window

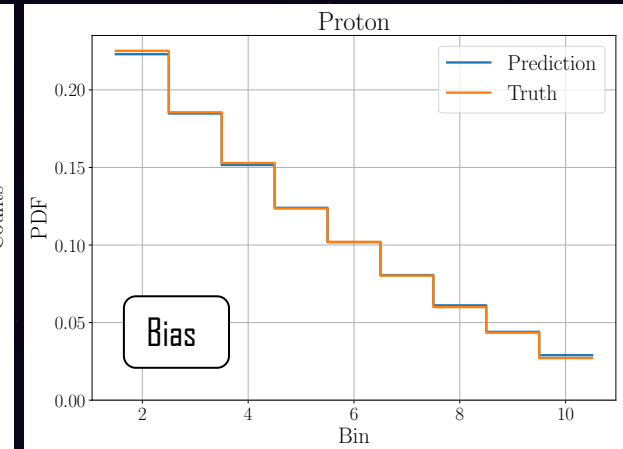
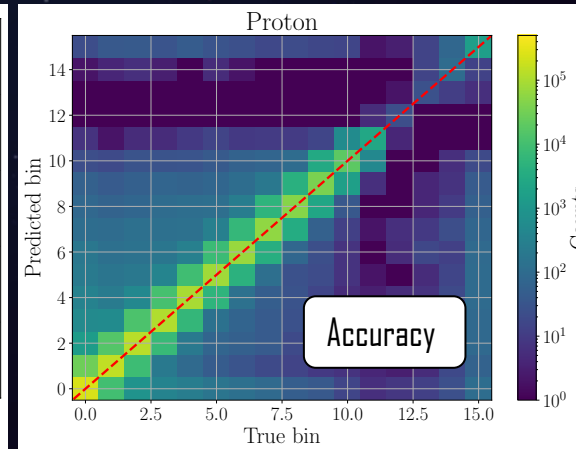
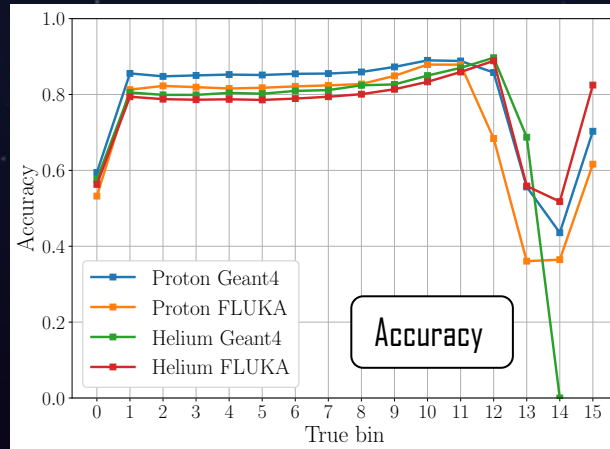
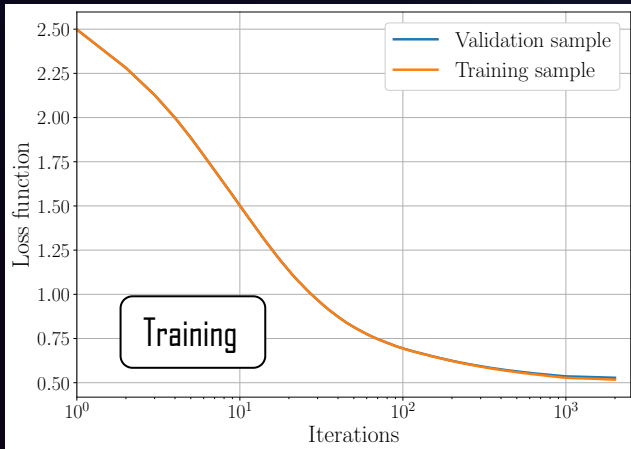
⇒ >80% signal efficiency for contained events, while background  $\lesssim 0.2\%$

[10.1016/j.astropartphys.2022.102795](https://arxiv.org/abs/10.1016/j.astropartphys.2022.102795)



# Cross section measurement

- Cross section  $\leftrightarrow$  point of inelastic interaction
- Interaction depth classifier:
  - Gradient boosted decision tree (XGB)
  - 16 output classes:
    - Before calorimeter
    - One per layer (14x)
    - After calorimeter





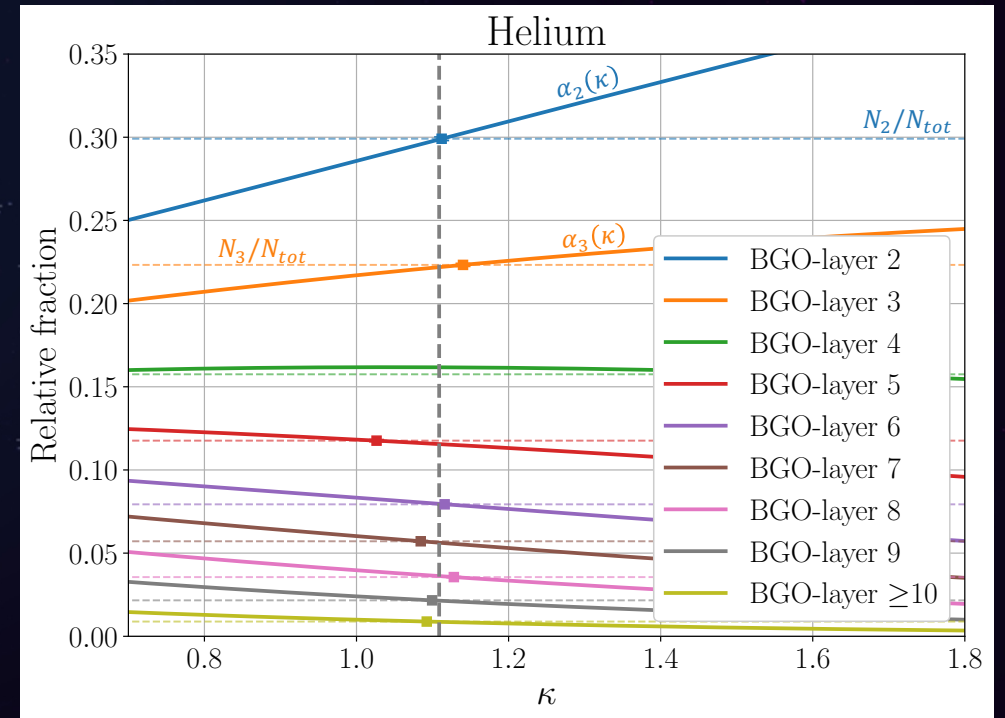
# Cross section measurement

- Cross section  $\leftrightarrow$  point of inelastic interaction
- Modify MC cross section until it matches data:

$$\sigma_{true} = \kappa \cdot \sigma_{MC}$$

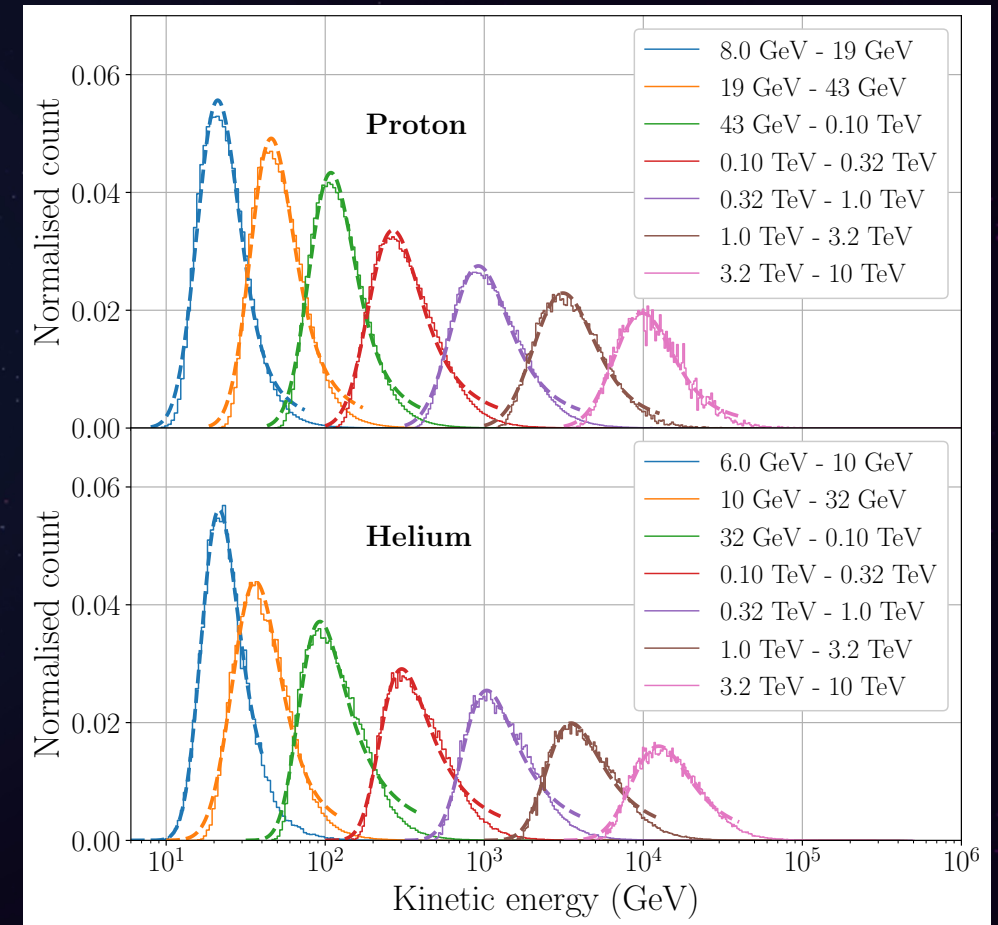
- Compare MC ( $\alpha_i$ ) to data ( $\frac{N_i}{N_{tot}}$ ):

$$\mathcal{L}(\kappa) = \frac{N_{tot}!}{N_2! N_3! \dots N_{10}!} \prod_{i=2}^{10} \alpha_i^{N_i}(\kappa)$$



# Energy dependence

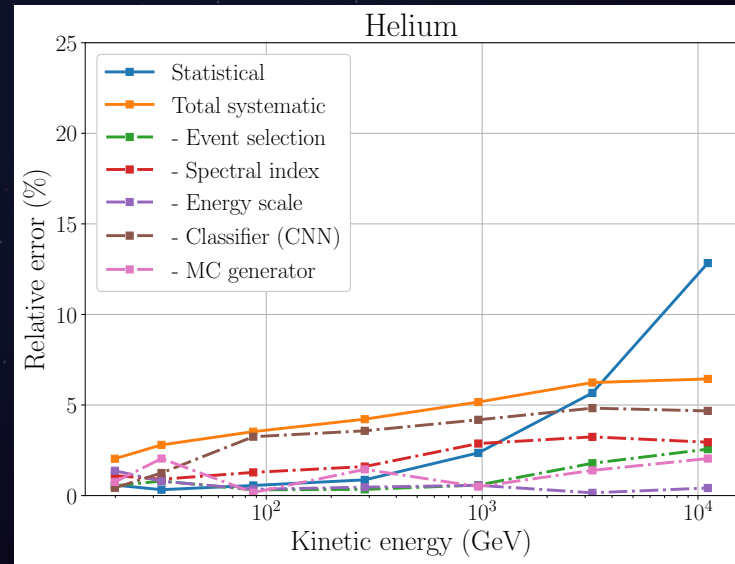
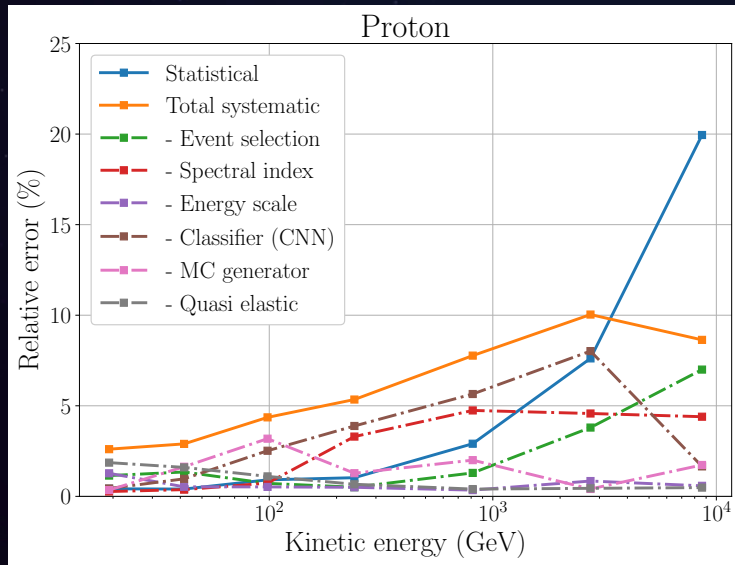
- Cross section measured as function of kinetic energy per nucl.
  - Bin events in total energy deposited in calorimeter
  - Determine corresponding kinetic energies from MC
  - Fit Landau+Gaussian
    - peak: reference value
    - width: uncertainty



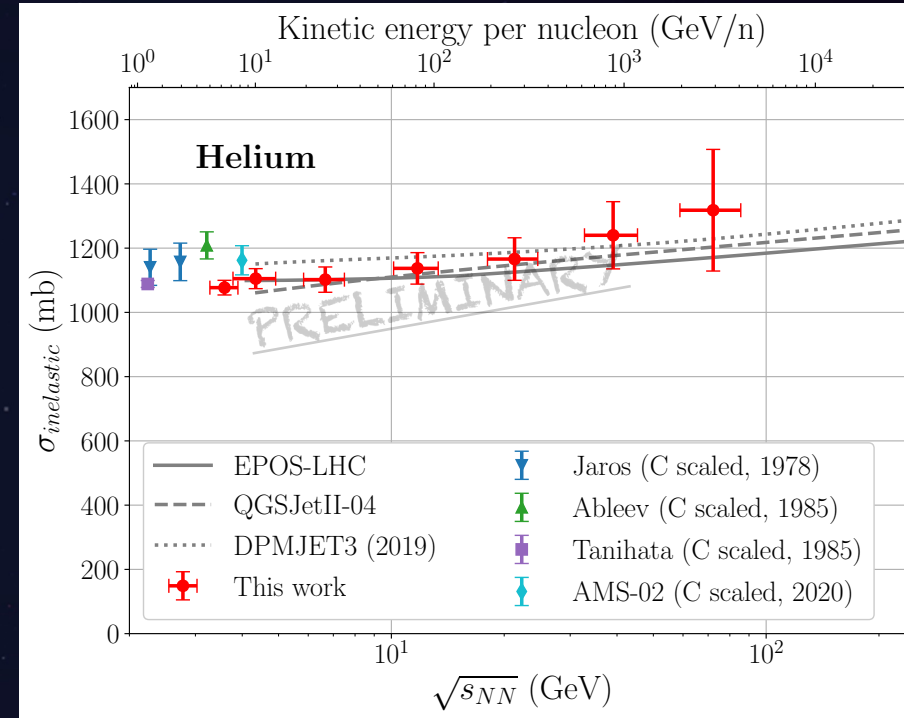
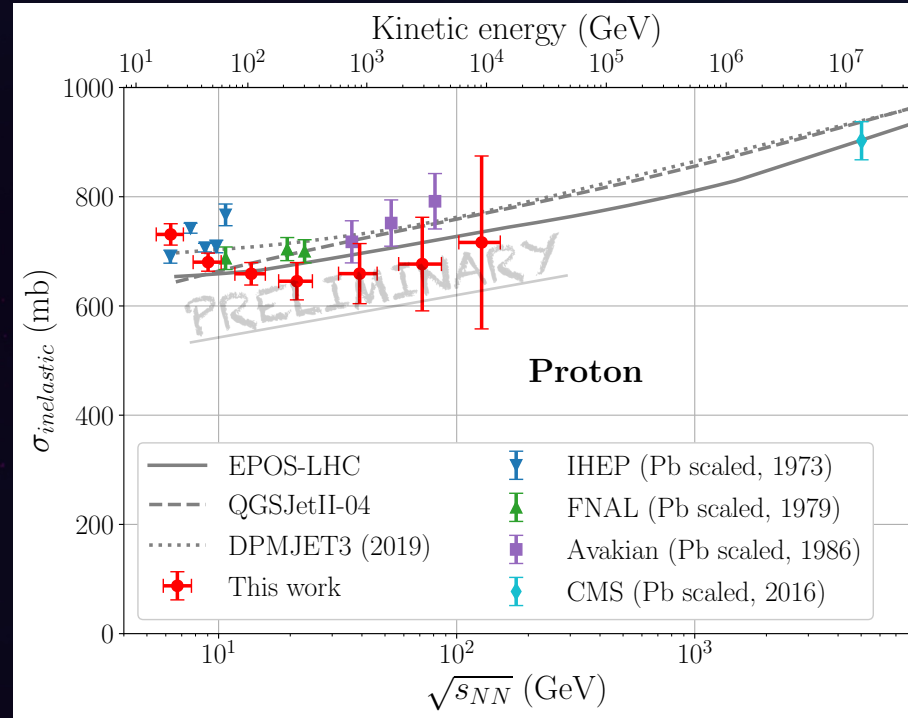
# Uncertainties

- Statistical uncertainty dominates in last bin
- Systematic uncertainty:

• Classifier	• Spectral index	• Event selection	<i>Largest</i>
• Isotopes	• MC generator	• Energy scale	<i>Smallest</i>



# Results



**PROTON:**  
 Within error-band of measurements at same energy; but slightly lower normalization. Consistent with CMS.

**HELIUM-4:**  
 Good agreement with other measurements. Slightly steeper rise, but models within analysis uncertainty.

- Model comparisons: EPOS-LHC, QGSJetII-04, DPMJET3
- Other measurements not for BGO, so scaled:  $\sigma_{target}^{EPOS-LHC} / \sigma_{BGO}^{EPOS-LHC}$

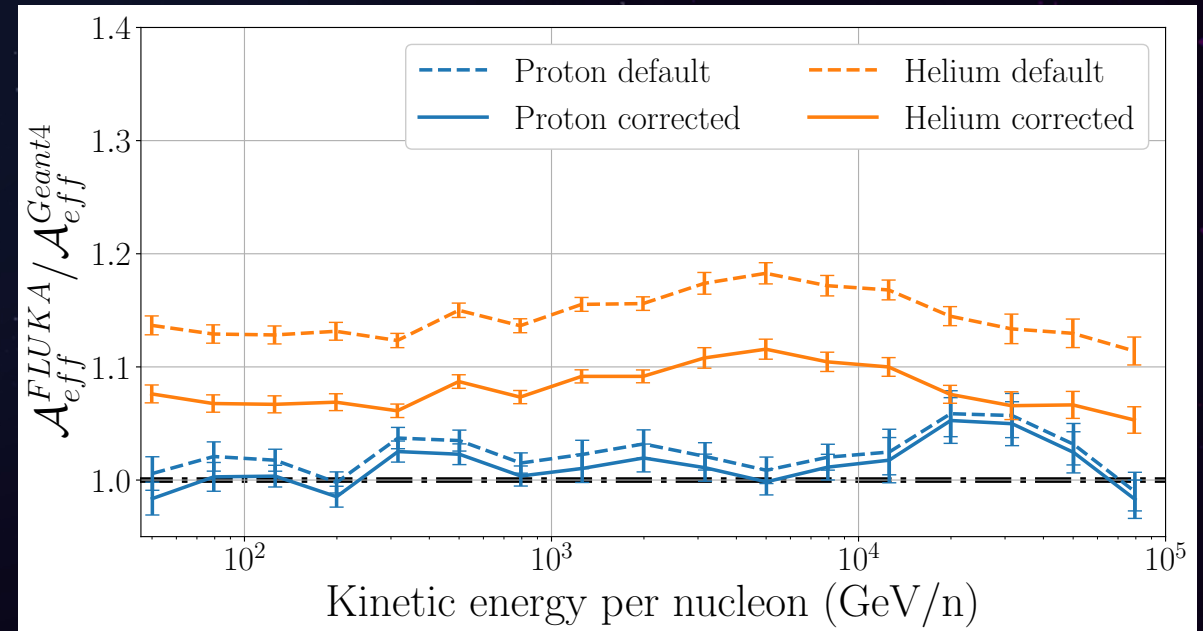
# Effect on flux normalisation

- Effective detector acceptance depends on cross section:

$$\Phi(E \rightarrow E + \Delta E) = \frac{N}{\mathcal{A}_{eff} \cdot \Delta E \cdot \Delta t}$$

- Higher cross section  
→ lower flux (and vice versa)

- Compare acceptances, FLUKA over Geant4
  - Correcting cross section in MC to measured result significantly improves agreement
  - Minor effect for proton, major effect for helium



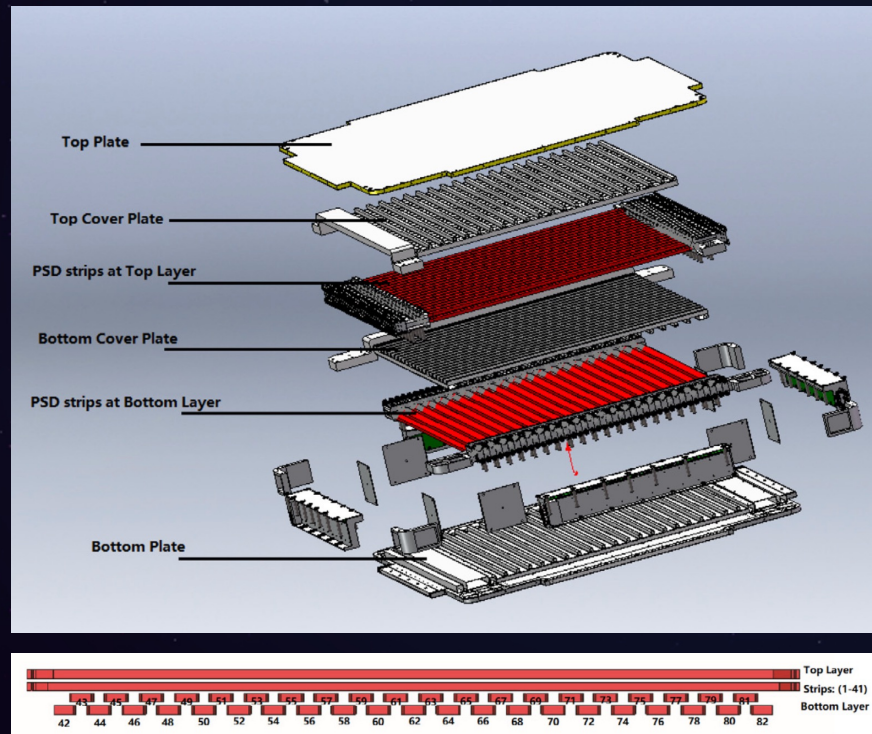
# Conclusion & outlook

- Hadronic inelastic cross section is important systematic affecting CR ion-flux normalization
- Presented inelastic cross section measurement
  - $\text{Bi}_4\text{Ge}_3\text{O}_{12}$  target (calorimeter)
  - Proton: 18 GeV – 9 TeV
  - Helium-4 (alpha): 5 GeV/n – 3 TeV/n  
→ First measurement at these energies!
- Outlook:
  - Near future: Analysis of carbon and oxygen
  - Future detectors such as HERD have the potential to extend measurements to much higher energies

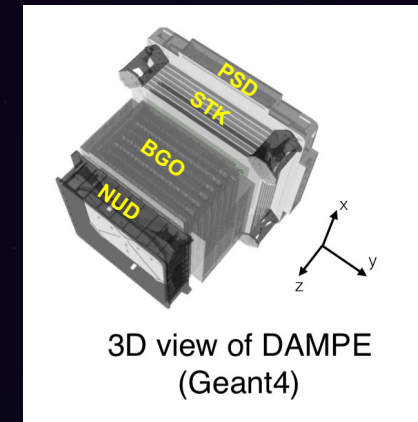
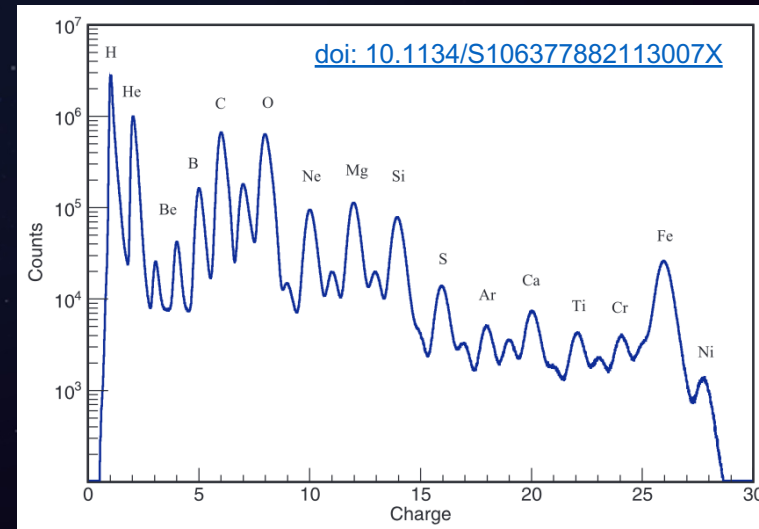
# Backup slides

# Detailed detector lay-out

## 1. Plastic scintillator → identify absolute charge of particle



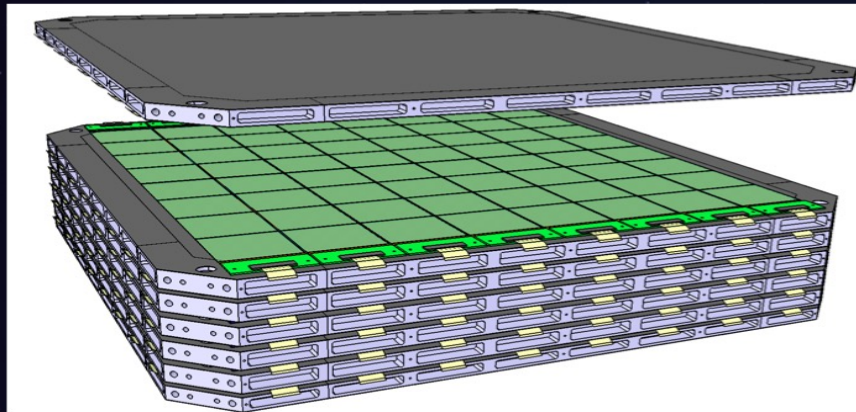
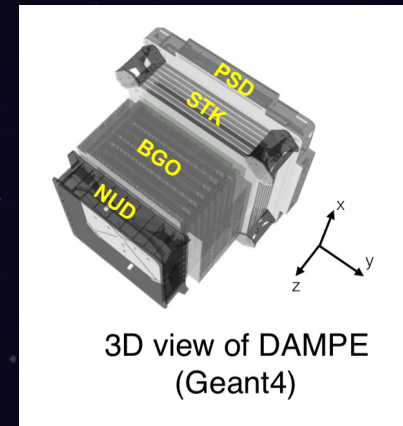
- 82 bars in 2 double layers
- Overall efficiency  $\geq 0.9975$
- Particles lose energy through ionisation energy losses:  $dE/dx \propto Z^2$



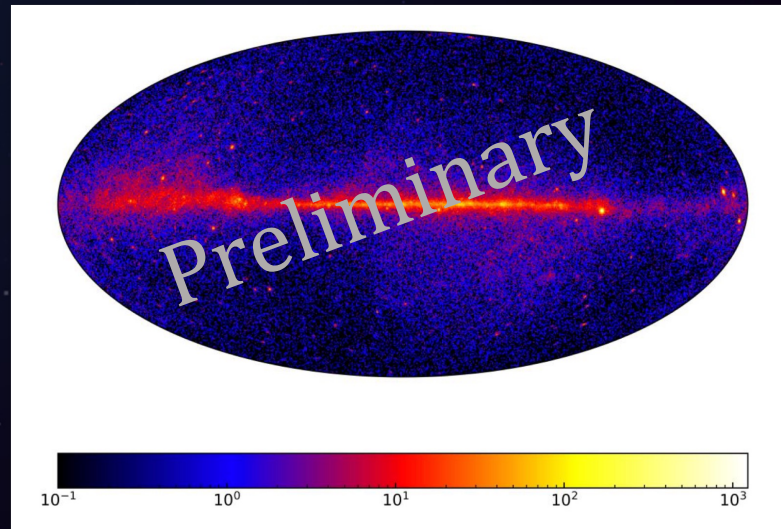
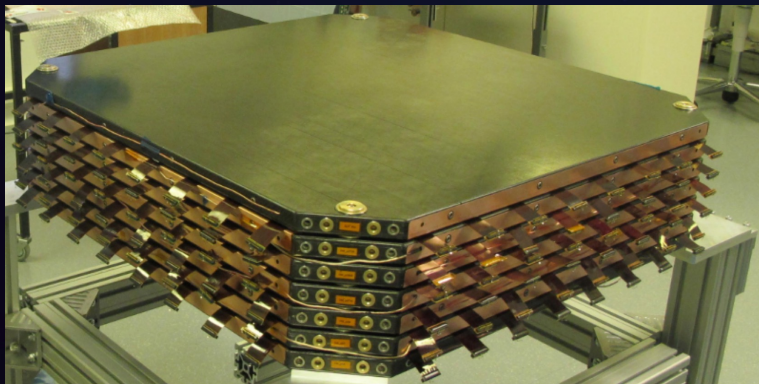


# Detailed detector lay-out

## 2. Tracker

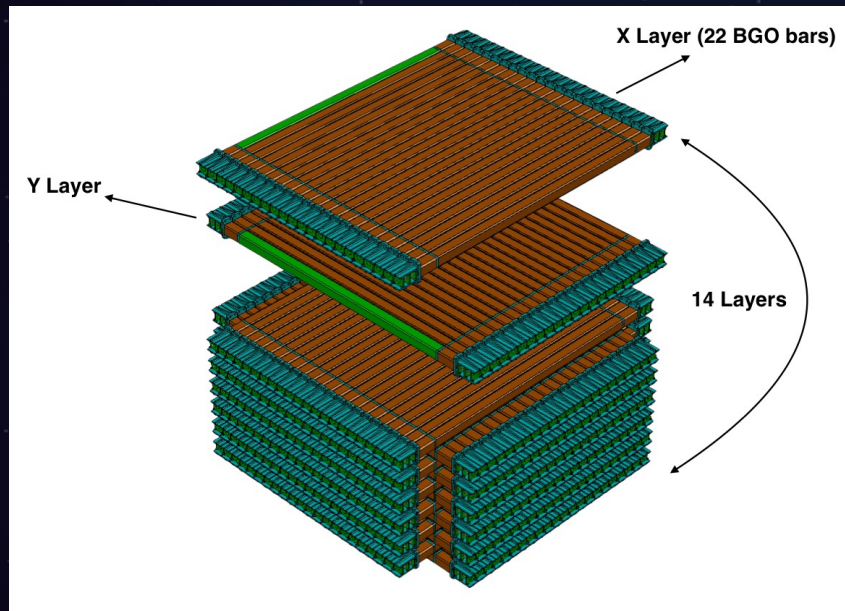


- 768 sensors of 768 strips each
- $\sim 50$  micron positional resolution  
 $\rightarrow 0.1-1^\circ$  pointing (electrons & photons)
- Also charge identification

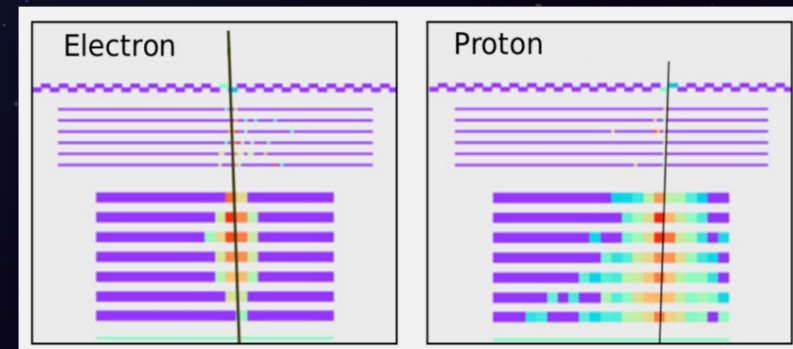
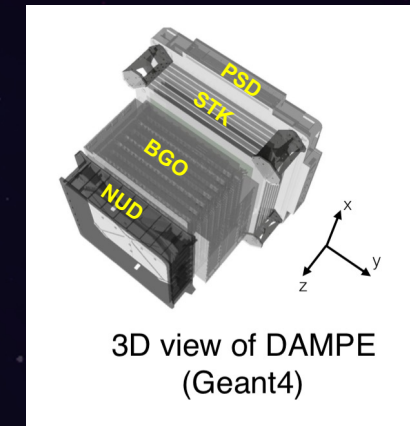


# Detailed detector lay-out

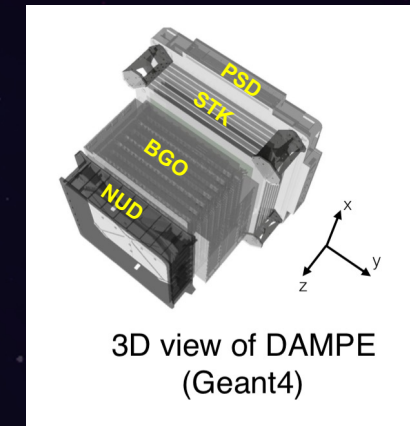
## 3. Calorimeter



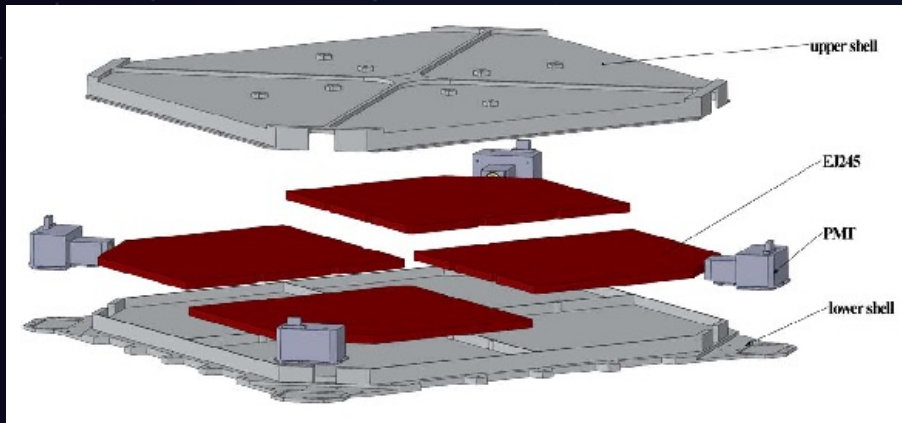
- 308 bars spread over 14 layers
- Readout by PMT at each end of crystal
- $\text{Bi}_4\text{Ge}_3\text{O}_{12}$  material
- Energy resolution:
  - $\sim 1\%$  for electrons (shower contained)
  - $\sim 40\%$  for ions (shower not-contained)



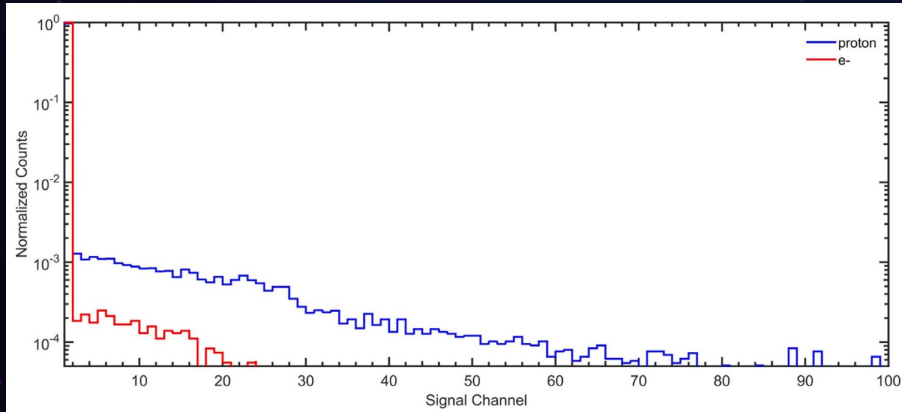
# Detailed detector lay-out



## 4. Neutron detector

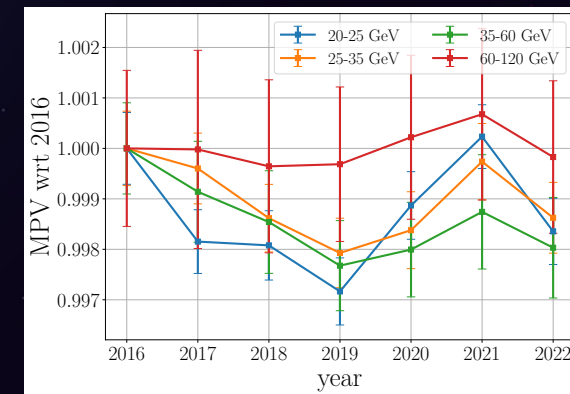
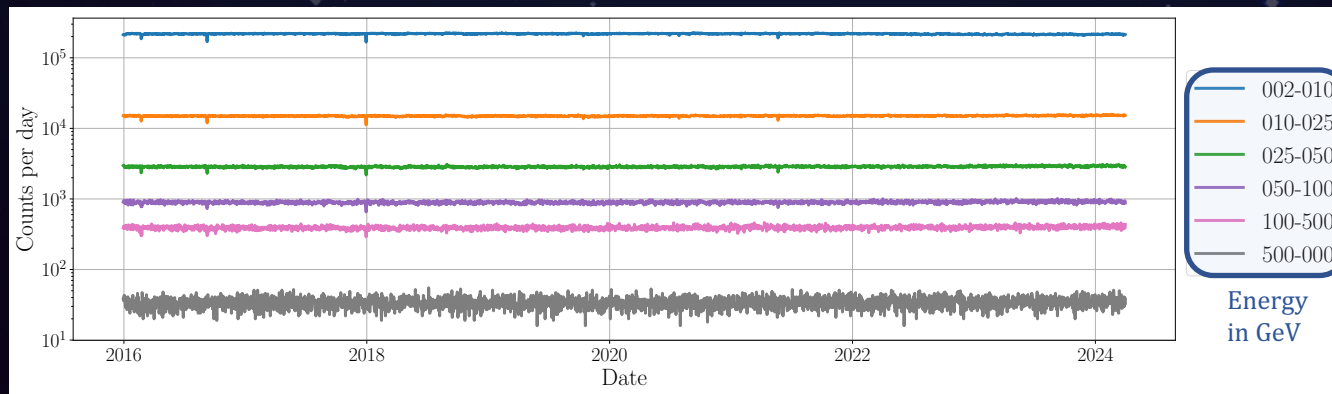


- 4 boron-doped plastic scintillators
- $B_{10} + n \rightarrow Li_7 + \alpha + \gamma$
- Hadronic showers produce  $\sim 10$  times more neutrons than EM showers
- Provides additional discrimination power in electron analysis to reject dominant proton background



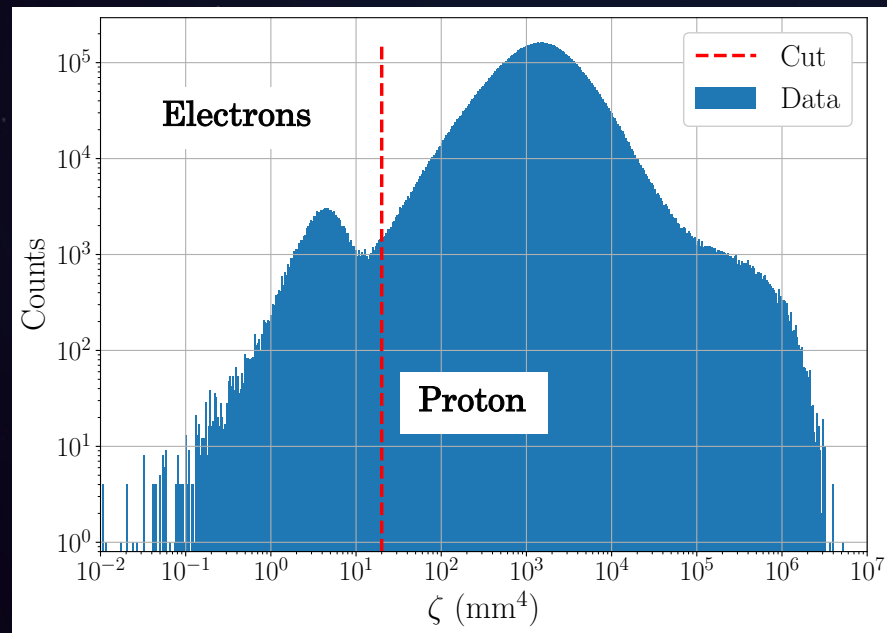
# Detector calibration

- DAMPE has been stably taking data for more than 8 years
- PMT gain, trigger thresholds, etc. are continually calibrated to ensure time-independent detector response
- Figure below shows per day rate of high-energy contained events



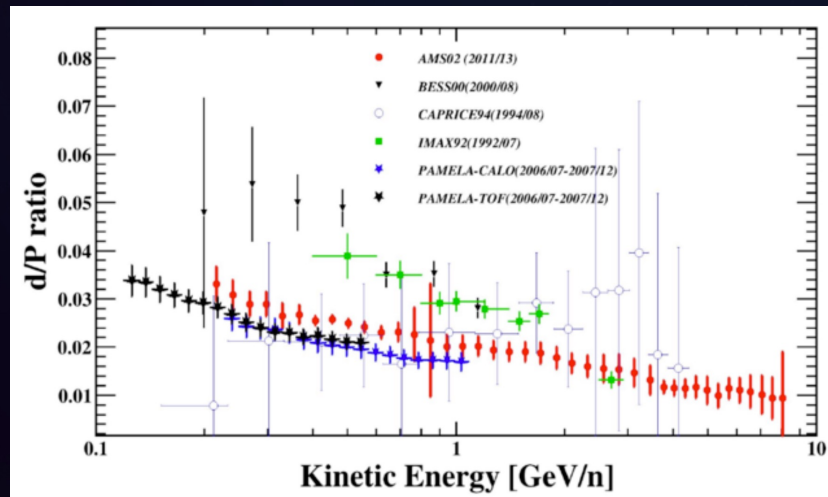
# Event selection

- Rejection of electrons (and positrons)
- XTRL variable has been developed  
(see doi: [10.1038/nature24475](https://doi.org/10.1038/nature24475))



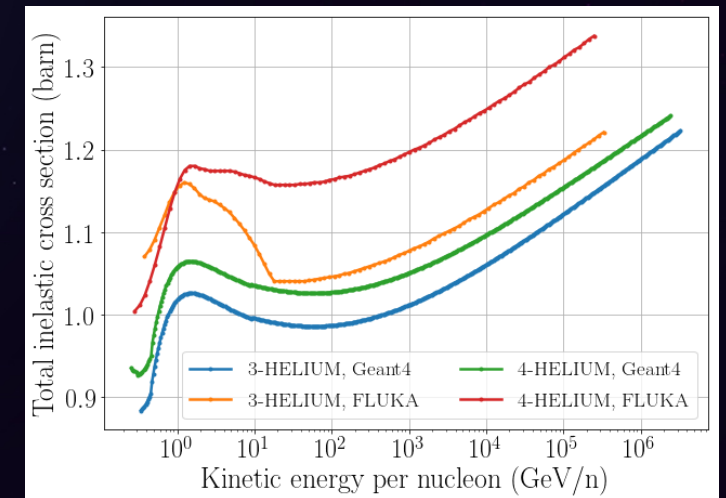
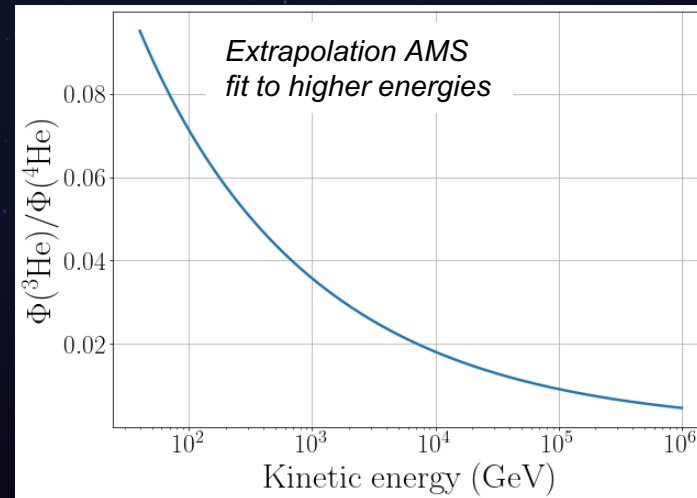
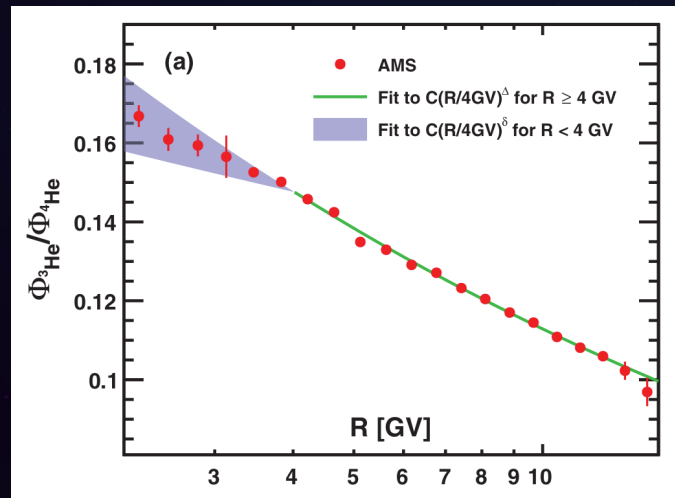
# Deuteron contribution

- DAMPE can measure charge but not mass
- No way to distinguish proton from deuteron
- Ratio  $\Phi(^2\text{H})/\Phi(^1\text{H})$  has been measured by AMS [doi.org/10.1016/j.nuclphysbps.2019.07.012](https://doi.org/10.1016/j.nuclphysbps.2019.07.012)
- Accounts for few percent of flux  $\Rightarrow \leq 1.8\%$  effect on measurement



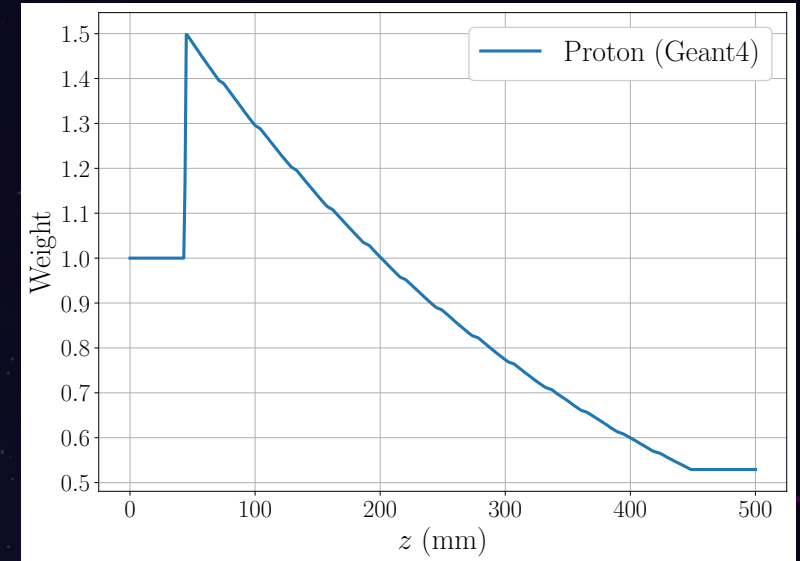
# Helium-3 contribution

- DAMPE can measure charge but not mass
- No way to distinguish helium-3 from helium-4
- Ratio  $\Phi(^3\text{He})/\Phi(^4\text{He})$  has been measured by AMS [10.1103/PhysRevLett.123.181102](https://arxiv.org/abs/10.1103/PhysRevLett.123.181102)
- Accounts for few percent of flux  $\Rightarrow \leq 1.2\%$  effect on measurement



# Reweighting procedure

- Consider a fixed:
  - Particle type
  - Primary energy
  - Incident angle
- Use existing MC to parametrise the probability that such a particle interacts as a function of the depth ( $z$ ) in the detector
- Rescale the CDF according to:
$$\text{CDF}_{\text{new}}(z) \rightarrow 1 - (1 - \text{CDF}(z))^{1+\alpha}$$
- Ratio of PDFs tells us the weighting factor as function of  $z$

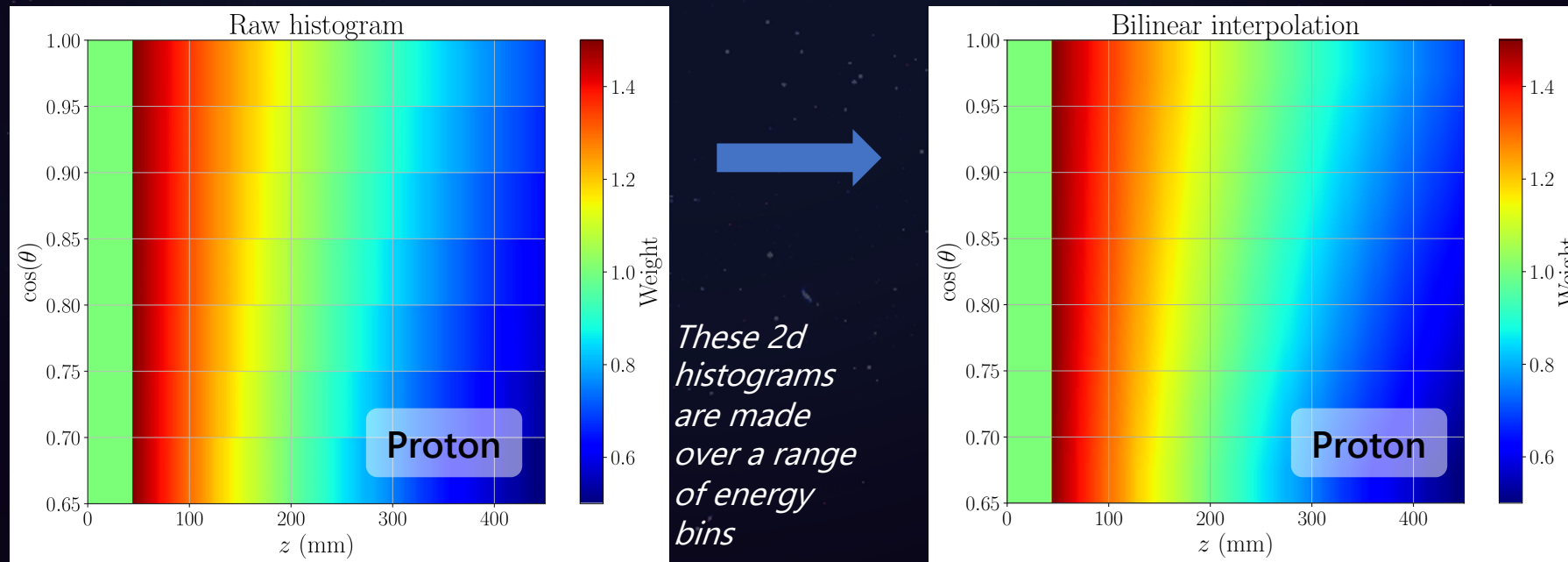


*Here,  $\alpha$  is the change in cross section, e.g.  $\alpha = 0.5$  for a 50% increase as shown in the figure*



# Reweighting procedure

- Next step, determine weights over full parameter space (bin MC in primary energy ; incident angle ;  $z_{stop}$ )
- To reweight a given event, do 3d interpolation ( $\theta, E_p, z_{stop}$ )



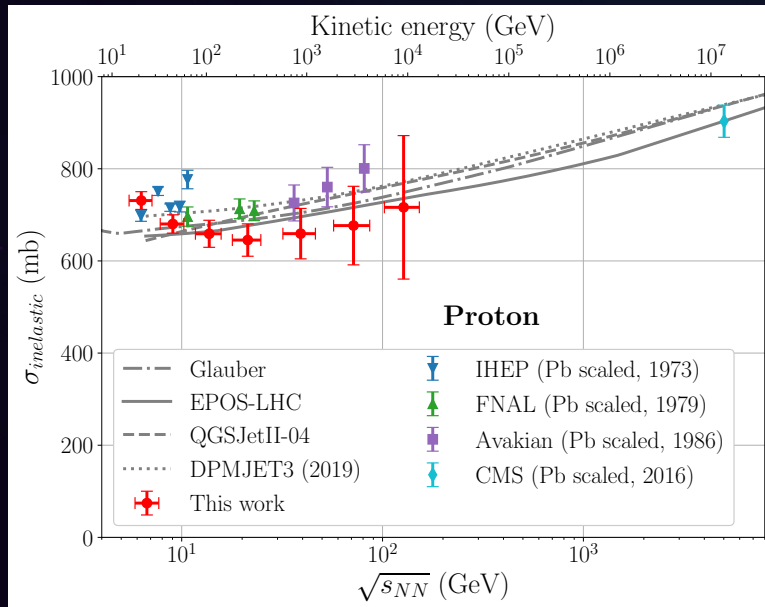
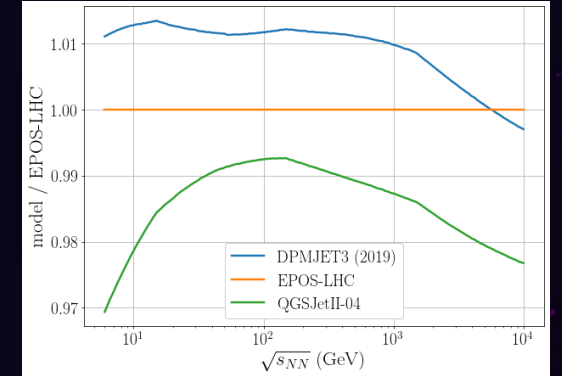
# Comparison between target materials

Our measurement is for a  $\text{Bi}_4\text{Ge}_3\text{O}_{12}$  target

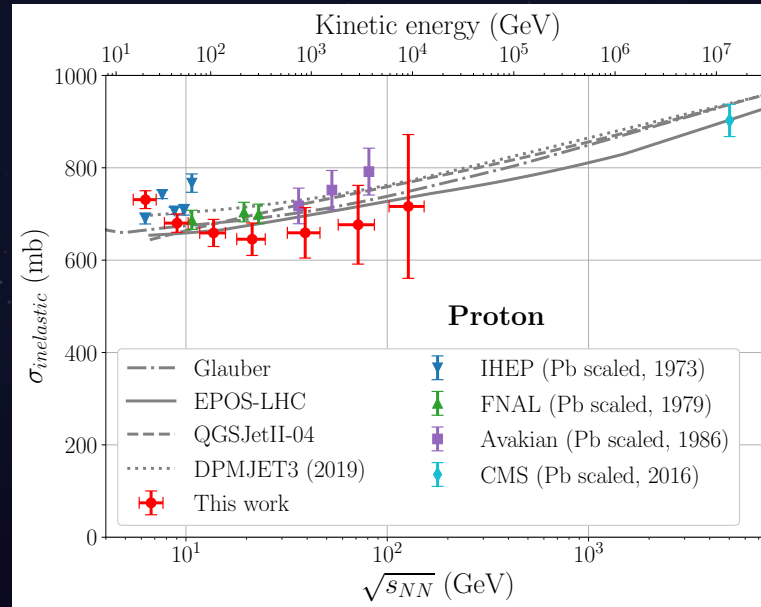
Measurements not for BGO are scaled:  $\sigma_{\text{target}}^{\text{model}} / \sigma_{\text{BGO}}^{\text{model}}$

Three models considered: EPOS-LHC, QGSJetII-04, DPMJET3

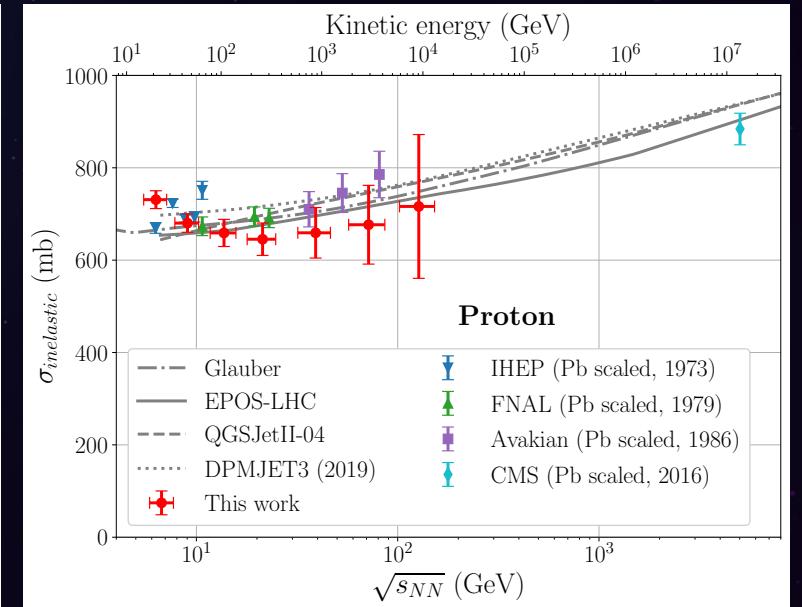
→ 1-3% difference, no effect on interpretation result



*DPMJET3 based scaling*



*EPOS-LHC based scaling*



*QGSJetII-04 based scaling*

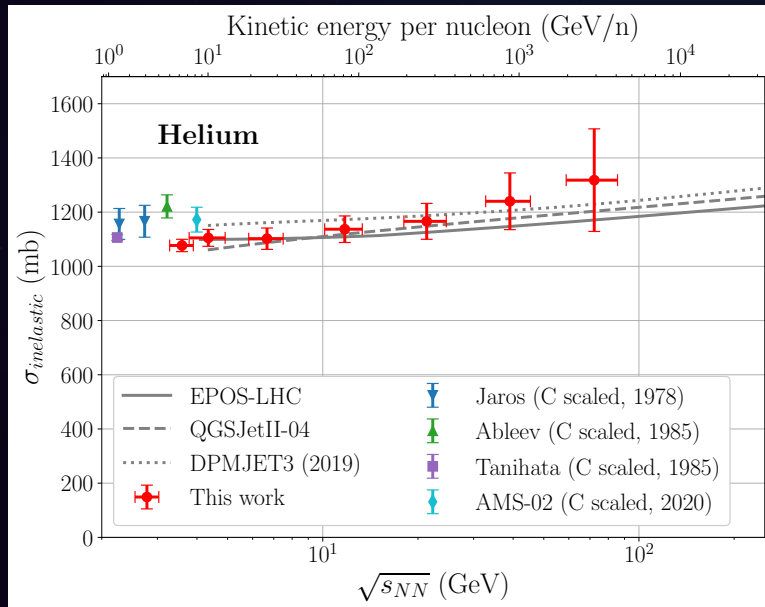
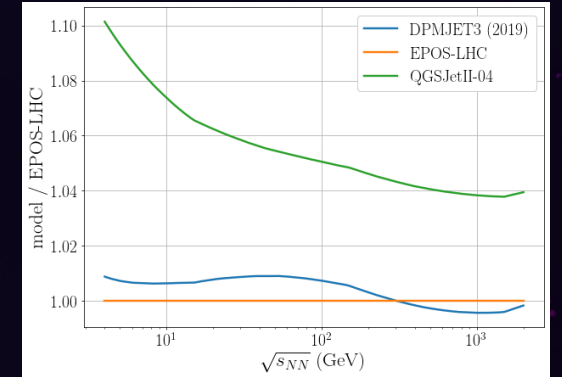
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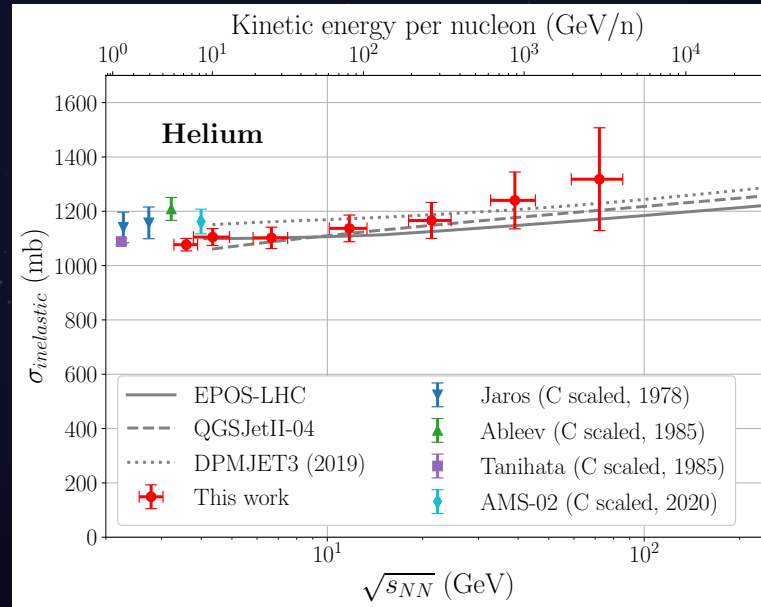
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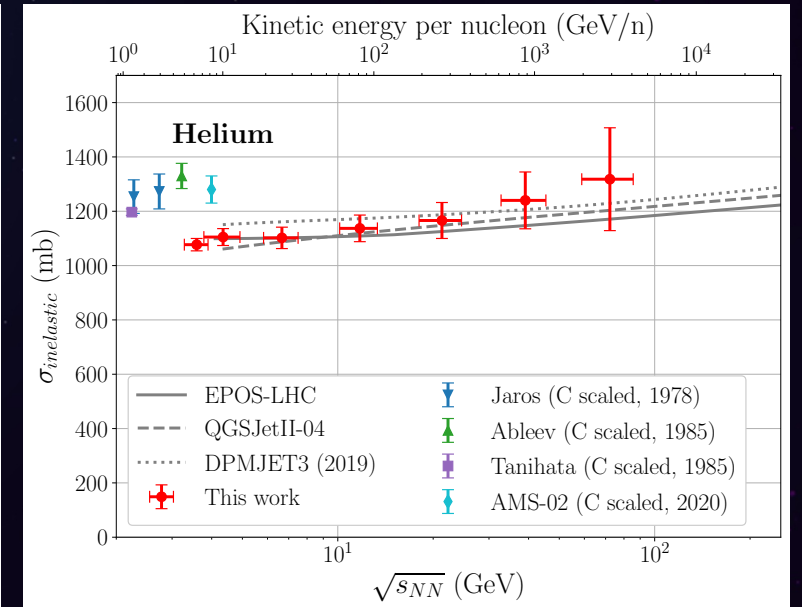
→ DPMJET3 & EPOS-LHC very close, QGSJetII-04 higher



*DPMJET3 based scaling*



*EPOS-LHC based scaling*

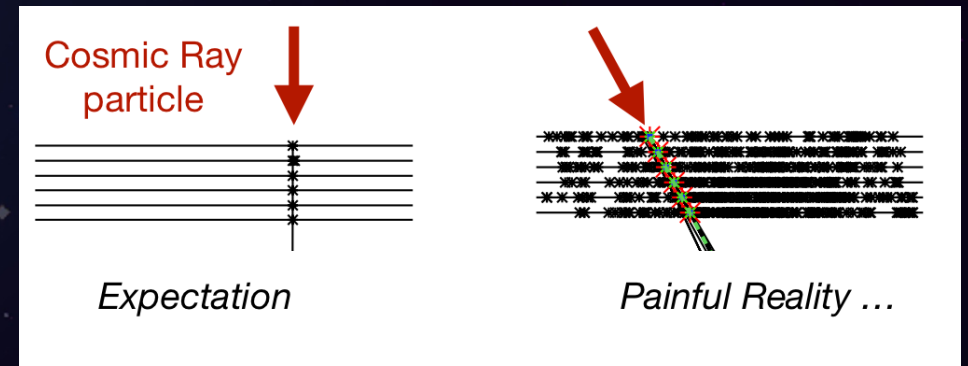


*QGSJetII-04 based scaling*

# Particle tracking

- Primary track drowns in a sea of secondaries
  - Pre-showering before the calorimeter
  - Back-splash from calorimeter
  - Majority of events affected
  - Gets worse at higher energies
- Not similar to LHC style tracking:
  - No magnetic field
  - Interaction point (axis) unknown
  - Way higher energies...
  - More passive material in/around tracker

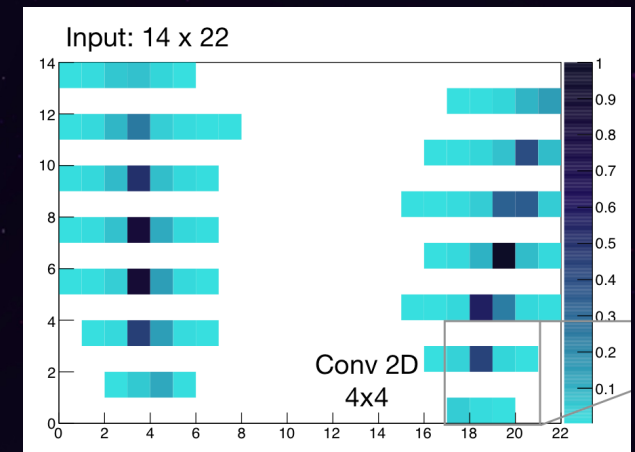
⇒ Very challenging for conventional algorithms!



# Particle tracking

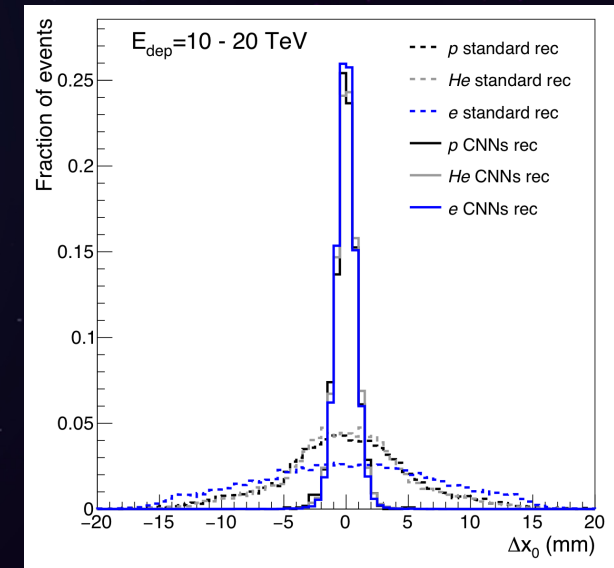
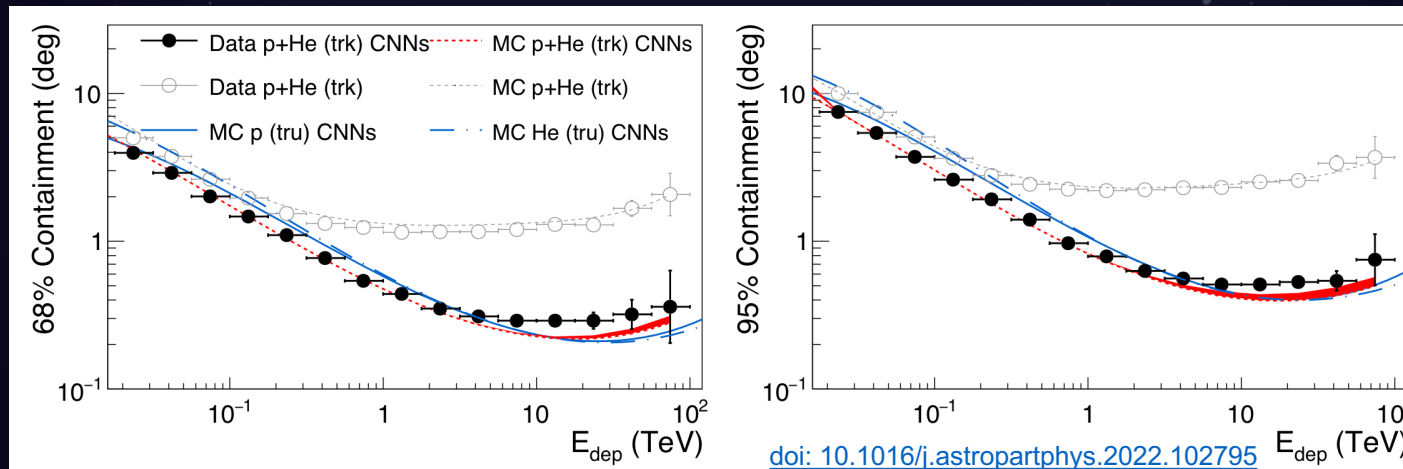
- Area where ML shows huge potential for improvement!
- Two-step approach:
  - Initial prediction by calorimeter:
    - 14 layers of 22 bars  $\rightarrow$  Image
    - Apply convolutional neural network
  - Refinement by tracker:
    - Using calo-prediction to identify region of interest (ROI)
    - Take Hough transform (works better than applying network on raw image)
    - Apply CNN convolutional neural network
- Output 4 variables (fully characterising track)
 

dir:  $(v_x, v_y, 1)$ ; pos:  $(x, y, 0)$



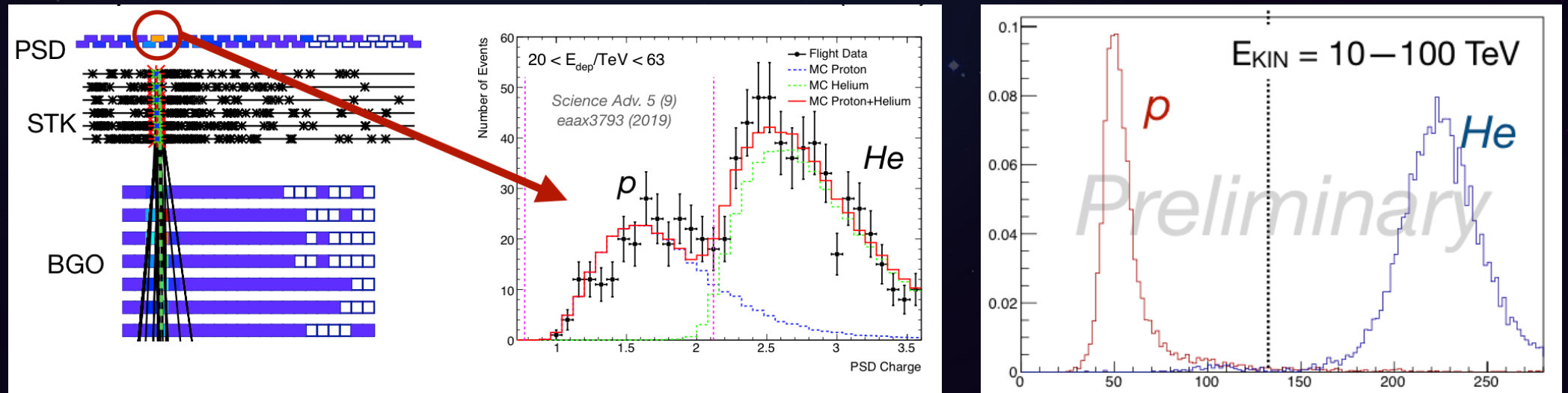
# Particle tracking

- Developed CNNs outperform classical algorithms by order of magnitude at high energies!



# Particle tracking

- At high-energies, the PSD gets overwhelmed  
→ Very challenging to distinguish e.g. proton from helium
- With accurate tracking, the signal strength in the tracker can be used for particle identification → Much better separation power!

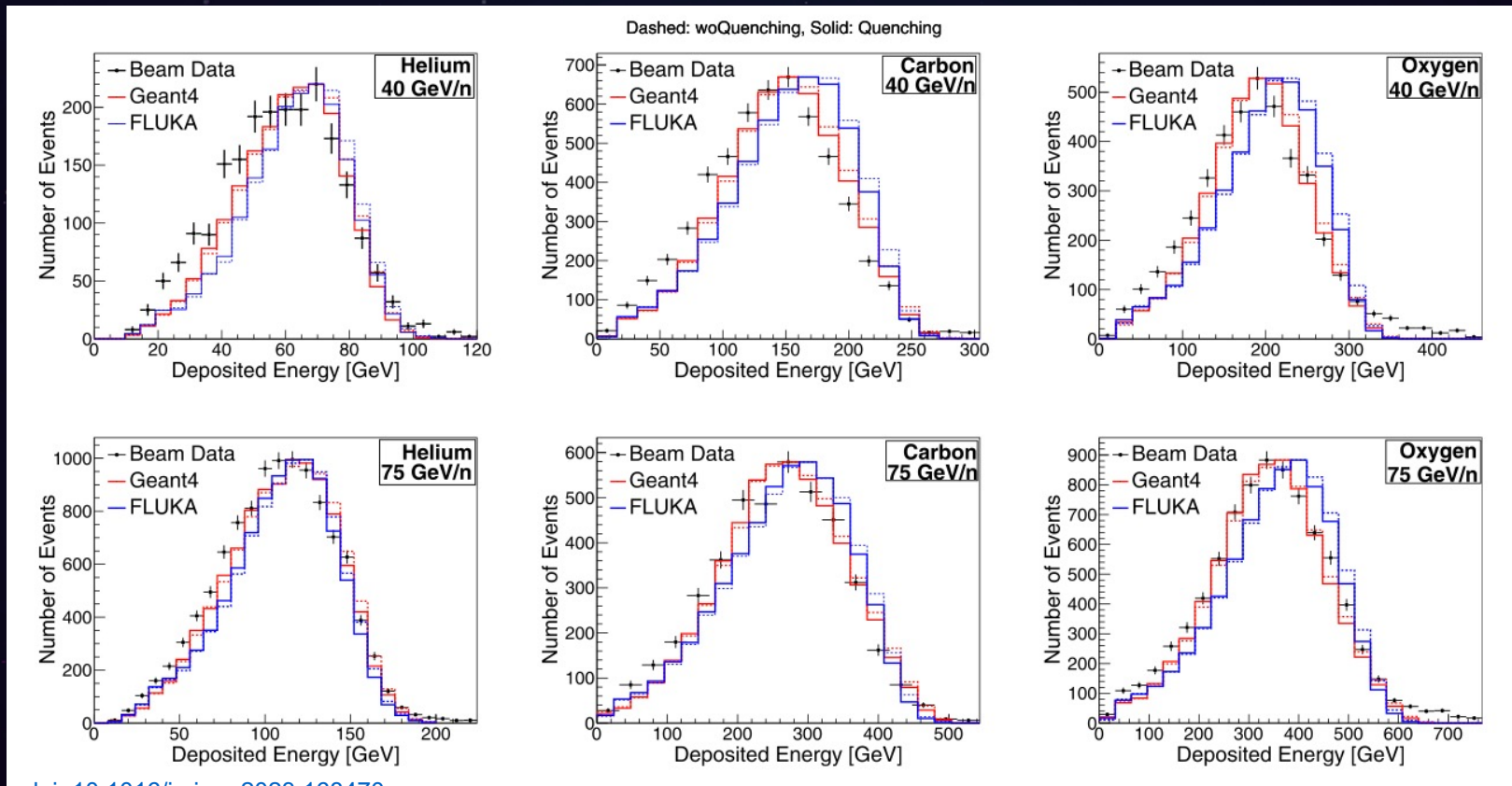


# Simulation models

- Geant4 version 4.10.5
- FLUKA version 2011.2X.7
- Downgoing particle sampled in 'half-sphere' around detector
- Simulated energy spectrum per decade:  $\frac{dN}{dE} \propto E^{-1}$
- Weighted to an  $\Phi \propto E^{-2.65}$  spectrum



# Geant4-FLUKA to data comparisons



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