



# *EXPLORING THE COSMIC FRONTIERS: ICECUBE'S UPDATE ON NEUTRINOS AND COSMIC RAYS*

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**ISVHECRI 2024**

**Puerto Vallarta, Mexico**



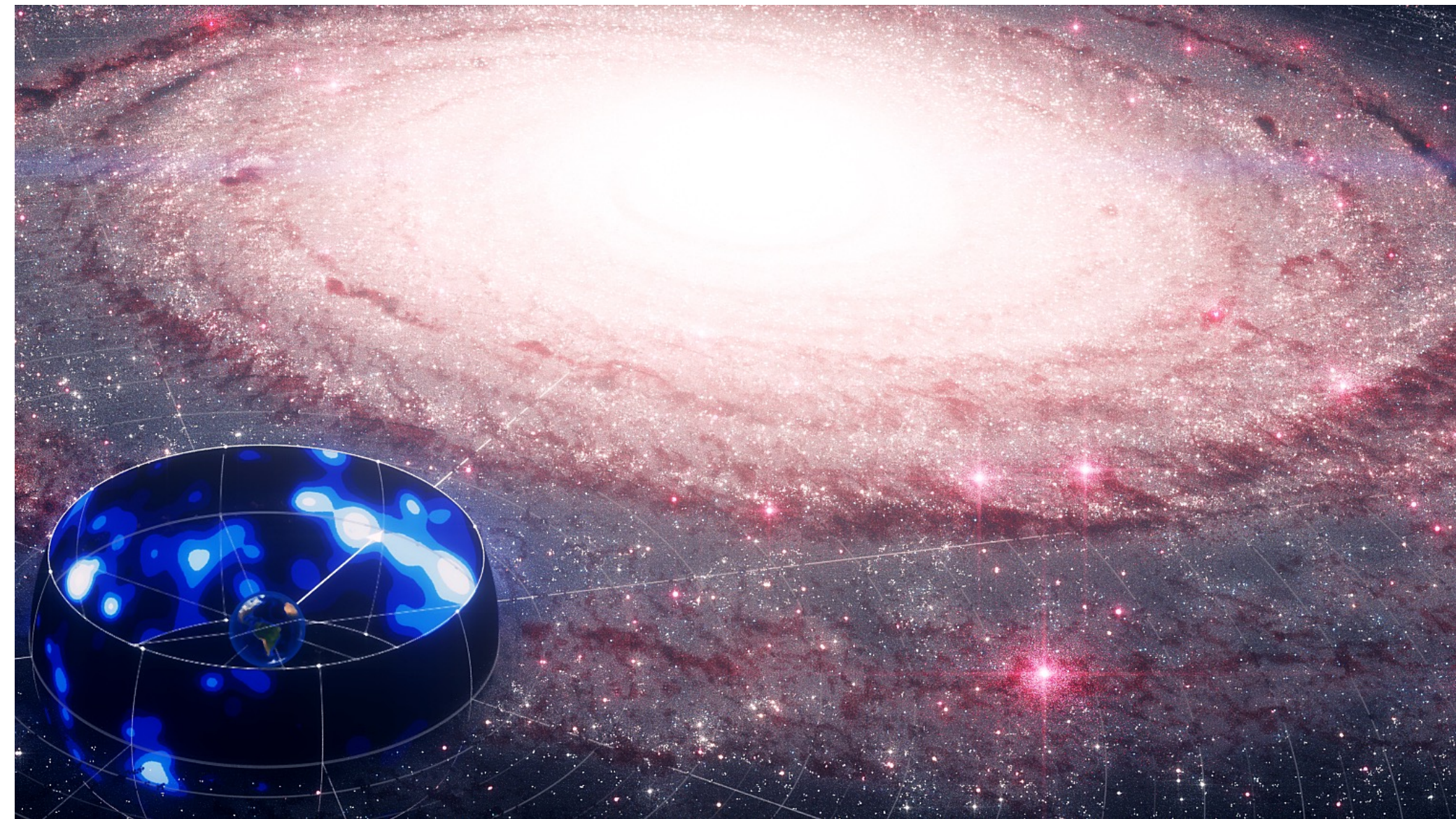
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# OUTLINE

- IceCube Neutrino Observatory
- Recent results on cosmic rays
- Recent results on neutrinos
- Outlook to IceCube-Gen2





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# ICECUBE NEUTRINO OBSERVATORY

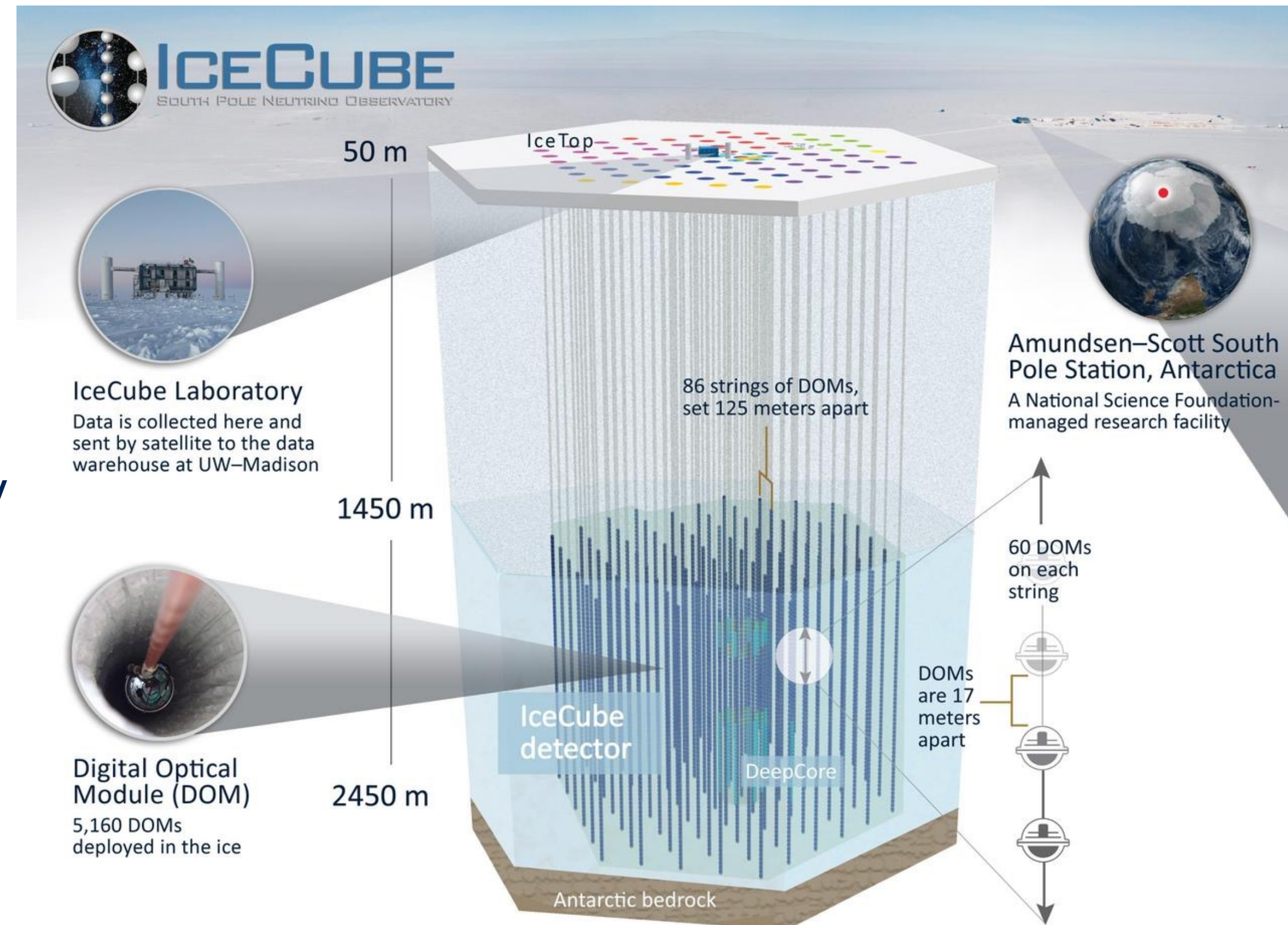
Unique astroparticle detector at the South Pole for high-energy particles

## IceTop

- Mostly electromagnetic particles and low-energy muons

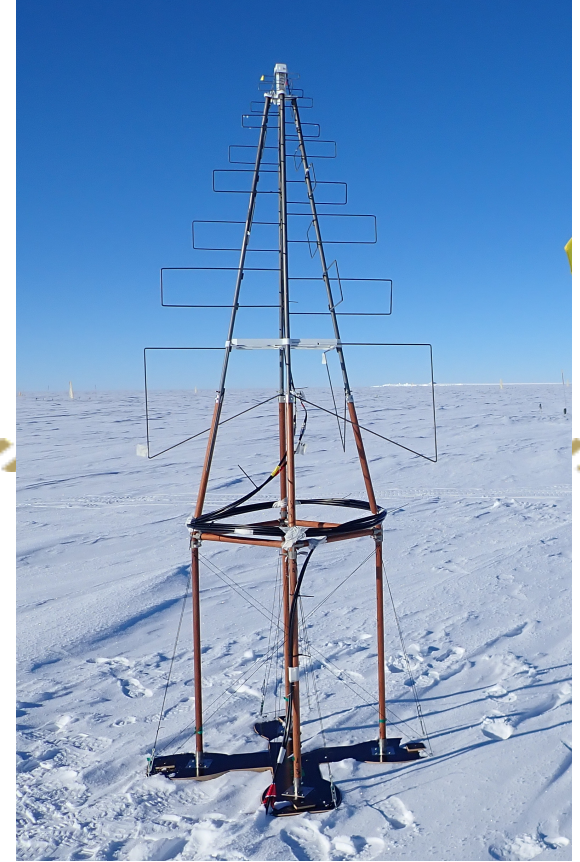
## IceCube

- High-energy air shower muons
- Neutrinos (indirect)



# ICETOP + SURFACE ENHANCEMENT ARRAY

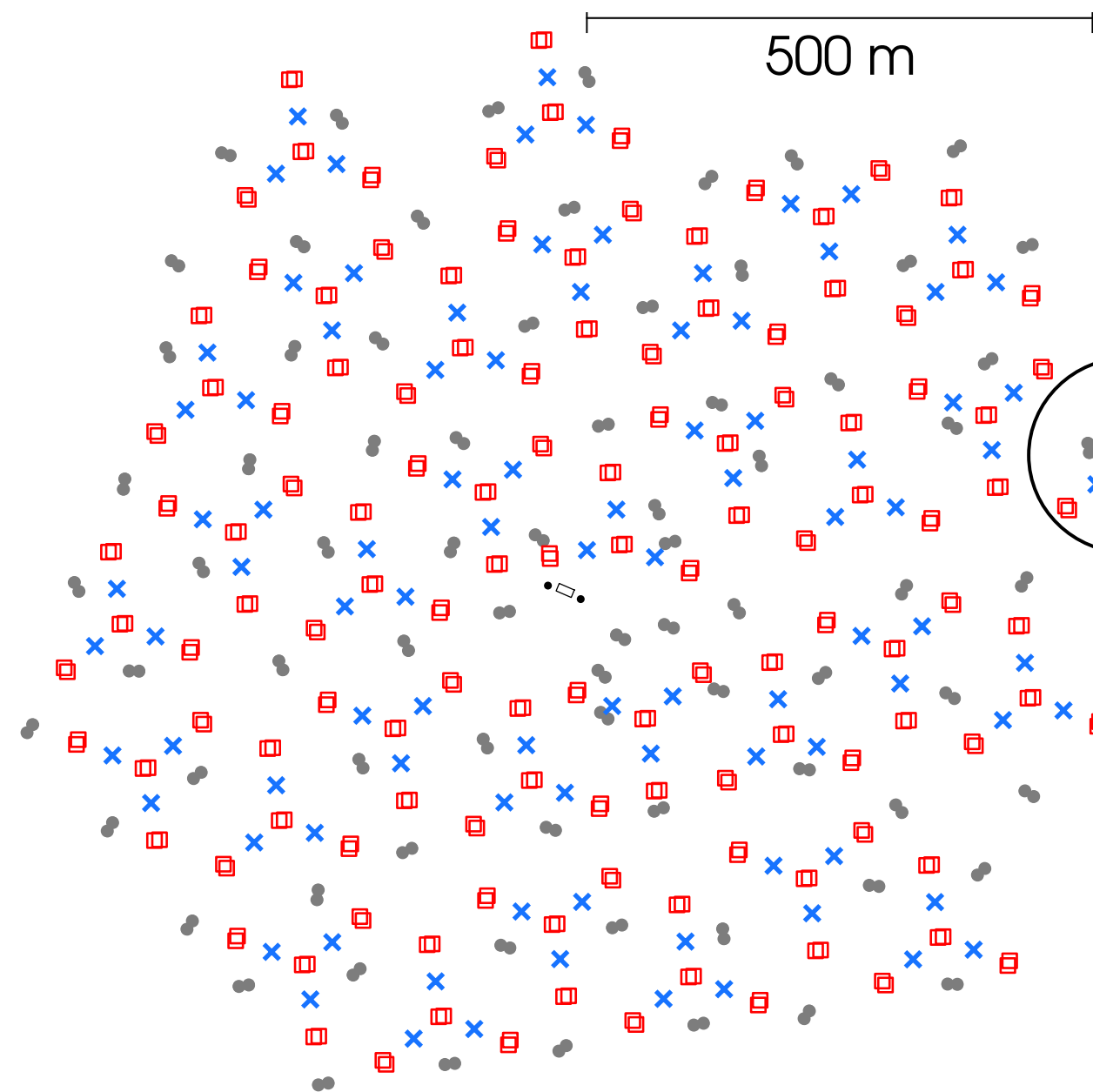
- IceTop is a 1 km<sup>2</sup> ice-Cherenkov tank air shower array under the snow surface
- Scintillator panels and radio antennas are planned to mitigate increasing snow coverage and add composition sensitivity
- Scintillator triggers similarly to IceTop. Radio is passively read out in case of a surface trigger



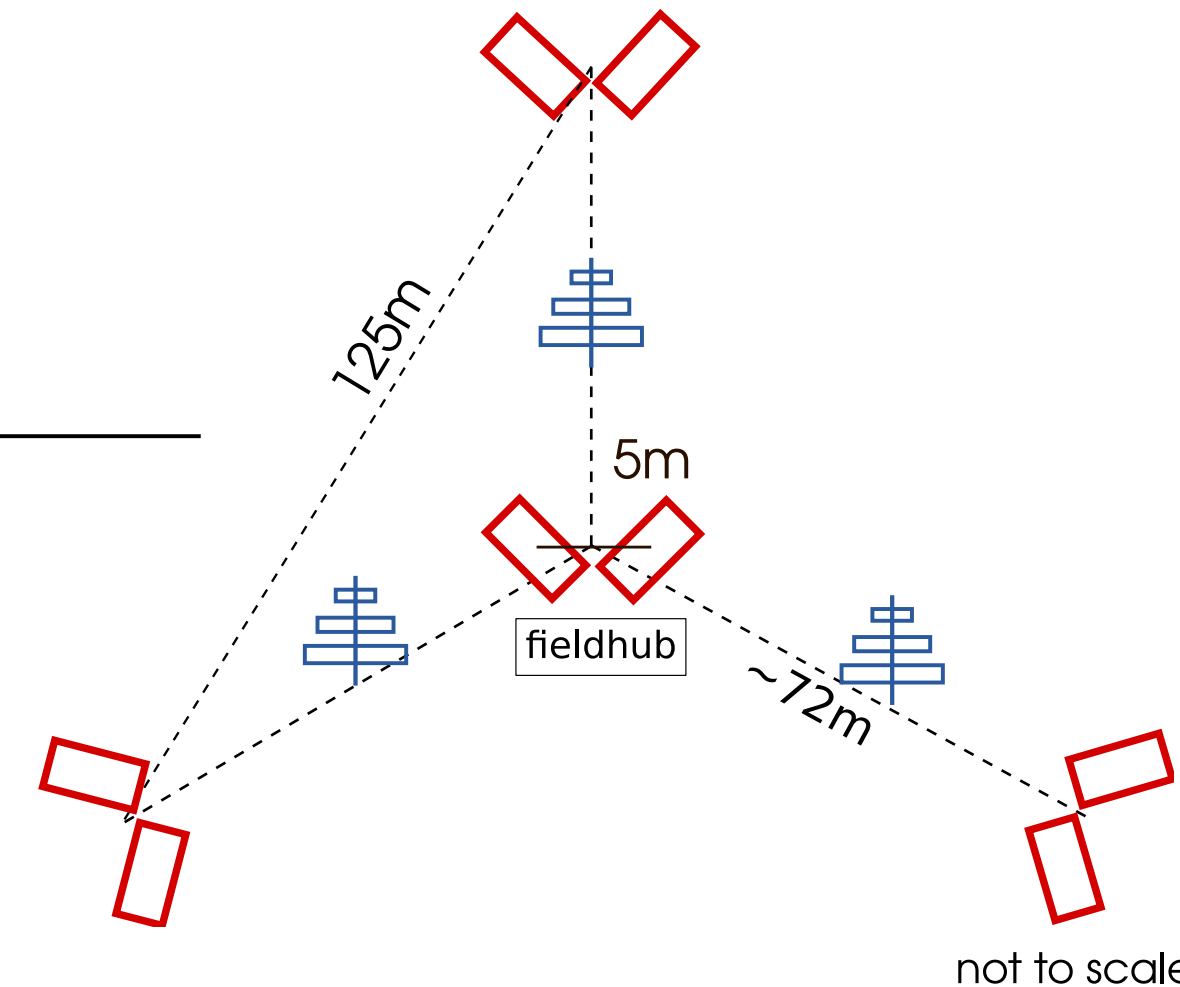
Radio antenna

Prototype station is running since 2020

Scintillator panel



• IceTop tanks   □ scintillators   × antennas



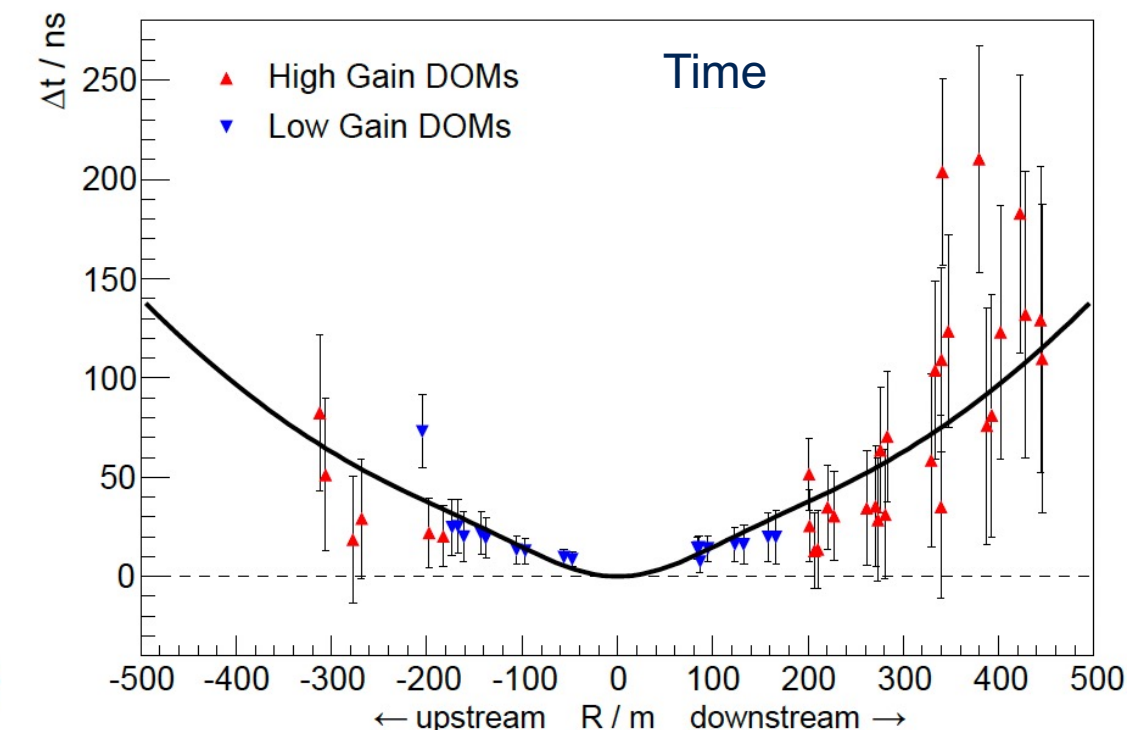
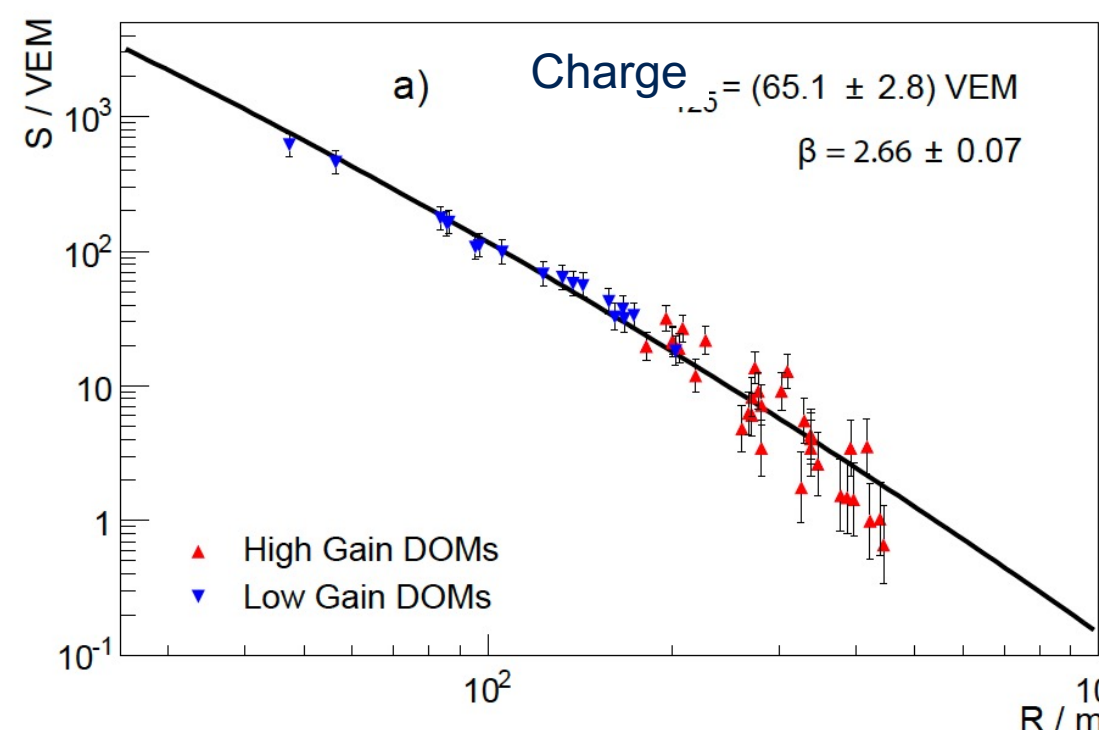
1 station =  
8 scintillator modules + 3 antennas

not to scale

# COSMIC RAY AIR SHOWER RECONSTRUCTION

## • IceTop

- Fit to IceTop signals
  - Lateral distribution function (charge)
  - Shower front (time)
- Direction & core position
- Shower size  $S_{125}$  : proxy for primary energy



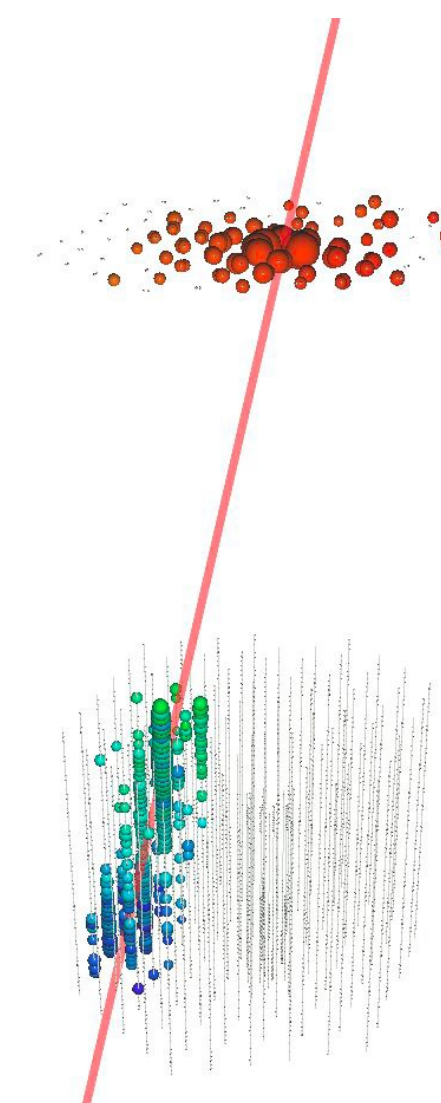
<https://arxiv.org/abs/1207.6326>

## • In-Ice

- Energy loss reconstruction
- Along the reconstructed IceTop track

## • Combined Reconstruction Surface Detector+Radio and deep In-Ice

- Direction & core position
- Shower size and energy loss reconstruction
- With Radio  $X_{\text{max}}$



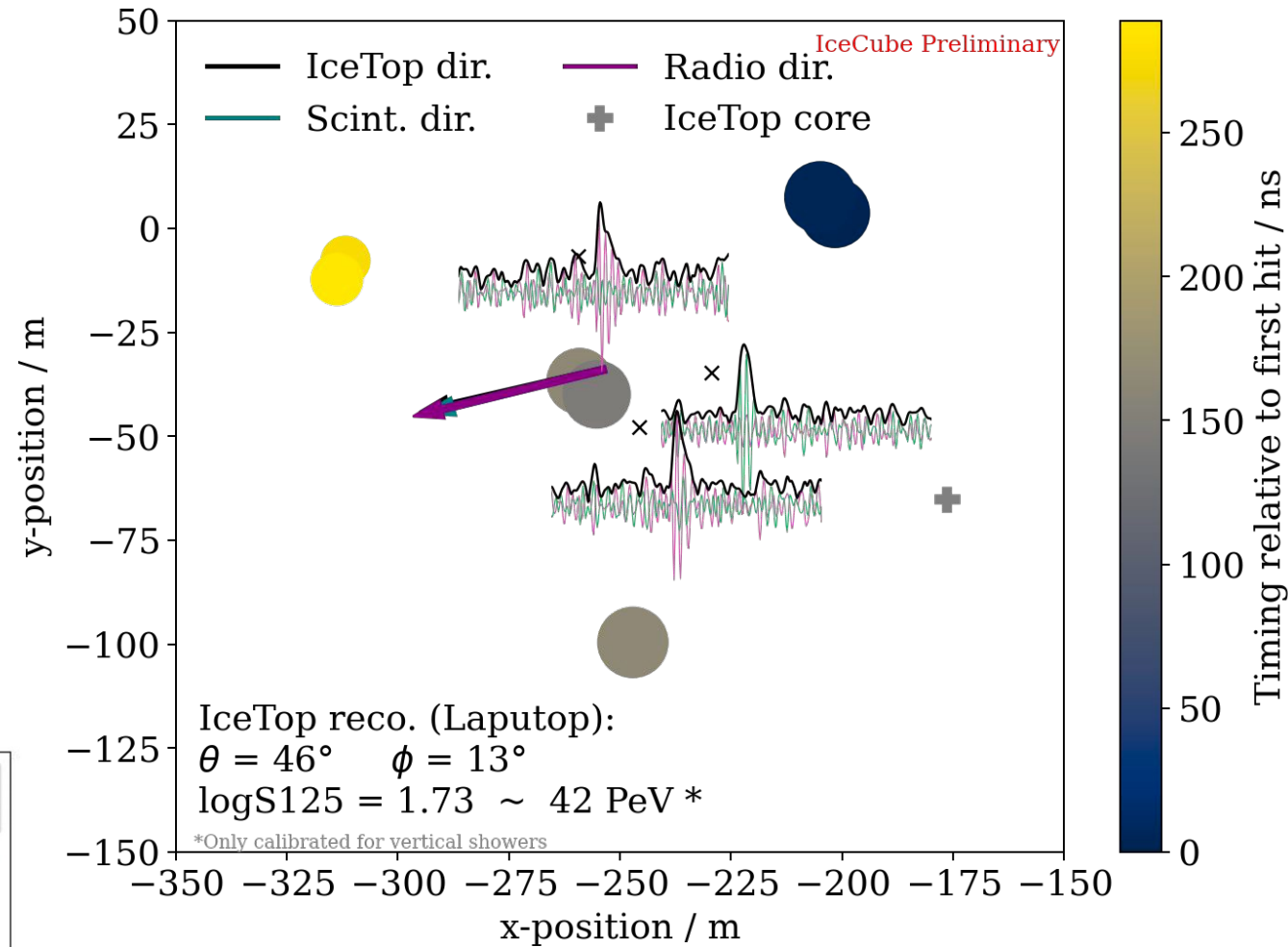
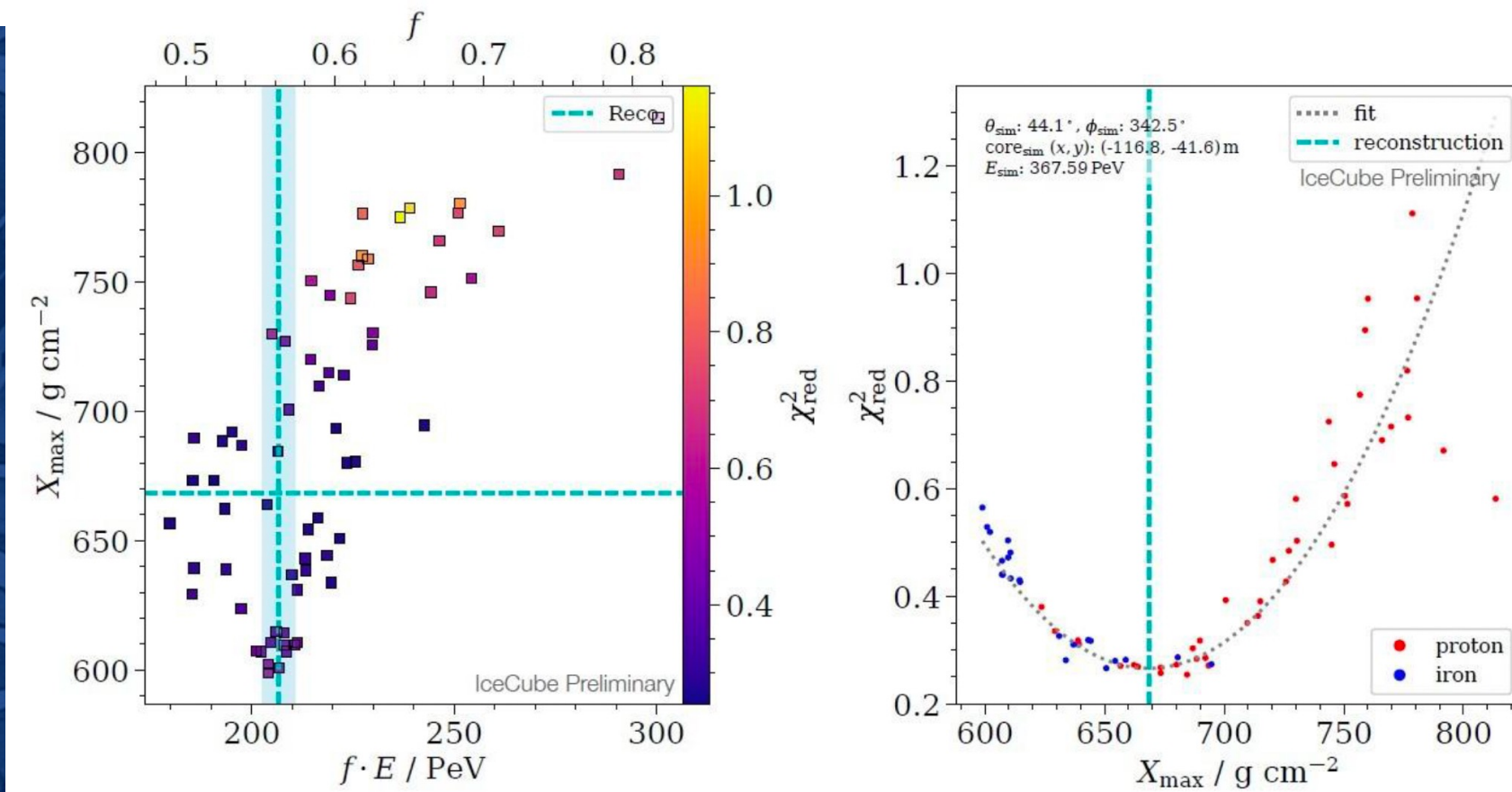


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# SURFACE SCINTILLATOR+RADIO ENHANCEMENT

Radio :

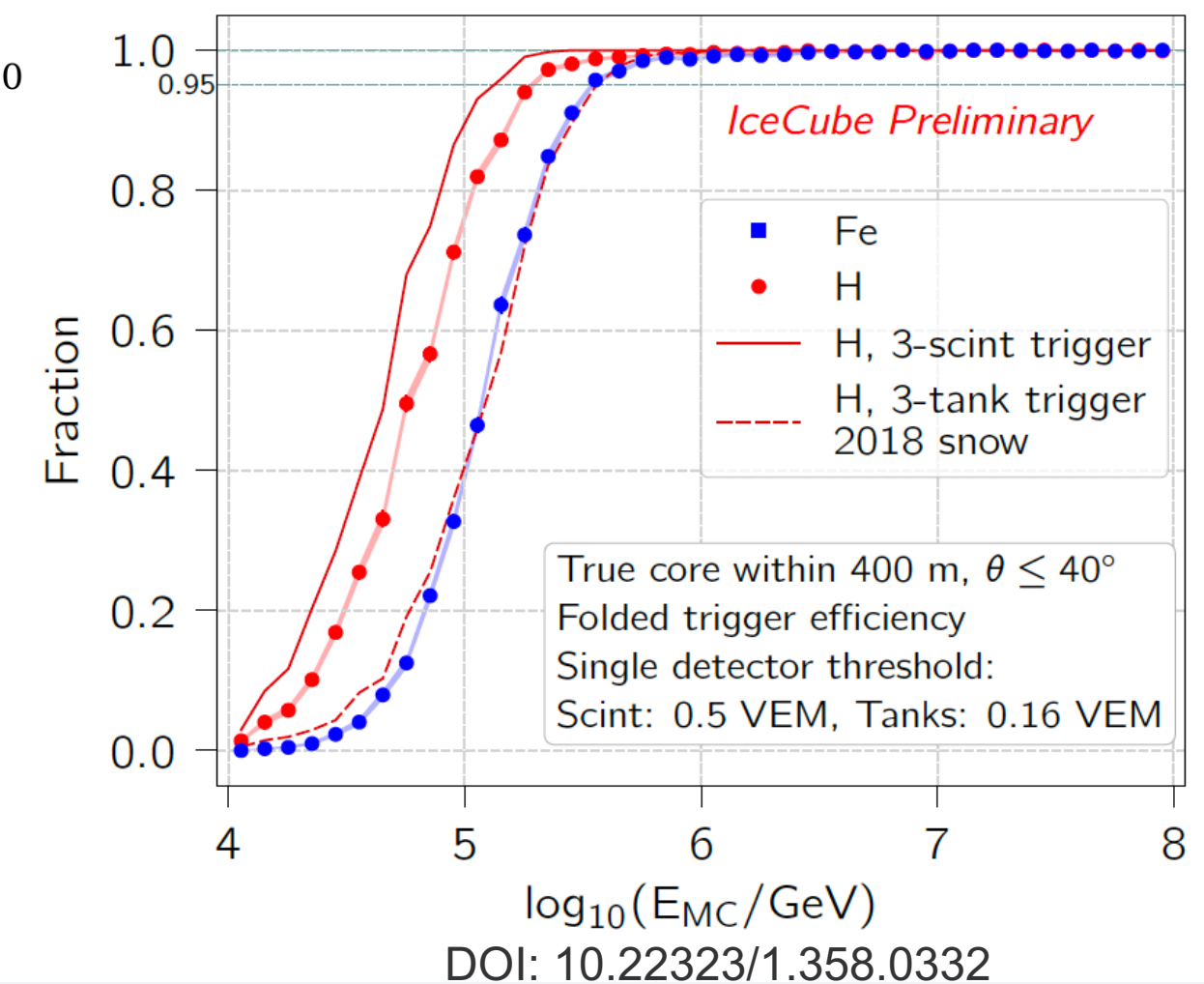
- Direct  $X_{\max}$  measurement for inclined high-energy shower



Event seen by IceTop, the R&D scintillators and radio antennas

Scintillator:

- Lower trigger probability
- Improved muon density measurements at the surface level



<https://arxiv.org/abs/2205.05845>

CURIOUS SMART TENACIOUS

# IMAGING AIR CHERENKOV TELESCOPES

## ICEACT

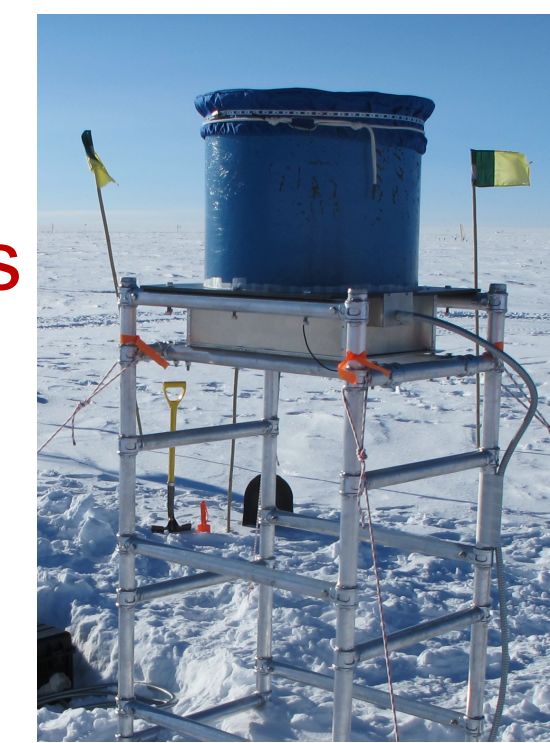
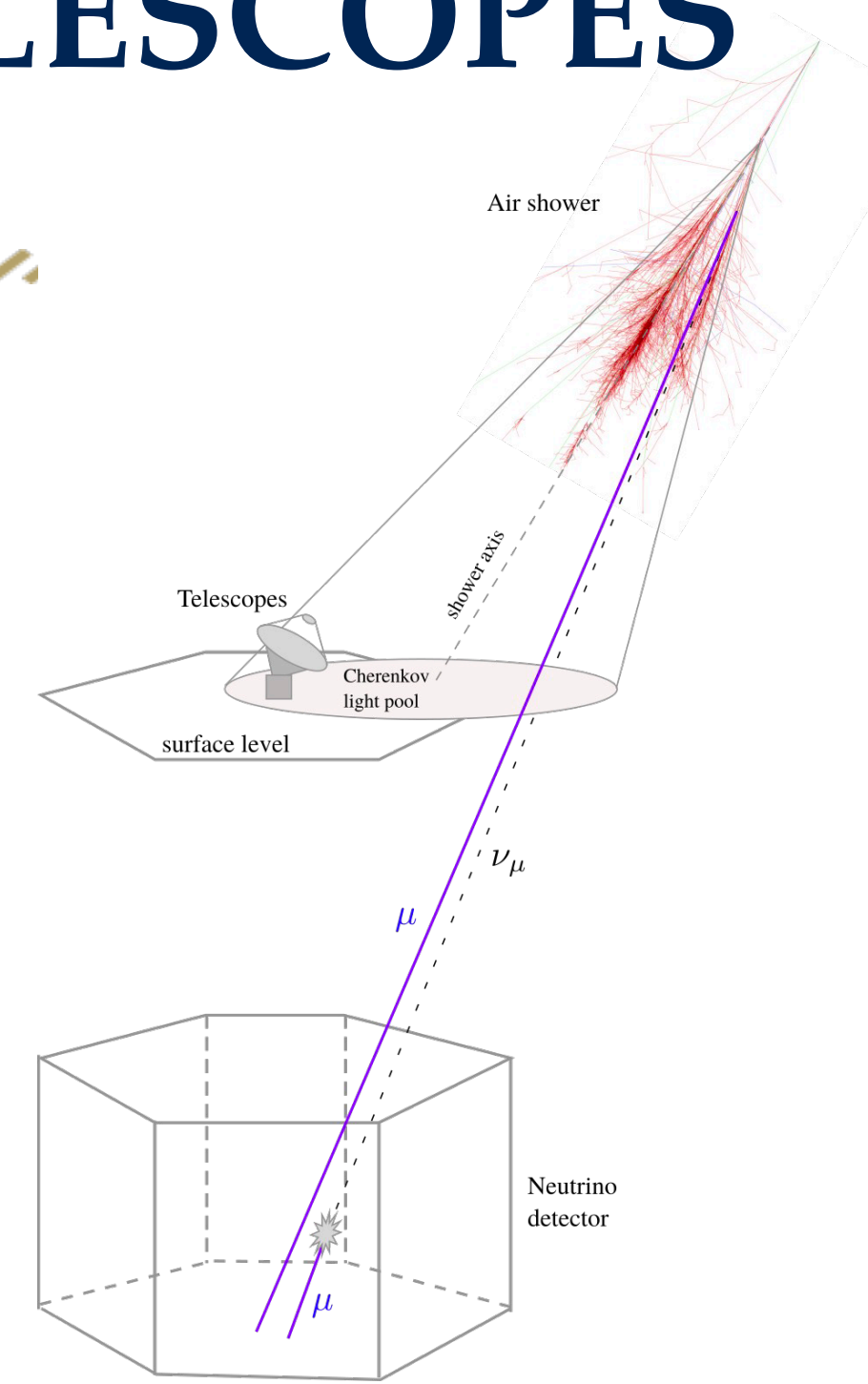
Low energy (10 TeV - 200 TeV) air shower particles barely reach the ground making 'classic' surface reconstruction challenging

### IceAct

- measure the el.-mag. shower component inside the atmosphere from TeV to PeV
- combine with particle footprint on ground level and in-ice muon reconstruction:
  - calibration of geometry and energy
  - hybrid composition studies
  - possible veto capability
- Since 2019 two R&D telescopes have been deployed at the South Pole and are taking data, a third telescope is currently being deployed

The telescopes can only operate during the Antarctic night (roughly 4.5 months stop) and good atmospheric conditions

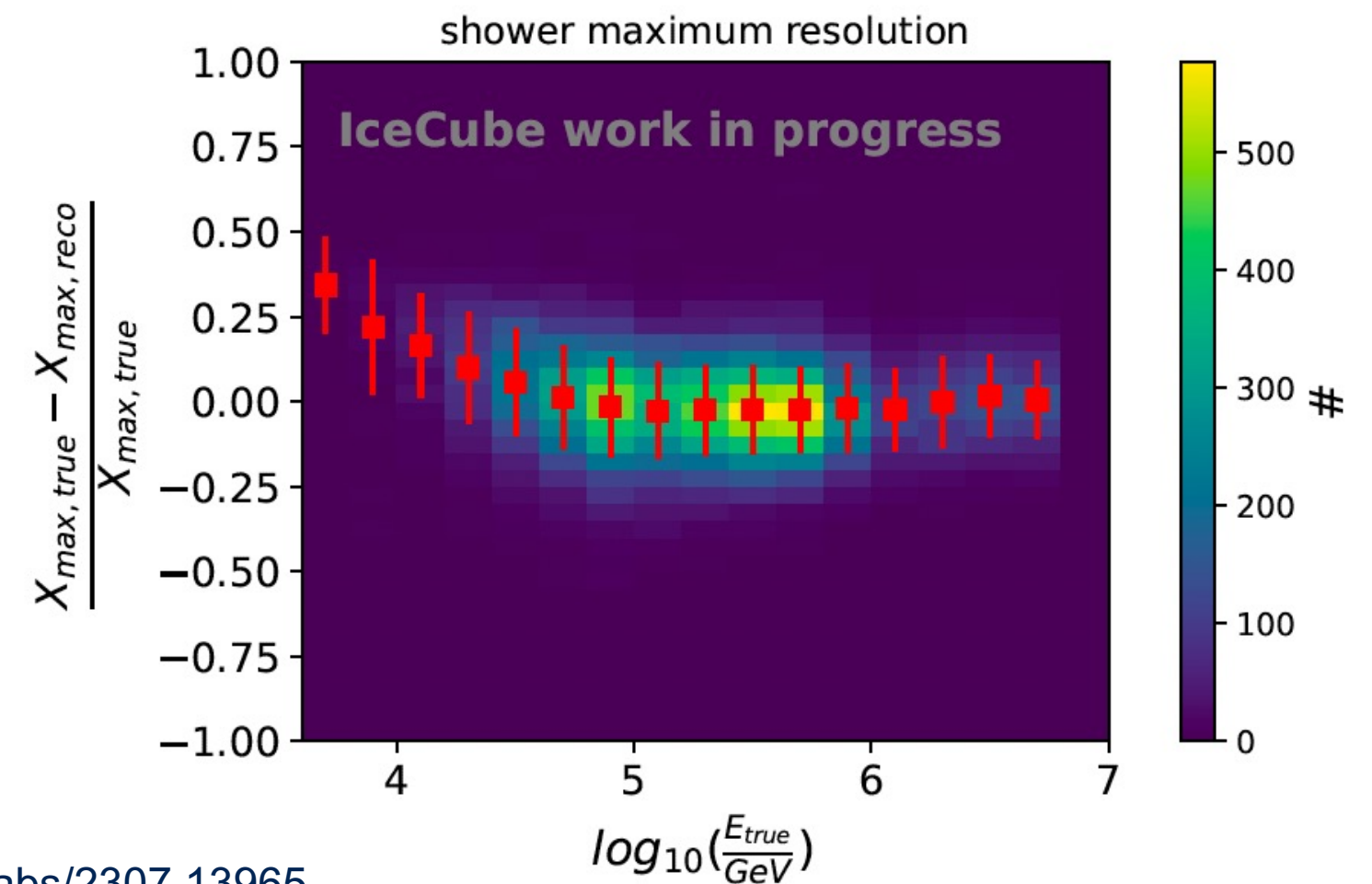
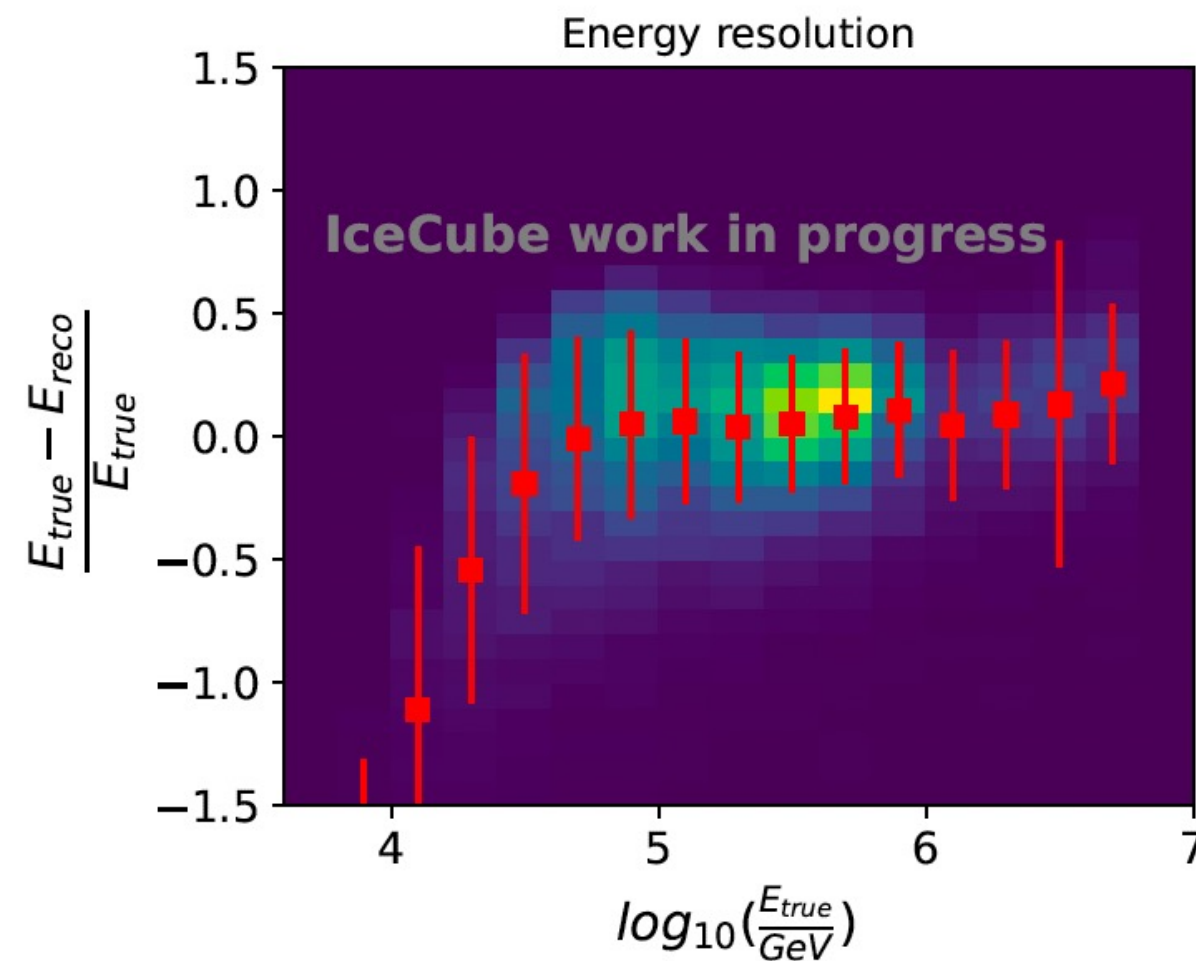
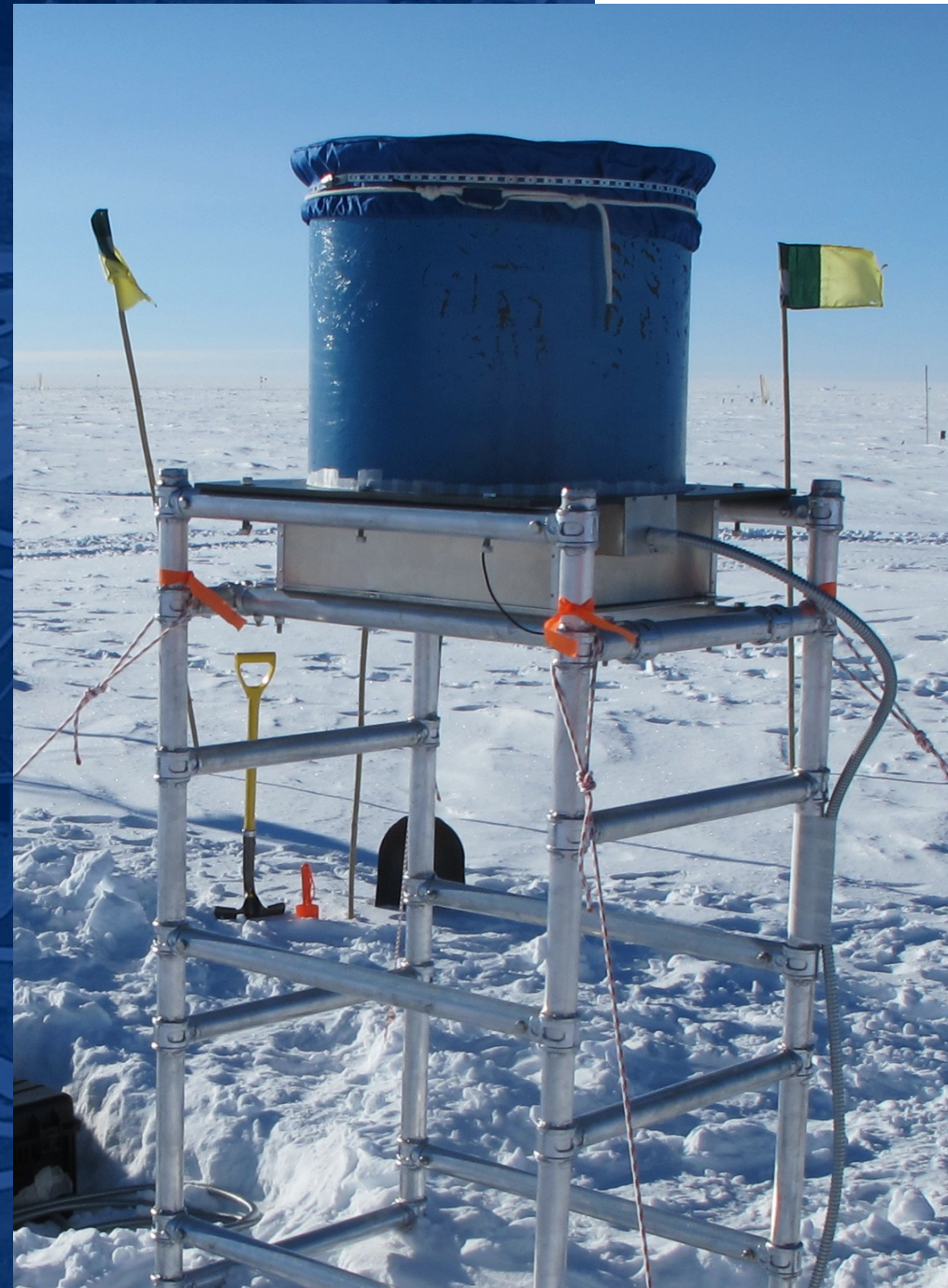
- Duty cycle ~ 20%



- 50 cm Fresnel lens
- 50 cm focal length
- 61 hexagonal pixel

# IMAGING AIR CHERENKOV TELESCOPES ICEACT

- A first approach of single telescope Graph Neural Network reconstruction
  - Simultaneously determines:
    - Air shower geometry
    - Energy
    - $X_{\max}$
- for vertical low-energy air shower



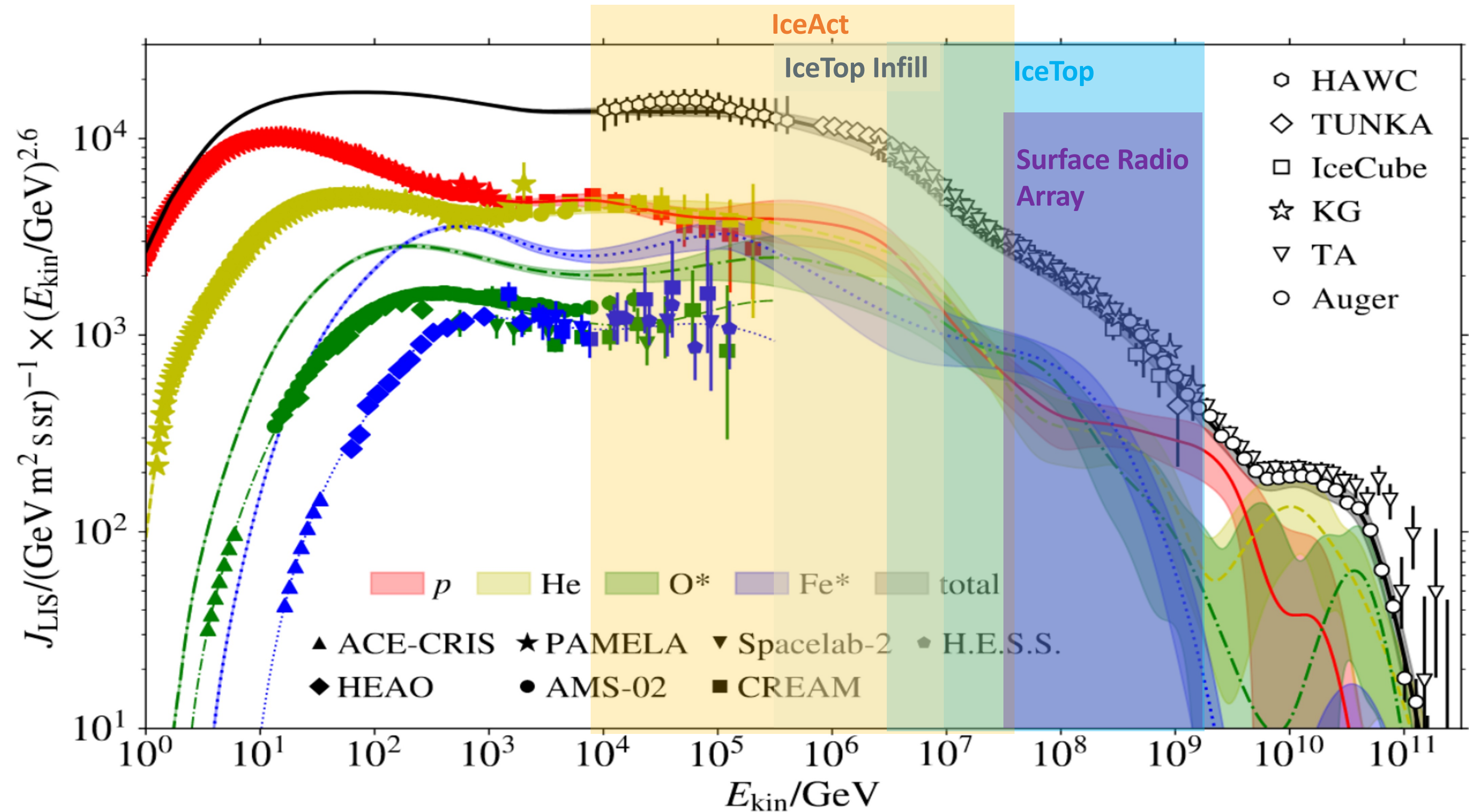
<https://arxiv.org/abs/2307.13965>





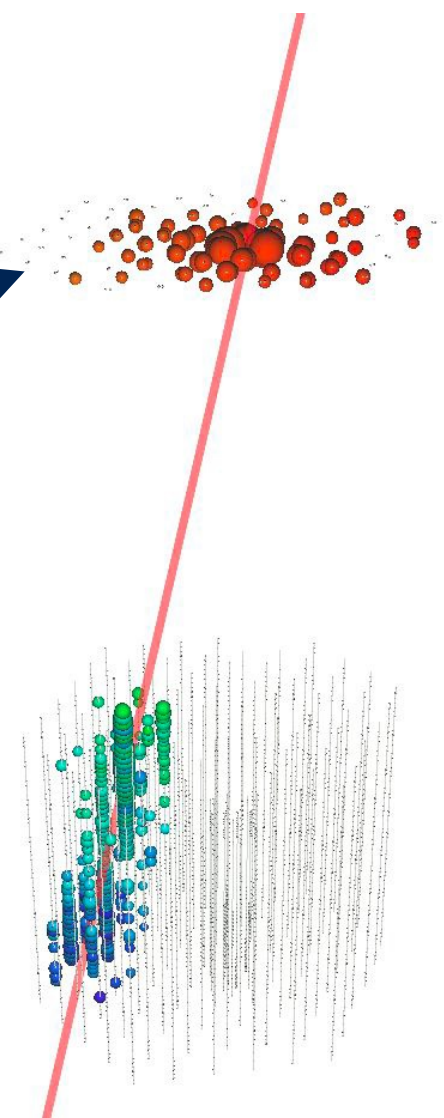
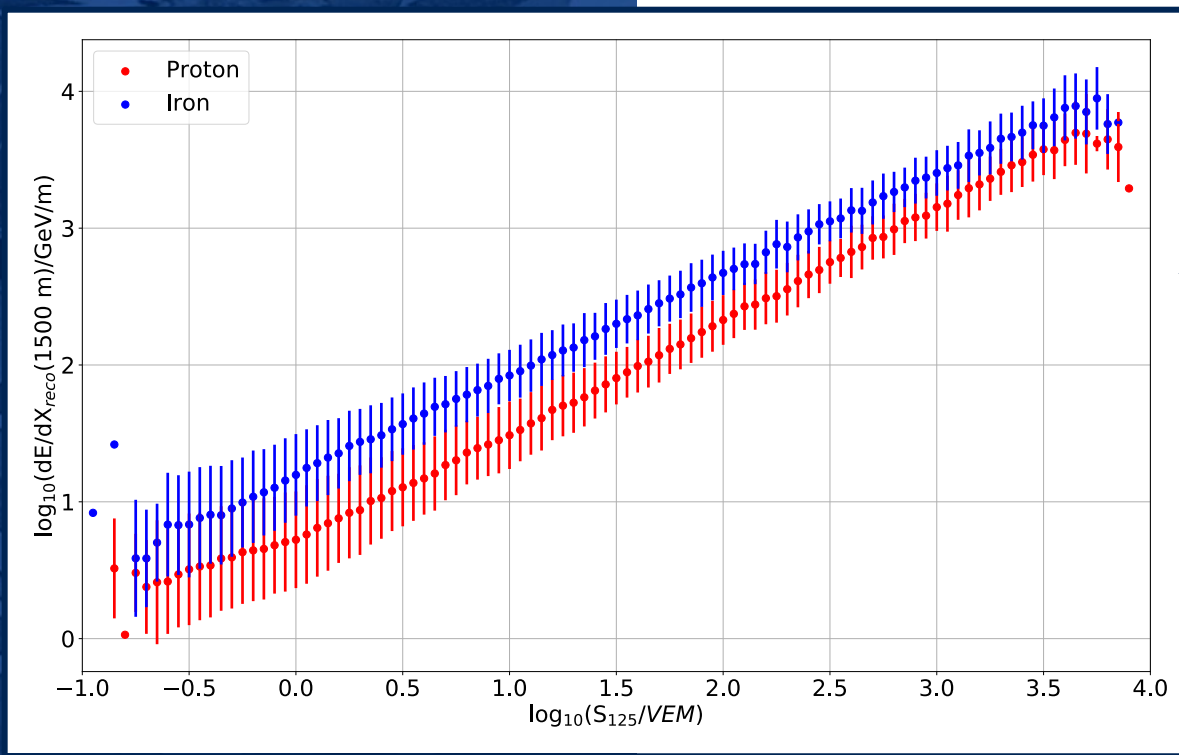
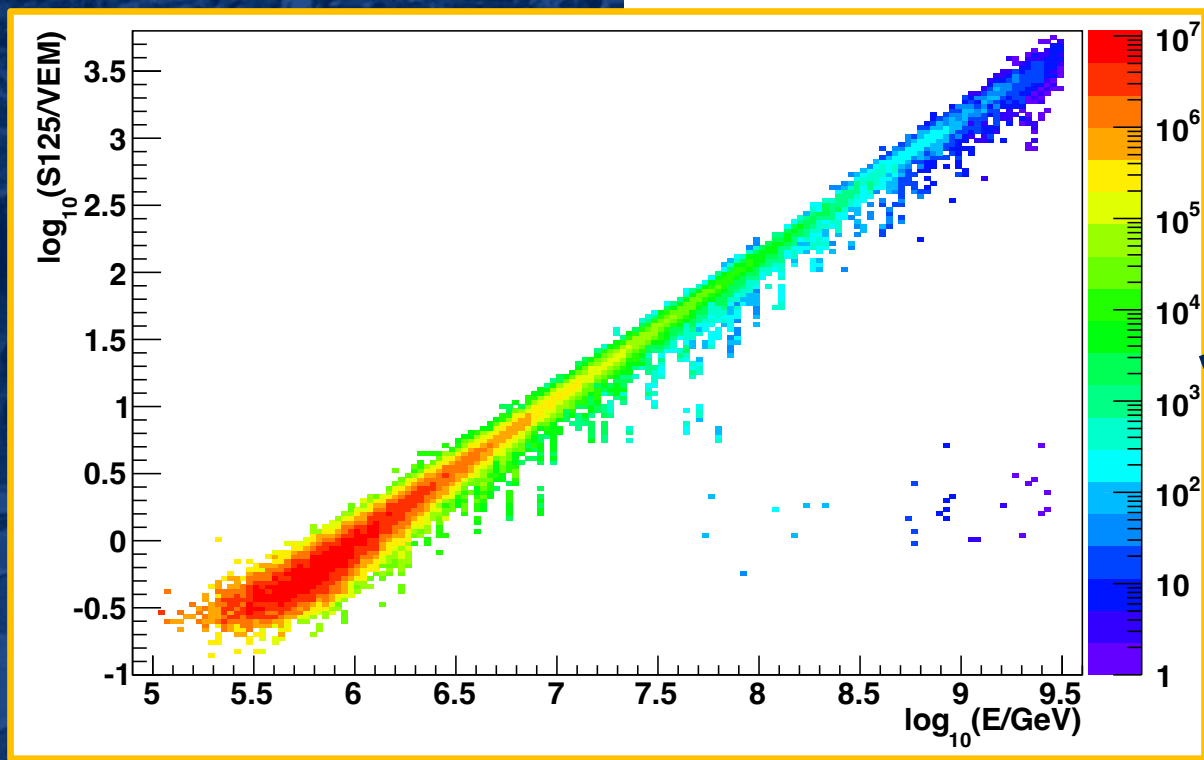
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# CR ENERGY RANGE OF ICECUBE/ICETOP



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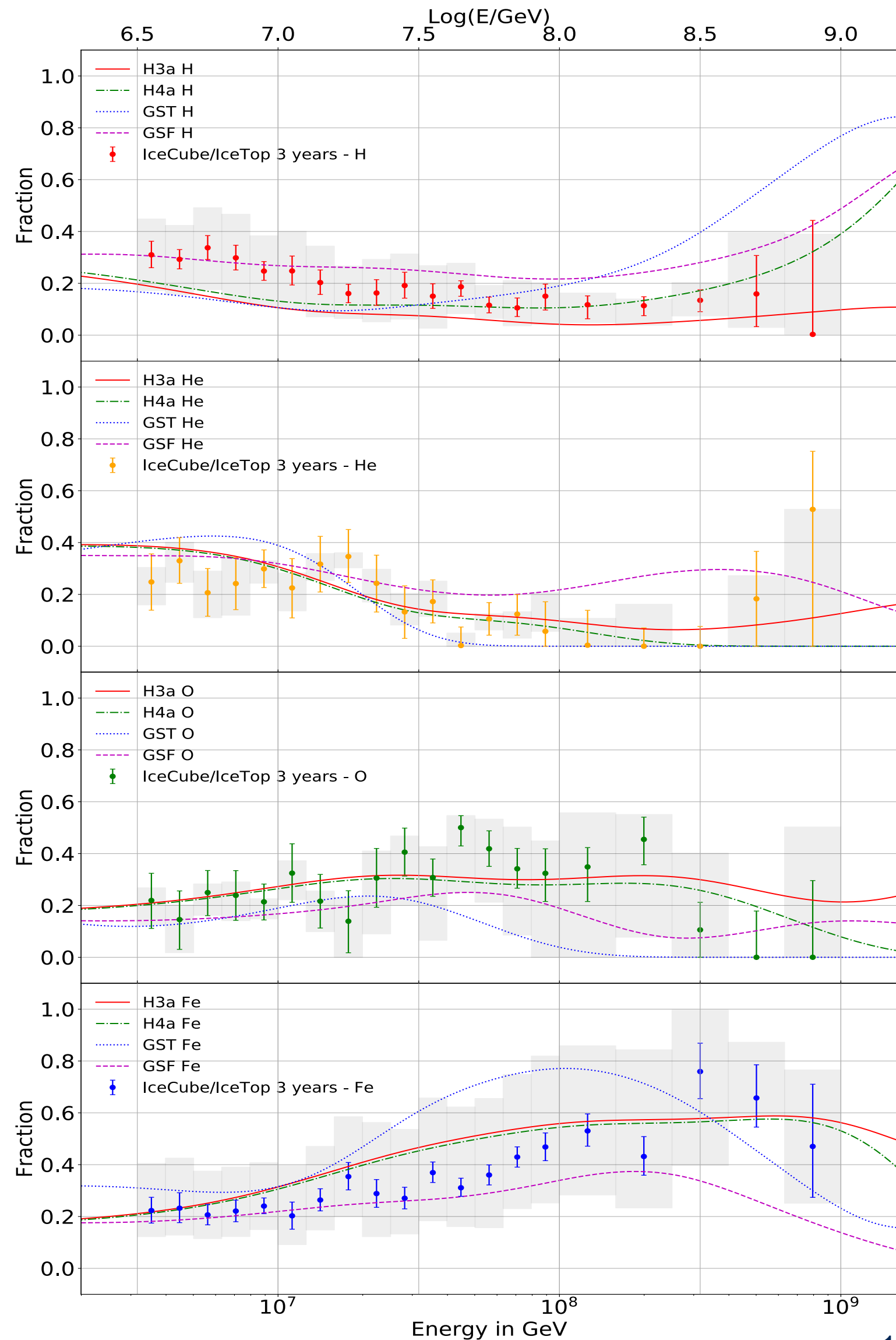
# ICETOP-ICECUBE MASS COMPOSITION



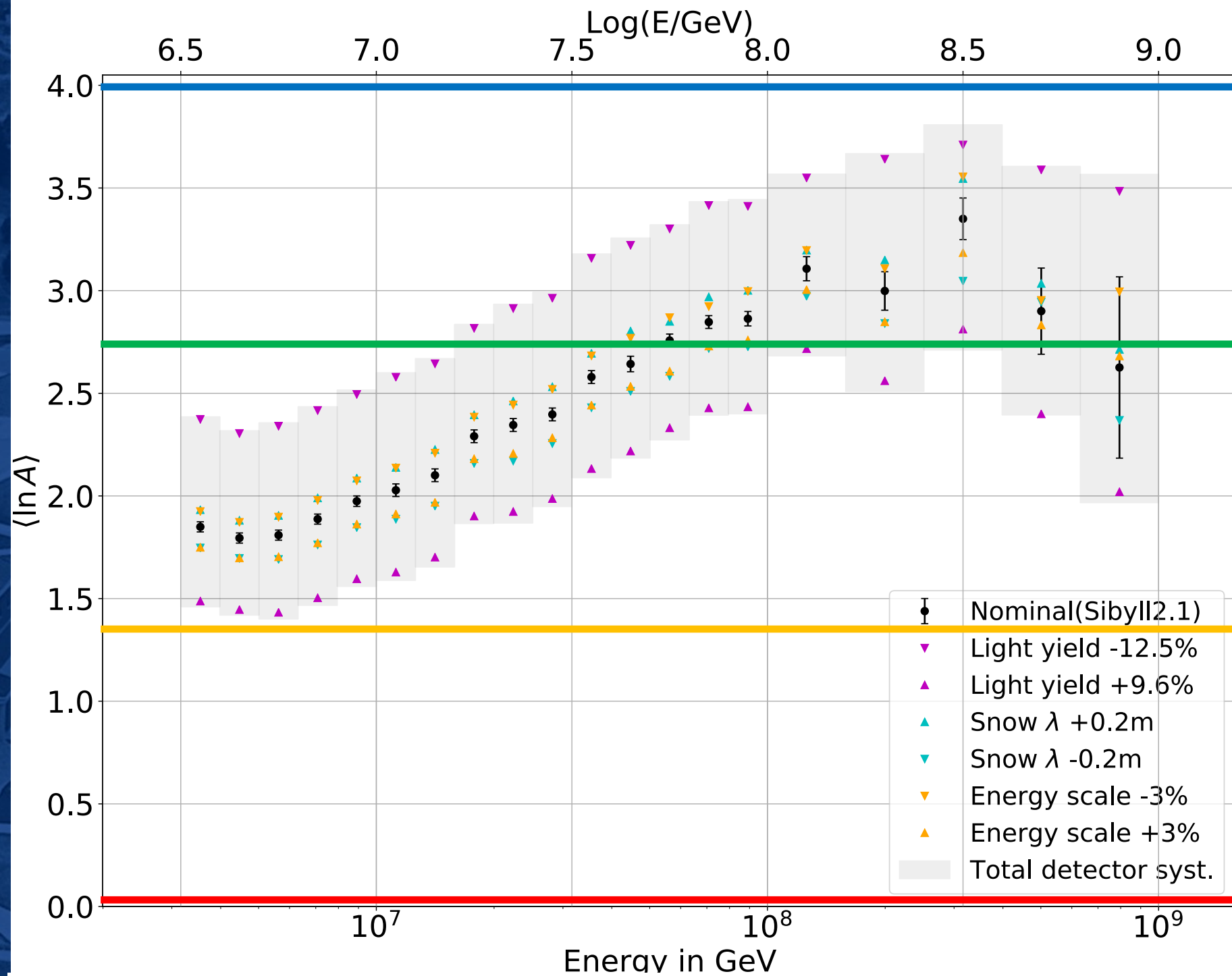
Elementary groups

- H
- He
- CNO
- Fe

- Coincident event analysis
  - Data 2011-2013
  - Energy Proxy from IceTop
  - Energy deposit profile from IceCube



# SYSTEMATIC UNCERTAINTY



Systematic offsets  $\langle \ln(A) \rangle$  due to:

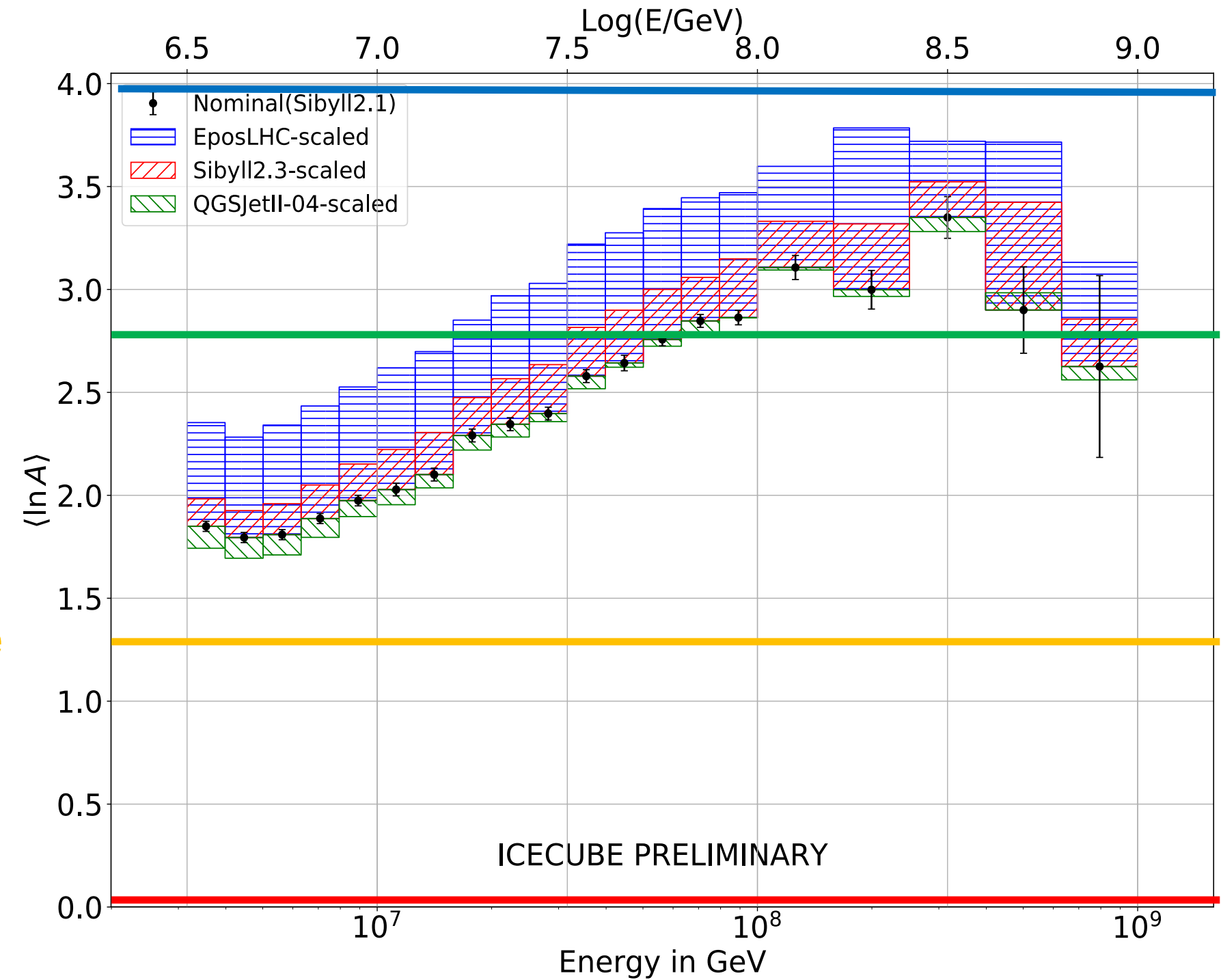
- Snow ( $\pm 0.2$  m)
- Light yield (-12.5% , +9.6%)
- Energy scale ( $\pm 3\%$ )

100% Fe

100% O

100% He

100% H



ICECUBE PRELIMINARY

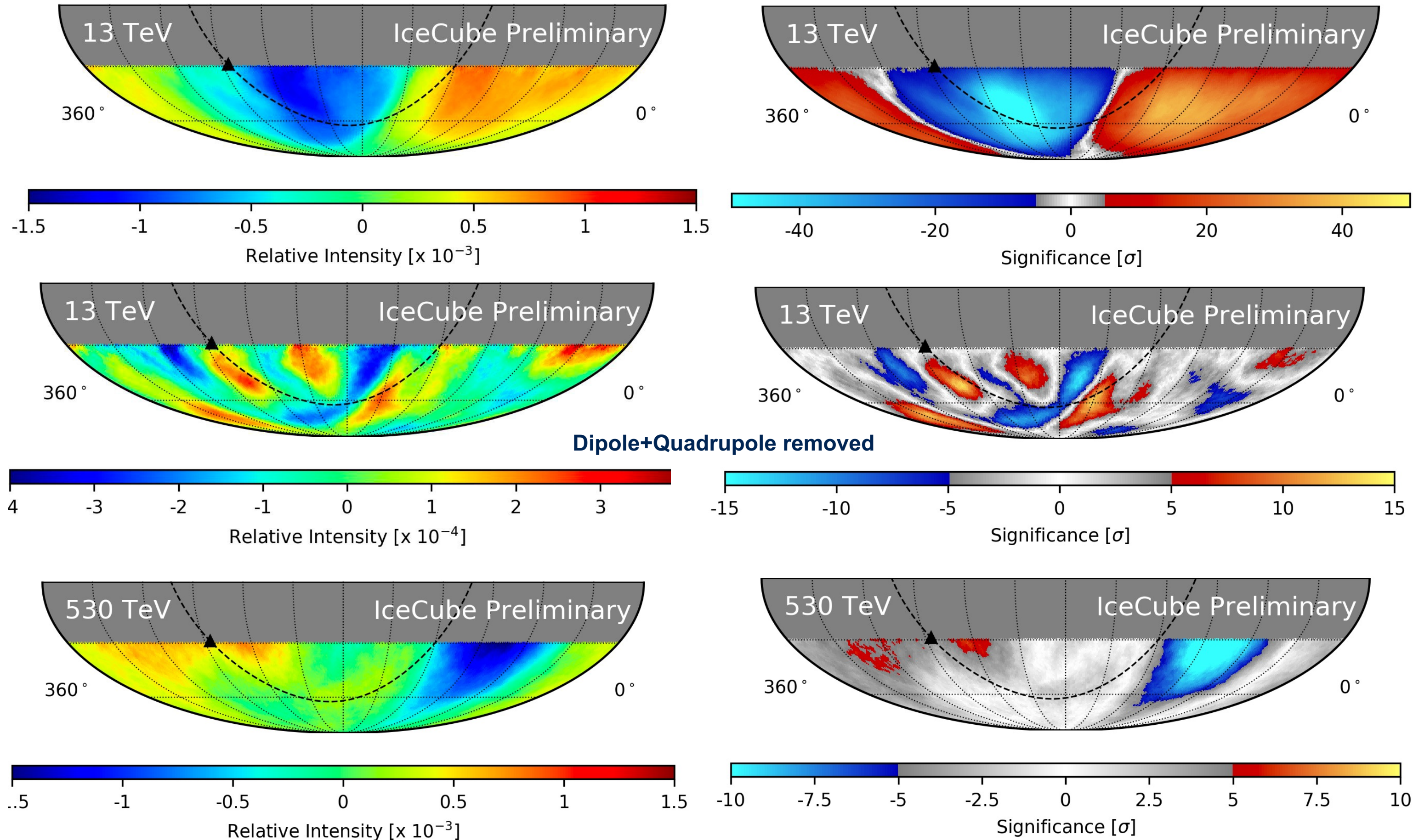
- Large systematic uncertainties hadronic interaction model
- Epos LHC
- Sibyll2.3
- QGSJetII-04



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# CR ANISOTROPY IN 11 YEARS OF DATA

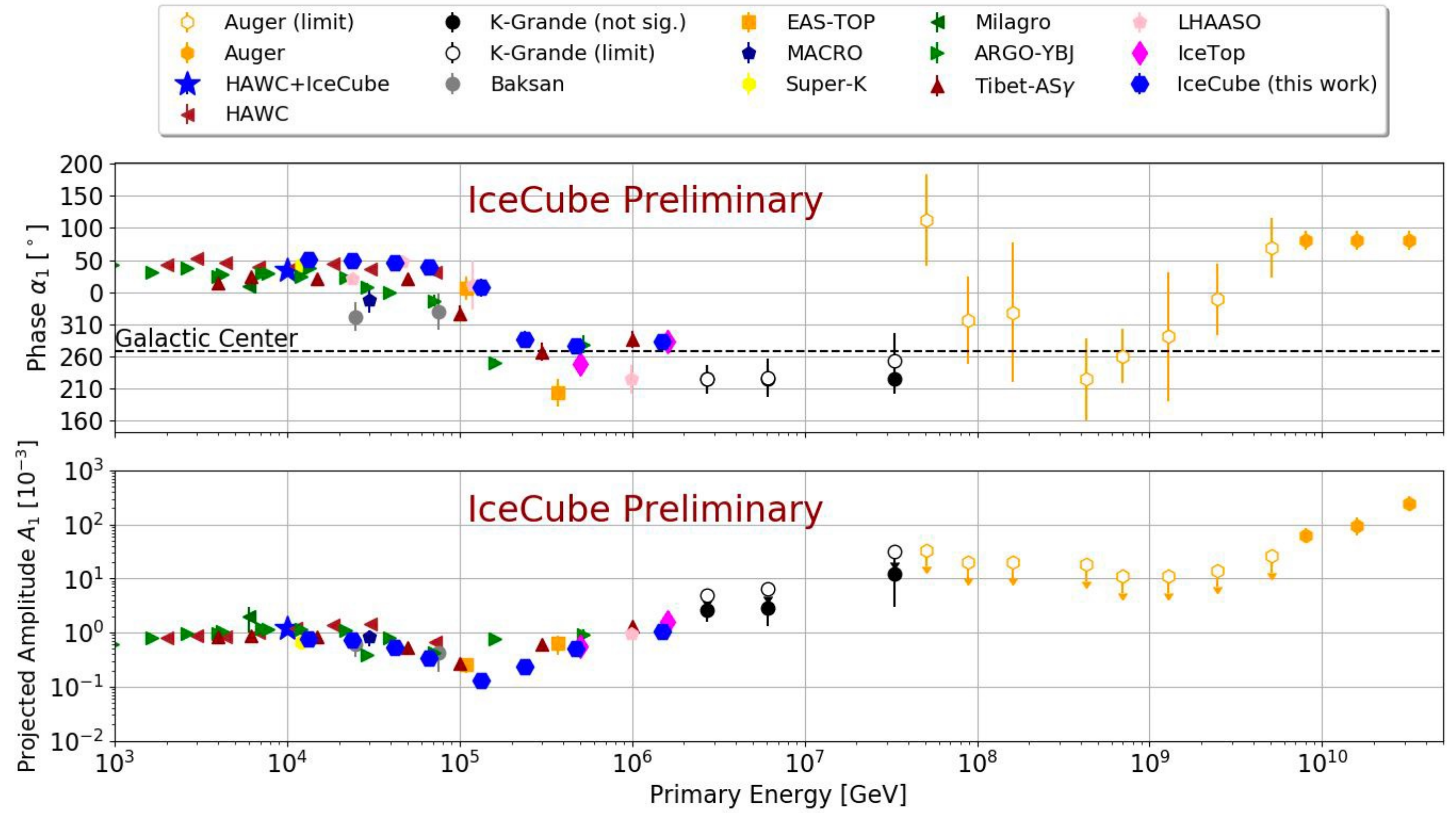
- Update of analysis published in 2016 (Paper under collaboration review)
- Improved statistics:
  - Eleven years of data (~700 billion events)
- Improved simulation:
  - Newer, dataset-specific, increased statistics
- Improved systematics:
  - Shift from detector to calendar years, stable detector configuration



# DIPOLE PHASE & AMPLITUDE

<https://arxiv.org/abs/2308.02331>

- New simulation and statistics only slightly change energy maps
- Transition still occurs around 100 TeV
- Structure at highest energy now consistent with other PeV measurements
- Phase and amplitude of best-fit dipole consistent with other experiments



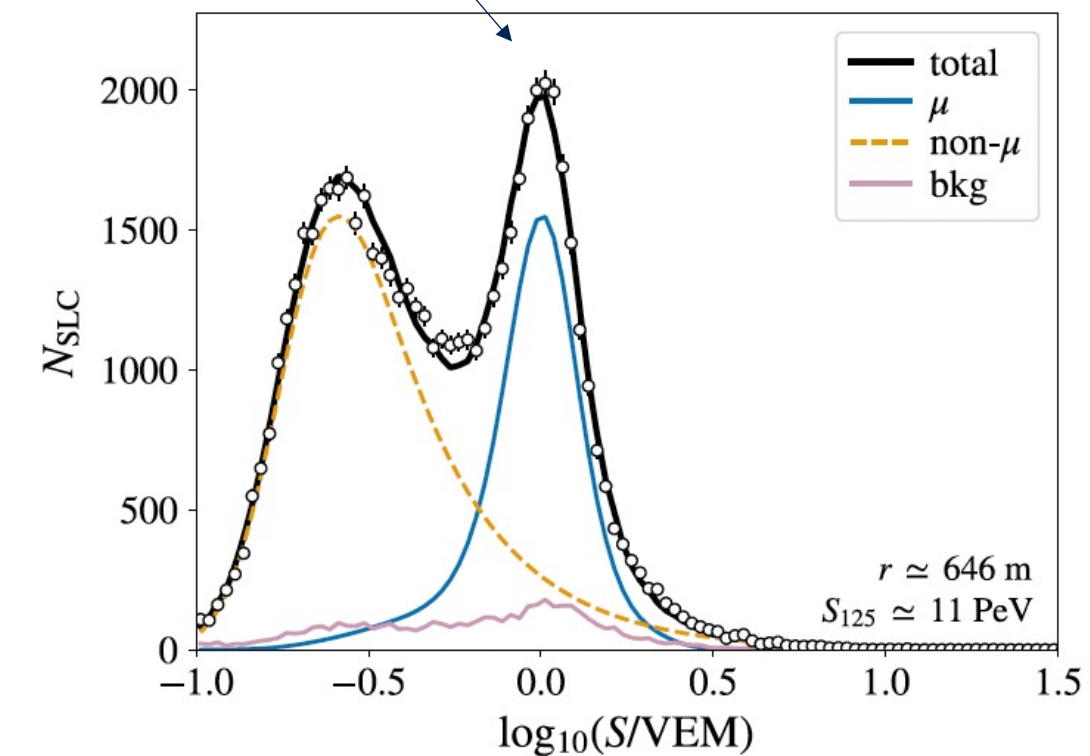
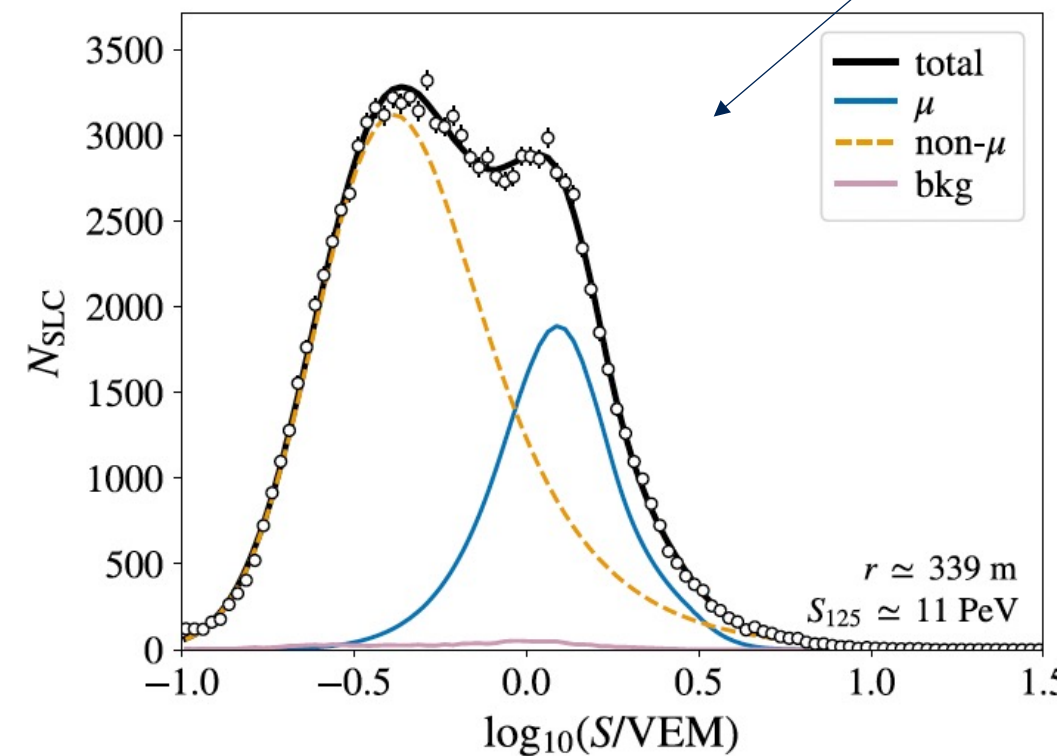
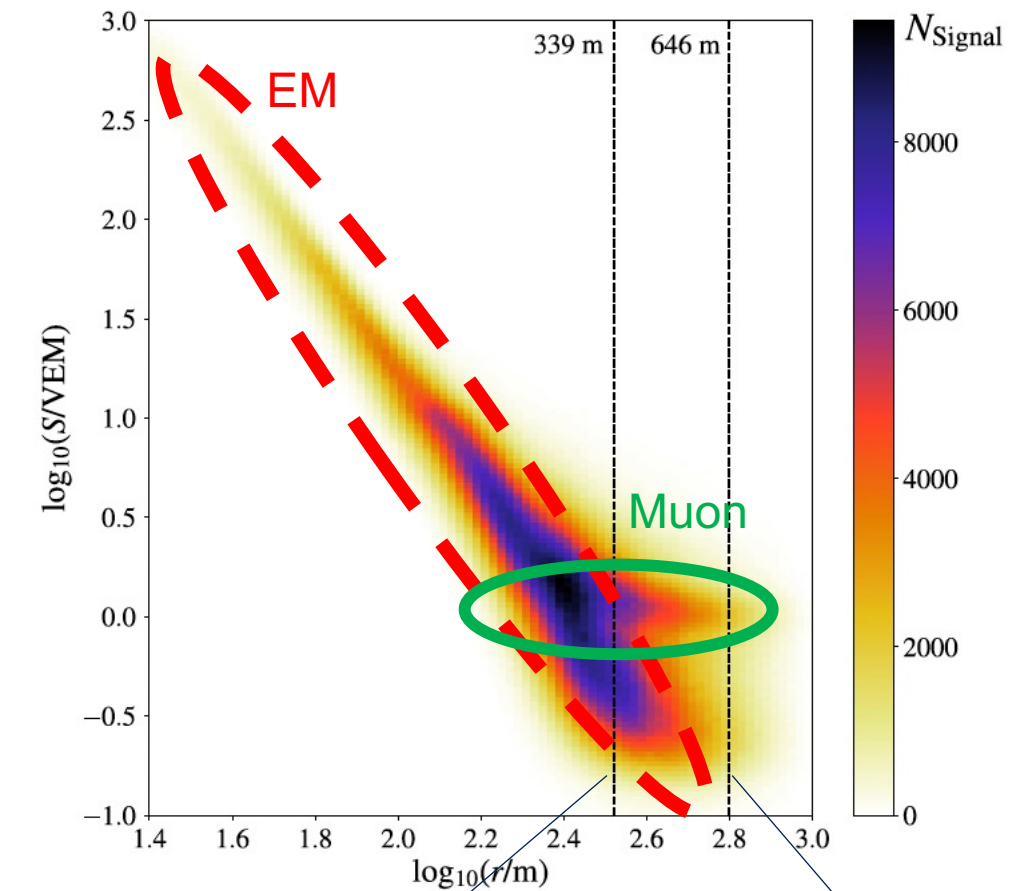


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# SURFACE MUON DENSITY

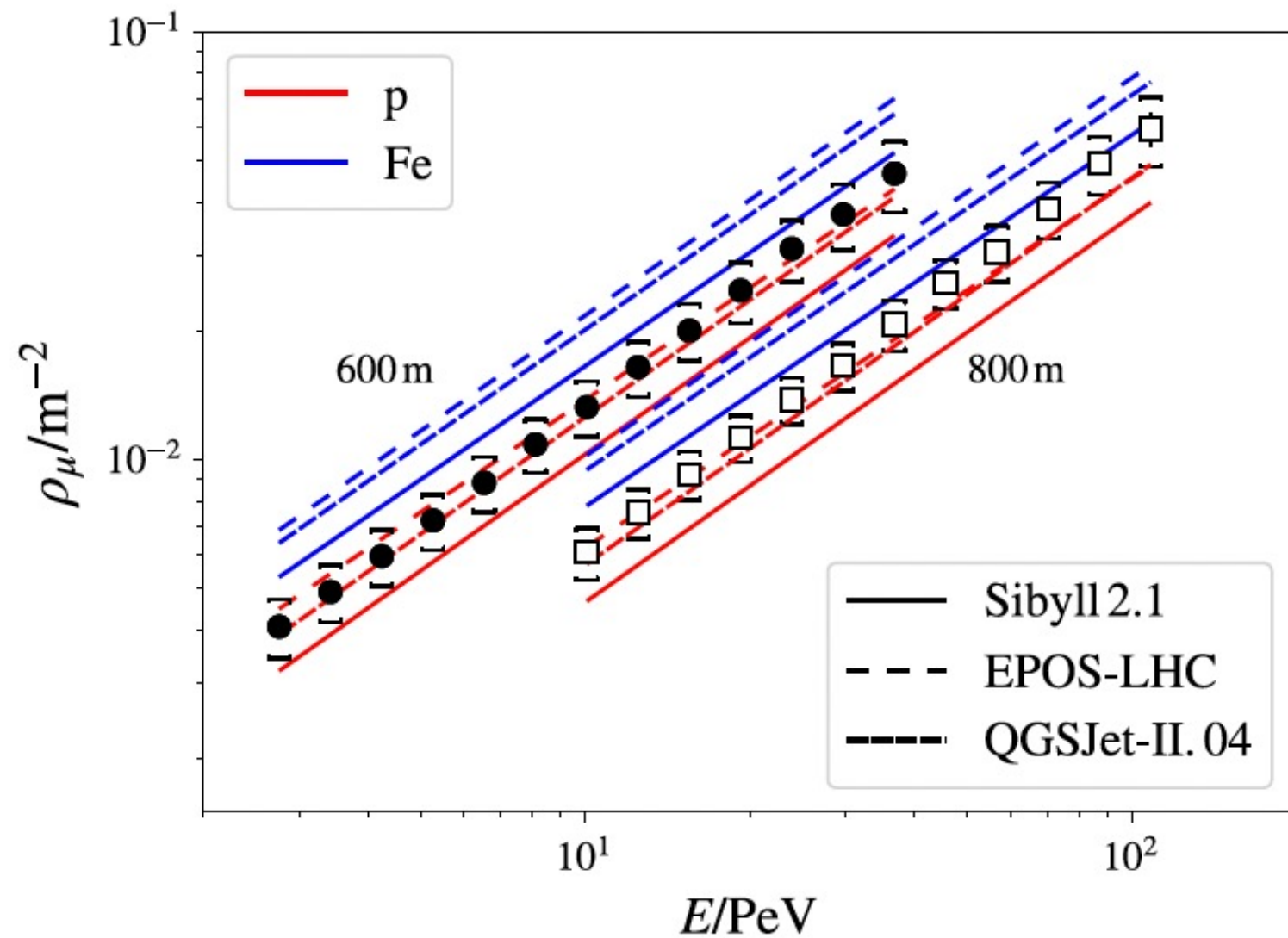
- Tank signal includes:
  - muons
  - electromagnetic component
  - background
- Due to EM contamination, the density of muons is evaluated at 600 and 800 m from the shower axis
- Mostly low-energy ( $\sim$ GeV) muons

For TeV-muon multiplicity studies with the deep in-ice IceCube, see Stef Verpoest's talk tomorrow



# SURFACE MUON DENSITY

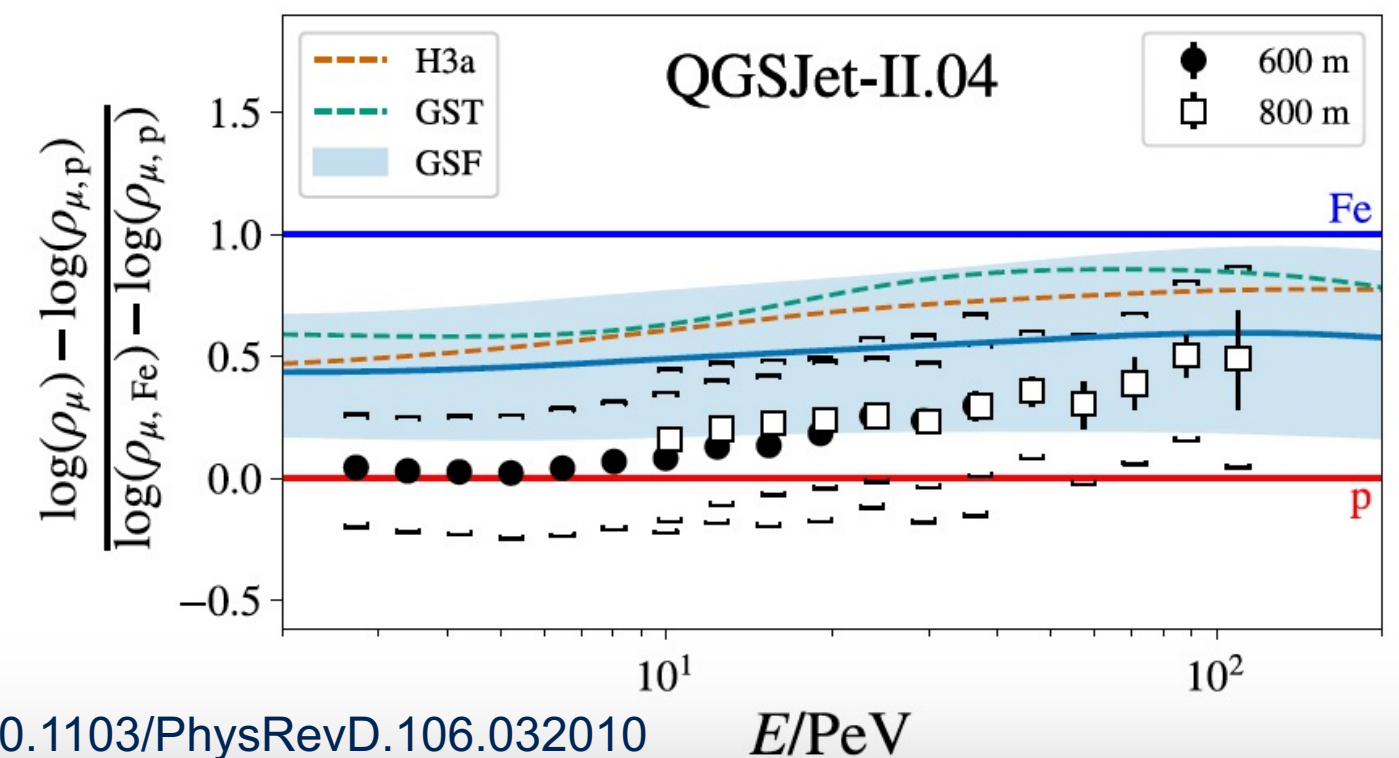
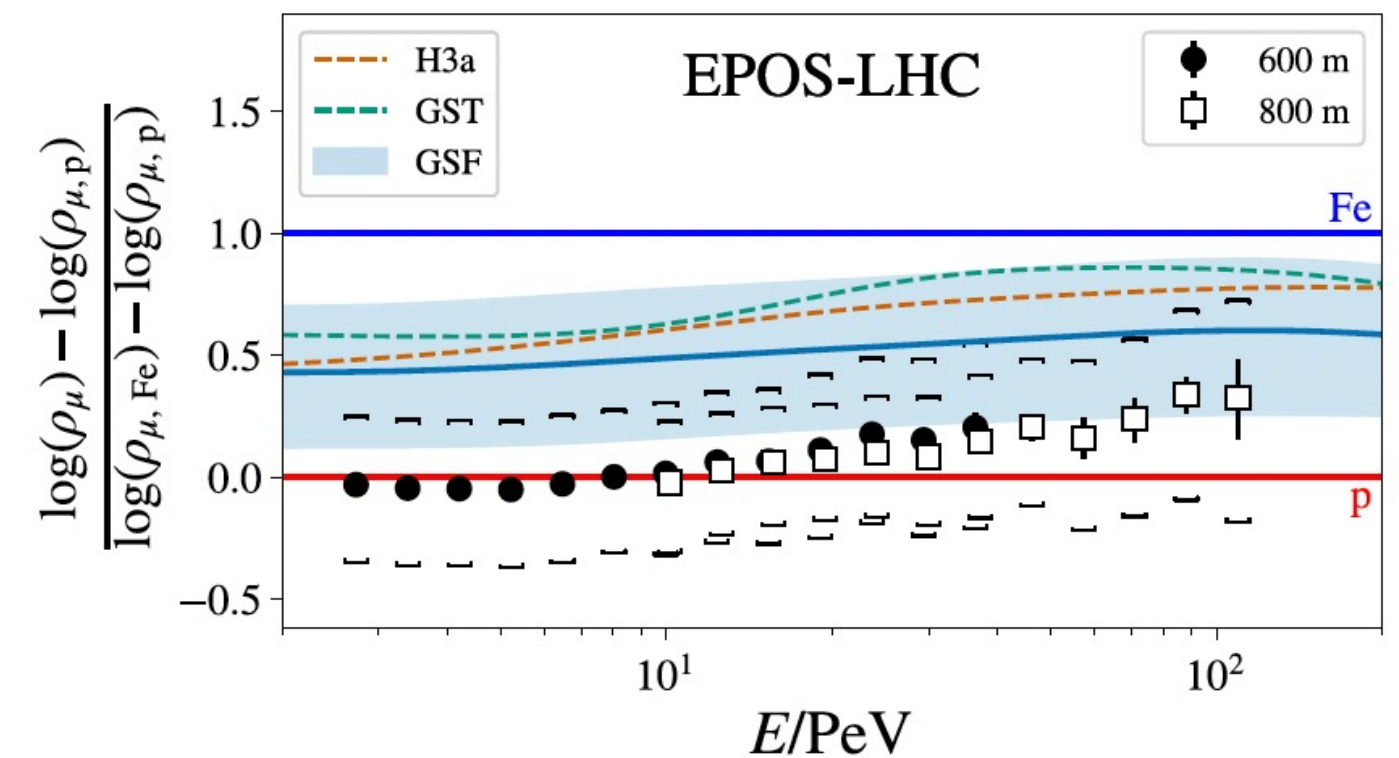
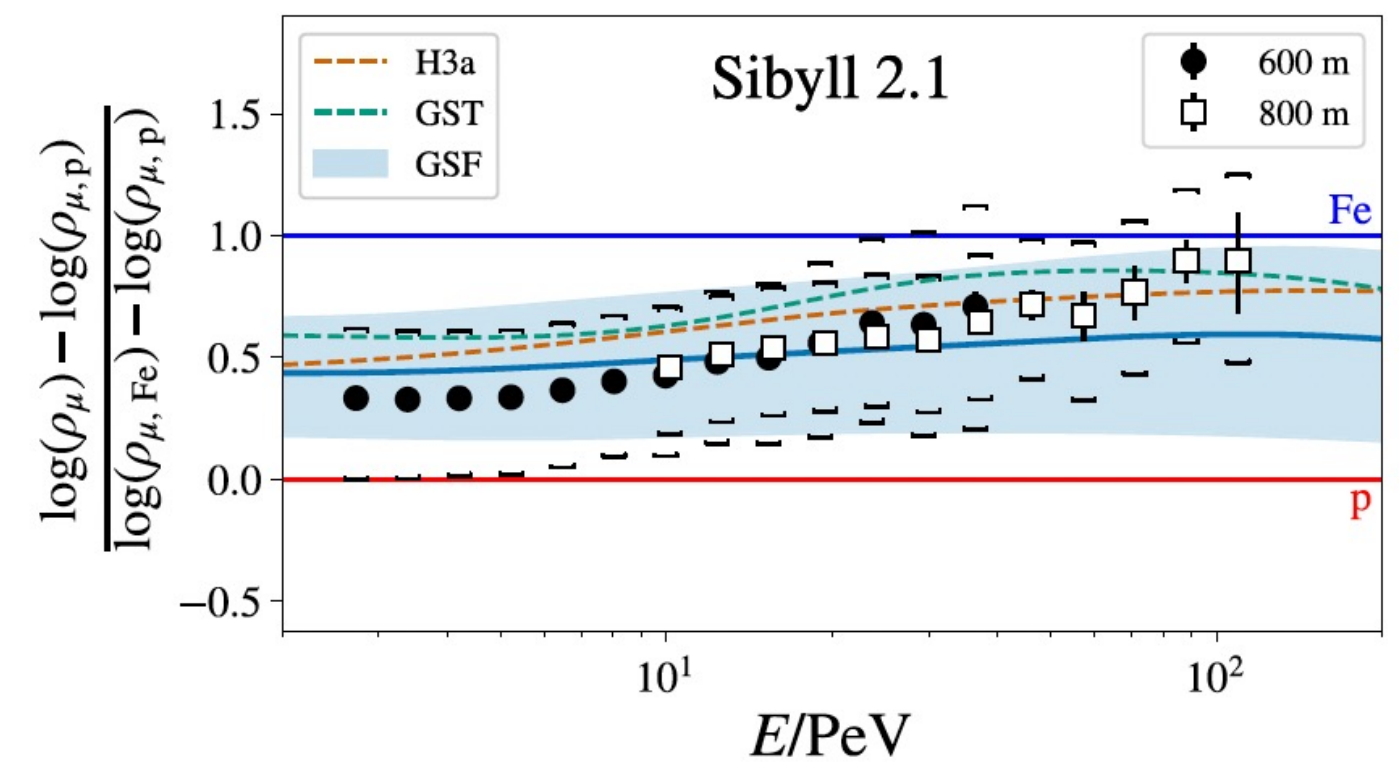
Muon densities compared to hadronic model predictions



The z-scale:

$$z = \frac{\log(\rho_\mu) - \log(\rho_{\mu,p})}{\log(\rho_{\mu,Fe}) - \log(\rho_{\mu,p})}$$

Proton: 0  
Iron: 1

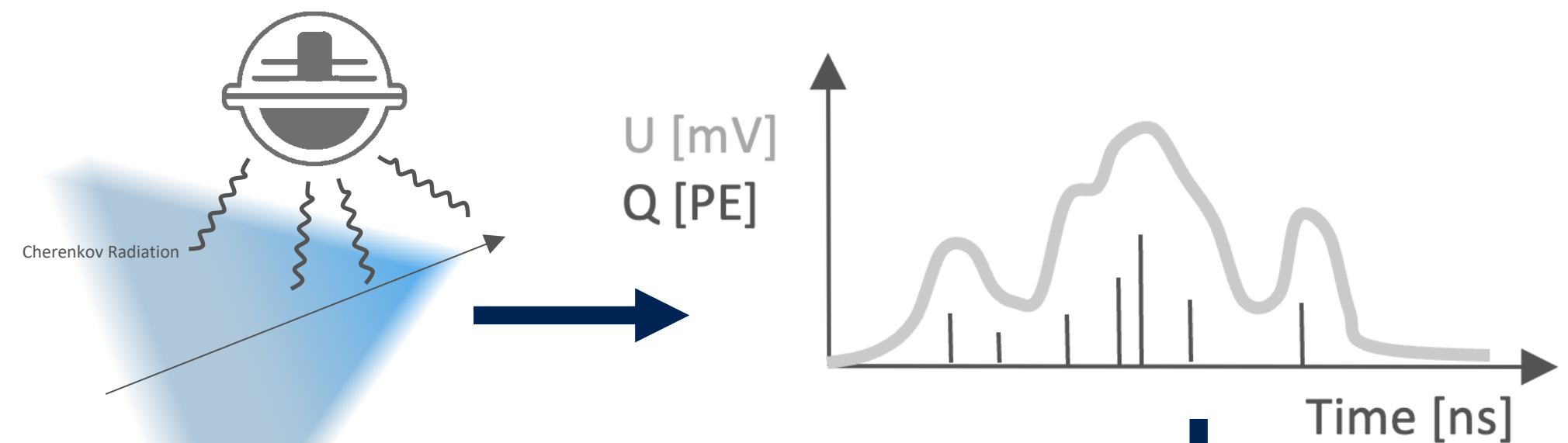
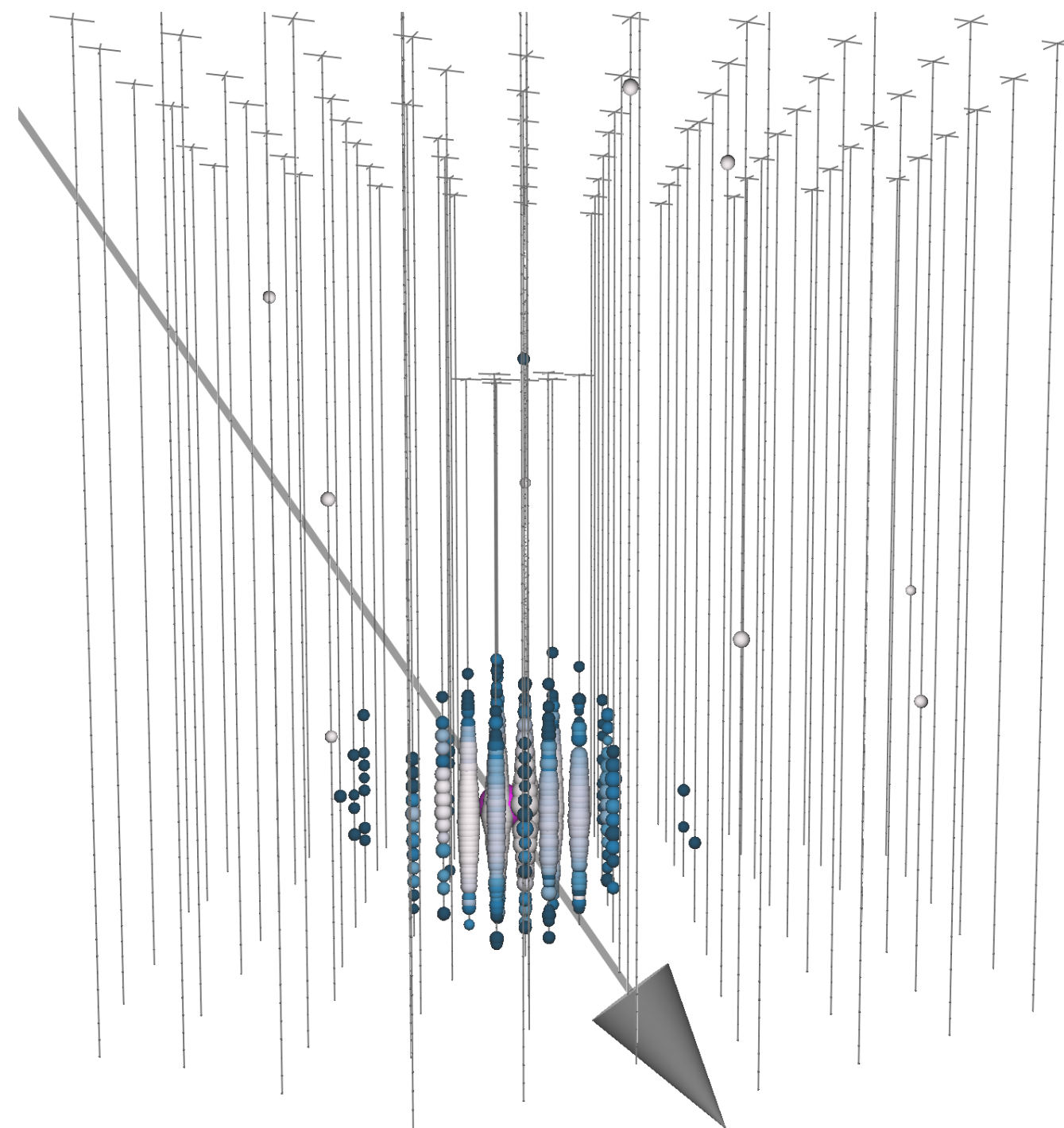


- Comparison of measured data to different flux model predictions
  - Best data/MC agreement for Sibyll 2.1
  - EPOS-LHC and QGSJet-II.04 yield very light masses



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# NEUTRINO EVENT RECONSTRUCTION



$$\mathcal{L}(\vec{x}|\vec{\theta}) = \prod_i p(x_i|\vec{\theta})$$



Event reconstruction:

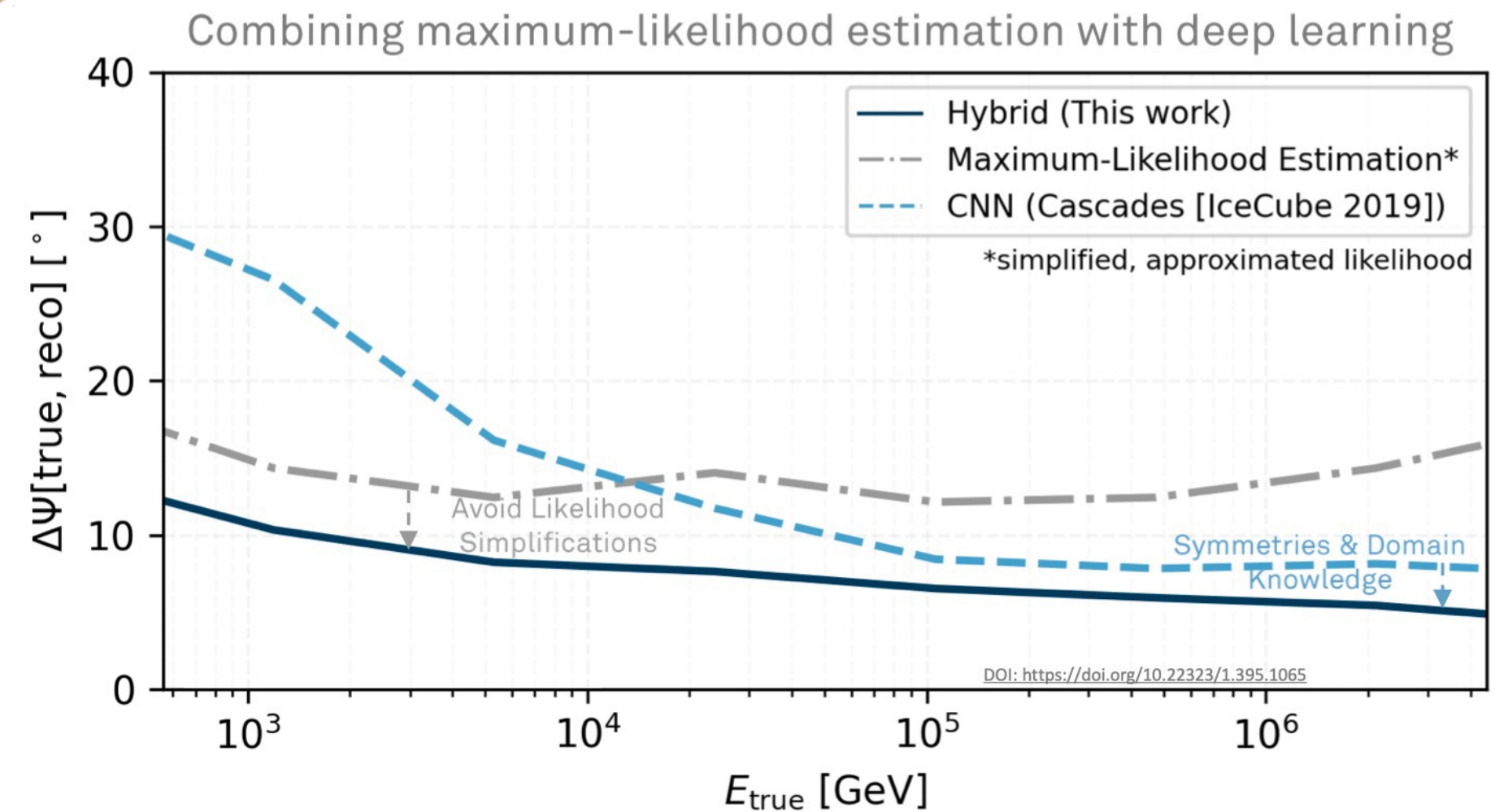
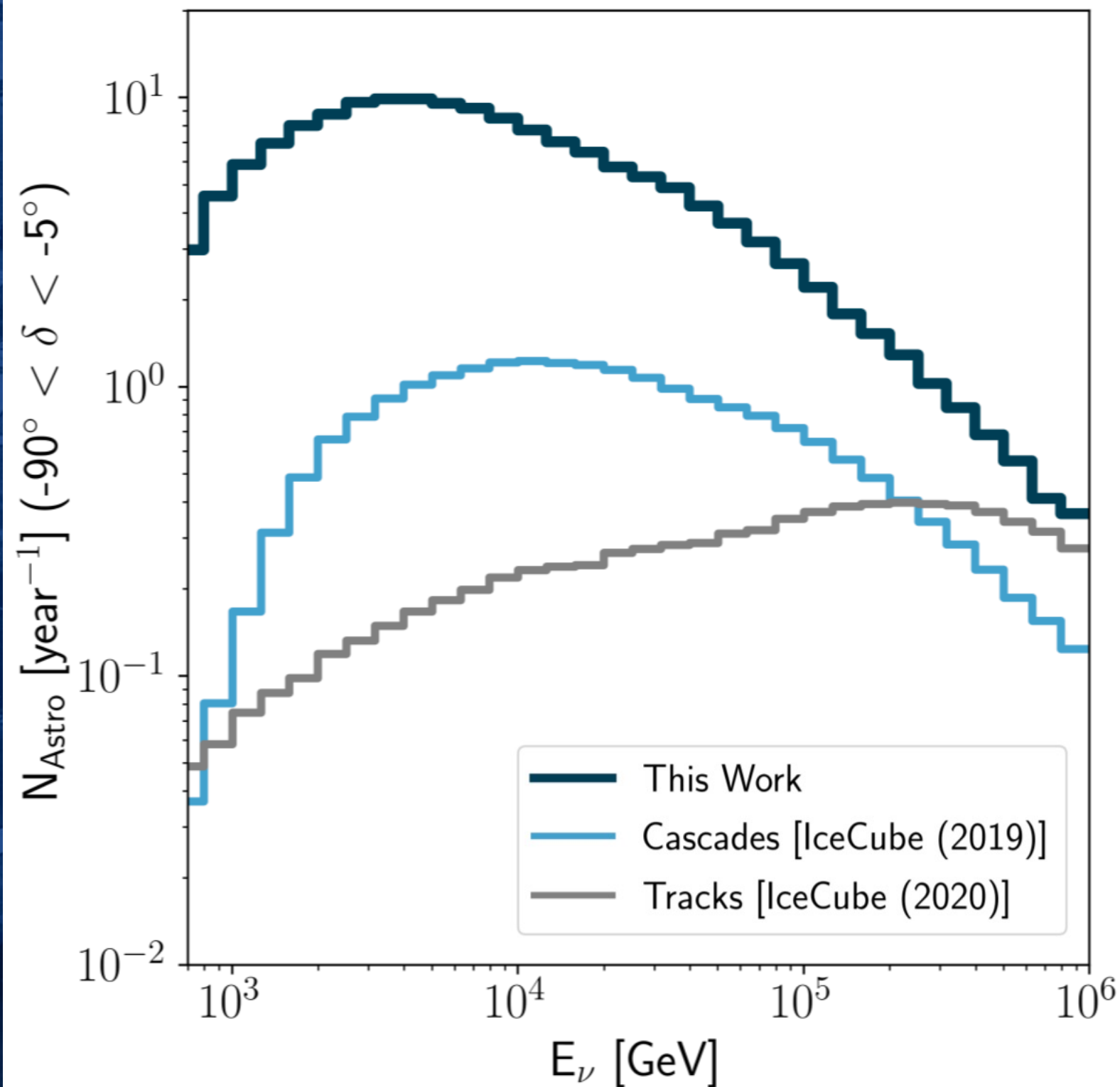
- Neutrino events are characterized by their energy and direction
- Properties are inferred from observed light pattern in detector





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# RECENT NEUTRINO RECONSTRUCTION IMPROVEMENTS



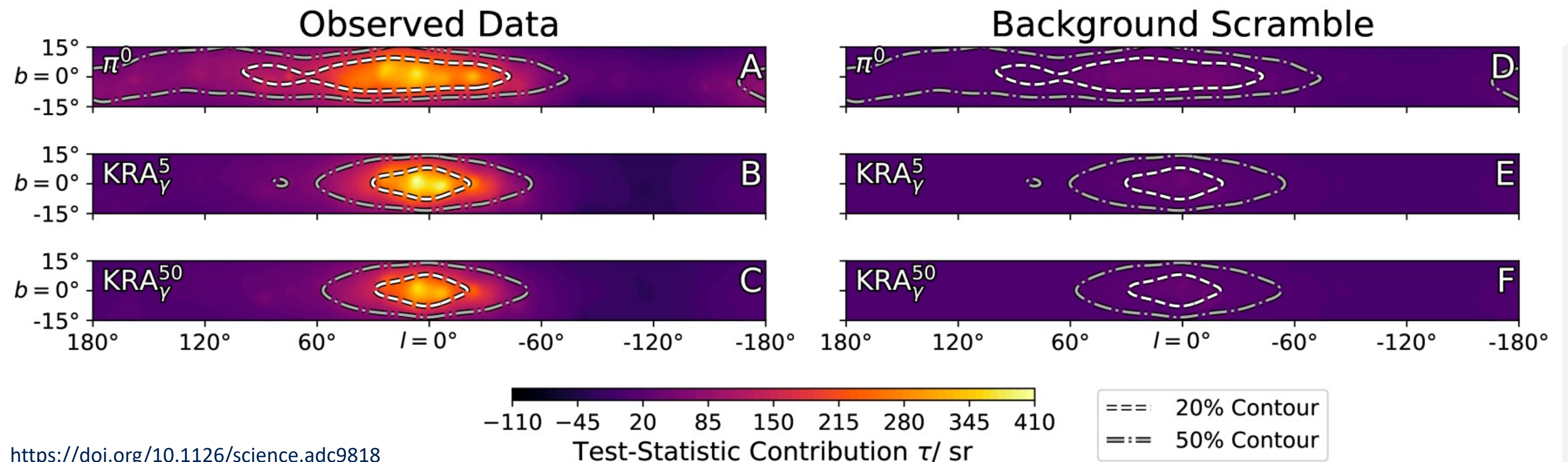
- Improvements due to novel machine learning:
- Improved reconstruction resolution over the entire energy range
  - 30 times as many events
  - Analysis sensitivity improved by a factor of 3

The equivalent of 75 years of detector lifetime and > \$500 million



# GALACTIC NEUTRINO SEARCHES

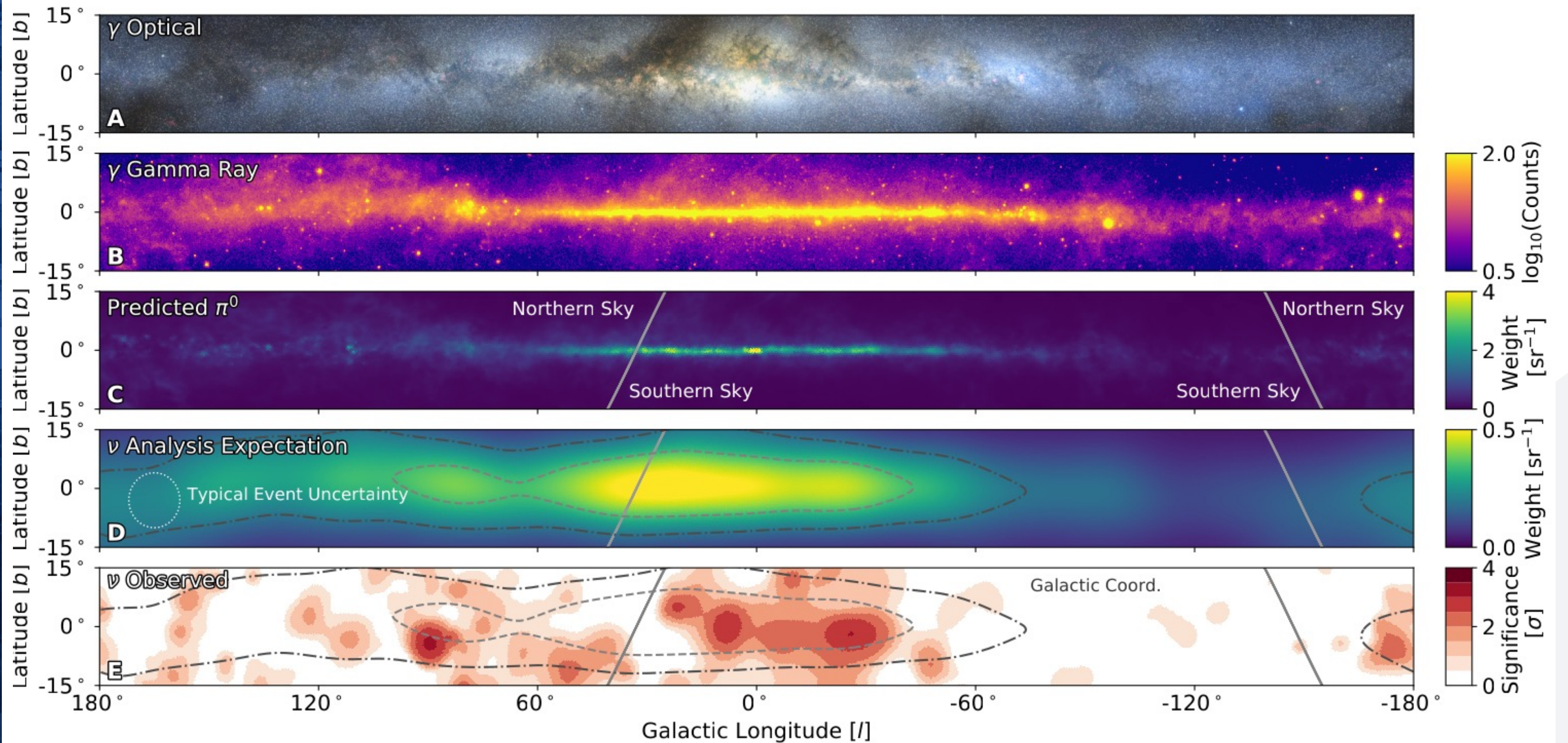
- Evidence for neutrino emission from the galactic plane
  - Global significance:  $4.5\sigma$
  - $3\sigma$  significance from stacking catalogs
- Data-driven background estimation





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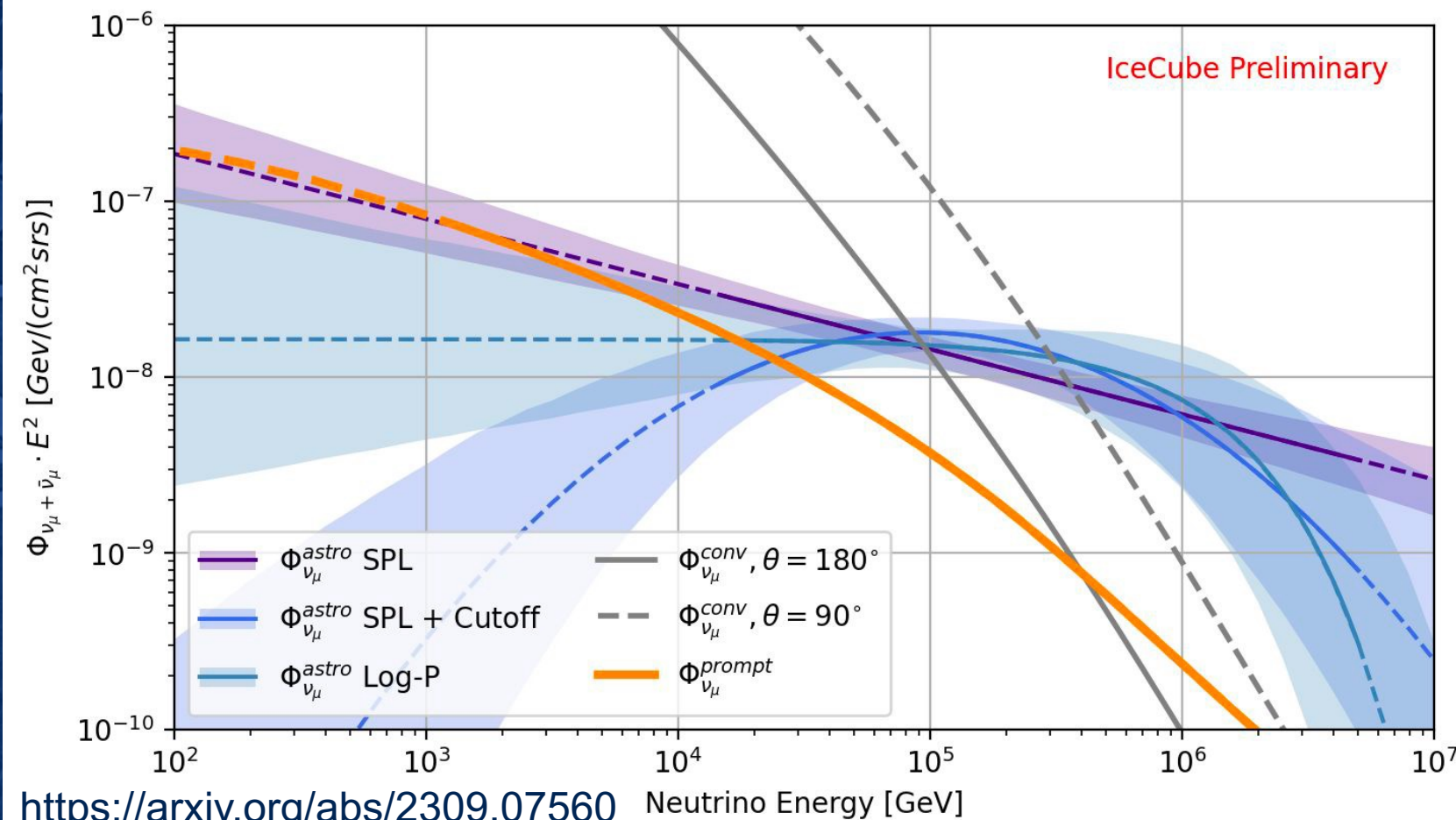
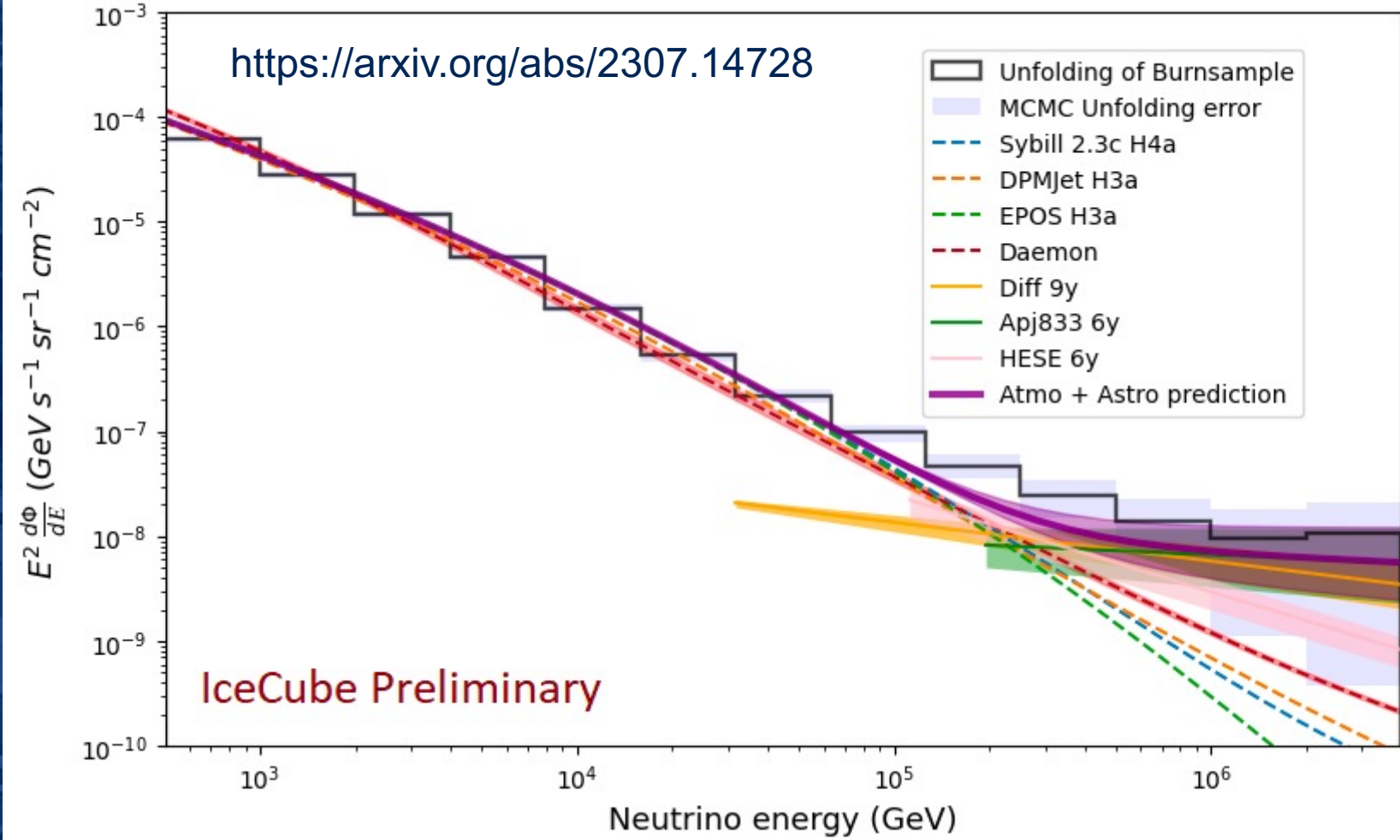
# GALACTIC PLANE NEUTRINO EMISSION



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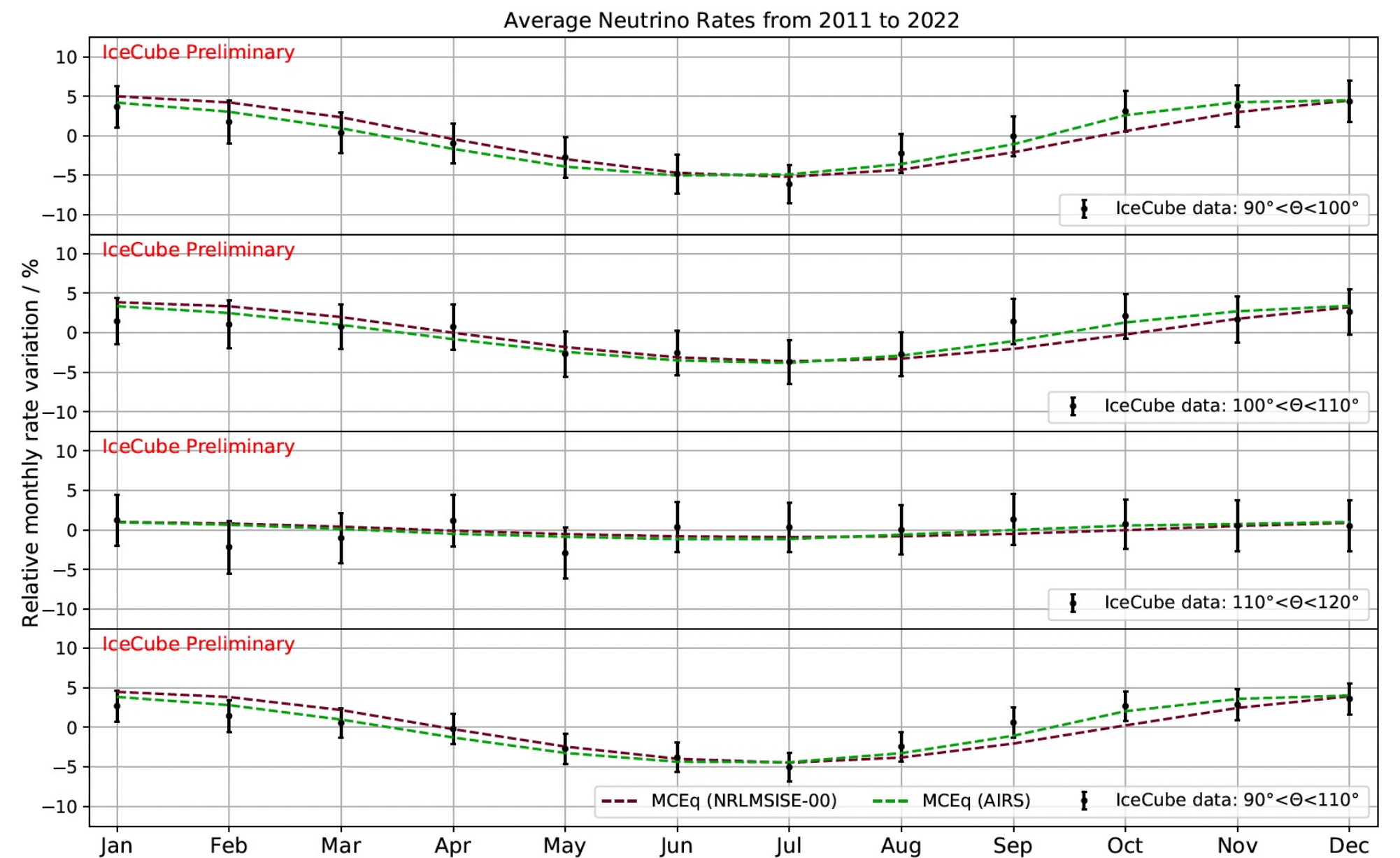
<https://doi.org/10.1126/science.adc9818>

# NEUTRINO FLUX MEASUREMENTS



Comparison of measured atmospheric neutrino flux to model prediction

- Measurement of the neutrino flux
- Measurement of the prompt muon production
- Measurement of seasonal variation in the neutrino flux

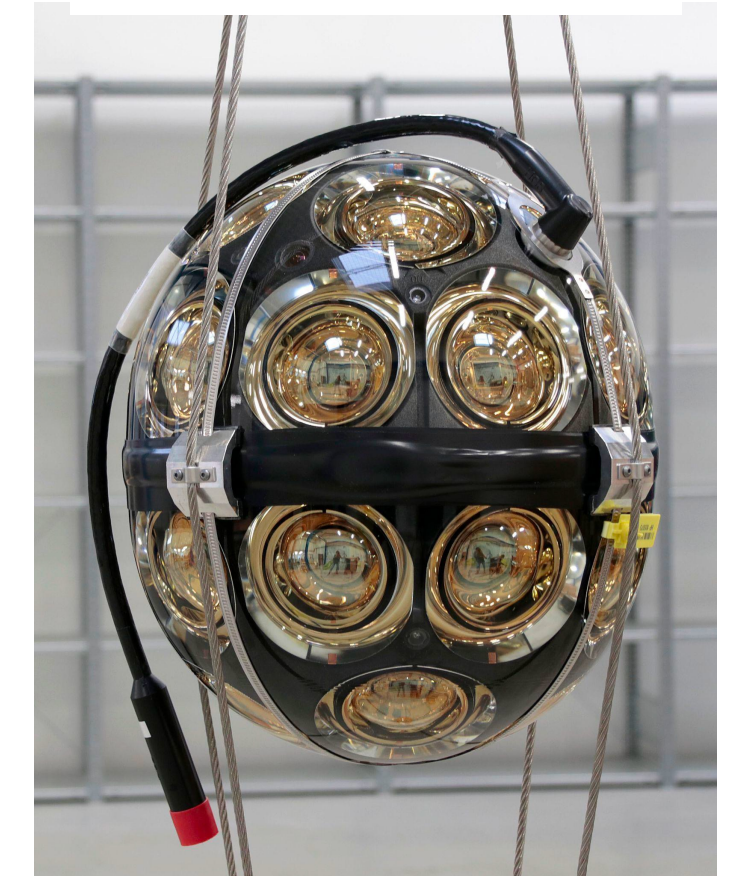
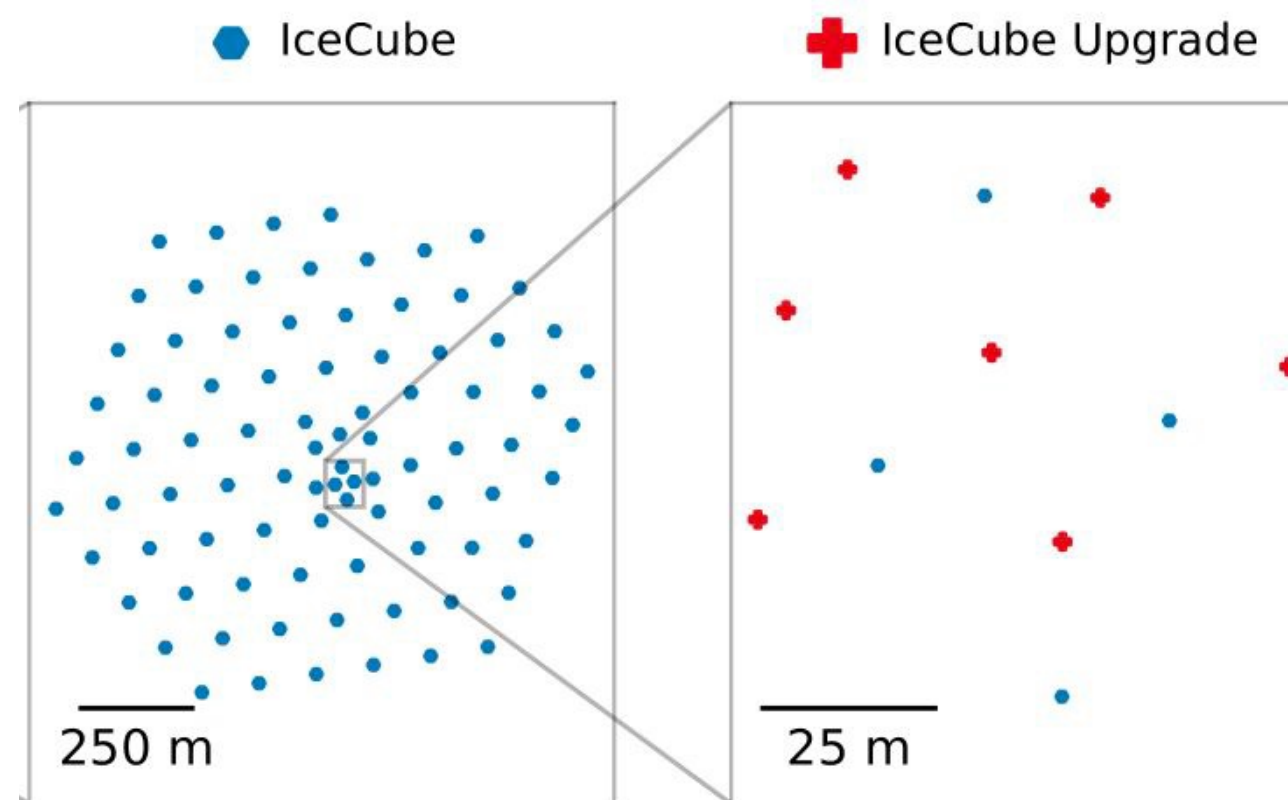




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# NEXT STEP IN DETECTOR EVOLUTION

Multi-PMT DOMs



IceCube Upgrade (scheduled deployment 2025/26)

- Denser optical array by 7 additional strings
- 1 GeV min. energy for neutrinos
- R&D for IceCube-Gen2
- Improve calibration to decrease detector systematics
- Oscillation physics

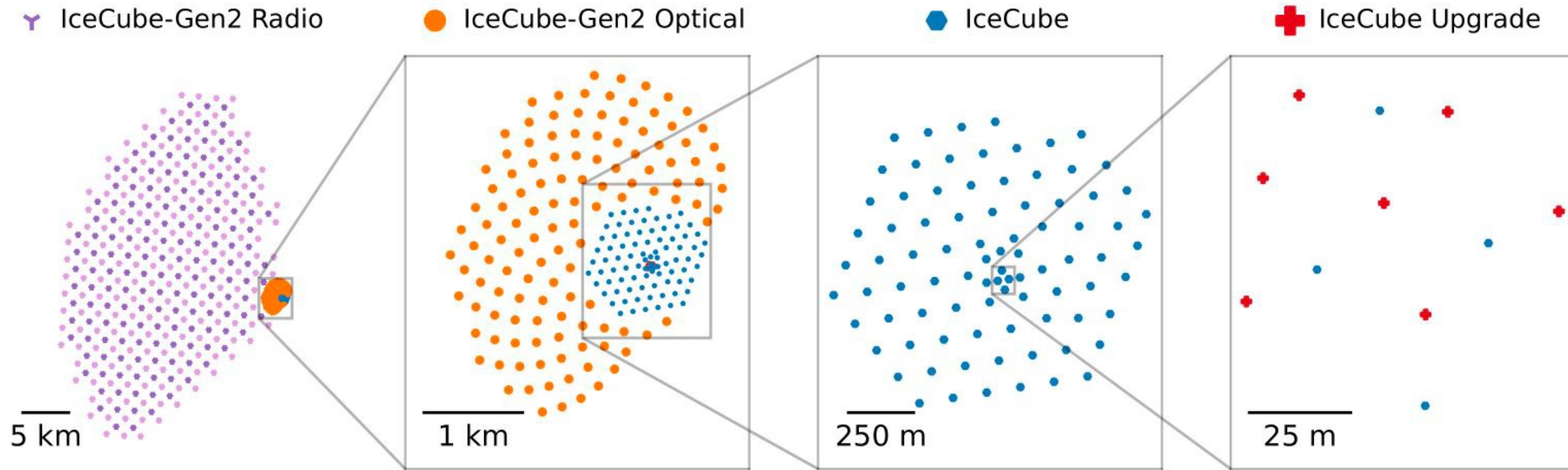
D-Eggs



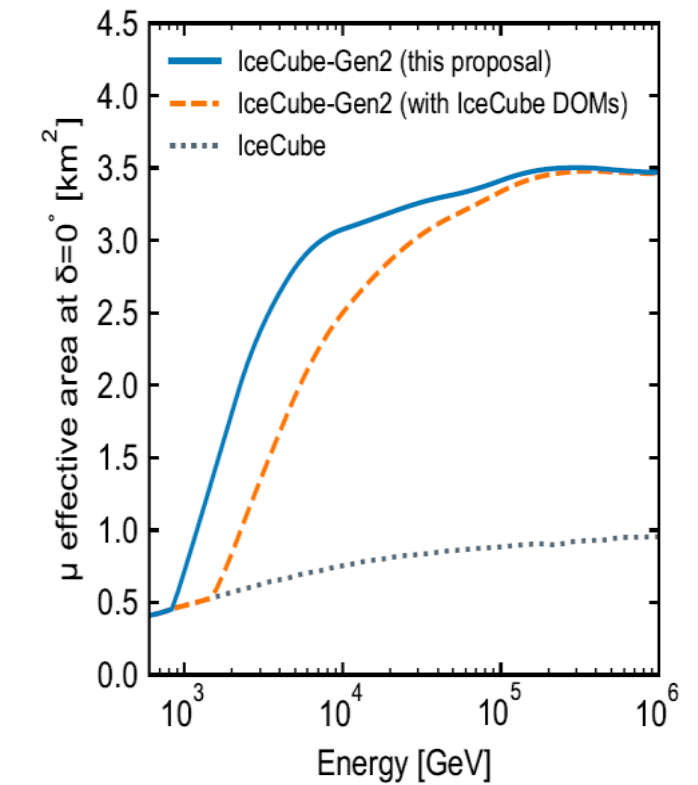


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# ICECUBE-GEN2

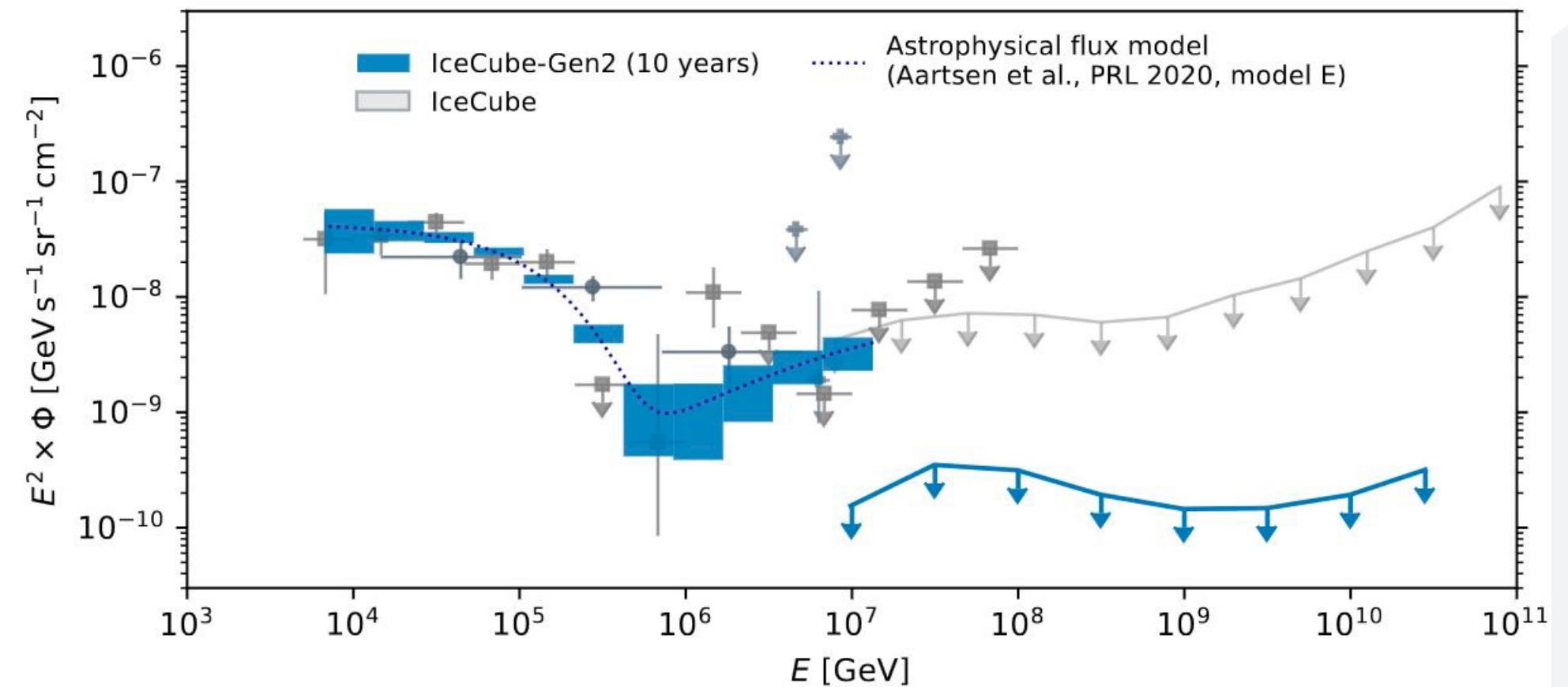


IceCube-Gen2 TDR



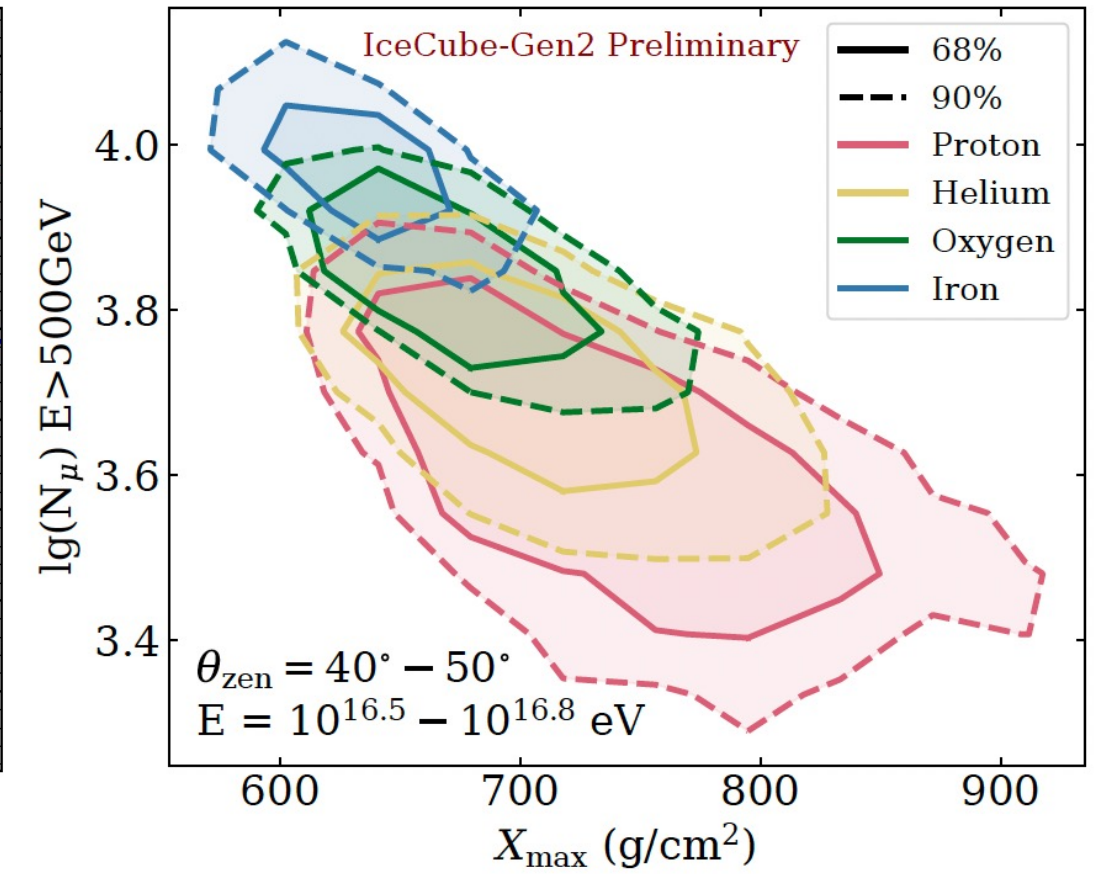
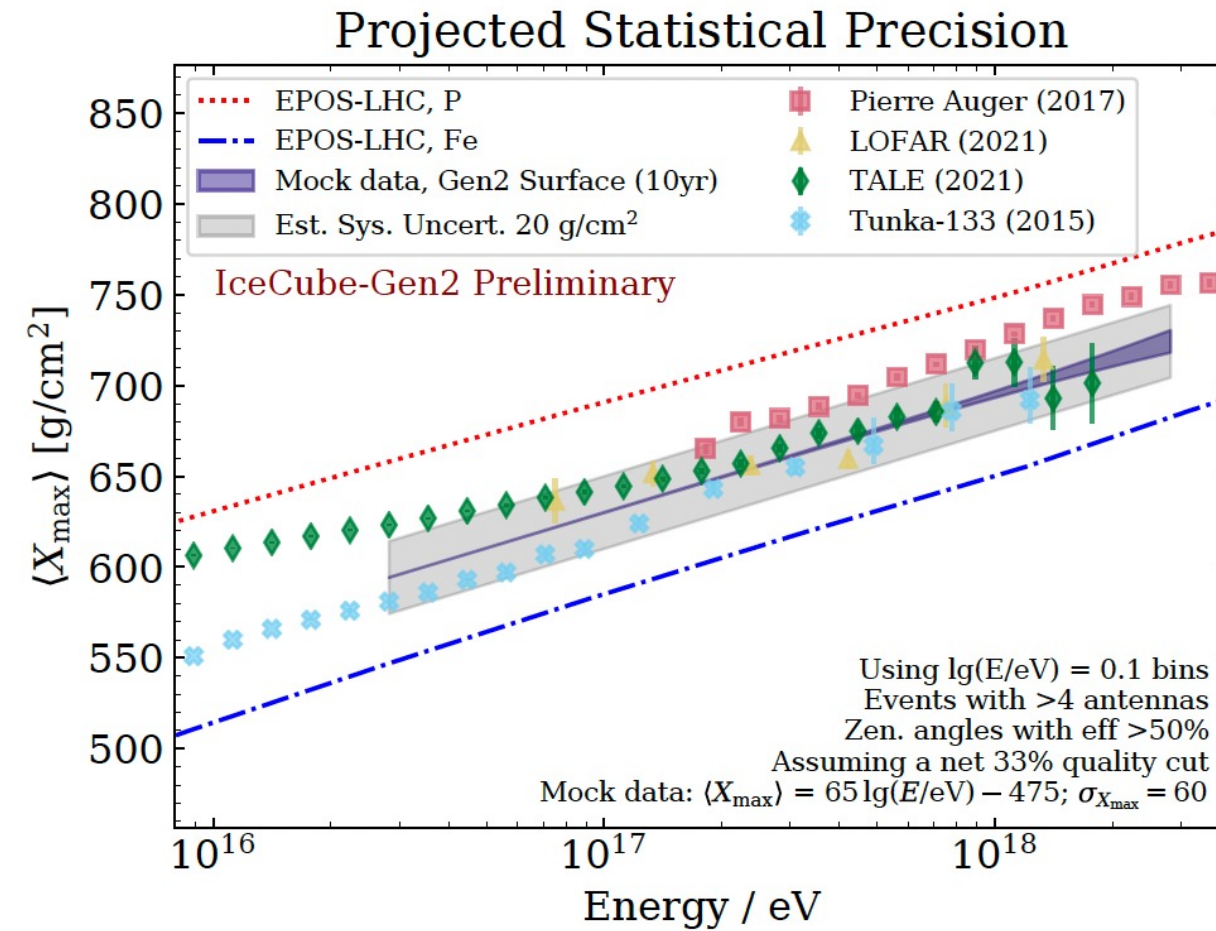
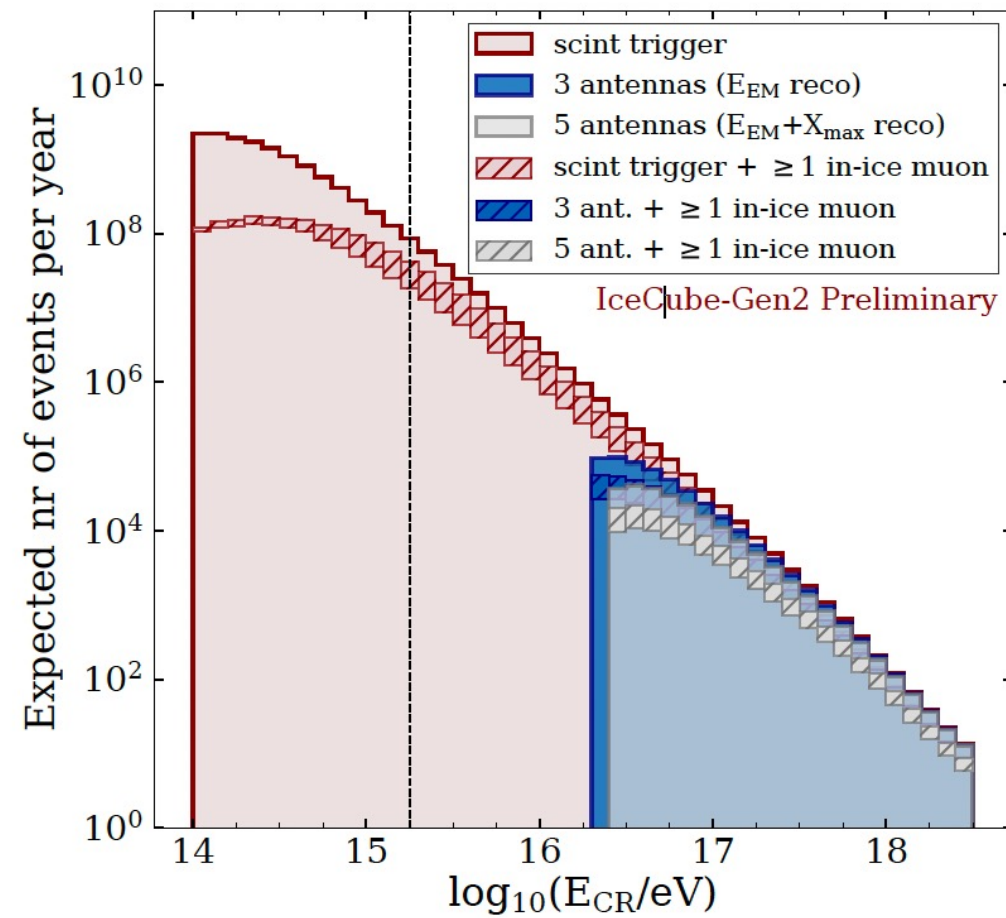
IceCube-Gen2 TDR

- Increase effective volume
- Increase upper energy threshold
- Measure flux of high-energetic neutrinos above PeV energies
- Improve sensitivity to astrophysical neutrino sources by factor of ~5





# ICECUBE-GEN2 SURFACE-ARRAY



- Radio antennas will be sensitive starting at 30 PeV, and will set energy scale and provide  $X_{max}$  measurements
- About 25% of detected air showers will have associated in-ice signals to study the high-energy air shower content
- High statistics for more anisotropy measurements



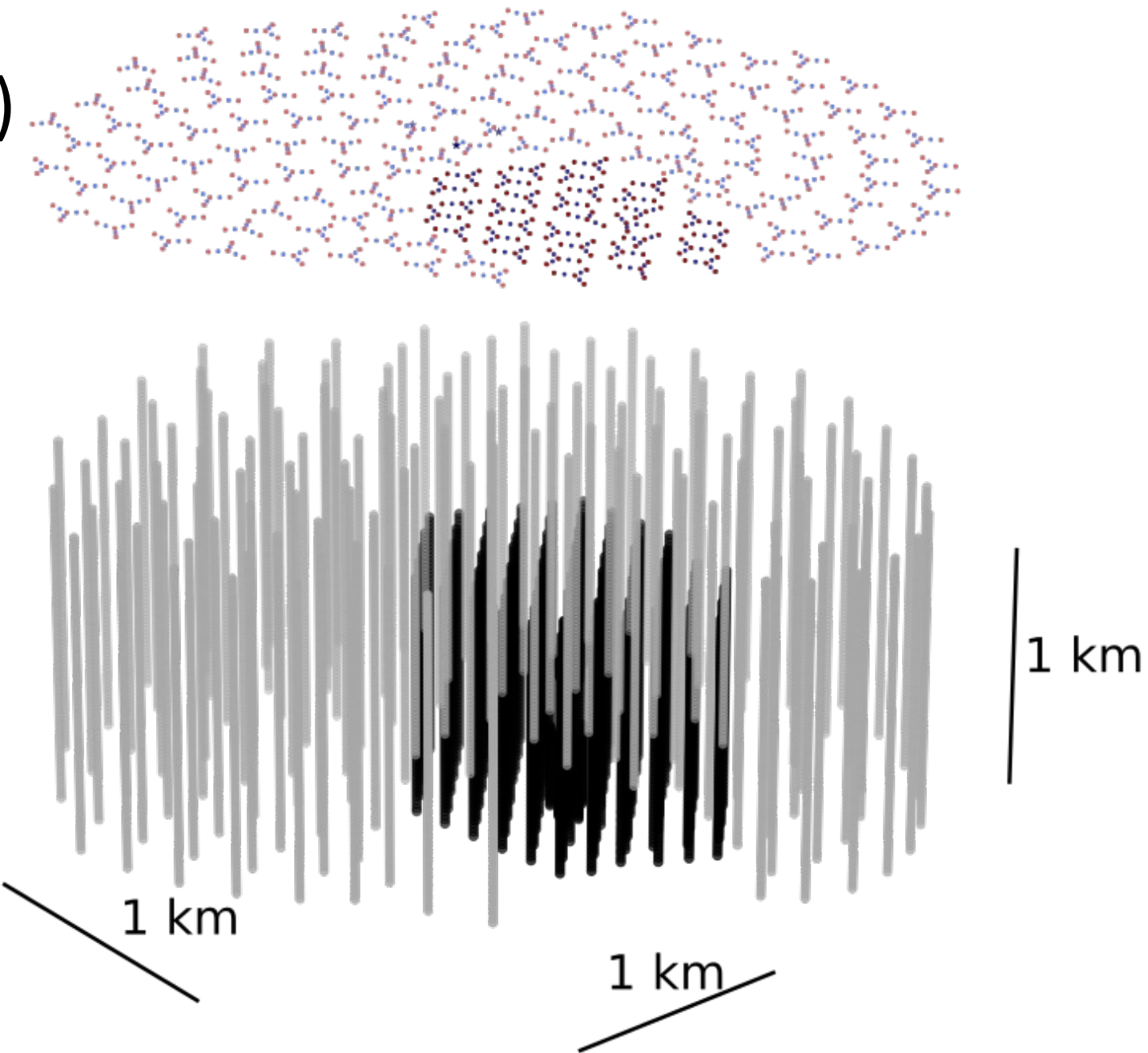
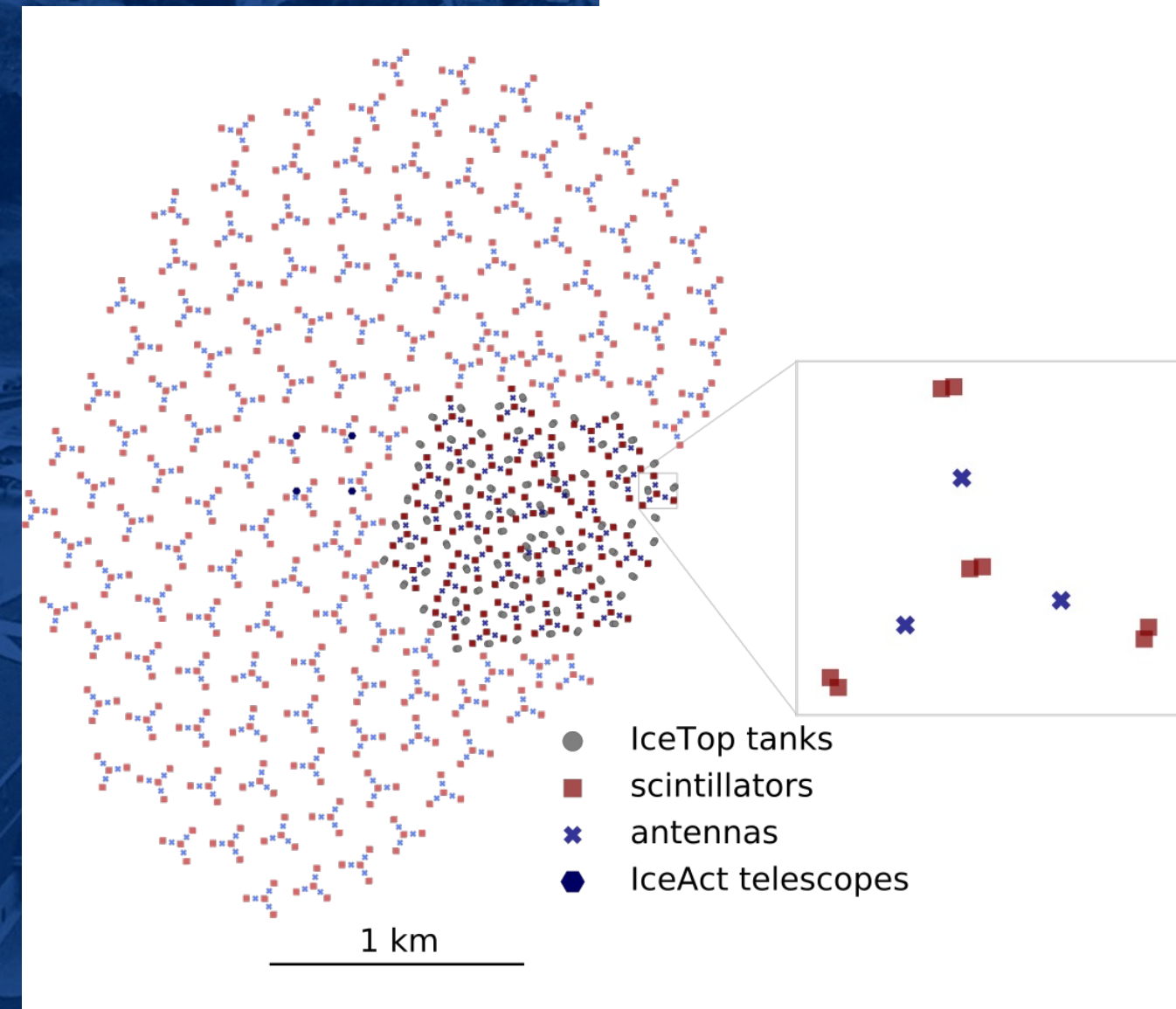
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# ICECUBE-GEN2 NUMBERS

IceCube-Gen2 TDR

## IceCube-Gen2 (IceCube) numbers

- Area:  $\sim 6.5 \text{ km}^2$  (0.9)
- Instrumented depth: 1.26 km (1.0)
- Instrumented volume:  $8 \text{ km}^3$  (1.0)
- 9600 optical sensors (5160)
- 120 strings (86)



## Surface array number:

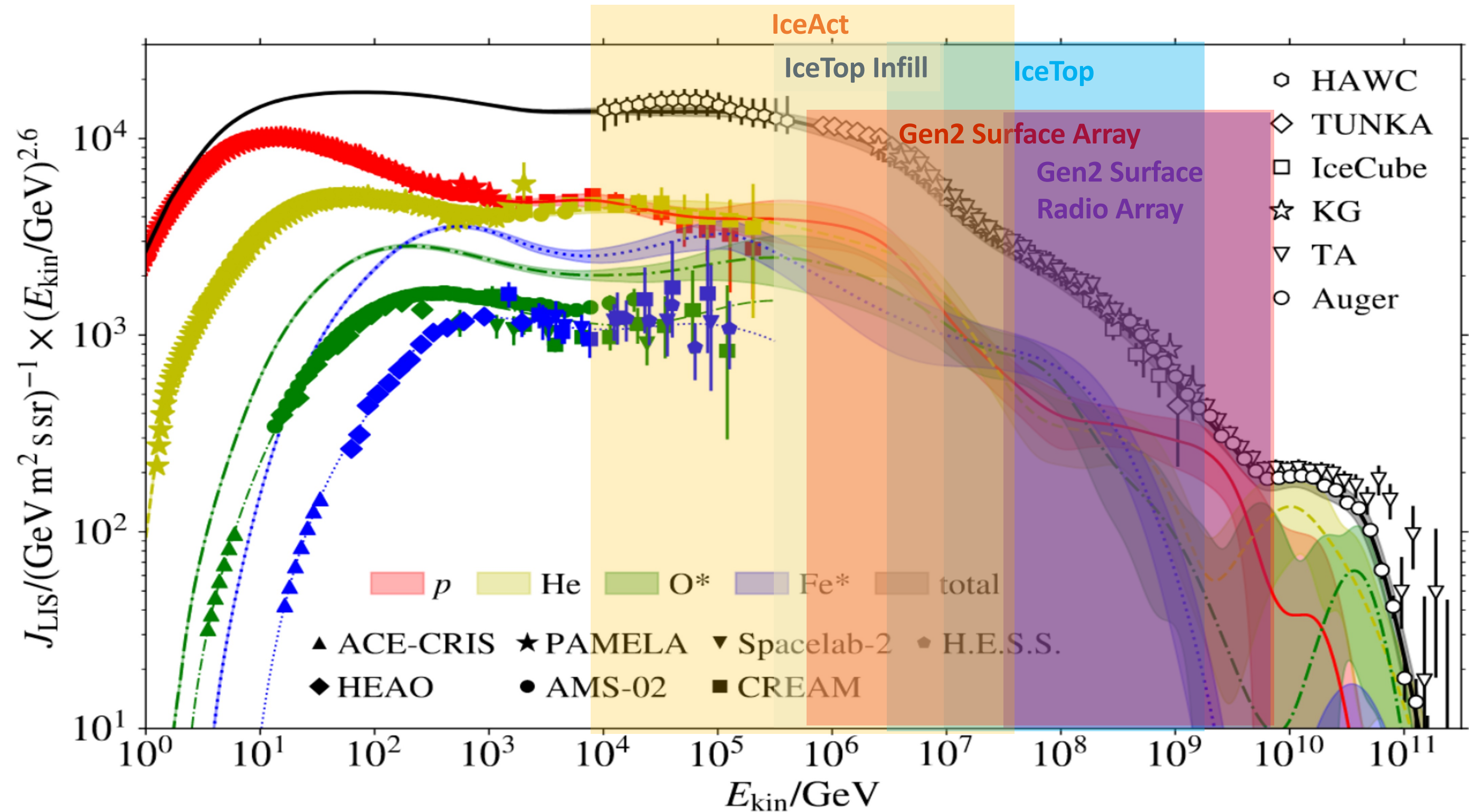
- 274 scintillator panels
- 102 radio antennas
- 4 IceAct station in Fly's eye configuration





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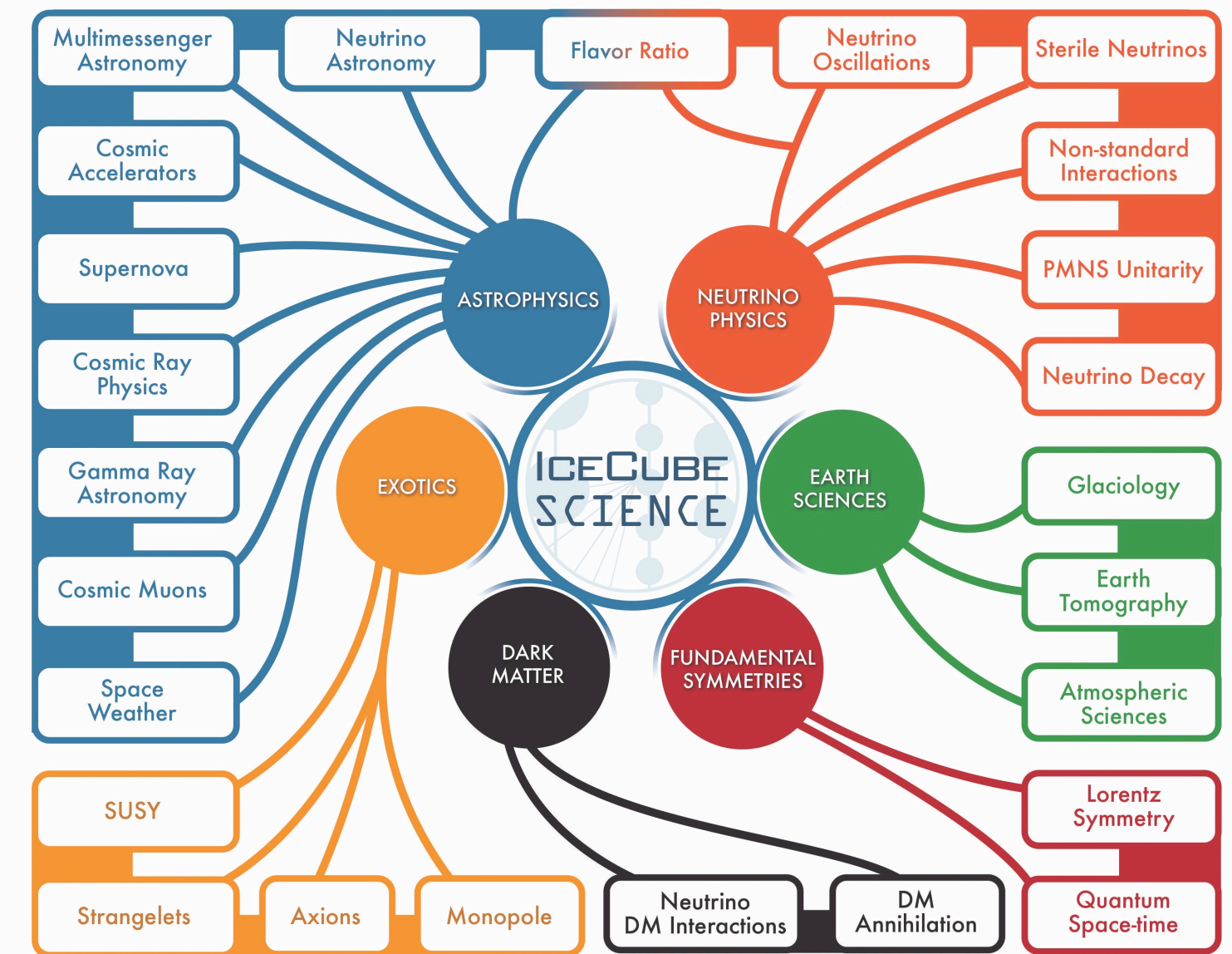
# CR ENERGY RANGE OF ICECUBE/ICETOP



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# SUMMARY

- IceCube Observatory is a versatile neutrino/cosmic ray observatory
- The combination of surface and deep in-ice detector allows unique studies of air shower physics from TeV to EeV
- In cosmic rays and air shower physics, we are measuring
  - Energy spectrum and mass composition
  - Anisotropy
  - Testing hadronic interaction models
- The first evidence of neutrino emission from the galactic plane was measured with  $4.5\sigma$
- IceCube Upgrade and IceCube-Gen2 will enhance the physics capabilities even further





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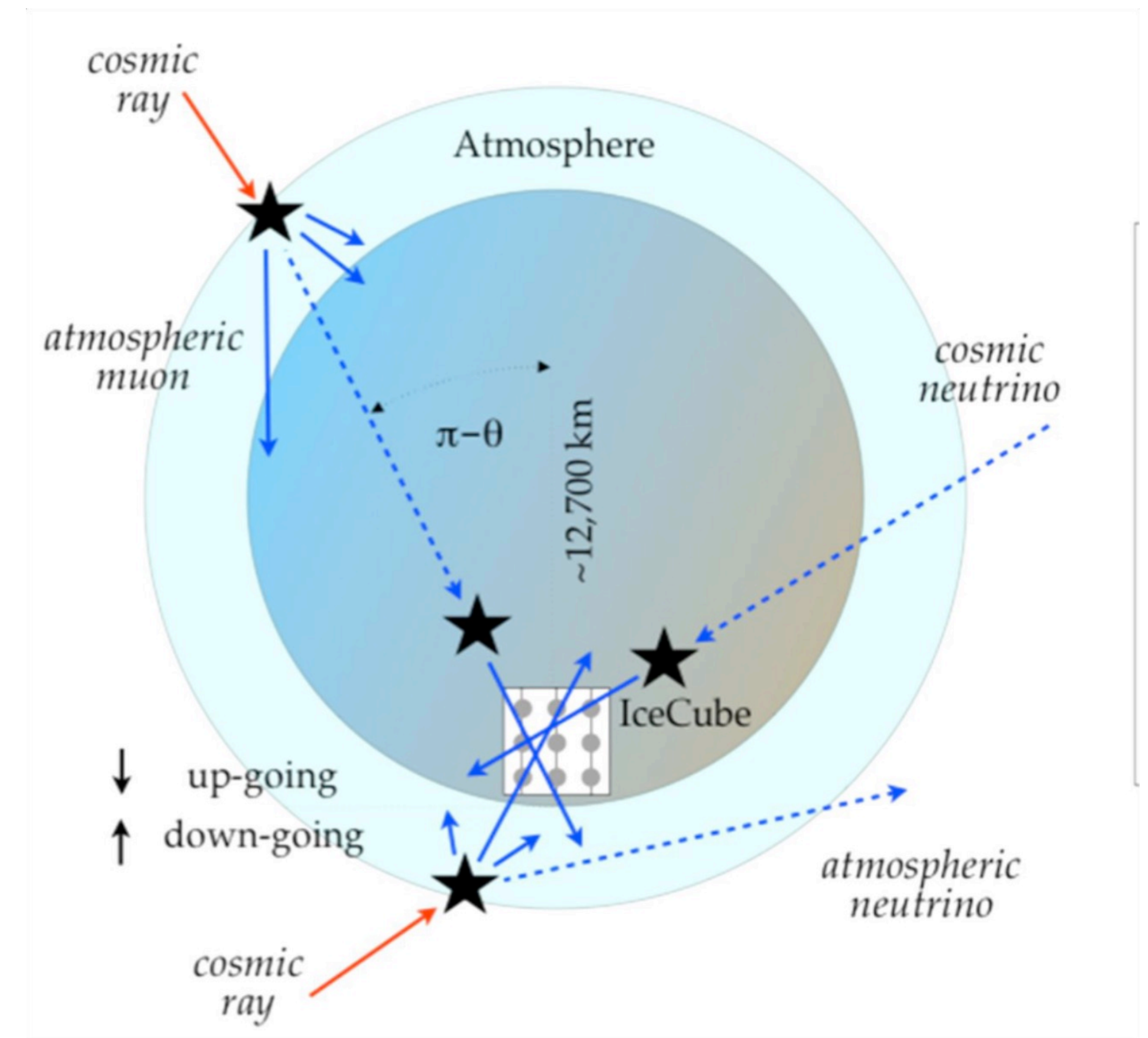
# BACKUP



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# NEUTRINO SIGNALS AND BACKGROUNDS

- Dominant signal:
  - Downgoing muons from cosmic rays interacting in the atmosphere
  - $\sim 2600/\text{sec}$  ( $\sim 10^{11}/\text{year}$ )
- Neutrino discriminators:
  - Upgoing (through Earth) or starting inside the array
  - $\sim 12/\text{hour}$  ( $\sim 10^5/\text{year}$ )
- Astrophysical discriminators:
  - Energy: Crossover  $\sim 100\text{TeV}$
  - Muon veto (starting events)
  - Spatial: Clusters/Catalogs
  - Time: Bunches/Multimessenger
  - 10s per month ( $\sim 100\text{s}/\text{year}$ )



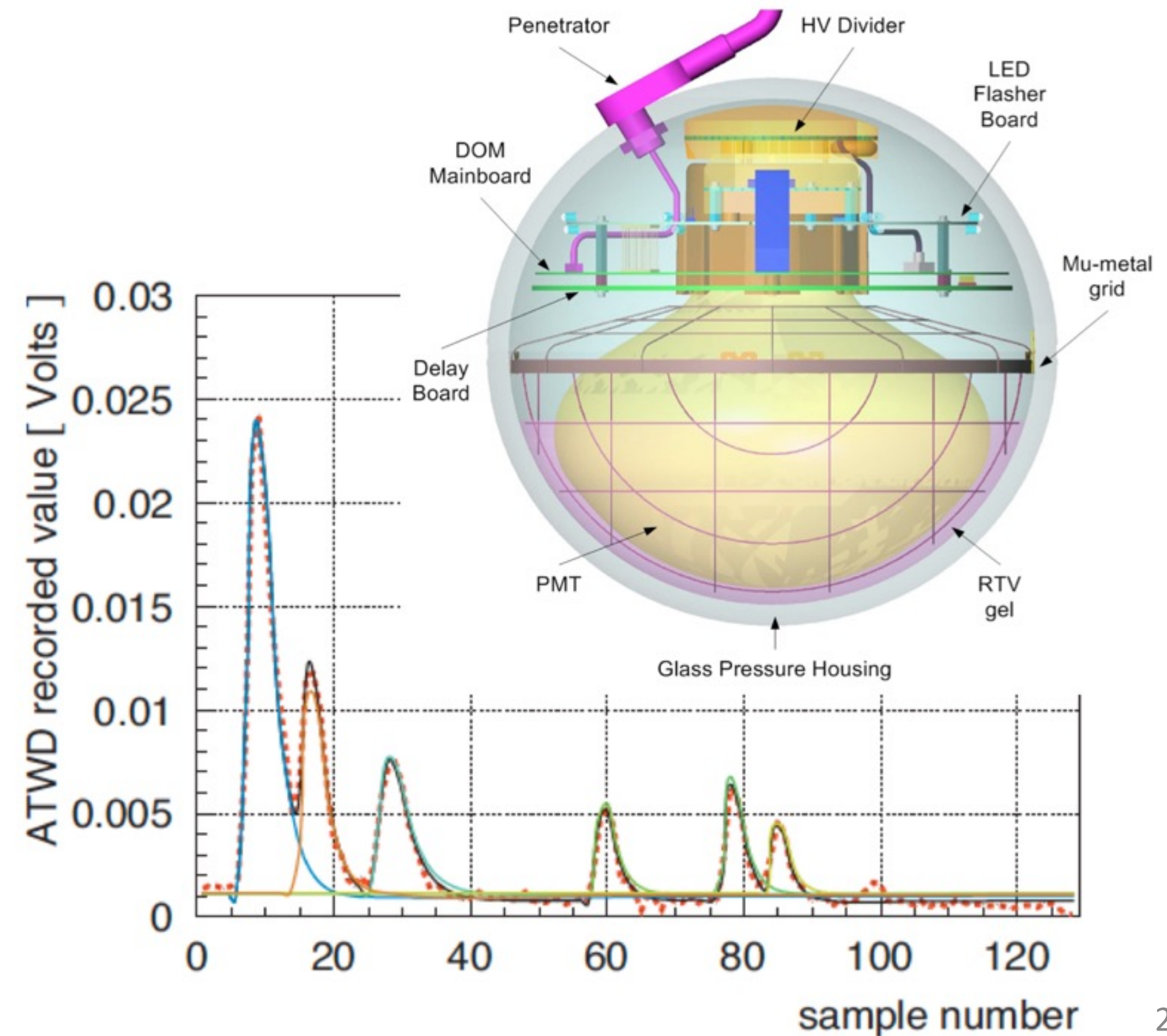
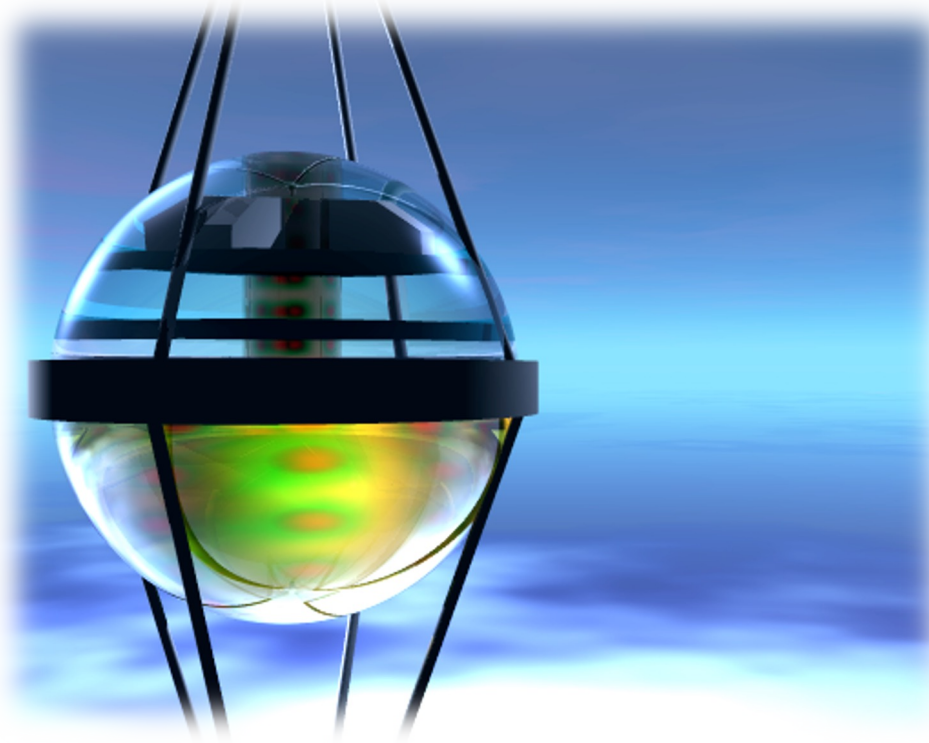


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# DIGITAL OPTICAL MODULE

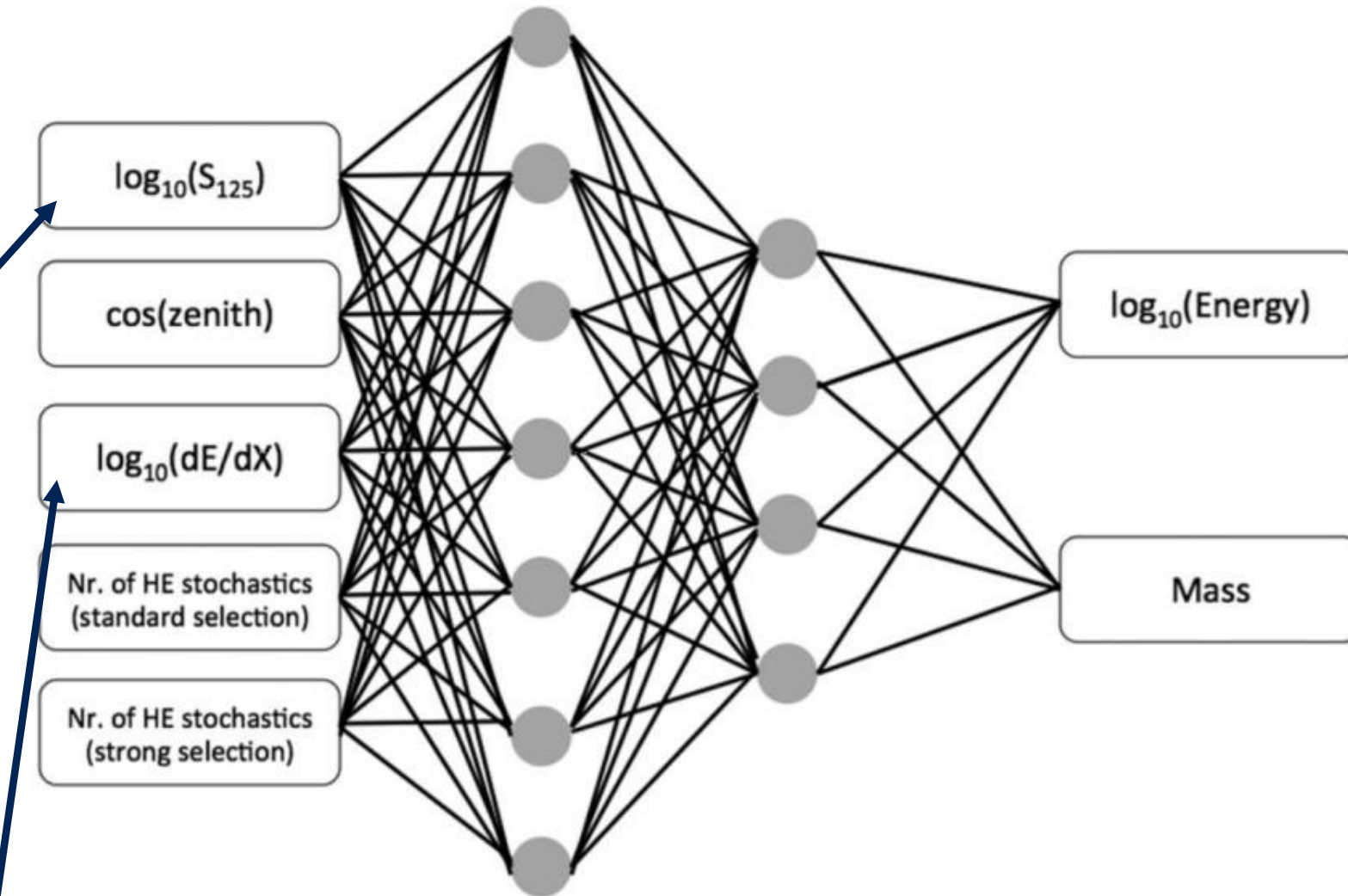
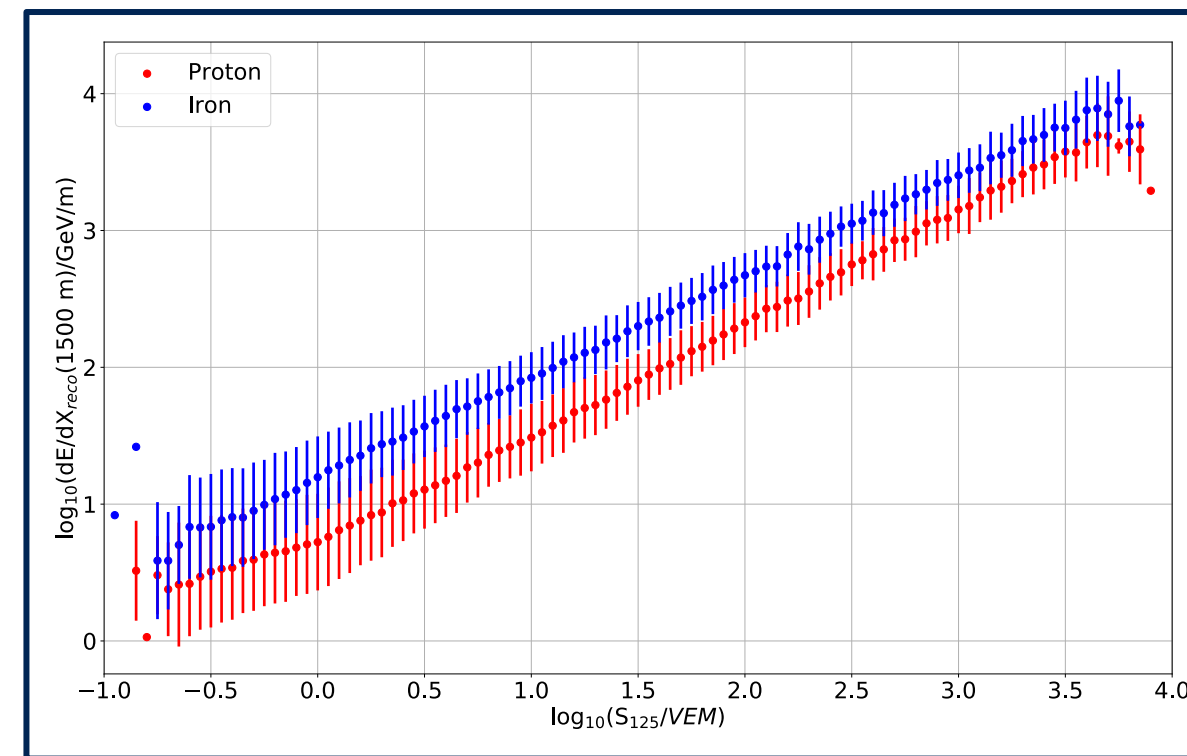
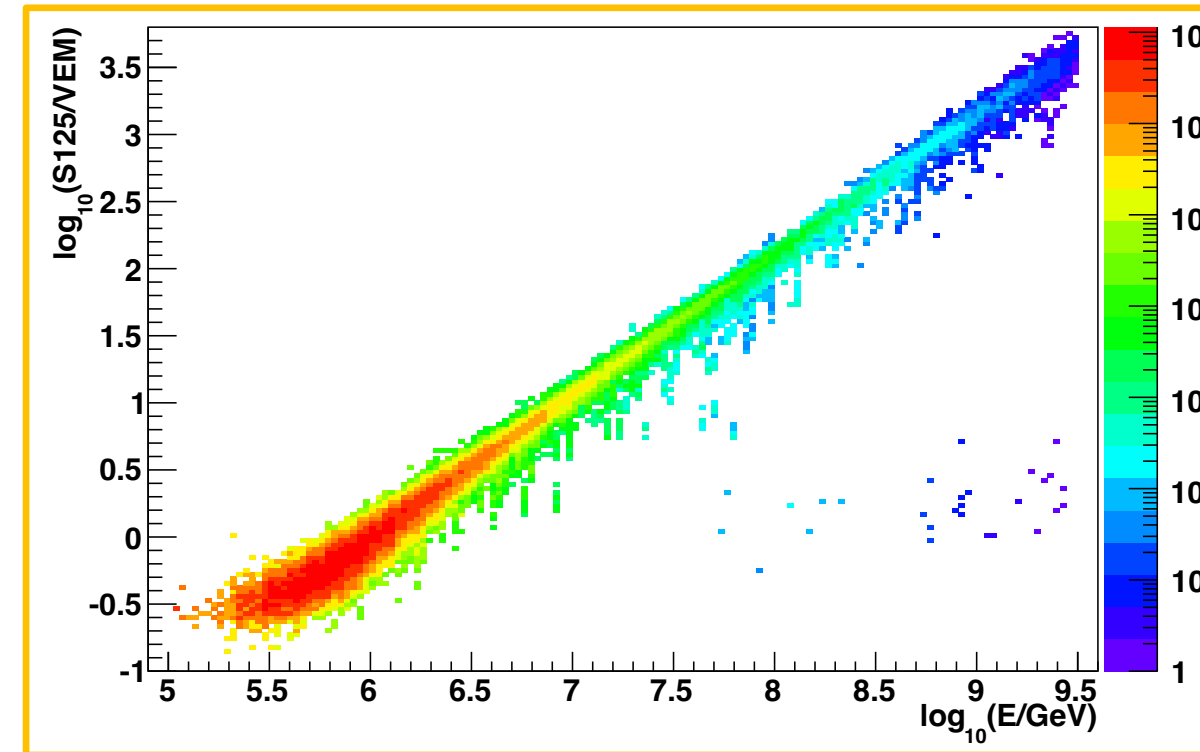
Each Digital Optical Module (DOM) operates independently

- collects light signal
- digitizes
- time stamp with 2 nanoseconds precision
- Send results to a computer on the surface for further reconstruction

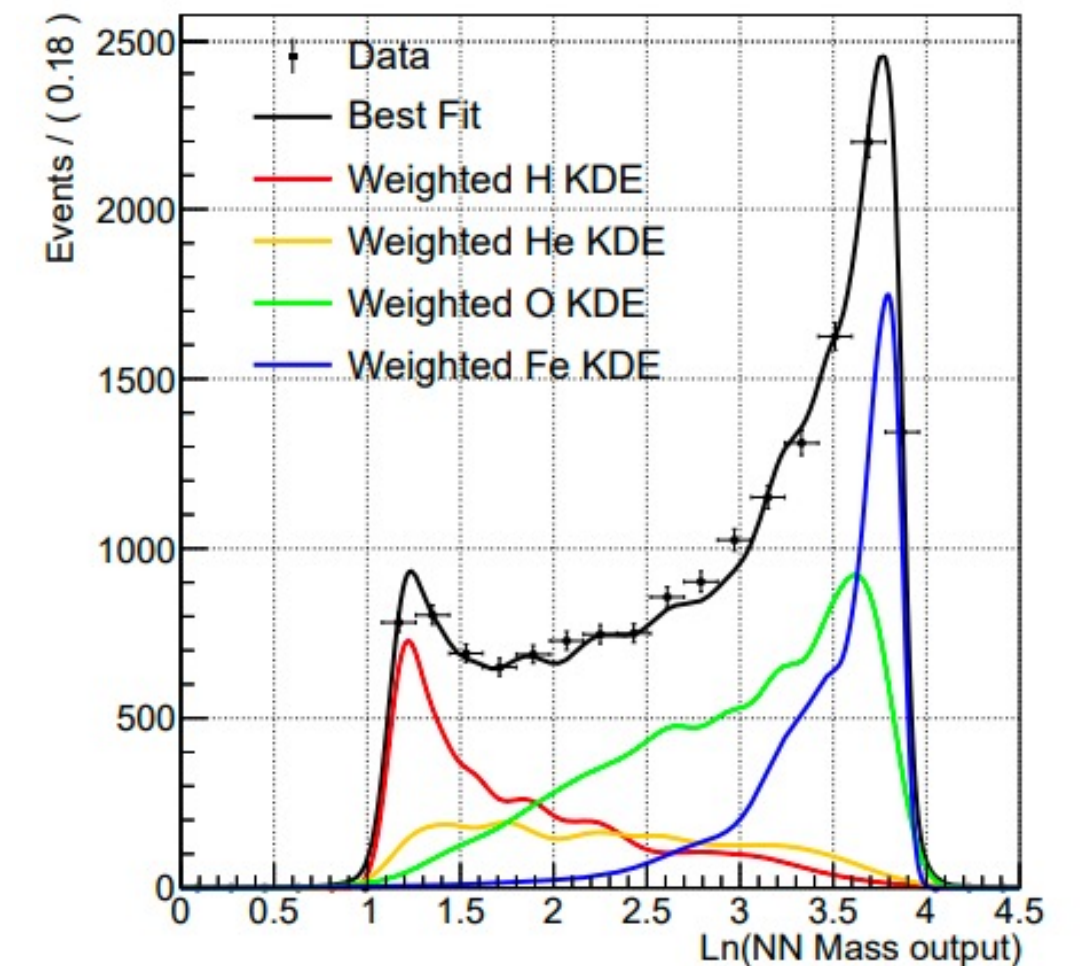


# ICETOP-ICECUBE MASSCOMPOSITION

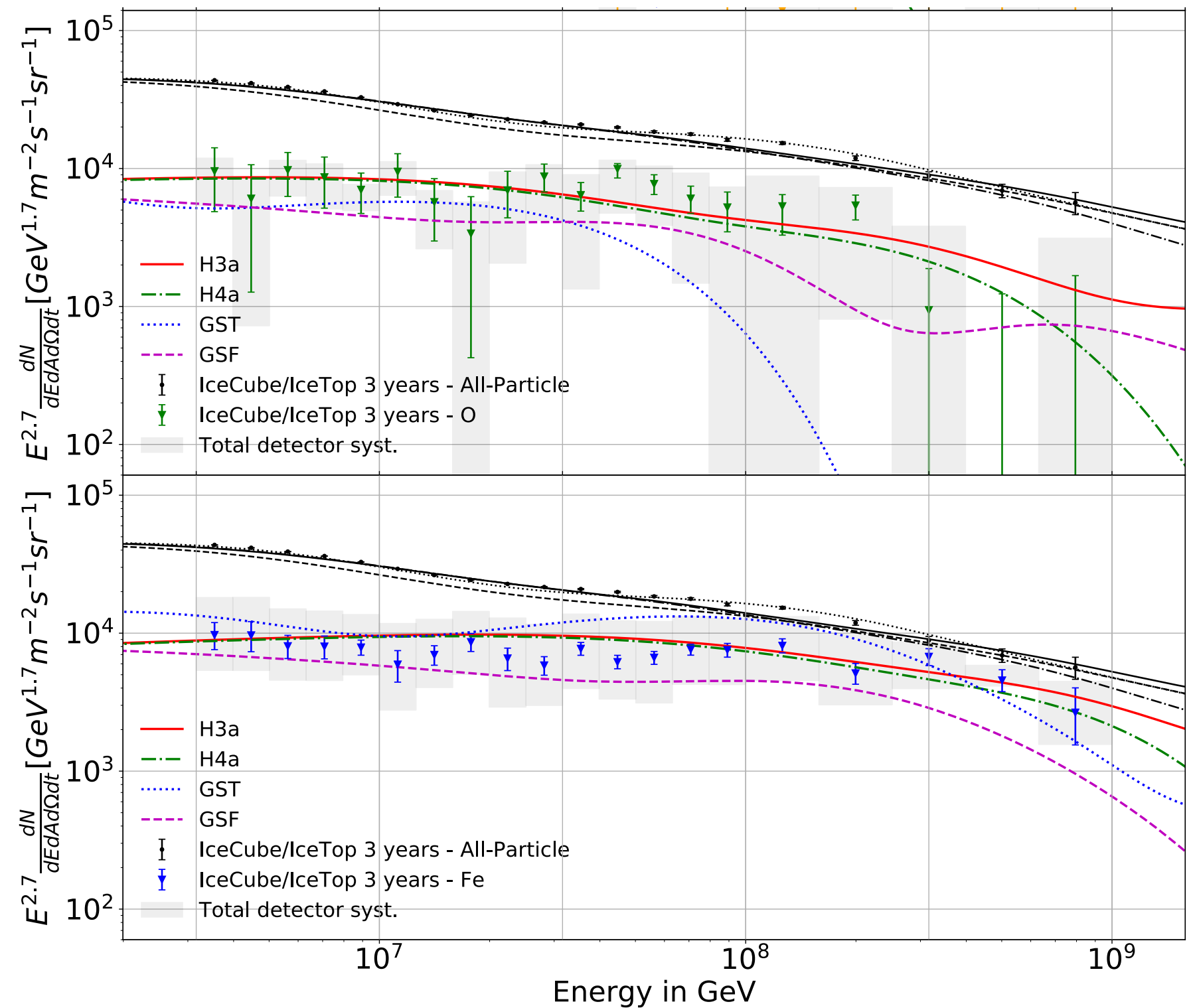
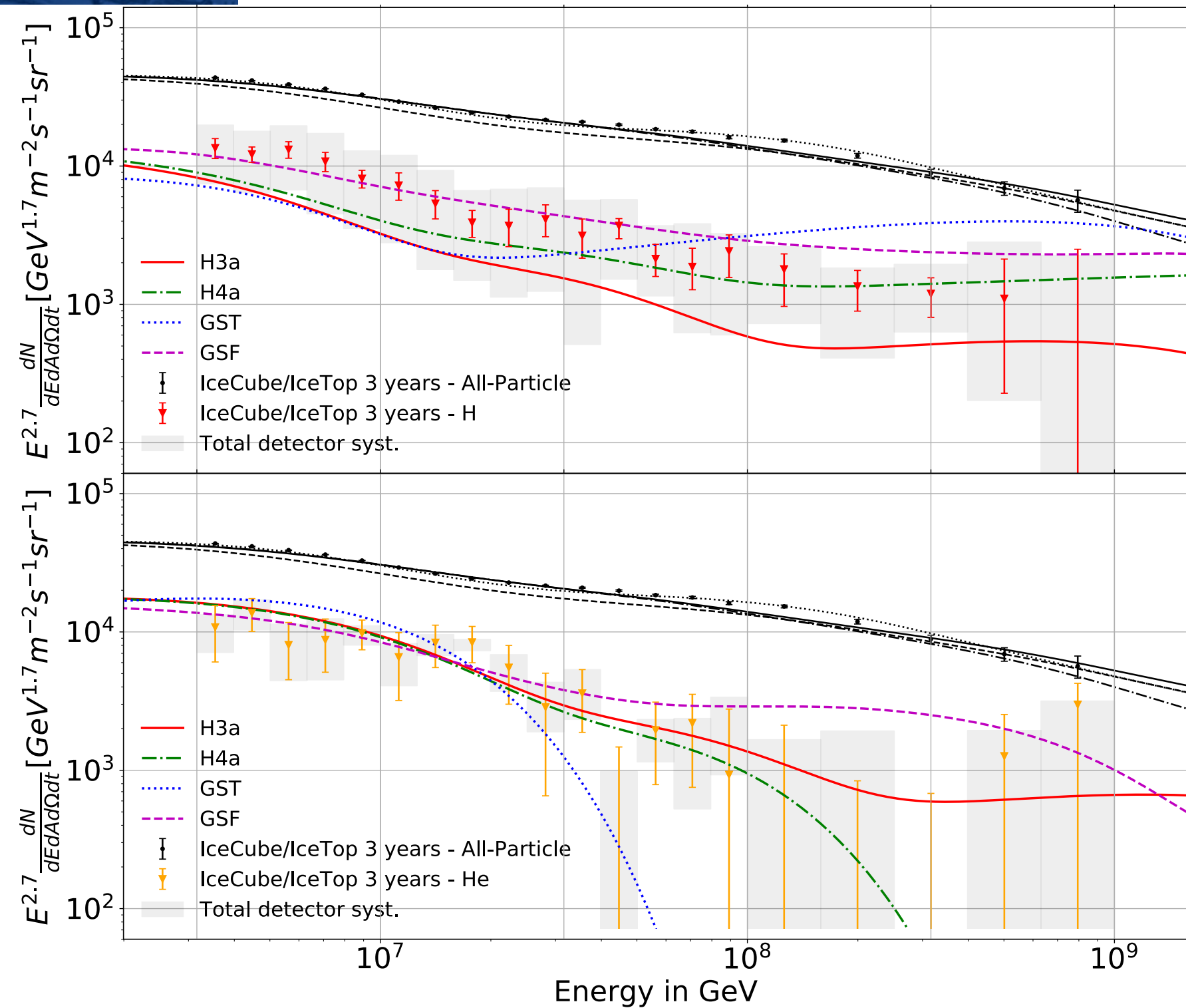
- Data 2011-2013
- $\text{Log}(E/\text{GeV}) = 6.5 \dots 9.0$
- Primary elementary groups
  - H, He, CNO, Fe
- Input variables
  - IceTop
    - S125 (Energy estimator)
    - Zenith
  - IceCube
    - dEdx at 1500m slant depth
    - Number of HE stochastic losses



Log(E/GeV): 7.4 - 7.5



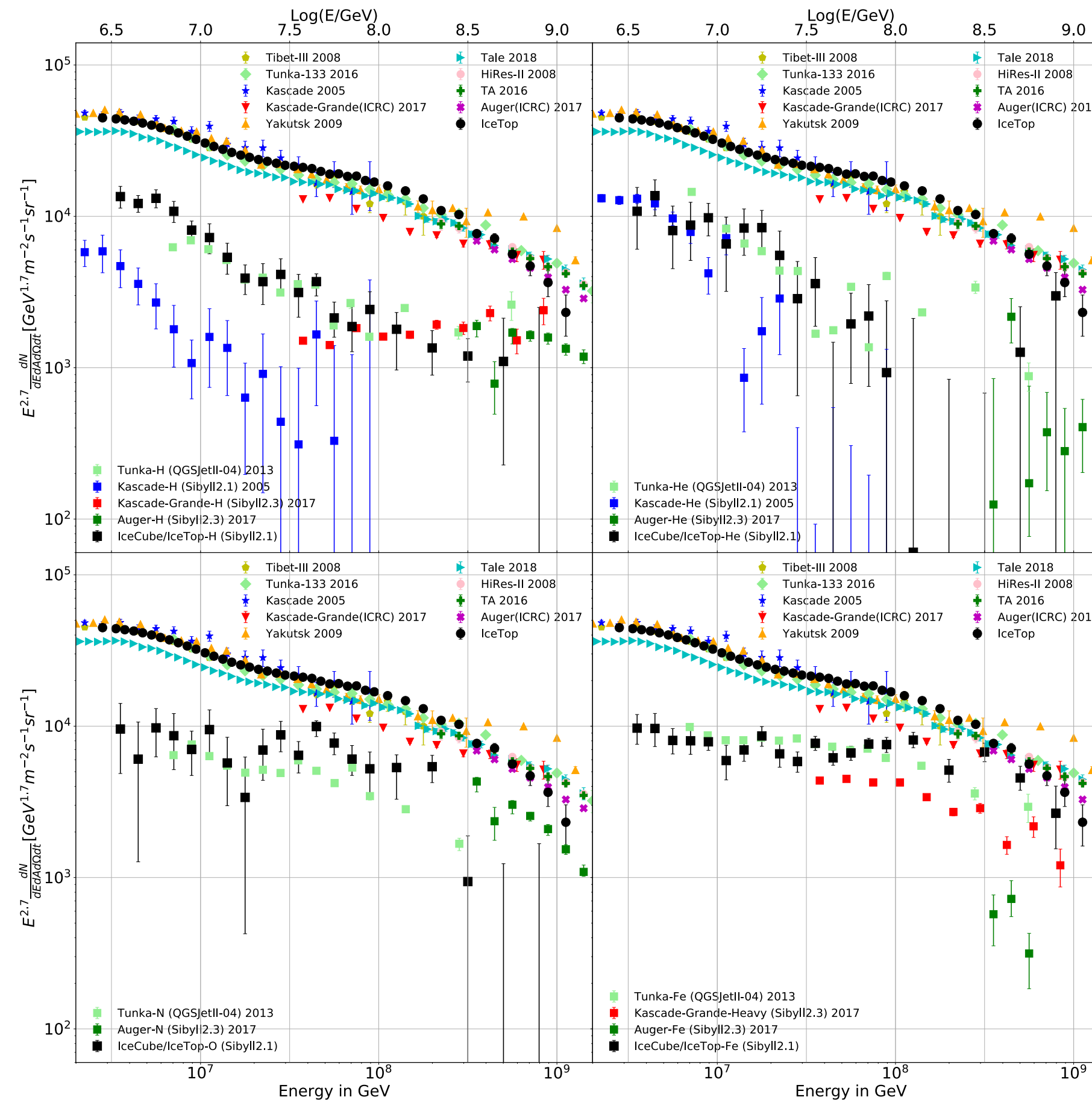
# CR MASS-COMPOSITION FLUX





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# CR ENERGY SPECTRUM



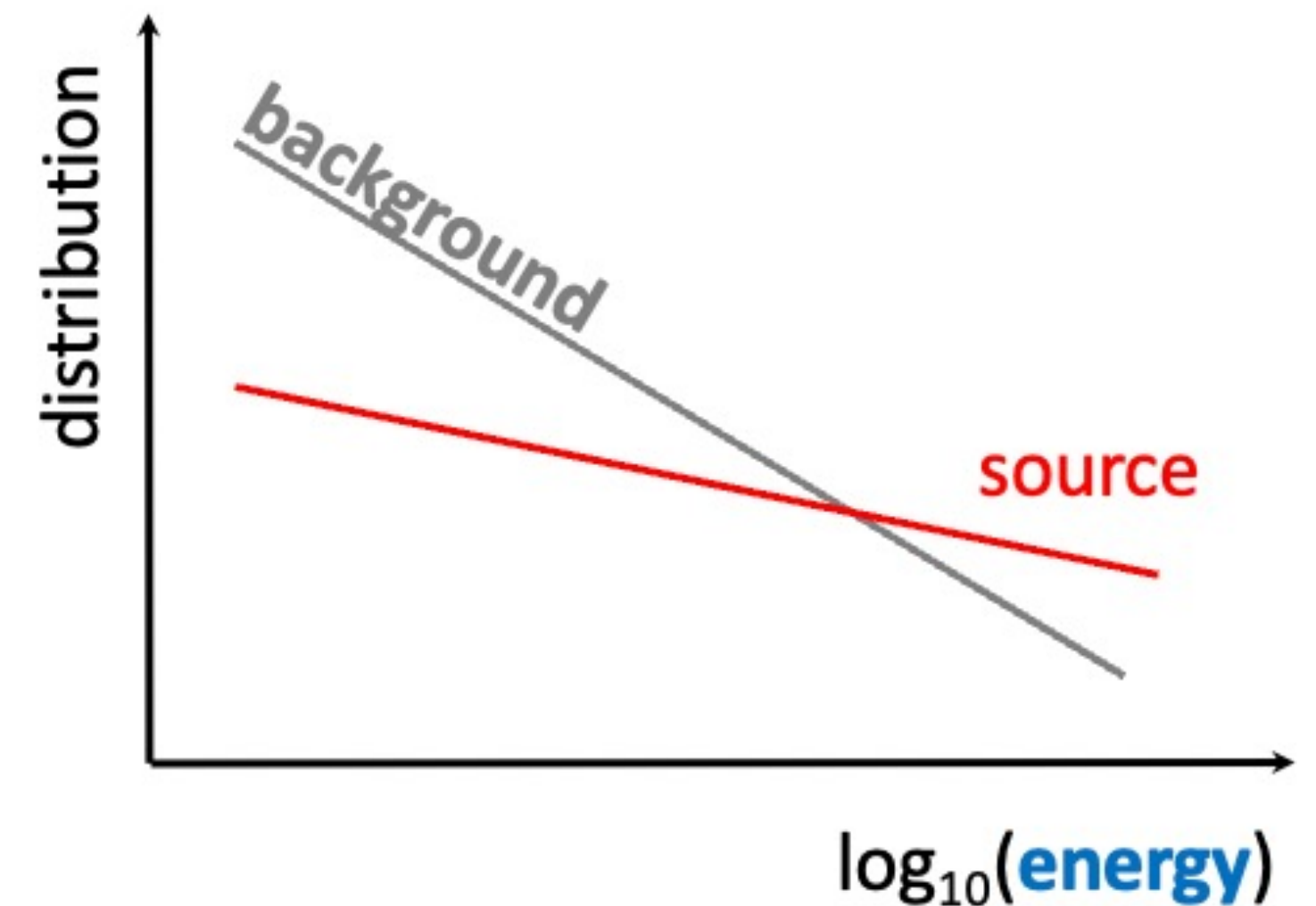
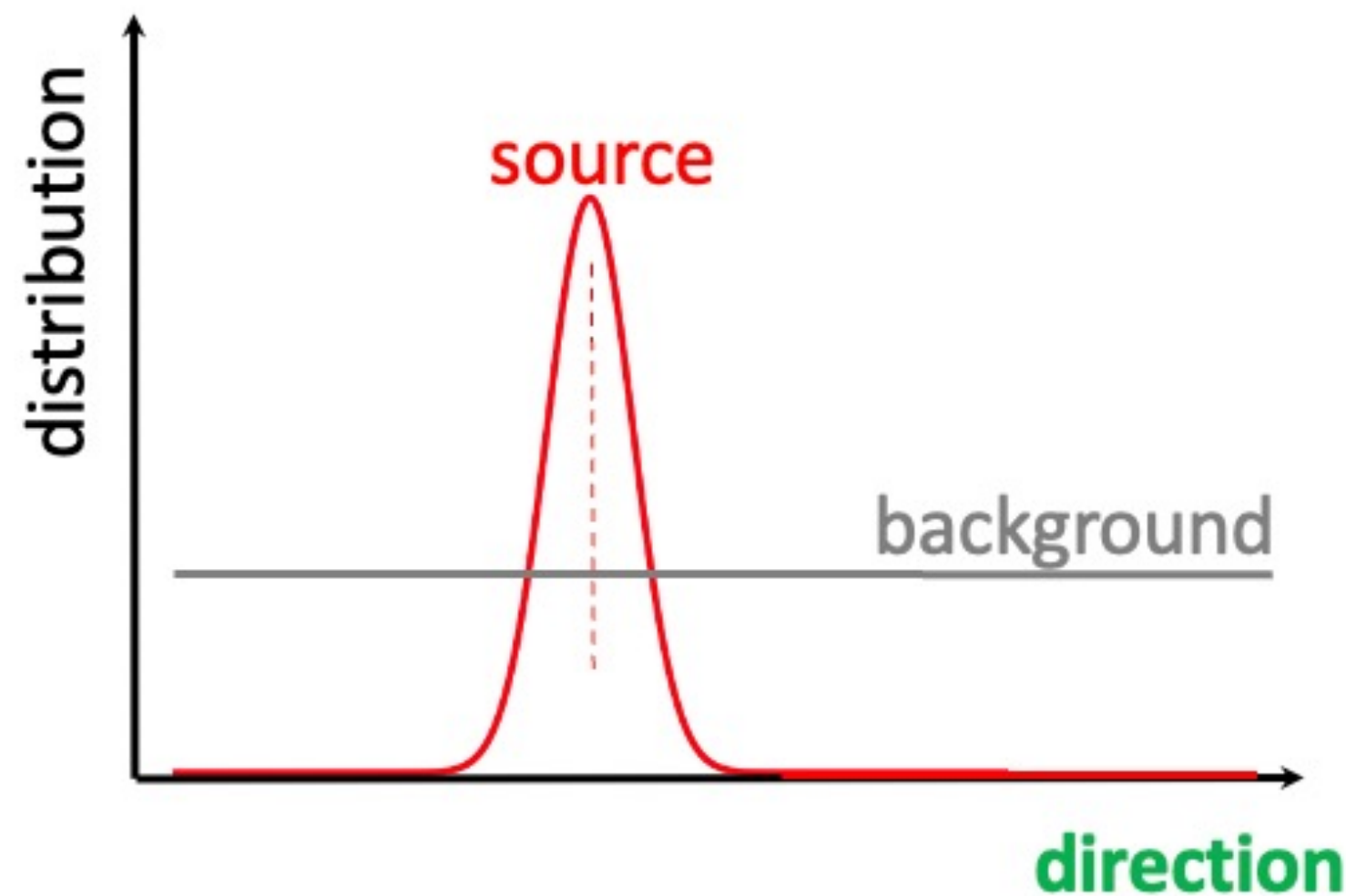
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SMART  
TENACIOUS



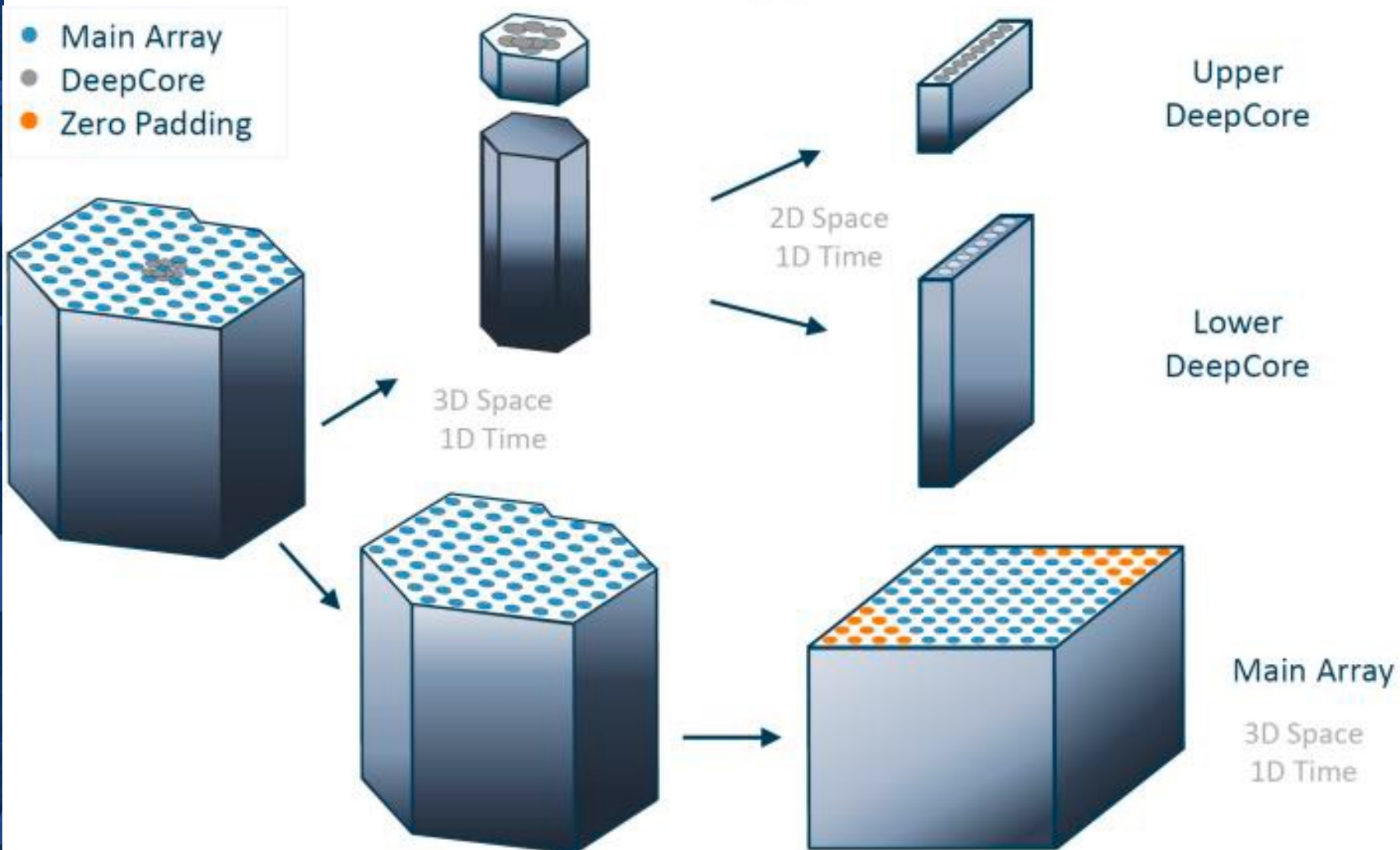
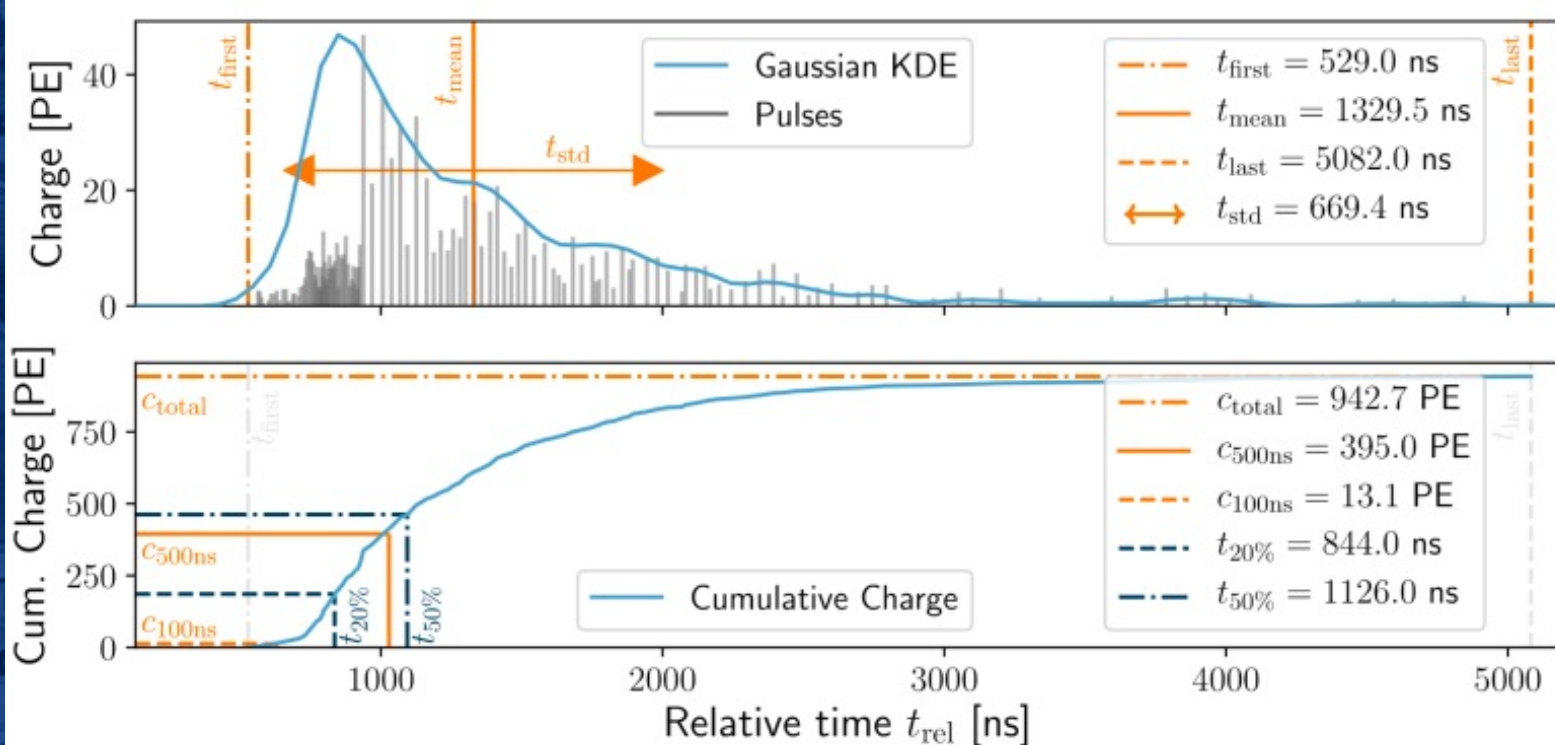
# SEARCHING FOR NEUTRINO SOURCES

Need good reconstruction of **directions** and **energies**  
and model of how they differ between **signal** and background

**We improved in both areas!**

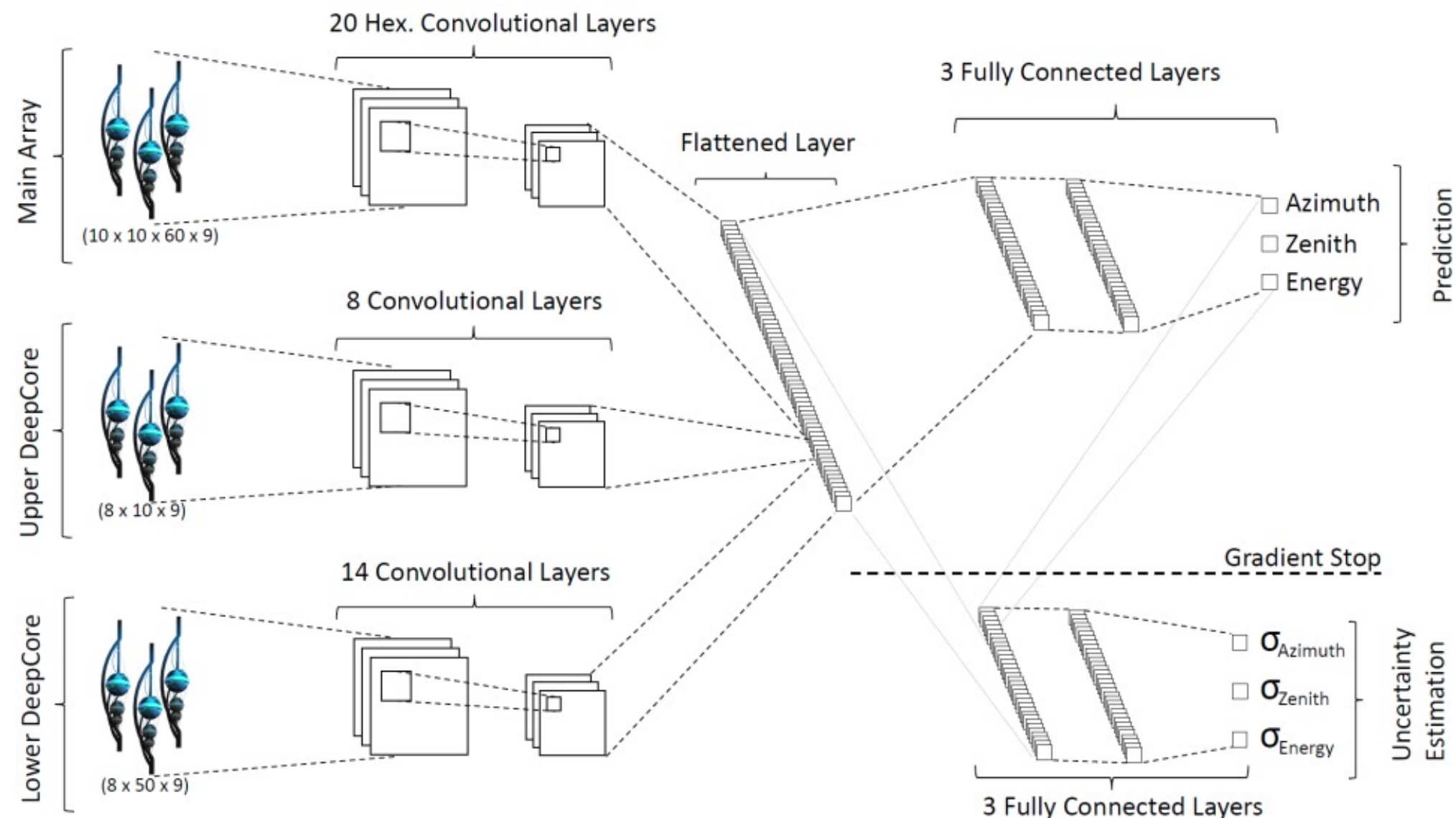


# CONVOLUTIONAL NEURAL NETWORK IN ICECUBE



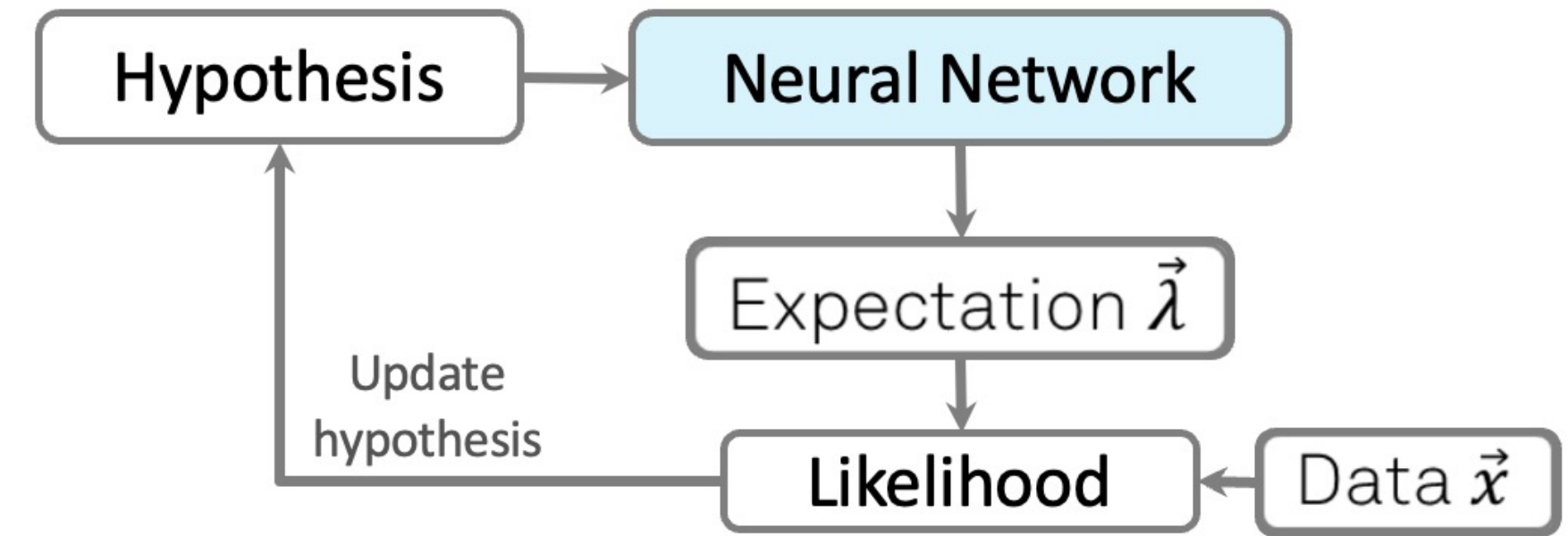
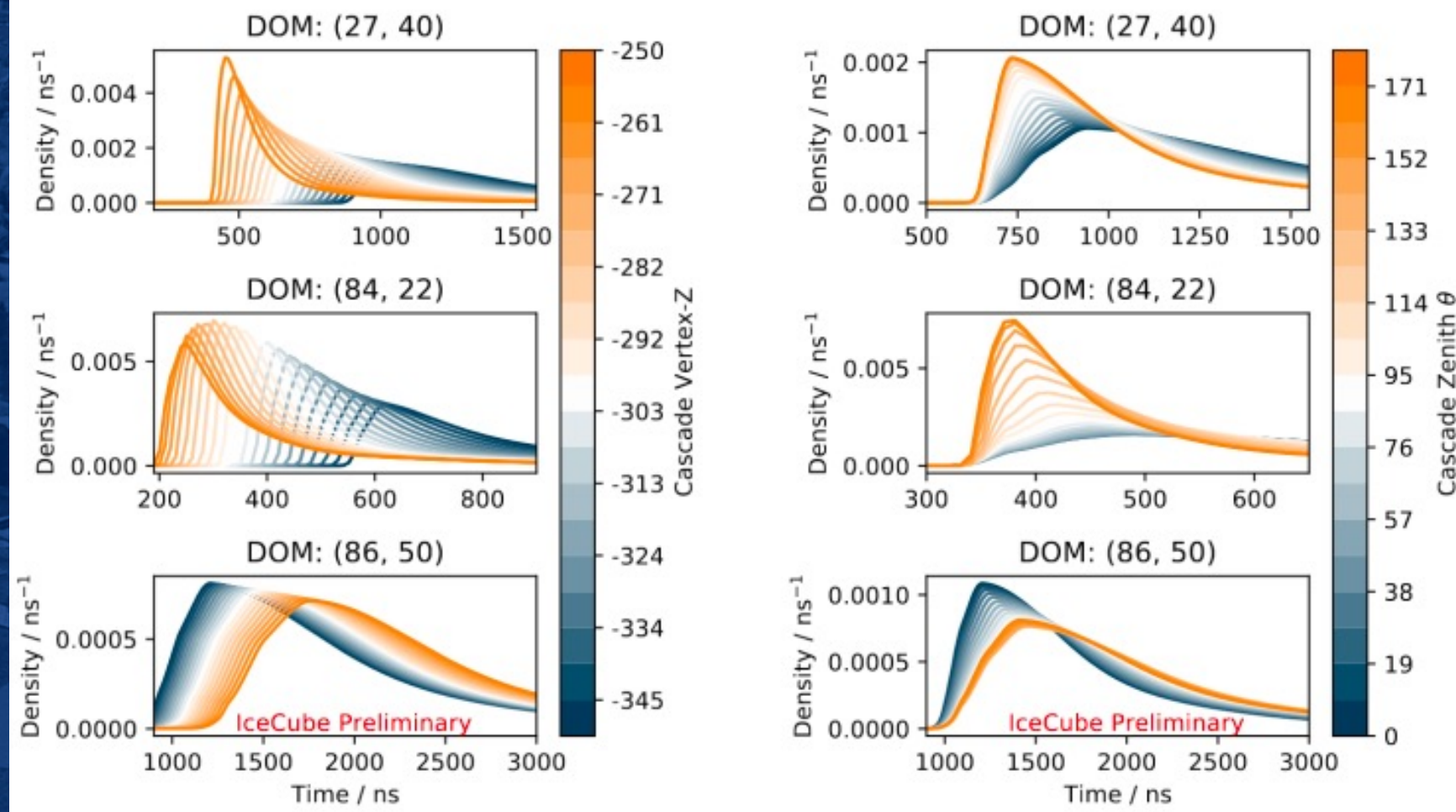
## Modification for IceCube

- Unify time dimension into a fixed set of input features
- Transform IceCube geometry such that it can be utilized by standard CNNs
- Hexagonal convolutional kernels
- Additional uncertainty estimation layer via Gaussian likelihood



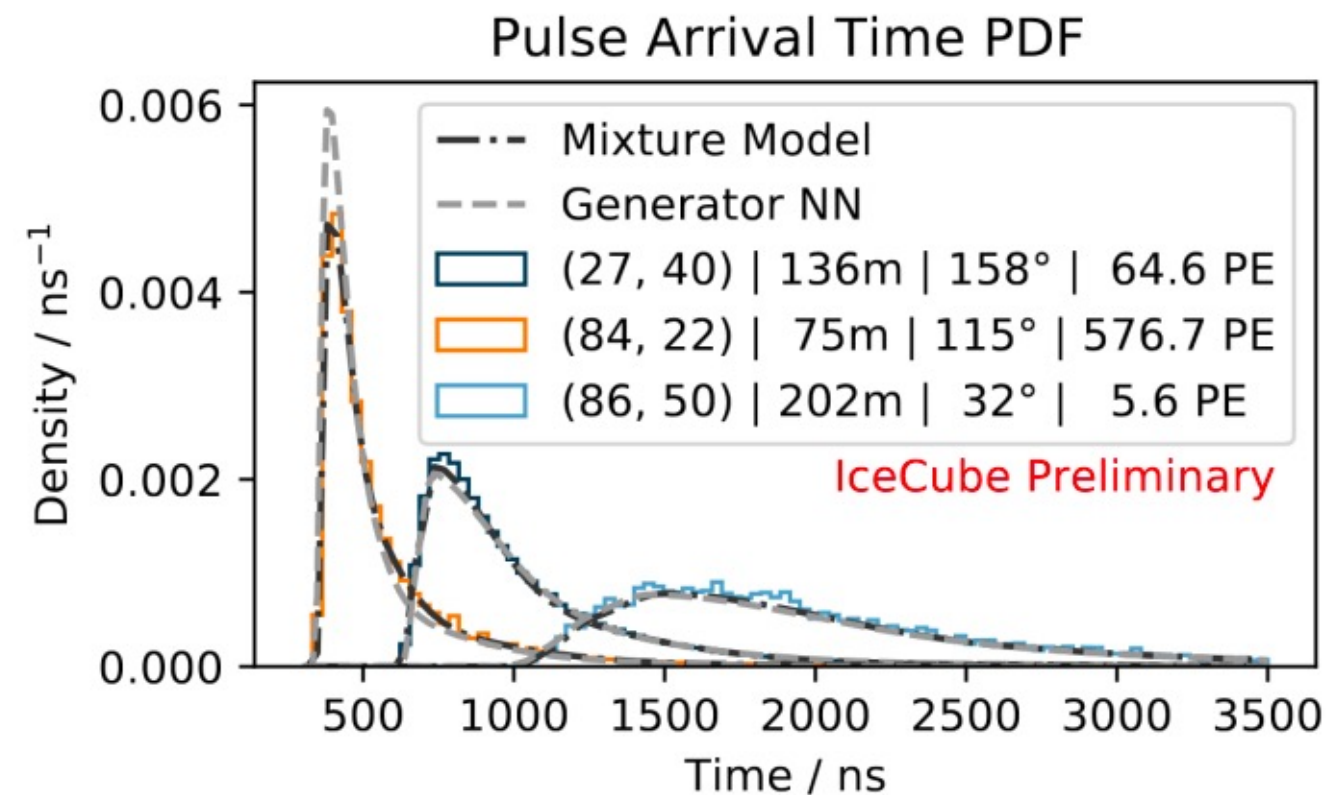


# RECONSTRUCTING EVENT PROPERTIES



Hybrid reconstruction method:

- Combines maximum-likelihood estimation with deep learning
- Modeling of high-dimensional PDFs via neural networks
- Exploits available information and symmetries



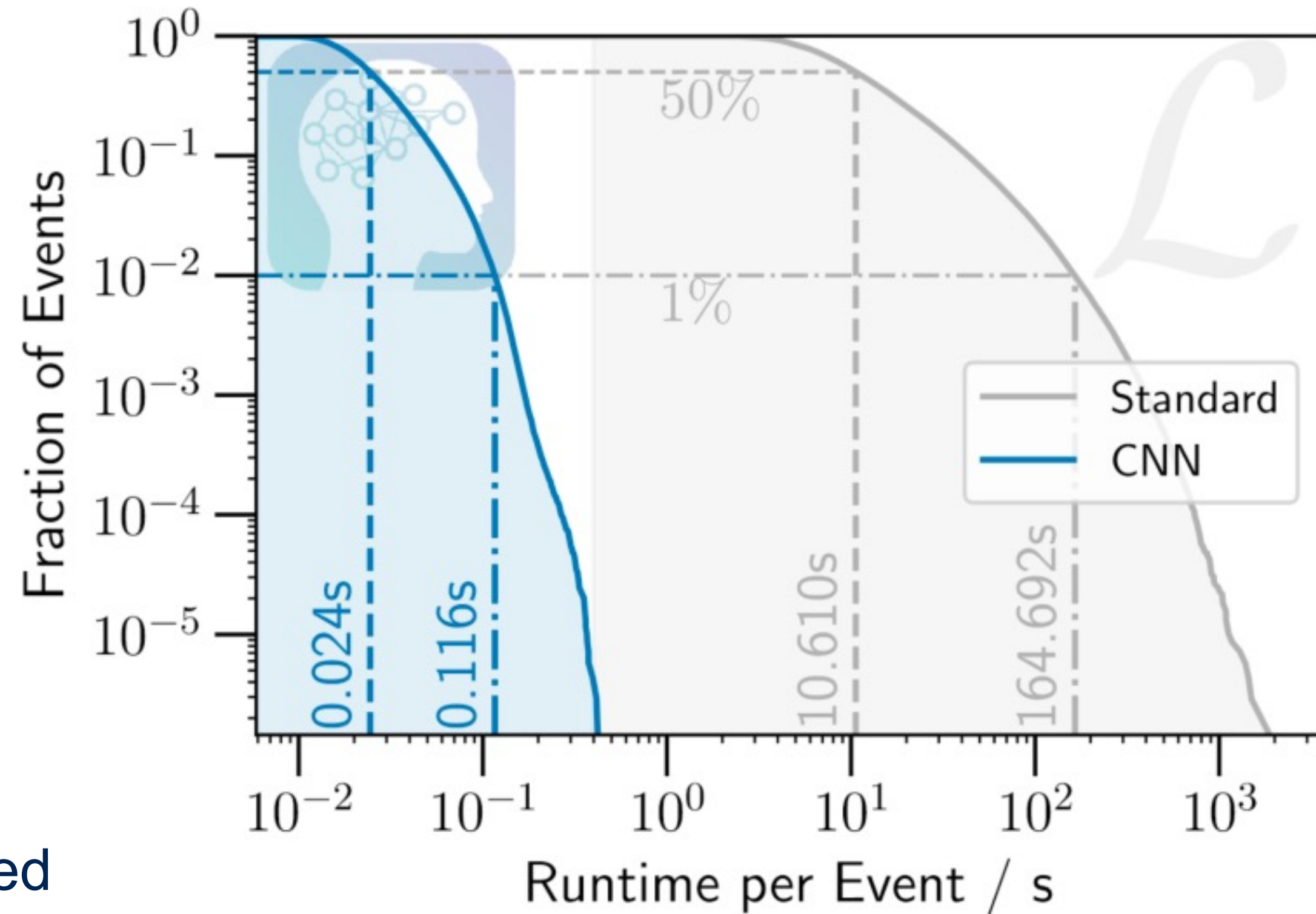


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# CONVOLUTIONAL NEURAL NETWORK IN ICECUBE

## Achievements of CNNs in IceCube

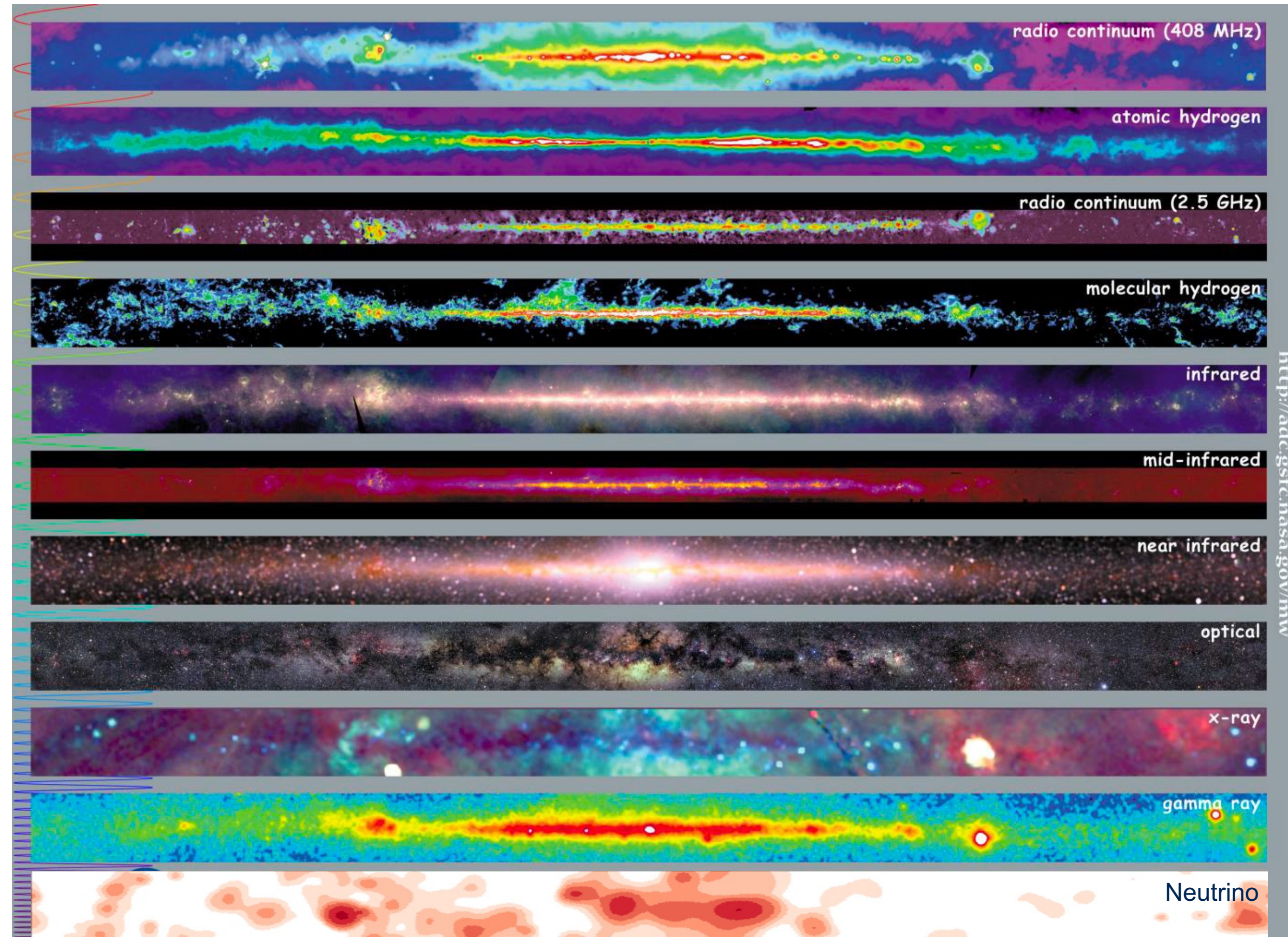
- Versatile tool for event reconstruction
- Improved reconstruction accuracy at high energies
- Reduced per-event runtime by 3 orders of magnitude
- Allows 'Online' event reconstruction with the limited hardware at the South Pole





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# THE MULTIWAVELENGTH MILKY WAY



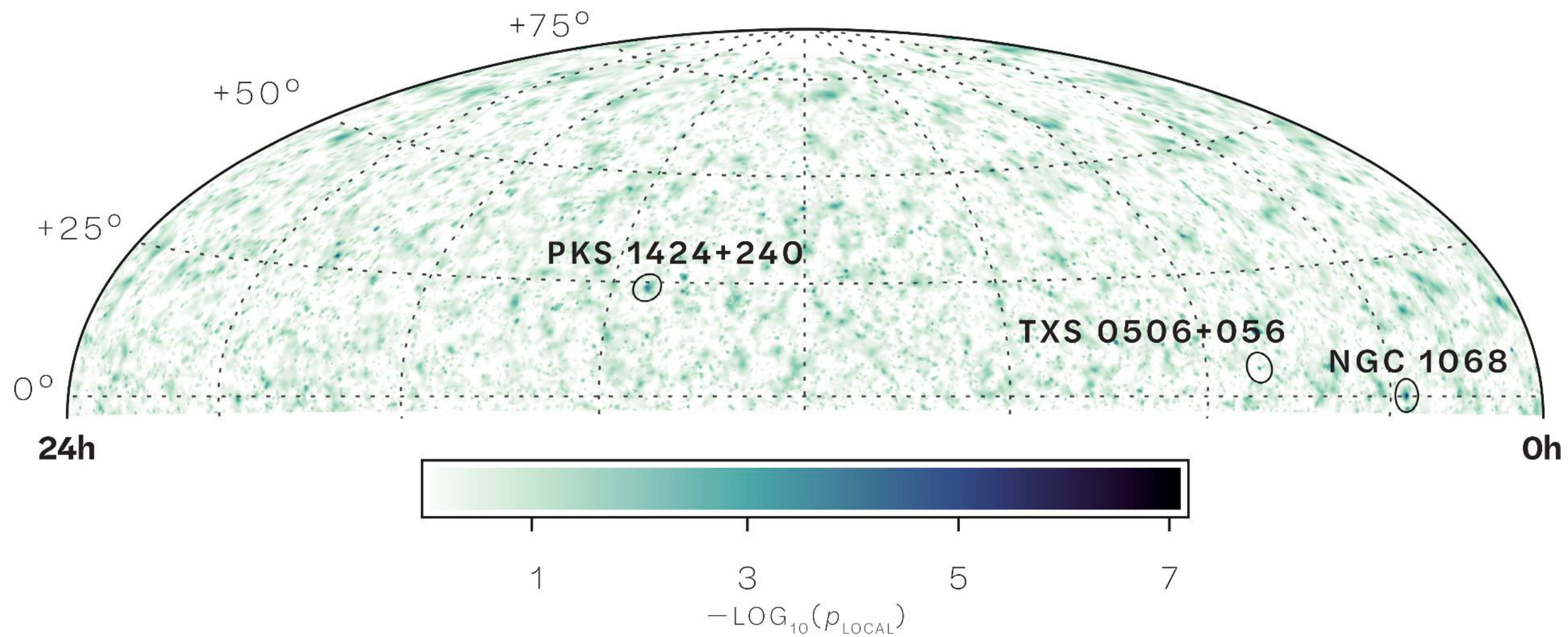
<http://adc.gsfc.nasa.gov/mw>

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# ICECUBE IDENTIFIES NGC 1068 AS LIKELY NEUTRINO SOURCE

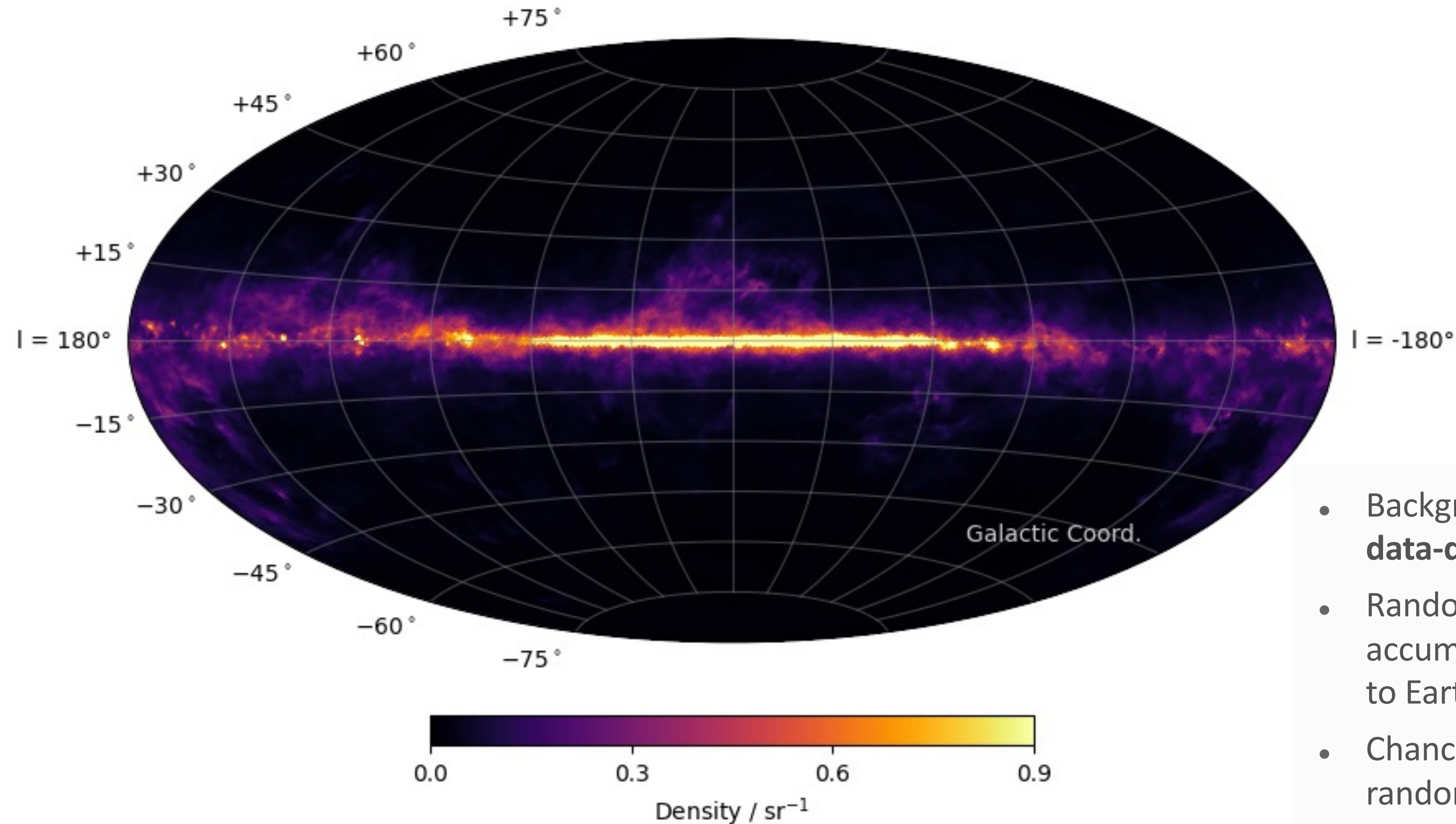


- Search for significant clustering of events versus isotropic null hypothesis
- Brightest point in sky correlates with Seyfert galaxy NGC 1068
- NGC 1068 rejects isotropic hypothesis at 4.2sigma after trials correction

<https://doi.org/10.1126/science.abg3395>

# Data-Driven Search Method

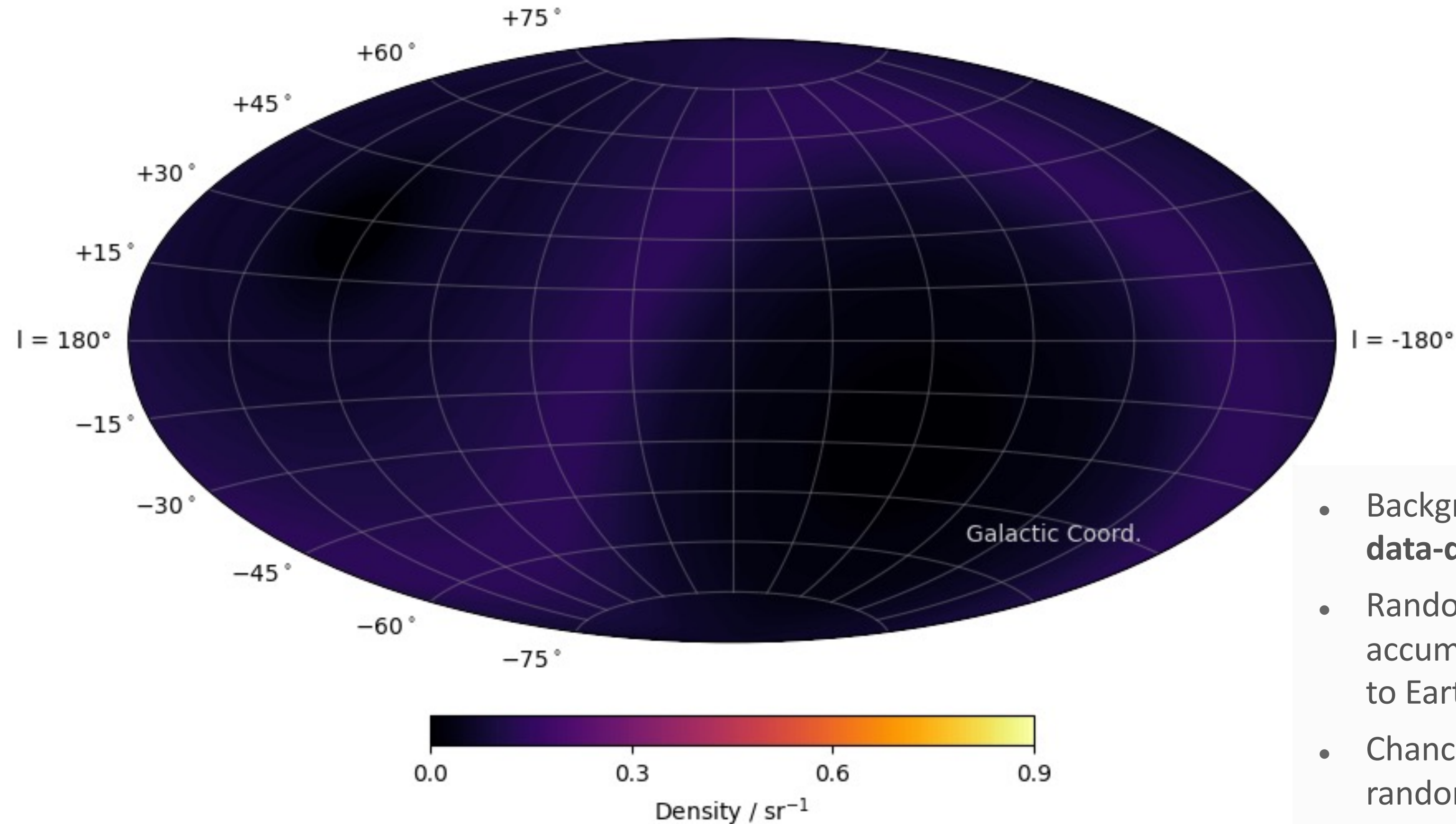
Model expectations based on Fermi-LAT measurements



- Backgrounds are modeled in **data-driven** approach
- Randomization in time removes accumulation along Galactic plane due to Earth's rotation
- Chance probability calculated via randomized pseudo-experiments

# Data-Driven Search Method

Scrambled background distribution (no signal present)



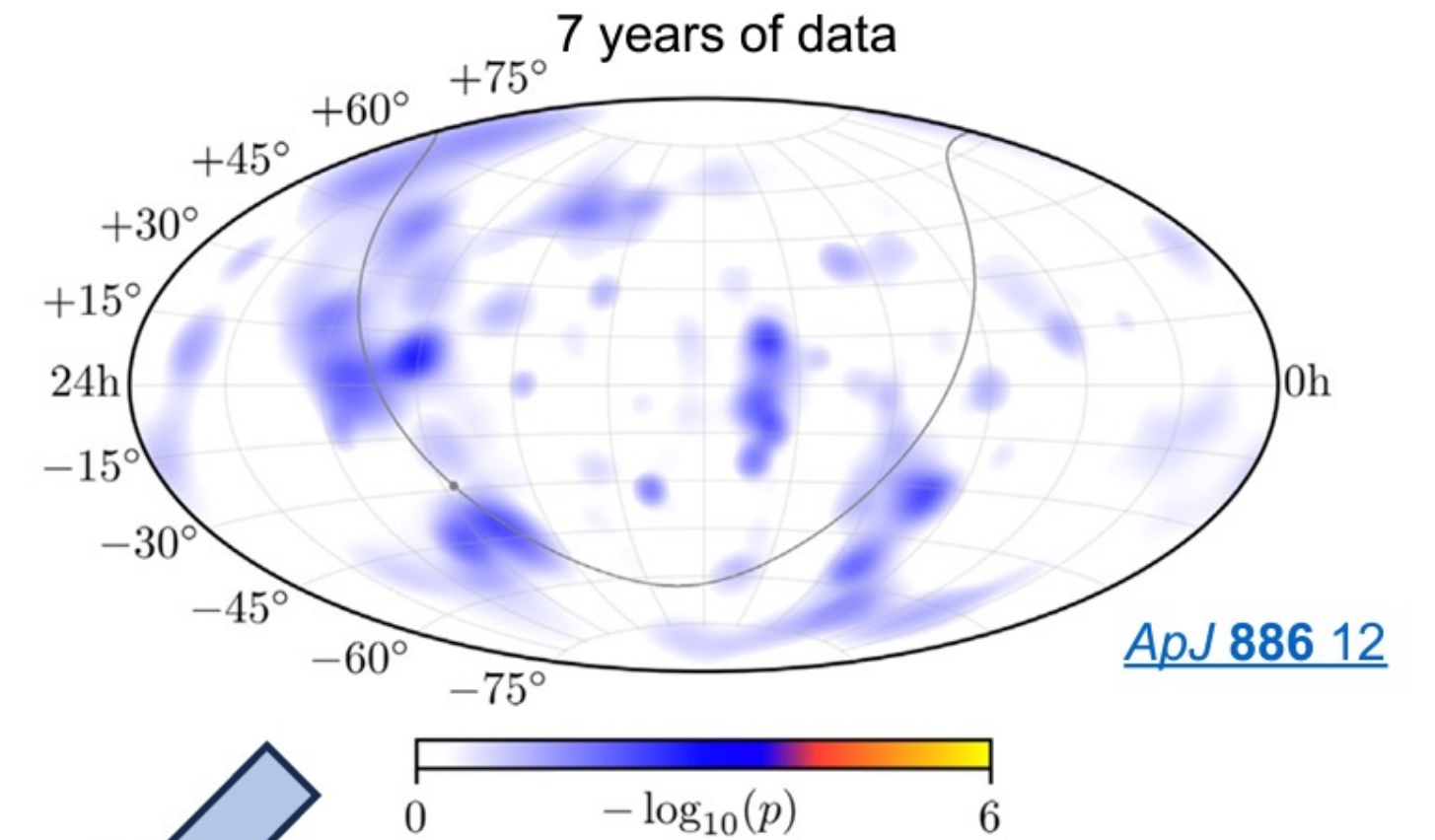
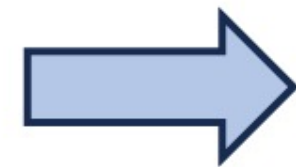
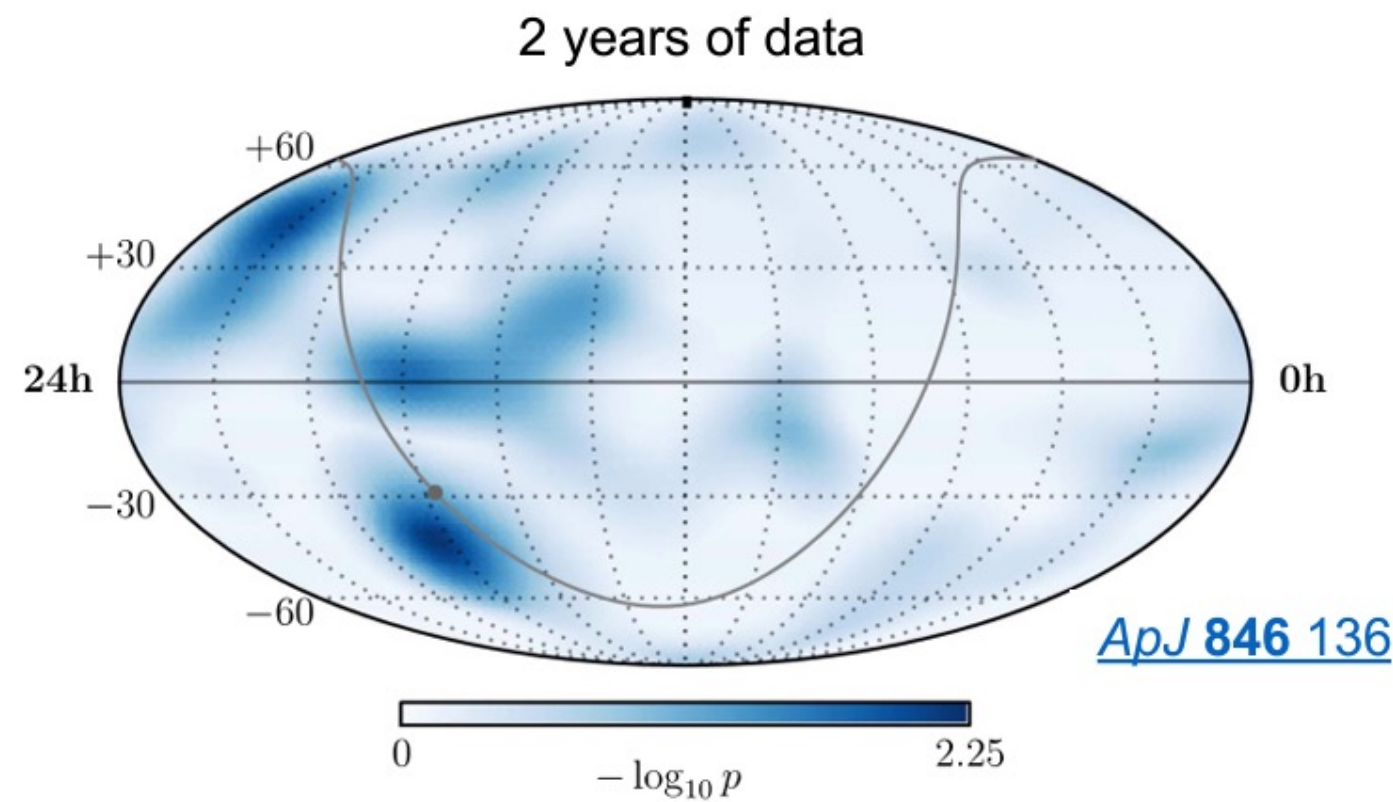
- Backgrounds are modeled in **data-driven** approach
- Randomization in time removes accumulation along Galactic plane due to Earth's rotation
- Chance probability calculated via randomized pseudo-experiments





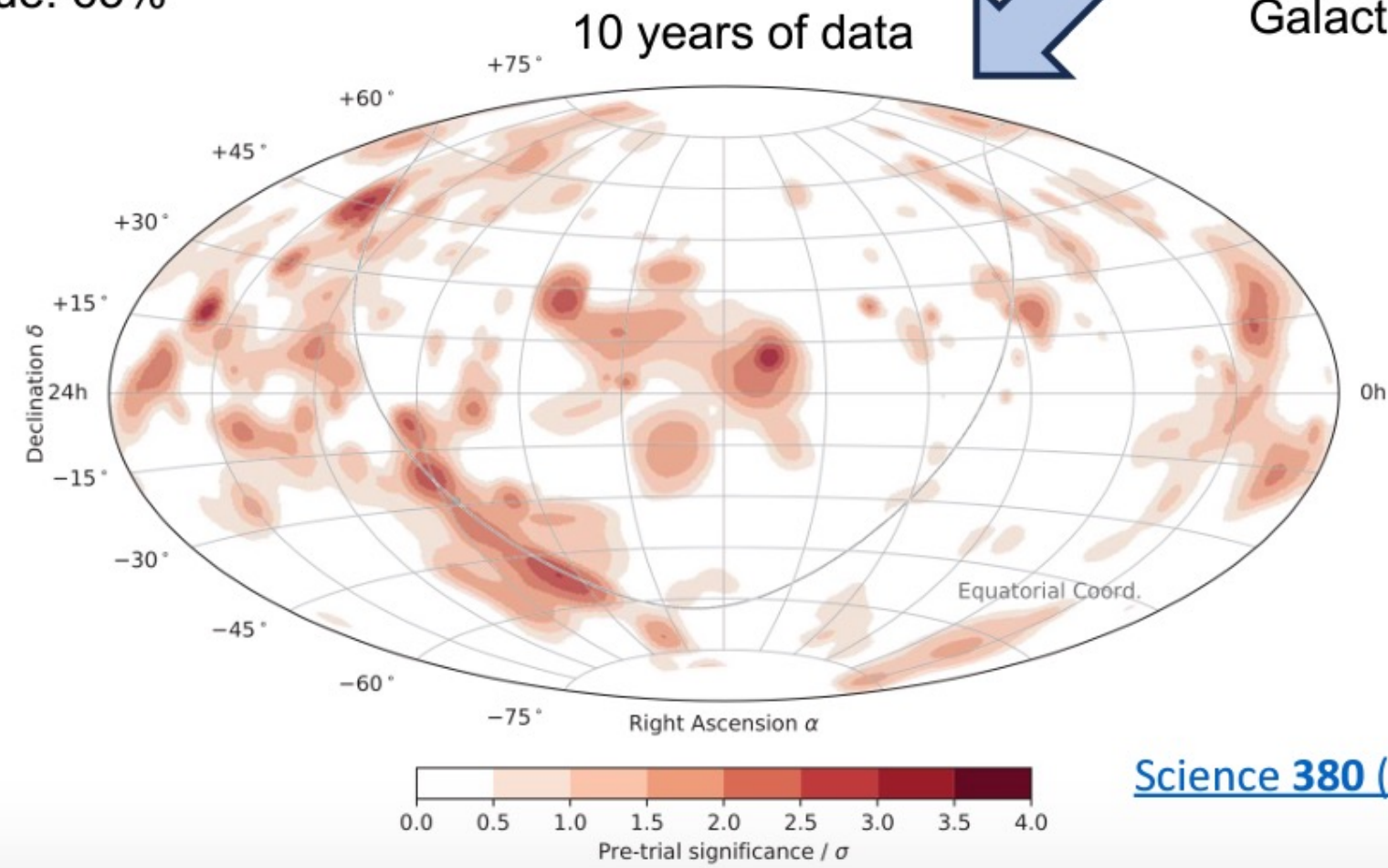
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Galactic plane p-value:  
65%

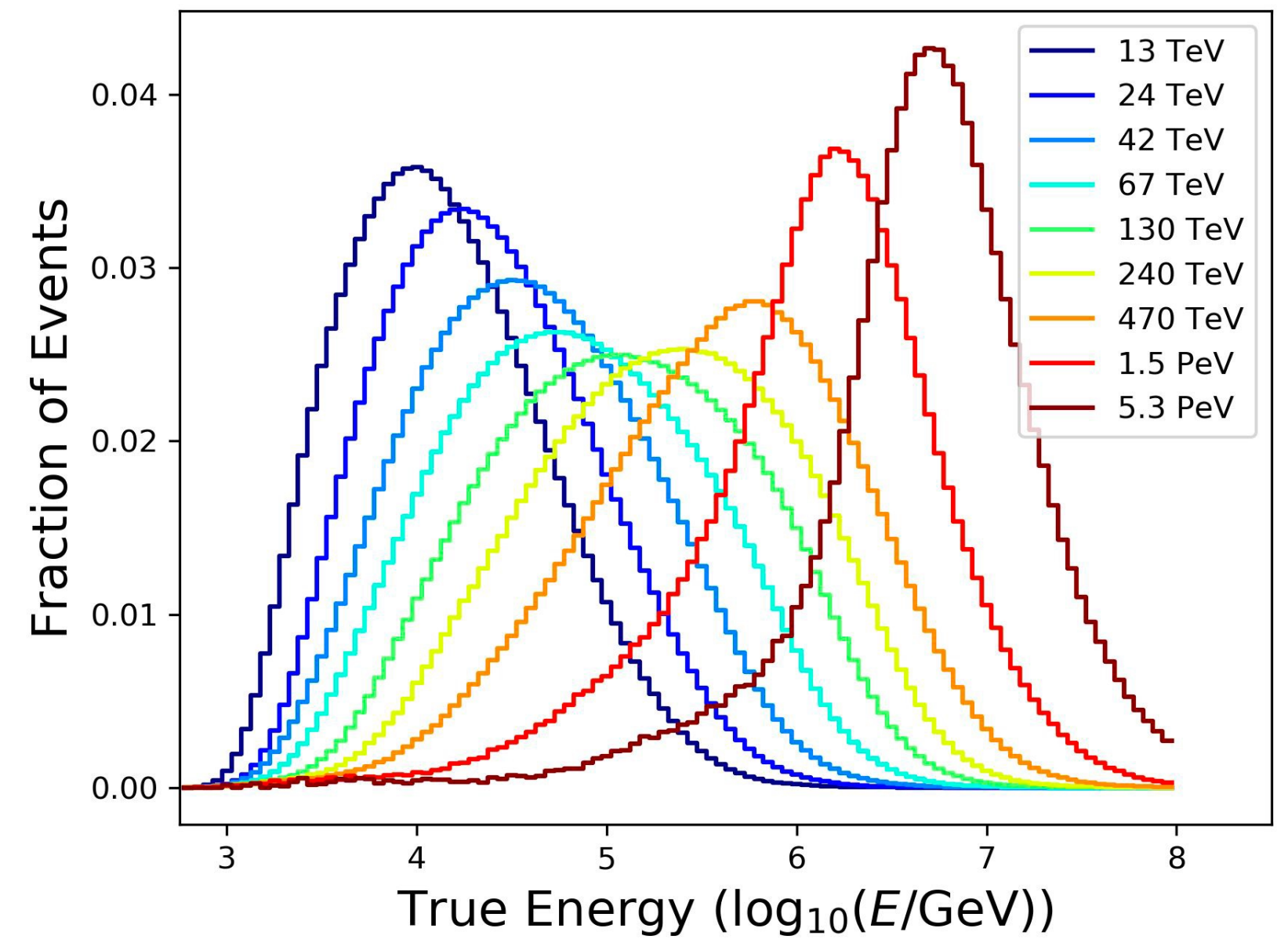
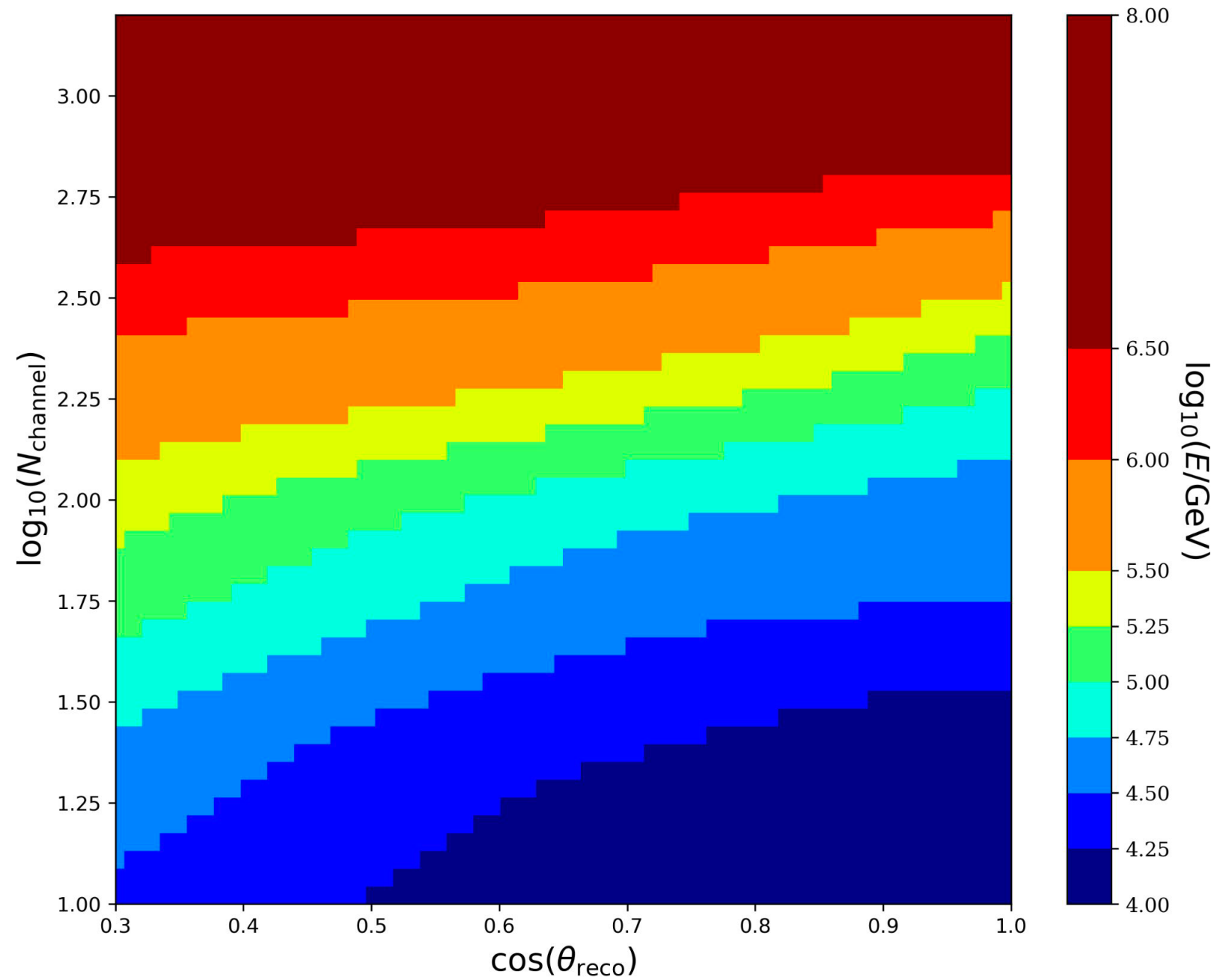
Galactic plane p-value:  
0.0004% ( $4.5\sigma$ )





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# ENERGY ESTIMATION ANISOTROPY





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### Seasonal unfolding of 11.5yrs of Data

