

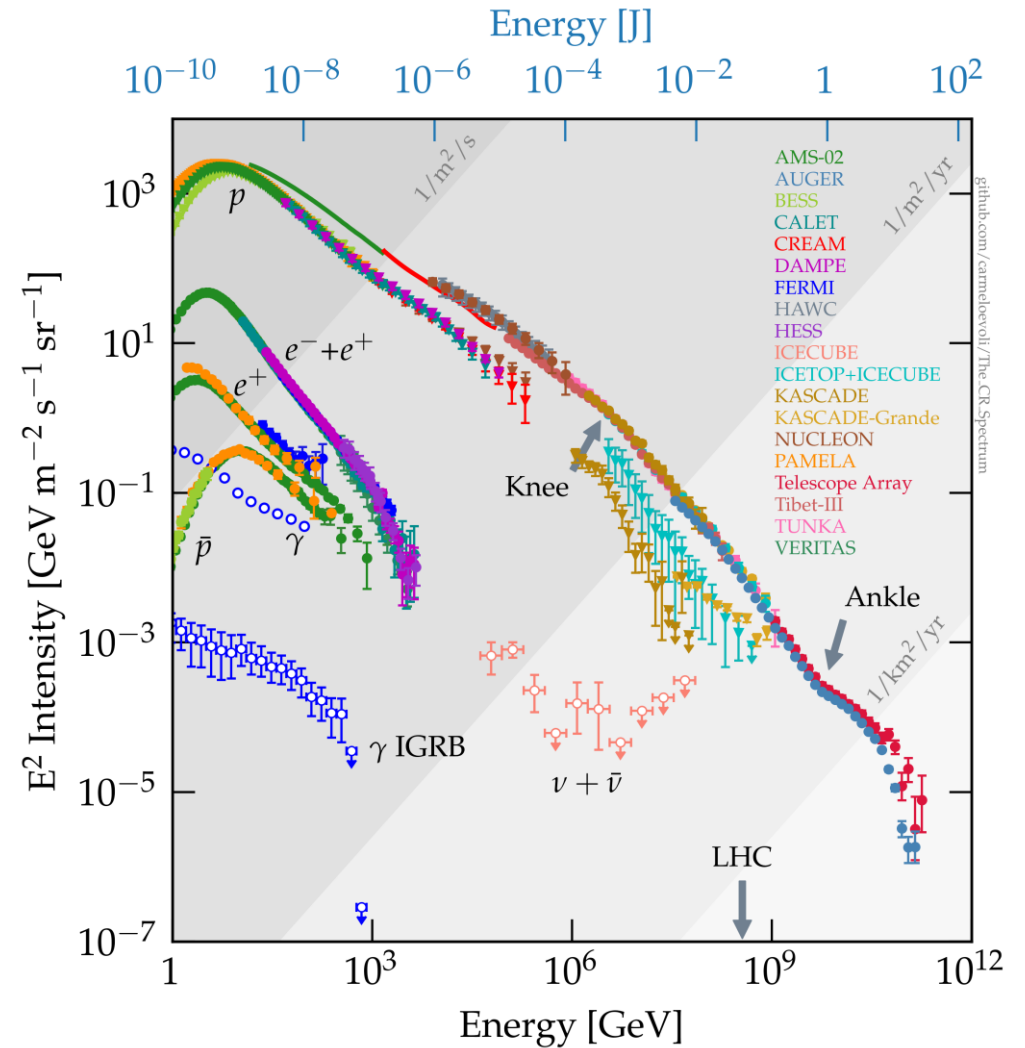
High-Energy Atmospheric Muon Study with TRIDENT

Cen Mo, Weilun Huang, Liang Li, Hualin Mei

Cosmic ray

- High energy charged particles.
- Composed of p^+ , He and some other heavy nucleus.
- Energy ranges from MeV to EeV.

• Where are they from?

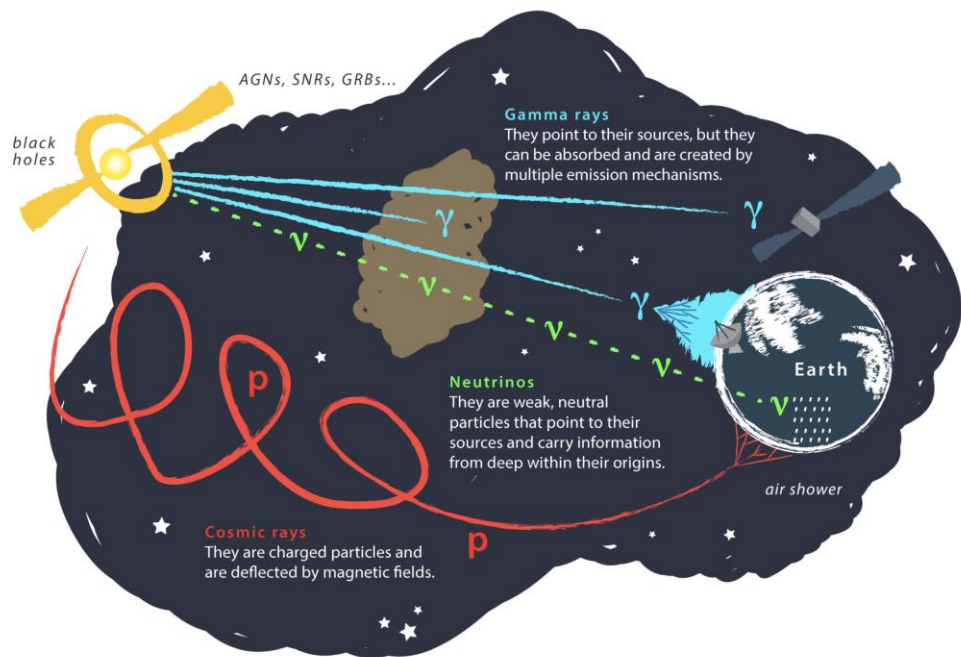


The Cosmic Ray Spectrum (2023)

Probe origins of cosmic ray with **astrophysical neutrino**:

Pros:

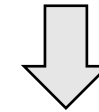
- **Neutral**: not deflected by magnetic field
- **Weak**: not absorbed



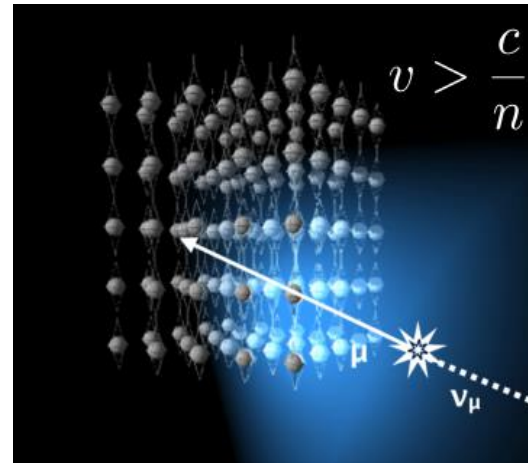
Juan Antonio Aguilar and Jamie Yang. IceCube/WIPAC

Cons:

- **Small flux**: $E_\nu \Phi_\nu < 2 \times 10^{-8} \text{ GeV cm}^{-2} \text{ s}^{-2} \text{ sr}^{-1}$
- **Small cross section**: $\sigma \sim 10^{-33} \text{ cm}^2$ for $E_\nu \sim 10 \text{ PeV}$



Use **sea water** as target



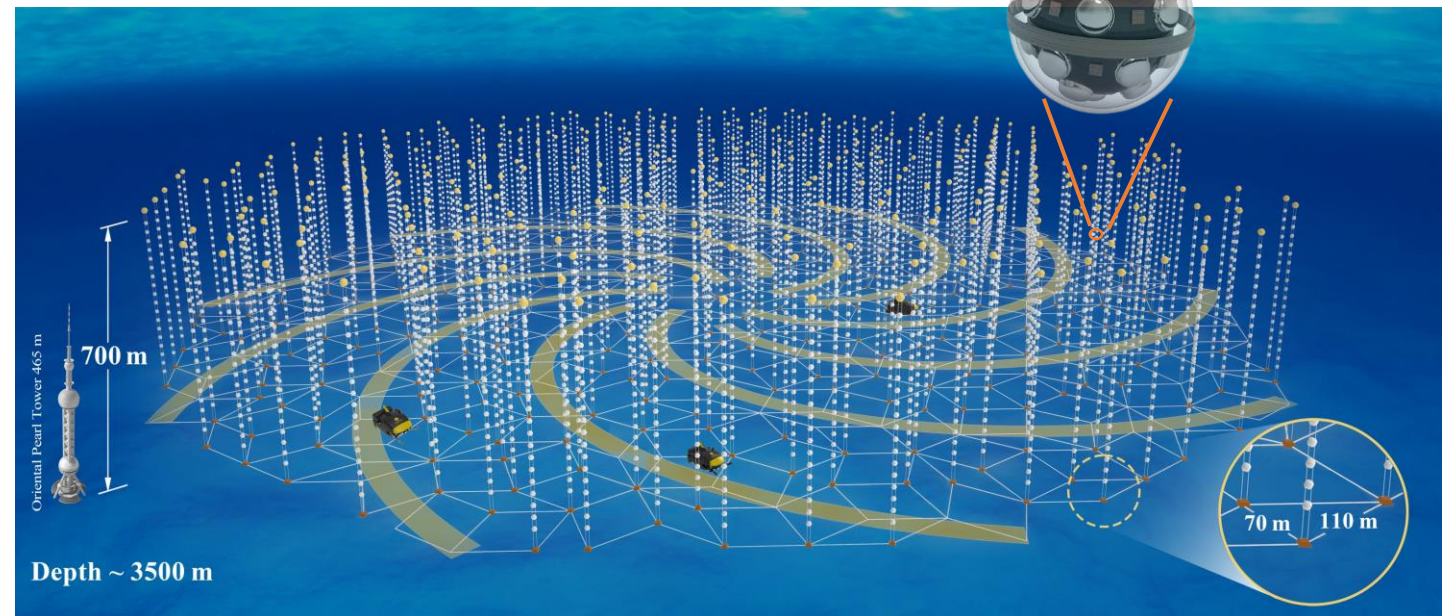
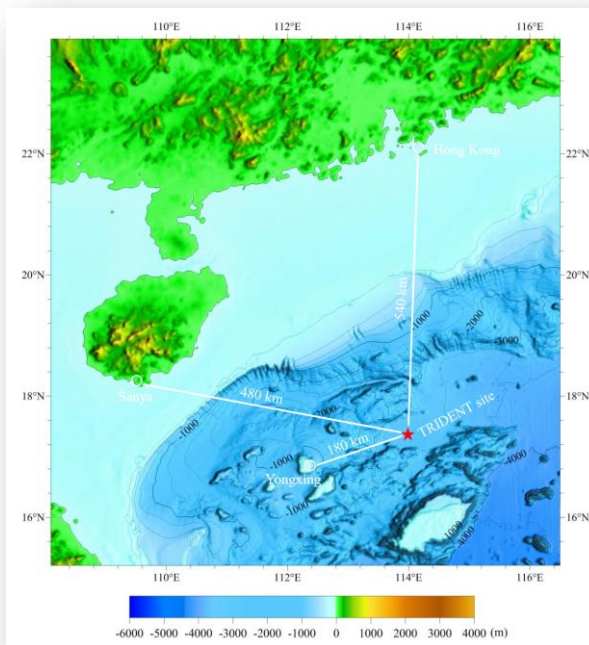
- Neutral-current interaction
 $\nu_l + N \rightarrow \nu_l + X$
- Charged-current interaction
 $\nu_l + N \rightarrow l + X$

- **TRIDENT (海铃计划):** **TR**opical **DE**ep-sea **N**eutrino **T**elescope.

A multi-cubic-kilometre neutrino telescope in the western Pacific Ocean. [Nat Astron \(2023\)](#).

- To be located in the **South China Sea**.
- **Penrose tiling** structure with 2000m radius, 700m height (8.7 km^3). **3500m deep** under sea level.

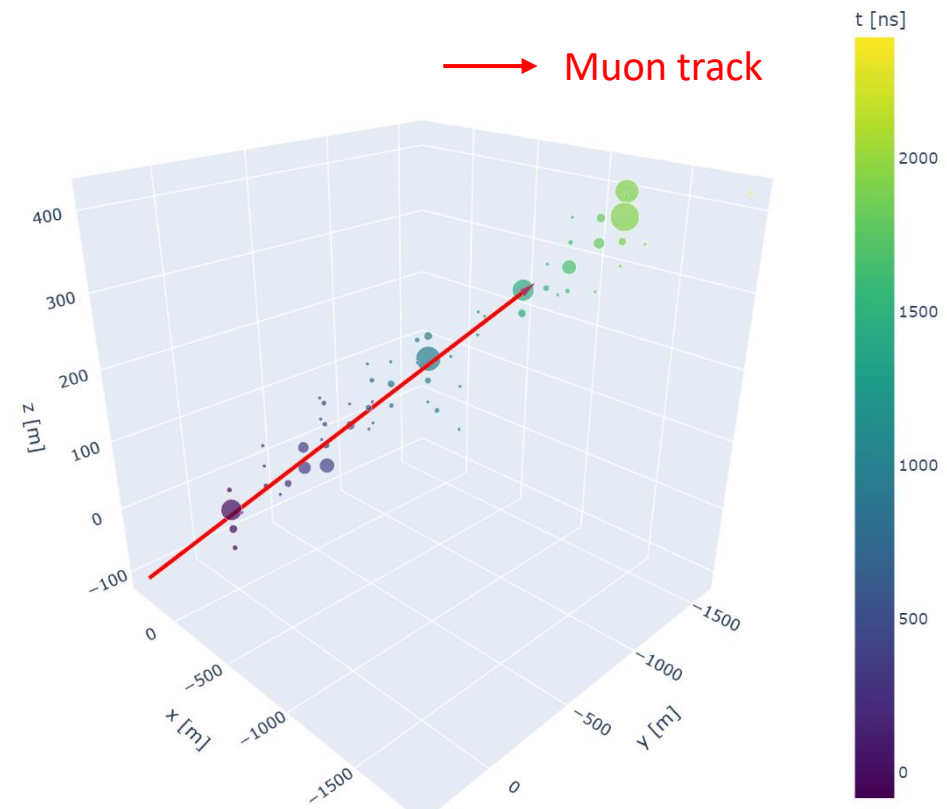
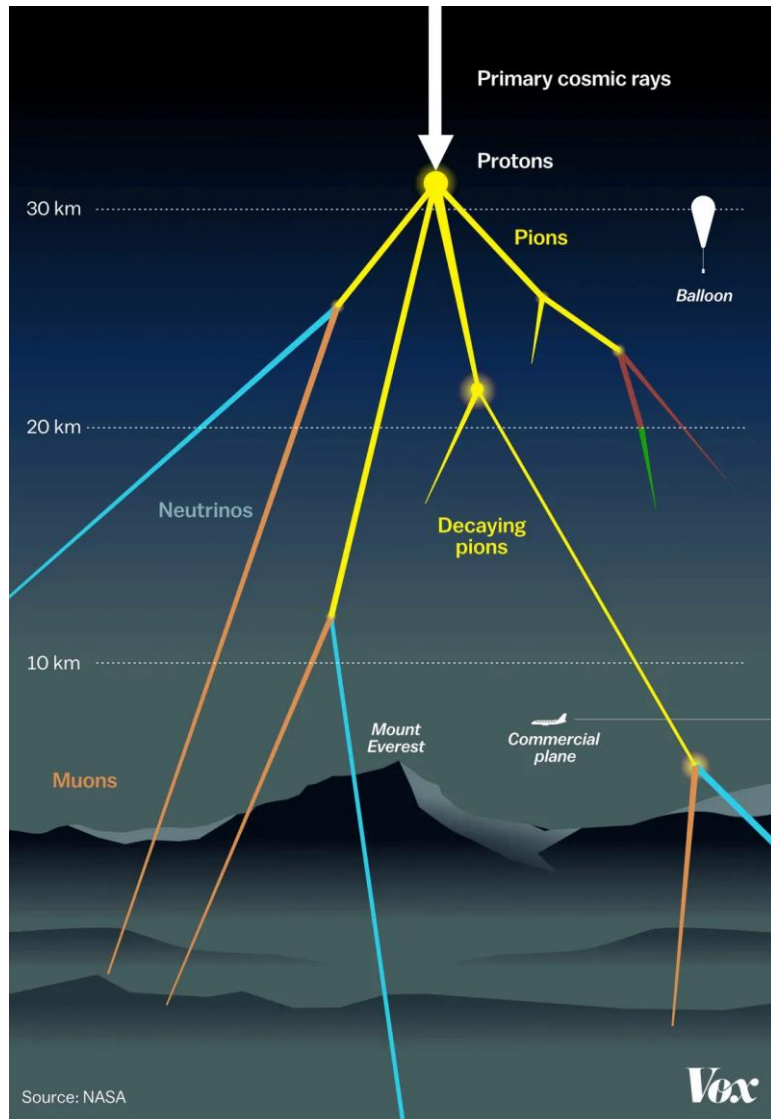
hDOM
(hybrid digital optical module)



TRIDENT

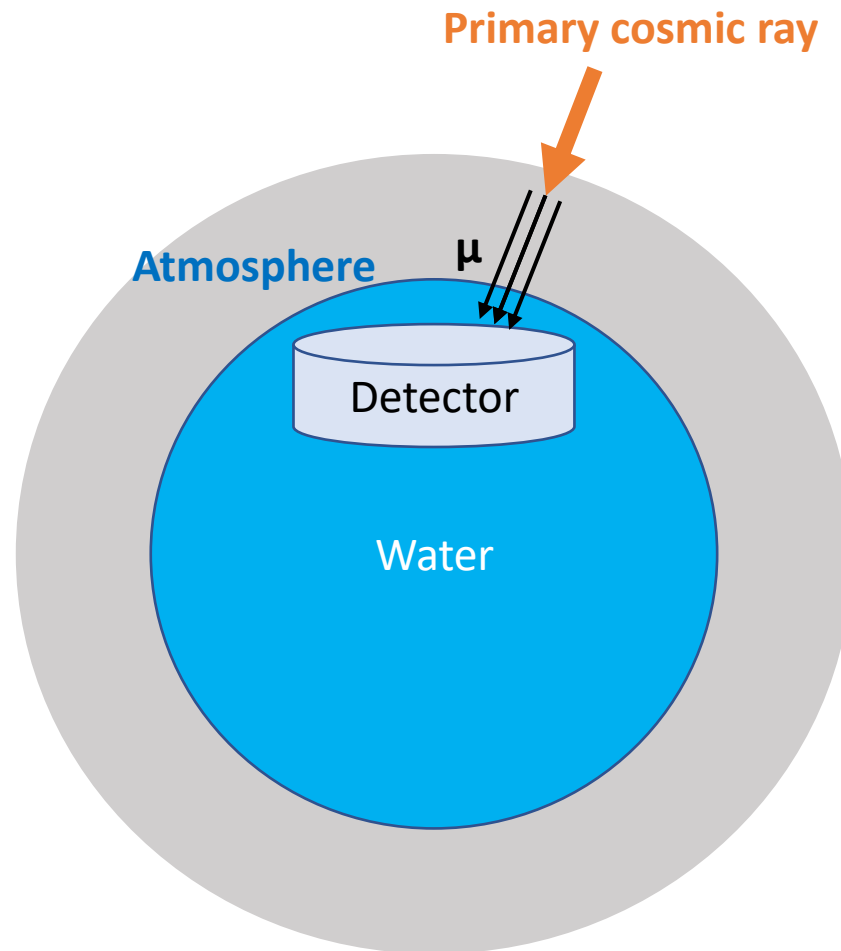
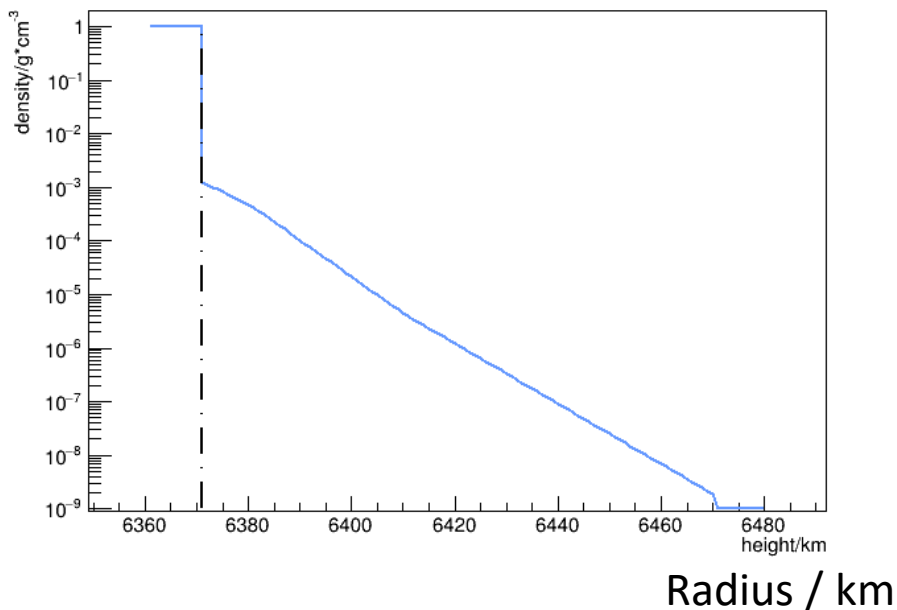
Background for neutrino telescope: **atmospheric muons**

- **High flux**
- **Indistinguishable** from μ originating from ν_{μ} charge-current interaction.



Based on CORSIKA8 ([arxiv:2208.14240](https://arxiv.org/abs/2208.14240)):

- The next-generation air shower simulation framework.
- Built a **water ball** with a radius of 6371 km.
- **Outer surface:** atmosphere with a thickness of 110 km.
- Density of the atmosphere: **U.S. Standard Atmosphere model.**



Physics models

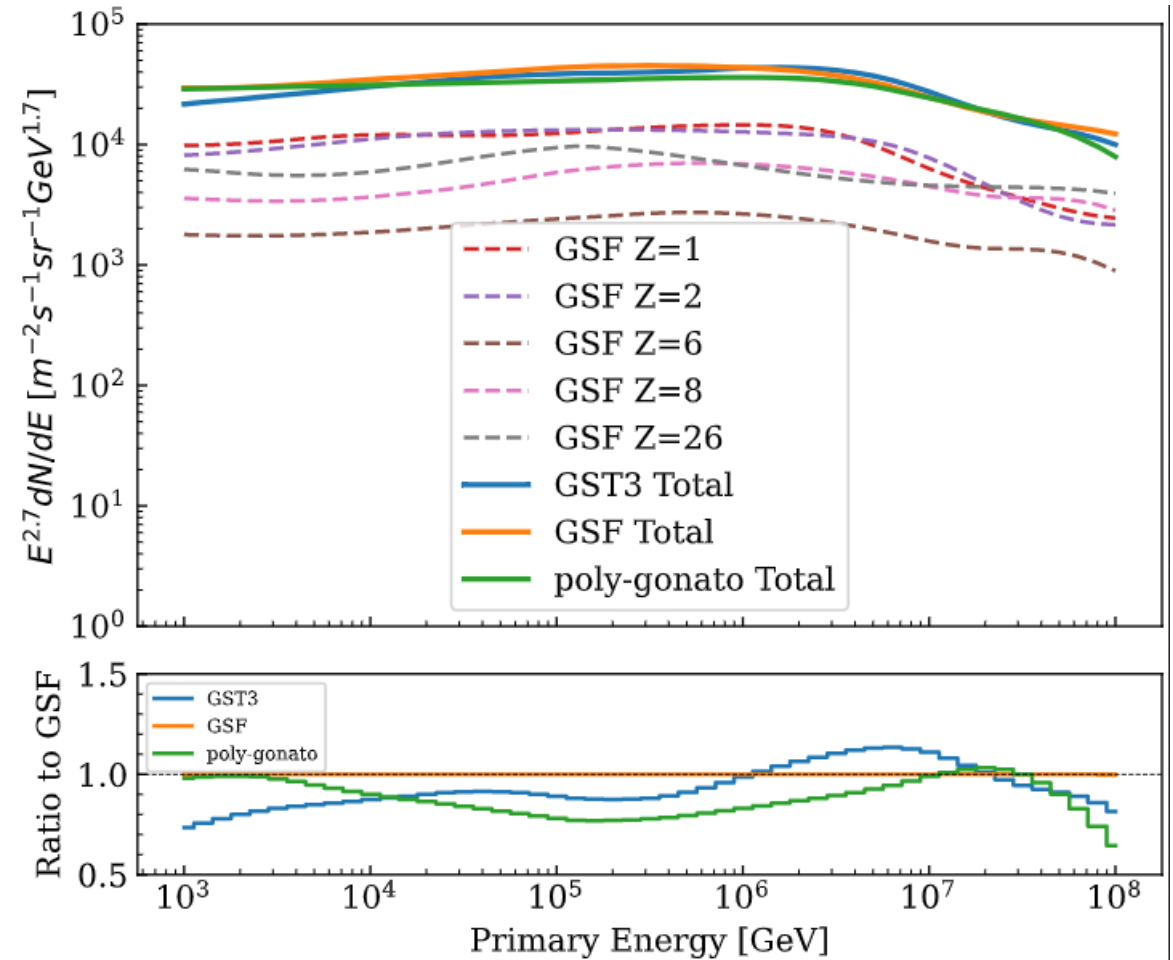
- Hadronic interaction models: **SIBYLL 2.3d**
- Continuous EM energy loss: **PROPOSAL**
- Decay Process: **Pythia**

MC Energy spectrum: $f(E) \propto E^{-1}$

MC sample counts of primary particle / energy range / direction

	P	He	C	O	Fe
Energy: 1-100 TeV cos θ : (0, 1)	5e5	5e5	1e5	1e5	1e5
Energy: 100 TeV – 100 PeV cos θ : (0.8, 1)	2e5	1e5	5e4	5e4	4e4
Energy: 100 TeV – 100 PeV cos θ : (0.4, 0.8)	2e5	1e5	5e4	5e4	4e4
Energy: 100 TeV – 100 PeV cos θ : (0, 0.4)	5e4	5e4	2e4	2e4	2e4

- A cosmic ray flux model describes the flux of (p, He, C, O and Fe)
- Three models were investigated:
 - **Global Spline Fit (GSF)** [arxiv 1711.11432]: data-driven
 - **GST3** [arxiv 1303.3565]: with an assumption of 3 populations of particle sources:
 - Supernova remnants
 - Other galactic sources.
 - Extragalactic sources
 - **Poly-gonato** [arxiv 0210453]: phenomenological model



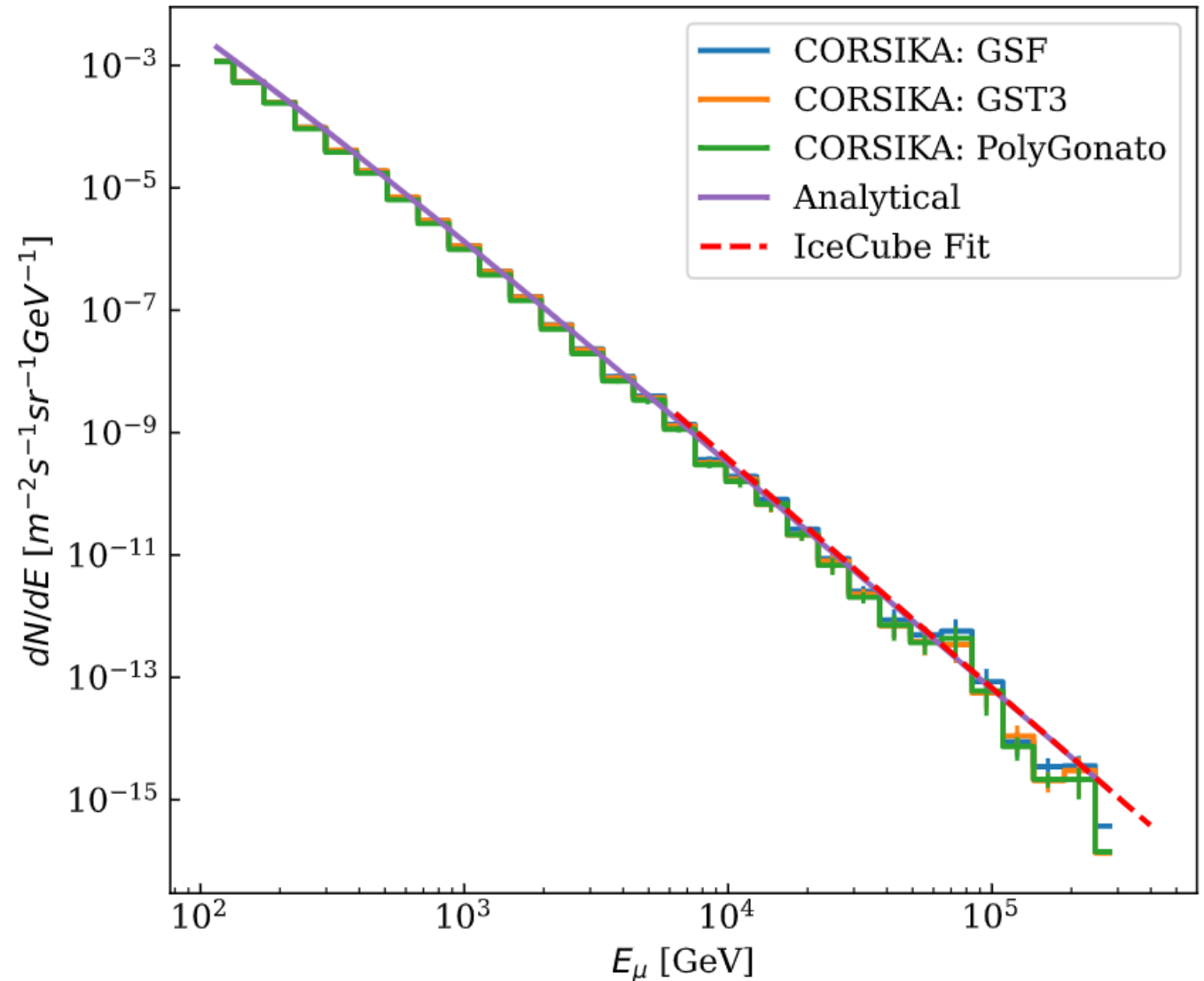
- Vertical muon flux at sea level.
- Analytical function:

Gaisser analytical parametric model

[\(Particle Data Group\) 2022, 083C01 \(2022\)](#)

$$\frac{dN_\mu}{dE_\mu d\Omega} \approx \frac{0.14 E_\mu^{-2.7}}{\text{cm}^2 \text{ s sr GeV}} \times \left\{ \frac{1}{1 + \frac{1.1 E_\mu \cos \theta}{115 \text{ GeV}}} + \frac{0.054}{1 + \frac{1.1 E_\mu \cos \theta}{850 \text{ GeV}}} \right\}$$

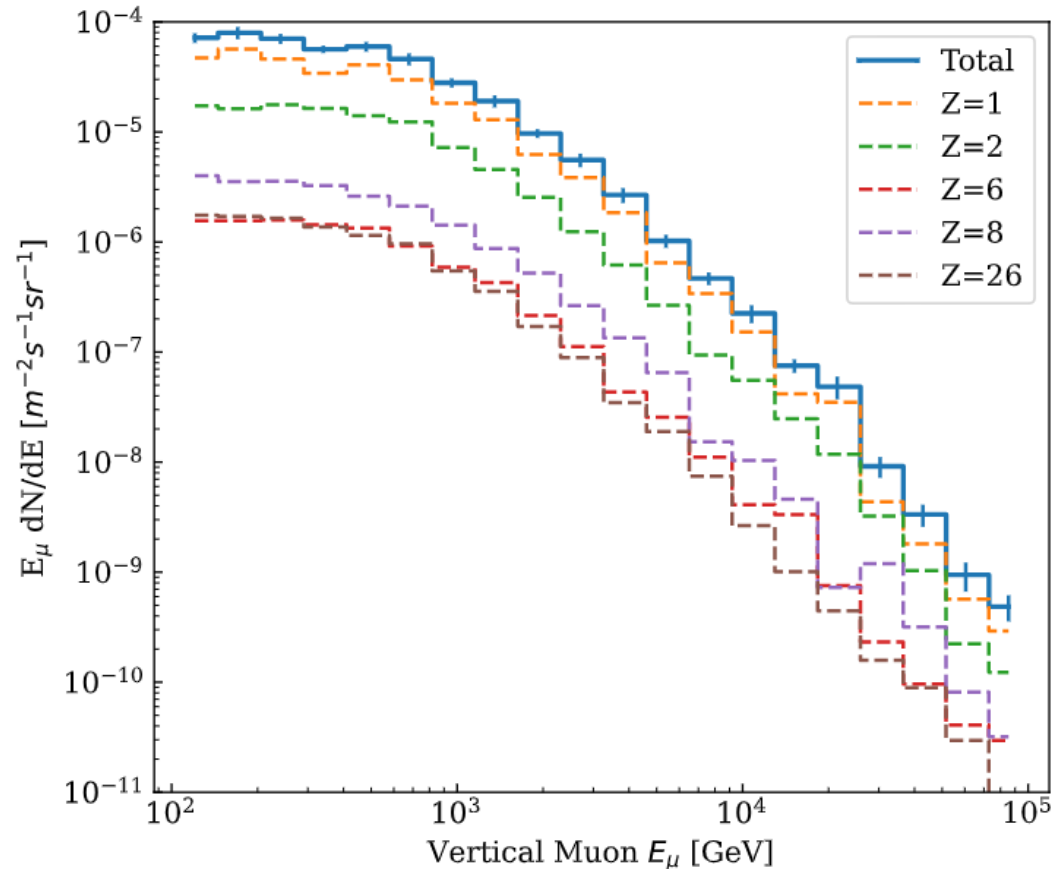
Pion Kaon



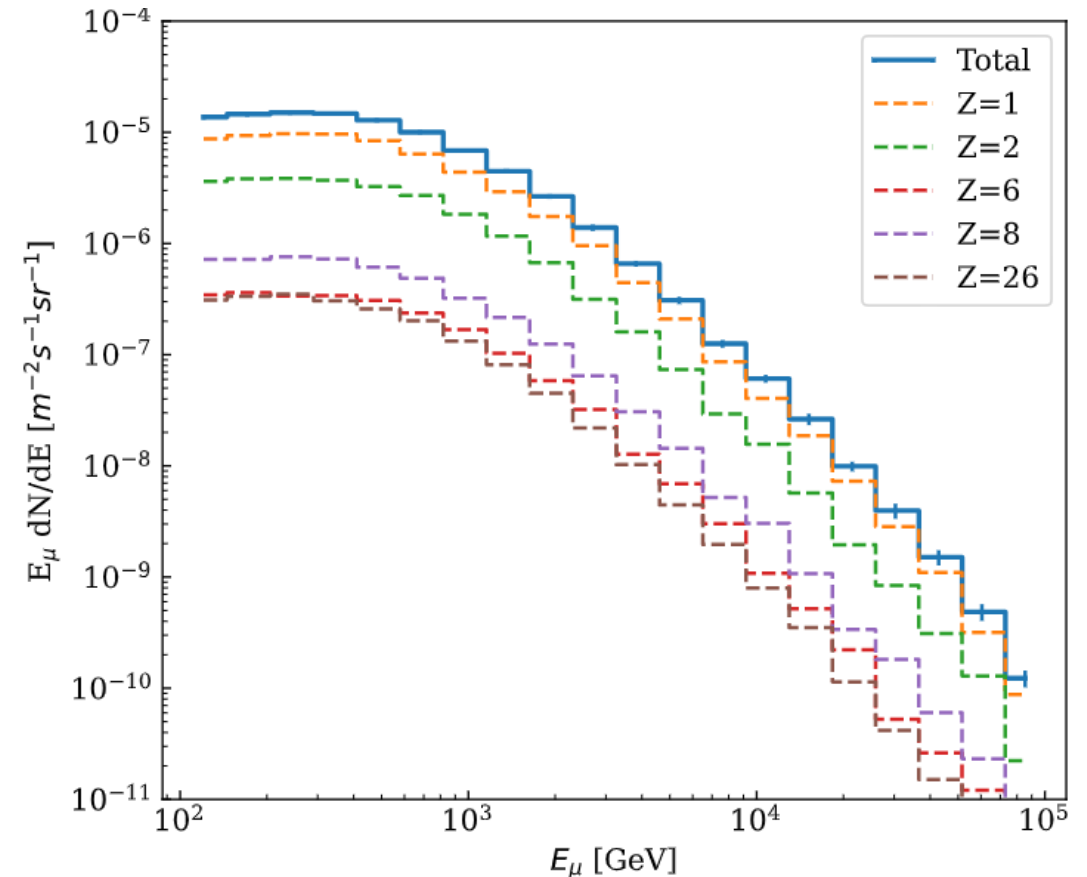
Muon flux at a depth of 2.5 km beneath the sea level as a function of muon energy.

- Types of primary nucleus are shown in dashed line
- Rate of atmospheric muon (0.1-100TeV) for a plate with 2 km radius: **2672.15Hz**.

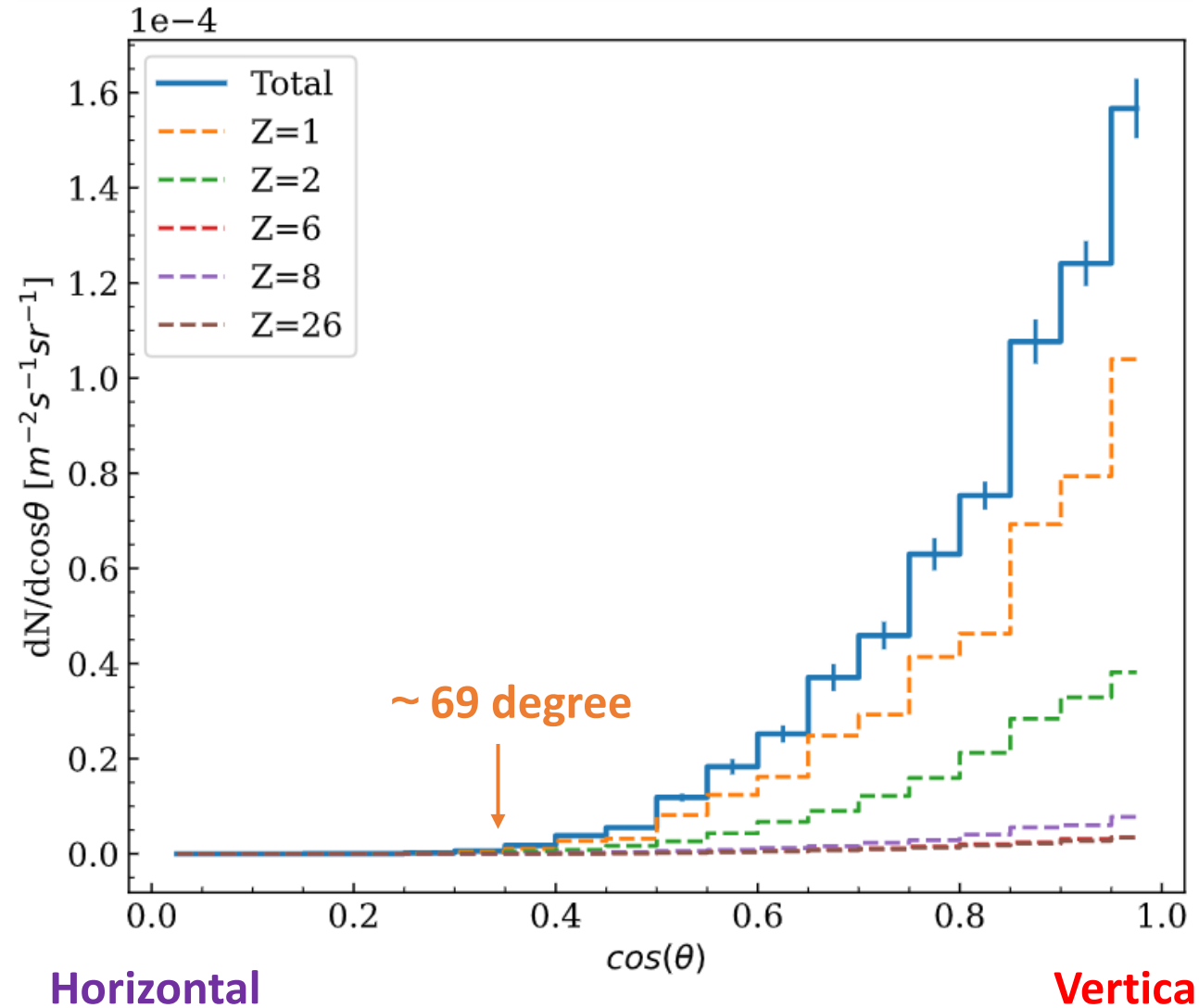
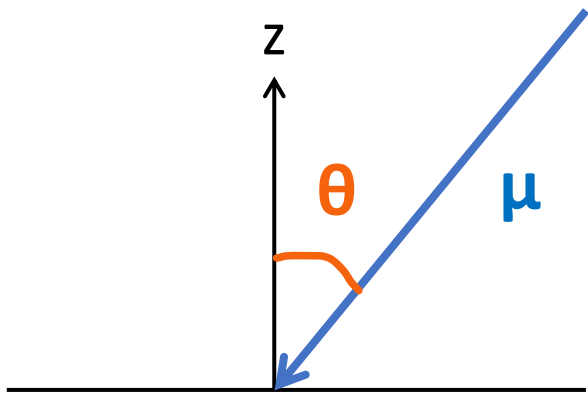
Vertical muon



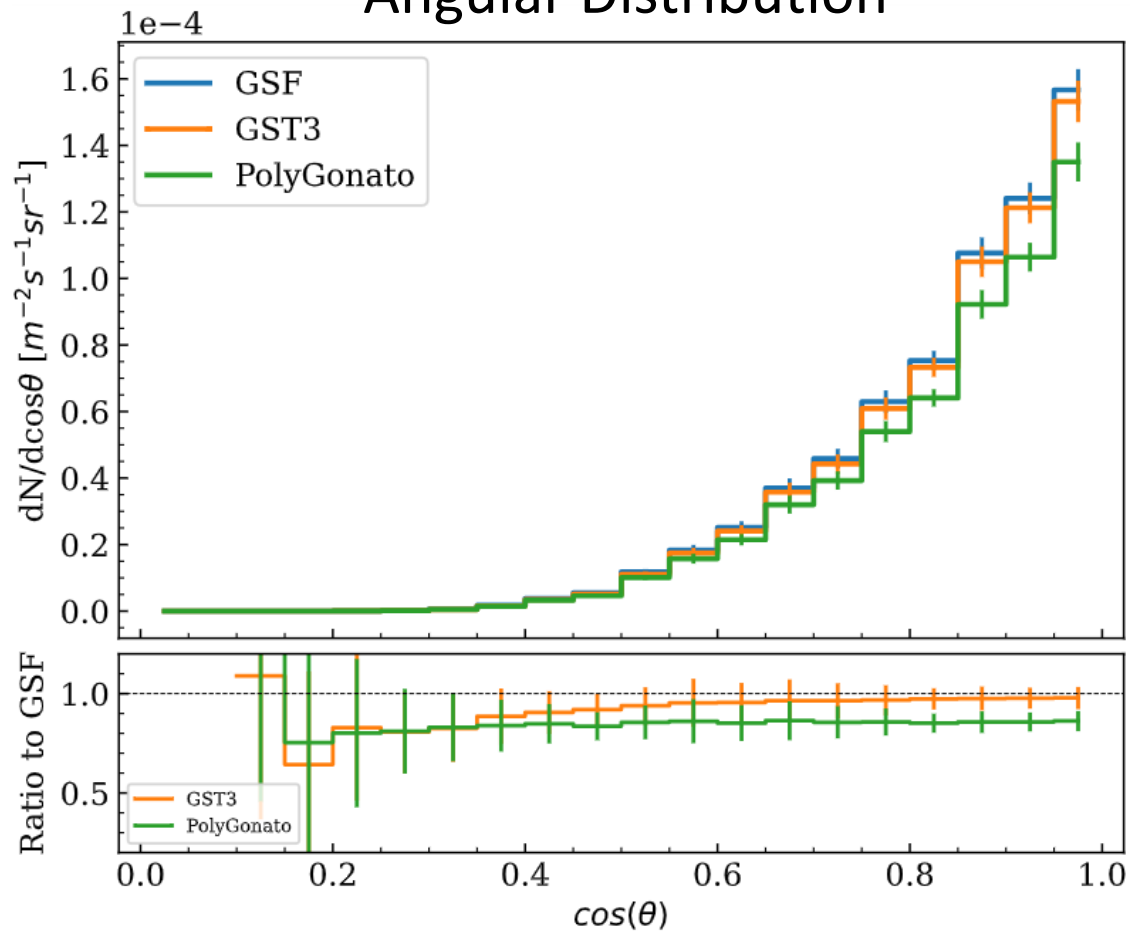
Muon from all direction



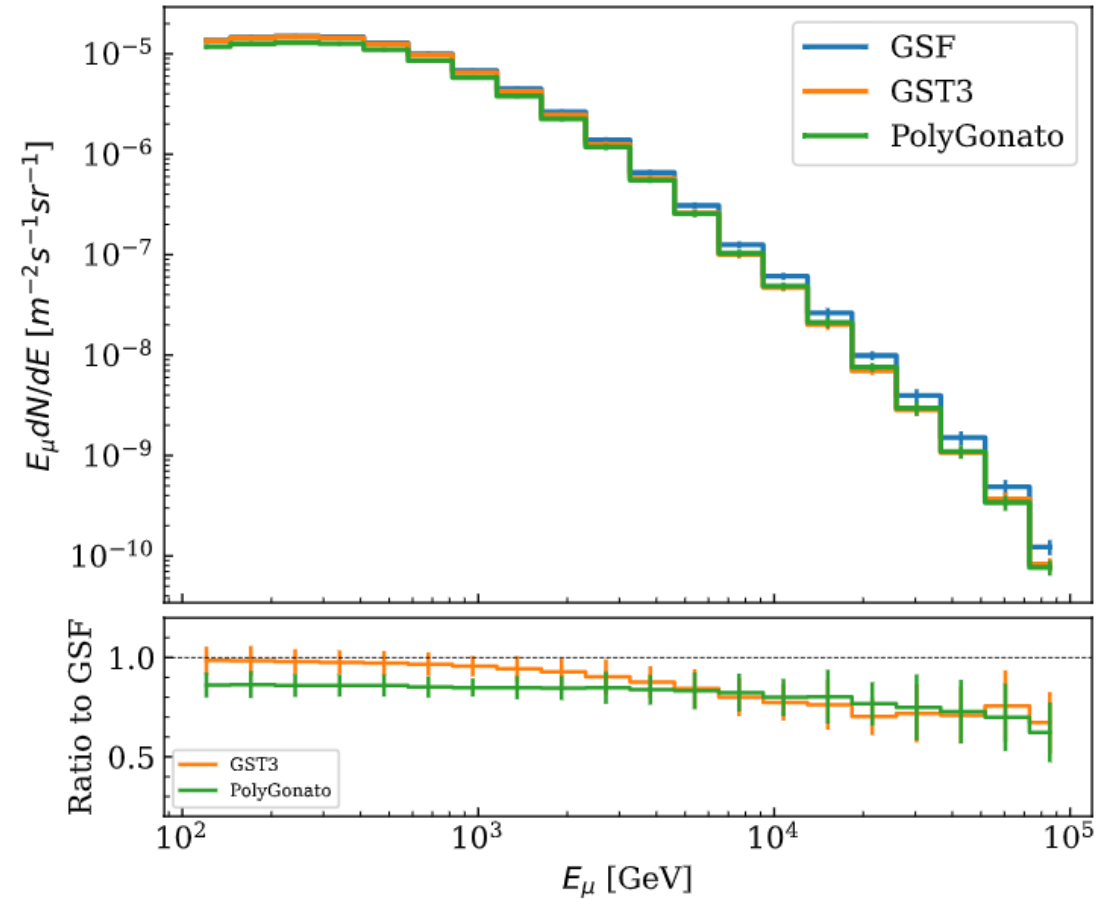
Muon flux at a depth of 2.5 km beneath the sea level as a function of $\cos(\theta)$



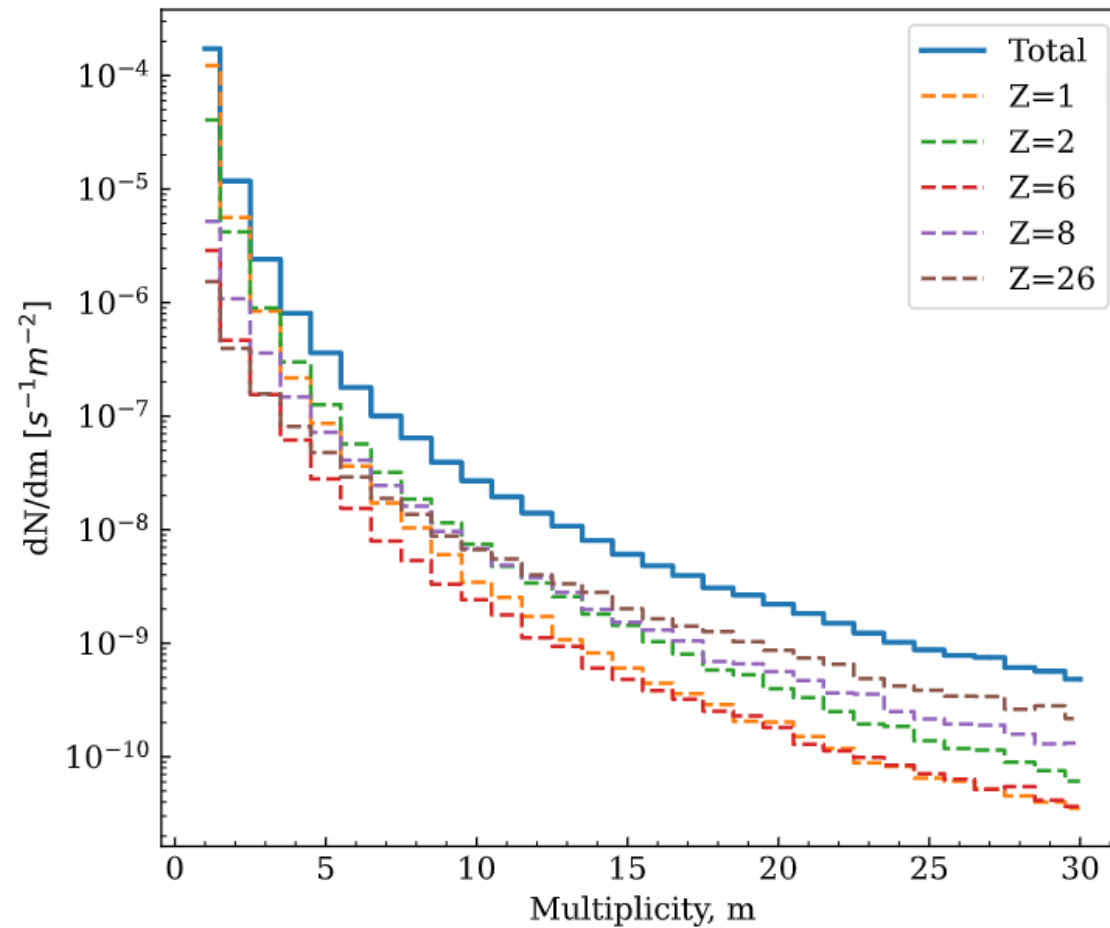
Angular Distribution



Energy Spectrum



- **Muon Multiplicity:** number of muons originating from the same primary particle.
- Most (91%) events contain only single muon.
- It is sensitive to Z of primary particles.



Reconstruction of muon events:

Traditional method: **Likelihood method.**

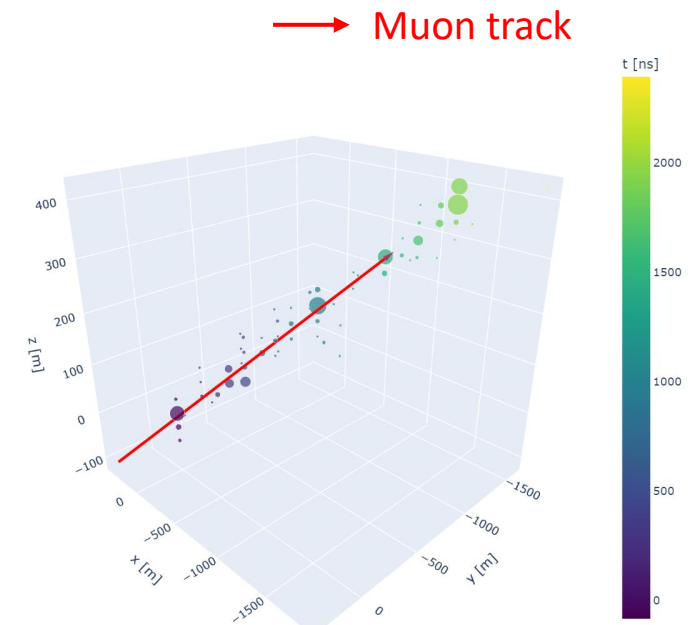
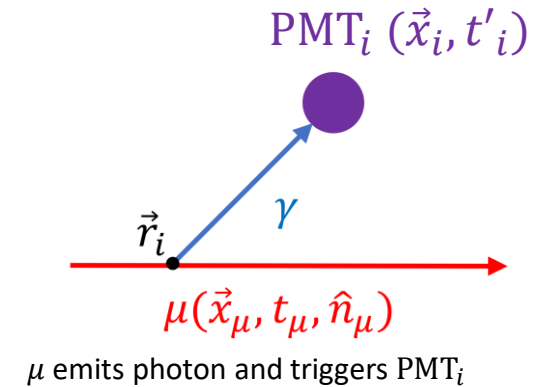
- Construct probability density function (PDF) with Monte Carlo result:

$$\text{Likelihood}(\hat{n}_\mu, \vec{x}_\mu, t_\mu; \vec{x}_i, t'_i) = \prod_i P(t_i^{res})$$

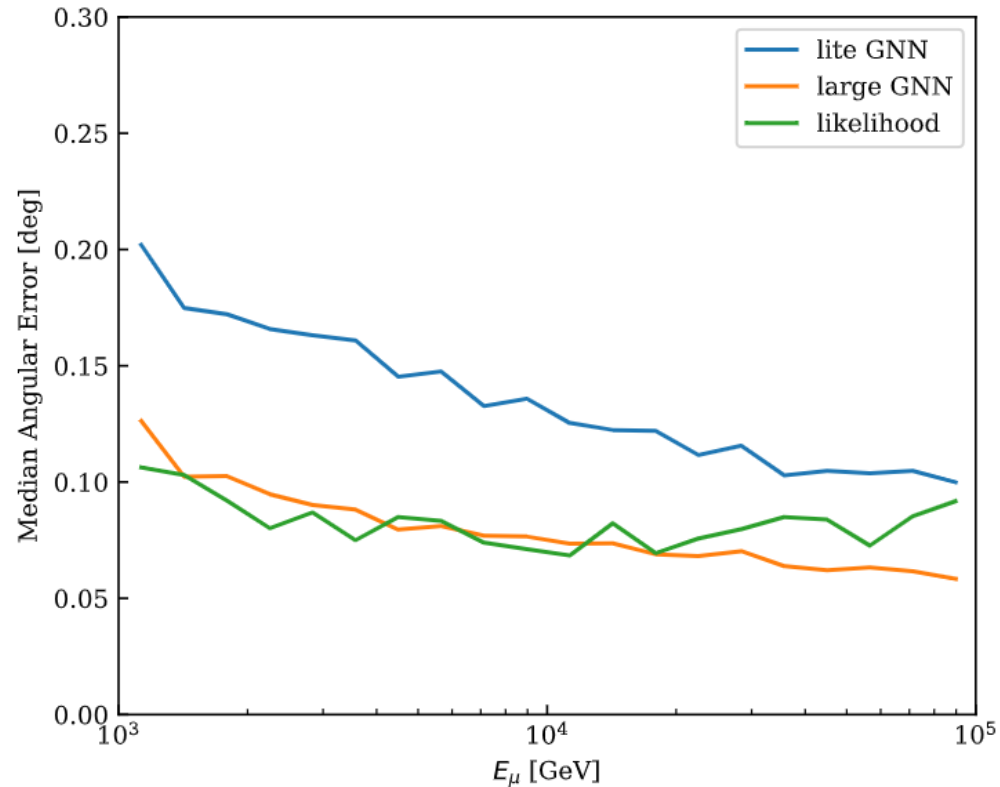
- **High accuracy**
- **High runtime cost**

Graph Neural Network (GNN) based method:

- Represent each digital optical module as a node. Train GNN with Monte Carlo result.
- **High accuracy**
- **Low runtime cost**



Angular resolution of different methods



Mean runtime cost per event

Method	Time (1-10 TeV) [ms]	Time (10-100 TeV) [ms]
Likelihood	1290.52	847.27
GNN lite (GPU)	0.27	0.57
GNN large (GPU)	1.21	3.53
GNN lite (CPU)	7.26	17.87
GNN large (CPU)	95.67	231.97

Define control region with atmospheric muons

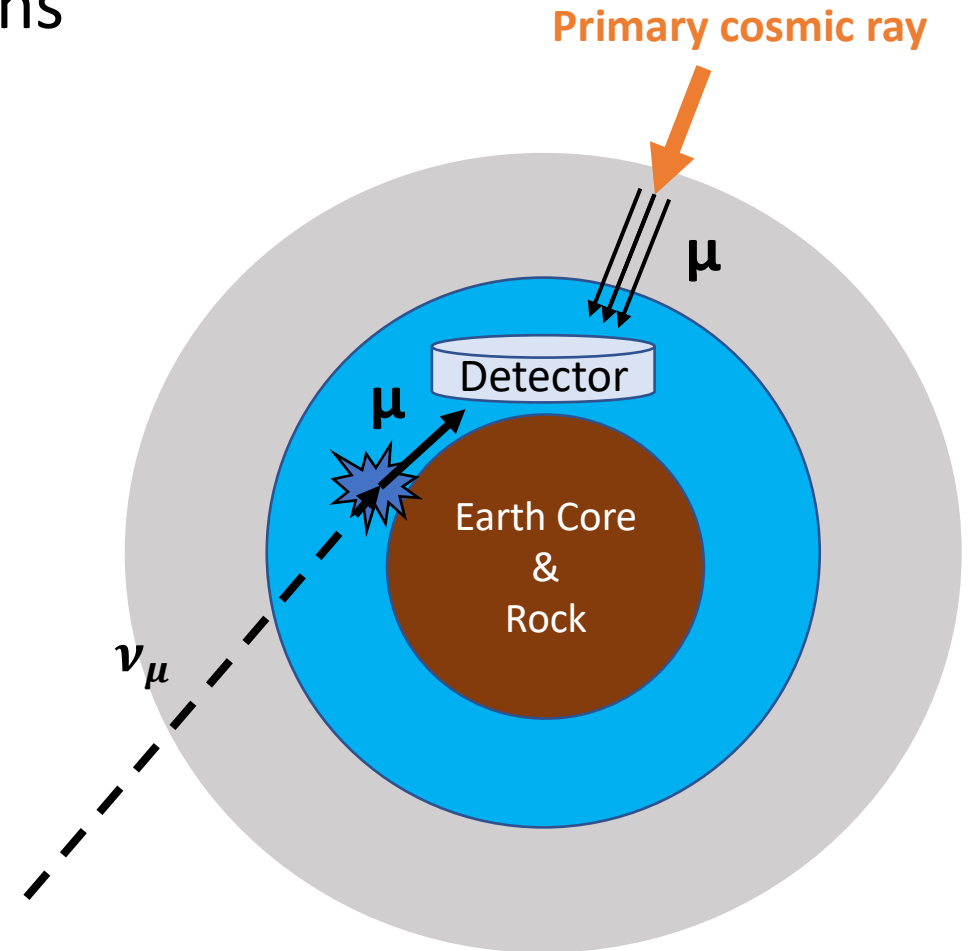
Down-going muon events:

- Dominated by atmospheric muons (**background**).
- High flux.
- Control Region (CR).

Up-going muon events:

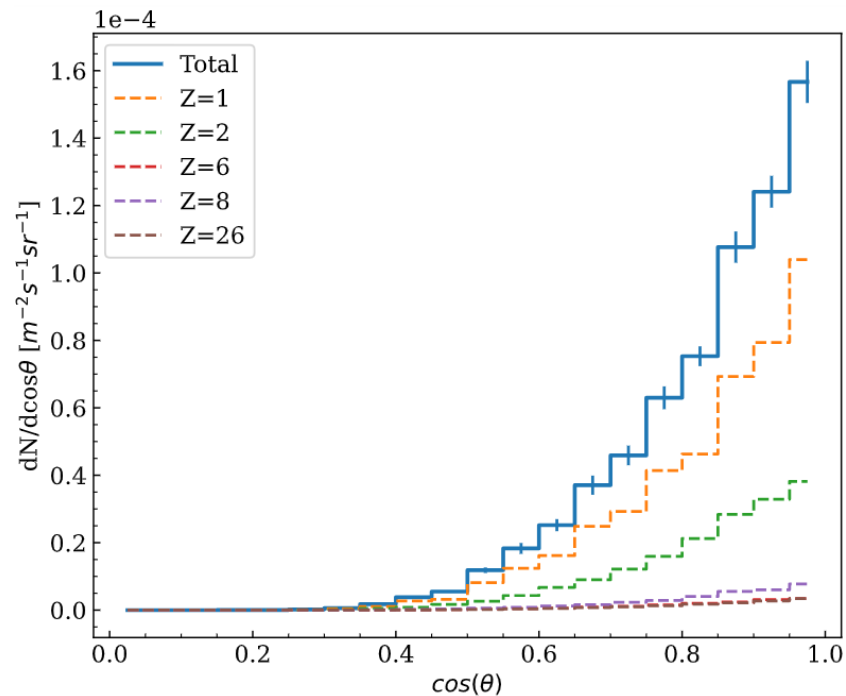
- Dominated by neutrino events (**signal**).
- Signal Region (SR).

Define CR to calibrate simulation & reconstruction.



To calibrate the simulation & reconstruction algorithm:

- Measure the atmospheric muons directly.
- Compare directly measured results with:
 - Reconstructed direction.
 - Flux of different direction (from MC results).



A study on high energy **atmospheric muon** is conducted:

- **Full simulation** of atmospheric muons were performed with CORSIKA8.
- Results across three cosmic ray flux models were compared:
 - The choice of model can lead to **~20% variation** in outcomes.
- At a depth of 2.5 km under sea water, the rate of atmospheric muon (0.1-100TeV) is approximately **$2 \times 10^{-4} \text{Hz/m}^2$** .
- The angular resolution for high-energy muon tracks is approximately **0.1 degrees**.

Outlook:

- The **composition of cosmic ray** can be inferred by reconstructing multiplicity of muon bundle.
- Muon simulation & reconstruction algorithms can be **calibrated** with atmospheric muons.

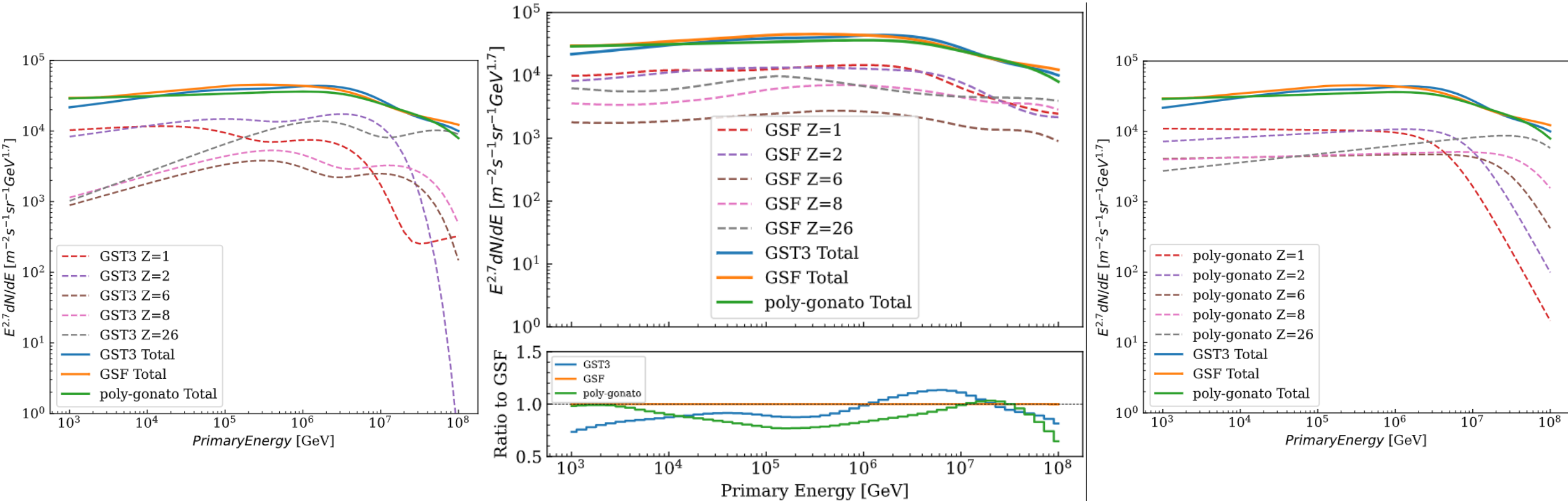


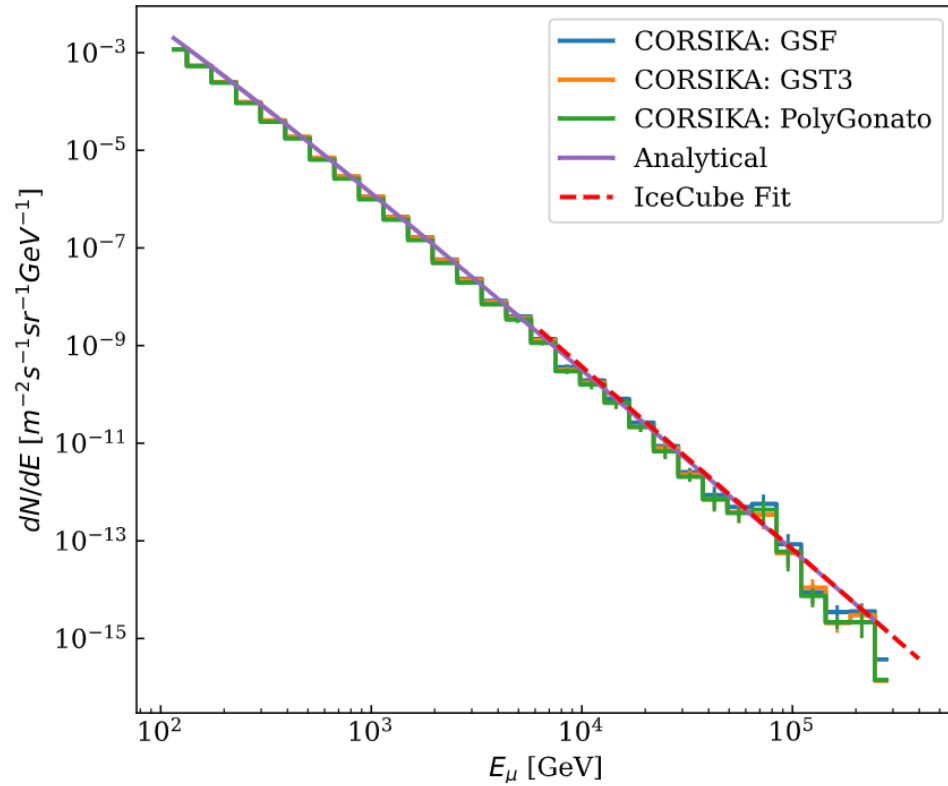
Thanks!

mo_cen@sjtu.edu.cn

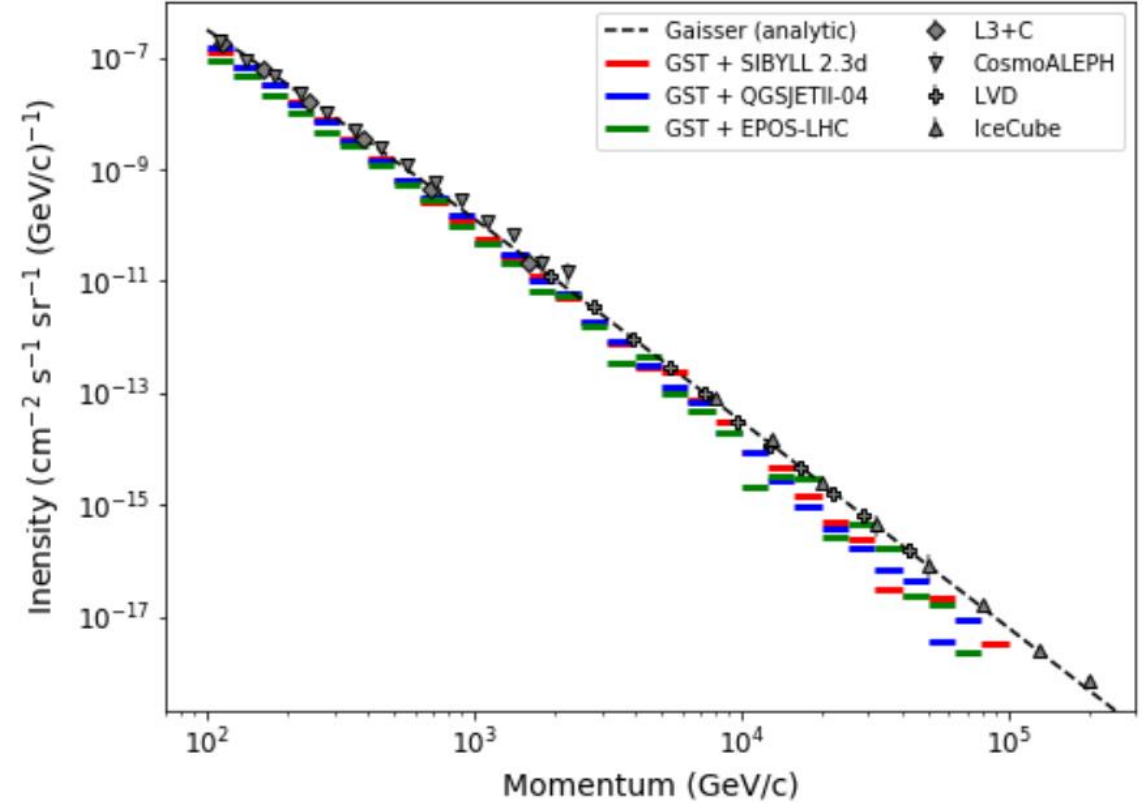


Backup



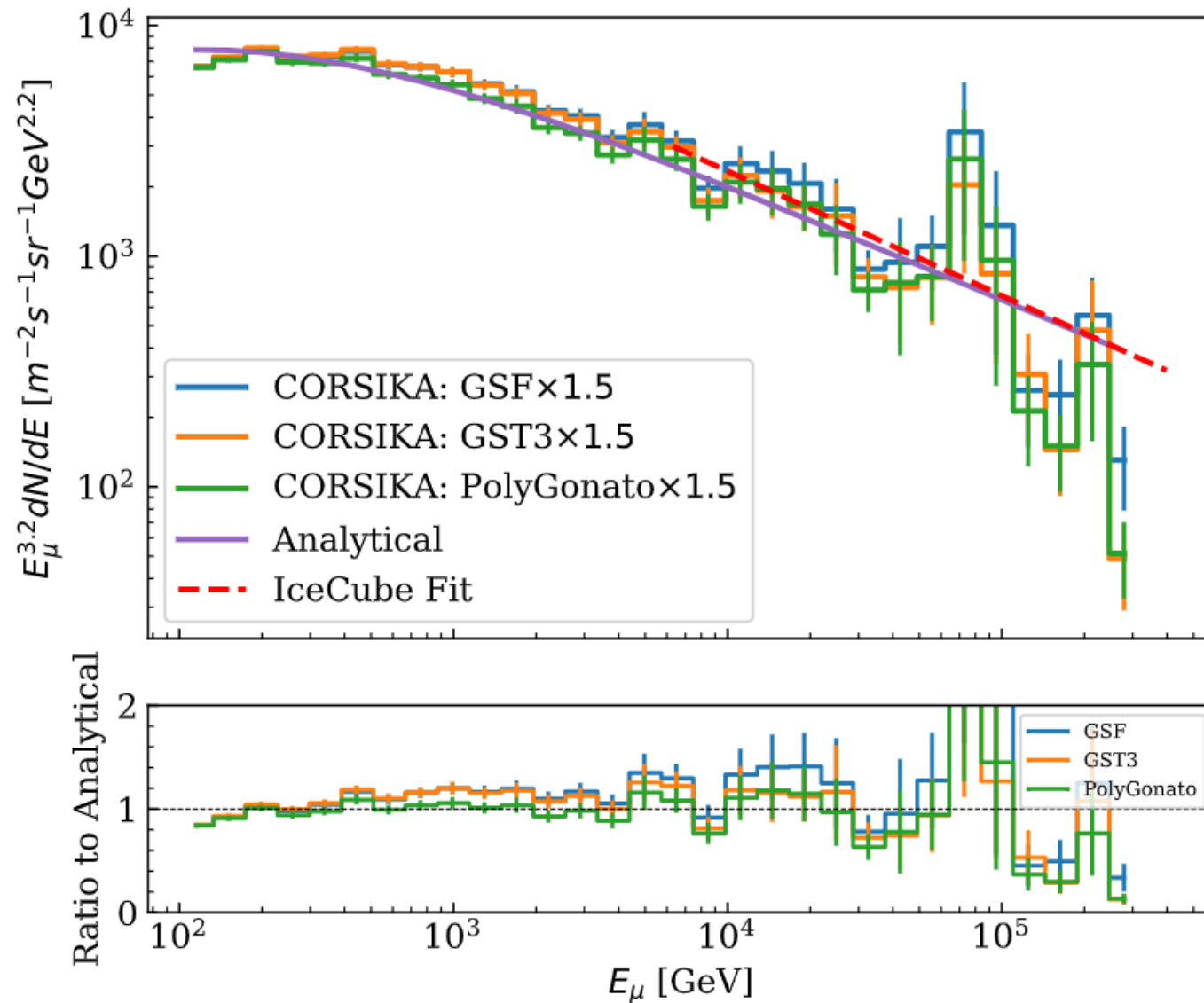


This study

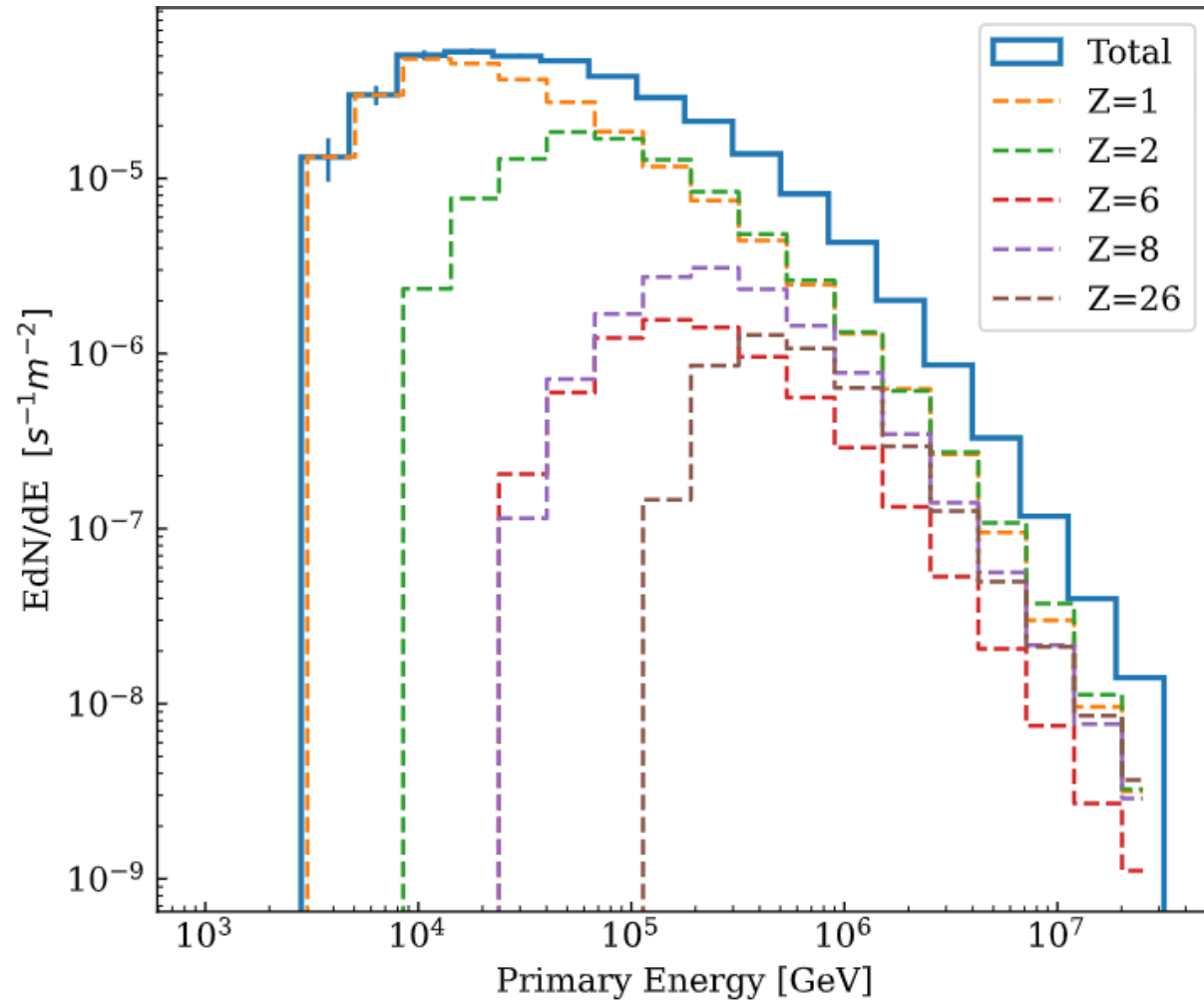


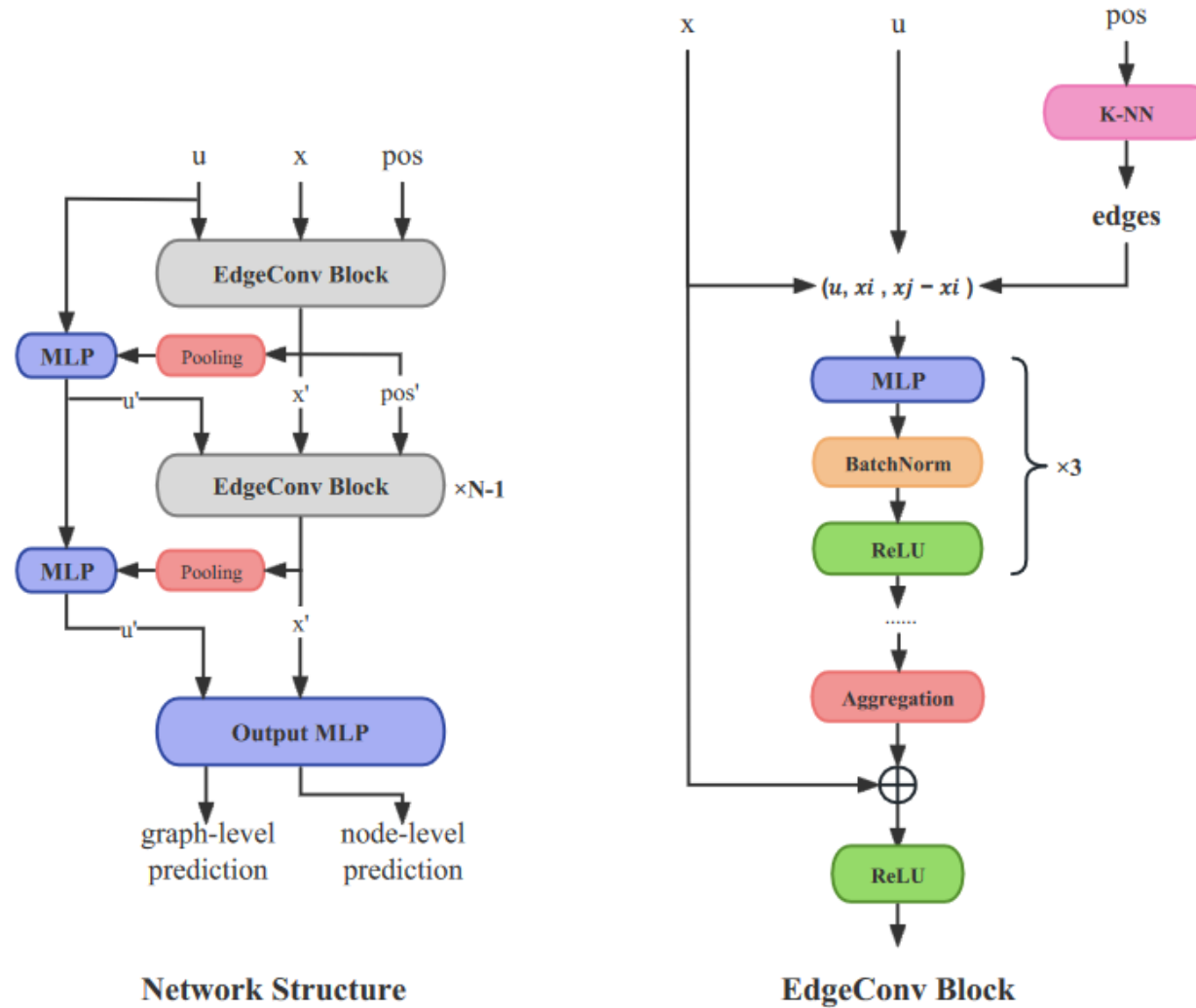
Based on CORSIKA7.741

<https://pos.sissa.it/423/071>



- Energy distribution of primary particles





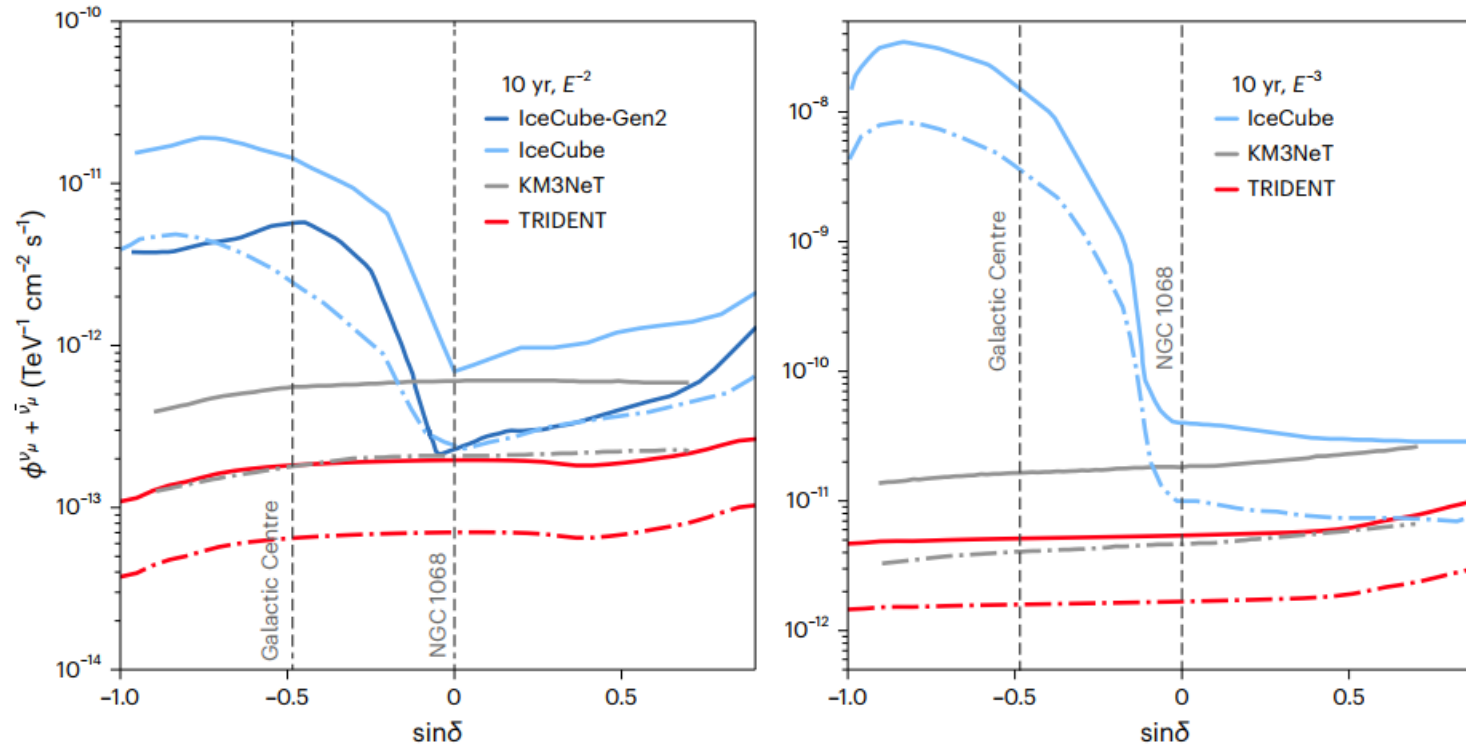


Fig. 3 | Projected point source sensitivities and discovery potentials of TRIDENT. All-sky point source 90% confidence-level median sensitivity (dashed dot lines) and 5σ discovery potential (solid lines) of TRIDENT with 10 years of data taking. The left panel corresponds to a source energy spectrum index of 2 (labelled E^{-2}) and minimum energy of 10 TeV, while the right panel assumes an index of 3 (E^{-3}) and minimum energy of 1 TeV. The x axis represents the sine declination ($\sin\delta$) and the y axis is the neutrino flux (ϕ). KM3NeT, IceCube and

IceCube-Gen2 sensitivities^{15,66,67} are also shown for comparison. IceCube, located at the South Pole, has increased sensitivity to the northern sky. For a source located in the southern sky with a spectral index of 3, TRIDENT will have 4 orders of magnitude improvement in sensitivity compared with IceCube. Similarly comparing to the future telescope KM3NeT located in the Northern Hemisphere yields an improvement factor of approximately 5.