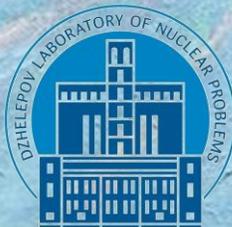


# Neutrino Telescope Simulation (NTSim)

Sergey Zavyalov

JINR/MSU



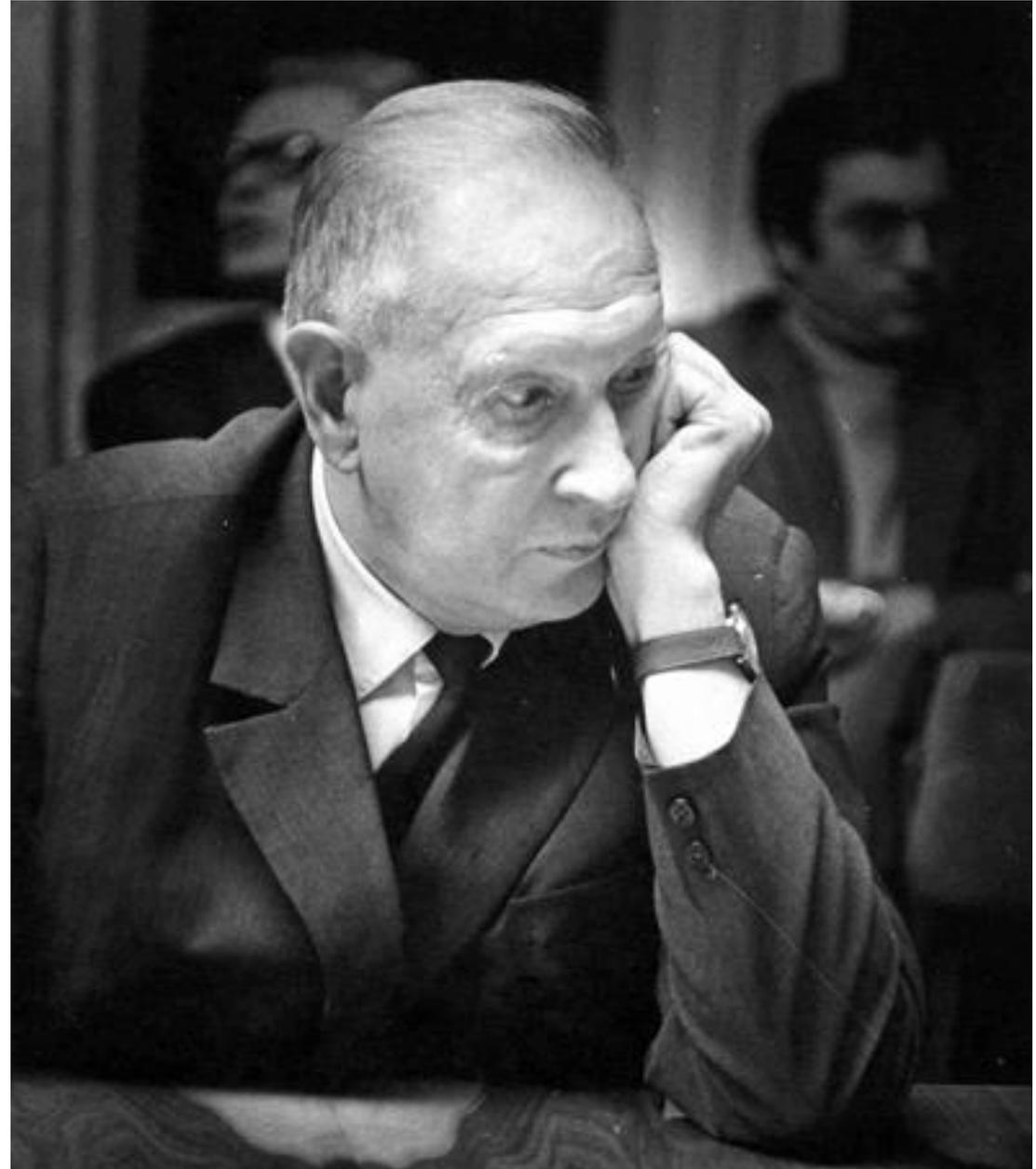
Moscow International School of Physics (MISP24)

HSE study center, Voronovo, Moscow region, Russia

1941  
Sergey Zavyalov

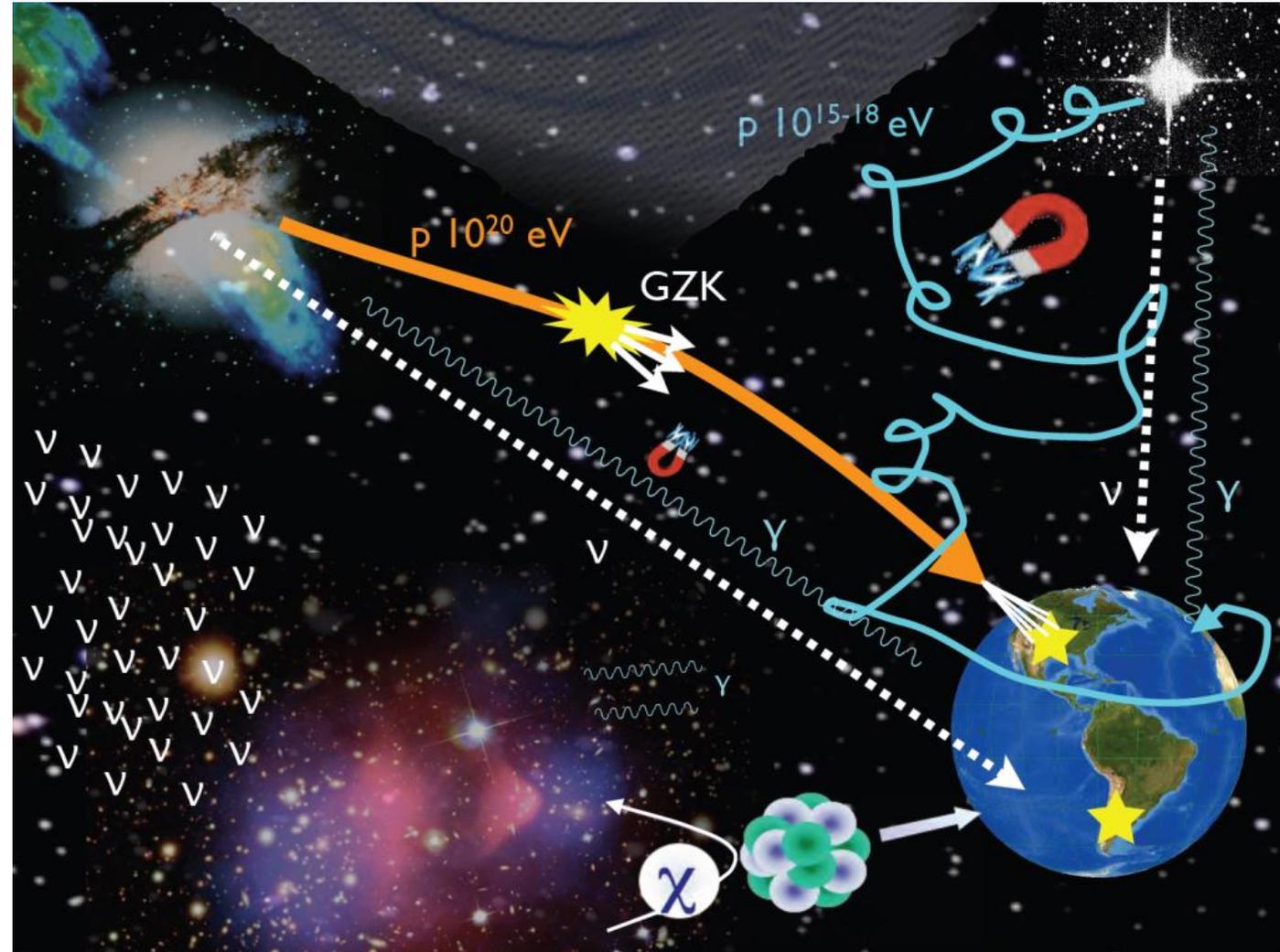
# Astrophysical neutrinos detection

- Moses Markov (1960) proposed creating a **network of optical detectors** in a **transparent natural environment** (water/ice) to register **optical flashes** (Cherenkov radiation) from neutrino interactions.



# Astrophysical neutrinos detection

- **Principle 1:** Neutrinos **interact** very **weakly** with matter (via weak and gravitational forces) - they can **propagate** enormous large distances **without changing** their trajectory.
- **Sources:** **AGNs**, **GRBs**, **SMBHs**, etc.  
([arXiv:2311.00281](https://arxiv.org/abs/2311.00281))

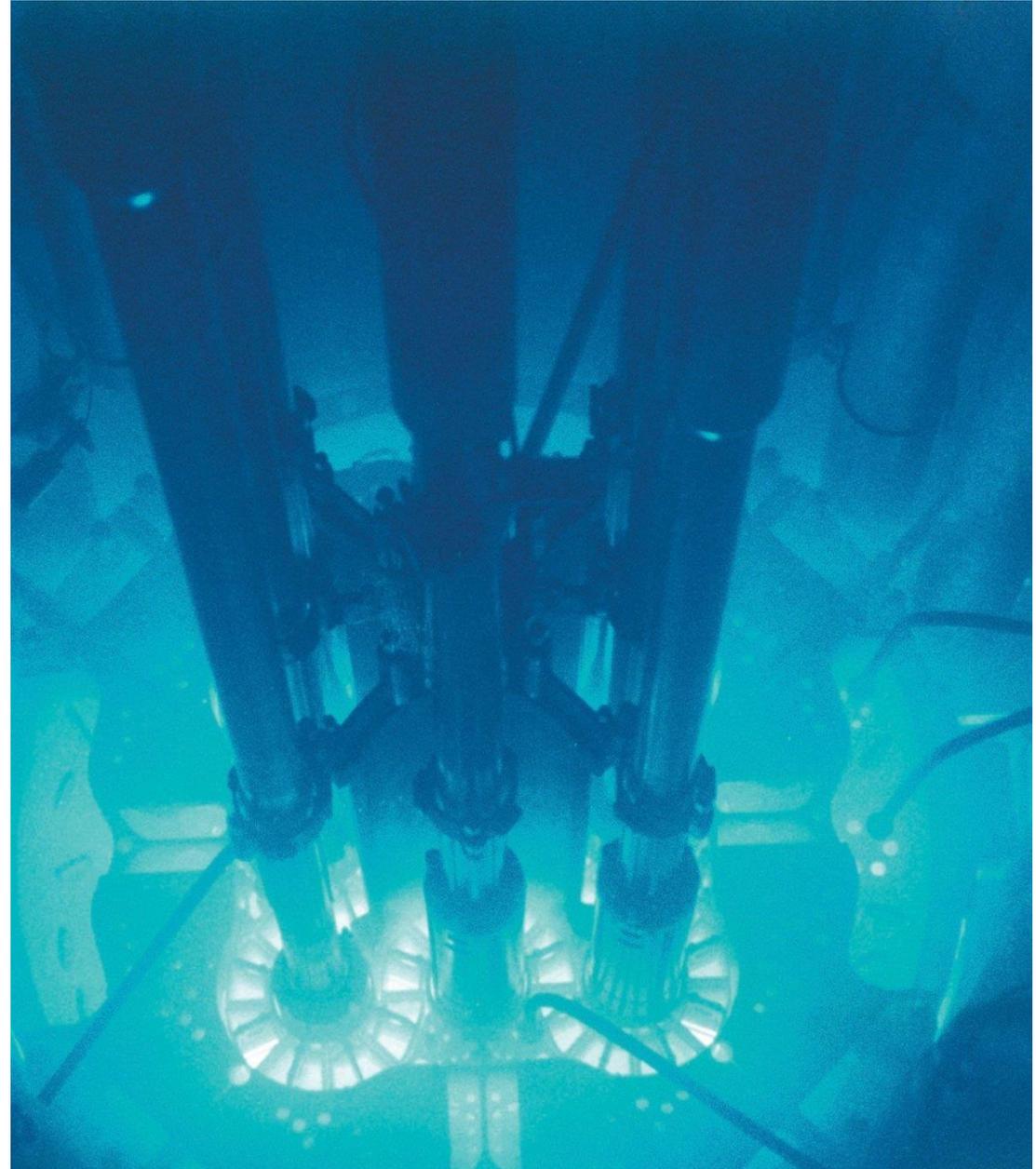
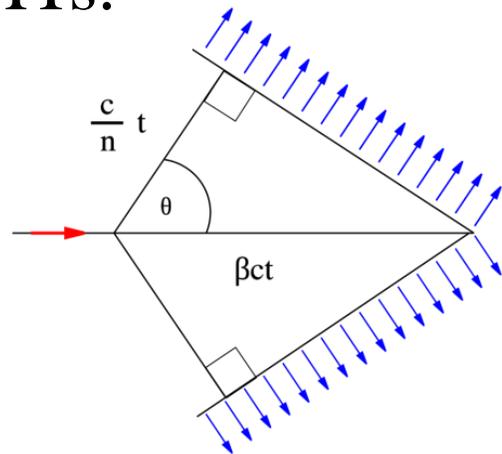


# Astrophysical neutrinos detection

- **Principle 2:** Neutrinos can **interact** with nucleons in **water** or **ice**, generating high-energy **charged particles** that generate **Cherenkov radiation** detected in the PMTs.

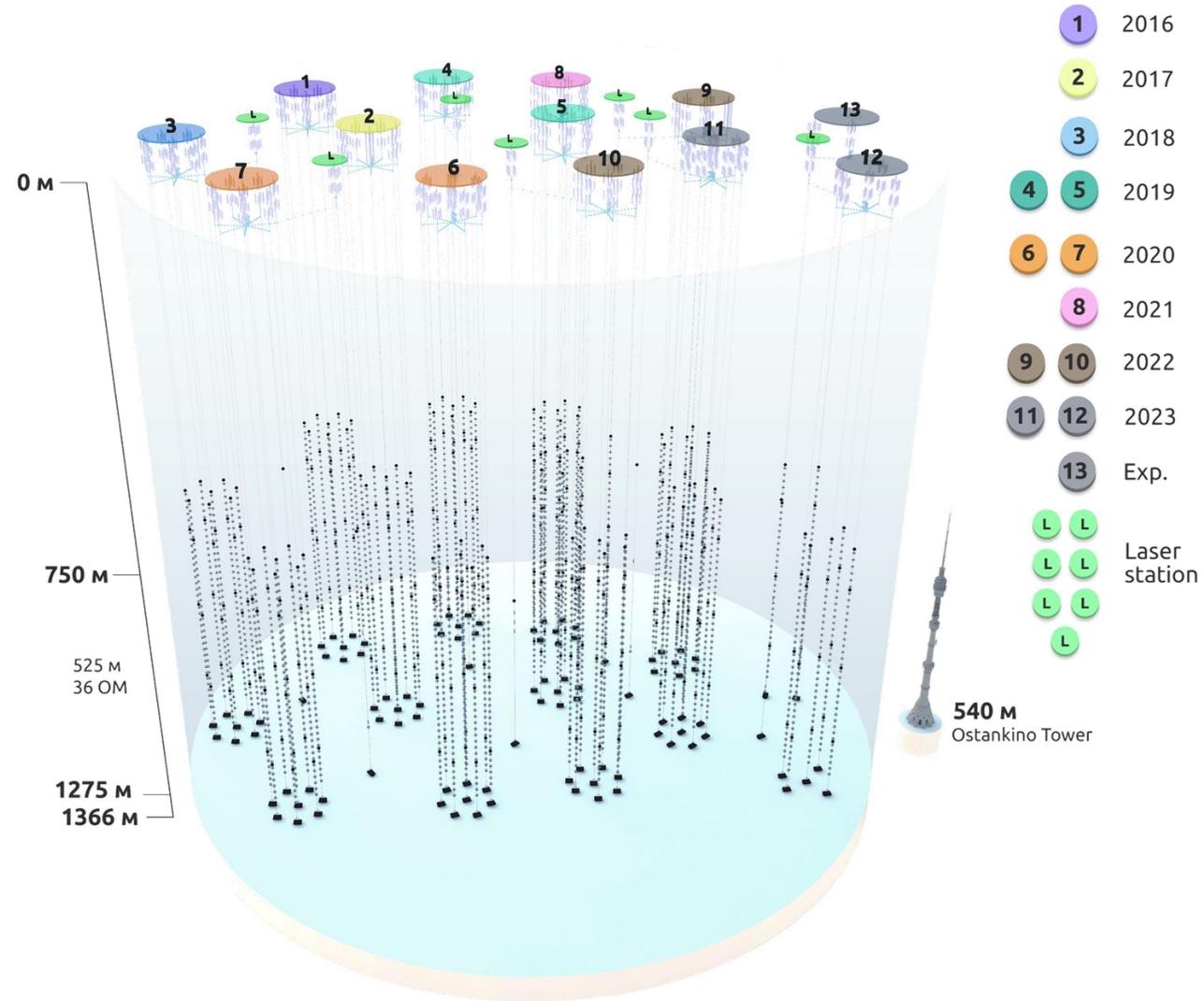
$$\frac{d^2 N}{dx d\lambda} = \frac{2\pi\alpha}{\lambda^2} \sin^2 \theta -$$

Frank-Tamm formula



# Baikal-GVD

- GVD – Gigaton Volume Detector
  - Current geometrical volume  $\approx 0.5 \text{ km}^3$
  - Effective volume for  $E \approx 100 \text{ TeV} \sim 0.1 \text{ km}^3$  for tracks per cluster
  - 36 Optical Modules (OMs) per 1 string
  - 8 strings in 1 cluster
  - Total 12 clusters
  - 3456 (+exp. & lasers) OMs
- ([Proc. Sci. ICRC2021, 395, 002](#))





Baikal GVD 2024



Дневник Баира  
Майбонова



Joint Institute  
for Nuclear Research

3 марта. День семнадцатый

# Underlying principles

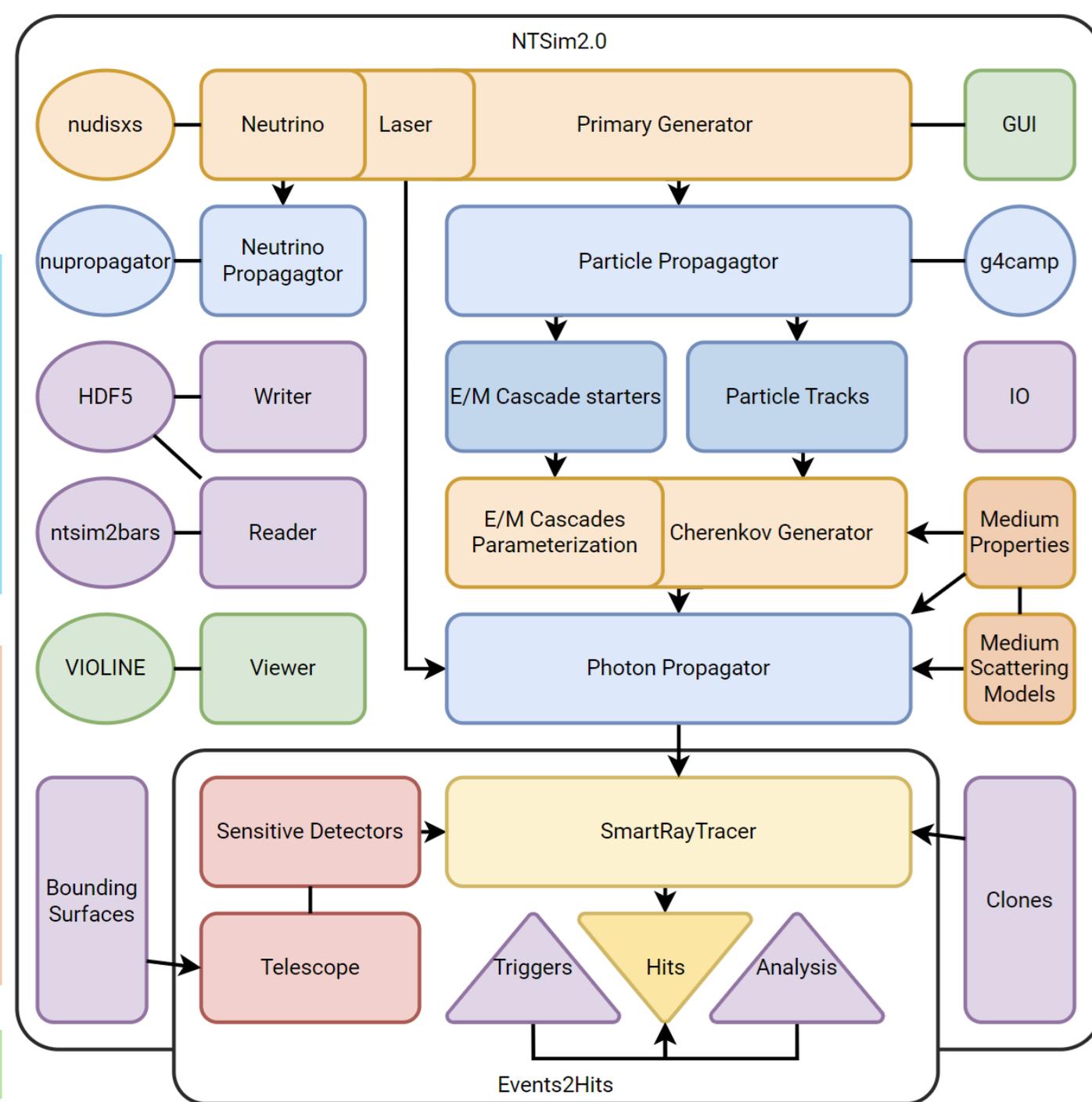
## Simulation quality/rapidity

- Parameterization of e/m cascades
- Simulation of Cherenkov photons
- Intersection of Cherenkov photons with a Cluster/String/OM to calculate the response

## Modularity

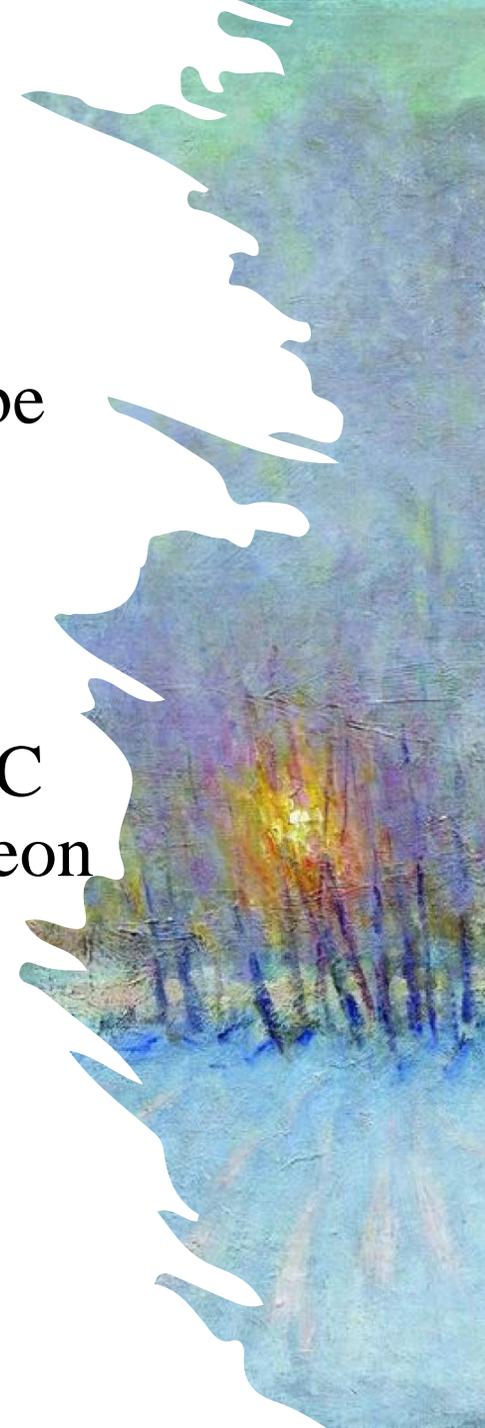
- NTSim – basic engine
- g4camp – based on [Geant4](#) with [geant4\\_pybind](#)
- Telescope – the response calculation for broad range of neutrino telescopes

User friendly → Python, GUI



# NTSim Structure: Primary Generators

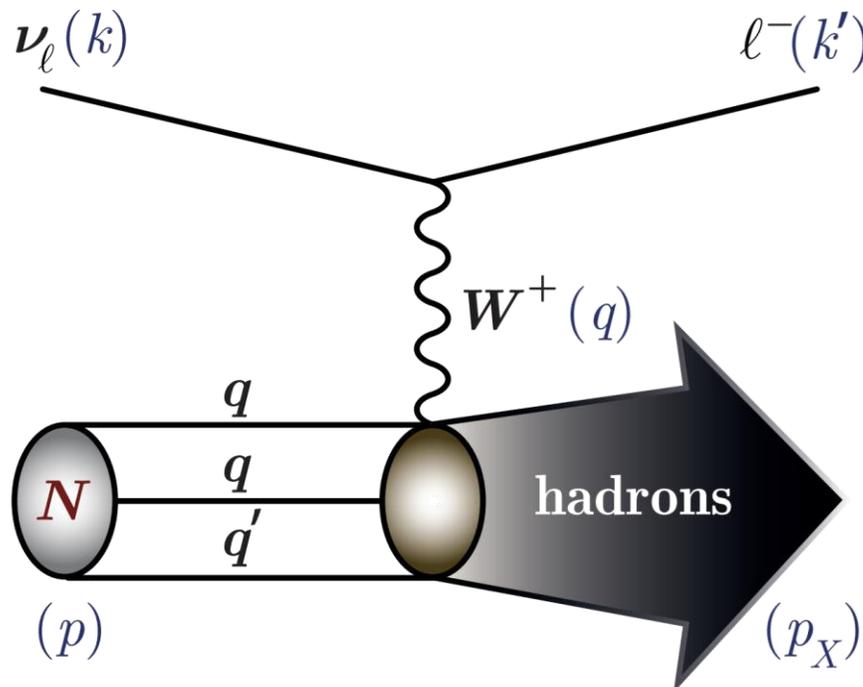
- Particle **generators** are needed to **initialize** an event that will be simulated in NTSim.
- **NuGen**
  - based on [nupropagator](#) and [nudisxs](#)
  - initializes the event of neutrino-nucleon interaction via CC or NC with the generation of lepton, pion and recoil nucleon
- **ToyGen**
  - based on [g4camp](#) ([documentation](#))
  - initializes the primary particle from Geant4
- **Laser + Diffuser**
- **SolarPhotons**



# NTSim Generators: NuGen

- **Target:** proton/neutron
- **Energy range:** Deep Inelastic Scattering (DIS) -  $[10^1, 10^8]$  GeV

- $\frac{d^2\sigma}{dx dy} = \frac{G_F^2}{2\pi} \frac{s}{(1+Q^2/M_W^2)^2} \mathcal{R},$
- $\mathcal{R} = \sum_{i=1}^5 A_i(x, y, E_l) F_i(x, Q^2)$
- $F_i(x, Q^2)$  – **structural functions**

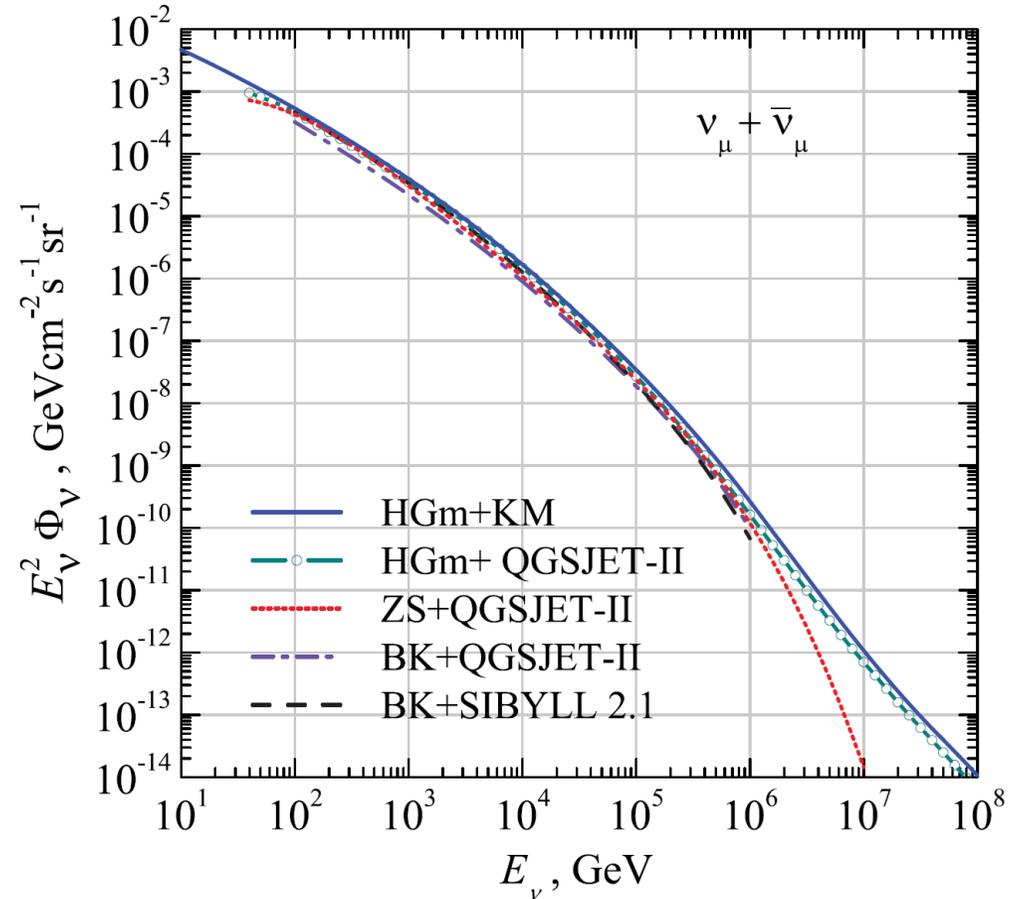


Structural functions are expressed in terms of experimentally measured Parton Distribution Functions (PDF) → LHAPDF library

# NTSim Generators: NuGen

- **Neutrino flux:** atmospheric  $\nu_\mu + \bar{\nu}_\mu$   
(conventional & prompt)

([arXiv:1407.3591](https://arxiv.org/abs/1407.3591))



# NTSim Generators: NuGen

- **Neutrino flux**: atmospheric  $\nu_\mu + \bar{\nu}_\mu$   
(conventional & prompt)

([arXiv:1407.3591](https://arxiv.org/abs/1407.3591))

- Propagate through the Earth: **Z-factor**

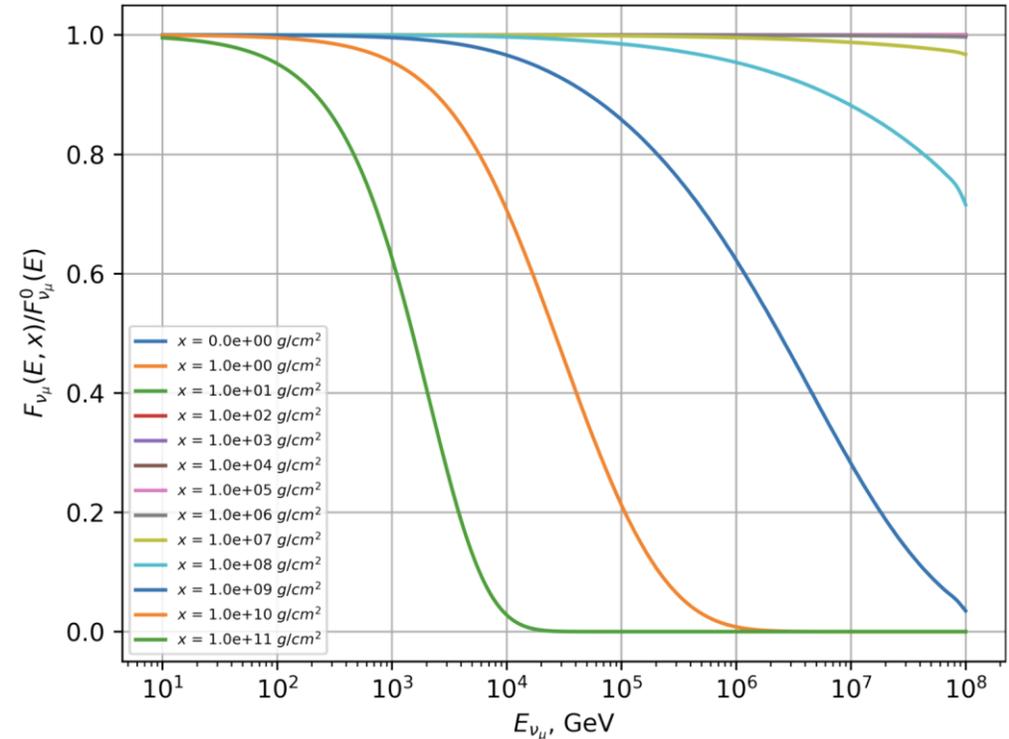
([arXiv:hep-ph/9804301](https://arxiv.org/abs/hep-ph/9804301))

$$\frac{\partial F_\nu(E, x)}{\partial x} = \frac{1}{\lambda_\nu(E)} \left[ \int_0^1 \frac{dy}{1-y} \Phi_\nu(y, E) F_\nu(E_y, x) - F_\nu(E, x) \right]$$

$$- x = \int_0^L dL' \rho(L')$$

$$- \Phi_\nu(y, E) = \lambda_\nu(E) \sum_T N_T \frac{d\sigma_{\nu T \rightarrow \nu X}(y, E_y)}{dy}$$

$$- \frac{1}{\lambda_\nu(E)} = \sum_T N_T \sigma_{\nu T}^{tot}(E)$$



The ratio of the atmospheric ( $\nu_\mu + \bar{\nu}_\mu$ ) flux at depth  $x$  to the initial neutrino spectrum.

# NTSim Structure: Propagators

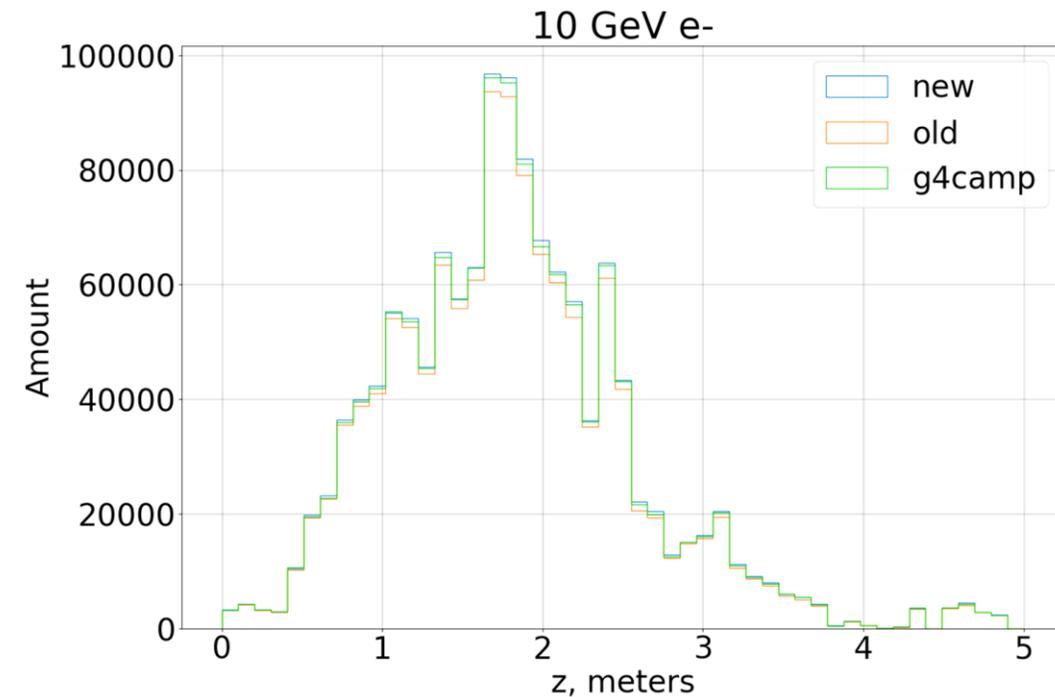
- **Propagators** are responsible for the **propagation** of particles in the medium.
- **ParticlePropagator**
  - based on [g4camp](#) ([documentation](#))
  - simulates the passage of particles above the Cherenkov threshold through matter via the [Geant4](#) toolkit
- **NuPropagator**
  - based on [nupropagator](#)
  - reconstructs the track of the primary neutrino that flew through the Earth
- **MCPhotonTransporter**
  - Monte-Carlo simulation of photon scattering using a medium scattering model (Henyey-Greenstein)
- **Radio Transport Equation (RTE)** – ([arXiv:2401.15698](#))



# NTSim Structure:

## Cherenkov Generator

- Cherenkov generators produce Cherenkov photons either from segments of charged particle tracks or from parameterization of electromagnetic cascades.
- CherenkovGenerator
  - Tracks
    - The improvement in the simulation speed of Cherenkov photons was achieved due to their joint generation and rotation



# NTSim Structure:

## Cherenkov Generator

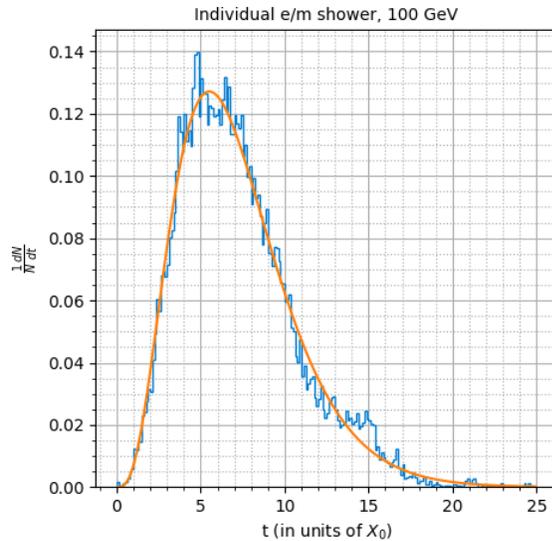
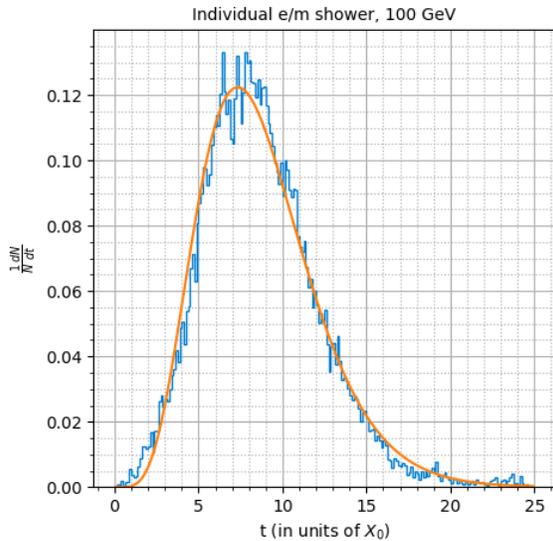
- Cherenkov generators produce Cherenkov photons either from segments of charged particle tracks or from parameterization of electromagnetic cascades.
- CherenkovGenerator
  - Tracks
  - Cascades (under validation)
    - amount of  $e^-/e^+$  are parametrized
    - gamma distribution, Greisen approximation
    - longitudinal and zenith parameterization
    - variation of MC parameters for individual e/m cascades
    - energy range is  $[10^1, 10^4]$  GeV



# Cherenkov Generator: E/m cascades

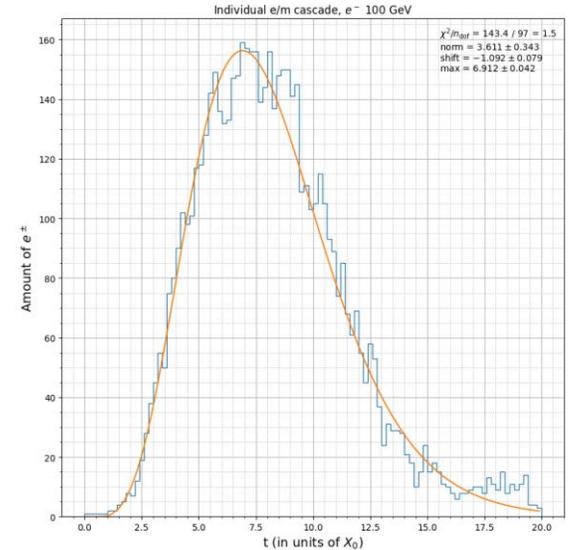
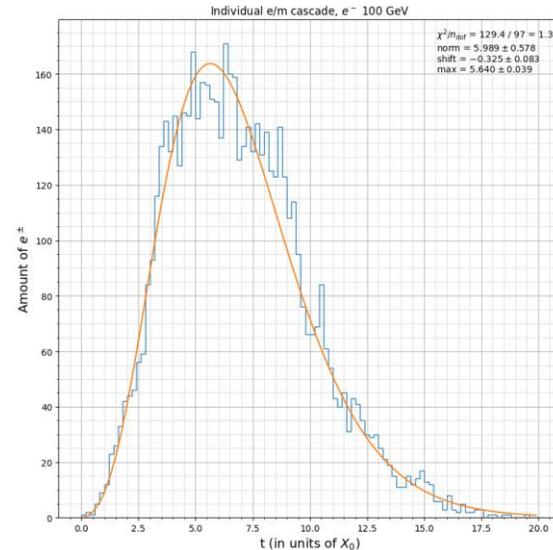
## Gamma distribution

- $f(t|\alpha, \beta) = \frac{\beta^\alpha}{\Gamma(\alpha)} t^{\alpha-1} e^{-\beta t}$ ,
  - $\alpha > 0, \beta > 0$



## Modified Greisen approximation (arXiv:0809.0190)

- $N_{e^\pm}(t|a, b, t_{max}) = \frac{0.31 \cdot a(E_{th})}{\sqrt{y(E_0, E_C)}} s(t_1, y)^{-1.5 \cdot t_1} e^{t_1}$ 
  - $s(t_1, y) = \frac{3 \cdot t_1}{t_1 + 2 \cdot y(E_0, E_C)} \Theta(t_1)$
  - $t_1 = t + b(E_{th}), \quad y(E_0, E_C) = t_{max}(E_0, E_C) + b(E_{th})$

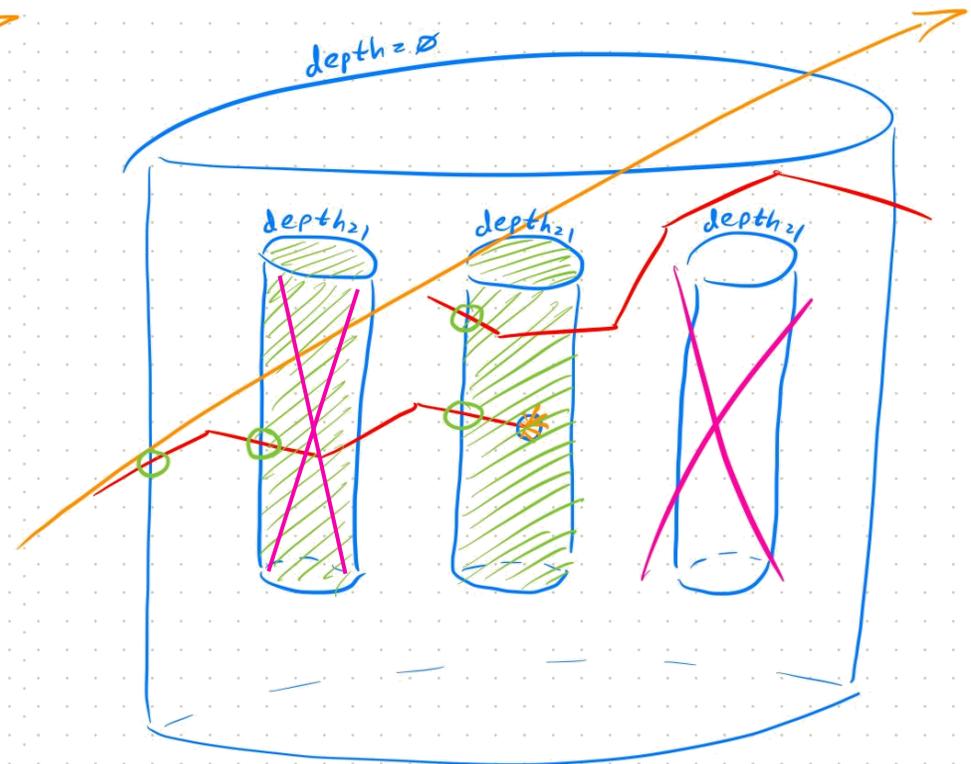
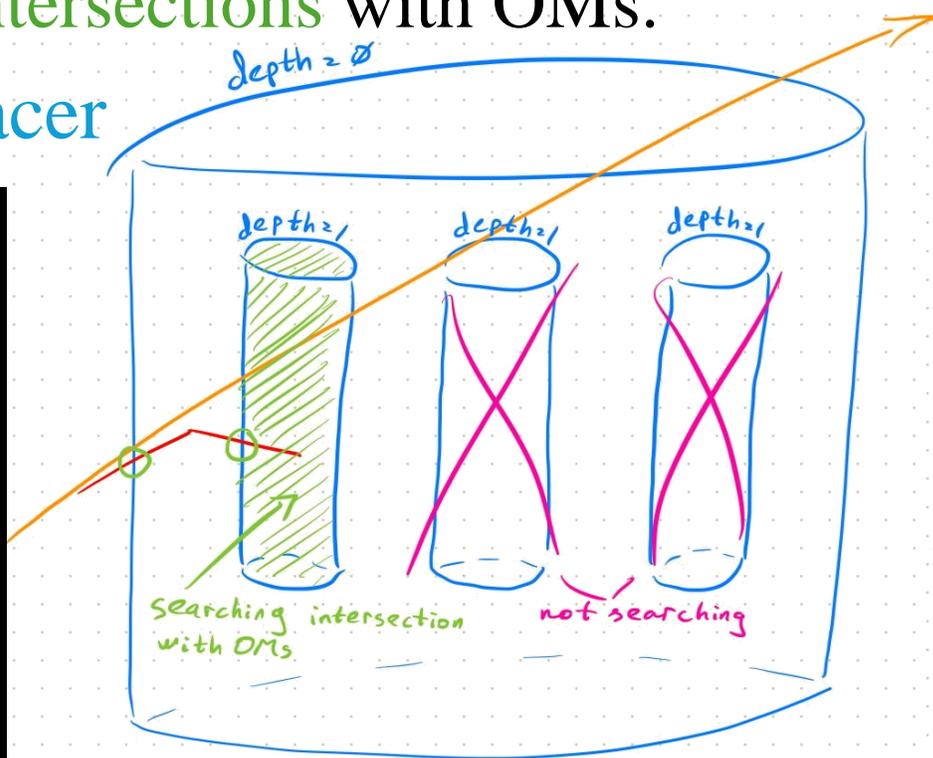
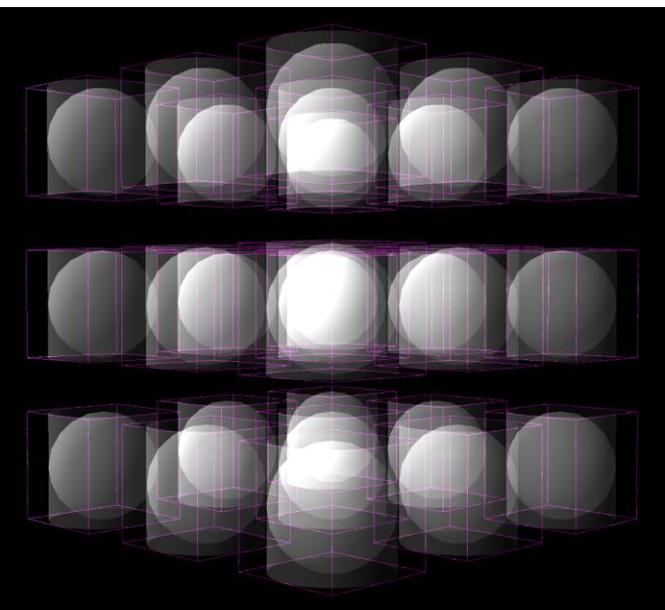




# NTSim Structure: Ray Tracer

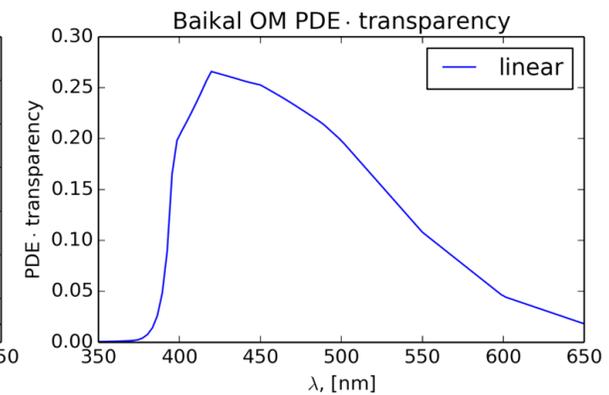
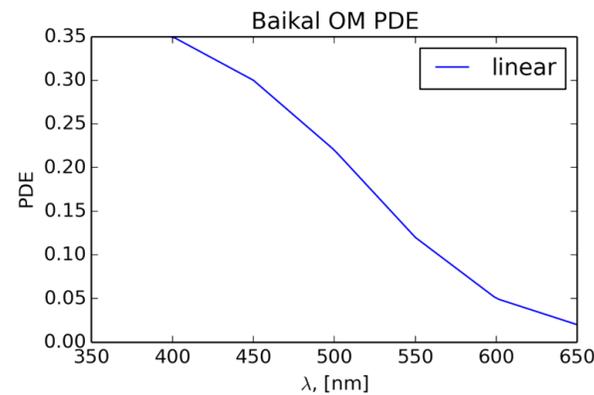
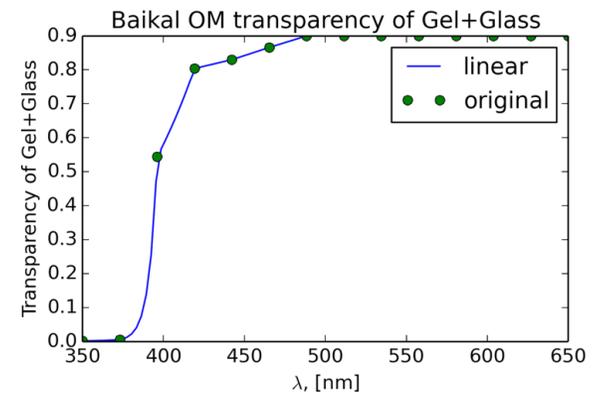
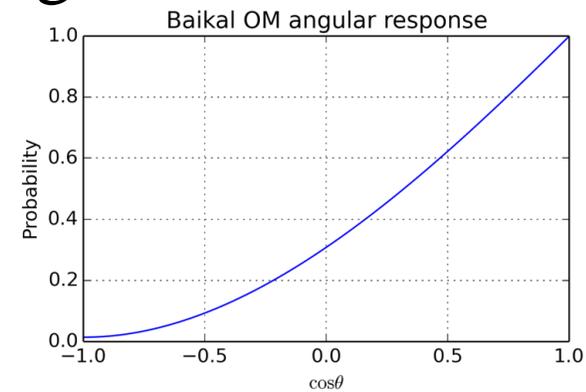
- The **Ray Tracer** algorithm is used to find where Cherenkov photon tracks intersect with **bounding surfaces**, followed by a search for **intersections** with OMs.

- **SmartRayTracer**



# NTSim Structure: Sensitive Detectors

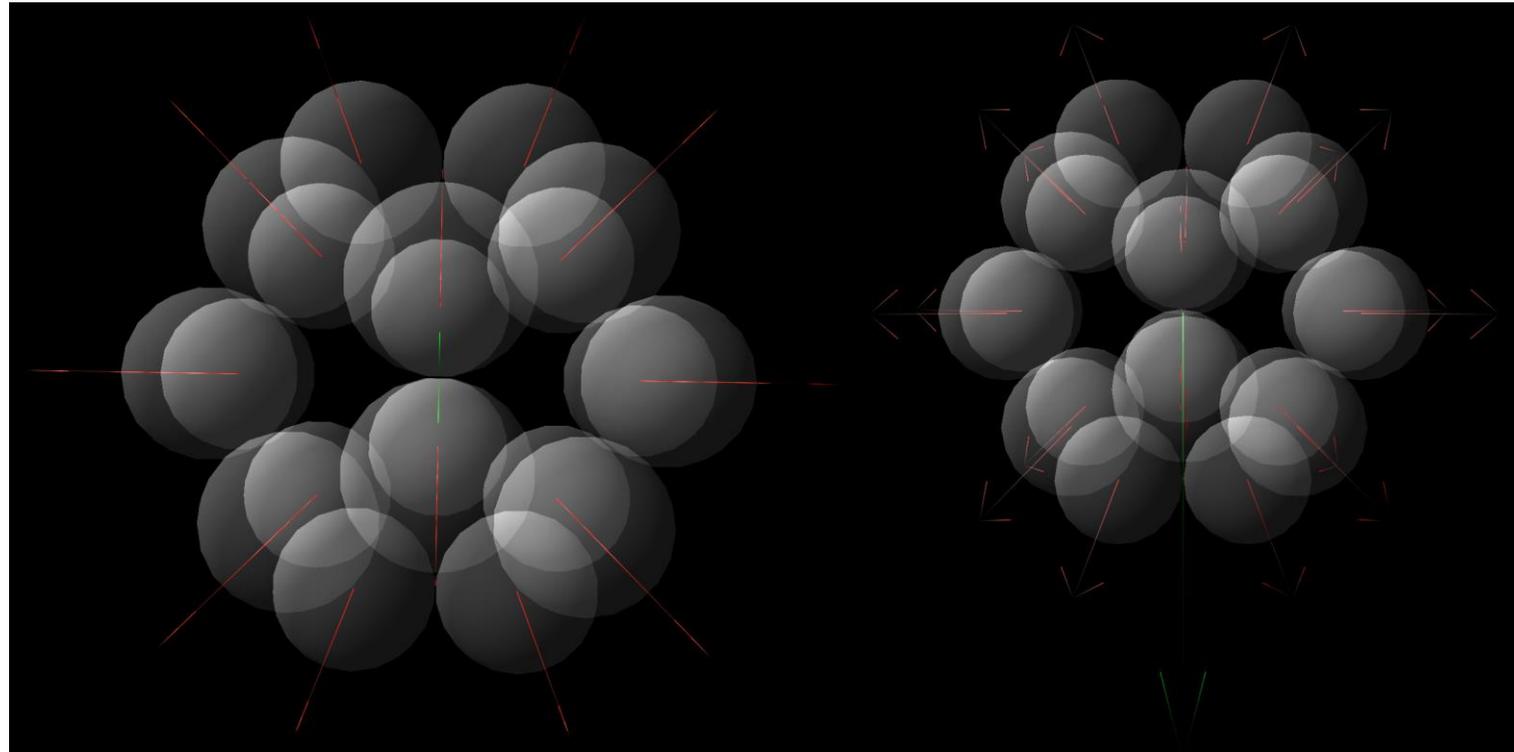
- It has become possible to create an **arbitrary optical detector** with the possibility of adding **detector effects**.
- **BGVDSensitiveDetector**



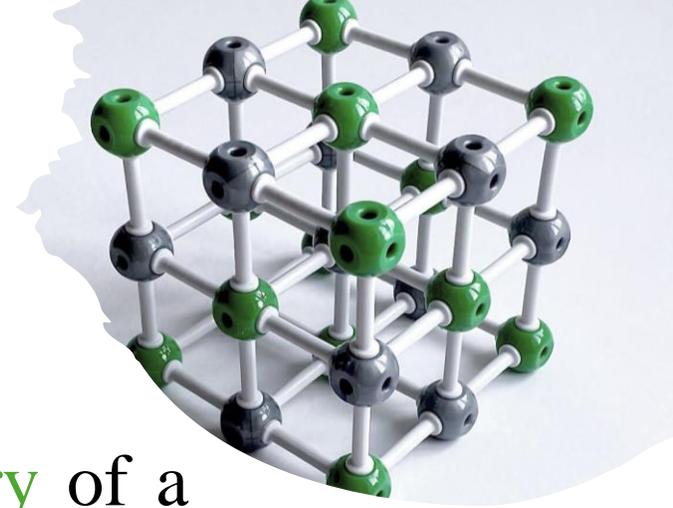
# NTSim Structure: Sensitive Detectors



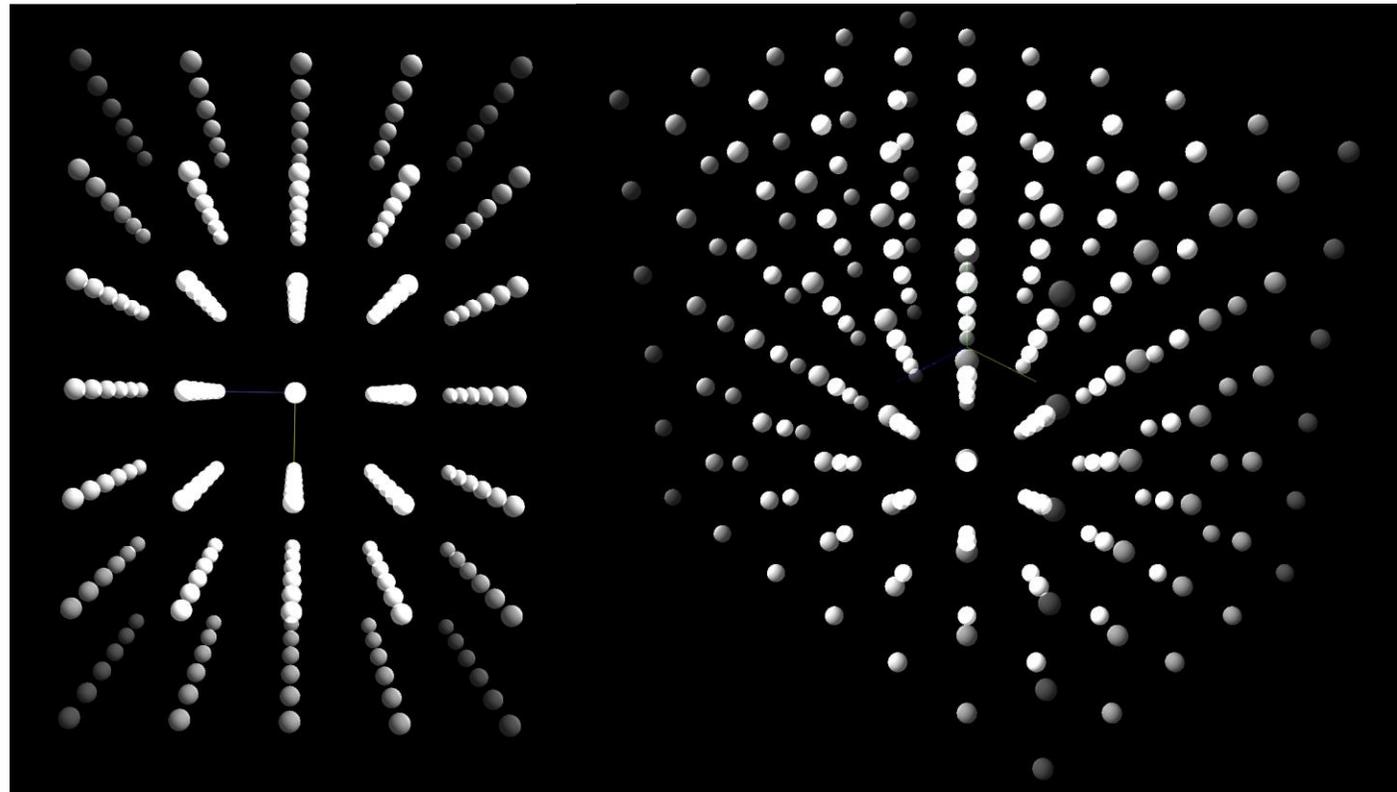
- It has become possible to create an **arbitrary optical detector** with the possibility of adding **detector effects**.
- **BGVDSensitiveDetector**
- **FlyEyeSensitiveDetector**
- ...



# NTSim Structure: Telescopes



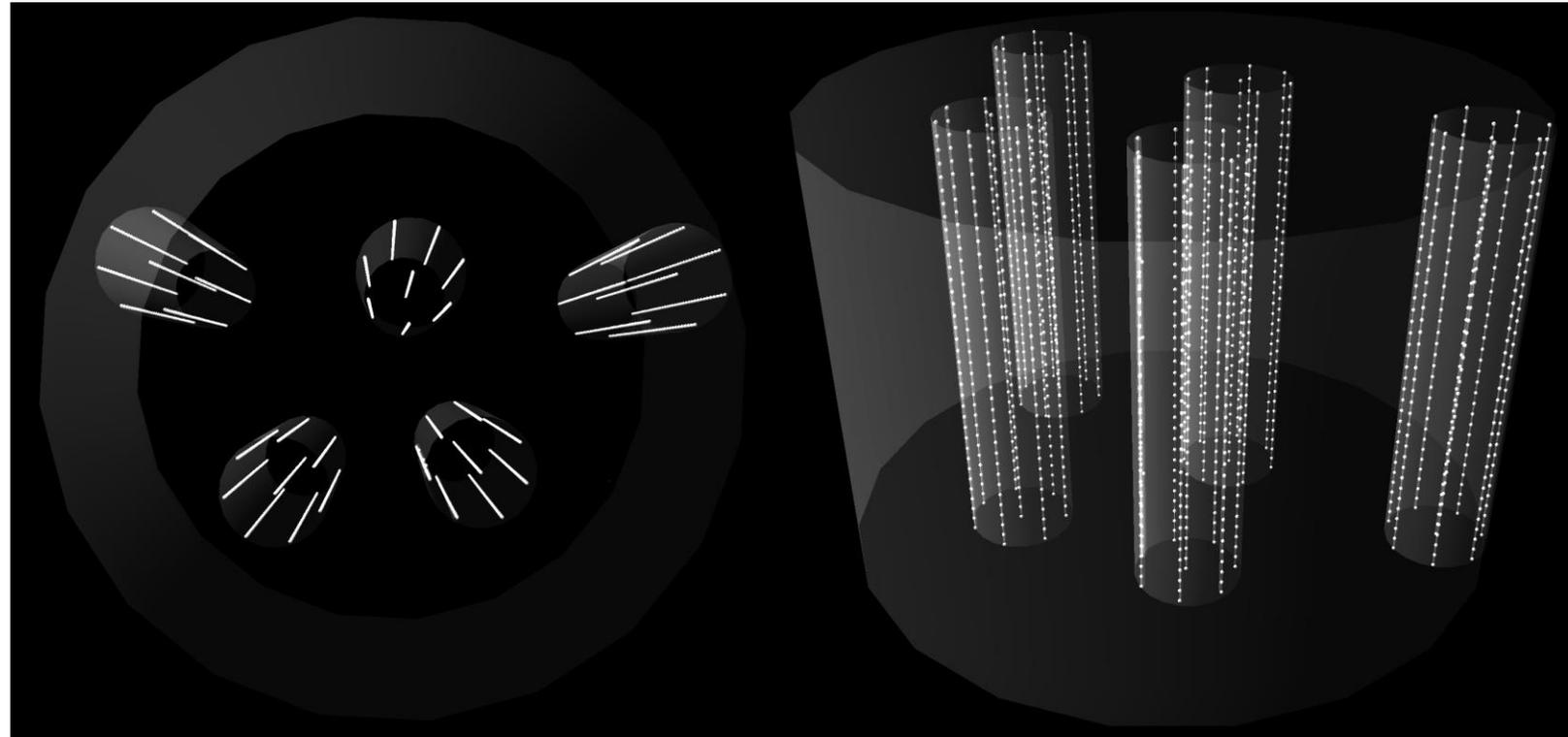
- It has become possible to create an **arbitrary geometry** of a **neutrino telescope** in NTSim.
- **SimpleTelescope**



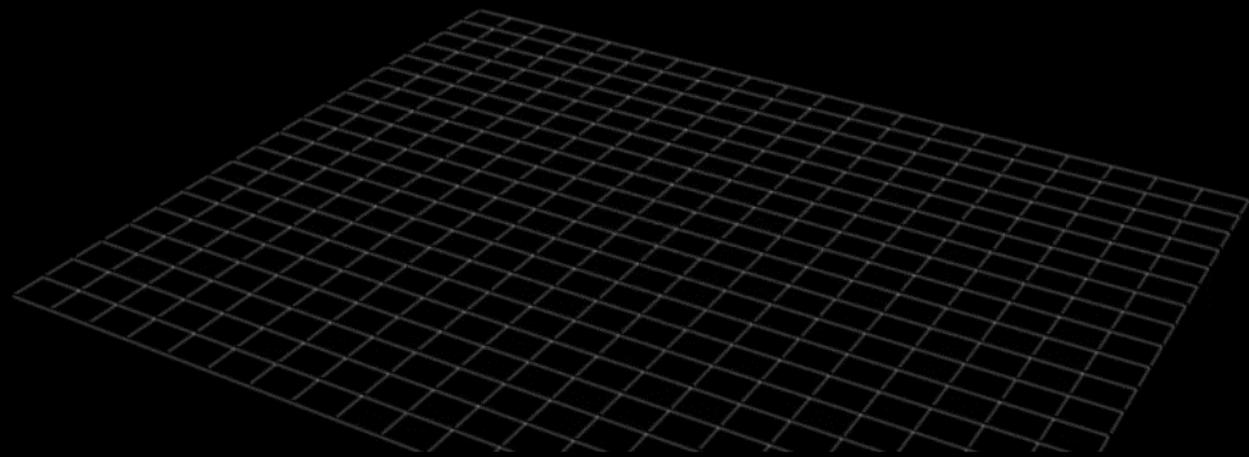
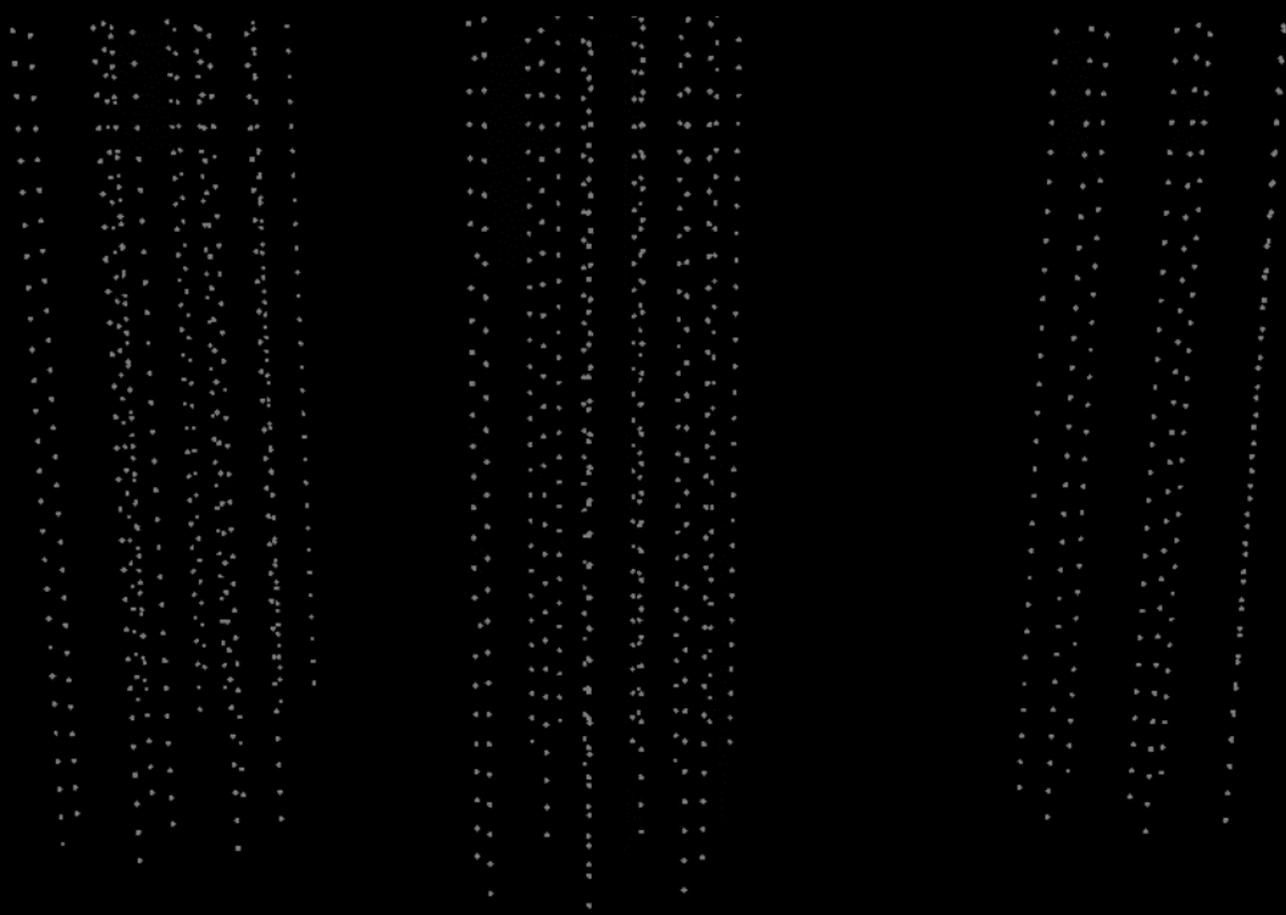
# NTSim Structure: Telescopes



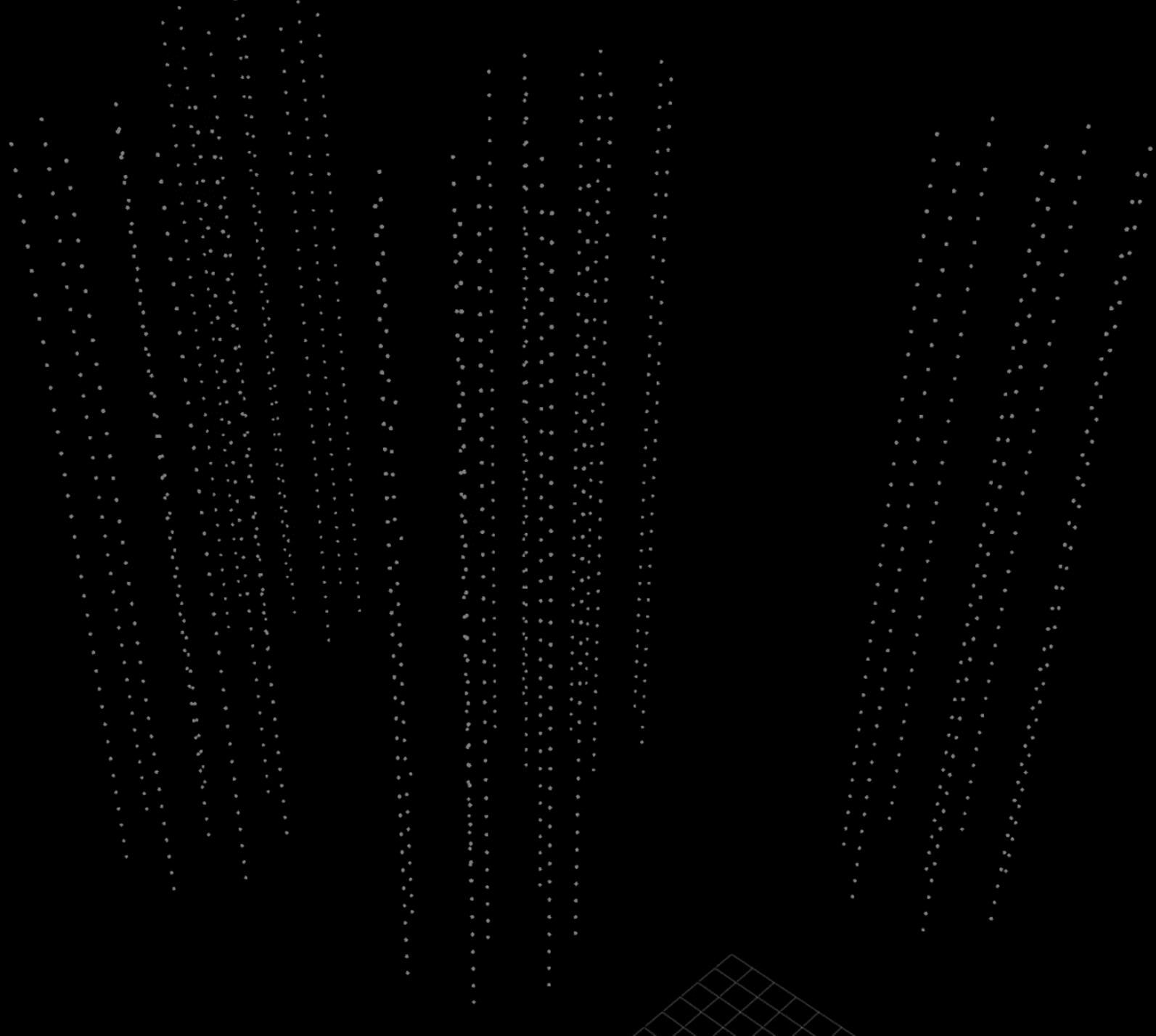
- It has become possible to create an **arbitrary geometry** of a **neutrino telescope** in NTSim.
- **SimpleTelescope**
- **BGVDTelescope**



$$\nu_{\mu} n \rightarrow \mu^{-} \pi^{+} n$$



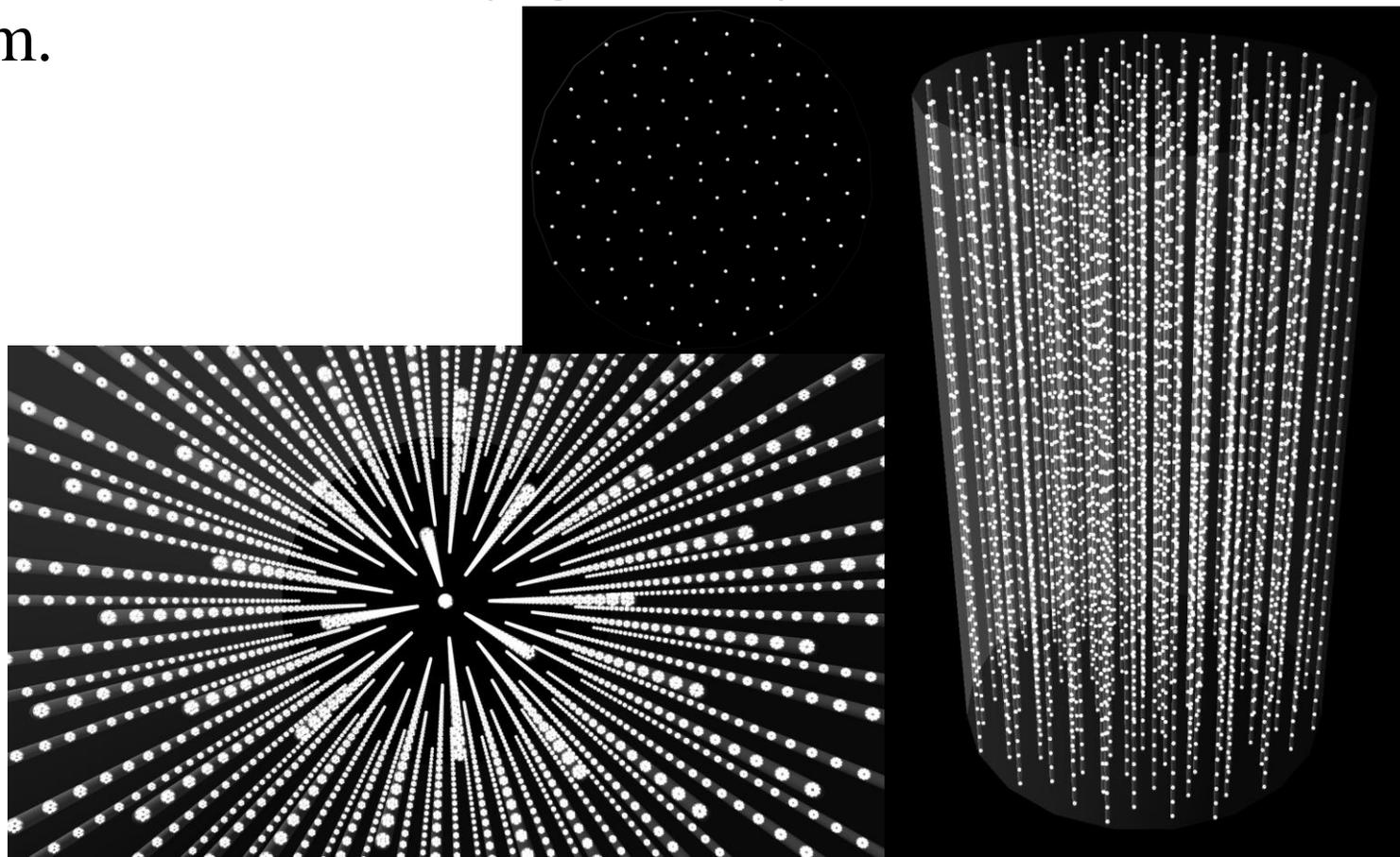
$\mu^-, 4 TeV$



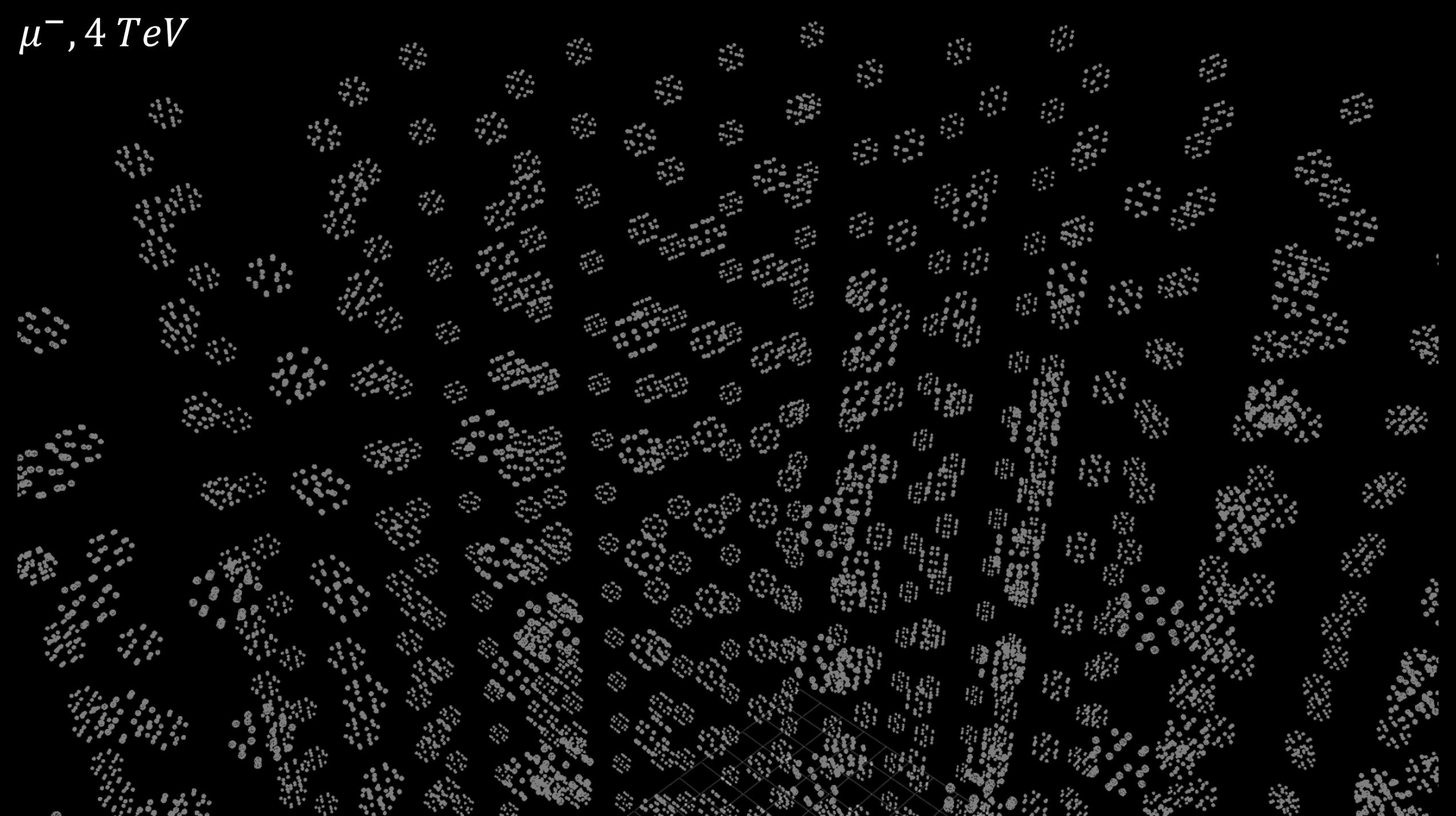


# NTSim Structure: Telescopes

- It has become possible to create an **arbitrary geometry** of a **neutrino telescope** in NTSim.
- **SimpleTelescope**
- **BGVDTelescope**
- **SunflowerTelescope**



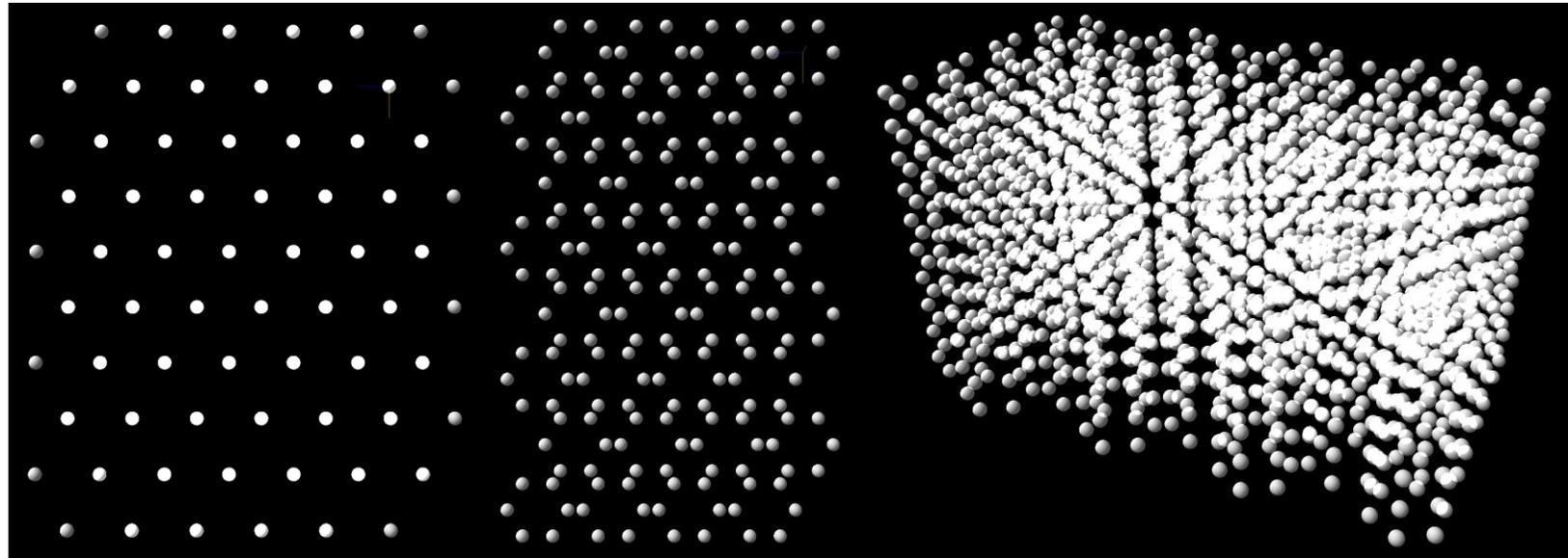
$\mu^-, 4\text{TeV}$



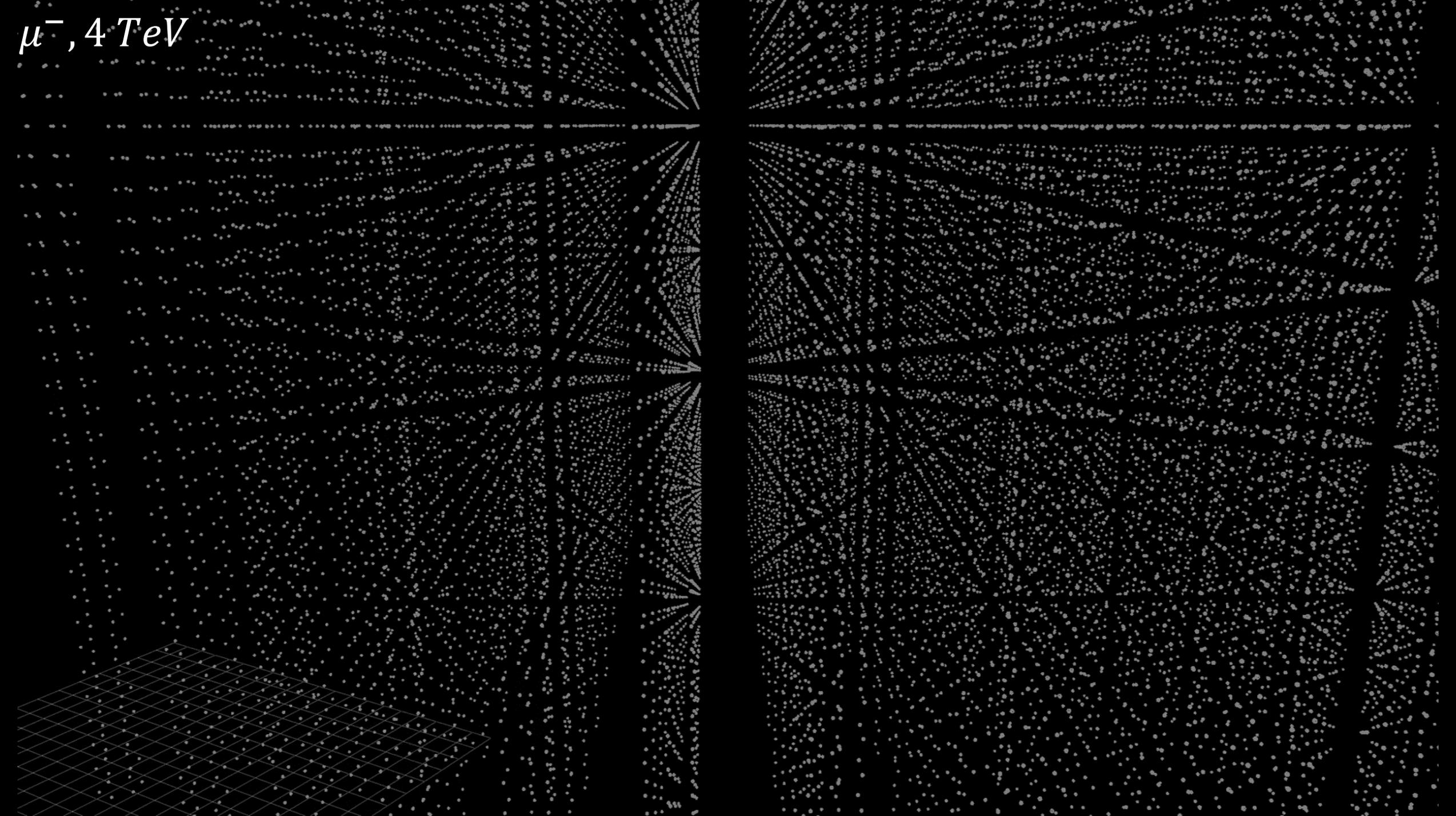
# NTSim Structure: Telescopes



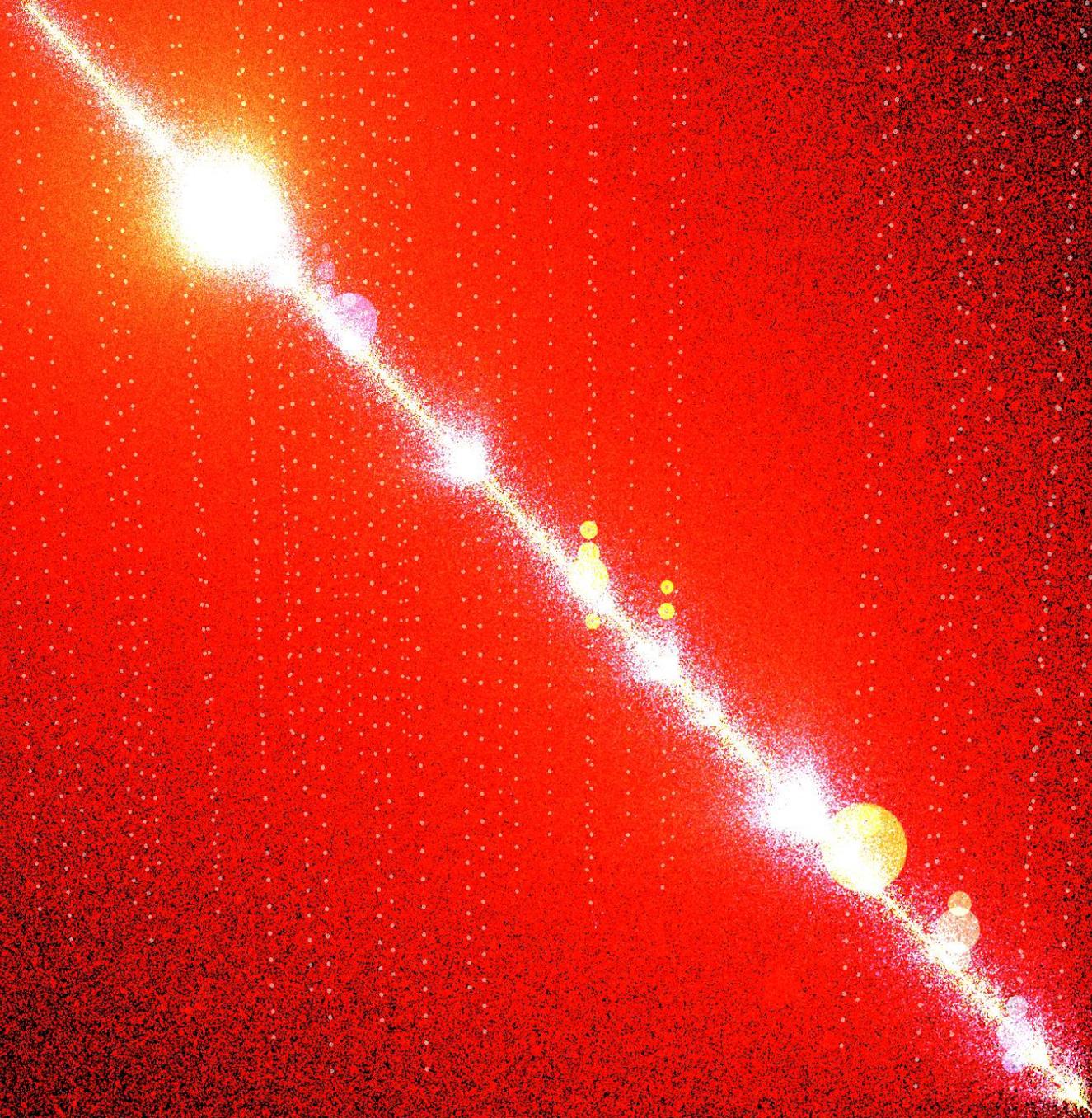
- It has become possible to create an **arbitrary geometry** of a **neutrino telescope** in NTSim.
- **SimpleTelescope**
- **BGVDTelescope**
- **SunflowerTelescope**
- **HoneycombTelescope**
- ...

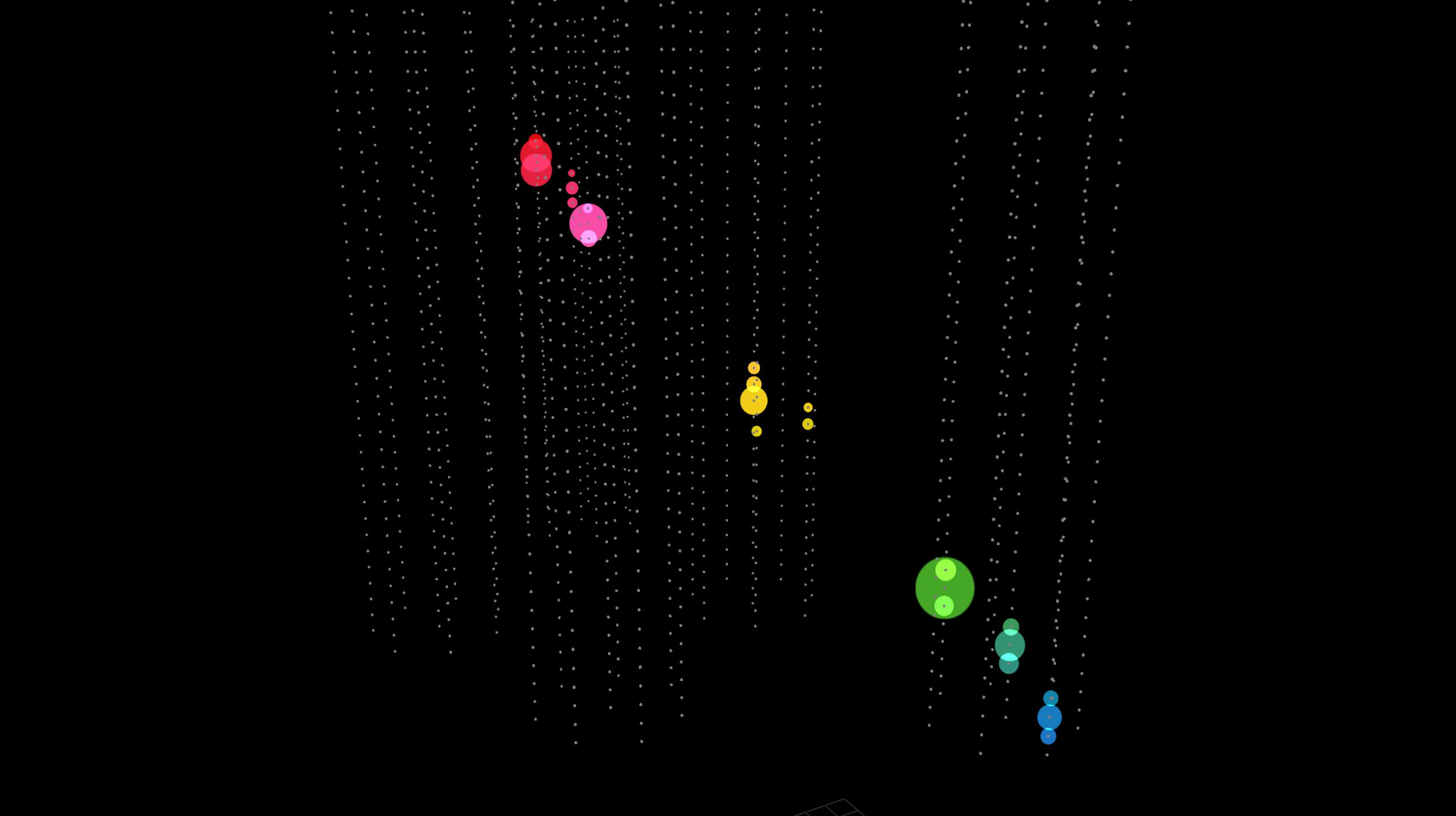


$\mu^-, 4\text{ TeV}$

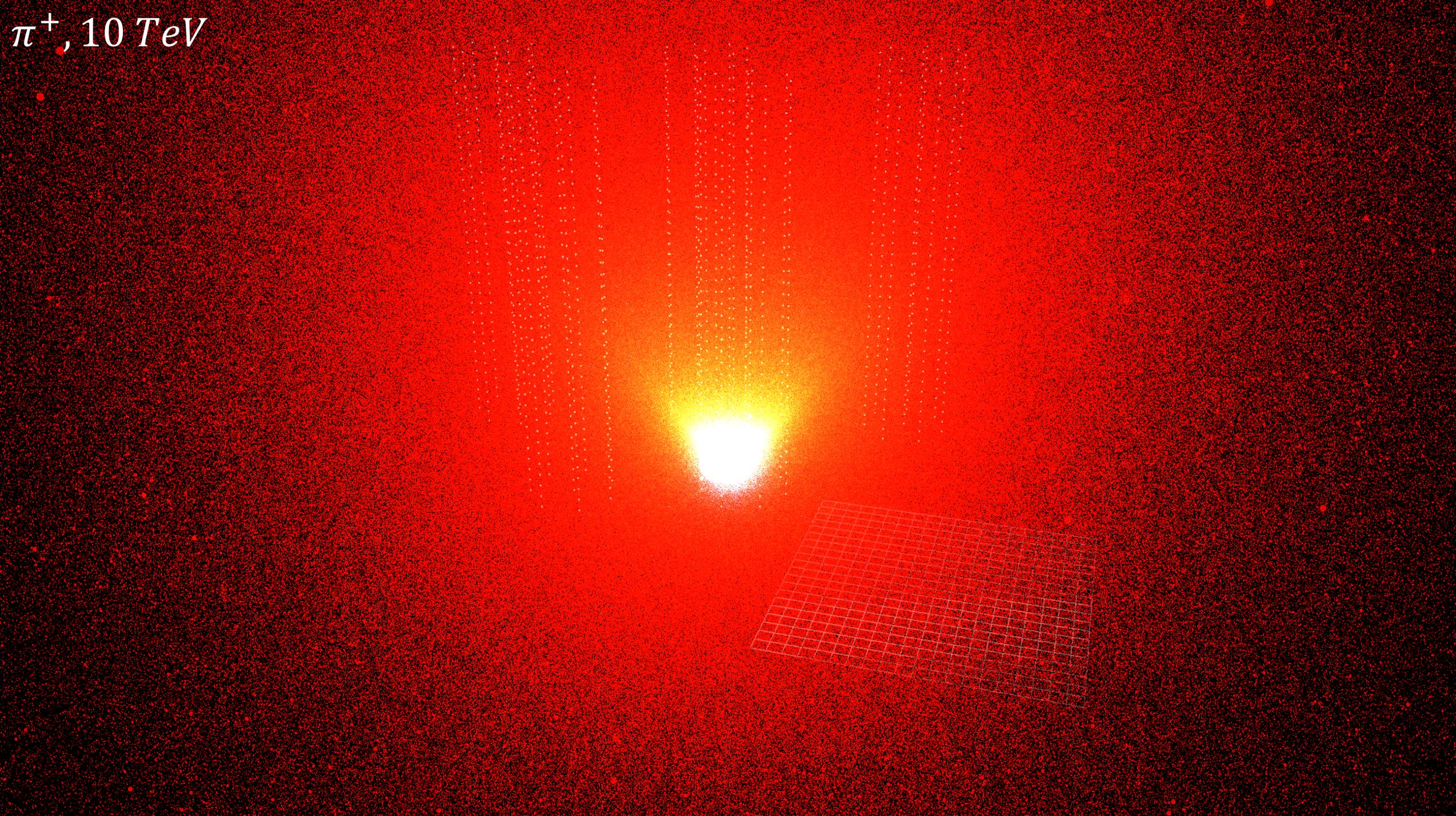


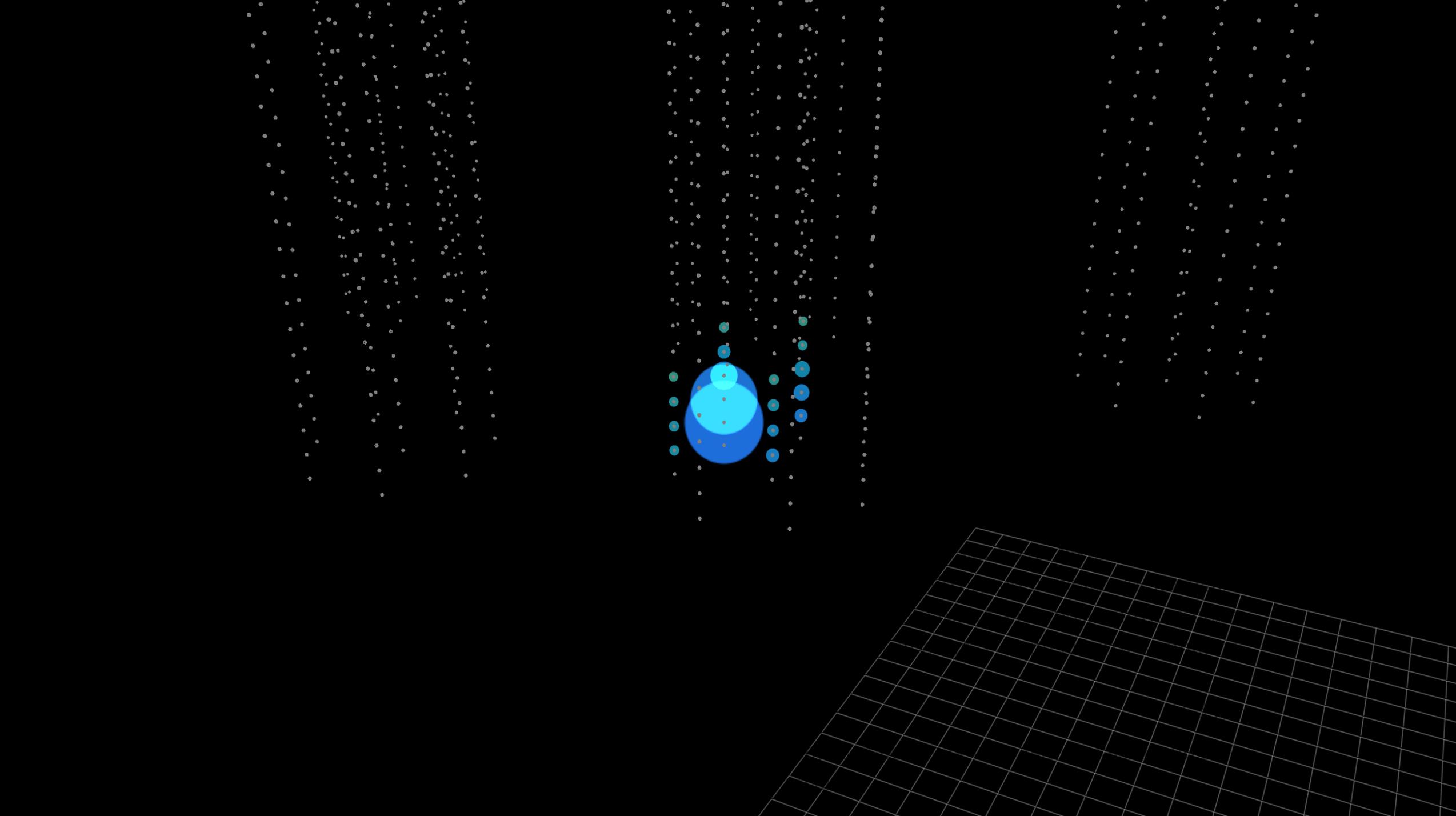
$\mu^-$ , 4 TeV





$\pi^+$ , 10 TeV





# Summary

## Key points:

- The **NTSim** provides a complete chain of neutrino event **simulation** and detector **response**.
- The package is **easy** to install via PyPI.
- To enhance efficiency, we utilize intelligent methods such as **parameterizing** e/m cascades, **generating** Cherenkov photons within the package, and rapid **searching** for hits.
- Top **priority** for the **construction** of next-generation neutrino telescopes such as TRIDENT or HUNT and **reconstruction** events in the Baikal-GVD.

## Main NTSim modules:

- **PrimaryGenerator**: Generates primary interaction vertex using NuGen/ToyGen.
- **Propagator**: Propagates particles through the medium using Particulerator and MCPhotonTransporter.
- **CherenkovGenerator**: Generates Cherenkov photons from charged particle tracks and e/m cascades.
- **RayTracer**: Searches for segments of Cherenkov photon tracks intercepted by optical modules.
- **Telescope**: enables users to create their own neutrino telescope topologies.

# Our team

- Dmitry Naumov (JINR)
- Dmitry Zaborov (INR RAS)
- Vladimir Allakhverdyan (JINR)
- Sergey Zavyalov\* (JINR/MSU)
- Daniil Zubchenko (MSU)
- Irina Perevalova (ISU)
- Anna Belyakova (ISU)
- Ilya Chernousov (ISU)
- Yan Dubovik (Dubna)



An impressionistic painting of a forest path. The scene is rendered with soft, blended colors of blue, green, and purple, creating a misty and atmospheric effect. The path leads from the foreground into the distance, flanked by trees whose forms are suggested with visible brushstrokes. The overall mood is serene and quiet.

Thank you for your attention

1941  
Wesley D. Taylor

An impressionistic oil painting of a forest path. The scene is rendered with soft, blended colors, primarily blues, greens, and yellows, suggesting a misty or overcast day. The path leads from the foreground into the distance, flanked by a dense forest of trees. The brushwork is visible and expressive, capturing the overall atmosphere rather than fine details. The text 'Back-Up' is centered over the middle ground in a white, serif font.

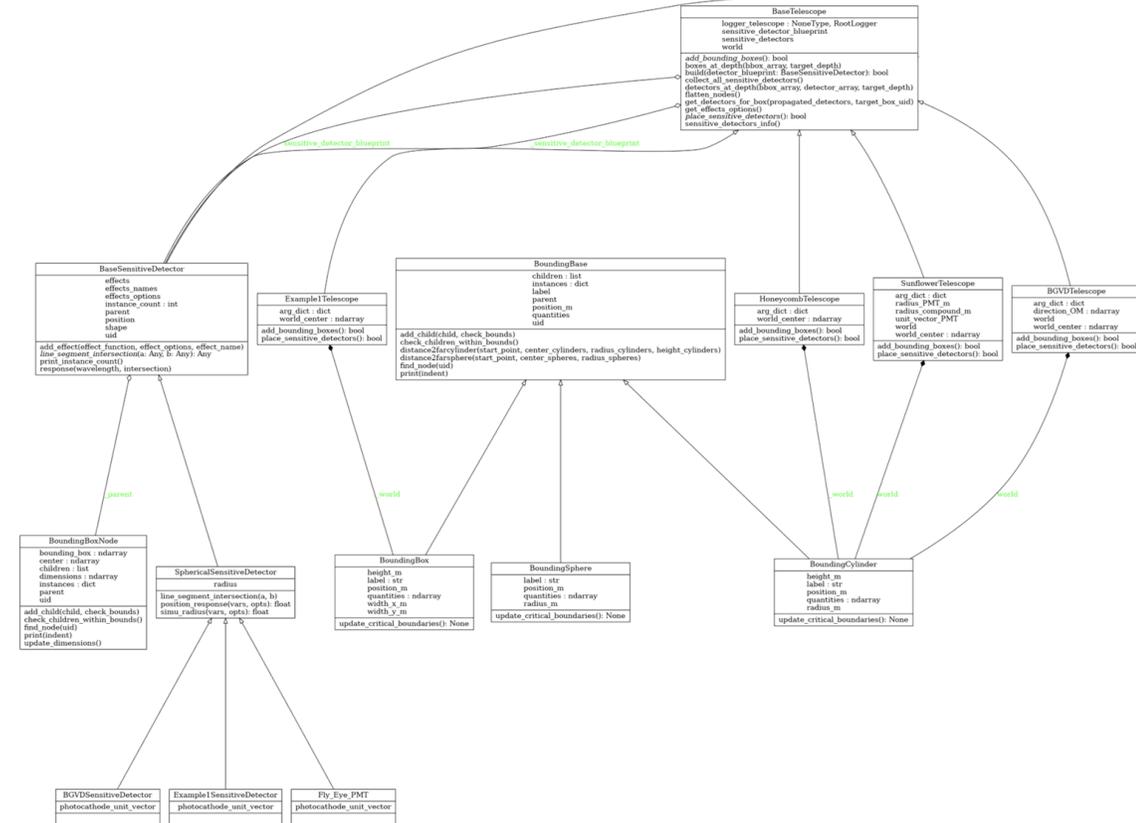
# Back-Up

1941  
Wesley D. Taylor

# Why is simulation needed?

## Objectives of simulation

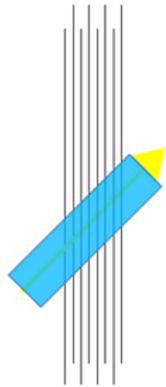
- Before the experiment
  - **Optimization** of the neutrino telescope design
  - **Determination** of the effective volume/area of the telescope
  - **Calculation** of expected signal values and background processes.
- Data analysis
  - **Reconstruction** of neutrino events
  - **Comparison** of analysis results with theoretical predictions



# Baikal-GVD

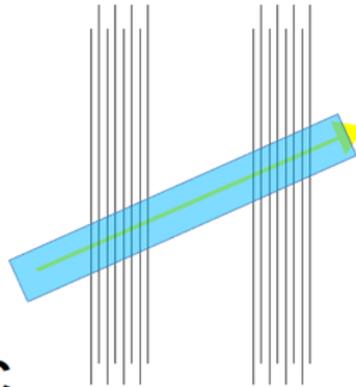
## Event types

### Single-cluster tracks



- ✓ Low energy threshold
- ✓ Optimal sensitivity to nearly vertical tracks
- ✓ 90% of recorded track events

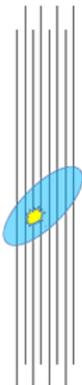
### Multi-cluster tracks



- ✓ Moderately low energy threshold
- ✓ Optimal sensitivity to inclined tracks
- ✓ Best angular resolution

$\nu_{\mu}$  CC

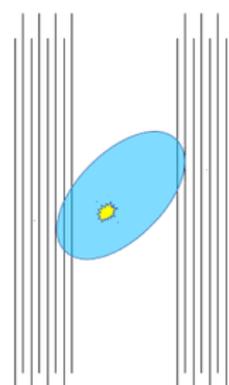
### Single-cluster cascades



- ✓ High energy threshold
- ✓ Good energy resolution
- ✓ Relatively rare events

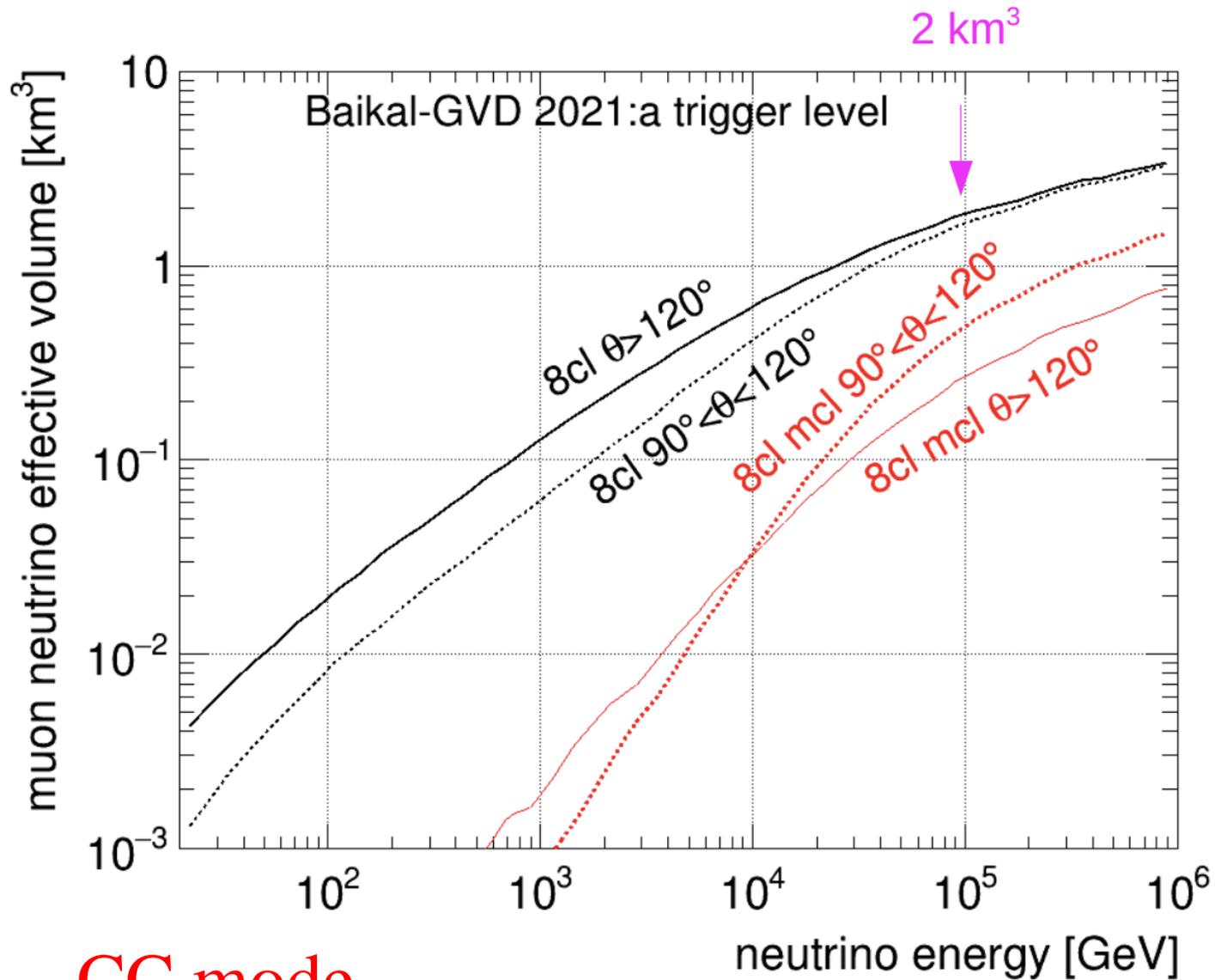
NC,  $\nu_e$ ,  $\nu_{\tau}$  CC

### Multi-cluster cascades

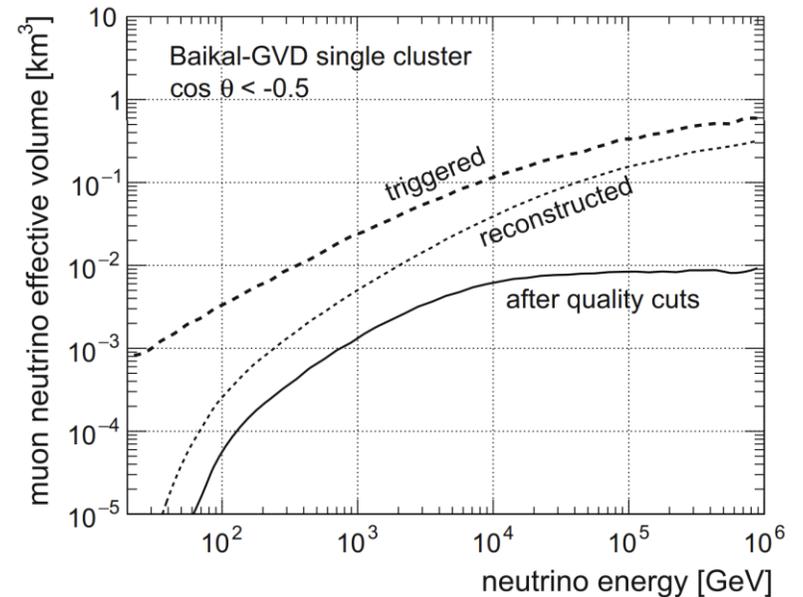
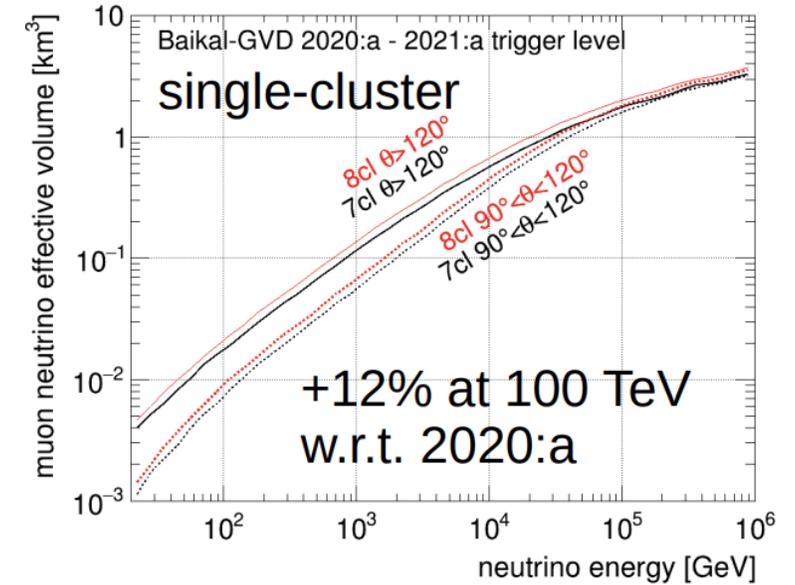


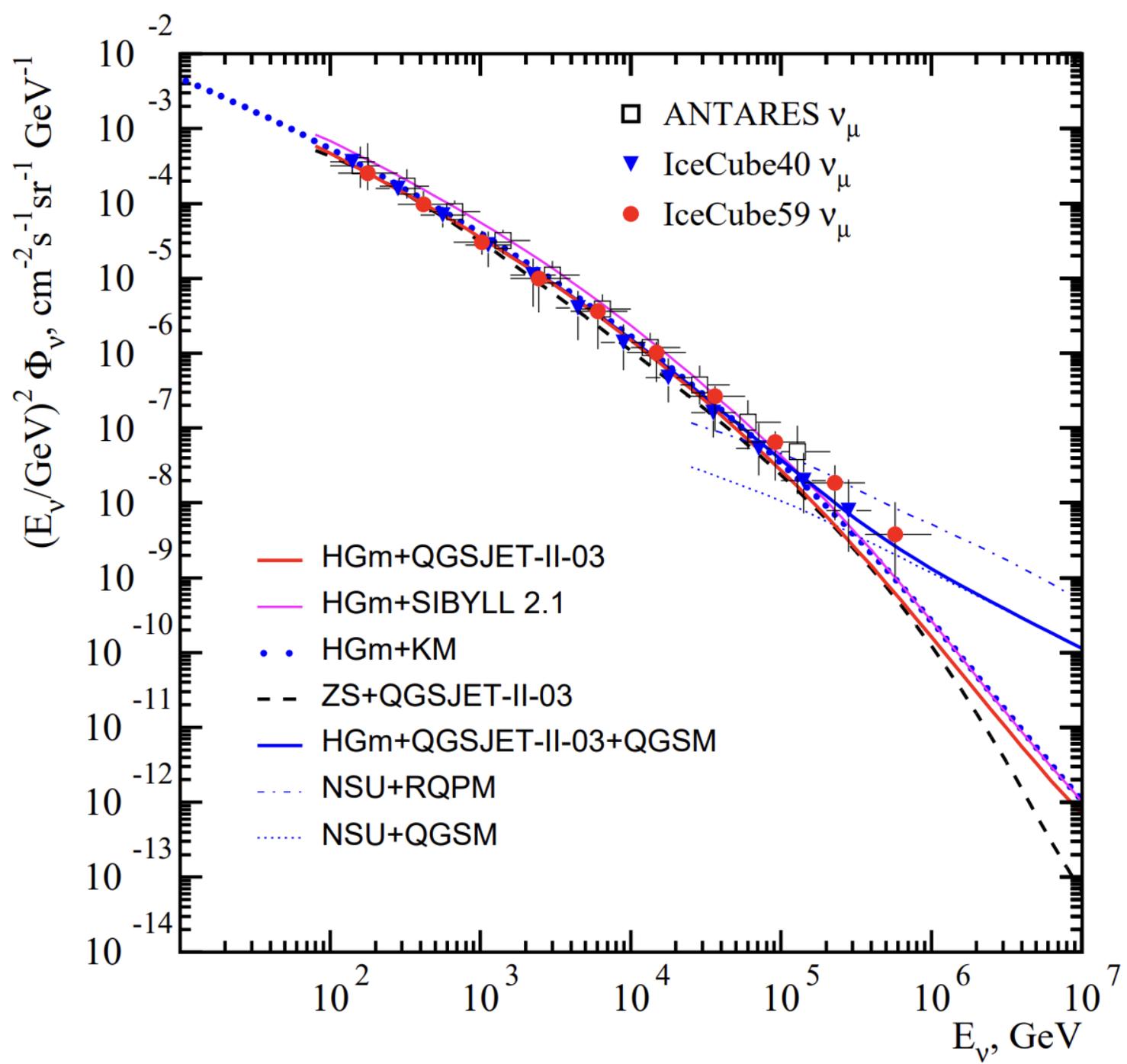
- ✓ Very high energy threshold
- ✓ Excellent energy resolution
- ✓ Very rare events

# Effective volume at trigger level



CC mode





# Structure functions

Реакция	$F_2^{\text{PM}}/(2x)$
$\nu p$	$d_N \cos^2 \theta_C + s_N \sin^2 \theta_C + \bar{u}_N + \bar{c}_N +$ $\theta(x_{cs} - x) \theta(E_\nu - E_{cs}) [d_c \sin^2 \theta_C + s_c \cos^2 \theta_C] +$ $\theta(x_{cd} - x) \theta(E_\nu - E_{cd}) [d_c \sin^2 \theta_C]$
$\nu n$	$u_N \cos^2 \theta_C + s_N \sin^2 \theta_C + \bar{d}_N + \bar{c}_N +$ $\theta(x_{cs} - x) \theta(E_\nu - E_{cs}) [u_N \sin^2 \theta_C + s_c \cos^2 \theta_C]$
$\bar{\nu} p$	$u_N \cos^2 \theta_C + c_N \sin^2 \theta_C + \bar{d}_N + \bar{s}_N +$ $\theta(x_{c\bar{s}} - x) \theta(E_\nu - E_{c\bar{s}}) [(u_N + \bar{d}_c - \bar{d}_N) \sin^2 \theta_C + (c_N + \bar{s}_c - \bar{s}_N) \cos^2 \theta_C] +$ $\theta(x_{c\bar{d}} - x) \theta(E_\nu - E_{c\bar{d}}) [(u_N + \bar{d}_c - \bar{d}_N) \sin^2 \theta_C + c_N \cos^2 \theta_C]$
$\bar{\nu} n$	$d_N \cos^2 \theta_C + c_N \sin^2 \theta_C + \bar{u}_N + \bar{s}_N +$ $\theta(x_{c\bar{s}} - x) \theta(E_\nu - E_{c\bar{s}}) [d_N \sin^2 \theta_C + (c_N + \bar{s}_c - \bar{s}_N) \cos^2 \theta_C]$
Реакция	$F_3^{\text{PM}}/2$
$\nu p$	$d_N \cos^2 \theta_C + s_N \sin^2 \theta_C - \bar{u}_N - \bar{c}_N +$ $\theta(x_{cs} - x) \theta(E_\nu - E_{cs}) [d_c \sin^2 \theta_C + s_c \cos^2 \theta_C] +$ $\theta(x_{cd} - x) \theta(E_\nu - E_{cd}) [d_c \sin^2 \theta_C]$
$\nu n$	$u_N \cos^2 \theta_C + s_N \sin^2 \theta_C - \bar{d}_N - \bar{c}_N +$ $\theta(x_{cs} - x) \theta(E_\nu - E_{cs}) [u_N \sin^2 \theta_C + s_c \cos^2 \theta_C]$
$\bar{\nu} p$	$u_N \cos^2 \theta_C + c_N \sin^2 \theta_C - \bar{d}_N - \bar{s}_N +$ $\theta(x_{c\bar{s}} - x) \theta(E_\nu - E_{c\bar{s}}) [(u_N - \bar{d}_c + \bar{d}_N) \sin^2 \theta_C + (c_N - \bar{s}_c + \bar{s}_N) \cos^2 \theta_C] +$ $\theta(x_{c\bar{d}} - x) \theta(E_\nu - E_{c\bar{d}}) [(u_N - \bar{d}_c + \bar{d}_N) \sin^2 \theta_C + c_N \cos^2 \theta_C]$
$\bar{\nu} n$	$d_N \cos^2 \theta_C + c_N \sin^2 \theta_C - \bar{u}_N - \bar{s}_N +$ $\theta(x_{c\bar{s}} - x) \theta(E_\nu - E_{c\bar{s}}) [d_N \sin^2 \theta_C + (c_N - \bar{s}_c + \bar{s}_N) \cos^2 \theta_C]$

$$F_4(x, Q^2) \approx \frac{1}{2} \left( \frac{F_2(x, Q^2)}{2x} - F_1(x, Q^2) \right) = \frac{1}{2} \left( \frac{1}{\mathfrak{D}(x, Q^2)} - 1 \right) F_1,$$

$$F_5(x, Q^2) \approx \frac{F_2(x, Q^2)}{\mathfrak{D}_r} = \frac{F_1(x, Q^2)}{\mathfrak{D}}.$$

$$F_1(x, Q^2) = (1 - a + a\mathfrak{D}(x, Q^2)) F_1^{\text{PM}}(x, Q^2),$$

$$F_2(x, Q^2) = [a + (1 - a)/\mathfrak{D}(x, Q^2)] F_2^{\text{PM}}(x, Q^2),$$

$$\mathfrak{D}(x, Q^2) F_2(x, Q^2) = 2x F_1(x, Q^2)$$

$$\mathfrak{D}(x, Q^2) = \frac{1}{1 + R(x, Q^2)} \left( 1 + \frac{Q^2}{\nu^2} \right)$$

$$F_L(x, Q^2) = (1 + Q^2/\nu^2) F_2(x, Q^2) - 2x F_1(x, Q^2)$$

$$W_{\alpha\beta}(p, q) = -g_{\alpha\beta} W_1 + \frac{p_\alpha p_\beta}{M^2} W_2 - i \frac{\epsilon_{\alpha\beta\gamma\delta} p^\gamma q^\delta}{2M^2} W_3$$

$$+ \frac{q_\alpha q_\beta}{M^2} W_4 + \frac{p_\alpha q_\beta + q_\alpha p_\beta}{2M^2} W_5 + i \frac{p_\alpha q_\beta - q_\alpha p_\beta}{2M^2} W_6.$$

$$W_1^{\text{DIS}}(x, Q^2) = F_1(x, Q^2), \quad W_n^{\text{DIS}}(x, Q^2) = w^{-1} F_n(x, Q^2)$$

$$n = 2, \dots, 6, \quad Q^2 = -q^2, \quad x = Q^2/2(pq), \quad w = (pq)/M^2.$$

# NTSim Structure: Triggers

- **Triggers** allow to perform an initial **analysis** of MC data before converting to BARS
- **BGVDTrigger**
  - Transit time spread\*
  - Single-cluster trigger ([arXiv:2106.06288](https://arxiv.org/abs/2106.06288))
    - two neighboring OMs within the same section
    - 100 ns time window
    - hits magnitude:  $A_1 = 3.5$ ,  $A_2 = 1.7$  p.e.
    - $5 \mu\text{s}$  event time frame

\*without any diffuseness of the signal

