



INDIANA UNIVERSITY

# Comp Graph Module for protoDUNE-VD PDS

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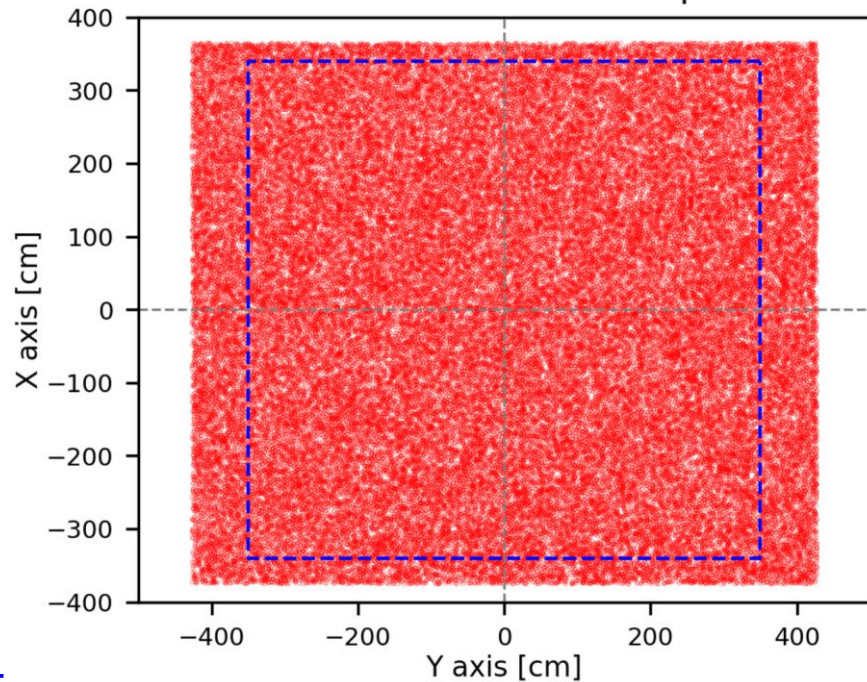
ProtoDUNE PDS Sim/Reco meeting

Jan 8, 2023 (Mon)

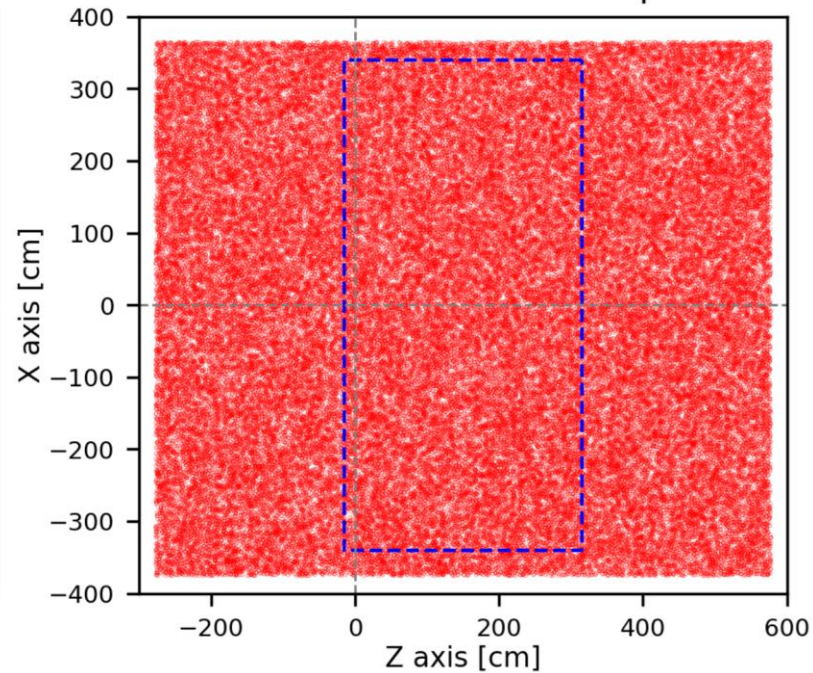
# Details of New Training

- ❖ Results of last training: <https://indico.fnal.gov/event/62064/>
- ❖ **Updates:**
  - Training set: 100,000  $\Rightarrow$  **500,000**
  - Evaluation set: 10,000  $\Rightarrow$  **100,000**
- ❖ Network & hyper-parameters are the same
- ❖ Evaluation events distribution:

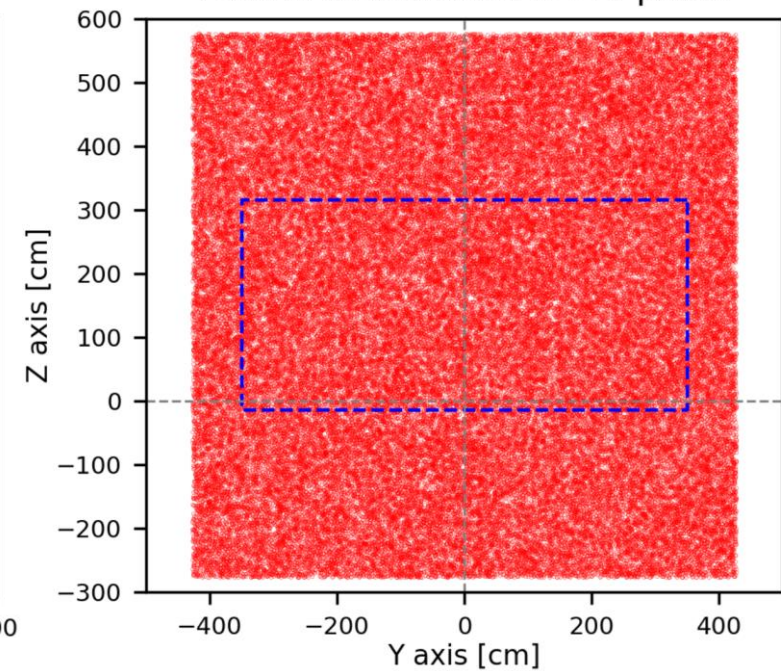
Events distribution in X-Y plane



Events distribution in X-Z plane



Events distribution in Z-Y plane



❖ Evaluation of collective performance

❖ Evaluation of Single optical channel

# Bias Distribution

Previous training (last presentation)

$[-0.1, 0.1]$ : 8,048 (86.2%),  $[-0.2, 0.2]$ : 8,745 (93.6%)

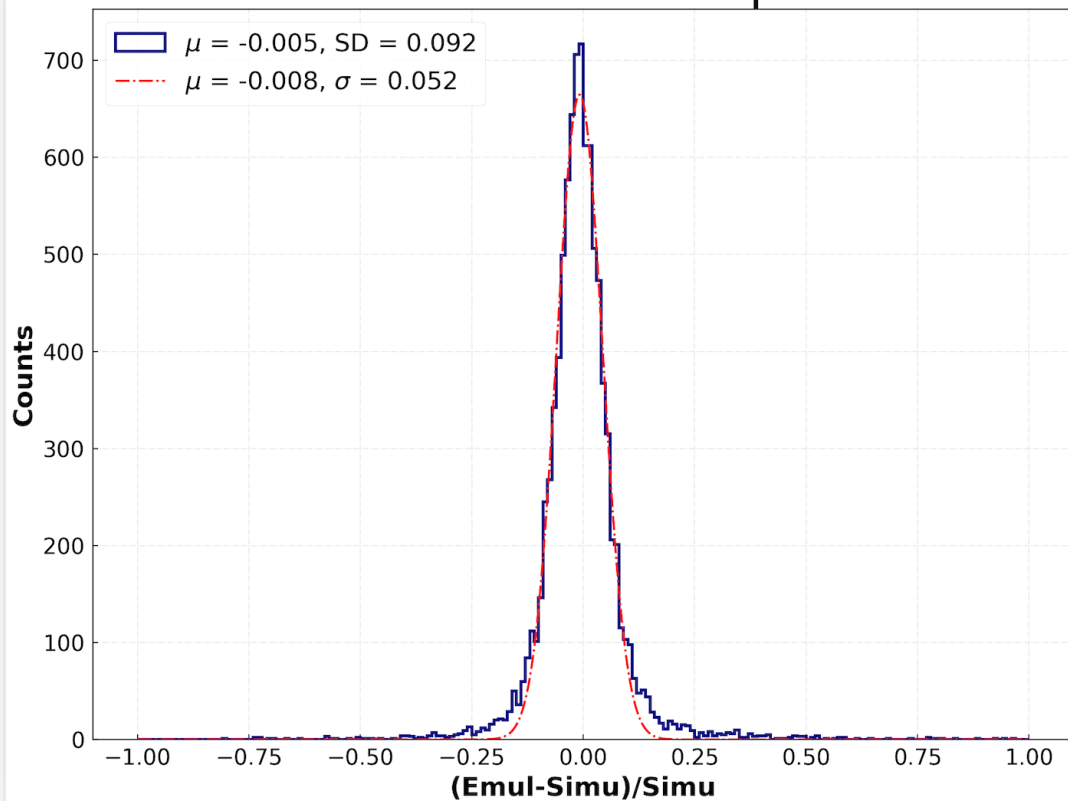
$[-1.0, 1.0]$ : 9,319 (99.8%)

New training (this presentation)

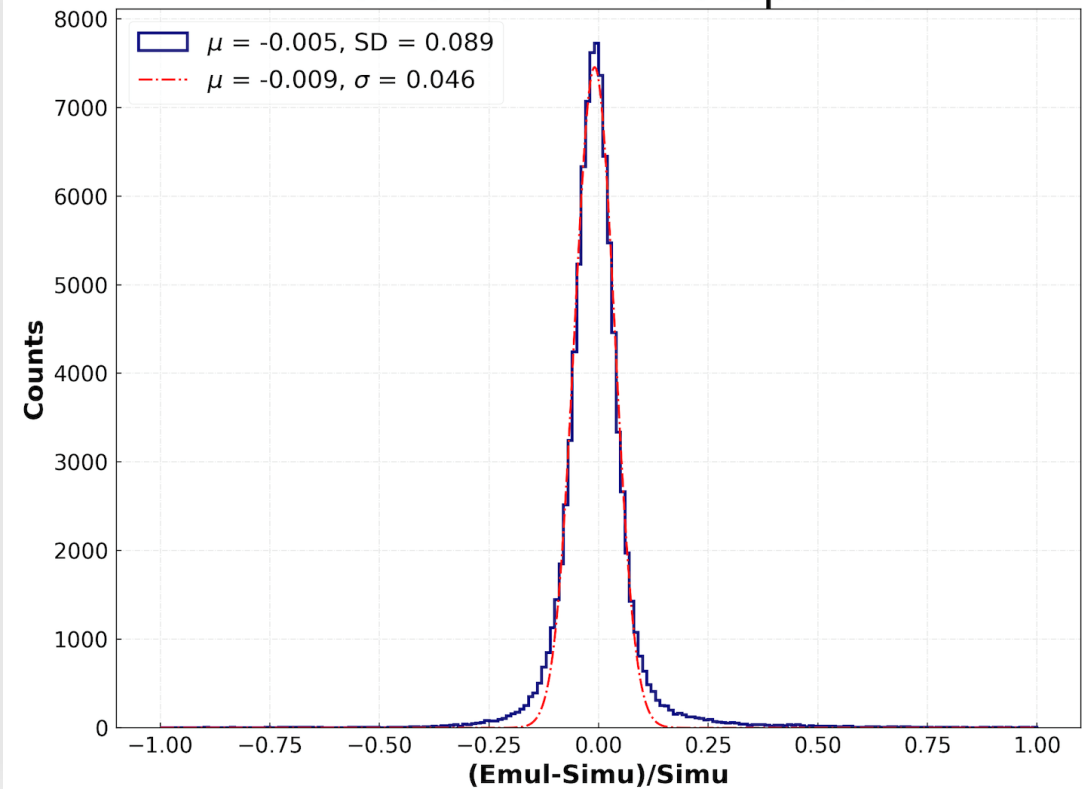
$[-0.1, 0.1]$ : 82,293 (88.5%),  $[-0.2, 0.2]$ : 90,003 (96.8%)

$[-1.0, 1.0]$ : 92,850 (99.8%)

Vertex of Whole Space



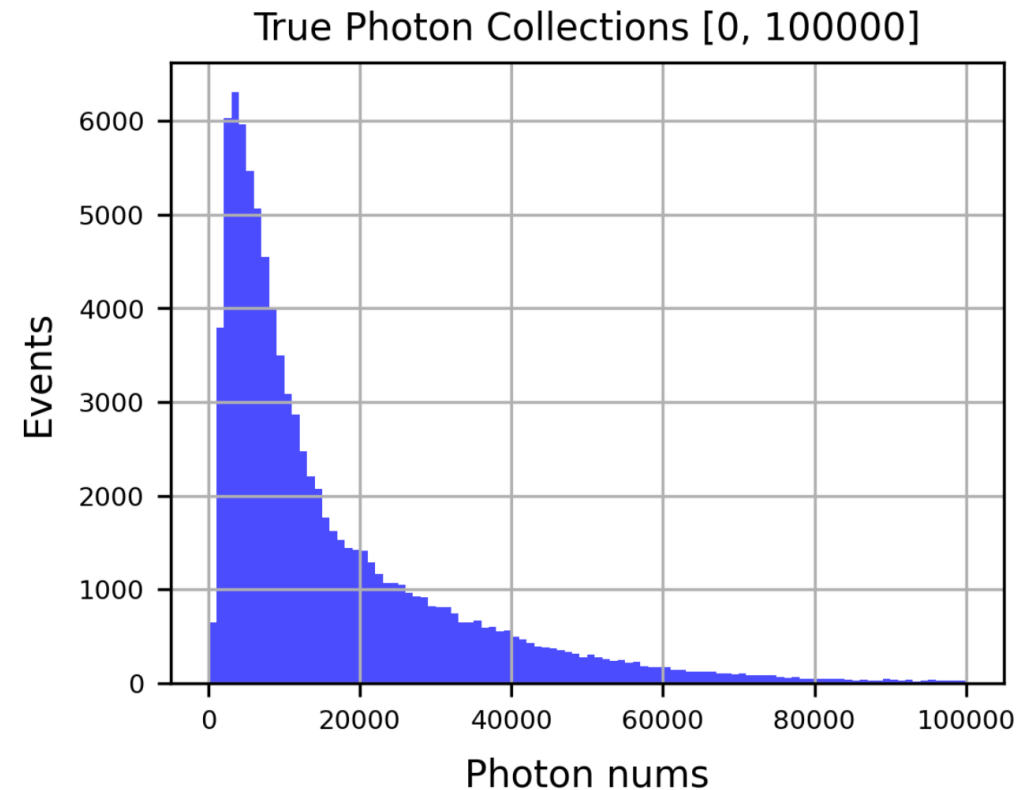
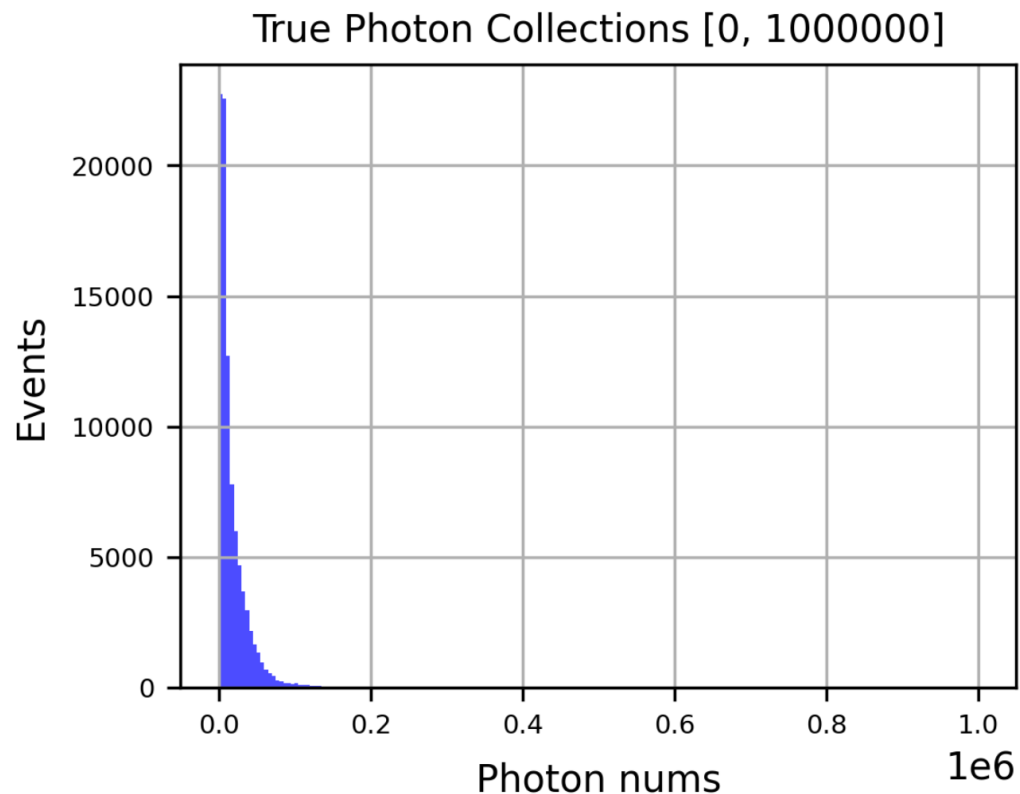
Vertex of Whole Space



# Photon Num distribution of Evaluation Set

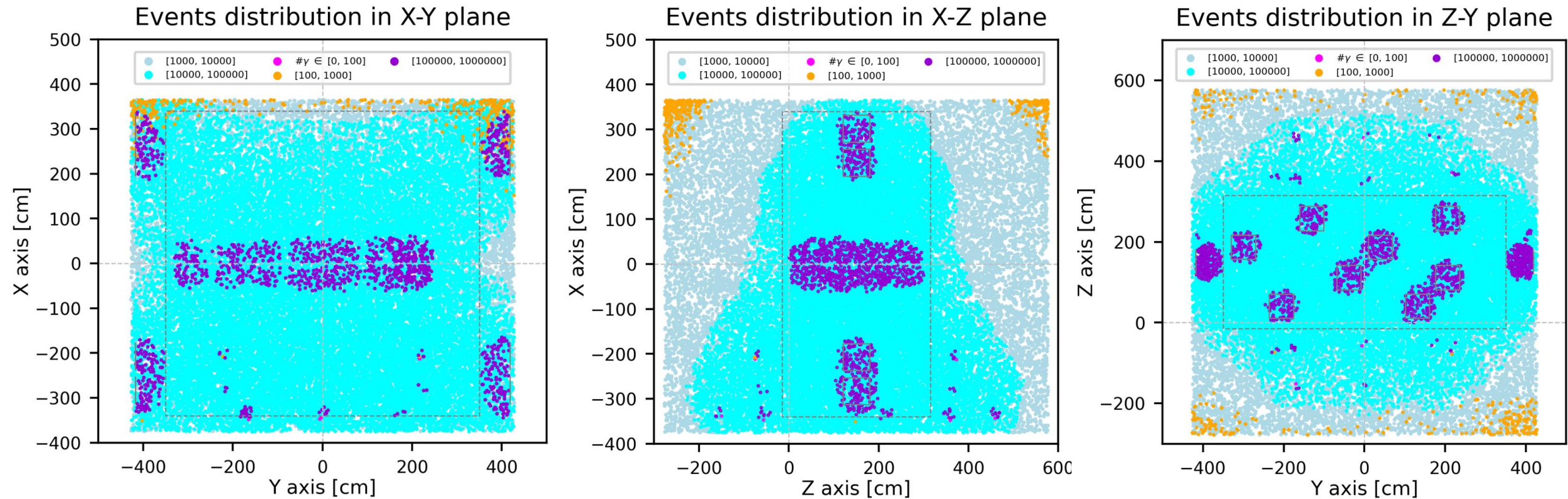
- ❖ Since this page, the analyses are based on the **new** training
- ❖ Results here are based on GEANT4 simulation

```
# event in [0, 100]      : 6
# event in (100, 1000]   : 644
# event in (1000, 10000] : 44645
# event in (10000, 100000] : 46498
# event in (100000, 1000000] : 1397
```



# Events Distribution in the Space

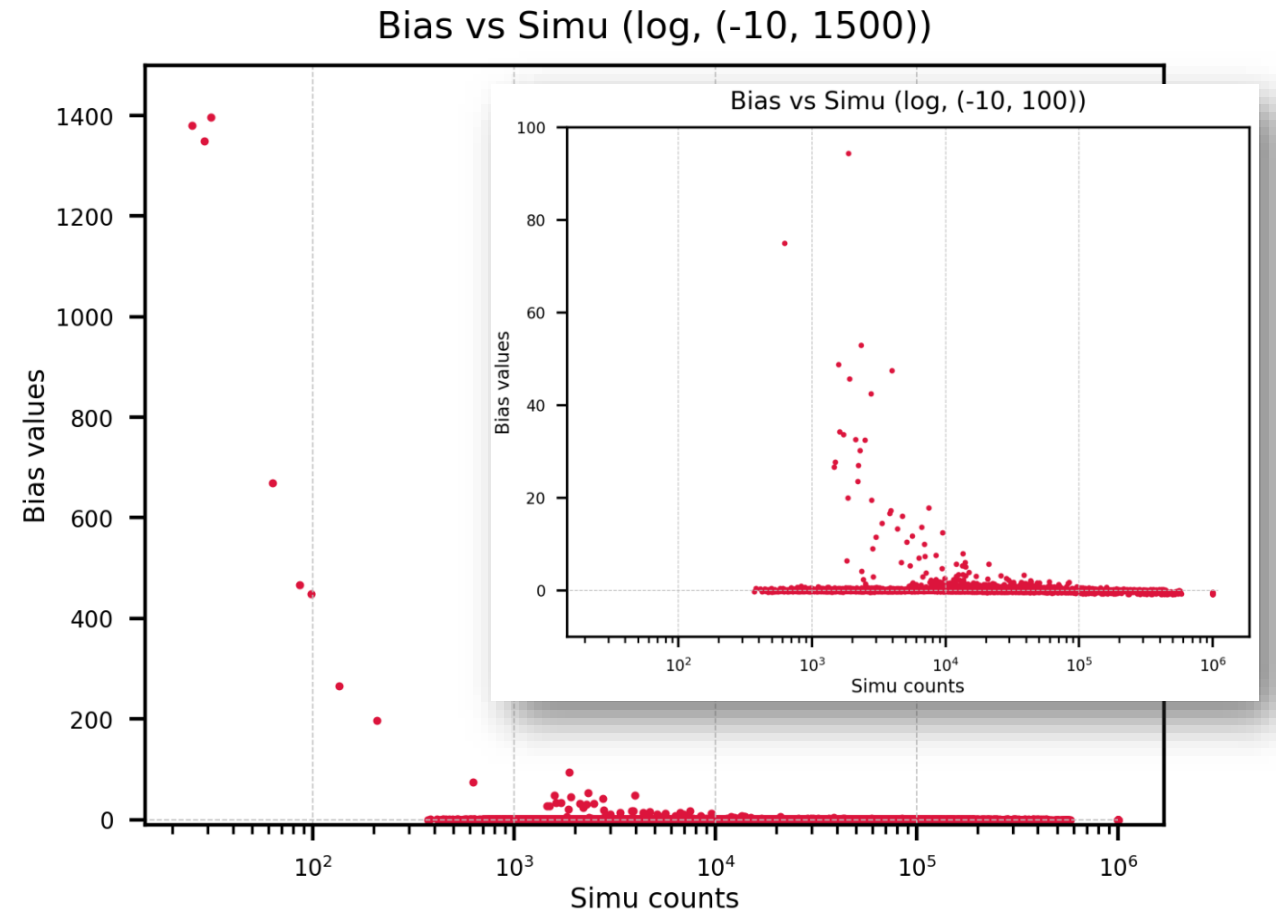
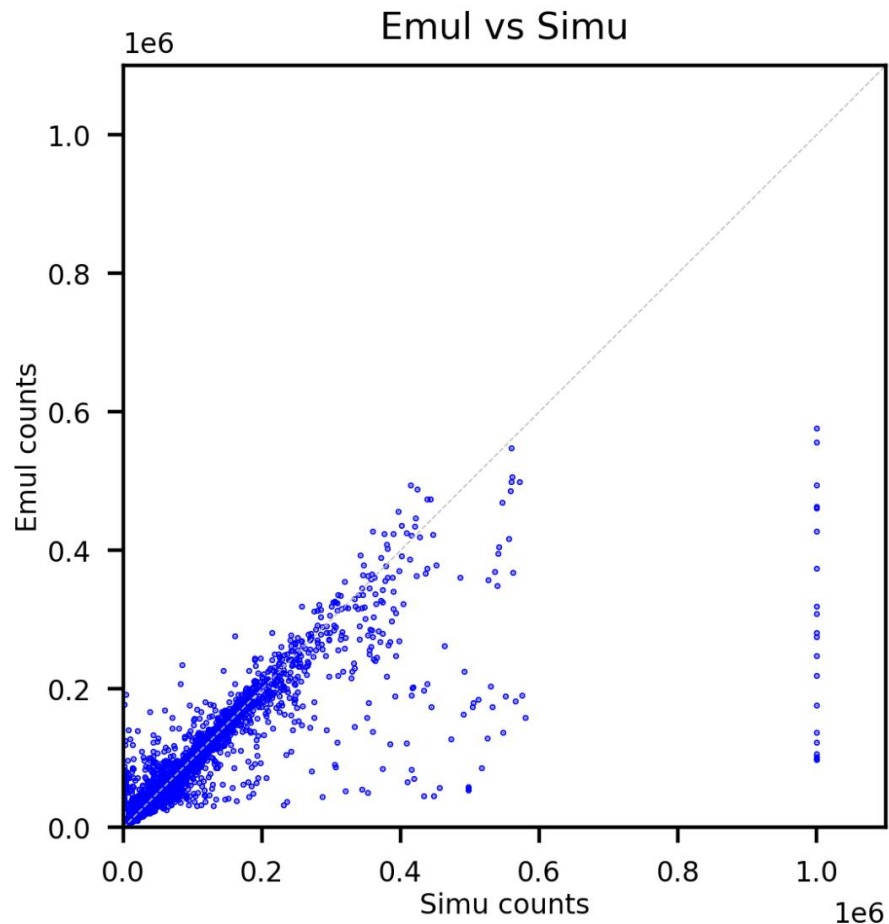
- ❖ For each event, the number of photons received by all optical channels is labeled



# Comp Graph Module vs GEANT4 (I)

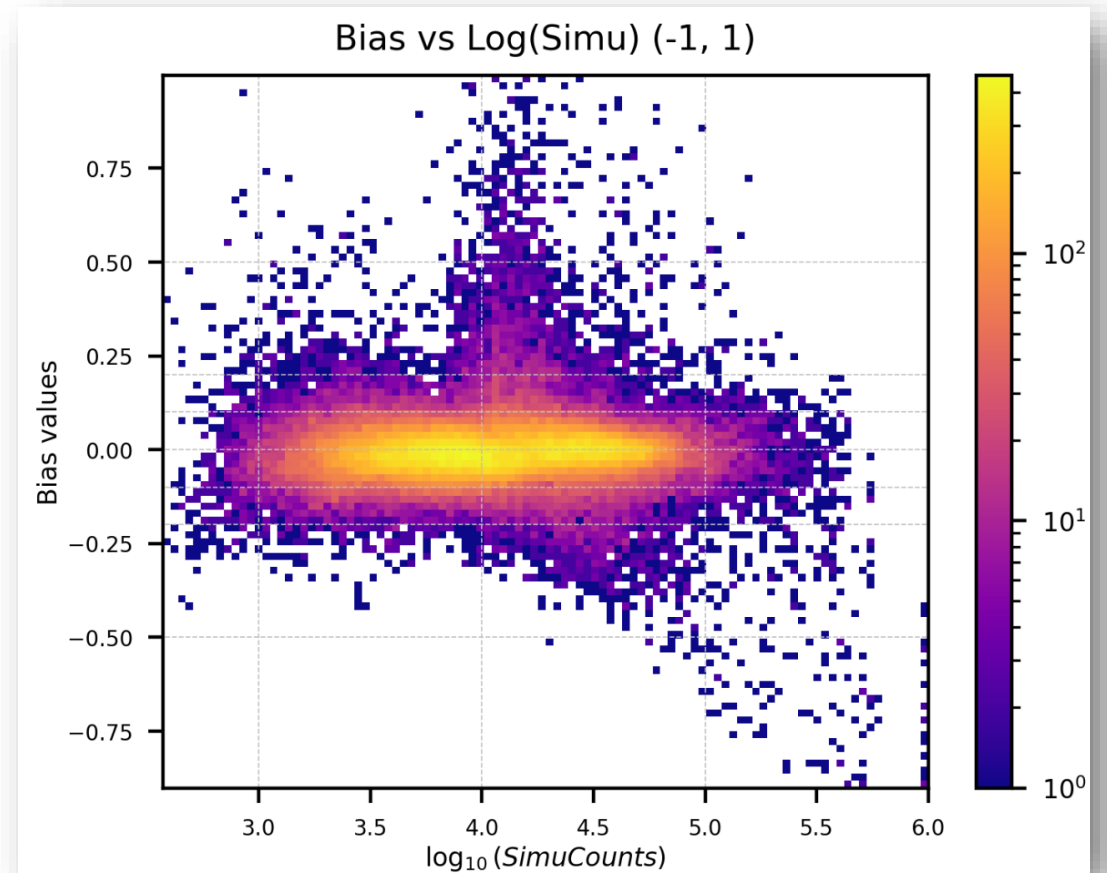
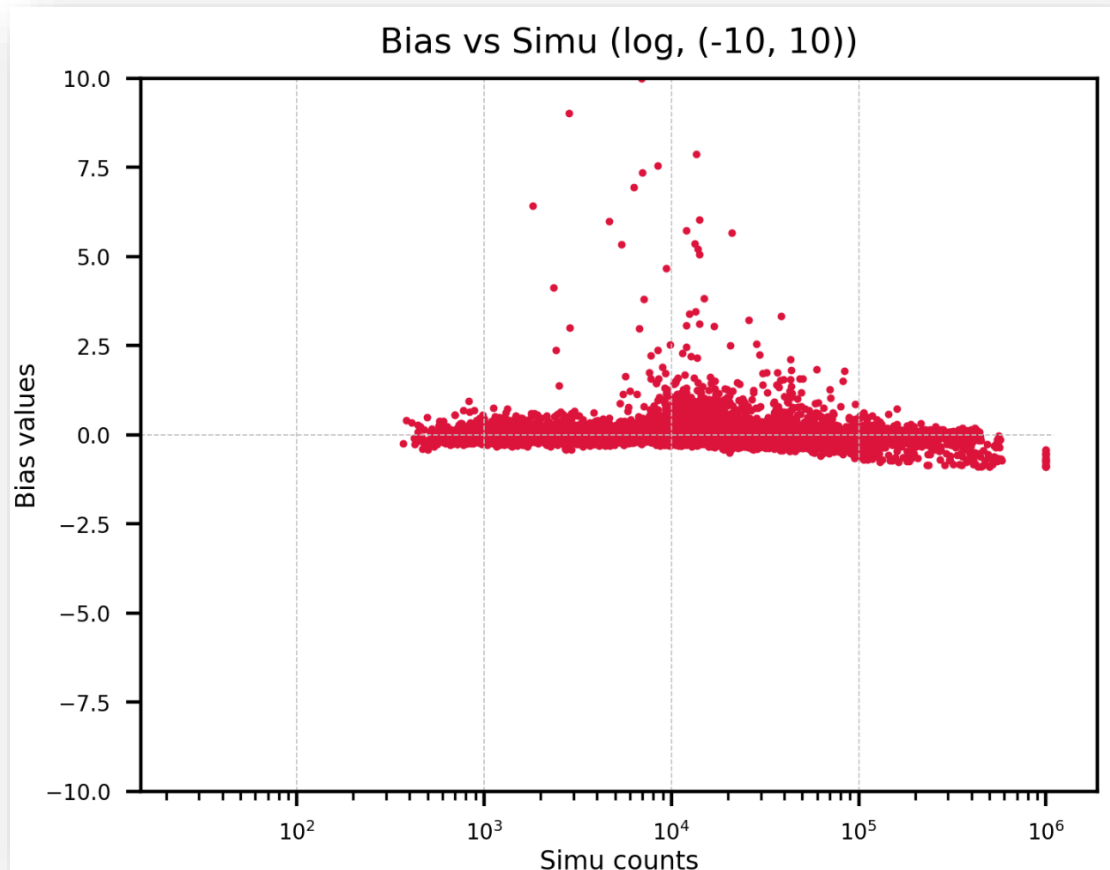
- ❖ Emul: Results from trained comp graph module
- ❖ Simu: Results from GEANT4, the “true” results

$$Bias = \frac{Emul - Simu}{Simu}$$



# Comp Graph Module vs GEANT4 (II)

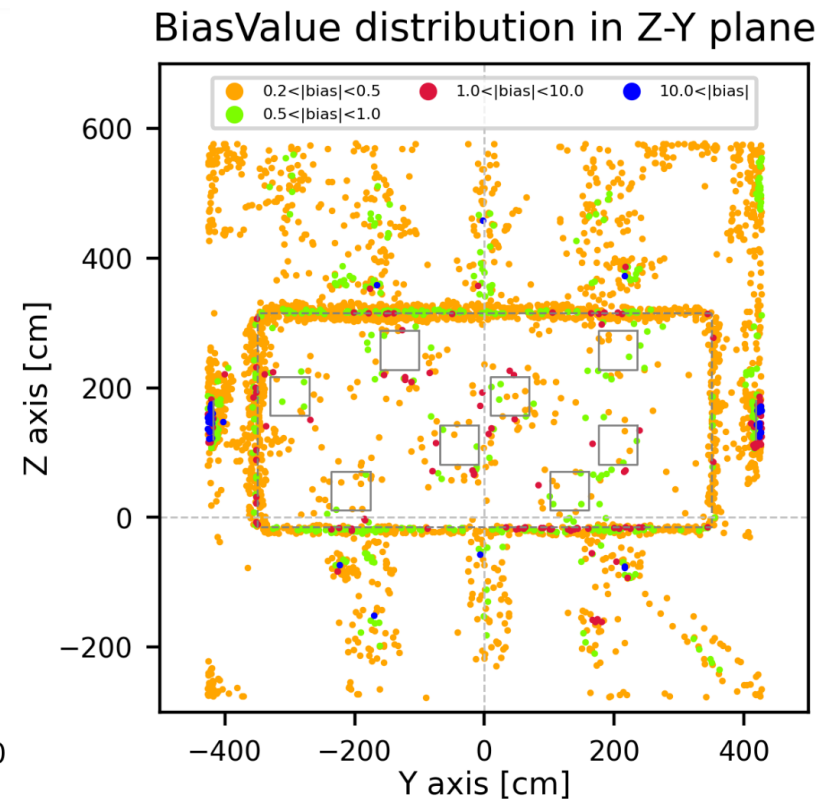
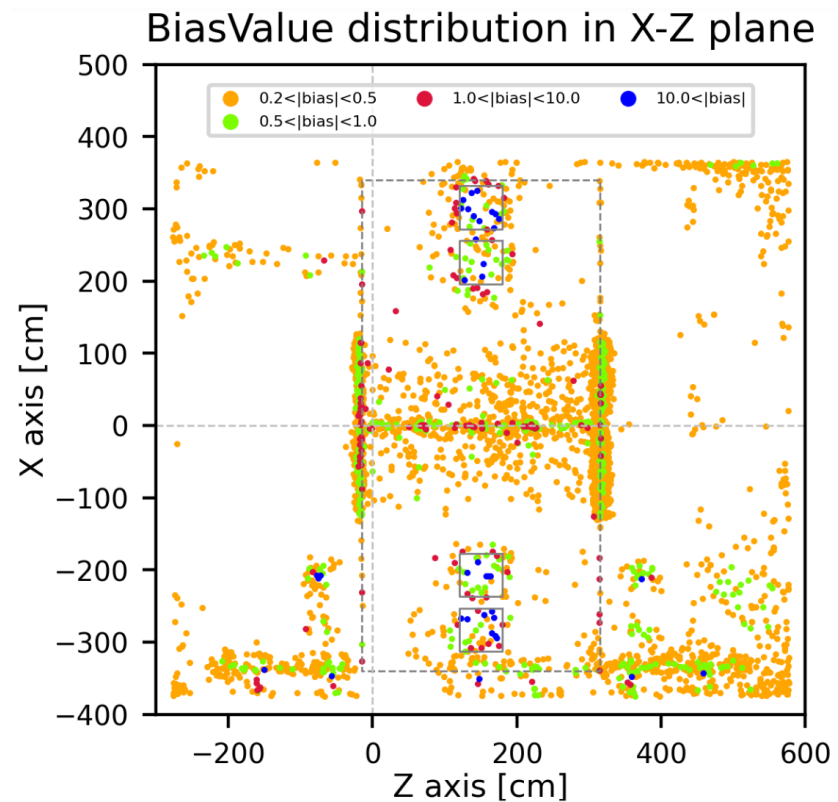
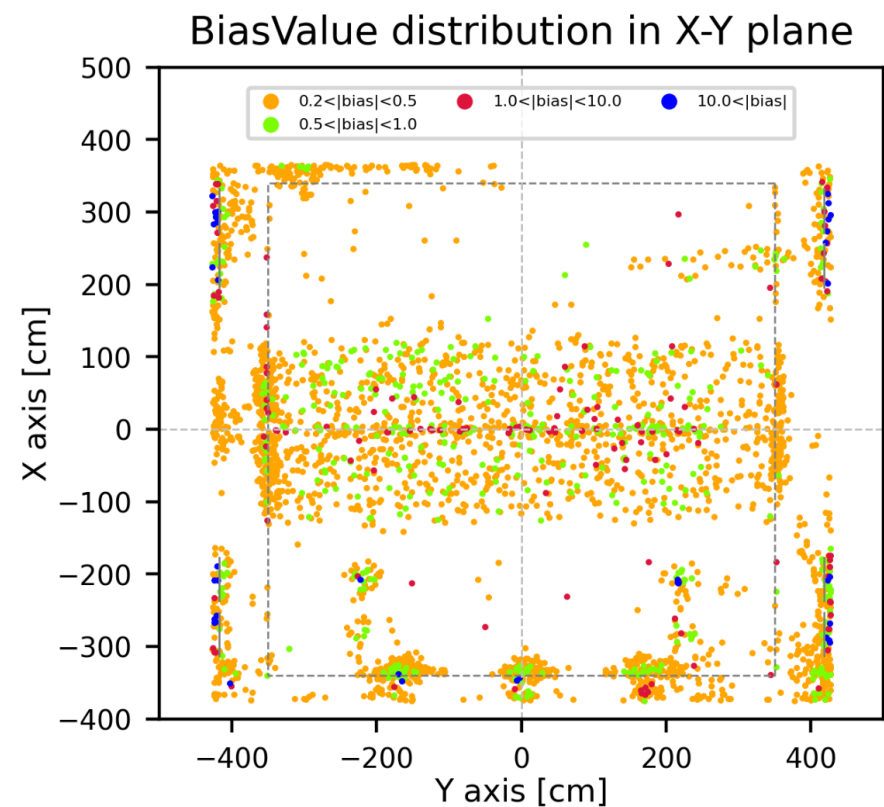
- ❖ Big bias events come from  $\#\gamma \in [10^3, 10^4]$  and  $\#\gamma \in [10^4, 10^5]$
- ❖ Small peak in Bias  $\in [-1, +1]$  can be explained by events close to field cage and other special regions





# Big-biased Events Distribution

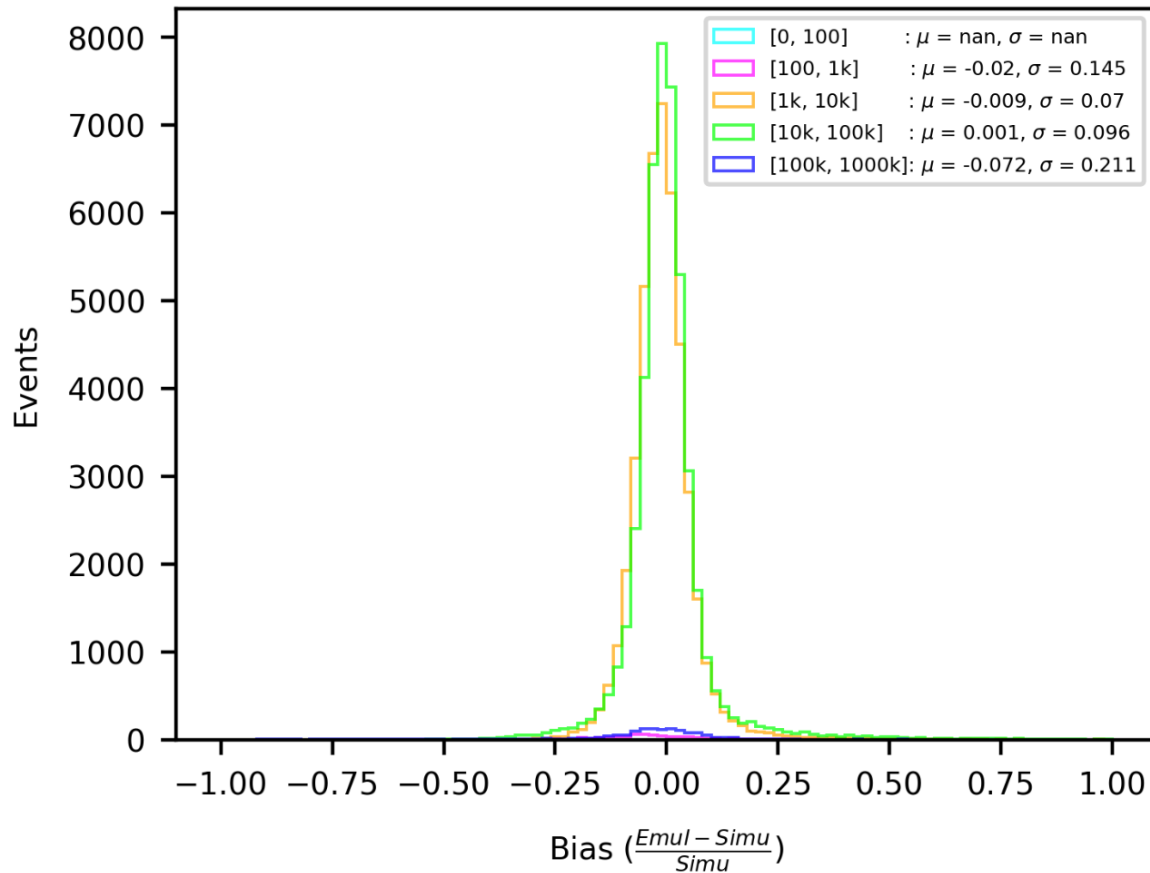
- ❖ Near field cage, back of optical channels, corners & beam pipe



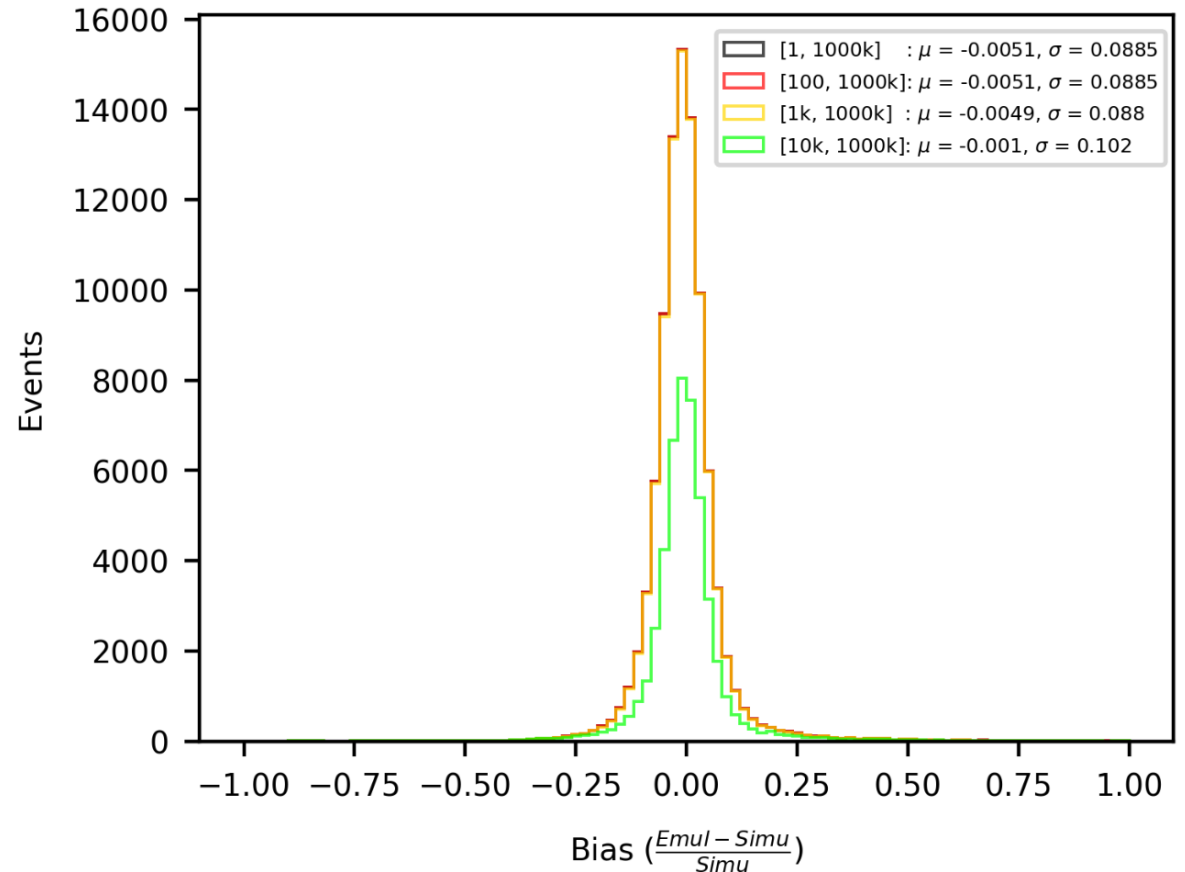
# Apply Cut to Bias distribution

❖ Preliminary Cut:  $\#\gamma \geq 1,000 \mapsto$  **negligible** improvement

Bias Distributions of Different Photon Num Regions



Bias Distributions of Different Photon Num Regions

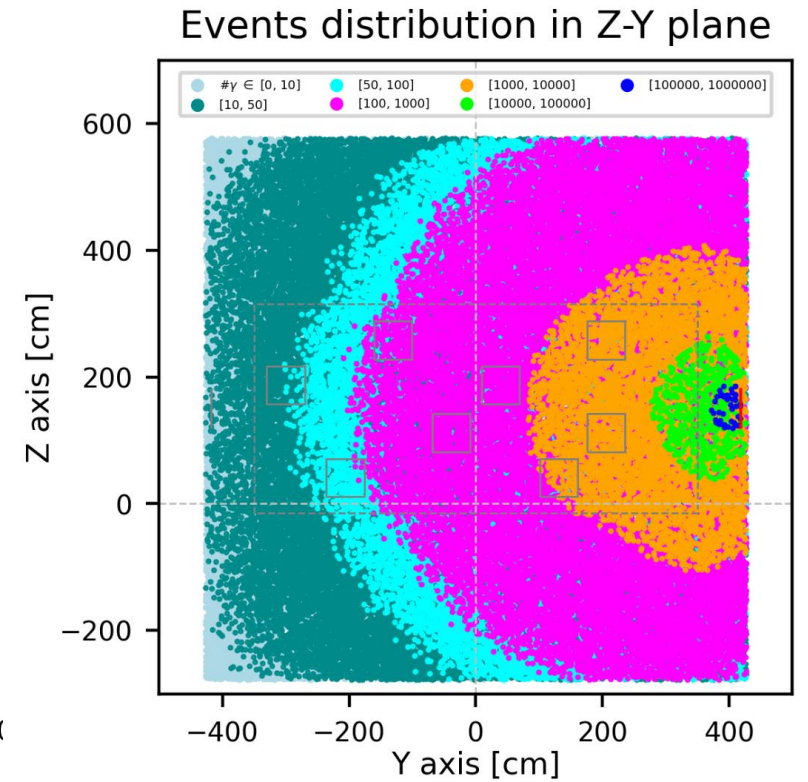
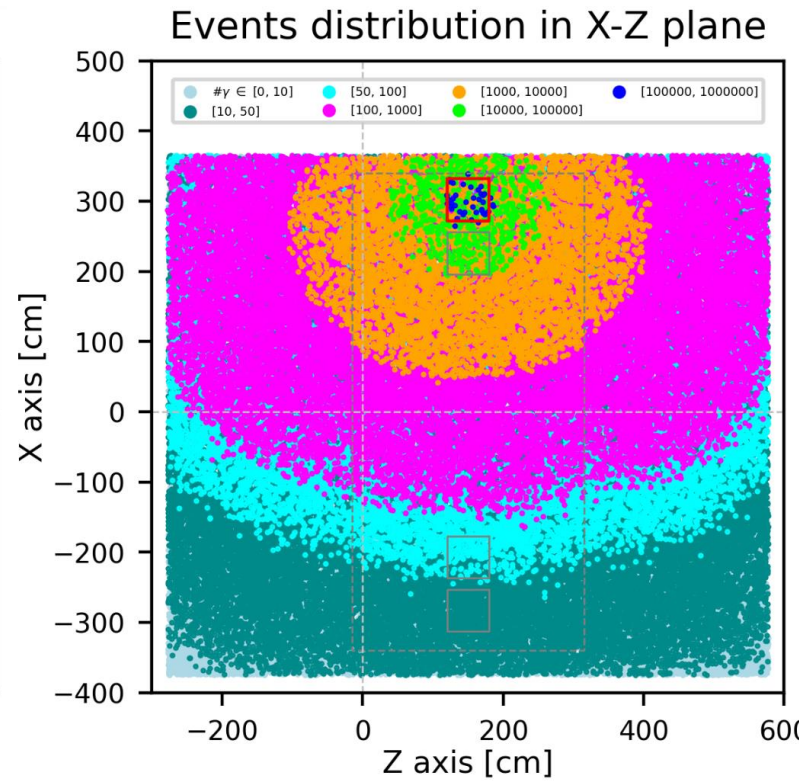
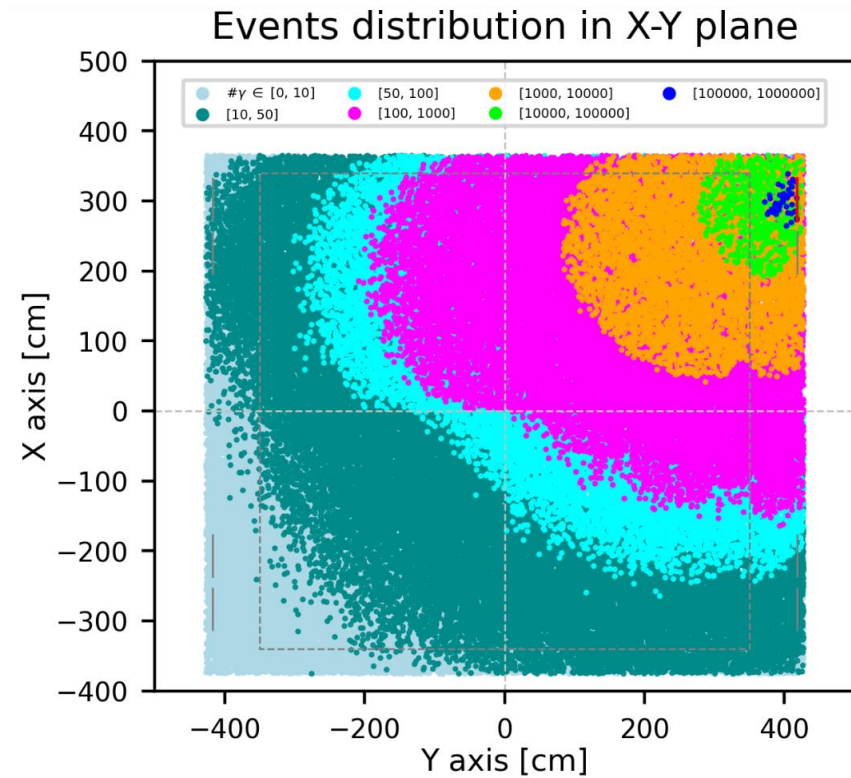


❖ Evaluation of collective performance

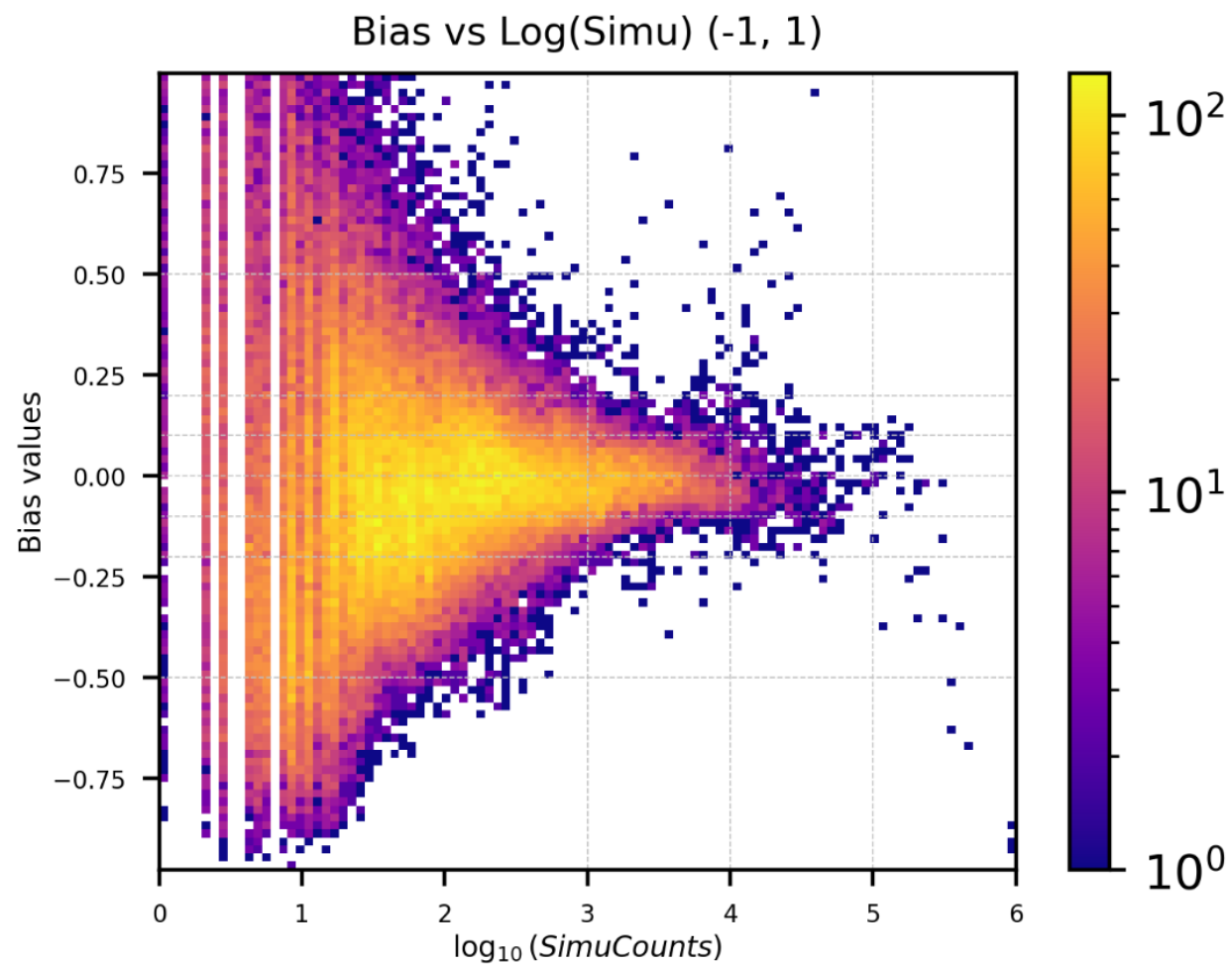
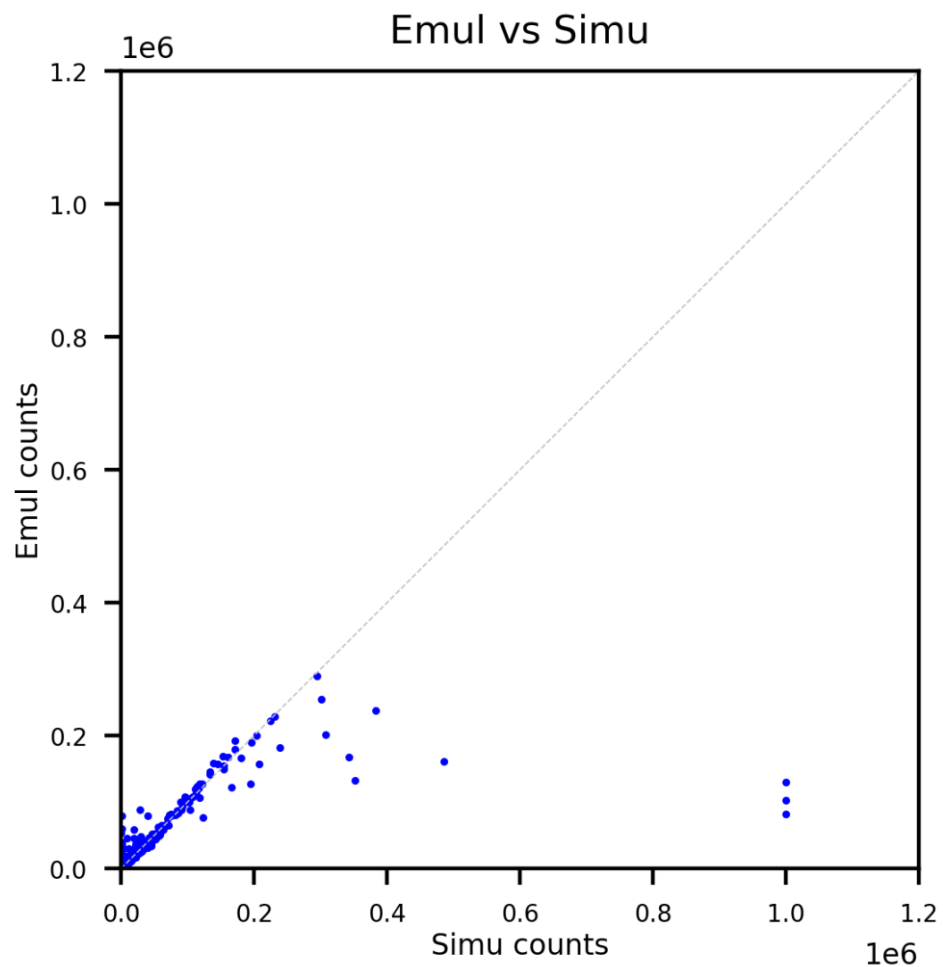
❖ **Evaluation of Single optical channel**

# OpCh00: Events Distribution

❖ This is still the events of evaluation set



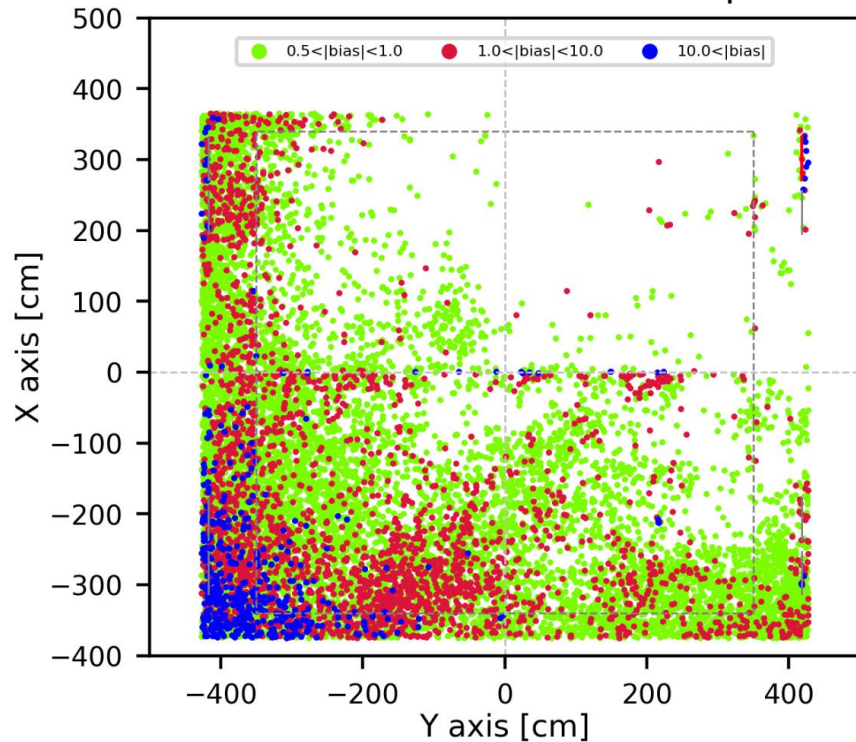
# OpCh00: Emul Counts & Bias



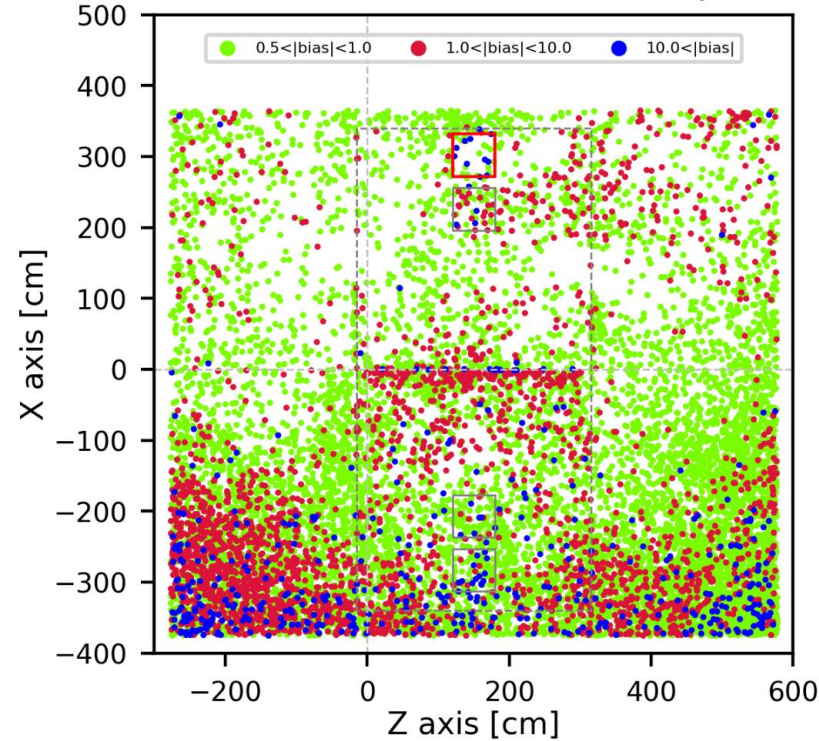
# OpCh00: Big Bias Events in Space

- ❖ Region away from OpCh00: Across field cage, bottom left, bottom right & top left

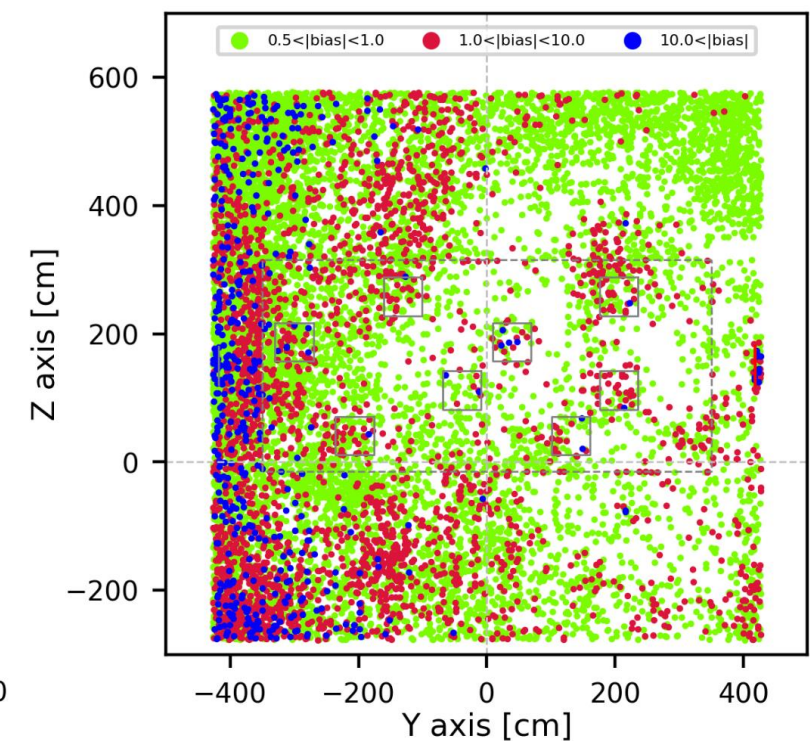
BiasValue distribution in X-Y plane



BiasValue distribution in X-Z plane



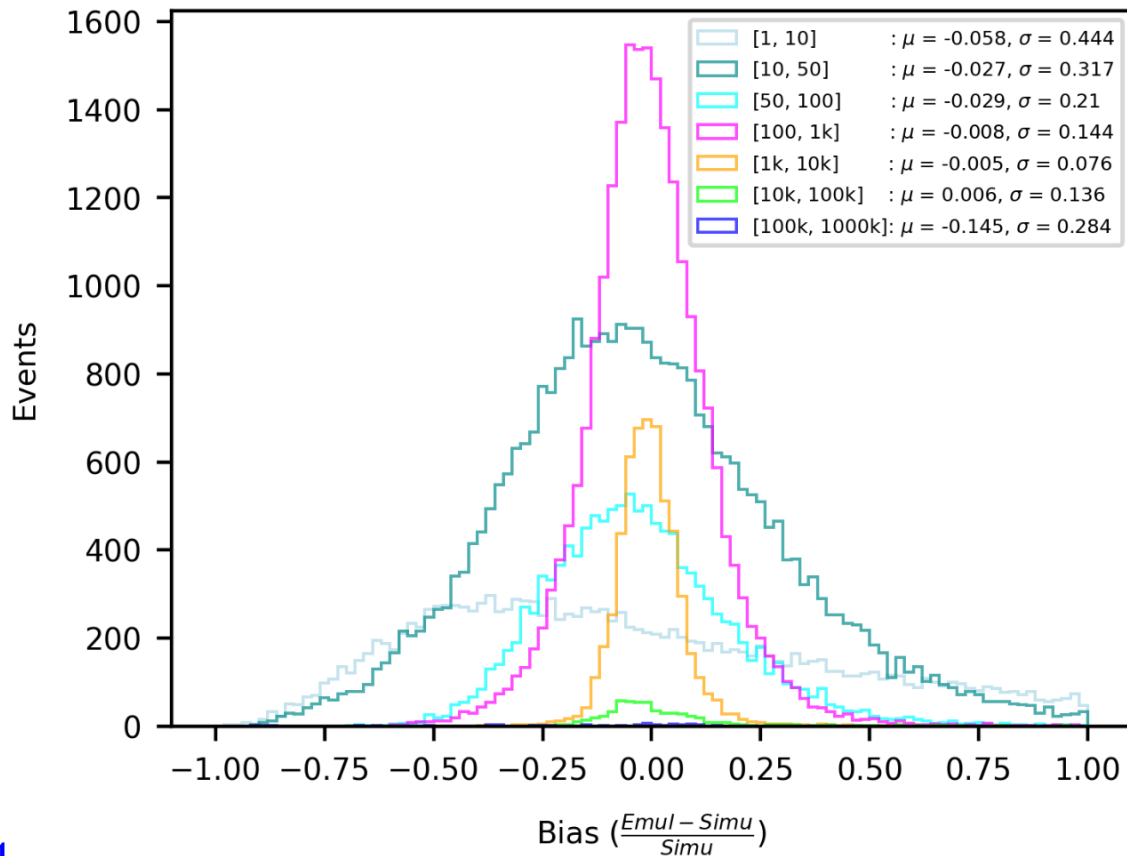
BiasValue distribution in Z-Y plane



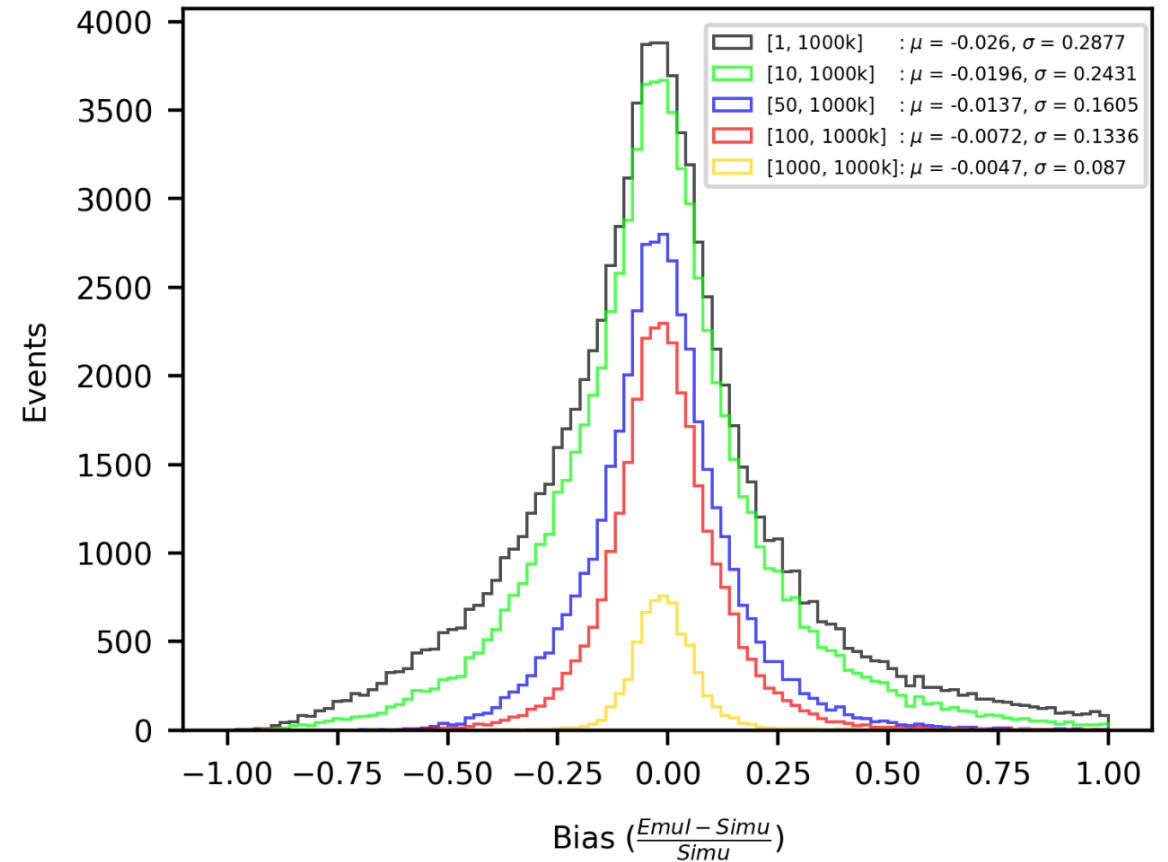
# OpCh00: Apply Cut

- ❖ Results comparison (without cut):  $\mu = -0.063, \sigma = 0.348$ (previous)  $\Rightarrow \mu = -0.026, \sigma = 0.287$ (**current**)
- ❖ Cut: Throw events with photon counts  $< 100 \Rightarrow \mu = -0.007, \sigma = 0.134$

Bias Distributions of Different Photon Num Regions

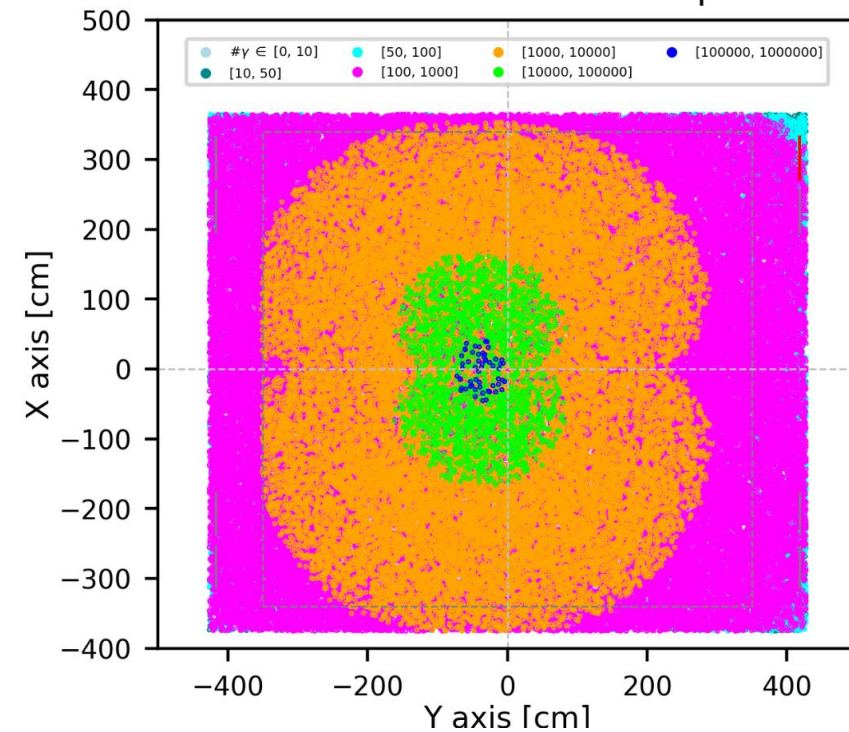


Bias Distributions of Different Photon Num Regions

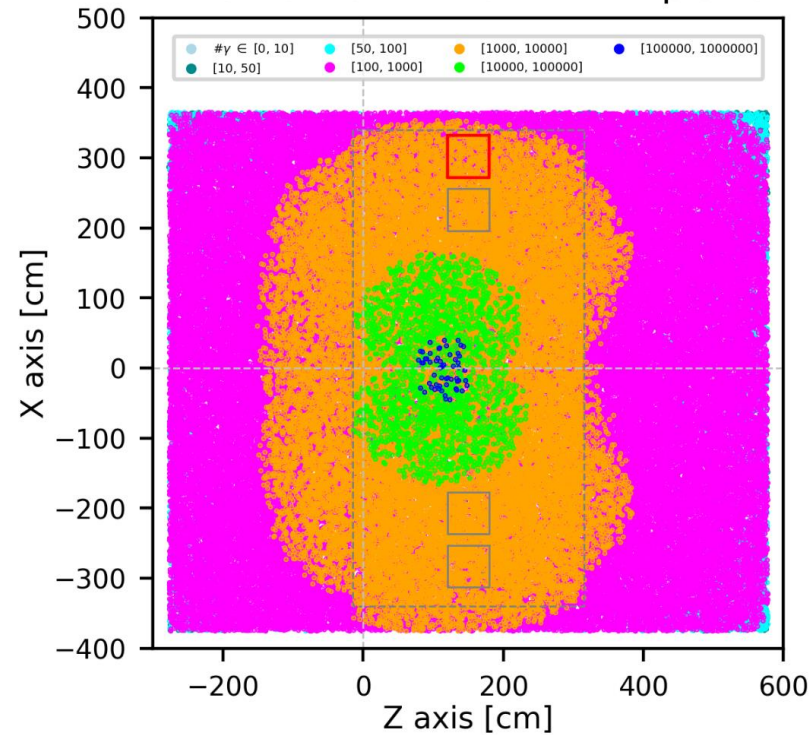


# OpCh09: Events Distribution

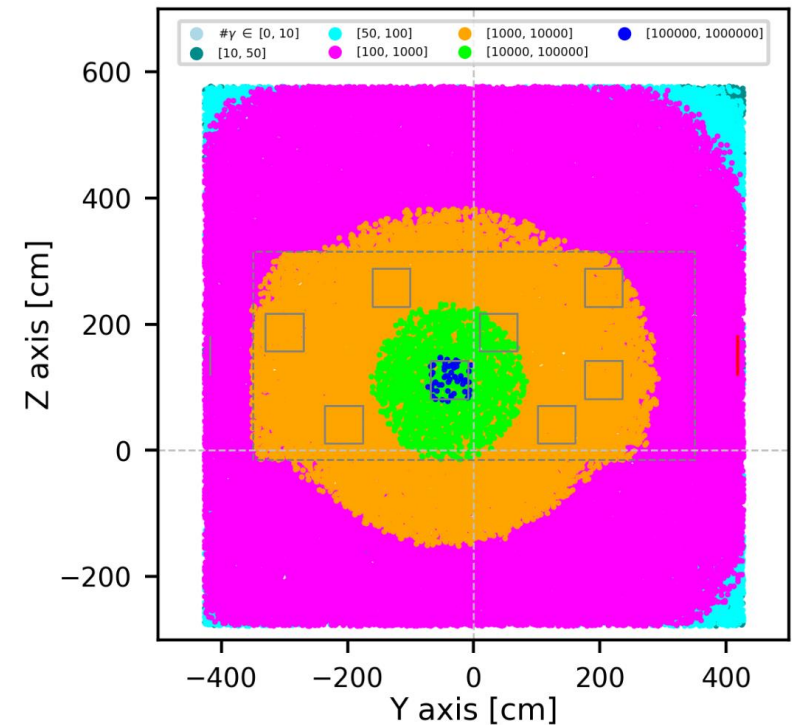
Events distribution in X-Y plane



Events distribution in X-Z plane

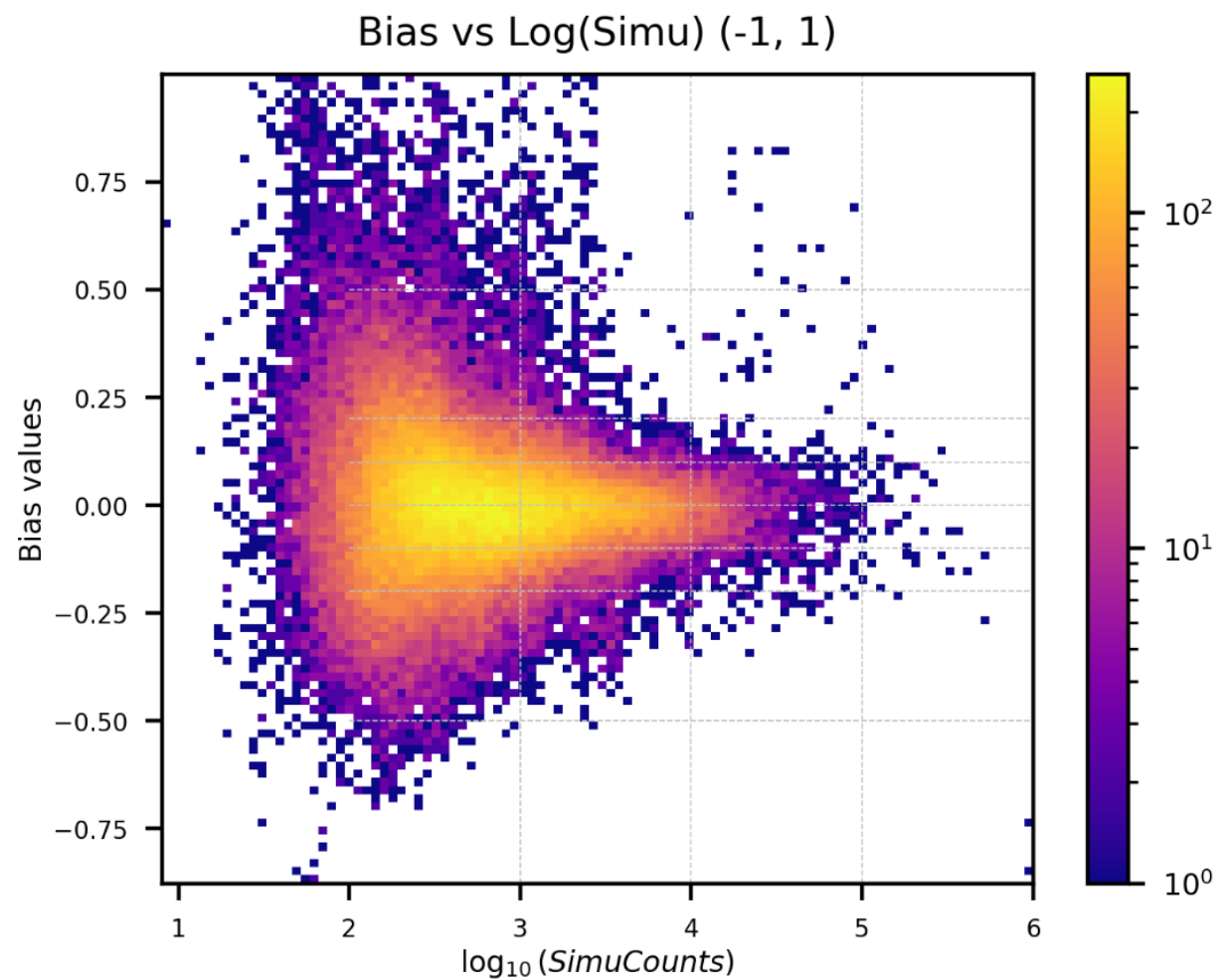
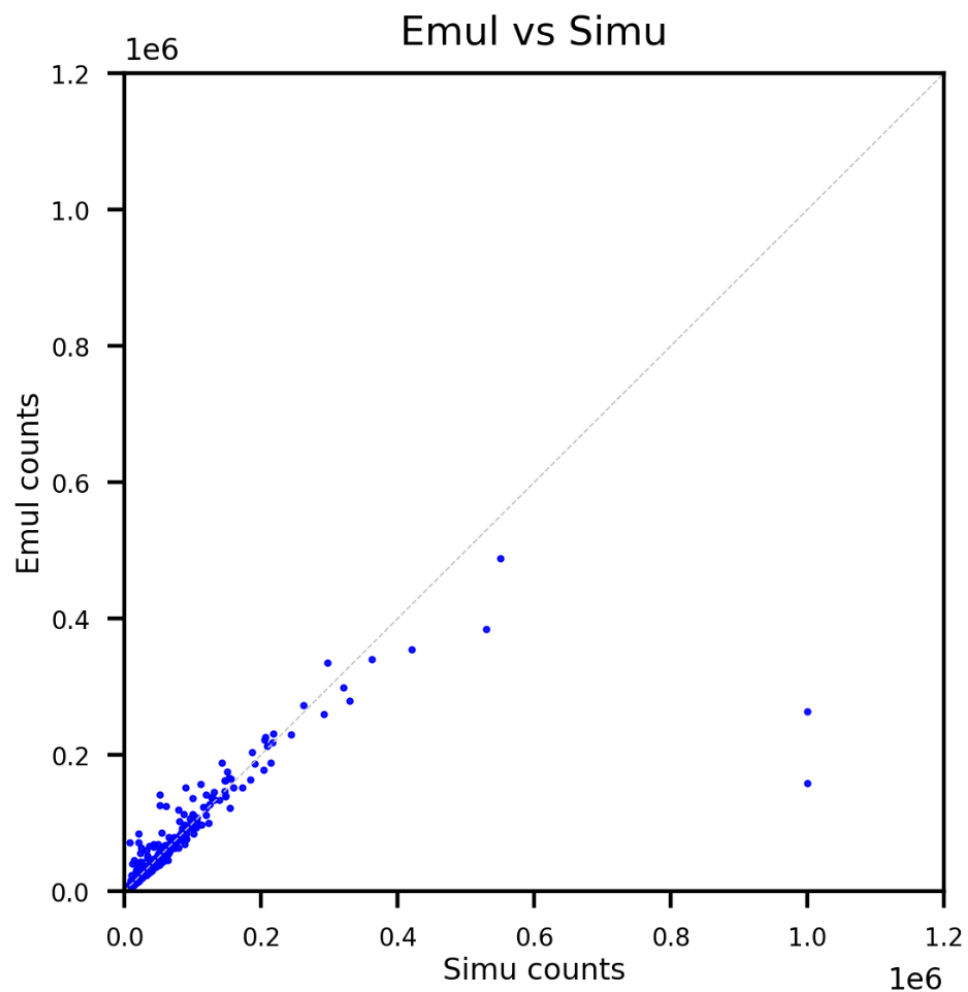


Events distribution in Z-Y plane



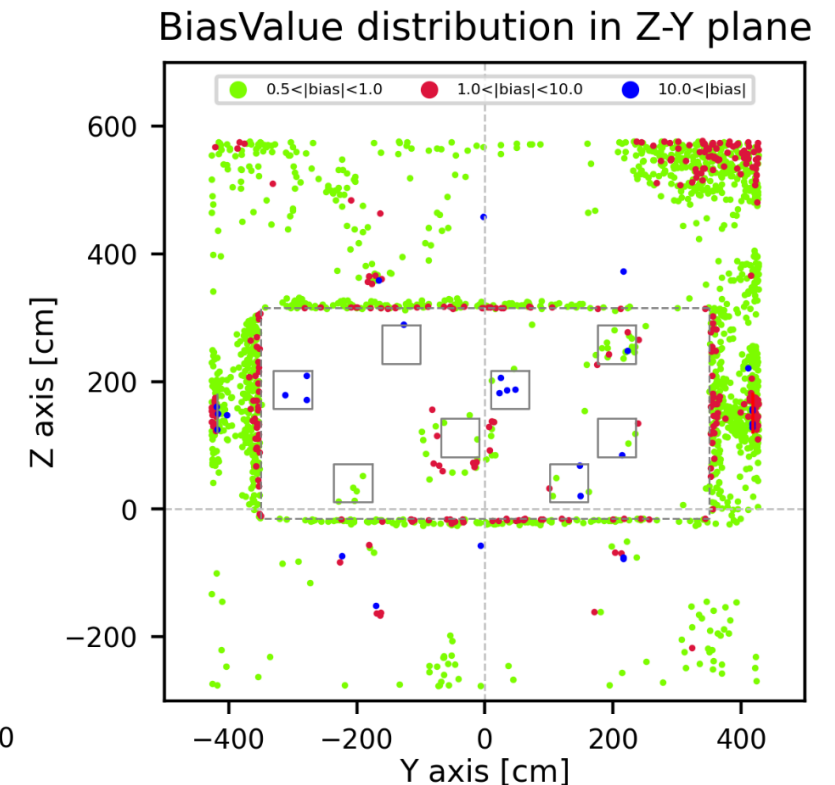
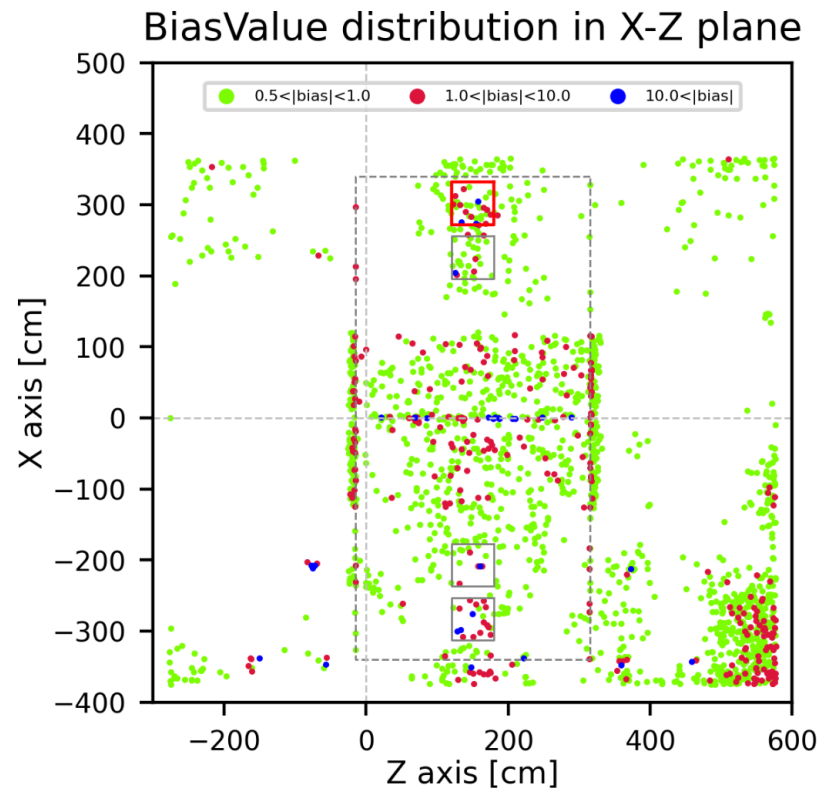
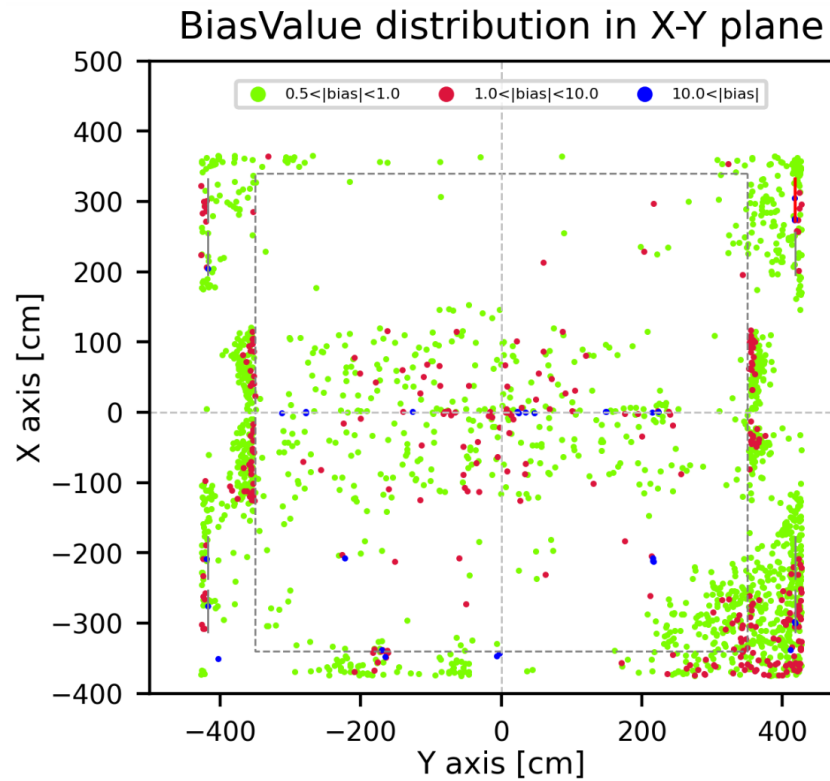


# OpCh09: Emul Counts & Bias



# OpCh09: Big Bias Events in Space

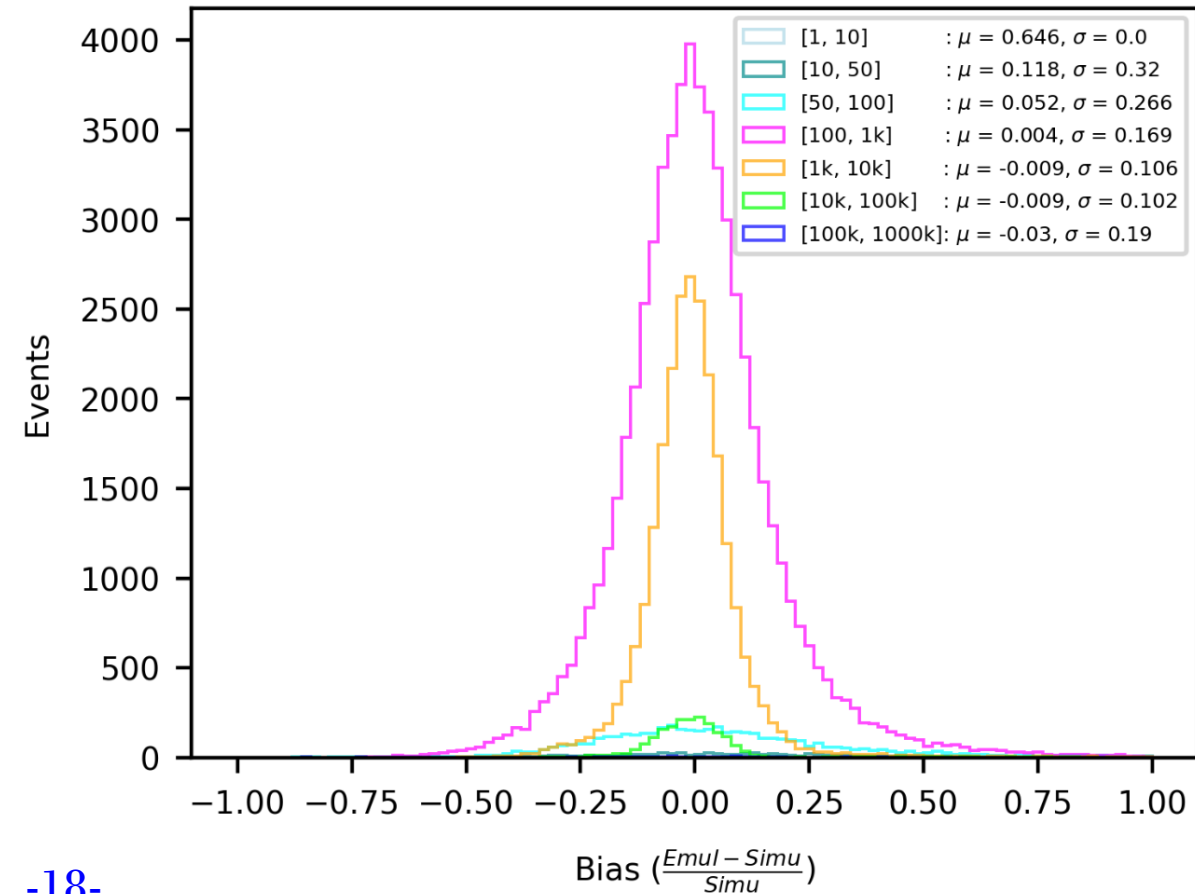
❖ Highly affected by field cage



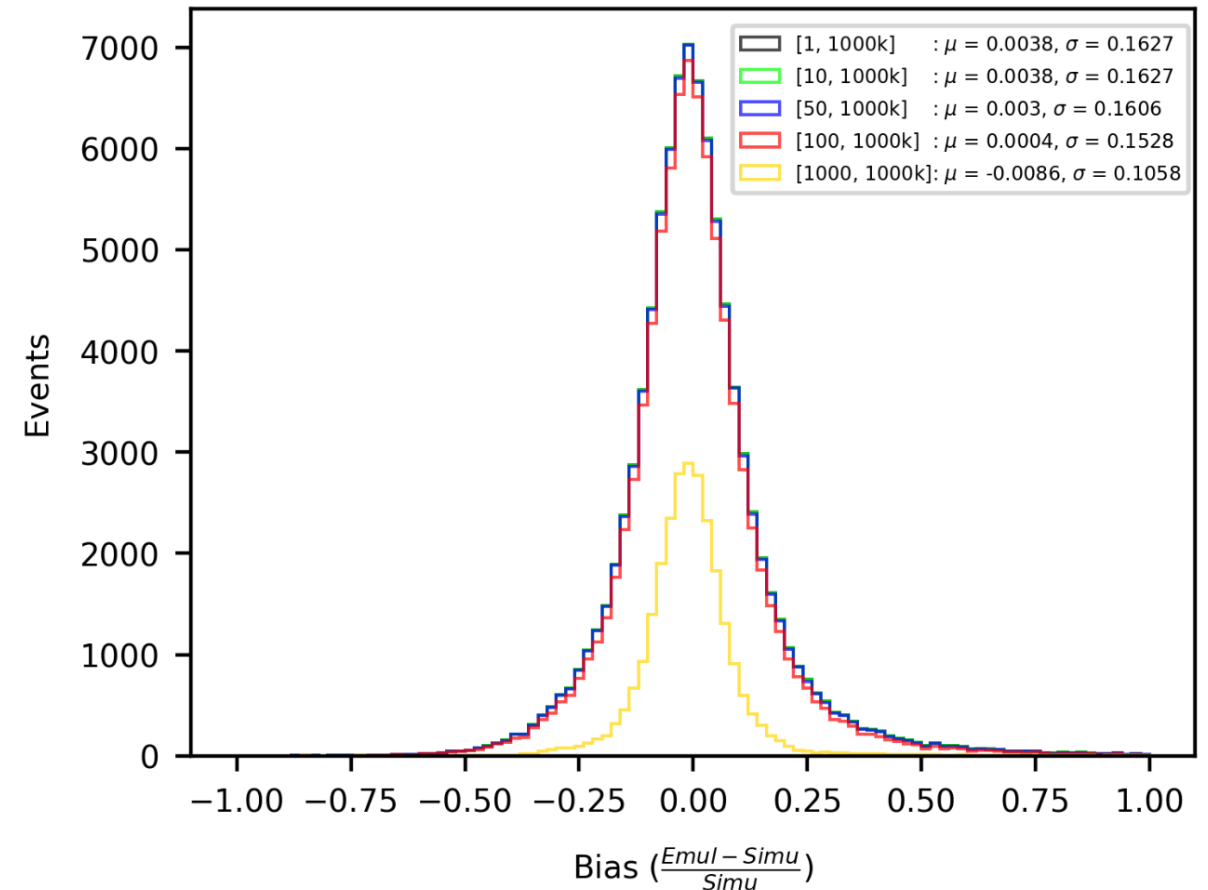
# OpCh09: Apply Cut

- ❖ Results comparison (without cut):  $\mu = 0.012, \sigma = 0.173$ (previous)  $\Rightarrow \mu = 0.004, \sigma = 0.163$ (current)
- ❖ Cut: Throw events with photon counts  $< 100 \Rightarrow \mu = 0.0004, \sigma = 0.153$

Bias Distributions of Different Photon Num Regions

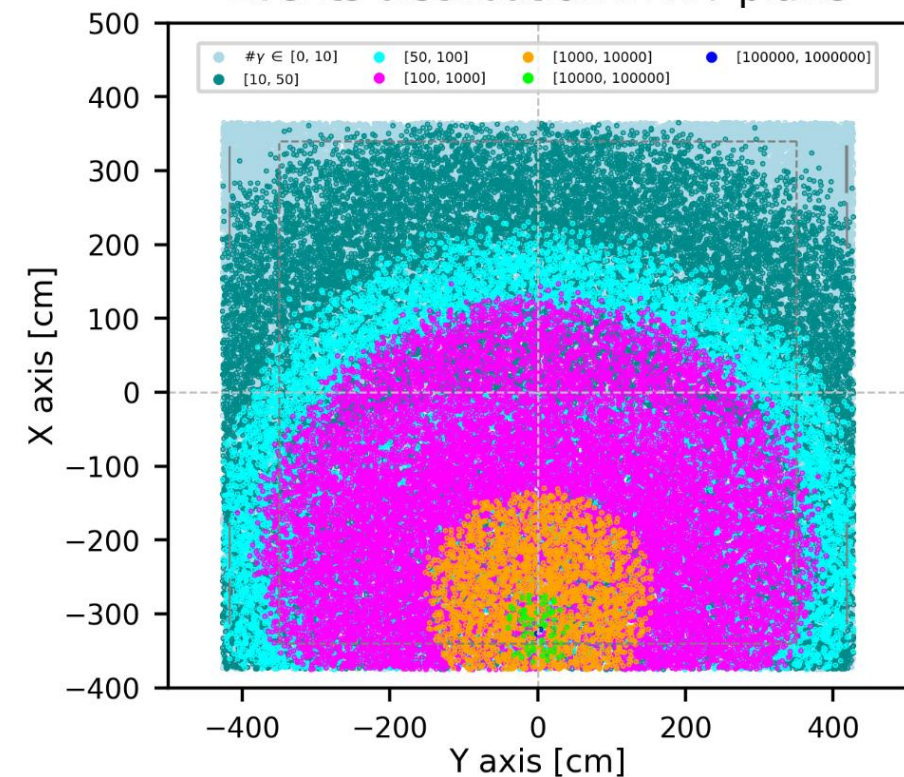


Bias Distributions of Different Photon Num Regions

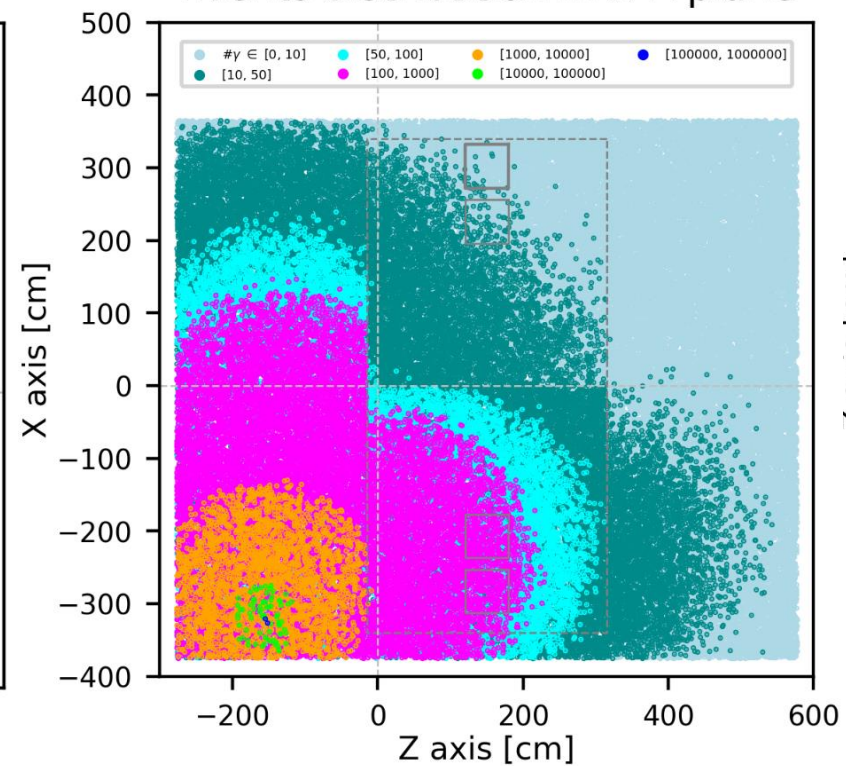


# OpCh38: Events Distribution

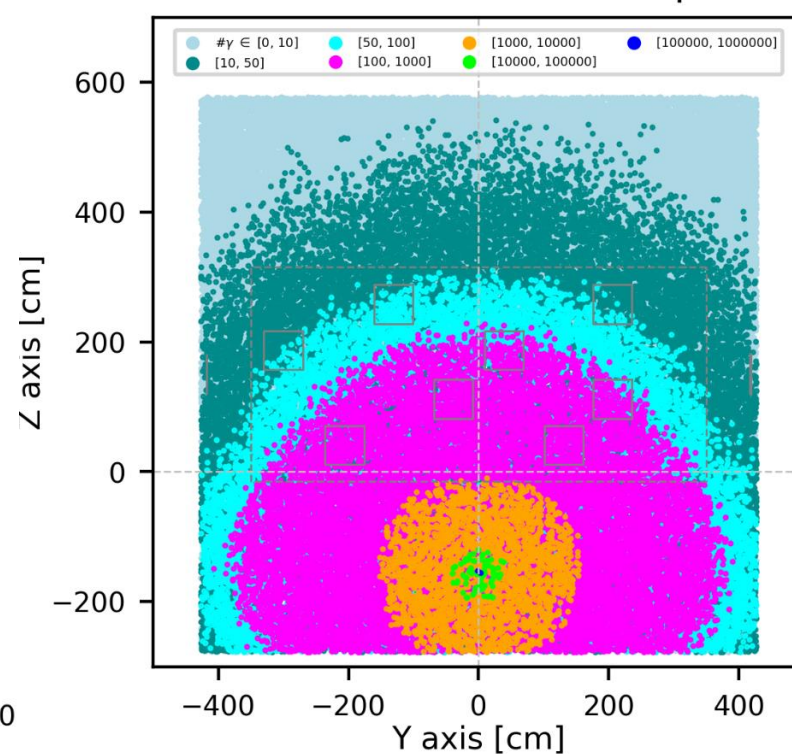
Events distribution in X-Y plane



Events distribution in X-Z plane

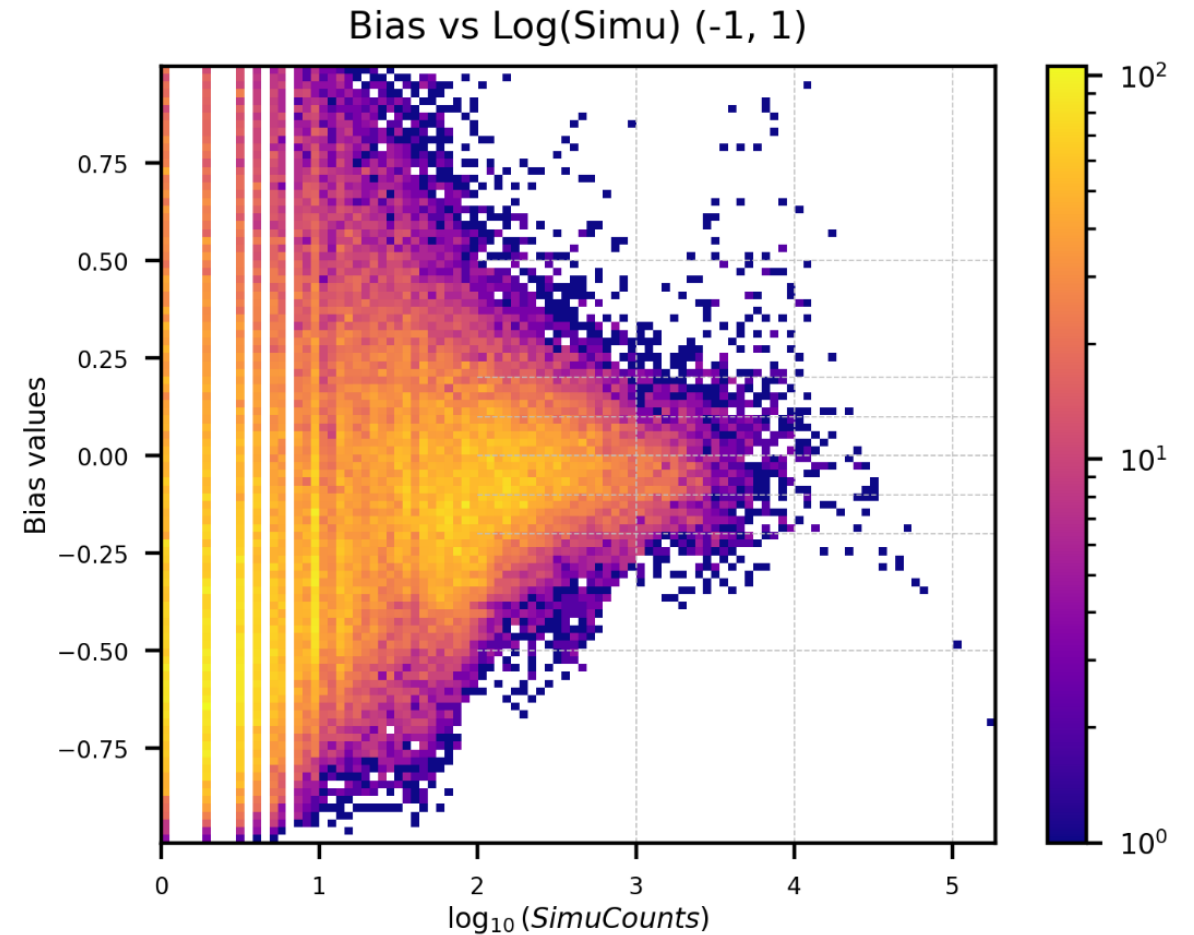
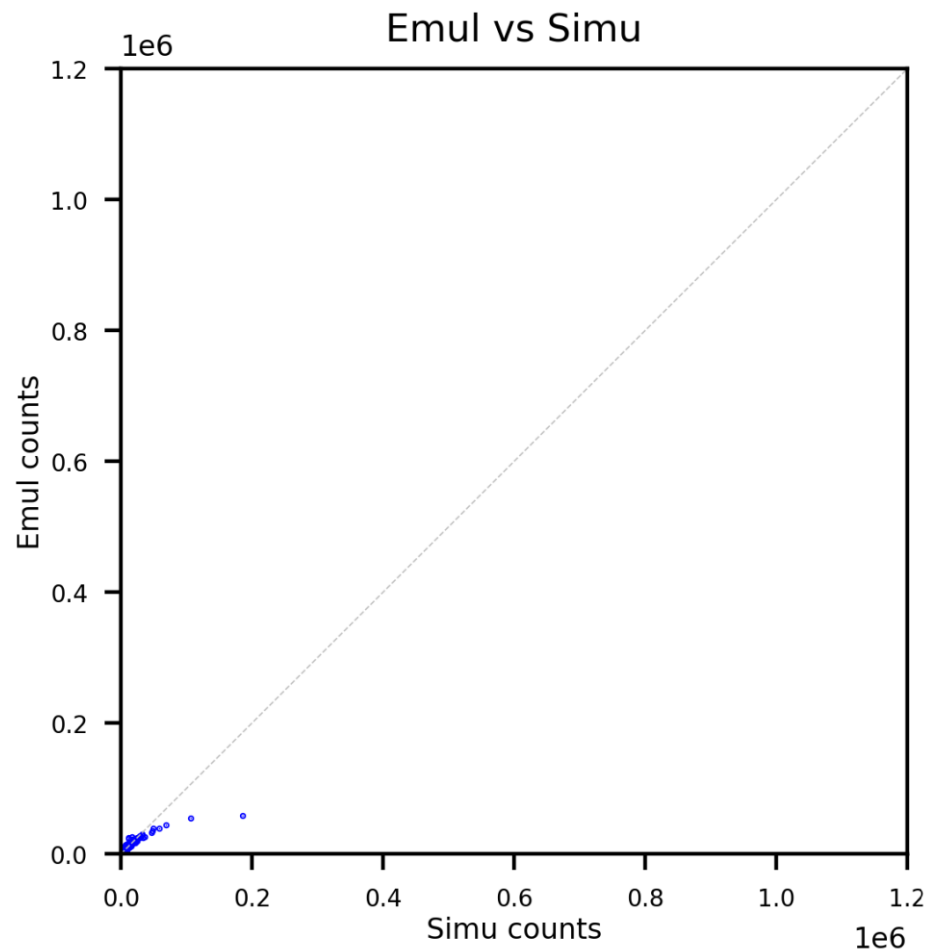


Events distribution in Z-Y plane

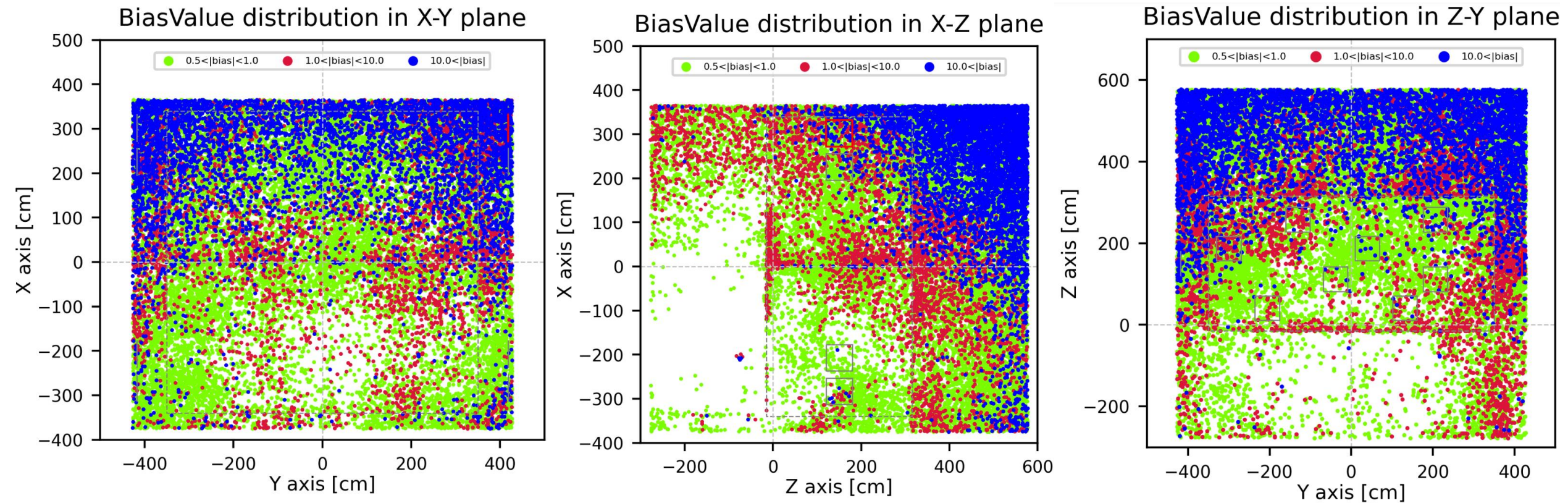


# OpCh38: Emul Counts & Bias

- ❖ Events with  $\#\gamma < 10$  contributes a lot to big-biased events



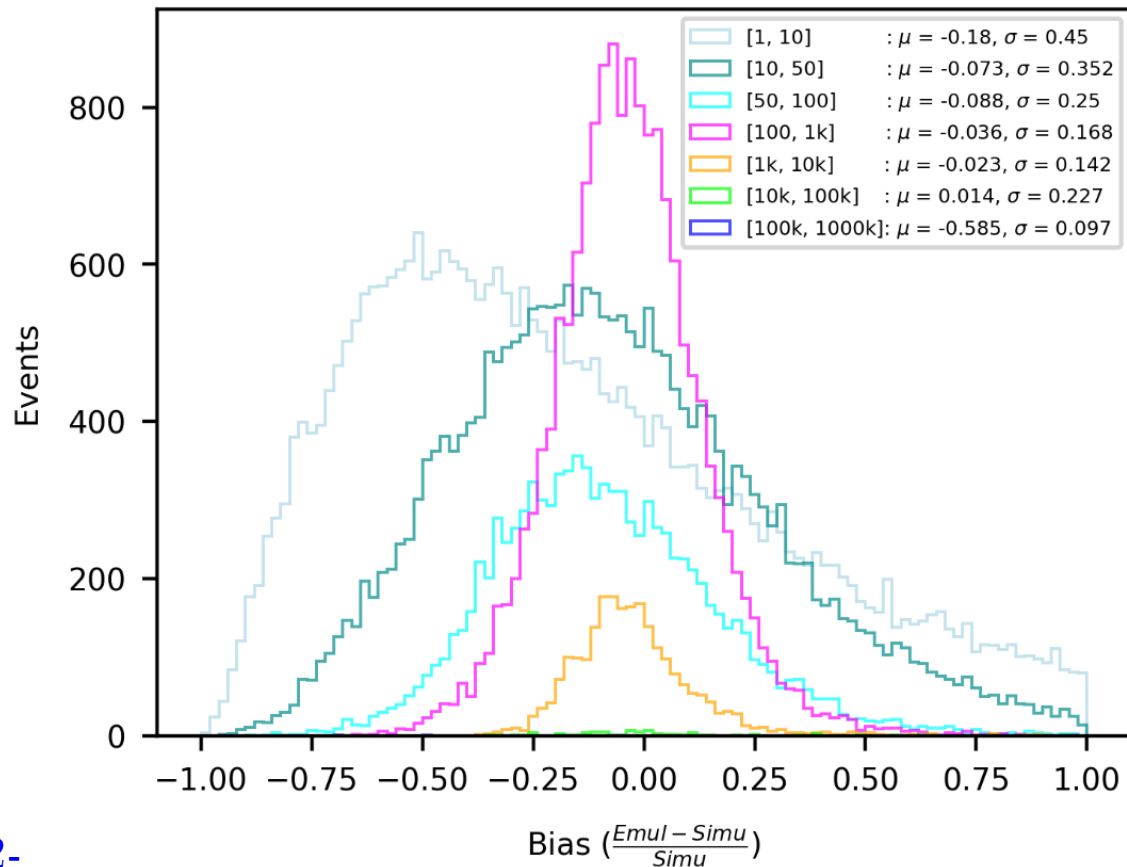
# OpCh38: Big Bias Events in Space



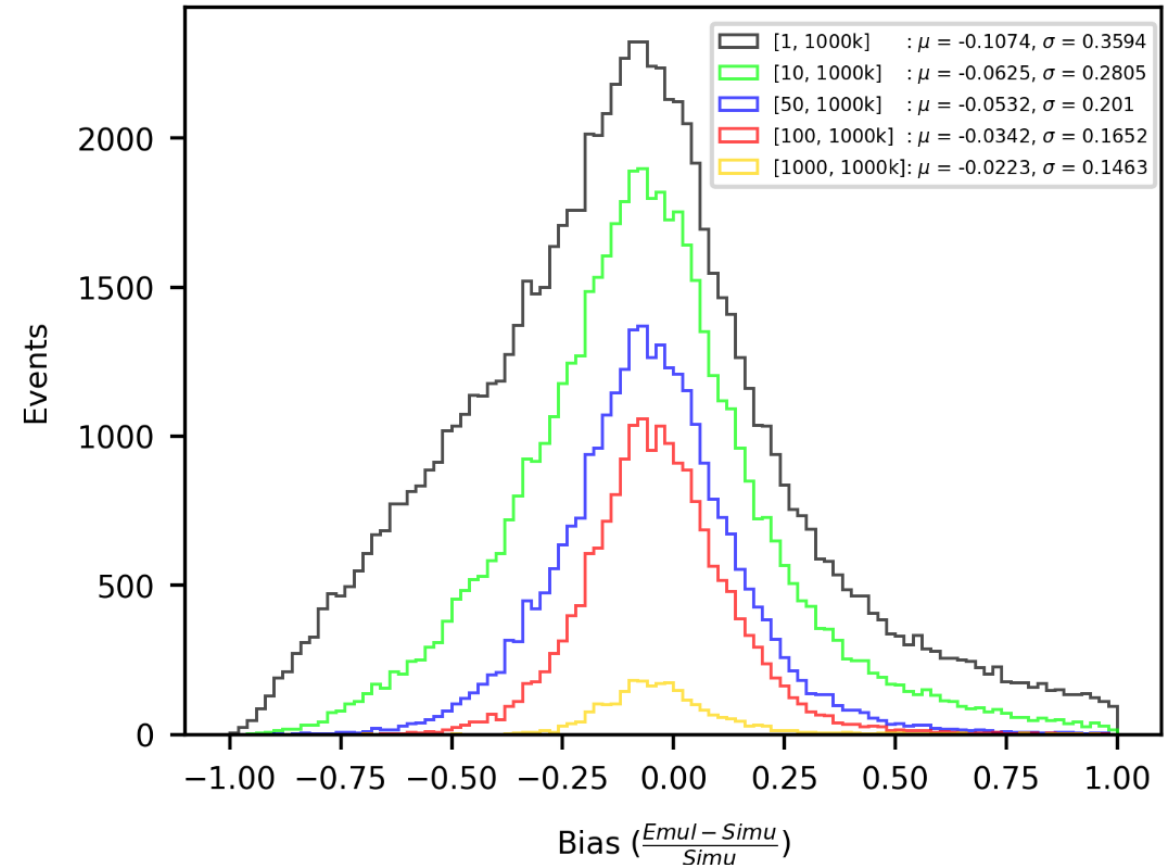
# OpCh38: Apply Cut

- ❖ Results comparison (without cut):  $\mu = -0.101, \sigma = 0.382$ (previous)  $\Rightarrow \mu = -0.107, \sigma = 0.359$ (**current**)
- ❖ Cut: Throw events with photon counts  $< 100 \Rightarrow \mu = -0.0342, \sigma = 0.165$

Bias Distributions of Different Photon Num Regions



Bias Distributions of Different Photon Num Regions



# Summaries

- ❖ Detailed evaluation methods developed
- ❖ New training has better performance over old training
- ❖ Applying proper cuts improves performance apparently
- ❖ Further steps:
  1. Determine the criteria of performance: How good is good?
  2. Further improve evaluation methods (Any suggestions is appreciated!)
  3. Expand evaluations to the left 37 optical channels
  4. Optimize current network (e.g change learning rate, hyper-parameters)
  5. Increase training samples: Current **500,000**  $\Rightarrow$   **$\sim$ 2,000,000**



# Backups

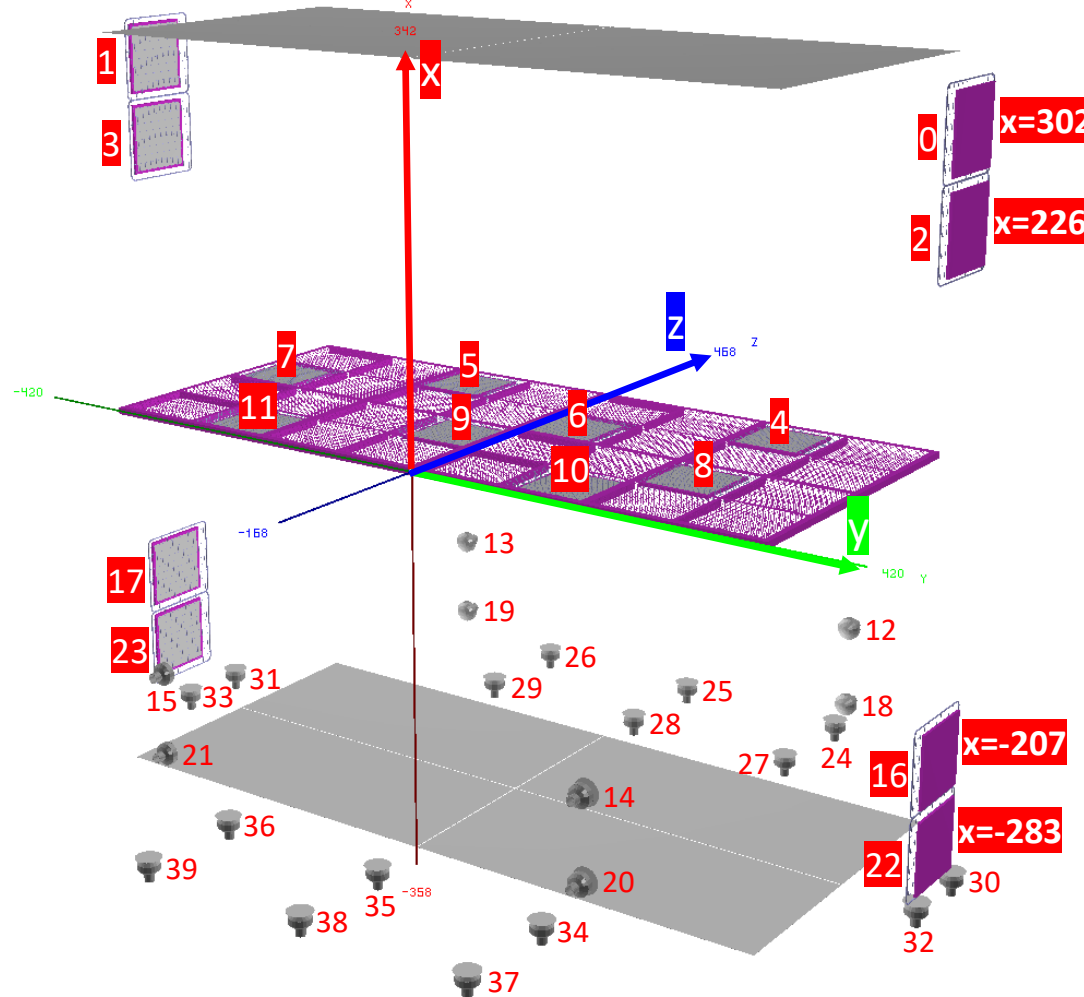
# X-Arapuca Labels in v4 geometry

Optical Channels positions: 40

0	302.18	417.61	149.65
1	302.18	-417.61	149.65
2	226.38	417.61	149.65
3	226.38	-417.61	149.65
4	0	205.65	258.525
5	0	-131.35	258.525
6	0	39.15	187.275
7	0	-297.85	187.275
8	0	205.65	112.025
9	0	-39.15	112.025
10	0	131.35	40.775
11	0	-205.65	40.775
12	-205.9	221	380.988
13	-205.9	-221	380.988
14	-205.9	221	-68.1242
15	-205.9	-221	-81.6884
16	-207.23	417.61	149.65
17	-207.23	-417.61	149.65
18	-281.7	221	380.988
19	-281.7	-221	380.988
20	-281.7	221	-68.1242

Cryo Boundaries

Xmin: -375 Xmax: 415 Ymin: -427.4 Ymax: 427.4 Zmin: -277.75 Zmax: 577.05  
drift coordinate: 1 (X direction)



21	-281.7	-221	-81.6884
22	-283.03	417.61	149.65
23	-283.03	-417.61	149.65
24	-336.474	170	455.65
25	-336.474	1.13687e-13	455.65
26	-336.474	-170	455.65
27	-336.474	170	353.65
28	-336.474	1.13687e-13	353.65
29	-336.474	-170	353.65
30	-336.474	405.3	217.75
31	-336.474	-405.3	217.75
32	-336.474	405.3	149.65
33	-336.474	-405.3	149.65
34	-336.474	170	-54.35
35	-336.474	1.13687e-13	-54.35
36	-336.474	-170	-54.35
37	-336.474	170	-156.35
38	-336.474	1.13687e-13	-156.35
39	-336.474	-170	-156.35

# RSL, Abs & Reflectivity

Rayleigh scattering length:

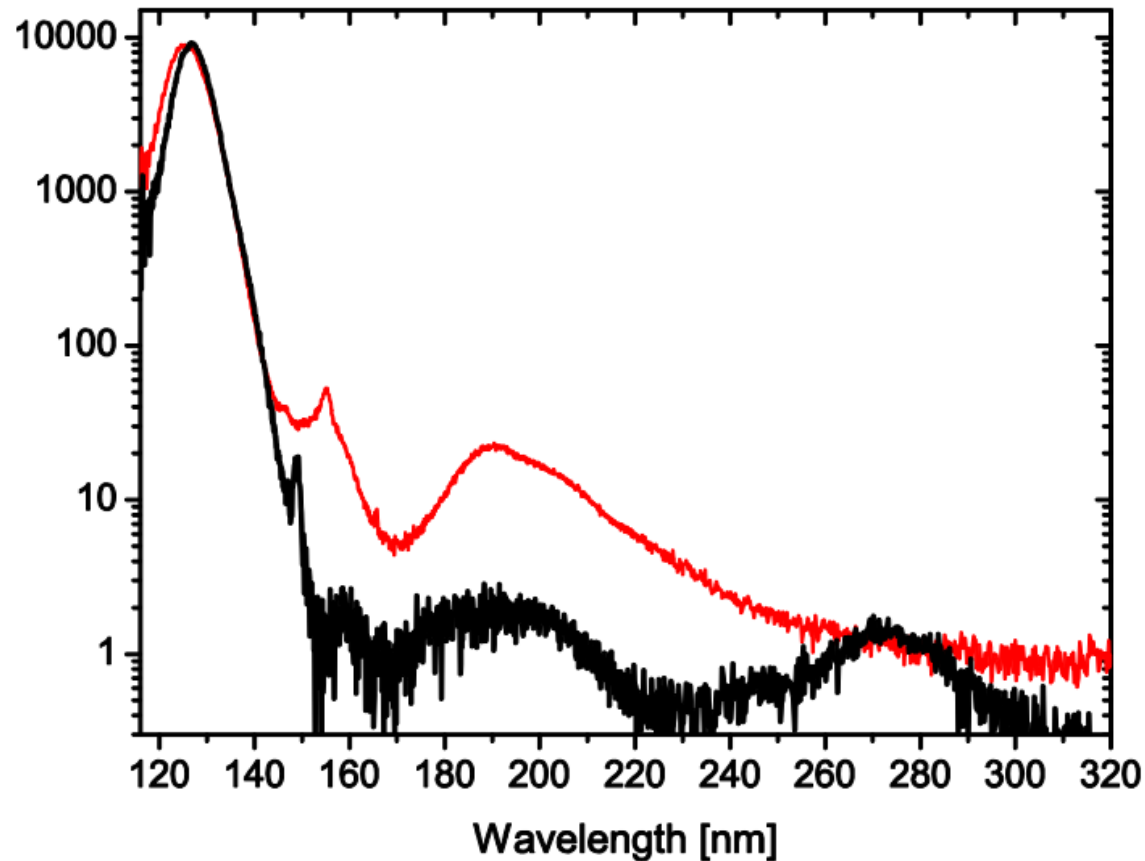
```
118 services.LArPropertiesService.RayleighEnergies: [1.18626, 1.68626, 2.18626, 2.68626, 3.18626, 3.68626, 4.18626, 4.68626, 5.18626, 5.68626, 6.18626, 6.68626, 7.18626, 7.68626, 8.18626, 8.68626, 9.18626, 9.68626, 10.1863, 10.6863, 11.1863]
119 services.LArPropertiesService.RayleighSpectrum: [1200800, 390747, 128633, 54969.1, 27191.8, 14853.7, 8716.9, 5397.42, 3481.37, 2316.51, 1577.63, 1092.02, 763.045, 534.232, 371.335, 252.942, 165.38, 99.9003, 51.2653, 17.495, 0.964341]
```

Absorption length:

```
127 services.LArPropertiesService.AbsLengthEnergies: [4,5,6,6.5,7,7.5,8,9,10,11]
128 services.LArPropertiesService.AbsLengthSpectrum: [2000,2000,2000,8000,8000,8000,2000,2000,2000,2000]
```

For more details, refer to (dunegpvm) [/dune/data/users/szh2/rsl\\_Nov2023/work/photonFull\\_module0\\_sim.fcl](#)

# Photon Spectrum of LAr



- ❖ Black: LAr, Red: GAr
- ❖ LAr: Peak @ **126.8nm**, FWHM: 7.8nm [122.9, 130.7]nm  
Energy: Peak @ 9.78eV, FWHM: 0.602eV
- ❖ Assuming Gaussian distribution:  
 $(\mu, \sigma) = (9.78, 0.256)eV$

## Normal distribution [ edit ]

See also: [Gaussian beam & Beam waist](#)

If the considered function is the density of a [normal distribution](#) of the form

$$f(x) = \frac{1}{\sigma\sqrt{2\pi}} \exp\left[-\frac{(x-x_0)^2}{2\sigma^2}\right]$$

where  $\sigma$  is the [standard deviation](#) and  $x_0$  is the [expected value](#), then the relationship between FWHM and the [standard deviation](#) is<sup>[1]</sup>

$$\text{FWHM} = 2\sqrt{2\ln 2} \sigma \approx 2.355 \sigma.$$

<https://arxiv.org/ftp/arxiv/papers/1511/1511.07718.pdf>

<https://iopscience.iop.org/article/10.1088/1748-0221/15/09/P09009/pdf>

X