

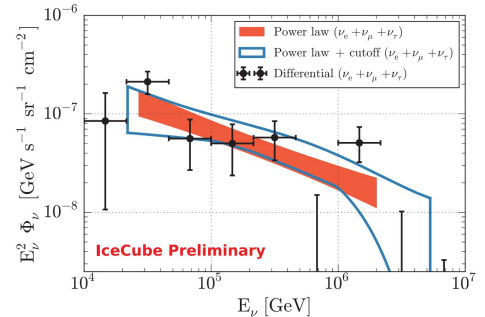
# Detecting $\nu_{\tau}$ in P-ONE

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P-ONE Virtual Collaboration meet  
December 15 2020  
Akanksha Katil

# Importance of detecting $\nu_\tau$

- $\nu_\tau$  not usually produced in the atmosphere. They exist only due to oscillations.
- Detecting  $\nu_\tau$  will:
  - Reaffirm the astrophysical origins of high energy neutrinos.
  - Confirm the existing model of neutrino oscillations on cosmological scales.
- $\nu_\tau$  detection should be regarded as priority by future detectors.
- 20%-40% of the total astrophysical flux is contributed by  $\nu_\tau$ .
- After 10 years of its construction, IceCube is on the verge of detecting the first  $\nu_\tau$  with 90% C.L.
- Three potential candidates for  $\nu_\tau$  events discovered so far.
- At high energies IceCube has no problem with detecting  $\nu_\tau$ . At lower energies, due to scattering, hard to separate  $\nu_\tau$  from background



Can P-ONE do better, given that there is less scattering in water?

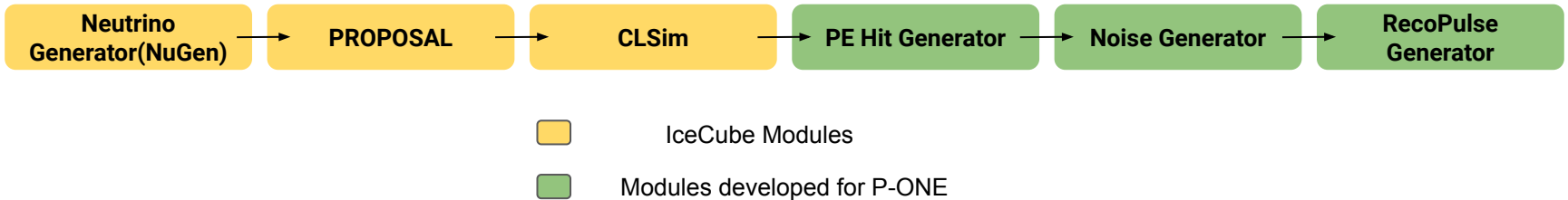
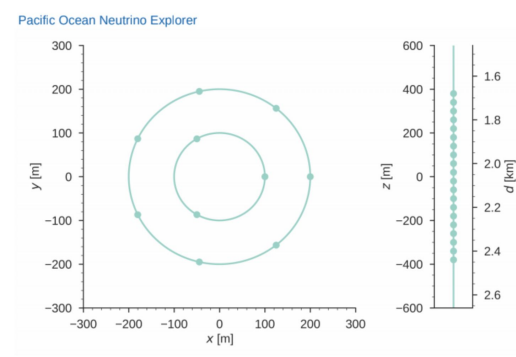
# Simulation

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01

# The Simulation Chain

- IceCube software for simulations. Uses Ice Tray framework.
- IceTray framework - modules written in C++ accessed by using Python interface
- Geometry of the detector changed to match that of P-ONE phase 1.



# Simulating mDOM

- Simulating IceCube mDOM, 24 3" PMTs and a flat angular acceptance.
- Angular acceptance of DOM depends on the PMT coverage area.

$$10 \times 3'' \text{PMT Area} \approx 10'' \text{PMT Area}$$

$$\Rightarrow \frac{mDOM \text{ area}}{IcecubeDOM \text{ area}} \approx 2.4$$

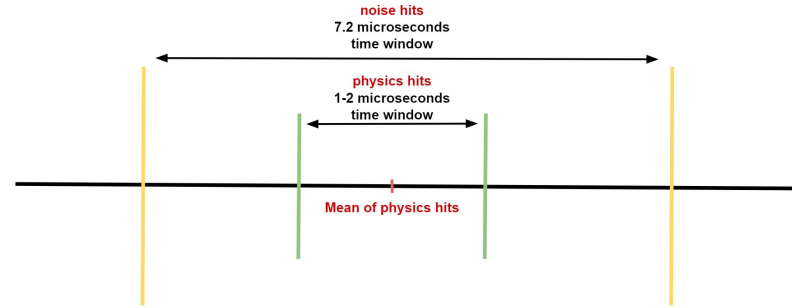
$$2.4 \times \sum_{\theta=-1}^1 f(\theta)_{IceCube \text{ Angular Acceptance}} = \sum_{\theta=-1}^1 mDOM \text{ Angular Acceptance}$$

- The angular acceptance is a constant value of 0.811
- The wavelength acceptance is set to be the same as IceCube's.



# MC parameters

- NuGen settings:
  - Energy: 100TeV to 5PeV
  - Azimuth: 0 to 180 degrees
  - Zenith: 0 to 180 degrees
  - Interaction Cylinder parameters:  $h=1000\text{m}$ ,  $r=500\text{m}$
- Signals assume an mDOM, but no granularity.
- Noise, STRAW data from dark runs, is injected on top of physics hits.
- RecoPulse Generator:
  - The PMT response is simulated here, hits within 3 ns are merged as one, and their charges summed.
  - The width of the pulse is chosen to be a constant, in this case, it is set to 3 ns.
  - 0-1.5 ns smear is added to the timestamps
- 40,000  $\nu_\tau$  and  $\nu_e$  events simulated in total





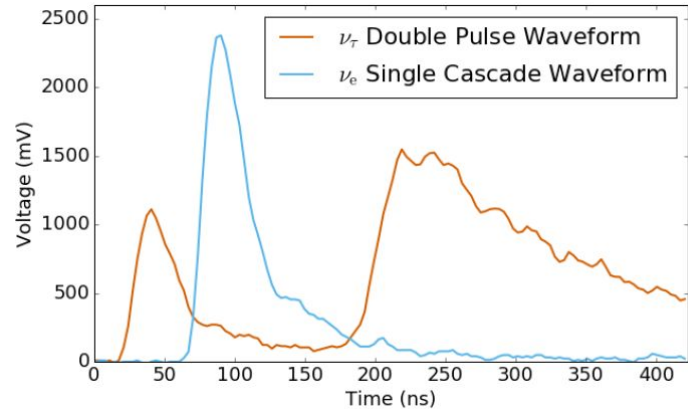
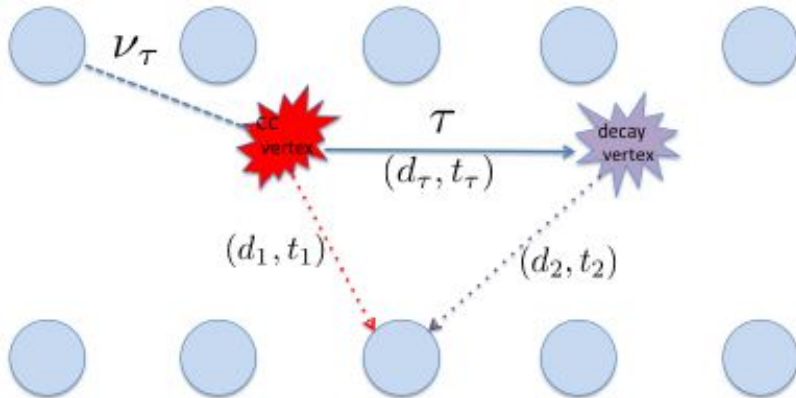
02

# Analysis



# The Goal of the Analysis

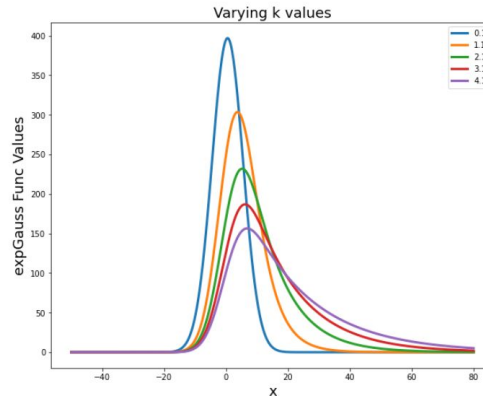
- $\nu_\tau$  CC interaction produces a characteristic signal called Double Pulse.
- Double Pulse - double cascades - 1) Tau creation 2) Tau Decay
- **Develop an algorithm that identifies tau neutrino signal from the background.**



# The Method

- The main background while detecting double peak signal is the CC interactions of electron neutrinos, NC interactions of neutrinos of all flavours and atmospheric muon neutrinos
- **The algorithm fits both a single exponential gaussian and double exponential gaussian to every DOM in the event.**
- Four parameters describe a single exponential gaussian - mean, width, amplitude and k(defines how exponential the tail is)
- Parameters of the fit and log likelihood values are used to separate  $\nu_\tau$  and background events.

$$f(x; \mu, \sigma, \lambda) = \frac{\lambda}{2} e^{\frac{\lambda}{2}(2\mu + \lambda\sigma^2 - 2x)} \operatorname{erfc}\left(\frac{\mu + \lambda\sigma^2 - x}{\sqrt{2}\sigma}\right)$$



The colours indicate the different k values

# The Algorithm

Number of hits in DOMs > 200

Select hits within 200 nanoseconds

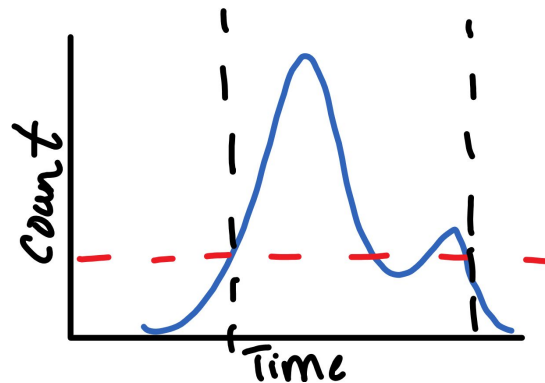
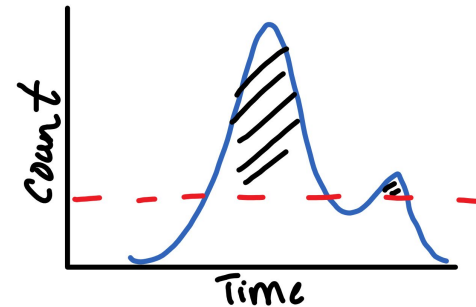
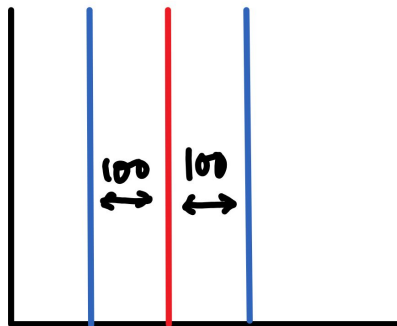
Histogram

Entries ratio = (entries in bins / max bin entry in a DOM)

Entries Ratio > 0.2

Bins between first-2 and first+2 bins entries ratio

Number of bins  $\geq$  10



# The Fit

- Used IMINUIT minimizer.
- The **minimizer minimizes the -log likelihood** value given by:

Ignored: Model independent ←  $\sum_i \ln(n_i!) + \mu_i - n_i \ln \mu_i$

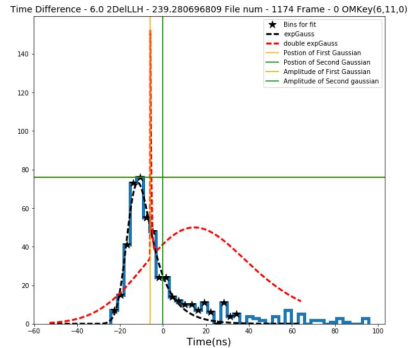
$\mu_i$  = model

$n_i$  = data (Number of hits in a bin)

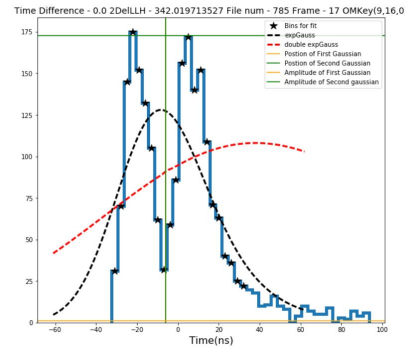
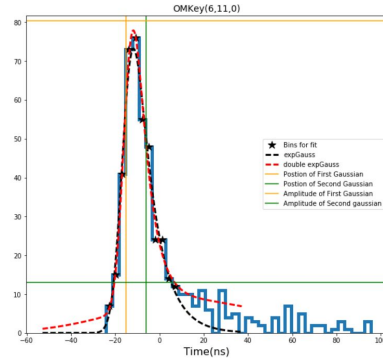
- Bounds and initial values given to the minimizer.

# Does the Algorithm work as expected?

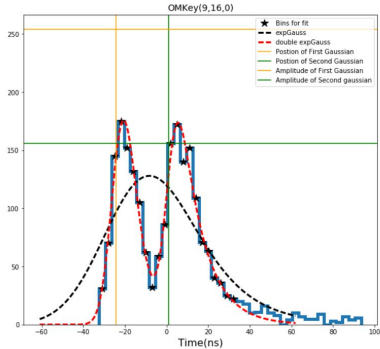
- Multiple checks were done to improve the algorithm by changing the bounds and initial values given to minimizer.
- Sensitive to initial values, looping over possible initial values.



Changing bounds



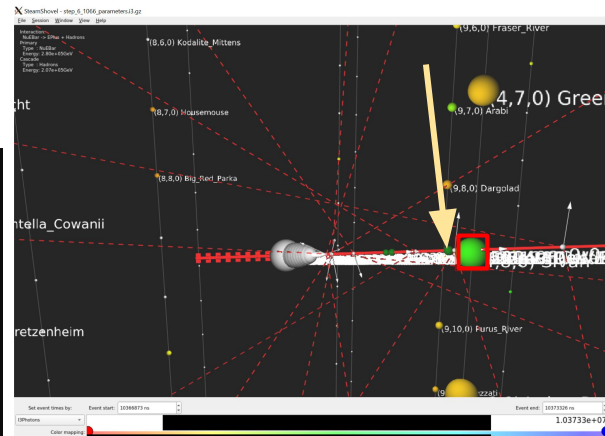
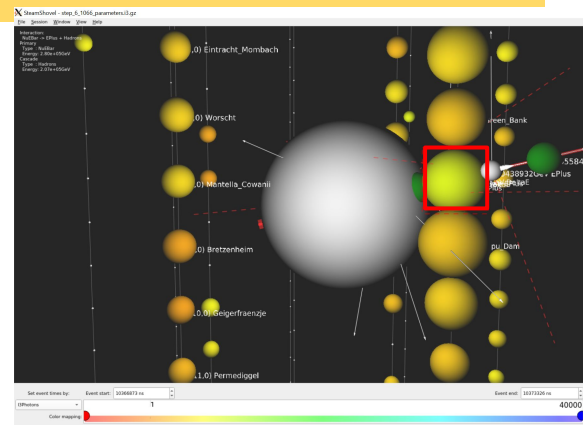
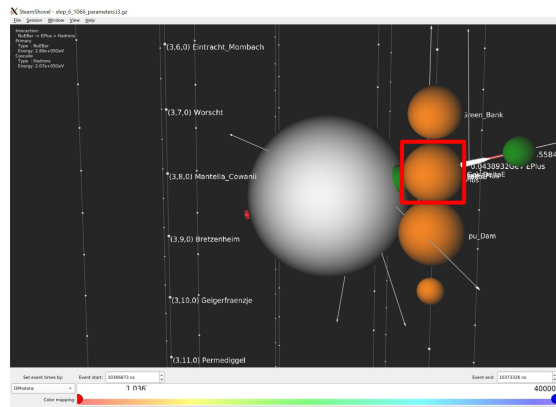
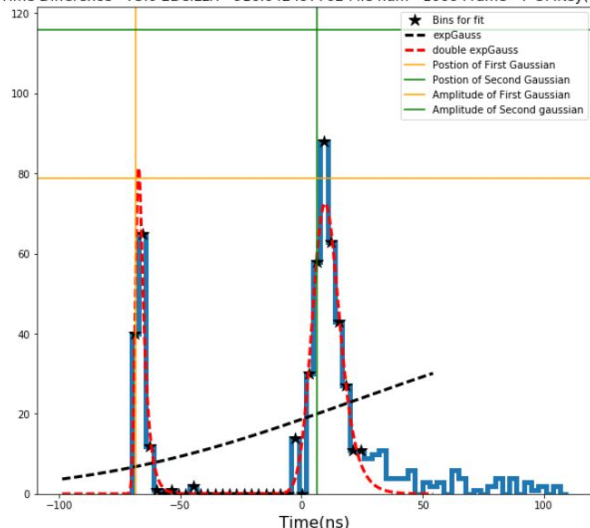
Changing Initial Values



Few examples of changing bounds and initial values to appropriate values to achieve a good fit

# Suspicious NuEs and NC events

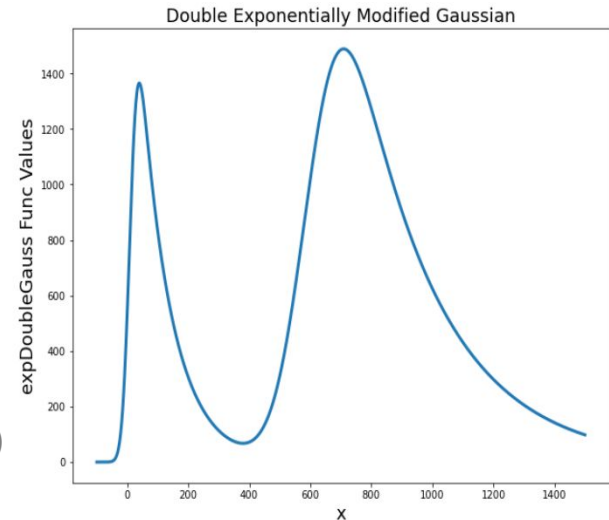
Time Difference - 75.0 2dELLH - 916.042497702 File num - 1066 Frame - 7 OMKey(4,8,0)



550	Hadrons	(-136.427m, -23.7625m, 10.0032m)	(104.066deg, 54.4047deg)	1.03671e+07ns	207044GeV	0m
561	MuPlus	(-136.427m, -23.7625m, 10.0032m)	(104.066deg, 54.4047deg)	1.03671e+07ns	56.9355GeV	227.179m
585	MuPlus	(-136.427m, -23.7625m, 10.0032m)	(104.066deg, 54.4047deg)	1.03671e+07ns	56.9355GeV	51.1243m
586	DeltaE	(-165.292m, -64.0876m, 22.4288m)	(104.066deg, 54.4047deg)	1.03673e+07ns	0.890161GeV	0m
587	MuPlus	(-165.292m, -64.0876m, 22.4288m)	(104.066deg, 54.4047deg)	1.03673e+07ns	44.5932GeV	21.6877m
588	DeltaE	(-177.537m, -81.1941m, 27.7m)	(104.066deg, 54.4047deg)	1.03674e+07ns	4.7113GeV	0m
589	MuPlus	(-177.537m, -81.1941m, 27.7m)	(104.066deg, 54.4047deg)	1.03674e+07ns	35.0553GeV	5.9981m
590	DeltaE	(-180.923m, -85.9252m, 29.1578m)	(104.066deg, 54.4047deg)	1.03674e+07ns	0.509406GeV	0m
591	MuPlus	(-180.923m, -85.9252m, 29.1578m)	(104.066deg, 54.4047deg)	1.03674e+07ns	33.1886GeV	50.916m
592	DeltaE	(-209.671m, -126.086m, 41.5328m)	(104.066deg, 54.4047deg)	1.03676e+07ns	0.605584GeV	0m
593	MuPlus	(-209.671m, -126.086m, 41.5328m)	(104.066deg, 54.4047deg)	1.03676e+07ns	21.2607GeV	97.4524m
594	EPlus	(-264.693m, -202.953m, 65.2184m)	(88.5481deg, 307.068deg)	1.03695e+07ns	0.0203435GeV	0m
595	NuE	(-264.693m, -202.953m, 65.2184m)	(17.3608deg, 90.5706deg)	1.03695e+07ns	0.0424134GeV	0m
596	NuMuBar	(-264.693m, -202.953m, 65.2184m)	(162.862deg, 163.611deg)	1.03695e+07ns	0.0429015GeV	0m

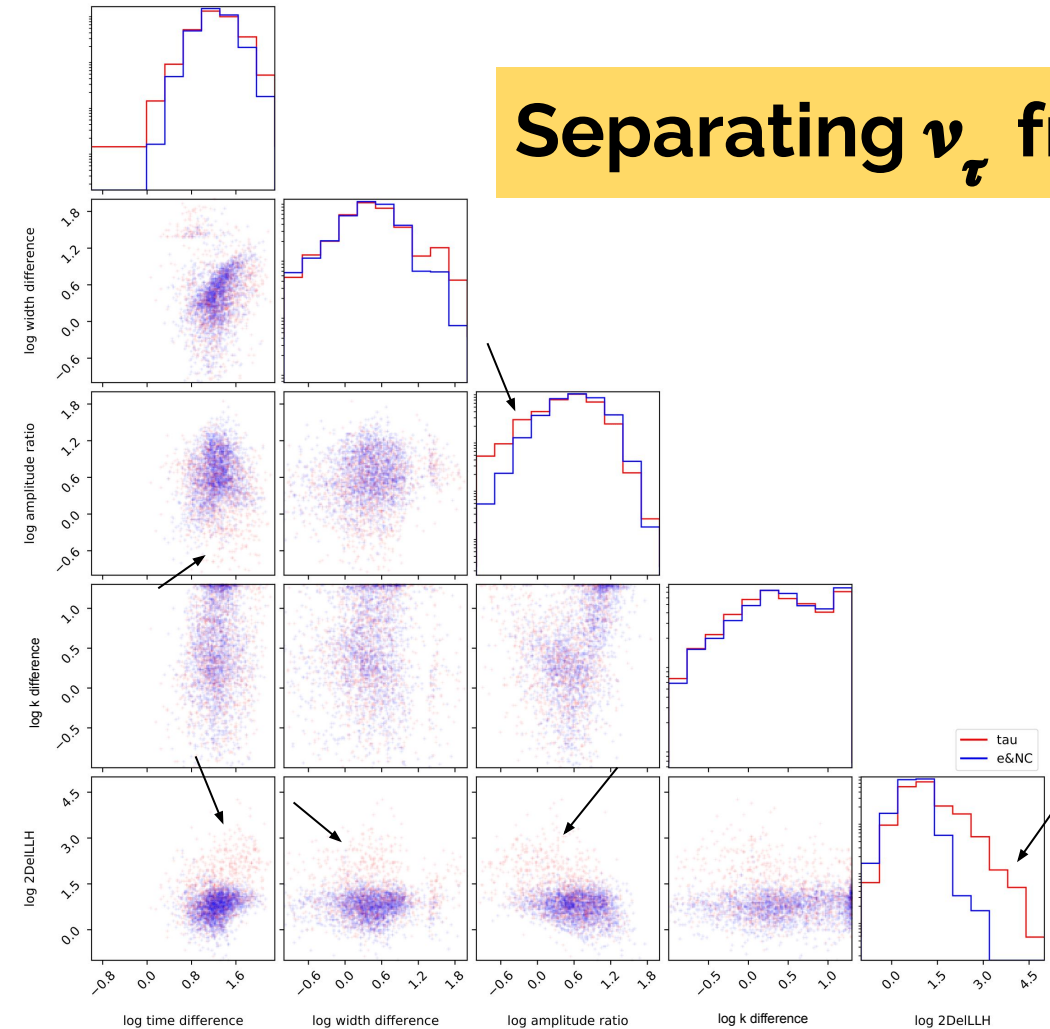
# Parameters for Comparison

- The algorithm returns the mean, width, amplitude and k values of the fits.
- A double exponential gaussian has 8 parameters(double expGauss = expGauss<sub>1</sub> + expGauss<sub>2</sub>)
- Time Difference = position<sub>2</sub> - position<sub>1</sub>
- Width Difference = |width<sub>2</sub> - width<sub>1</sub>|
- Amplitude Ratio = amplitude<sub>1</sub>/amplitude<sub>2</sub>
- k difference = |k<sub>2</sub> - k<sub>1</sub>|
- LLH difference =  $2*(LLH_{\text{double expGauss}} - LLH_{\text{expGauss}})$ 
  - Defines how likely the double expGauss model is the correct fit.



# Separating $\nu_\tau$ from the background

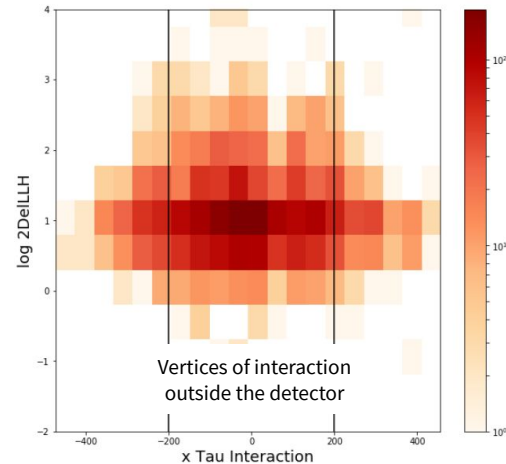
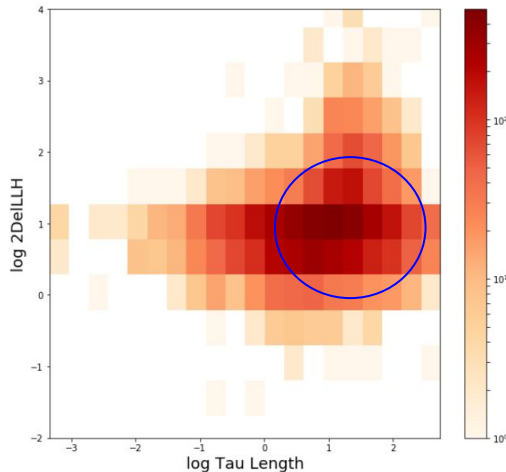
- Some separation in log amplitude ratio.
- Most separation observed in log  $2\Delta_{LLH}$ .
- Introducing cuts in the data using  $\log 2\Delta_{LLH}(\text{CUT VARIABLE})$  values will be most effective.





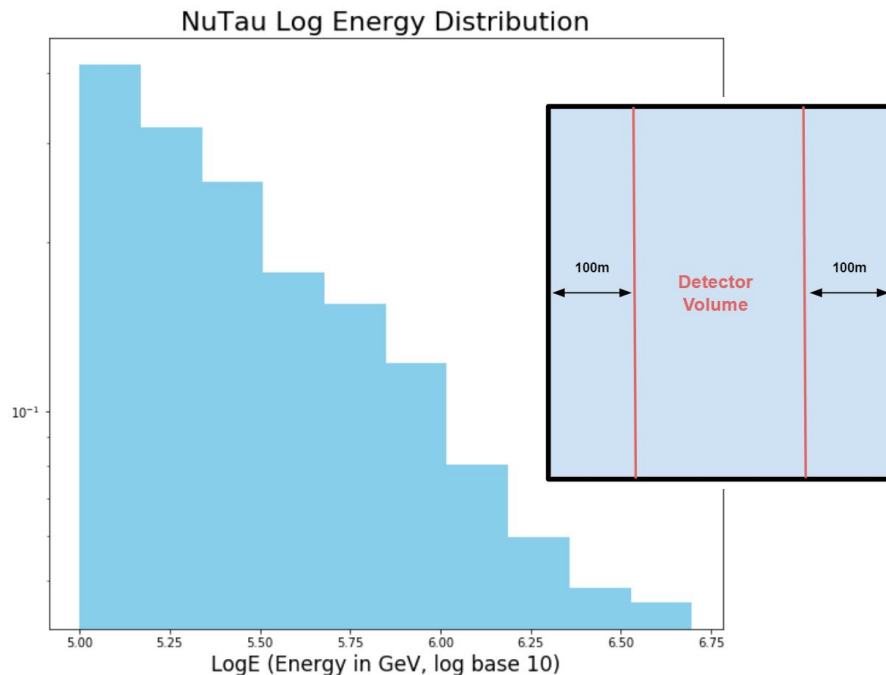
# Tau length Correlation

- Ideally large tau length would mean large cut variable value .
- What happens with DOMs with large tau length and small cut variable?
  - Vertices(Tau creation and tau decay) are outside the detector.
  - Tau decays into a muon
  - DOM is not at an ideal distance from the vertices.



# Weighting Events

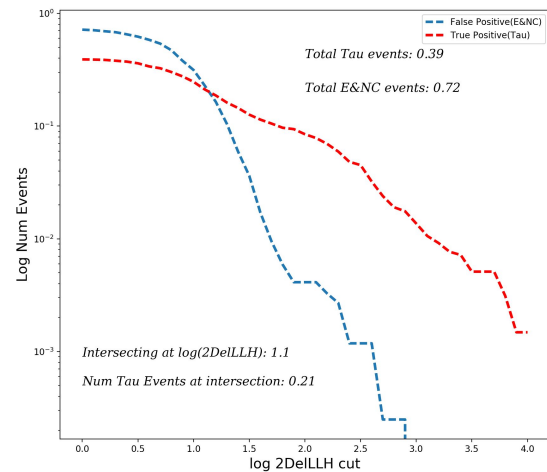
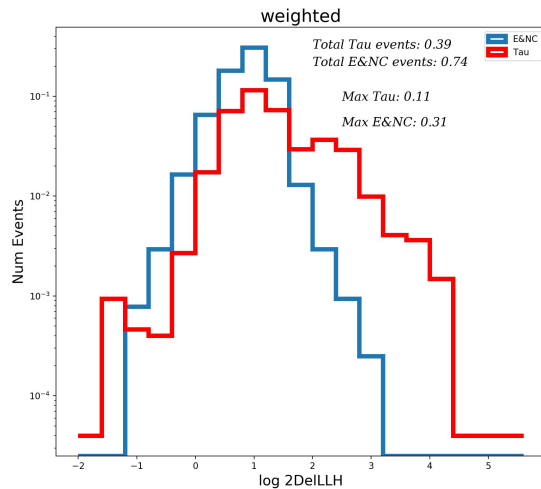
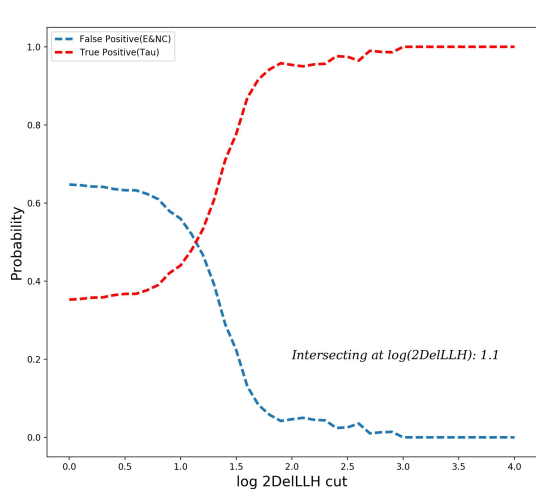
- Each event has a corresponding weight associated with it.
- For the analysis here the events are weighted to include:
  - Signal from astrophysical  $\nu_\tau$
  - Background from atmospheric muon neutrinos and other flavours of astrophysical neutrinos
- Desired  $\nu_\tau$  events:
  - Charged Current interactions.
  - Interaction vertex should be within 100m around the detector volume in X and Y axis.



**Expected CC  $\nu_\tau$  events per year: 1.68**

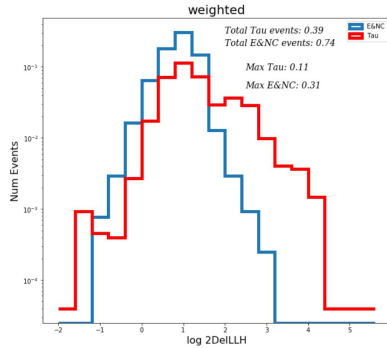
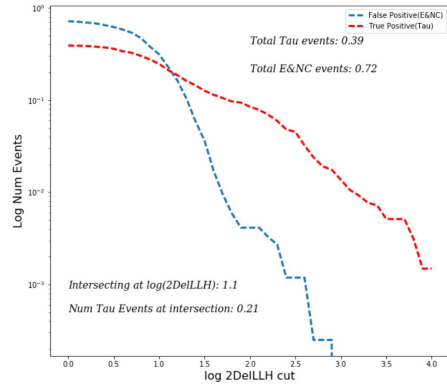
# Separating signal from background

- At cut variable 1.1 there is equal probability of the event being either a  $\nu_\tau$  or background event
- Total  $\nu_\tau$  events in a year is 0.39. Can this number be improved?

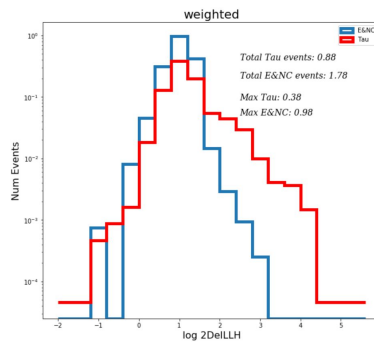
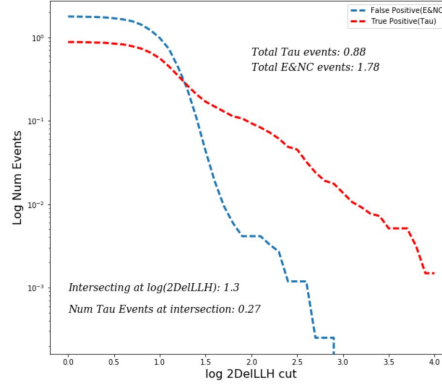


# Improving the Number of $\nu_\tau$ events/year

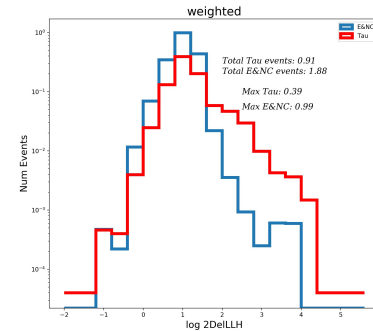
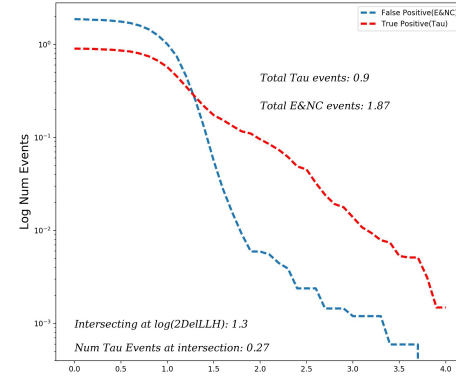
Number of hits in DOMs >  
**200**



Number of hits in DOMs > **0**



Number of bins >= **9**



The intersection point moves to the right as the number of events included in the analysis increases.

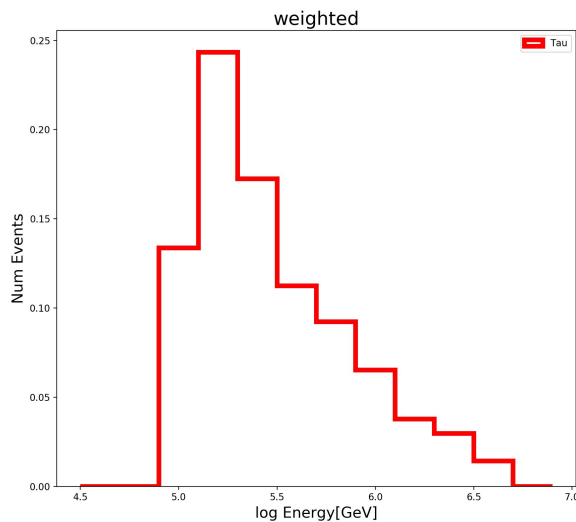
# Improving the Number of $\nu_\tau$ events / year

Conditions Changed	Total NuE&NC Events	Total NuTau Events	Intersection Point	Tau Neutrino Events at Intersection Point
Number of hits in DOMs > 200	0.72	0.39	1.1	0.21
Number of hits in DOMs > 100	1.11	0.59	1.3	0.22
Number of hits in DOMs > 0	1.78	0.88	1.3	0.27
Number of bins >= 9	1.87	0.9	1.3	0.27
Entries Ratio > 0.1	2.1	0.97	1.5	0.28

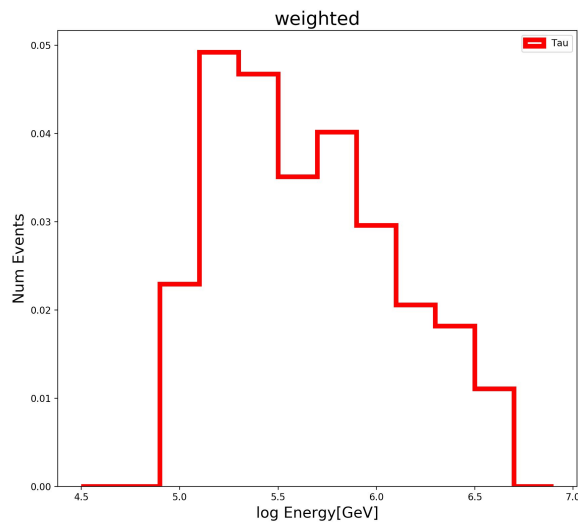
# Energy Distributions - Tau neutrino events

- The energy distribution shifts to the right as higher cut variable is imposed.

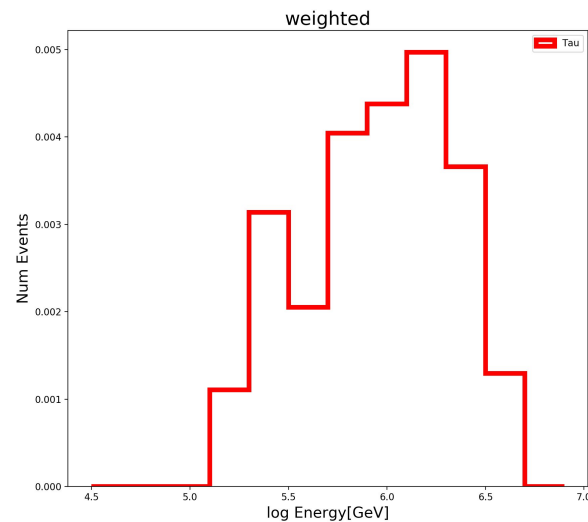
Cut Variable = 0



Cut Variable = 1.3



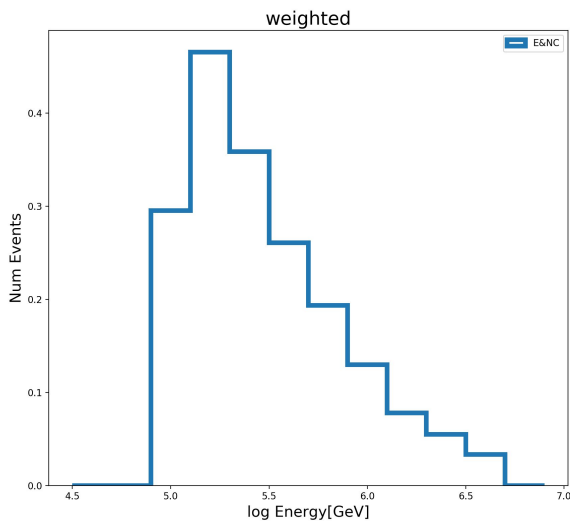
Cut Variable = 3.0



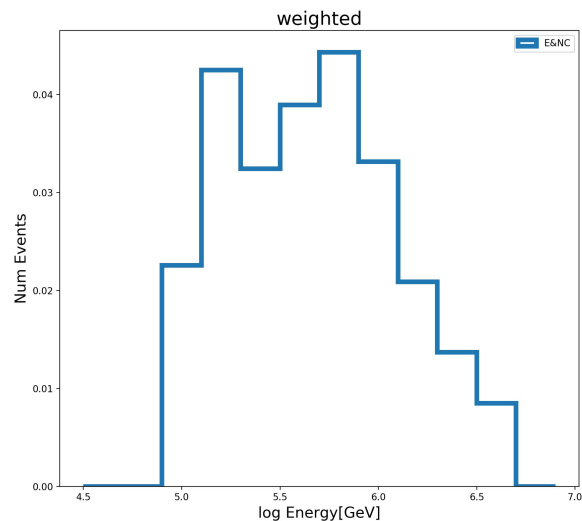
# Energy Distribution - NuE&NC events

- The energy distribution shifts to the right as higher cut variable is imposed.

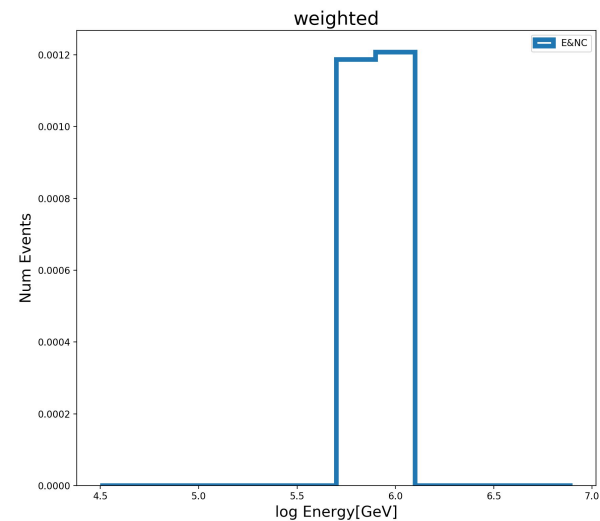
Cut Variable = 0



Cut Variable = 1.3



Cut Variable = 3.0



# Conclusions and Next Steps

- The algorithm is successful in separating  $\nu_\tau$  from the background.
- LLH ratio between single/double ExpGauss fits is the most effective parameter that shows a clear separation between tau neutrino and background.
- $\sim 1$   $\nu_\tau$  events expected in a year if the algorithm is capable of identifying all  $\nu_\tau$  from the background.
- $\sim 0.3$  tau neutrino events with cut variable  $> 1.3$  are detected in a year in P-ONE.
- The Algorithm can be further improved by having finer binning. The binning currently is motivated by icecube-type time resolution.
- Lower energies can be simulated to increase the number of  $\nu_\tau$  events detected.
- Parameters other than  $2\Delta LLH$  can be explored to see more separation.
- DOMs with large number of hits ( $\sim > 50,000$ ) can be eliminated from the analysis.
- Machine learning to enhance the separation between tau neutrinos and the background.



# **Thank You**

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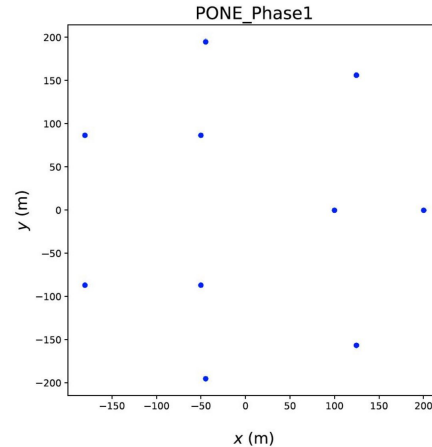
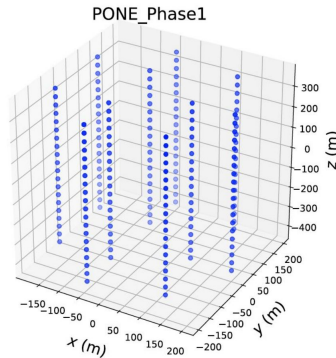
**Any Questions?**

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# Backup

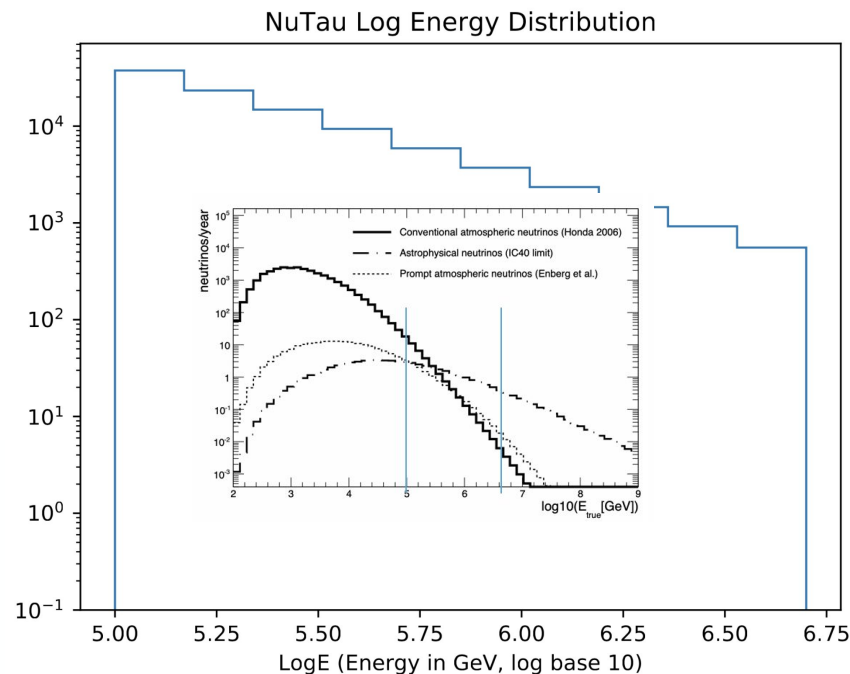
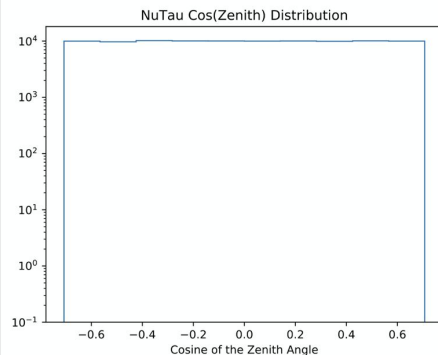
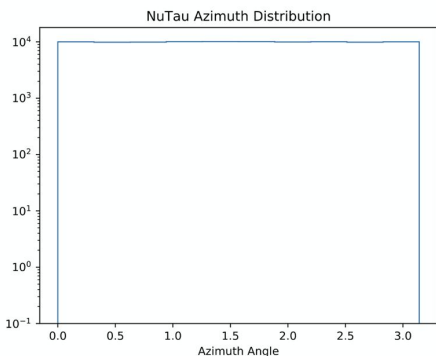
# GCD File

- Before starting the simulation the Geometry(G), Calibration(C) and Detector(D) status information should be updated accordingly to match P-ONE.
- A new GCD file generated.
- Calibration and Detector Status information is irrelevant for P-ONE



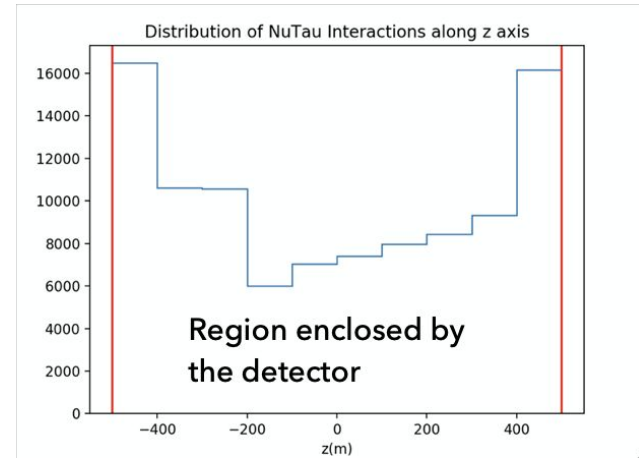
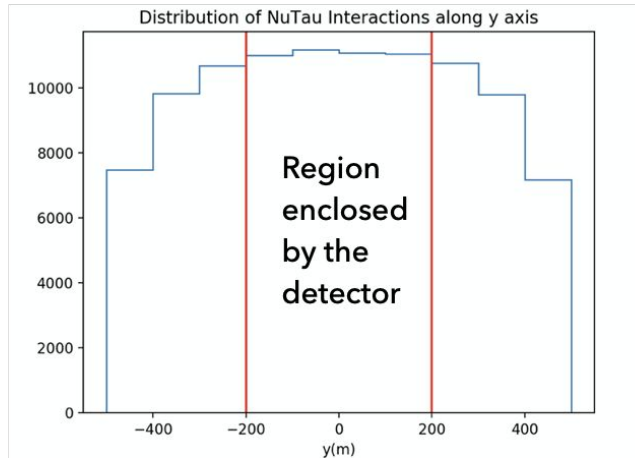
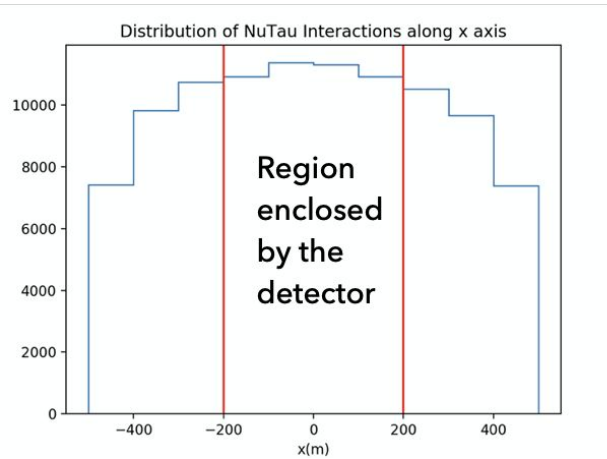
# Neutrino Distributions

- Energy range given to the simulation is 100TeV - 5PeV
- Energy distribution looks as expected.
- Simulating events between Zenith(-45, 45) and Azimuth(0, 180), no bias observed.



# Vertex of Interaction of Neutrinos

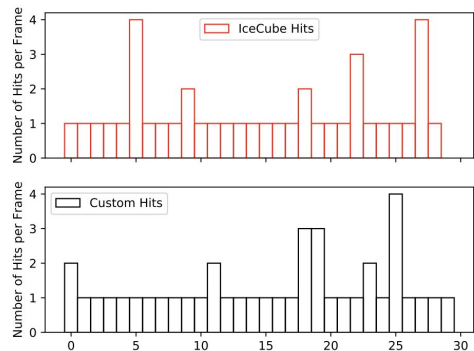
Distributions of interactions of neutrinos to produce corresponding lepton



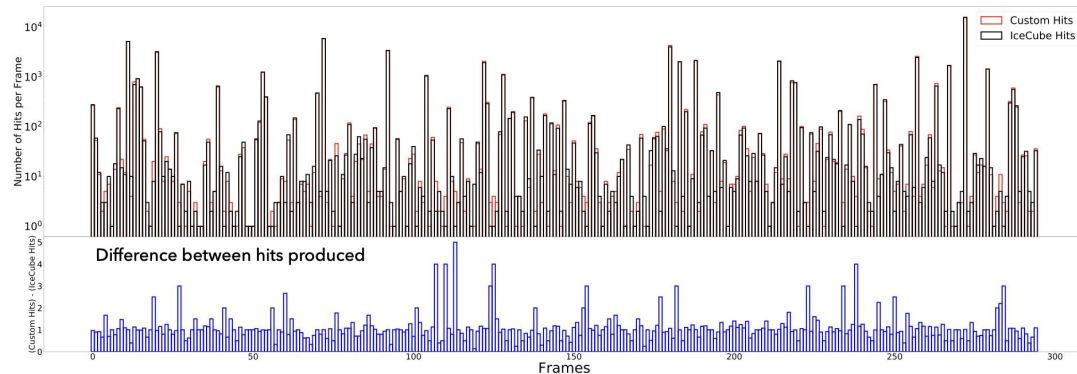
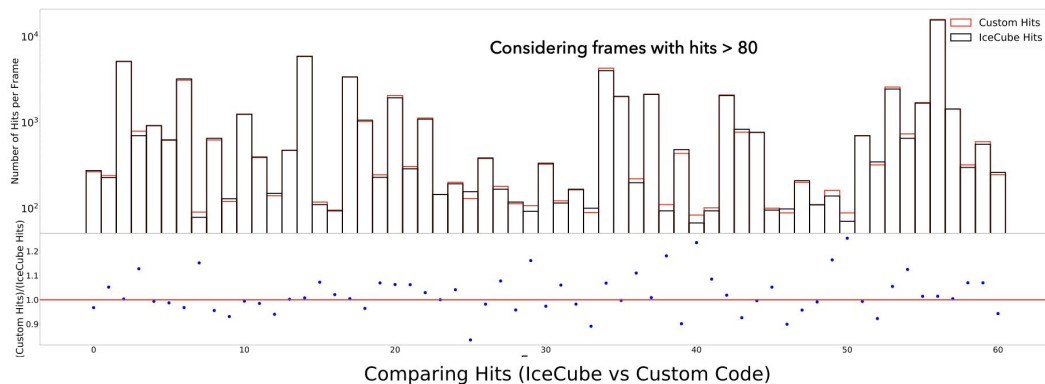
The dimensions of interaction cylinder given - Radius - 500m, height - 1000m, centered at  $(0, 0, 0)$

# Comparing Hits

- Frames with hits  $> 80$  are closer to one as expected.
- The frames need enough statistics to get ratio closer to one.
- Number of hits from frames not common to output files from both

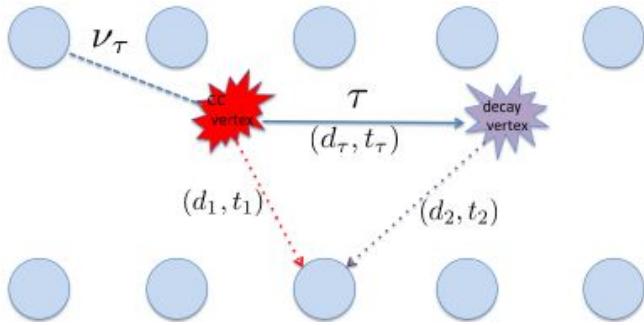


Comparing Hits (IceCube vs Custom Code)

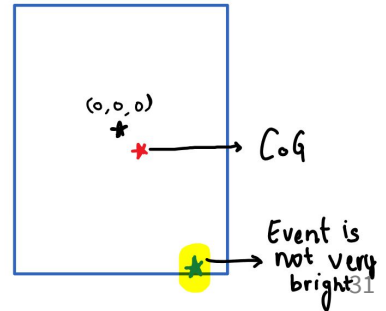
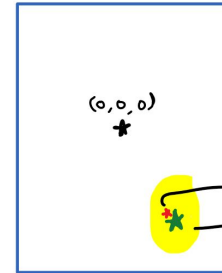
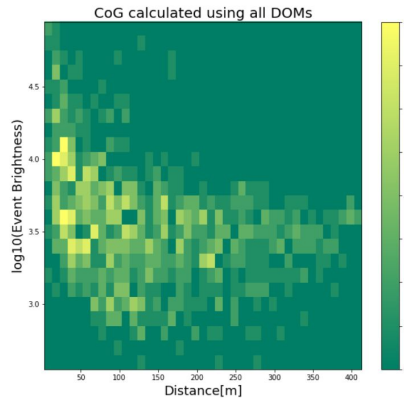


# CoG

- Identify DOMs with double pulse signature relative to Centre of Gravity(CoG) of hits?
- Selected DOMs using time difference method. However most doms only have a single peak.
- Minimum distance between DOM and CoG does not show much correlation.



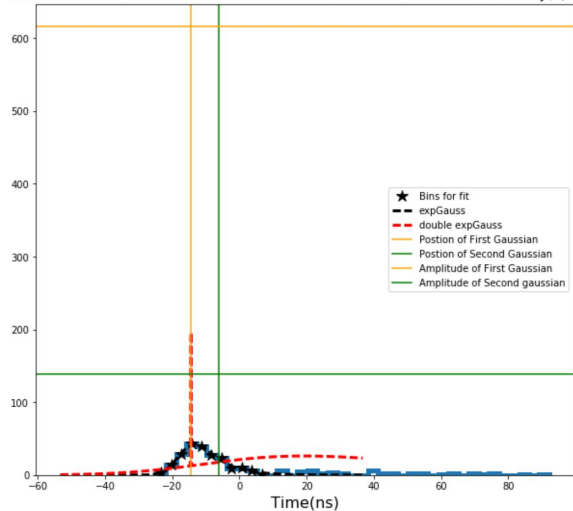
Time Difference =  $t_2 - t_1$



# Bounds and Initial Values of the Fit

- Width needs to be negative, to change the direction of the exponential tail. However, the caveat here is that the minimizer outputs a NaN once it starts considering width values between  $(-0.999, 0.999)$

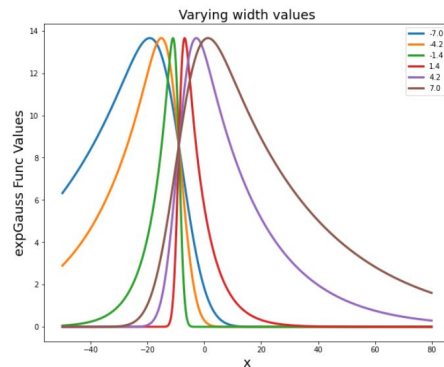
Time Difference - 8.0 2DelLLH - 124.455775748 File num - 63 Frame - 7 OMKey(1,18,0)



pos1	wid1	k1	amp1	pos2	wid2	k2	amp2	log likelihood
-14.4044	-0.0734752	0.134472	237.057	-5.96877	18.3955	6.09133	248.598	nan

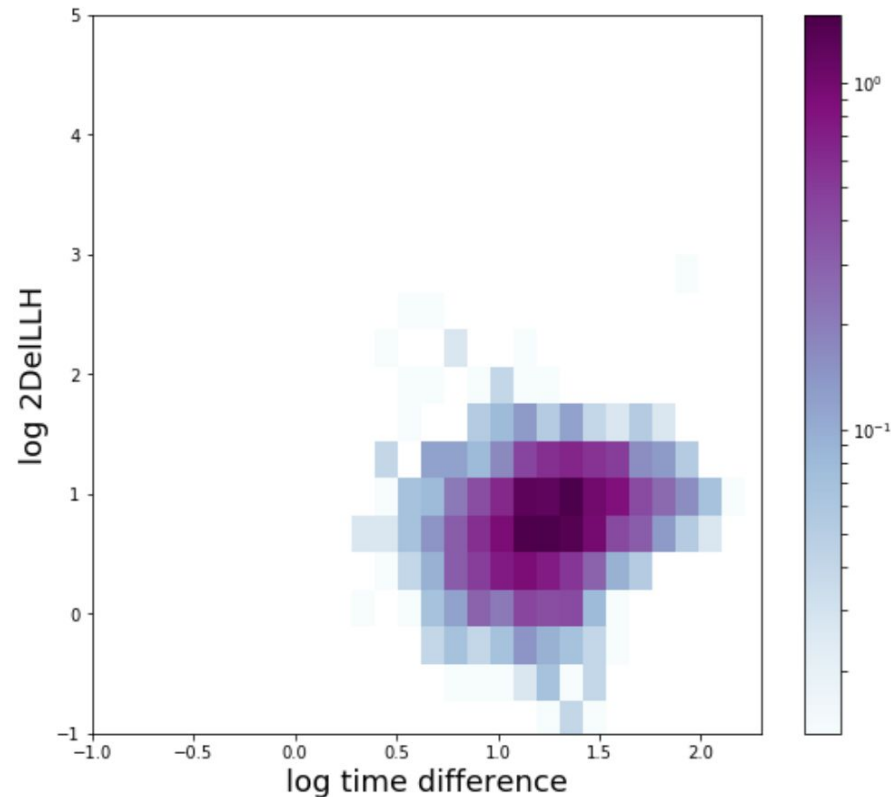
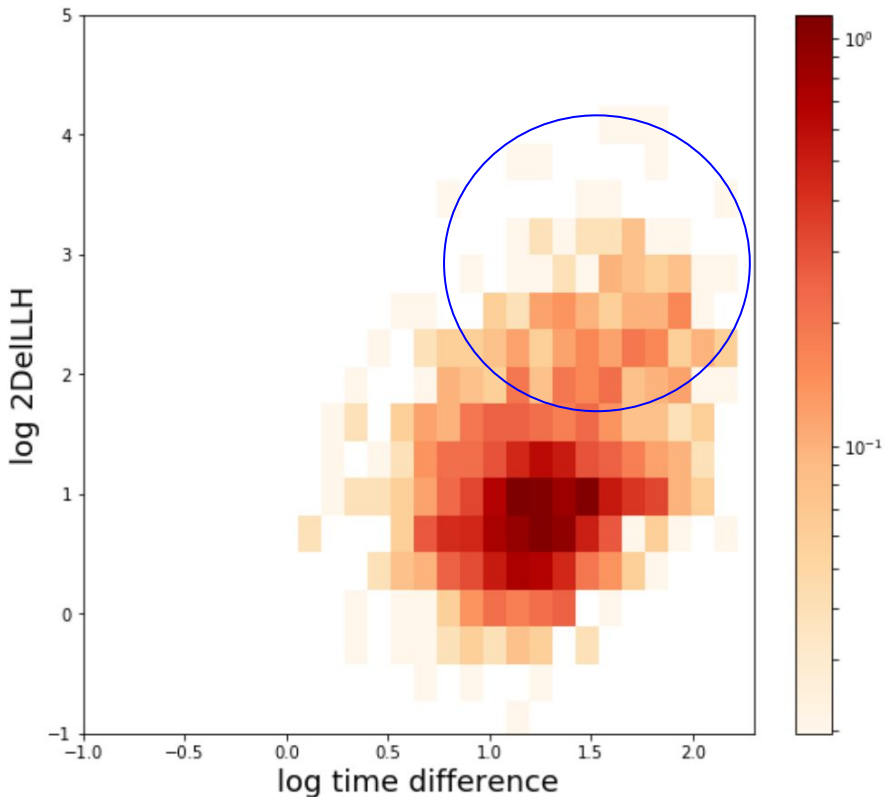
pos1	wid1	k1	amp1	pos2	wid2	k2	amp2	log likelihood
-14.3644	-0.05513	0.427769	638.78	-5.99934	23.245	1.34232	74.7544	nan

- The same with  $k$ , values should be between  $(0, 0.99)$ .

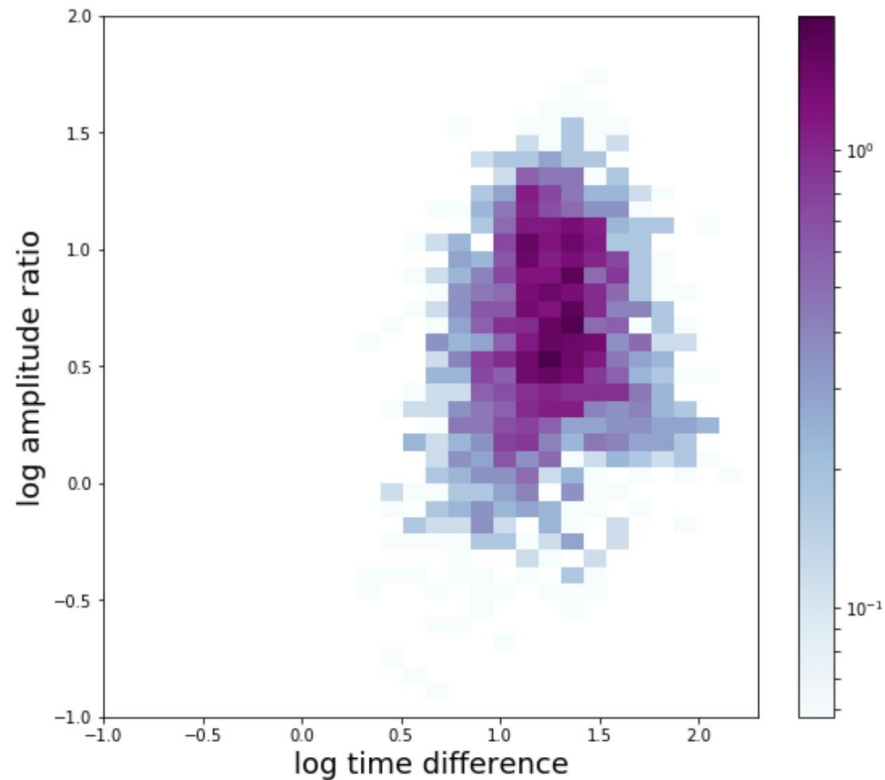
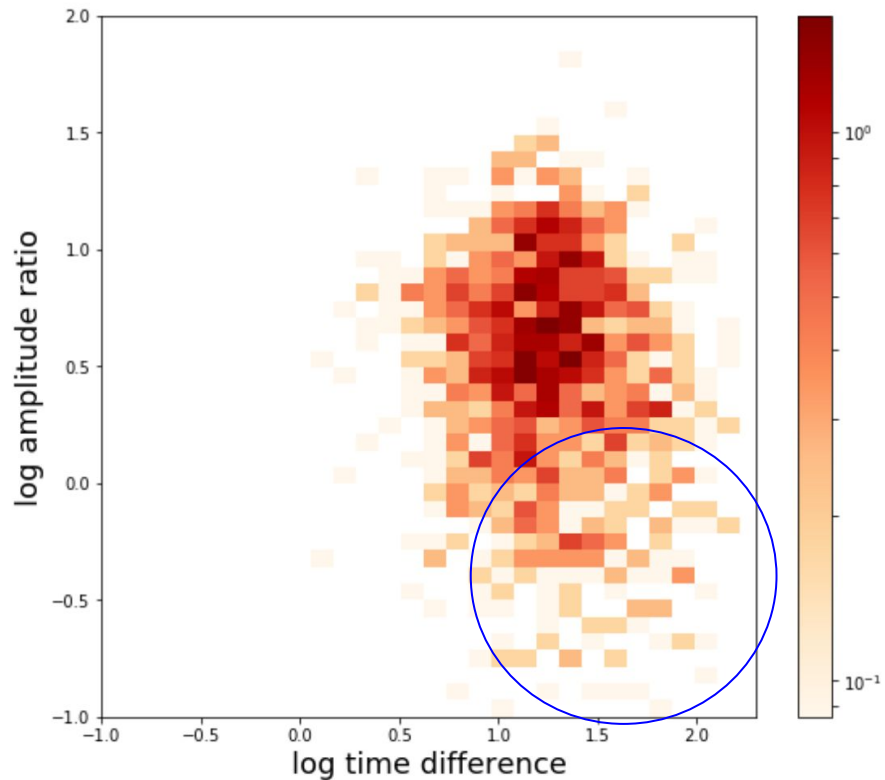




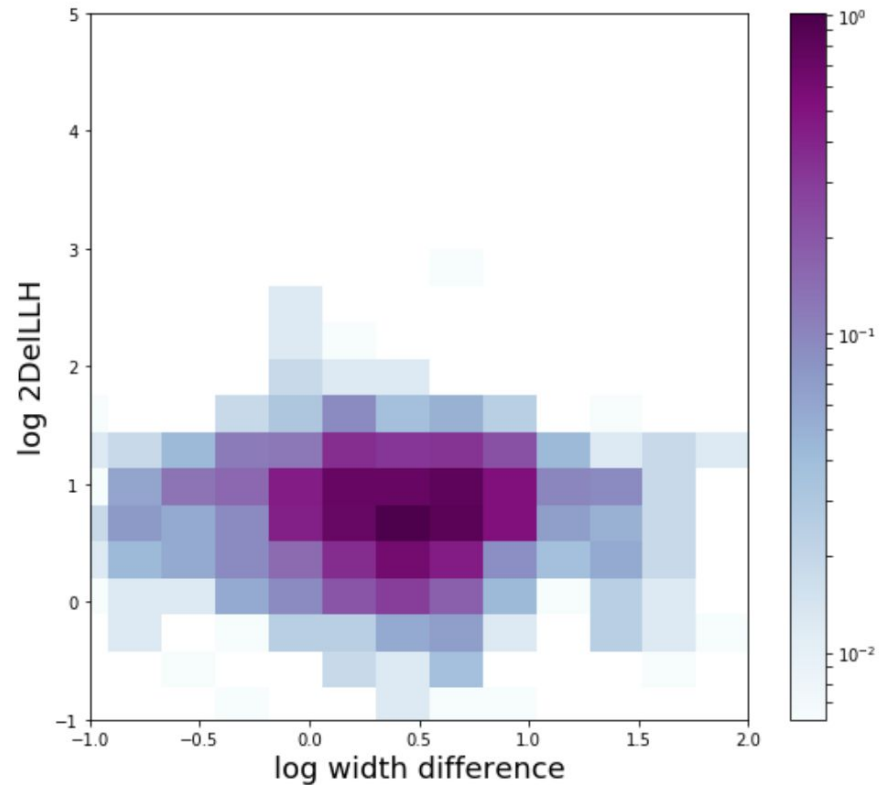
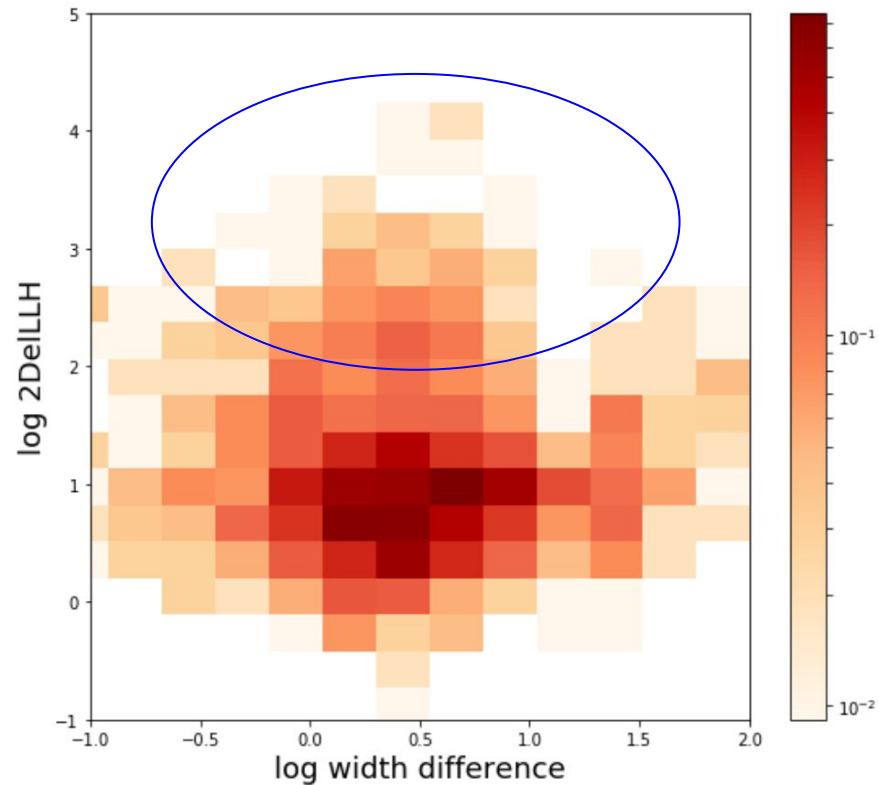
# Hist 2Ds for Exponential gaussian fits



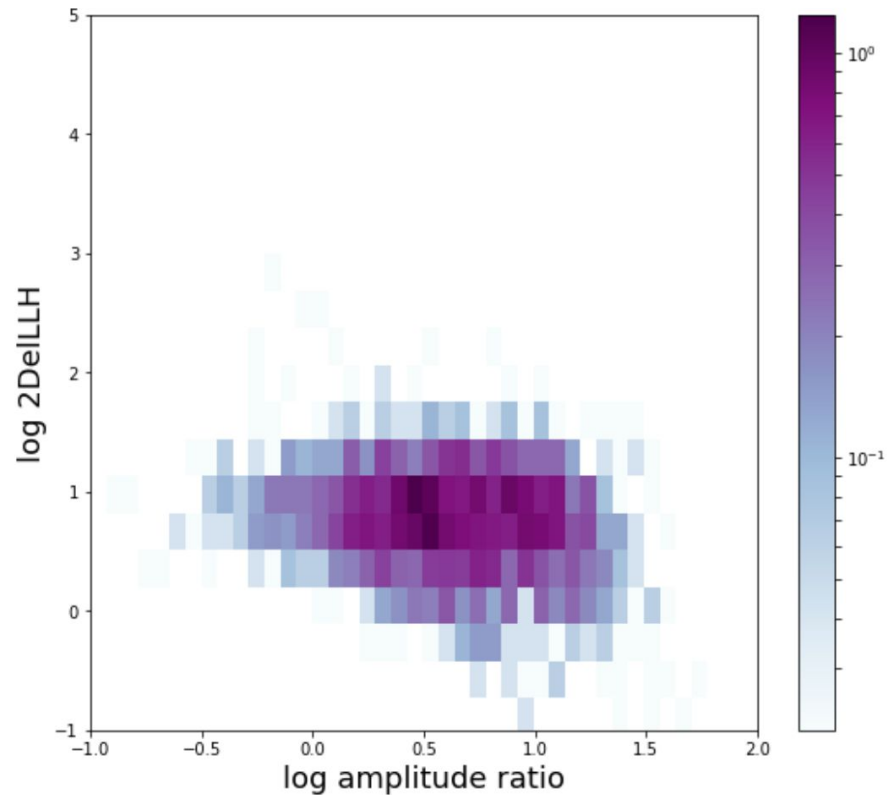
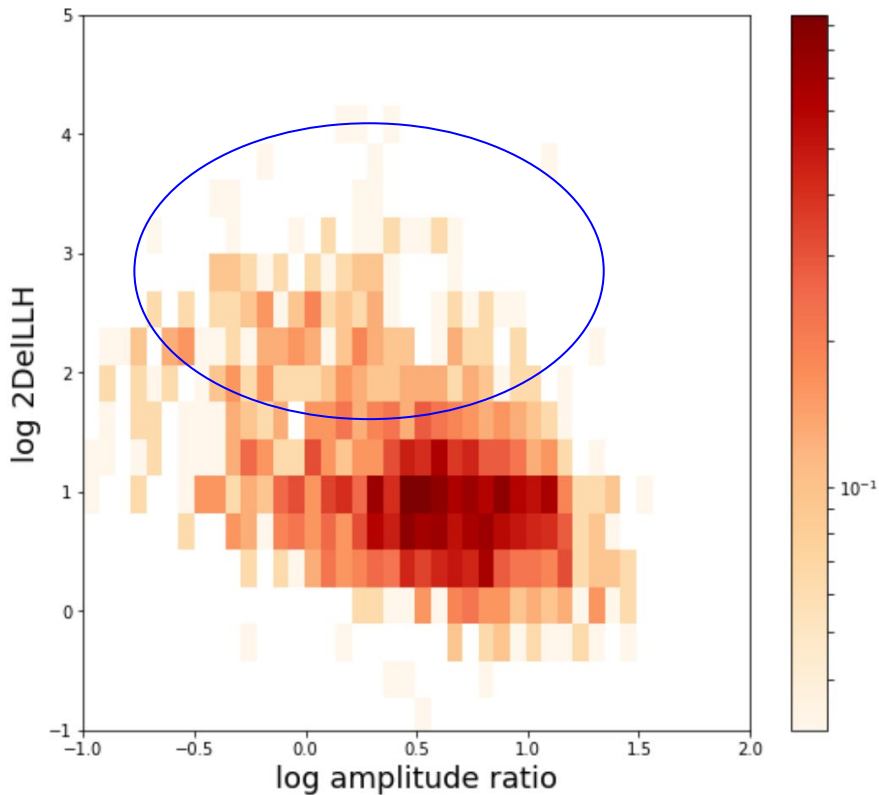
# Hist 2Ds for Exponential gaussian fits



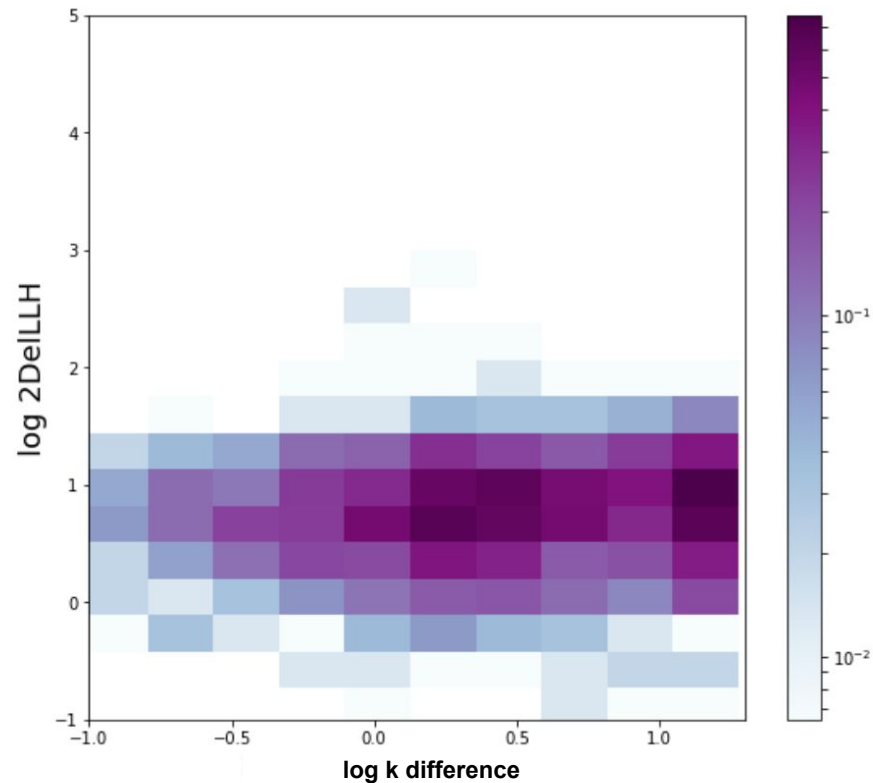
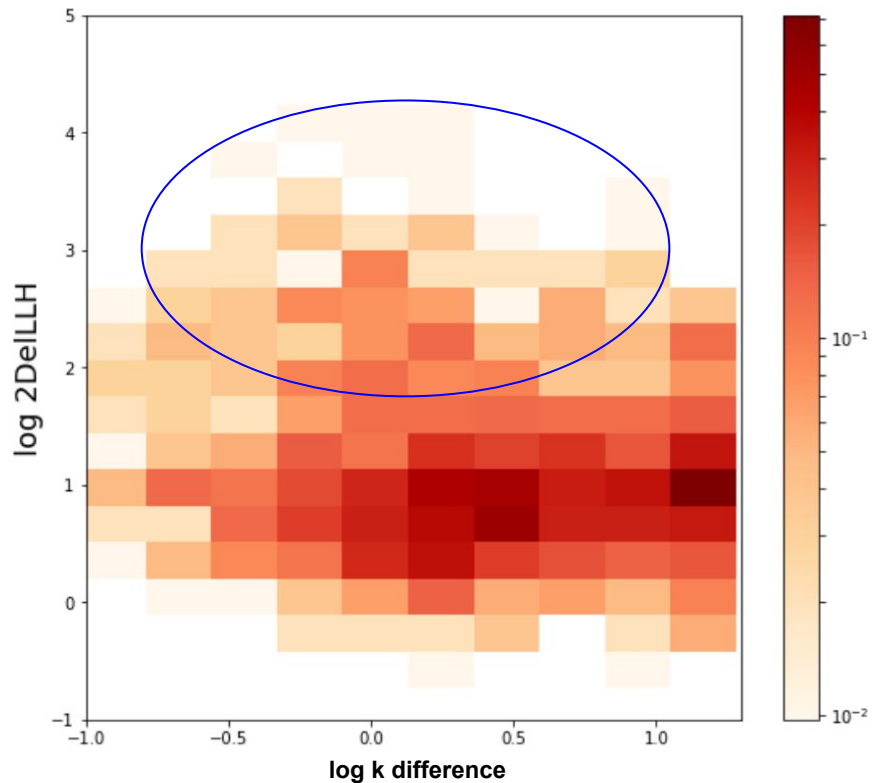
# Hist 2Ds for Exponential gaussian fits



# Hist 2Ds for Exponential gaussian fits



# Hist 2Ds for Exponential gaussian fits



# Weighting Events

$$weight_{CC} = \frac{\phi_{astro} \times OneWeight}{N/4}$$

$$weight_{NC,\nu_\mu} = \frac{(3\phi_{astro} + \phi_{atmo,\nu_\mu}) \times OneWeight}{N/2}$$

$$weight_{NC,\bar{\nu}_\mu} = \frac{(3\phi_{astro} + \phi_{atmo,\bar{\nu}_\mu}) \times OneWeight}{N/2}$$

$N$  = Number of files

$OneWeight$  = Taken from I3MCWeight

$$\frac{d\Phi_{\nu+\bar{\nu}}}{dE} = (1.01 \pm_{0.23}^{0.26}) \left( \frac{E}{100 \text{ TeV}} \right)^{-2.19 \pm 0.10} \cdot 10^{-18} \text{ GeV}^{-1} \text{ cm}^{-2} \text{ s}^{-1} \text{ sr}^{-1}.$$

# Time Difference

