

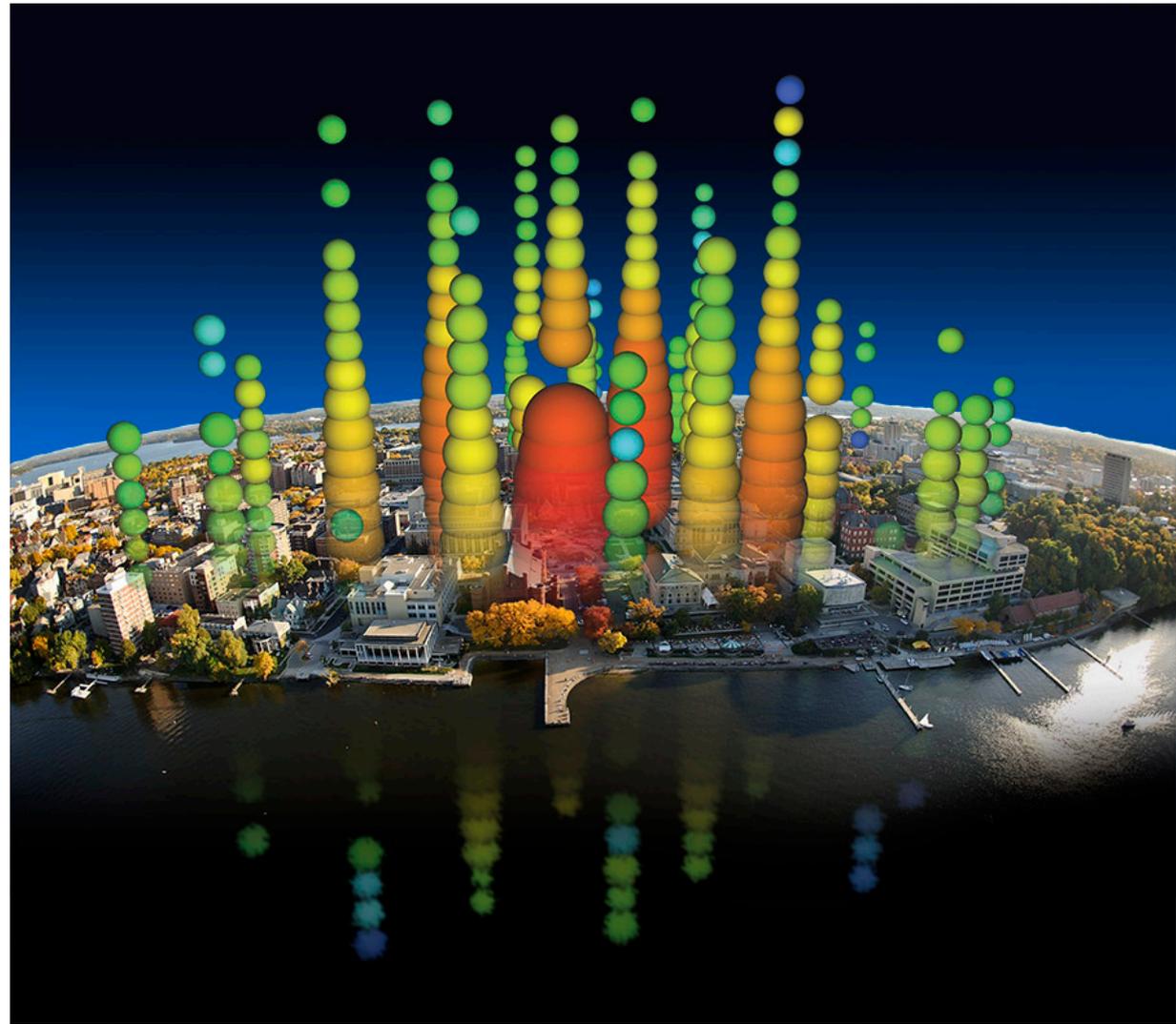
# Improving angular resolution in IceCube cascades

Tianlu Yuan

The IceCube collaboration

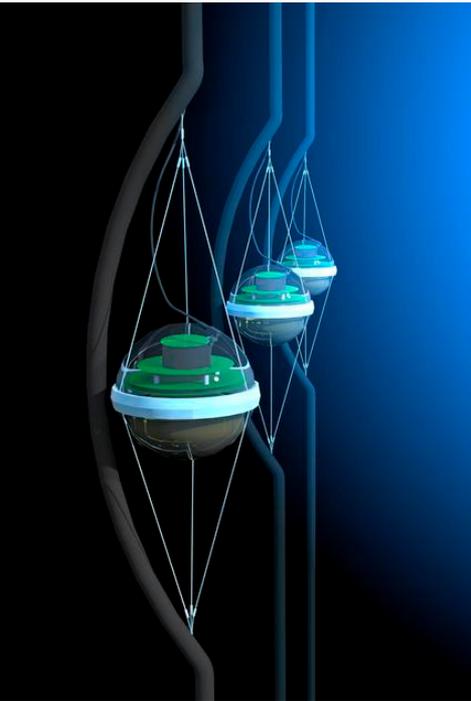
TeVPA, 8 Aug 2017

Columbus, OH, USA



# IceCube

Over 5000 deployed Digital Optical Modules (DOMs) on 86 strings



Vertical PMT spacing

17m

7m in DeepCore

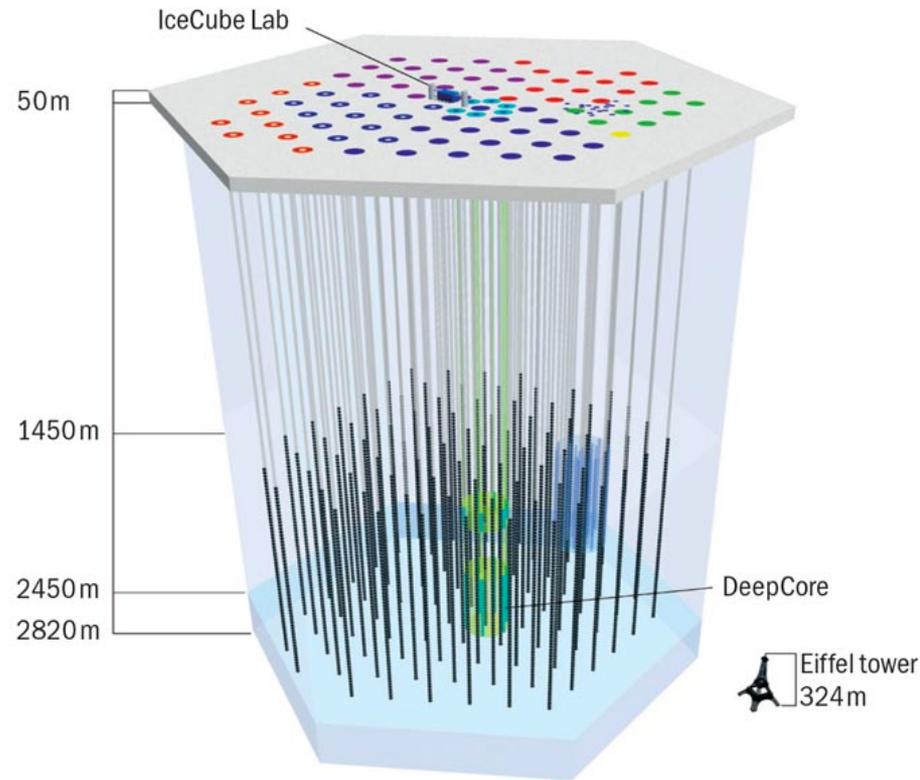
String spacing

125m

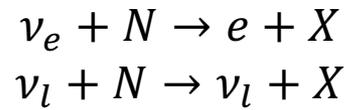
45-70m in DeepCore

Energy range

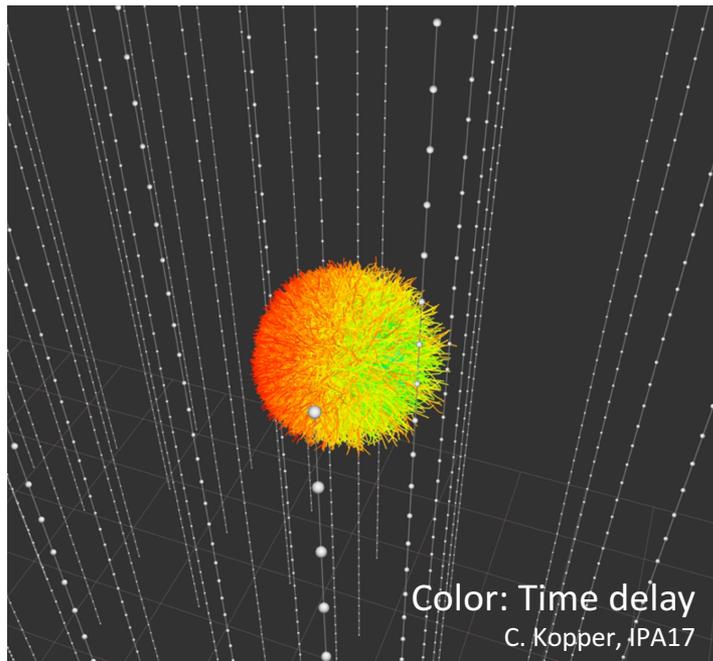
10 GeV—10 PeV



# Cascades in IceCube



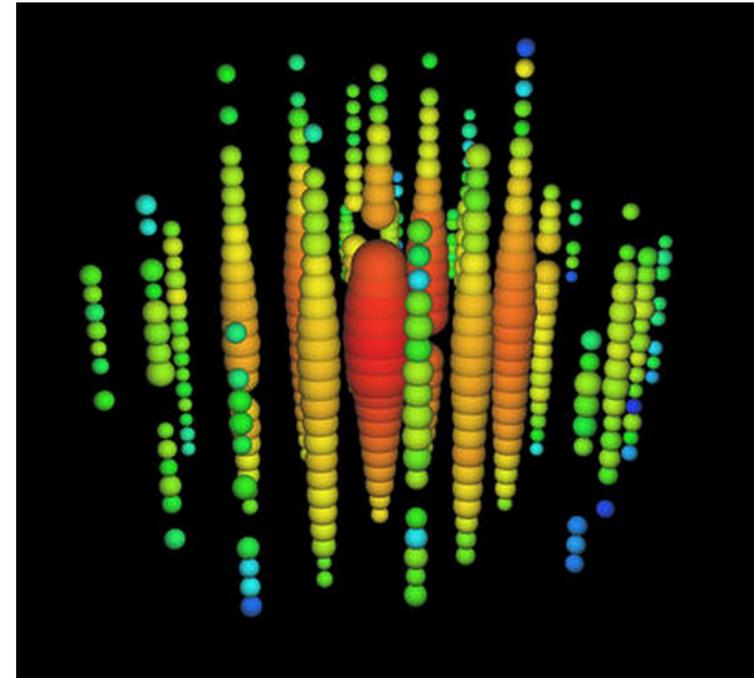
Hadronic or EM shower from  
neutral-current or  $\nu_e$  charge-  
current



Simulated photons

Asymmetry in  
photon emission  
allows for  
directional  
reconstruction

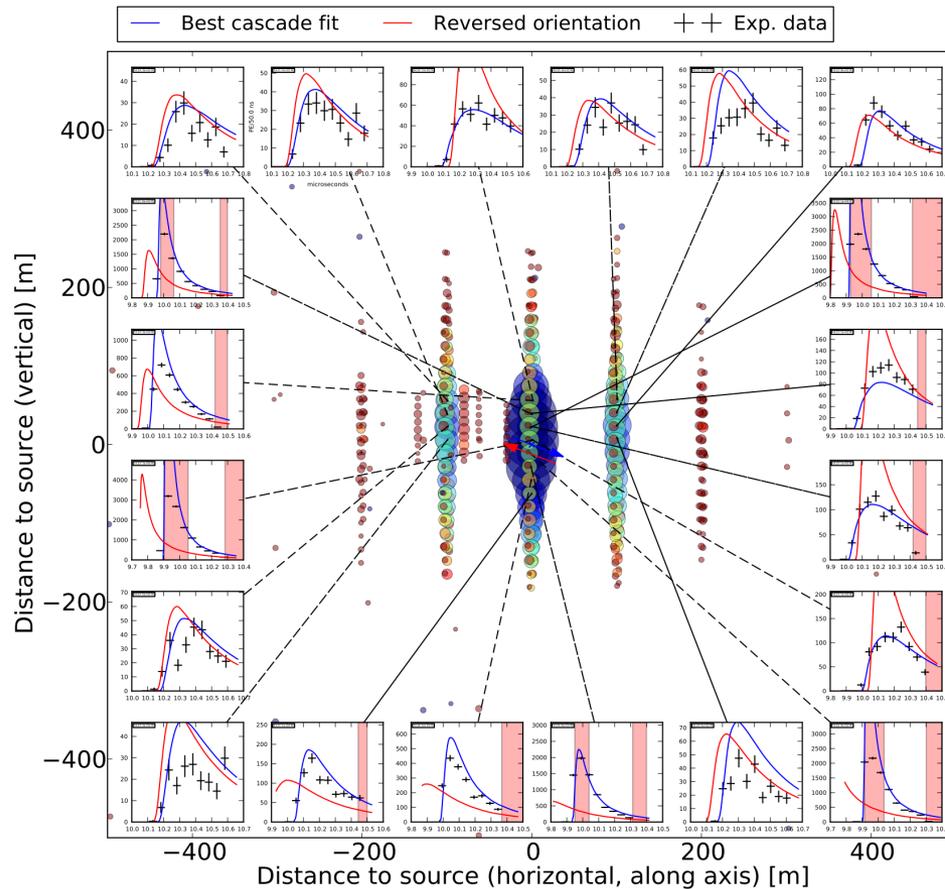
Information loss



Detected photons

# Waveforms and cascade orientation

Bert "Panopticon" plot



Reconstruction relies on waveform amplitude and timing

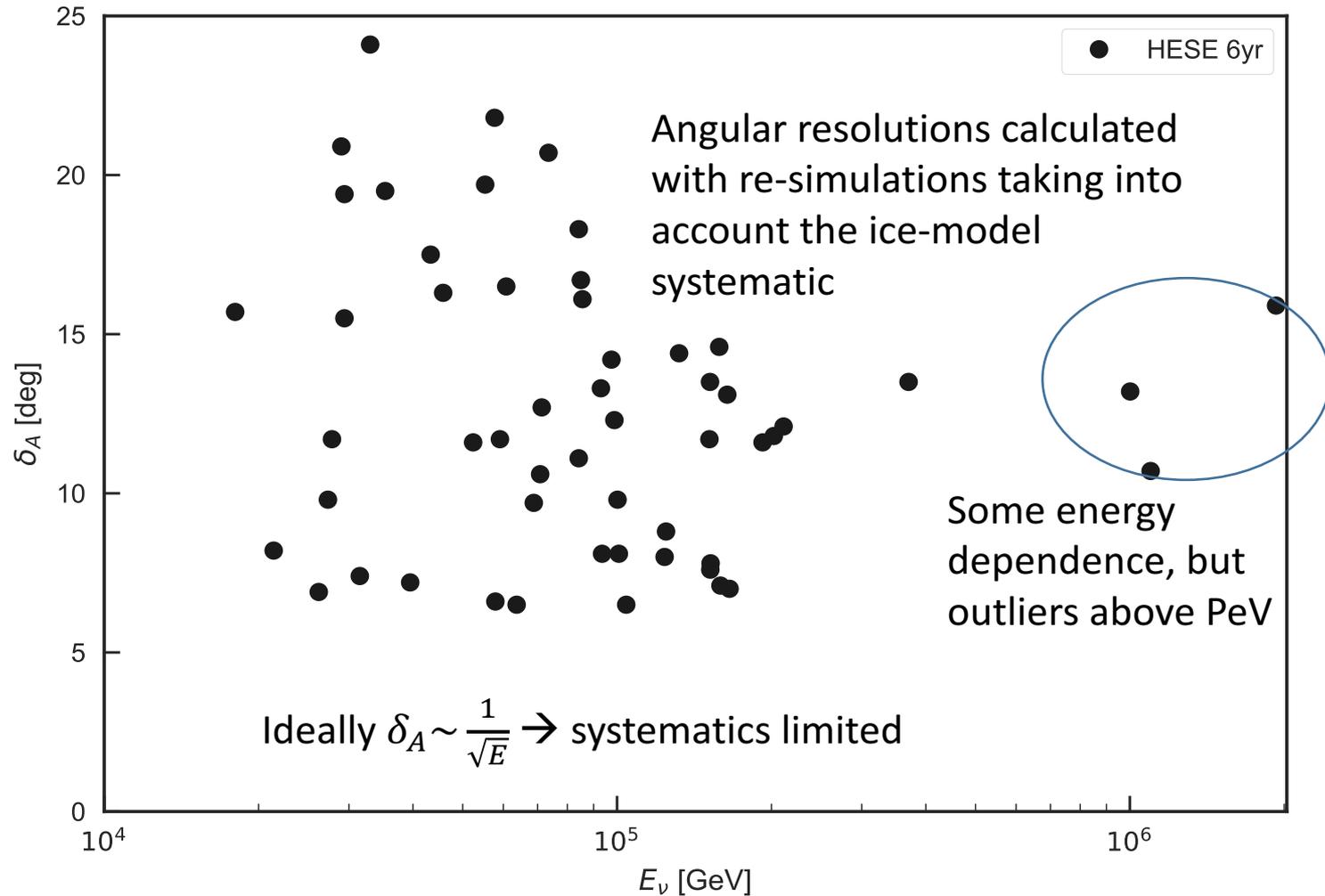
Noticeable differences between best-fit and reversed-orientation directions

Some disagreement between best-fit and data remain and hint that there is room to improve reconstruction

Time-windows where PMT saturates or marked as errata are shaded in red

# Cascade resolutions for HESE

## Cascades in high energy starting event selection

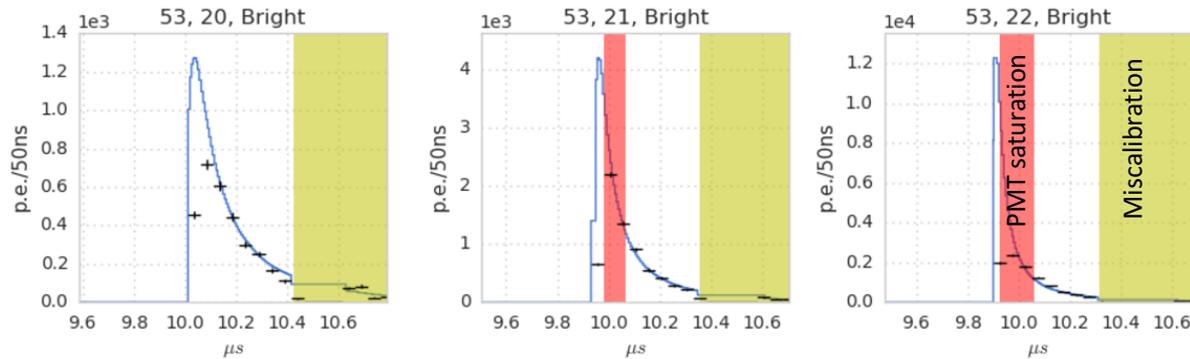


# Two approaches to improved resolutions

## 1. Include more data

Bert waveforms on closest string

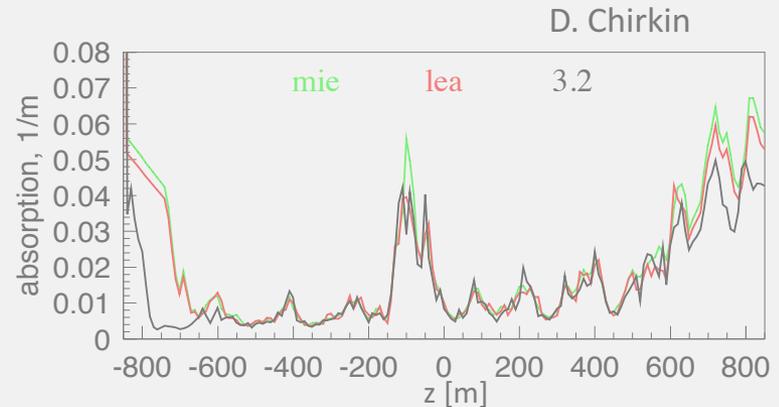
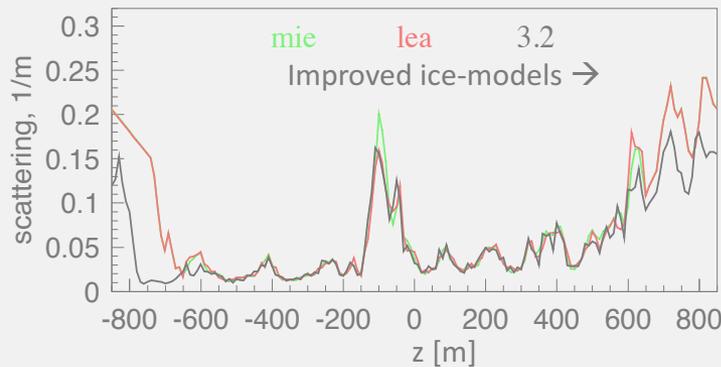
A few examples of unused waveforms



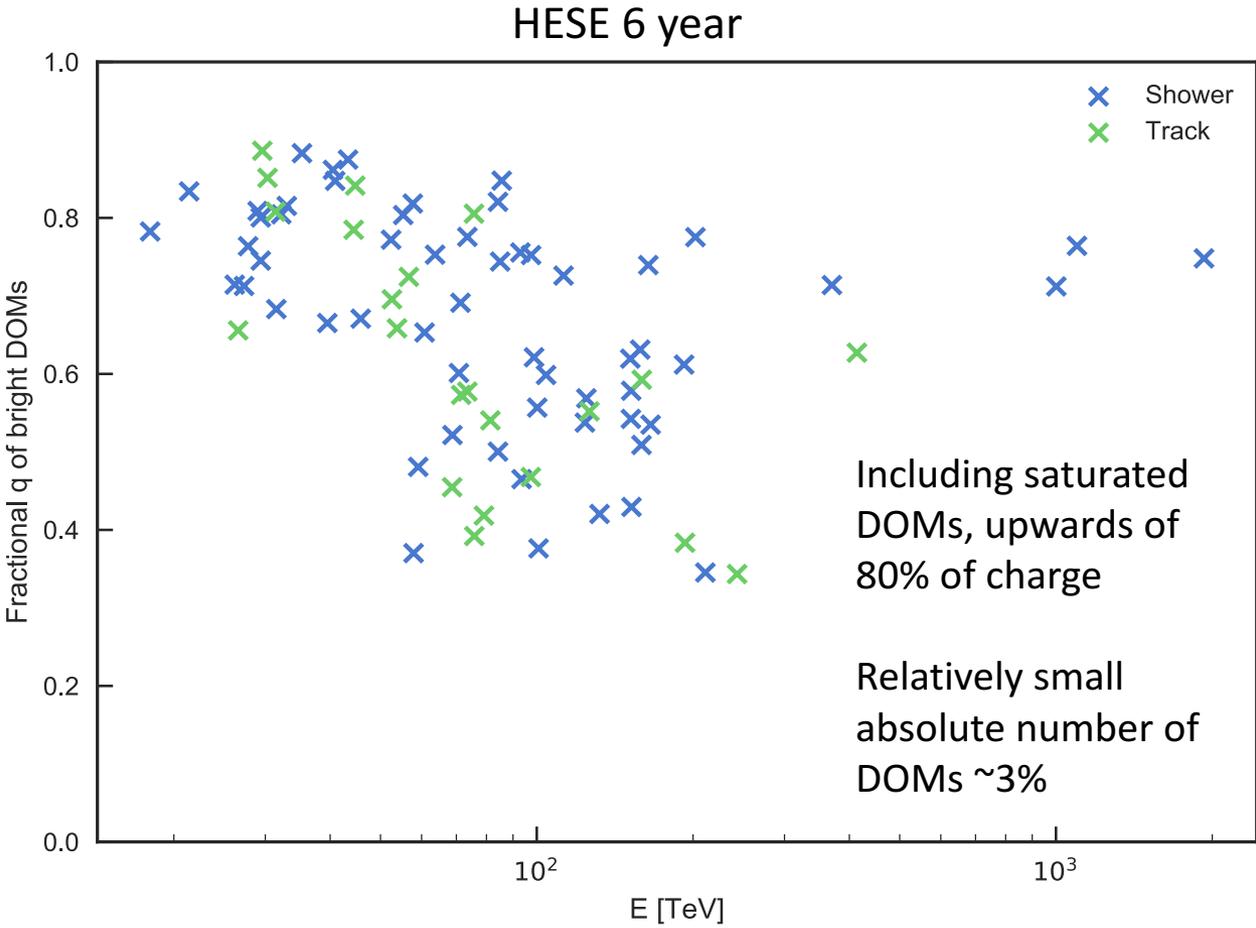
Bright DOMs are ignored in reconstruction

## 2. Improve ice model, reduce ice uncertainties

Currently an effective ice-model error of 10%



# Bright DOMs in high energy events

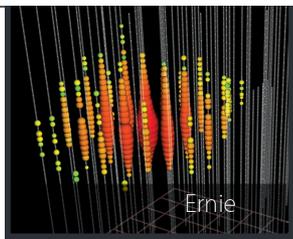


Define  $Q_{avg}$  as the mean total charge of all hit DOMs

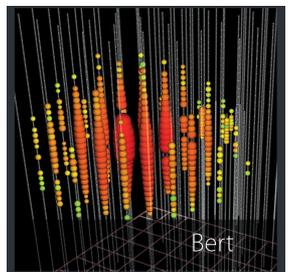
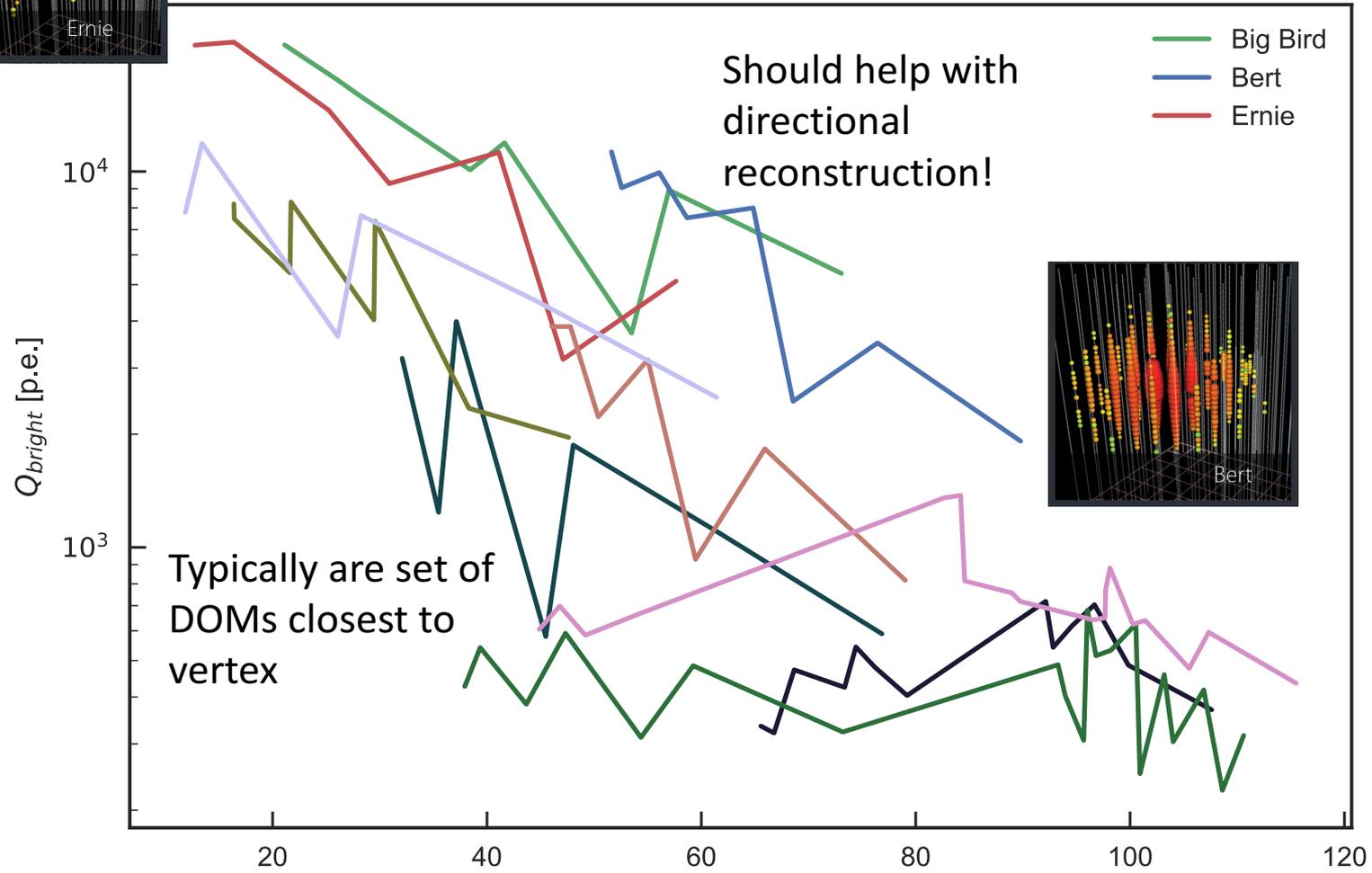
DOMs with  $Q_{bright} > 10 * Q_{avg}$  are classified as "Bright"

PMT is not necessarily saturated, but excluded because systematic uncertainties start to dominate over statistical errors in fitting the waveforms

# Distance to vertex of brightest DOMs



Top 10 energetic cascades in HESE 6 year



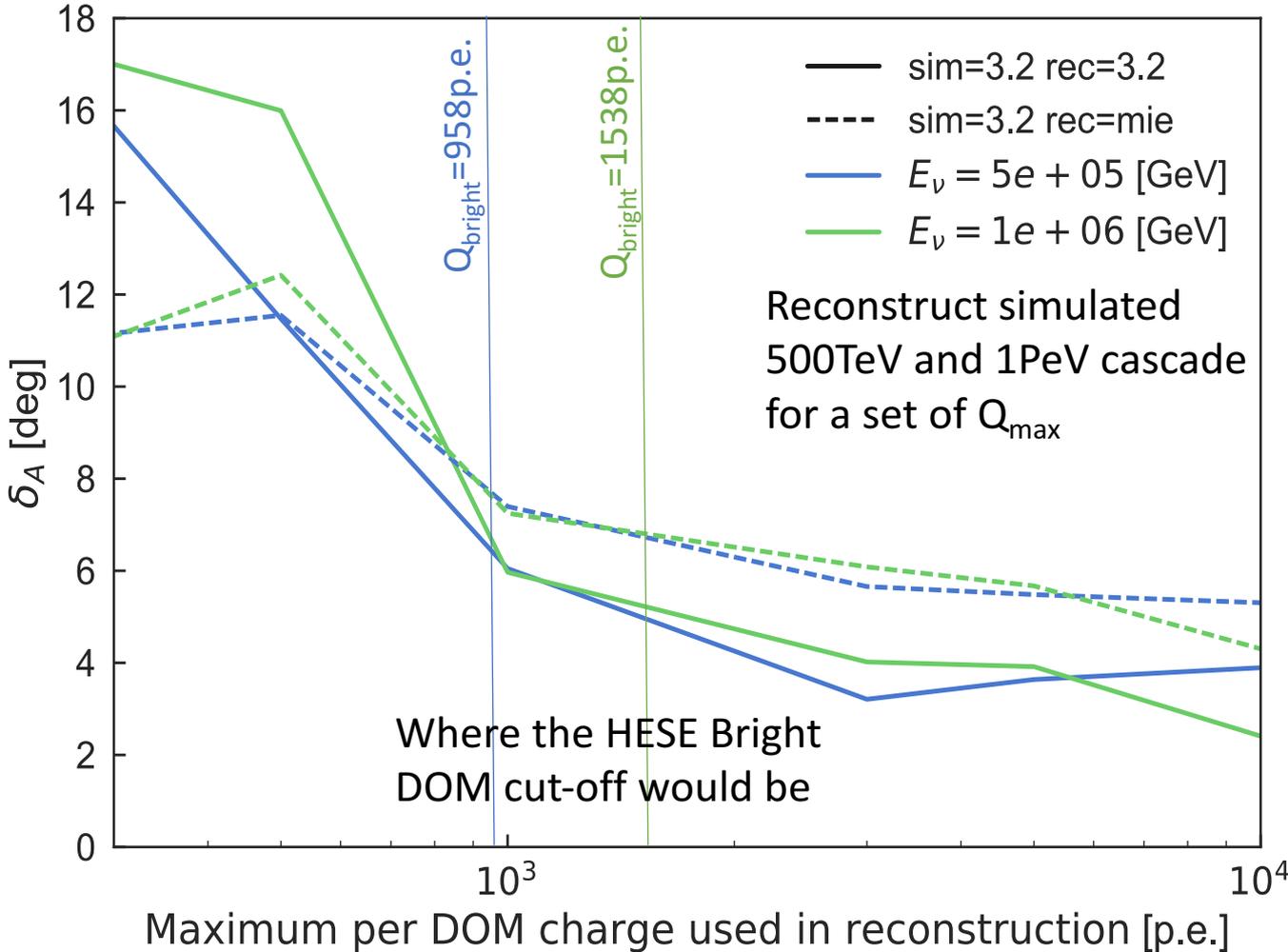
Mostly within single string spacing (125m)

1. Simulate an EM cascade at fixed location/direction and various energies with latest version of ice-model
2. For each simulated cascade, reconstruct with direct photon propagation
3. Approximate Bayesian Method (ABC) to get angular uncertainty

Reconstruction can be performed with different settings

- Identical or different ice-models: ice-rec
- Maximum per-DOM charge:  $Q_{\max}$
- Effective ice-model uncertainty parameter:  $\sigma$  (in a few slides)

# Effect of $Q_{\max}$ on angular resolution



Tested with an identical sim-reco ice-model (3.2) and a different reco ice-model (mie)

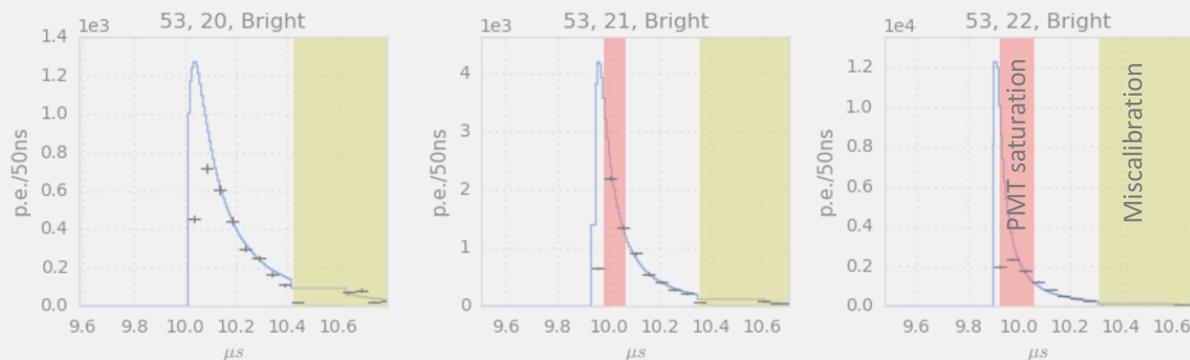
Both show a trend towards better angular resolution as more DOMs are included (increasing  $Q_{\max}$ )

# Two approaches to improved resolutions

## 1. Include more data

A few examples of unused waveforms

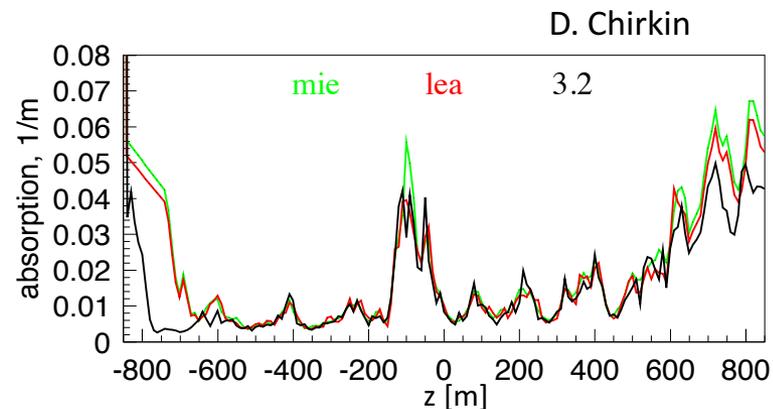
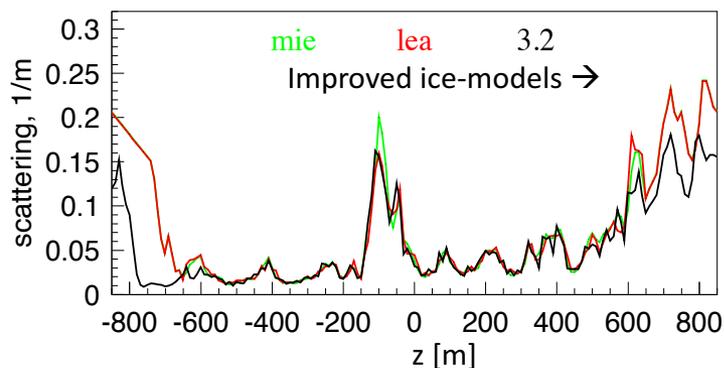
Bert waveforms on closest string



Bright DOMs are ignored in reconstruction

## 2. Improve ice model, reduce ice uncertainties

Currently an effective ice-model error of 10%



D. Chirkin

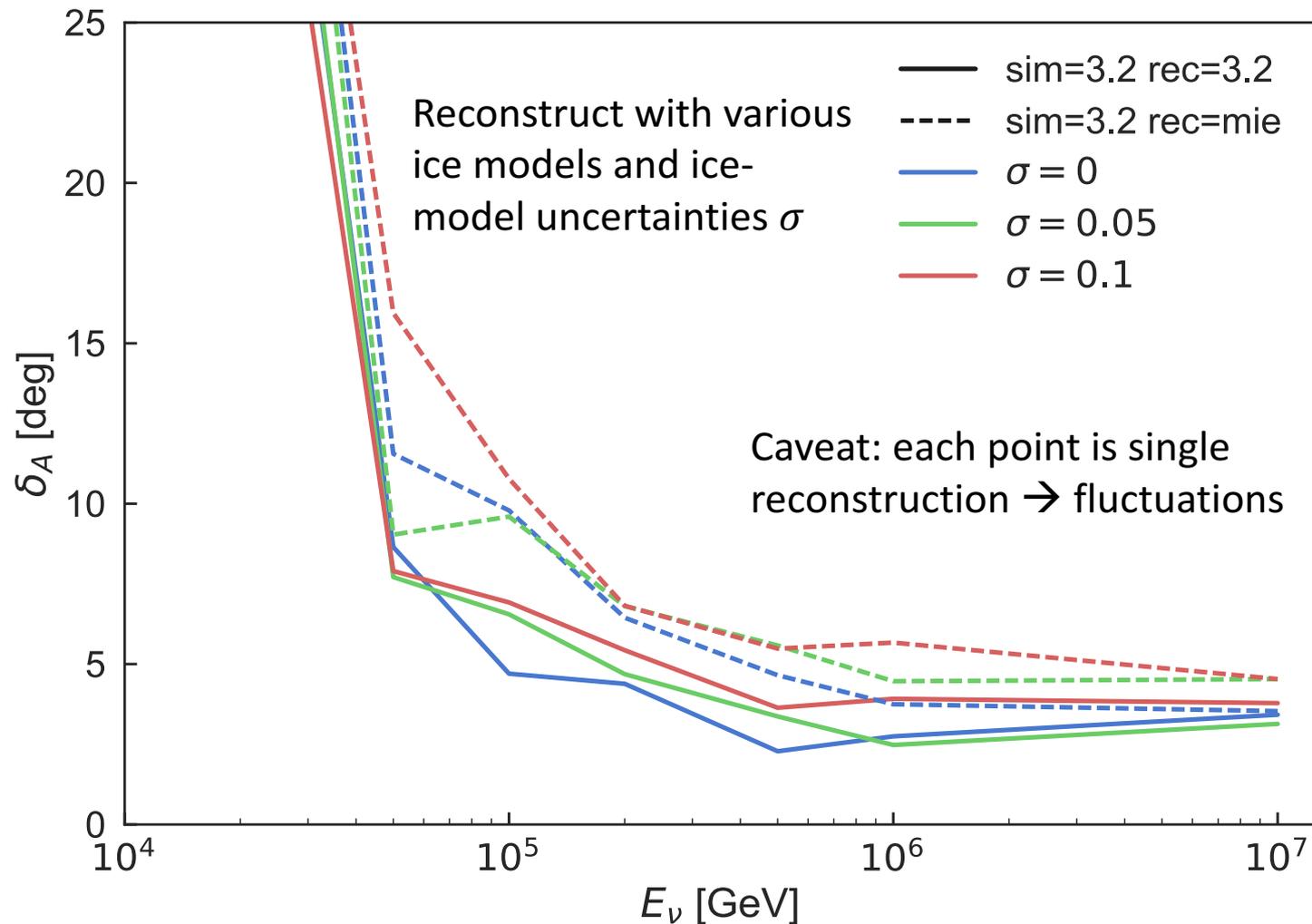
Without any ice-model systematic, simulation must describe data completely within statistical errors

Add smearing to predicted charge on each DOM that penalizes the likelihood with log-normal

distribution:  $\exp \frac{-\ln\left(\frac{\mu_d}{\mu_s}\right)^2}{2\sigma^2}$  .

Effective ice-model uncertainty parameterized with  $\sigma$ ; based on data from in-situ LED calibration devices

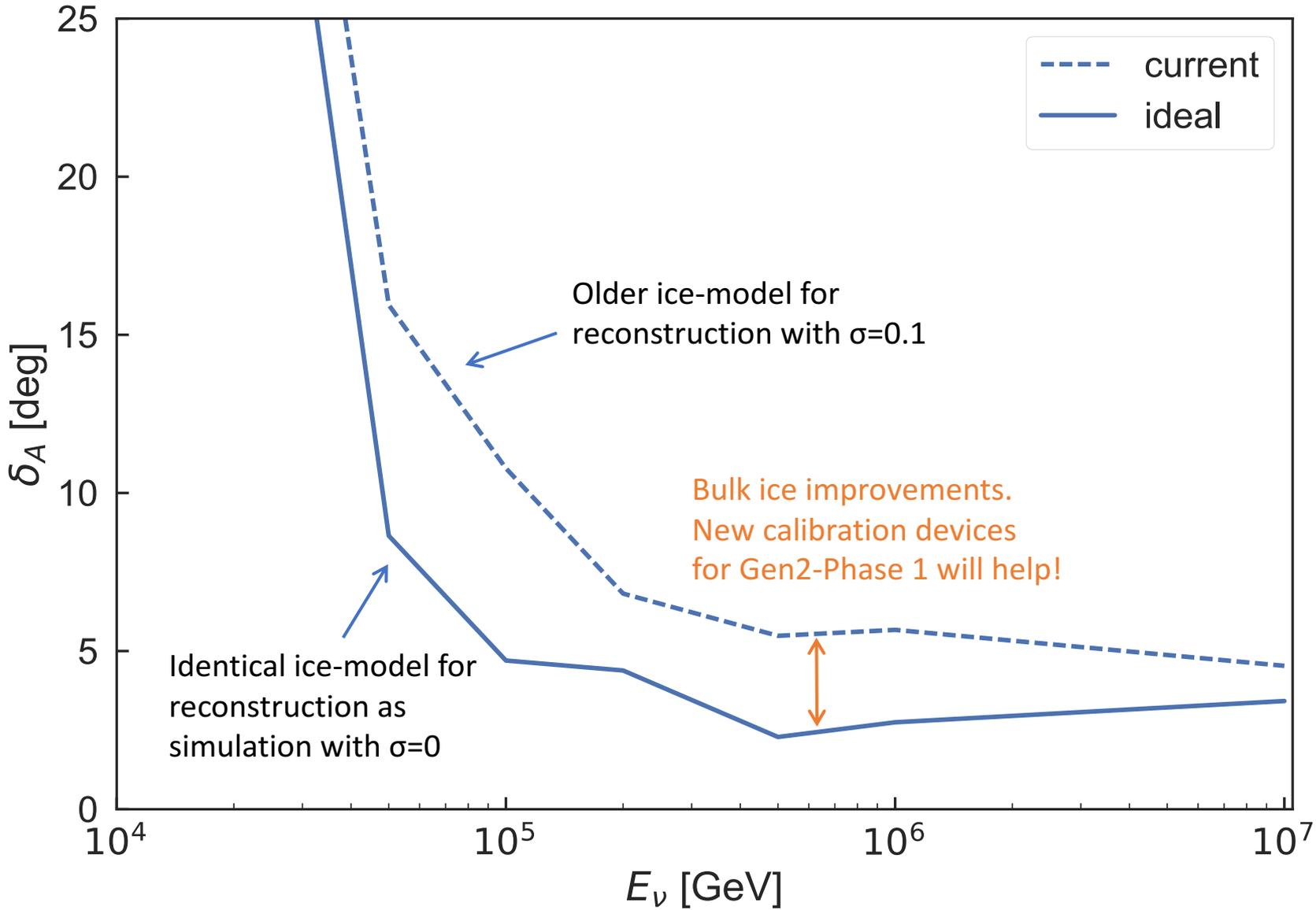
# Angular resolution vs energy and $\sigma$



Reducing  $\sigma$  generally reduces  $\delta_A$  (colors)

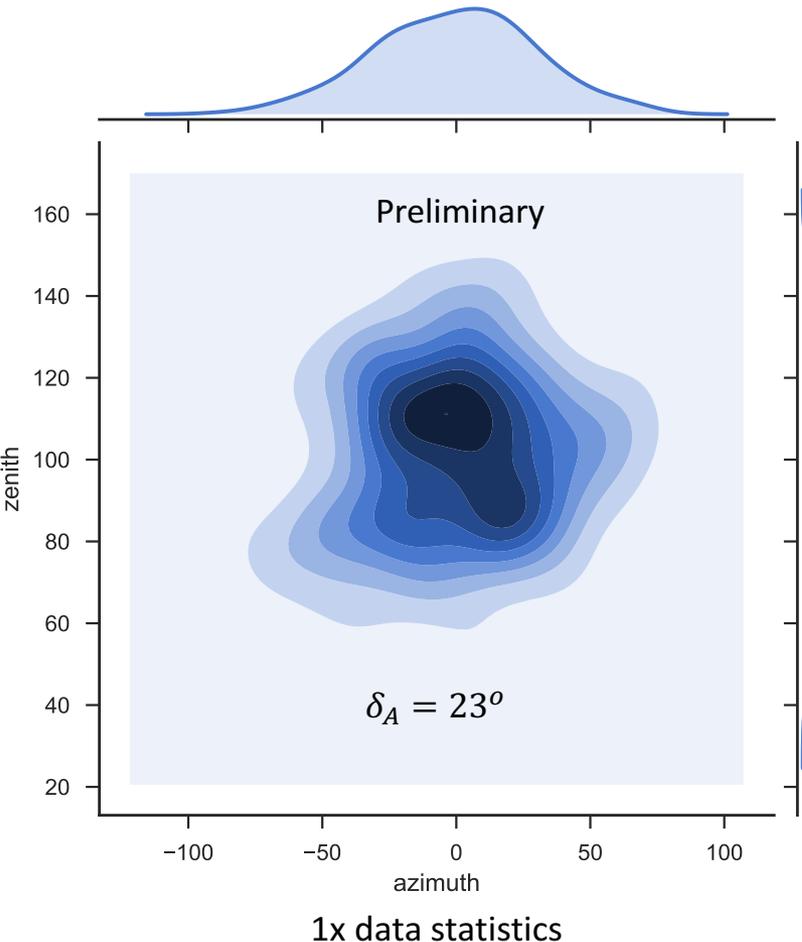
Correct knowledge of ice also reduces  $\delta_A$  (dashed vs solid)

# Effect of ice-model and $\sigma$ on angular resolution



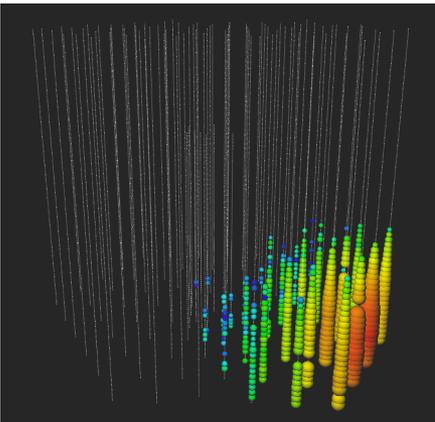
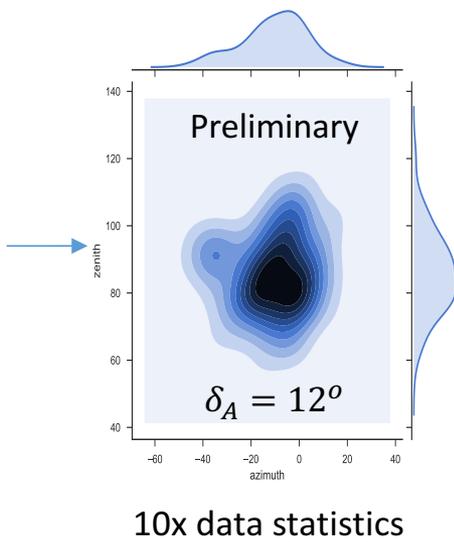
# With more simulated photons

Direct photon reconstruction  
mean statistical uncertainties  
in MC



Increased photon statistics  
improves angular  
resolution even more!

Limited by GPU time



Performed on new non-contained PeV cascade  
“Hydrangea” – see Lu’s talk!

$$\frac{\delta_E}{E} : 8.3\% \rightarrow 3.6\%$$

# Summary

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Room to improve cascade reconstruction

Currently affected by

1. Bright DOM exclusions
2. Ice-model and ice-model uncertainty

There is a concerted, ongoing effort to incorporate more waveform data and improve ice-models.

Even more improvement with increased direct photon statistics but this may prove to be impractical.

# Thank you!

## THE ICECUBE COLLABORATION

 **AUSTRALIA**  
University of Adelaide

 **BELGIUM**  
Université libre de Bruxelles  
Universiteit Gent  
Vrije Universiteit Brussel

 **CANADA**  
SNOLAB  
University of Alberta–Edmonton

 **DENMARK**  
University of Copenhagen

 **GERMANY**  
Deutsches Elektronen-Synchrotron  
ECAP, Universität Erlangen-Nürnberg  
Humboldt–Universität zu Berlin  
Ruhr-Universität Bochum  
RWTH Aachen University  
Technische Universität Dortmund  
Technische Universität München  
Universität Mainz  
Universität Wuppertal  
Westfälische Wilhelms-Universität  
Münster

 **JAPAN**  
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University of Canterbury

 **REPUBLIC OF KOREA**  
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Massachusetts Institute of Technology  
Michigan State University  
Ohio State University  
Pennsylvania State University  
South Dakota School of Mines and  
Technology

Southern University  
and A&M College  
Stony Brook University  
University of Alabama  
University of Alaska Anchorage  
University of California, Berkeley  
University of California, Irvine  
University of Delaware  
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University of Maryland  
University of Rochester  
University of Texas at Arlington

University of Wisconsin–Madison  
University of Wisconsin–River Falls  
Yale University

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University of Wisconsin Alumni Research Foundation (WARF)  
US National Science Foundation (NSF)



icecube.wisc.edu

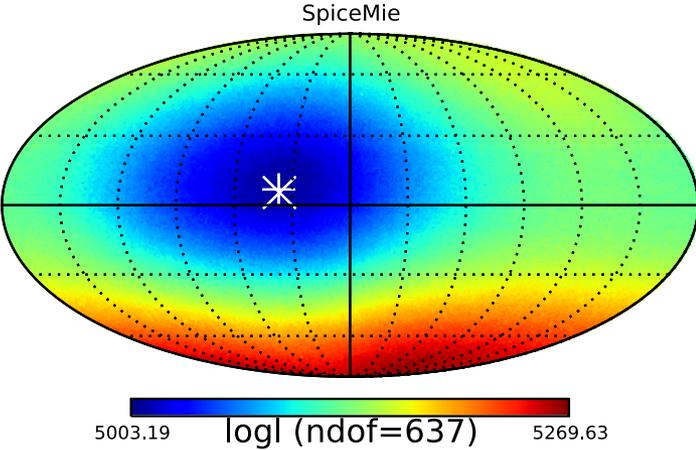
# Backups

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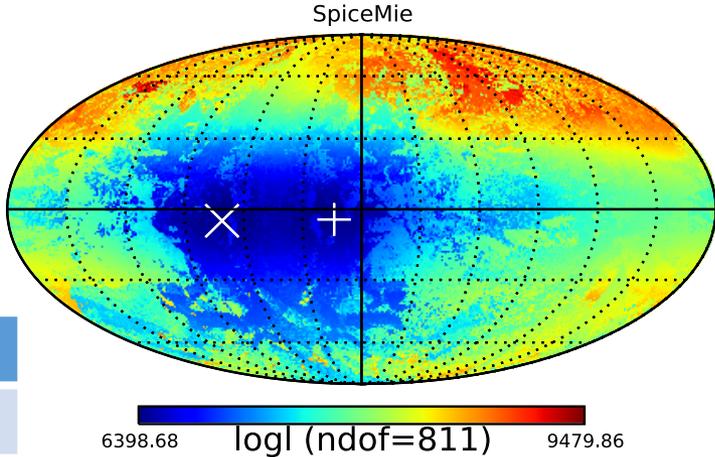
# Rowlf: A particularly bad case

x = full sky scan  
+ = iterative monopod

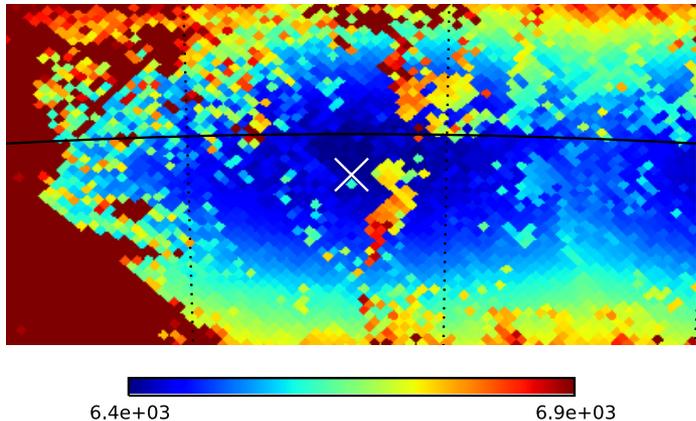
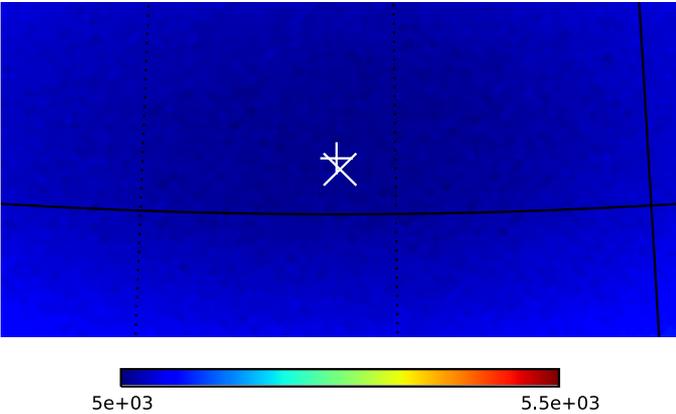
### Without Brights



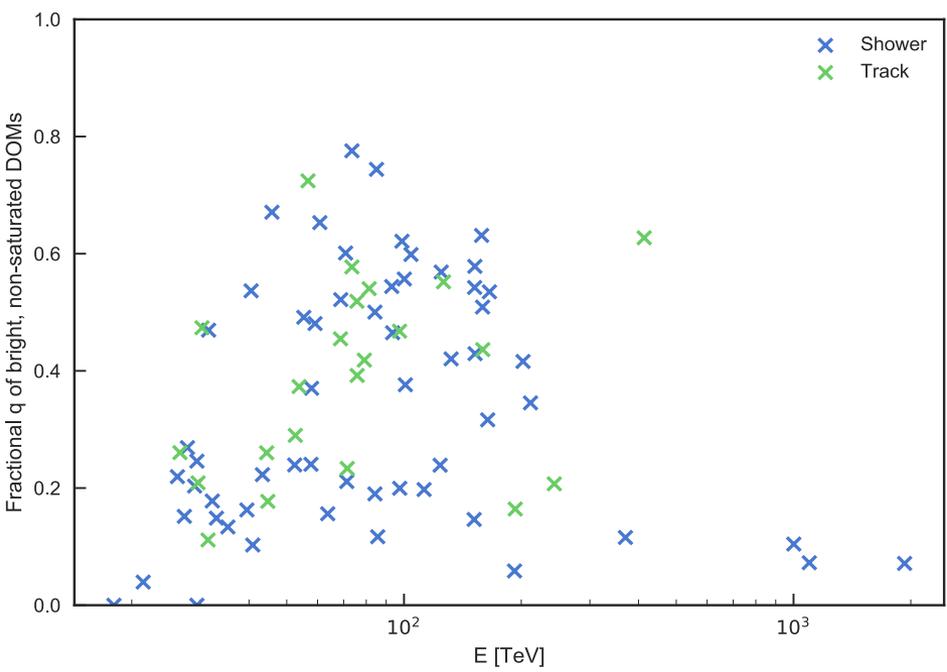
### With Brights



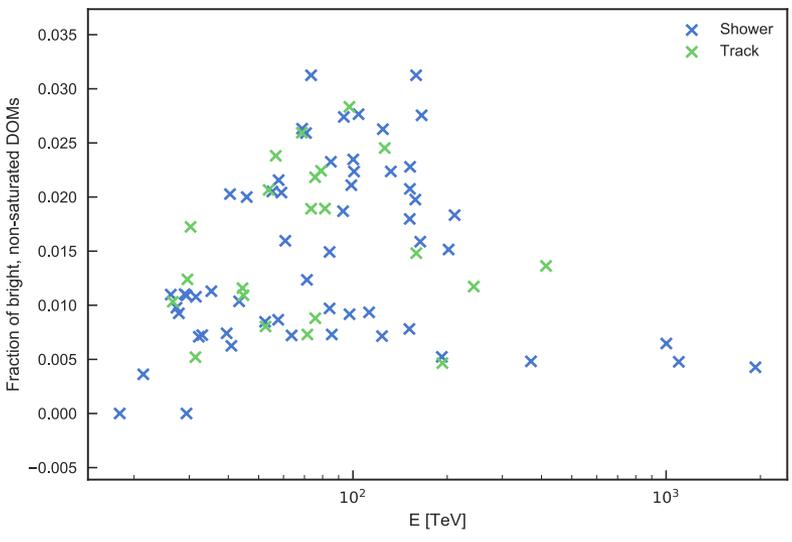
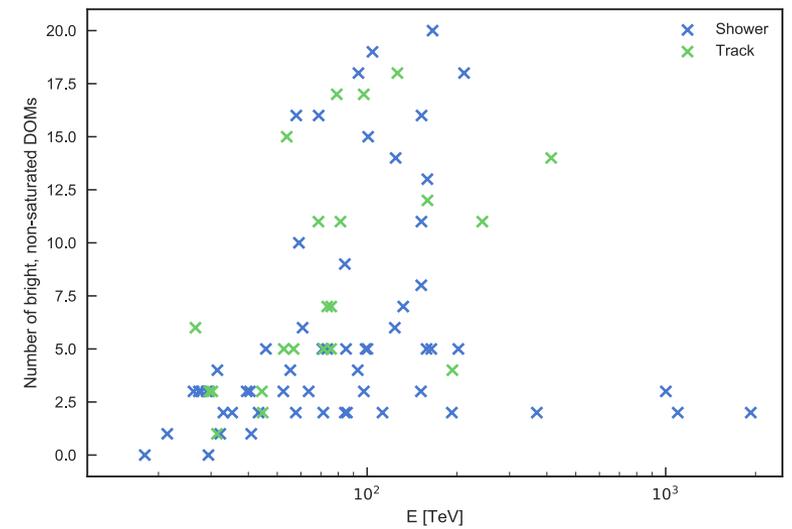
dE/E [%]	dθ [deg]
16	36



# Bright but not saturated



Saturated DOMs are typically a subset of bright DOMs.



# DirectFit

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- DirectFit LLH includes an effective ice-model uncertainty that smears the charge on each DOM +/- 10% (default)
- This ensures that the fit isn't too biased by high statistic DOMs

$$-\ln \mathcal{L} = \sum_i \left[ s_i \ln \frac{s_i/n_s}{\mu_s^i} + d_i \ln \frac{d_i/n_d}{\mu_d^i} + \frac{1}{2\sigma^2} \ln^2 \frac{\mu_d^i}{\mu_s^i} \right].$$

“Likelihood description for comparing data with simulation of limited statistics”,  
D. Chirkin, arXiv:1304.0735

# DirectFit

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Capable of reconstructing data with direct photon simulation with ppc

Likelihood function different from the mainstream recos as the expectations from simulation is no longer analytic (e.g. Millipede)

Fit routine proceeds through several iterations of a localized random search where many position and direction are tested and the best fit energies at those steps are calculated.

Following fit, approximate Bayesian calculation (ABC) method applied based on fit results to estimate posterior via MCMC.

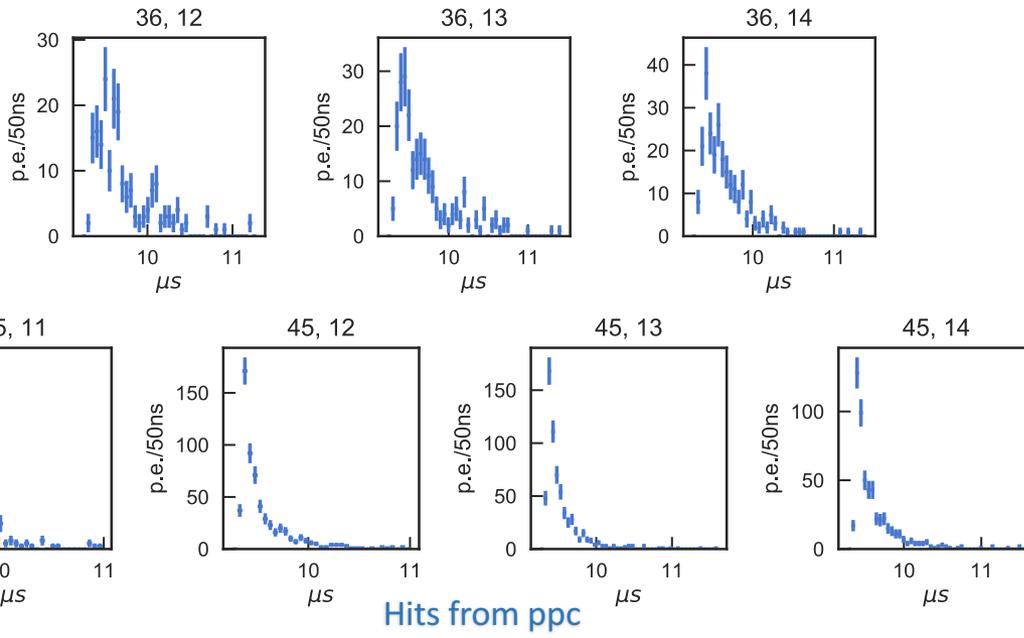
# Procedure

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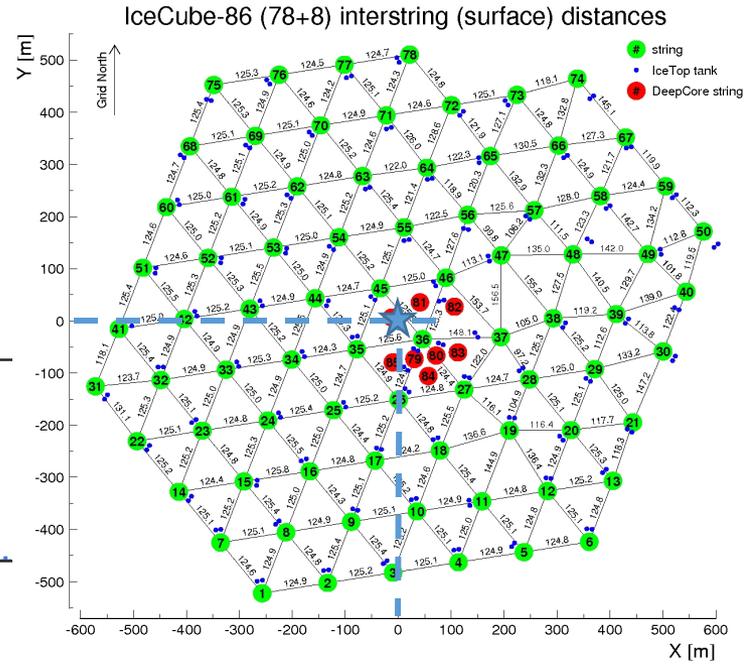
1. Simulate a EM cascade with ppc at
  - $r=(0, 0, 300)\text{m} \rightarrow 1648\text{m}$  depth
  - $\theta=(90 \text{ zenith}, 0 \text{ azimuth})$
  - Ice-sim=3.2
  - $E=1\text{E}[3, 4, \dots 7] \text{ GeV}$
2. For each simulated cascade, use DirectFit to try and reconstruct the best fit point assuming
  - Ice-rec=(spice-Mie, 3.2)
  - $\sigma=(0.0, 0.05, 0.1)$  ice model uncertainty
  - $Q_{\text{max}}=(300, 500, 1000, 3000, 5000, 10000)$  p.e. cut off such that DOMs with  $Q_{\text{DOM}} > Q_{\text{max}}$  are excluded
3. Once best fit is found, sample from the approximate posterior distribution  $P(r, \theta | D)$  for each combination of ice models, energies, and sigmas
  - Std deviation of this sample gives resolution:  $\delta r, \delta \theta, \delta E$
  - And pulls:  $\frac{E - E_{\text{true}}}{\delta E}$  etc.

# An example: step 1, simulation

1.  $E=100$  TeV, ice=spice-3.2 (latest),  $r=(0, 0, 300)$ ,  $\theta=(90z, 0a)$

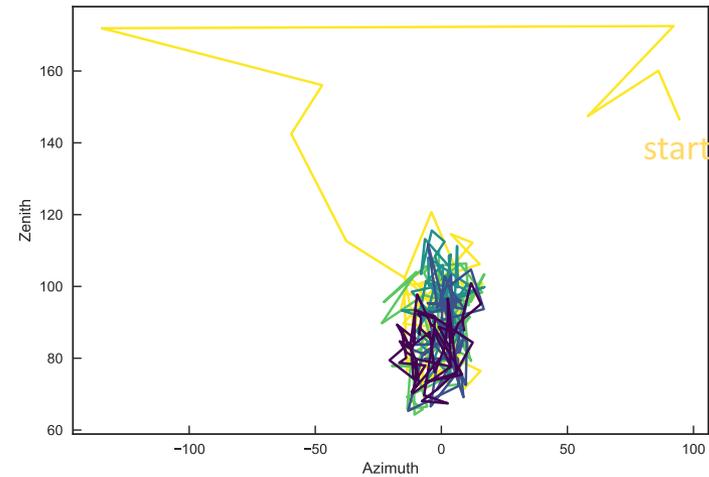
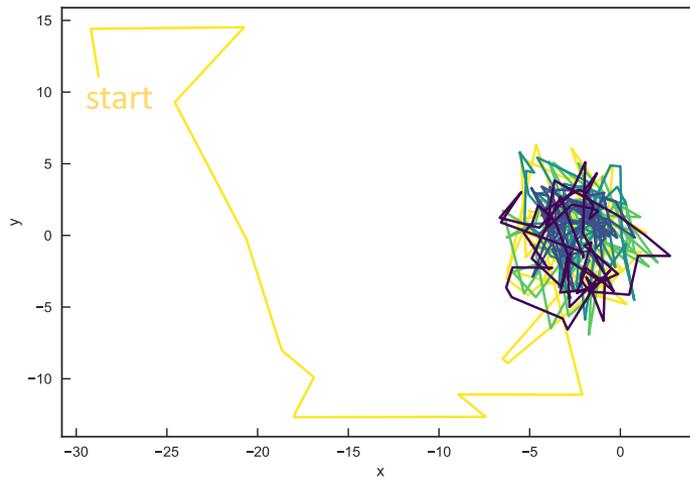


Hits from ppc



# An example: step 2, reconstruction

1.  $E=100$  TeV, ice=spice-3.2 (latest),  $r=(0, 0, 300)$ ,  $\theta=(90z, 0a)$ ,  $\sigma=0.0$
2. DirectFit steps to the minimum



Spread and mean of last 5% of steps  
used to initialize step 3

# An example: step 3, error calculation

1.  $E=100$  TeV, ice=spice-3.2 (latest),  $r=(0, 0, 300)$ ,  $\theta=(90z, 0a)$ ,  $\sigma=0.0$
2. DirectFit steps to the minimum
3. Generate probabilities across the parameter space

