



# Cosmic ray spectrum and mass composition from IceTop and IceCube



TeVPA 2018, Berlin

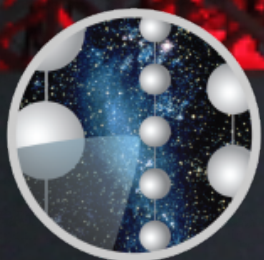
Matthias Plum for the IceCube collaboration

Marquette University

Milwaukee, WI USA

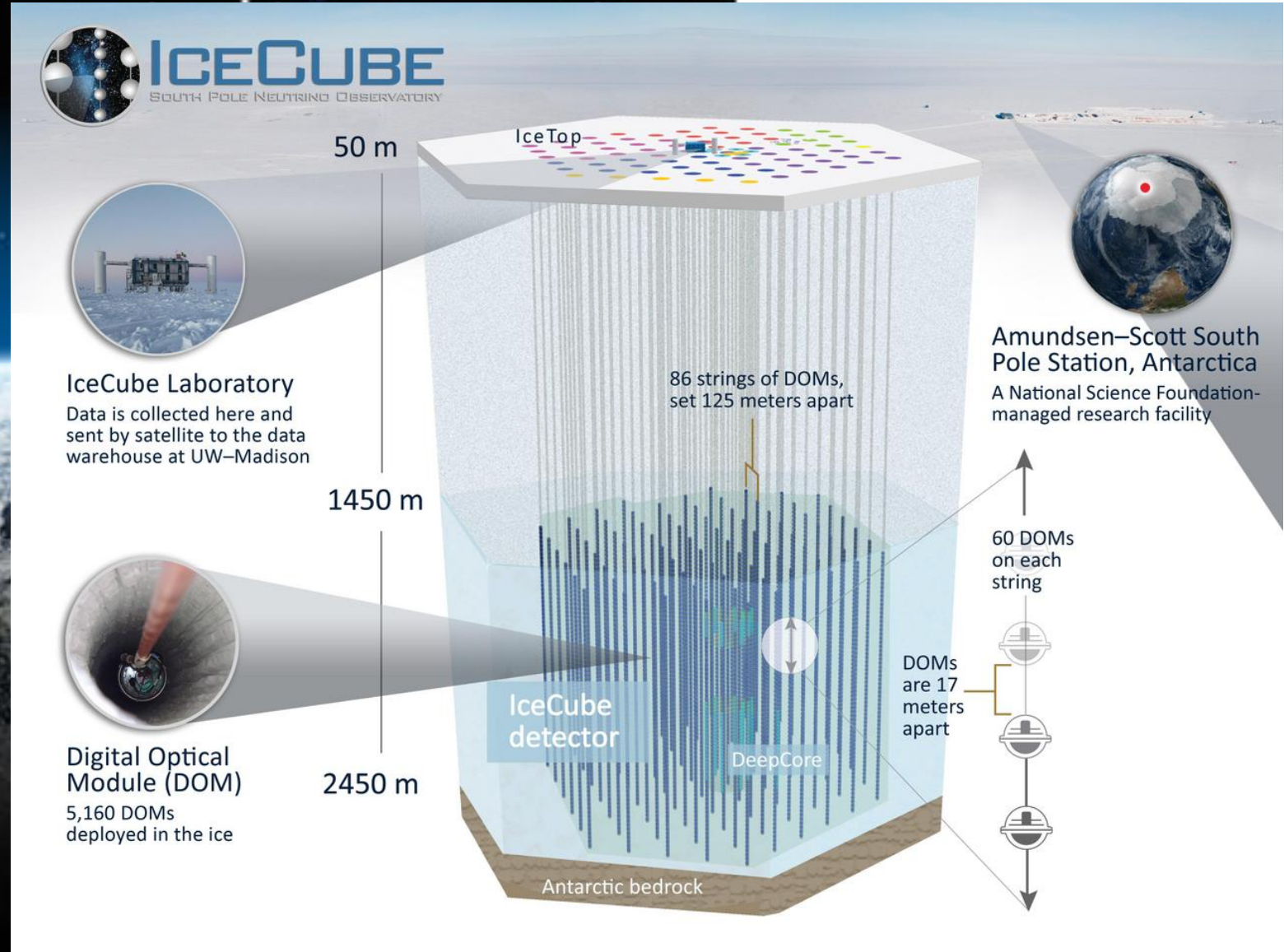
## Outline

- Introduction
- Energy spectrum & Composition
  - IceTop Analysis
  - IceTop/IceCube Coincidence Analysis
- Summary

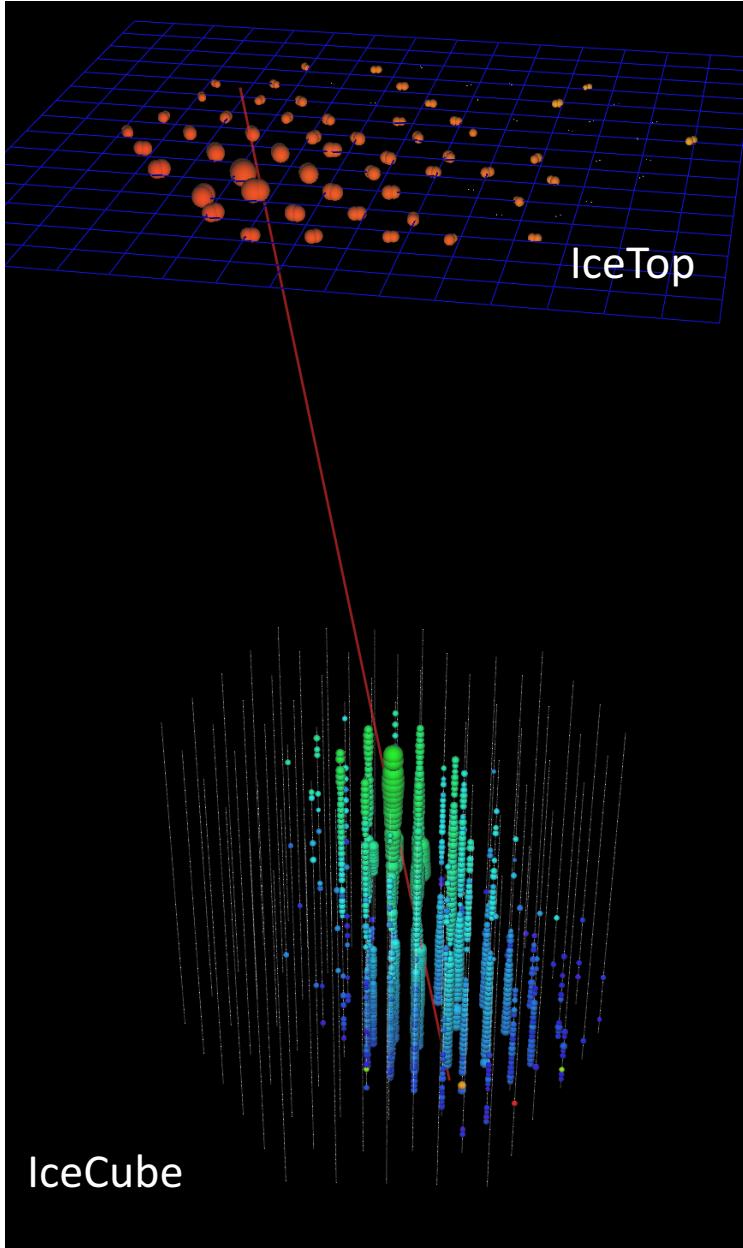


**ICECUBE**  
SOUTH POLE NEUTRINO OBSERVATORY

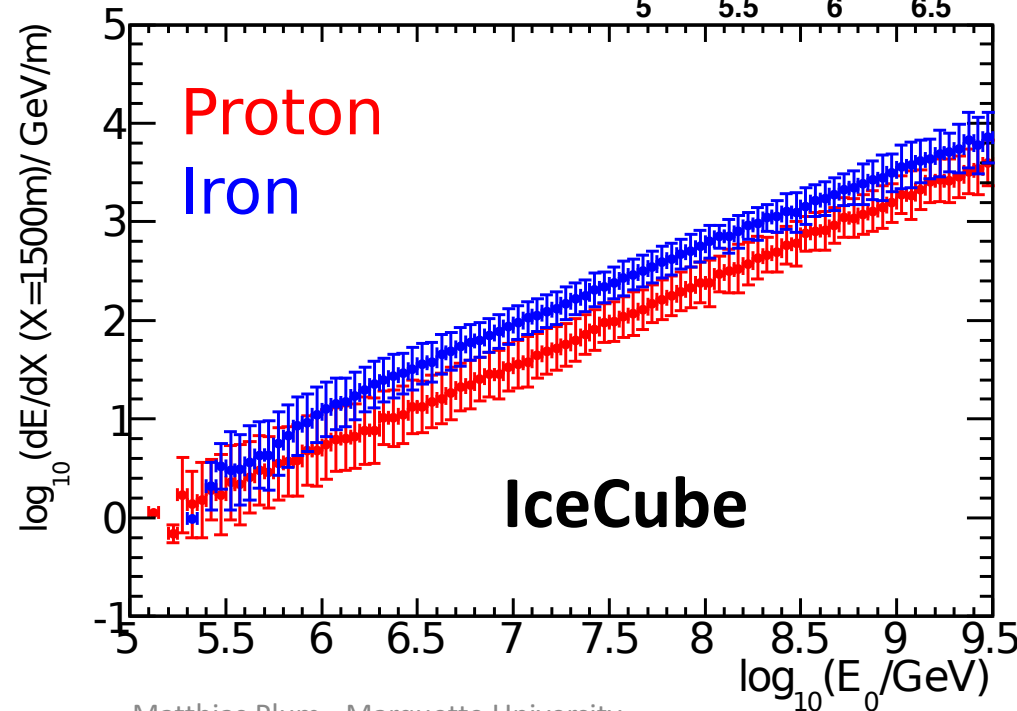
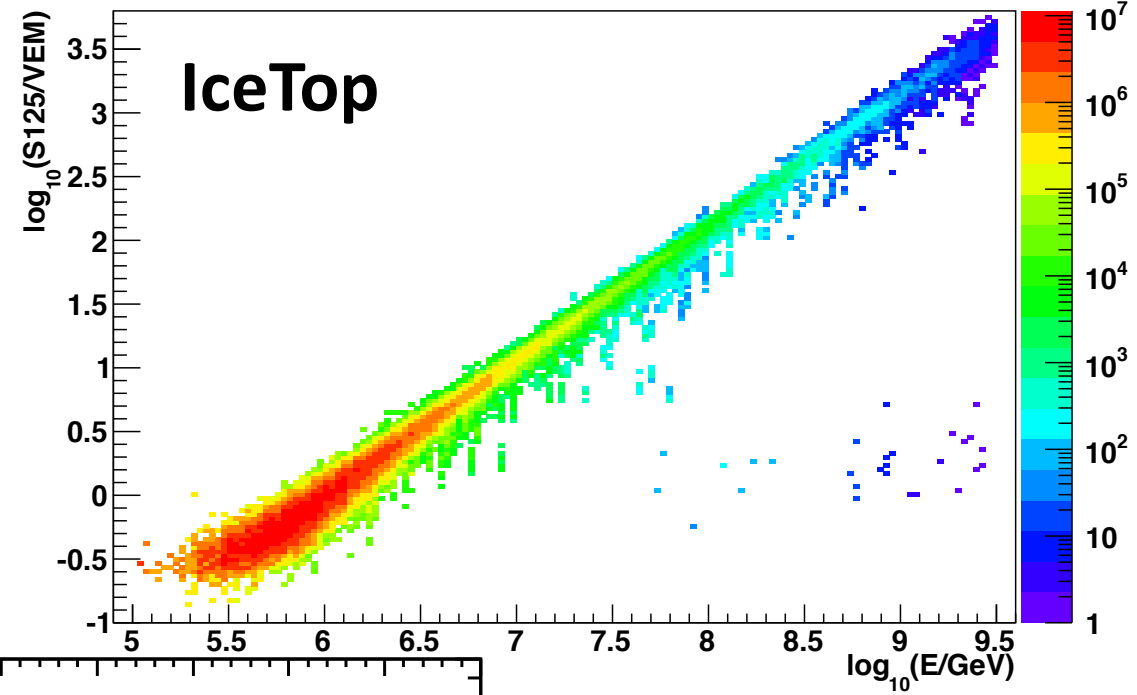
# IceCube Neutrino Observatory



# Reconstruction



- 'Shower size'  $S_{125}$  is signal strength measured in vertical equivalent muons (VEM) at 125m
- Only small composition sensitivity



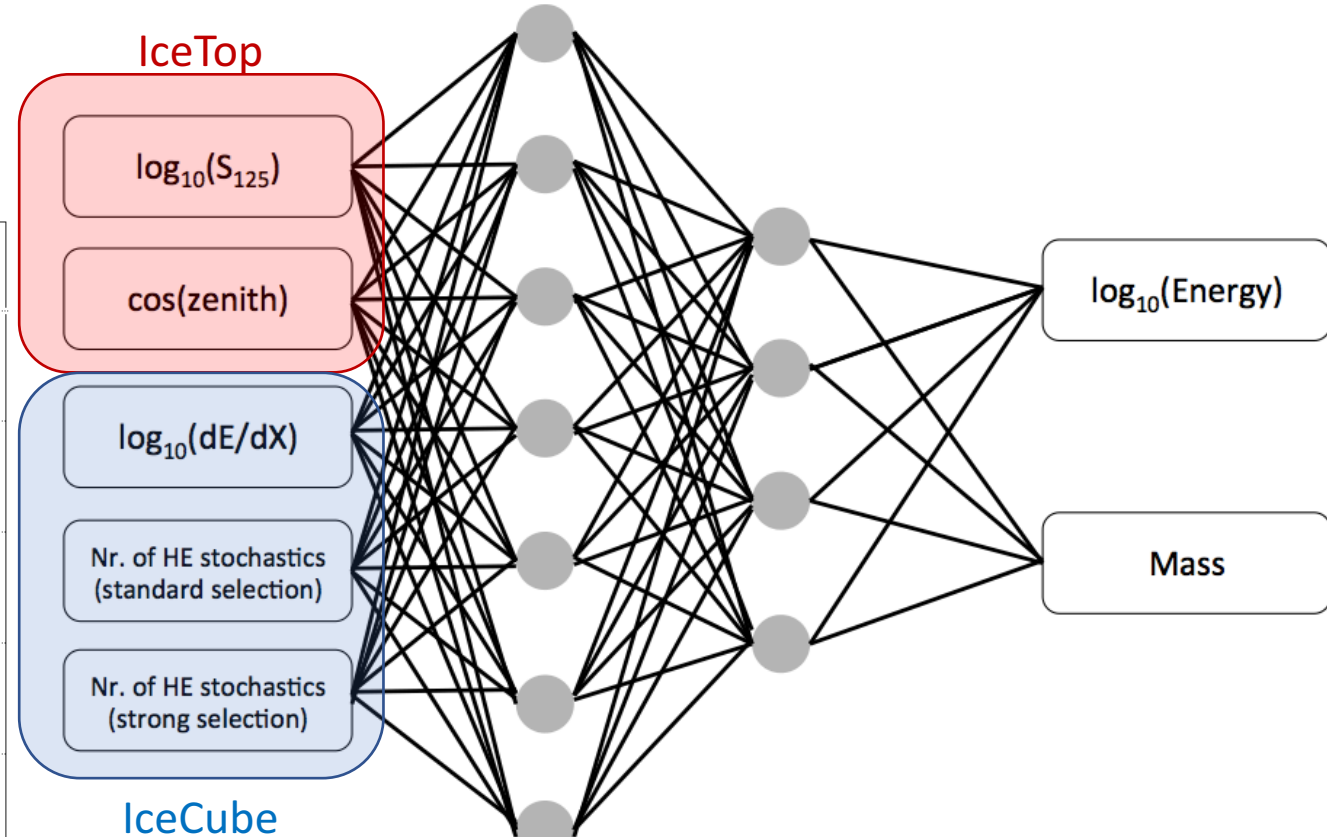
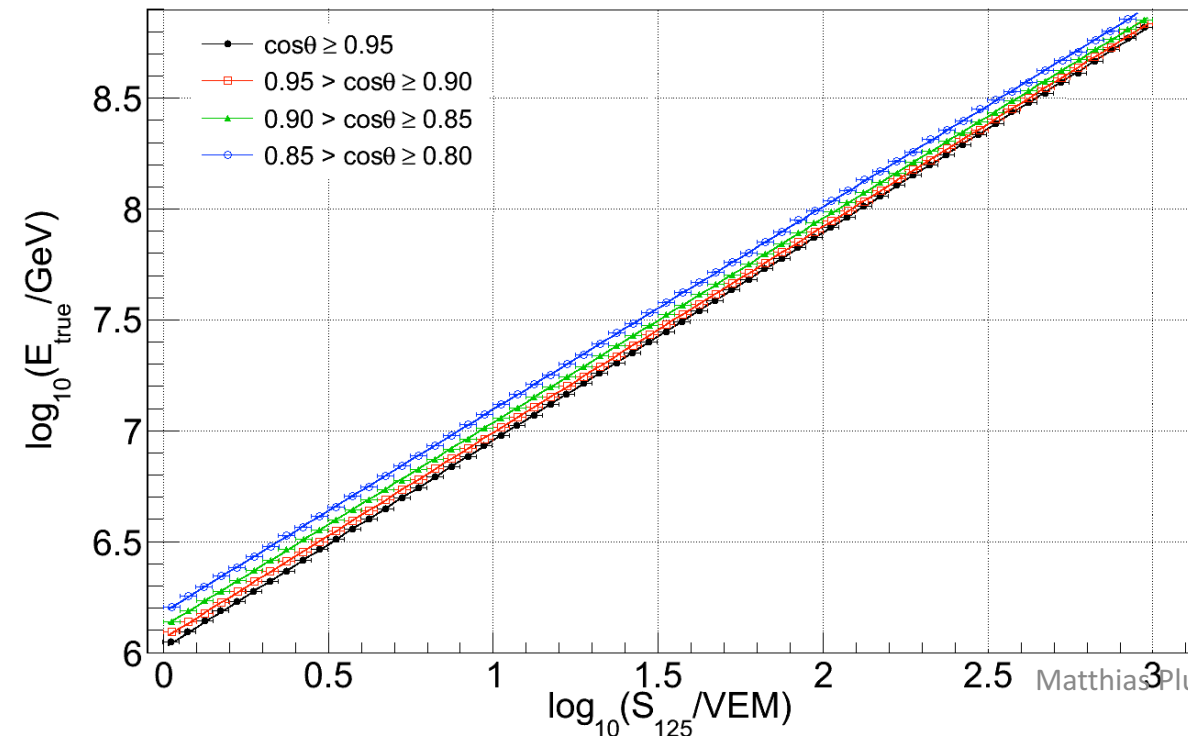
- Energy loss  $dE/dX$  at a fixed slant depth of  $X=1500$  m in the glacial ice
- Good composition sensitivity

# IceTop Only

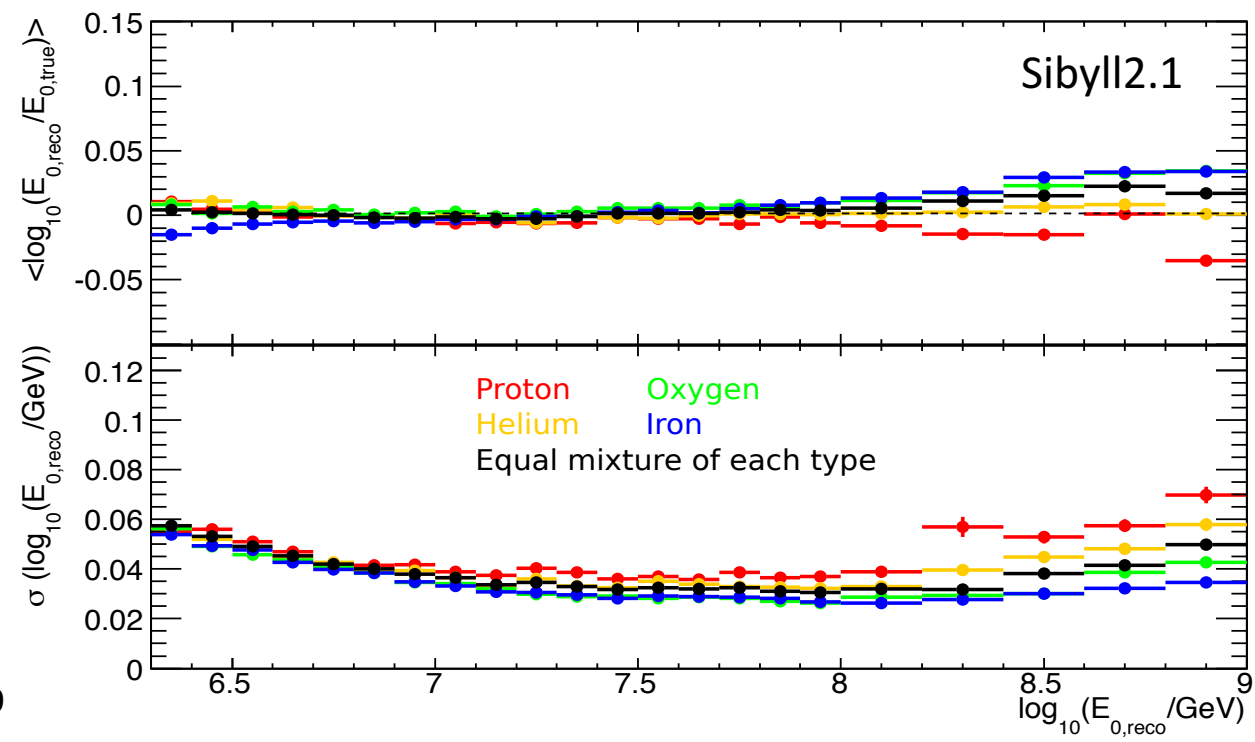
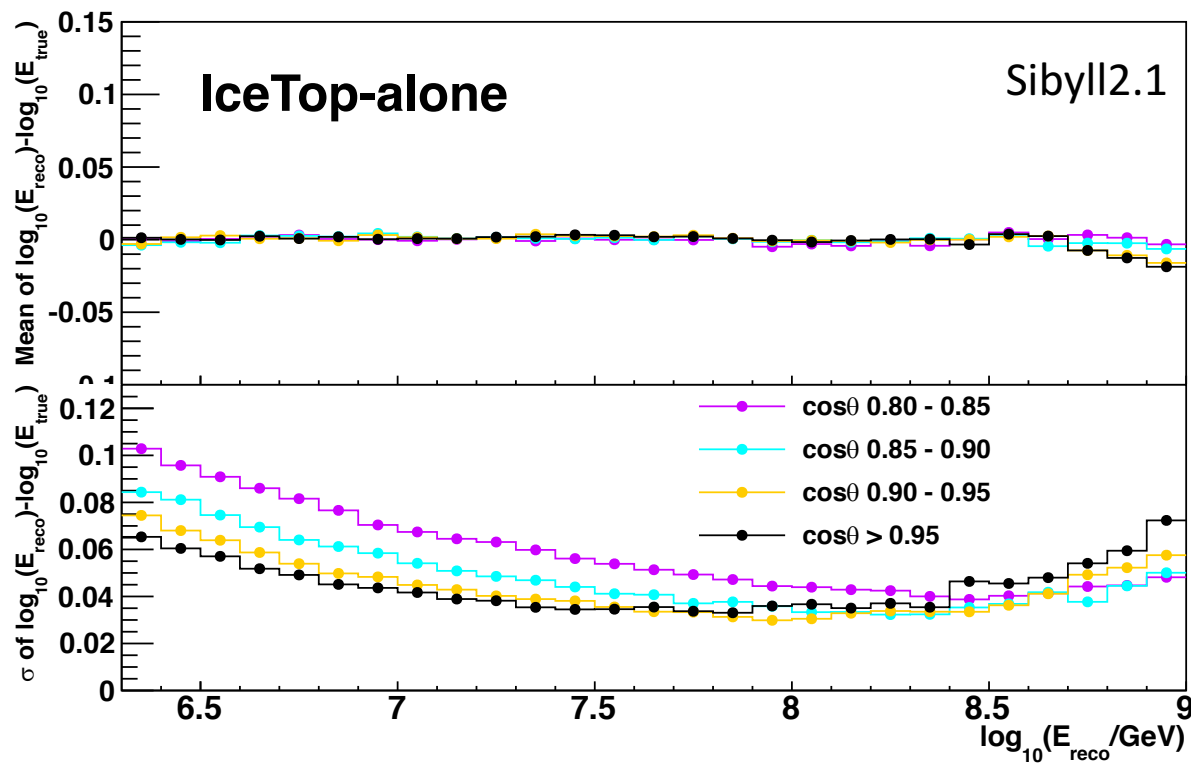
- Energy reconstruction using maximum-likelihood procedure
- Reconstruct core position, direction and shape/normalization of LDF from the deposited charge
- Includes effects snow coverage by assuming an 'effective attenuation length'  $\lambda$  (range 2.10 – 2.25m)

# IceTop/IceCube Coincidence

- Energy & Mass reconstructed with neural network
- Use best available detector simulation including snow coverage



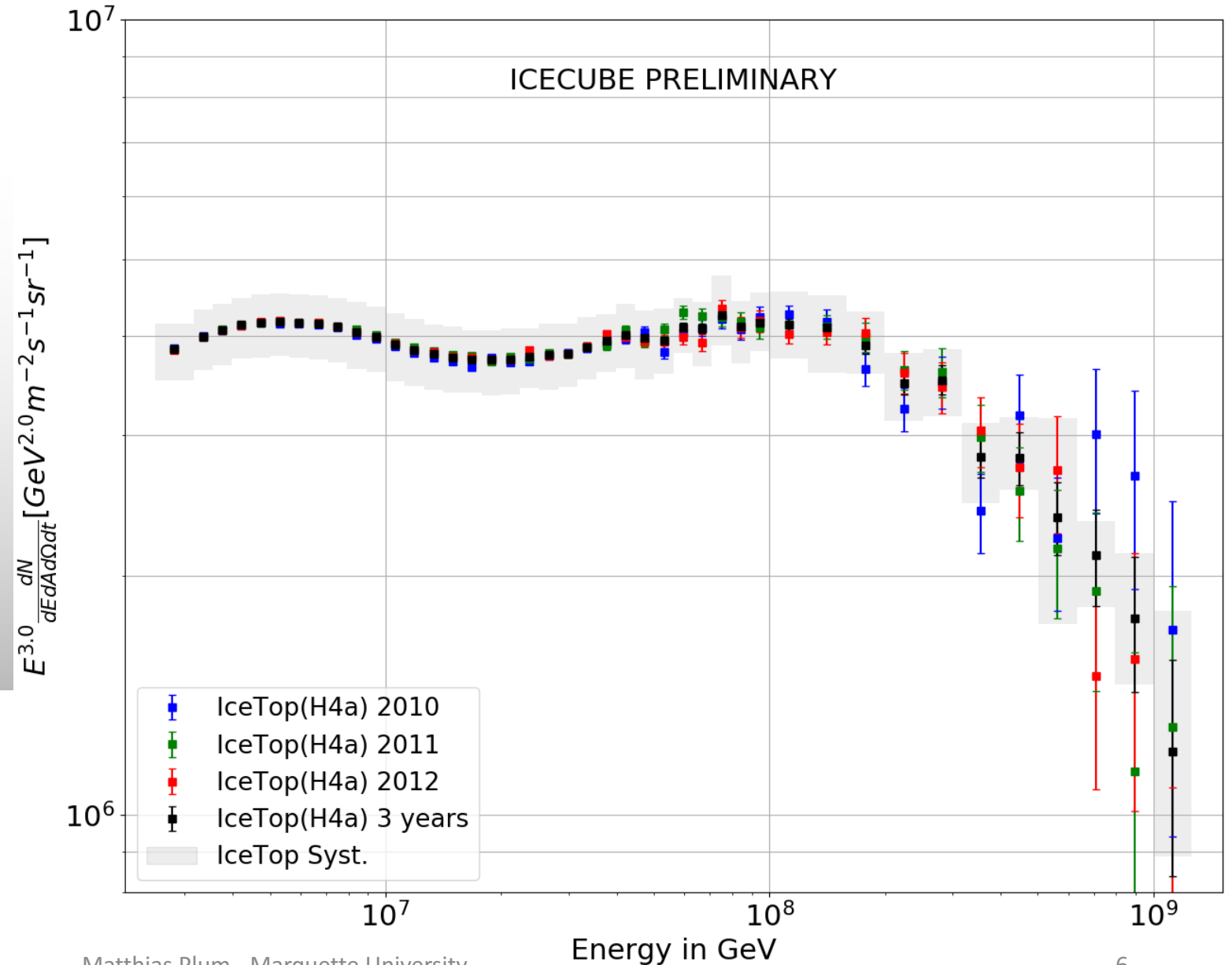
# Energy Reconstruction & Resolution



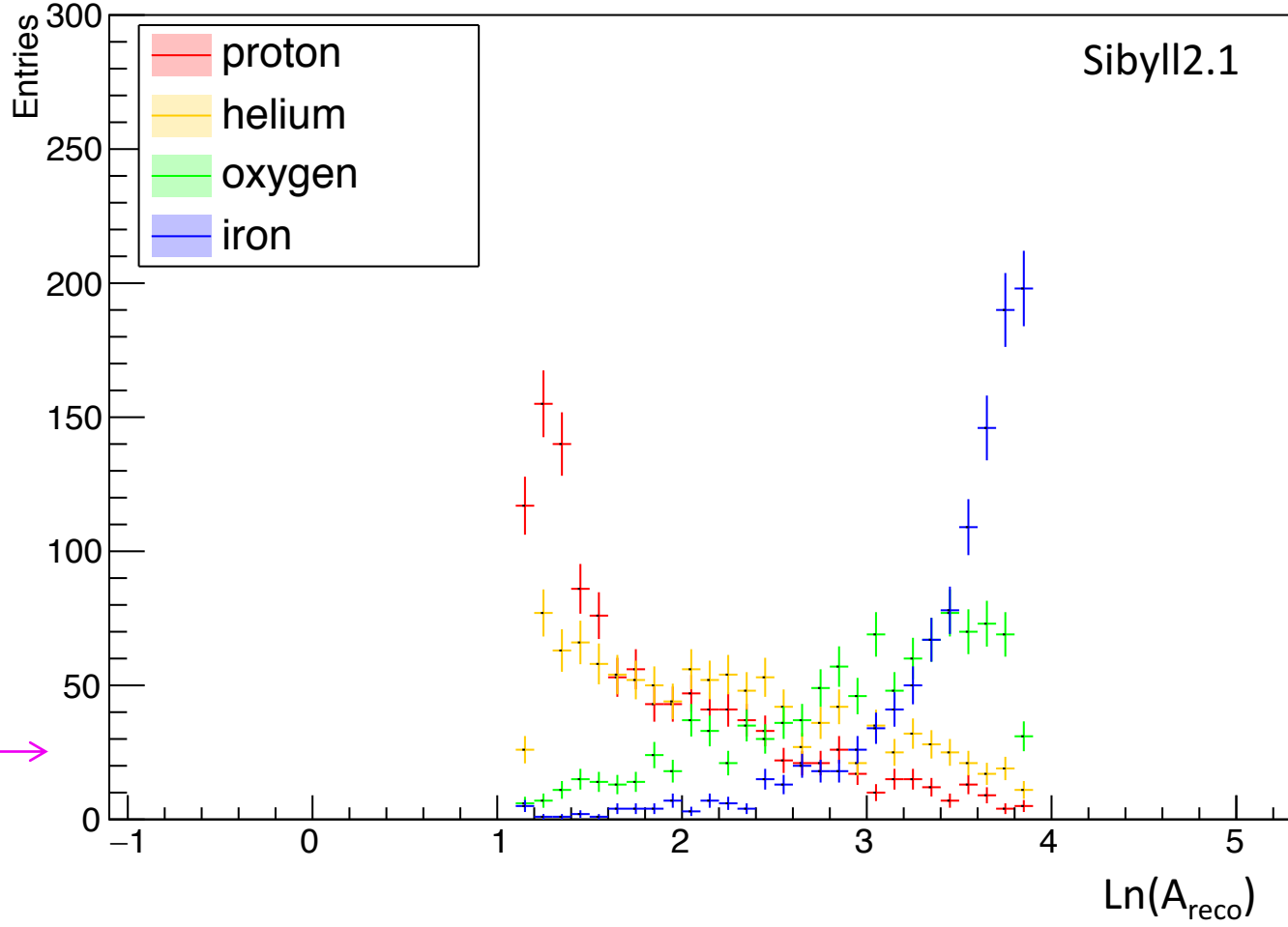
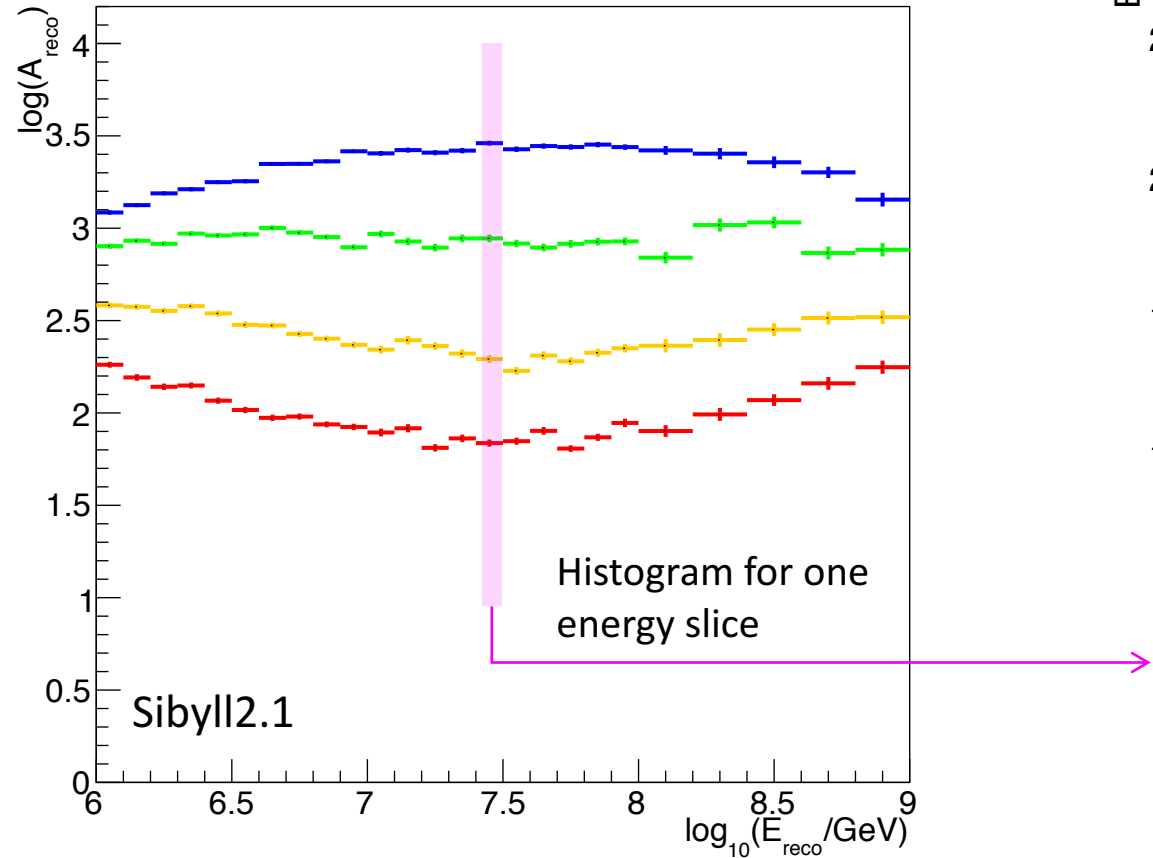
Both analyzes have a small energy bias and and a tight resolution

# Energy Spectrum IceTop Only

- Total uptime from June 2010 to May 2013 - 977.6 days
- Composition assumption from H4a model
- Divided data set into individual years show good agreement with each other



# Mass Reconstruction



- Mass types reconstruction needs an extra step
  - Event-by-event classification not possible

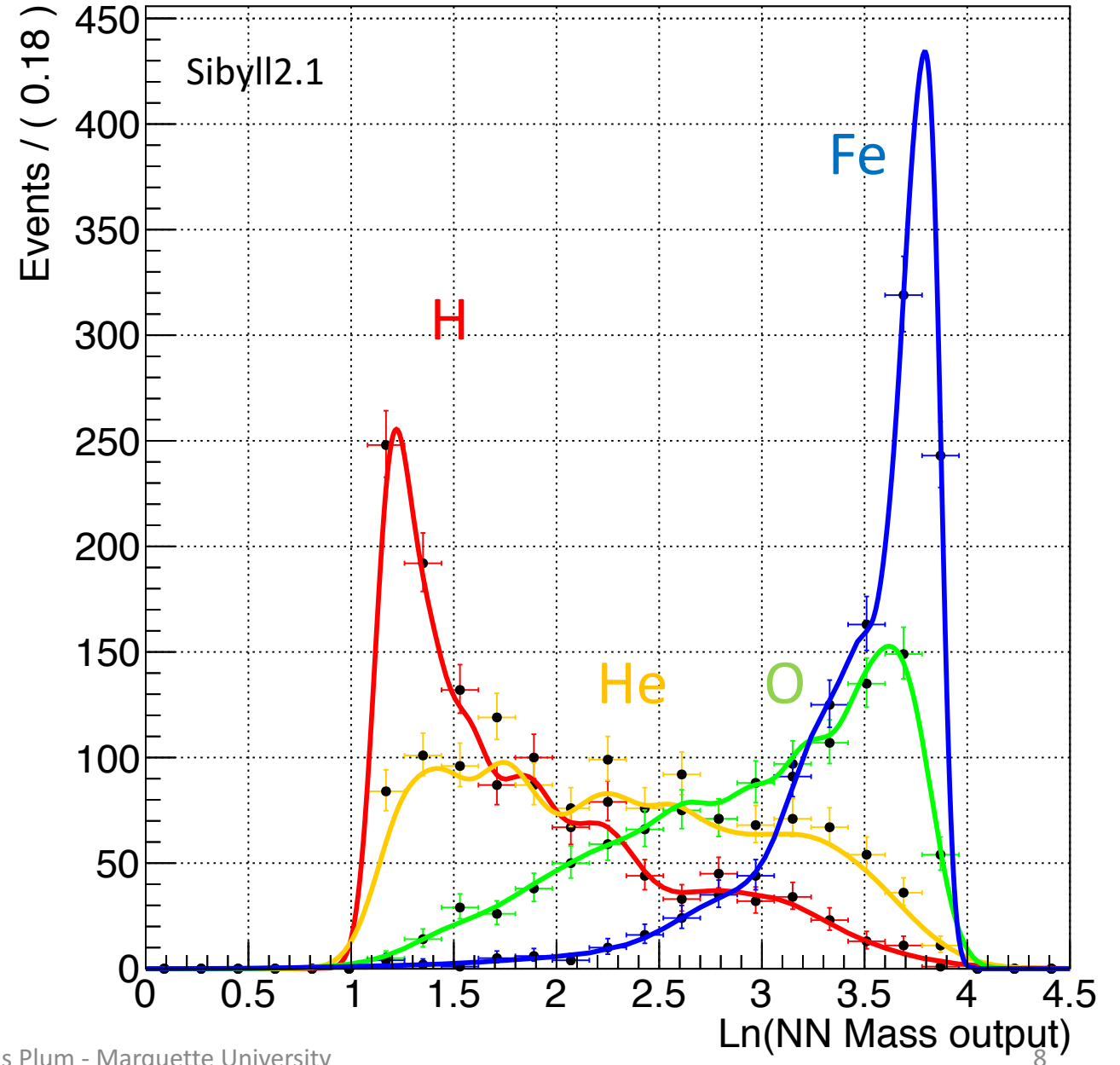


Analyze mass as a function of energy on statistical bases

# KDE templates

- Monte Carlo data converted into template 'probability density functions' (PDF) for each primary in each energy bin
- Used adaptive Gaussian kernel width to preserve characteristic features of neural net output
- PDFs used in extended Likelihood analysis

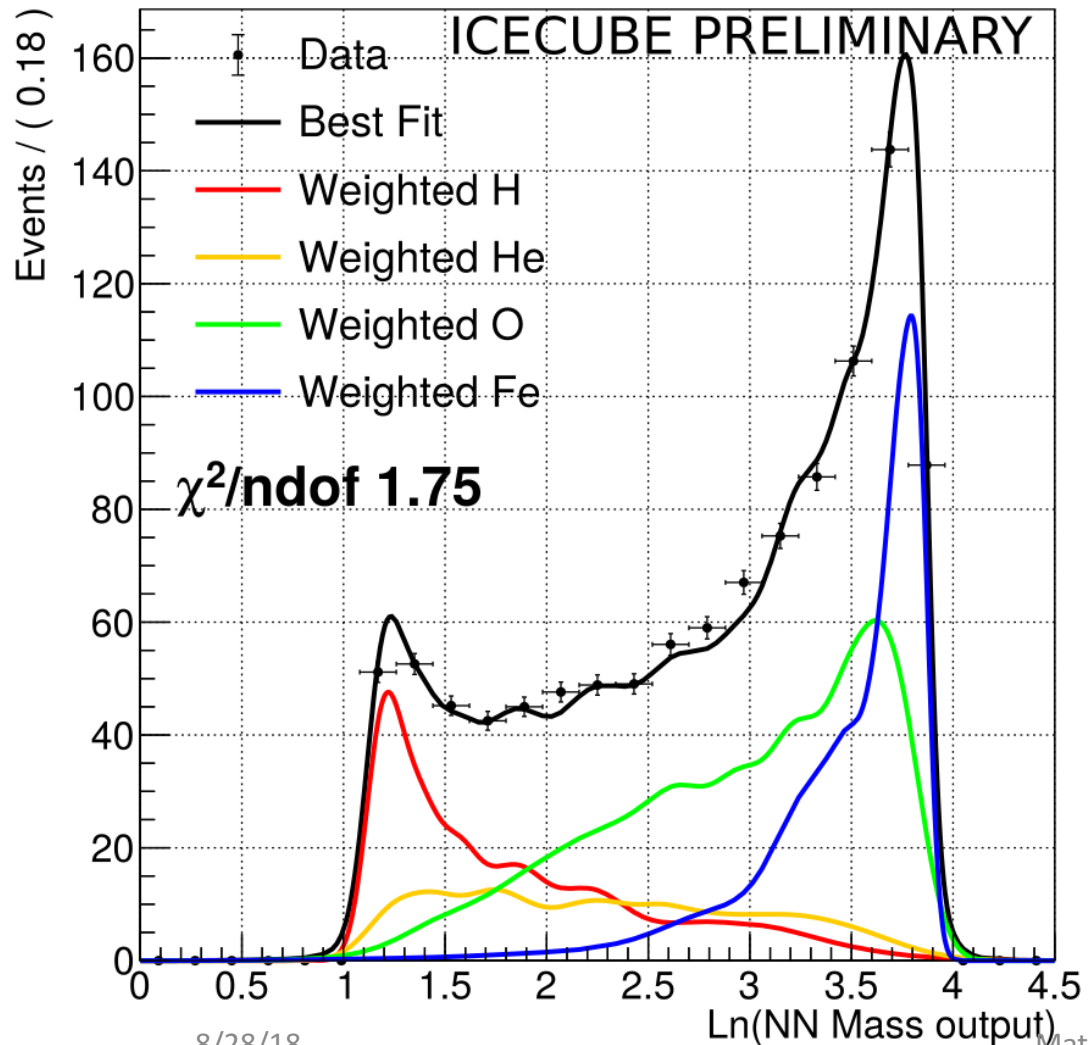
Log(E/GeV): 7.4 - 7.5



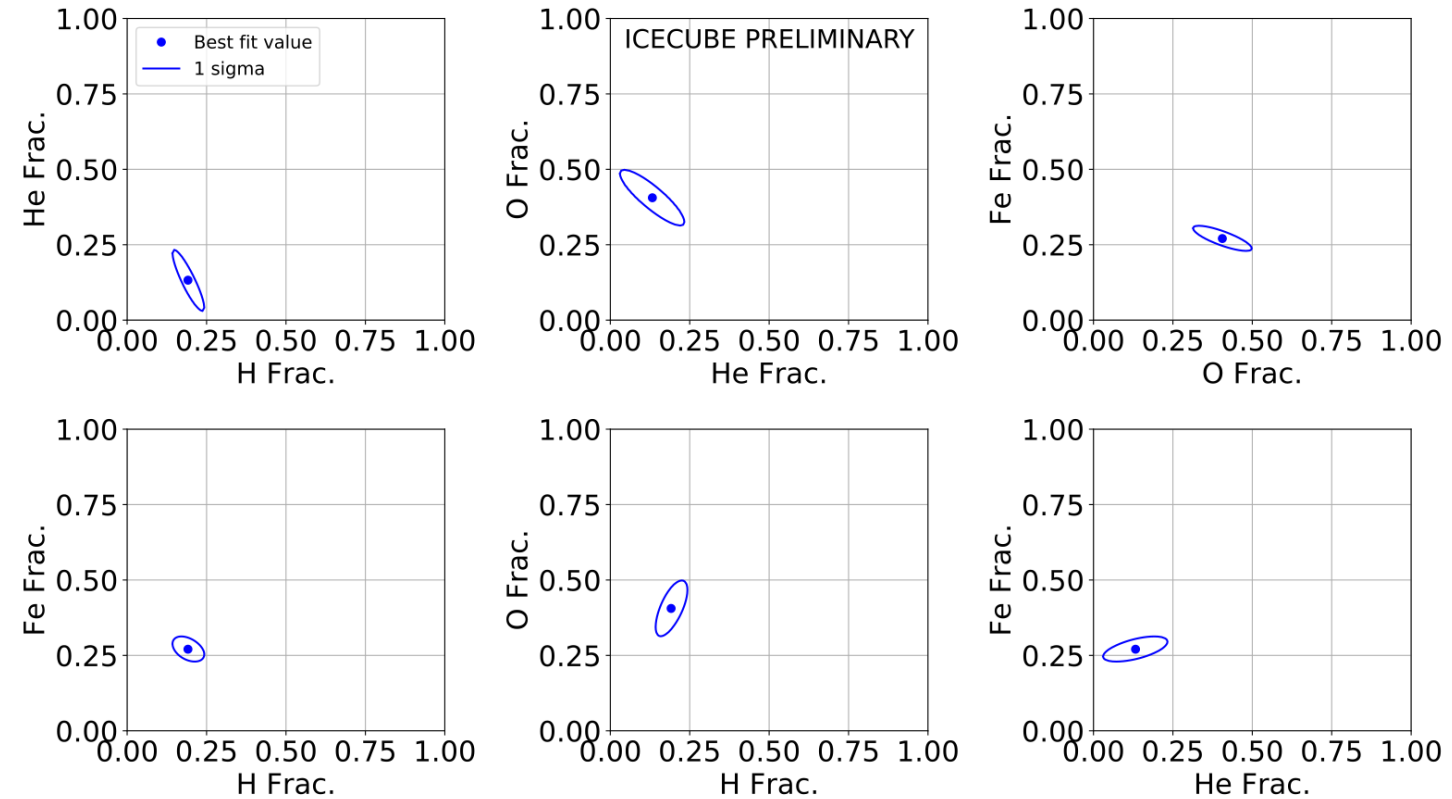


# Application to Data – Example Bin

Energy Log(E/GeV): 7.45

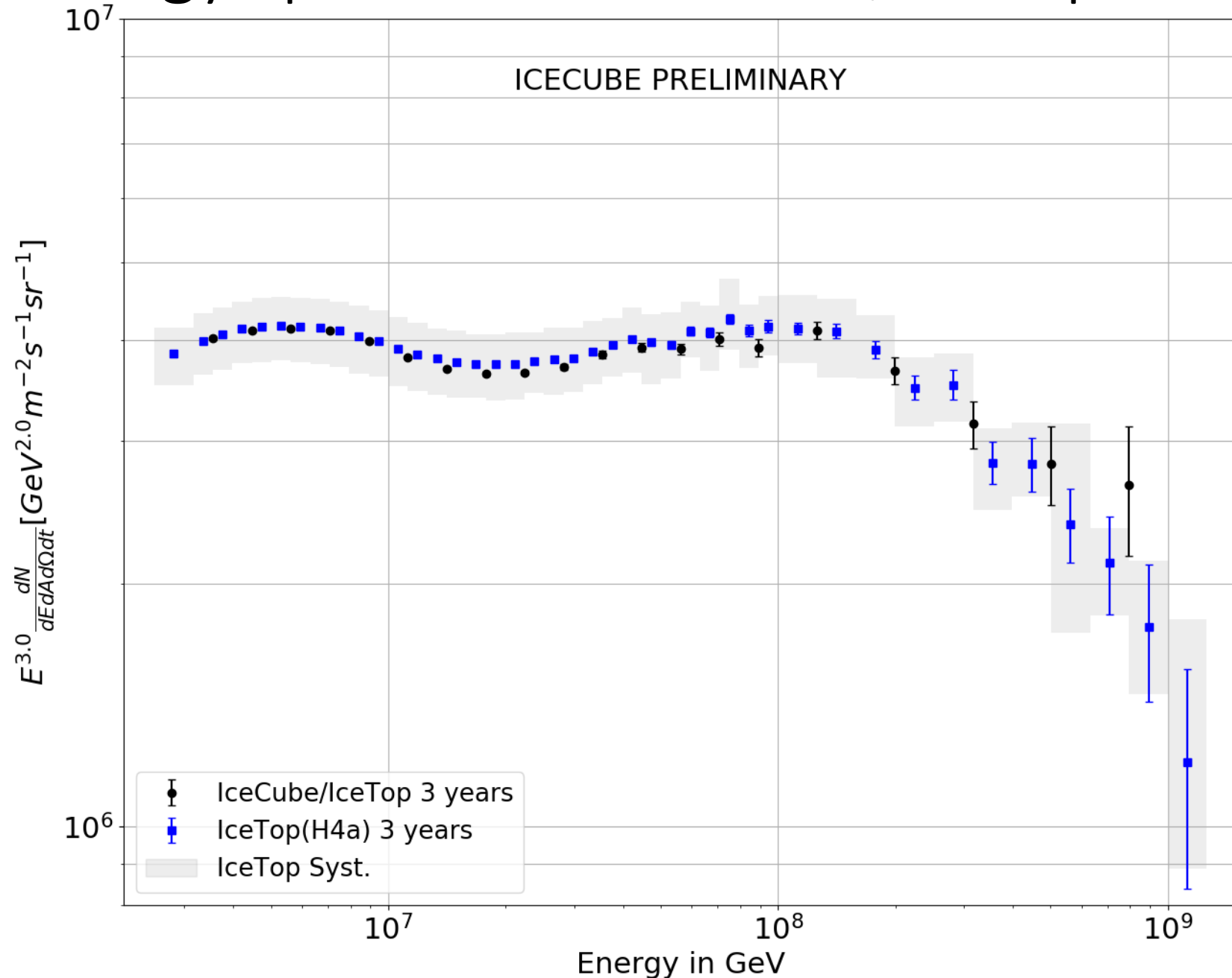


Log(E/GeV): 7.45



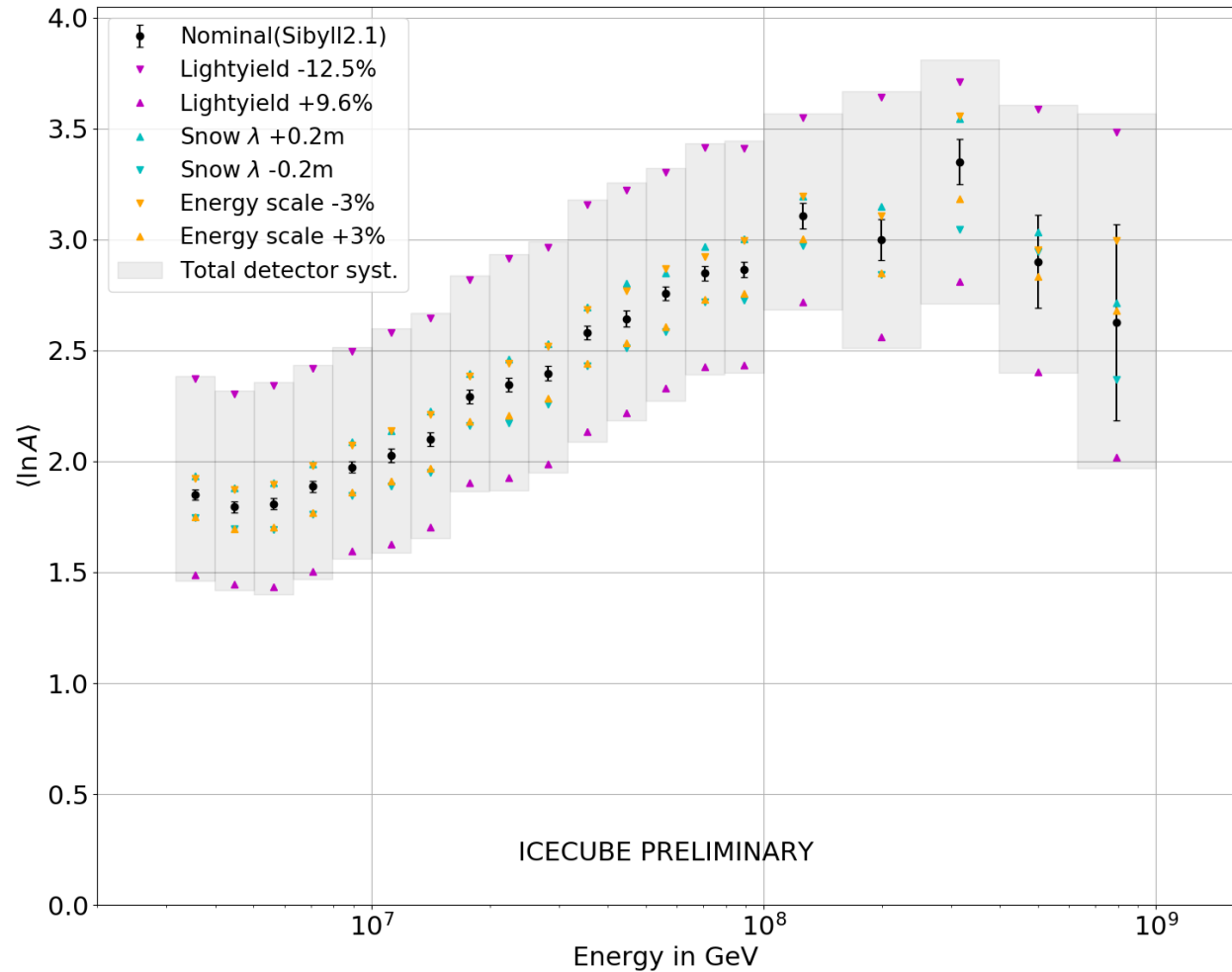
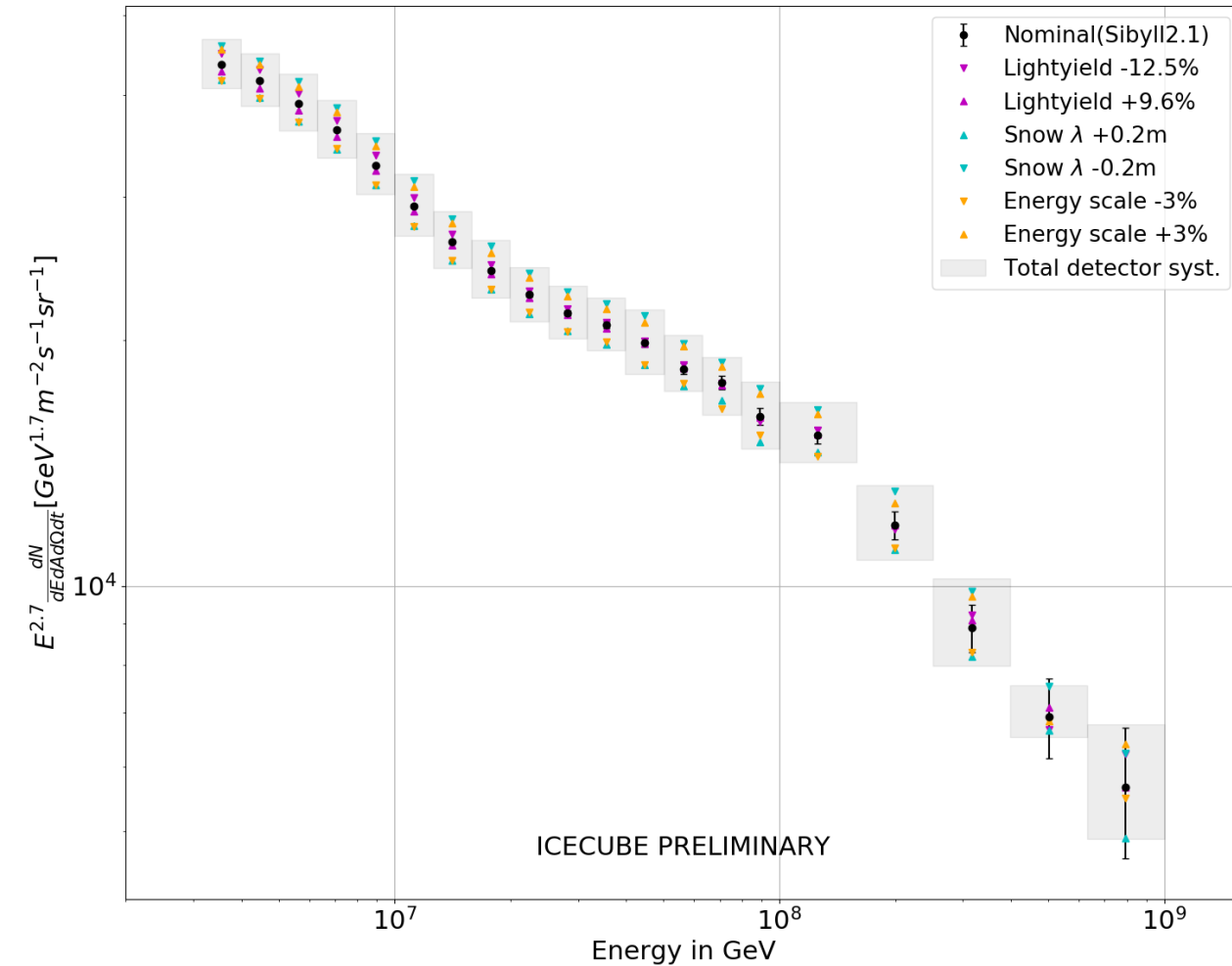
- Data in each energy bin are weighted with corresponding sets of templates
- Weights correspond to a mass fraction
- Strong correlation between neighboring primaries

# Energy spectrum - IceCube/IceTop vs. IceTop Only



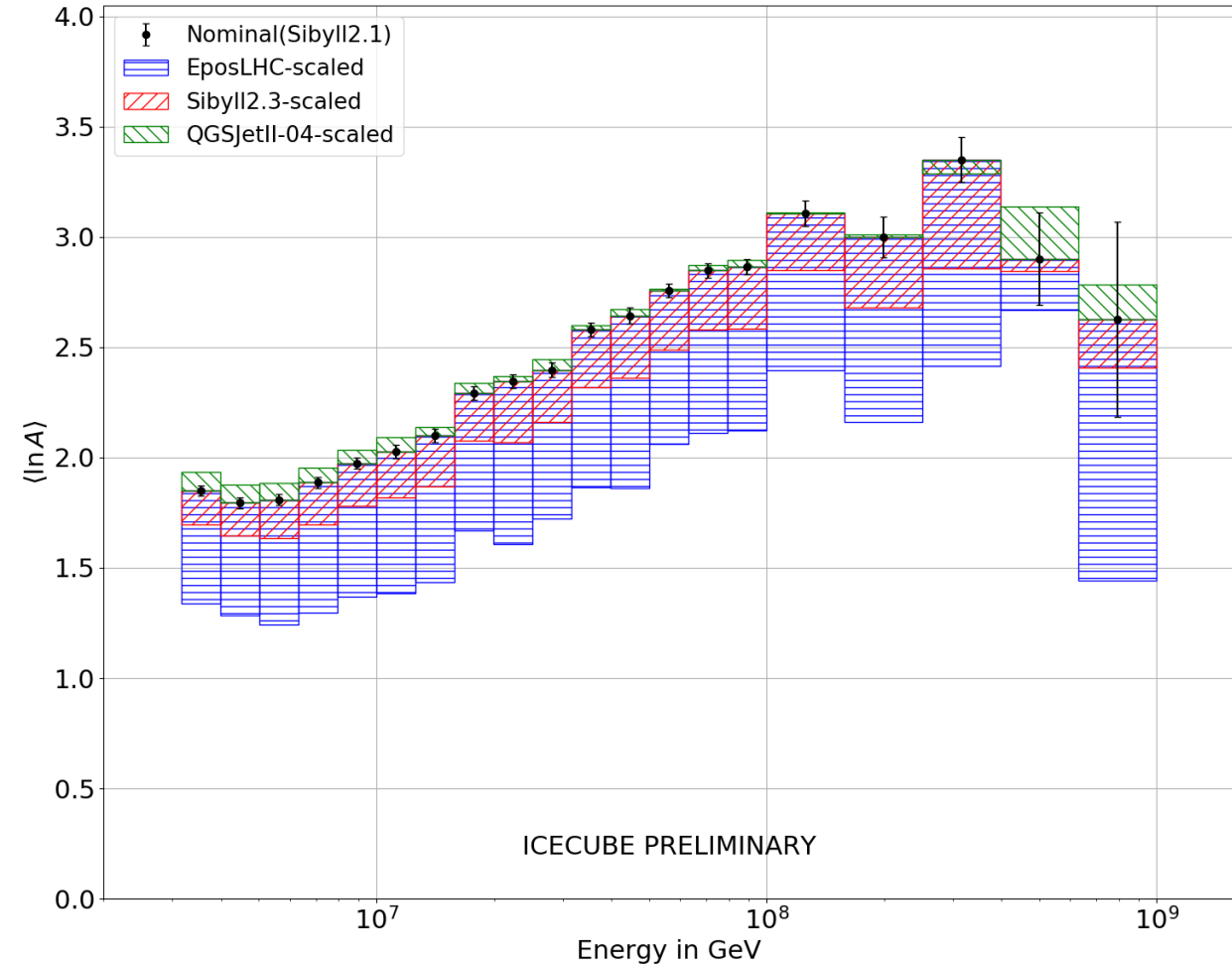
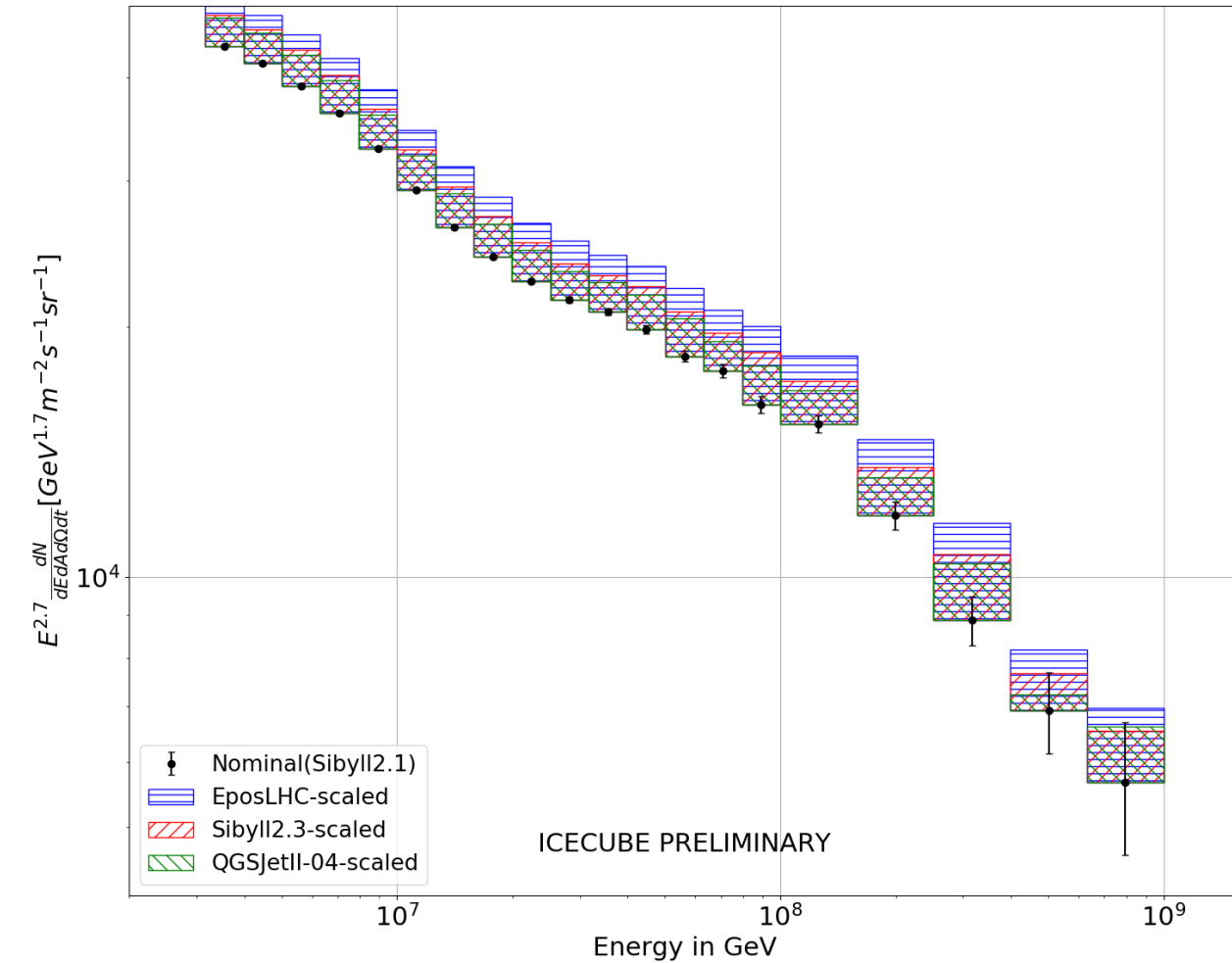
- Due to constrains for the coincidence analysis smaller energy range than IceTop Only
- Good agreement between the energy spectra of both analyses methods

# Detector Systematic Uncertainty



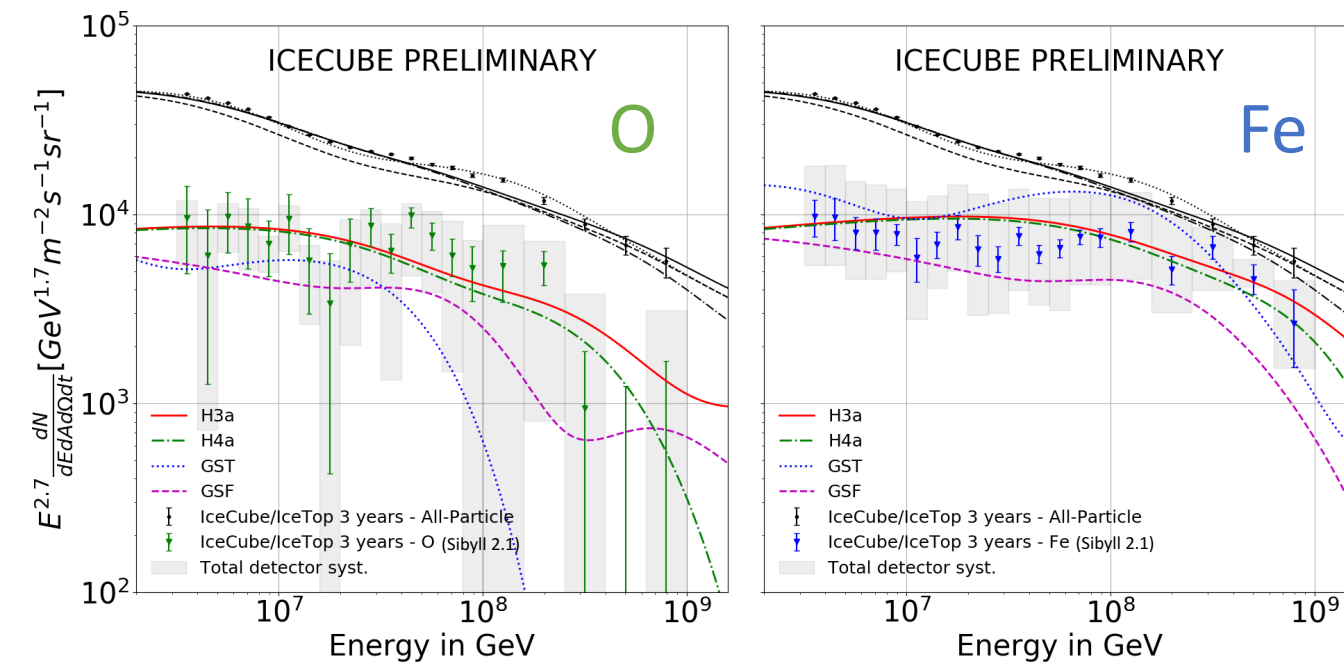
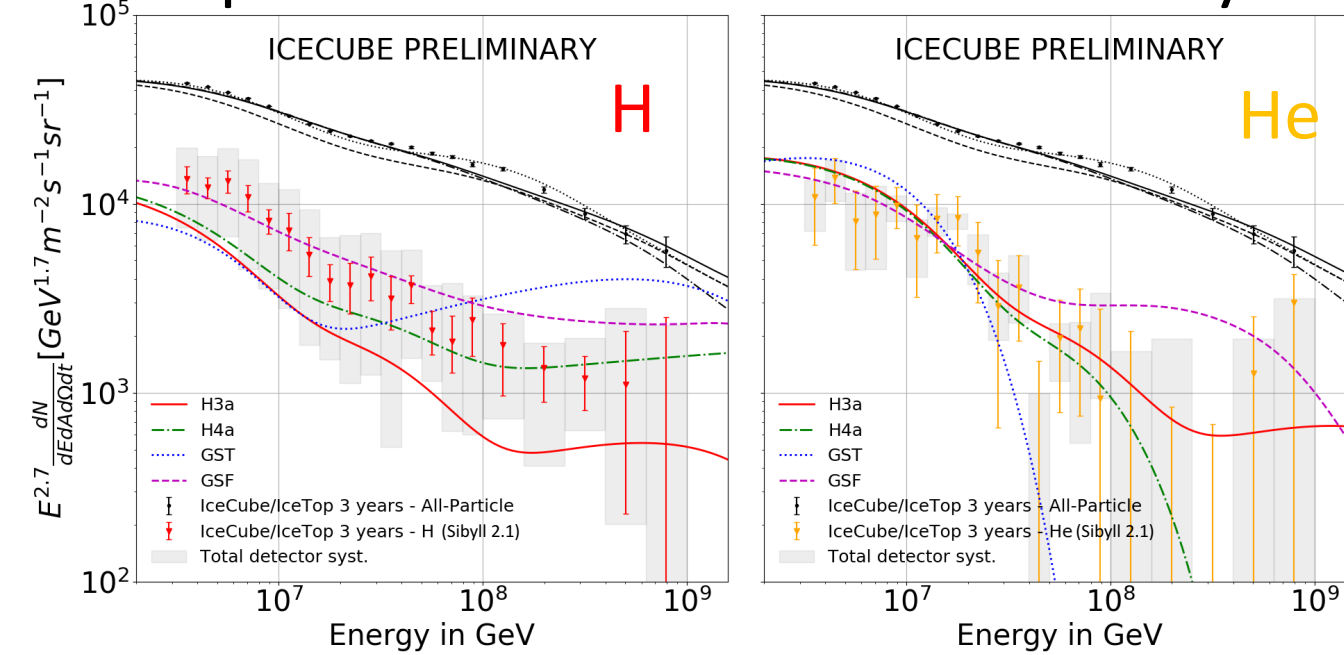
• Snow, light yield and energy scale uncertainty result in systematic offsets on flux and  $\langle \ln(A) \rangle$

# Hadronic Systematic Uncertainty



- Scaling data according to differences in detector response due to interaction models result in uncertainty region in the flux and the  $\langle \ln(A) \rangle$

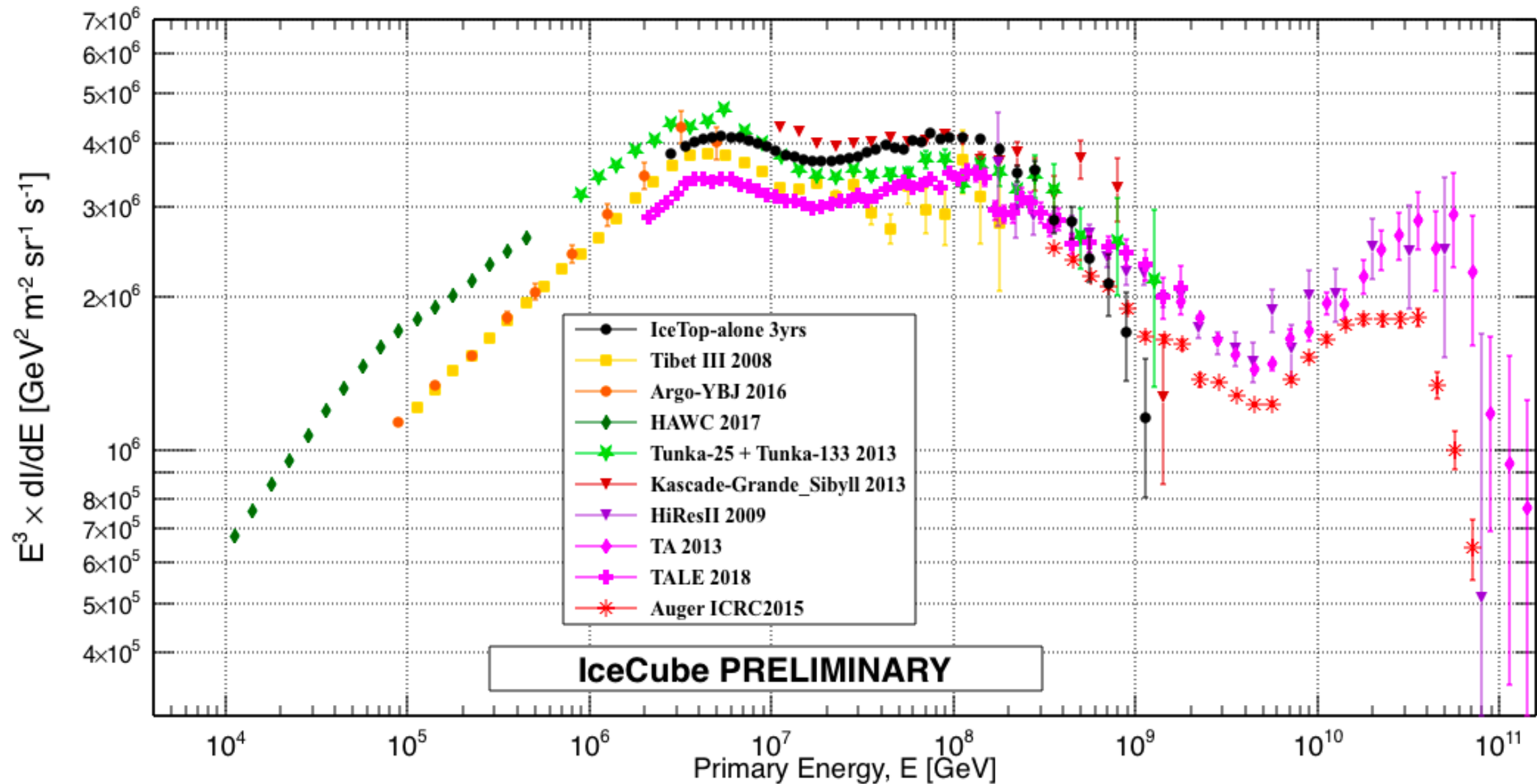
# Comparison with Cosmic Ray Composition Model & Fits



- Models:
  - H3a and H4a
- Fits:
  - GST [T. Gaisser, T. Stanev & S. Tilav 2013]
  - GSF (Global spline fit) [H. Dembinski, R. Engel, A. Fedynitch, T. Gaisser, F. Riehn, T. Stanev 2017]

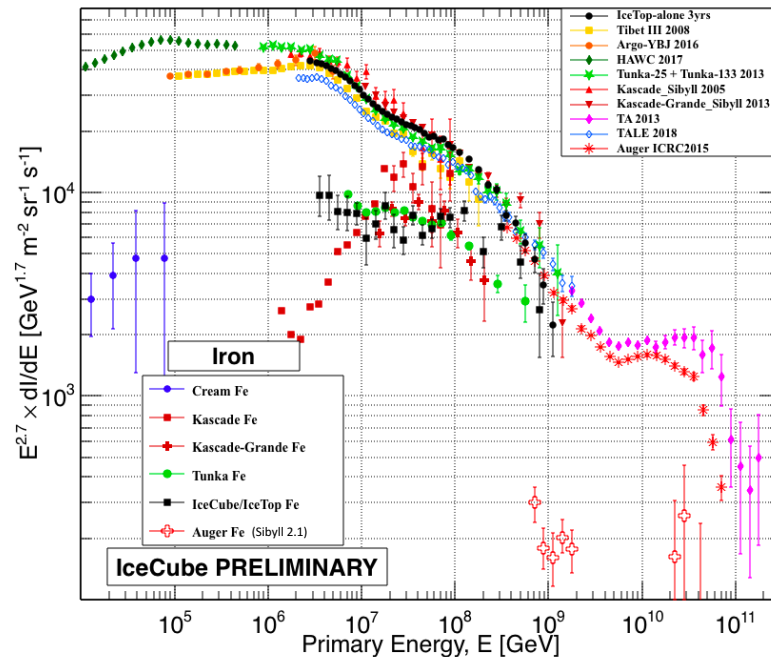
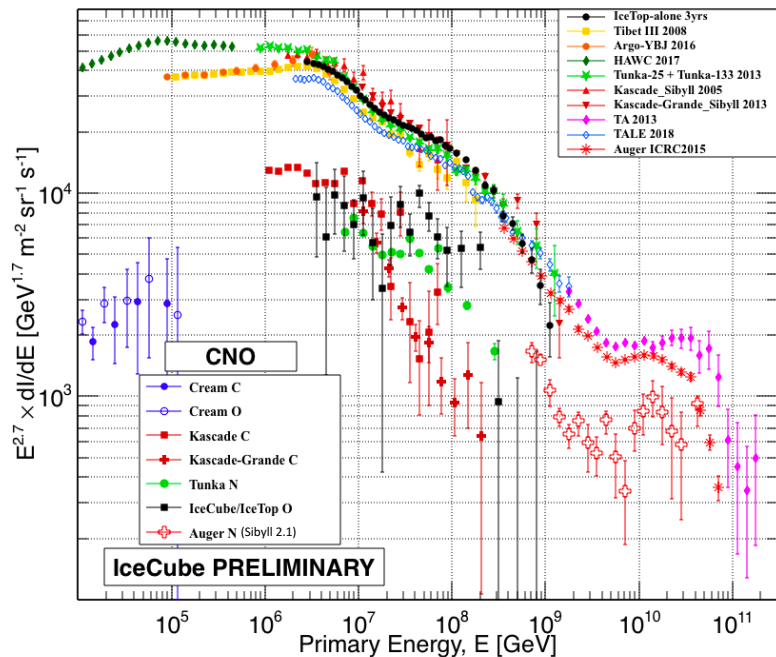
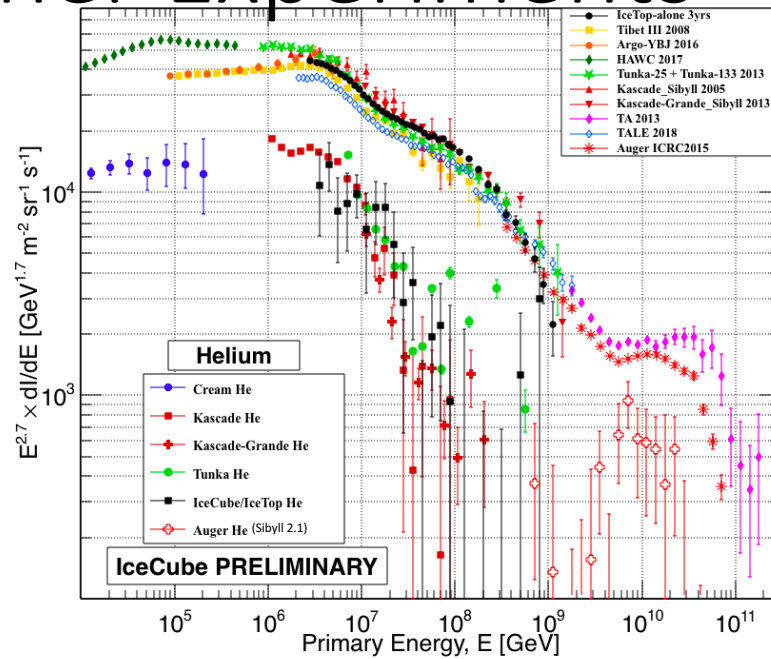
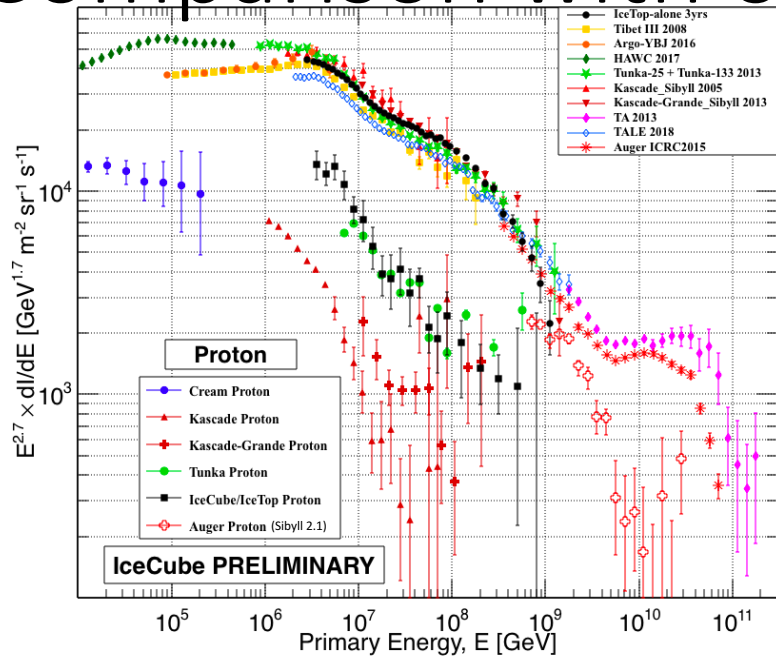
➤ Inside statistical and systematic uncertainties good agreement with the predicted models

# Comparison with other Experiments



Overall good agreement of with results from other experiments

# Comparison with other Experiments



- Composition seems to get heavier with increasing energy up to 10<sup>8</sup> GeV
- Overall good agreement with the composition results from most other experiments

# Summary

- Evolution of CR energy spectrum and mass composition is studied
  - Composition is getting heavier with increasing energy up to  $10^8$  GeV
  - Individual spectra shown in the energy range from  $10^{6.5}$  –  $10^9$  GeV
- Good agreement with cosmic ray composition models and fits
- Good agreement with results of other experiments

# Future Prospects

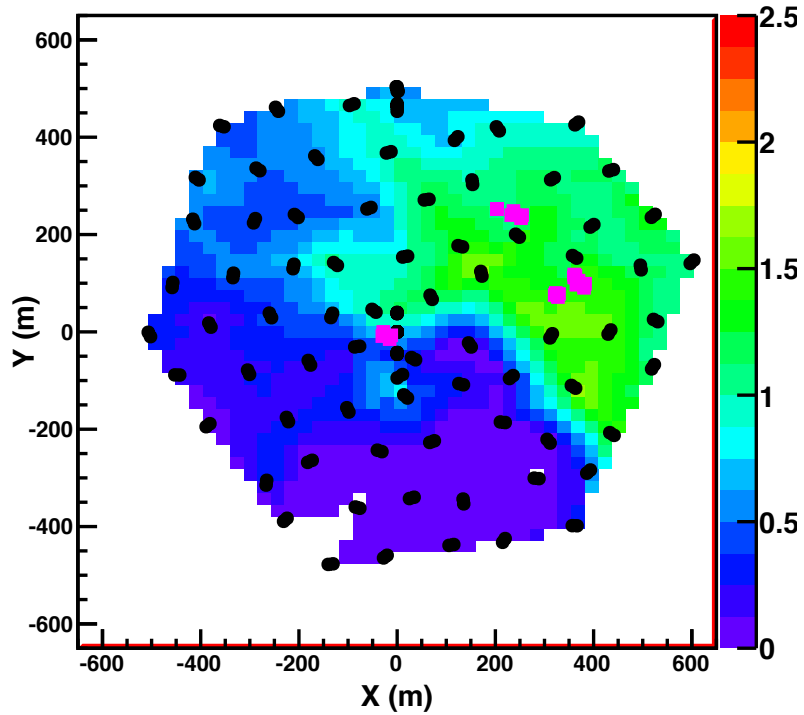
- Systematical uncertainties will be reduced by:
  - Improved detector systematics
  - Improved simulations and reconstruction
  - Improvements to hadronic interaction models in air shower simulation



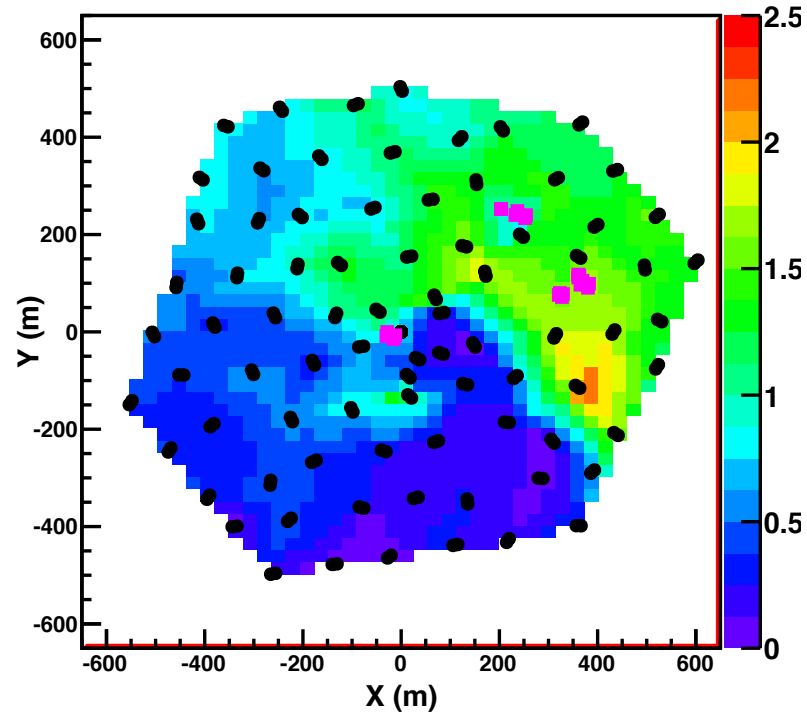
# Backup

# Snow accumulation

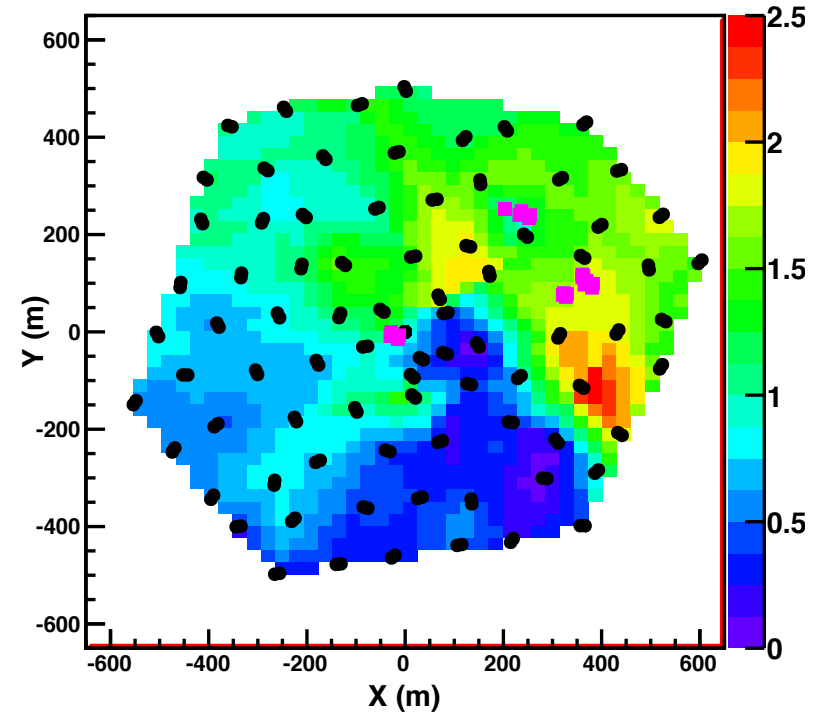
2010 November

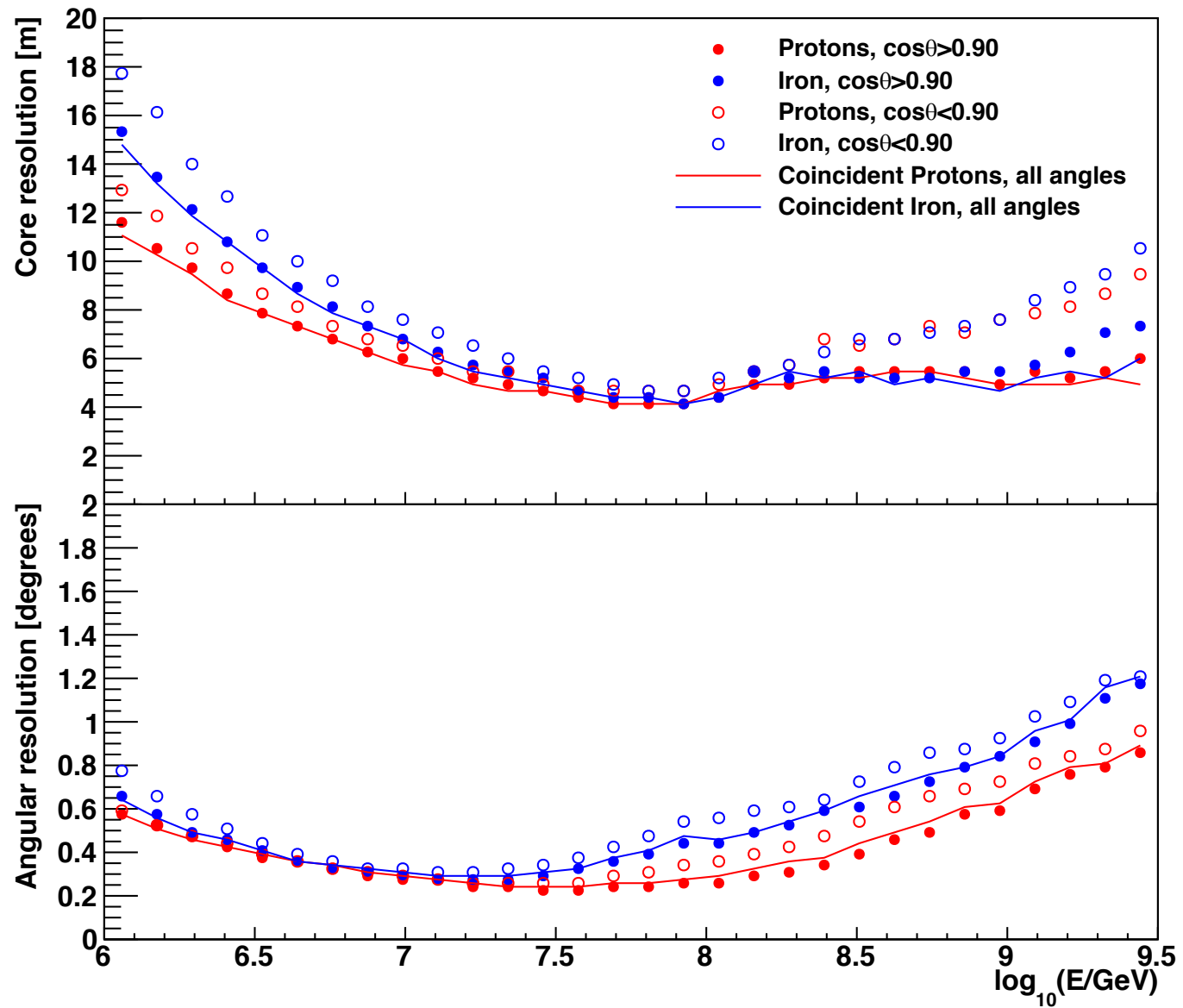


2011 November



2012 November





# Superposition Model of Mass Composition PDFs

Total PDF for all nuclear mass cosmic rays is given by  
(our model only use 4 typical components (H,He,O,Fe))

$$f(\mathbf{x}; \boldsymbol{\theta}) = \sum_{i=1}^m \theta_i f_i(\mathbf{x}),$$

Due to the constraint, one fraction parameter can be substituted

$$\theta_m, \text{ by } 1 - \sum_{i=1}^{m-1} \theta_i$$

## With Extended LogLikelihood:

- Poisson fluctuations included
- Advantage of extended LL is to have a more symmetrical fit problem (easier fitting and error calculation)
  - 4 free fit parameter

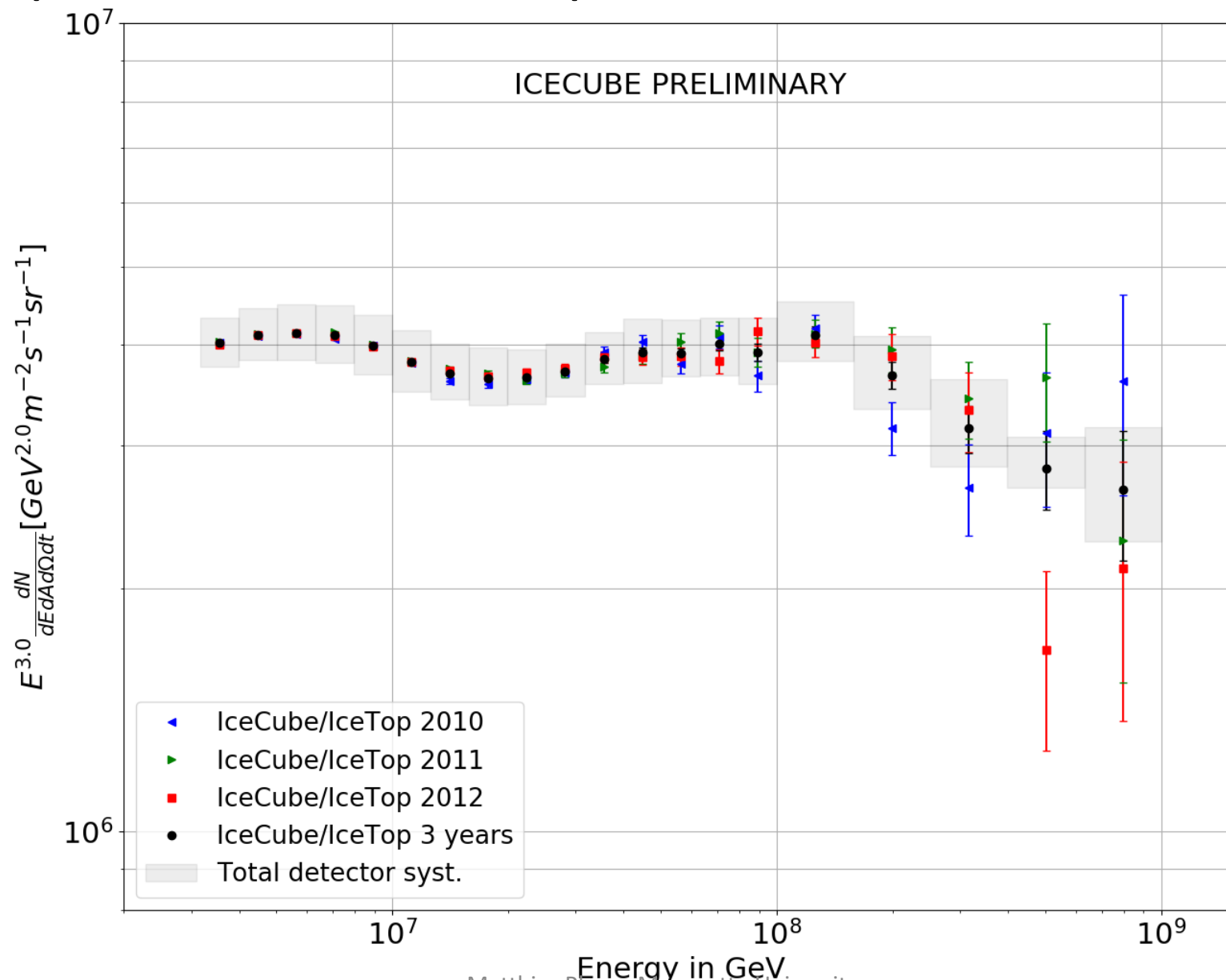
$$\log L(\nu, \boldsymbol{\theta}) = -\nu + \sum_{i=1}^n \log \left( \sum_{j=1}^m \nu \theta_j f_j(\mathbf{x}_i) \right)$$

- By using  $\mu_i = \theta_i \nu$  follows

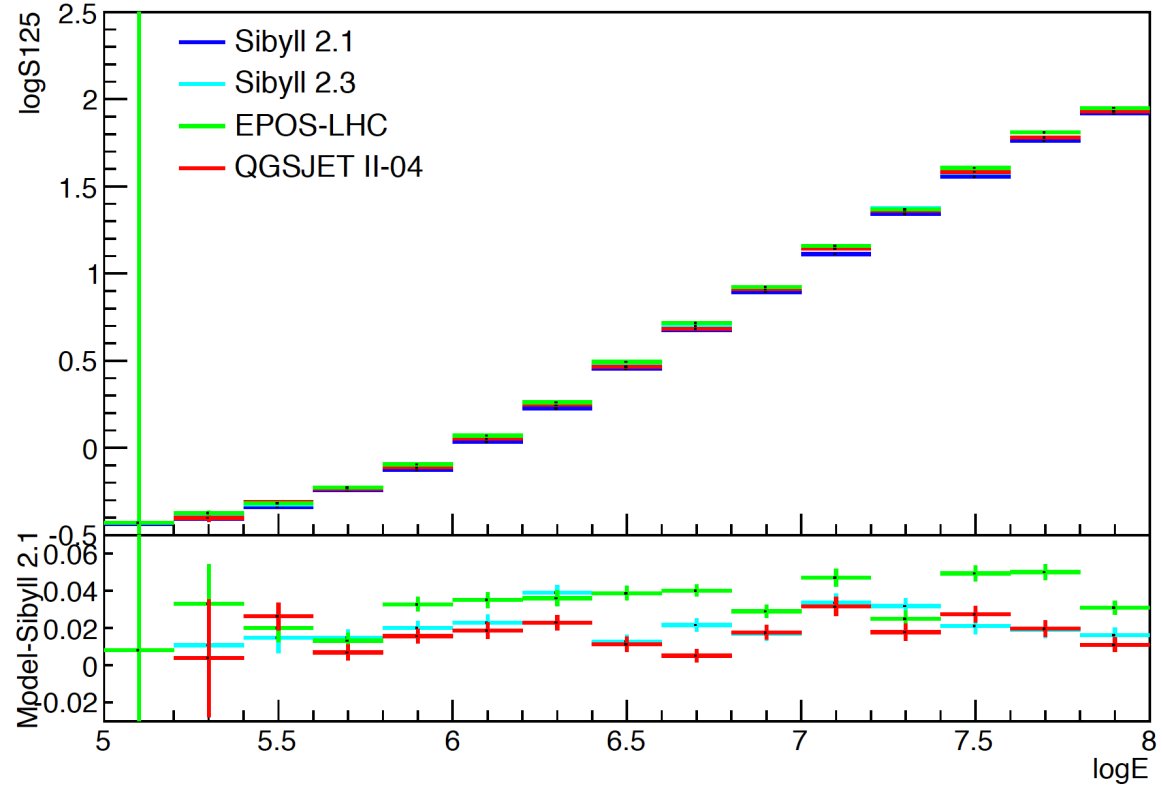
$$\log L(\boldsymbol{\mu}) = -\sum_{j=1}^m \mu_j + \sum_{i=1}^n \log \left( \sum_{j=1}^m \mu_j f_j(\mathbf{x}_i) \right)$$

Fit result gives now the number of events per mass species, which we need for the energy spectrum

# Energy Spectrum IceTop/IceCube



# $S_{125}$ shift



# dEdX shift

