

# Event-by-event reconstruction of air-shower events with IceCube using a two component lateral distribution function

Mark Weyrauch for the IceCube Collaboration



# Two Component LDF - Motivation

## ■ “Muon Puzzle”

- Mismatch between data and simulations in low energy muon content

→ Constraints necessary for future model improvements

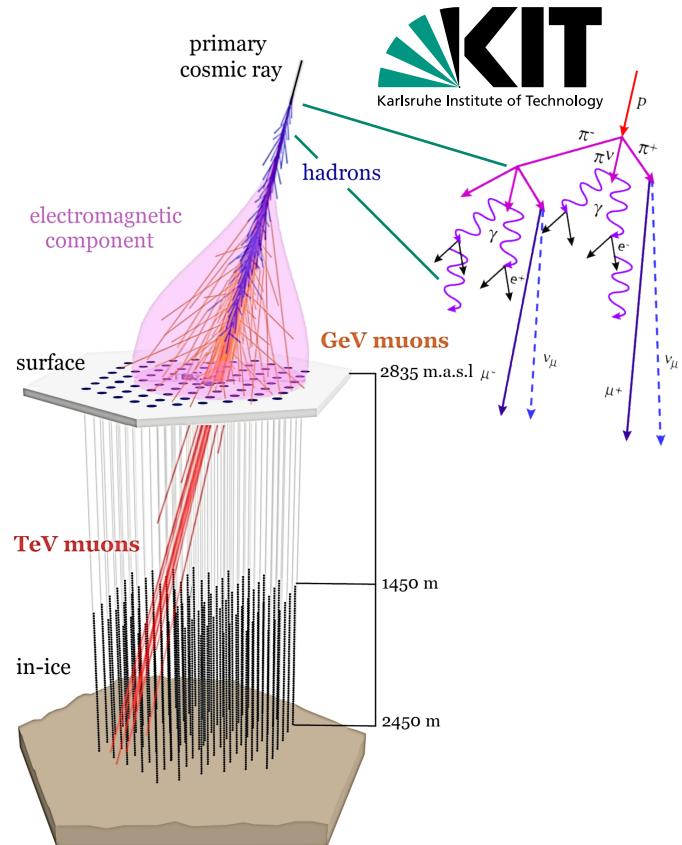
## ■ Unique role of IceCube

- Coincident measurement of low-energy (~GeV) muons & high-energy (~TeV\*) muons

→ Ideal for tests of hadronic interaction models

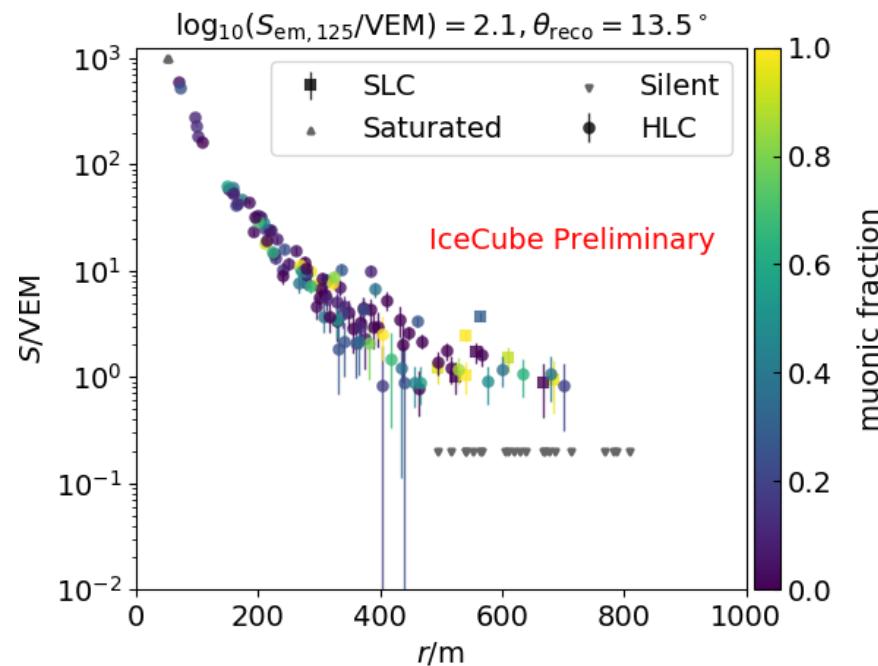
- Missing piece: event-by-event based GeV muon estimator

→ **emLDF + muLDF = Two Component LDF**



# IceTop Signal Classification

- “Hard Local Coincidence” (**HLC**) hits
  - Both tanks in one station hit within  $1\mu\text{s}$ 
    - **full station triggers**
    - dominant **close to axis**
- “Soft Local Coincidence” (**SLC**) hits
  - **single tank triggers**
  - dominant **far from axis**
- “Silent” hits
  - tanks without trigger



# Two Component LDF – Basic Idea

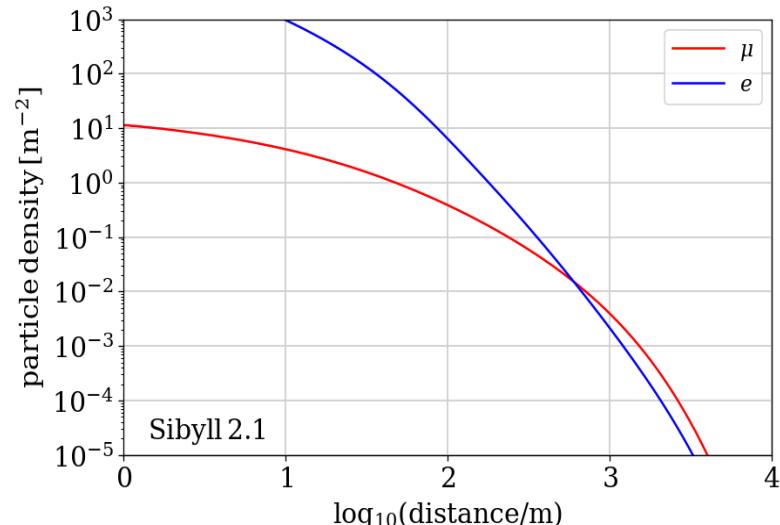
$$S_{\text{em}}(r) = S_{\text{DLP}} = S_{\text{em},125} \left( \frac{r}{125 \text{ m}} \right)^{-\beta_{\text{em}} - \kappa \log \left( \frac{r}{125 \text{ m}} \right)}$$

$$\kappa = 0.255 \cdot \log_{10} S_{\text{em},125} + 1.01$$

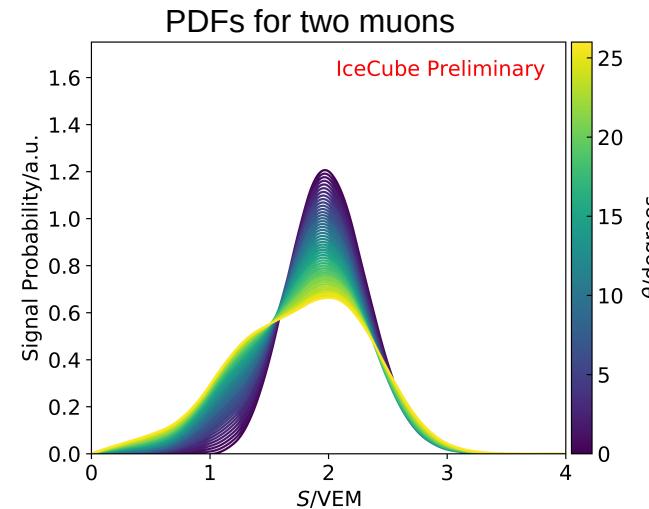
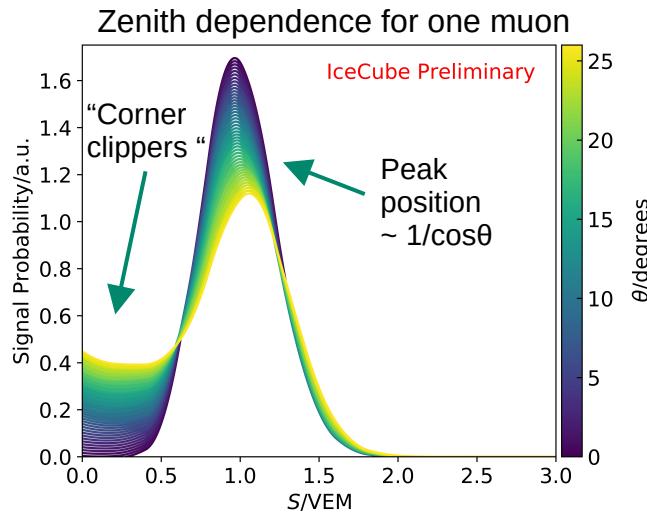
$$S_{\mu}(r) = S_{\mu,600} \left( \frac{r}{R_{\mu}} \right)^{-\beta_{\mu}} \left( \frac{r+320 \text{ m}}{R_{\mu}+320 \text{ m}} \right)^{-\gamma}$$

**Combined fit of em & mu signal model**

- **em contribution** dominant close to the shower axis → HLCs
- **μ contribution** more significant at **large distances** → SLCs
- This talk: **vertical ( $\theta < 26^\circ$ ) showers** produced with **Sibyll2.1**



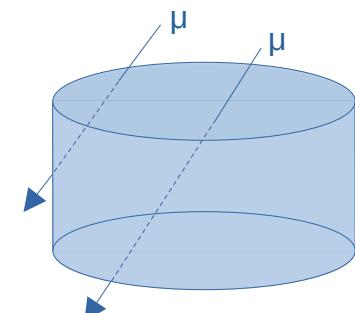
# Muon Signal PDF



■  $p_{\text{sig}}(S|\theta, n)$

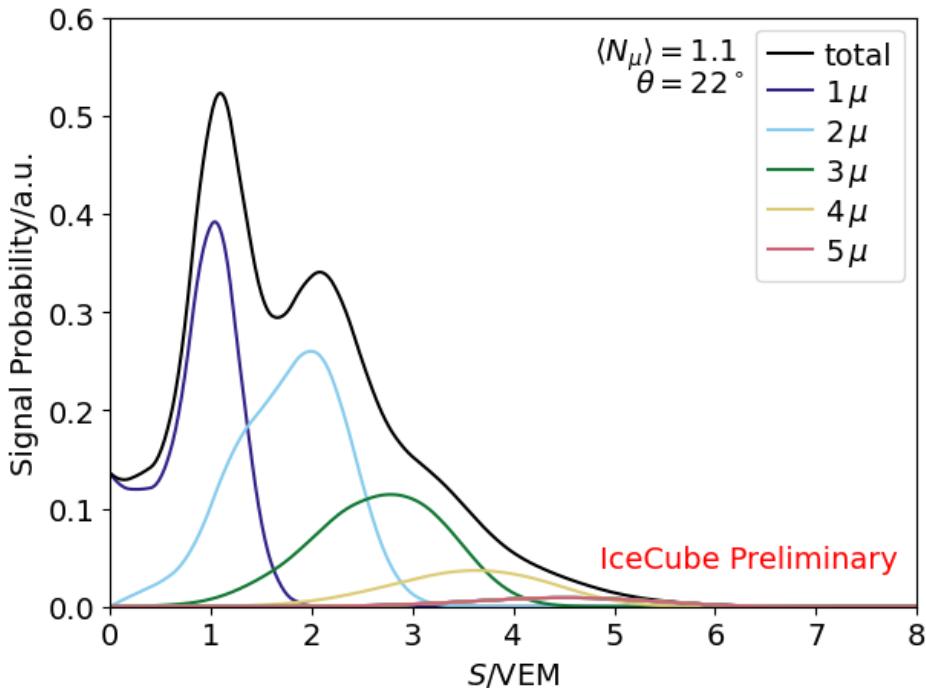
→ probability to observe signal  $S$  given  $n$  muons &  $\theta$

→ assuming **muons** propagate along primary direction



- IceTop tank response for different  $n, \theta$  saved as spline fits
- Muon signal  $\sim$  track length

# Muon Signal PDF

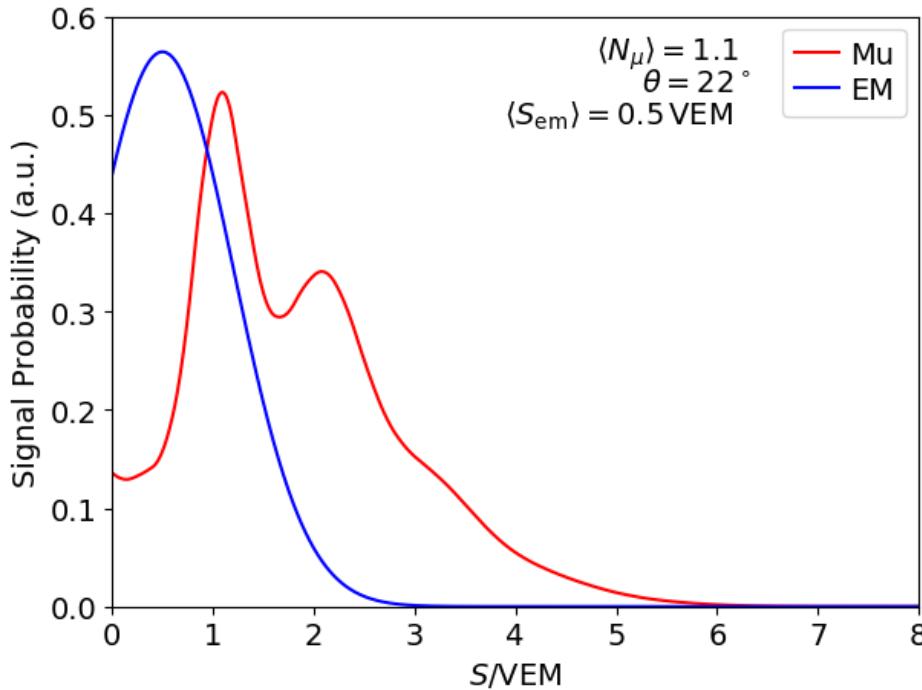


■ Total muon signal PDF for expected average number of muons  $\langle N_\mu \rangle$  (given by muonLDF \* tank area)

$$p_\mu(S|\theta, \langle N_\mu \rangle) = \sum_{n=1}^{\infty} \frac{\langle N_\mu \rangle^n}{n!} e^{-\langle N_\mu \rangle} p_{\text{sig}}(S|\theta, n)$$

→  $p_{\text{sig}}(S|\theta, n)$  weighted by probability to observe  $n$  muons given  $\langle N_\mu \rangle$

# Total Signal PDF



■ **Total muon signal PDF** for expected average number of muons  $\langle N_\mu \rangle$  (given by muonLDF \* tank area)

$$p_\mu(S|\theta, \langle N_\mu \rangle) = \sum_{n=1}^{\infty} \frac{\langle N_\mu \rangle^n}{n!} e^{-\langle N_\mu \rangle} p_{\text{sig}}(S|\theta, n)$$

→  $p_{\text{sig}}(S|\theta, n)$  weighted by probability to observe  $n$  muons given  $\langle N_\mu \rangle$

■ **Total signal PDF** (convolution of em and mu PDF)

$$s = s_{\text{em}} + s_\mu$$

$$p(S|\theta, \langle S_{\text{em}} \rangle, \langle N_\mu \rangle) = p_{\text{trg}} \cdot \int_0^s p_{\text{em}}(S_{\text{em}}|\theta, \langle S_{\text{em}} \rangle) p_\mu(s - S_{\text{em}}|\theta, \langle N_\mu \rangle) dS_{\text{em}}$$

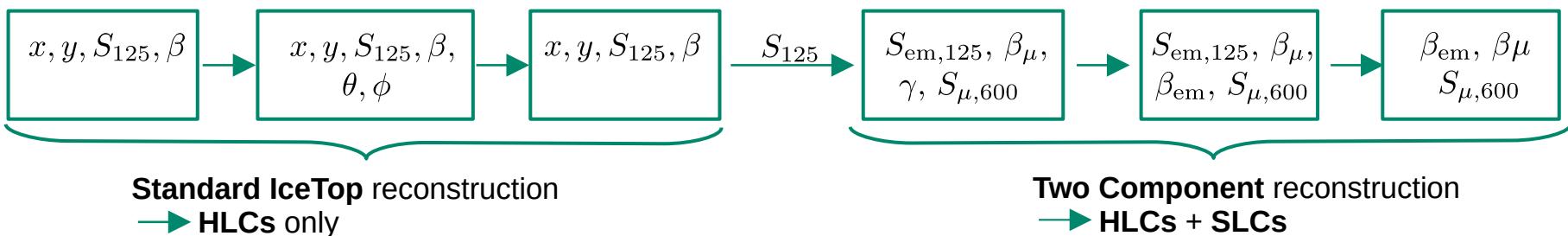
# Reconstruction Procedure

## Fit regimes:

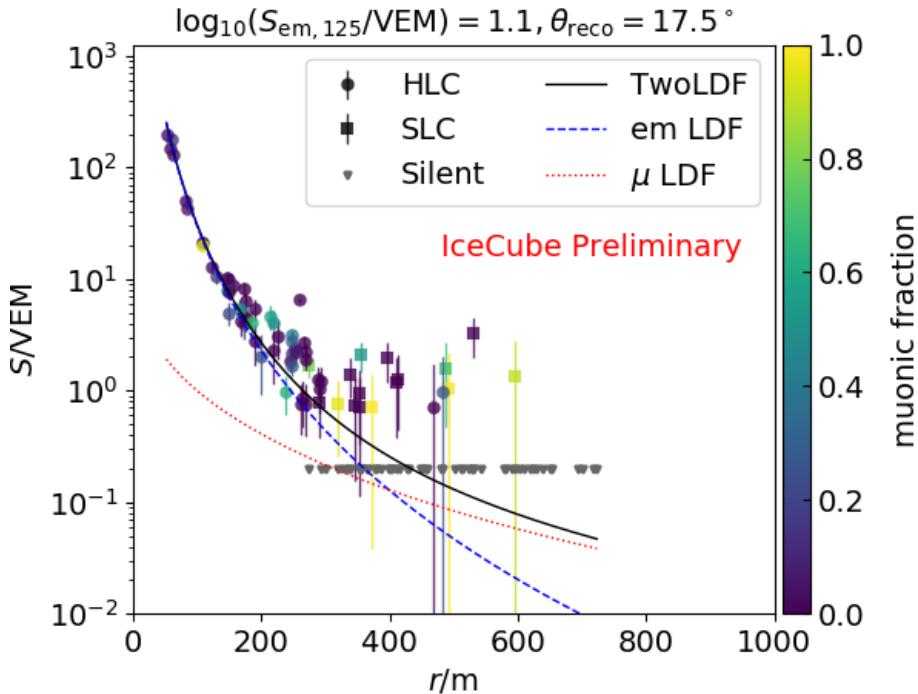
$$p_{\text{HLC}}(S|\theta, \langle S_{\text{em}} \rangle, \langle N_\mu \rangle) = p_{\text{trg}} \begin{cases} p_{\text{em}}((S - \langle S_\mu \rangle) / c_{\text{snow}} | \theta, \langle S_{\text{em}} \rangle) & , \langle S_\mu \rangle < \frac{\langle S_{\text{em}} \rangle}{2} \\ \int_0^s p_{\text{em}}(S'_{\text{em}} / c_{\text{snow}} | \theta, \langle S_{\text{em}} \rangle) p_\mu(S - S'_{\text{em}} | \theta, \langle N_\mu \rangle) dS'_{\text{em}}, \text{ else} \end{cases}$$

$$p_{\text{SLC}}(S|\theta, \langle S_{\text{em}} \rangle, \langle N_\mu \rangle) = p_{\text{trg}} \int_0^s p_{\text{em}}(S'_{\text{em}} / c_{\text{snow}} | \theta, \langle S_{\text{em}} \rangle) p_\mu(S - S'_{\text{em}} | \theta, \langle N_\mu \rangle) dS'_{\text{em}}$$

## Full 6 Step nLLH minimization procedure



# Two Component LDF – Single Fits

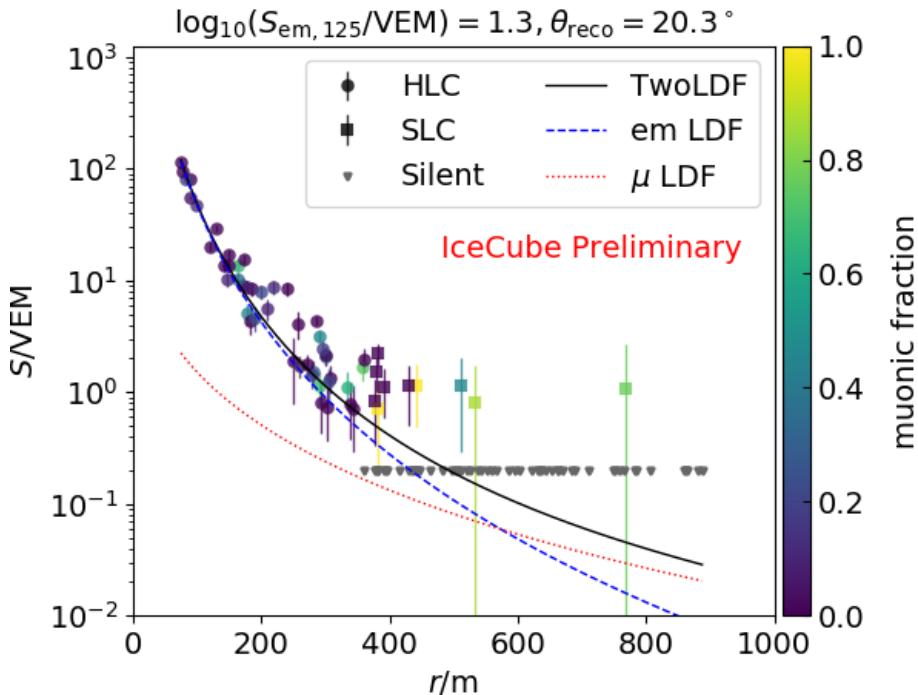


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- General behavior as expected
- $S_{\text{em}}$  describes em dominated **HLC hits** close the shower axis
- $S_{\mu}$  sensitive to muon dominated **SLC** hits at large lateral distances

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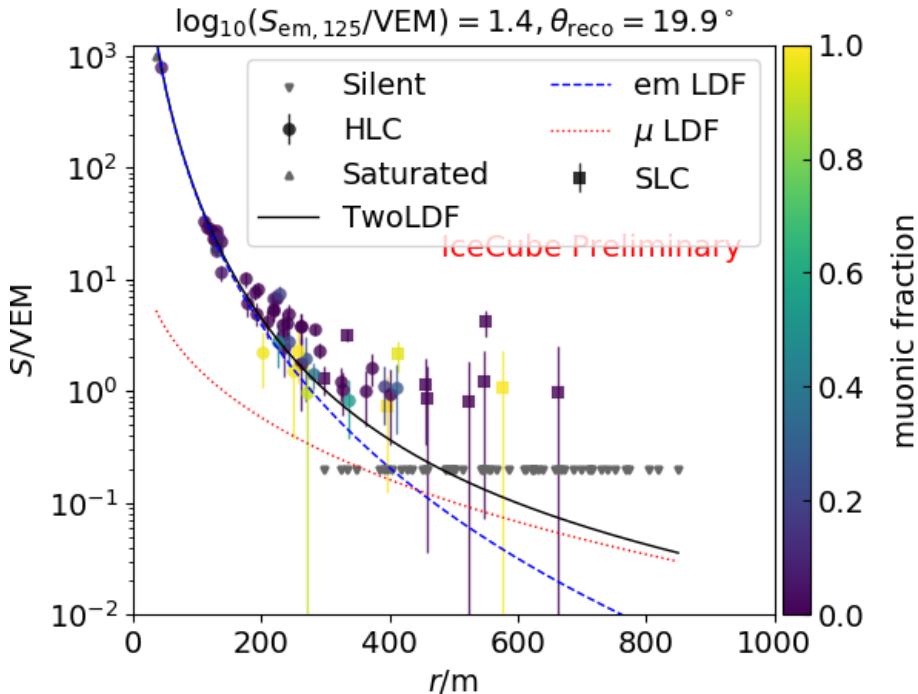


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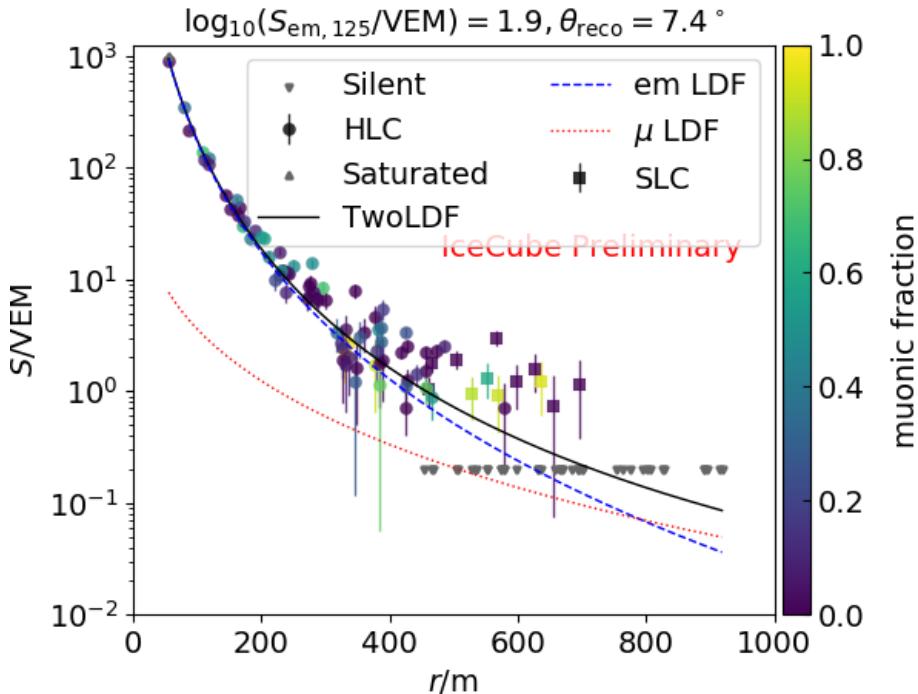


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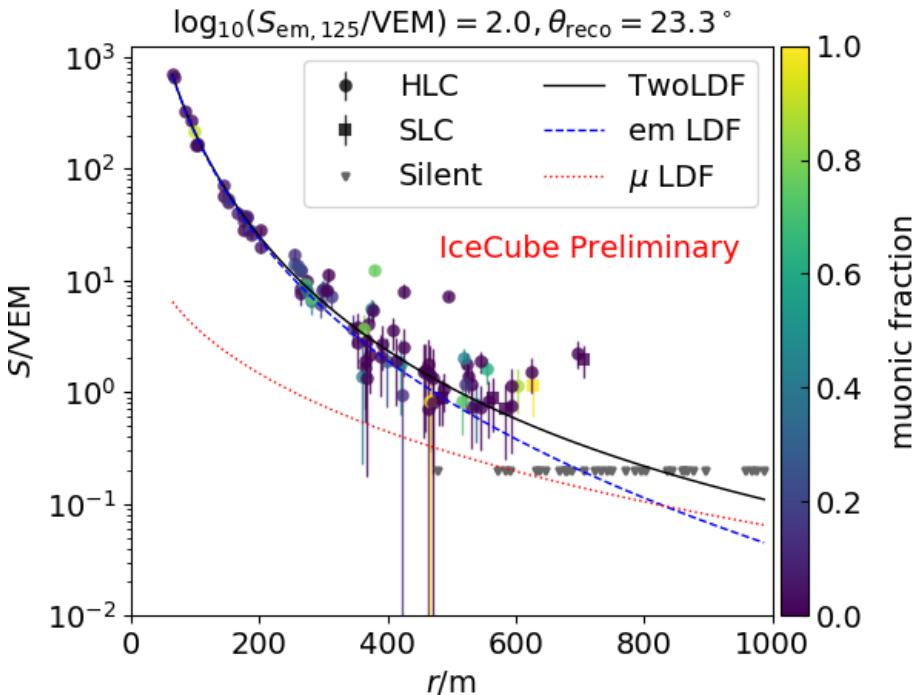


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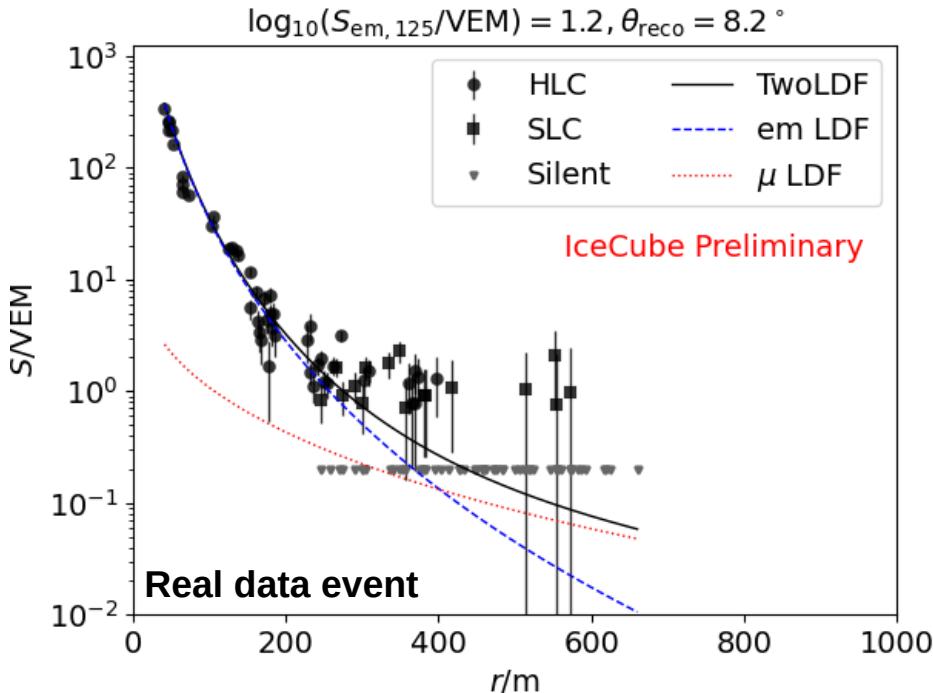


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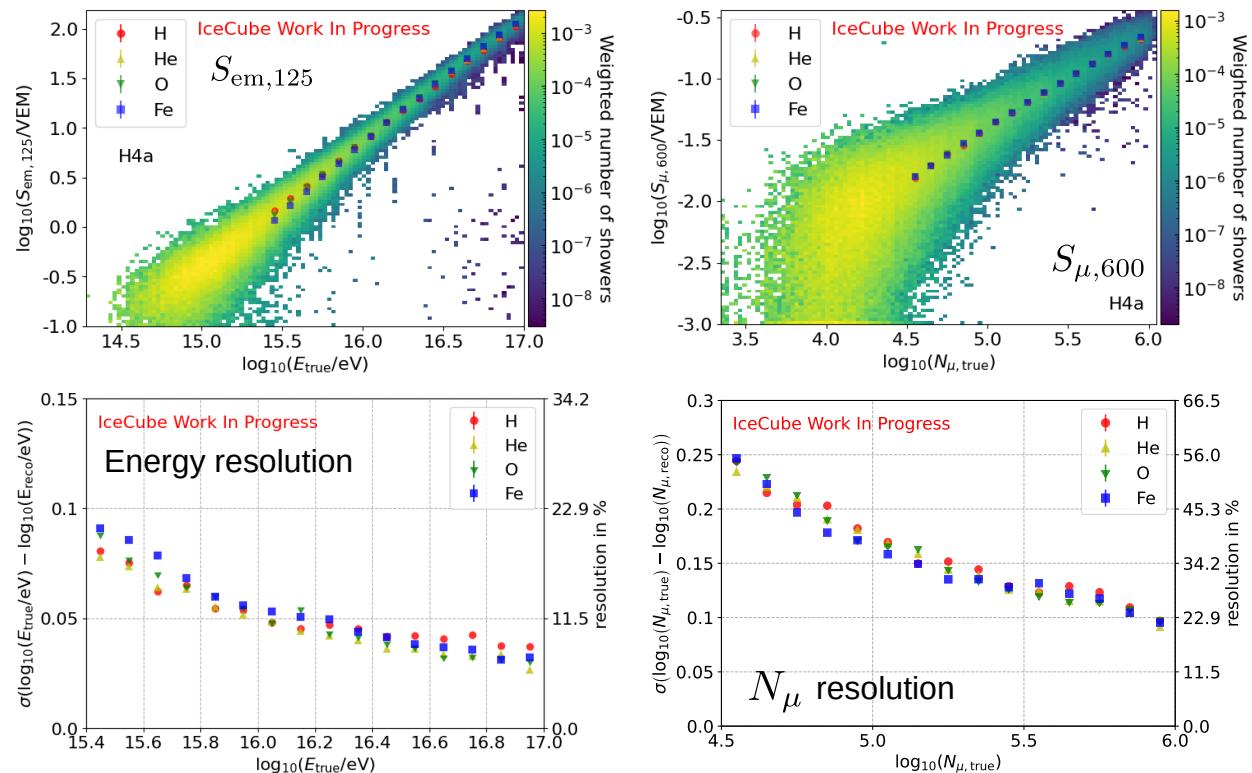
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# Two Component LDF – Average Distributions

Successful reconstruction of energy and low energy (GeV) muon number



# Summary & Outlook

- Successful reconstruction of energy and low energy (**GeV**) muon number
- Next Steps:
  - Extending energy & zenith angle range
  - Study **systematics**
  - Study **correlations of TeV & GeV muons** on event-by-event basis
  - Test different hadronic models

