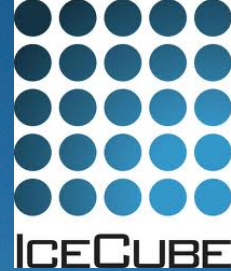


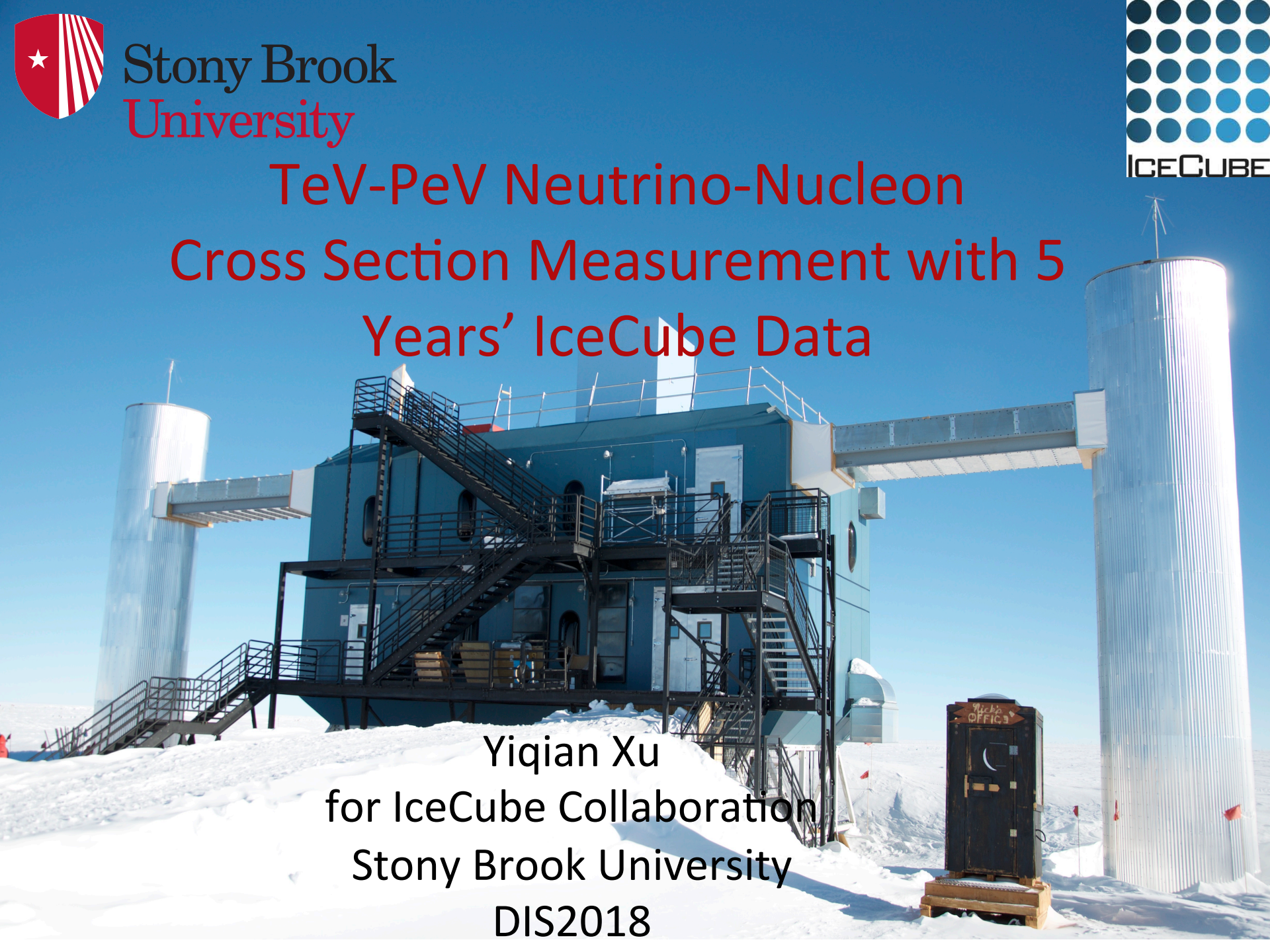


Stony Brook
University



TeV-PeV Neutrino-Nucleon Cross Section Measurement with 5 Years' IceCube Data

Yiqian Xu
for IceCube Collaboration
Stony Brook University
DIS2018



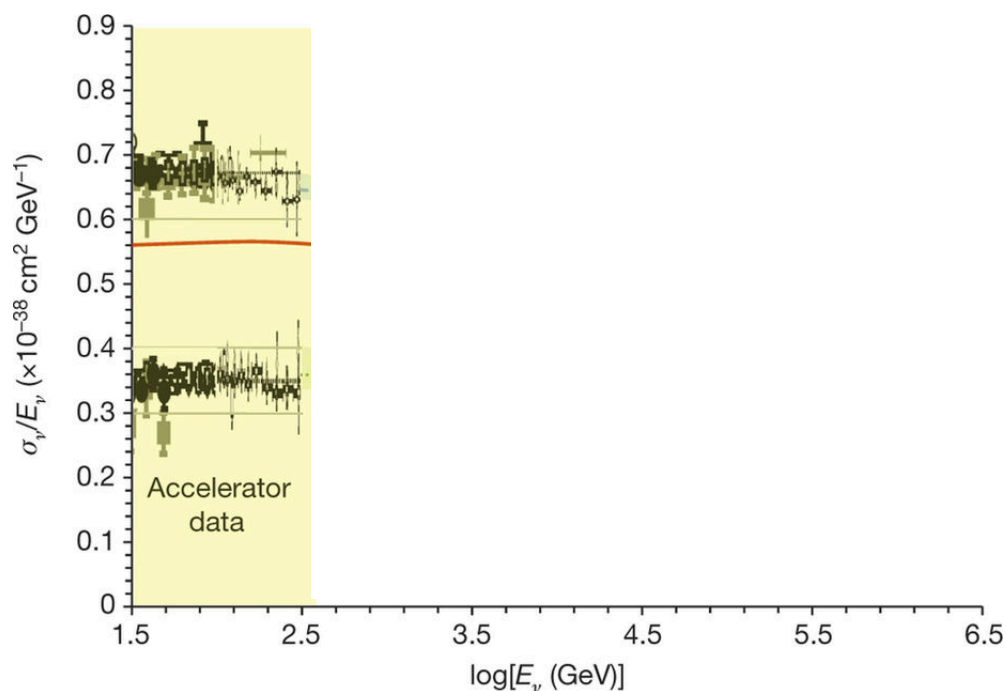


- Introduction
- IceCube Detector
- Analysis Method
- Data Sample
- Cross Section Measurement
 - statistical uncertainty
 - systematic uncertainty
- Summary

Introduction



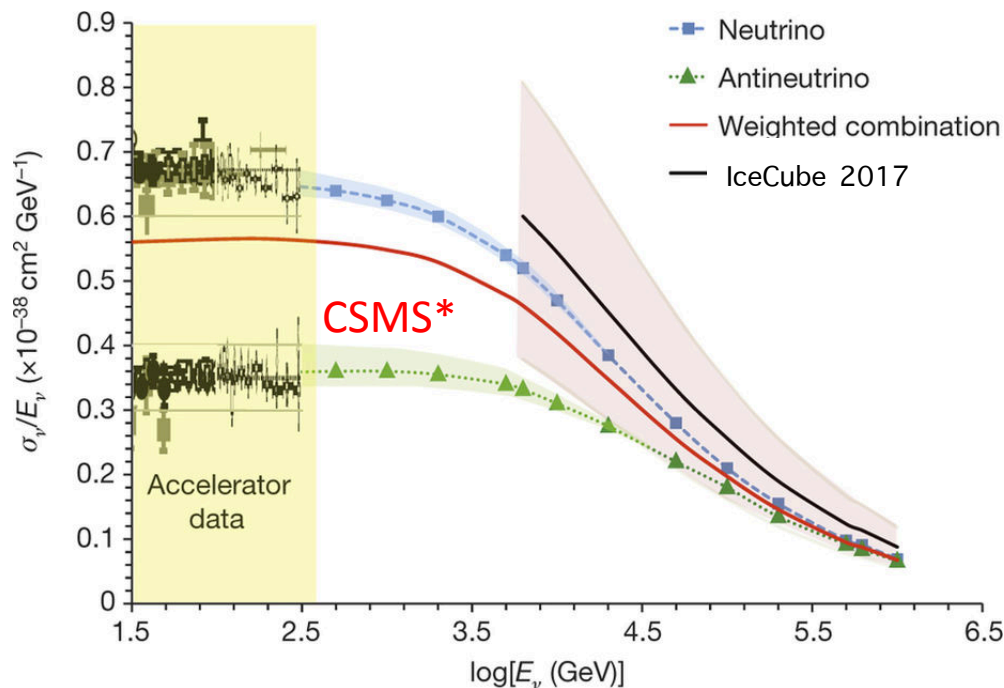
- Accelerator data contributes up to $\sim 100\text{ GeV}$ in $\nu\text{-N}$ cross section measurement. **Exciting (new) physics awaits at much higher energy range.**



Introduction



Stony Brook University



IceCube, Nature (2017), 10.1038

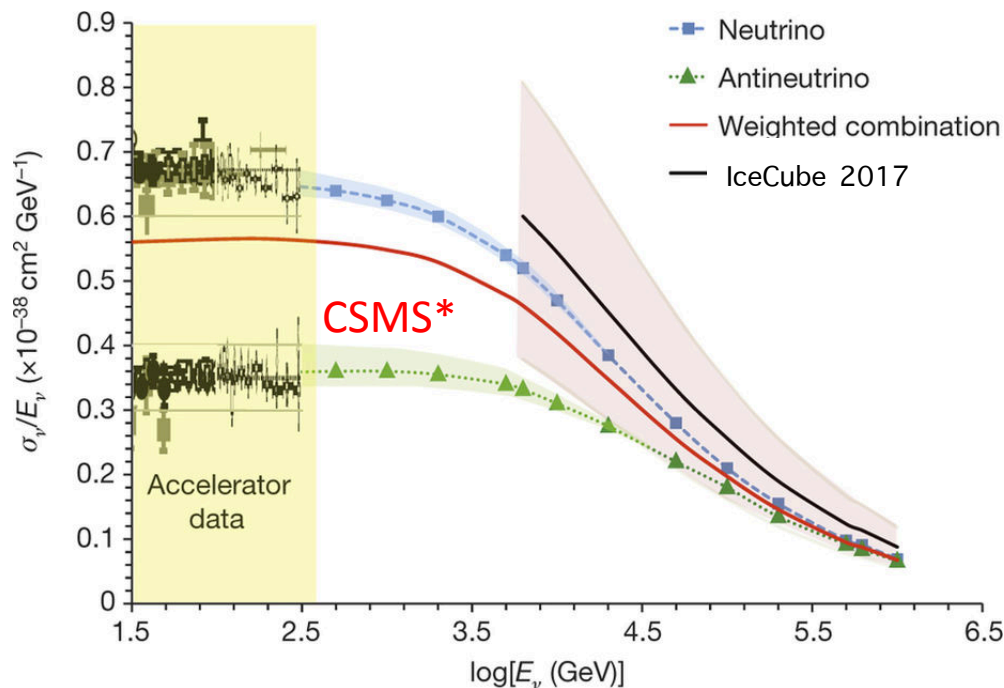
**CSMS: JHEP 08, 042 (2011)*

- Accelerator data contributes up to ~ 100 GeV in ν -N cross section measurement. **Exciting (new) physics awaits at much higher energy range.**
- IceCube has recently published the first cross section measurement result using 1yr of up-going ν_μ sample in energy range 6.3 TeV to 980 TeV:
 $1.30^{+0.21}_{-0.19}(\text{stat})^{+0.39}_{-0.43}(\text{sys}) \times \text{CSMS}^*$

Introduction



Stony Brook University



IceCube, Nature (2017), 10.1038

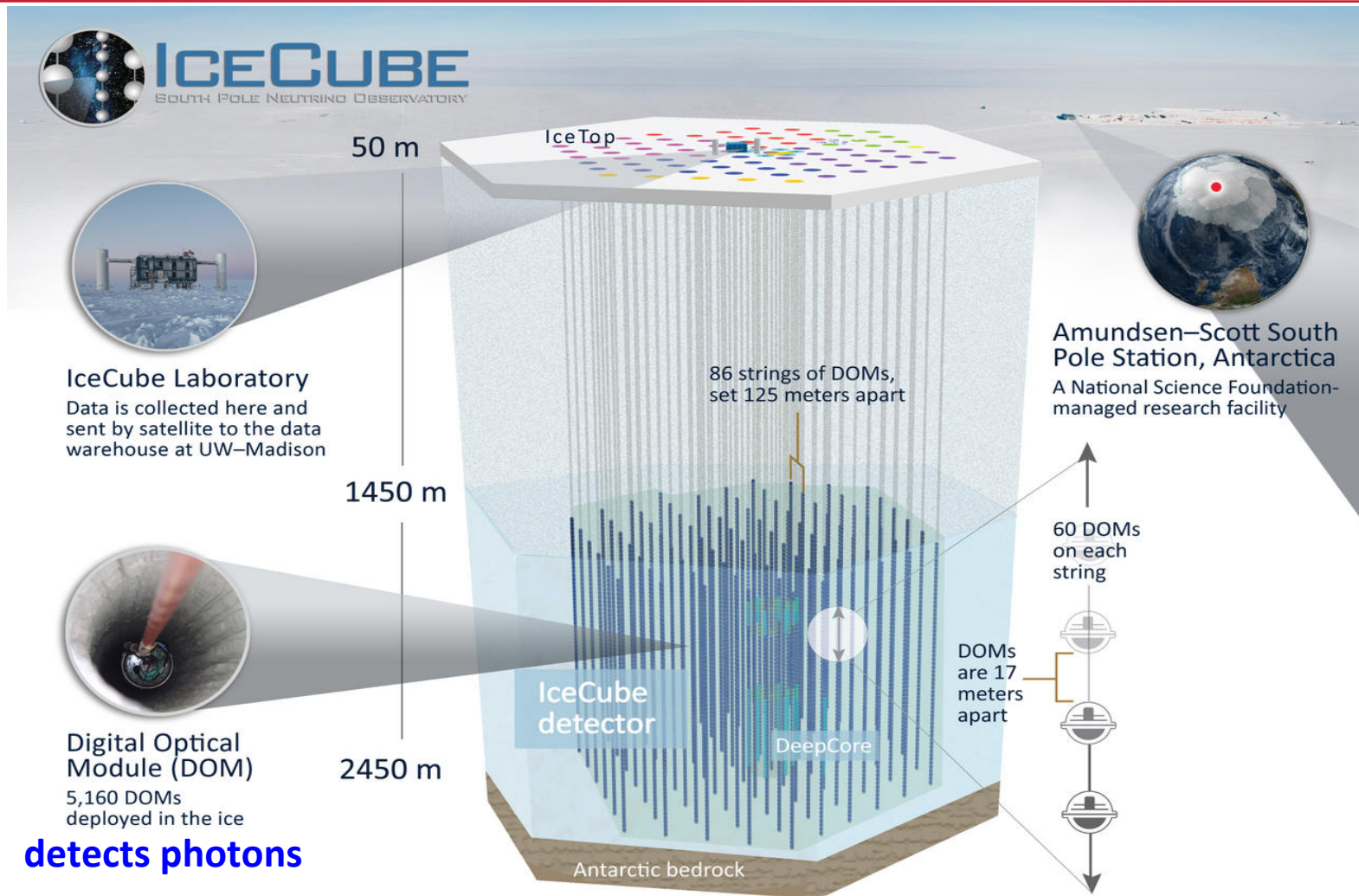
**CSMS: JHEP 08, 042 (2011)*

- Accelerator data contributes up to $\sim 100\text{GeV}$ in ν -N cross section measurement. **Exciting (new) physics awaits at much higher energy range.**
- IceCube has recently published the first cross section measurement result using 1yr of up-going ν_μ sample in energy range 6.3TeV to 980 TeV:
 $1.30^{+0.21}_{-0.19}(\text{stat})^{+0.39}_{-0.43}(\text{sys}) \times \text{CSMS}^*$
- This analysis will present a **novel method** to measure the **energy dependence** of ν -N cross section using 5yr IceCube $\nu_\tau + \nu_e$ sample.

IceCube Detector



Stony Brook University



IceCube Detector



Stony Brook University

Neutrinos

ν_e, ν_μ, ν_τ

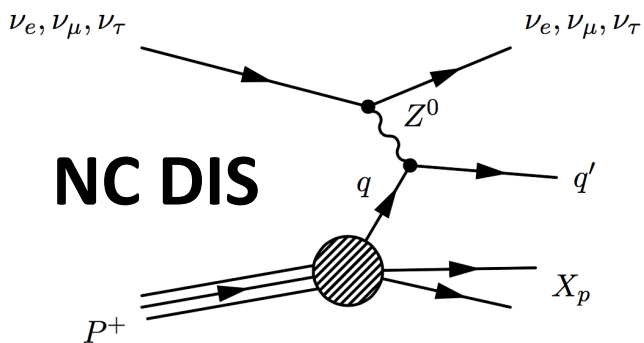
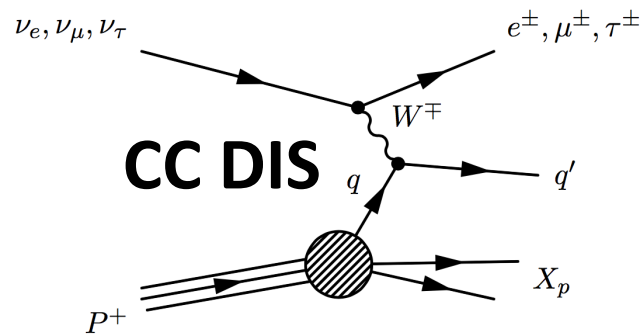
ν_e, ν_μ, ν_τ

IceCube Detector



Stony Brook University

Neutrinos \rightarrow DIS

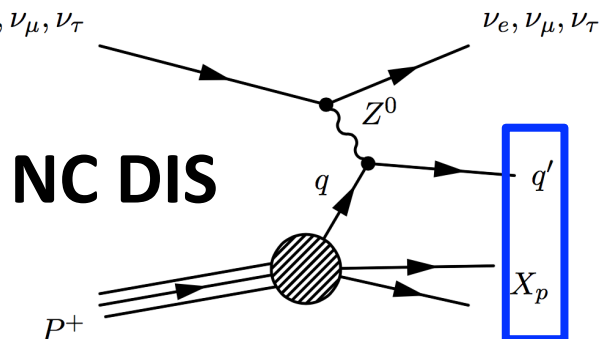
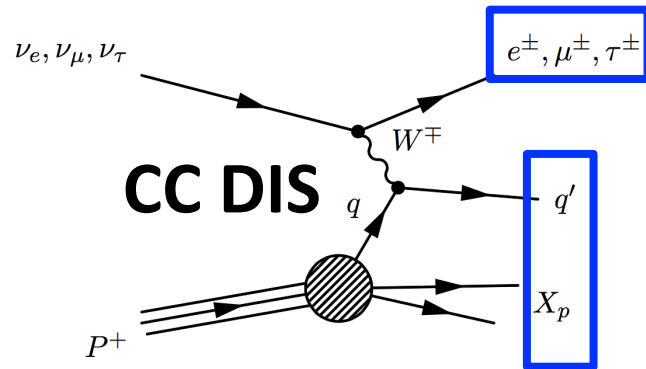


IceCube Detector



Stony Brook University

Neutrinos \rightarrow DIS \rightarrow charged secondaries

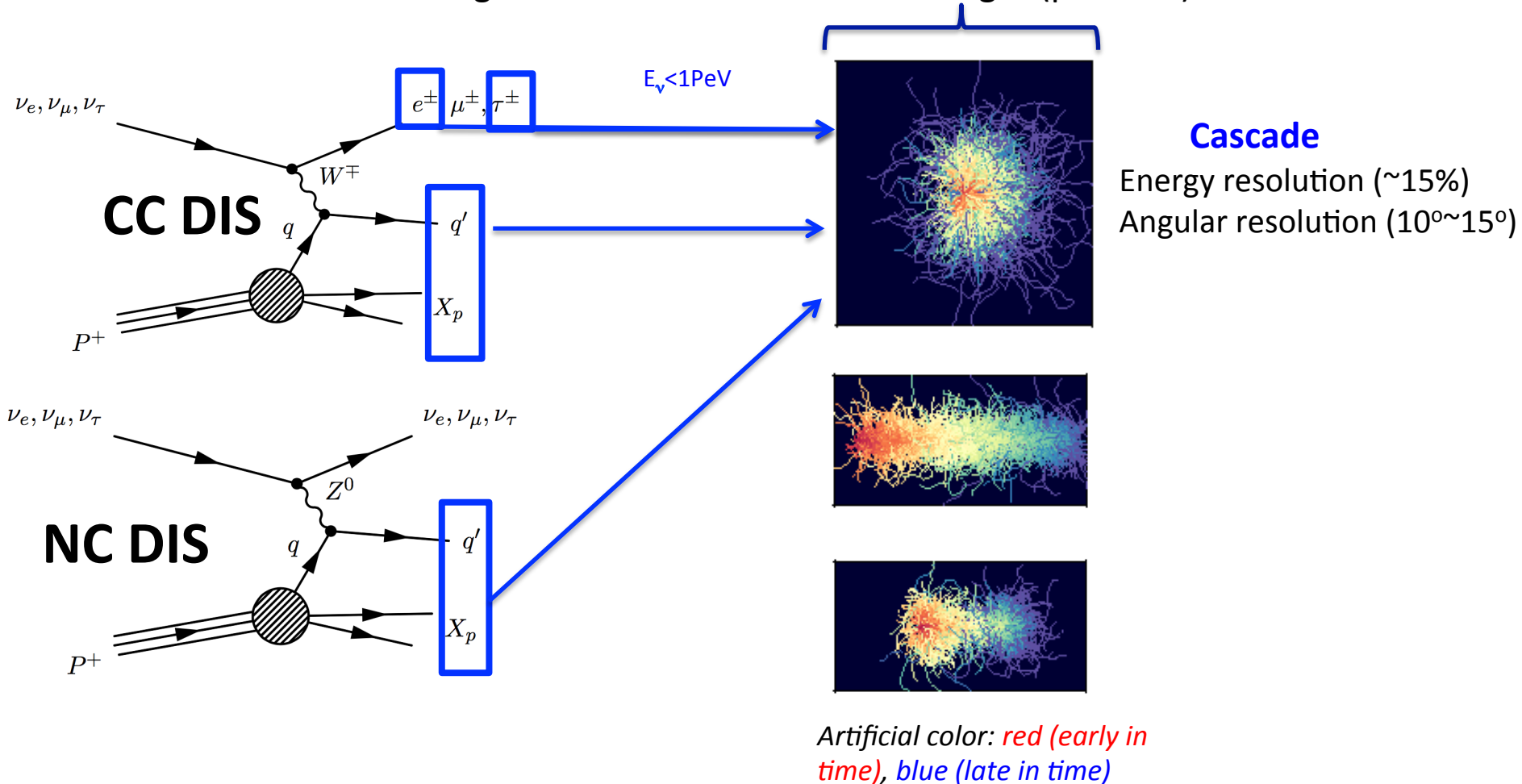


IceCube Detector



Stony Brook University

Neutrinos \rightarrow DIS \rightarrow charged secondaries \rightarrow Cherenkov Light (photons)

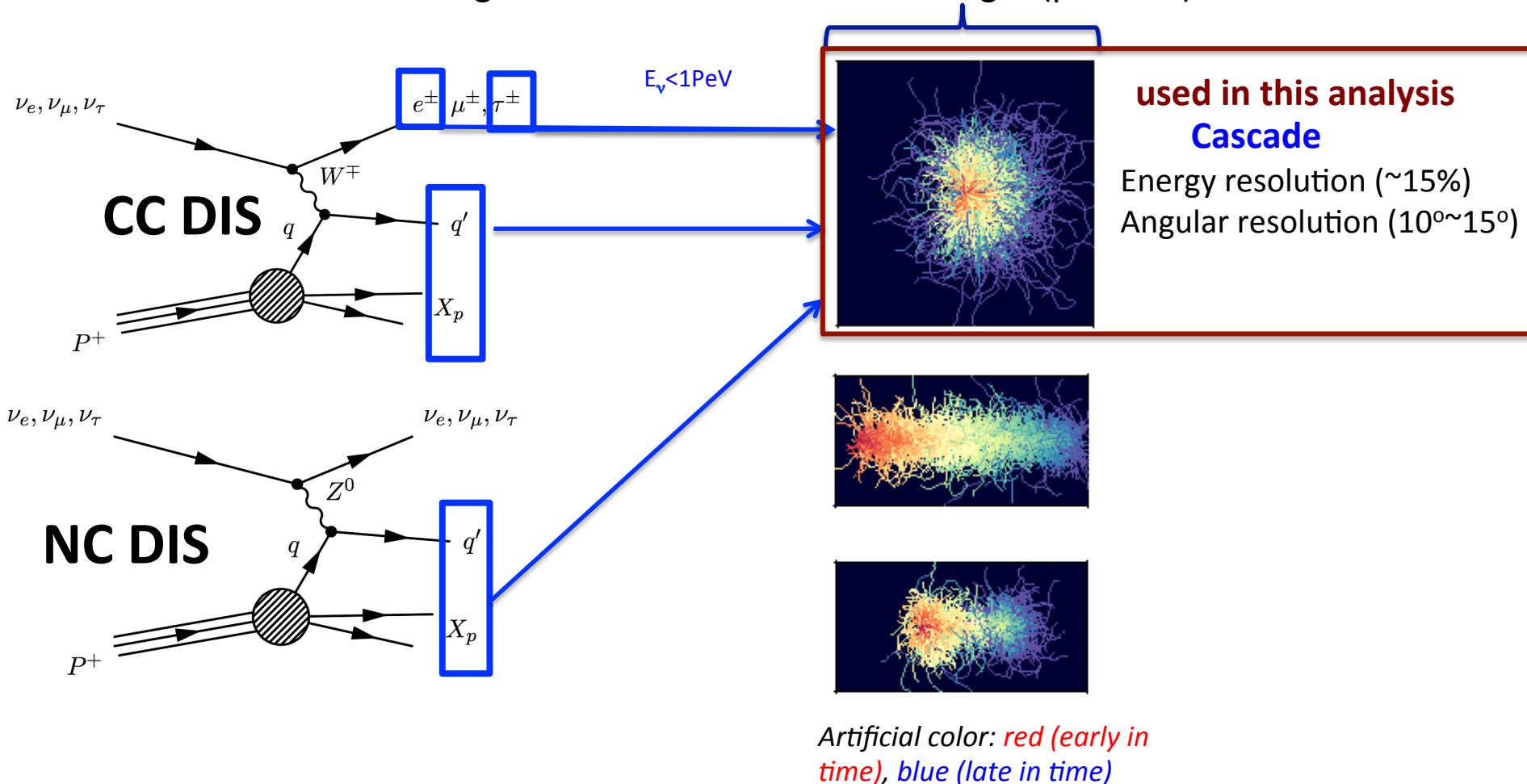


IceCube Detector



Stony Brook University

Neutrinos \rightarrow DIS \rightarrow charged secondaries \rightarrow Cherenkov Light (photons)

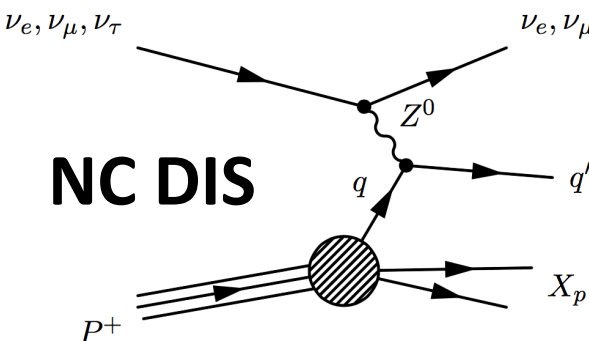
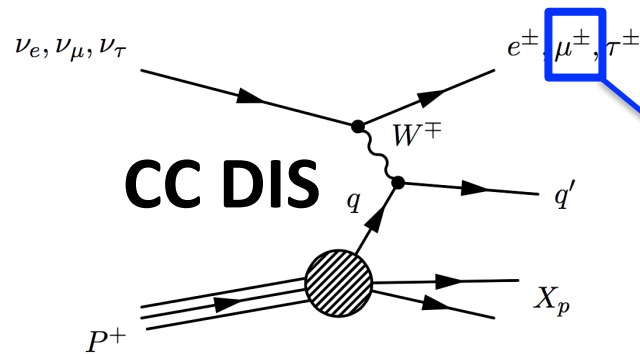


IceCube Detector

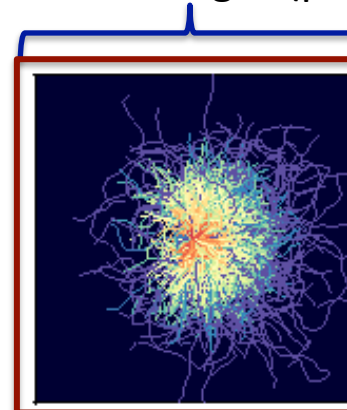


Stony Brook University

Neutrinos \rightarrow DIS \rightarrow charged secondaries \rightarrow Cherenkov Light (photons)

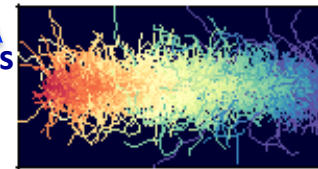


Used in IceCube 2017 cross section measurement



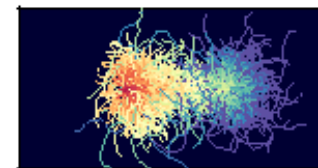
used in this analysis
Cascade

Energy resolution ($\sim 15\%$)
Angular resolution ($10^\circ \sim 15^\circ$)



Track

Only lower bound on E_ν
Angular resolution ($0.2^\circ \sim 1^\circ$)



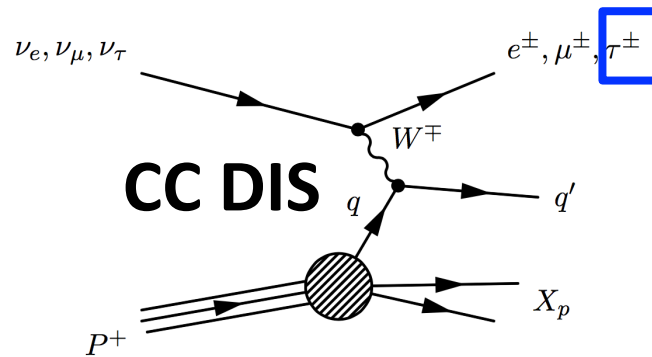
Artificial color: red (early in time), blue (late in time)

IceCube Detector

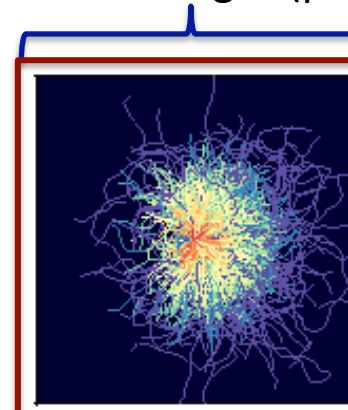


Stony Brook University

Neutrinos \rightarrow DIS \rightarrow charged secondaries \rightarrow Cherenkov Light (photons)

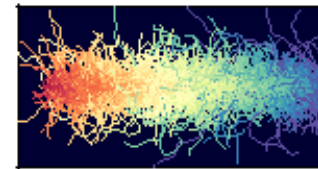


$E_\nu > 1 \text{ PeV}$



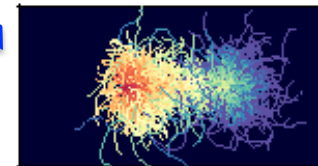
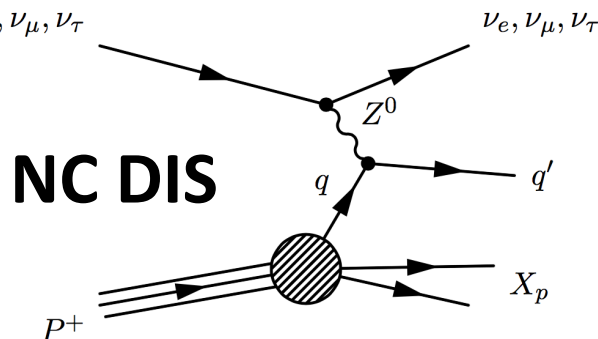
used in this analysis
Cascade

Energy resolution ($\sim 15\%$)
Angular resolution ($10^\circ \sim 15^\circ$)



Track

Only lower bound on E_ν
Angular resolution ($0.2^\circ \sim 1^\circ$)



"Double-Bang"

Has not been observed yet

Artificial color: red (early in time), blue (late in time)

IceCube Detector



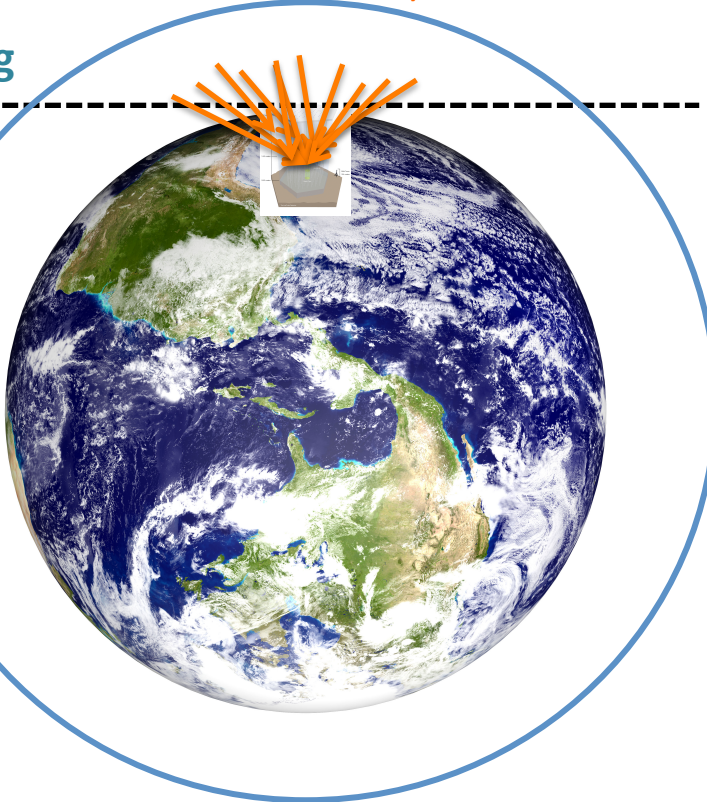
Stony Brook University

Mostly removed by this analysis (<10%
in below 60TeV, 0 above 60TeV)

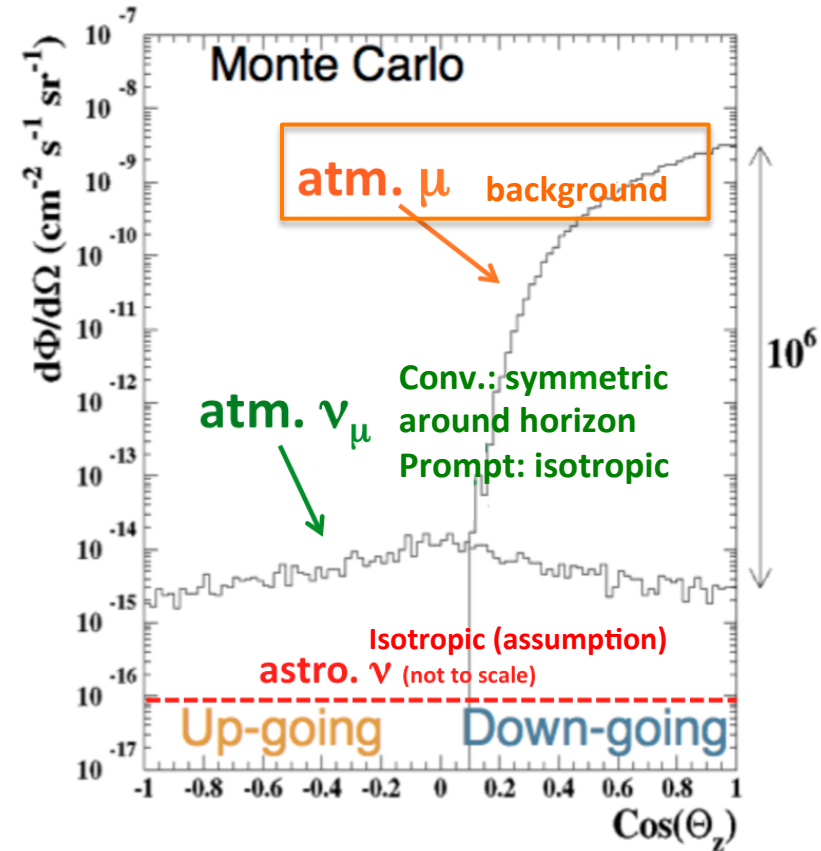
South

Down-going

Up-going



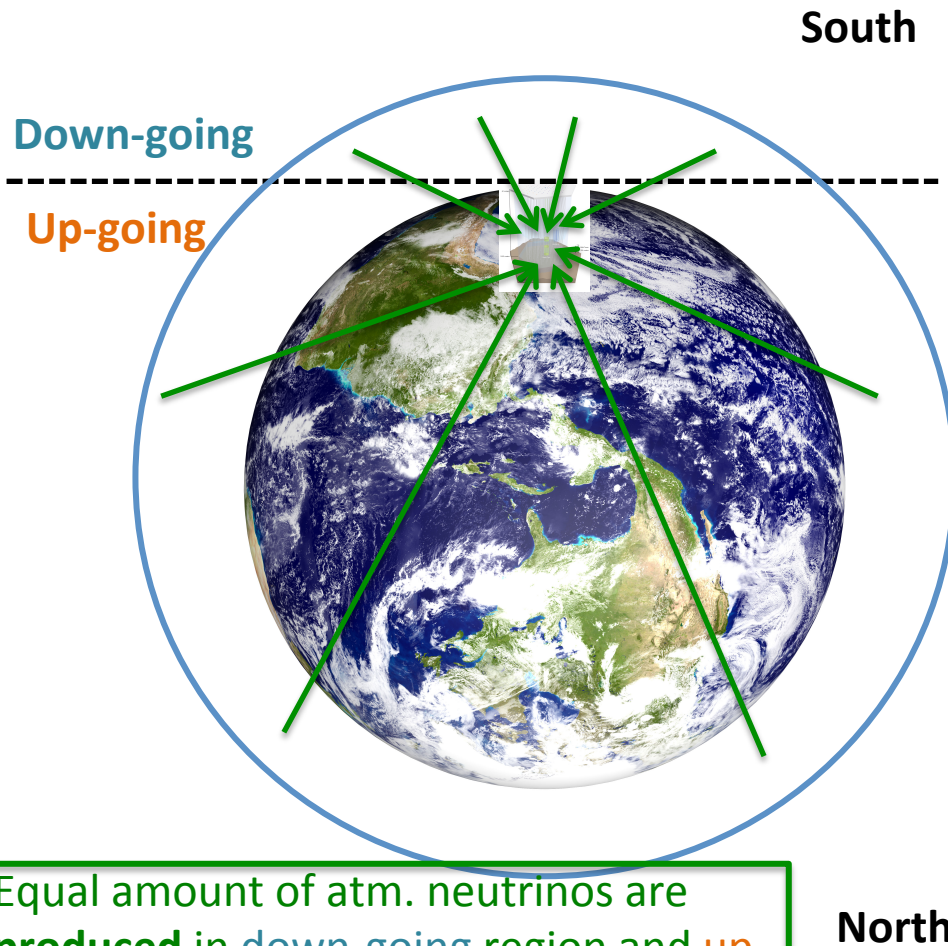
North



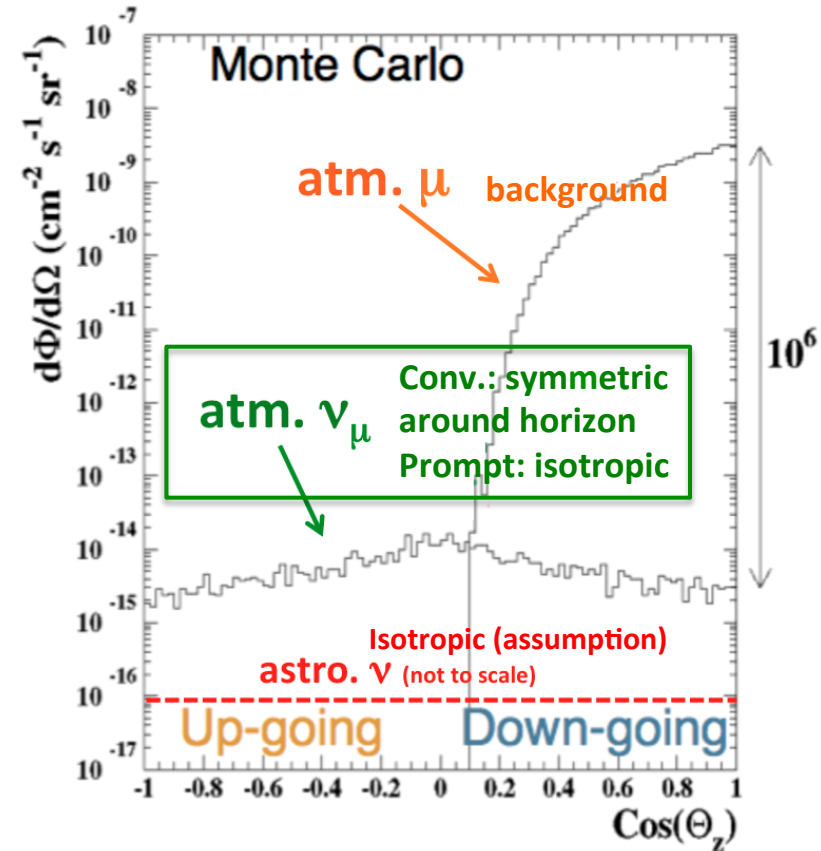
IceCube Detector



Stony Brook University



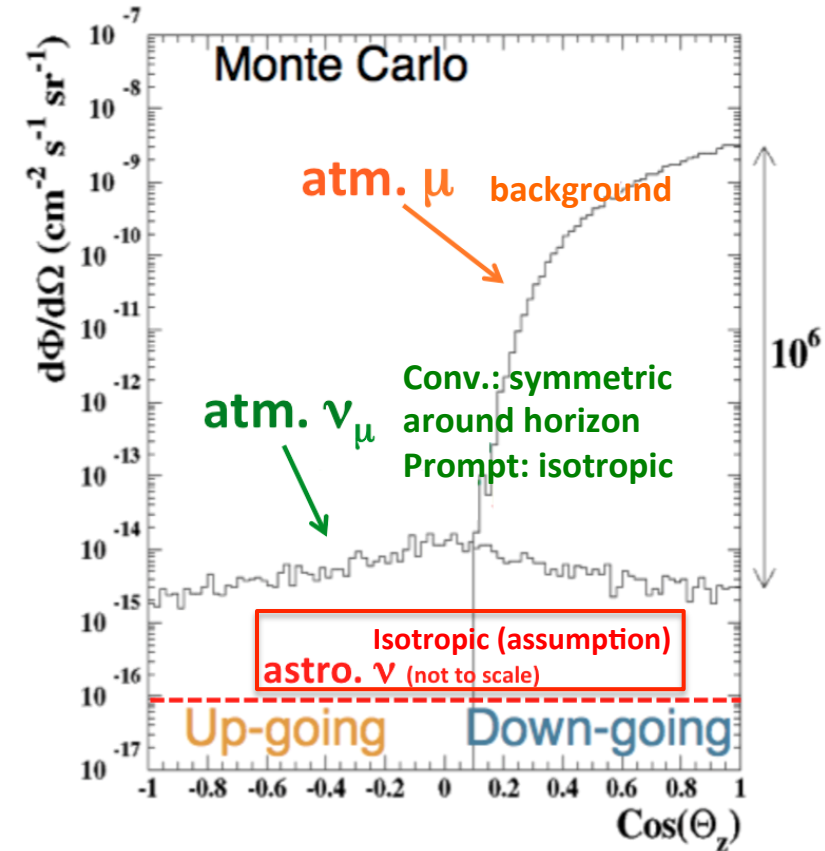
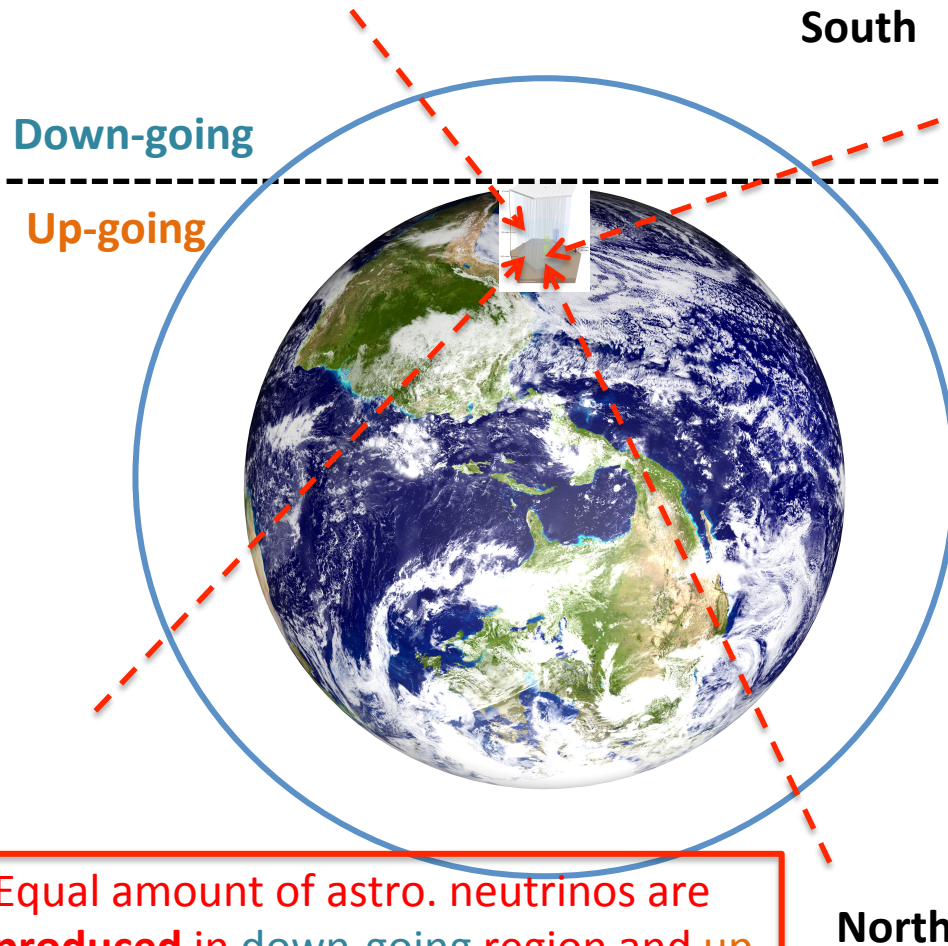
Equal amount of atm. neutrinos are **produced** in down-going region and up-going region.



IceCube Detector



Stony Brook University



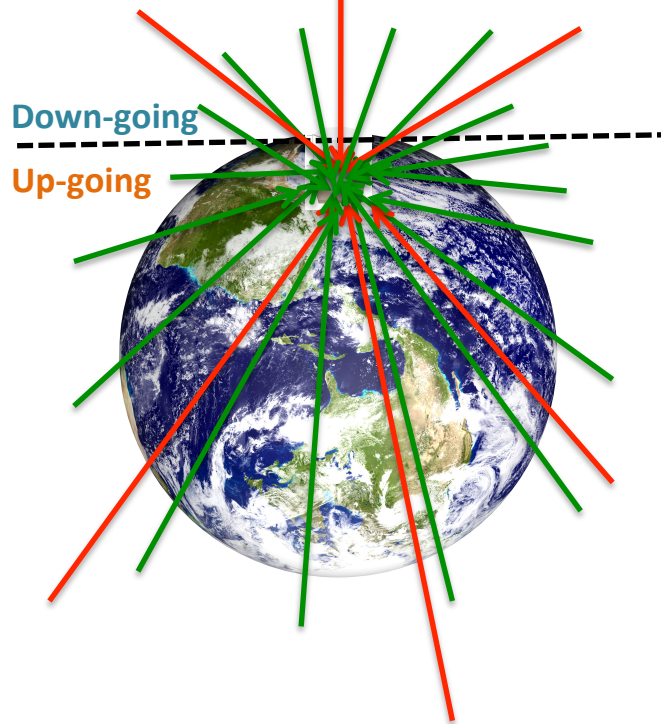
Equal amount of astro. neutrinos are produced in down-going region and up-going region.

Analysis Method



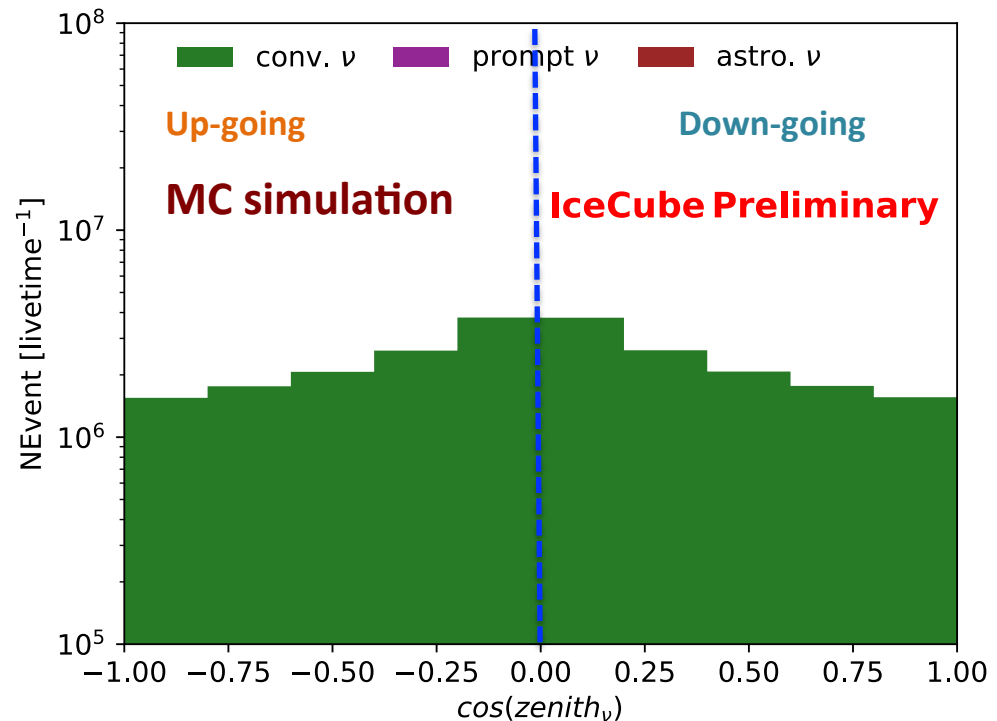
Stony Brook University

Proposed by D. Hooper, Phys.Rev.D 65.097303



$$R(E_\nu) = \frac{N\text{Events}(\text{Down-going})}{N\text{Events}(\text{Up-going})} = 1.0$$

All energy ranges



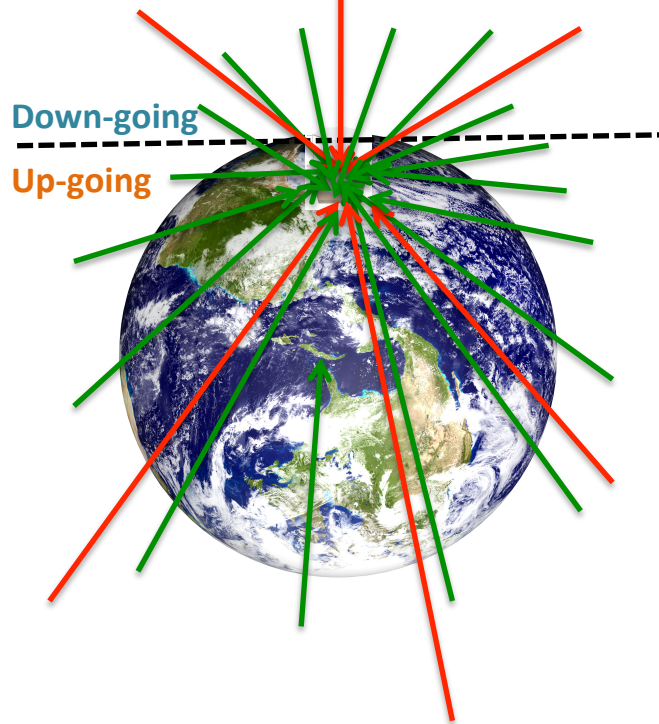
When the **cross section** of neutrino-nucleon interaction is **small**, the Earth is **transparent** to neutrinos.

Analysis Method



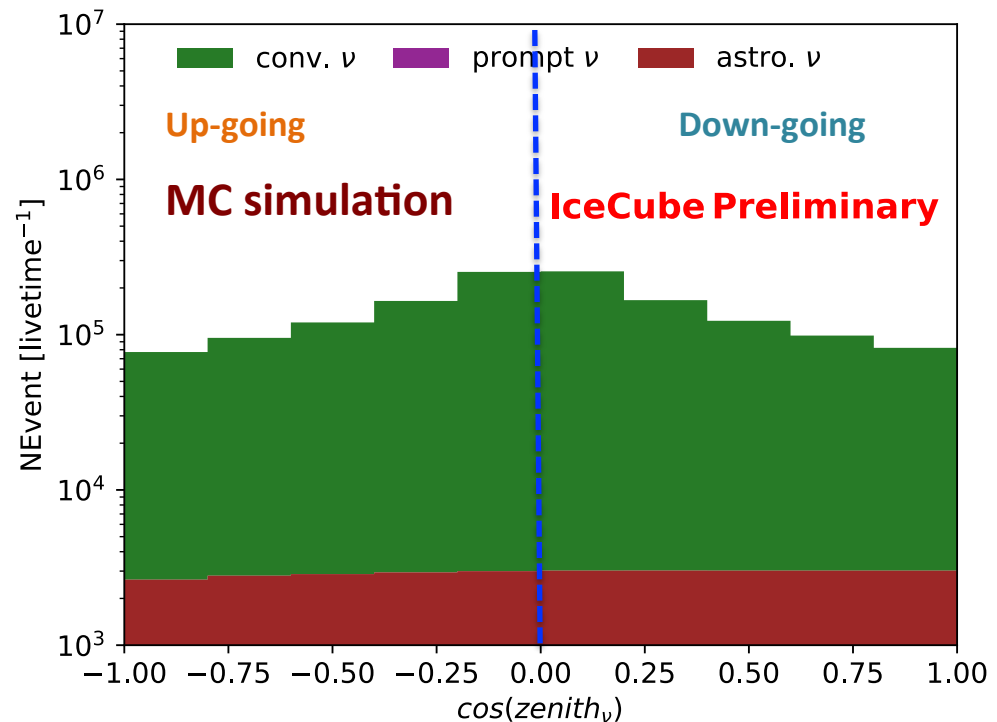
Stony Brook University

Proposed by D.Hooper, Phys.Rev.D 65.097303



$$R(E_\nu > 1\text{TeV}) = \frac{N\text{Events}(\text{Down-going})}{N\text{Events}(\text{Up-going})} = 1.02$$

Neutrino energy > 1TeV



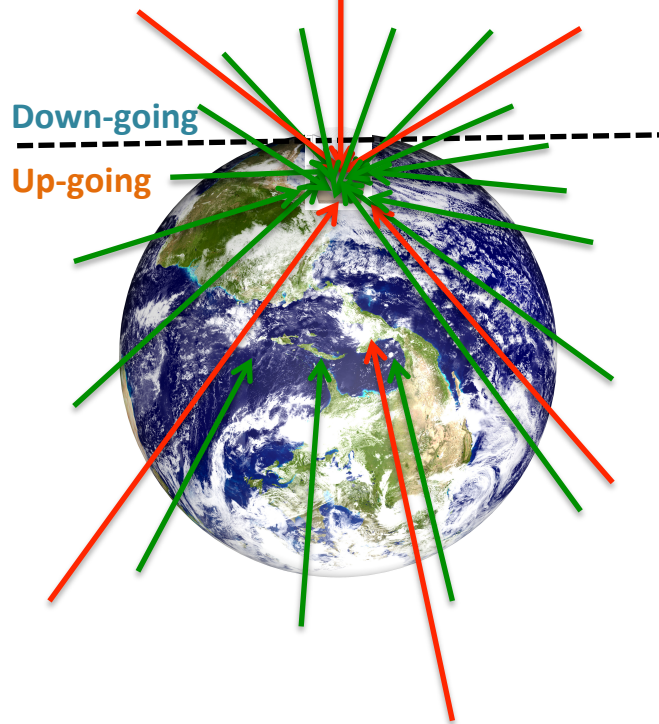
With the increase of neutrino energy, the cross section increases. The **up-going** events get absorbed by the Earth.

Analysis Method



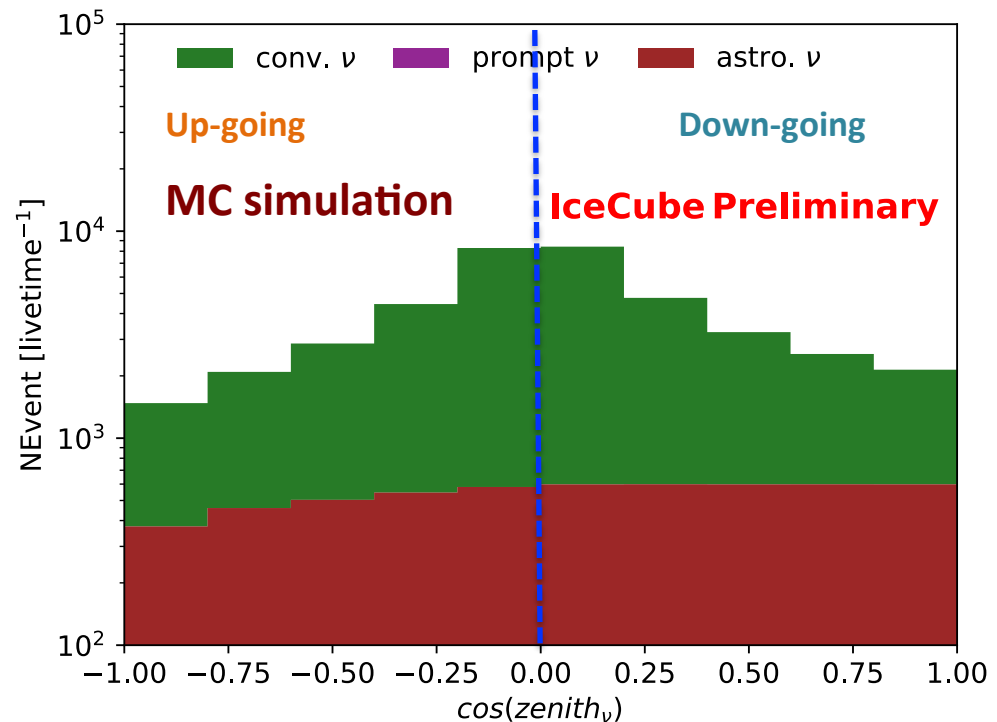
Stony Brook University

Proposed by D.Hooper, Phys.Rev.D 65.097303



$$R(E_\nu > 10\text{TeV}) = \frac{N\text{Events}(\text{Down-going})}{N\text{Events}(\text{Up-going})} = 1.10$$

Neutrino energy > 10 TeV



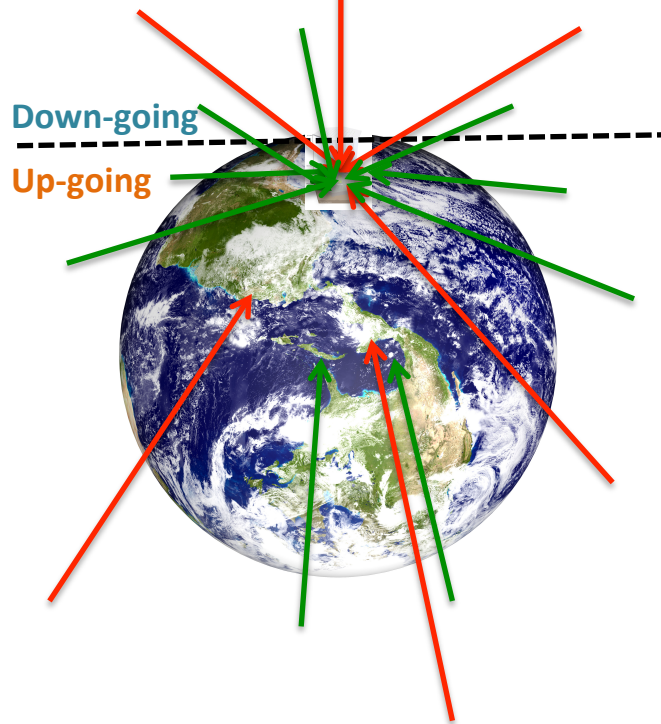
With the increase of neutrino energy, the cross section increases. The **up-going** events get absorbed by the Earth.

Analysis Method



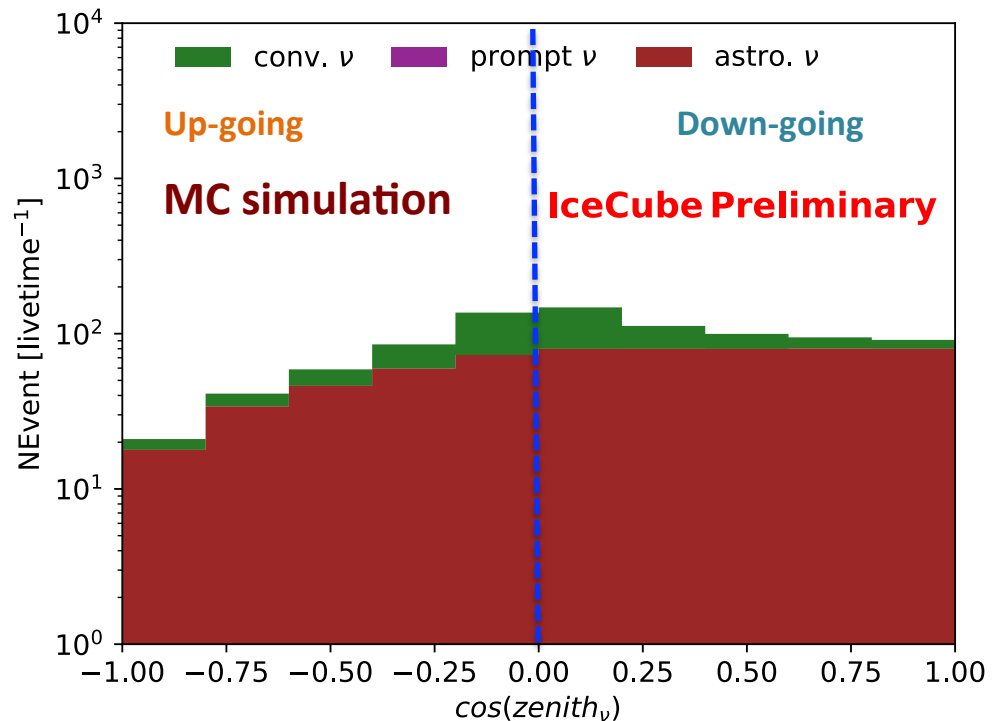
Stony Brook University

Proposed by D.Hooper, Phys.Rev.D 65.097303



$$R(E_\nu > 100 \text{ TeV}) = \frac{N\text{Events}(\text{Down-going})}{N\text{Events}(\text{Up-going})} = 1.59$$

Neutrino energy > 100 TeV



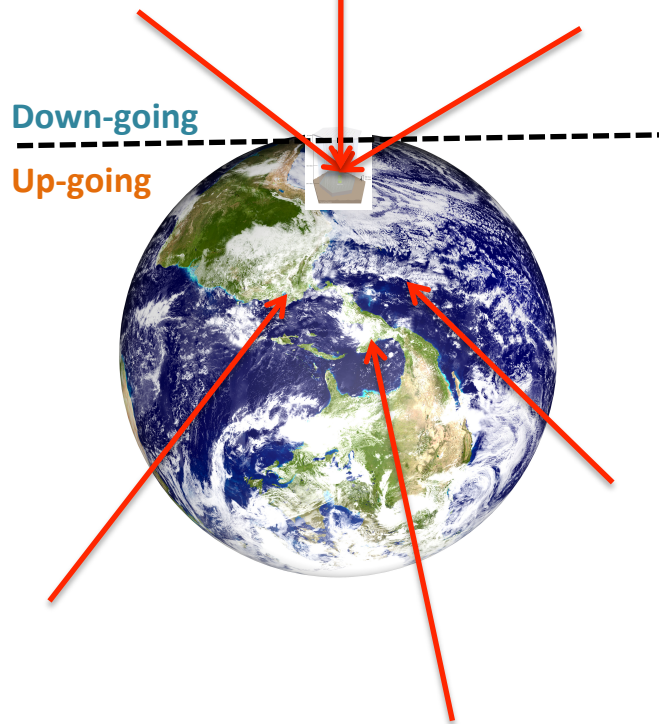
With the increase of neutrino energy, the cross section increases. The **up-going** events get absorbed by the Earth.

Analysis Method



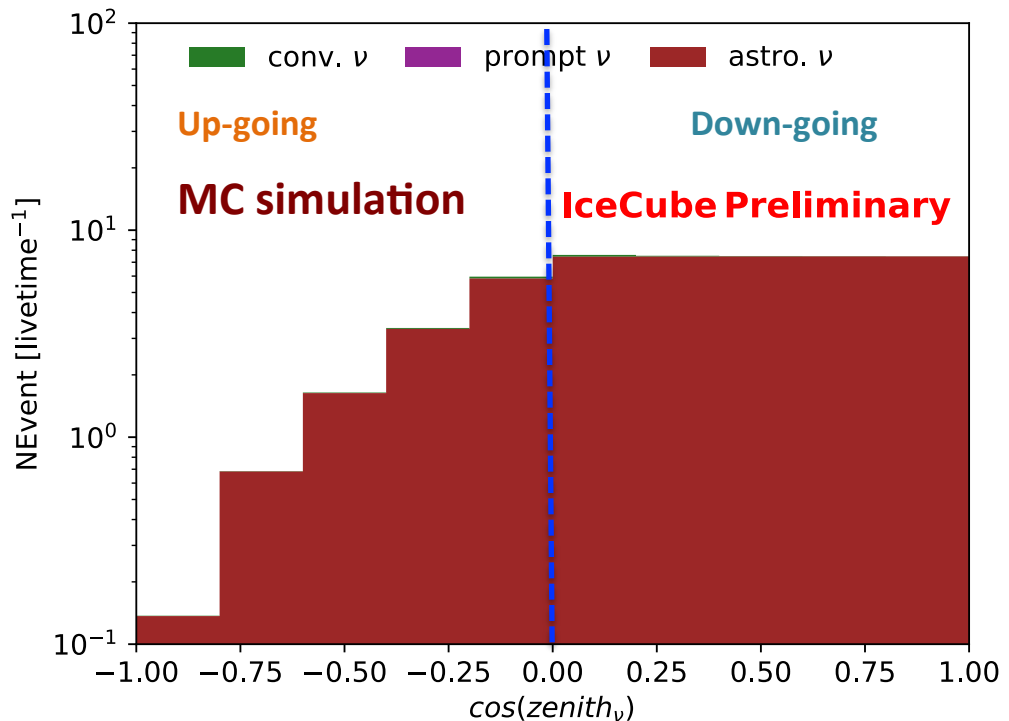
Stony Brook University

Proposed by D.Hooper, Phys.Rev.D 65.097303



$$R(E_\nu > 1\text{PeV}) = \frac{N\text{Events}(\text{Down-going})}{N\text{Events}(\text{Up-going})} = 3.19$$

Neutrino energy > 1PeV



With the increase of neutrino energy, the cross section increases. The **up-going** events get absorbed by the Earth.

Analysis Method



Stony Brook University

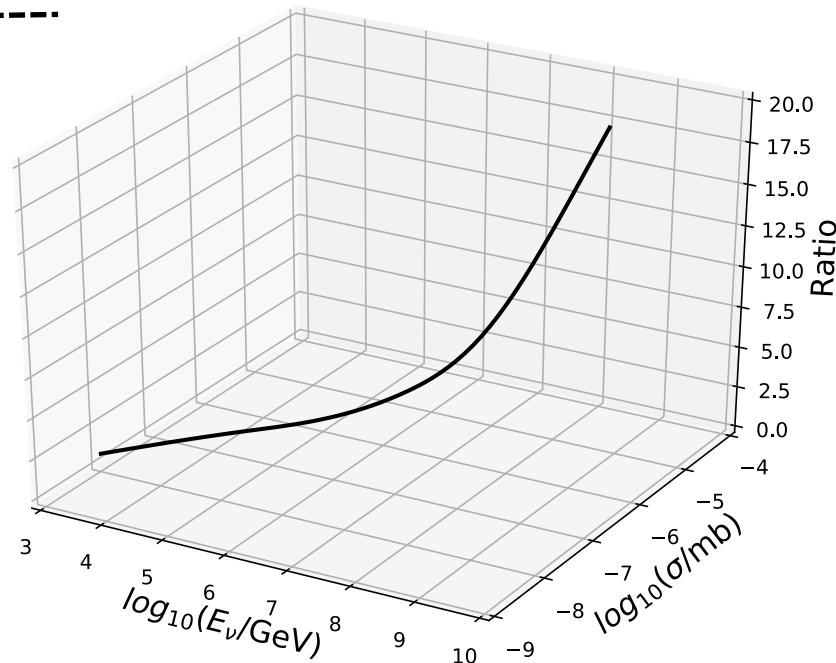
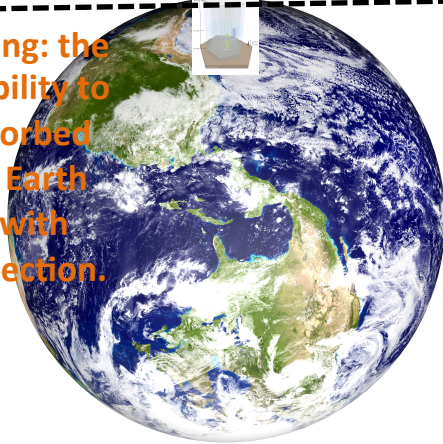
A simplified illustration

—assuming perfect detector, energy and direction are in true space (E_ν , Zenith_ν).

Proposed by D.Hooper, Phys.Rev.D 65.097303

Down-going: not affected by the Earth

Up-going: the probability to be absorbed by the Earth scales with cross section.



Analysis Method



Stony Brook University

A simplified illustration

—assuming perfect detector, energy and direction are in true space (E_ν , Zenith $_\nu$).

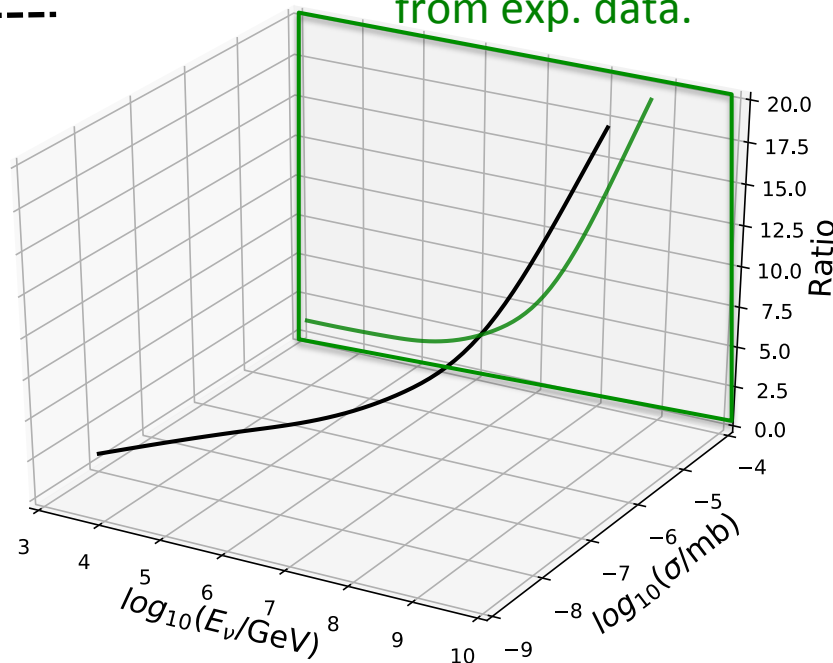
Proposed by D.Hooper, Phys.Rev.D 65.097303

Down-going: not affected by the Earth

Up-going: the probability to be absorbed by the Earth scales with cross section.



1. Calculate $R(E_\nu) = N_{\text{Event}}(\text{down}_\nu) / N_{\text{Event}}(\text{up}_\nu)$ in each neutrino energy bin from exp. data.



Analysis Method



Stony Brook University

A simplified illustration

—assuming perfect detector, energy and direction are in true space (E_ν , Zenith $_\nu$).

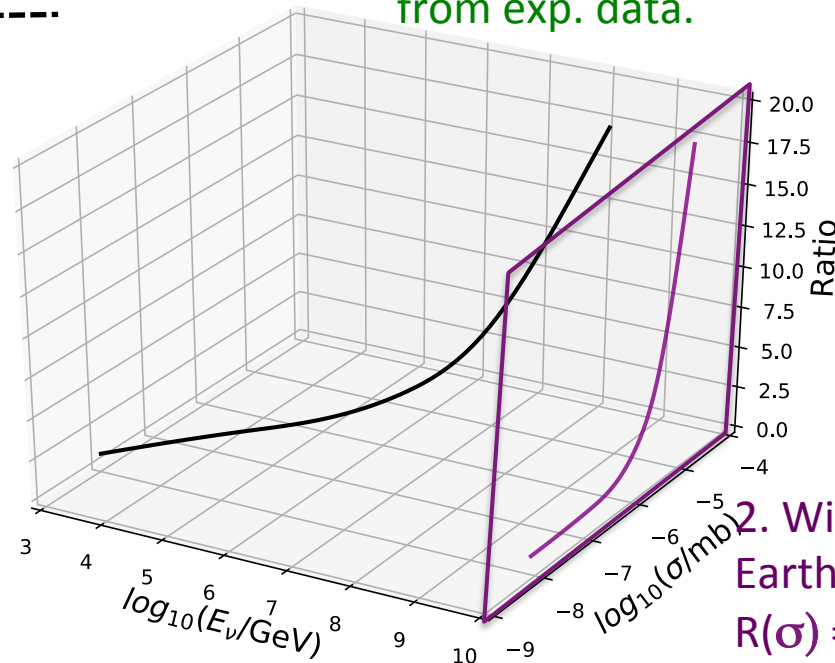
Proposed by D.Hooper, Phys.Rev.D 65.097303

Down-going: not affected by the Earth

Up-going: the probability to be absorbed by the Earth scales with cross section.



1. Calculate $R(E_\nu) = \text{NEvent}(\text{down}_\nu) / \text{Nevent}(\text{up}_\nu)$ in each neutrino energy bin from exp. data.



2. With the knowledge of Earth density, we get $R(\sigma) = \text{Nevent}(\text{down}_\nu) / \text{Nevent}(\text{up}_\nu)$ in different cross section bins.

Analysis Method



Stony Brook University

A simplified illustration

—assuming perfect detector, energy and direction are in true space (E_ν , Zenith $_\nu$).

Proposed by D.Hooper, Phys.Rev.D 65.097303

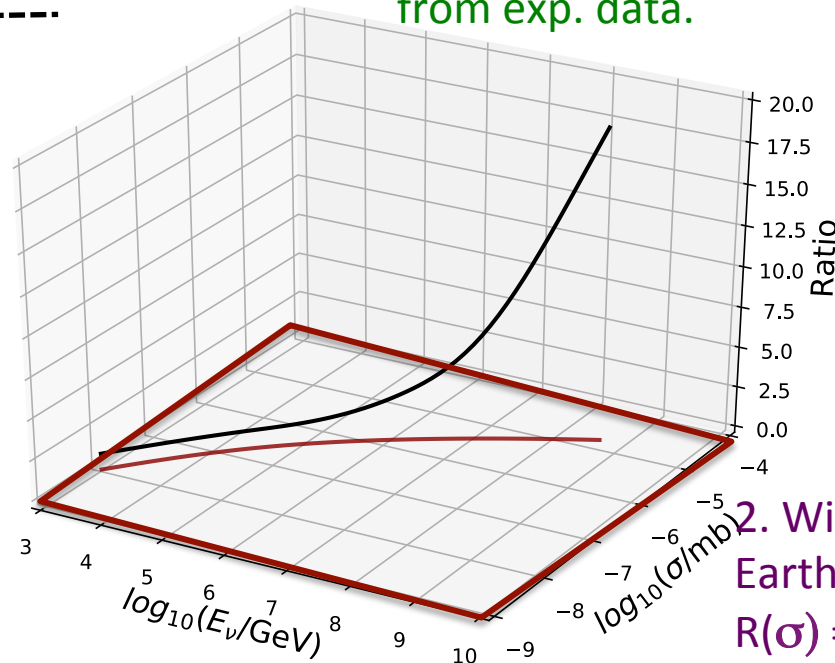
Down-going: not affected by the Earth

Up-going: the probability to be absorbed by the Earth scales with cross section.



3. Take the ratio for each neutrino energy bin and find the corresponding cross section.

1. Calculate $R(E_\nu) = \text{NEvent}(\text{down}_\nu) / \text{NEvent}(\text{up}_\nu)$ in each neutrino energy bin from exp. data.



2. With the knowledge of Earth density, we get $R(\sigma) = \text{NEvent}(\text{down}_\nu) / \text{NEvent}(\text{up}_\nu)$ in different cross section bins.

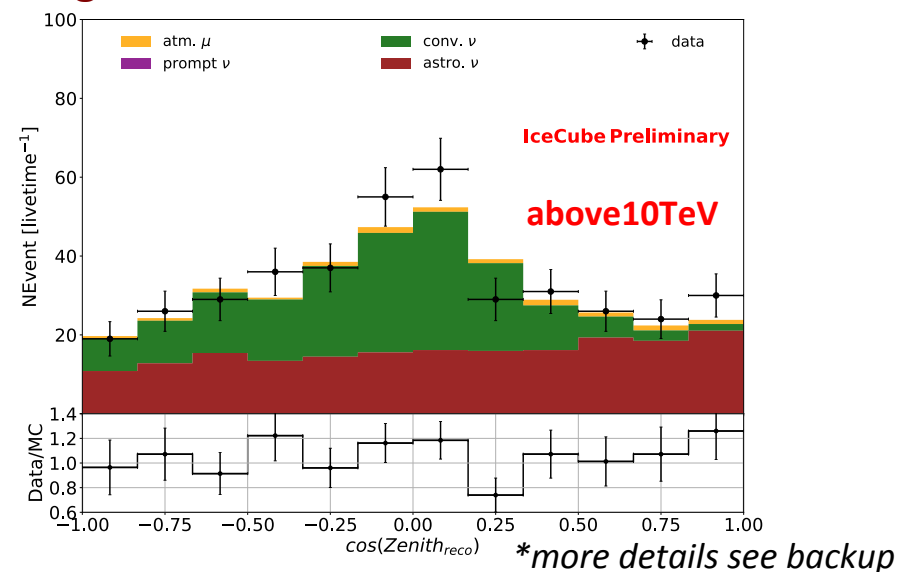
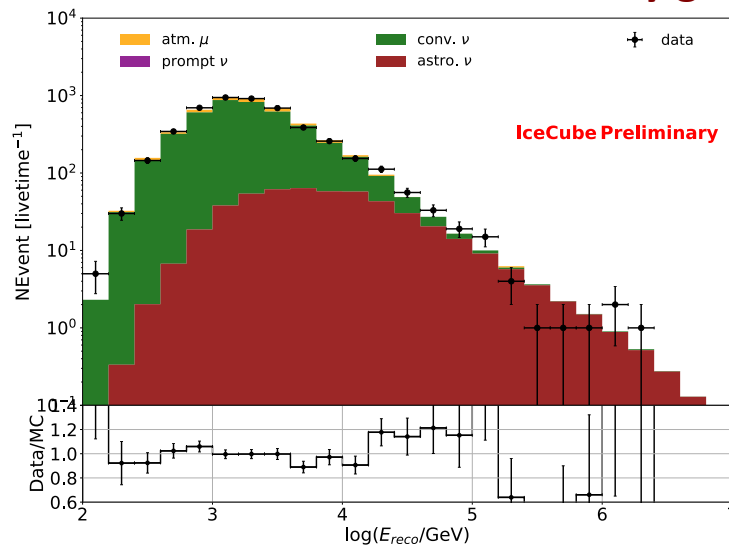
Data Sample



Stony Brook University

- The data sample: collected by IceCube **from May 2011 to May 2016**.
- An event selection* is developed using straight cut and machine learning to select cascades and remove track-like events.
- This event selection features **high background rejection** (<10% background contamination below 60TeV, background free above 60TeV) and **high signal efficiency** (~80%).
- Below are the reconstructed (observed) **energy** and **zenith** distribution for data and MC after the event selection.

Very good Data/MC agreement!



*more details see backup

9

How do we get NEvents in neutrino energy and zenith bins from reconstructed (observed) distribution?

- An Unfolding method (**Iterative Unfolding**) is used to unfold **zenith distribution (2bins) and energy distribution** at the same time.
- **An assumption of 1:1:1 flavor ratio is made.**
- The probability $P(T_i | R_j)$ of an event end up in Reco bin j given True bin i is **known**.
- The probability $P(R_j | T_i)$ of an event from True bin i given it's found in Reco bin j is **of interest**.

$$P(T_i | R_j)^{(k)} = \frac{P(R_j | T_i) N(T_i)^{(k)}}{\sum_i P(R_j | T_i) N(T_i)^{(k)}}$$

$$N(T_i)^{(k+1)} = \sum_j P(T_i | R_j)^{(k)} N(R_j) / \alpha_i \rightarrow \alpha_i = \sum_j P(R_j | T_i) \text{ corrects for acceptance losses.}$$

Distribution in **true** space of the k+1 th iteration

Distribution in **reconstructed** space, aka measurement

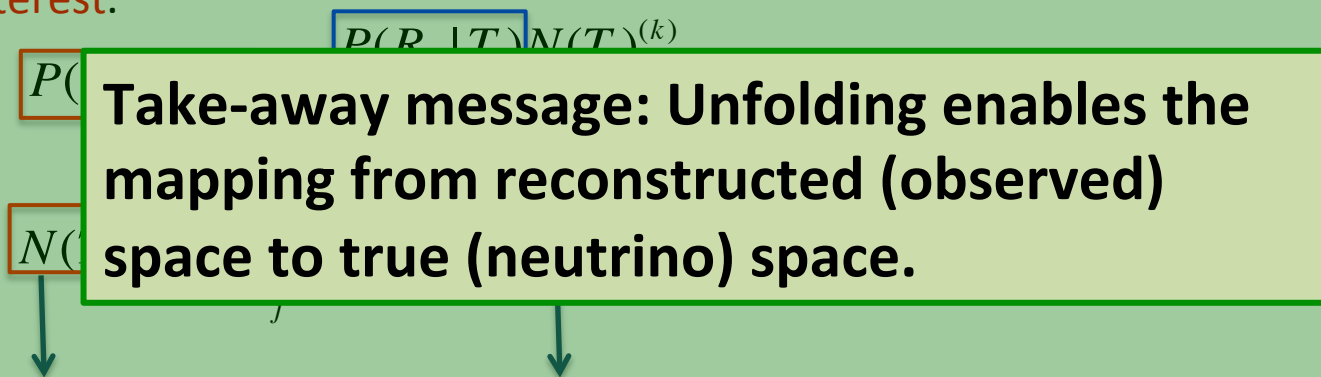
R: reconstructed (observed) energy, zenith
T: true (neutrino) energy, zenith

Unfolding



How do we get NEvents in neutrino energy and zenith bins from reconstructed (observed) distribution?

- An Unfolding method (**Iterative Unfolding**) is used to unfold **zenith distribution (2bins) and energy distribution** at the same time.
- **An assumption of 1:1:1 flavor ratio is made.**
- The probability $P(T_i | R_j)$ of an event end up in Reco bin j given True bin i is **known**.
- The probability $P(R_j | T_i)$ of an event from True bin i given it's found in Reco bin j is **of interest**.



Distribution in **true** space of the k+1 th iteration

Distribution in **reconstructed** space, aka measurement

R: reconstructed (observed) energy, zenith
T: true (neutrino) energy, zenith

How to estimate statistical uncertainty in iterative unfolding?

- Use MCMC to sample in **reconstructed (observed)** space with log uniform prior.
- MCMC sampling distribution is shown as below.

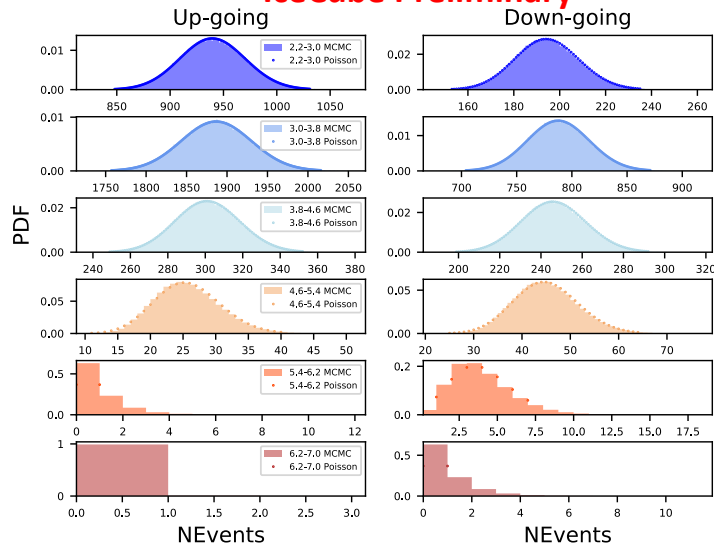
Iterative Unfolding



- Get posterior distribution in **true (neutrino)** space.
- Take the 68% range (from 16% to 84% in cdf) as the uncertainty.



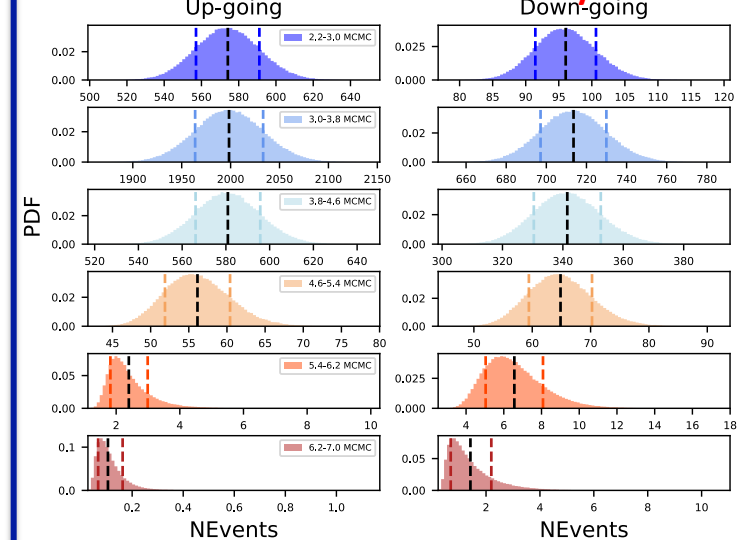
IceCube Preliminary



Energy Increases



IceCube Preliminary

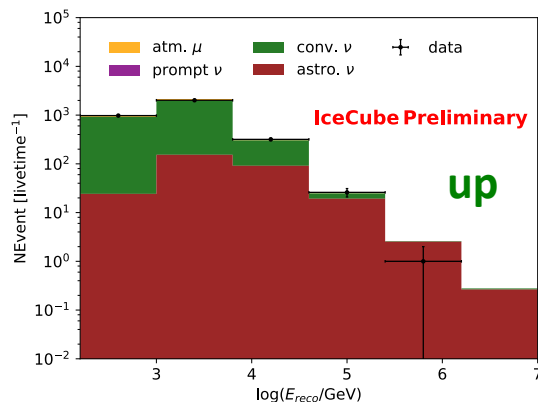
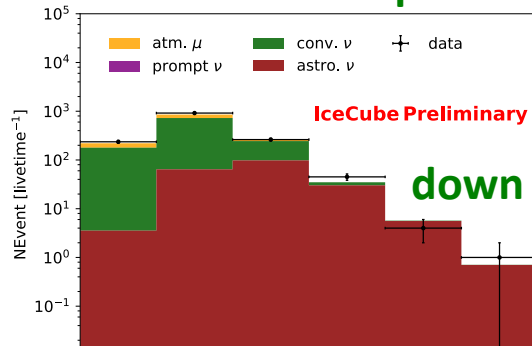


Unfolding



- Assign data in **reconstructed energy** bins according to their **reconstructed direction**.

Reconstructed Space



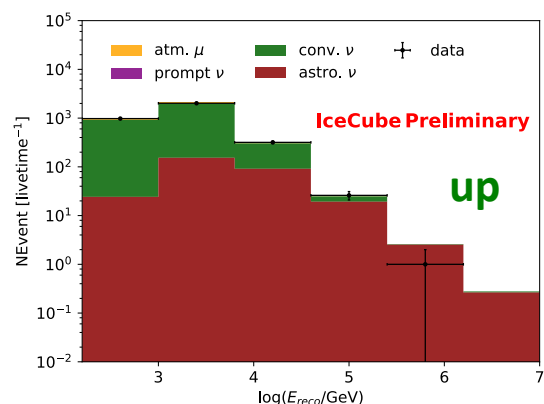
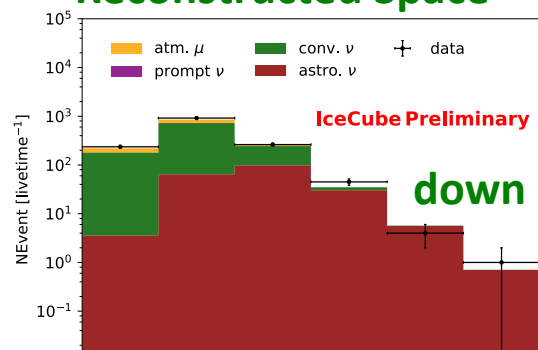
Unfolding



Stony Brook University

- Assign data in **reconstructed energy** bins according to their **reconstructed direction**.
- Apply unfolding to data distribution in reconstructed space subtract the background estimation.

Reconstructed Space



data-background



Unfolding

Unfolding

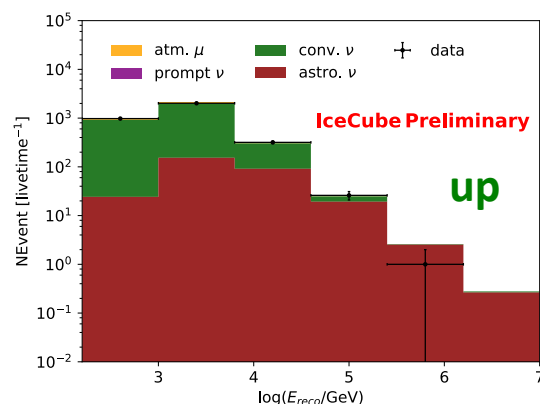
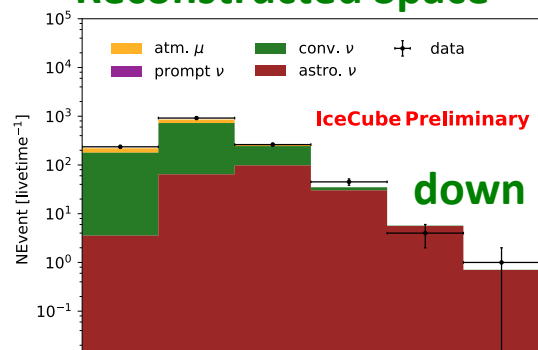


Stony Brook University

- Assign data in **reconstructed energy** bins according to their **reconstructed direction**.
- Apply unfolding to data distribution in reconstructed space subtract the background estimation.
- We acquire NEvents in **neutrino energy** bins according to their **true direction**.

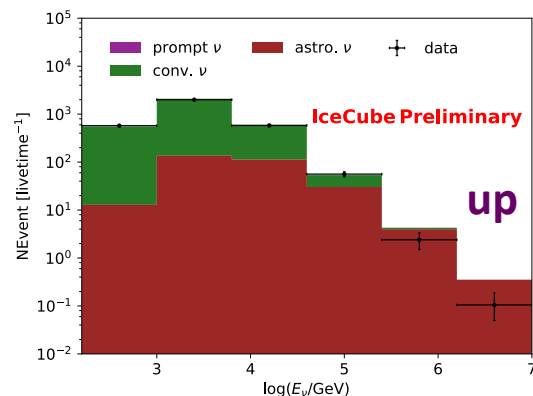
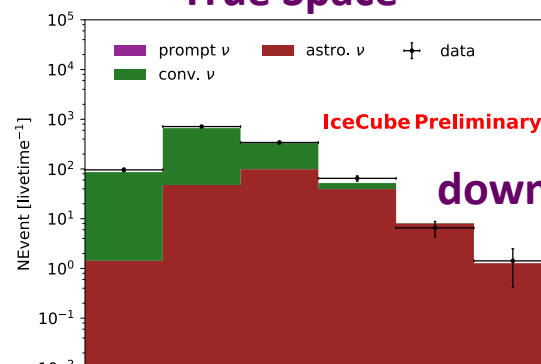
Reconstructed Space

True Space



data-background

Unfolding



What exactly is the ratio we are calculating?

Assuming isotropic astro flux

$$R_{\text{exp}}(E_\nu) = \frac{N(E_\nu, \text{down}_\nu)}{N(E_\nu, \text{up}_\nu)} = \frac{\cancel{\Phi(E_\nu)} \cdot \cancel{Acpt(E_\nu, \text{down}_\nu)} \cdot \cancel{\sigma(E_\nu)}}{\cancel{\Phi(E_\nu)} \cdot \cancel{Acpt(E_\nu, \text{up}_\nu)} \cdot \boxed{Absp(\sigma(E_\nu))} \cdot \cancel{\sigma(E_\nu)}}$$

$$\equiv \boxed{R(E_\nu)} \cdot \boxed{CF(E_\nu)}$$

- Ratio of $N(E_\nu, \text{down})$ and $N(E_\nu, \text{up})$ contains information of **detector acceptance effects**, i.e. the detector accepts down-going neutrinos and up-going neutrinos with different efficiency (DOMs pointing down-wards, self-veto, event selection effect).
- After a correction factor (calculated from simulation) is applied, the **new ratio** reflects information of Earth absorption only. This new ratio is what we use to measure cross section.

$$CF(E_\nu) \equiv \frac{Acpt(E_\nu, \text{up})}{Acpt(E_\nu, \text{down})}$$

$$Acpt(E_\nu, \text{up/down}) = \frac{N\text{Events}(E_\nu, \text{up/down, final})}{N\text{Events}(E_\nu, \text{up/down, gen})}$$

Ratio



What exactly is the ratio we are calculating?

Assuming isotropic astro flux

$$R_{\text{exp}}(E_\nu) = \frac{N(E_\nu, \text{down}_\nu)}{N(E_\nu, \text{up}_\nu)} = \frac{\cancel{\Phi(E_\nu)} \cdot \cancel{Acpt(E_\nu, \text{down}_\nu)} \cdot \cancel{\sigma(E_\nu)}}{\cancel{\Phi(E_\nu)} \cdot \cancel{Acpt(E_\nu, \text{up}_\nu)} \cdot \boxed{Absp(\sigma(E_\nu))} \cdot \cancel{\sigma(E_\nu)}}$$

$$\equiv \boxed{R(E_\nu)} \cdot \boxed{CF(E_\nu)}$$

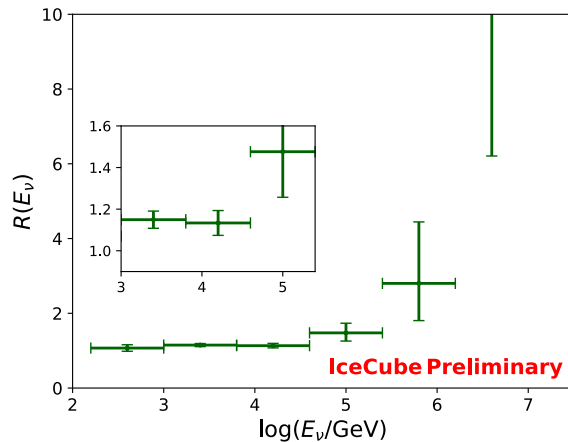
- Ratio of $N(E_\nu, \text{down})$ and $N(E_\nu, \text{up})$ contains information of **detector acceptance effects**, i.e. the detector accepts down-going neutrinos and up-going neutrinos with different efficiencies (DOM pointing down/up, self-trigger, event selection effect).
- After a ratio is formed, the detector acceptance effect is factorized, we use $R(E_\nu)$ as the ratio to measure cross section.

$$CF(E_\nu) \equiv \frac{Acpt(E_\nu, \text{up})}{Acpt(E_\nu, \text{down})} \quad Acpt(E_\nu, \text{up/down}) = \frac{N_{\text{Events}}(E_\nu, \text{up/down, gen})}{N_{\text{Events}}(E_\nu, \text{up/down, obs})}$$



How to measure the cross section with the ratio in each neutrino energy bin?

- Take the ratio in each neutrino energy bin.

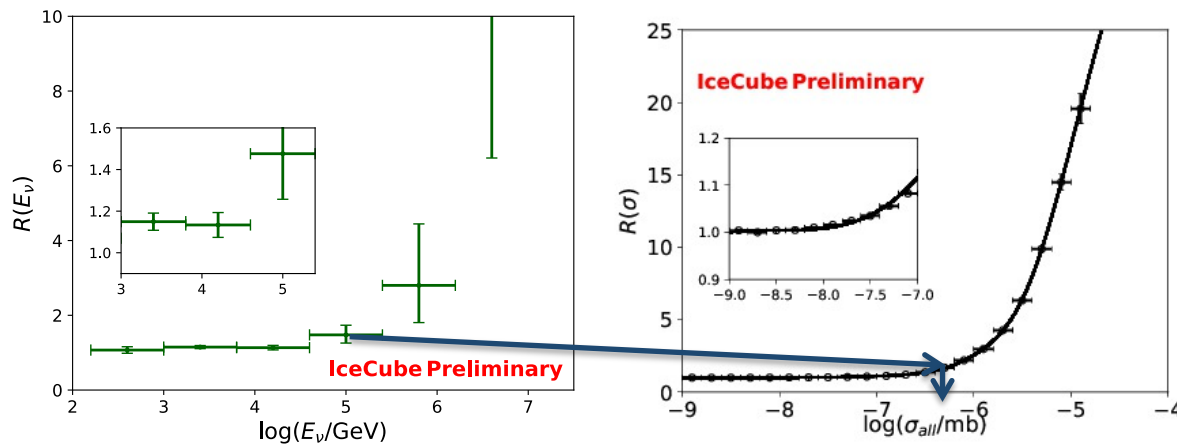


$$R(E_\nu)$$



How to measure the cross section with the ratio in each neutrino energy bin?

- Take the ratio in each neutrino energy bin.
- Find the corresponding cross section for that ratio in ratio vs cross section curve.



$R(E_\nu)$

$R(\sigma)$

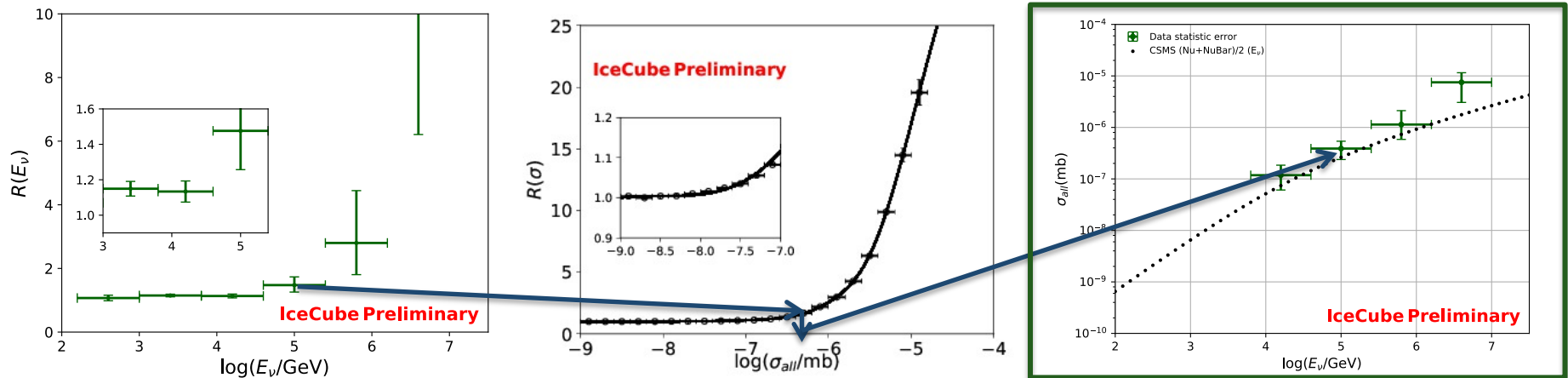
Cross Section Measurement



Stony Brook University

How to measure the cross section with the ratio in each neutrino energy bin?

- Take the ratio in each neutrino energy bin.
- Find the corresponding cross section for that ratio in ratio vs cross section curve.
- The cross section measured for that each neutrino energy bins is the **total cross section (CC+NC), average over neutrino and anti-neutrino with the ratio 1:1.**



$$\begin{matrix} R(E_\nu) \\ R(\sigma) \end{matrix} \quad \longrightarrow \quad \sigma(E_\nu)$$

Result!

Systematic Study



Stony Brook University

- The systematic effects that **change the mapping between reconstructed (observed) space and true (neutrino) space**, i.e. the unfolding procedure will affect the result, thus contribute to the systematic uncertainty of this measurement.

Systematic Study



Stony Brook University

- The systematic effects that **change the mapping between reconstructed (observed) space and true (neutrino) space**, i.e. the unfolding procedure will affect the result, thus contribute to the systematic uncertainty of this measurement.
- The systematic effects considered in this analysis are:
 1. Photon scattering in the South Pole ice -> **Most significant systematic effect**

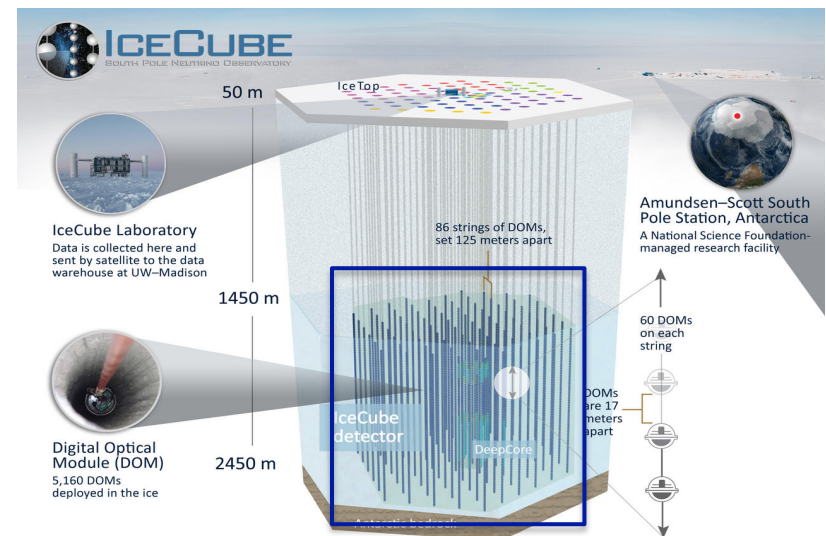
Systematic Study



Stony Brook University

- The systematic effects that **change the mapping between reconstructed (observed) space and true (neutrino) space**, i.e. the unfolding procedure will affect the result, thus contribute to the systematic uncertainty of this measurement.
- The systematic effects considered in this analysis are:
 1. Photon scattering in the South Pole ice -> **Most significant systematic effect**
 - photon scattering variations in the bulk ice-> implemented

bulk ice (the ancient glacial ice)



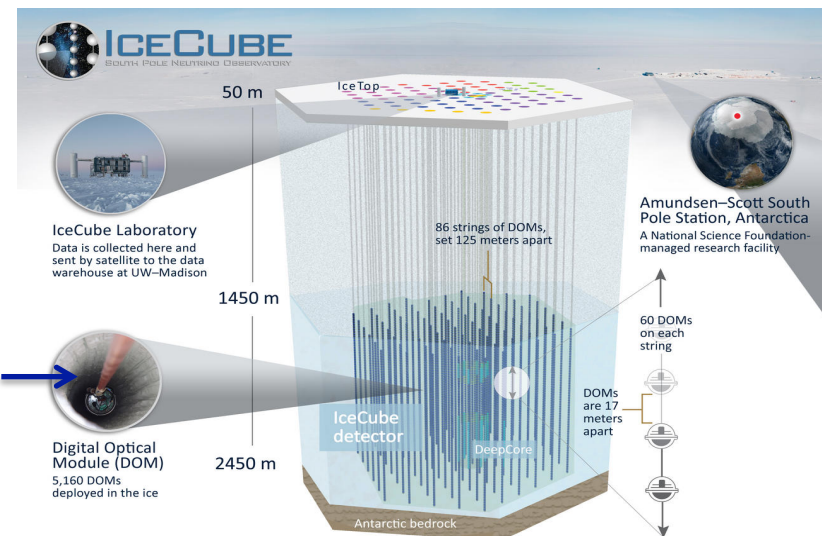
Systematic Study



Stony Brook University

- The systematic effects that **change the mapping between reconstructed (observed) space and true (neutrino) space**, i.e. the unfolding procedure will affect the result, thus contribute to the systematic uncertainty of this measurement.
- The systematic effects considered in this analysis are:
 1. Photon scattering in the South Pole ice -> **Most significant systematic effect**
 - photon scattering variations in the bulk ice-> implemented
 - photon scattering variations in the hole ice -> lack of simulation, will be added in the near future

hole ice (the refrozen ice around the DOMs)





- The systematic effects that **change the mapping between reconstructed (observed) space and true (neutrino) space**, i.e. the unfolding procedure will affect the result, thus contribute to the systematic uncertainty of this measurement.
- The systematic effects considered in this analysis are:
 1. Photon scattering in the South Pole ice -> **Most significant systematic effect**
 - photon scattering variations in the bulk ice-> implemented
 - photon scattering variations in the hole ice -> lack of simulation, will be added in the near future
 2. Photon absorption in the South Pole Ice
 3. DOM efficiency

} negligible effect on the result*

**more details see backup*



- The systematic effects that **change the mapping between reconstructed (observed) space and true (neutrino) space**, i.e. the unfolding procedure will affect the result, thus contribute to the systematic uncertainty of this measurement.
- The systematic effects considered in this analysis are:
 1. Photon scattering in the South Pole ice -> **Most significant systematic effect**
 - photon scattering variations in the bulk ice-> implemented
 - photon scattering variations in the hole ice -> lack of simulation, will be added in the near future
 2. Photon absorption in the South Pole Ice
 3. DOM efficiency

} **negligible effect on the result***

 4. Self-Veto effect*: the uncertainty on this parameter itself is small.
 5. Astrophysical neutrino flux: **Due to the ratio method, the uncertainty associated with flux is negligible.**

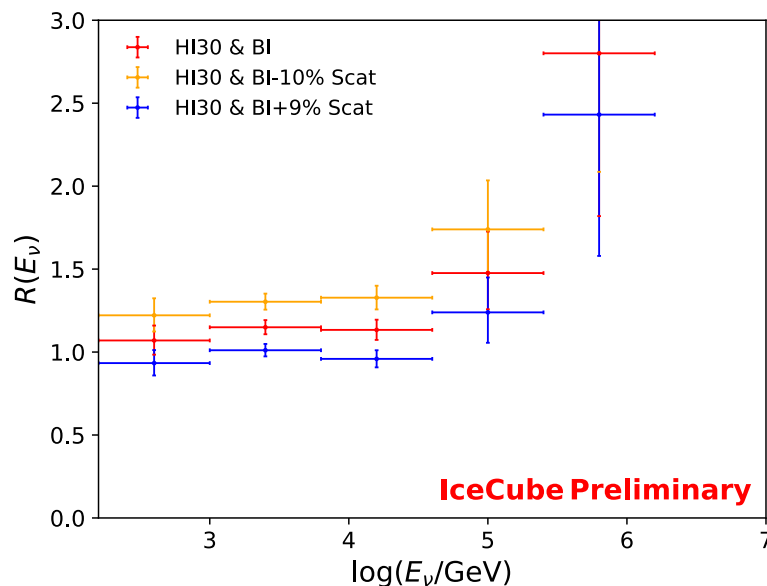
**more details see backup*

Systematic Study



Stony Brook University

- Using the matrices built with different systematic simulation datasets to unfold data results in different NEvents neutrino energy & zenith bins -> different ratios in neutrino energy bins as shown in the left plot below.

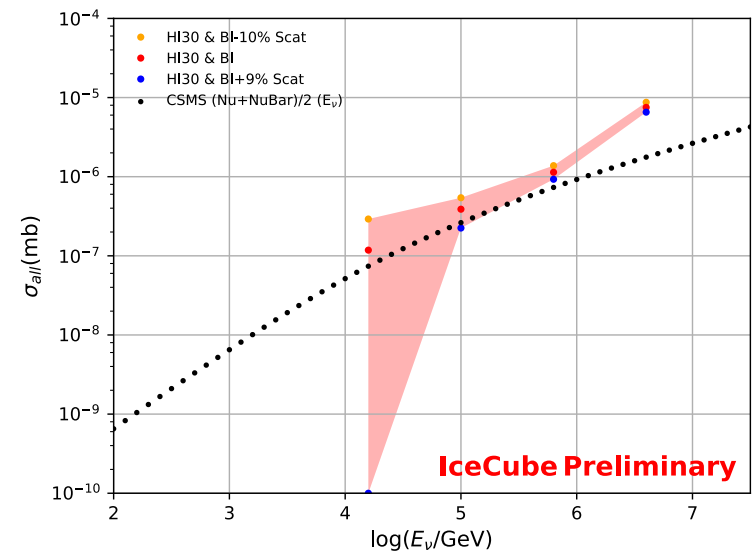
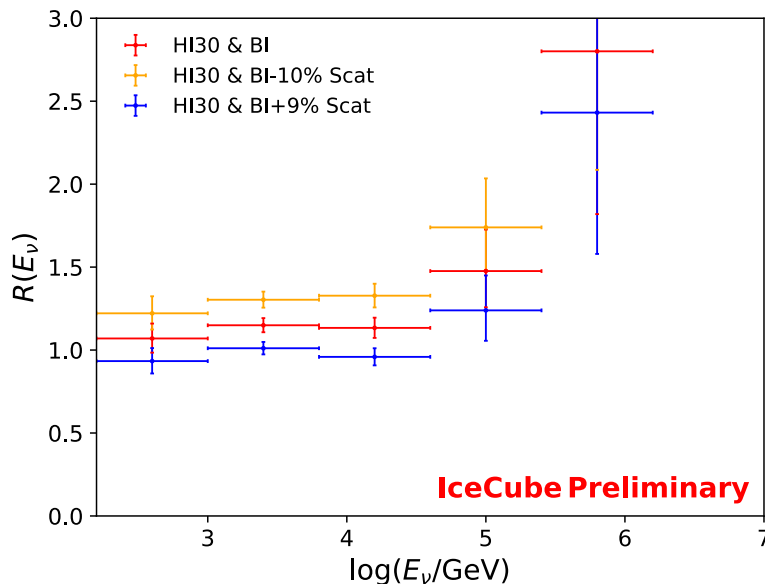


Systematic Study



Stony Brook University

- Using the matrices built with different systematic simulation datasets to unfold data results in different NEvents neutrino energy & zenith bins -> different ratios in neutrino energy bins as shown in the left plot below.
- Different ratios correspond to different cross sections. The light red band in the right plot shows the partial systematic uncertainty for this analysis.

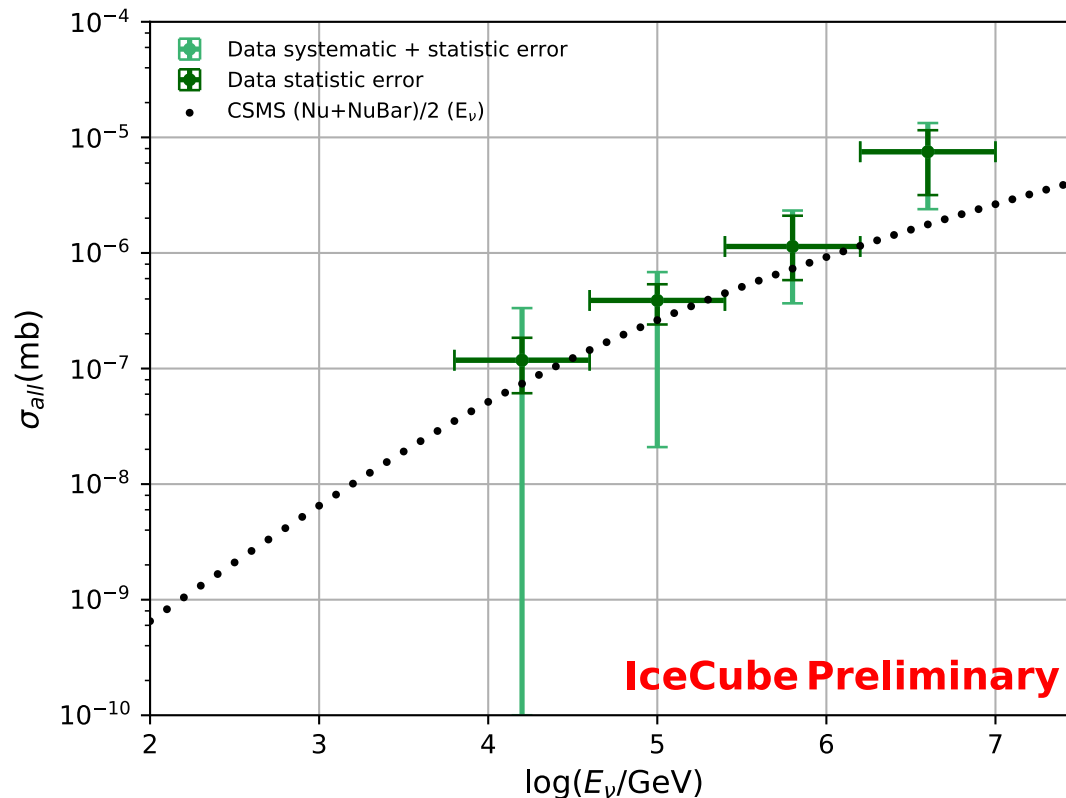


Combined Uncertainty



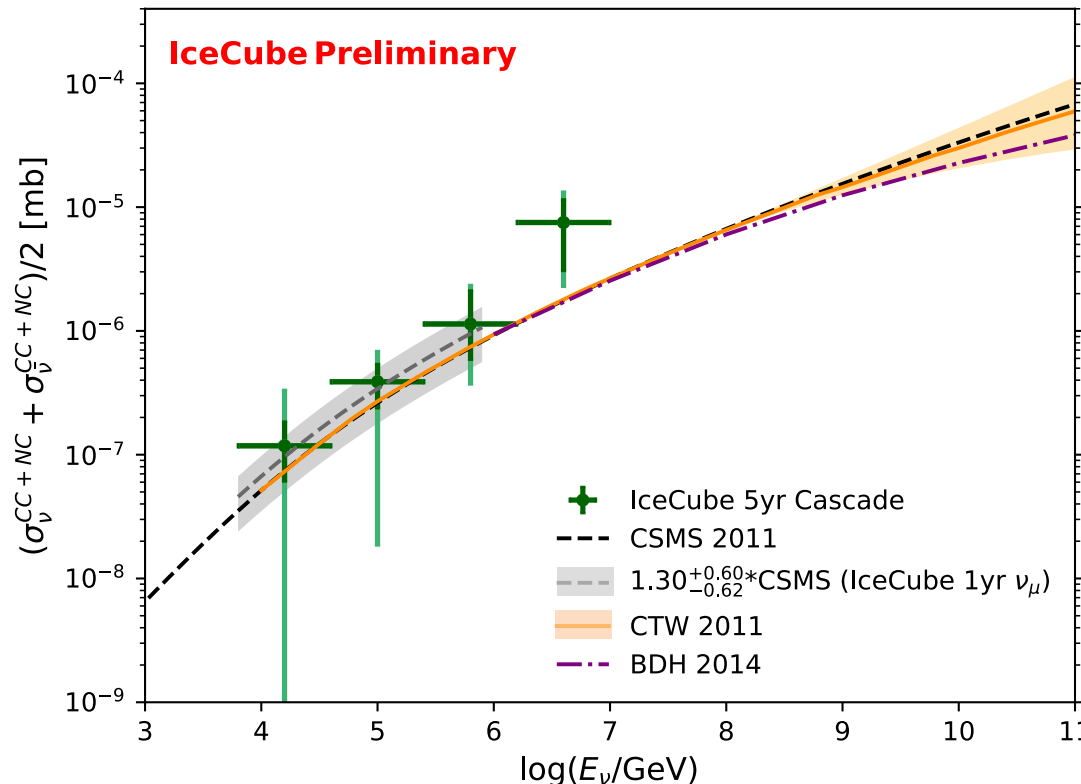
Stony Brook University

Neutrino energy dependence (in **6.3TeV-10PeV** range) of neutrino-nucleon cross section measurement result with statistic uncertainty and statistic + partial systematic uncertainty





Neutrino energy dependence (in **6.3TeV-10PeV** range) of neutrino-nucleon cross section measurement result with statistic uncertainty and statistic + partial systematic uncertainty in comparison with more models



CSMS: *JHEP* 08, 042 (2011)

CTW: *Phys. Rev. D* 83, 113009 (2011)

BDH: *Phys. Rev. D* 89, 094027 (2014)



- A **novel analysis** has been developed to measure neutrino-nucleon **cross section in 6.3TeV-10PeV region** using 5 years' IceCube Cascade sample.
- **Iterative Unfolding** is used to map from reconstructed energy and direction to neutrino energy and direction.
- The method to estimate statistical uncertainty using **MCMC** is presented.
- **All but one** (hole ice scattering variations) **systematic effects have been evaluated.**
- The measurement result with uncertainties has been presented. The result shows **consistency with the CSMS** standard model cross section.

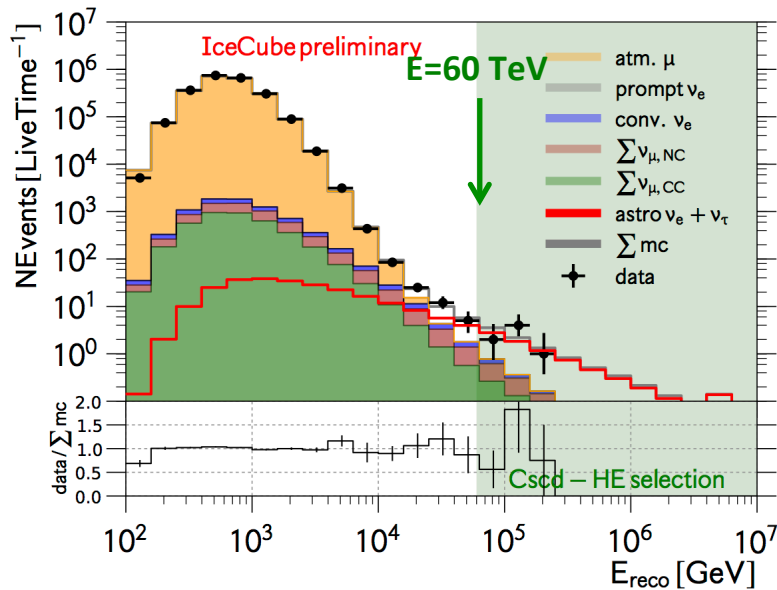


Backup

Event Selection

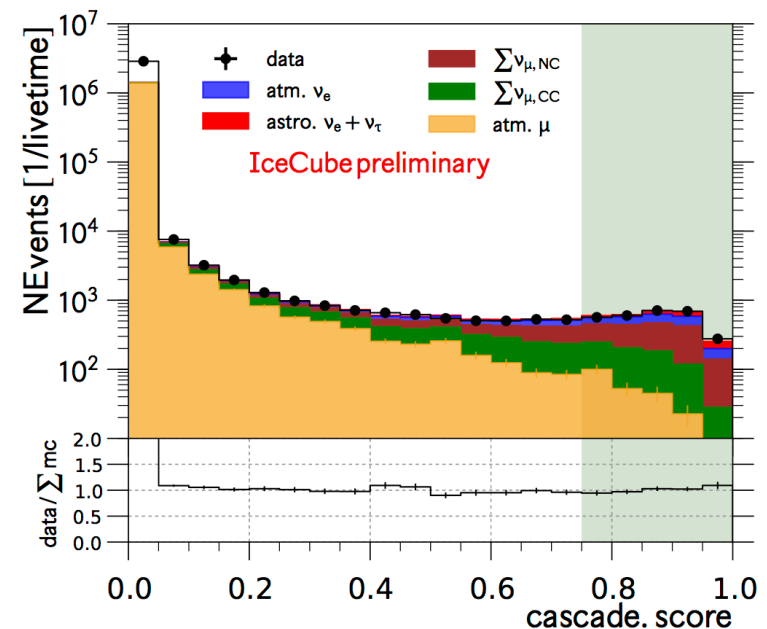


Stony Brook University

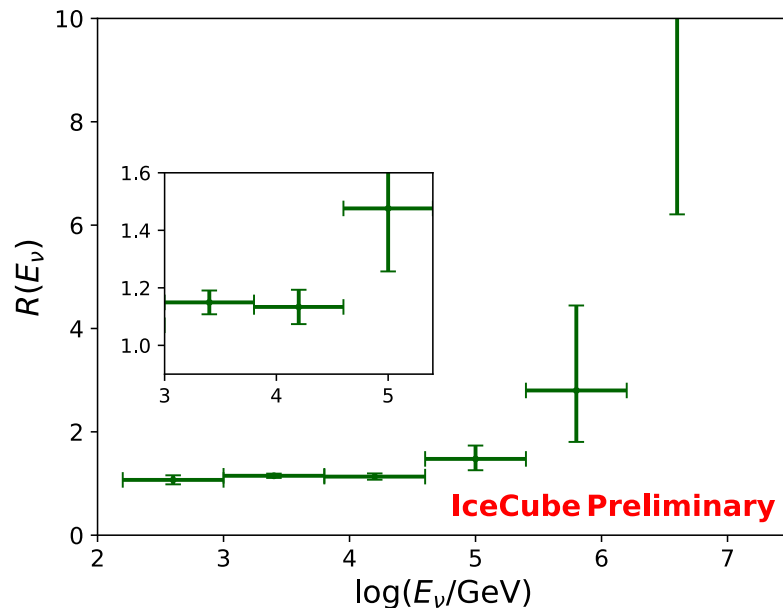


- The low energy part applies gradient boosted multi-class decision trees to classify events in to three groups: cascade, starting track and track.

- Event sample was separated into two parts: low energy ($<60\text{TeV}$) and high energy ($E \geq 60\text{TeV}$)
- The high energy part applies straight cut on variables that have separation power in event topology.

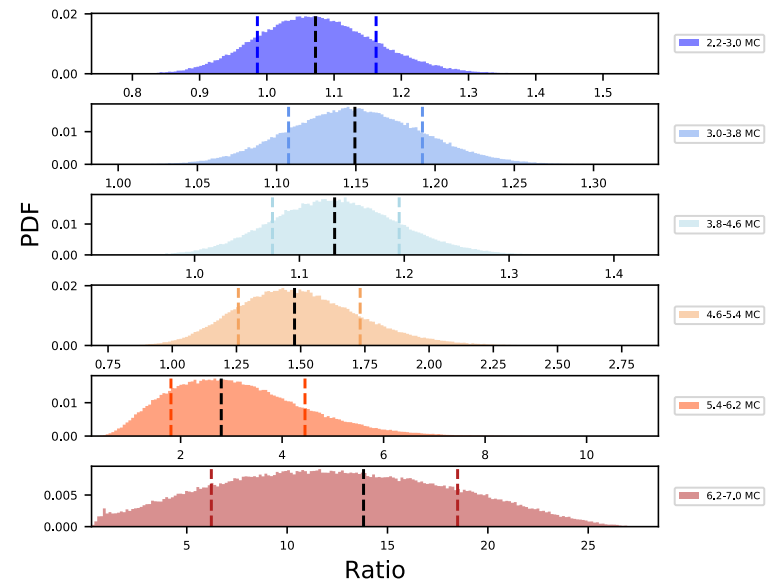


The unfolded ratio in neutrino energy bins for Data



The MCMC posterior distribution of unfolded ratio in neutrino energy bins for Data

IceCube Preliminary

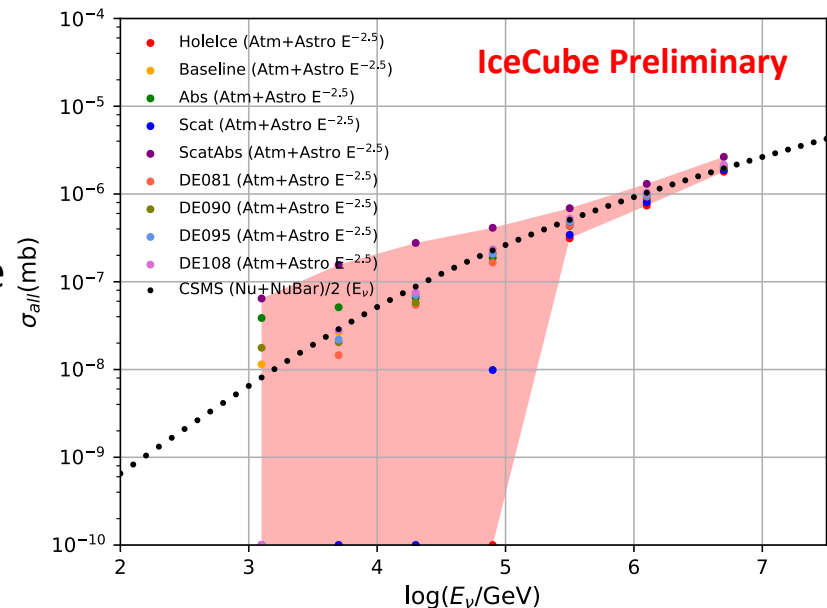


Systematic Study



Stony Brook University

- To study the effect of ice property and DOM efficiency change, baseline reconstructed distribution is used to be unfolded with all the systematic datasets (abs, scat, scatabs, DOMEff, HoleIce 30)
- The plot shows that the systematic parameter that affects the result the most is **scattering(Bulk Ice)** and **holeice**.
- It's shown that HoleIce 30 simulation describe the sample used for this analysis better. Therefore we **define HoleIce 30 as new baseline**. We will show how to treat the change of bulk ice scattering on HoleIce 30 and **avoid overestimating its uncertainty**.
- New HoleIce Model will be checked (simulation is being processed).

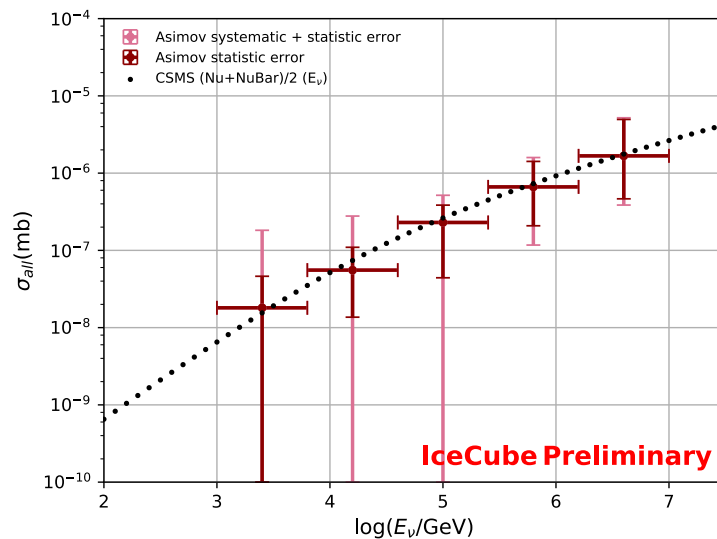


Expected Sensitivity

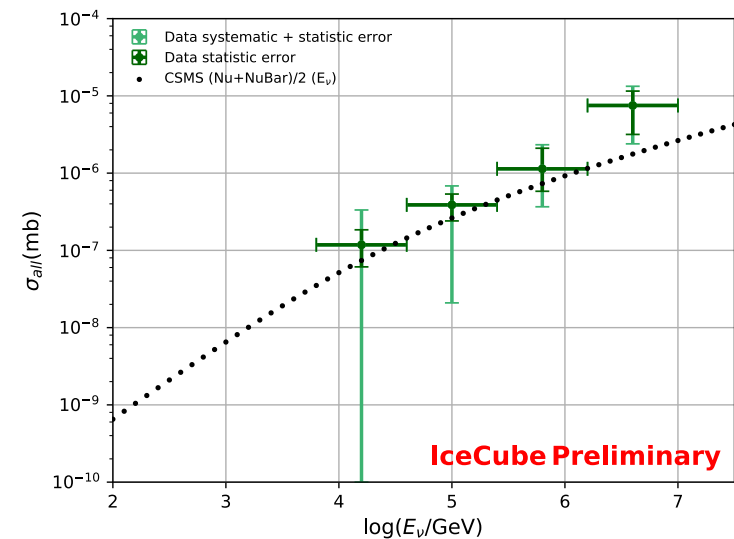


Stony Brook University

Combined systematic and statistic uncertainty assuming **5years' life time** in Asimov study

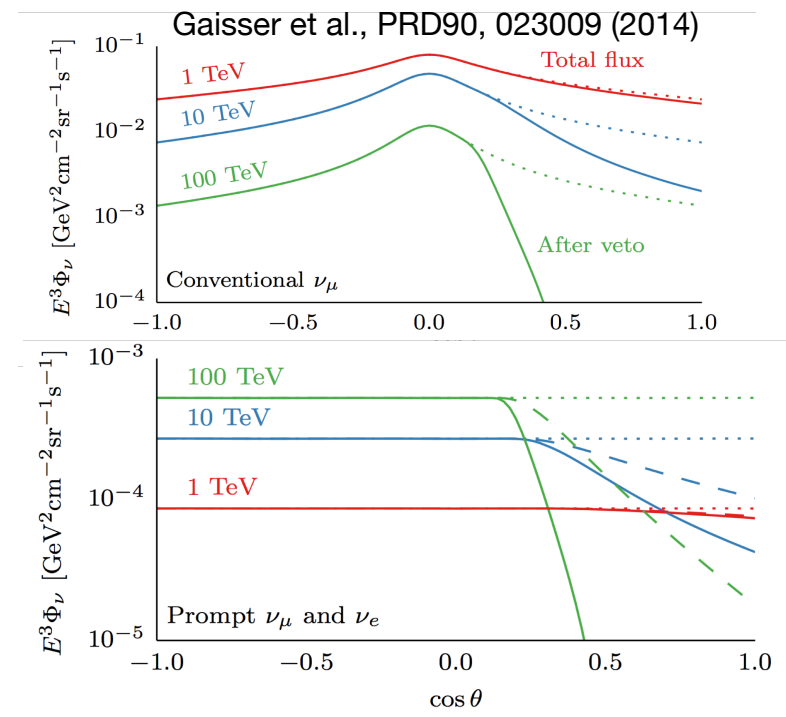


Combined systematic and statistic uncertainty for **2011-2015 data**



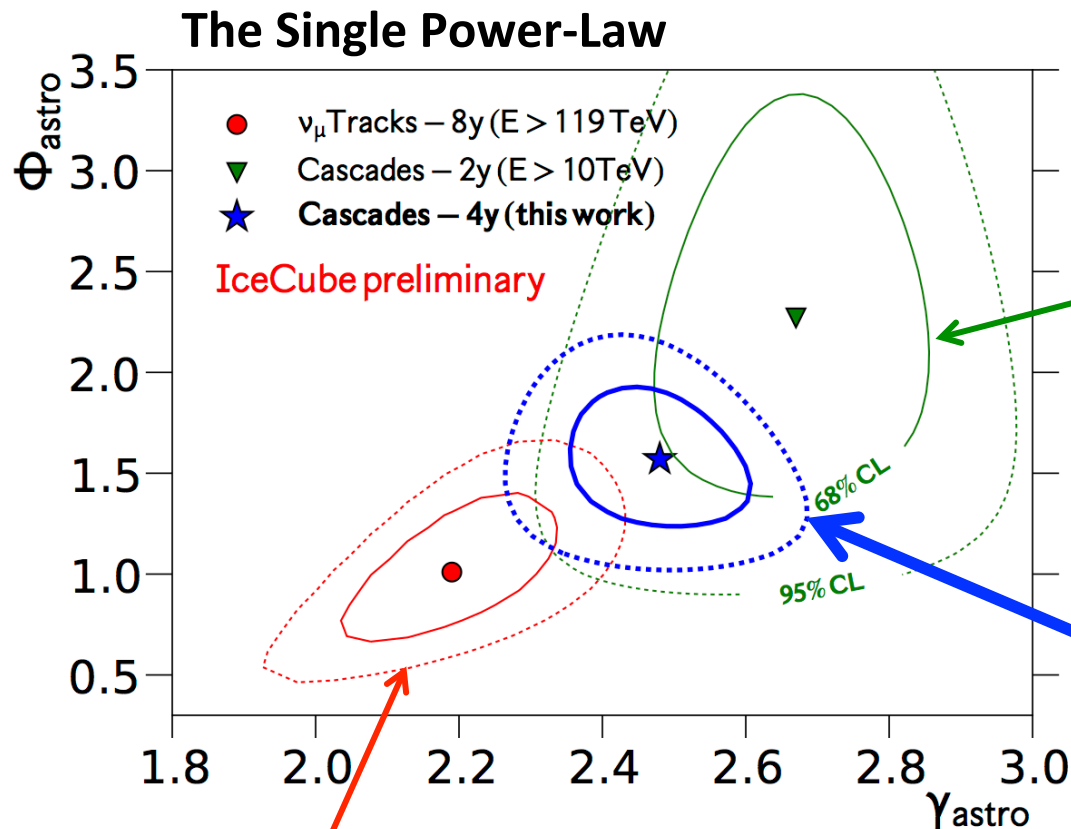


- Atmospheric neutrinos are produced when cosmic ray enters the atmosphere. In this process, atmospheric muons are produced as well.
- Atmospheric neutrinos from the southern sky (down-going) are often accompanied by atmospheric muons, while Atmospheric neutrinos from the northern sky (up-going) do not have such effect.
- Therefore the southern sky atmospheric neutrinos detection efficiency is lower than northern sky due to the muon rejection process.





Astrophysical Neutrino Flux



PoS(ICRC2015)1109

$\nu_e + \nu_{\tau}$

$E_{\text{rec}} > 10 \text{ TeV}$

this work

PoS(ICRC2017)968

$\nu_e + \nu_{\tau}$

significant energy range
12 TeV – 2.1 PeV

PoS(ICRC2017)1005

ν_{μ} Northern Sky

significant energy range
119 TeV – 4.8 PeV

poster NU022

✓ consistent with previous cascade analysis

✓ also still consistent with diffuse ν_{μ} ($p=0.04$)