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Flavor And Energy Inference For The High-Energy IceCube Neutrinos And Applications In Quantum Spacetime Models

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A flavor and energy inference analysis is presented for each high-energy neutrino event observed by the IceCube observatory during six years of data taking. For each event the main observables in the IceCube detector are the deposited energy and the event topology (showers or tracks) produced by the Cherenkov light by the transit through a medium of charged particles created in neutrino interactions. Using Bayesian inference and Markov chain Monte Carlo it is possible to reconstruct from these observables the properties of the astrophysical neutrino which generated such event. In the end, in the contest of a multi-messenger astrophysics, it is speculated that some aspects of IceCube data may be manifestations of quantum-gravity-modified laws of propagation for neutrinos. A speculation which, as testified by some recent publications, has attracted an increasing interest.

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1. Introduction

The largest neutrino telescope to date is the IceCube Neutrino Observatory at the geographic South Pole. After six years of data taking¹, from early 2010 to early 2016 for a total of 2078 days, 74 cointened "high-energy starting event" (HESE) with deposited energies above 30 TeV have provided the evidence for the existence of an extraterrestrial neutrino flux. The discovery of this flux has motivated a vigorous program of studies to unravel their origin² and their properties³⁻⁵.

In previou works IceCube data have been analyzed and discussed in detail (see Ref.^{2,3,6} and references therein) using a maximum-likelihood approach over the whole collection of events. Although useful informations about the energy behavior and the flavor composition has already been explored, it has never been performed an inference analysis of the properties of each single astrophysical neutrino.

This inference analysis for the energy of the astrophysical neutrinos will be then used in order to suggest that some aspects of IceCube data might be manifestations of quantum-gravity-modified laws of propagation for neutrinos. The prediction of a neutrino emission associated with gamma ray bursts (GRBs) is generic within the most widely accepted astrophysical models⁷. After a few years of operation Ice-Cube still reports⁸ no conclusive detection of GRB neutrinos, contradicting some influential predictions^{9–12} of the GRB-neutrino observation rate by IceCube. From the viewpoint of quantum-gravity/quantum-spacetime research it is interesting to speculate that the IceCube results for GRB neutrinos might be misleading because of the assumption that GRB neutrinos should be detected in very close temporal coincidence with the associated -rays: a sizeable mismatch between GRB-neutrino detection time and trigger time for the GRB is expected in several much-studied models of neutrino propagation in a quantum spacetime (see Refs. $^{13-15}$ and references therein).

2. Neutrino inference analysis and assumptions on the astrophysical flux

IceCube detects neutrinos by observing Cherenkov light produced by charged particles created in neutrino interactions as they transit the ice within the detector. At this range of energies, the way neutrinos interact is deep-inelastic scattering with nuclei in the detector material. There are two possible interactions: chargedcurrent (CC) or neutral-current (NC) interactions. In both a cascades of hadrons is created at the neutrino interaction vertex and for CC interaction this shower is accompanied by an outgoing charged lepton which may itself trigger another overlaid cascades. IceCube events have two basic topologies: tracks and showers. Considering the energy involved for this analysis we assume tracks are made only by ν_{μ} CC interactions and by ν_{τ} CC interactions in which the tau lepton decays in $\nu_{\tau} \mu \nu_{\mu}$. Showers instead are those events without visible muon tracks and are formed by particle showers near the neutrino vertex. While the particle content of showers created by final-state hadrons, electrons, and taus is different, the IceCube detector is currently insensitive to the difference. This means that a shower is produced in ν_e CC interaction, ν_{τ} CC interactions (where the produced τ does not decay in the muonic channel), and in all-flavor NC interactions. In Table 1 we summarize all parameters and the sequence of events that, given a neutrino with energy E_{ν} , cause an observed-deposited energy $E_{dep.}^{obs.}$ in the detector. In a certain sense, we need to go backwards through the whole chain of events in order to infer the neutrino energy E_{ν} from the observed-deposited energy $E_{dep.}^{obs.}$ and its topology.

As usually done in literature, let D denote the observed data, in our case the observed-deposited energy $E_{dep}^{obs.}$ and the event topology (track or shower), and θ denote the model parameters, which are summarized in the first column of Table 1. Formal inference then requires setting up a joint probability distribution $f(D,\theta)$ (here and in the rest of this paper we will refer simply as f to all distributions). This joint distribution comprises two parts: a prior distribution $f(\theta)$ (see the second column of Table 1) and a likelihood $f(D|\theta)$. Defining $f(\theta)$ and $f(D|\theta)$ gives the full probability distribution

$$f(D,\theta) = f(D|\theta) \cdot f(\theta).$$
(1)

Having observed D, one can then obtain the distribution of θ conditional on D by applying the Bayes theorem

$$f(\theta|D) = \frac{f(D|\theta) \cdot f(\theta)}{\int f(D|\theta) \cdot f(\theta) \, d\theta}.$$
(2)

This is called the posterior distribution of θ and is the object of our Bayesianinference analysis. From the posterior distribution of θ one can then obtain the

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Table 1. Table of all parameters used in this analysis along with their associated prior probability distribution. The last column shows the references where these parameters are discussed in detail.

Parameters		Prior probability distribution	Ref.
Flux parameters			
r	(anti-neutrino/neutrino ratio)	$\delta(r-1)$	16
		$1/3, \ell = e$	
ℓ	(neutrino flavor)	$1/3, \ell = \mu$	17
		$1/3, \ell = \tau$	
γ	(spectral index)	$\delta(\gamma-2)$	1,18
E_{ν}	(neutrino energy)	$E_{\nu}^{-2}/\left((60{\rm TeV})^{-1}-(3{\rm PeV})^{-1} ight)$	1,18
Deep-inelastic scattering parameters			
k	(neutrino-nucleon interaction)	$A_1 + A_2 \cdot \ln(\epsilon - A_3), k = \mathrm{NC}$	19,20
		$1 - A_1 - A_2 \cdot \ln(\epsilon - A_3), k = CC$	
y	(inelasticity parameter)	$d\sigma_k(E_ u)/dy$	19,21
au-decay parameters			
	(au-decay channel)	$0.18, j = \tau \to \nu_\tau e \nu_e$	22
		$0.18, j = \tau \to \nu_\tau \mu \nu_\mu$	
i		$0.12, j = \tau \to \nu_\tau \pi$	
J		$0.26, j = \tau \to \nu_\tau \rho$	
		$0.13, j = \tau \to \nu_\tau a_1$	
		0.13, $j = \tau \rightarrow \nu_{\tau} X$ $(X \neq \pi, \rho, a_1)$	
	(energy fraction $E_{\nu_{\tau}}/E_{\tau}$)	$4/3(1-z^3)$, if $j = \tau \to \nu_\tau e \nu_e$ or $\nu_\tau \mu \nu_\mu$	22-24
		$(a_{\pi} + b_{\pi} \cdot z) \theta(1 - r_{\pi} - z), \text{if } j = \tau \to \nu_{\tau} \pi$	
z		$(a_{\rho} + b_{\rho} \cdot z) \theta(1 - r_{\rho} - z), \text{if } j = \tau \to \nu_{\tau} \rho$	
		$(a_{a_1} + b_{a_1} \cdot z) \theta(1 - r_{a_1} - z), \text{if } j = \tau \to \nu_\tau a_1$	
		$1/0.3 \theta(0.3-z), \text{if } j = \tau \to \nu_{\tau} X (X \neq \pi, \rho, a_1)$	
	(energy fraction E_{ℓ}/E_{τ})	$4 - 12z' + 12z'^2 - 4z'^3$, if $j = \tau \to \nu_\tau e \nu_e$ or $\nu_\tau \mu \nu_\mu$	22,23
Deposited Energy			
$E_{dep.}^{obs.}$ (observed deposited energy)		$\mathcal{N}(E_{dep.}^{obs.} E_{dep.}, \sigma_{E_{dep.}})$	3,5

expected value of a given parameter by integrating over the remaining parameters or study the dependence between parameters x and y by applying the product rule f(x|y, D) = f(x, y|D)/f(y|D).

From Eq. 2, one recovers the maximum likelihood approach as a special case that holds under particular conditions, such as many data points and vague priors, which clearly are not satisfied in this analysis.

In theory, Bayesian methods are straightforward: the posterior distribution contains everything you need to carry out inference. In practice, the posterior distribution can be difficult to estimate precisely. A useful tool to derive the posterior 4

distribution of Eq. 2 is the Markov Chain Monte Carlo (MCMC) technique. In a MCMC instead of having each point being generated one independently from another (like in a Monte Carlo), the sequence of generated points takes a kind of random walk in parameter space. In particular, for this work we performed the MCMC using the Gibbs sampling algorithm²⁵, in order to explore the entire parameter space of the posterior distribution. This allows us to derive the unknown and potentially complex distribution $f(\theta|D)$ and estimate all neutrino properties we are interested in.

3. Astrophysical neutrinos affected by in-vacuo dispersion

Focusing only on shower events, for which the energy inference is less problematic, and focusing on the class of scenarios whose predictions for energy (E_{ν}) dependence of Δt (the mismatch between GRB-neutrino detection time and trigger time for the GRB) can all be described in terms of the formula ^a (working in units with the speed-of-light scale c set to 1)

$$\Delta t = \eta_X \frac{E_\nu}{M_P} D(z) \pm \delta_X \frac{E_\nu}{M_P} D(z) , \qquad (3)$$

one finds that 9 IceCube neutrinos fit the requirements for candidate GRB neutrinos affected by in-vacuo dispersion. The properties of these 9 candidates are summarized in Fig. 1. The correlation between $|\Delta t|/(1+z)$ and $E^*/(1+z)$ ^b for



Fig. 1. Points here in figure correspond to the 9 GRB-neutrino candidates picked up by the selection criteria, characterized in terms of their values of $\Delta t/(1+z)$ and $E^*/(1+z)$. Filled points correspond to "late neutrinos" ($\Delta t > 0$), while unfilled points correspond to "early neutrinos" ($\Delta t < 0$).

^aHere the redshift- (z-)dependent D(z) carries the information on the distance between source and detector, and it factors in the interplay between quantum-spacetime effects and the curvature of spacetime. With M_P we denote the Planck scale ($\simeq 1.2 \cdot 10^{28} eV$) while the values of the parameters η_X and δ_X characterize the specific scenario one intends to study. ^b E^* is a "distance-rescaled energ" defined as $E \cdot D(z)/D(1)$.

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the 9 GRB-neutrino candidates highlighted in Fig.1 is of 0.866. We then ask^{26,27} how often a time-randomization procedure produces 9 or more GRB-neutrino candidates with correlation ≥ 0.866 , and remarkably we find that this happens only in 0.11% of cases.

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