Flavor Ratio of Astrophysical Neutrinos above 35 TeV in IceCube

A diffuse flux of astrophysical neutrinos above 100 TeV has been observed at the IceCube Neutrino Observatory. Here we extend this analysis to probe the astrophysical flux down to 35 TeV and analyze its flavor composition by classifying events as showers or tracks. Taking advantage of lower atmospheric backgrounds for showerlike events, we obtain a shower-biased sample containing 129 showers and 8 tracks collected in three years from 2010 to 2013. We demonstrate consistency with the backgrounds for showerlike events, we obtain a shower-biased sample containing 129 showers and 8 tracks.

**Introduction.—**Traveling virtually unimpeded through matter, radiation, and magnetic fields, astrophysical neutrinos probe otherwise inaccessible regions of the high-energy universe. If produced from cosmic rays interacting with gas and radiation at their sources, they convey unique information about astrophysical particle accelerators in their direction, energy, and flavor [1–5]. Though no individual sources of TeV cosmic neutrinos have yet been collected in three years from 2010 to 2013. We demonstrate consistency with the backgrounds for showerlike events, we obtain a shower-biased sample containing 129 showers and 8 tracks.
found, a diffuse flux was observed by the IceCube Neutrino Observatory above 100 TeV in three years of data [6,7]. Here this work is expanded to observe the diffuse astrophysical neutrino flux down to 35 TeV and derive constraints on its flavor composition.

Astrophysical neutrinos are expected from the decay of secondary particles such as pions, kaons, muons, and neutrinos produced in cosmic-ray interactions. In the model of diffusive shock acceleration, the differential energy spectrum of injected cosmic rays follows a power law \( E^{-\gamma} \) with \( \gamma \sim 2 \) [8,9]. Though this spectrum may be modified by propagation in cosmic magnetic fields en route to Earth [10], neutrinos produced at the source retain the same spectral index \( \gamma \) as the injected cosmic-ray spectrum, provided the environment is sparse enough to allow particles to decay rather than interact. In the most commonly considered scenario, the decay of pions and their daughter muons dominate the neutrino flux, resulting in a flavor ratio of \( f_\beta : f_\mu : f_\tau \approx (1:2:0) \) at the source [11,12]. The composition could vary from \((0:1:0)\) to \((1:0:0)\) under a multitude of scenarios including muon energy loss in high matter density or magnetic fields [13–16], muon acceleration [17], and neutron decay [18].

As first noted in Ref. [19], neutrino oscillations, averaged by propagation over astronomical distances, transform the flavor ratio according to the Pontecorvo-Maki-Nakagawa-Sakata (PMNS) mixing matrix [20–22]. Taking global best-fit mixing parameters [23], a flavor ratio at Earth of \( f_\beta : f_\mu : f_\tau \approx (0.93:1.05:1.02) \) is expected for a \((1:2:0)\) source composition, a result of the near tribimaximal form of the PMNS matrix [24]. For a composition at sources varying from \((0:1:0)\) to \((1:0:0)\), the composition at Earth varies linearly from \((0.6:1.3:1.1)\) to \((1.6:0.6:0.8)\). Though expected to be negligible [11], even a large \( \nu_e \) contribution at sources causes only a small deviation from this range. Because of this limited variation in the flavor ratio at Earth for all possible source compositions, the observation of a ratio inconsistent with these expectations would signal new physics in the neutrino sector, such as neutrino decay [25,26], sterile neutrinos [27], pseudo-Dirac neutrinos [28,29], Lorentz or CPT violation [30], and quantum gravity-induced decoherence [31]. Measuring the flavor ratio of astrophysical neutrinos is interesting both as a probe of the source of high-energy cosmic rays and as a test of fundamental particle physics.

Neutrino interactions in IceCube.—The IceCube detector consists of 5160 digital optical modules (DOMs) instrumenting 1 km\(^3\) of clear ice at the South Pole [32,33]. Each DOM contains a photomultiplier and digitizing electronics that detect Cherenkov light emitted from secondary particles produced in neutrino interactions [34]. Neutrino events are generally classified into two topologies: tracklike, where the path of an outgoing charged particle is visible, and showerlike, where the region of light emission is too small to be resolved and appears pointlike. For both topologies the energy deposited within the detector can be reconstructed within \( \approx 15\% \) above 10 TeV [35]. Neutrino direction can be reconstructed with a median angular error of \( \lesssim 1^\circ \) for tracks versus \( \sim 15^\circ \) for showers above 100 TeV [35].

In charged-current (CC) interactions, a neutrino deposits its energy into a charged lepton and a hadronic shower, and the topology of an event depends on flavor. For \( \nu_e \) CC interactions, the outgoing electron initiates an electromagnetic shower indistinguishable from the accompanying hadronic shower. For \( \nu_\mu \) CC interactions, the outgoing muon leaves a long track in addition to a hadronic shower. If the muon leaves the detector, the deposited energy is only a lower bound on the neutrino energy. For \( \nu_\tau \) CC interactions, the outgoing \( \tau \) decays quickly and is difficult to resolve for energy \( \lesssim 1\) PeV [19,35,36]. However, tracks may be observed from the muonic decay of the \( \tau \) with 17.4% branching ratio. In neutral-current interactions of all flavors, a neutrino deposits on average \( \approx 1/3 \) of its energy into a hadronic shower but with a cross section \( \sim 1/3 \) of the CC cross section [37]. Above \( \sim 10\) TeV, neutrino fluxes become attenuated by interactions in Earth, though \( \nu_\tau \) fluxes are regenerated by subsequent \( \tau \) decay to neutrinos [38].

The backgrounds in astrophysical neutrino searches are muons and neutrinos produced by cosmic-ray air showers in Earth’s atmosphere. Muons dominate the trigger rate in IceCube and usually create long tracks. However, they can also appear showerlike if they undergo a single catastrophic energy loss inside the detector. Atmospheric neutrinos are usually divided into two categories. The first arises from the decay of kaons, pions, and muons, producing mostly \( \nu_\mu \) [39–41]. Since time dilation causes decay to be less likely than interaction at high energy, the neutrino energy spectrum is asymptotically one power steeper than the primary cosmic-ray spectrum, and the angular distribution is peaked at the horizon. Time dilation also suppresses \( \nu_e \) from muon decay down to the detector depth, and the remaining \( \nu_\tau \) are from kaon decays at the level of \( \nu_e/\nu_\tau \approx 4\% \). The flux of atmospheric \( \nu_e \) has recently been measured in the TeV range by IceCube [42].

The second category, yet to be observed, results from the prompt decay of charm mesons [43–48], yielding a nearly equal mixture of \( \nu_e \) and \( \nu_\mu \), but negligibly small \( \nu_\tau \) [49]. Henceforth referred to as the charm neutrino flux, it should follow the same \( E^{-2.7} \) spectrum as primary cosmic rays and also be isotropic. Since atmospheric backgrounds from muons and \( \nu_\mu \) produced in \( \pi/K \) decay are largely tracklike, astrophysical events dominate over backgrounds down to lower energies in the shower channel, and a contribution from charm decay may be more easily identified [50].

Event selection.—Data collected at IceCube in 974 days from May 2010 to May 2013 are used in this analysis. During the design of the event selection criteria, 90% of
data was kept blind. Following the same strategy as the previous 3-year analysis \cite{6,7}, events are selected using an outer layer of DOMs to veto the vast majority of incoming muons, isolating neutrino interactions of all types starting within the detector from across the entire sky. Also similarly, the muon background rate is estimated with a control sample. Using outer DOMs to tag incoming muons, an inner volume geometrically similar to the full fiducial volume is defined with its own veto layer of DOMs. After correcting for its smaller fiducial volume, the rate of tagged but unvetoed events yields the muon background rate in the full detector.

Down-going atmospheric neutrinos can also be vetoed by accompanying muons that reach the detector from the same cosmic-ray air shower \cite{52}. The veto probability is determined using the analytic calculation described in Ref. \cite{53}, accounting for muons from both the same decay as the neutrino and other decays in the air shower. The resulting suppression of down-going atmospheric neutrino events distinguishes them from the isotropic distribution expected from a diffuse astrophysical flux. For the charm neutrino flux, otherwise isotropic, this suppression is the only distinguishing feature if the astrophysical flux has a power-law index close to 2.7 and a nonstandard flavor ratio \((1:1:0)_{\nu}\).

Showerlike and tracklike events are classified by performing a per-event maximum likelihood analysis of the first photon arrival times in every DOM. Each event is reconstructed according to the hypothesis of an infinite track with constant light emission along its path \cite{54} and the hypothesis of a pointlike shower \cite{55}, yielding likelihoods \(L_{\text{track}}\) and \(L_{\text{shower}}\). A log-likelihood ratio, \(\text{LLR} = -\ln(L_{\text{shower}}/L_{\text{track}})\), is formed, with negative values being considered showerlike and positive values tracks.

Figure 1 shows a distribution of LLR for veto-passing events in the 10% unblind data sample producing more than 1500 total photoelectrons (PE). Best-fit neutrino distributions for a \((1:1:1)_{\nu}\) composition (discussed later) are shown, and the prediction for muons is obtained from the corresponding likelihood ratio distribution in the muon control sample. The agreement with data illustrates that the control sample reliably predicts the rates of both showerlike and tracklike muons. Also shown is the combined distribution of astrophysical and atmospheric \(\nu_\mu\) CC events, illustrating that most are classified as tracks. The remaining 30% of \(\nu_\mu\) CC events classified as showers arise when the outgoing muon has too little energy to be resolved or escapes near the edge of the detector.

In the final selection, showerlike events above 1500 PE are selected, while for tracks, only events above 6000 PE are selected due to the larger background from penetrating muons. The deposited energy and direction of each event is reconstructed using the full timing distribution of recorded photoelectrons in every DOM. For events classified as showers, pointlike light emission is assumed, whereas for tracks, the energy deposition is unfolded along the path of the track \cite{35}. To avoid systematic uncertainties relating to muons, down-going, showerlike events below 20 TeV are excluded because they are dominated by muons.

**Statistical analysis.**—To measure the flavor ratio of the astrophysical flux, we follow the approach of earlier IceCube analyses \cite{56} and perform a binned, maximum likelihood fit over the 2D distributions of deposited energy and reconstructed declination of both showers and tracks. The expected count in each bin is calculated from Monte Carlo simulation and depends on a set of nuisance parameters, which describe systematic uncertainties, and physics parameters, which are of interest to be measured. The likelihood contains two terms—the first describing the Poisson distribution of bin counts and the second penalizing deviations of nuisance parameters from their central values according to their uncertainty \cite{57}. To construct confidence intervals and perform hypothesis tests, we use the profile likelihood method \cite{58} and minimize the likelihood over nuisance parameters. Unless noted, we assume that profile likelihood ratios follow a \(\chi^2\) distribution \cite{59}.

Systematic uncertainties are either detector related, such as DOM optical efficiency and ice optical properties, or theoretical, such as neutrino fluxes and cross sections. All tend to uniformly scale the rates of tracks and showers, maintaining their ratio and leaving their energy and angular distributions unaffected. Thus, nuisance parameters
we use the flux calculation of HKKMS [60] for \(\pi/K\) neutrinos and muons. To describe atmospheric neutrinos, we use the flux calculation of ERS [61] for charm neutrinos. A correction is included to describe the cosmic-ray knee in the model of [62], and the HKKMS flux is extrapolated above 10 TeV as described in Ref. [56]. No priors are used to constrain the scalings of these atmospheric neutrino distributions. For muons, although the control sample constrains the overall passing rate, there are insufficient statistics in its energy and angular distribution, so simulation is used. It is based on a parametrization of the deep-ice muon flux [63,64] obtained from CORSIKA air-shower simulation [65] and the cosmic-ray model of Ref. [62]. Since muons are the dominant background for atmospheric tracks, we allow the scalings applied to tracklike muons and showerlike muons to float independently, accounting for uncertainties such as ice properties, energy loss cross sections, and muon bundle multiplicity that could skew the ratio of tracks to showers. These scalings are, however, constrained by a Gaussian prior of \(8.4 \pm 4.2\) events each, derived from the 4 surviving events each in the tracklike and showerlike muon control samples.

When placing limits on the flavor ratio, nuisance parameters also include those describing the atmospheric flux. For this analysis, we use an isotropic, power-law flux with the following parametrization for each neutrino flavor,

\[
\Phi_{\alpha}(E) = 3\Phi_0 f_{\alpha,0} \left(\frac{E}{100 \text{ TeV}}\right)^{-\gamma},
\]

where \(f_{\alpha,0}\) is the fraction of each flavor at Earth, \(\gamma\) is the spectral index, and \(\Phi_0\) is the average flux of \(\nu\) and \(\bar{\nu}\) per flavor at 100 TeV. An equal \(\nu\) and \(\bar{\nu}\) flux is assumed. Though this does not hold for neutrinos of photoproduced origin, there are consequences for a flavor ratio measurement only from yet-unobserved \(\bar{\nu_e}\) interactions at the 6.3 PeV Glashow resonance [66,67], too high in energy to have a significant impact with currently available statistics.

**Results.**—After all selection criteria, 129 showers and 8 tracks remain in the final event sample, forming a superset of the earlier 3-year sample with 28 showers and 8 tracks [7]. Before attempting to constrain the atmospheric flavor ratio, it is necessary to verify that the adopted isotropic, power-law model of the atmospheric flux adequately describes the data. Assuming a flavor composition of \((1:1:1)_{\oplus}\) at Earth, the best-fit distributions are shown in Fig. 2. Noteworthy are the best-fit astrophysical flux parameters, \(\gamma = 2.6 \pm 0.15\) and \(\Phi_0 = (2.3 \pm 0.4) \times 10^{-18} \text{ GeV}^{-1} \text{cm}^{-2} \text{s}^{-1} \text{sr}^{-1}\). While being compatible with the previous 3-year result [7], the spectral index is substantially different from \(\gamma = 2\), which is rejected at \(3.0\sigma\). The preference for \(\gamma > 2\) comes mostly from low-energy data rather than a lack of events above several PeV. A high-energy cutoff in the astrophysical flux of the form \(E^{-\gamma} \exp(-E/E_c)\) is also disfavored with respect to a power law at 2.9\(\sigma\). Finally, the power-law model with \((1:1:1)_{\oplus}\) flavor ratio is in agreement with data with a goodness-of-fit \(p\) value of 0.13.

A large charm flux to explain low-energy data is disfavored since the suppression of down-going events

![Fig. 2](color online) The best-fit deposited energy distributions for showers and tracks, divided into the southern (down-going) and northern (up-going) samples, assuming a power-law astrophysical flux with \((1:1:1)_{\oplus}\) flavor ratio at Earth. The contribution of charm atmospheric neutrinos is not shown since the best-fit scaling of the ERS flux is 0. Showers in the southern sky below 20 TeV are dominated by muons and excluded; however, the prediction from the control sample measurement is shown in this region. Though not shown, 4 bins in declination (\(\delta\)) are used in the fit.
by accompanying muons is not observed, and the best-fit scaling of the ERS [61] flux is 0. Even fixing the ERS scaling at its 90% upper limit of 3.4 obtained here, the astrophysical index only changes to $\gamma = 2.5$. These results are consistent with a recent, dedicated IceCube measurement of the astrophysical spectral index and charm flux with improved veto techniques [63]. Nuisance parameters describing $\pi/K$ neutrinos and muons are also consistent with expectations from the HKKMS flux and the control sample measurement.

This analysis is sensitive to the astrophysical flux in the neutrino energy range 35 TeV–1.9 PeV. The lower and upper bounds of this range, $E_{\text{low}}$ and $E_{\text{up}}$, were calculated separately by fixing the astrophysical spectral index and normalization at their best-fit values, excluding the flux with $E < E_{\text{low}}$ or $E > E_{\text{up}}$, respectively, refitting the data with nuisance parameters left free, and finding the values for $E_{\text{low}}$ or $E_{\text{up}}$ that decreased the log likelihood by 1/2 each.

With a power-law astrophysical flux describing the data, we then further allow the flavor composition at Earth to float and calculate exclusion regions according to the Feldman and Cousins approach [51], as shown in Fig. 3. Though the best-fit composition is $(0:0.2:0.8)_{\oplus}$ at Earth, the limits are compatible with all standard flavor compositions possible under averaged neutrino oscillations at <68% confidence level.

With showers and tracks serving as the only two identifiers for three flavors in this analysis, there is an inherent degeneracy in the determination of astrophysical flavor ratios. This is reflected in the strong anticorrelation between $\nu_e$ and $\nu_\tau$ components, which both produce mostly showers. The degeneracy is broken mainly by two effects—the shift in the $\nu_e$ deposited energy distribution caused by invisible energy lost to neutrinos in $\tau$ decay and the lack of observed $\bar{\nu}_e$ Glashow resonance events. The preference for a $\nu_e$-like signature is not statistically significant, and future work to identify $\nu_\tau$ signatures at PeV energies may resolve this degeneracy.

Since compositions produced by averaged neutrino oscillations (extremely narrow blue triangle in Fig. 3) are nearly orthogonal to the flavor degeneracy in IceCube, constraints on source flavor composition are possible but not yet significant. After restricting to flavor ratios allowed by averaged neutrino oscillations, no source composition can be excluded at >68% confidence level, and this remains true even with the additional constraint $f_{\tau,\oplus} = 0$ expected at astrophysical sources.

Having found agreement with the predictions of averaged neutrino oscillations, constraints are placed on non-standard flavor compositions producing a large $\nu_e$ or $\nu_\mu$ fraction at Earth. A maximally tracklike, pure $\nu_\mu$ signature of $(0:1:0)_{\oplus}$ is excluded at 3.3$\sigma$ and a purely showerlike $\nu_\tau$ signature of $(1:0:0)_{\oplus}$ at 2.3$\sigma$.

These results contrast with an earlier analysis of IceCube’s 3-year data, which found a preference for $(1:0:0)_{\oplus}$ over $(1:1:1)_{\oplus}$ at 92% confidence level [68]. We attribute this discrepancy mainly to two unaccounted for effects—partial classification of $\nu_\mu$ CC events as showers and systematic uncertainty on muon background. Repeating their analysis but accounting for the ~30% of $\nu_\mu$ CC events classified as showers and using a profile likelihood incorporating the 50% uncertainty in muon background, a $(1:0:0)_{\oplus}$ best fit is still obtained but neither $(1:1:1)_{\oplus}$ or our best fit of $(0:0.2:0.8)_{\oplus}$ is excluded at >68% confidence level. Since only shower and track counts were analyzed, the tighter constraints reported here result from the use of energy and directional information in addition to the lower-energy data.

Future measurements of the flavor ratio at IceCube will use improved veto techniques, include up-going tracks starting outside the detector, and search for high-energy signatures of $\nu_\tau$. With these improvements, measuring the flavor composition at astrophysical sources and precision tests of neutrino oscillations over astronomical distances will be in reach.

We acknowledge the support from the following agencies: U.S. National Science Foundation-Office of Polar Programs, U.S. National Science Foundation-Physics Division, University of Wisconsin Alumni Research Fund.
Foundation, the Grid Laboratory Of Wisconsin (GLOW) grid infrastructure at the University of Wisconsin—Madison, the Open Science Grid (OSG) grid infrastructure; U.S. Department of Energy, and National Energy Research Scientific Computing Center, the Louisiana Optical Network Initiative (LONI) grid computing resources; Natural Sciences and Engineering Research Council of Canada, WestGrid and Compute/Calcul Canada; Swedish Research Council, Swedish Polar Research Secretariat, Swedish National Infrastructure for Computing (SNIC), and Knut and Alice Wallenberg Foundation, Sweden; German Ministry for Education and Research (BMBF), Deutsche Forschungsgemeinschaft (DFG), Helmholtz Alliance for Astroparticle Physics (HAP), Research Department of Plasmas with Complex Interactions (Bochum), Germany; Fund for Scientific Research (FNRS-FWO), FWO Odysseus programme, Flanders Institute to encourage scientific and technological research in industry (IWT), Belgian Federal Science Policy Office (Belspo); University of Oxford, United Kingdom; Marsden Fund, New Zealand; Australian Research Council; Japan Society for Promotion of Science (JSPS); the Swiss National Science Foundation (SNSF), Switzerland; National Research Foundation of Korea (NRF); Danish National Research Foundation, Denmark (DNRF)

Note added.—The authors of Ref. [68] have released a new analysis [69] that includes muon background, track mis-classification, and energy spectrum effects, and its results are now compatible with those obtained here. Another analysis of IceCube’s 3-year data has also found the track-to-shower ratio to be consistent with averaged oscillations of astrophysical neutrinos [70].

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