A Search for Cosmic Neutrino and Gamma-Ray Emitting Transients in 7.3 yr of ANTARES and Fermi LAT Data

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We analyze 7.3 yr of ANTARES high-energy neutrino and Fermi Large Area Telescope (LAT) γ-ray data in search of cosmic neutrino + γ-ray (ν+γ) transient sources or source populations. Our analysis has the potential to detect either individual ν+γ transient sources (durations \( \Delta t \leq 1000 \) s), if they exhibit sufficient γ-ray or neutrino multiplicity, or a statistical excess of ν+γ transients of individually lower multiplicities. Individual high γ-ray multiplicity events could be produced, for example, by a single ANTARES neutrino in coincidence with a LAT-detected γ-ray burst. Treating ANTARES track and cascade event types separately, we establish detection thresholds by Monte Carlo scrambling of the neutrino data, and determine our analysis sensitivity by signal injection against these scrambled data sets. We find our analysis is sensitive to ν+γ transient populations responsible for >5% of the observed gamma-coincident neutrinos in the track data at 90% confidence. Applying our analysis to the unscrambled data reveals no individual ν+γ events of high significance; two ANTARES track + Fermi γ-ray events are identified that exceed a once per decade false alarm rate threshold \( (p = 17\%) \). No evidence for subthreshold ν+γ source populations is found among the track \( (p = 39\%) \) or cascade \( (p = 60\%) \) events. Exploring a possible correlation of high-energy neutrino directions with Fermi γ-ray sky brightness identified in previous work yields no added support for this correlation. While TXS 0506+056, a blazar and variable (nontransient) Fermi γ-ray source, has recently been identified as the first source of high-energy neutrinos, the challenges in reconciling observations of the Fermi γ-ray sky, the IceCube high-energy cosmic neutrinos, and ultrahigh-energy cosmic rays using only blazars suggest a significant contribution by other source populations. Searches for transient sources of high-energy neutrinos thus remain interesting, with the potential for either neutrino clustering or multimessenger coincidence searches to lead to discovery of the first ν+γ transients.

**Key words:** BL Lacertae objects: general – cosmic rays – gamma-ray burst: general – gamma rays: general – neutrinos

1. Introduction

The ANTARES telescope (Ageron et al. 2011) is a deep-sea Cerenkov neutrino detector, located 40 km offshore from Toulon, France, in the Mediterranean Sea. The detector comprises a three-dimensional array of 885 optical modules, each one housing a 10 inch photomultiplier tube, and distributed over 12 vertical strings anchored in the sea floor at a depth of about 2400 m. The detection of light from upgoing charged particles is optimized with the photomultipliers facing 45° downward. Completed in 2008 May, the telescope aims primarily at the detection of neutrino-induced muons that cause the emission of Cerenkov light in the detector (track-like events). Charged current interactions induced by electron neutrinos (and, possibly, by tau neutrinos of cosmic origin) or neutral current interactions of all neutrino flavors can be reconstructed as cascade-like events (Albert et al. 2017a).

Due to its location, the ANTARES detector mainly observes the Southern sky (2π sr at any time). Events arising from sky positions in the decl. band \(-90° \leq \delta \leq -48°\) are always visible as upgoing. Neutrino-induced events in the decl. band \(-48° \leq \delta \leq +48°\) are visible as upgoing with a fraction of time decreasing from 100% down to 0%. While ANTARES has a substantially smaller volume than IceCube, the use of sea water as detection medium (rather than ice) provides better pointing resolution for individual events, especially those of cascade type, and its geographic location enables reduced-background studies of the Southern hemisphere including the Galactic center region. On the other hand, natural light emission in the water leads to higher background levels (ANTARES Collaboration et al. 2005).

Chief scientific results from ANTARES include: searches for neutrino sources using track- and cascade-like events in data collected between 2007 and 2015 (Albert et al. 2017b); dedicated studies along the Galactic plane (Albert et al. 2017c), also in collaboration with the IceCube telescope (Albert et al. 2018a); and searches for an excess of high-energy cosmic neutrinos over the background of atmospheric events (Albert et al. 2018b). No cosmic neutrinos have been positively identified in the ANTARES data. Despite this, by integrating the cosmic neutrino spectrum from IceCube Collaboration et al. (2017) over the ANTARES effective area (Albert et al. 2017b), we estimate an expected 6.8 neutrinos of cosmic origin are detected each year, though all but the most energetic will be indistinguishable from the atmospheric background. Among all the possible astrophysical sources, transient sources increase the observation possibilities thanks to the suppression of atmospheric background in a well-defined spacetime window. For this reason, the ANTAREES Collaboration is involved in a broad multimessenger program to exploit the connection between neutrinos and other cosmic messengers, including follow-up analyses associated with gravitational wave events.
(Albert et al. 2017d; Albert et al. 2019b); coincidence searches against electromagnetic observations from radio (Croft et al. 2016; Albert et al. 2019a) and visible (Adrián-Martínez et al. 2016) to X- and γ-rays (Ageron et al. 2012); blazar flare episodes (Adrian-Martinez et al. 2015); and the neutrino source TXS 0506+056 (Albert et al. 2018c). To date, there have been no high-confidence counterparts identified for any ANTARES neutrino event.

In parallel, members of the Astrophysical Multimessenger Observatory Network (AMON; Smith et al. 2013; Cowen et al. 2016) have been exploring the possibility of neutrino + γ-ray (ν+γ) source identification via coincidence analysis, publishing analyses of Fermi Large Area Telescope (LAT; Atwood et al. 2009) and public IceCube 40-string (Keivani et al. 2015) and 59-string (Turley et al. 2018) data. Although no high-confidence ν+γ transients, nor evidence of subthreshold ν+γ source populations, were identified in these works, the latter revealed mild evidence for correlation between IceCube neutrino positions and the Fermi γ-ray sky.

Within the last year, a coincidence between the neutrino IceCube-170922A (Kopper et al. 2017) and the flaring blazar TXS 0506+056 (Tanaka et al. 2017) led to multimessenger (IceCube Collaboration et al. 2018b) and time-dependent neutrino clustering (IceCube Collaboration et al. 2018a) analyses suggesting this BL Lac-type object as the first known source of high-energy neutrinos and the first identified extragalactic cosmic ray accelerator. Further blazar source identifications can certainly be anticipated; however, the absence of point-source excesses in the ANTARES (Albert et al. 2017b) and IceCube (Aartsen et al. 2017a; Albert et al. 2018a) time-integrated data sets set strict limits on the fraction of cosmic high-energy neutrinos that can originate in these observed sources.

Possible alternative source populations include star-forming galaxies; starburst galaxies; galaxy groups and clusters; supernovae; and standard and low-luminosity gamma-ray bursts (see Murase 2015 for a review). Of these source possibilities, the transient and highly variable source populations will likely require time-sensitive searches for identification. Hadronic models foresee that neutrinos and γ-rays are cogenerated through the production and subsequent decay of mesons, mainly pions. γ-rays then result from the decay of neutral pions, while the decay of charged pions produces neutrinos. Additional processes in dense astrophysical regions can then degrade the energy of individual γ-rays to lower energies while leaving the neutrino energy spectrum almost unaffected, resulting in correlated emission of higher-energy neutrinos and lower-energy γ-rays.

The present paper is organized as follows. Details of the data sets are provided in Section 2. Our statistical approach and signal injection studies are discussed in Section 3. Unscrambled results and interpretation are presented in Section 4, and our conclusions in Section 5.

2. Data Sets

The Fermi LAT data set is highly complementary for cross-reference with high-energy neutrino data sets. The LAT offers a 1.4 steradian field of view, provides all-sky coverage every three hours on average, and exhibits good sensitivity over the 100 MeV < E < 300 GeV energy band.

This analysis was performed using publicly available Fermi LAT data. The relevant Fermi data were the Pass 8 photon reconstructions available from the LAT FTP server.54 These photon events were filtered using the Fermi Science Tools, keeping only photons with a zenith angle smaller than 90°, energies between 100 MeV and 300 GeV, detected during good time intervals as provided in the LAT satellite files.55

The point-spread function (PSF) of the LAT is given by a so-called double King function (King 1962) with the parameters depending on the photon energy, conversion type, and incident angle with respect to the LAT boresight (Ackermann et al. 2013). At energies in the hundreds of MeV, the angular uncertainty can be several degrees, especially for off-axis photons. At ε > 1 GeV the average uncertainty drops below 1°, and at ε > 100 GeV angular uncertainties are better than 0.1°.

The ANTARES data used spans from 2007 February to 2015 December. Data from this 8.9 yr interval are divided into track and cascade events, all of which are ongoing. According to the selection criteria defined in Albert et al. (2017b), during this period 7622 track and 180 cascade neutrino candidates were identified. The Fermi mission has public data available starting from 2008 August 4. The ANTARES data is coincident with weeks 9 through 396 of the Fermi data, with 6774 track-like events and 162 cascade-like events falling within that 7.3 yr window. For the ANTARES data, the average PSFs for tracks and cascades are derived from Monte Carlo simulation, and then interpolated. For track and cascade events, the 90% containment radii for the PSFs are 1.5° and 10°, respectively.

A healpix (Górski et al. 2005) map of resolution 8 (Nside = 256, mean spacing of 0.23°) was constructed using the entire Fermi data set (weeks 9 to 495 at the time of creation) with aforementioned photon selection criteria. Using the HEASoft software,56 events were binned into three logarithmically uniform energy bins. Each energy bin was then further binned into a healpix map, with the live time calculated via a Monte Carlo simulation. Dividing the counts map by the live time map produced the Fermi exposure map. Zero-valued (low-exposure) pixels were replaced by the average of the nearest neighbor pixels. Our three resulting all-sky Fermi maps are shown in Figure 1. Due to the additional reconstruction uncertainty in the Fermi PSF for high-inclination events (inclination angle greater than 60°), three additional maps for analysis of these events were generated by further averaging all pixels with their nearest neighbors.

3. Methods

3.1. Significance Calculation

Our analysis follows as an extension to the methods presented in Turley et al. (2018). Different from previous work, our analysis allows for coincidences with both multiple photons and multiple neutrinos. Our analysis also covers both the track and cascade events detected by ANTARES. For track-like events, we use an angular acceptance window of 5°, while for cascade-like events, we use a 10° window. For both event types, the temporal acceptance window is ±1000 s. Neutrino multiplets are constrained to have each neutrino within both the

54 LAT data located at ftp://legacy.gsfc.nasa.gov/fermi/data/lat/weekly/ photon/.
55 Fermi satellite files located at ftp://legacy.gsfc.nasa.gov/fermi/data/lat/ weekly/spacecraft/.
56 HEASoft website: https://heasarc.gsfc.nasa.gov/docs/software/heasoft/.
angular and temporal separation of each other neutrino. Photons must fall within the angular and temporal window as measured from the average neutrino position and time. For each coincidence, a pseudo-log-likelihood test statistic, $\lambda$, is calculated as follows:

$$
\lambda = 2 \ln \frac{P_{\gamma}^{n_{\gamma}!} P_{\nu}^{n_{\nu}!} \Pi_{n_{\nu}, n_{\gamma}} \tau(\Delta t)}{\Pi_{n_{\nu}} B_{\nu,\gamma}(x)} + \sum_{\nu} \ln \left( \frac{1 - P_{\gamma,i}}{P_{\nu,i}} \right),
$$

where $P_{\nu}$ and $P_{\gamma}$ are the product of the PSF of each LAT photon and each ANTARES neutrino at the best position, $x$, with each PSF normalized to have units of probability per square degree. The LAT PSF for each photon additionally depends on the photon energy, inclination angle, and conversion type. In general, the closer the PSF centers are, the larger the resulting $\lambda$ value.

For particles within 100 s of the average arrival time, this function is identically one, while it scales as $1/\Delta t$ for times between 100 and 1000 s. This allows the search to address the possibility of longer timescale associations (as might result from low-luminosity gamma-ray bursts; GRBs) while maintaining a preference for shorter timescale associations, if and when they are also present.

The $\Pi_{n_{\nu}, n_{\gamma}} \tau(\Delta t)$ term is the product of LAT $\gamma$-ray backgrounds for each photon at the coincidence location, taken from the background maps shown in Figure 1. Together with the factorial terms, this acts like a Poisson probability of observing $n_{\gamma}$ photons from background. The $p_c$ factor, similar to the IceCube signalness (Aartsen et al. 2017b), is an energy proxy calculated by the ANTARES collaboration. The $p_c$ for a neutrino event is computed on an event-by-event basis using the normalised anti-cumulative distribution of the number of hits from the full ANTARES 2012–2017 neutrino data set. This probability represents the fraction of ANTARES events with a number of hits larger than that observed for the event: the larger the number of hits, the smaller the $p_c$ value. Overall, larger values of the $\lambda$ statistic suggest a greater likelihood of a physically associated multiplet from a cosmic source, rather than a coincidence of uncorrelated events.

The best-fit position $x$ is numerically calculated as the location of maximum PSF overlap. The photon multiplicity of each coincidence is calculated iteratively: beginning with a coincidence including all photons passing the temporal and proximity cuts, the photon with the lowest PSF density at the best-fit position is removed and a new $\lambda$, for the new best-fit position, is calculated. This process is repeated until one photon is left ($n_{\nu}$ iterations), with the iteration yielding the maximum $\lambda$ selected as the coincidence multiplicity.

This analysis presents two ways to identify a potential signal. First, with $\lambda$ unbounded, the null distribution provides threshold values which can be used to identify individually significant coincidences and calculate their estimated false alarm rates. In this work, we use two such thresholds, $\lambda_D$ and $\lambda_C$, corresponding to false alarm rates of one per decade and one per century, respectively. Second, the presence of a subthreshold population of $\nu+\gamma$ emitting sources can be identified by a difference in the cumulative distributions of $\lambda$ values between the observed and scrambled (null) populations. By design, true coincidences will be biased to higher $\lambda$ values, and a population containing a sufficient number of signal events can be distinguished from the null distribution via an Anderson–Darling $k$-sample test (Scholz & Stephens 1987).
3.2. Background Generation

We generate a set of 10,000 Monte Carlo scrambled versions of each of our data sets to characterize their null distributions and define analysis thresholds, prior to performing any study of the unscrambled data sets. Our scrambling procedure begins by first converting the coordinates of each neutrino to detector coordinates. The arrival time and azimuthal angle of each original neutrino $v_1$ are then exchanged with another randomly selected neutrino $v_j$. Each neutrino retains its original elevation. Finally, the coordinates are converted back to the equatorial system. This approach is similar to the method used in our previous work (Turley et al. 2016), with the primary difference being the use of detector coordinates for the scrambling procedure. Fermi LAT photons are not scrambled as the LAT data contains known sources and extensive (complex) structure. Coincidence analysis is carried out for each scrambled data set and $\lambda$ values are calculated for the resulting $\nu+\gamma$ coincidences via Equation (1). Thresholds from this analysis for false alarm rates of 1 per decade ($\lambda_D$) and 1 per century ($\lambda_C$) are presented in Table 1.

In contrast to previous work (Turley et al. 2018), due to the sensitivity to multineutrino events and the use of both track and cascade events, we split the analysis into three separate parts. The first part is to detect all coincidences with single-neutrino track-like events. The second looks for coincidences with multineutrino track-like events. The third and final part is a search for coincidences with all single-neutrino cascade-like events. Multineutrino cascades are not considered, as there are no cascade-like events within the temporal acceptance window of each other.

3.3. Signal Injection

To estimate the sensitivity of our analysis to subthreshold populations of cosmic $\nu+\gamma$ emitting sources, we generate a population of signal-like events. These events are injected into the scrambled data sets so that the injected distributions can be compared with the null distribution.

We determine the multiplicity of a generated signal event following the methods used in Turley et al. (2018). This method assumes a population of sources emitting one neutrino, with associated photon fluence distributed according to $N(S \geq S_0) \propto S_0^{-3/2}$. In this formulation, $N(S \geq S_0)$ is the number of events observed with a fluence greater than the threshold fluence $S_0$. Setting this minimum to 0.001 photons, we can invert this relationship and generate the expectation value for the multiplicity of an arbitrary event in terms of a uniform random variable $u$ as $\langle n_\gamma \rangle = S_0 u^{-2/3}$. The distribution of $n_\gamma$ is then calculated by drawing randomly from a Poisson distribution with the expectation value $\langle n_\gamma \rangle$. Excluding events with zero photons, this yields the following $n_\gamma$ distribution: 93.8% singlet, 4.5% doublet, 0.9% triplet, and 0.38%, 0.19%, 0.095%, 0.0567%, 0.0365%, 0.0245%, and 0.0174% for multiplicities four through 10.

A signal event of photon multiplicity $n_\gamma$ is then generated by choosing a random R.A. and drawing a random decl. from the list of all ANTARES events. These coordinates serve as a sky position for the coincidence. The PSFs for $n_\gamma$ LAT photons and $n_\gamma$ neutrinos are then centered on this point, and placed randomly according to their respective PSFs. All photons are chosen to have the same inclination angle, which is drawn from the full set of inclination angles within the Fermi data set. A conversion type for each photon is similarly drawn from the Fermi data set. Photon energies are drawn from a power law with a photon index $\Gamma = 2$. Using the photon background maps, the number of unassociated photons expected to arrive within the temporal and spatial windows for that section of sky is calculated. From this Poisson probability, $n_\gamma$ photons are randomly placed uniformly within the spatial window. Energy and conversion type for the background photons are chosen in the same manner as for the signal photons. All background photons are given the same inclination angle as the signal photons. Each particle is also given an arrival time randomly selected from a uniform distribution. Using this information, a $\lambda$ value is calculated following the methods of Section 3. Due to the iterative rejection of one or more low-significance $\gamma$-rays, events can end up with some of the injected photons excluded.

Because the varied physical models predicting $\nu+\gamma$ coincidences have different characteristic timescales, we generate two sets of signal events for each of the three null distributions. One set draws the timestamps from a uniform distribution 100 s wide, while the other draws from a uniform distribution 1000 s wide.

To calculate the sensitivity of our analysis, we inject an increasing number of signal events $n_{inj}$ and plot the median resulting Anderson–Darling $p$-value (Scholz & Stephens 1987) against $n_{inj}/n_{obs}$ for the track and cascade data, as shown in Figure 3.

For the tracks, this provides an estimate of the threshold value of $n_{inj}$ that is needed to yield a statistically significant deviation from the null distribution (see columns $n_{inj,1\%}$ and $n_{inj,0.1\%}$ in Table 1). For the cascades, the size of each

| Data Set          | $\langle n_{\nu+\gamma} \rangle$ | $\lambda_D$ | $\lambda_C$ | $n_{inj,1\%}$ | $n_{inj,0.1\%}$ | $\lambda_{\max}$ | $p_{A-D}$ |
|-------------------|----------------------------------|-------------|-------------|--------------|-----------------|------------------|-----------|
| Tracks, 100 s     | 2716 ± 36                        | 18.5        | 25.4        | 205          | 260             | 2734             | 18.94     | 39%       |
| 1000 s            | "                                | "           | "           | 220          | 285             | "                | "         | "         |
| Cascades          | 83.6 ± 5.8                       | 8.1         | 14.6        | -            | -               | 80               | 2.7       | 60%       |
| Track Multiplets  | 0.48 ± 0.69                      | -           | -9.3        | -            | -               | 0                | -         | -         |

Note: $\langle n_{\nu+\gamma} \rangle$ is the expected number of neutrinos observed in coincidence with one or more $\gamma$-rays, as derived from 10,000 Monte Carlo scrambled realizations of each data set. $\lambda_D$ and $\lambda_C$ are the thresholds above which a coincidence is observed only once per simulated decade or century, respectively. $n_{inj,1\%}$ and $n_{inj,0.1\%}$ are the number of injected signal events required in simulations to give Anderson–Darling test (Scholz & Stephens 1987) $p$-values of $p < 1\%$ and $p < 0.1\%$, respectively, by comparison to the null distributions for each data set. $n_{\nu+\gamma}$ is the number of neutrinos observed in coincidence with one or more $\gamma$-rays in unscrambled data, $\lambda_{\max}$ is the maximum observed $\lambda$ for each data set, and $p_{A-D}$ is the Anderson–Darling test $p$-value from comparison of the observed $\lambda$ distribution to the associated null distribution. Cells with a “-” could not be calculated, for reasons detailed in the main text.
individual scramble is small enough that replacing 100% of the data set with signal events yields a $p$-value of 2.8% on average, making it very unlikely that this sample would yield a high-confidence demonstration of an underlying $\nu+\gamma$ source population. At 90% confidence, our analysis is sensitive to >130 source-like $\nu+\gamma$ coincidences in the 100 s track data, >145 in the 1000 s track data, and >60 in the 100 and 1000 s cascade data. Relevant statistics from these analyses are provided in Table 1.

In previous work, Turley et al. (2018) found that scrambled neutrinos coincident with LAT-detected GRBs, in particular GRB 090902B (Abdo et al. 2009), yielded $\lambda$ values well above the $\lambda_C$ threshold. To quantify our analysis sensitivity to GRB + neutrino coincidences, we carried out a Monte Carlo simulation for each LAT-detected GRB that occurred within our data span.

| Date       | Time (UTC) | MJD      | $\Delta t$ (s) | Position (J2000) | $r_{1\sigma}$ | $N_{ph}$ | $\lambda$ | FAR (yr$^{-1}$) |
|------------|------------|----------|----------------|------------------|--------------|----------|-----------|----------------|
| 2012 Nov 21| 20:19:52   | 56252.8471| 307            | 248°00.0, −7°70 | 2'           | 1        | 18.9      | 0.96           |
| 2014 Aug 5 | 11:13:33   | 56874.4677| 750            | 279°68.0, −5°05 | 3'           | 2        | 18.8      | 0.96           |

**Note:** Date, Time, and MJD show the central time of the coincidence, while $\Delta t$ measures the separation between the earliest and latest particles in the coincidence in seconds. Position gives the R.A. and decl. (in degrees) of the best-fit position, while $r_{1\sigma}$ gives the approximate 1σ error on the angular uncertainty in arcminutes (39% containment, assuming a Gaussian form). $N_{ph}$ is the number of photons in the coincidence. The false alarm rate (FAR) is calculated as the number of events of that $\lambda$ or higher expected per year.

Figure 3. Anderson–Darling two-sample $p$-value vs. fraction of coincidences that result from signal events, $N_{sig}/N_{obs}$. Results from both signal populations are shown.

Figure 4. Cumulative and residual histograms of the $\lambda$ distributions for the track (left, $n_{\nu+\gamma} = 2734$) and cascade (right, $n_{\nu+\gamma} = 80$) data. The unscrambled data (green dashed line) and the null distribution (blue line) are shown for both tracks and cascades. Signal injection curves for the 100 s temporal window display as identical on this plot. Upper panels show cumulative histograms, while lower panels show residuals against the null distribution (plotted as null minus alternative). Anderson–Darling test $p$-values from comparison of the unscrambled and null distributions are $p = 39\%$ for the track sample and $p = 60\%$ for the cascade sample.

Table 2

| Date       | Time (UTC) | MJD      | $\Delta t$ (s) | Position (J2000) | $r_{1\sigma}$ | $N_{ph}$ | $\lambda$ | FAR (yr$^{-1}$) |
|------------|------------|----------|----------------|------------------|--------------|----------|-----------|----------------|
| 2012 Nov 21| 20:19:52   | 56252.8471| 307            | 248°00.0, −7°70 | 2'           | 1        | 18.9      | 0.96           |
| 2014 Aug 5 | 11:13:33   | 56874.4677| 750            | 279°68.0, −5°05 | 3'           | 2        | 18.8      | 0.96           |

57 LAT GRB catalog: https://fermi.gsfc.nasa.gov/ssc/observations/types/grbs/lat_grbs/.
collection period. Neutrinos were injected following our signal injection procedures, with the GRB position and trigger time as reference, and with a 1000 s box-window temporal distribution for neutrino arrival times. For each LAT GRB, we carried out 10,000 such neutrino signal injections and calculated the λ value for the resulting association in each instance.

The maximum λ generated through this search was $\lambda = 3524.5$, resulting from a 368-photon coincidence with GRB 130427A (Zhu et al. 2013). Of the 128 individual bursts in this simulation, 58 have median λ values from these neutrino injection trials of $\lambda_{\text{med}} > \lambda_{C}$, and a further five bursts have $\lambda_{C} > \lambda_{\text{med}} > \lambda_{D}$.

4. Results

Applying our analysis to the two unscrambled neutrino data sets yields the results summarized in Table 1. Figure 4 shows the λ distributions for the unscrambled data for the track and cascade data, along with the null distributions, and distributions for signal injections (where possible) yielding $p$-values of 1% and 0.1%, respectively.

All distributions are normalized to the number of coincidences in the unscrambled distribution. Note that due to the small size of the cascade coincidence sample, it is not possible to inject enough signal events into a random scramble to differentiate from other random scrambles at better than $p = 2.8\%$ (97.2% confidence).

Two coincidences above the $\lambda_{D}$ threshold were observed in the track data. From Poisson statistics, two or more such coincidences would be observed 16.6% of the time given the 7.3 yr span of the data. Details of these two coincidences are presented in Table 2. No λ values above the $\lambda_{D}$ threshold were observed in the cascade data. The subthreshold population search demonstrated that both unscrambled distributions were consistent with background, with test statistics of 39% for the tracks, and 60% for the cascades. Results from the track multiplet analysis are not shown as there were, on average, only 0.48 such coincidences per scramble, and none in the unscrambled analysis.

Turley et al. (2018) also tested for correlation between neutrino and Fermi LAT photon sky positions without any temporal correlation. Repeating this analysis using the ANTARES data, we first construct a single Fermi background map covering the full energy range. We then measure the background value at the location of every neutrino in the track and cascade data to compute an average photon background for each neutrino map. Carrying this out on the scrambled neutrino data sets yields an average background of $(2.33 \pm 0.06) \times 10^{-2}$ photons deg$^{-2}$ m$^{-2}$ per 200 s for the track data, and $(2.16 \pm 0.36) \times 10^{-2}$ photons deg$^{-2}$ m$^{-2}$ per 200 s for the cascade data. The observed backgrounds (in the same units) from the unscrambled data are $2.36 \times 10^{-2}$ (+0.44σ; $p = 33\%$) for the track data, and $2.19 \times 10^{-2}$ (+0.09σ; $p = 46\%$) for the cascade data. Both results are consistent with background (Figure 5).

The dispersion in the cascade background from scrambled data sets is far larger than that for the tracks because of the much-reduced sample size (180 cascade events compared with 7622 track events); however, the two average backgrounds are consistent, as the mean of the track background is 0.47× and the mean of the cascade background, as measured using the standard deviation of the cascade background distribution, Recalling the IC 59 Northern ($p = 28.1\%$), IC 59 Southern ($p = 4.7\%$), and IC 40 ($p = 58.3\%$) results from Turley et al. (2018), we can calculate a unified $p$-value of 19.7% from these values using Fisher’s method (Mosteller & Fisher 1948).

5. Conclusions

We have carried out a search for $\nu + \gamma$ transients using publicly available Fermi LAT $\gamma$-ray data and ANTARES neutrino data. Our analysis used archival data from both observatories over the period 2008 August to 2015 December. As with previous work (Turley et al. 2018), our analysis was designed to be capable of identifying either individual high-significance $\nu + \gamma$ transients or a population of individually subthreshold events, via statistical comparison to uncorrelated (scrambled) data sets.

Our Monte Carlo simulations demonstrate a sensitivity to single-neutrino events of sufficient $\gamma$-ray multiplicity, as demonstrated by signal injection against multiple bright LAT-detected $\gamma$-ray bursts. Signal injection against scrambled data sets established our sensitivity to subthreshold populations of transient $\nu + \gamma$ sources at the >7% level (>200 coincidences) for tracks; however, due to the small sample size, we were not able to place meaningful limits on a subthreshold $\nu + \gamma$ source population within the cascade data. Our limit of >200 coincidences in the full data set is equivalent to >27 LAT-associated cosmic neutrinos per year in the ANTARES data. Because IceCube estimates of the cosmic neutrino flux and spectrum lead us to expect 6.8 cosmic ANTARES neutrinos per year (Section 1), our limit is not physically constraining in this context.

Analysis of the observed (unscrambled) data reveals two $\nu + \gamma$ coincidences above a nominal $\lambda_{D}$ threshold (false alarm rate FAR < 0.1 yr$^{-1}$; Table 2). Due to the 7.3 yr span of the data, we anticipate observing two or more $\lambda > \lambda_{D}$ coincidences 16.6% of the time ($p = 16.6\%$). We observe no statistically significant deviation of the observed λ distributions from their associated null distributions, with observed $p$-values of $p = 39\%$ and $p = 60\%$ for the track and cascade events, respectively.

Independently, we performed the first test for correlation between ANTARES neutrino positions and persistently bright portions of the Fermi $\gamma$-ray sky. Our test found no significant...
excess in either the tracks (\(p = 33\%\)) or cascades (\(p = 46\%\)). Combining these values with previous results (28.1\% for IC 59 north, 4.7\% for IC 59 south, 58.3\% for IC 40; Turley et al. 2018) by Fisher’s method yields a joint \(p\)-value of \(p = 19.7\%\).

While our results show no significant evidence of \(\nu-\gamma\) coincidences, we look forward to the results of future searches using additional neutrino data. We also continue our work with Astrophysical Multimessenger Observatory Network (Smith et al. 2013; Cowen et al. 2016) partner facilities and the Gamma-ray Coordinates Network (Barthelmy et al. 1998) to generate low-latency \(\nu-\gamma\) alerts from Fermi LAT \(\gamma\)-ray and high-energy neutrino data. Once these alerts are deployed, they will be distributed in real time to AMON follow-up partners.

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