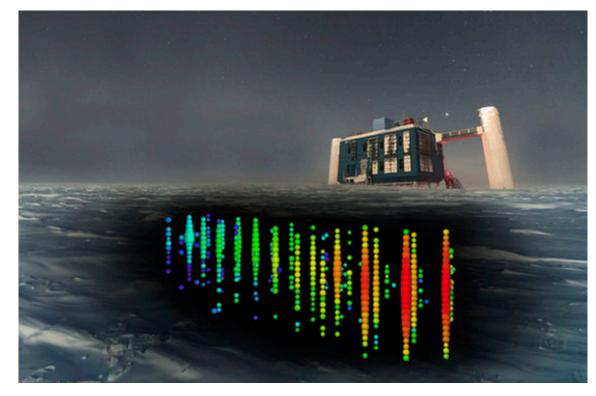
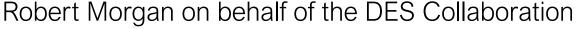
IceCube Follow-up by the Dark Energy Survey

A DECam Search for Explosive Optical Transients Associated with IceCube Neutrinos









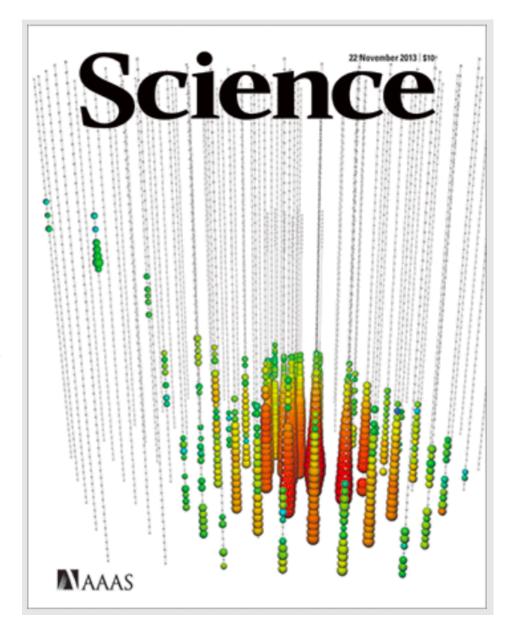
DATA SCIENCE FELLOWSHIP PROGRAM

With Keith Bechtol, Rick Kessler, Masao Sako, Zoheyr Doctor, Dan Scolnic, Nacho Sevilla-Noarbe, Marcelle Soares-Santos, Ken Herner, Alyssa Garcia, Antonella Palmese, Dillon Brout, Francisco Paz-Chinchon and Eric Neilsen (from the DES Collaboration); and Naoko Kurahashi Neilson, Marek Kowalski, and Anna Franckowiak (from the IceCube Collaboration)





- Article: The IceCube Collaboration 2013
- Nearly isotropic neutrino flux
- Not produced in the atmosphere
- Motivated the search for EM counterparts
 - At present, <u>only one out of O(50)</u> high energy neutrinos has convincing evidence for association with an EM counterpart (<u>The IceCube Collaboration</u> <u>et al. 2018</u>)





Current constraints leave a large fraction of the TeV-PeV flux unexplained

Source Class	Maximum Contribution	Reference	
Gamma Ray Bursts	1%	Aartsen et al. 2015	
Gamma Ray Blazars	19 % - 27 %	Aartsen et al. 2017	
Star Forming Galaxies	~30 %	Bechtol et al. 2017	



Current constraints leave a large fraction of the TeV-PeV flux unexplained

Several analyses suggest core-collapse supernovae (CC SNe)

- Physical mechanism: A choked relativistic jet during the collapse
- Hadrons accelerated by the jet could produce prompt TeV-PeV neutrino emission
- Associated gamma signal is expected to be blocked by the stellar material
 - Razzaque et al. 2004, Ando & Beacom 2005, Woosley & Janka 2006, Murase & loka 2013, among many others



Current constraints leave a large fraction of the TeV-PeV flux unexplained

Several analyses suggest core-collapse supernovae (CC SNe)

This situation has motivated several optical follow-ups

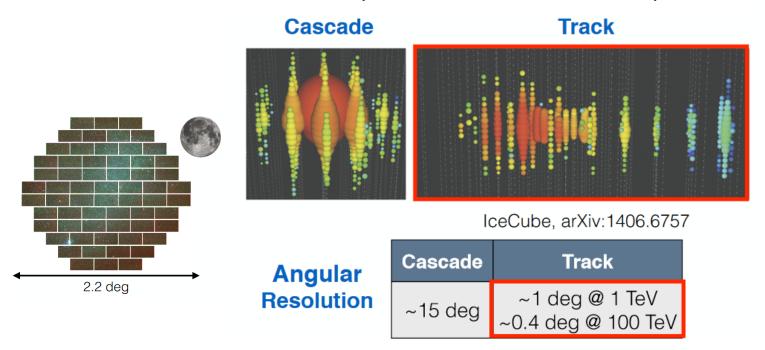
- Some recent papers from the most active collaborations
 - Pan-STARRS1: Kankare et al. 2019
 - MASTER: <u>Aartsen et al. 2017</u>
 - ROTSE and PTF: <u>Aartsen et al. 2015</u>



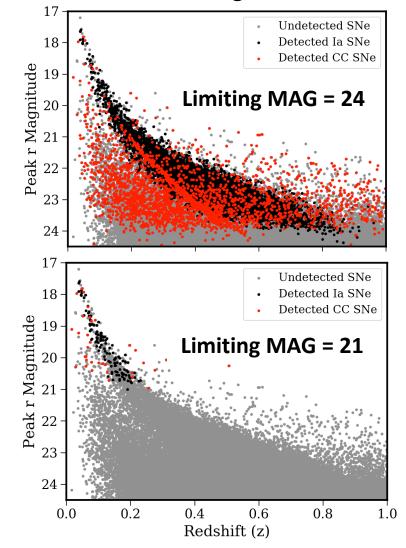
DECam and IceCube:

The best match for optical southern hemisphere neutrino multimessenger studies

arXiv: 1907.07193



Field of view size and imaging depth make DECam the ideal instrument for optical IceCube follow-up in the southern hemisphere





DECam Cadence
Candidate Selection
DECam Follow-Ups



DECam Cadence

- Triggered observations for ~6 epochs spread over 2-3 weeks after an alert
- 2 x 150 second exposures in gri
- Half-chip dither to fill in CCD gaps
- 5σ limiting magnitude g,r,i=23.6, 23.7, 23.3 mag
- Process images with DES Difference Imaging Pipeline
 - Reference: <u>Kessler et al. 2015</u>



DECam Cadence

Candidate Selection

- Largest expected contaminants:
 - Noise, AGN / QSO, Asteroids, Type Ia SNe, Unassociated CC SNe
- Cuts on data
 - Optical quality and detectability
 - Increasing brightness
 - Light curve fitting for the date of peak brightness
 - Random forest classification for CC versus la
 - Catalog lookup to exclude AGN / QSO

Observations





DECam Cadence

Candidate Selection

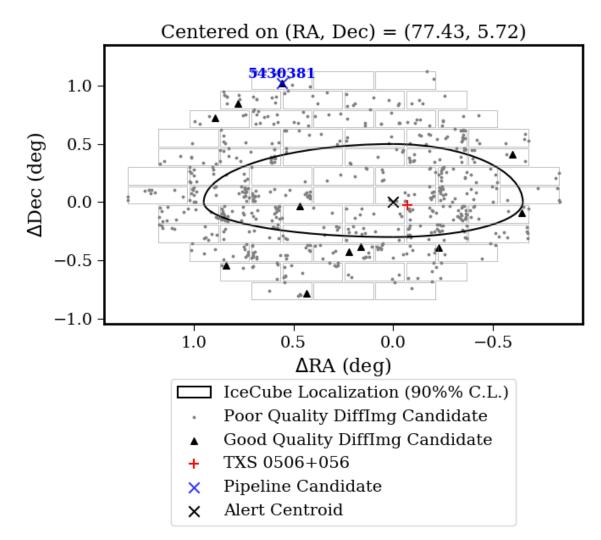
DECam Follow-Ups

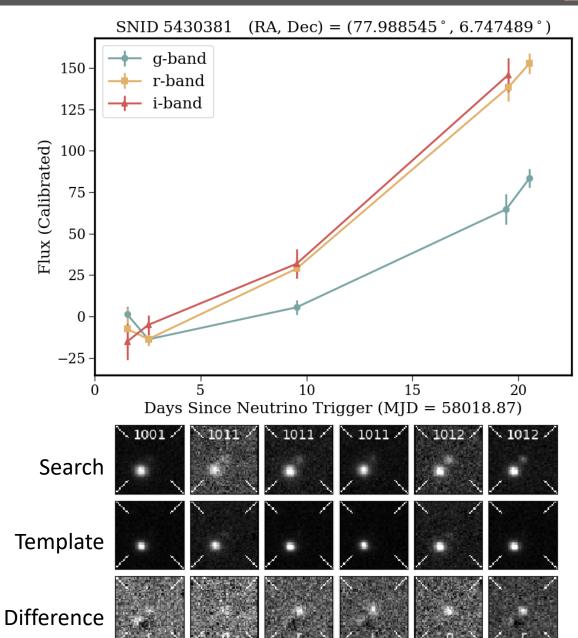
- Two alerts with completed analysis
 - IC170922A (<u>GCN</u>) and IC171106A (<u>GCN</u>)
 - 1 candidate passed selection for each follow-up



DES-5430381

(g, r, i) mag = (22.7, 22.0, 22.1)

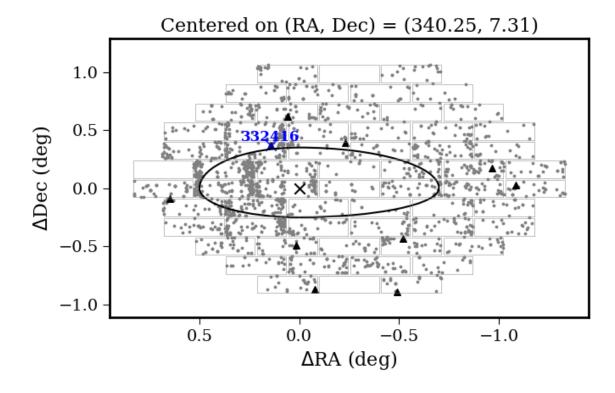




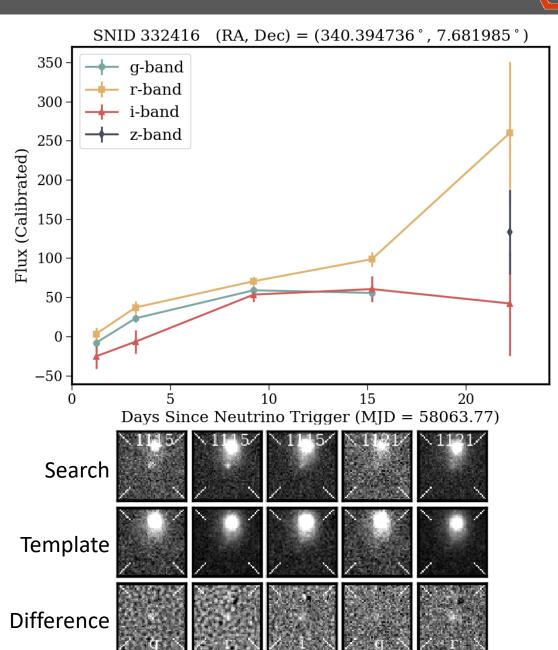


DES-332416

(g, r, i, z) mag = (23.1, 21.5, 23.4, 22.2)



- ☐ IceCube Localization (90%% C.L.)
- Poor Quality DiffImg Candidate
- ▲ Good Quality DiffImg Candidate
- Pipeline Candidate
- × Alert Centroid





Simulation Components

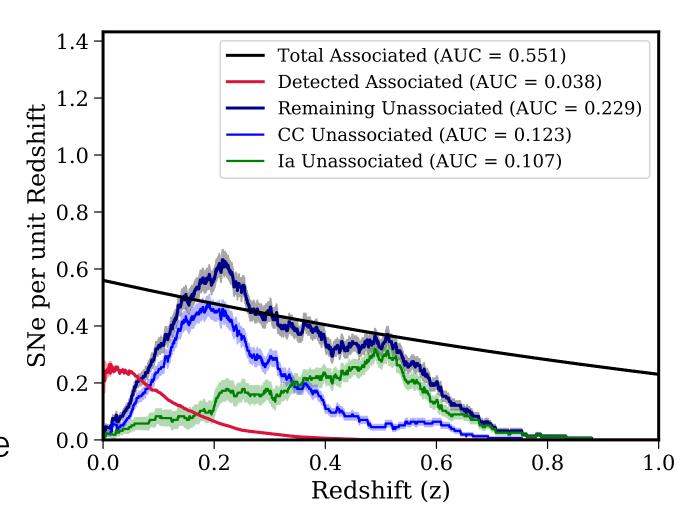
- SNe light curves simulated in SNANA (<u>Kessler et al. 2009</u>)
- Signal sample:
 - CC SNe with explosion time set to date of neutrino trigger
- Background sample:
 - Type Ia SNe and CC SNe with PeakMJD in [Trigger 30 days, Trigger + 100 days]
 - Type la rate from <u>Dilday et al. 2008</u>
 - CC SNe rate from <u>Bernstein et al. 2012</u>

Procedure: Apply selection criteria to simulations and quantify the expected numbers of signal and background events as functions of redshift



Simulations show a large unremovable SNe background and comparatively low detectable signal

- Very unlikely to be able to confidently associate a single SN with a single neutrino
- With repeated observations, one could observe a statistically significant excess of SNe over time

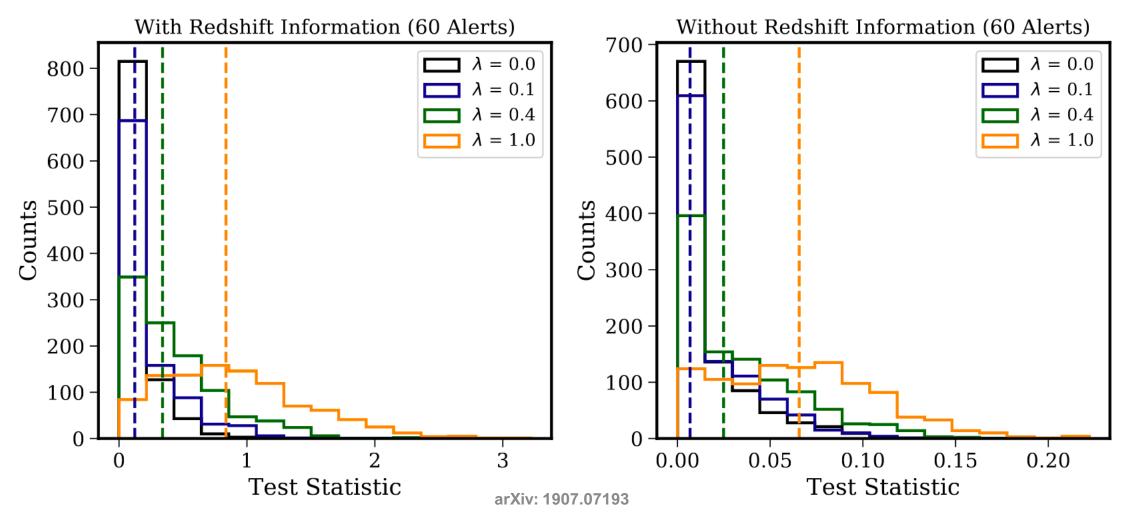


Distributions show the expected SNe per unit redshift within the IceCube 90% confidence region for the IC170922A follow-up



We perform 1000 realizations of dedicated follow-up campaigns.

Figure: TS distributions of 1000 realizations of the follow-up of 60 IceCube alerts. The parameter λ represents the true fraction of the IceCube TeV-PeV flux caused by CC SNe



Forecasting Hypothesis Testability

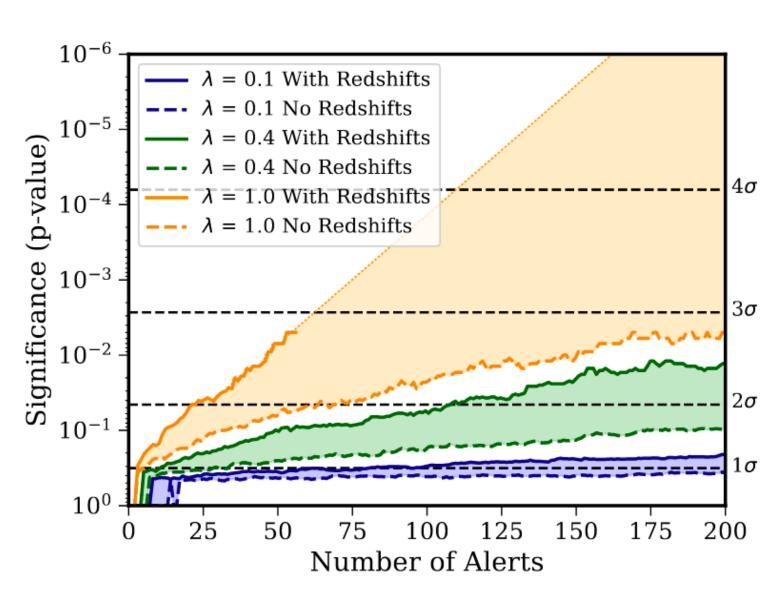


Figure:

Confidence level at which one can claim CC SNe contribute to the TeV-PeV IceCube neutrino flux

Performance depends on:

- Observing conditions
- Availability of redshift information
- Number of alerts targeted
- True fraction of IceCube flux caused by CC SNe (λ)



Application to Observations





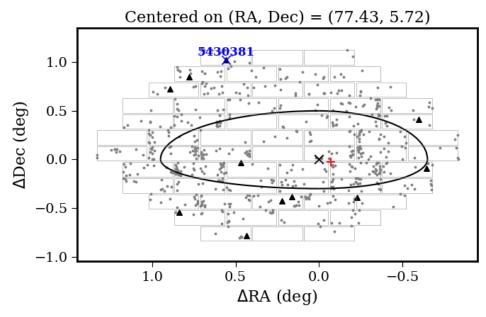
Based on the 1000 realizations of DECam follow-ups, we calculate p-values for the association of each candidate with the corresponding neutrino alert

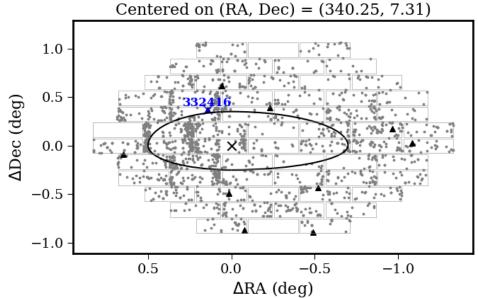
DES-5430381 and IC170922A: p-value = 1.00

DES-332416 and IC171106A: p-value = 0.03

Joint result: p-value = 0.09

Based on the simulations, we shouldn't expect to be able to make a significant claim after only two follow-ups.





Components of a Successful Follow-Up Campaign robert.morgan@wisc.edu



Based on our pilot observations, the necessary components of a successful follow-up campaign are:

- Triggered follow-up
- 2. Deep imaging
- 3. Redshift information
- 4. The follow-up of many alerts

Components of a Successful Follow-Up Campaign robert.morgan@wisc.edu



Based on our pilot observations, the necessary components of a successful follow-up campaign are:

- 1. Triggered follow-up
- 2. Deep imaging
- 3. Redshift information
- 4. The follow-up of many alerts

Looking Forward:

- DECam will likely remain the best instrument for this campaign
 - Deep imaging
 - Fild of view size
 - Availability of triggered observations
- IceCube Gen2
 - Increased neutrino event rate
 - Improved angular resolution
- LSST
 - Host galaxy photo-z measurements



CC SNe are frequent enough that we expect an unremovable background to be present in optical follow-ups

Obtaining redshifts of candidates / host galaxies helps to reduce backgrounds significantly

If CC SNe make up a significant fraction of the TeV-PeV neutrino flux, it will take dedicated and methodological follow-up of several of IceCube alerts to observe a statistically significant excess of CC SNe.



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Thank you!

Robert Morgan ◆ University of Wisconsin-Madison ◆ LSSTC Data Science Fellow https://rmorgan10.github.io robert.morgan@wisc.edu

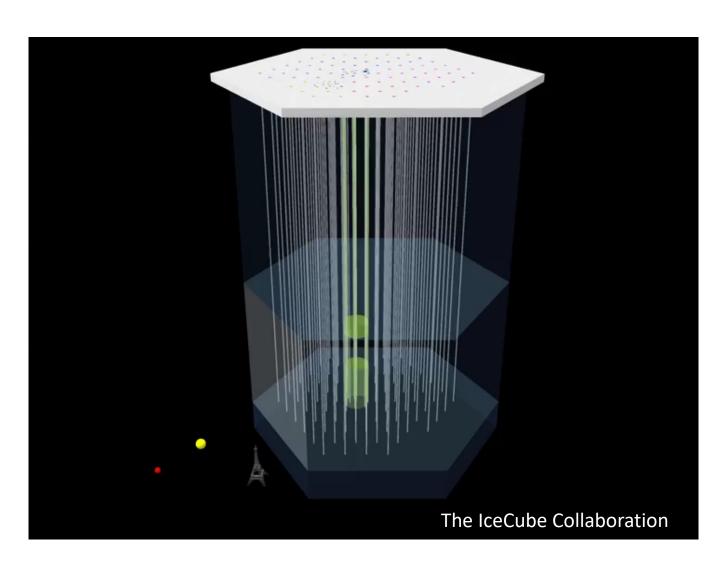


Supplemental Material



The IceCube Neutrino Observatory

- Cubic km scale detector built into the South Pole ice
- Over 5000 optical modules to detect Cherenkov radiation
- Event reconstruction
- Realtime alert system





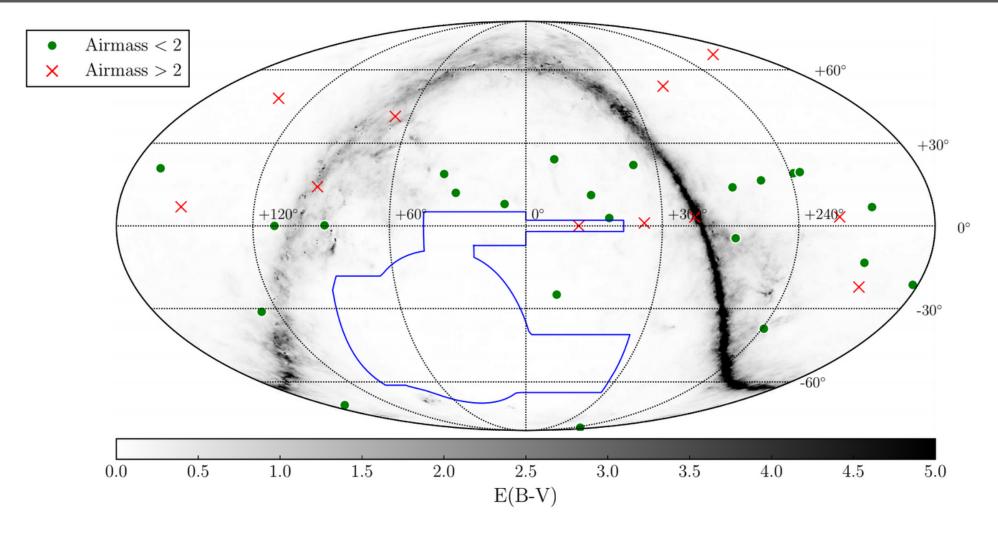
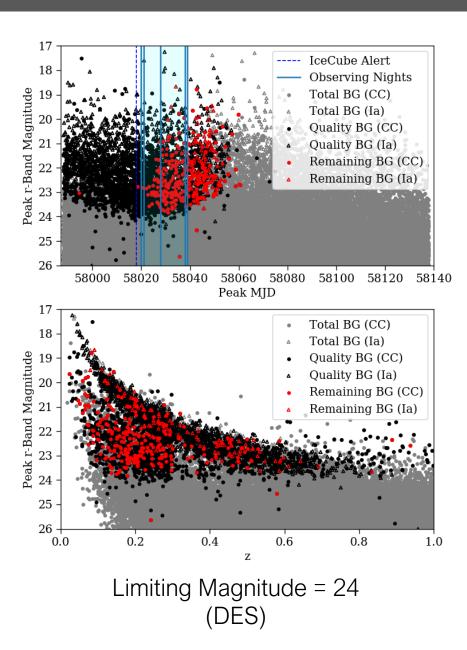


Figure: Population of the best-localized high energy neutrino track events detected by IceCube

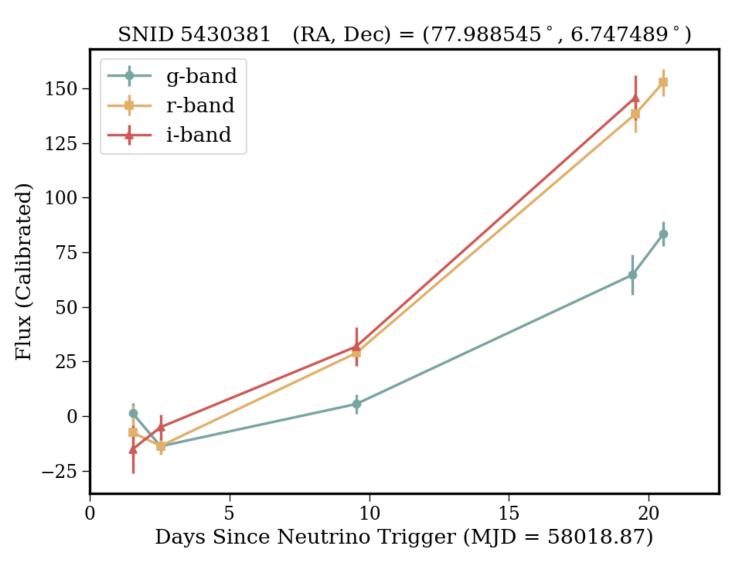


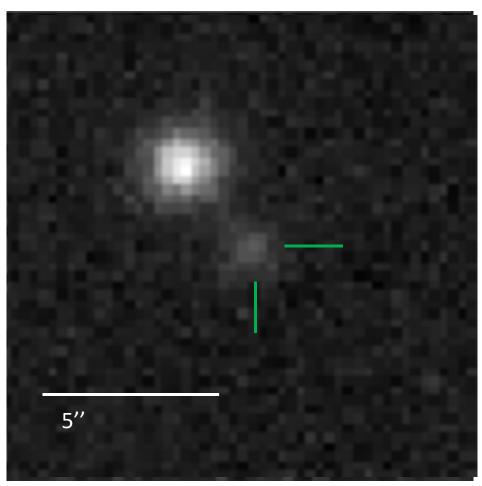


---- IceCube Alert Observing Nights Total BG (CC) Total BG (Ia) Quality BG (CC) Quality BG (Ia) Remaining BG (CC) Remaining BG (Ia) 25 26 58060 58080 58100 58120 58140 58000 58020 58040 Peak MJD Total BG (CC) Total BG (Ia) Peak r-Band Magnitude 22 23 24 24 Quality BG (CC) Quality BG (Ia) Remaining BG (CC) Remaining BG (Ia) 26 0.0 8.0 0.2 0.4 0.6 1.0 Limiting Magnitude = 21

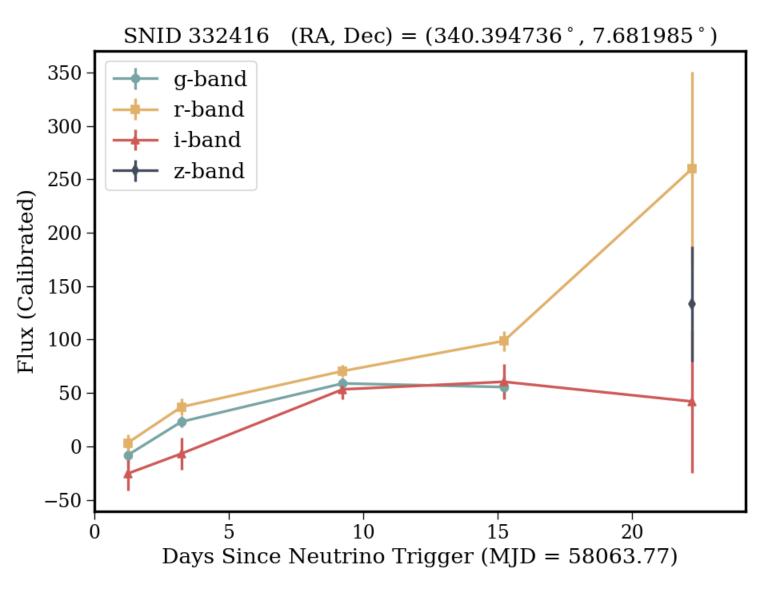
(Previous Efforts)

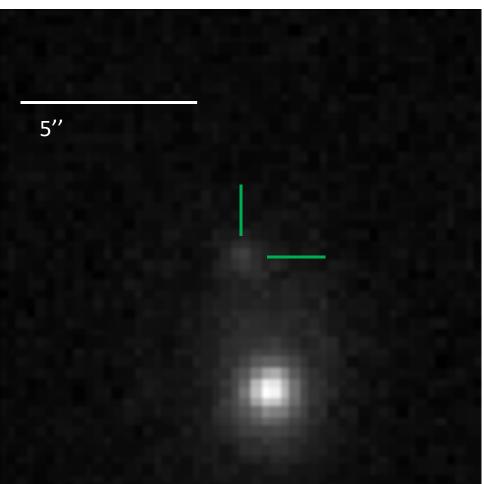














Signal Sample

CC SNe with the explosion time set to the date of the neutrino trigger

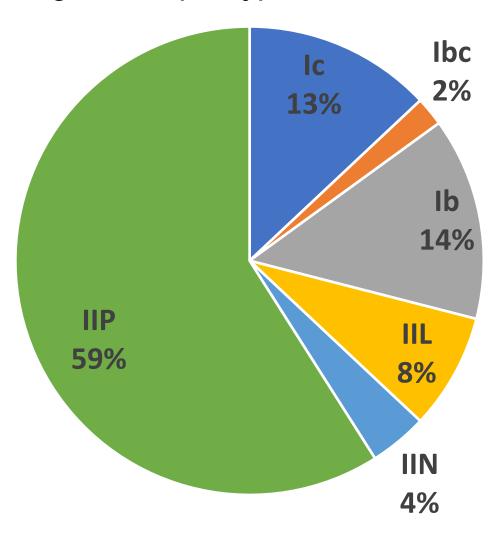
Background Sample

Type-Ia and CC SNe within the range Trigger – 30 days < PEAKMJD < Trigger + 100

Notes

- Trying to select against Type Ia SNe, out-of-phase CC SNe
- Purposeful inclusion of in-phase CC SNe in background sample

Signal Sample Type Distribution



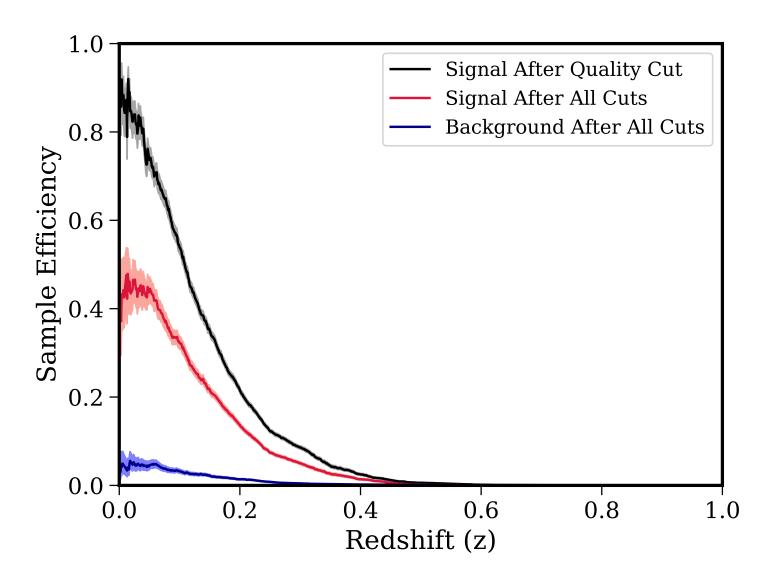


Selection Criteria Effectiveness on Signal versus Background Samples

Criterion	Description	Signal Efficiency	Background Efficiency
Light Curve Quality	Detected in two separate epochs regardless of filter	19.9 %	16.0 %
Increasing Flux	No detection on first night, or if detected, an increase in flux by at least 1 mag over the first two nights	19.8 %	10.8 %
Best-Fit Peak MJD	PSNID fitting to type-II and type-Ibc templates has best-fit peak MJD 16 and 6 nights after trigger, respectively	17.9 %	5.5 %
Random Forest Classifier	RFC trained on SNANA simulations to select temporally-coincident and low-z CC SNe from background SNe	12.1 %	1.3 %

Efficiencies based on z < 0.3 simulations of IC170922A





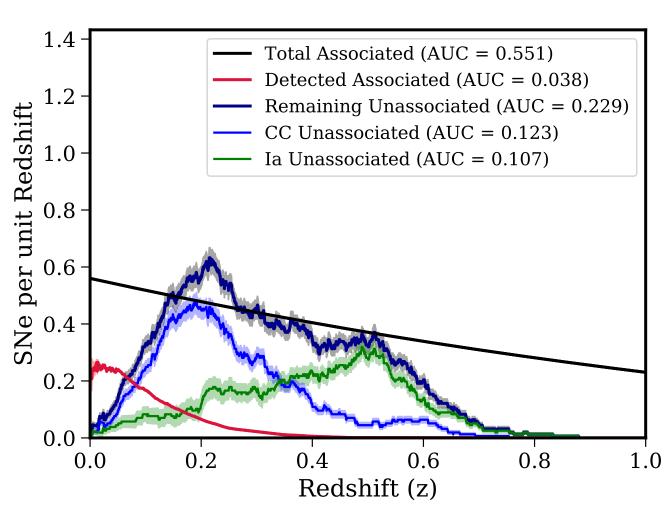


Signal rate determination:

- Obtain signal efficiency as a function of redshift
- Fold signal efficiency with massive star formation rate to obtain neutrino intensity from CC SNe PDF

$$\begin{array}{cccc} \text{Cumulative} & \text{Luminosity} & \text{Time} \\ \text{intensity} & \text{distance} & \text{dilation} \\ \\ \frac{dN_{\nu}(E_{\nu})}{dE_{\nu}d\Omega dt_{\text{obs}}dA} = \int_{0}^{z_{\text{max}}} \frac{dV}{dz d\Omega} \frac{1}{4\pi D_{L}^{2}} \frac{dN_{\nu}(E_{\nu}(1+z))}{dE_{\nu}} \frac{1}{1+z} \mathcal{R}(z) dz \\ \\ \text{Comoving} & \text{Emission} & \text{Star formation} \\ \text{volume} & \text{spectrum} & \text{rate} \\ \end{array}$$

Background rate is obtained directly from simulations



Distributions show the expected SNe per unit redshift within the IceCube 90% confidence region for the IC170922A follow-up



A Monte Carlo Approach to forecasting follow-up feasibility Details:

- Parameterize the signal by the fraction of high energy neutrinos that are produced by CC SNe (call this fraction λ)
- Define a test statistic

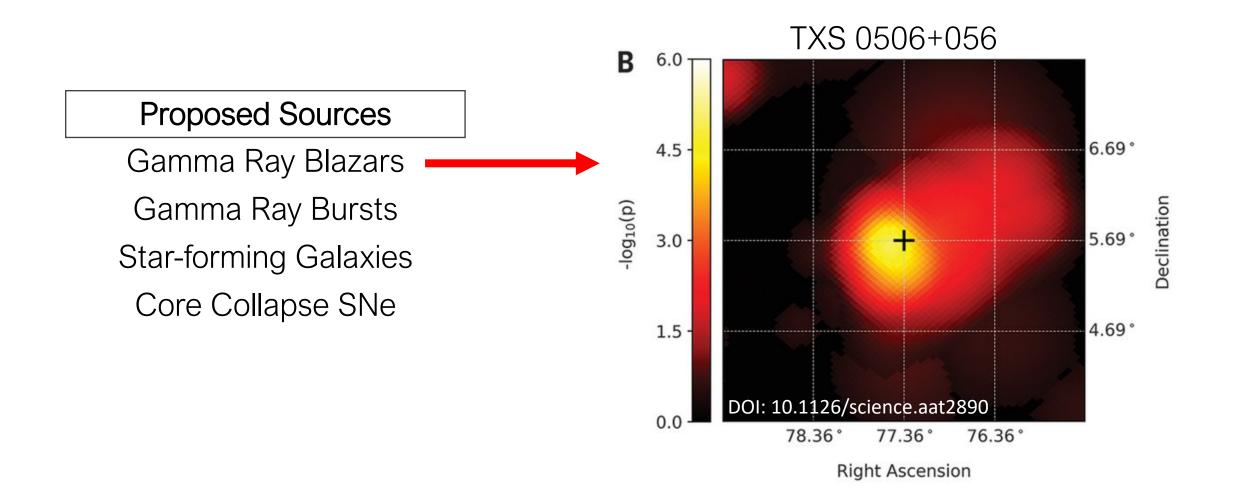
$$\mathcal{L}$$
 = Poisson (Observed | Expected Background)

$$TS = \log(\mathcal{L})|_{\lambda = \hat{\lambda}} - \log(\mathcal{L})|_{\lambda = 0}$$

- Perform 1000 realizations of the problem with $\lambda = 0$
 - This is our "null-hypothesis test statistic distribution"
- Perform 1000 realizations of the problem with $\lambda \neq 0$
 - This is our "signal-hypothesis test statistic distribution"



Identifying high-energy neutrino sources is a current focus of multimessenger studies and a necessity for the field of neutrino astronomy



Frequently Asked Questions About TXS

IC-170922A was associated to TXS0506+056; Why didn't DECam find it?

- At the time of the alert, TXS 0506+056 was V ~ 14 mag and therefore would be saturated in our DECam images. Our search was optimized for faint transients
- Optical imaging, spectroscopy, and polarimetry obtained from combination of ASAS-SN, Kanata/HONIR, Kiso/KWFC, Liverpool Telescope, Subaru/FOCAS

Are continued searches for *other source classes* besides gamma-ray blazars in association with IceCube neutrinos still well motivated?

- YES gamma-ray blazars likely contribute a small fraction of the total diffuse flux
- 51 total events pass IceCube realtime alert criteria; 1 coincident gamma-ray bright blazar → consistent with ~5% overall contribution from blazars, taking into account purity of realtime alert stream
- Previous cross-correlation studies using a larger neutrino event sample found upper limits on the gamma-ray blazar contribution of < 10-30% (arXiv:1611.03874)



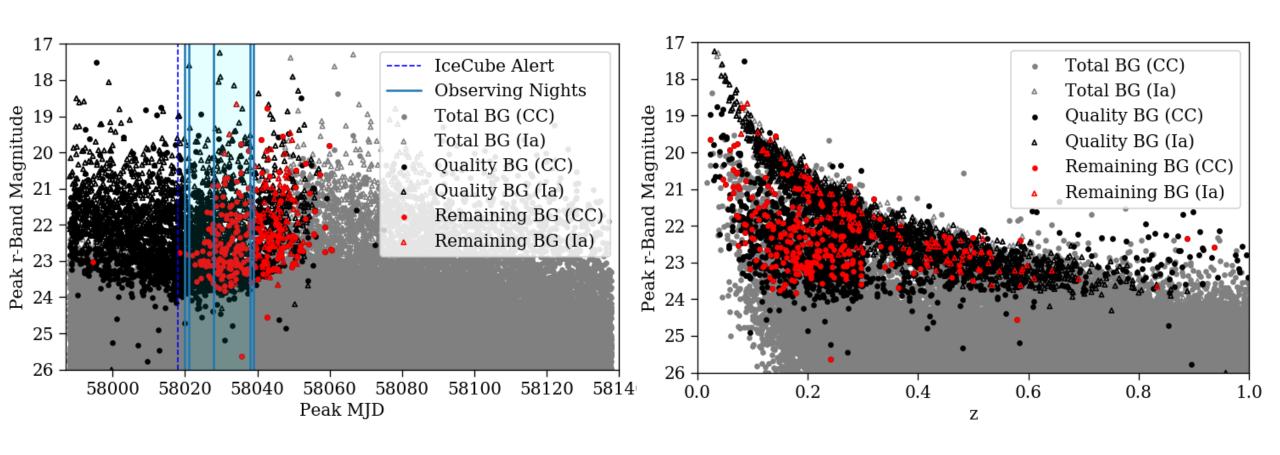


Figure: Magnitude and Redshift distributions of events after cuts



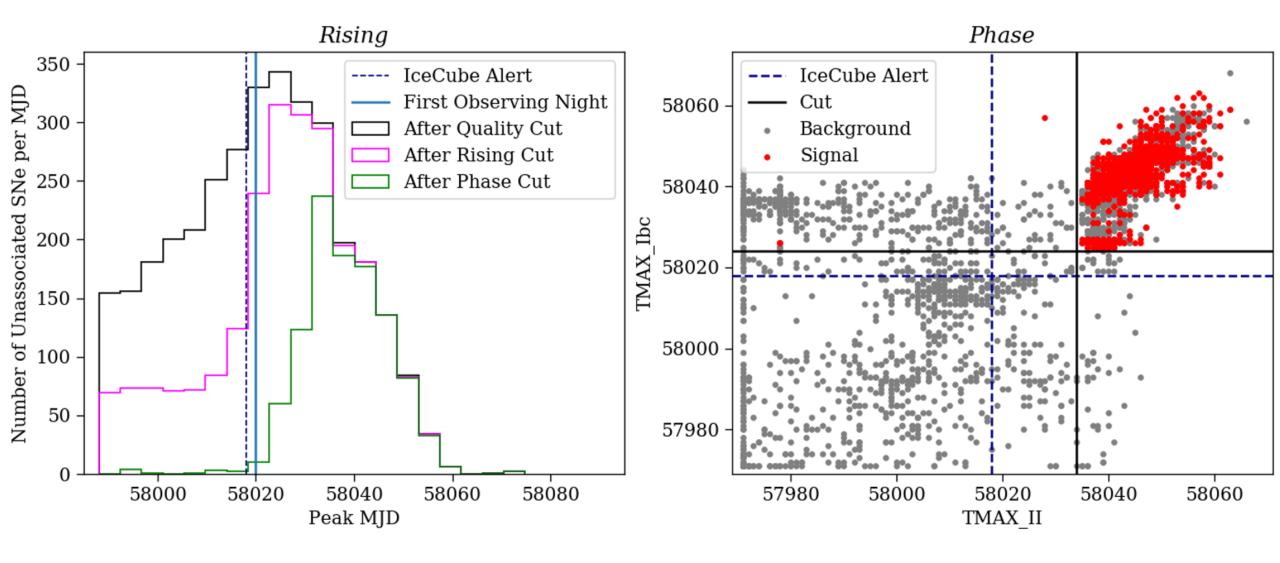


Figure: Efficacy of Rising and Phase Cuts

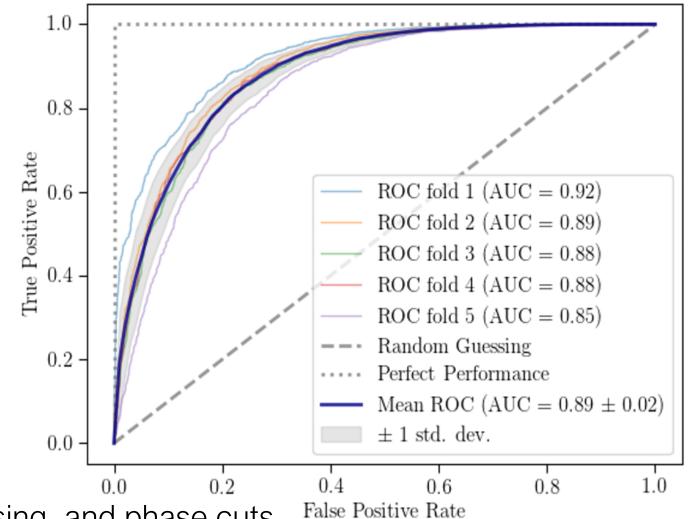
Random Forest Classification





Classification pipeline

- Use PSNID to fit light curves to la, lbc, and II templates
- Principal Component Analysis
 - 8 components
- Random Forest Classifier
 - 1000 estimators
 - No max-depth restriction
 - Decisions based on entropy
- Five-fold Cross Validation



Training set

- All light curves pass the quality, rising, and phase cuts
- Good: Signal sample SNe with z < 0.3
- Bad: Background sample SNe and Signal sample SNe with z > 0.3



https://rmorgan10.github.io/des-icecube/

Complete alert observability diagnostics within minutes

Notifies users via email

Stable and running at Fermilab

- gcn.checker@gmail.com

 Daily email. I am alive and well
- gcn.checker@gmail.com

 I crashed, please help me

des-icecube

Tracking all IceCube alerts for DES follow-up

Recent Alerts

EHE 27162025

Alert Diagnostics (IceCube)

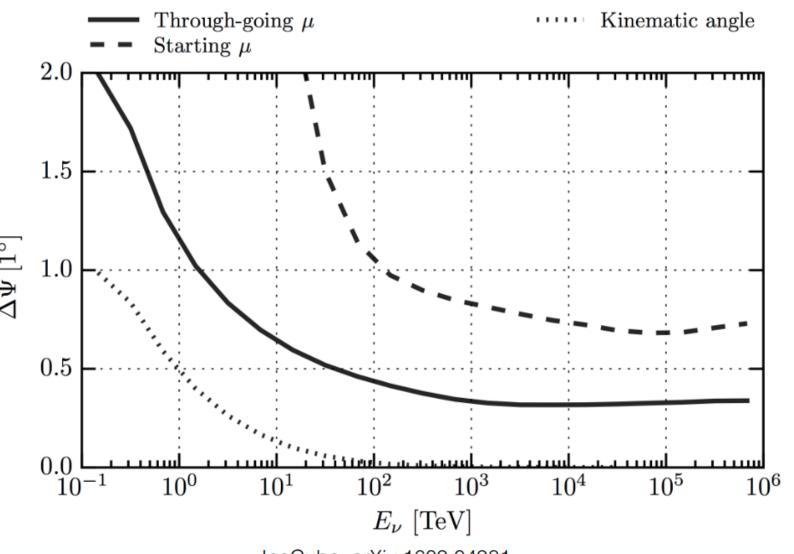
Signalness = 0.59

Alert Diagnostics (DES)

Event

Event ID = 27162025





IceCube, arXiv:1609.04981



Neutrino Intensity Redshift Integral Incorporating Star-Formation Rate

Cumulative intensity

Luminosity distance

Time dilation

$$\frac{dN_{\nu}(E_{\nu})}{dE_{\nu}d\Omega dt_{\rm obs}dA} = \int_{0}^{z_{\rm max}} \frac{dV}{dz d\Omega} \frac{1}{4\pi D_{L}^{2}} \frac{dN_{\nu}(E_{\nu}(1+z))}{dE_{\nu}} \frac{1}{1+z} \mathcal{R}(z) dz$$

Comoving volume

Emission spectrum

Star formation rate