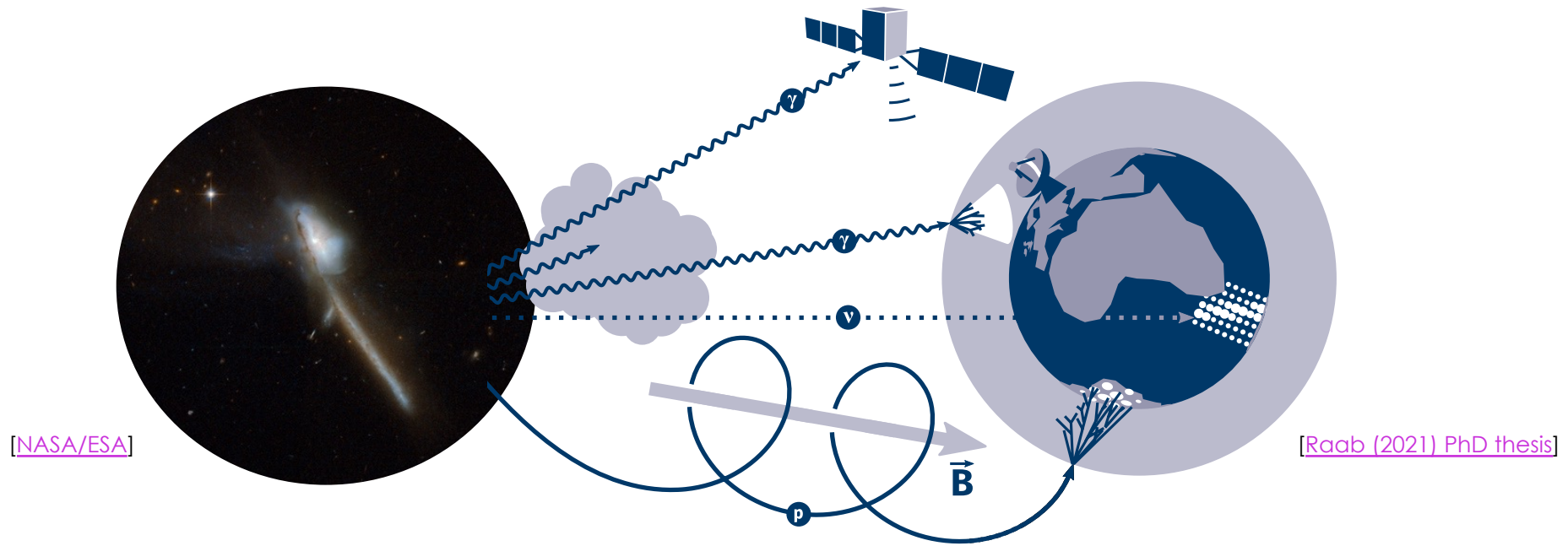




Hunting the Sources of Cosmic Neutrinos with IceCube

Pablo Correa

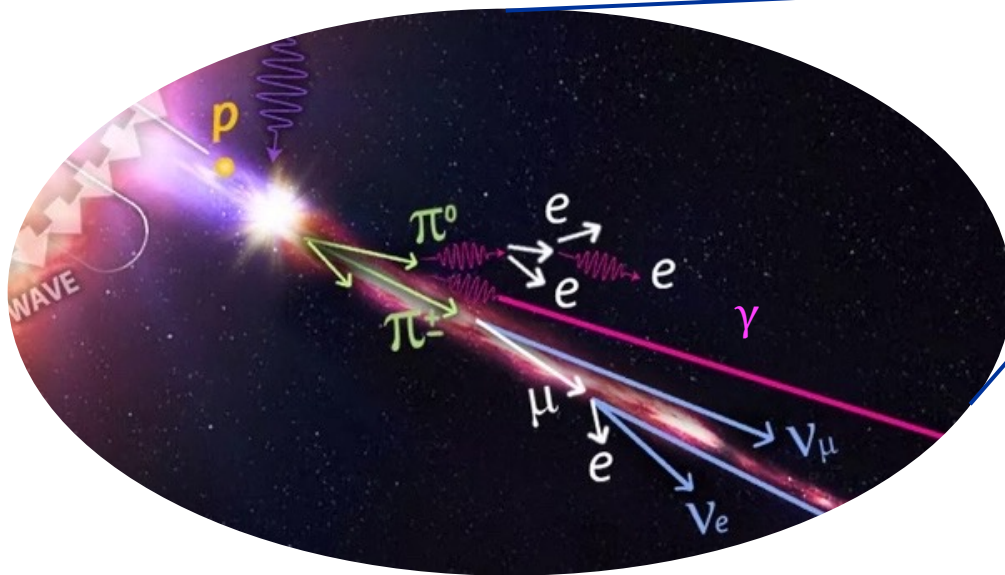
LPNHE Seminar | 13 February 2023



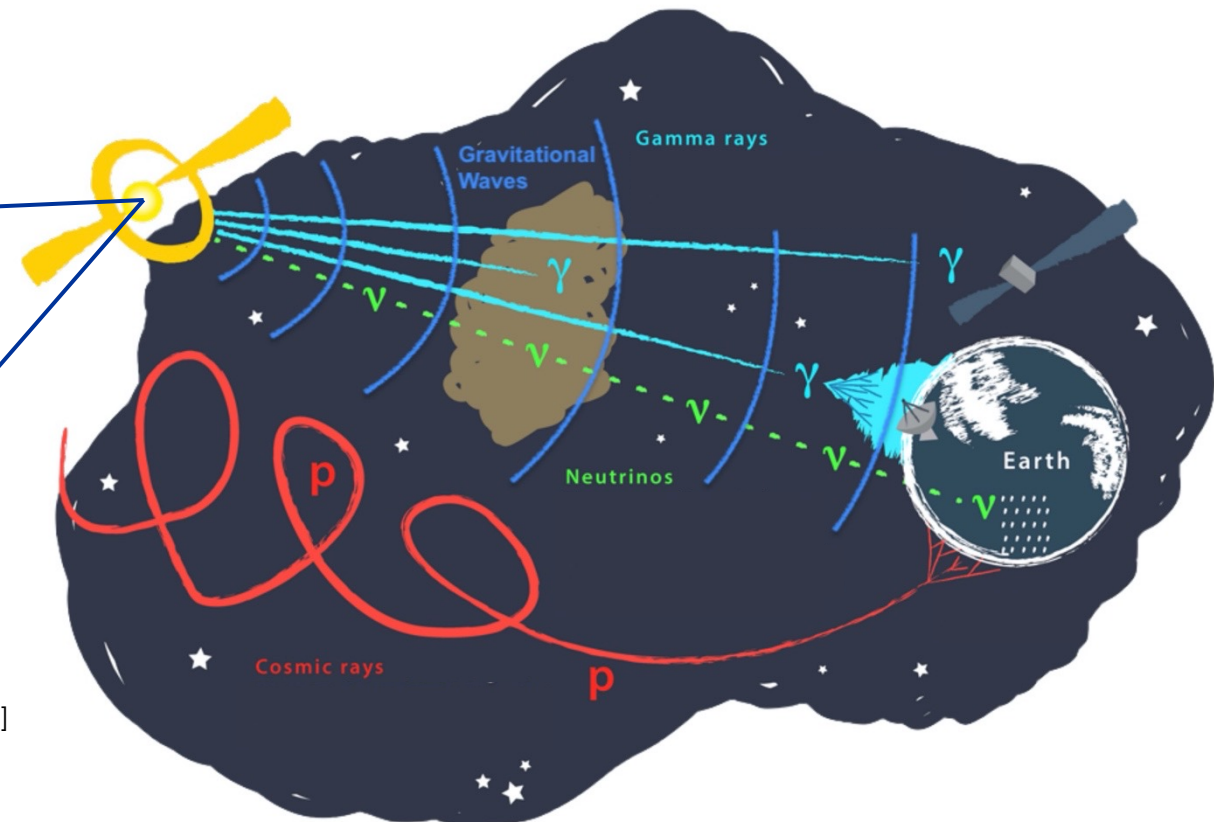
The Multimessenger Connection

- ▶ **Cosmic rays** (p)
 - ▶ Energies up to 10^{20} eV $\approx$ 16 J
 - ▶ Deflected by $\vec{B} \rightarrow$ **origin unknown!**
- ▶ **Gamma rays** (γ)
 - ▶ Attenuated by matter & radiation
 - ▶ Also produced in **leptonic** processes

- ▶ **Neutrinos** (ν)
 - ▶ Not deflected or attenuated
 - ▶ Smoking gun of hadronic interactions



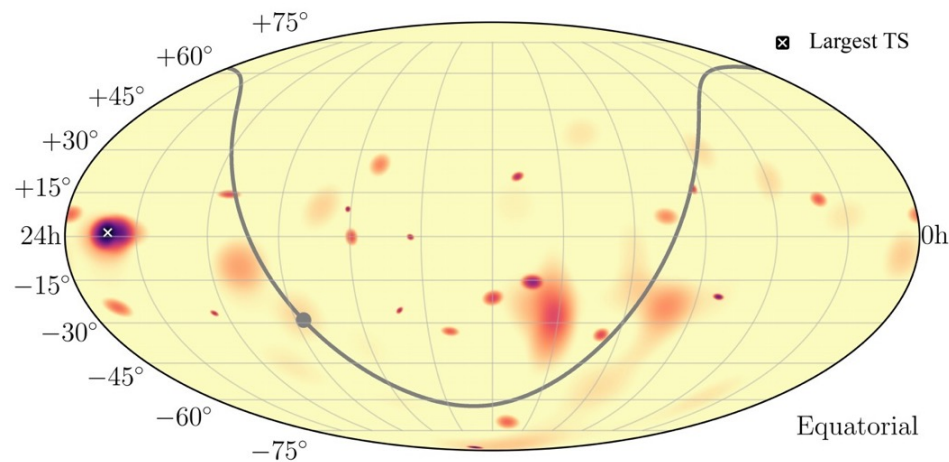
[IceCube/NSF]



The Diffuse High-Energy Neutrino Sky

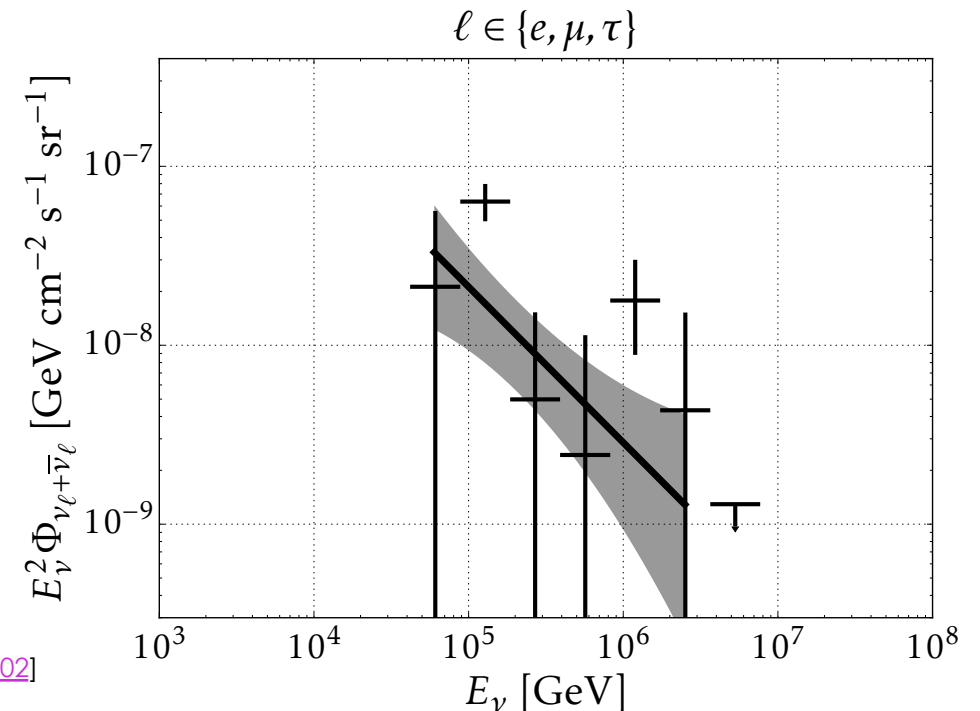
- ▶ Diffuse flux discovered by **IceCube** in 2013
- ▶ Spectrum described by single power law ($\gamma \sim 2.5$)
- ▶ Consistent with isotropic observations

What is the **origin** of high-energy neutrinos?



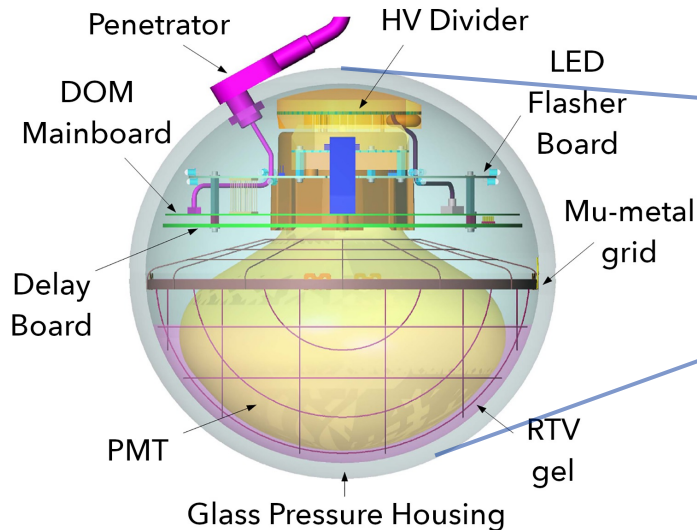
$$\Phi_{\nu+\bar{\nu}}(E_\nu) = \Phi_0 \left(\frac{E_\nu}{E_0} \right)^{-\gamma}$$

[[IC \(2021\) PRD 104 022002](#)]

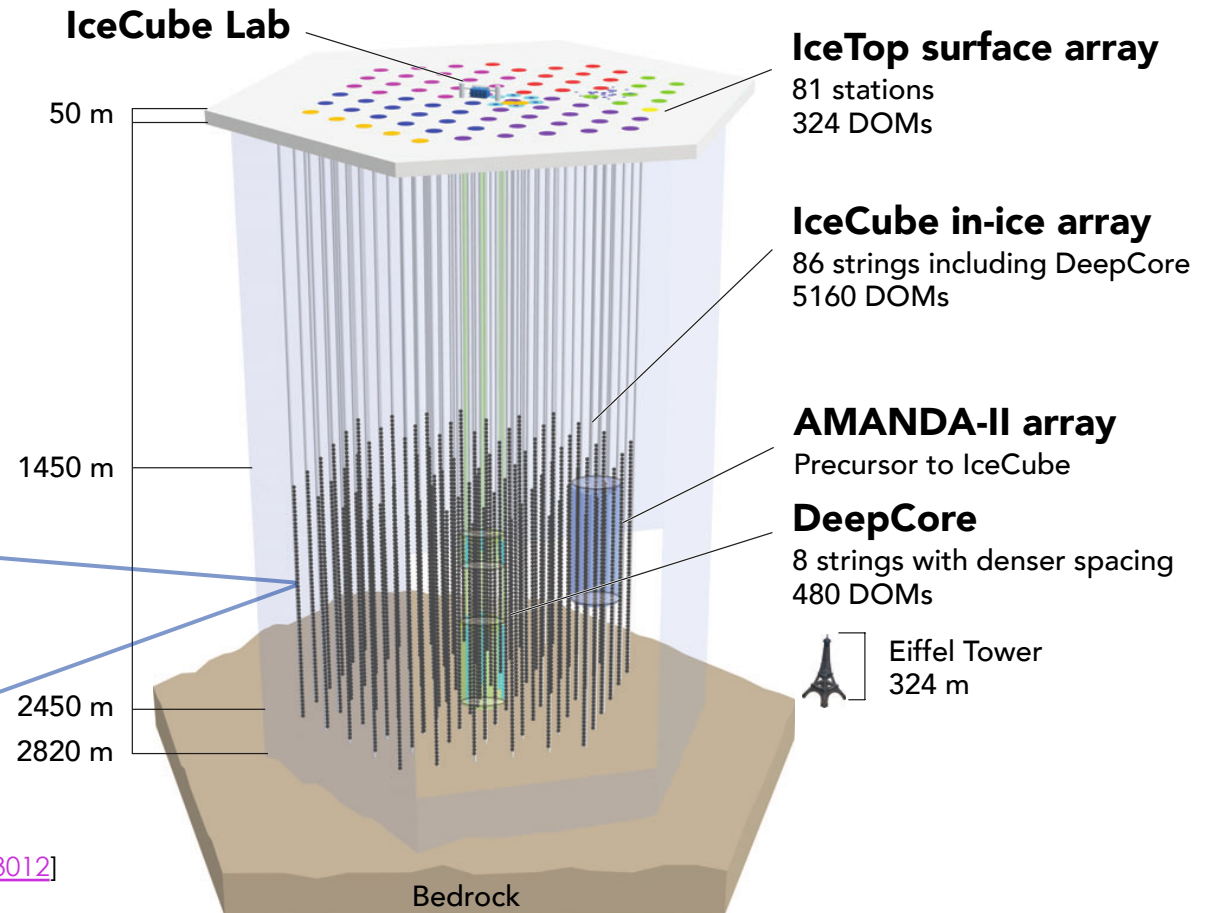


The IceCube Neutrino Observatory

- ▶ 1 km³ detector at the South Pole
- ▶ 5160 digital optical modules (DOMs)
- ▶ 86 strings down to 2.45 km depth



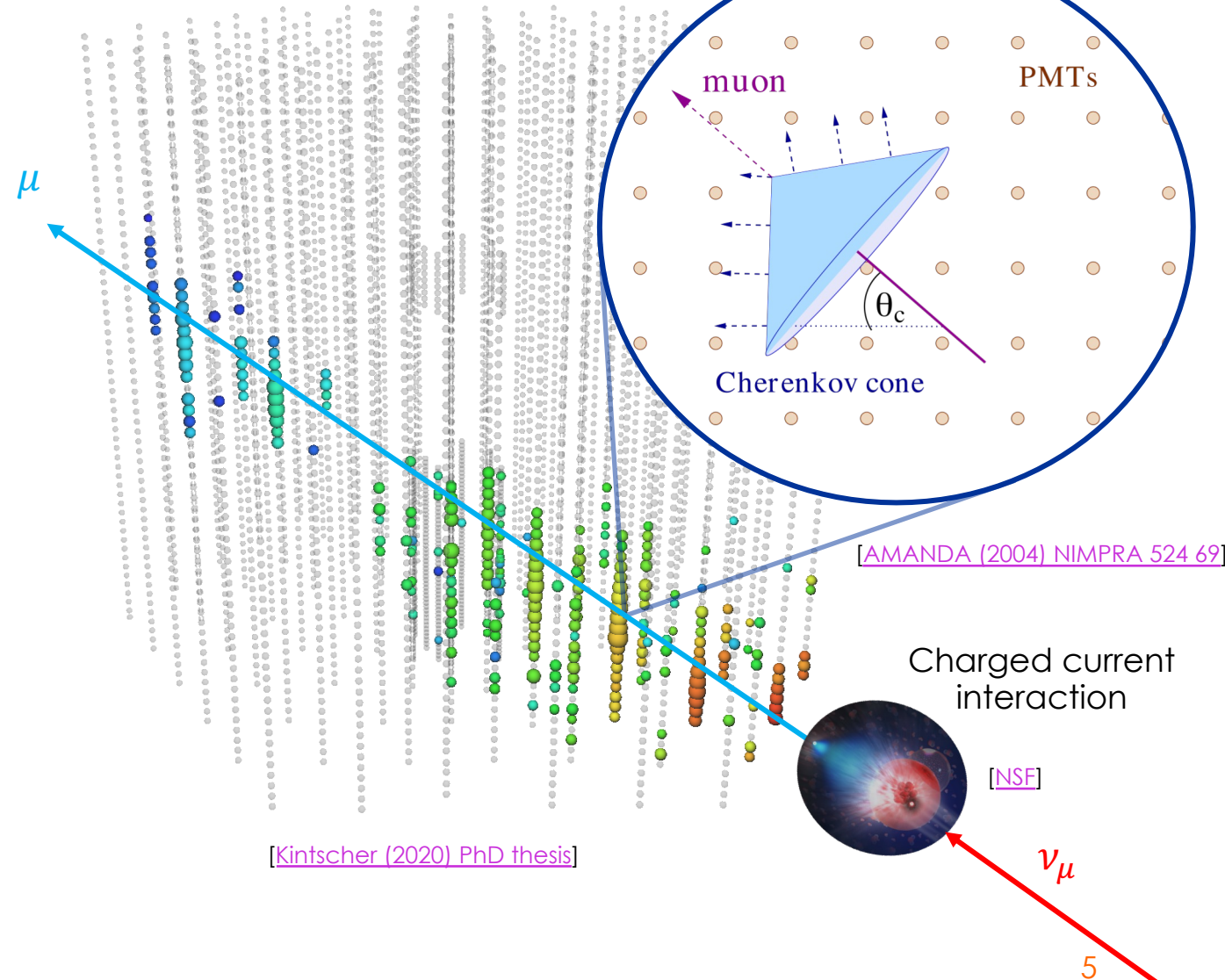
[IC (2017) JINST 12 P03012]



Detecting Neutrinos with IceCube

- ▶ Neutrinos can interact with ice
 - ▶ Produce secondary charged particles
 - ▶ These emit Cherenkov radiation
- ▶ Mostly focus on muon (μ) tracks
 - ▶ Signatures of ν_μ and $\bar{\nu}_\mu$
 - ▶ Typical angular resolution $< 1^\circ$

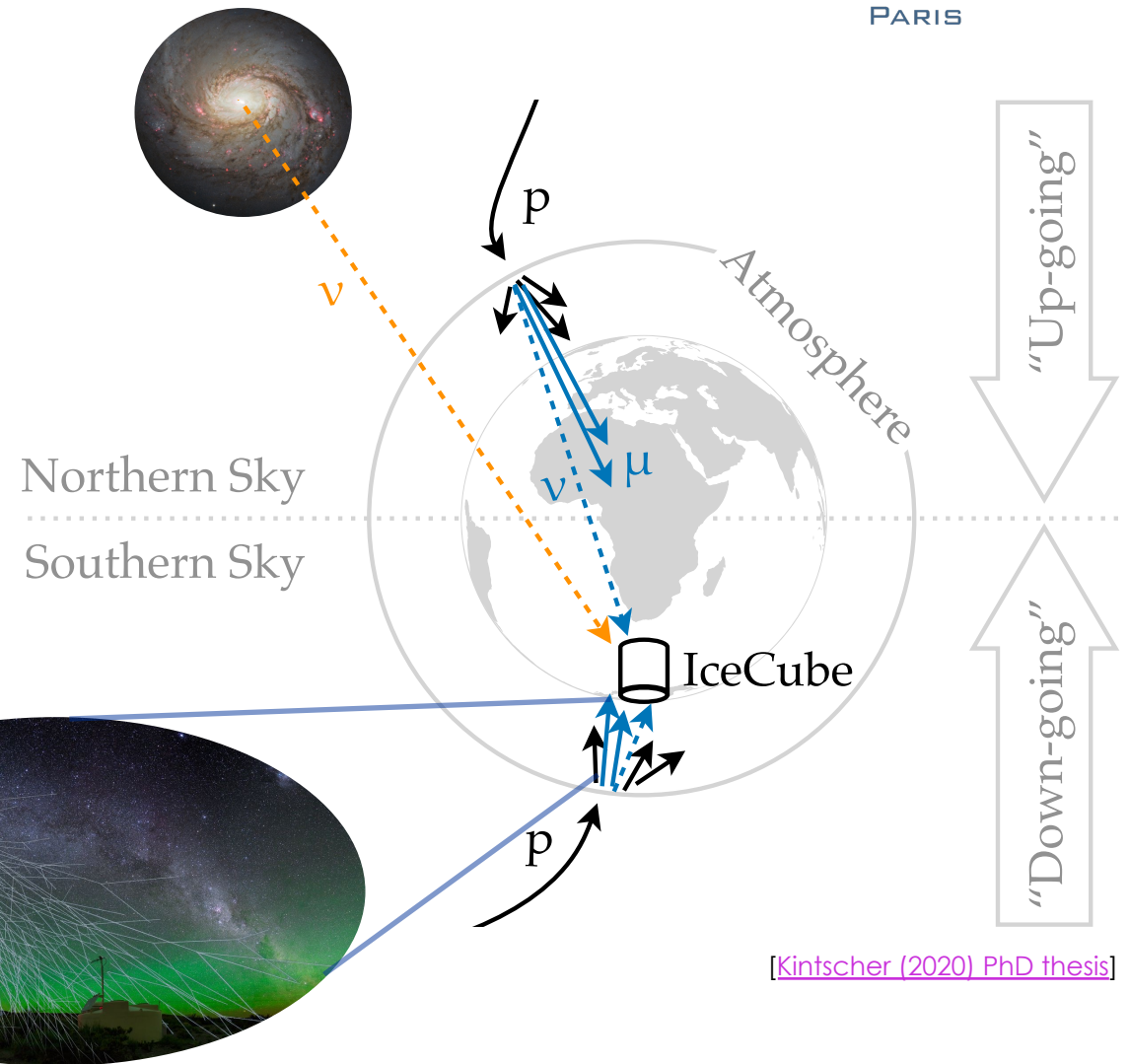
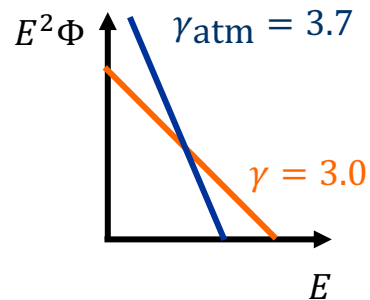
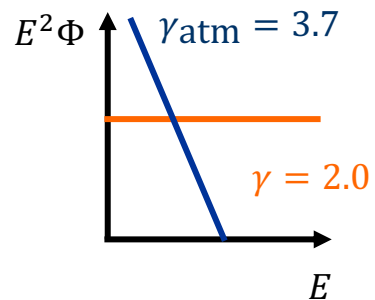
LEPTONS	$\approx 0.511 \text{ MeV}/c^2$ -1 $\frac{1}{2}$  electron	$\approx 105.66 \text{ MeV}/c^2$ -1 $\frac{1}{2}$  muon	$\approx 1.7768 \text{ GeV}/c^2$ -1 $\frac{1}{2}$  tau
	$< 2.2 \text{ eV}/c^2$ 0 $\frac{1}{2}$  electron neutrino	$< 0.17 \text{ MeV}/c^2$ 0 $\frac{1}{2}$  muon neutrino	$< 18.2 \text{ MeV}/c^2$ 0 $\frac{1}{2}$  tau neutrino



Background vs Signal

- ▶ Data mostly **atmospheric background**
 - ▶ Induced by cosmic-ray air showers
 - ▶ Relatively soft spectrum $\sim E^{-3.7}$

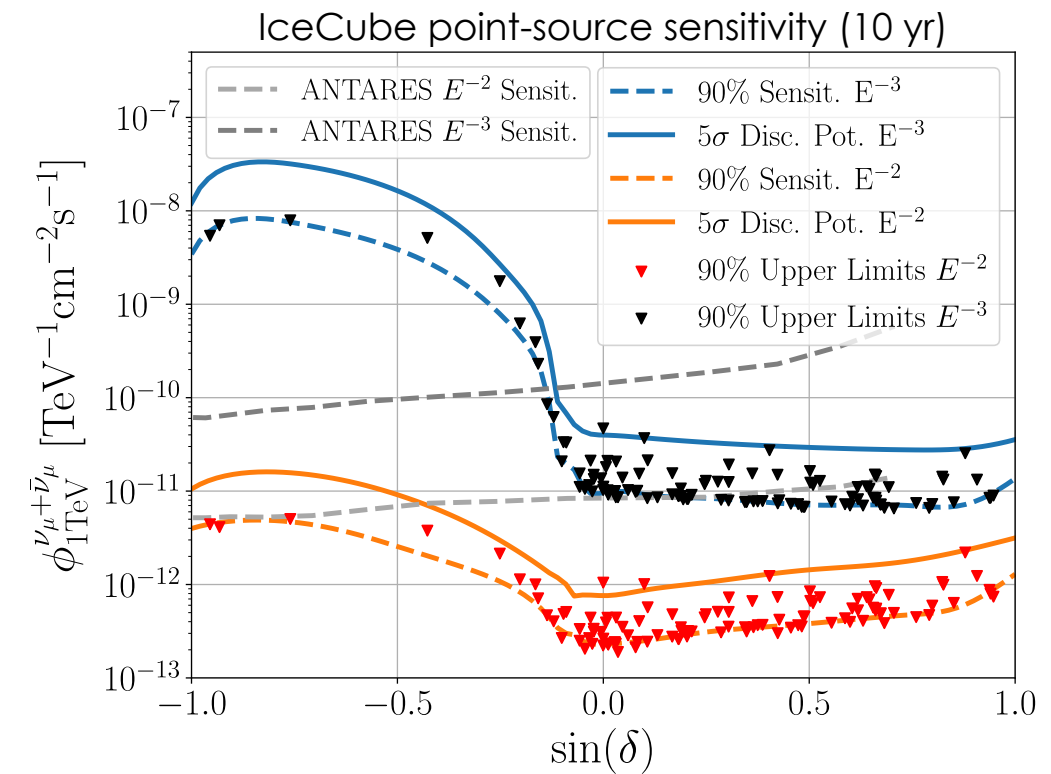
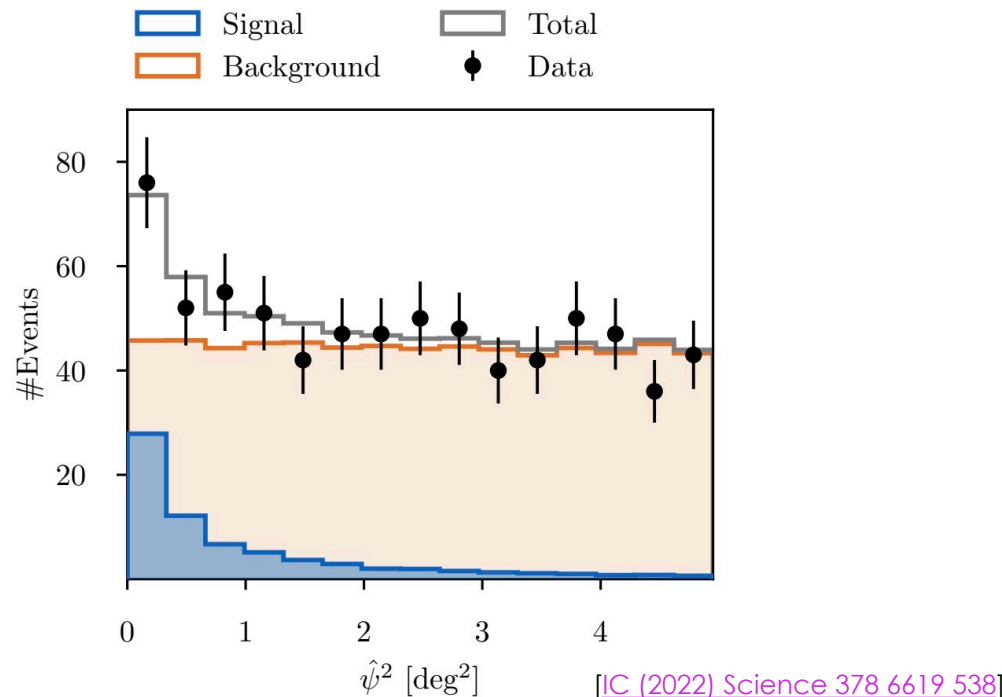
Atmospheric muons	Atmospheric neutrinos	Astrophysical neutrinos
2,700 per second	600 per hour	10–100 per year
South only	Full sky	Full sky



[Kintscher (2020) PhD thesis]

Searches for Neutrino Point Sources

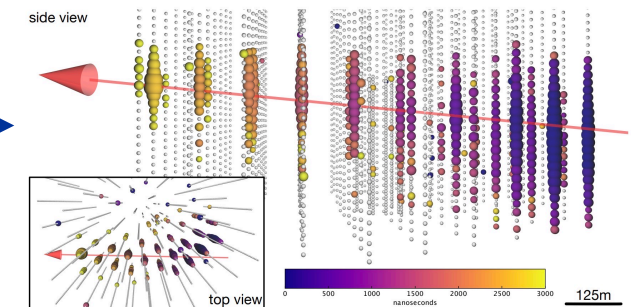
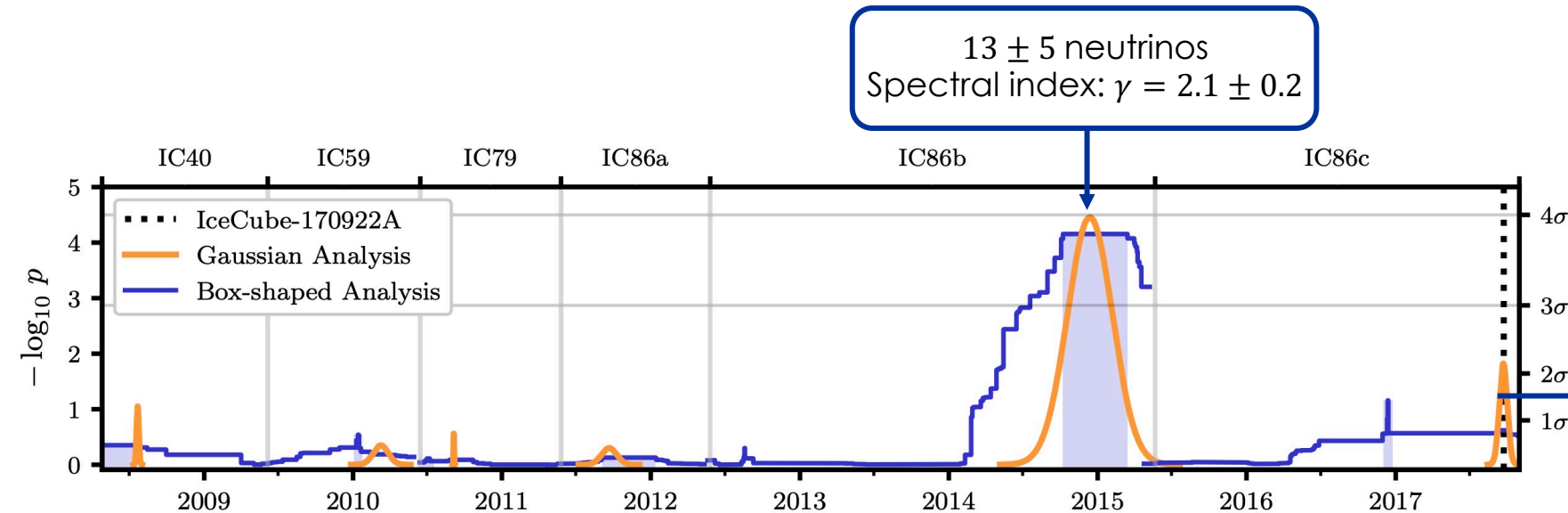
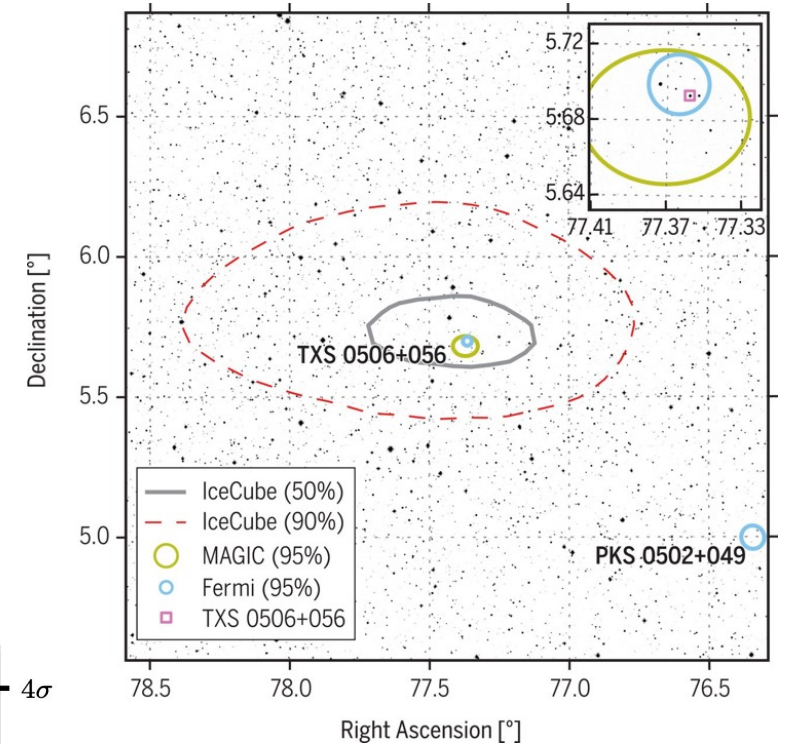
- ▶ Look for **spatial clustering** of tracks
- ▶ Steady sources: integrate over total livetime
- ▶ Transients: look for clustering in time window



[IC (2020) PRL 124 051103]

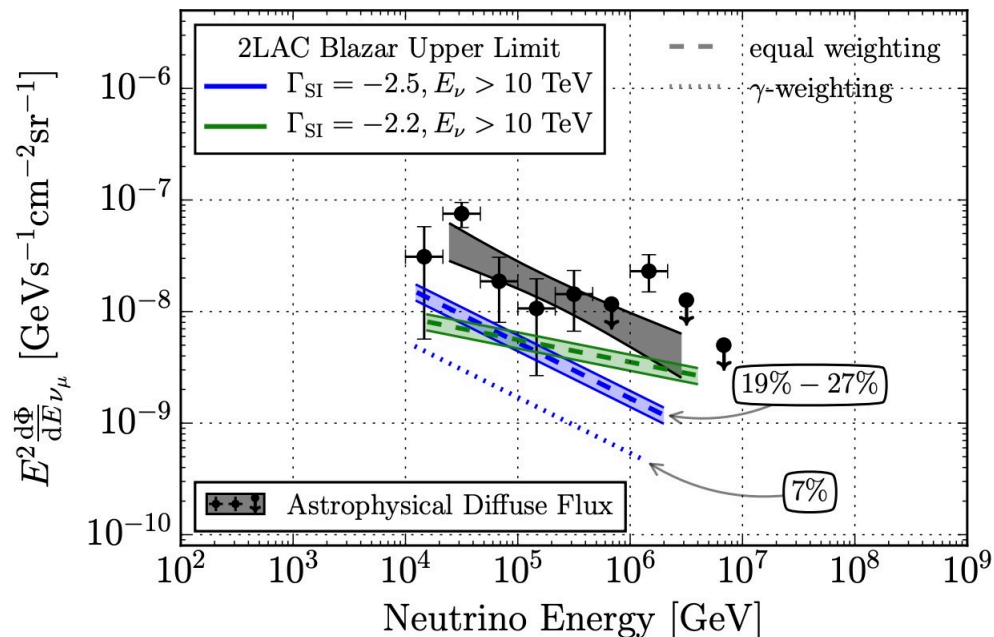
TXS 0506+056: First Transient Source (1/2)

- ▶ **Neutrino alert** ($E_\nu \sim 200$ TeV) on 22 September 2017
- ▶ 3σ coincidence with gamma-ray flaring blazar
- ▶ **Archival analysis** revealed neutrino flare at 3.5σ
 - ▶ But no coincident gamma-ray flare!
 - ▶ Other production mechanism?



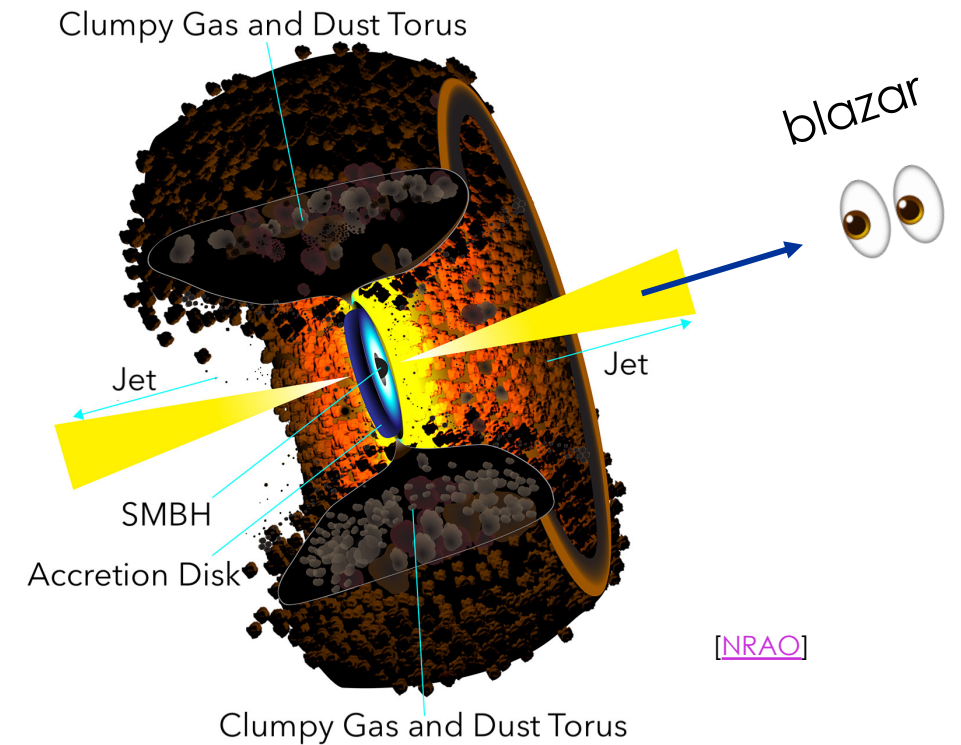
TXS 0506+056: First Transient Source (2/2)

- ▶ **Blazar** at redshift $z = 0.334$ (1.75 Gpc)
- ▶ TXS 0506+056 must be a “special” blazar
 - ▶ Contribution of *Fermi* 2LAC blazars **constrained**



[IC (2017) ApJ 835 45]

Active galactic nucleus (AGN)

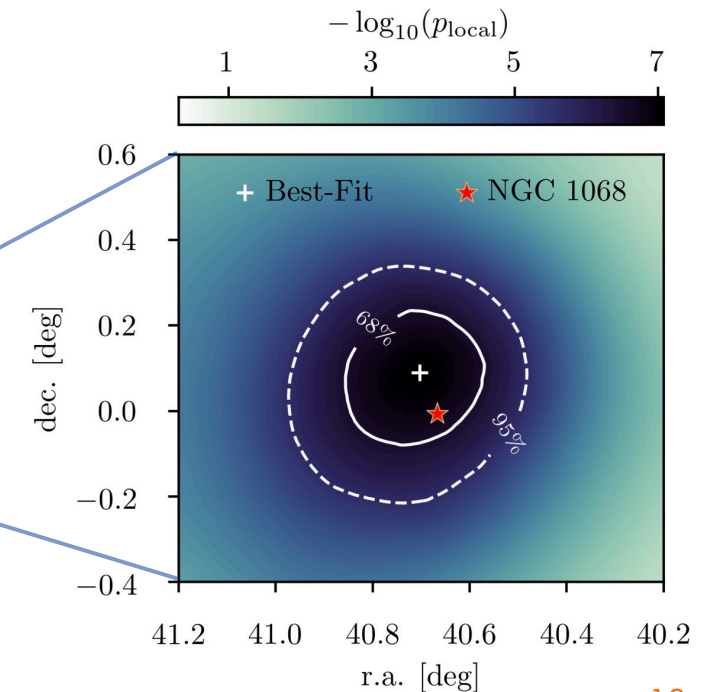
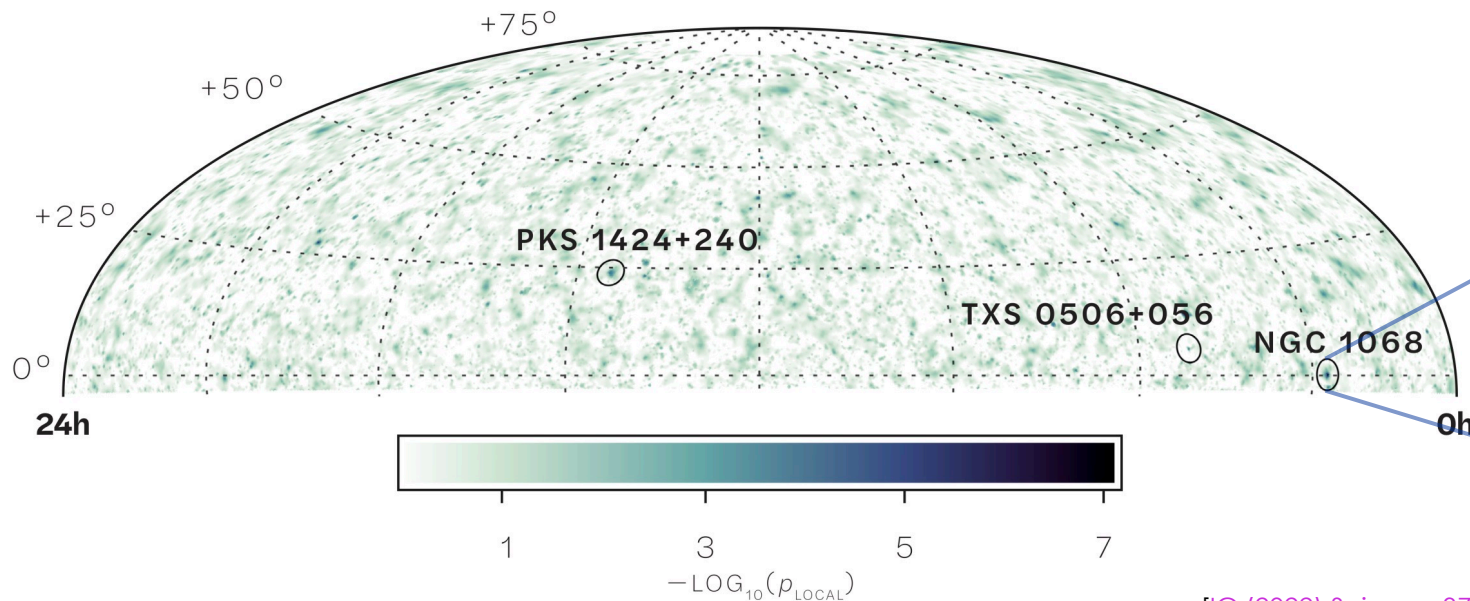


NGC 1068: First Steady Source (1/2)

- ▶ Northern Sky scan with 10 years of data
 - ▶ **Hotspot** at location of NGC 1068: 2.0σ post-trial
- ▶ Parallel **catalog search** of 110 pre-selected sources
 - ▶ **Evidence** for 79^{+22}_{-20} neutrinos coming from NGC 1068: 4.2σ post-trial
 - ▶ Power-law spectral fit: $\gamma = 3.2 \pm 0.2$



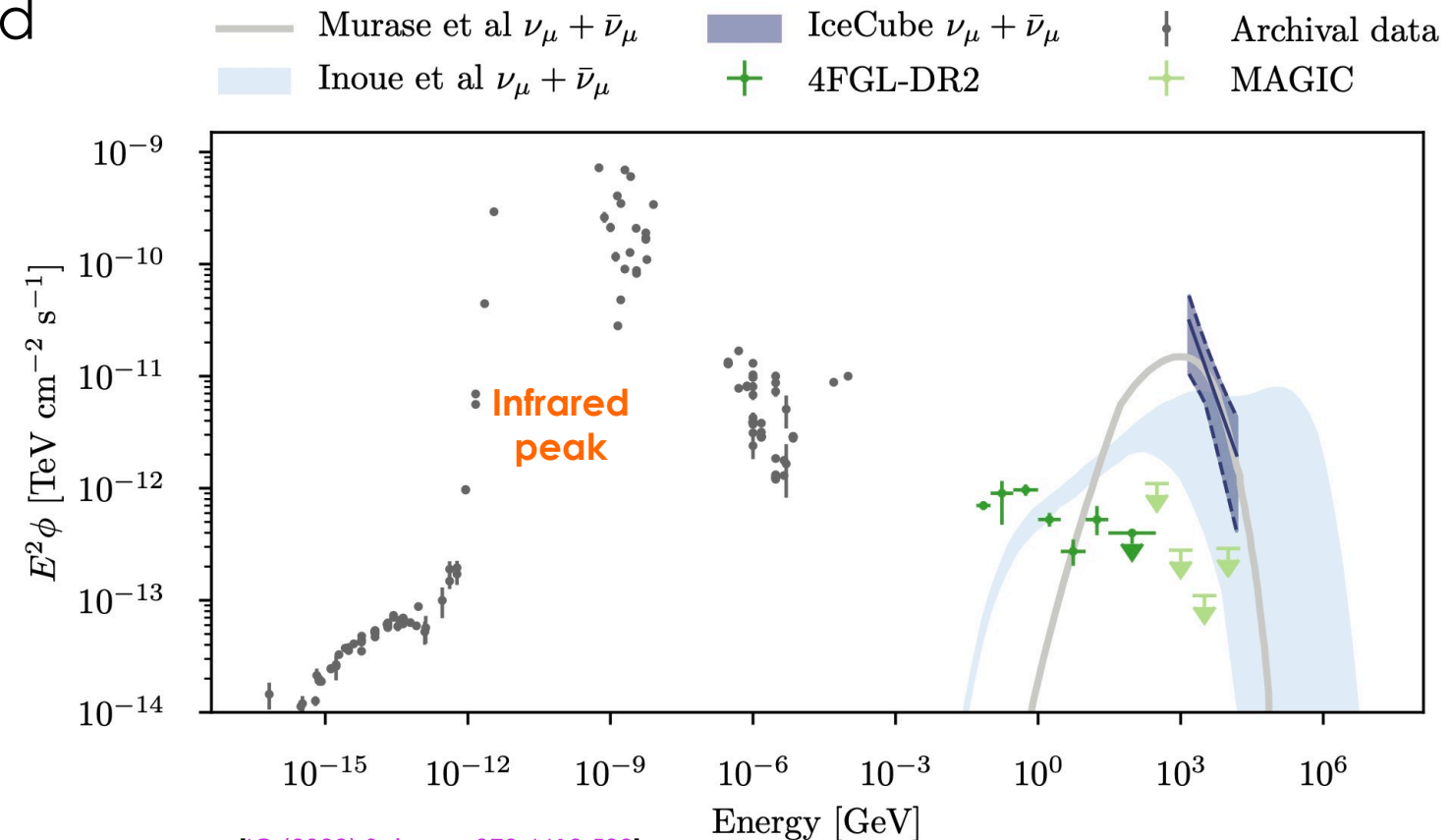
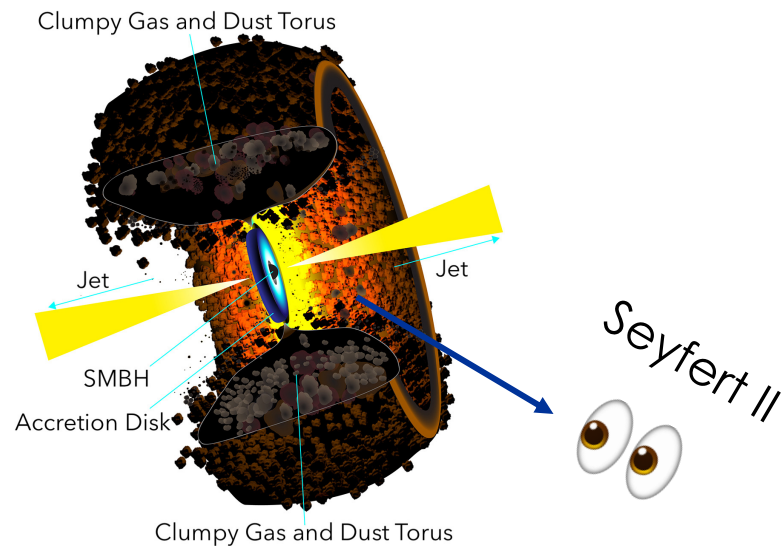
[NASA/ESA]



[IC (2022) Science 378 6619 538]

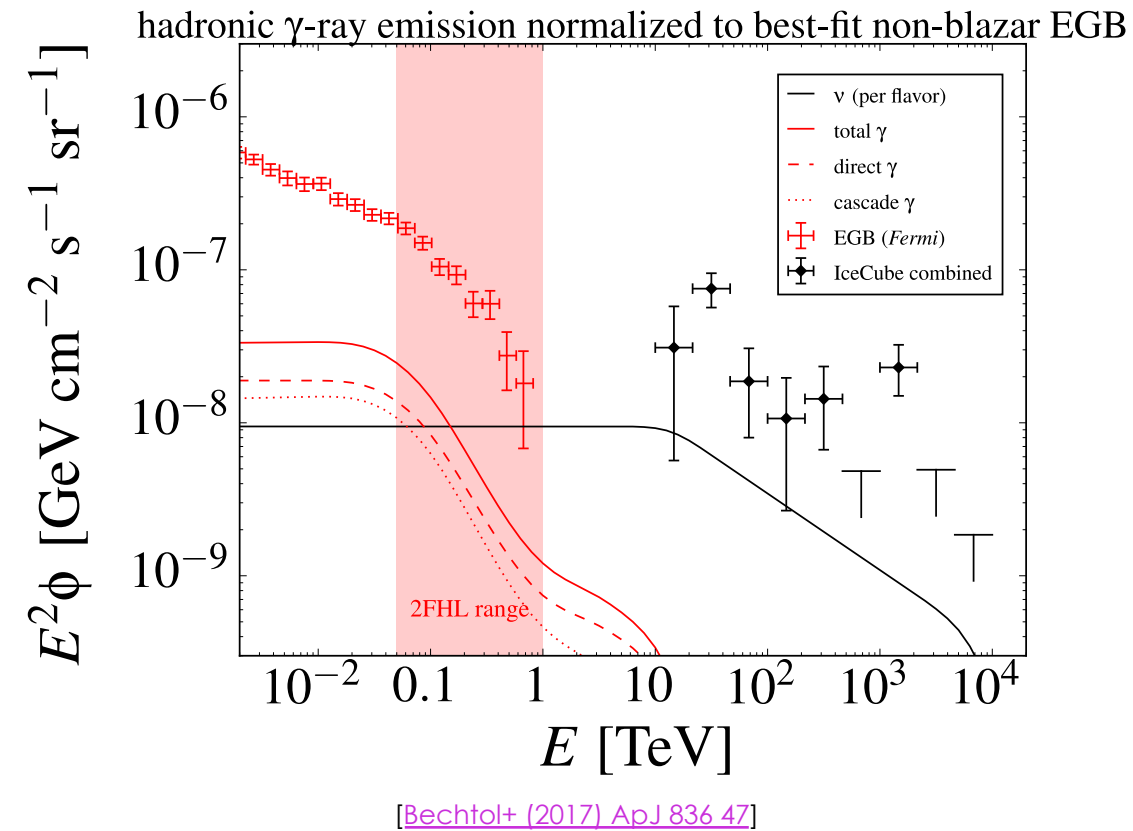
NGC 1068: First Steady Source (2/2)

- ▶ Well-known nearby Seyfert II galaxy (14.4 Mpc)
 - ▶ Coupled with strong starburst activity
- ▶ Obscured AGN models favored
 - ▶ Starburst reservoirs less favored



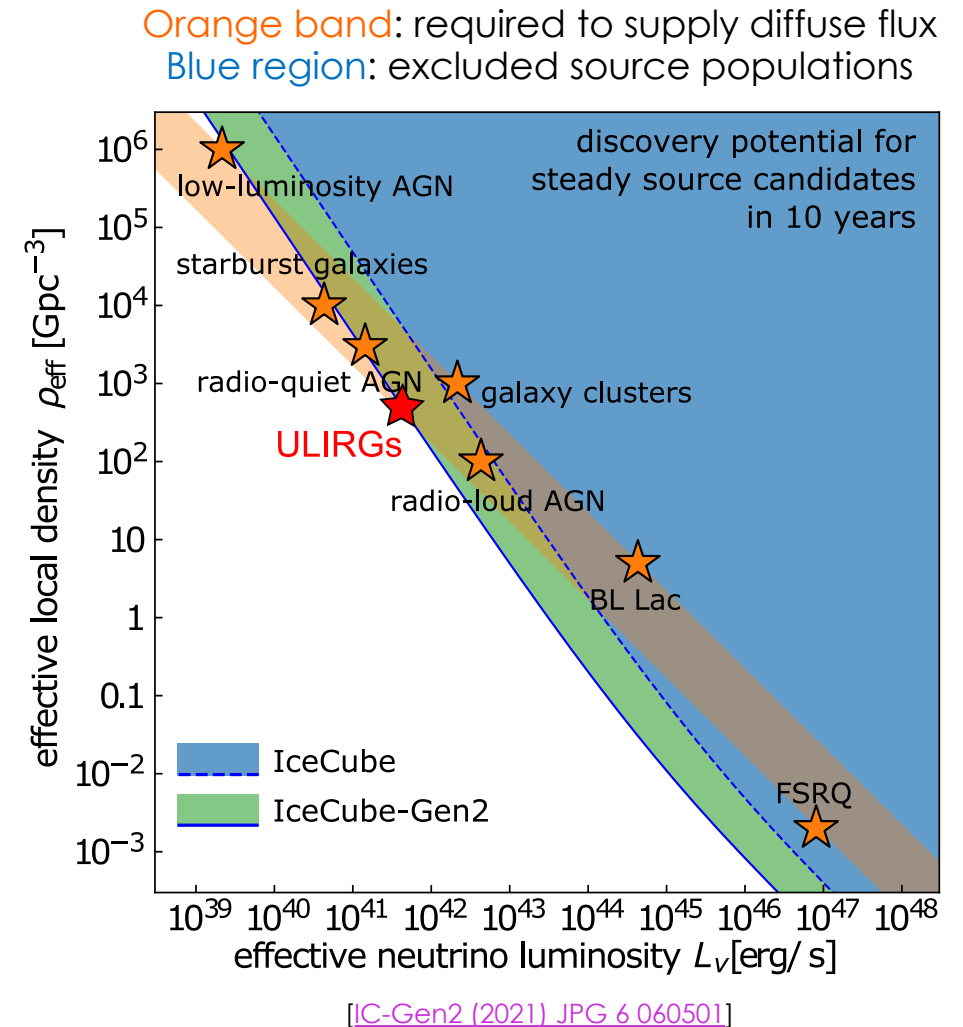
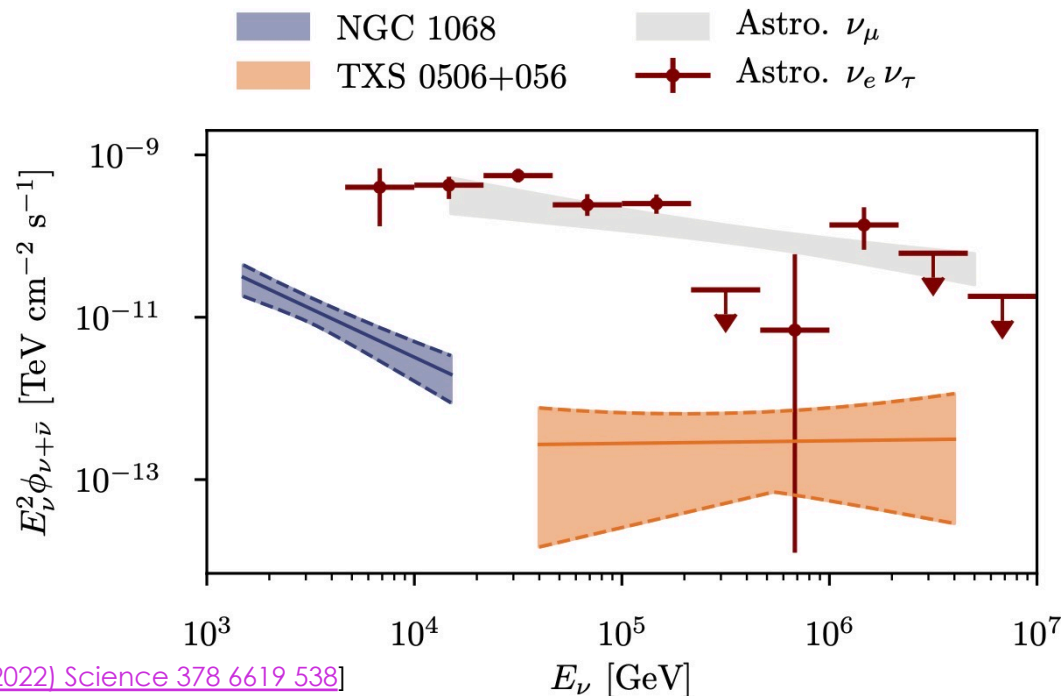
Status of Neutrino Astronomy (1/2)

- ▶ **Fermi-LAT**: 86% of EGB from blazars
- ▶ **IceCube**: blazar contribution constrained
- ▶ Neutrino sources cannot exceed non-blazar EGB
- ▶ Points towards **gamma-ray opaque** neutrino sources [\[Murase+ \(2016\) PRL 116 071101\]](#)



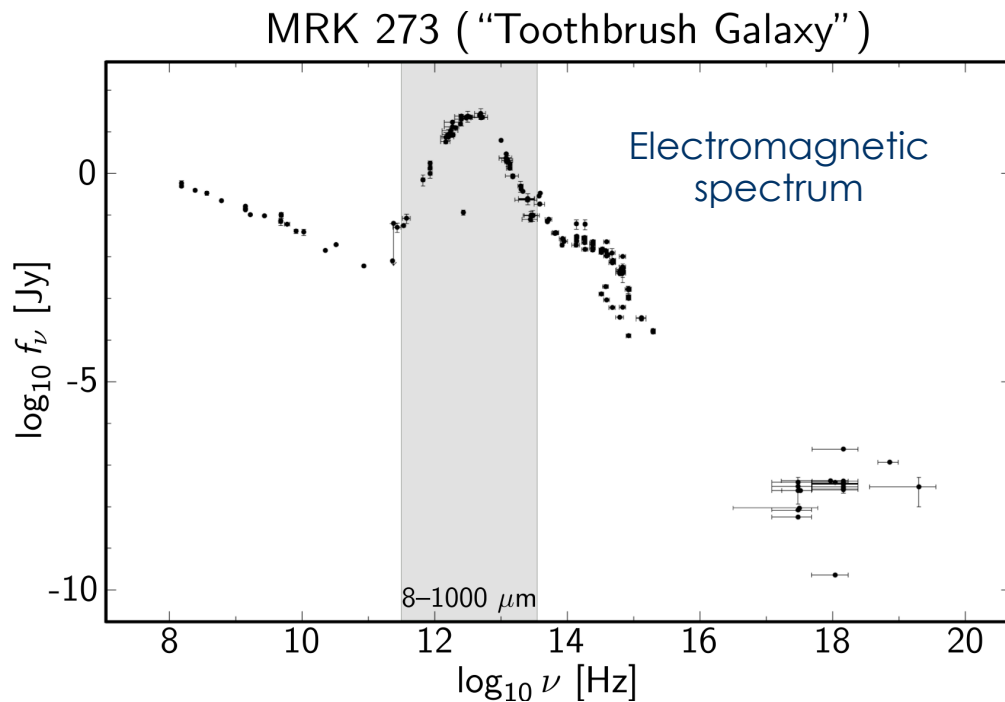
Status of Neutrino Astronomy (2/2)

- Sources of diffuse flux largely **unidentified**
 - At least **two** source types!
- **Constraints** after 10 years of IceCube data
 - Favor **numerous** populations of **dim** sources



Ultra-Luminous Infrared Galaxies

- ▶ The **most luminous** objects in the IR sky
 - ▶ Even more than NGC 1068!
 - ▶ $L_{IR} \geq 10^{12} L_{\odot}$ between 8–1000 micron
- ▶ Rich in obscuring gas and dust
- ▶ Mergers of spiral galaxies



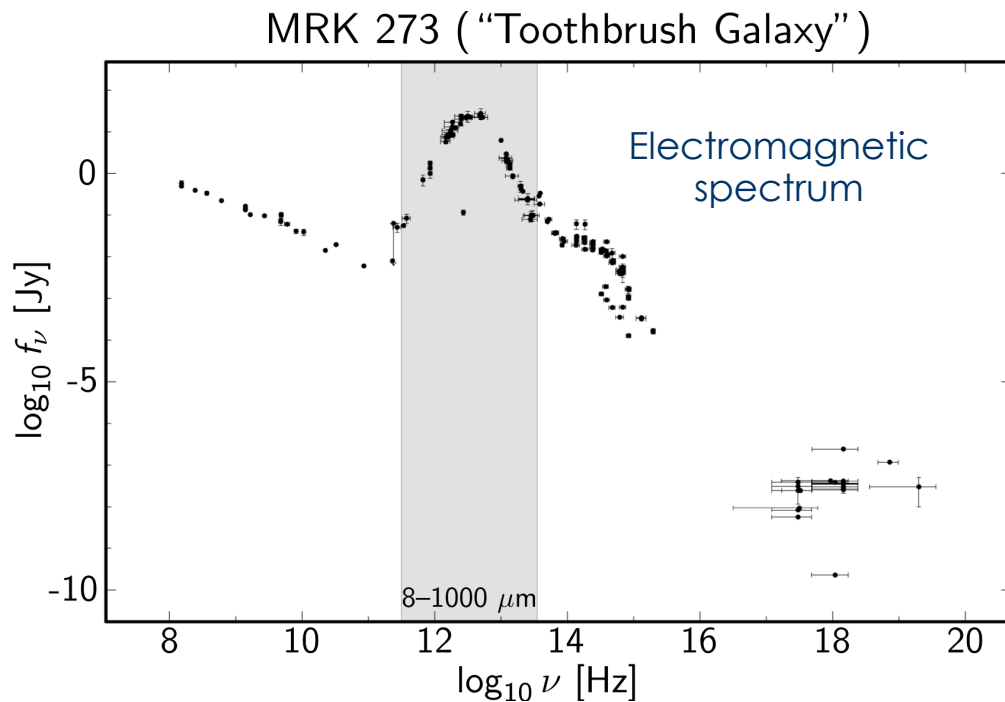
[NASA/IPAC Extragalactic Database]



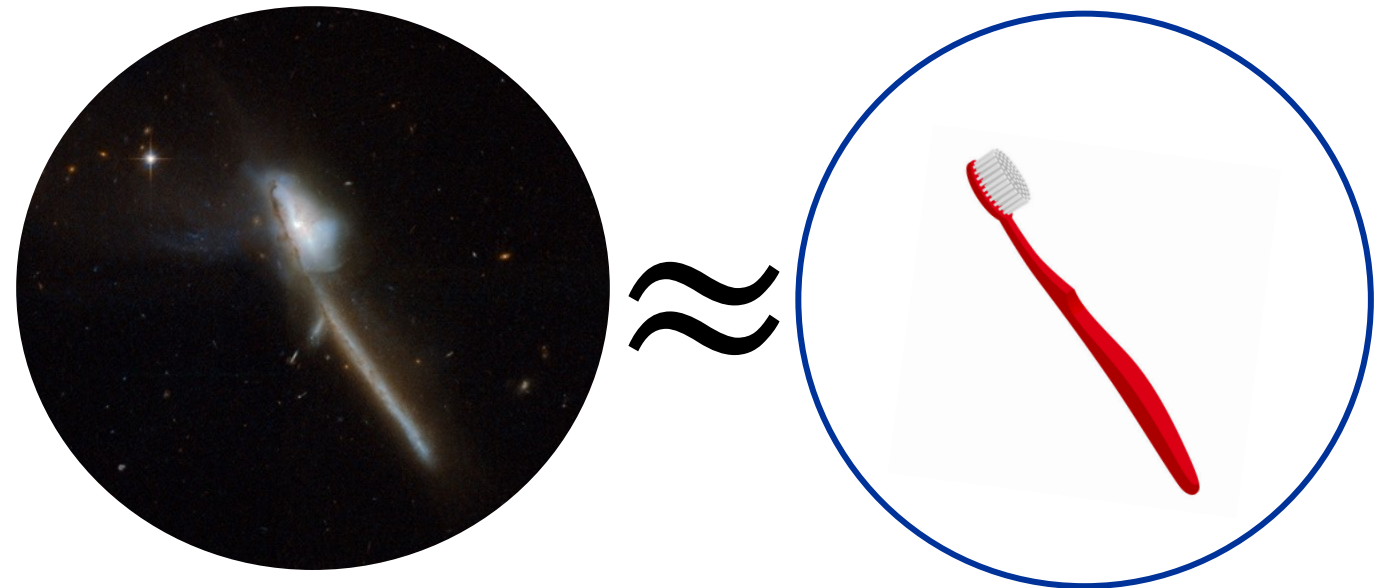
[NASA/ESA]

Ultra-Luminous Infrared Galaxies

- ▶ The **most luminous** objects in the IR sky
 - ▶ Even more than NGC 1068!
 - ▶ $L_{IR} \geq 10^{12} L_{\odot}$ between 8–1000 micron
- ▶ Rich in obscuring gas and dust
- ▶ Mergers of spiral galaxies



[[NASA/IPAC Extragalactic Database](#)]



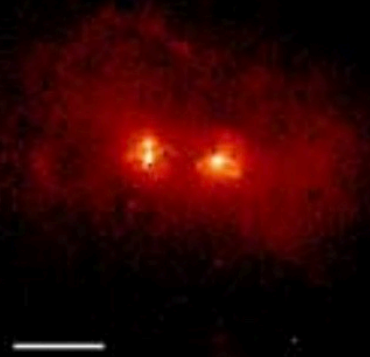
[[NASA/ESA](#)]

[not Oral-B]

IRAS 12112+0305



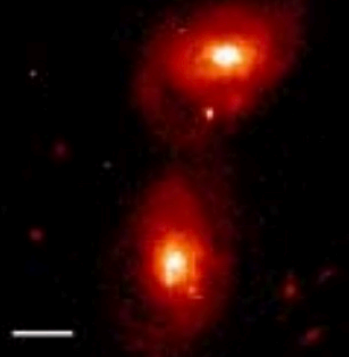
Markarian 463



IRAS 11087+5351



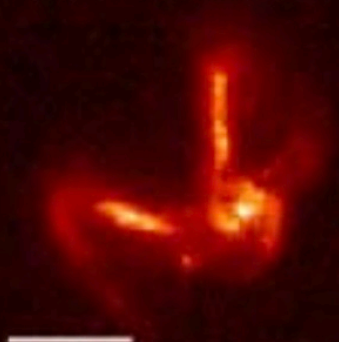
IRAS 15156+0435



IRAS 13342+3932



IRAS 16007+3743



IRAS 06268+3509



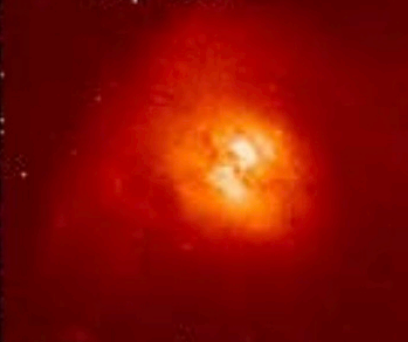
IRAS 08572+3915



Markarian 273



Arp 220



IRAS 14348-1447



Arp 299



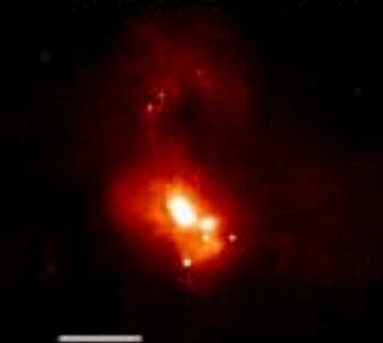
IRAS 13469+5833



IRAS 15250+3609



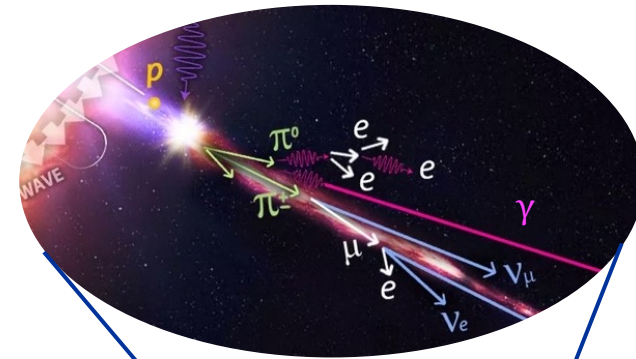
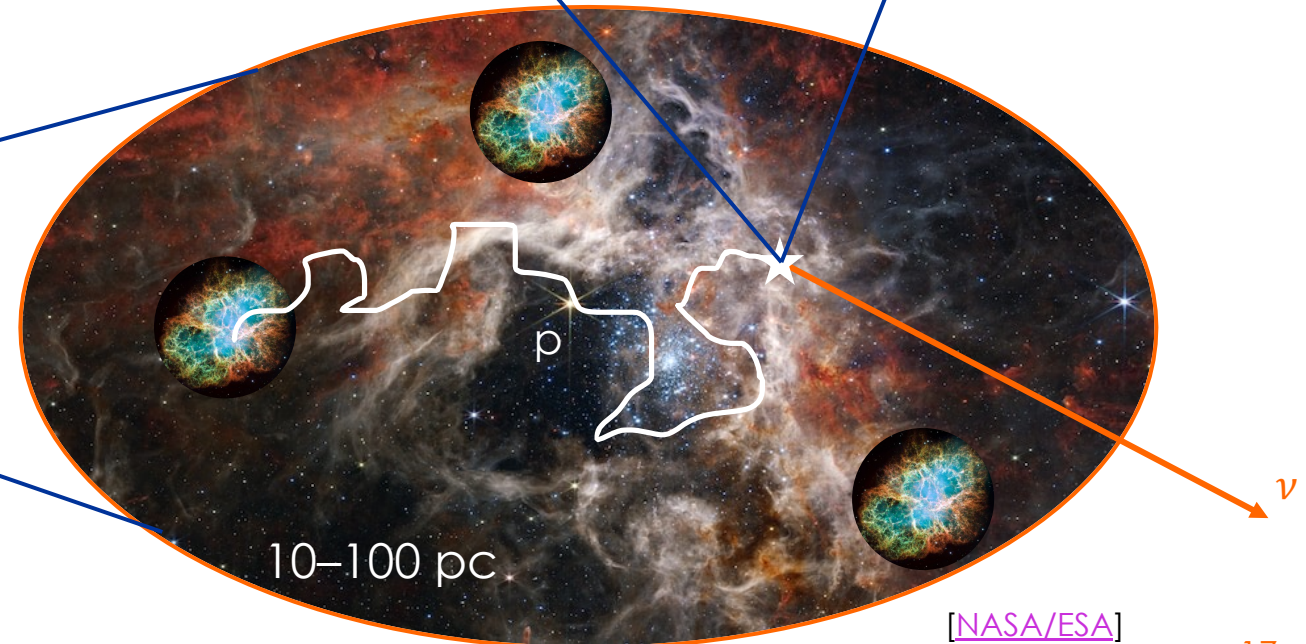
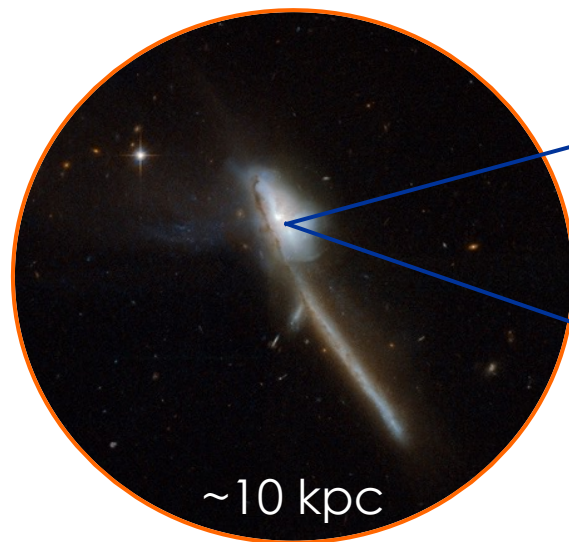
IRAS 12490-1009



Neutrino Production in ULIRGs (1/2)

- ▶ Starburst activity
 - ▶ Stellar factories: $\gtrsim 100 M_{\odot} \text{ yr}^{-1}$
 - ▶ Enhanced supernova rate
- ▶ **Cosmic-ray reservoir**
 - ▶ Cosmic rays confined
 - ▶ Interact with dust/gas (pp)

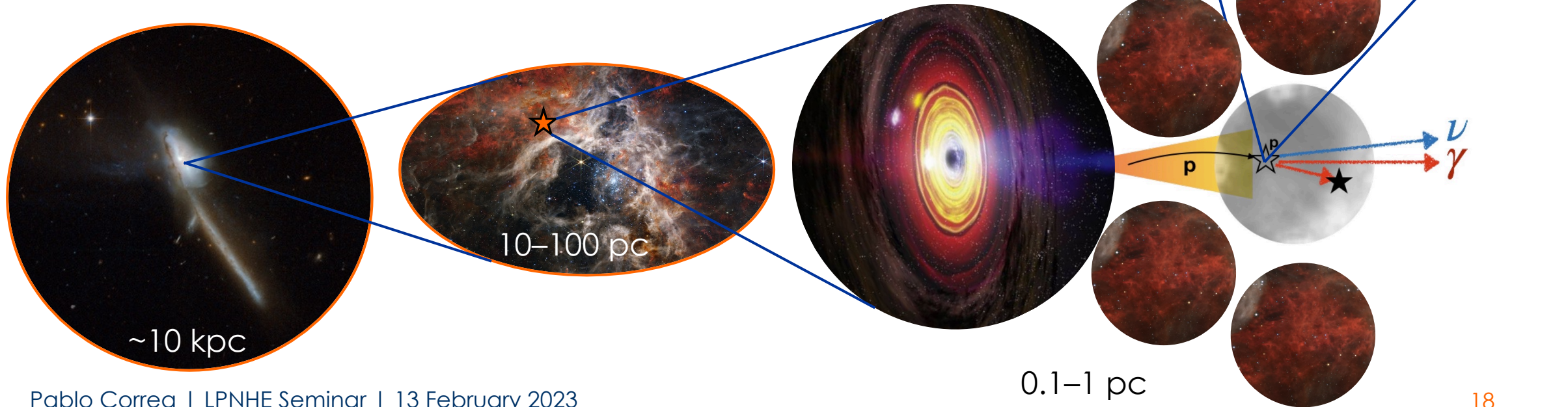
[He+ (2013) PRD 87 063011;
Palladino+ (2019) JCAP 09 004]



Neutrino Production in ULIRGs (2/2)

- ▶ Compton-thick AGN
 - ▶ Extremely obscured: $N_H \gtrsim 10^{24} \text{ cm}^{-2}$
 - ▶ Secondary IR component ($\sim 10\%$)
- ▶ **AGN beam dump**
 - ▶ Cosmic rays shot at dense target
 - ▶ Interact with dust/gas (pp)

[Vereecken+ (2020) arXiv:2004.03435]



ULIRG Analysis Motivation

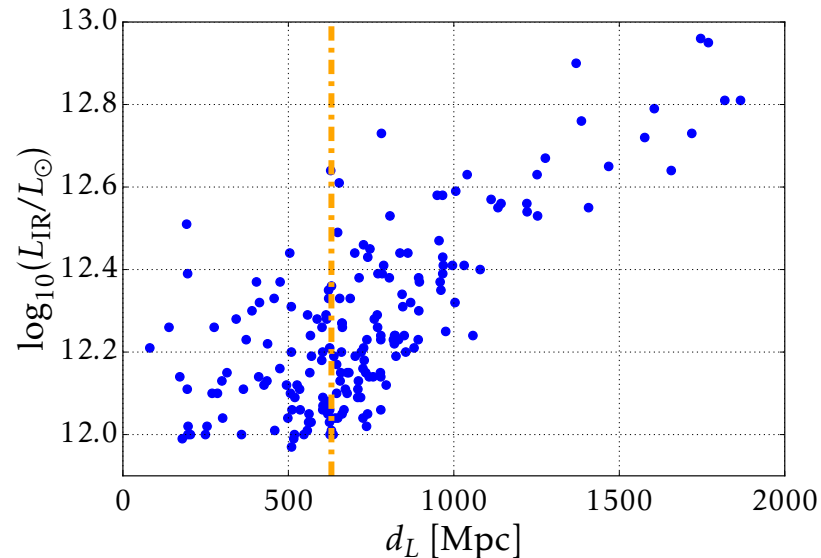
ULIRGs are most extreme
infrared sources

ULIRGs are promising neutrino
source candidates

Perform **first ever search** for high-energy
neutrinos from ULIRGs with IceCube

Selection of ULIRGs

- ▶ Start from three **IRAS** catalogs
- ▶ Determine redshift up to which:
 - ▶ All ULIRGs with $L_{IR} = 10^{12} L_{\odot}$ are observed
 - ▶ Given an IRAS sensitivity $f_{60} = 1 \text{ Jy}$
- ▶ **Final sample**: 75 ULIRGs within $z \leq 0.13$
 - ▶ Representative of local ULIRG population



Infrared Astronomical Satellite

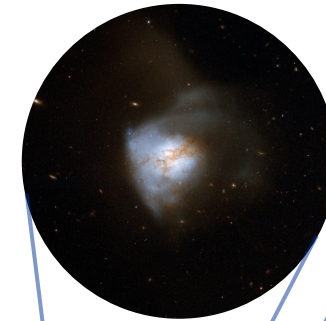


Jan-Nov 1983
12, 25, **60**, 100 micron

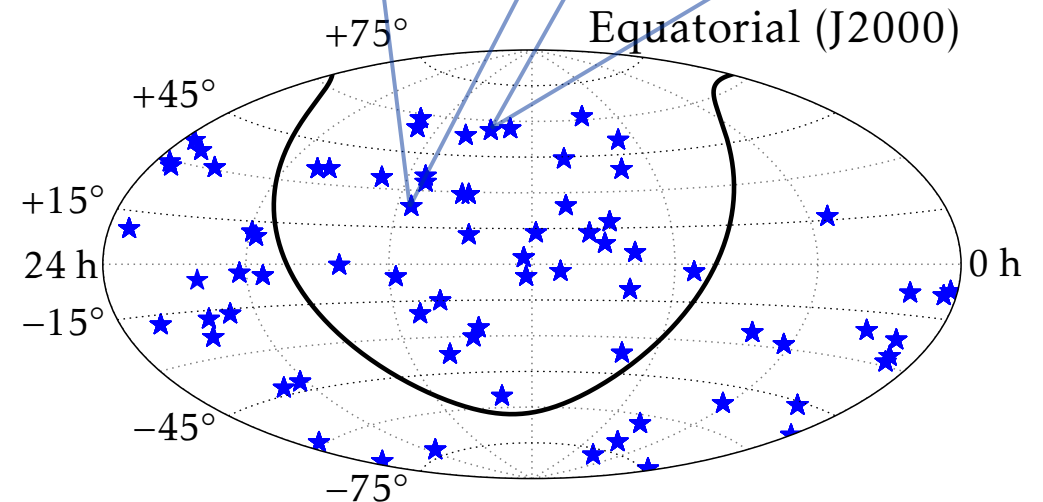
[Neugebauer+ (1984) ApJ 278 L1]



Arp 220

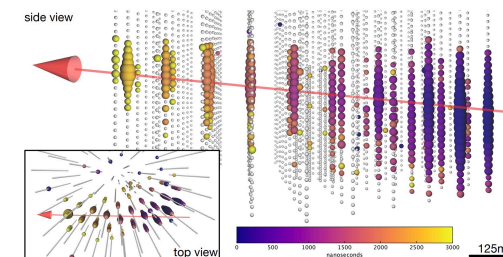
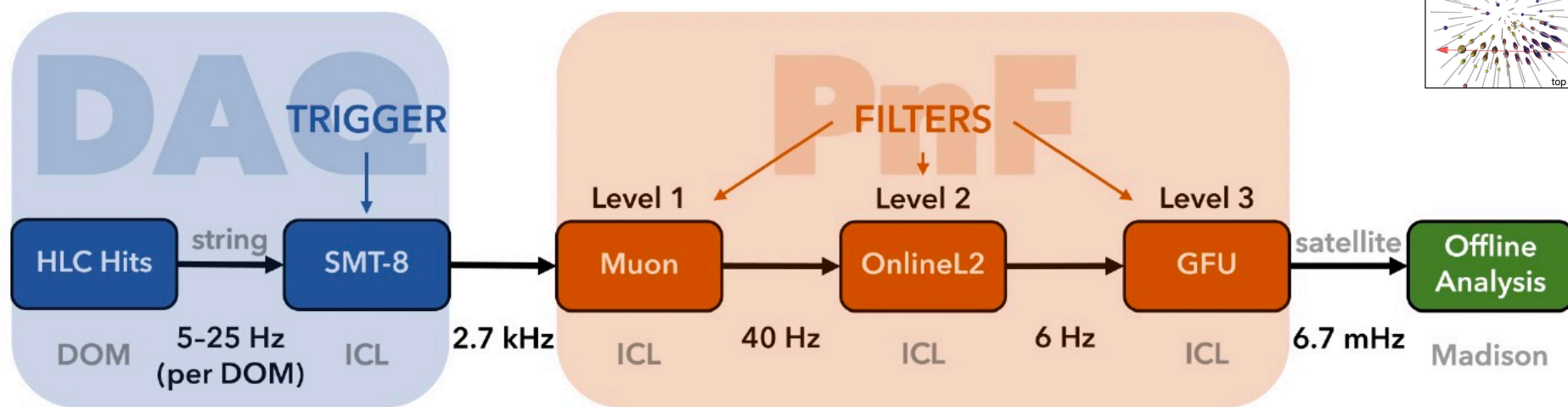
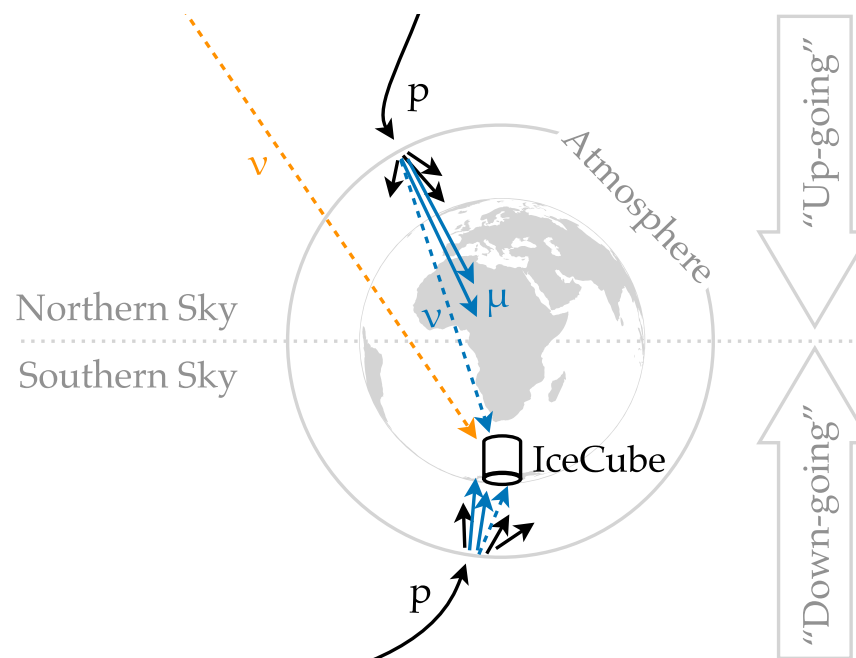


Mrk 273



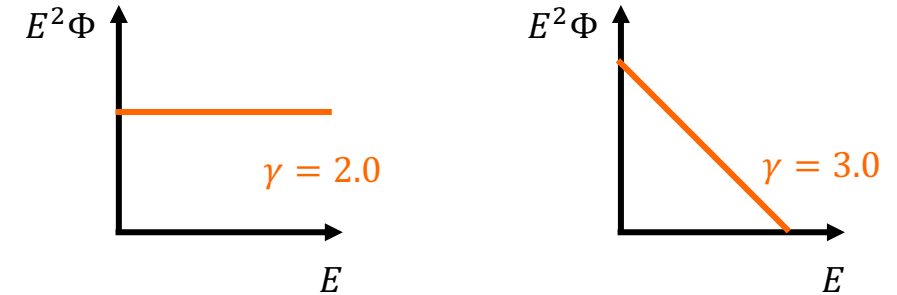
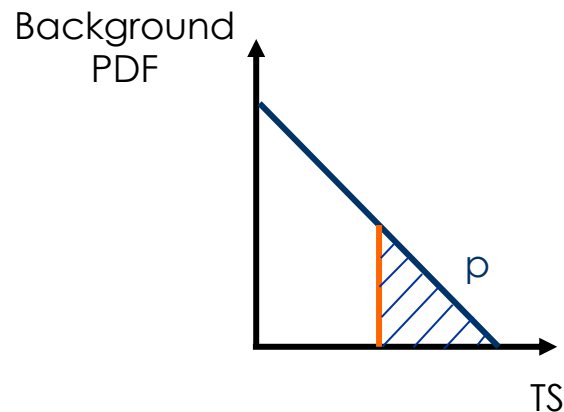
IceCube Dataset

- ▶ **GFU sample** [[IC \(2017\) Astropart. Phys. 92 30](#)]
 - ▶ Well-reconstructed **tracks**
 - ▶ 7.2 years of data
 - ▶ 6.7 mHz all-sky rate
 - ▶ 1.5 million events (mostly background)



Analysis Method

- ▶ Maximum **likelihood** method
 - ▶ Fit for number of ULIRGs neutrinos, n_s
 - ▶ Fit for power-law spectral index, γ
- ▶ **Hypothesis test** (one-tailed)
 - ▶ $\mathcal{H}_0$: data only atmospheric background
 - ▶ $\mathcal{H}_s$: data contains signal from ULIRG locations
 - ▶ Larger TS $\longrightarrow$ smaller p-value



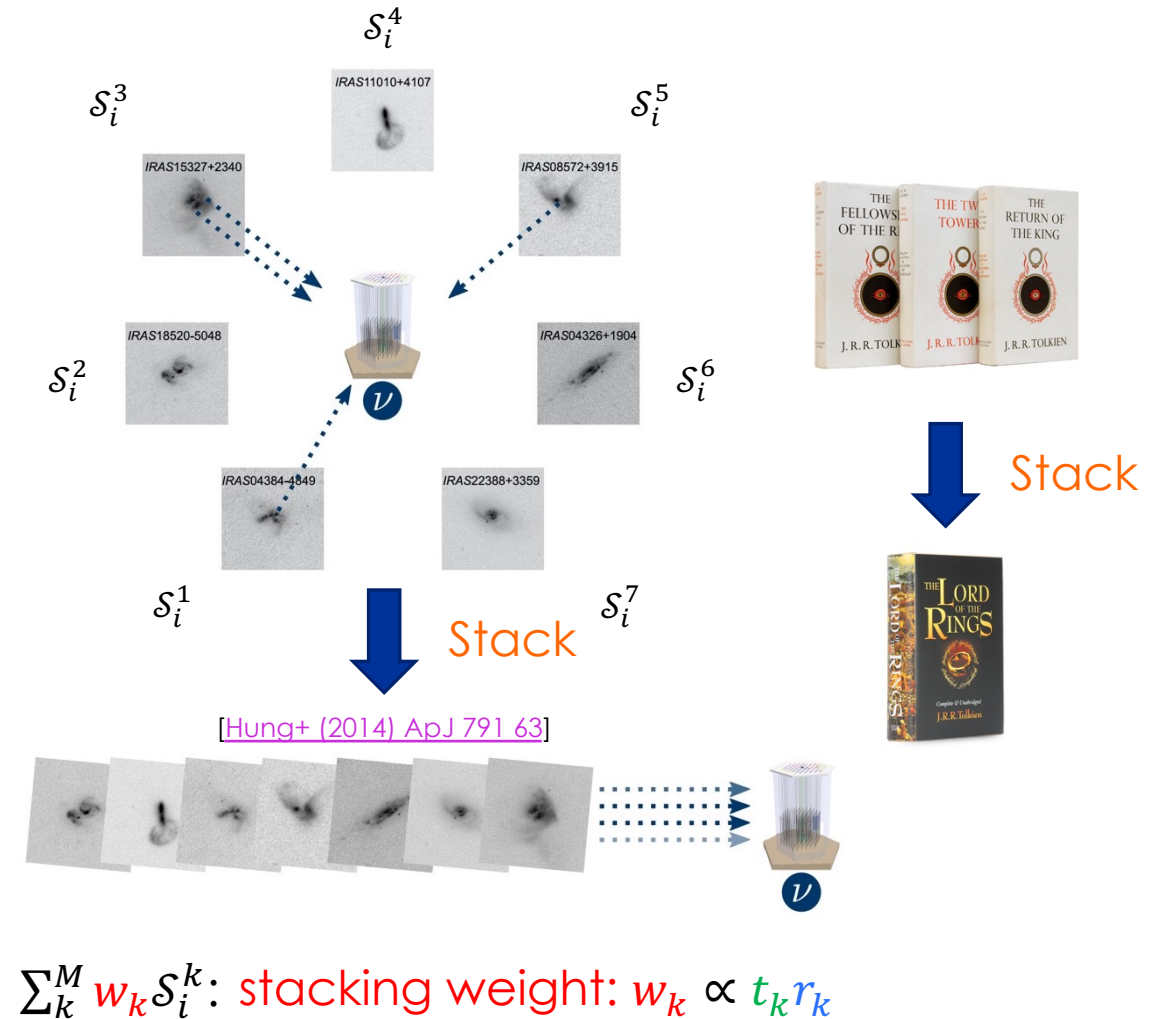
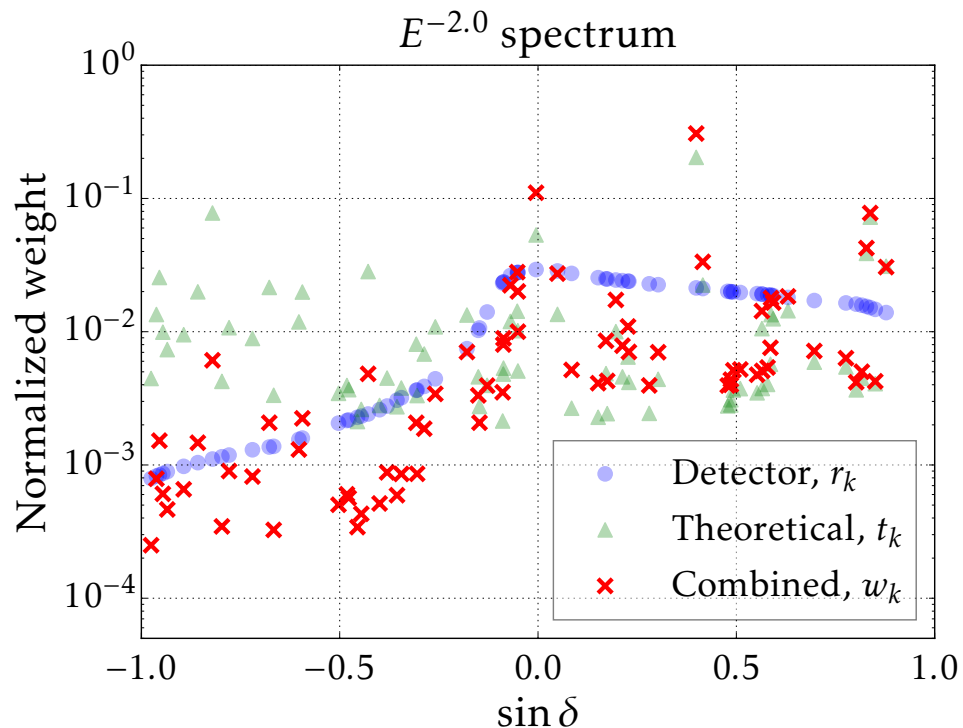
$$\mathcal{L}(n_s, \gamma) = \prod_i^N \left[\frac{n_s}{N} \sum_k^M w_k s_i^k(\gamma) + \left(1 - \frac{n_s}{N}\right) \mathcal{B}_i \right]$$

$$TS = 2 \log \left(\frac{\mathcal{L}(n_s = \hat{n}_s, \gamma = \hat{\gamma})}{\mathcal{L}(n_s = 0)} \right)$$

$\mathcal{H}_s$ (top) and $\mathcal{H}_0$ (bottom)

Stacking Technique

- **Stack** ULIRGs to enhance sensitivity
- **Theoretical weight** t_k : total IR flux (8–1000 micron)
- **Detector weight** r_k : detector response



Sensitivity & Discovery Potentials

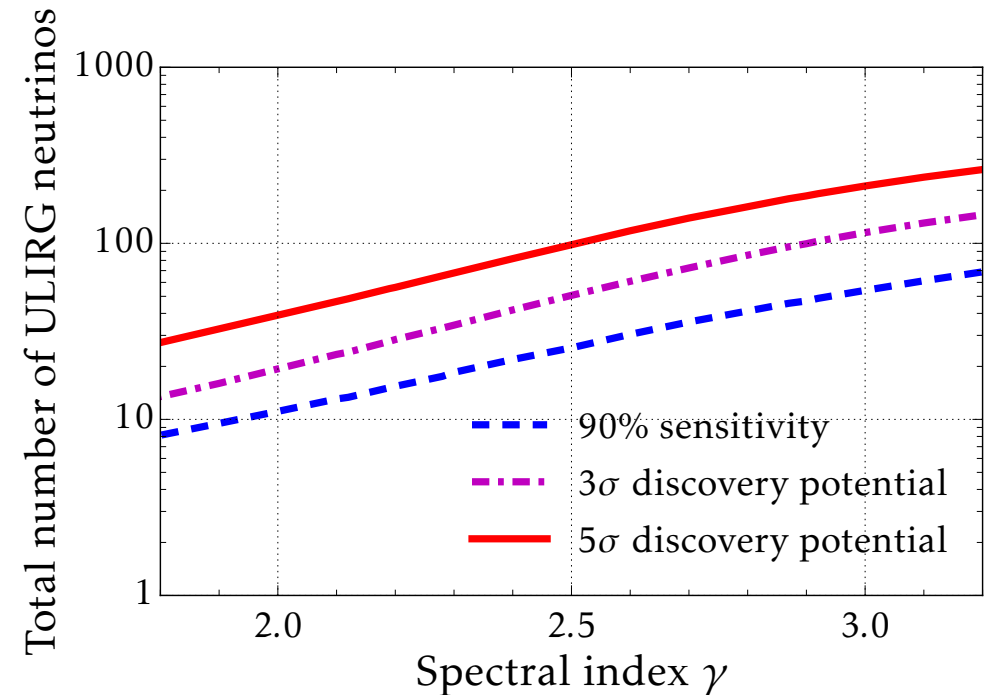
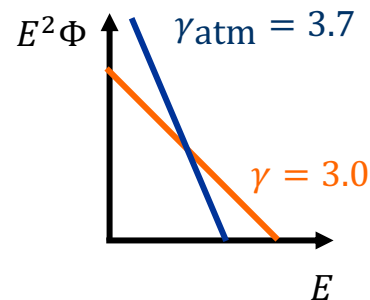
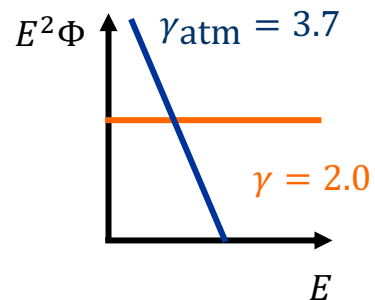
- ▶ Test **analysis performance**

- ▶ Simulate pseudo-signal according to

$$\Phi_{\nu_\mu + \bar{\nu}_\mu}(E_\nu) = \Phi_0 \left(\frac{E_\nu}{E_0} \right)^{-\gamma}$$

- ▶ **Sensitive** to 10–100 ULIRG neutrinos

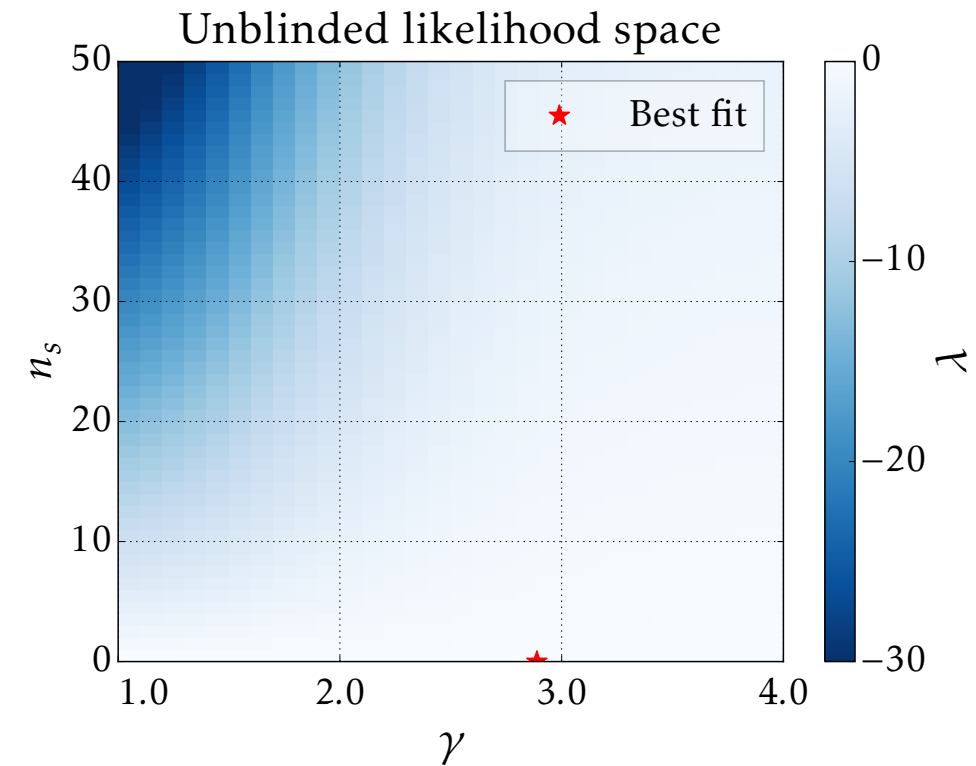
- ▶ More sensitive to harder spectra
- ▶ Easier to distinguish from $E^{-3.7}$ background



Analysis Results

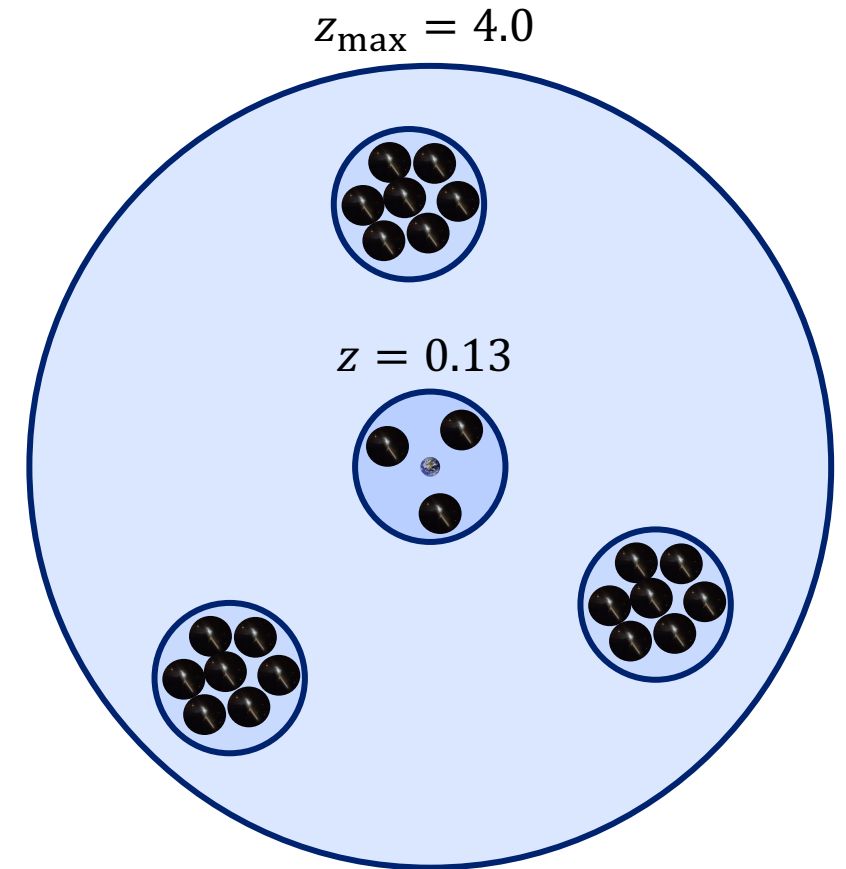
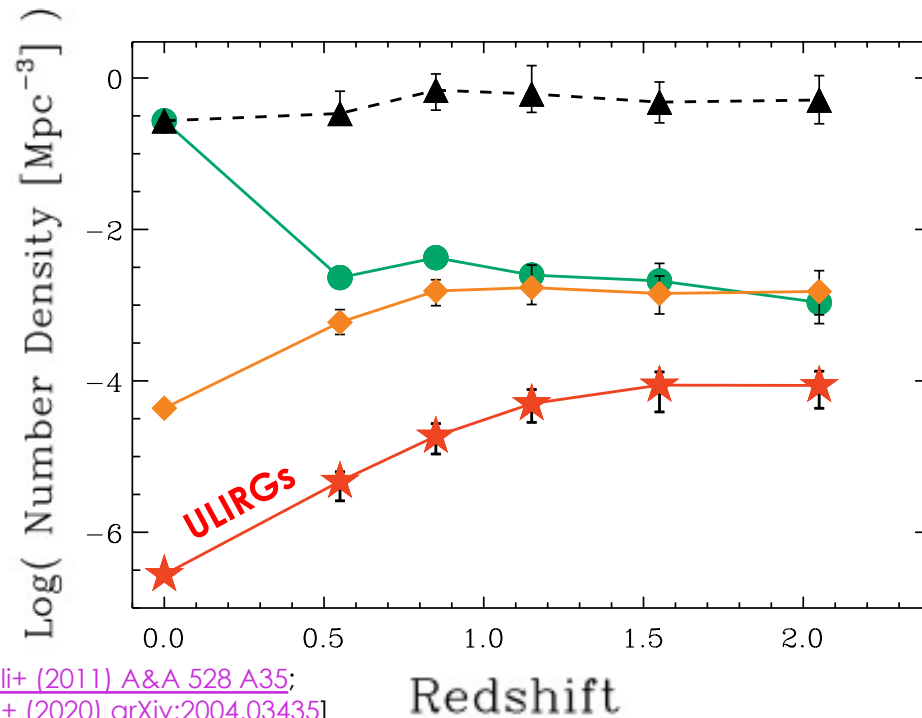
- ▶ Analysis consistent with background
- ▶ Set upper limits on flux from 75 ULIRGs ($z \leq 0.13$)
 - ▶ Limits equal to sensitivity (90% CL)
- ▶ Total systematic uncertainty $\sim 15\%$
 - ▶ DOM efficiency, ice properties, muon propagation

Analysis yields
 $TS = 0$
 $p\text{-value} = 1.0$



Extrapolating to Diffuse Limits

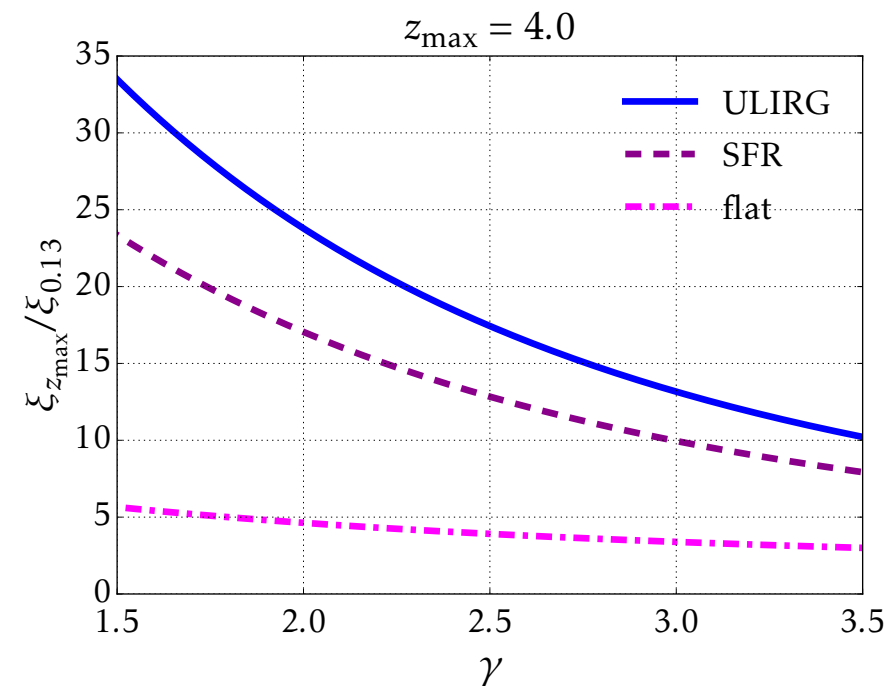
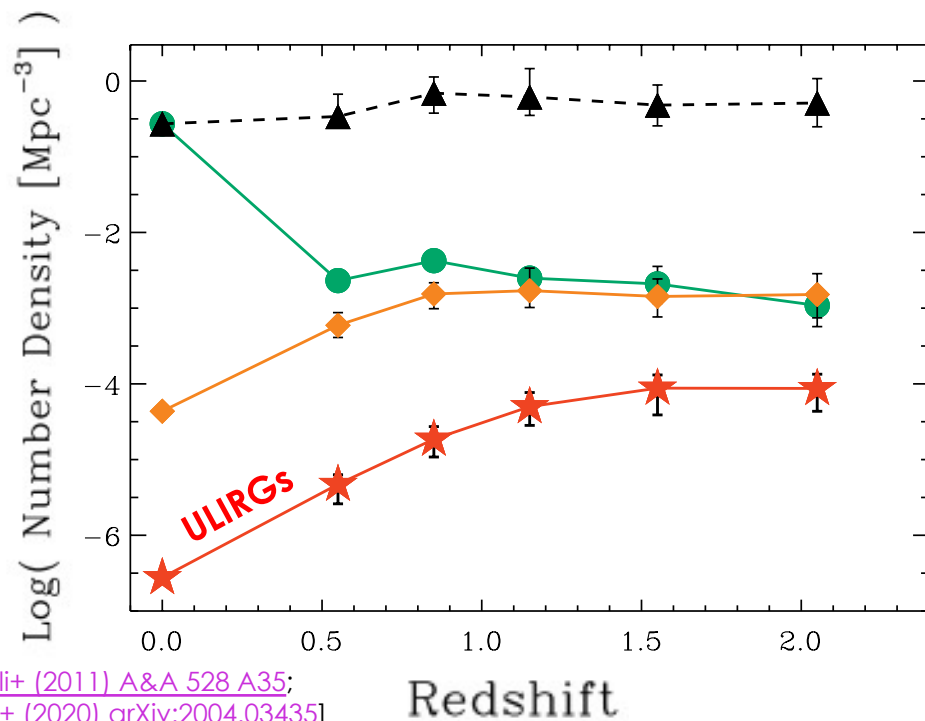
- ▶ Set **limits on diffuse flux** of full ULIRG population
 - ▶ Integrate contribution of ULIRGs up to $z_{\max}$
 - ▶ Assume $L_{IR} \propto L_V = \text{constant}$ and same $E^{-\gamma}$ spectrum



Extrapolating to Diffuse Limits

- ▶ Set **limits on diffuse flux** of full ULIRG population
 - ▶ Integrate contribution of ULIRGs up to $z_{\max}$
 - ▶ Assume $L_{IR} \propto L_{\nu} = \text{constant}$ and same $E^{-\gamma}$ spectrum

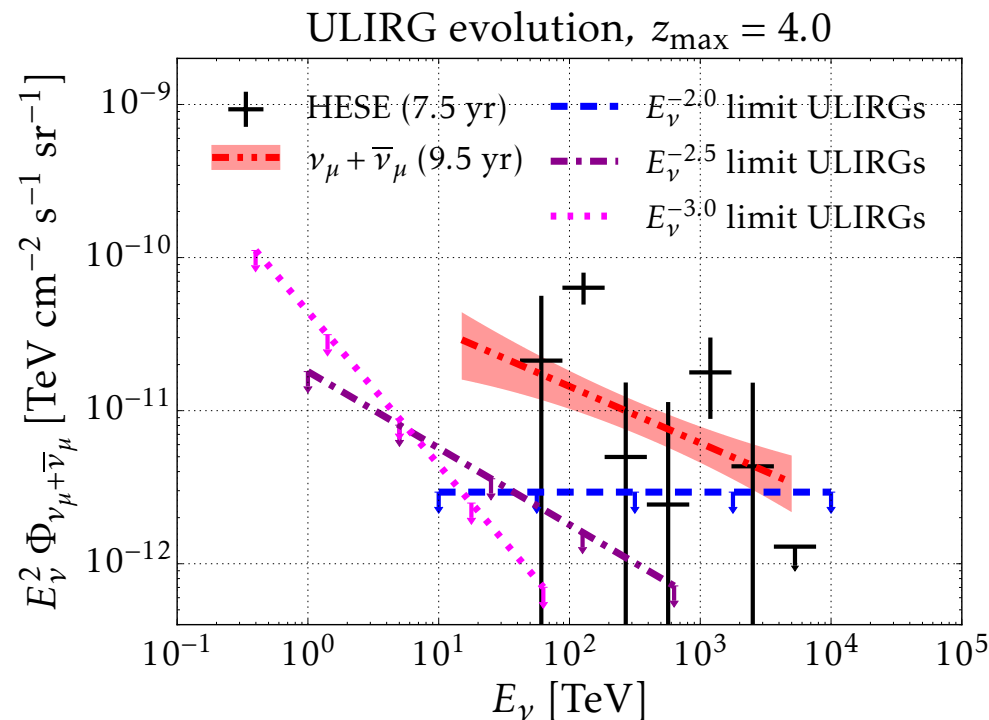
$$\Phi_{\nu_{\mu} + \bar{\nu}_{\mu}}^{z \leq z_{\max}} = \frac{\xi_{z=z_{\max}}}{\xi_{z=0.13}} (\gamma) \Phi_{\nu_{\mu} + \bar{\nu}_{\mu}}^{z \leq 0.13}$$



Limits on ULIRG Population

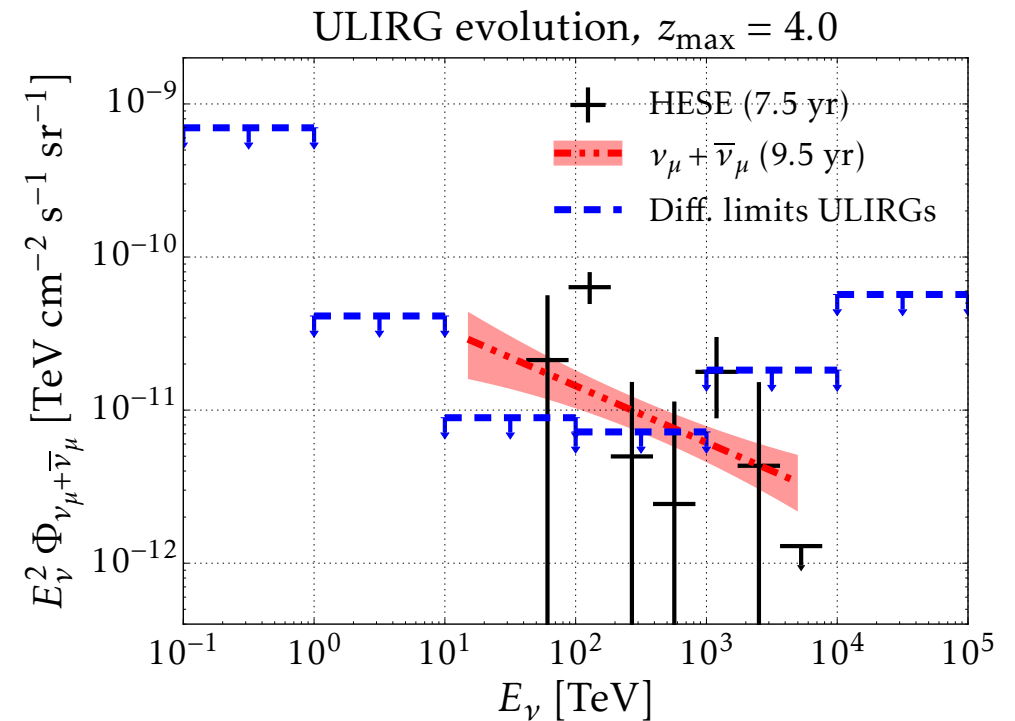
► Integral limits

- Contribution to diffuse observations **constrained** for $E^{-2.0}$ and $E^{-2.5}$ spectra



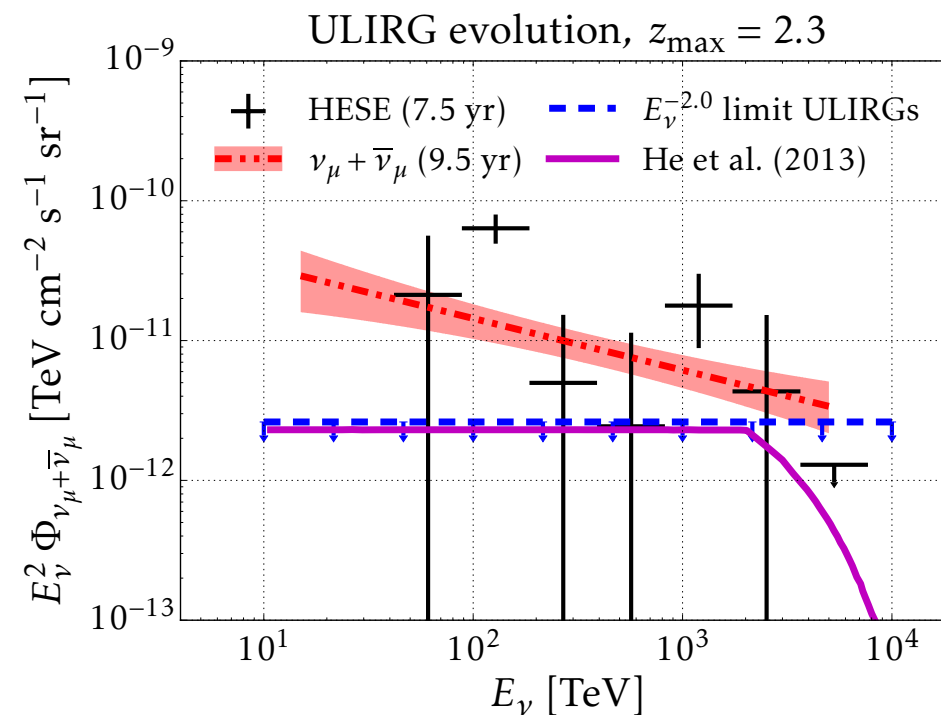
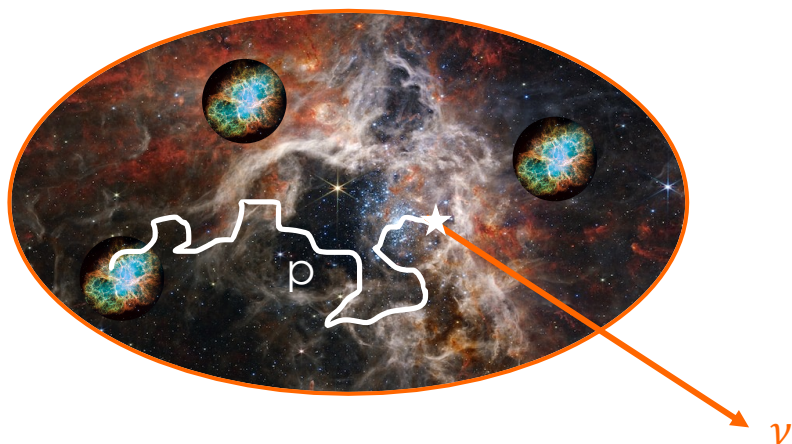
► Differential limits

- Contribution to diffuse observations **constrained** for 10– 100 TeV and 100– 1000 TeV



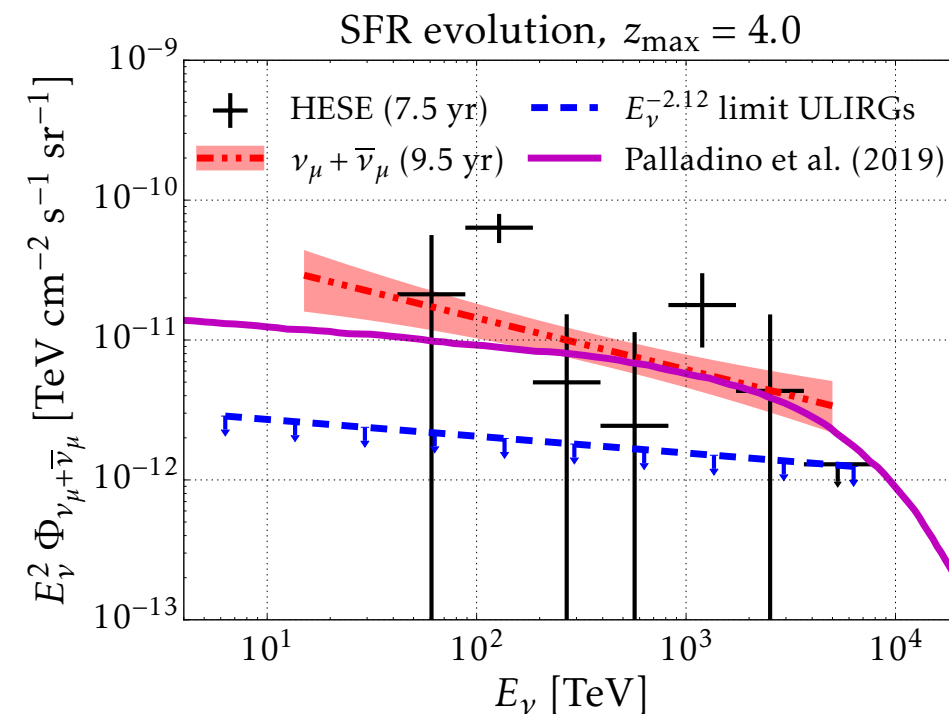
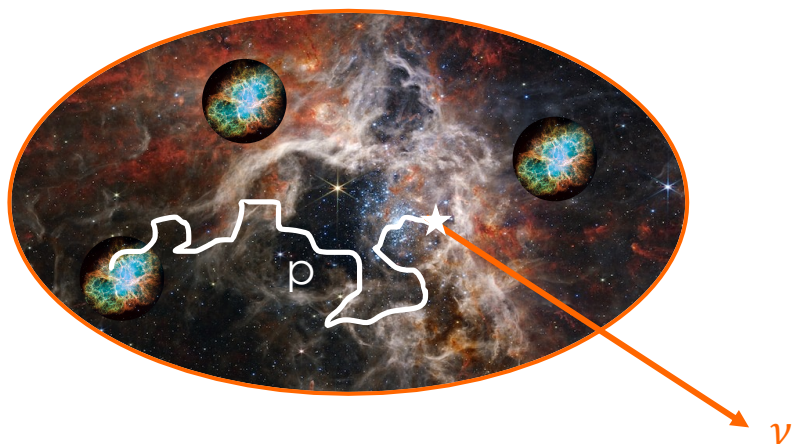
Comparison with Reservoir Model I

- ▶ [He+ \(2013\) PRD 87 063011](#)
 - ▶ Neutrino flux powered by hypernovae
 - ▶ **At level** of our upper limit
 - ▶ More data needed to exclude/validate



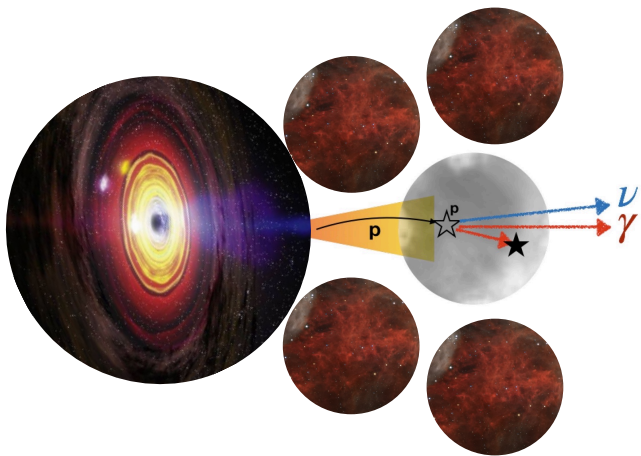
Comparison with Reservoir Model II

- ▶ [Palladino+ \(2019\) JCAP 09 004](#)
- ▶ Generic model of hadronically powered gamma-ray galaxies (HAGS)
- ▶ **ULIRGs excluded as sole HAGS** responsible for diffuse observations



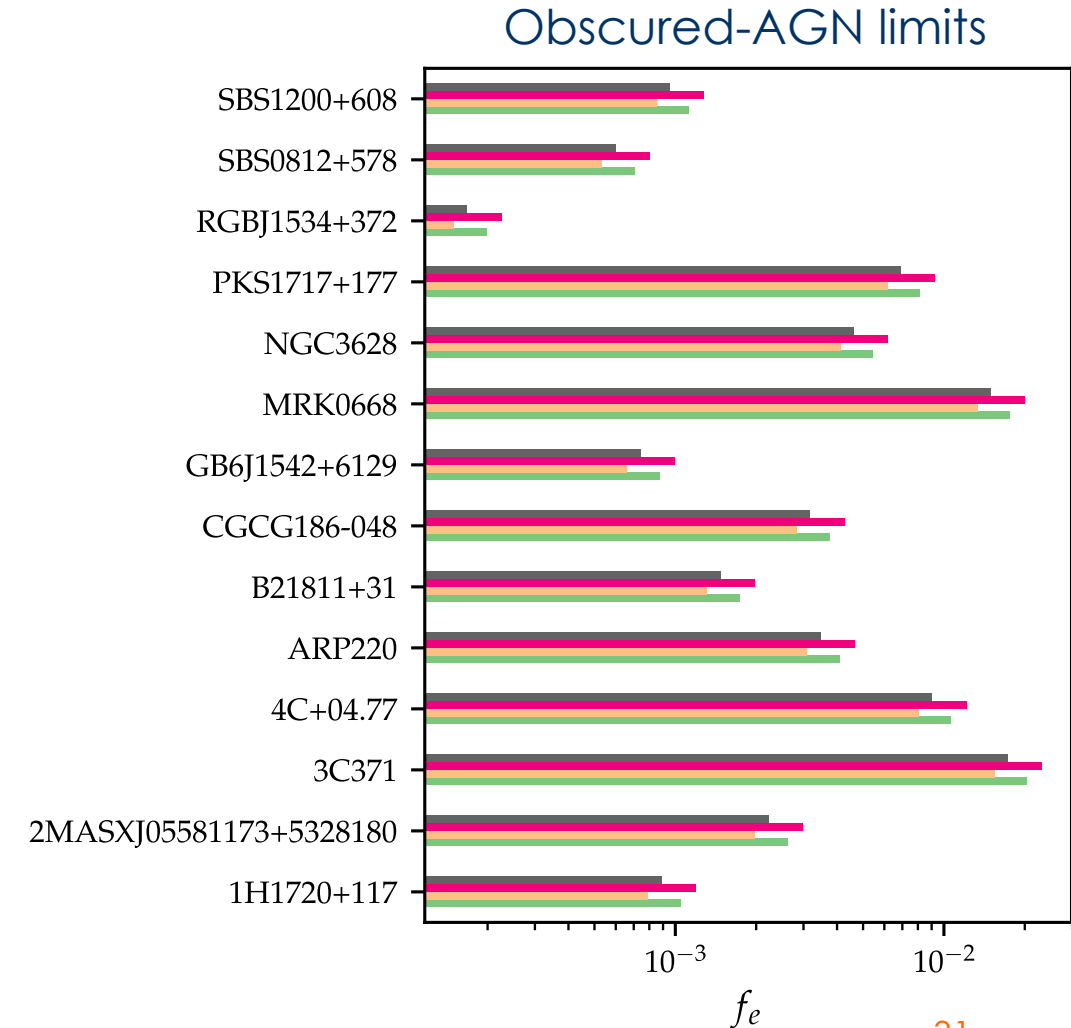
Comparison with Beam-Dump Model

- ▶ [Vereecken+ \(2020\) arXiv:2004.03435](#)
 - ▶ Compton-thick AGN beam dump
- ▶ Set **lower limit** on parameter $f_e = L_e/L_p$
 - ▶ Fit model to $E^{-2.0}$ ULIRG limit
 - ▶ Order of magnitude estimation
 - ▶ **Consistent with previous limits** on obscured AGN
[PoS ICRC2017 1000]



$$f_e \gtrsim 10^{-3}$$

Limit from our ULIRG analysis



Conclusions & Outlook

Summary

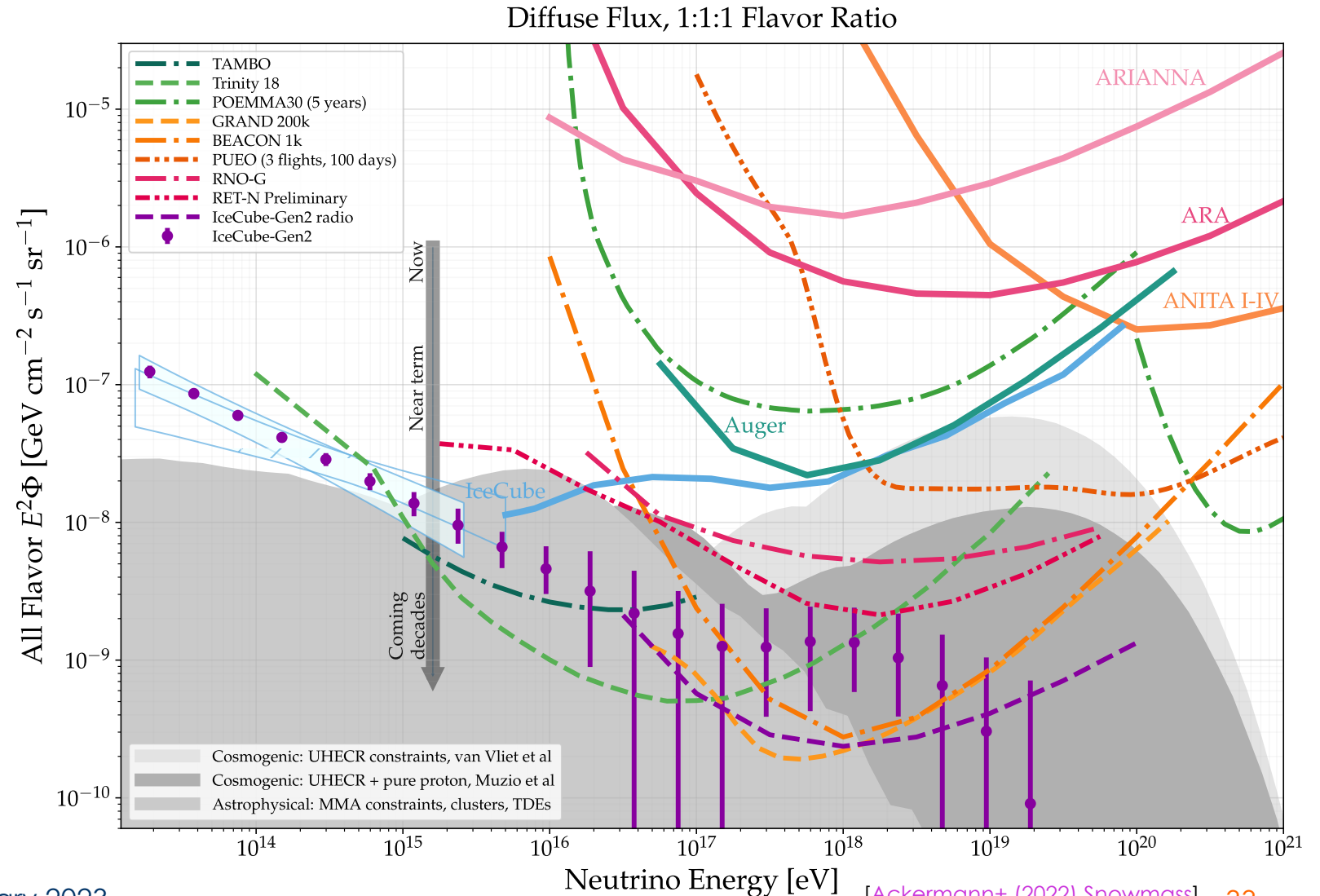
- ▶ **Exciting times** for neutrino astronomy!
 - ▶ First neutrino sources unveiled
 - ▶ MANY more to be discovered!
- ▶ Searched for **ULIRG** neutrinos
 - ▶ Upper limits on ULIRG source class
 - ▶ Constrained model predictions
 - ▶ **Paper** published [[IC \(2022\) ApJ 926 59](#)]

Outlook

- ▶ **LIRGs**
 - ▶ 10x less luminous but 100x more numerous
 - ▶ NGC 1068 is a LIRG!
 - ▶ IceCube analysis planned [[Merckx \(2021\) MSc thesis](#)]
- ▶ **Compton-thick AGN**
 - ▶ IceCube analysis underway [[PoS ICRC2021 1142](#)]
- ▶ Focus on **X-ray sources** of neutrinos

The Future of Neutrino Astronomy

- Towards ultra-high energies!
- **GRAND@LPNHE**



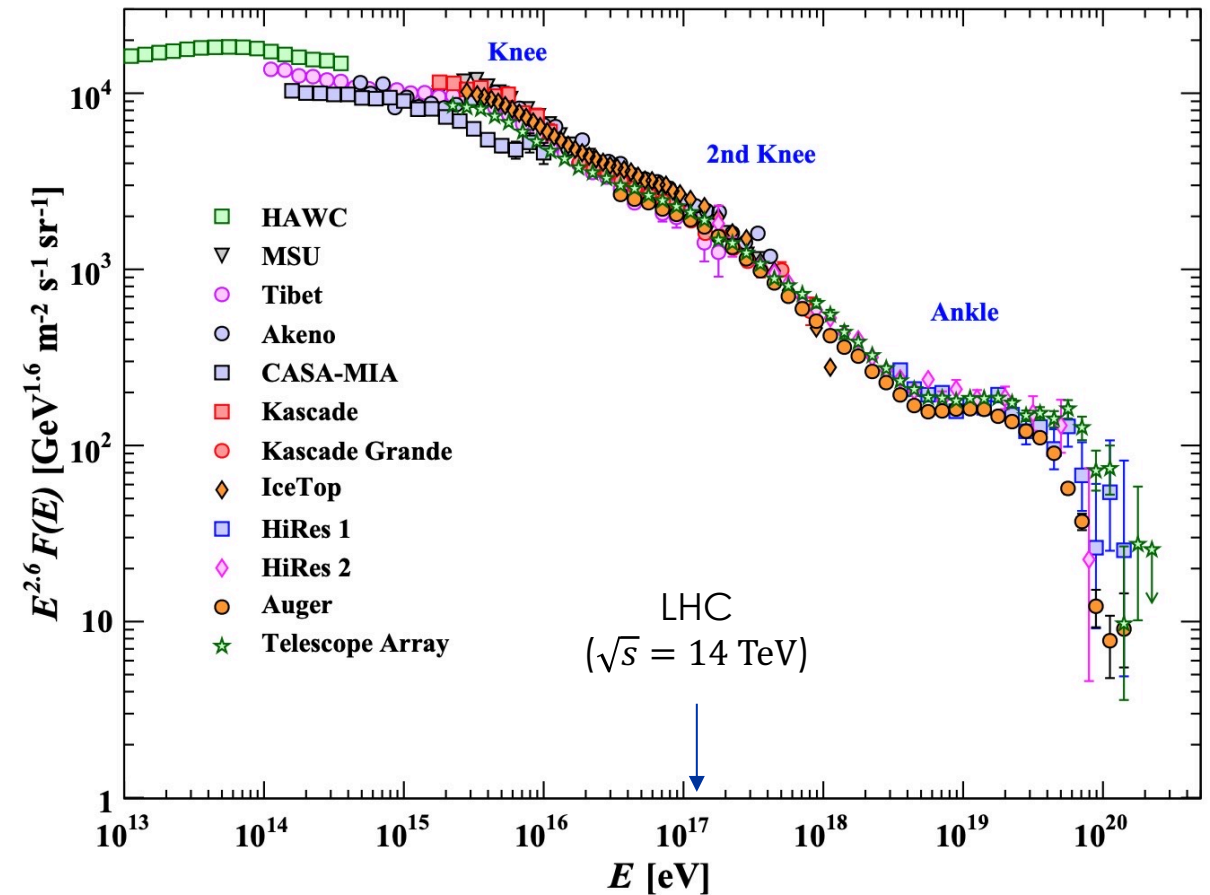
BACKUP

The Mystery of Astroparticle Physics

- ▶ Cosmic rays discovered in 1912
 - ▶ Charged atomic nuclei (p, He, ..., Fe)
- ▶ Observed up to **ultra-high energies**
 - ▶ Highest energy 3×10^{20} eV $\approx$ 50 J

Where do (ultra)-high-energy cosmic rays come from?

Cosmic-ray energy spectrum



[PDG (2022) PTEP 083C01]

The Diffuse High-Energy Sky

What is the **origin** of
(ultra)-high-energy
cosmic rays?

Unresolved
isotropic
observations

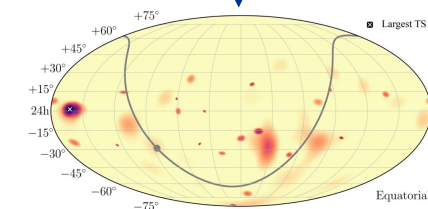
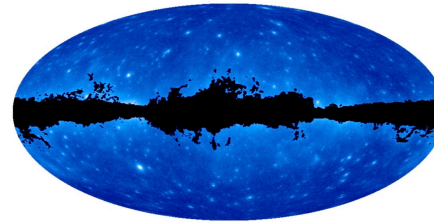
Similar energy
budgets

Sources likely
extragalactic

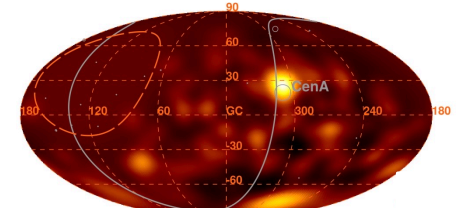
What is the **origin** of
high-energy neutrinos?

Focus of this talk

[Fermi-LAT (2017) ApJS 232 18]



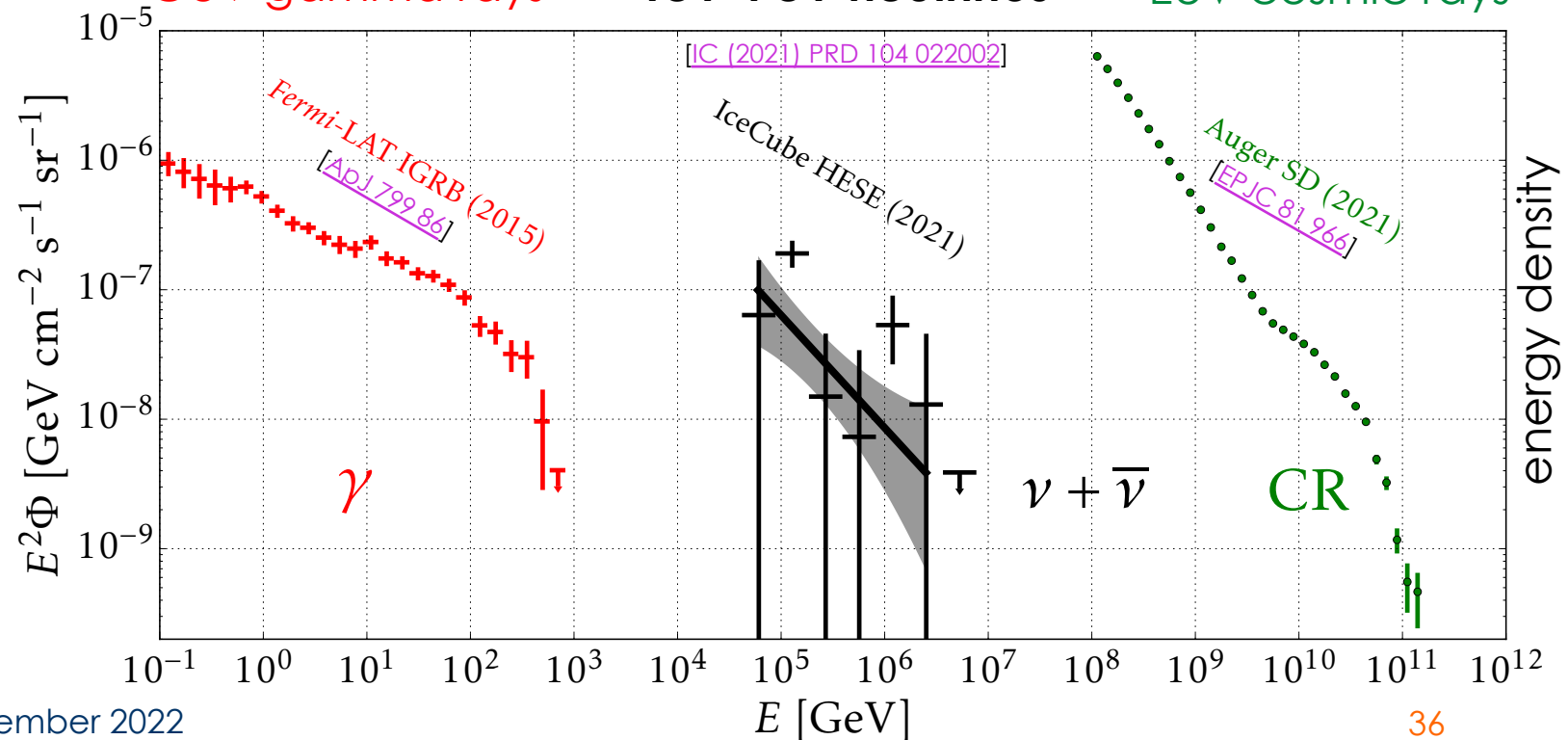
[Auger (2018) ApJL 853 L29]



GeV gamma rays

TeV-PeV neutrinos

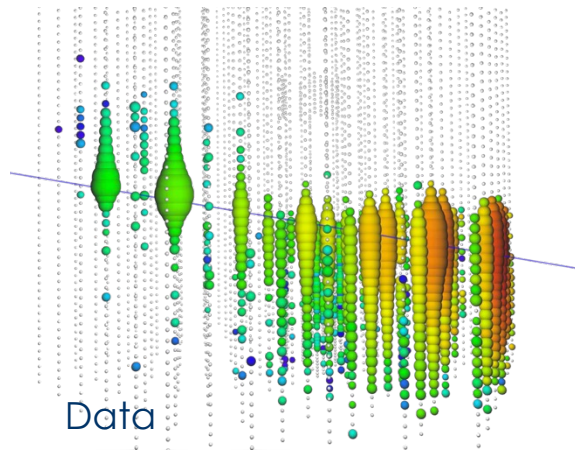
EeV cosmic rays



Event Signatures in IceCube

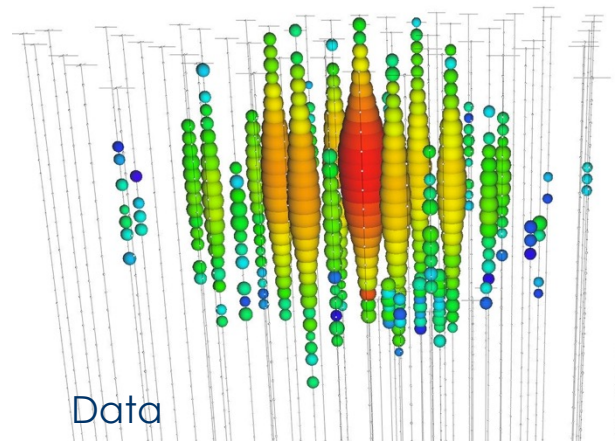
Track

ν_μ charged-current
Good **angular resolution**, $\lesssim 1^\circ$



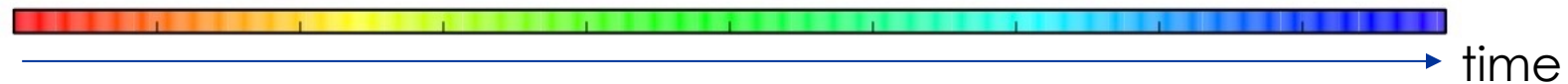
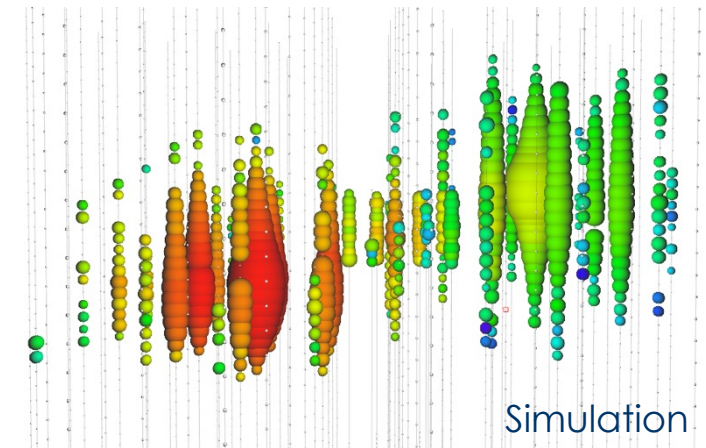
Cascade

ν_e (ν_τ) charged-current & all neutral-current
Good energy resolution, $\sim 15\%$



Double Bang

ν_τ charged-current at highest energies
 ν_τ candidates observed! [[IC \(2022\) EPJC 82 1031](#)]



Initial Selection of ULIRGs

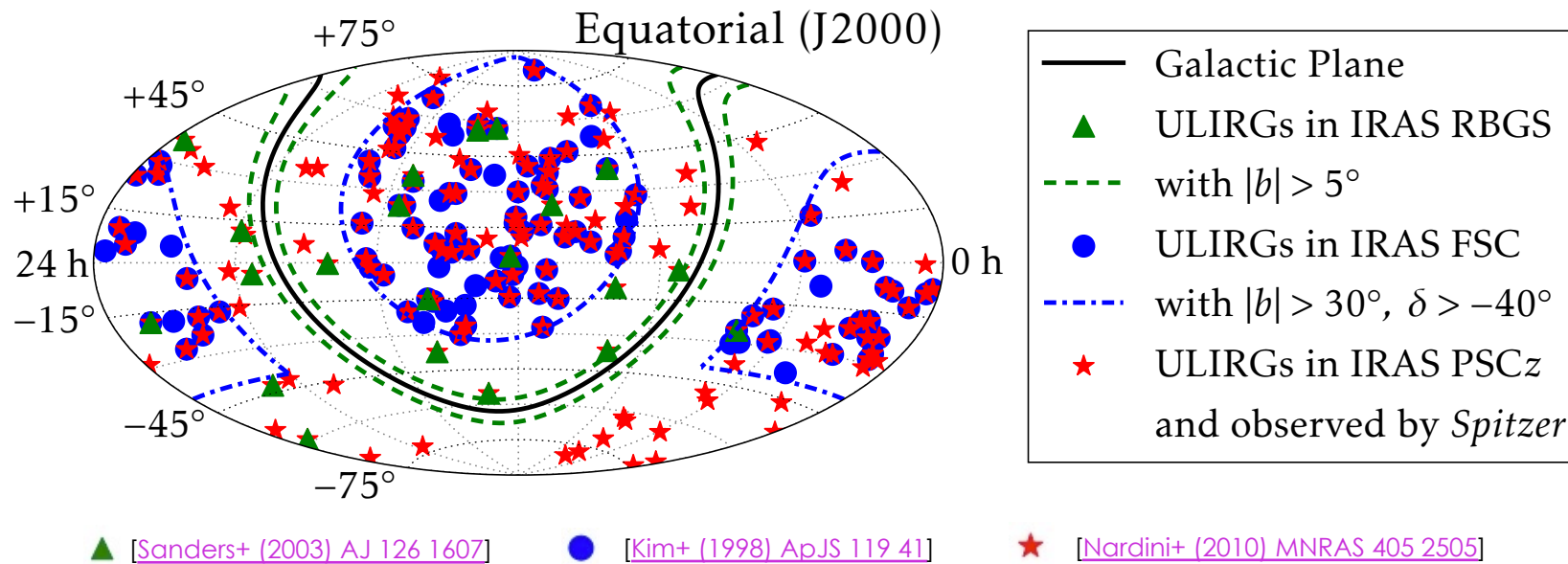
- ▶ Start from **three catalogs** based on IRAS data
- ▶ Mainly observe flux at 60 micron, f_{60}
- ▶ 189 unique ULIRGs

Infrared Astronomical Satellite



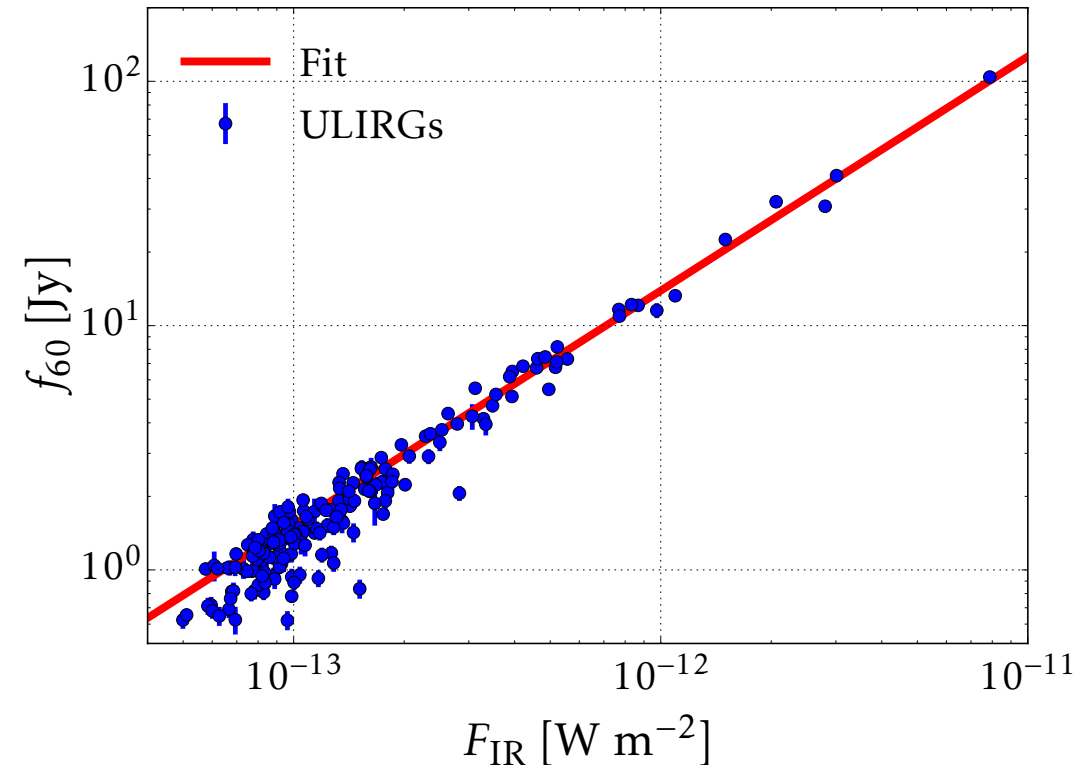
Jan-Nov 1983
12, 25, **60**, 100 micron

[Neugebauer+ (1984) ApJ 278 L1]

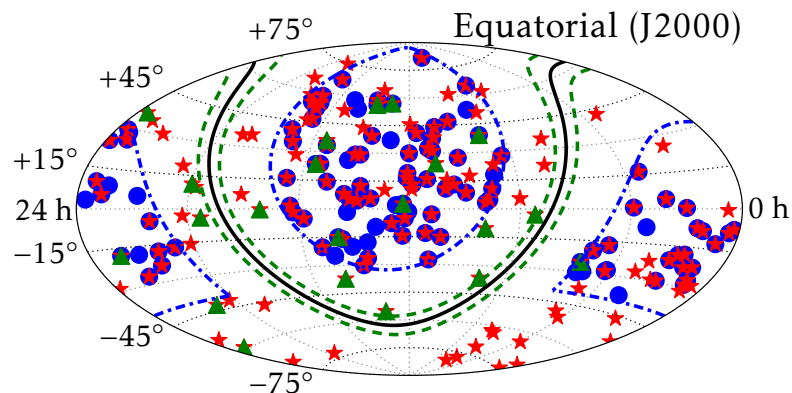


Completeness Estimation

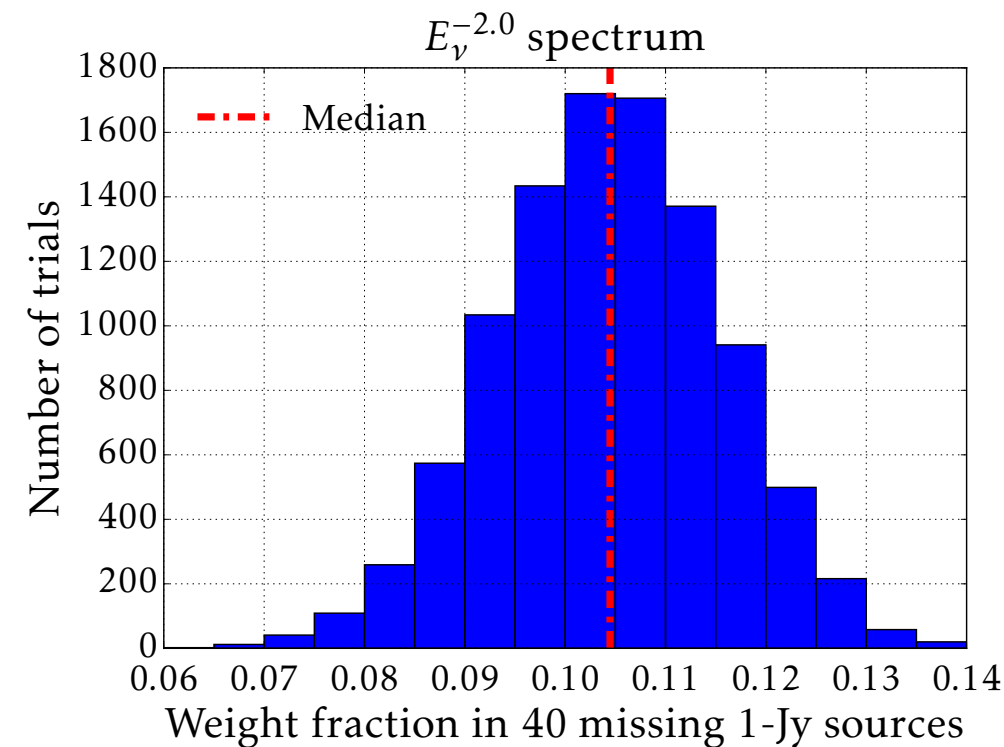
- ▶ Perform **log-linear fit** between f_{60} and F_{IR}
 - ▶ Flux density at 60 micron, f_{60}
 - ▶ Total IR flux (8–1000) micron, $F_{IR} = L_{IR}/(4\pi d_L^2)$
- ▶ Find **maximum distance** d_L from fit for
 - ▶ $f_{60} = 1$ Jy
 - ▶ $L_{IR} = 10^{12} L_{\odot}$
- ▶ **Result**: $d_L \sim 700$ Mpc or $z \sim 0.143$
 - ▶ Make **conservative choice** $z = 0.13$ for cut



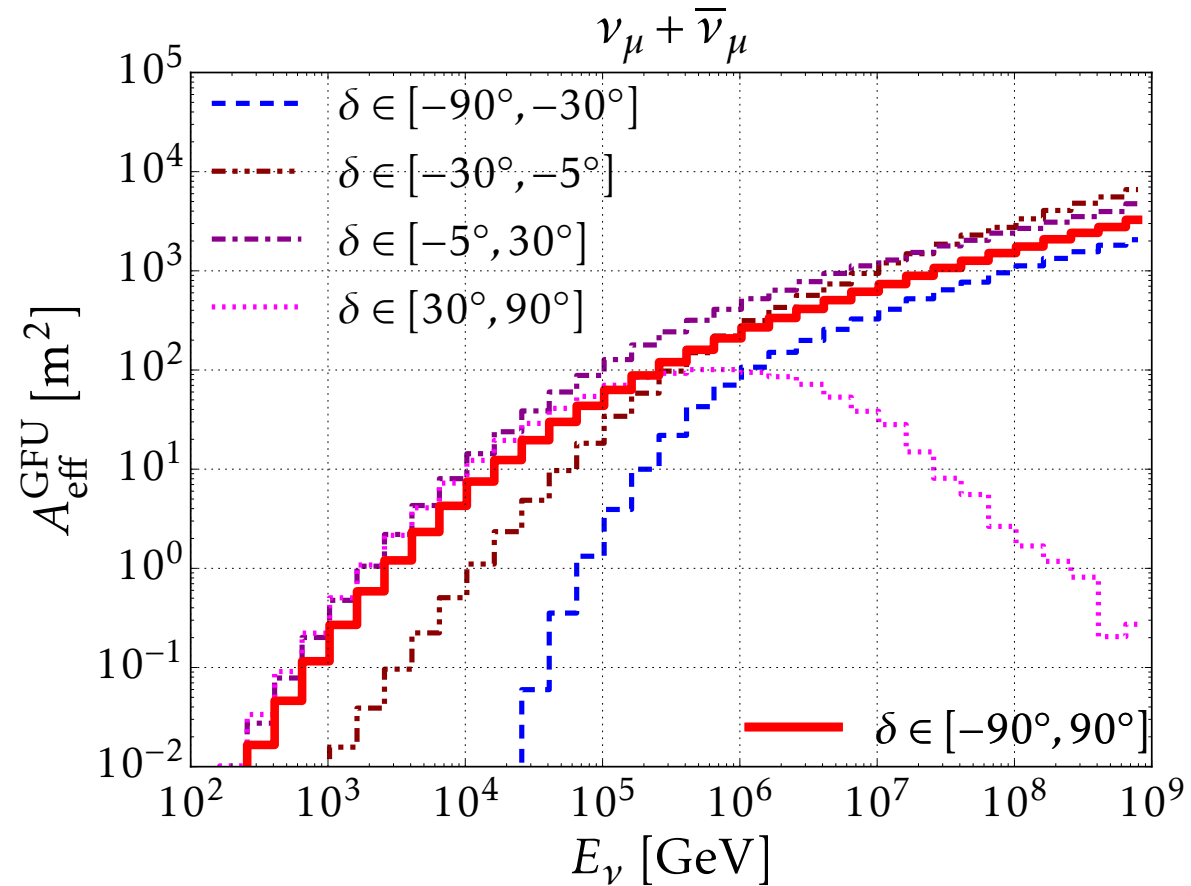
Effect of Missing Sources



- ▶ Final ULIRG selection: $f_{60} \geq 1 \text{ Jy}$
 - ▶ For $f_{60} \geq 5.24 \text{ Jy}$: complete
 - ▶ For $1 \text{ Jy} \leq f_{60} < 5.24 \text{ Jy}$: **limited sky coverage**
- ▶ Likely miss ~40 sources with $1 \text{ Jy} \leq f_{60} < 5.24 \text{ Jy}$
- ▶ Simulate 40 ULIRGs on patch not fully covered
 - ▶ Detector weight: declination dependent
 - ▶ Theoretical weight: average total IR flux of FSC ULIRGs
- ▶ **Effect** on final analysis result: **~10%**
 - ▶ Taken into account in ULIRG population limits



GFU Effective Area



[IC (2017) Astropart. Phys. 92 30]

Maximum-Likelihood Method

► Construct **likelihood**

► Fit for

- Number of signal events n_s (get best fit $\hat{n}_s$)
- Power-law spectral index γ (get best fit $\hat{\gamma}$)

► Determine **test statistic**

- Perform hypothesis test
- Background-only TS PDF from data scrambles
- Use to determine p-value

$$\mathcal{L}(n_s, \gamma) = \prod_i^N \left[\frac{n_s}{N} \sum_k^M w_k \mathcal{S}_i^k(\gamma) + \left(1 - \frac{n_s}{N}\right) \mathcal{B}_i \right]$$

Stacking term

$w_k \propto t_k r_k$
 t_k : Total IR flux
 r_k : Detector response

Sum over
each source k

Signal PDF

Simulation
Space: 2D Gaussian
Energy: $E^{-\gamma}$ spectrum

Evaluate for
each event i

Background PDF

Scrambled data
Space: Uniform in RA
Energy: $E^{-3.7}$ spectrum

Evaluate for
each event i

Alternative hypothesis

Data is compatible with
background + ULIRG signal

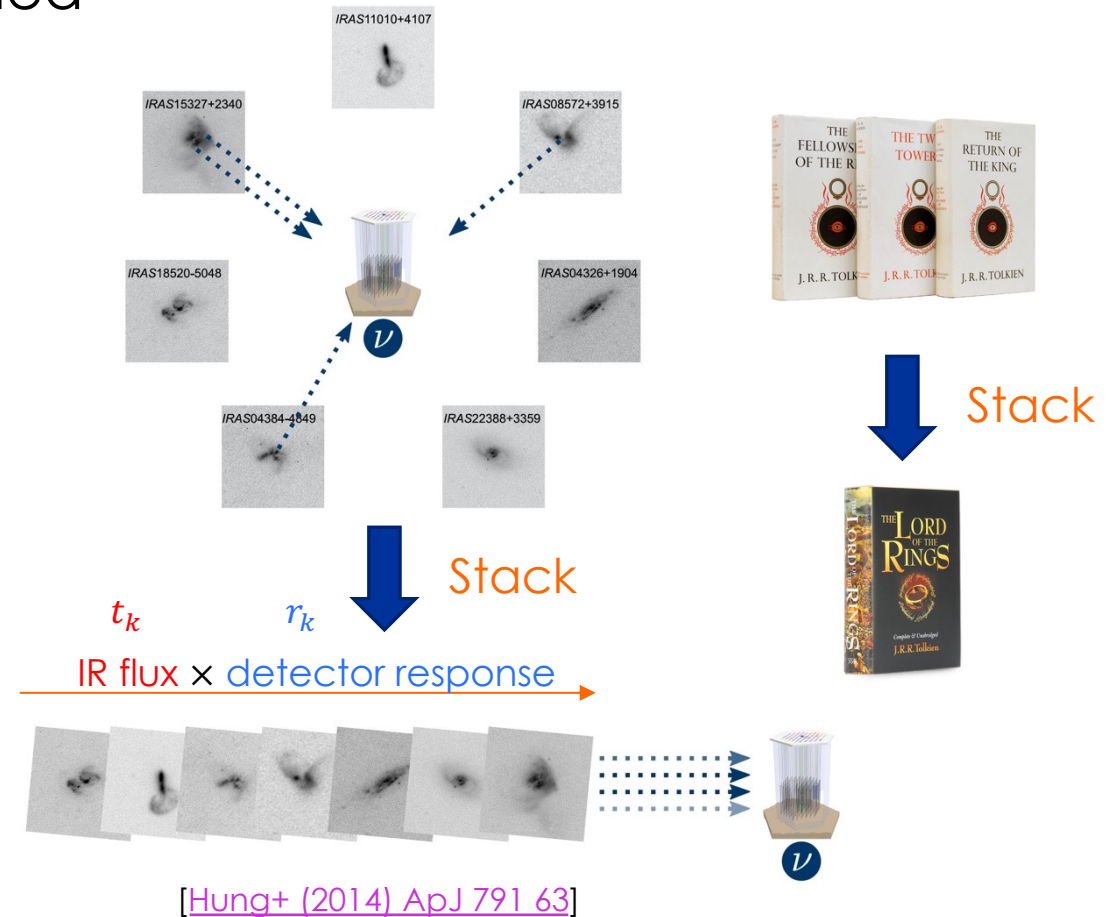
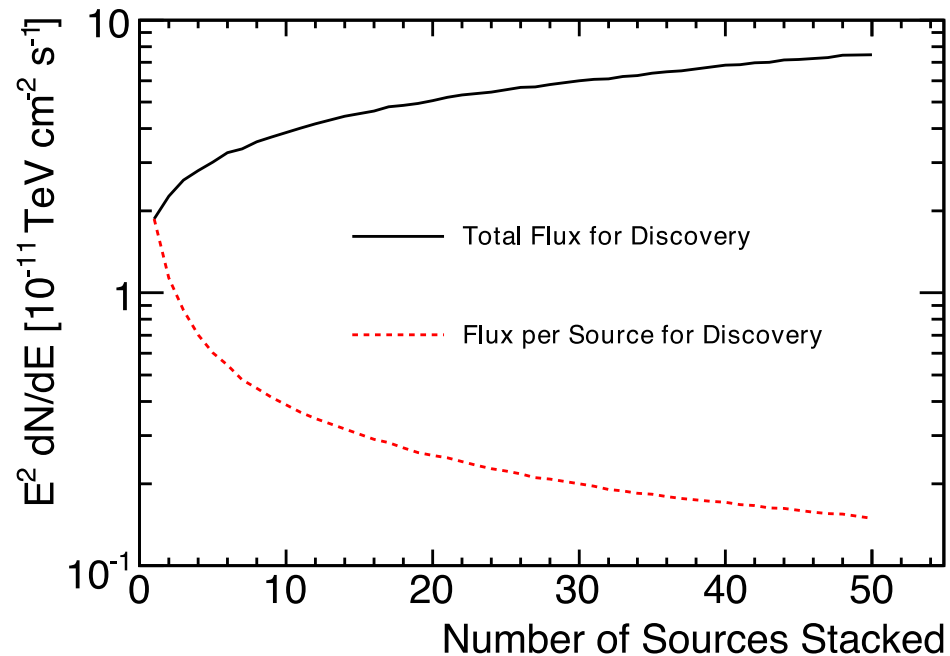
$$TS = 2 \log \left(\frac{\mathcal{L}(n_s = \hat{n}_s, \gamma = \hat{\gamma})}{\mathcal{L}(n_s = 0)} \right)$$

Null hypothesis

Data is compatible with
atmospheric background

The Power of Stacking

- ▶ Increase in sensitivity flux of sources combined
- ▶ Decrease in sensitivity flux per source
- ▶ Strongly depends on chosen weights

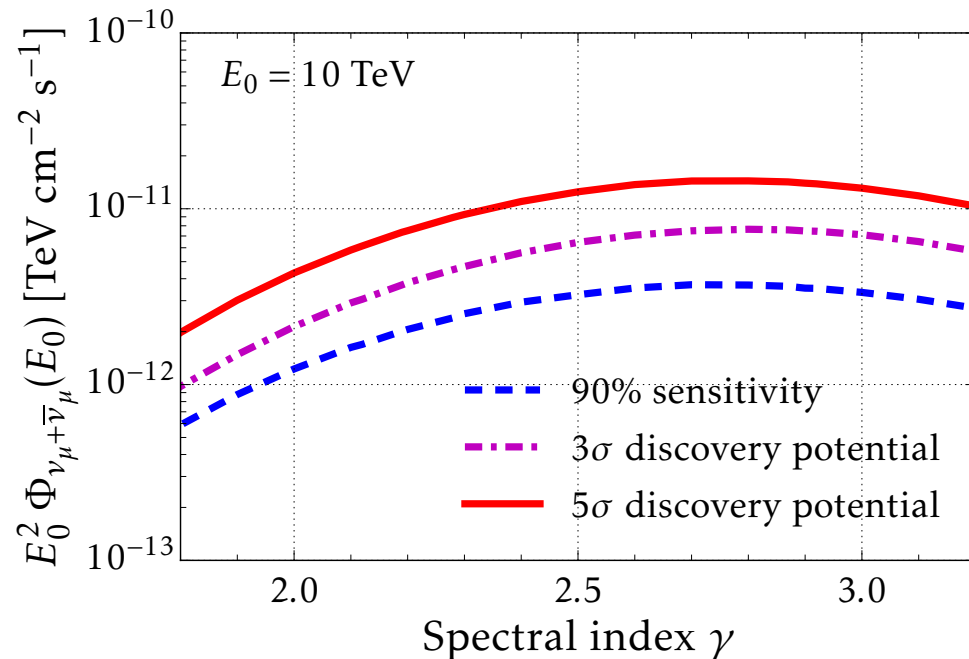


Sensitivity & Discovery Potentials

- ▶ Test **analysis performance**

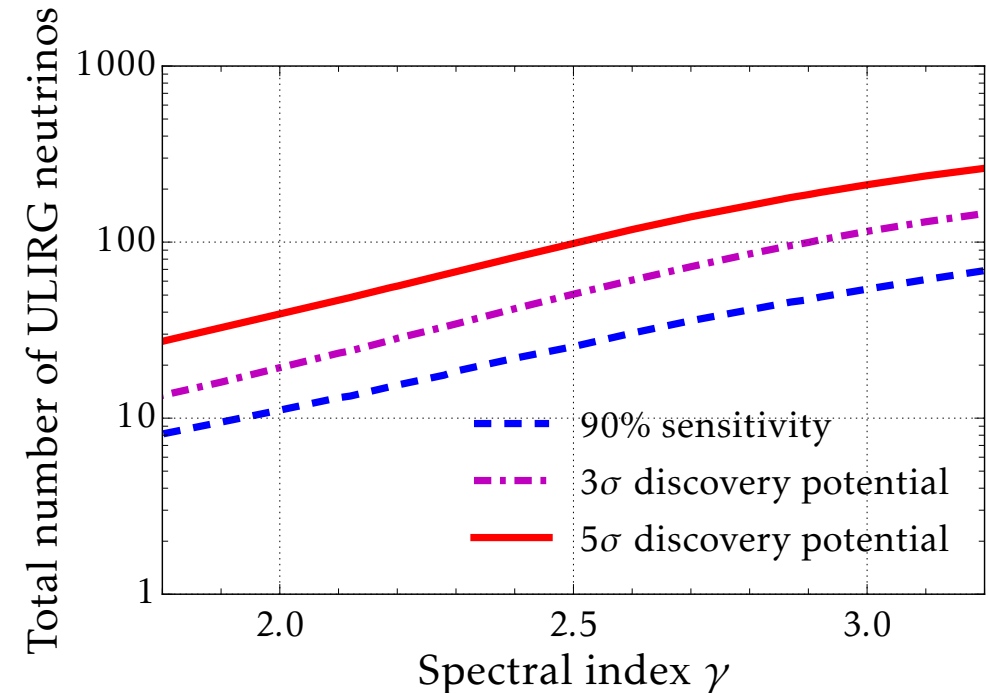
- ▶ Simulate **pseudo-signal** according to

$$\Phi_{\nu_\mu + \bar{\nu}_\mu}(E_\nu) = \Phi_0 \left(\frac{E_\nu}{E_0} \right)^{-\gamma}$$



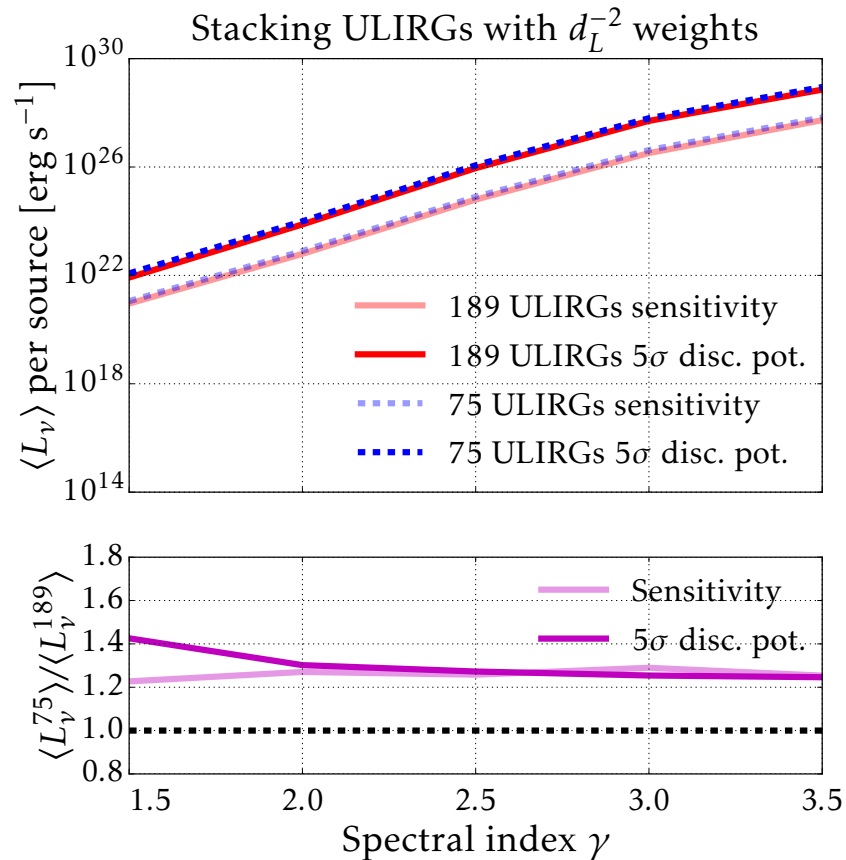
- ▶ **Sensitive** to 10–100 ULIRG neutrinos

- ▶ More sensitive to **harder spectra**
- ▶ Easier to distinguish from $E^{-3.7}$ background

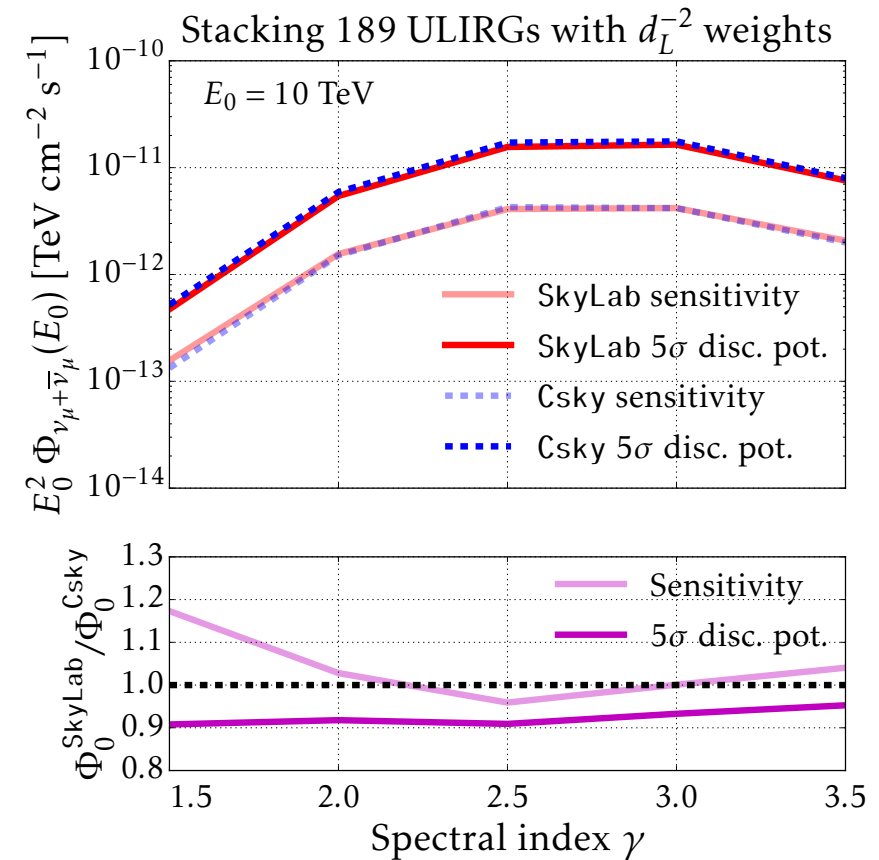


Crosschecks of Analysis Performance

- Stacking 75 vs 189 ULIRGs
 - Small sensitivity loss of 20–40%



- Software comparison
 - Consistent results within 20%



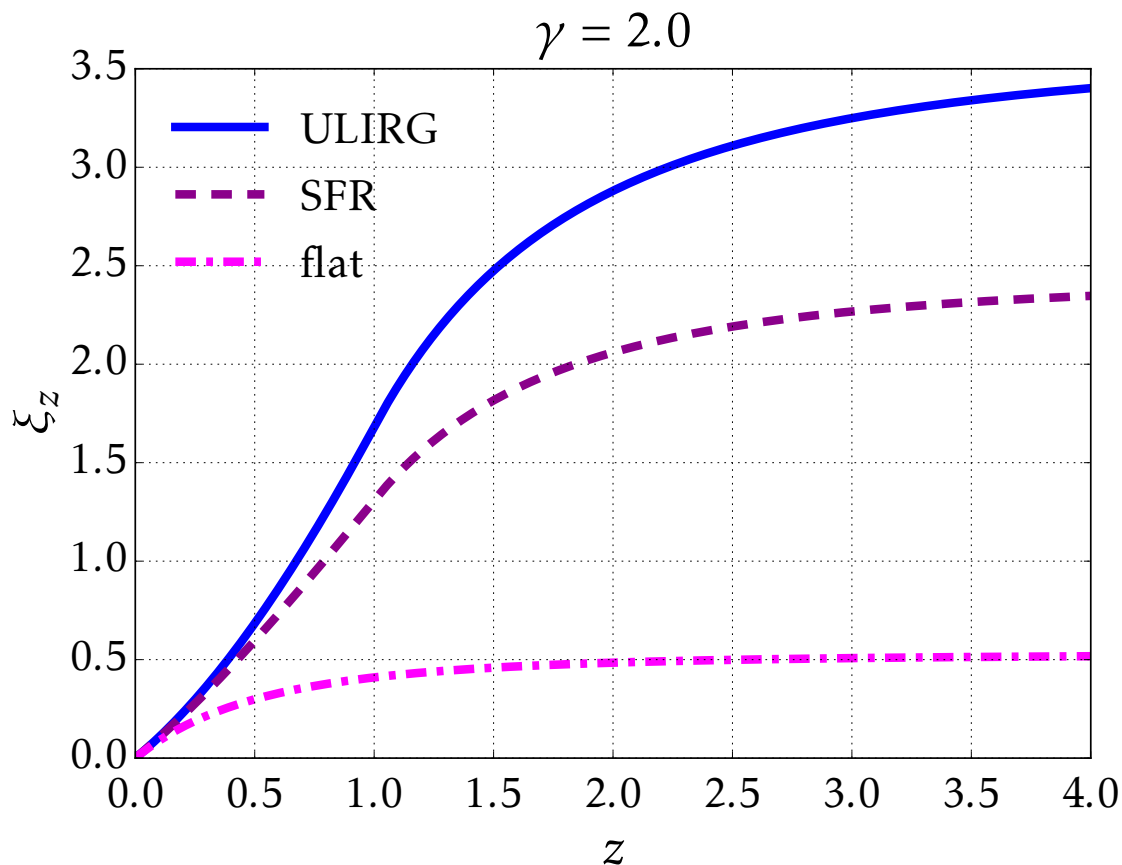
Redshift-Evolution Parameter

$$\mathcal{H}(z) = \begin{cases} (1+z)^4 & z \leq 1 \\ \text{flat} & z > 1 \end{cases}$$

$$\mathcal{H}(z) = \begin{cases} (1+z)^{3.4} & z \leq 1 \\ (1+z)^{-0.3} & z > 1 \end{cases}$$

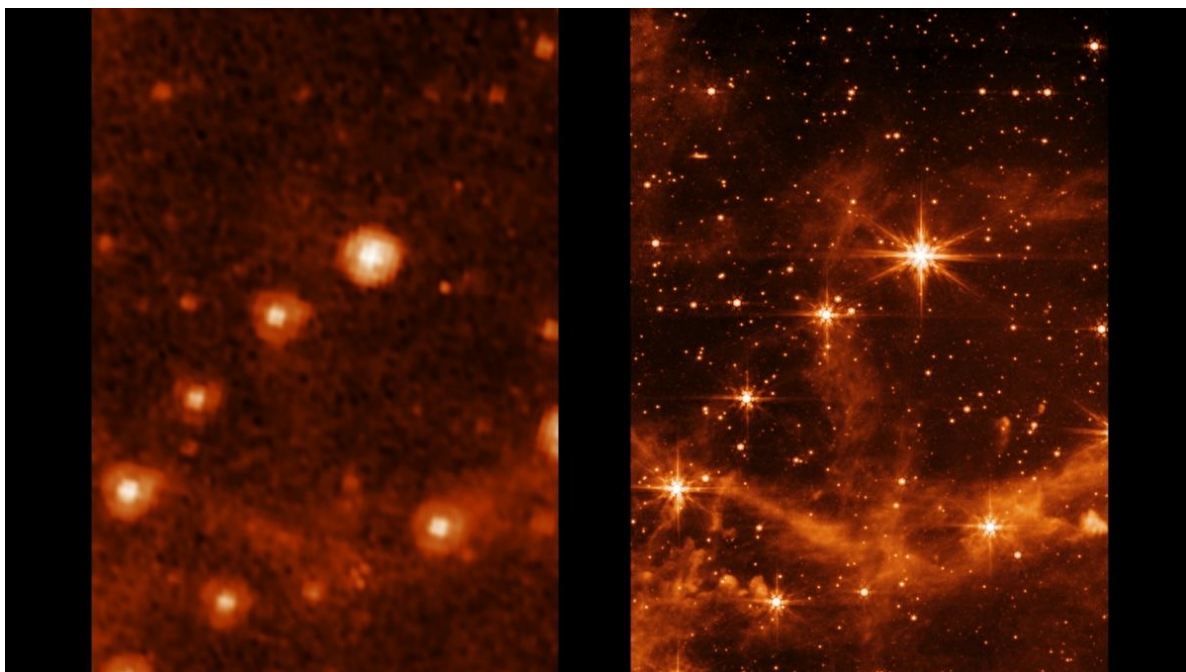
$$\mathcal{H}(z) = 1$$

$$\xi_z(\gamma) = \int_0^z \frac{\mathcal{H}(z')(1+z')^{-\gamma}}{\sqrt{\Omega_m(1+z')^3 + \Omega_\Lambda}} dz'$$



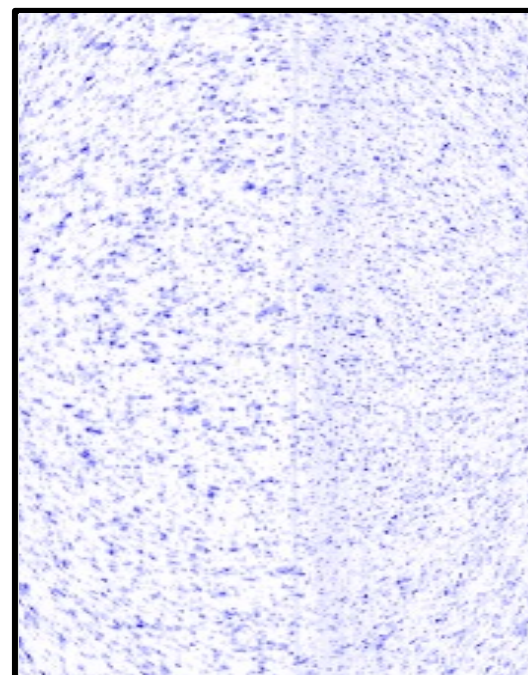
[Vereecken+ (2020) arXiv:2004.03435]

JWST vs IceCube-Gen2

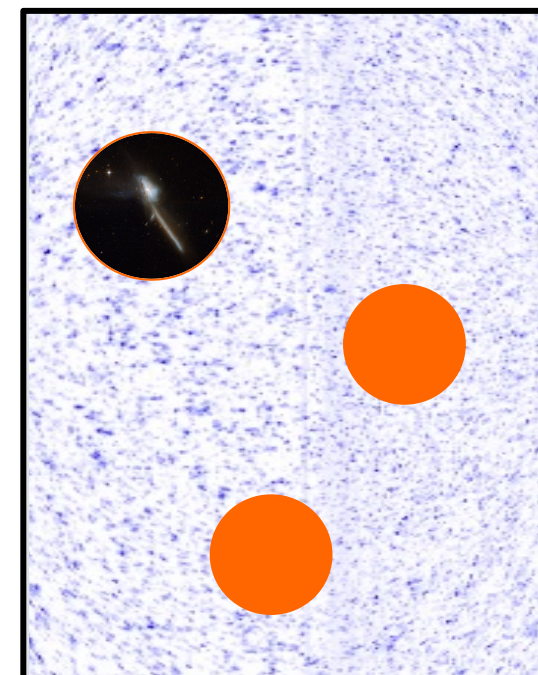


Spitzer (2003)

James Webb (2022)



IceCube (2021)



IceCube-Gen2? (2030+)