



Innsbruck, 30 August - 3 September

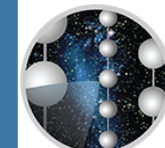


# Search for transient sources of astrophysical neutrinos with 10 years of IceCube data



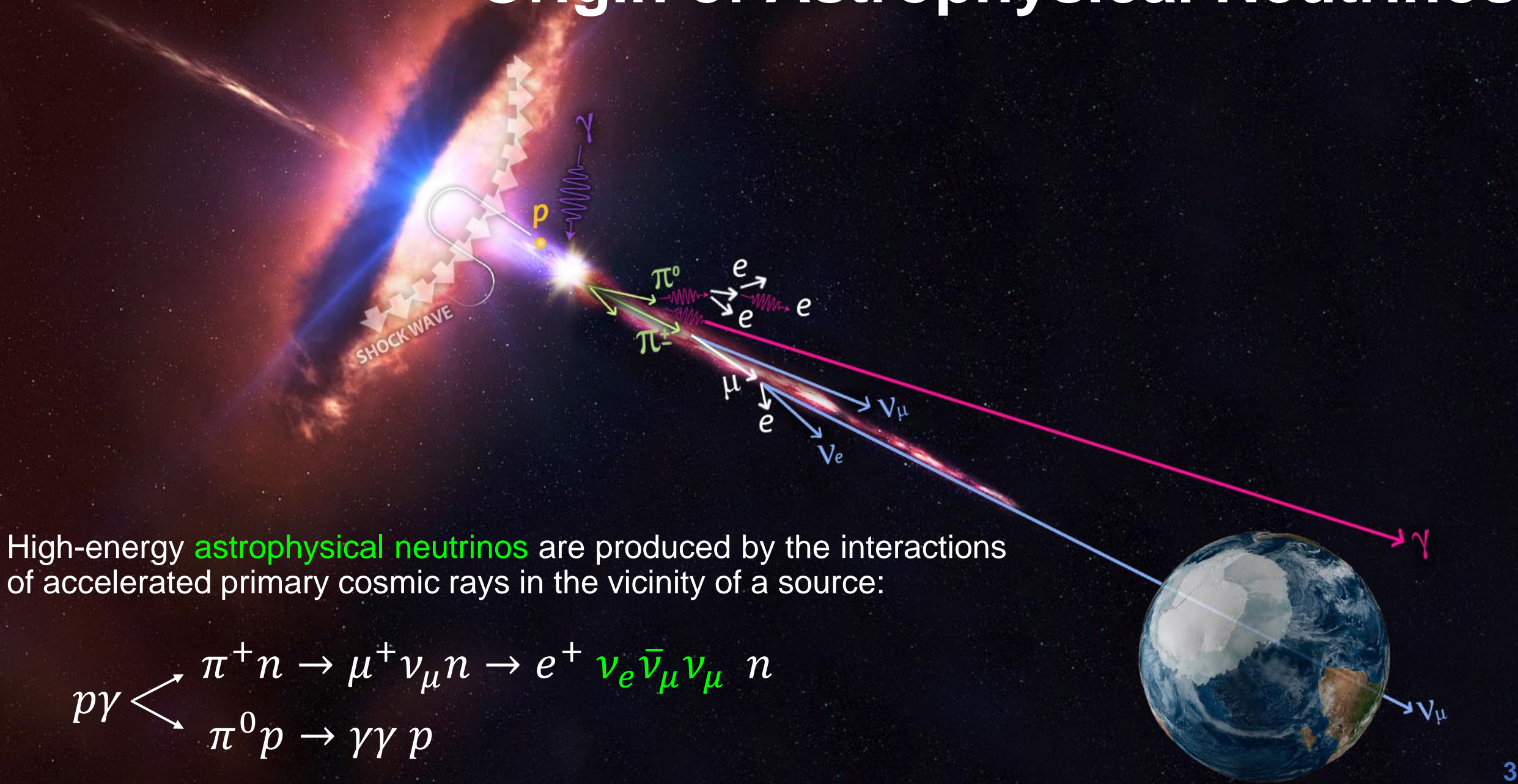
**UNIVERSITÉ  
DE GENÈVE**

F. Lucarelli, T. Montaruli

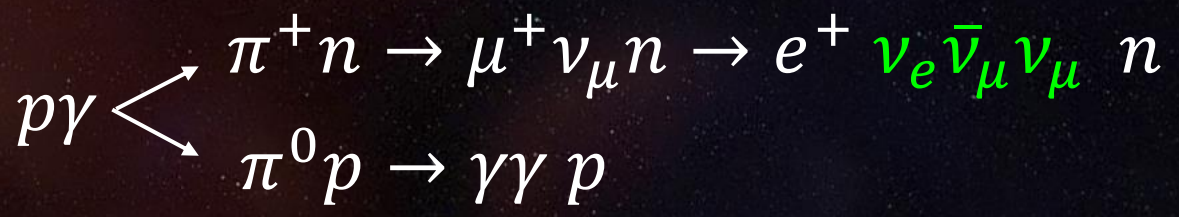


**ICECUBE**  
SOUTH POLE NEUTRINO OBSERVATORY

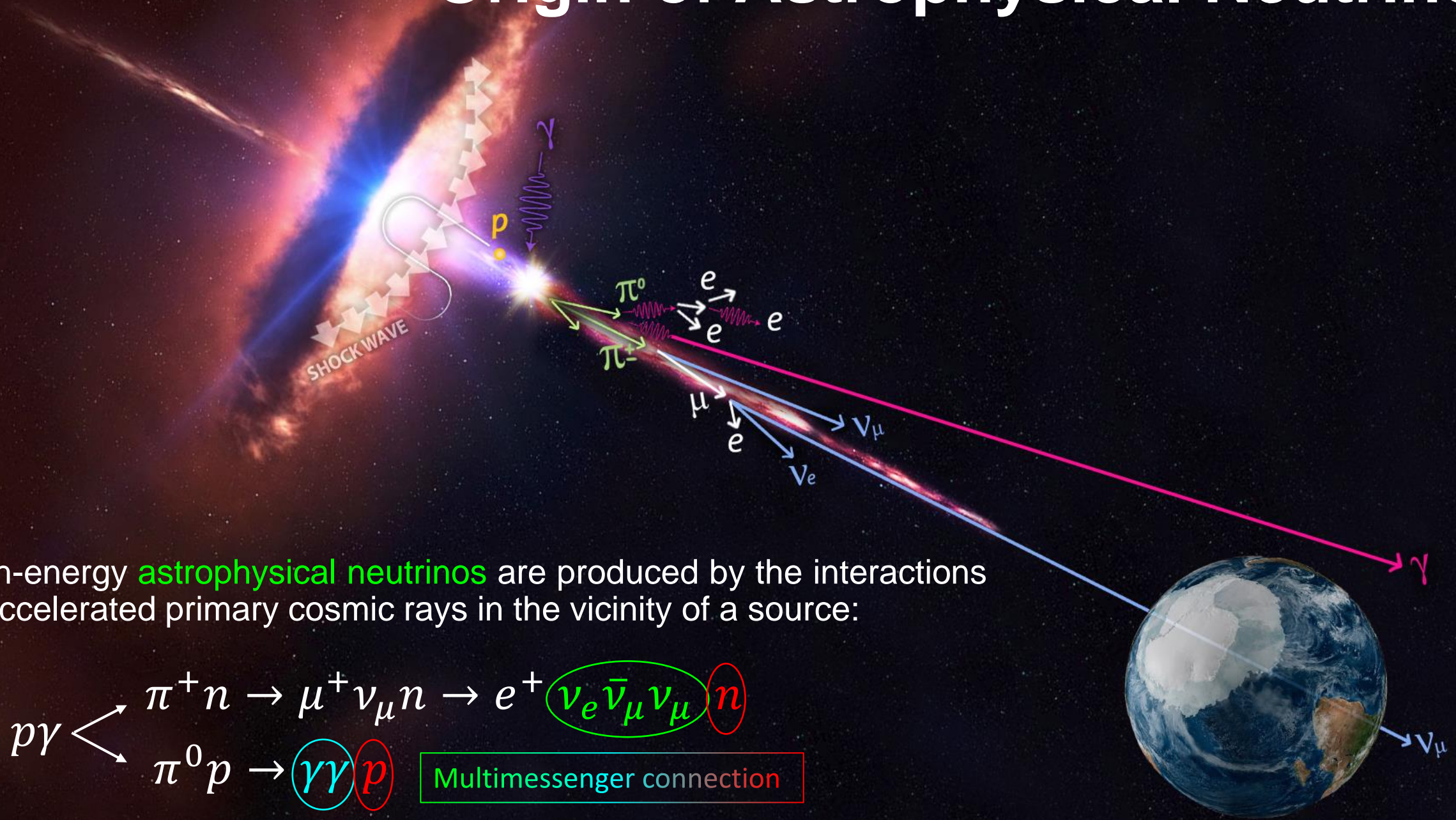
# Origin of Astrophysical Neutrinos



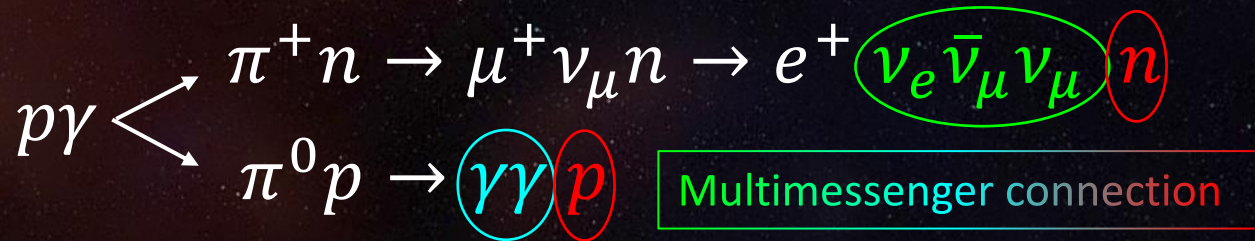
High-energy **astrophysical neutrinos** are produced by the interactions of accelerated primary cosmic rays in the vicinity of a source:



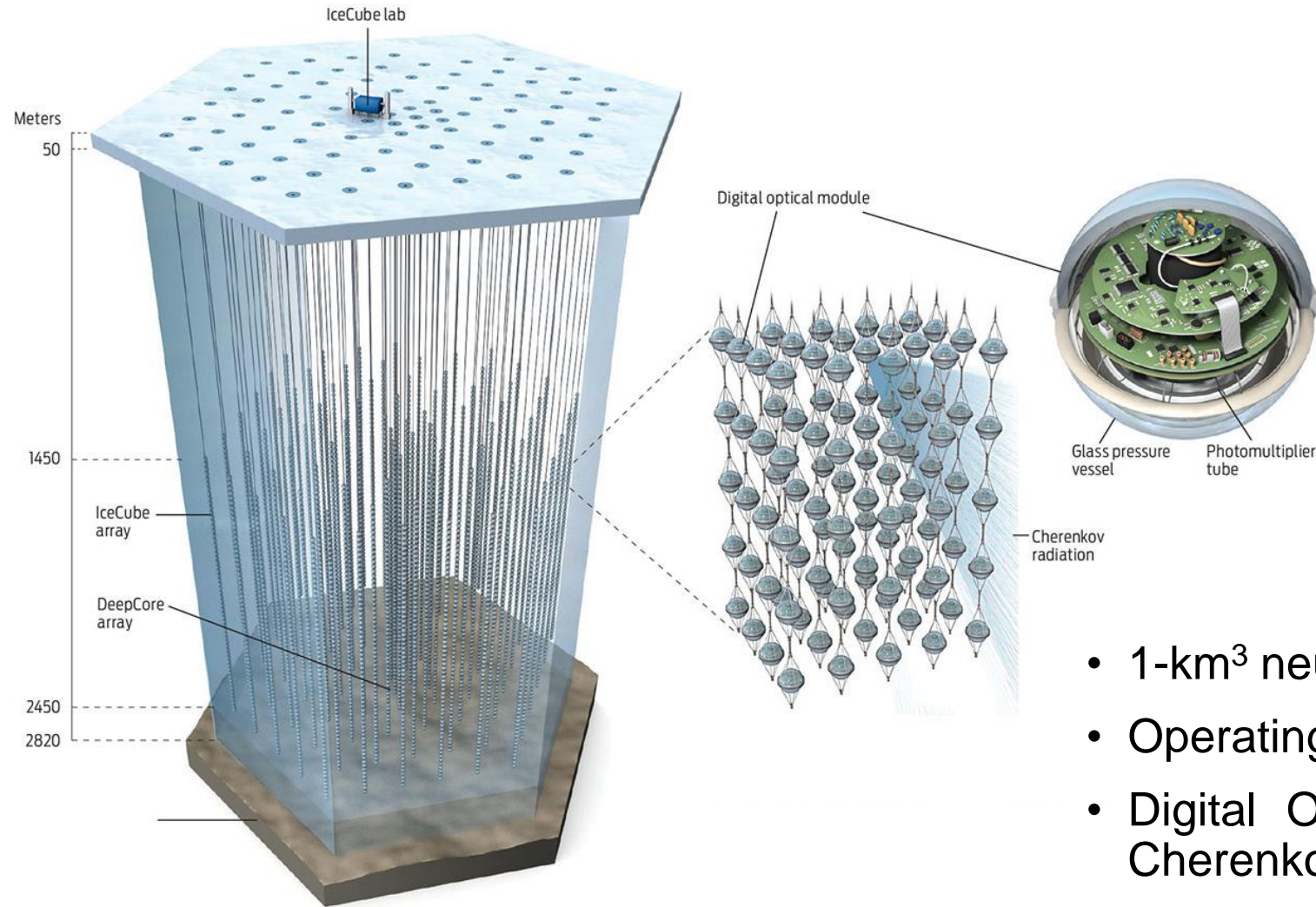
# Origin of Astrophysical Neutrinos



High-energy **astrophysical neutrinos** are produced by the interactions of accelerated primary cosmic rays in the vicinity of a source:



# IceCube Neutrino Observatory

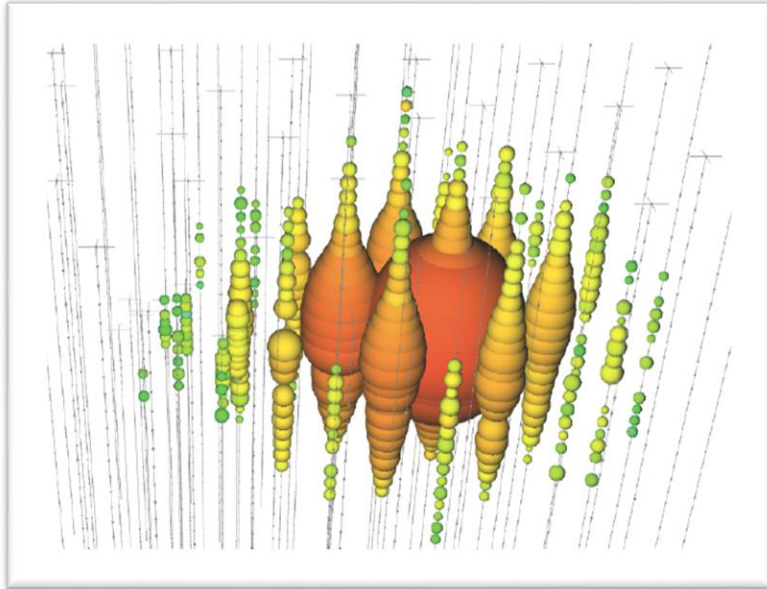


- 1-km<sup>3</sup> neutrino telescope at the South Pole
- Operating in full configuration since May 2011
- Digital Optical Modules designed to collect Cherenkov light
- > 99% uptime, 4 $\pi$  survey

# Neutrino Signature

## Tracks and cascades

Cascade event

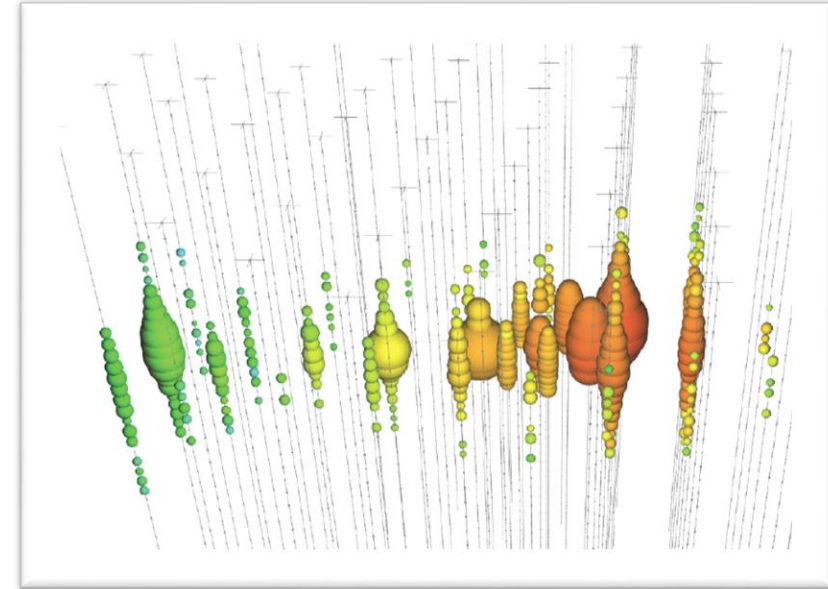


$\nu_e, \nu_\tau$  CC; All-flavour NC

**Bad angular resolution:**  $\sim 10^\circ$  ( $> 100$  TeV)

**Good energy resolution:**  $\sim 15\%$

Track-like event



$\nu_\mu$  CC (dominant)

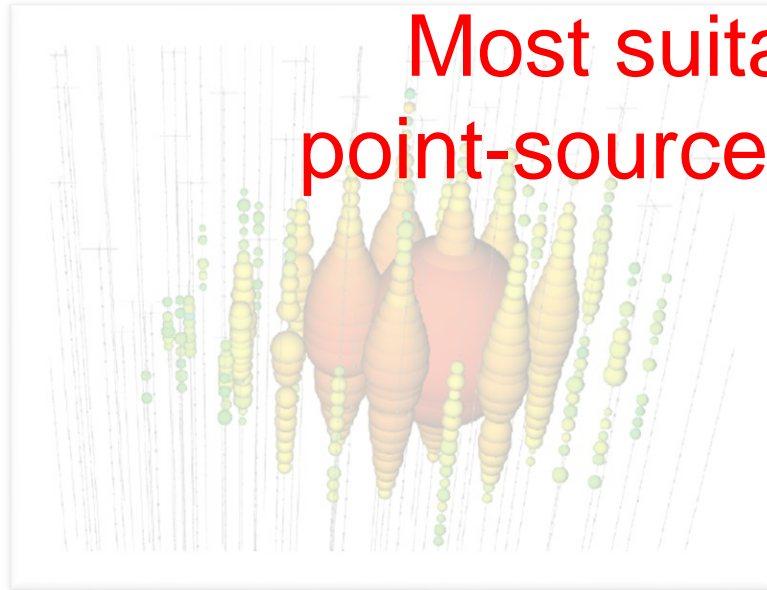
**Good angular resolution:**  $< 0.3^\circ$  ( $> 100$  TeV)

**Bad energy resolution:**  $\sim 2 \times$

# Neutrino Signature

## Tracks and cascades

Cascade event



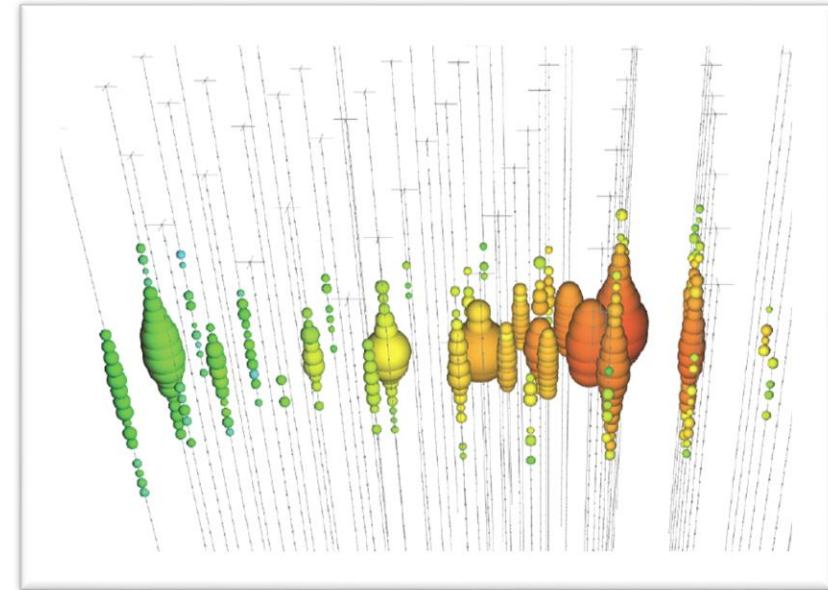
Most suitable for  
point-source searches

$\nu_e, \nu_\tau$  CC; All-flavour NC

Bad angular resolution:  $\sim 10^\circ$  ( $> 100$  TeV)

Good energy resolution:  $\sim 15\%$

Track-like event



$\nu_\mu$  CC (dominant)

Good angular resolution:  $< 0.3^\circ$  ( $> 100$  TeV)

Bad energy resolution:  $\sim 2 \times$

# Signal and Background

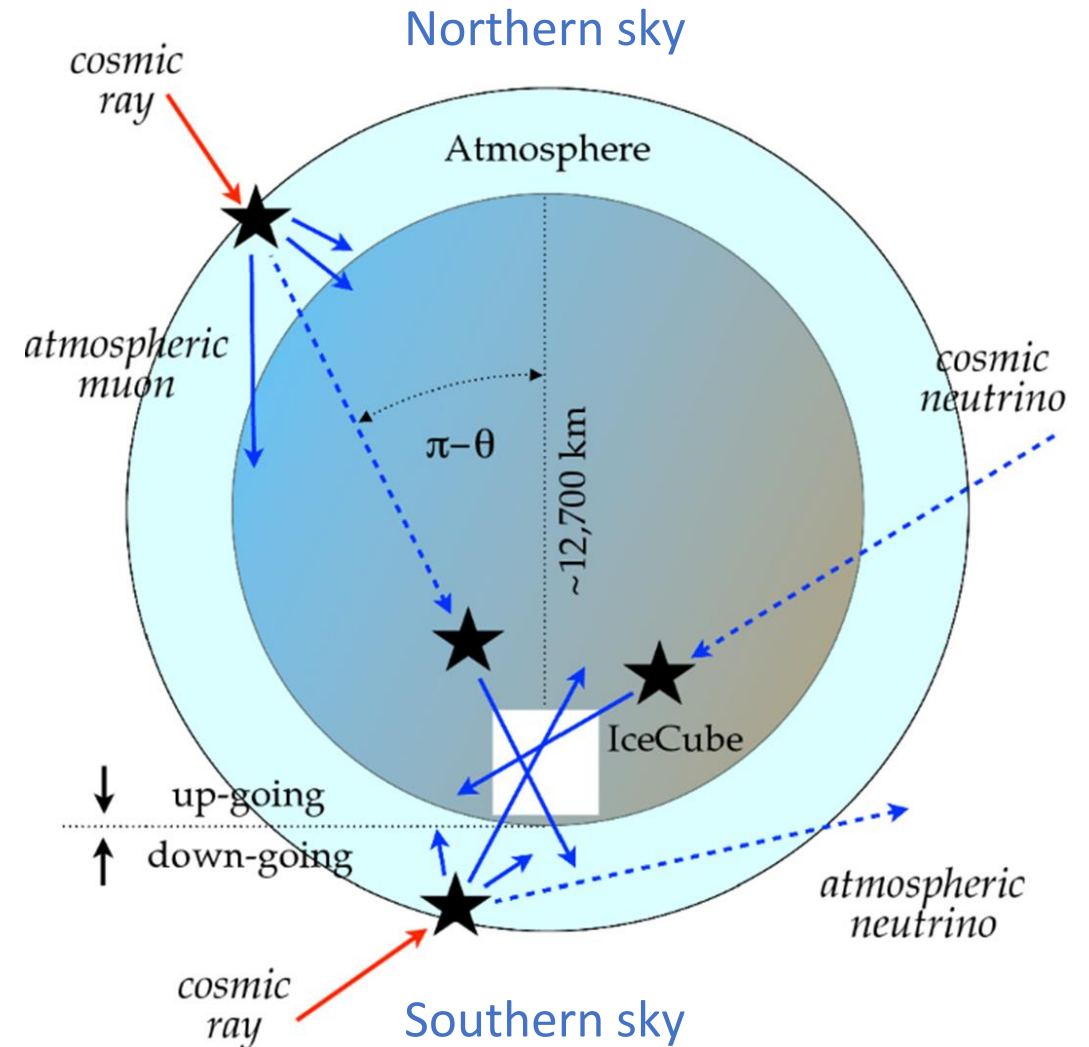
## Signal

- Astrophysical muon neutrinos

## Background

- Atmospheric muons  
Dominant in Southern sky
- Atmospheric muon neutrinos  
Dominant in Northern sky

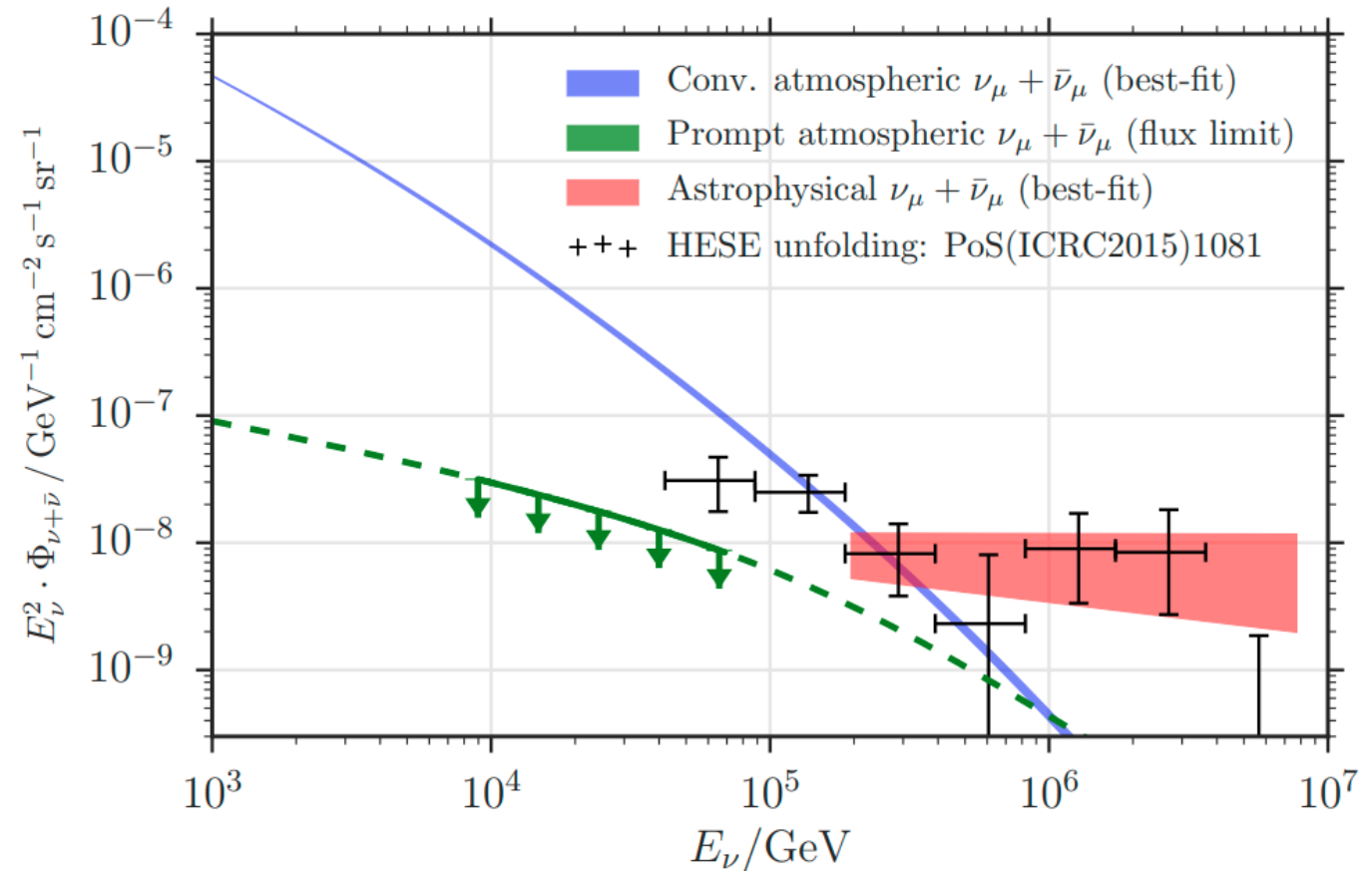
$$\text{Astro } \nu_{\mu} : \text{Atm } \nu_{\mu} : \text{Atm } \mu = 10 : 10^5 : 10^{11} \text{ evts/yr}$$



# IceCube Results

## Astrophysical Diffuse Flux

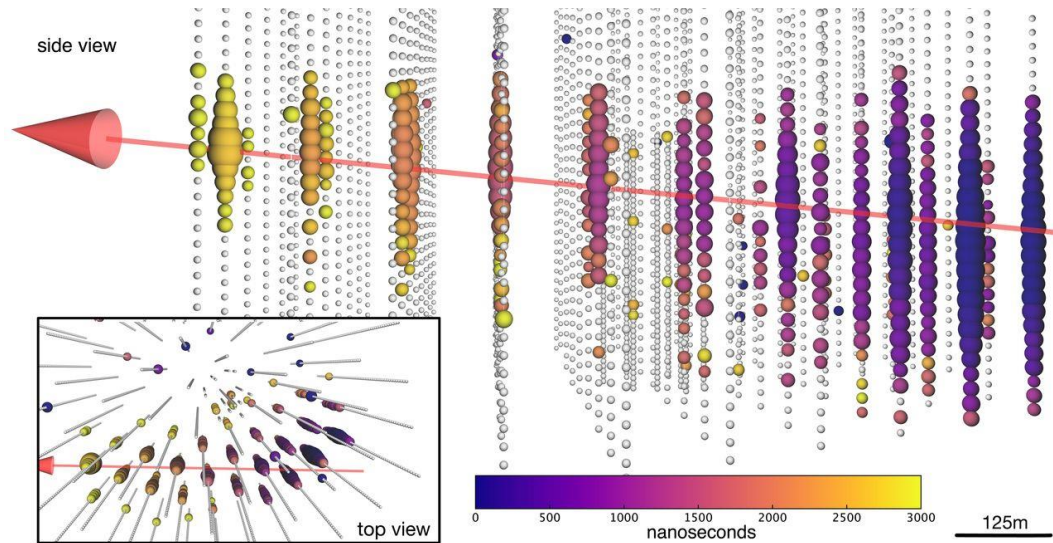
- In 2014 IceCube observed a diffuse flux of astrophysical neutrinos at  $> 5\sigma$
- Expected spectrum:
  - Main background:  $\propto E^{-3.7}$
  - Astrophysical signal:  $\propto E^{-2}$
- Astrophysical component dominant above  $O(100 \text{ TeV})$





# IceCube Results

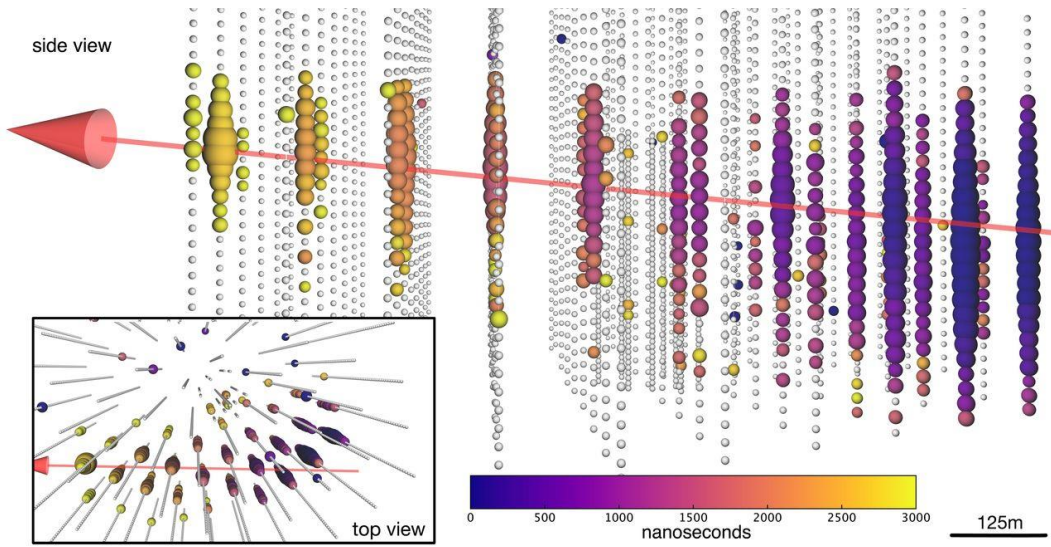
## Evidence of Point-Like Sources: TXS 0506+056



- On 22 September 2017 IceCube detected a track event with reconstructed neutrino energy of 290 TeV
- Its arrival direction was compatible with the location of a known blazar TXS 0506+056

# IceCube Results

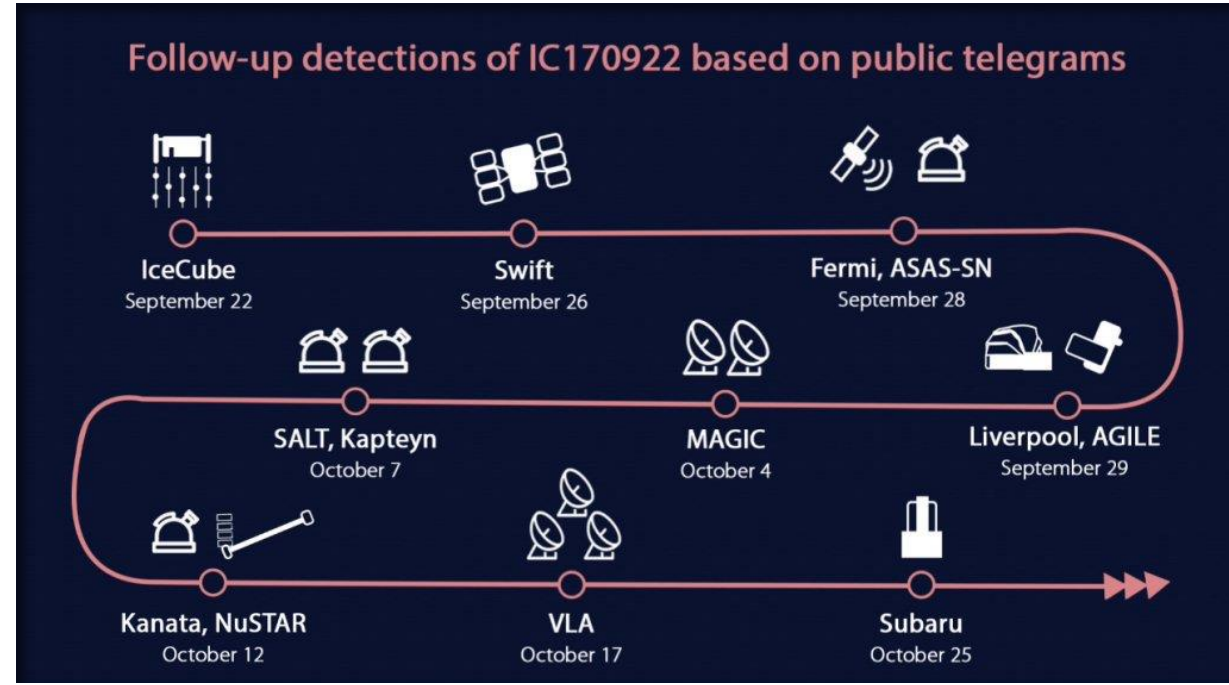
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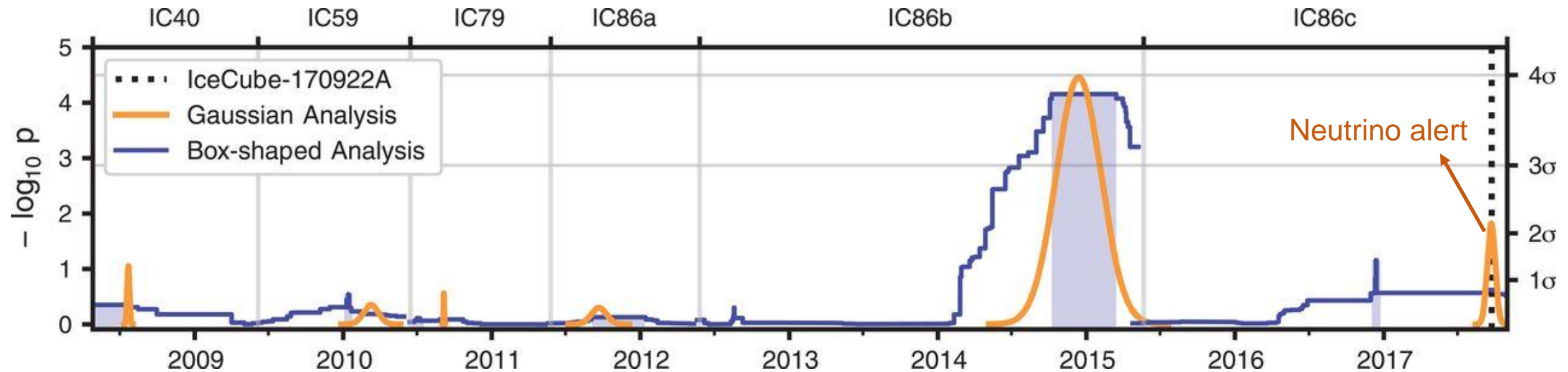
- An increased flux was observed from a compatible direction in the following days

It was the first common observation of the two messengers, indicating TXS 0506+056 as a potential source of cosmic rays



# IceCube Results

## Evidence of Point-Like Sources: TXS 0506+056



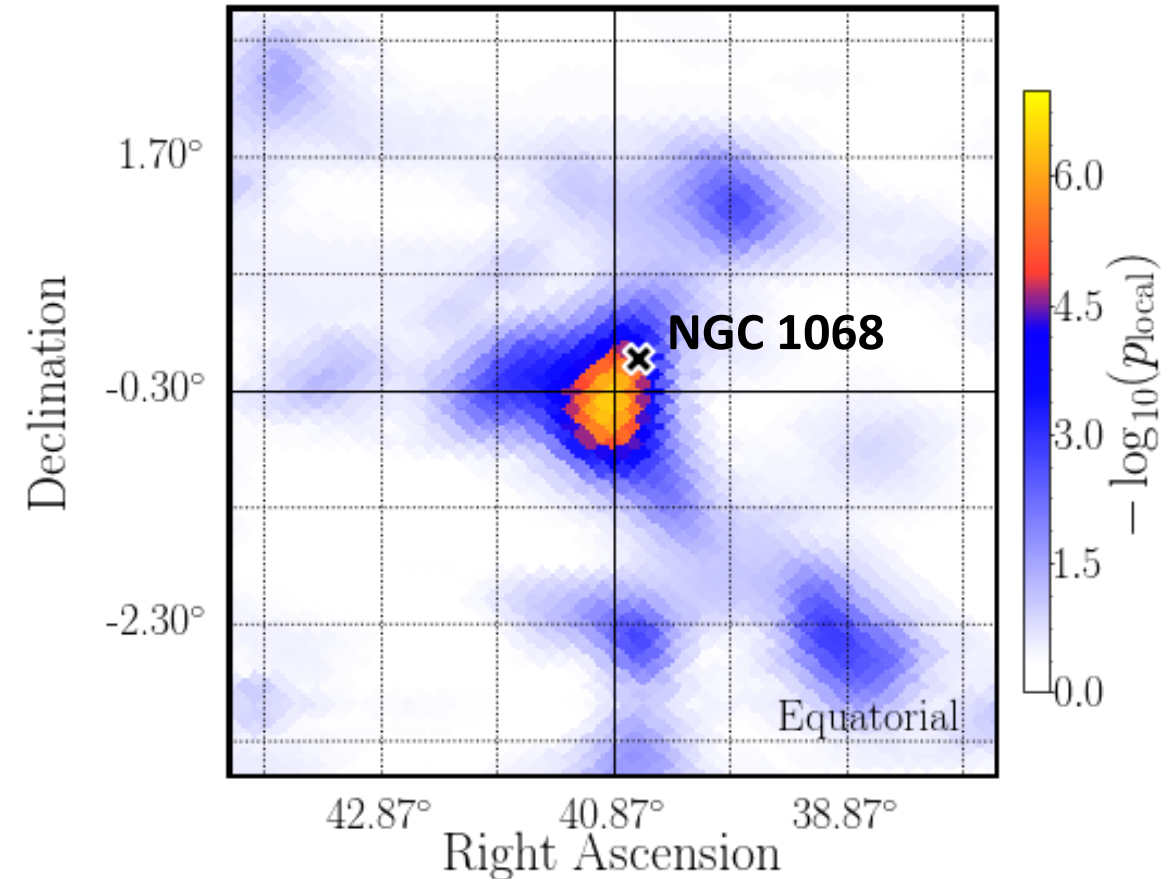
- Looking back at the data from the direction of TXS 0506+056, IceCube observed a neutrino flare prior to the alert time with a significance level of  $3.5\sigma$

No gamma-ray counterpart was observed for this flare

# IceCube Results

## Hints of Point-Like Sources: NGC 1068

- To exploit the multi-messenger connection, in 2019 another analysis looked for point-like sources from a catalogue of gamma-ray emitters
- This analysis identified NGC 1068 as the hottest source at a significance level of  $2.9\sigma$
- Intriguingly, this source is also close to the hottest spot in the Northern hemisphere in an all-sky search



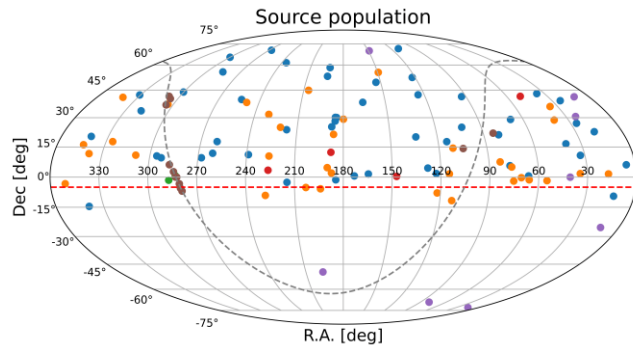
# Analysis Outline

The following time-dependent analysis:

- Looks for **transient sources** with 10 years of IC data
- Can reconstruct **multiple neutrino flares** from one single direction
- Is based on an **unbinned maximum-likelihood method**

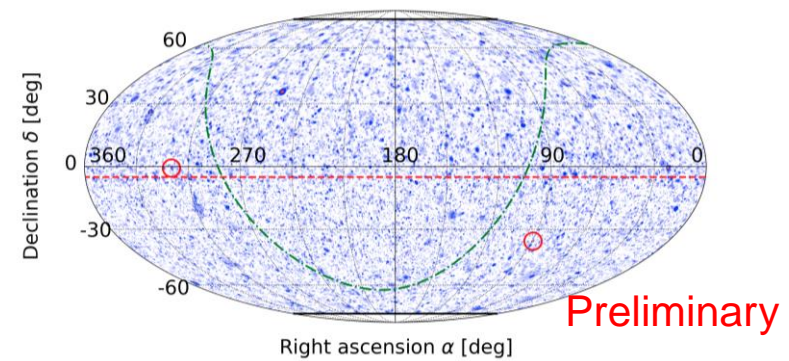
## Catalogue search

- Tests the directions of 110 gamma-ray emitters
- Exploits the multi-messenger correlations
- Looks only at specific directions



## All-sky search

- Looks at the full sky in an unbiased way
- Identifies the hottest spot in the full sky
- Strong penalisation for “look elsewhere” effect



# Time-Dependent Likelihood

$$\mathcal{L} = \prod_{i=1}^N \left[ \underbrace{\left( \sum_{f=\text{flares}} \frac{n_s^f}{N} \mathcal{S}_i^f \right)}_{\text{Signal term}} + \underbrace{\left( 1 - \frac{\sum_f n_s^f}{N} \right)}_{\text{Background term}} \mathcal{B}_i \right]$$

Single-event probability

# Time-Dependent Likelihood

$$\mathcal{L} = \prod_{i=1}^N \left[ \left( \sum_{f=\text{flares}} \frac{n_s^f}{N} \mathcal{S}_i^f \right) + \left( 1 - \frac{\sum_f n_s^f}{N} \right) \mathcal{B}_i \right]$$

**Total events** (red arrow pointing to  $N$ )

**Signal-like events in flare  $f$**  (green arrow pointing to  $n_s^f$ )

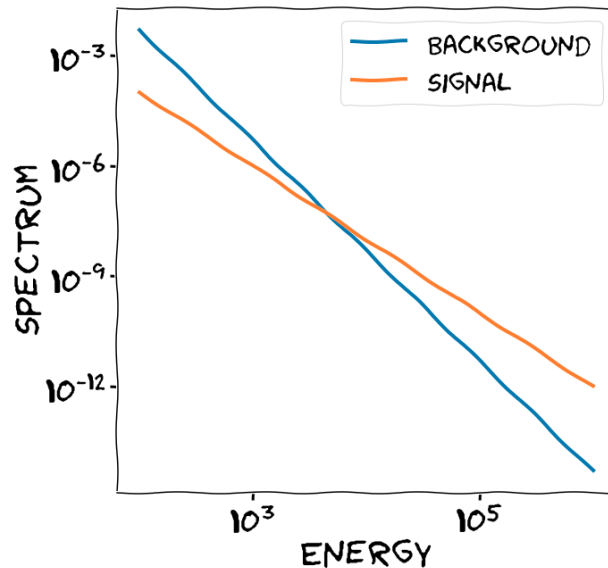
**Single-flare signal PDF** (blue arrow pointing to  $\mathcal{S}_i^f$ )

**Background PDF** (blue arrow pointing to  $\mathcal{B}_i$ )

# Time-Dependent Likelihood

$$\mathcal{L} = \prod_{i=1}^N \left[ \left( \sum_{f=\text{flares}} \frac{n_s^f}{N} \mathcal{S}_i^f \right) + \left( 1 - \frac{\sum_f n_s^f}{N} \right) \mathcal{B}_i \right]$$

Signal/background PDF = Energy PDF  $\times$



Signal: power-law  $E^{-\gamma}$

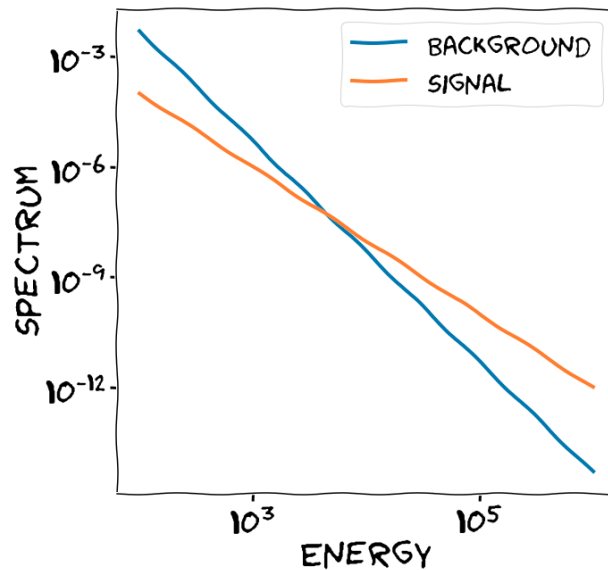
Background: data-driven



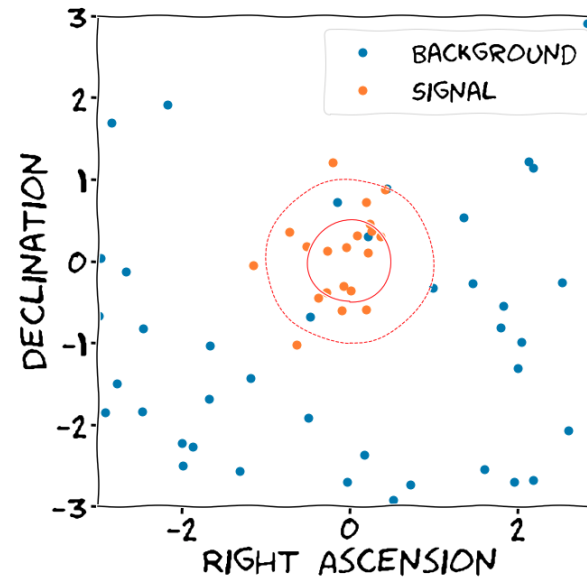
# Time-Dependent Likelihood

$$\mathcal{L} = \prod_{i=1}^N \left[ \left( \sum_{f=\text{flares}} \frac{n_s^f}{N} \mathcal{S}_i^f \right) + \left( 1 - \frac{\sum_f n_s^f}{N} \right) \mathcal{B}_i \right]$$

Signal/background PDF = Energy PDF  $\times$  Spatial PDF  $\times$



Signal: power-law  $E^{-\gamma}$   
Background: data-driven



Signal: 2D Gaussian  
Background: data-driven

# Time-Dependent Likelihood

$$\mathcal{L} = \prod_{i=1}^N \left[ \left( \sum_{f=\text{flares}} \frac{n_s^f}{N} \mathcal{S}_i^f \right) + \left( 1 - \frac{\sum_f n_s^f}{N} \right) \mathcal{B}_i \right]$$

Signal/background PDF

=

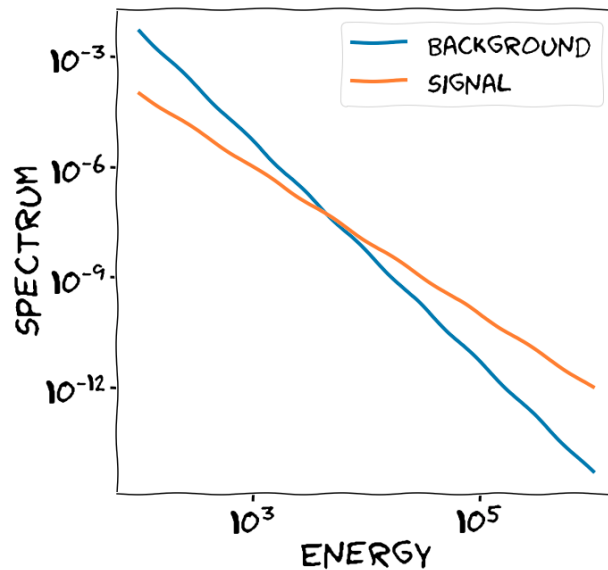
Energy PDF

X

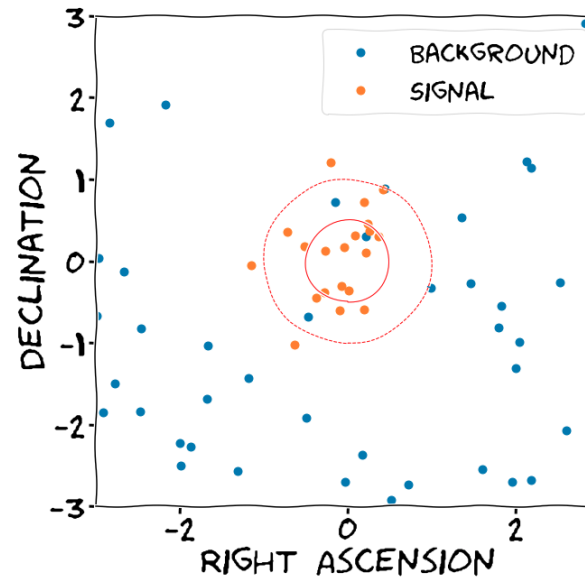
Spatial PDF

X

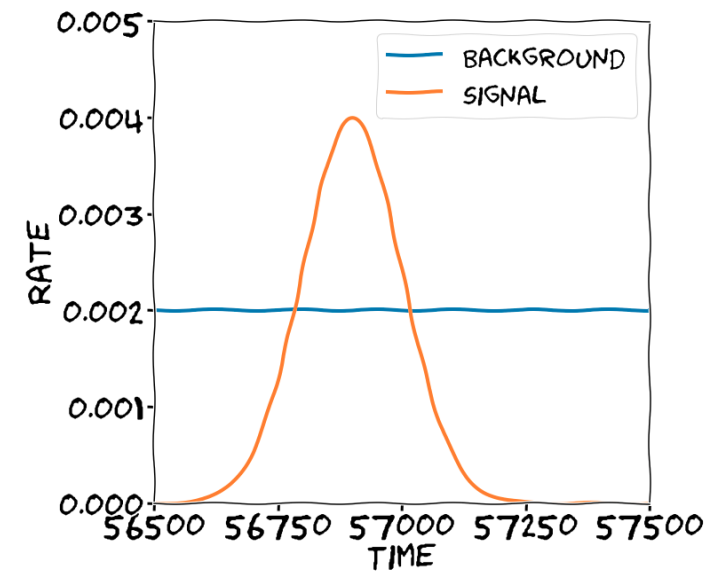
Temporal PDF



Signal: power-law  $E^{-\gamma}$   
Background: data-driven



Signal: 2D Gaussian  
Background: data-driven



Signal: Gaussian  $G(t_i|t_0^f, \sigma_T^f)$   
Background: uniform

# Test Statistic

$$\text{TS} = -2 \log \left[ \underbrace{\frac{1}{2} \left( \prod_{f=\text{flares}} \frac{T_{\text{live}}}{\sigma_T^f \int G(t|t_0^f, \sigma_T^f) dt} \right)}_{\text{Marginalization term}} \times \frac{\mathcal{L}(\vec{n}_s = \vec{0})}{\mathcal{L}(\vec{\hat{n}}_s, \vec{\hat{\gamma}}, \vec{\hat{t}}_0, \vec{\hat{\sigma}}_T)} \right]$$

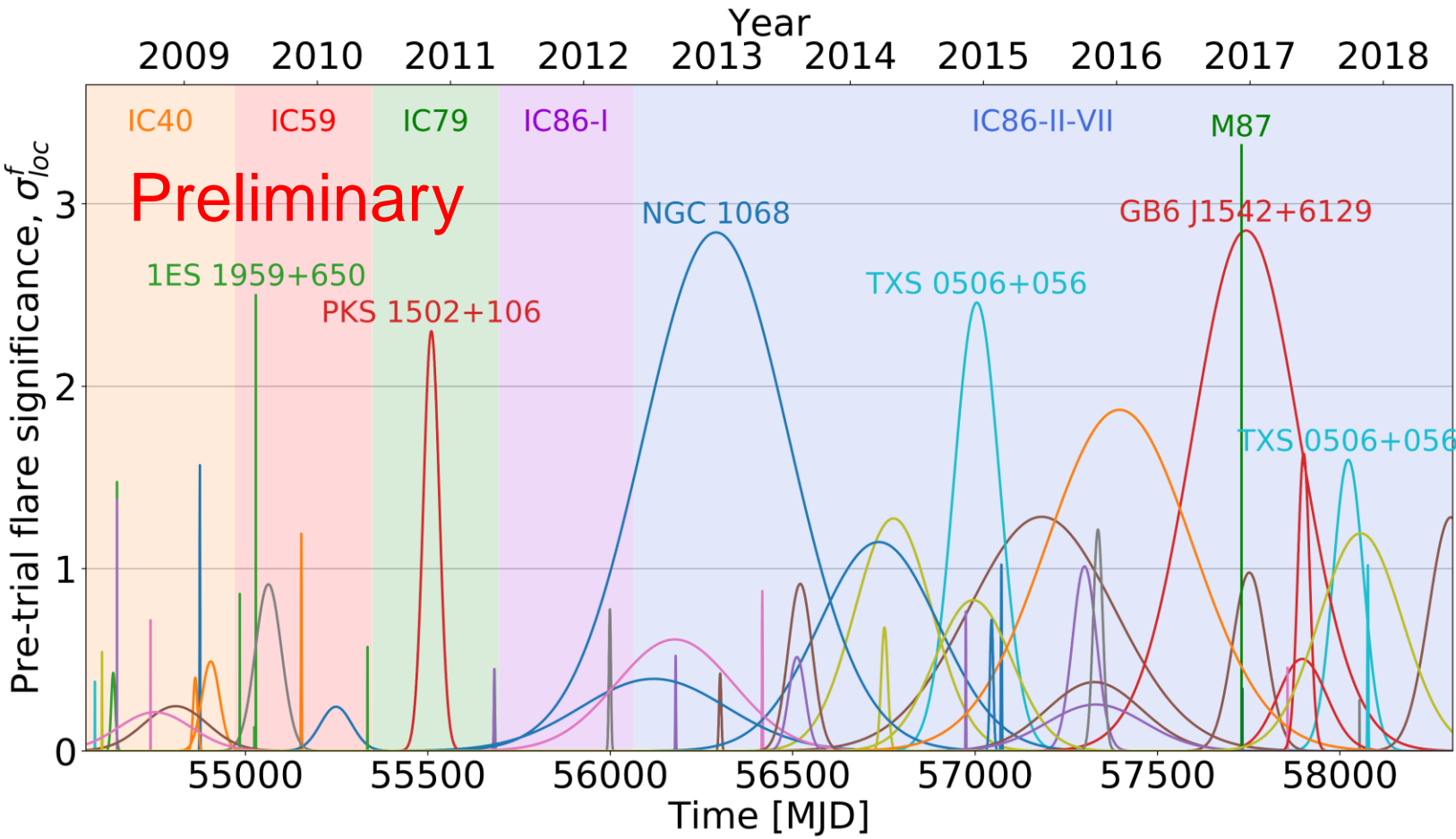
Diagram annotations:

- Full data livetime** (purple arrow) points to  $T_{\text{live}}$ .
- Gaussian time PDF** (orange arrow) points to  $G(t|t_0^f, \sigma_T^f)$ .
- Background likelihood** (red arrow) points to  $\mathcal{L}(\vec{n}_s = \vec{0})$ .
- Maximum likelihood** (green arrow) points to  $\mathcal{L}(\vec{\hat{n}}_s, \vec{\hat{\gamma}}, \vec{\hat{t}}_0, \vec{\hat{\sigma}}_T)$ .

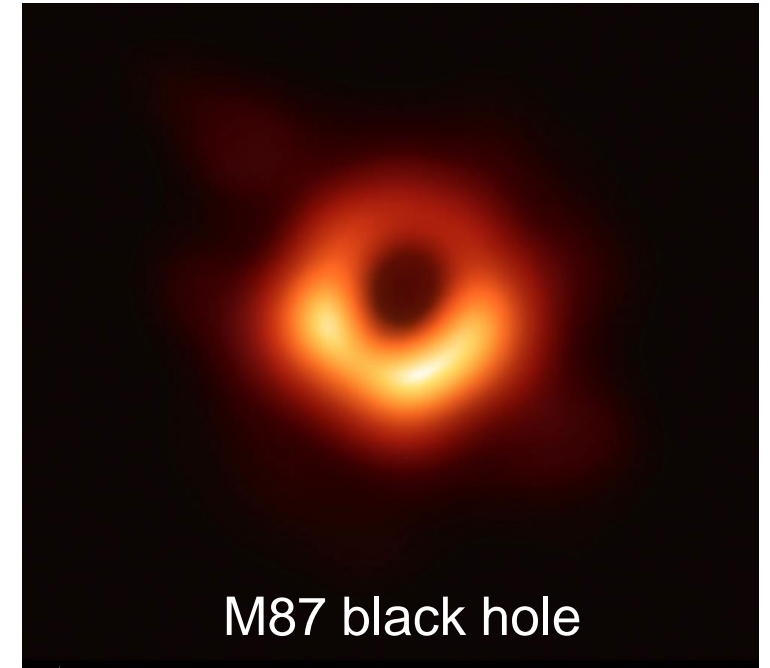
- For any tested direction, the TS is used to evaluate a p-value
- When needed, the p-value is further penalised for the “look else-where” effect

# Catalogue Search

## Individual source results



- Hottest source: M87,  $1.7\sigma$
- TXS 0506+056 only multi-flare source
- No hints of time-dependency from NGC 1068



M87 black hole

# Catalogue Search

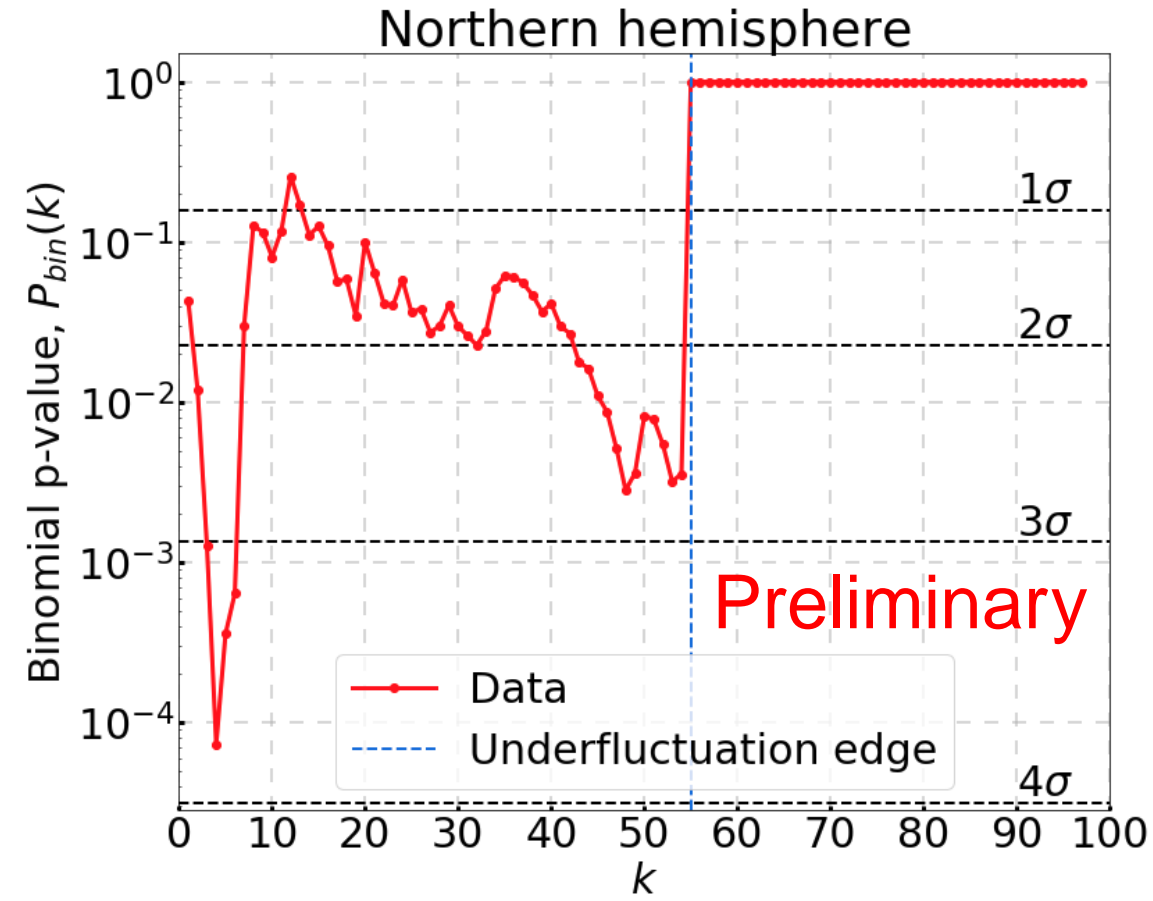
## Population Test

Looks for a cumulative excess of neutrinos from a subset of sub-threshold sources

Source p-values are sorted and a binomial p-value is evaluated for each source index  $k$ :

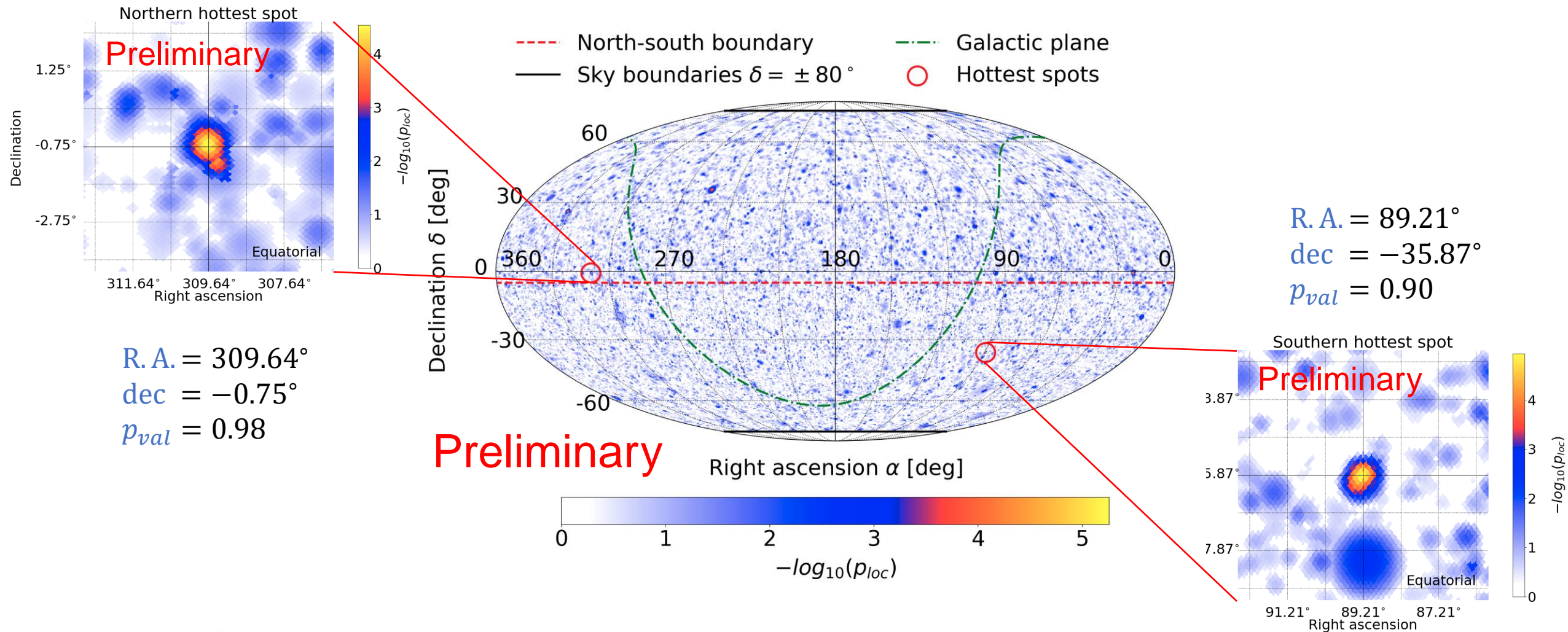
$$P_{bin}(k) = \sum_{m=k}^{N_{src}} \binom{N}{m} p_k^m (1 - p_k)^{N-m}$$

**Result:** Excess in Northern sky at  $3.0\sigma$  when  $k = 4$  sources are considered (M87, TXS 0506+056, NGC 1068, GB6 J1542+6129)



# All-Sky Search

## Hottest Spot



# All-Sky Search

## Population Test

Looks for a cumulative excess from sub-threshold hot spots in the sky.

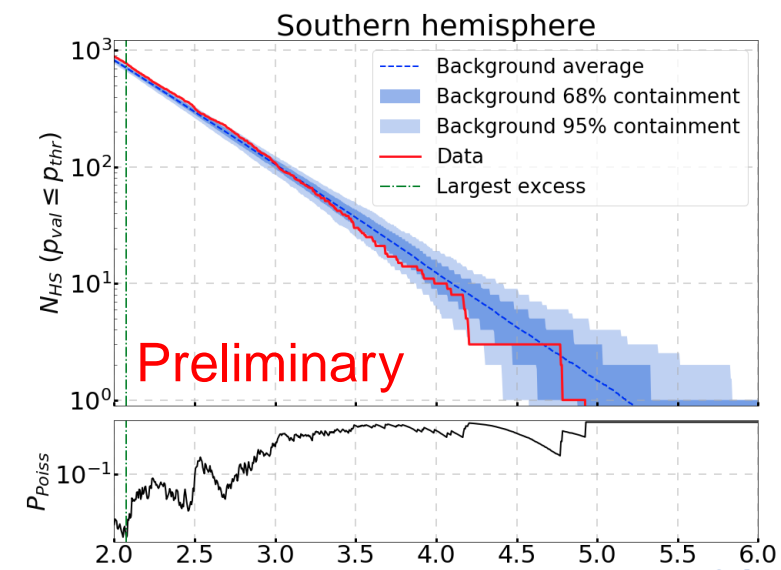
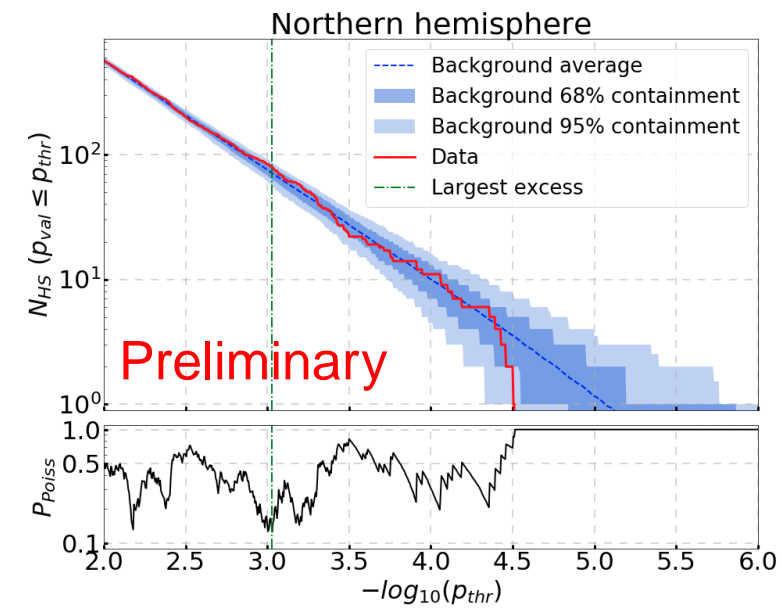
Based on Poissonian statistics:

$$P_{Poiss}(p_{thr}) = e^{-\lambda(p_{thr})} \sum_{m=k(p_{thr})}^{\infty} \frac{\lambda(p_{thr})^m}{m!}$$

↑ Expected hot spots  
↓ Observed hot spots

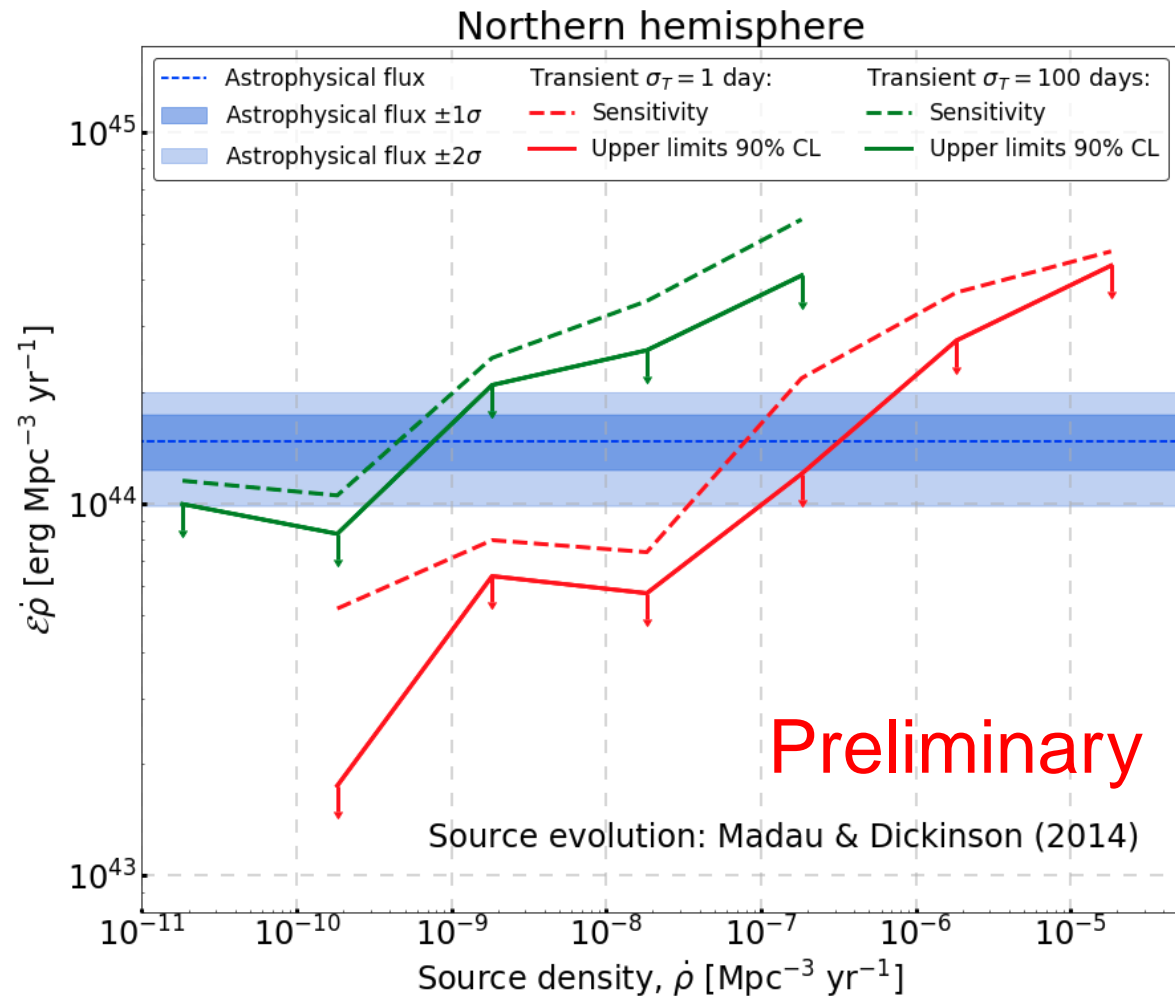
After scanning some  $p_{thr}$ , the smallest  $P_{Poiss}(p_{thr})$  is selected and corrected for the “look else-where” effect

Hemisphere	Corrected $P_{Poiss}$
North	0.85
South	0.22



# All-Sky Search

## Population Test



The population test is used to constrain the luminosity and density of a population of transient sources assuming:

- Single-flare emission
- Isotropic source distribution
- Source spectrum  $dN/dE \propto E^{-2.28}$
- Time scales of 1 and 100 days
- Source evolution: [Madau & Dickinson \(2014\)](#)

Simulations of flare intensities and source distributions are based on [FIRESONG](#)



# Conclusions

- A multi-flare method has been implemented in the IceCube likelihood
- No significant transient sources are observed, although promising hints come from the catalogue search
- The all-sky results are used to constrain the parameters of an hypothetical all-sky population of transient sources
- In the near future, improvements of the analysis and additional data can bring interesting results. Stay tuned!

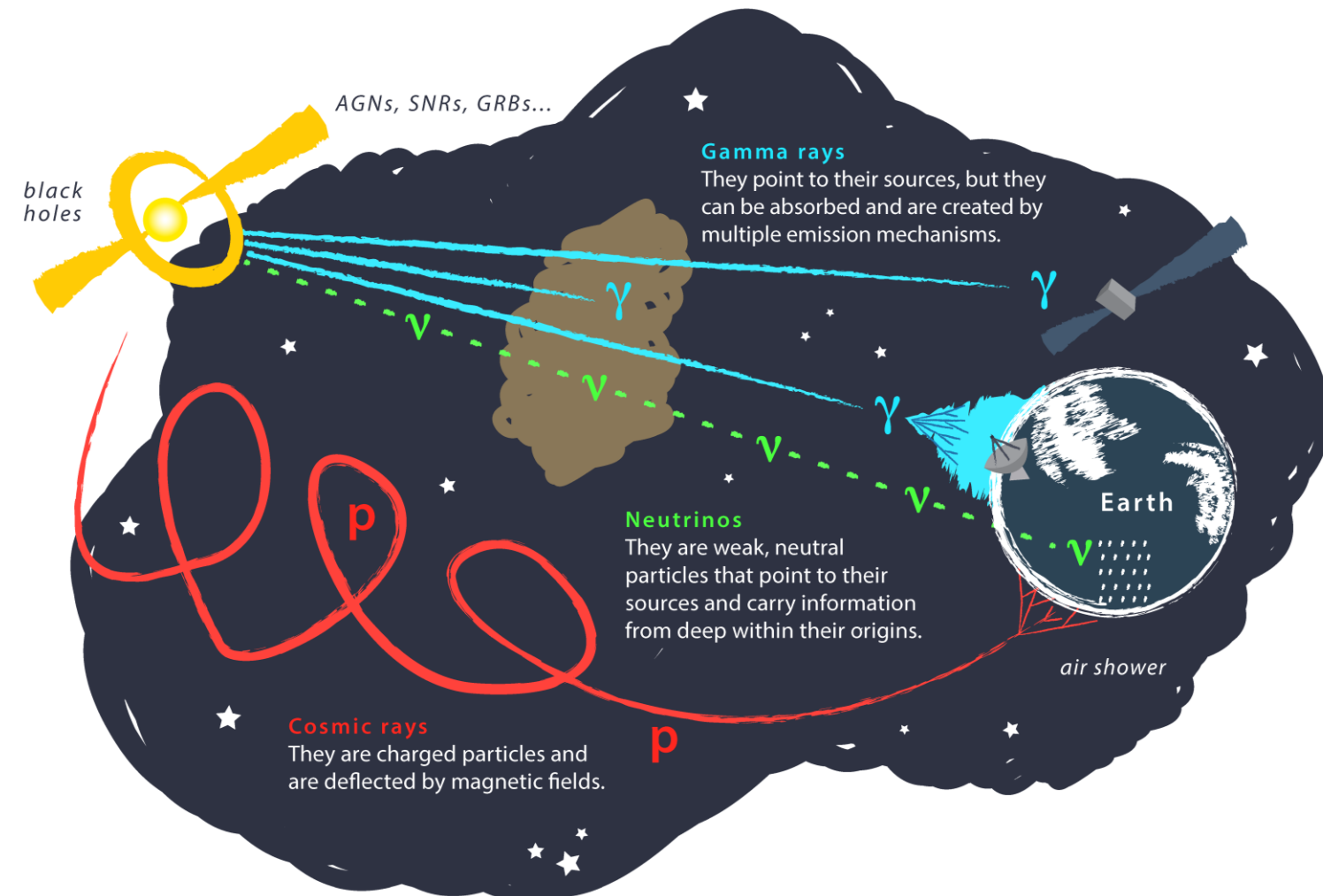


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SCHWEIZERISCHER NATIONALFONDS  
FONDO NAZIONALE SVIZZERO  
SWISS NATIONAL SCIENCE FOUNDATION

We wish to acknowledge the Swiss National Science Foundation for its support in this and other IceCube analyses

**BACKUP**

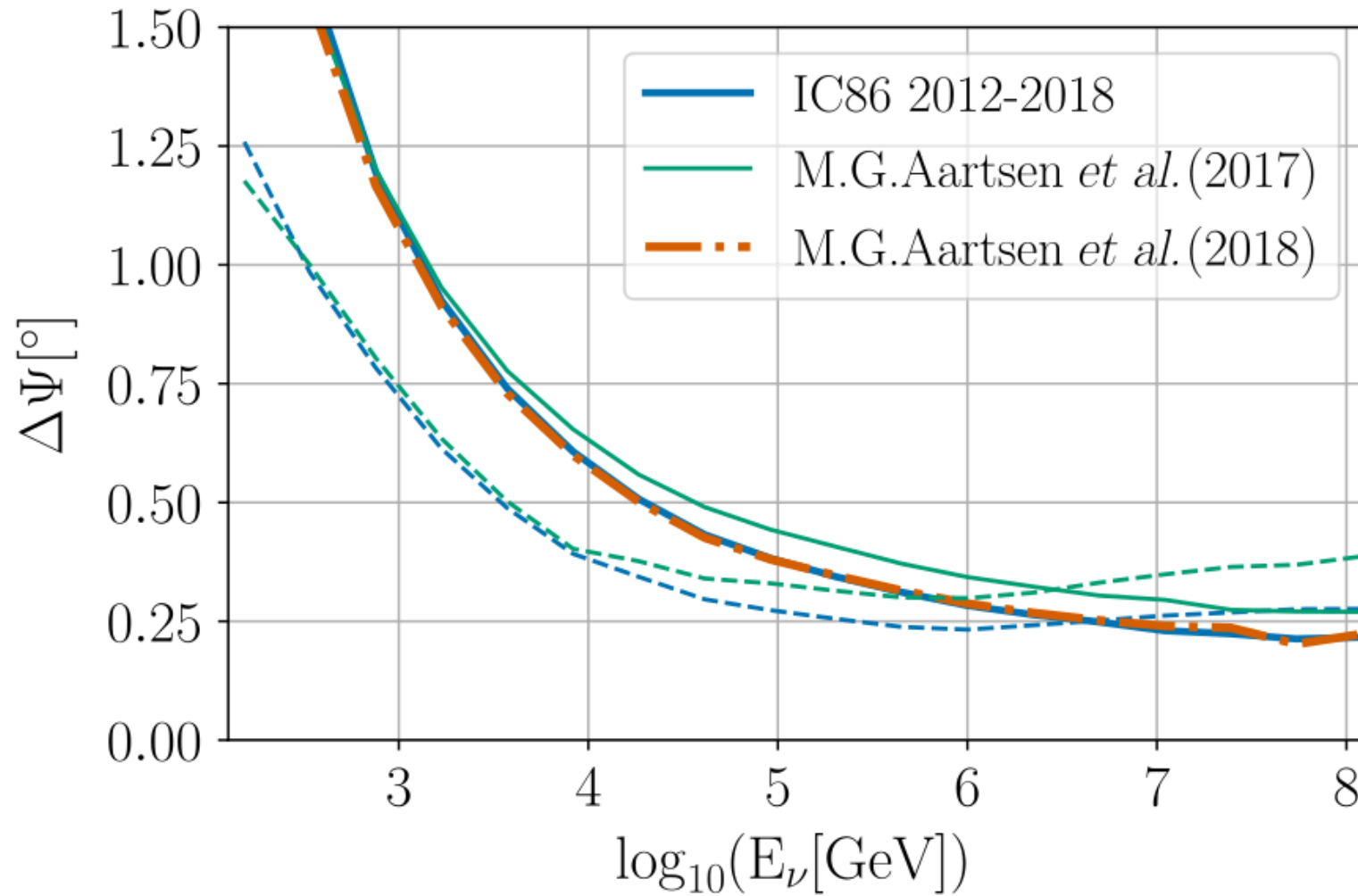
# Why Neutrino Astronomy?



Astroparticles in the multi-messenger era:

- **Cosmic rays**
  - Easy to detect
  - Deflected by magnetic fields
  - Interact during travel
- **Gamma rays**
  - Easy to detect
  - Point back to the source
  - Absorbed during travel
- **Neutrinos**
  - Difficult to detect
  - Point back to the source
  - Travel unaffected through the Universe

# Angular Resolution

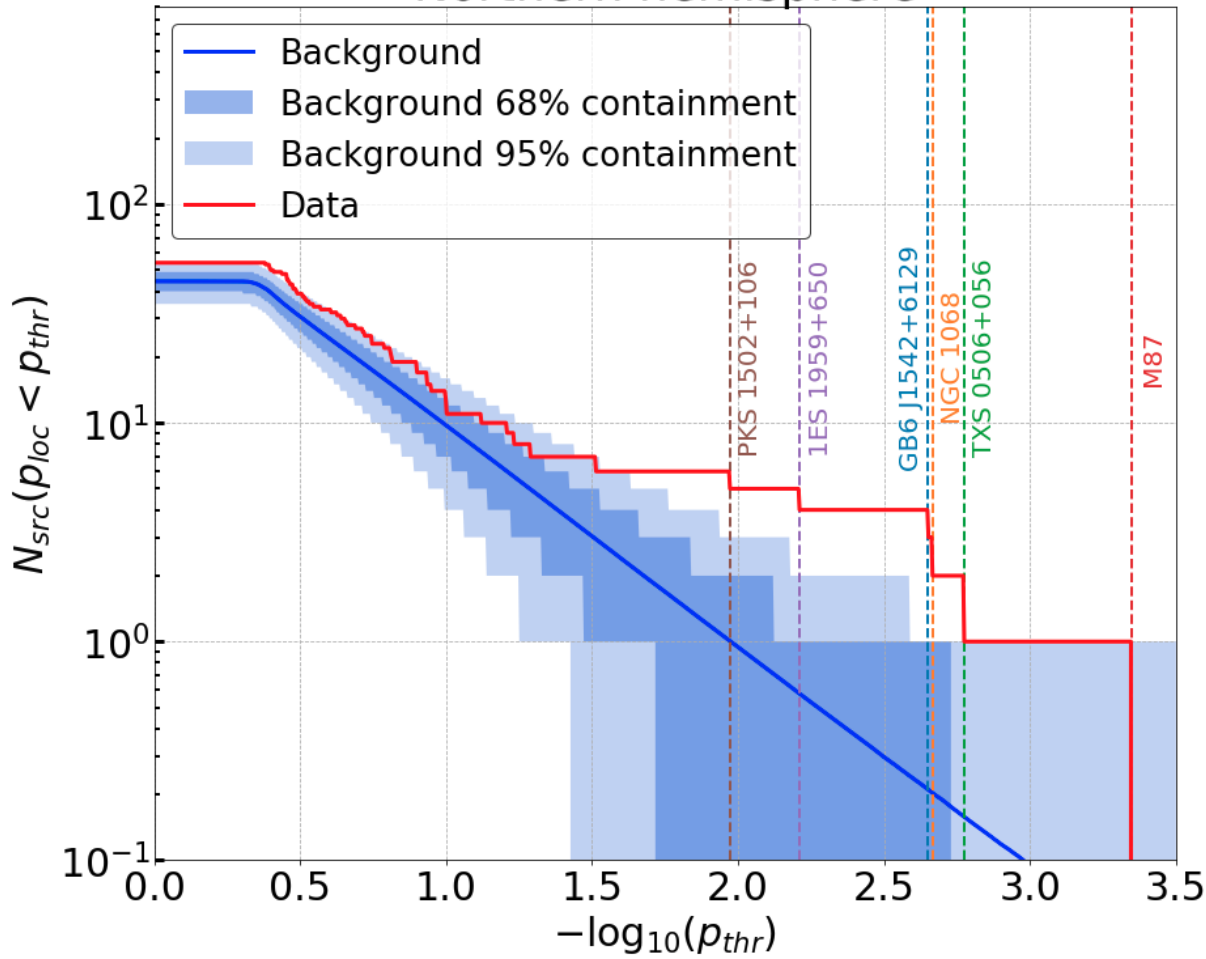


Solid lines: Northern hemisphere  
Dashed lines: Southern hemisphere

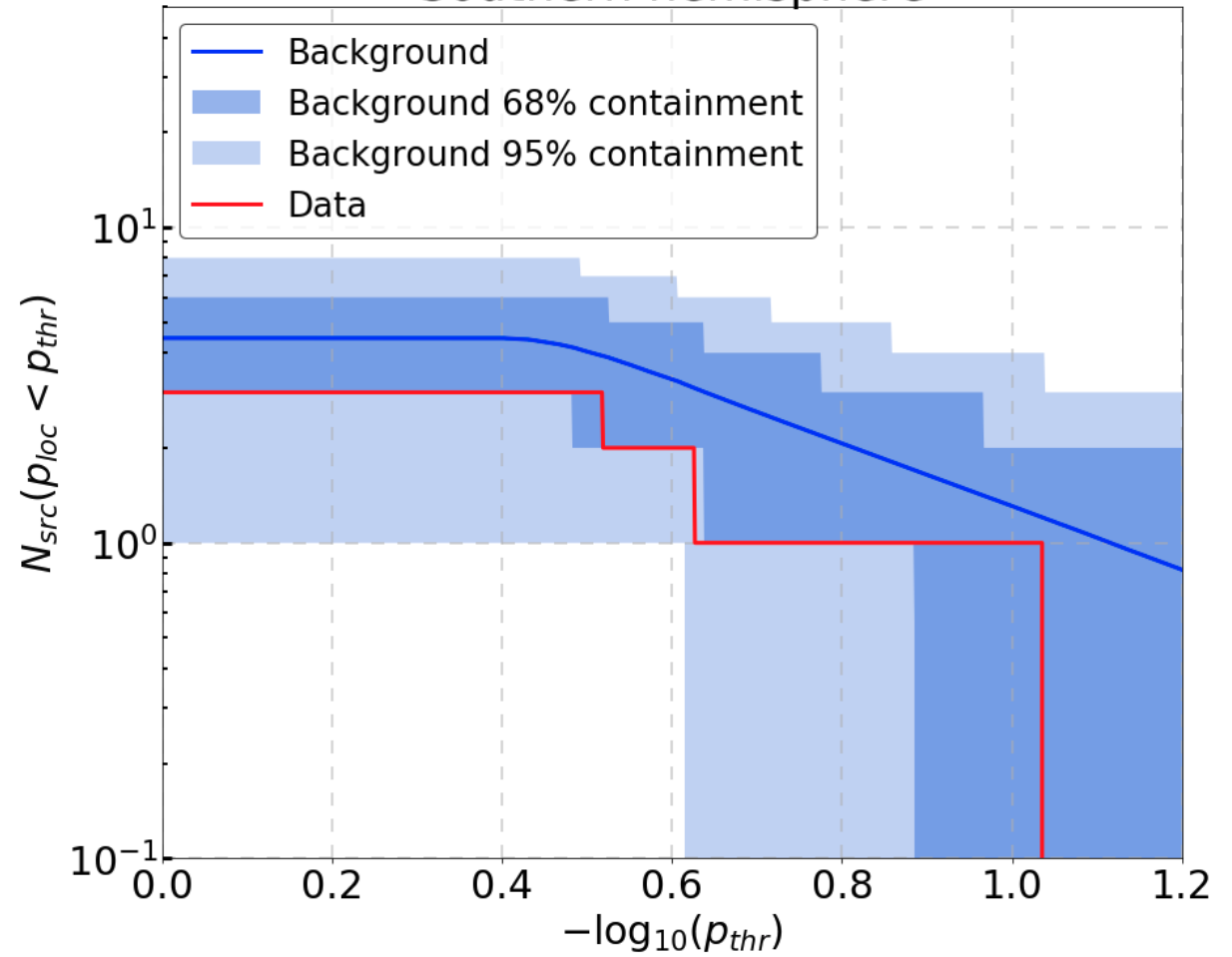
# Catalog Search

## Source p-values

Northern hemisphere



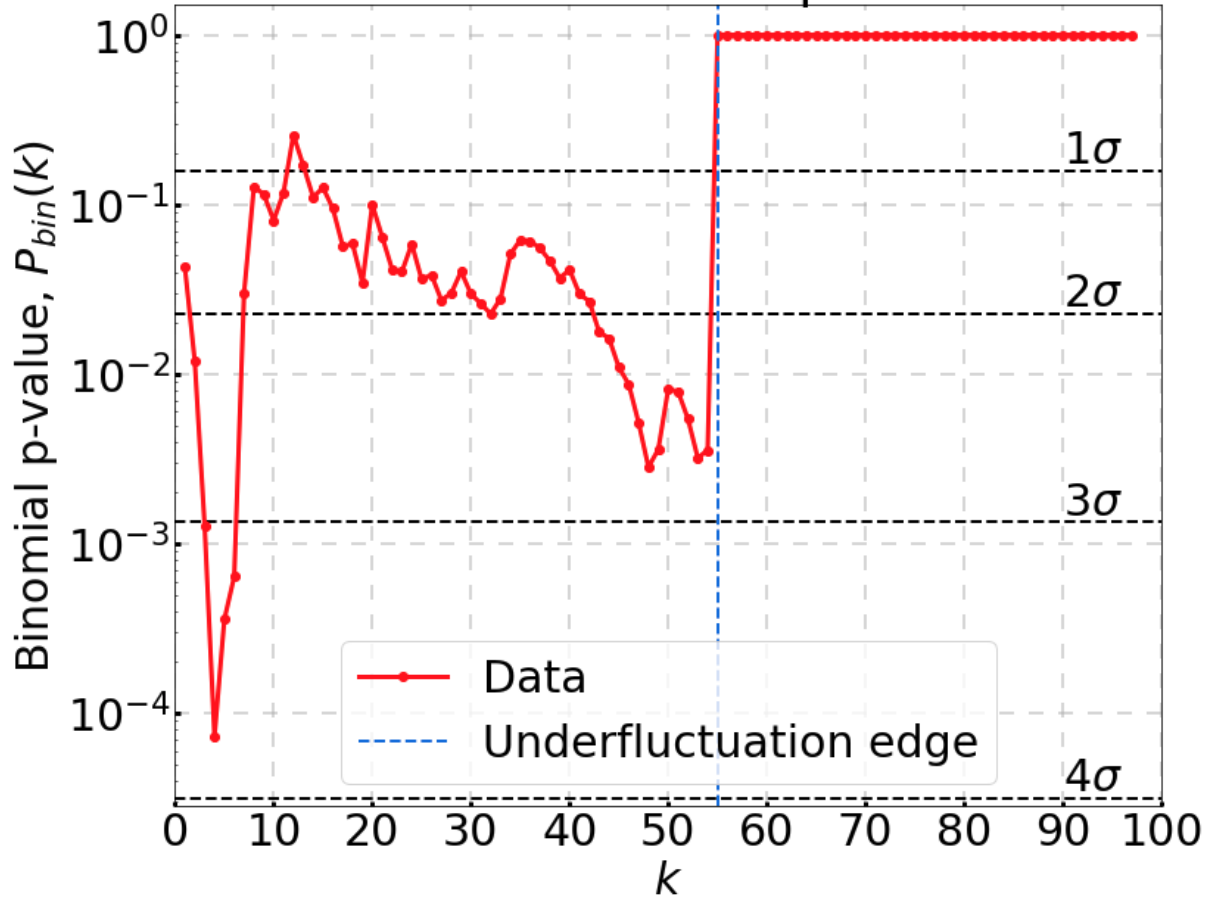
Southern hemisphere



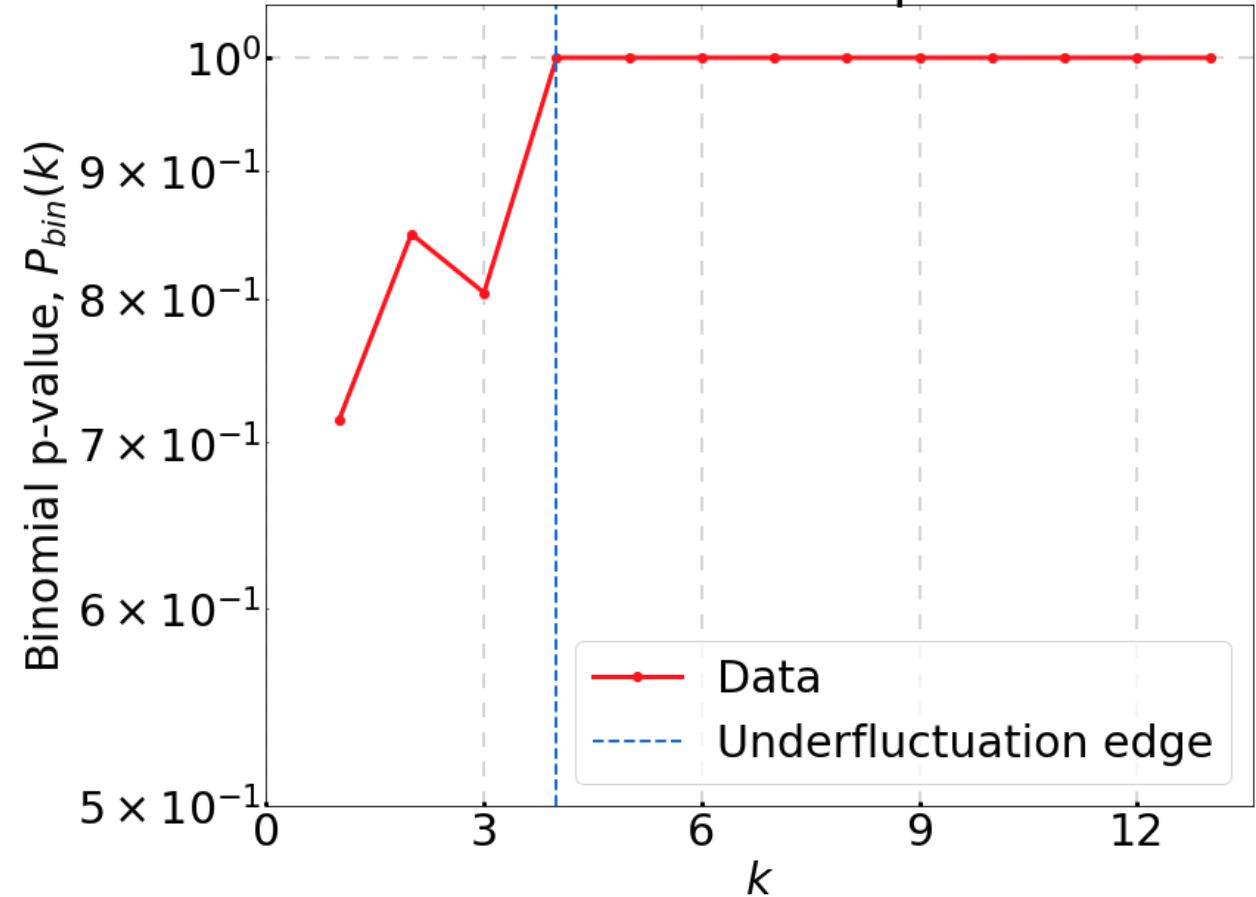
# Catalog Search Population Test

## Binomial p-value

Northern hemisphere

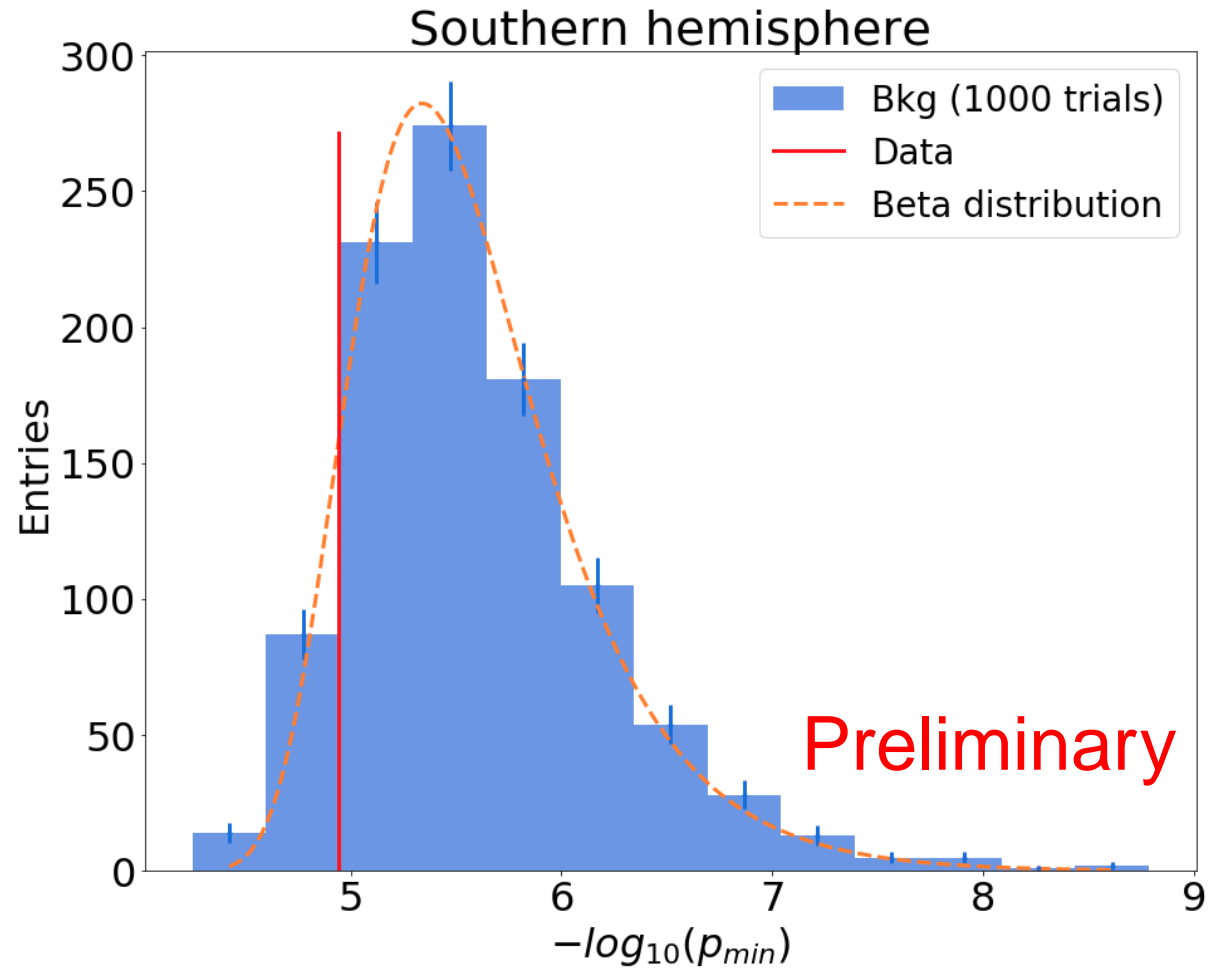
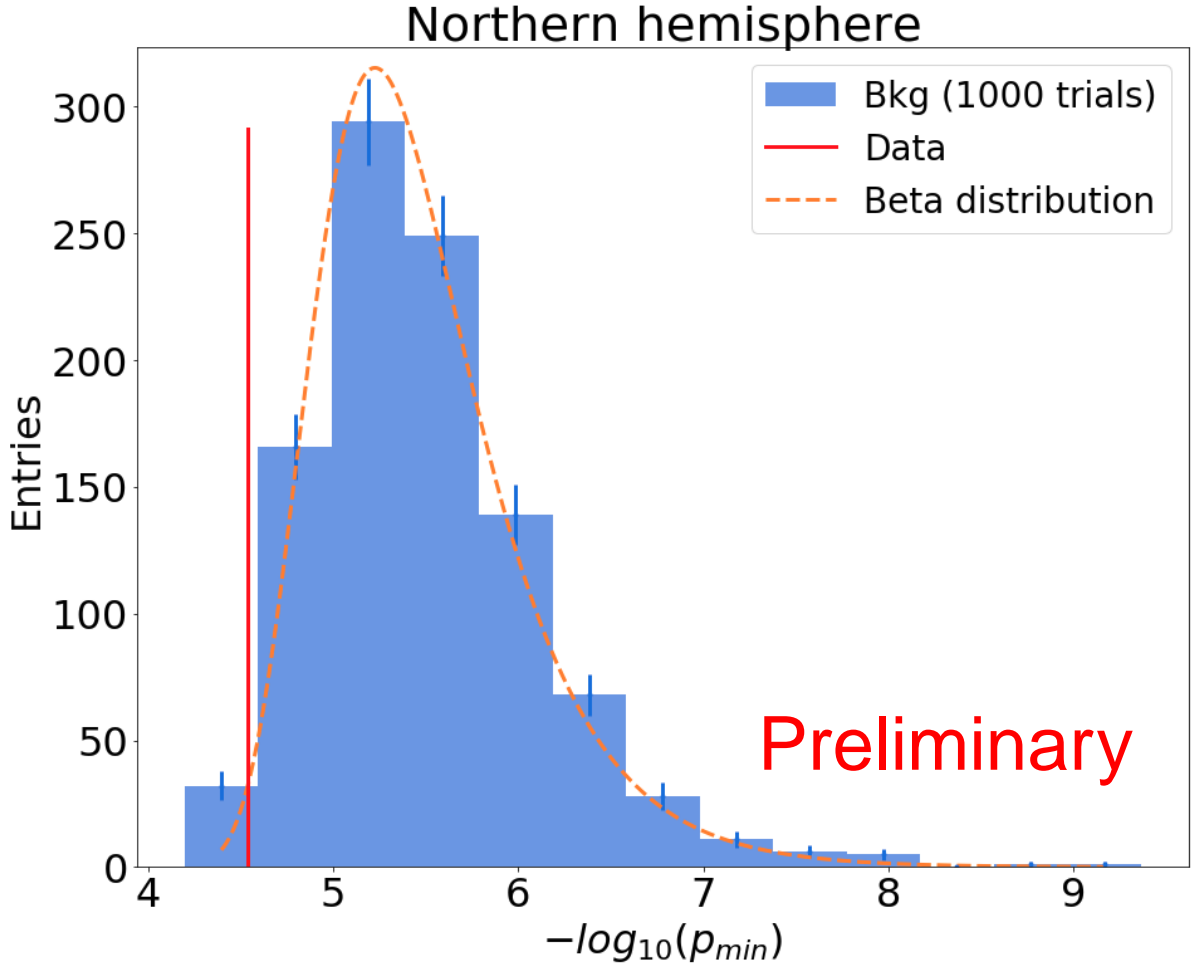


Southern hemisphere



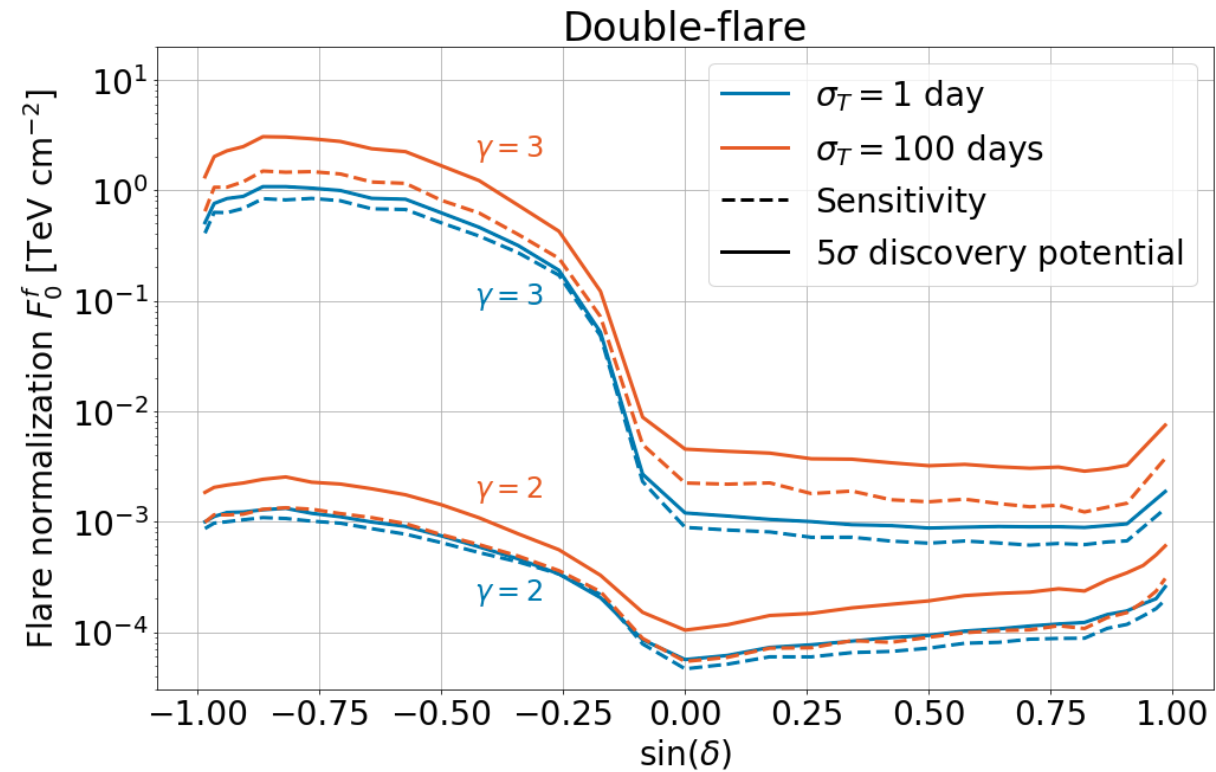
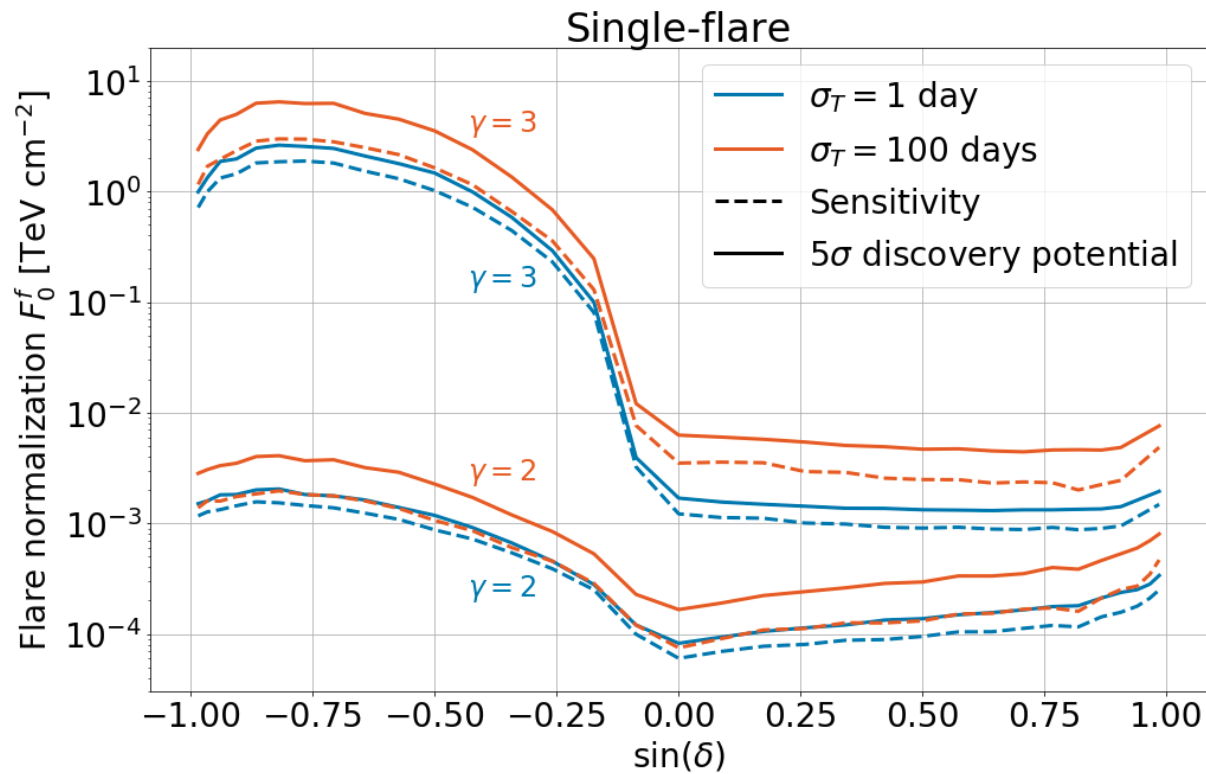
# All-Sky Hottest Spot

## Post-trial p-value



# All-Sky Sensitivity

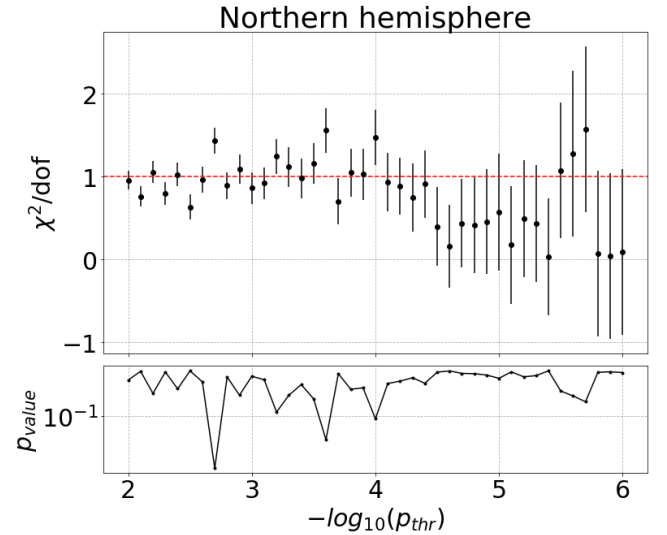
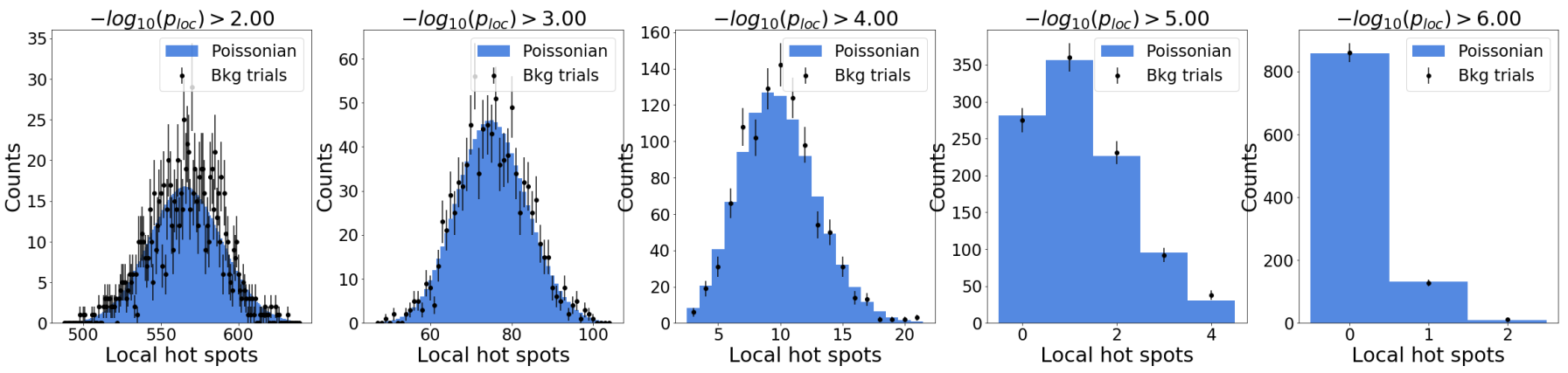
$$\Phi(E, t) = \sum_{f=\text{flares}} \frac{F_0^f}{\sqrt{2\pi}\sigma_T^f} \left(\frac{E}{\text{TeV}}\right)^{-\gamma^f} G(t|t_0^f, \sigma_T^f)$$



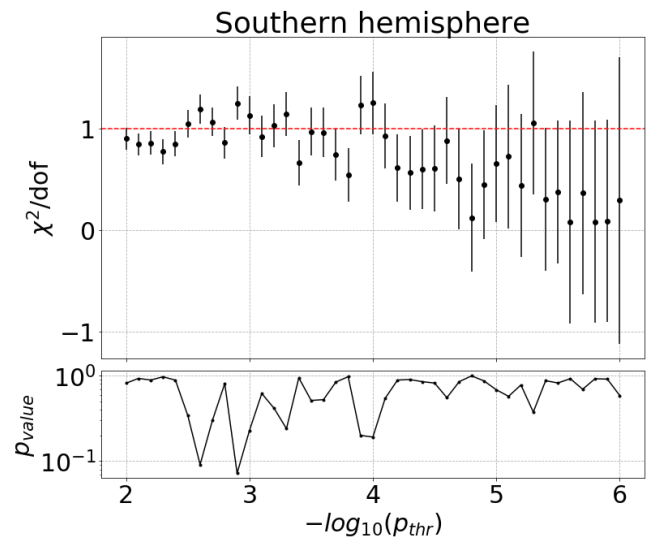
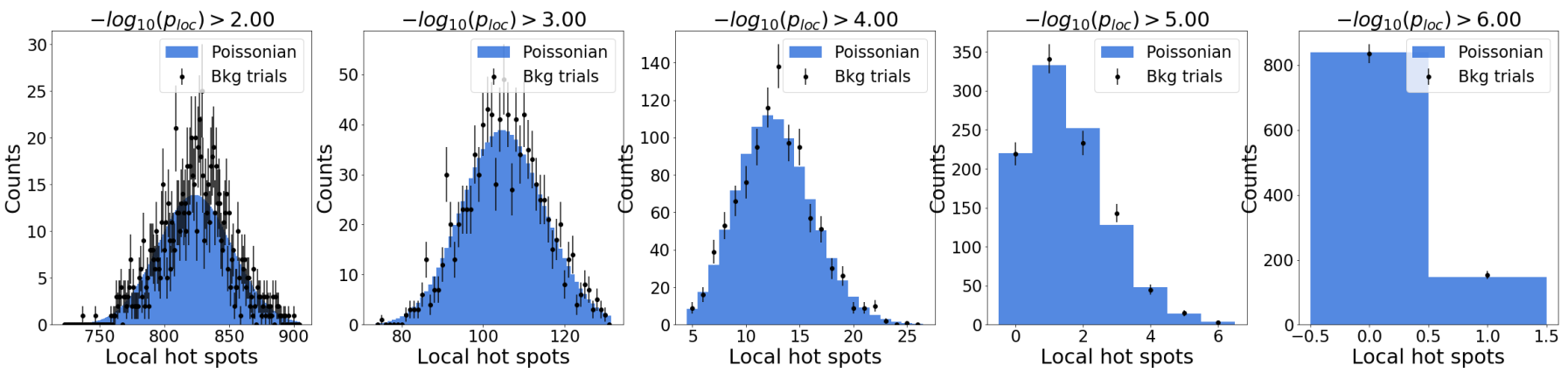


# Hot Spot Distribution

## Northern hemisphere



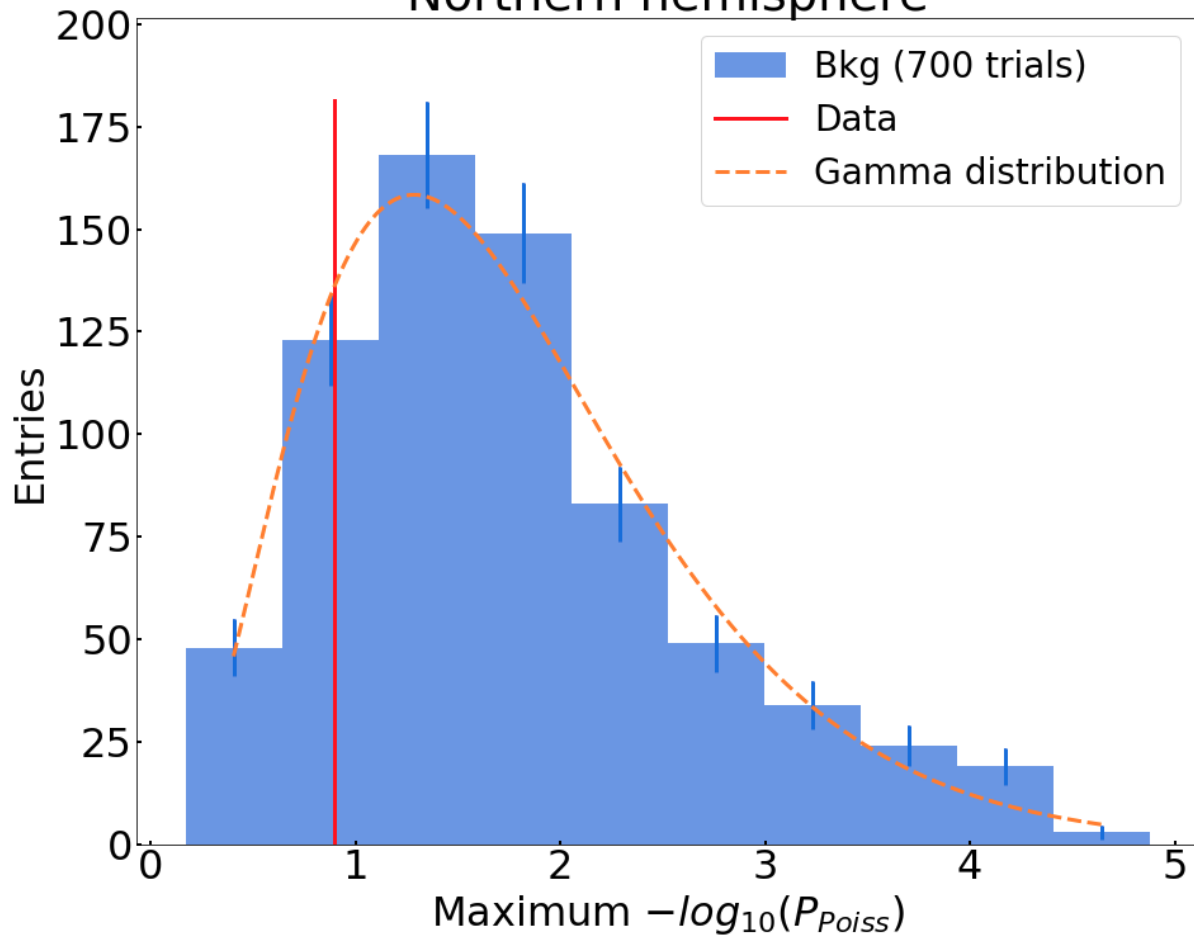
## Southern hemisphere



# All-Sky Population Test

## Post-trial p-value

Northern hemisphere



Southern hemisphere

