

cherenkov elescope array





# A Catalog Pipeline for Sources in the CTA Galactic Plane Survey

Treasures hidden in high energy catalogues Toulouse, May 2018

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## **Surveys – Key CTA Science Projects**

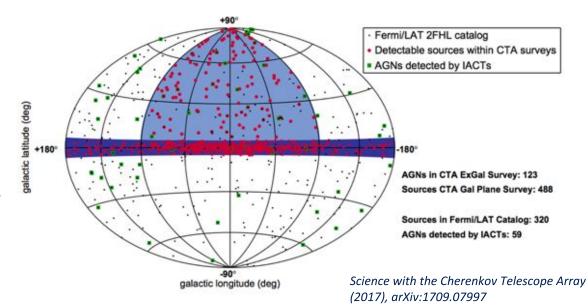


#### **Extragalactic Survey**

- |*l*|< 90°, *b* > 5°
- Better understand TeV population of AGN

### **Galactic Plane Survey**

- |*b*| < 5°
- All longitudes (at varying sensitivity)

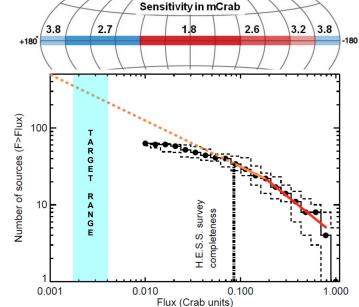


Cardenzana - Treasures hidden in high energy catalogues

# Galactic Plane Survey (GPS)

Survey of the Galactic plane to address:

- Physics & census of Galactic gamma-ray source populations (SNR, PWNe, binaries, etc...)
- Identifying possible PeVatron candidates
- Characterize the diffuse Galactic gamma-ray emission
- Study the origin of cosmic rays



+90

Science with the Cherenkov Telescope Array (2017), arXiv:1709.07997





### **Method Overview**



Pipeline for generating catalog of sources from survey data (built on GammaLib and ctools)



#### The gist:

- Input data and background model
- Returns fully parameterized list of additional sources in that data
- Provide tools for assessing the results of the analysis

#### **Additional Resources:**

- Tools for source detection
- Tools for iterative source fitting
- Macros for studying results

## **Source Detection (finding seeds)**

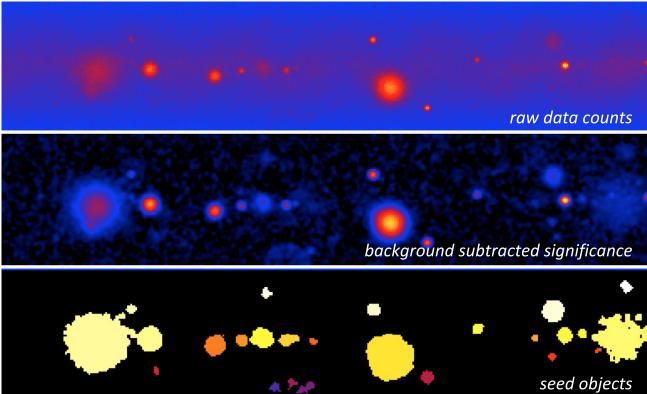


#### How it works:

- Compute a significance map based on observed & predicted counts
  - depending on region size & model type, this can take a lot of time
- Apply technique based on the SExtractor method (<u>https://doi.org/10.1051/aas:1996164</u>)
  - identifies individual pixels above a given threshold (typically >3σ)
  - connect nearby pixels to identify "objects" (these are individual sources)
  - done in a single pass over the map (i.e. it's pretty fast)
  - de-blend objects to detect overlapping sources
  - Tuning parameters: significance threshold, pixels per object, deblend levels

## **Source Detection (finding seeds)**





#### Raw data counts map

Significance map after accounting for expected background events and interstellar emission

Detected seeds input

to fitting algorithm (colored by seed ID)

## **Source Fitting**



#### How it works:

- Take seeds from source detection
  - Each source starts as point source with sub-sensitivity flux
- Iteratively fit all sources:
  - Fit source
    - If source is new, test extension (disk, Gaussian)
  - Evaluate fit validity (reasonable parameters & extension)
  - Do this for every source
- Loop until all sources have converged (ΔTS < 10)</li>
  - Remove insignificant sources (final TS < 10)</li>
- Test for spectral curvature
- Reoptimize all parameters



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# **Testing the Pipeline**

## **Testing on Simulation of GPS**



#### **Purpose:**

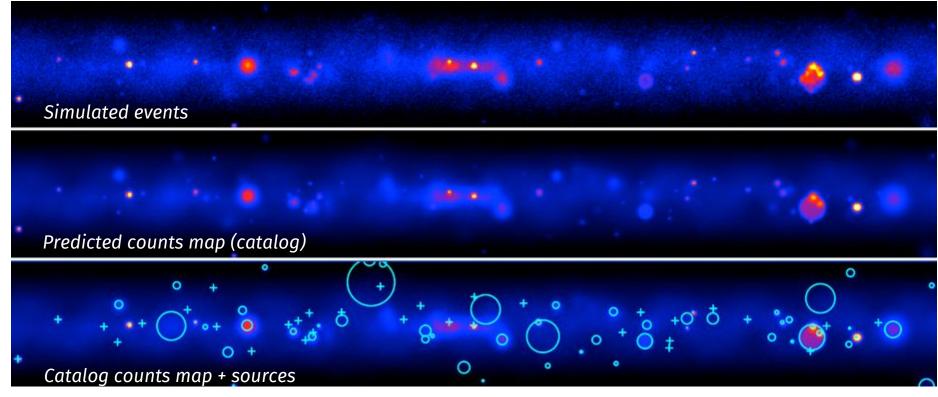
- Stress test analysis methods on mock-up "data"
- Simulate (somewhat realistically) the CTA GPS data will obtain
  - Includes sources modeled based on existing observations

#### Caveat:

• The simulation should only be considered as a means to test software tools and not a representation of what CTA will ultimately see.

### **Testing on Simulation of GPS**

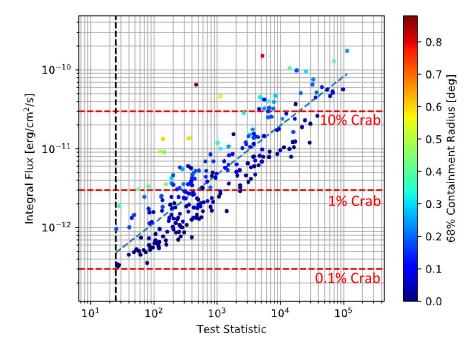




### **Source Distribution – TS vs. Flux**

#### Noteable features:

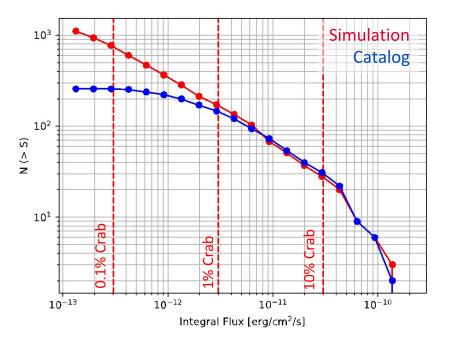
- Trend between detection significance & flux
- Appear to miss sources at low flux
  - Optimize detection parameters?
  - Optimize energy threshold for detection





# Comparison to Simulation – logN-LogS

- Appear to miss sources at low flux
  - May need looser detection criteria
  - Alternative source detection methods



### **Comparison to Simulation**



Each source is compared to simulated sources by:

- Centroid position & 68% containment radius (closest match => association)
- No consideration for flux (to avoid biases)

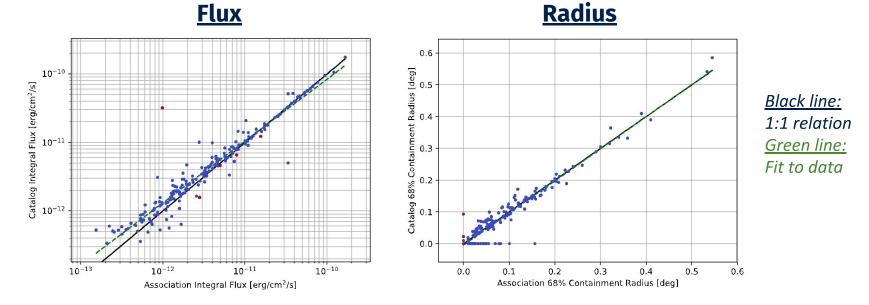
#### **Results:**

- Associated: 80.6%
- Unassociated: 19.4%
  - Spurious sources
    - (e.g. fluctuations in diffuse gamma-ray background)
  - Source confusion
    (e.g. multiple overlapping sources detected as single source)

### **Comparison to Simulation**



- Integrated source flux (0.1 100 TeV)
- Red dots denote variable sources (*binaries & pulsars*)



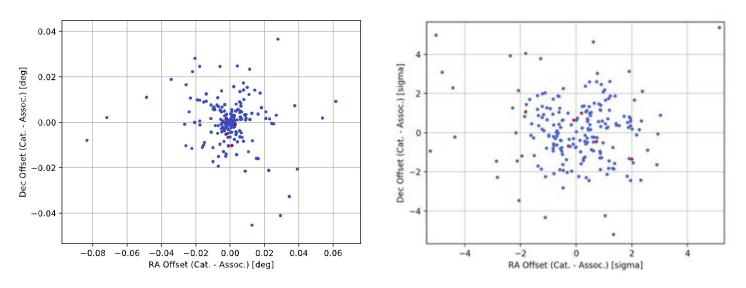
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### **Comparison to Simulation - Centroid**



Distribution of catalog RA,Dec vs. association RA,Dec:

- Most points within 1 bin width (0.02°)
- Most sources reasonably close to the corresponding association





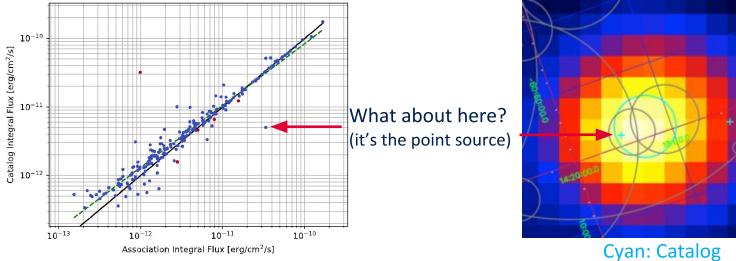
## **Source Confusion:**

- Overlapping sources
- Properly modeling extended sources

#### May 2018

### **Overlapping sources**

• Another large outlier in the flux plot is actually a multiple association





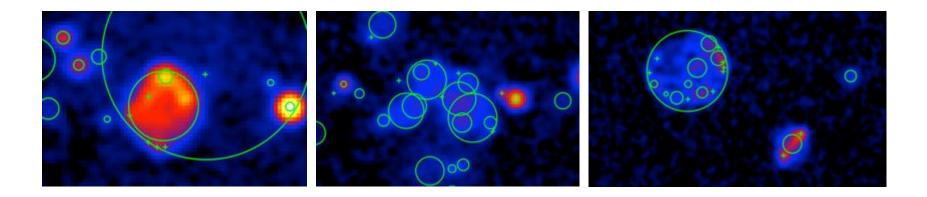


### **Issue – Diffuse sources**



Multiple detections are a problem for extended structures

- Most sources will NOT be well described as a 'Gaussian' or 'disk'
- How to identify these objects as the same object?



### Summary



#### Latest work:

- Framework exists for detecting & characterizing sources in CTA data
- On the right track (also not the only survey tools being developed)

#### Things to be Mindful of:

- Cannot try every model combination:
  - Limits on computation time, degrades significances
- Extended, diffuse sources are complicated
  - Can reconstruct as multiple overlapping sources (also seen in HGPS)
  - Need to statistically assess how likely these are to be the same source

#### **Open questions:**

- Do uncertainties in gamma-ray background impact detection/characterization?
  - Interstellar gamma-ray background + unresolved sources
  - Can be tested through simulations
- Investigate source detection optimizations
  - Adjust energy range, detection parameters, etc...
- MWL association of sources with other catalogs