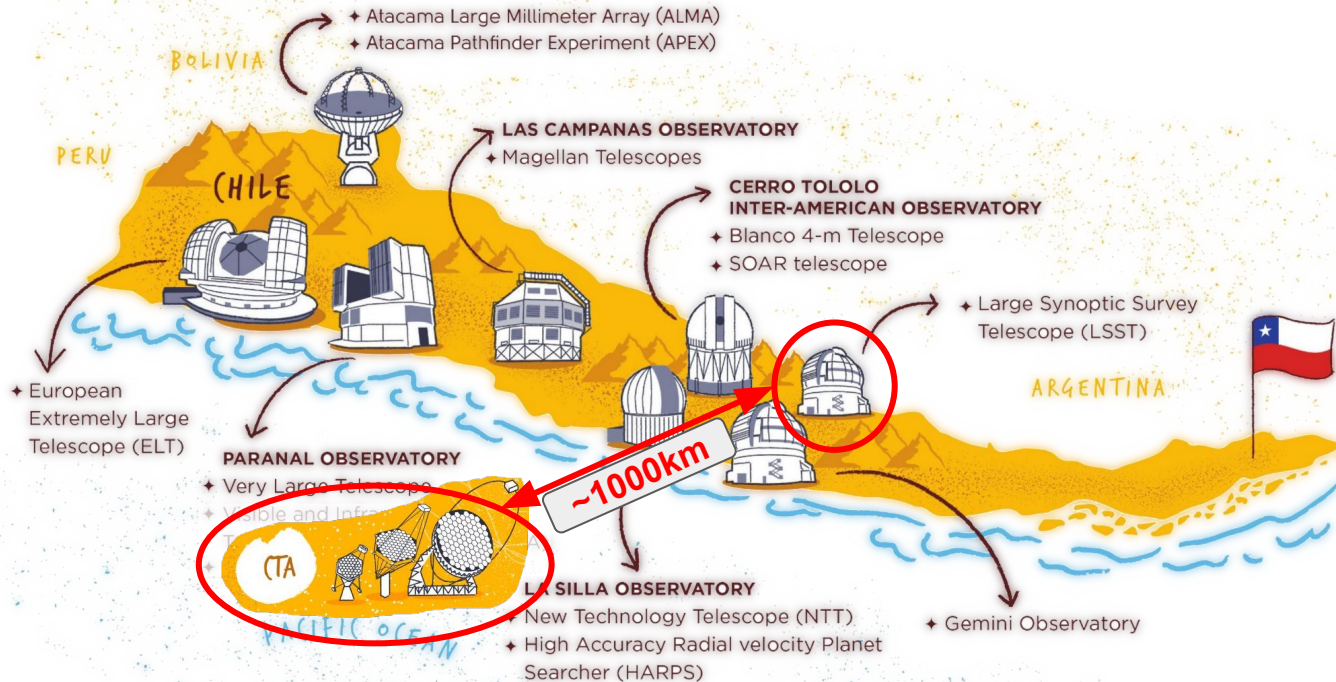


# Blazar multi-wavelength studies with Rubin and the CTAO

Julian Hamo, with Maria Kherlakian, Iftach Sadeh,  
Jonathan Biteau, Elisa Pueschel and **Julien Peloton**

# Chile: A bustling hub of astrophysics



# The Cherenkov Telescope Array Observatory

## Exploring the GeV-TeV sky

### Two observing sites to access any sky point

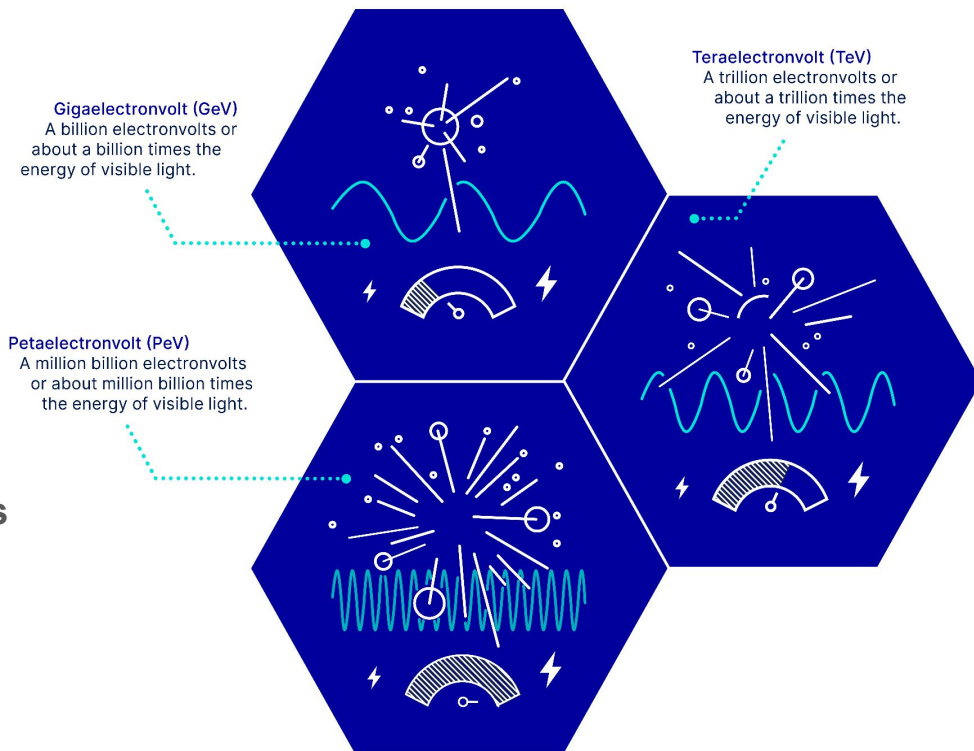
- Paranal, Chile (in between the ELT and VLT)
- La Palma, Canaries (close to MAGIC)

### Open observatory

- ~ 1/2 of the time on non-consortium proposals
- to be operated for 20+ years

### Enhancements with respect to its precursors (HESS, MAGIC, VERITAS)

- sensitivity × 5-10
- energy resolution × 1.5-2
- angular resolution × 1.3-1.4



# Science case: extreme states of blazars

## Blazars:

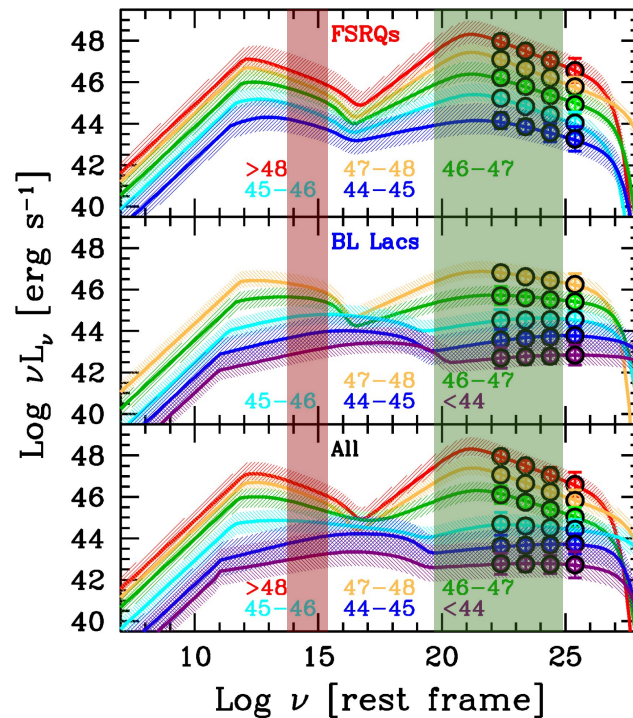
- jetted AGN with jet close to the line of sight
- Stochastic variability (no typical timescale)
- Non thermal emission processes

→ **optical** to X-ray emission: synchrotron radiation

→ X-ray to **gamma-ray** emission: Inverse Compton emission

Joint optical and gamma-ray observation constraint on emission processes, interaction around extreme environments, etc. →

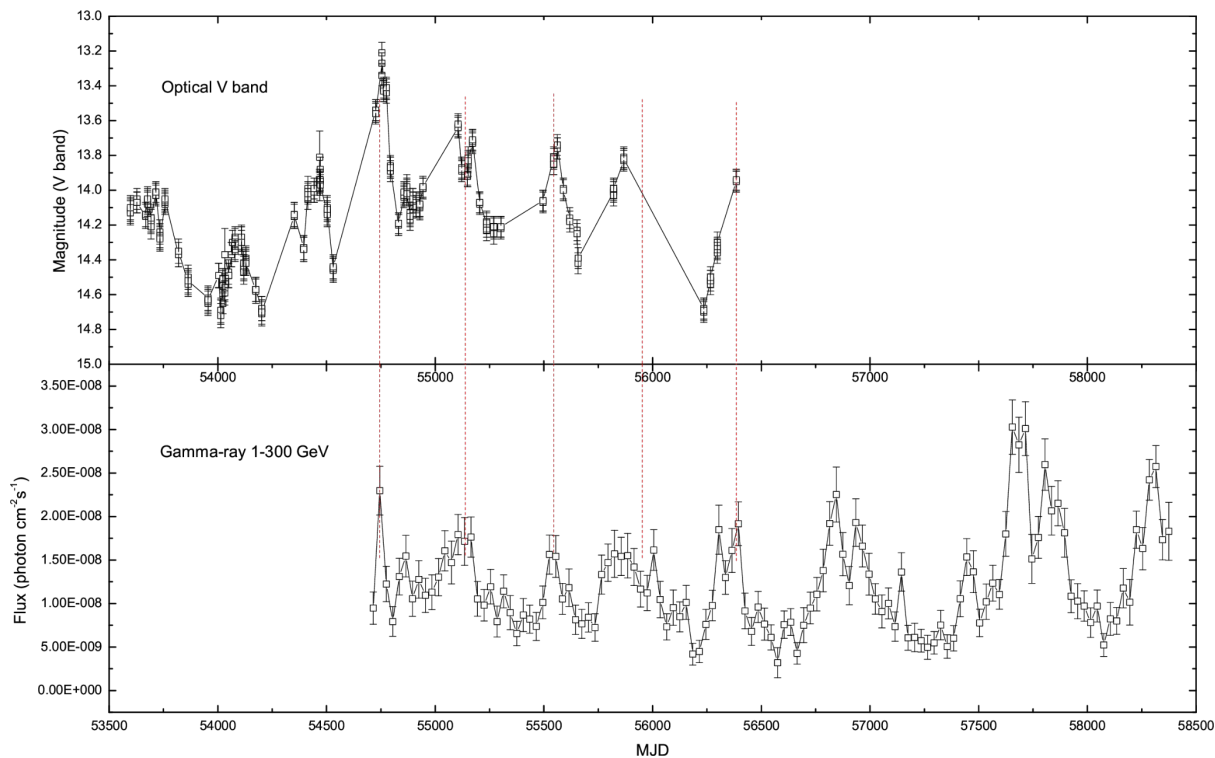
Already observed optical/gamma-ray correlations (cf. Hovatta+ '14, Liodakis+ '18, Liodakis+ '19)



Adapted from Ghisellini+ '17

# Motivations on the extreme state detection

- Known flare correlations between **optical** and **gamma-ray** emissions
- Theoretical models to explain such correlations through EC or SSC emissions
- Recent studies on population of blazars showing correlations for a fraction of the sources
- Suggest to study the implementation of **trigger** from optical to gamma-ray observations



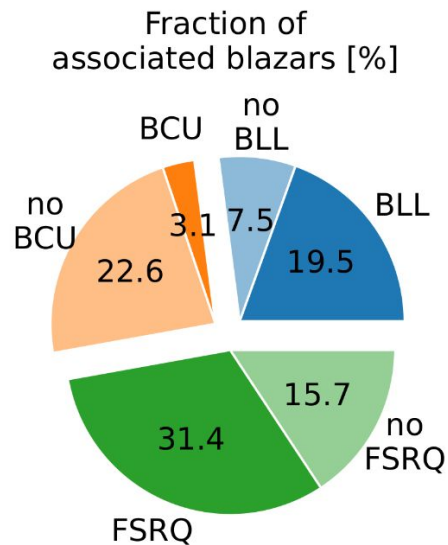
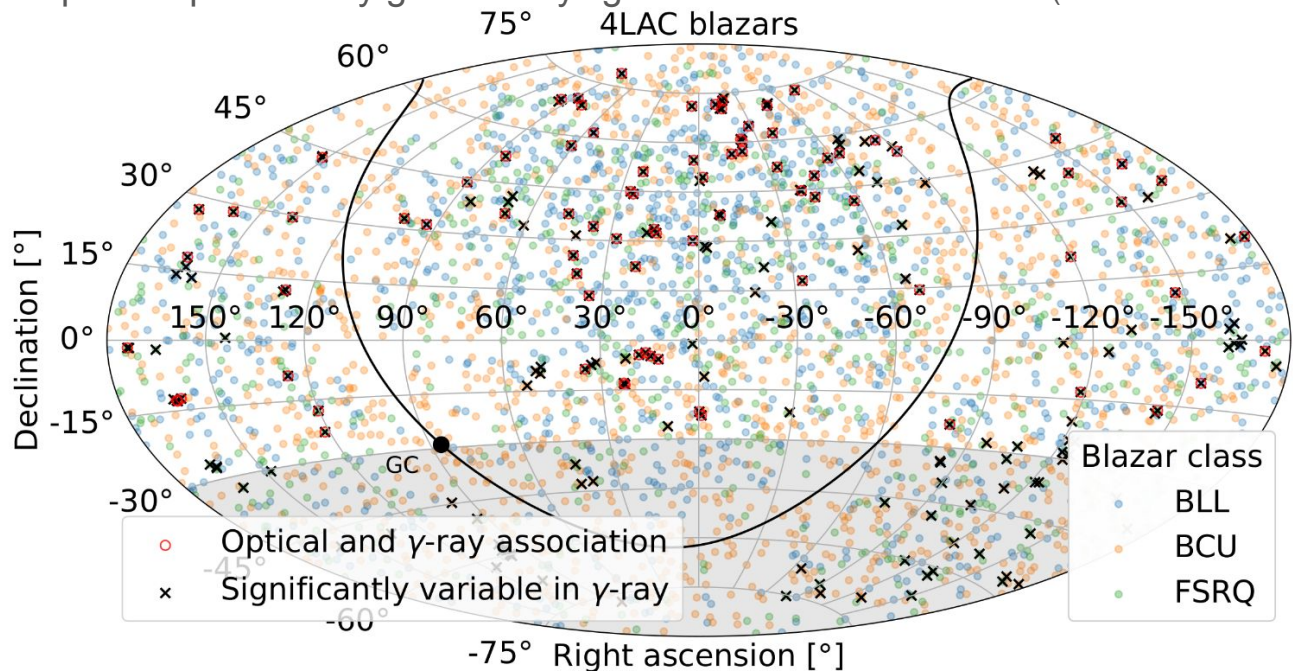
Adapted from Yang+ '20

# Selection of dataset

Gamma-ray blazars with significant optical variability:

→ 86 sources in common, with >150 ZTF measurements per source in g and r bands

→ aperture photometry gamma-ray light curves from *Fermi*-LAT (credit: J.P. Lenain)

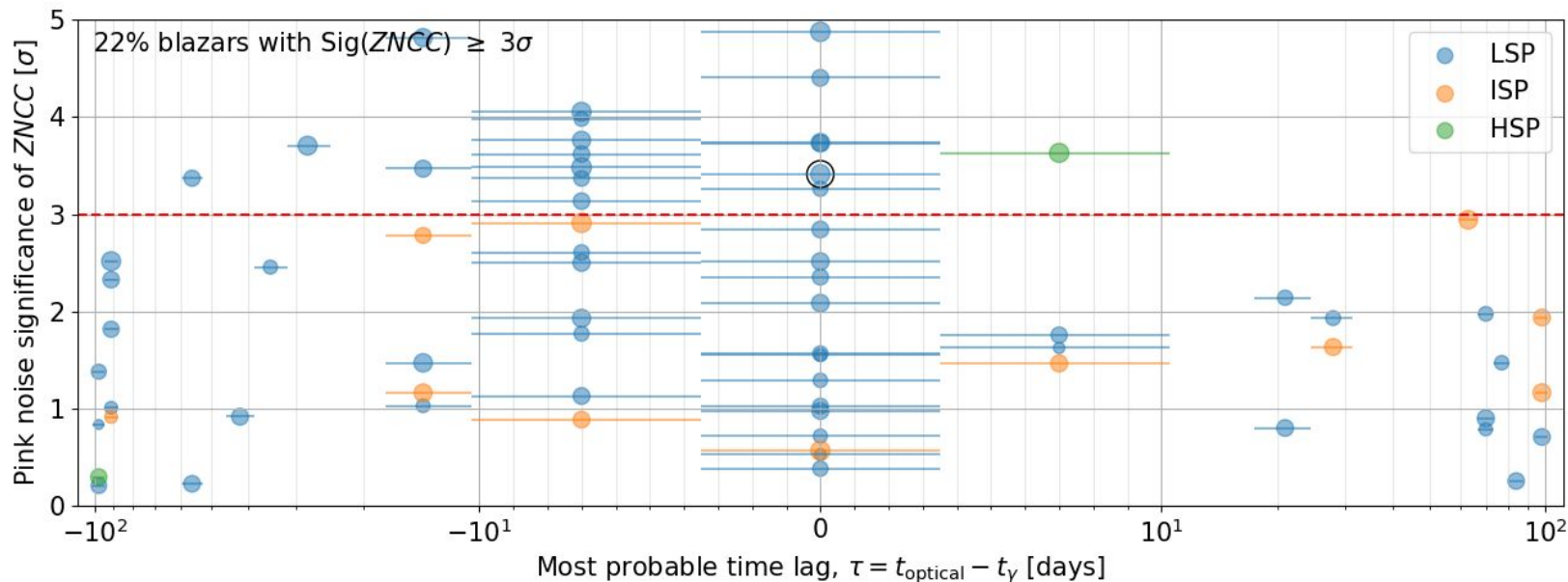


# Optical to gamma-ray correlations

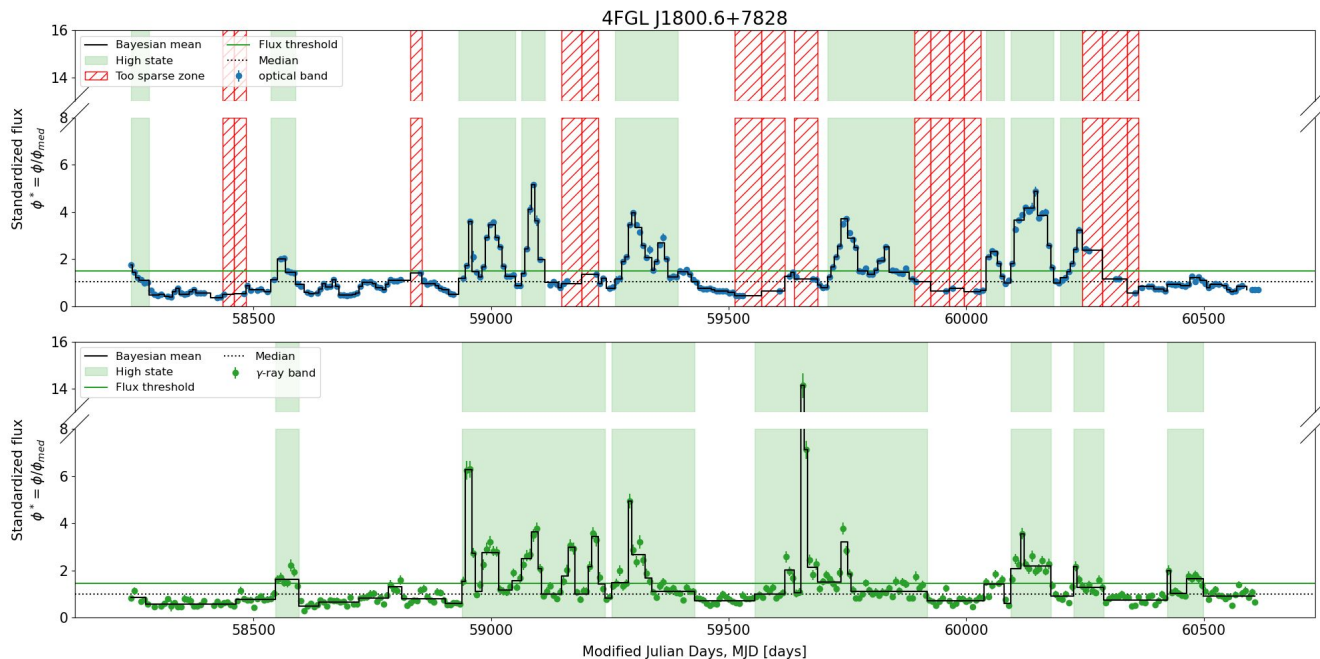
Similarity metric: cross-correlation over RMS of both light curves

→ ~60% sources: no time lag between optical and gamma-ray

→ ~20% sources:  $>3\sigma$  correlation  $\Rightarrow$  co-spatial production



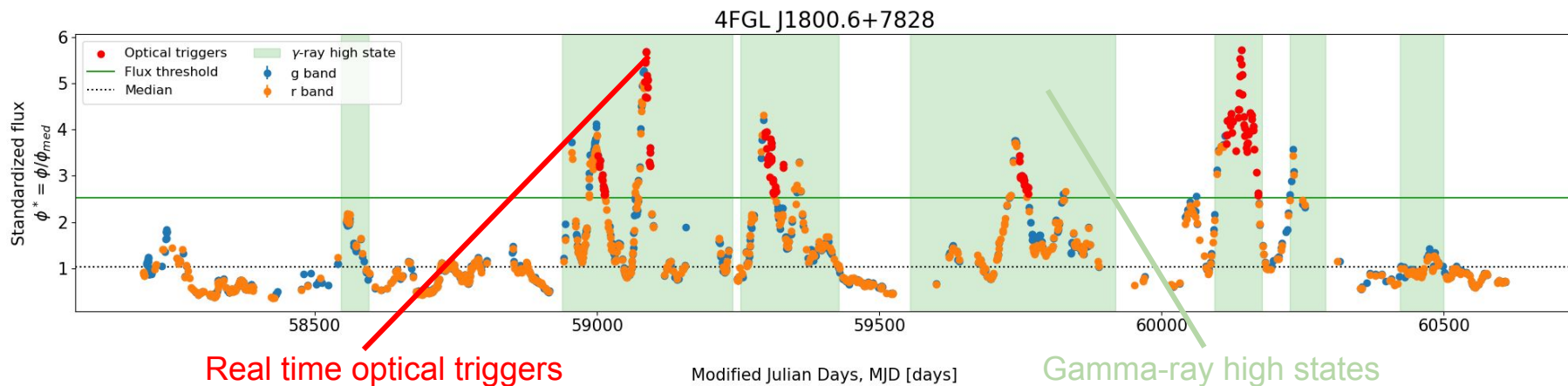
# Extreme state detection: superblock method



- **BL Lac & LSP (LBL)**
- Optical band accurate merging method
- Gamma-ray band from FLAapLUC (*Fermi*-LAT)
- Bayesian block construction  $\rightarrow$  steady flux states
- Selection of greatest quartile
- Merge of concomitant high states + rise and fall parts  $\Rightarrow$  superblock (= flare)

# Real time extreme state detection

- Threshold computed from DR light curve greatest decile
- Flare optical trigger: both measurement and fluence over last 30 days above threshold
- Triggers as proxy of start of gamma-ray high states for IACT observations



+ Soon to come:  $\gamma$ -ray flare alerts from *Fermi*-LAT (FlaapLUC: Lenain, '18)

# Methodology conclusion

## Metrics on flare optical triggers

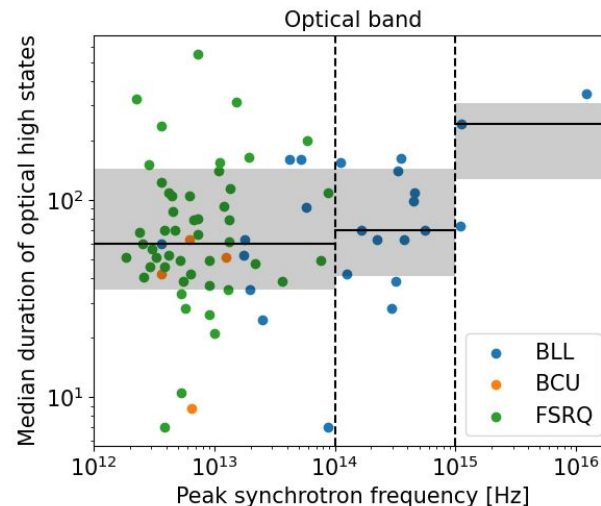
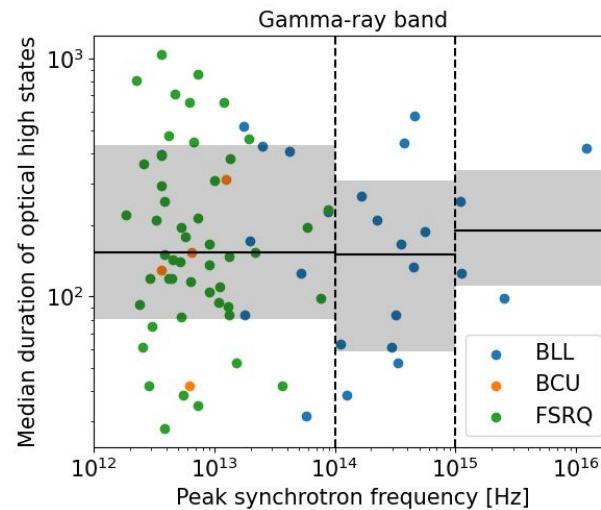
- Efficiency:  $12 \pm 2 \%$   
→ 0.2 detected new flares per source per year out of 1.6 new flaring states per source per year
- Purity:  $69 \pm 6 \%$

## Real-time first optical trigger

- $\langle t_{\text{trigger}} \rangle \sim 10$  days before the highest  $\gamma$ -ray flux
- fraction of the flare left after the trigger:  $\sim 76\%$

## Flare duration

- Not correlated with class of blazar
- Poorly correlated with  $v_{\text{syn}} \Rightarrow$  important spread

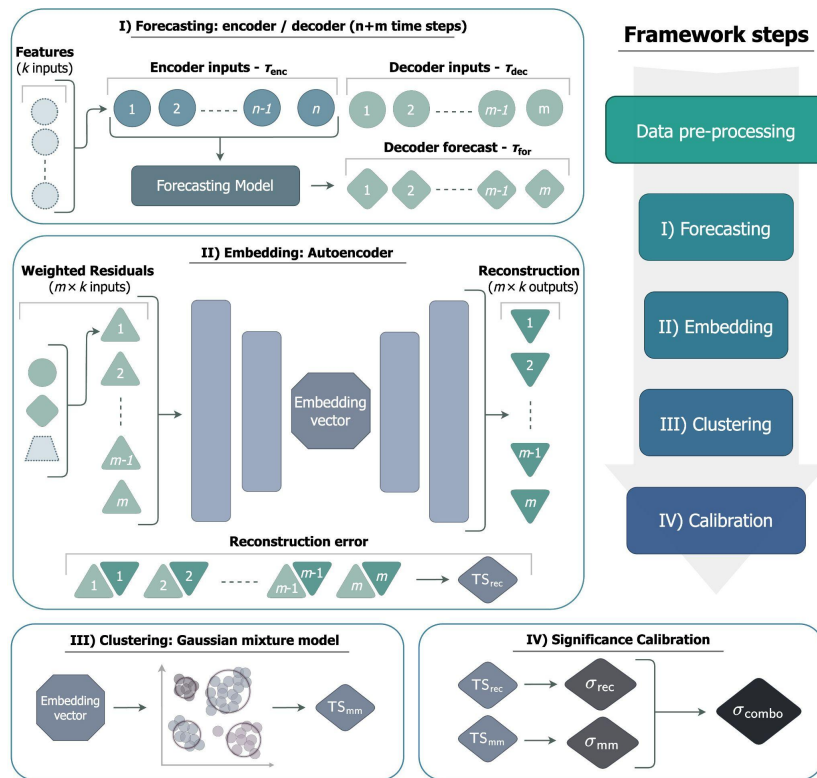


# ML MWL flare detection

## More advanced flare selection

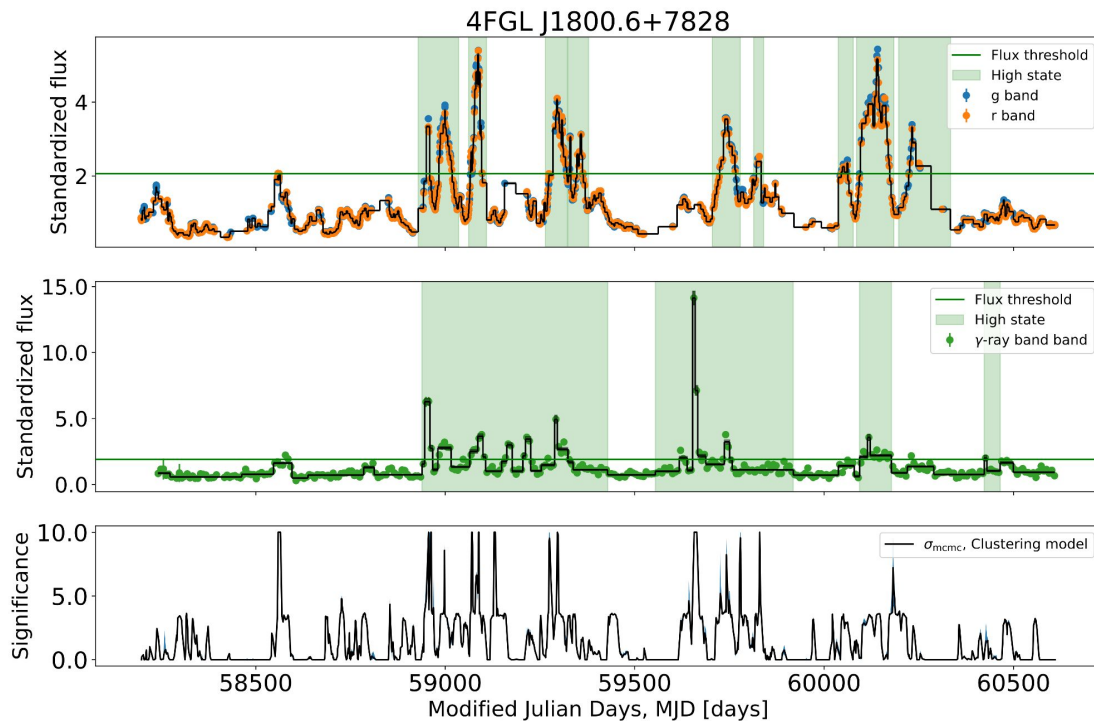
Ongoing work with M. Kherlakian, E. Pueschel (Bochum) and I. Sadeh (DESY) to implement an unsupervised machine-learning anomaly detection algorithm in Fink

- Flares as anomalies over a trained background/passive state of a source
- Already tested on simulations of 1ES 1215+303
- Archival light curves of BL Lacertae test: 3 high significance detections ( $\sim 6\sigma$ ) coincident with VERITAS flares
- Detection of flares before community alerts
- Robust against cadence, gaps, and data quality inhomogeneity



# Example with ZTF and *Fermi*-LAT

- Optical (ZTF/LSST) bands ingested in pipeline
- Comparison with both method to statistical metrics + double weight of triggering
- Training on background only period
- Implementation to Fink broker → automated detection for blazars



# Conclusion

## Can LSST alerts trigger CTAO follow-ups on flares of blazars?

- Joint start of LSST reasonable alerts and CTAO network (2026/2027)
- Preliminary analysis using ZTF and *Fermi*-LAT GeV observations as proxy for  $\sim$ TeV observations from the CTAO
- Conservative fine-tuning to trigger on a manageable rate of alerts:  $\sim$ 0.2 detected flare per source per year /  $\sim$ 1.6 flare per source per year
- Ongoing: Use of ML to detect features for MWL flares - comparison from ZTF and *Fermi*-LAT
- Alerts sent by Fink  $\rightarrow$  **Reach out if interested**

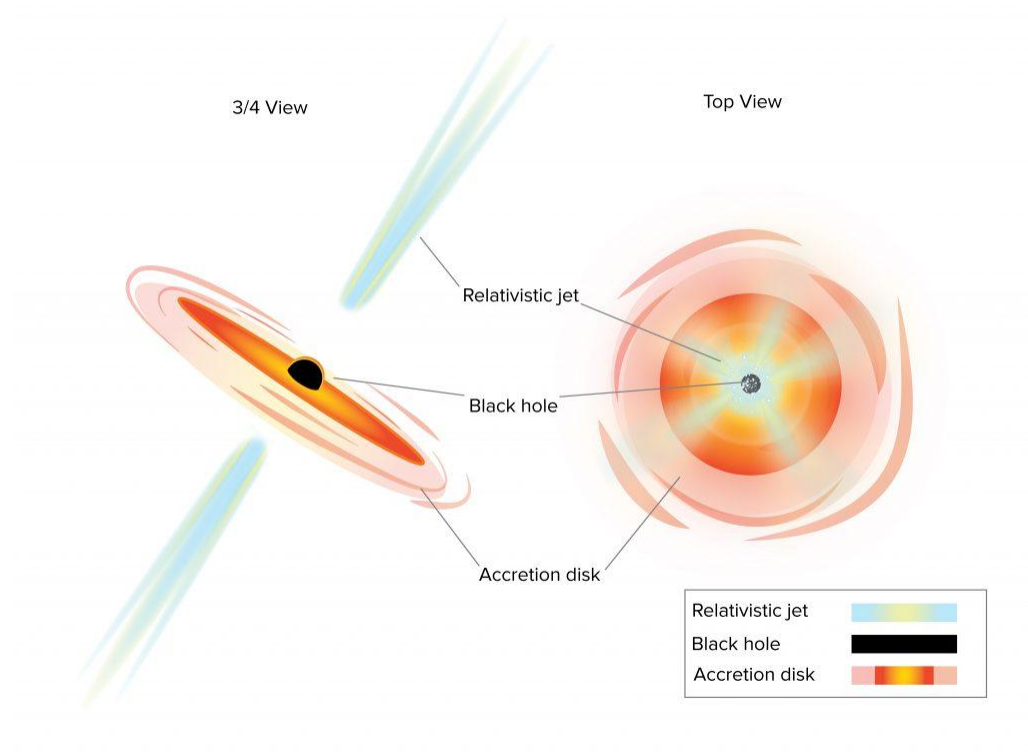
*Note: low-state alerts already sent to AGN redshift task force of CTAO*



# Backup slides

# From AGNs to blazars

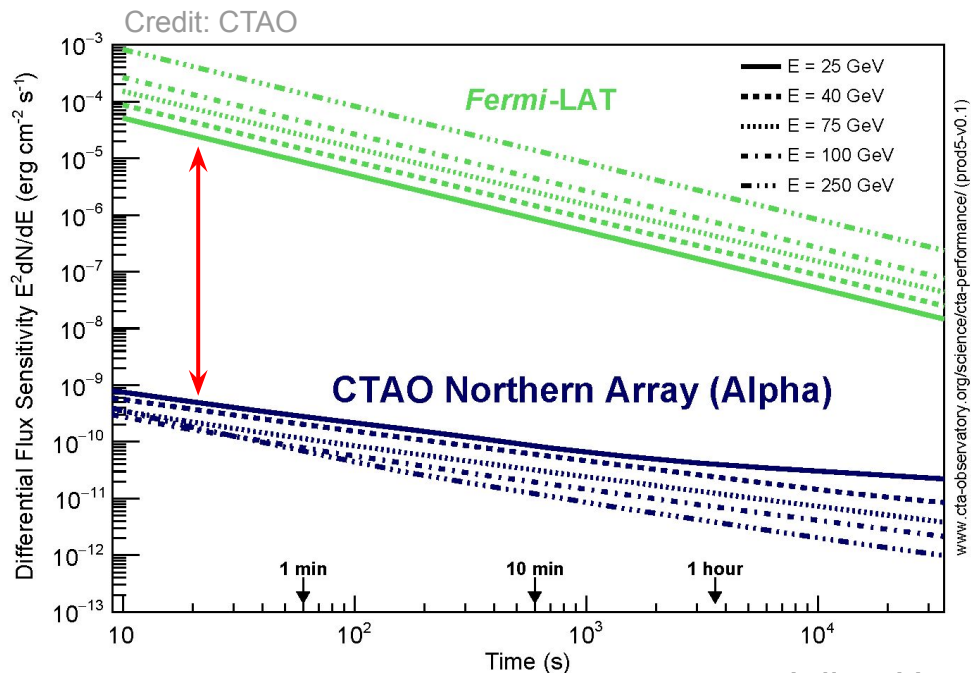
- Radio-loud jetted AGN
- Jet pointing the line of sight
- Extremely bright compared to the host galaxy (up to 10-100 times)
- Extremely variable (~min to years)



# CTAO performance in the time domain

For short- and bright-enough events

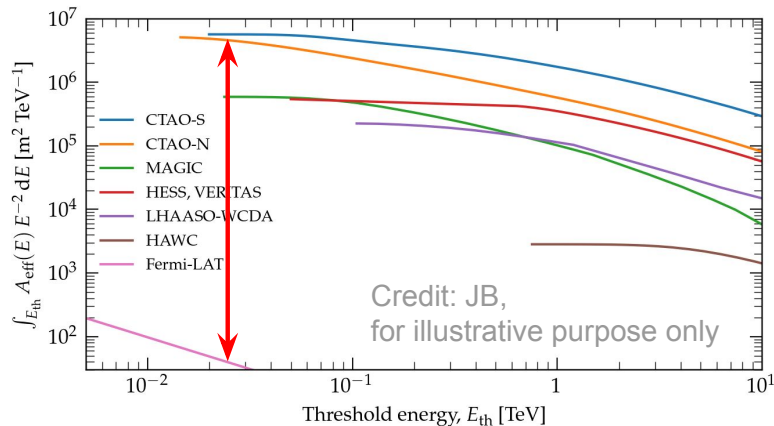
→ signal dominated regime



$$(Z[\sigma])^2 \approx N_\gamma(> E_{\text{th}})$$

$$\approx T \times \int_{E_{\text{th}}} dE A_{\text{eff}}(E) \frac{d^3 N}{dE dA dt}$$

$$\propto T \times \int_{E_{\text{th}}} dE A_{\text{eff}}(E) \times E^{-2}$$



# Current/new generation $\gamma$ -ray observatories

## Water Cherenkov Detectors (WCDs)

*HAWC, LHAASO, next: SWGO*

→ continuous, wide-field  $\gamma$ -ray observations.

## Imaging Air Cherenkov Telescopes (IACTs)

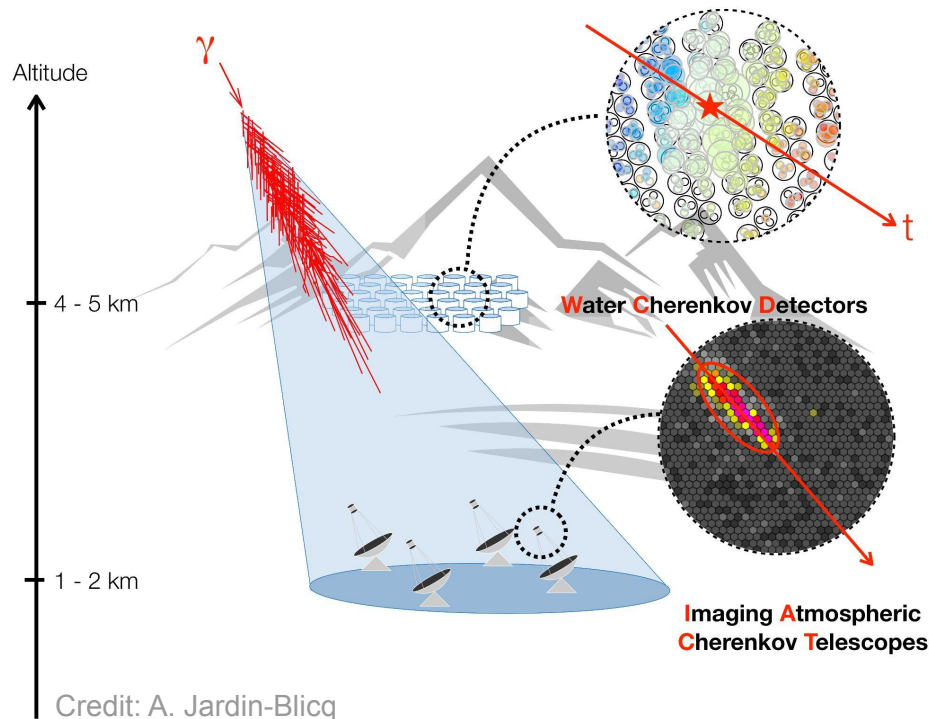
*HESS, MAGIC, VERITAS, next: CTAO*

→ deep, precision  $\gamma$ -ray observations.

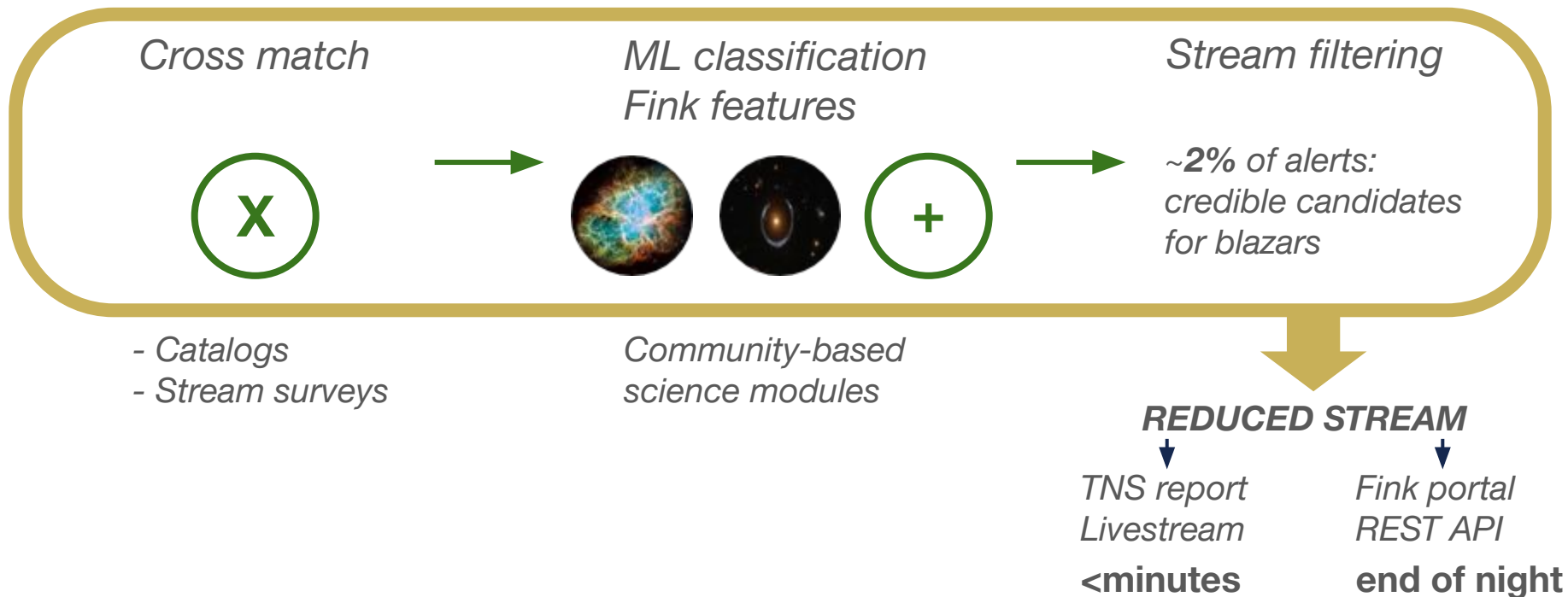
## Not in competition, need each other!

→ WCDs: operational 24/7, but higher  $E$ -threshold & smaller effective area

→ IACTs: better spectral and temporal resolution, but smaller field of view and 10% duty cycle



# What is Fink?



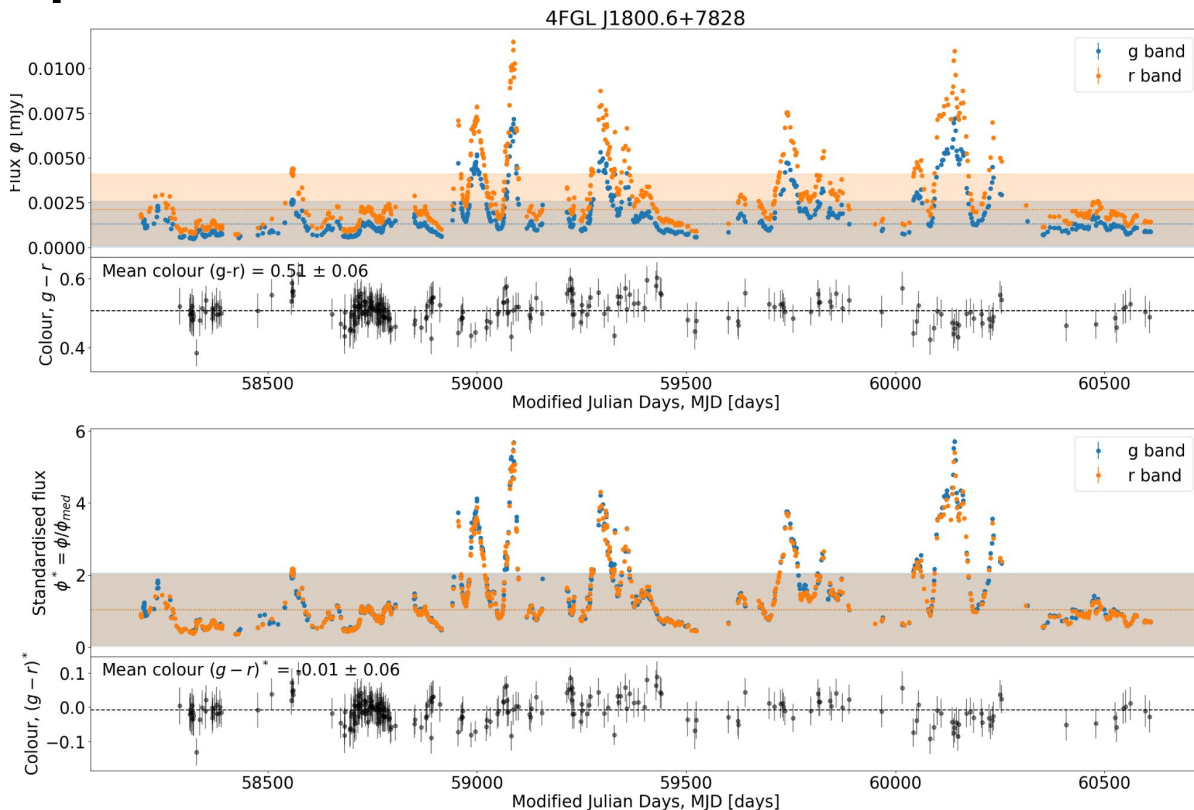
# The Fink portal

The screenshot displays the Fink portal interface. At the top, there is a navigation bar with icons for Search, Data Transfer, Xmatch, and Gravitational Waves, along with a Statistics icon. The main header features the FINK logo. Below the header, a search bar contains the query `class="CTA Blazar" trend=low_state`. The results section, titled "Last 100 objects with class 'CTA Blazar' and low\_state trend - 13 objects found", lists three objects:

- ZTF17aabtuld**: 645 detection(s) in 2863.1 days. First: 2017-12-18 11:37:55, Last: 2025-10-20 12:51:46. Equ: 10 54 30.62 +22 10 54.7, Gal: 217.637 63.0482, RealBogus: 0.96, Anomaly score: -0.62.
- ZTF19aaaajjy**: 485 detection(s) in 2481.1 days. First: 2019-01-04 16:09:15, Last: 2025-10-20 11:29:14. Equ: 68 17 49.75 -09 33 30.5, Gal: 231.797 14.3195, RealBogus: 0.94, Anomaly score: -0.62.
- ZTF20aahbwem**: 168 detection(s) in 2375.3 days.

Each object entry includes a small image of the object, a table of detection statistics, and a scatter plot of Apparent DC magnitude versus Observation date. The scatter plots show a clear trend of increasing magnitude over time, with data points colored in blue and orange. A "Sky Map" icon is visible in the top right corner of the results area.

# Optical standardisation



## Non-thermal emission in multiple optical bands

“Standardisation” of the g and r fluxes:

- Selection of quasi-simultaneous measurements ( $<1h$ ) in each band
- Normalization in each band to the median over the preselected points.

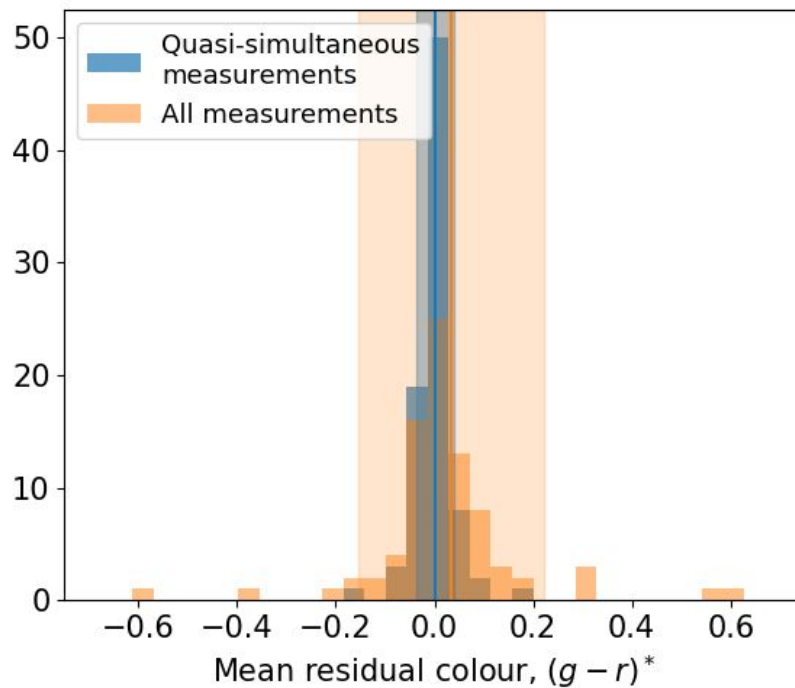
## Little colour variation left

g- & r-bands can be merged into a single optical lightcurve

Method easily transposed to Rubin’s urgizy bands

# Standardisation precision

- Computation of the residual colour for quasi-simultaneous measurements
- Computation of mean of the residual colour per source
- Both agree with null mean
- Less spread of the residual colour mean for quasi-simultaneous measurements



# Zero Normalised Cross-Correlation function

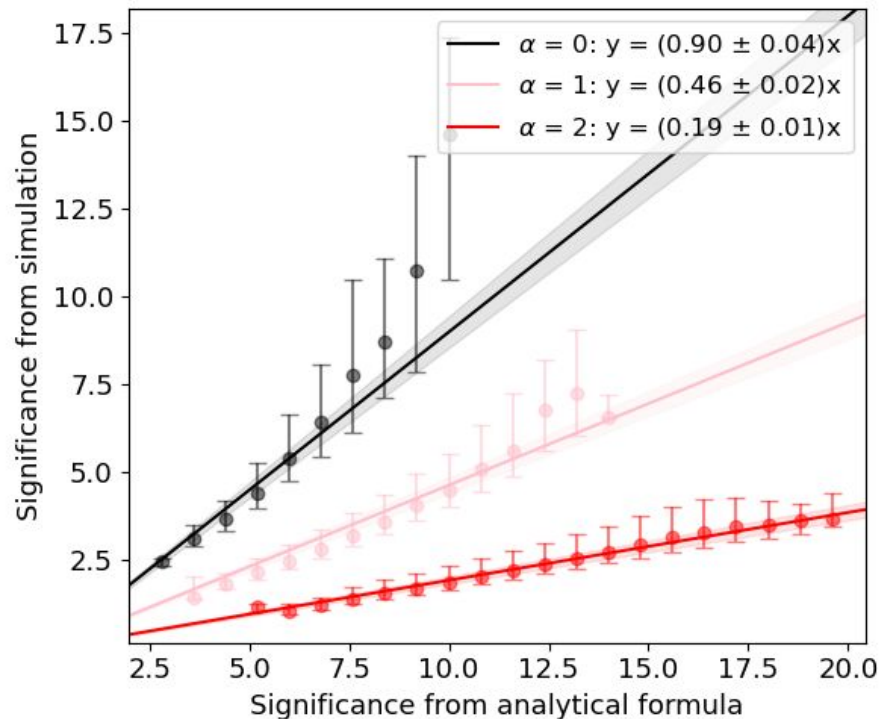
$$ZNCC_{\{x,y\}}(\tau) = \frac{1}{N - |n_\tau|} \sum_i^{N - |n_\tau|} \frac{(x_{i+n_\tau} - \bar{x})(y_i - \bar{y})}{\sqrt{(\sigma_x^2 - \bar{e}_x^2)(\sigma_y^2 - \bar{e}_y^2)}}$$

$$\text{Var}_{ZNCC,\{x,y\}}(\tau) = \frac{1}{(N - |n_\tau|)^2} \frac{1}{(\sigma_x^2 - \bar{e}_x^2)(\sigma_y^2 - \bar{e}_y^2)} \left[ \sum_i^{N - |n_\tau|} \left( e_{x_{i+n_\tau}}^2 y_i^2 + x_{i+n_\tau}^2 e_{y_i}^2 \right) + \sigma_y^2 \left( \left(1 + \frac{1}{N}\right) \sum_i^{N - |n_\tau|} x_{i+n_\tau}^2 - \frac{1}{N} \left( \sum_i^{N - |n_\tau|} x_{i+n_\tau} \right)^2 \right) \right]$$

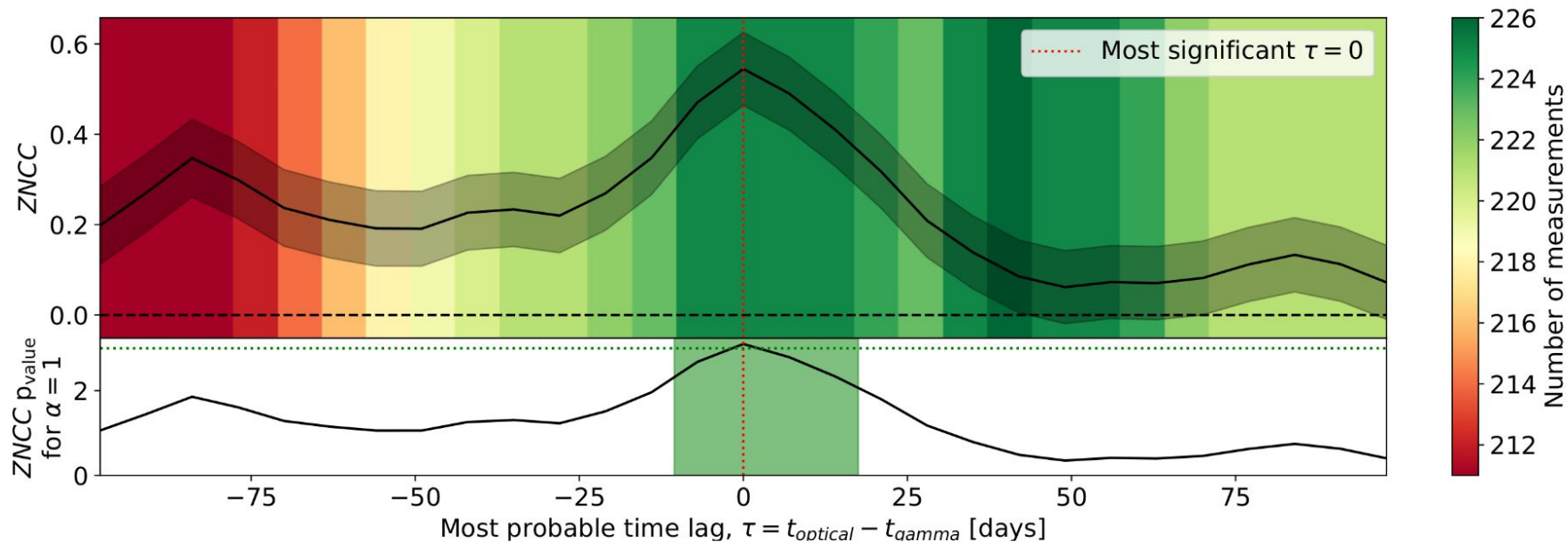
Caveat for variance: Assume white noise for PSD → overestimation of the significance

# Penalization from noise colour

- ZNCC assumes uncorrelated data  
⇒ white noise PSD
- Penalization factor from the colour of the noise
- Computation of the factor from Monte Carlo simulations
- Assumed blazar to be modelled by a pink noise PSD



# Similarity metric



# Time lag comparison with literature

## Optical-gamma-ray correlation:

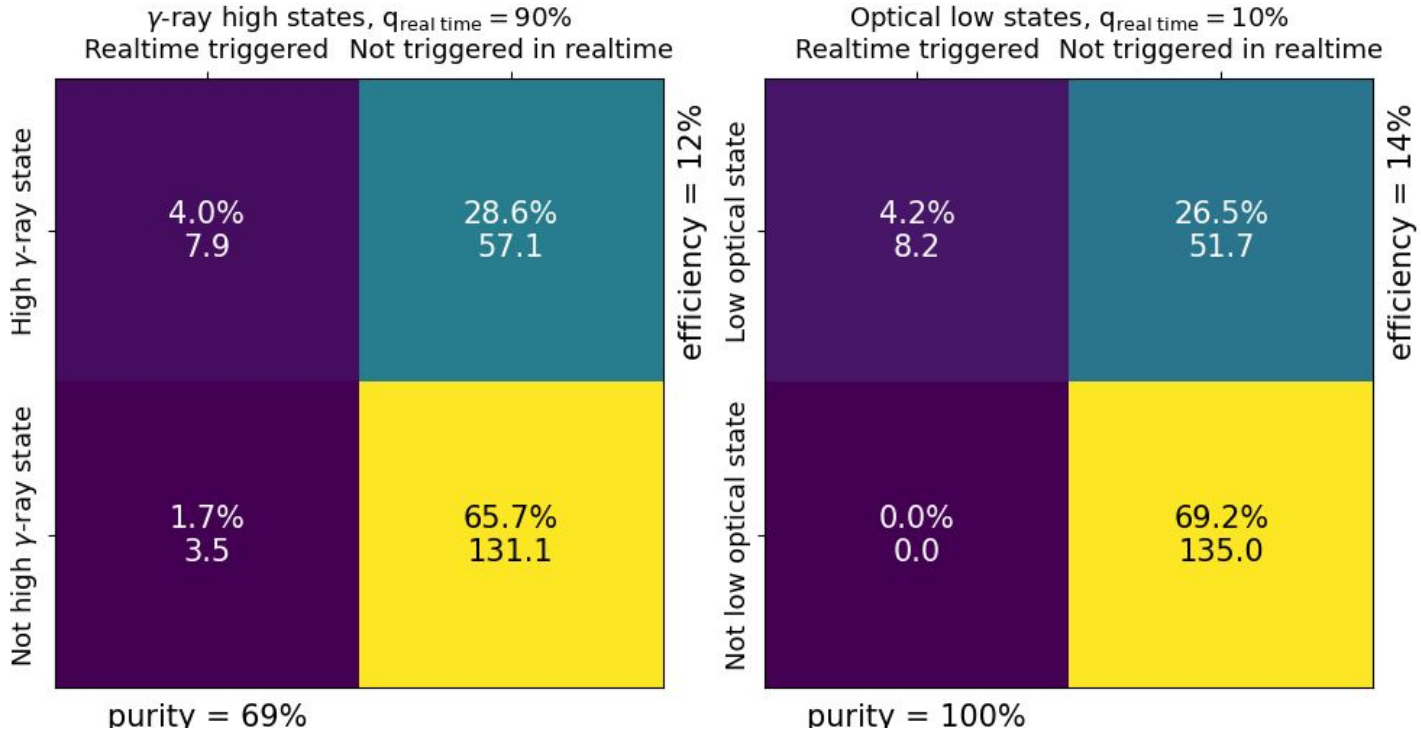
- Lioudakis+ '19:  $>3\sigma$  correlations for ~6% of their (178 sources) dataset
- Lioudakis+ '18: Higher correlations for FSRQs than BL Lacs

## Time lag:

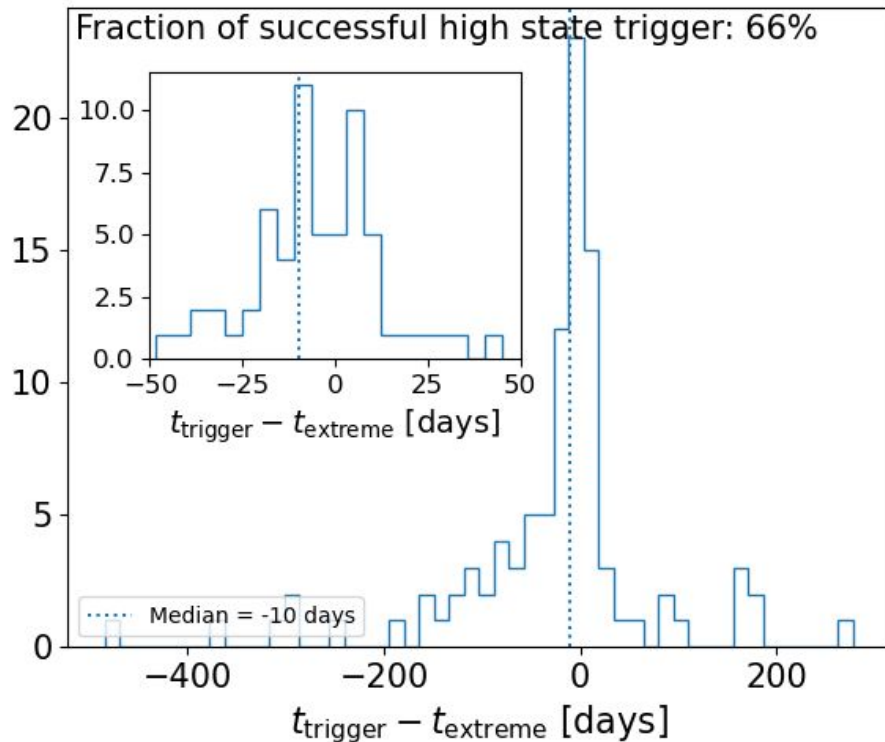
- Cohen+ '14: no significant time lag for a large proportion of blazars

**Overall message: Results in agreement with previous studies**

# Real time method comparison



# Time offset between trigger and peak



# Significance of a ML detected flare

