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### Overview

#### Aim:

Apply periodicity search algorithms on Active Galactic Nuclei (AGN) light-curves in the high-energy domain.

#### Status:

Development of MCMC Time-Series based algorithms for **regularly** spaced data. Applied on a Fermi-LAT sample.

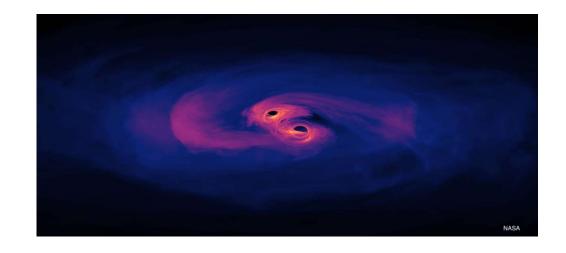
→ Published in *The Astrophysical Journal* (DOI: <u>10.3847/1538-4357/ac771c</u>)

Development of MCMC Time-Series based algorithms for **irregularly** spaced data Applied to Fermi-LAT light curve repository

→ Paper in preparation

### Introduction

- Binary super-massive black holes (BSMBH)
  could be responsible for the apparent
  precession of radio jets and would have
  detectable periodic modulation of their fluxes.
- Binary BH has become a hot topic due to the detection of gravitational waves from merger events by LIGO and VIRGO and expected future detection of BSMBH.



• These sources are well identified through their High Energy (HE) emission by detecting periodicities on their light curves. Then, it is necessary to separate the true period from the stochastic noise.

# Regularly sampled data - Methodology

### **Object Selection and Data Analysis**

Sources selected compose an AGN population sub-sample of the 4FGL

→ 27 sources motivated from existing literature on Fermi-LAT periodicities.

Light curve computation based on a binned likelihood LAT analysis using enrico.

→ 145 monthly bins. Time range [from 54700 to 59287 MJD]. Energy range [1 to 300 GeV].

#### **MCMC Time Series Models**

Different MCMC models are fitted by the composition of the following terms:

Stochastic noise components: Auto-Regressive AR(N) + White Noise

$$\phi(t_n) = \bar{\phi} + \sum_{N} \beta_N \phi(t_{n-N}) + N(0, \sigma)$$

Deterministic components: Linear, Sinusoidal, Harmonic

# Regularly sampled data - Results

#### **Model Selection**

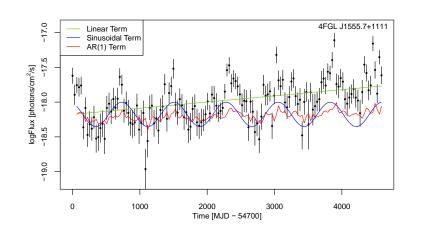
- For each light curve, within all the possible MCMC models, the one with the minimum AIC is selected.
- Period significance is assessed by AIC comparison between the periodic and the only noise model.

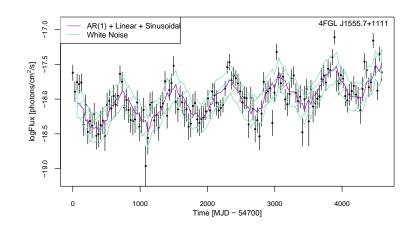
### **Full Light-Curve**

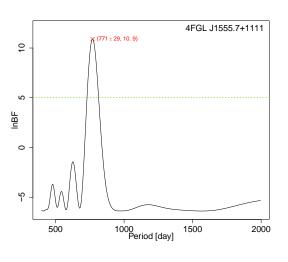
• 14 periodic sources found by a novel method which separates the stochastic and the periodic component.

The fit shows a stochastic noise term, a linear term and a sinusoidal with a 774 days periodicity.

- → Spectral cross-check: Bayes Factor Periodogram (BFP) computed from Agatha software.
- → The result is compatible with the spectral analysis and with previous literature.







example: PG 1553+113

# Regularly sampled data - Results

Table 2
MCMC Fit Results and Agatha Cross-check Comparison of the AGN Fermi-LAT Sample

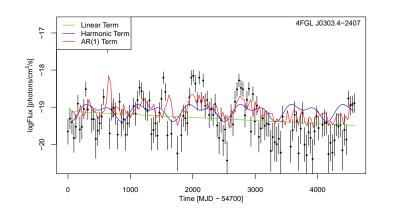
4FGL Name	Best Model	AIC	Period	Period HDI <sub>95%</sub>	$\Delta AIC$	$p_{ m value}$	$Period_{\rm AGATHA}$	lnBF
J1555.7+1111	AR(1) + lin + sin	298.03	$774 \pm 10$	755-793	28.98	$1.2 \times 10^{-7}$	$771 \pm 29$	10.9
J2158.8-3013	AR(1) + lin + sin	340.07	$614 \pm 16$	589-642	9.85	$1.2 \times 10^{-3}$	$615 \pm 26$	6.3
J1903.2+5540	AR(1) + lin + sin	381.92	$1120 \pm 95$	1040-1230	8.7	$2.1 \times 10^{-3}$	$1163 \pm 55$	0.6
J0303.4-2407	AR(1) + lin + harm	323.83	$821 \pm 40$	761-870	5.58	$8.2 \times 10^{-3}$	$773 \pm 26$	-1.2
J0521.7+2112	$AR(2) + \sin$	309.1	$1136\pm128$	990-1280	5.52	$9.2 \times 10^{-3}$	$1139 \pm 73$	11
J1248.3+5820*	$AR(2) + \sin$	383.73	$2048 \pm 169$	1800-2350	4.29	$1.6 \times 10^{-2}$	$2039 \pm 133$	3
J0211.2+1051	AR(1) + harm	301.31	$1398\pm122$	1190-1630	3.62	$1.8 \times 10^{-2}$	$1446 \pm 59$	3
J0449.4-4350**	AR(1) + lin + sin	296.29	$746 \pm 229$	505-1030	3.6	$2.2 \times 10^{-2}$	$669 \pm 14$	7.2
J0457.0-2324*	$AR(1) + \sin$	293.61	$1300 \pm 153$	975-1590	2.11	$4.4 \times 10^{-2}$	$1330 \pm 59$	7.9
J2202.7+4216*	AR(1) + lin + sin	261.19	$1799 \pm 219$	1430-2250	2.01	$4.6 \times 10^{-2}$	$1763 \pm 89$	0.1
J0721.9+7120**	$AR(1) + \sin$	321.08	$987 \pm 220$	574-1520	1.94	$4.7 \times 10^{-2}$	$1011 \pm 96$	7.3
J0818.2+4222**	$AR(2) + \sin$	360.61	$955 \pm 356$	501-1790	1.68	$5.3 \times 10^{-2}$	$1333 \pm 21$	2.1
J0428.6-3756*	AR(1) + lin + sin	288.65	$1310 \pm 175$	889-1650	0.94	$7.4 \times 10^{-2}$	$1262 \pm 114$	13.2
J0210.7-5101**	AR(2) + lin + sin	210.93	$1080 \pm 351$	502-1640	0.68	$8.3 \times 10^{-2}$	$1025 \pm 13$	3.9

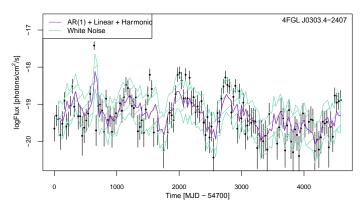
**Note.** For each source, the list indicates: the best model in terms of AIC; the AIC value; the period mean and standard deviation in days; the period 95% highest density intervals (HDI) in days; the  $\triangle$ AIC between the periodic and the noise model; the *p*-value computed from  $\triangle$ AIC; the Agatha period mean and standard deviation; the Agatha lnBF. \* indicates a specific prior assumption and \*\* indicates inferior posterior convergence for the period (see Appendix B.1). The results are sorted by MCMC period detection significance.

# Regularly sampled data - Results

**Harmonics** *example:* PKS 0301-243

Source shows a periodic component of 821 days with a second harmonic.



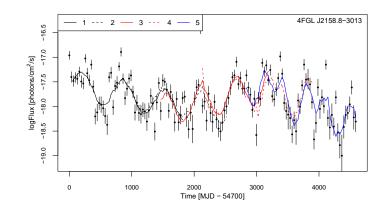


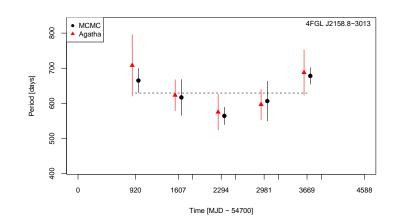
#### **Time-Windows**

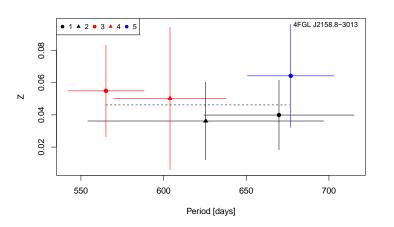
The observed data is divided into 5 equally spaced and overlapped time windows.

To analyse the period change with time and the variation of the sinusoidal amplitude with period.

→ Useful for understand and constrain the physical mechanisms of periodicity in HE emission.







example: PKS 2155-304

## Regularly sampled data - Discussion

### Physical Models explaining periodic emission

- Jet Precession originated in a BSMBH system. (Caproni et al. 2013, MNRAS, 428, 280) (Sobacchi et al. 2017, MNRAS, 465, 161)
- Periodic changes in the disk accretion flow. (Gracia et al. 2003, MNRAS, 344, 468)
- Geometric models where periodicities are related to helical trajectories. (Rieger 2004, ApJL, 615, L5)
- Lighthouse model explains periods of a few hundred days by the rotation of plasma bubbles around the central axis of the jet. (Camenzind & Krockenberger 1992, A&A, 255, 59)

### Results constraining different emission models

- PG 1553+113 period and amplitude are constant in time.
  - In agreement with a BSMBH model such as the 2-jet model. (Tavani et al. 2018, ApJ, 854, 11)
  - Not in agreement with lighthouse effect where both are expected to change
- PKS 2155-304 period slightly changes, and amplitude is constant in time.
  - Disfavours again models based on the lighthouse effect.

# Irregular data - Methodology

### **Object Selection and Data Analysis**

- Light-curves obtained from the <u>Fermi LAT Light Curve Repository</u>
- Possibility of analyzing more than 1500 monthly binned variable sources. (27 in previous work)
- Some light-curves present some missing points and gaps in the data.

### Stochastic CAR(1) model

The stochastic noise components in time t, with respect to previous time s is:

$$\varepsilon(t) = \exp((s-t)/\tau) \phi(s) + w(t-s),$$

where the Gaussian random variable is:

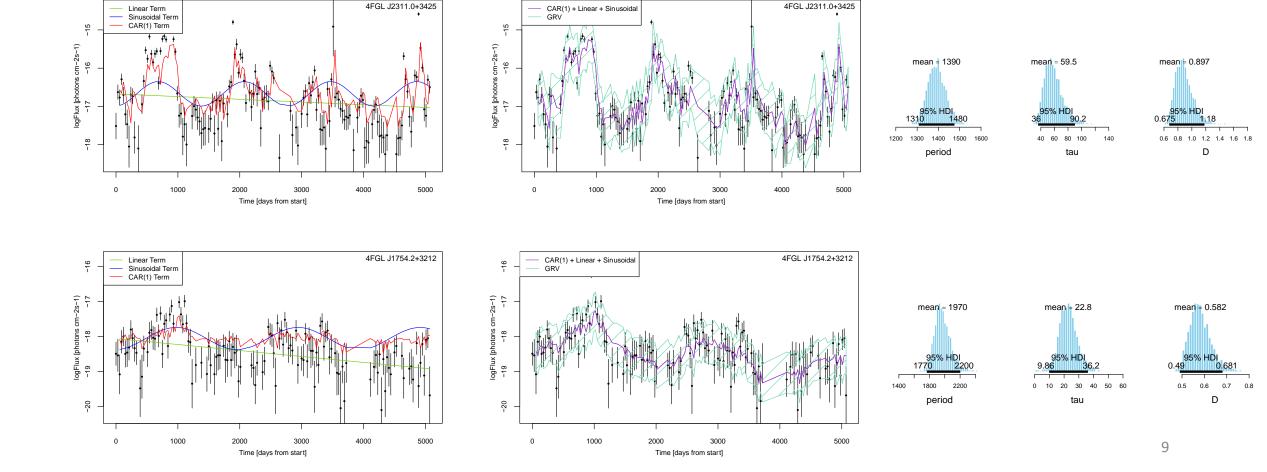
$$w(t-s) \sim N(0, D \times (1 - \exp(-2(t-s)/\tau))$$

with correlation time  $\tau$ , and constant D as parameters in the MCMC search.

→ Developing a MCMC algorithm for generalized stochastic CAR(N) model

# Irregular data – Preliminary Results

~ 1 hundred periodic 4FGL sources found with different models and significance.



## **Conclusions**

- Adding a periodic component can significantly improve the fit to the data compared to AR noise-only models.
- Adding an AR (CAR) component can significantly improve the fit to the data compared to white noise models.
- This method is able to analyse harmonics and the evolution in time of periods and amplitudes.
- Time-domain approach is able to parametrize a light-curve with data gaps and inhomogeneous sampling.
- All this knowledge helps to understand better the physical mechanism models of the AGN HE emission.
- → This analysis can be applied not only to Fermi-LAT data but to any other instrument/wavelength data







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