

# Probable low-frequency quasi-periodic oscillations in blazars from the ZTF survey

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## ABSTRACT

We investigate the possible presence of quasi-periodic oscillation (QPO) signals in 2103 blazars from the Zwicky Transient Facility (ZTF) time-domain survey. We detect a low-frequency QPO signal in five blazars observed over these 3.8-yr-long optical *r*-band ZTF light curves. These periods range from 144 to 196 d detected at  $\gtrsim 4\sigma$  significance levels in both the Lomb–Scargle periodogram and weighted wavelet Z-transform analyses. We find consistent results using the phase dispersion minimization technique. A similar peak is detected in the *g*-band light curves at a slightly lower significance of  $3\sigma$ . Such nearly periodic signals on these time-scales in optical wavebands most likely originate from a precessing jet with high Lorentz factor, closely aligned to the observer's line of sight or the movement of plasma blobs along a helical structure in the jet.

**Key words:** galaxies: active – galaxies: jets – quasars: general.

## 1 INTRODUCTION

Blazars are a sub-class of active galactic nuclei (AGNs) which are marked by their powerful parsec-scale relativistic radio jets closely aligned along the observer's line of sight (Urry & Padovani 1995). Blazars emit copiously across the entire electromagnetic spectrum and their emission dominates the  $\gamma$ -ray sky (Hufnagel & Bregman 1992). Blazars are further classified into two sub-categories on the basis of their optical spectra, namely flat-spectrum radio quasars (FSRQs) characterized by the broad emission lines in the optical spectra, and BL Lac objects, marked by essentially featureless continua (Angel & Stockman 1980).

The broad-band spectral energy distribution (SED) of blazars features the characteristic double-hump configuration in the logarithmic luminosity–frequency plane. The low-energy peak is produced by the synchrotron emission of the relativistic particles contained in the jet, and the second high energy hump is usually considered to be produced by the inverse-Comptonization of lower energy seed photons. In this leptonic scenario, there are two basic possibilities for the origin of the seed photons. In the synchrotron self-Compton (SSC) scenario the same population of electrons produced by the

synchrotron process are inverse-Comptonized to produce high-energy emission (Maraschi, Ghisellini & Celotti 1992), whereas in the external Comptonization (EC) models, the seed photons originate from various regions external to the jets, e.g. accretion disc (Dermer & Schlickeiser 1993), broad-line region (Sikora 1994), or the surrounding dusty torus (Blażejowski et al. 2000). The synchrotron peak frequency is a key parameter, on the basis of which the BL Lac sources are subdivided into low- (LBL;  $\log \nu_{\text{peak}} < 14$  Hz), intermediate- (IBL;  $14 \text{ Hz} \leq \log \nu_{\text{peak}} \leq 15$  Hz), and high- (HBL;  $\log \nu_{\text{peak}} > 15$  Hz) synchrotron peaked blazars (Abdo et al. 2010).

Blazars show substantial variability across the entire electromagnetic window, ranging from radio to high energy  $\gamma$ -rays, which is strongly enhanced by the relativistically beamed jet. In general, such variability is stochastic or aperiodic in nature, but in recent times several instances of quasi-periodicities in different electromagnetic wavebands have been reported (e.g. Lachowicz et al. 2009; Rani, Wiita & Gupta 2009; Bhatta et al. 2016; Smith et al. 2018). Such quasi-periodic oscillation (QPO) features in blazars have been claimed to be observed on diverse time-scales in optical, radio, X-ray, and  $\gamma$ -ray wavebands. Several early nominal detections of QPO features, such as a  $\sim 15$ -min periodicity in 37 GHz radio monitoring (Valtaoja et al. 1985), a  $\sim 23$ -min periodicity observed in the optical band (Carrasco, Dultzin-Hacyan & Cruz-Gonzalez 1985), and a  $\sim 1$  d periodicity of S5 0716+714 during coordinated radio and optical

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campaign (Quirrenbach et al. 1991), were however, plagued by improper modelling of the underlying broad-band noise (see Vaughan & Uttley 2006). The first more robust detection of a QPO feature used a 91 ks observation of the Narrow Line Seyfert 1 galaxy RE J1034+396 by *XMM-Newton* was performed by Gierliński et al. (2008), where they reported a  $5.6\sigma$  detection of a  $\sim 1$  h QPO. Subsequently, nominally strong detections of several other QPOs in different AGNs using X-ray monitoring data have been reported:  $\sim 7\sigma$  detection of a 4.6 h QPO in PKS 2155–304 (Lachowicz et al. 2009), a  $>3\sigma$  detection of a 3.8 ks QPO in 1H 0707–495 (Pan et al. 2016), a  $\sim 1$  h QPO of  $>3\sigma$  detection in MCG–06–30–15 (Gupta et al. 2018), and a  $3.3\sigma$  detection of a  $\sim 2$  h QPO in the active galaxy MS 2254.9–3712 (Alston et al. 2015). However, since most such detections lasted for only a few cycles, their statistical significance was probably overestimated (Covino, Sandrinelli & Treves 2018).

A remarkable correlation is seen between QPO frequency and the mass of the central object across several orders of magnitude, ranging from stellar mass black holes in binary systems to supermassive black holes in AGNs (e.g. Zhou et al. 2015). Such a correlation strongly suggests that the underlying accretion flow properties are similar in these two classes of sources, and a  $\frac{1}{M}$  scaling relation is expected if the oscillatory features are connected to the characteristic length scales of the system (Smith et al. 2018). However, this would indicate that the low-frequency QPO ( $\sim 1$  Hz QPO in the case of a  $10M_{\odot}$  low mass X-ray binary) would occur at time-scales of months to years in AGN (Ackermann et al. 2015; Zhang et al. 2017c; Bhatta 2019). Detecting these QPOs would invariably require long duration, high cadence, and monitoring of the sources. With the advent of *Fermi*-LAT, which enables the monitoring of the  $\gamma$ -ray sky as frequently as every 3 h for the brightest blazars, as well as high cadence optical monitoring programmes, it is possible to make significant progress in the exploration of such low-frequency, or long time-scale, QPOs. Examination of  $\gamma$ -ray and optical/NIR light curves of six blazars from Rapid Eye Mounting telescope photometry yielded a statistically significant peak at a year-like time-scale in PKS 2155–304 (Sandrinelli et al. 2016a). The detection of optical QPOs, particularly on longer time-scales, has always been challenging, owing to the normally sparse sampling by ground-based monitoring instruments and data gaps induced by poor weather and the daytime transit of most AGNs. Enabled by the high precision and nearly continuous monitoring provided by the *Kepler* exoplanet satellite, Smith et al. (2018) found a significant detection of a  $\sim 44$  d QPO in KIC 9650712, a narrow-line Seyfert 1 galaxy, which was confirmed by Phillipson et al. (2020) who employed an independent approach to analysing those *Kepler* data.

A number of physical models have been invoked to explain the observed AGN QPO features, including bending or twisting of the relativistic jets (e.g. Camenzind & Krockenberger 1992; Raiteri et al. 2017), the precession of the jet due to interaction in a supermassive black hole binary (SMBH) system (e.g. Graham et al. 2015), warped accretion disc structure in a binary SMBH system (e.g. Ulubay-Siddiki, Gerhard & Arnaboldi 2009), the movement of plasma blobs along a helical structure in the jet (e.g. Sarkar et al. 2020), and kink instabilities in magnetized jets (e.g. Jorstad et al. 2022). The multiplicity of plausible explanations calls for both more QPO detections and a detailed investigation of their multiwavelength variability properties in order to put real constraints on the plausible origin involving physical mechanisms within the jet and/or accretion disc, as well as their possible coupling.

Here, we report the probable detections of elusive lower frequency QPO signatures in a few blazars over the rather long time baseline provided by the Zwicky Transient Facility (ZTF) *r*-band observations which span nearly 4 yr with measurements made every few days. Optical observations over such time spans could reveal several cycles of such putative QPO variability and so are very well suited to explore the presence, strength, and evolution of the low-frequency quasi-periodic variations. This paper is organized as follows. The data set is discussed in Section 2, followed by the results in Section 3. We describe various possible scenarios to explain the QPO signatures in Section 4. Finally, a summary is given in Section 5. Throughout this paper, we adopt a set of cosmological parameters as follows:  $H_0 = 70 \text{ km s}^{-1} \text{ Mpc}^{-1}$ ,  $\Omega_m = 0.30$ ,  $\Omega_{\Lambda} = 0.70$ .

## 2 DATA AND SAMPLE SELECTION

Our preliminary sample of blazars was taken from the Roma-BZCAT catalogue (Massaro et al. 2015), which consists of a total of 3561 blazars. We searched for the *r*-band light curves for all these 3561 blazars in the ZTF (Masci et al. 2019) time-domain survey, the 10th ZTF public data release, and found 2751 of these blazars to be present in this data base. The ZTF uses the 48-inch Samuel Oschin Schmidt telescope with a field of view of  $48 \text{ deg}^2$  to map the sky in *g*, *r*, and *i* optical bands with a typical exposure time of 30 s, reaching a magnitude limit of  $\sim 20.5$  in *r*-band (Bellm et al. 2019). The average cadence of the survey is about 3 d over a period of 3–4 yr, so ZTF is extremely well suited for studying AGN variability (see Negi et al. 2022). Note that ZTF assigns a unique observation ID to a source observed in a particular field, filter, and CCD-quadrant independently. Here, to avoid any spurious variability based on varying calibrations on different CCD quadrants (see Van Roestel et al. 2021), we only examined the light curve corresponding to the observation ID with the maximum number of data points. To only include data obtained in good observing conditions, we further applied the quality score of catflags score = 0, listed in ZTF documentation. For the sources having multiple intranight observations, we averaged all the data points observed on same day and used the daily averaged light curves for further analysis.

Further, to avoid large data gaps and to have a sufficiently large number of data points to robustly detect any periodic signature, we included only the sources with at least 100 data points during the entire set of observations. This leaves us with a sample of 2103 blazars observed by ZTF with light curves good enough to search for QPOs. In the next section, we search for any kind of quasi-periodic behaviour in the *r*-band light curves of these 2103 sources.

## 3 ANALYSIS AND RESULTS

Here, we employ three different mathematical techniques in order to detect and quantify any statistically significant oscillation.

### 3.1 Weighted wavelet Z-transform

The wavelet transform method has been widely employed in analyses of blazar time-series (e.g. Lachowicz et al. 2009; Bhatta et al. 2013; Mohan & Mangalam 2015; Bhatta et al. 2016). This approach determines any periodicities by fitting to sinusoids; however, it also offers the ability to localize the waves in both time and frequency space to explore possibly transient QPOs (e.g. Bravo et al. 2014). By examining any evolution of the signal’s frequency and amplitude it is

a powerful tool for investigating whether such oscillations gradually develop, evolve, and dissipate over time.

In brief, the weighted wavelet Z-transform (WWZ) method convolves a light curve with a time- and frequency-dependent kernel and decomposes the data into time and frequency domains to create a WWZ map. We use the Morlet kernel (Grossmann & Morlet 1984) which has the functional form

$$f[\omega(t - \tau)] = \exp[i\omega(t - \tau) - c\omega^2(t - \tau)^2], \quad (1)$$

corresponding to which the WWZ map is

$$W[\omega, \tau; x(t)] = \omega^{1/2} \int x(t) f^*[\omega(t - \tau)] dt, \quad (2)$$

where  $f^*$  is the complex conjugate of the Morlet kernel  $f$ , and  $\omega$  and  $\tau$  are respectively the frequency and the time-shift. This kernel acts as a windowed discrete Fourier transform which contains a frequency-dependent window of size  $\exp(-c\omega^2(t - \tau)^2)$ . The WWZ map has the advantage of being able to detect statistically significant periodicities, as well as the time spans of their persistence.

For the purpose of our analysis, we have considered only those cases where a strong concentration of power within a narrow window of frequency is detected, and the peaked components pertaining to such cases are successively tested for their statistical significance, as will be discussed in the subsequent sections. Most of the wavelets show the most significant concentration of power towards the lower frequency region, i.e. time-scales of more than  $\sim 100$  d. We note that the time-series are associated with gaps of at least a few tens of days duration, hence we have considered only those cases where a concentration of power is observed throughout the domain of observation. A total of 169 such cases were identified, and a rigorous estimation of their significance was done as explained in the next section.

### 3.2 Lomb–Scargle periodogram and testing the peak significance

The traditional Lomb–Scargle periodogram (LSP) method is one of the most efficient and widely used methods for periodicity search (Lomb 1976; Scargle 1982). Though it is a variant of the standard discrete Fourier transform (DFT) method, the advantage of the LSP is that it attempts to account for the data gaps and irregularities by the least-square fitting of the sinusoidal waves of the form  $X(t) = A \cos \omega t + B \sin \omega t$  of the data by  $\chi^2$  statistics, which reduces the effect of the noise on the signal and also provides a measure of the significance of detected periodicity (e.g. Zhang et al. 2017a,b).

Blazars typically exhibit a red-noise type variability feature in temporal frequency space, such that the periodogram can be represented by a power spectral density (PSD) with the functional form of a power-law (PL) as  $P(\nu) = A\nu^{-\alpha}$ , where  $\nu$  represents the temporal frequency,  $\alpha > 0$  is the spectral slope. Alternatively, a bending power law (BPL) might be a better fit, with

$$P(\nu) = A \frac{\nu^{-\alpha_1}}{1 + (\nu/\nu_{\text{bend}})^{\alpha_2 - \alpha_1}} + c, \quad (3)$$

where  $\nu_{\text{bend}}$  is the bending frequency and  $\alpha_1$  and  $\alpha_2$  are the power spectral slopes before and after the bending frequency respectively (e.g. Timmer & Koenig 1995; Max-Moerbeck et al. 2014).

Such power-law profiles indicate that high amplitude features in the PSD seen at longer time-scales (low-frequency domain) can mimic an actual QPO signal (Vaughan et al. 2016). In order to disentangle the effect of red noise, rigorous estimation of the periodogram

**Table 1.** Best-fitting parameter values.

Source	Best-fitting model	Best-fitting parameters
J092915+501336	BPL	$A = 39.21$ $\nu_b = 0.012$ $\alpha_1 = -1.92$ $\alpha_2 = 2.53$ $c = 1.65 \times 10^{-5}$
J092331+412527	BPL	$A = 0.51$ $\nu_b = 0.021$ $\alpha_1 = -0.92$ $\alpha_2 = 2.33$ $c = 9.61 \times 10^{-5}$
J101950+632001	PL	$A = 1.71 \times 10^{-5}$ $\alpha = 1.41$
J173927+495503	PL	$A = 1.01 \times 10^{-5}$ $\alpha = 1.73$
J223812+274952	PL	$A = 3.00 \times 10^{-5}$ $\alpha = 1.33$

peaks must be undertaken before concluding a peaked feature as a true QPO. In this work, this issue has been addressed by performing Monte-Carlo simulations of the light curves, such that the simulated light curves exhibit the same PSD and flux distribution (PDF) as those of the original light curve (Emmanoulopoulos, McHardy & Papadakis 2013). Since the underlying red-noise PSDs of blazar light curves are well approximated by a PL or BPL profile (Vaughan 2005), the PSD of the original light curve has been approximated using these functional forms, and the final model has been chosen on the basis of the lower  $\chi^2$  value. The best-fitting PSD models and model parameters are provided in Table 1. Subsequently, a total of 1000 light curves with the same PSD and PDF as that of the original light curve were simulated using the `DELIGHTCURVESIMULATION`<sup>1</sup> code (Emmanoulopoulos et al. 2013).

Our wavelet analysis suggested the plausibility of the presence of low-frequency oscillatory features in a small fraction of the blazars observed by ZTF. We consider the peaks at frequencies above  $0.005 \text{ d}^{-1}$  (i.e.  $< 200$  d) with  $\geq 4\sigma$  significance level to be the legitimate cases of statistically significant variability features. The frequency bound is selected on the basis of requiring that during the full window of observations, there should be at least 4–5 full cycles of oscillation to identify significant oscillatory features. Variabilities corresponding to longer time-scales will not satisfy the criteria for these observations. We also note that the ZTF data have multiple gaps in the light curves so that requiring at least 4–5 cycles helps to pick the genuine QPO candidates. Further, to account for any fake periods arising from gaps in the light curve data, we computed the spectral window power spectrum of the sources using `STARLINK PERIOD`<sup>2</sup> software. The fake periods were estimated by replacing all data points by unity and then computing the Fourier transform of that time series data. We made sure that no periodicity due to the fake gaps fell within  $1\sigma$  of our estimated periods. Only 5 sources satisfy all these criteria, and such cases with statistically significant LSP peaks are listed in Table 2.

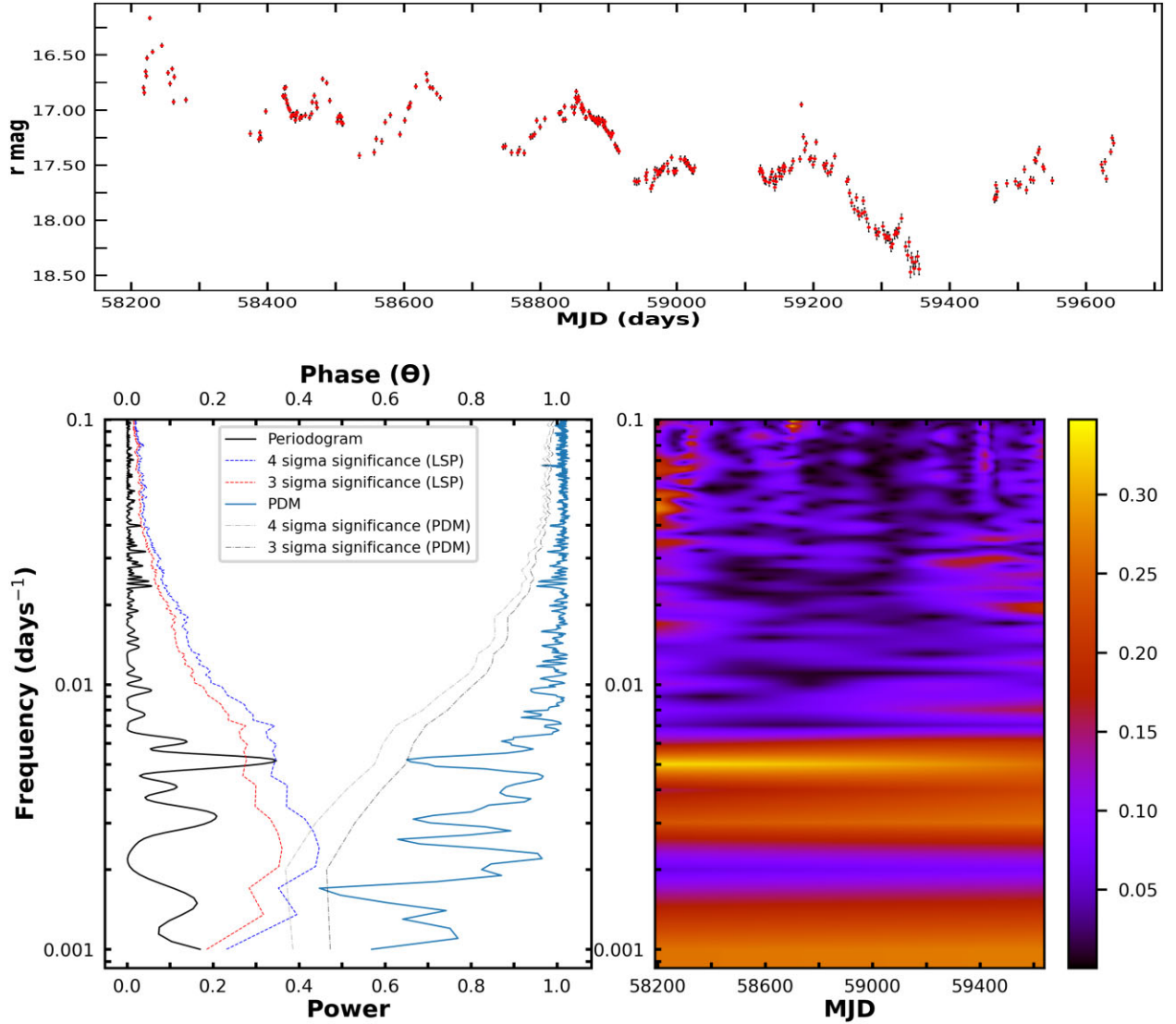
We also checked the false alarm probability (FAP) corresponding to these peaks, which estimates the possibility of getting a peak with the obtained amplitude or higher arising out of the random

<sup>1</sup><https://github.com/samconnolly/DELIGHTCURVESIMULATION>

<sup>2</sup><https://starlink.eao.hawaii.edu/devdocs/sun167.htx/sun167.html>

**Table 2.** Probable cases of QPO in blazars from the ZTF survey.

No (#)	Source	RA (deg.)	Dec. (deg.)	Peak frequency <sup>†</sup> (d <sup>-1</sup> )	Period (LSP) (d)	Period (WWZ) (d)	Period (PDM) (d)	Global Sig. (per cent)
1	J092915+501336	142.31429	50.22667	0.00509	196.3 ± 6.8	192.31	196.08 ± 3.85	99.4
2	J092331+412527	140.88042	41.42428	0.00509	196.1 ± 6.8	196.08	200.00 ± 4.00	99.7
3	J101950+632001	154.96196	63.33378	0.00615	162.7 ± 4.6	163.93	163.93 ± 2.69	99.8
4	J173927+495503	264.86408	49.91761	0.00694	144.1 ± 3.9	142.86	142.86 ± 2.04	99.3
5	J223812+274952	339.55358	27.83133	0.00647	154.5 ± 4.7	153.84	156.25 ± 2.44	99.4

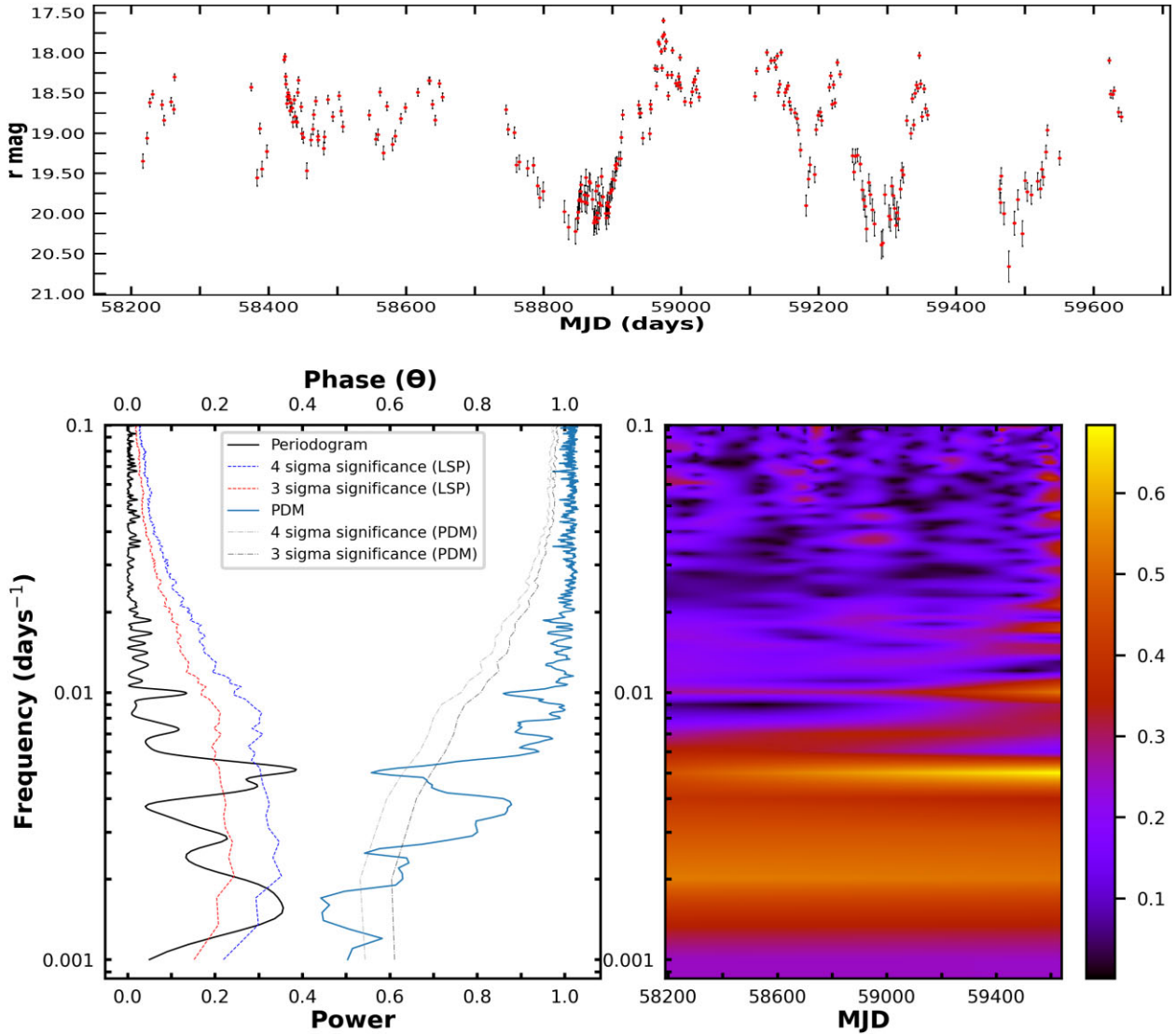
<sup>†</sup>LSP based measurements.


**Figure 1.** Upper panel:  $r$ -band ZTF light curve of blazar J092915+501336 over a time span of 3.8 yr. Bottom left panel: A low-frequency peak in the LSP at  $>4\sigma$  statistical significance is detected in the  $r$ -band light curve, suggesting the presence of a QPO at  $0.0051 \text{ d}^{-1}$ , and this is supported by the dip below 0.7 in the PDM phase at that frequency, which is  $\sim 3\sigma$  significance. Bottom right panel: A weighted wavelet Z-transform of this light curve showing a strong power concentration at the same frequency over the entire observing time window.

fluctuations in the data instead of some inherent periodicity. In the absence of any a priori information regarding the periodicity within a particular frequency interval, we checked the ‘global significance level’ of the peaks, also known as the ‘look-elsewhere effect’ or ‘multiple comparison problem’ in statistics (Bell et al. 2011). We

calculated the fraction of simulated light curves that show a higher statistical significance of peak detection at any frequency interval, and that provides us the global confidence level of the peaks. In all of our cases, we find that the global confidence level of the detected periodicities are  $> 99$  per cent, and the exact confidence levels are





**Figure 2.** Upper panel: As in Fig. 1 for the blazar J092331+412527. A low-frequency peak in the LSP at  $>4\sigma$  statistical significance detected in the  $r$ -band light curve, suggesting the presence of a QPO at  $0.0051 \text{ d}^{-1}$ . At this frequency, we observe a  $>4\sigma$  significant prominent dip in the phase in our PDM analysis as well. This further strengthens the claim for the presence of a QPO. Bottom right panel: A weighted wavelet Z-transform of this light curve showing a strong power concentration at the same frequency over the entire observing time window.

mentioned in Table 2. This lends further credence to the detection of periodic features in these ZTF light curves.

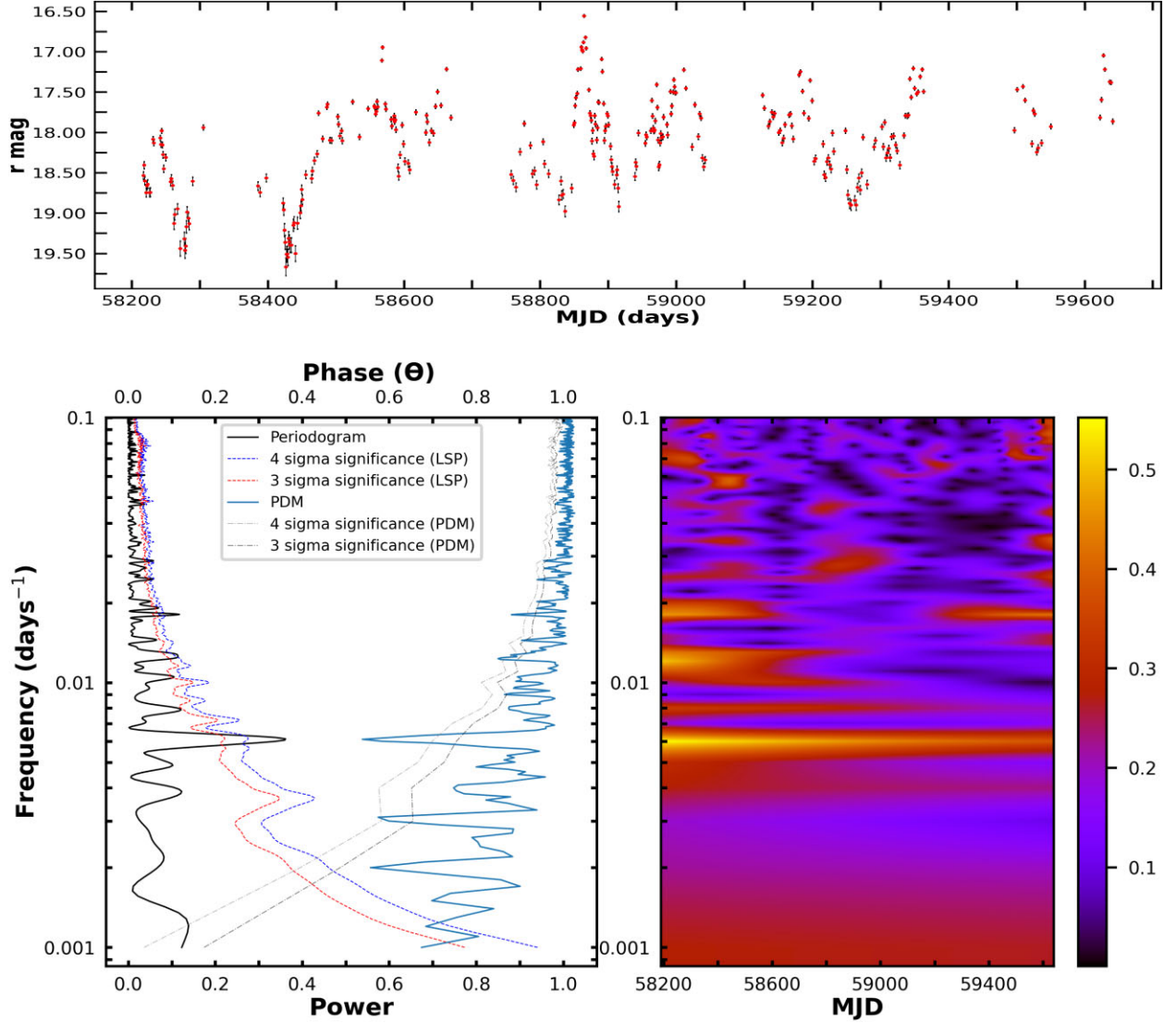
We also searched for the presence of any possible peaked components in the high frequency (i.e. short time interval) zone as well, but the periodograms become noisier in this frequency domain and the power peaks turn out to be at least one order of magnitude smaller than the low-frequency peaks. Further, given the sampling cadence, a detection of a peaked component corresponding to period of oscillation  $\lesssim 20 \text{ d}$  could not be made with high statistical confidence. We therefore do not further consider the presence of any high frequency QPOs.

We detect a strong signature of a QPO in a frequency range where these data are most useful in five blazars over their  $\sim 3.8 \text{ yr}$  long ZTF light curve data sets. A peak at relatively low frequencies, ranging from  $0.00509 \text{ d}^{-1}$  (i.e.  $196 \text{ d}$ ) to  $0.00604 \text{ d}^{-1}$  (i.e.  $144 \text{ d}$ ) is detected in the LSP with  $\gtrsim 4\sigma$  significance in  $r$ -optical passband (see Figs 1–5) in the case of five sources listed in Table 2. The QPO signature is

also independently confirmed with the weighted wavelet transform method (see Figs 1–5), which makes them all strong cases of elusive persistent low-frequency QPOs. Further, we also checked for the QPO signatures in the  $g$ -band light curves of these five blazars. All the cases were found to show similar features in those power spectra with at least  $\gtrsim 3\sigma$  significance (see Figs A1–A5). A few other blazars showed comparably strong signals but were not further considered either because the peak was at too low a frequency or because the power was spread over a wide band of frequencies.

### 3.3 Phase dispersion minimization technique

This is another well-known technique for periodicity detection which is especially suitable for non-sinusoidal waveforms (Stellingwerf 1978). For a time-series of  $N$  data points represented as  $(x_i, t_i)$ , where  $x_i$  is the flux state at some particular instant  $t_i$ , the flux variance is



**Figure 3.** As in Fig. 1 for the blazar J101950+632001. A low-frequency peak in the LSP at  $>4\sigma$  statistical significance is detected in the  $r$ -band light curve, suggesting the presence of a QPO at  $0.0062 \text{ d}^{-1}$ . A  $>4\sigma$  significant sharp dip in phase going below 0.6 is also observed from our PDM analysis at this frequency. A strong power concentration at the same frequency is seen in the WWZ plot over the entire observing time window.

given by

$$\sigma^2 = \frac{\sum (x_i - \bar{x})^2}{N - 1}, \quad (i = 1, \dots, N) \quad (4)$$

where  $\bar{x}$  is the flux mean. The idea is then to subdivide the light curve into  $M$  number of phase bins according to a trial period ( $\phi$ ) such that each segment contains  $n_j$  number of points that are similar in phase. If the  $k$ -th data point in the  $j$ -th bin is denoted by  $x_{kj}$ , then the sample variance within each phase bin is denoted as

$$s_j^2 = \frac{\sum (x_{kj} - \bar{x}_j)^2}{n_j - 1} \quad (j = 1, \dots, M). \quad (5)$$

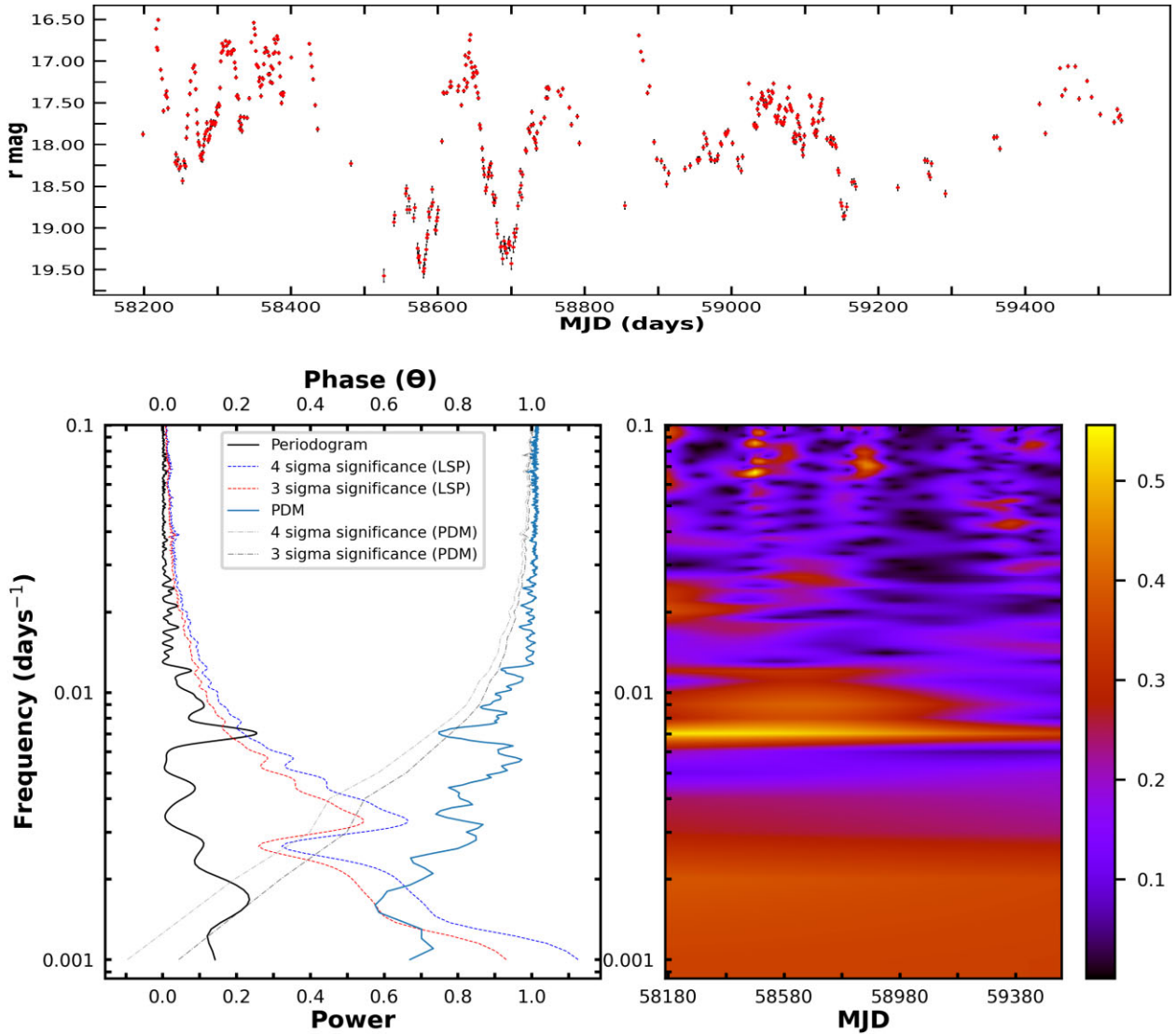
The overall variance including all the phase bins reads as

$$s^2 = \frac{\sum (n_j - 1)s_j^2}{\sum n_j - M} \quad (j = 1, \dots, M). \quad (6)$$

The periodogram statistic,  $\theta = \frac{s_j^2}{s^2}$ , defined as the ratio between the sample variance to the overall variance provides a measure of scatter

of the sample variance around the mean of the time series. For a true period the scatter is expected to be small, so  $\theta$  will be low. On the other hand, for a false period sample variance approaches true variance, and  $\theta$ , therefore, approaches unity. After plotting the test statistic  $\theta$  with each trial period, one obtains the local minimum  $\theta_{\min}$  indicating a frequency corresponding to the least scatter about the mean.

However, using extensive Monte Carlo simulations to test the detection feasibility of a true positive periodicity against the red noise background (which is the case for AGN), it was concluded that the PDM technique has to be used very cautiously and QPO components occurring beyond one-third of the light curve duration tend to be false positives (Krishnan et al. 2021). Keeping this in mind, we have used the PDM technique only as an auxiliary tool to verify the putative periodicities obtained from WWZ and LSP techniques. We reject any dip occurring at a frequency corresponding to  $>1/3$ rd of the light curve duration and also exclude the false positives arising out of the data gaps by matching with the template obtained from WWZ



**Figure 4.** As in Fig. 1, for the blazar J173927+495503. A low-frequency peak in the LSP at  $\sim 4\sigma$  statistical significance was detected in the  $r$ -band light curve, suggesting the presence of a QPO at  $0.0069 \text{ d}^{-1}$ , and the phase in the PDM analysis also shows a dip at this frequency ( $>3\sigma$  significant). A power concentration is seen at that frequency in the WWZ plot over the entire span of observations but it weakens with time.

false positive. This leaves us with only the true positive signals, and we find the QPO frequencies from the PDM match well with those obtained from LSP and WWZ in the case of both the  $r$ - and  $g$ -band data. In our PDM analysis, we have utilized the publicly available PYASTRONOMY PDM software.<sup>3</sup> In Figs 1–5 where we observe the signature of a significant peak from the LSP and WWZ methods, we detect strong dips in PDM phase as well, which further strengthens the claims of QPO detections. We tested the same method for  $g$ -band data as well, and the periodicity obtained in LSP and WWZ are also well corroborated with PDM in these  $g$ -band light curves (see Figs A1–A5). Following the same method as in LSP and WWZ, we have estimated the significance values for the PDM dips, and in  $r$ -band data, we obtain a  $3\sigma$  detection significance in all the cases, and  $>4\sigma$  detection significance in the case of J092331+412527 and J101950+63200. In the  $g$ -band data as well, the detection

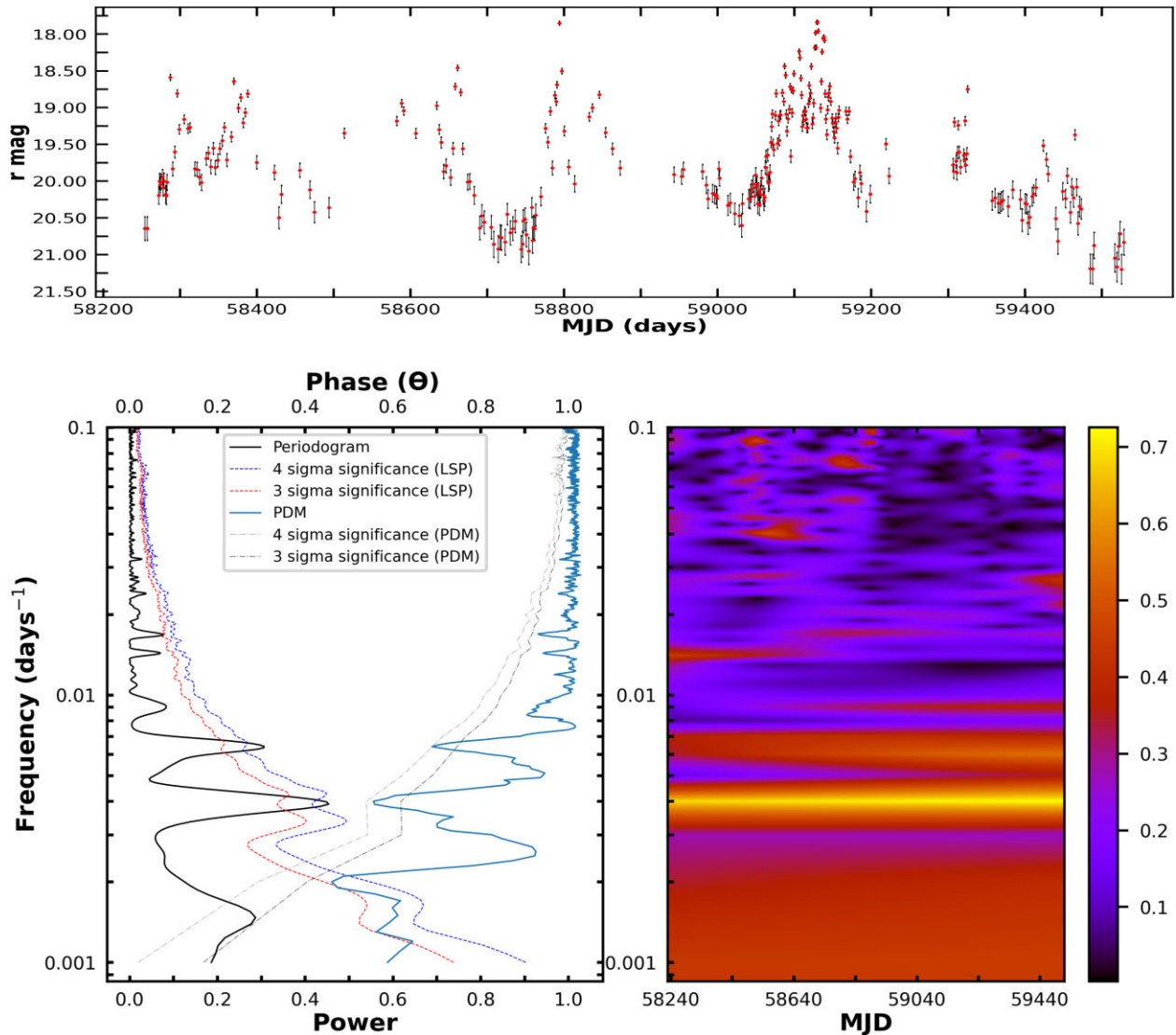
significance is  $>3\sigma$  in all cases, barring J092915+501336, for which the significance is marginally below  $3\sigma$ .

Below, we discuss possible physical scenarios for the emergence of such a QPO feature.

#### 4 DISCUSSION AND CONCLUSIONS

For blazars, the approaching jet is aligned close to the observer's line of sight ( $<10^\circ$ ; Urry & Padovani 1995), and the entire electromagnetic spectrum is usually fully dominated by the emission from the jet. The extreme relativistic boosting means that the jet's emission appears strongly amplified, often overwhelming all the thermal emission contributed by the AGN's accretion disc and the host galaxy. Therefore, it is quite likely that the jet emission is the primary driver behind the observed QPO signature instead of the putative accretion disc or the coronal region. If the jet is precessing or if it possesses an internal helical configuration (Camenzind & Krockenberger 1992; Villata & Raiteri 1999; Rieger 2004; Mohan & Mangalam 2015), quasi-periodic flux variations could easily arise

<sup>3</sup><https://pyastronomy.readthedocs.io/en/latest/pyTimingDoc/pyPDMDoc/pdm.html>



**Figure 5.** As in Fig. 1, for the blazar J223812+274952. A low-frequency peak in the LSP at  $\sim 4\sigma$  statistical significance detected in the  $r$ -band light curve, suggesting the presence of a QPO at  $0.0065 \text{ d}^{-1}$ . A dip in phase at that frequency ( $>3\sigma$  significant) also is observed in the PDM analysis. A power concentration is seen at that frequency in the WWZ plot over the entire span of observations but it weakens with time. The other apparently significant peak seen at a frequency of  $\sim 0.0039$  is found to be a false signal, matching with the fake signal due to the data gap.

from the temporal variations in the Doppler boosting factor as perceived by the observer. In the context of the blazar PG 1553+113, Ackermann et al. (2015) described the possibility of a  $\sim 2$  yr QPO in the  $\gamma$ -ray and other waveband emissions in this way. There could be several possible triggers behind the jet axis modulation, one being the Lense–Thirring precession of the disc (e.g. Fragile & Meier 2009).

It has been shown that if the AGN is part of a binary SMBH system, that could also induce the jet precession effect (Begelman, Blandford & Rees 1980; Valtonen et al. 2008), although such mechanisms are most likely to produce periodicities exceeding 1 yr (Rieger 2007). Several such candidates demonstrating  $\gamma$ -ray QPOs with periods longer than this ballpark have recently been reported and have found plausible explanations in this framework (Ackermann et al. 2015; Sandrinelli et al. 2016a; Sandrinelli, Covino & Treves 2016b; Zhang et al. 2017a, b). However, for jets closely aligned along the line of sight having large Lorentz factors, the detected periods could be significantly shorter (Rieger 2004). Zhou et al. (2018) has applied this

framework in order to explain the 34.5 d QPO apparently detected in the BL Lac PKS 2247–131. In our cases as well, if the jets are closely aligned along the line of sight, and the Lorentz factors are high, such a jet precession effect could produce QPOs in the range between 144 and 196 d that we have obtained.

The appearance of fast quasi-periodicity in the jet emission could also be explained in the framework of magnetic reconnection events in nearly equi-distant magnetic islands inside the jet (Huang et al. 2013). Such a physical configuration could periodically boost the emitted radiation, which would likely be manifested as a rapidly transient QPO. Shukla et al. (2018) successfully applied this paradigm to model the extremely fast variability ( $\sim 5$  min) in the FSRQ CTA 102 during its outburst in 2016. This model does appear to be capable of producing the 3.6-d QPO seen in  $\gamma$ -rays for PKS 1510–089 as well (Roy et al. 2021). Current-driven instabilities near a recollimation shock seem to provide a good explanation for the recent detection of a 13 h QPO in both optical and  $\gamma$ -ray fluxes from BL Lac (Jorstad



et al. 2022). However, the relatively longer optical QPOs exceeding 100 d we have found in these blazars do not seem to fit either of these paradigms.

We can also consider other non-axisymmetric phenomena like the rotation of an accretion disc hotspot around the innermost stable circular orbit (e.g. Zhang & Bao 1990), such that the optical flux modulation comes from the circular motion of the hotspot (e.g. Gupta et al. 2019). However, the  $\sim 200$  d period as observed in our QPO analysis is too long for this mechanism. In addition, the SMBH mass we obtain from the relevant relation

$$\frac{M}{M_{\odot}} = \frac{3.23 \times 10^4 P}{(r^{3/2} + a)(1 + z)}, \quad (7)$$

where  $P$  is the period in seconds,  $r$  is the distance of the hotspot in units of  $GM/c^2$ ,  $a$  is the spin parameter, and  $z$  is the redshift, turns out to be  $\sim 10^{10} M_{\odot}$ , which is on the very high end of plausible values. Therefore, such a ‘rotating hotspot’ interpretation is unlikely to explain the observed QPO in our case.

A geometrical origin instead could also be considered to be a plausible explanation. At radio wavelengths, very long baseline interferometry (VLBI) has revealed that in some blazars, the parsec-scale cores appear to be misaligned with the large, kiloparsec-scale structures of jets (e.g. Sarkar et al. 2019). One natural explanation of such misalignment could be intrinsic helical structures of these inner jets. Such helical structures could be quite common in blazar sources (e.g. Villata & Raiteri 1999). The origin of such helical structures could be connected to the hydrodynamic instability effects in magnetized jet (e.g. Hardee & Rosen 1999), as well as the interaction of the plasma blobs with the proximate medium (Godfrey et al. 2012). Propagation of a relativistic shock or plasma blob out along such a perturbed jet could induce significantly enhanced emission as the shock passes through a region of enhanced electron density. Owing to the extreme Doppler boosting effect, such a flux enhancement would be quite pronounced for an observer looking down the jet and such an effect could naturally be connected to the genesis of a QPO feature (Camenzind & Krockenberger 1992). Such an intersection of a relativistic shock with successive twists of a non-axisymmetric jet structure scenario was invoked by Rani et al. (2009) in order to reasonably explain the claimed 17 d QPO in AO 0235+164. Depending upon the pitch angle, the Lorentz factor, and the viewing angle, such a mechanism is also compatible with the observed several-month periods of the QPOs observed in the present cases.

For the simple one-zone leptonic model where the plasma blob containing elevated particle density and magnetic energy density is moving along a postulated helical trajectory along the extension of the jet, the viewing angle changes with time as

$$\cos \theta_{\text{obs}}(t) = \sin \phi \sin \psi \cos 2\pi t / P_{\text{obs}} + \cos \phi \cos \psi, \quad (8)$$

where  $\psi$  is the angle of the jet relative to our line of sight and  $\phi$  is the pitch angle of the blob, and  $P_{\text{obs}}$  is the observed periodicity (Sobacchi, Sormani & Stamerra 2016). Since the viewing angle varies with time, the Doppler factor also becomes time variable as  $\delta = 1/[\Gamma(1 - \beta \cos \theta(t))]$ , where  $\Gamma = 1/\sqrt{1 - \beta^2}$  is the bulk Lorentz factor. Given this scenario, the periodicity in the rest frame of the blob is given by

$$P_{\text{rf}} = \frac{P_{\text{obs}}}{1 - \beta \cos \psi \cos \phi}. \quad (9)$$

For typical values of  $\phi = 2^\circ$ ,  $\psi = 2^\circ$ , and  $\Gamma = 10$ , the rest frame periodicity becomes  $\sim 97$  yr for  $P_{\text{obs}} \sim 150$  d. During this period, the blob traverses a distance  $D = c\beta P_{\text{rf}} \cos \phi$ , which amounts to  $\sim 30$  parsec during one period. Since for the detection of statistically

significant QPO in the present case we are considering 4–5 cycles at least, during the domain of observation the blob would travel  $\sim 150$  pc. In order to explain the variation of amplitude during the domain of observation, Roy et al. (2021) considered that the angle relative to the line of sight could be time-dependent, arising out of a geometrically curved jet. Over a length scale of 150 pc, such a curved jet structure can form and thereby drive quasi-periodicity with the time-dependent amplitudes we have obtained in our samples. Such a conclusion has been drawn by Roy et al. (2021) for the case of PKS 1510–089.

## 5 SUMMARY

We report highly probable detections of low-frequency QPOs with periods ranging from 144 to 196 d in the  $\sim 3.8$  y long ZTF  $r$ -band optical light curve in five blazar sources. The QPO is also apparently present in the  $g$ -band light curve and lasts for the entire data set at  $\gtrsim 3\sigma$ . Such QPO signals are most likely to originate from the precession of high Lorentz factor jets, closely aligned to the observer’s line of sight or the movement of a plasma blob along a helical jet structure. More such detections, made with surveys at a high cadence, and preferably at multiple bands, would increase our understanding of the underlying physical processes triggering the oscillatory features.

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This research has made use of the NASA/IPAC Extragalactic Database (NED) which is operated by the Jet Propulsion Laboratory, California Institute of Technology, under contract with the National Aeronautics and Space Administration.

## DATA AVAILABILITY

The data used in this study is publicly available in the ZTF DR10.

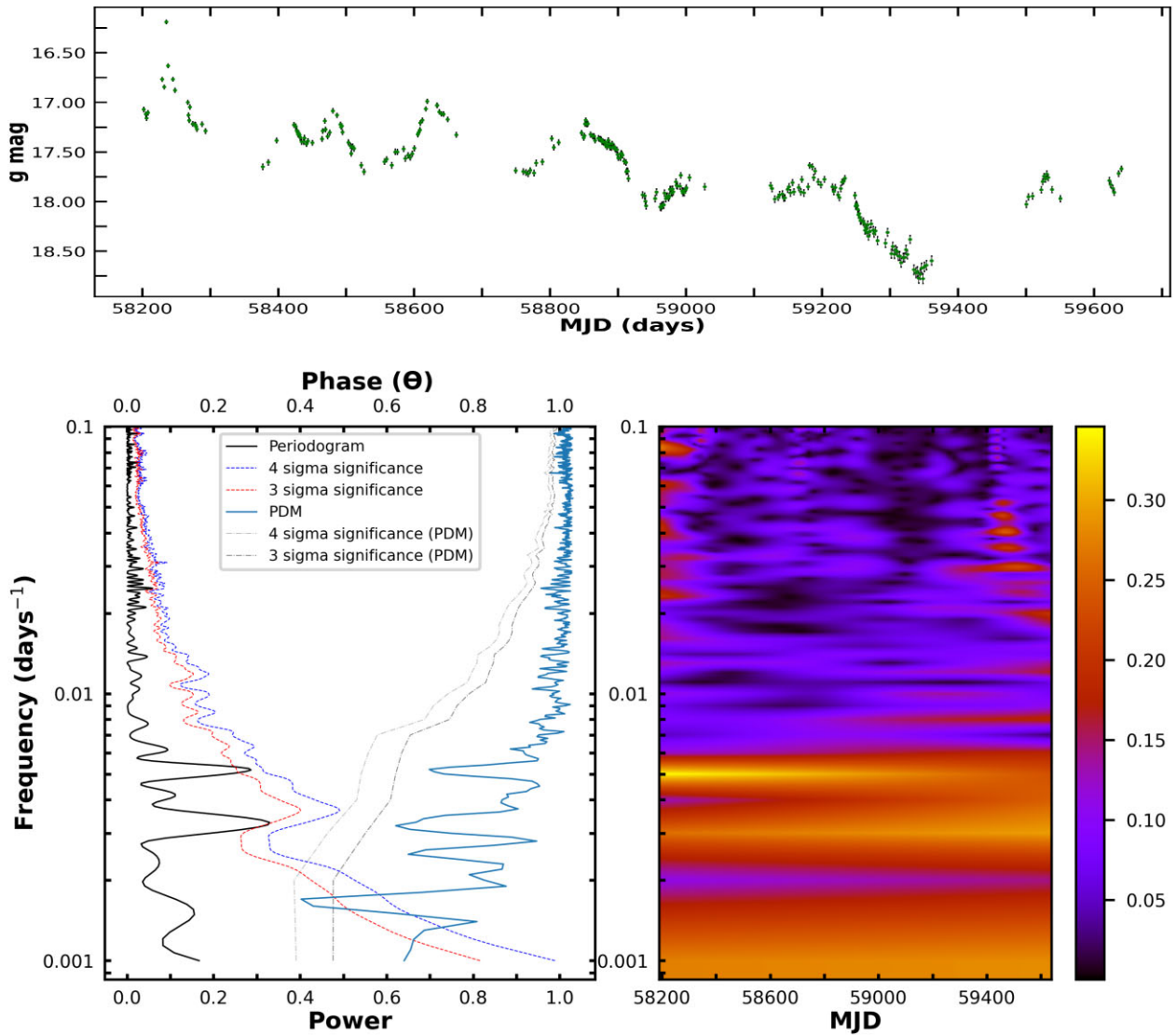
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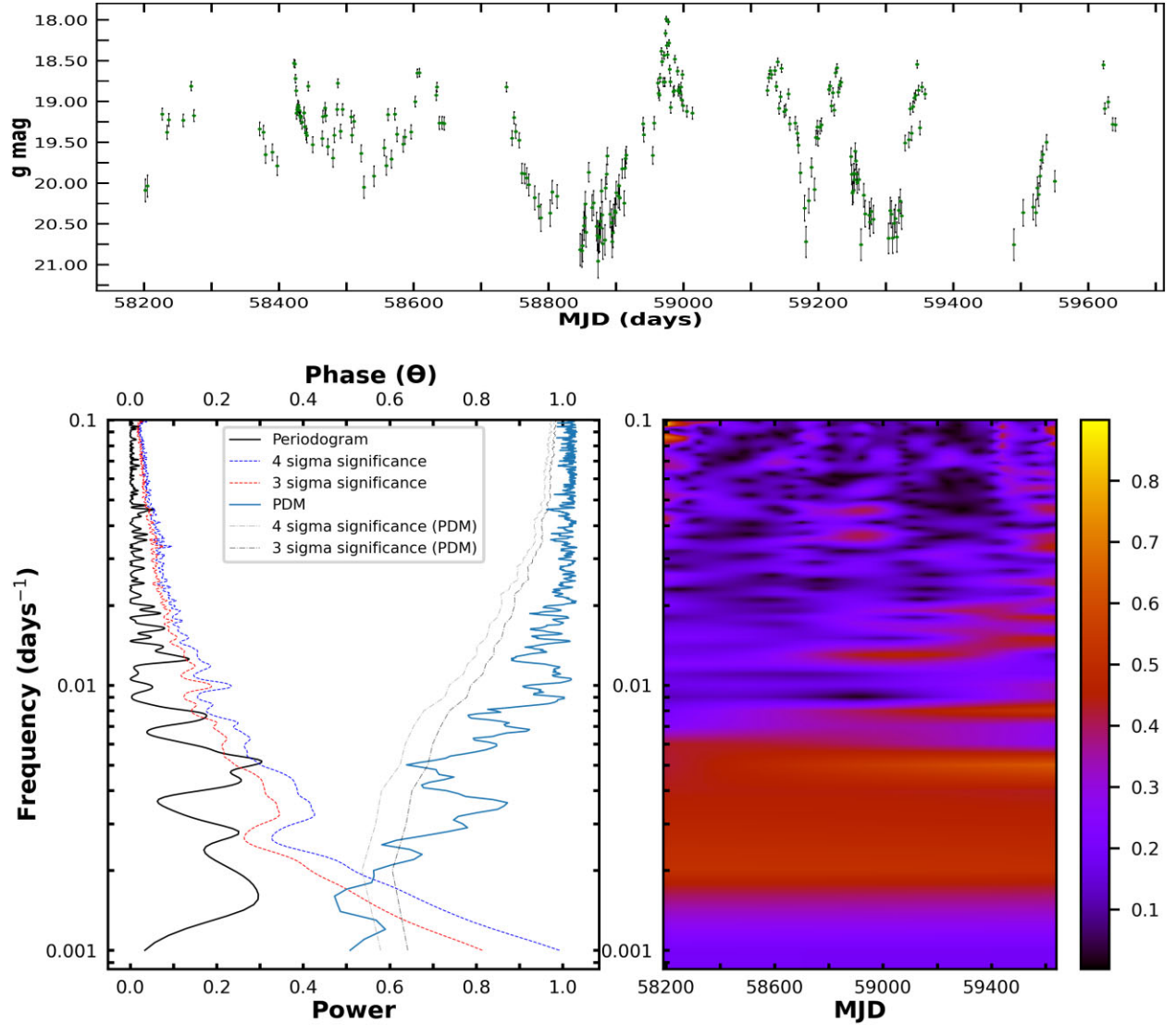
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## APPENDIX A: RESULTS FOR THE G-BAND ANALYSIS OF THE FIVE SOURCES

In this section, we present information on the analysis of the g-band light curves of the five sources showing a prominent peak/dip in the WWZ, LSP, and the PDM analyses. As mentioned earlier, we are considering only those cases to be legitimate ones for which a peaked signature is observed in the WWZ map (i) above a frequency of  $0.005 \text{ d}^{-1}$  and (ii) concentrated within a narrow window of frequency and present throughout the observed duration. The analysis of the g-band light curve of these five sources showed similar signatures of periodicity (see Figs A1–A5), which further confirms the true nature of these QPOs.

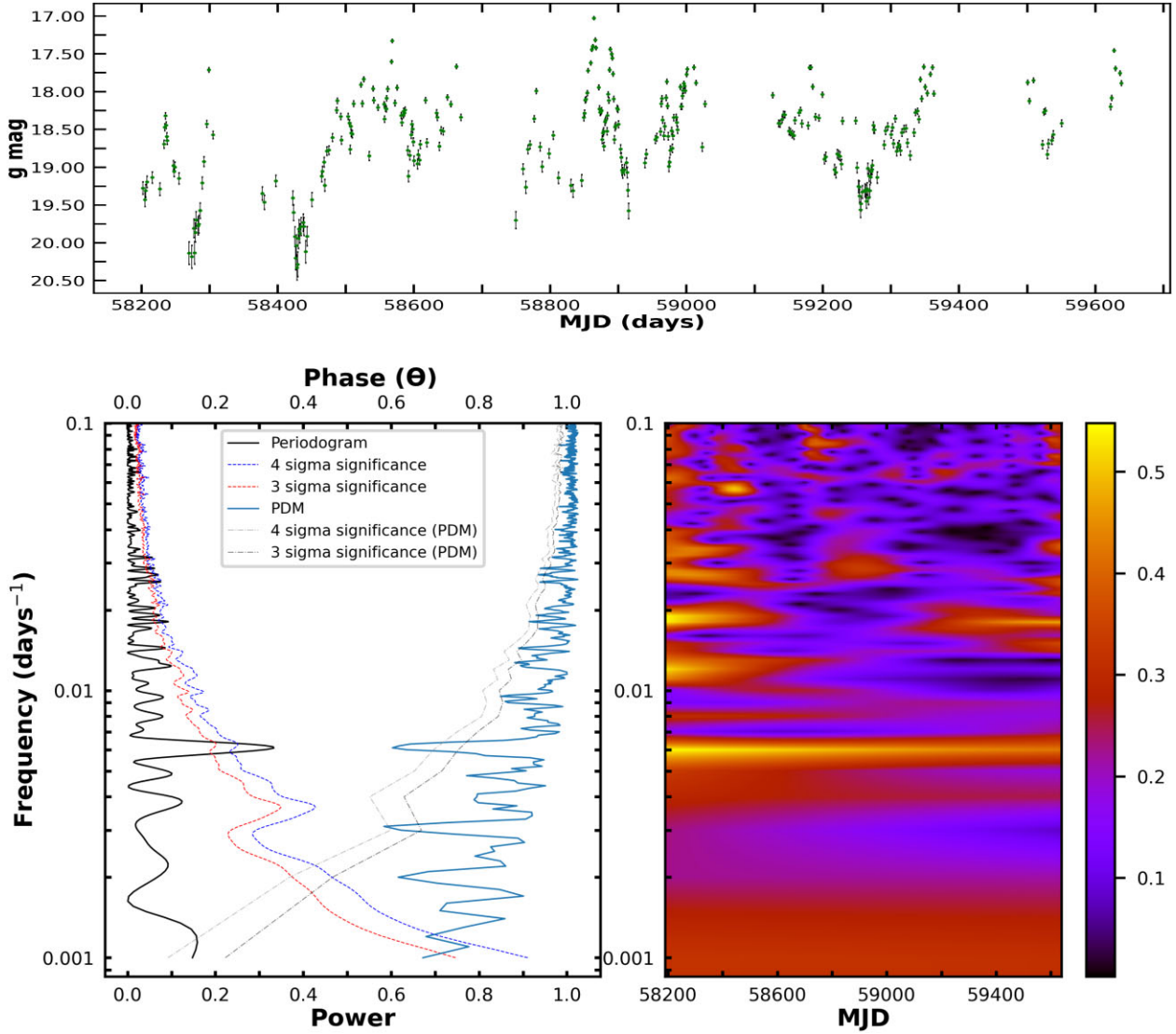


**Figure A1.** Upper panel: *g*-band ZTF light curve of blazar J092915+501336 over a time span of 3.8 yr. Bottom left panel: A low-frequency peak in the LSP at  $>3\sigma$  statistical significance is detected in the *g*-band light curve, similar to the  $>4\sigma$  peak in the *r*-band, suggesting the presence of a QPO at  $0.0051 \text{ d}^{-1}$ . The PDM phase factor also shows a dip at that frequency, which is marginally below  $3\sigma$  significance level. Bottom right panel: A weighted wavelet Z-transform for the *g*-band optical light curve showing a strong power concentration over the entire observing time window at that slightly too low frequency.

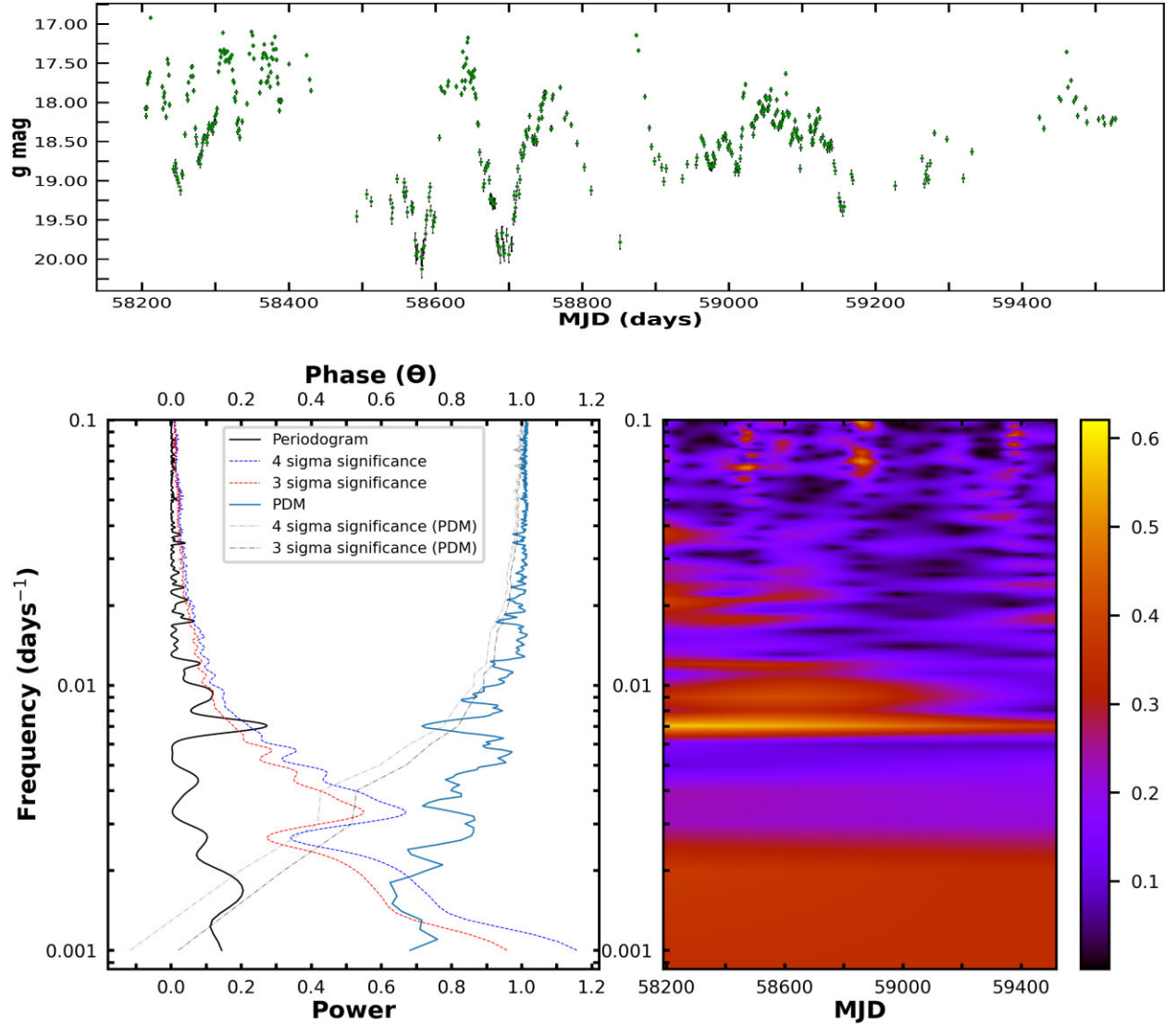


**Figure A2.** As in Fig. A1, for the blazar J092331+412527. A broad low-frequency peak in the LSP at  $>4\sigma$  statistical significance detected in the  $g$ -band light curve, similar to the  $>4\sigma$  peak in the  $r$ -band, suggesting the presence of a QPO around  $0.0051 \text{ d}^{-1}$ . A slump in the phase factor from the PDM analysis ( $>3\sigma$  significant) is also seen there. A moderately strong but very broad power concentration is seen in the WWZ throughout the length of the observations.

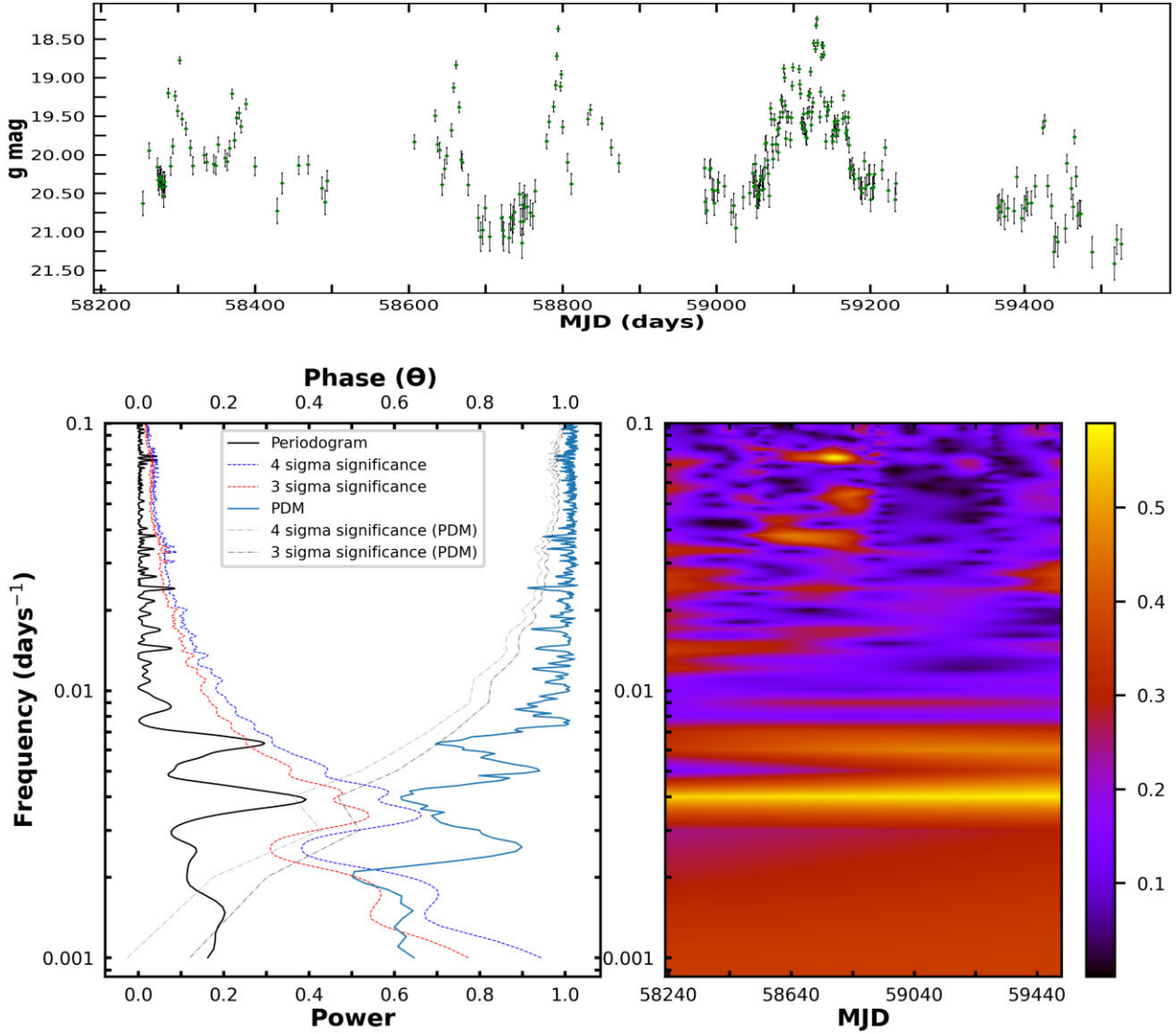




**Figure A3.** As in Fig. A1, for the blazar J101950+632001. A low-frequency peak in the LSP at  $>4\sigma$  statistical significance detected in the  $g$ -band light curve, similar to the  $>4\sigma$  peak in the  $r$ -band, suggesting the presence of a QPO around  $0.0062 \text{ d}^{-1}$ . A sharp drop in the phase factor to below 0.6 ( $>4\sigma$  significant) is observed in the PDM analysis. A strong and very narrow power concentration is seen in the WWZ throughout the length of the observations.



**Figure A4.** As in Fig. A1, for the blazar J173927+495503. A low-frequency peak in the LSP at  $>4\sigma$  statistical significance detected in the  $g$ -band light curve, similar to the  $>4\sigma$  peak in the  $r$ -band, suggesting the presence of a QPO around  $0.0069 \text{ d}^{-1}$ . A minimum in the phase factor is detected in the PDM analysis ( $>4\sigma$  significant) at that frequency. A strong and very narrow power concentration is seen in the WWZ throughout the length of the observations.



**Figure A5.** As in Fig. A1, for the blazar J223812+274952. A low-frequency peak in the LSP at  $>3\sigma$  statistical significance detected in the  $g$ -band light curve, similar to the  $>4\sigma$  peak in the  $r$ -band, suggesting the presence of a QPO around  $0.0065 \text{ d}^{-1}$ . At this frequency, a prominent dip in the phase factor is also observed from our PDM analysis ( $>3\sigma$  significant). A strong and very narrow power concentration is seen in the WWZ throughout the length of the observations.

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