

# **Rotation Periods of Asteroids Determined With Bootstrap Convex Inversion From ATLAS Photometry**

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The rotation period is one of the fundamental physical characteristics of asteroids. It can be determined from photometric measurements by standard methods of time-series period analysis or by creating a physical model of an asteroid with the rotation period being one of the fitted parameters. We used the latter approach to determine the sidereal rotation period for more than 5000 asteroids, out of which about 1600 are those for which their period was not known. We processed photometric measurements of about 100,000 asteroids from the ATLAS survey with the light curve inversion technique in the Asteroids@ home project to search for the best-fit rotation period. This was repeated 25 times with randomly resampled-bootstrapped-data. For thousands of asteroids, their best-fit period was the same for most of the bootstrapped data sets; thus, their rotation

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period was determined with a high degree of reliability.

#### Keywords: asteroids, photometry, surveys, light curves, bootstrap

# **1 INTRODUCTION**

Asteroid photometry is a simple yet powerful tool to reveal some basic physical properties of observed objects. Time-resolved photometry-a light curve-provides a direct measurement of the rotation period. The vast majority of asteroid rotation periods (currently around 30,000 in the Asteroid Lightcurve Database, LCDB, of Warner et al., 2009)<sup>1</sup> have been determined from light curve analysis.

When an asteroid is observed over a longer time interval (years), its light curves change as the aspect and the solar phase angle change. If the coverage of geometries is sufficient (which usually requires several apparitions for a main-belt asteroid), the evolving shape of the light curves uniquely defines the direction of the rotation axis and the convex shape of the asteroid, together with the sidereal rotation period (Kaasalainen and Durech, 2020). The process of reconstruction of asteroid shape and spin is called light curve inversion, and it can be done almost routinely if there is a sufficient amount of observations (Kaasalainen et al., 2001, 2002).

Apart from classical light curves that are true "curves" showing how the brightness evolves with time, there are also photometric observations that are sparse with respect to the rotation period. Thus, instead of a curve, we have individual sparse-in-time brightness measurements. This data type are typically produced by sky surveys and they can be used the same way as light curves for the shape and spin reconstruction of asteroids (Kaasalainen, 2004).

<sup>1</sup>https://minplanobs.org/MPInfo/



**FIGURE 1** Histogram showing the number of asteroids with a given  $N_{BS}$ —the number of cases in which the BS period was the same as the original one. The number above each histogram bar indicates the mean number of data points for asteroids in that sample.



With the light curve inversion, the shape and spin of an asteroid are found by fitting a model (described by the rotation period P, the direction of the spin axis in ecliptic

coordinates  $(\lambda, \beta)$ , and parameters of a convex shape) to data. The best model is found by scanning the period/pole parameter space with the standard  $\chi^2$  measure used to define the best agreement between the model and the data. Hundreds of models have been derived from dense photometry (Wang et al., 2015; Warner et al., 2017; Husárik, 2018; Marciniak et al., 2018; Franco and Pilcher, 2020, for example) and thousands from sparse photometry (Durech et al., 2009; Hanuš et al., 2013; Durech et al., 2016; Durech and Hanuš, 2018; Durech et al., 2020, for example). Sparse photometry is available from large sky-surveys (Pan-STARRS, ATLAS, Catalina, Gaia, ZTF, etc.) essentially for all asteroids. Because the photometric accuracy and the number of data points are usually not sufficient to derive a reliable model, the success rate of inversion of sparse data is low. However, as we show in this paper even when sparse data are not abundant enough to derive a reliable full spin/shape model, the rotation period can be derived uniquely.

This work aims to derive sidereal rotation periods of asteroids that have photometric data from the ATLAS survey. In our previous work ( $\check{D}$ urech et al., 2020), we used the same data to derive full shape/spin models.

# **2 ATLAS PHOTOMETRY**

In this work, we used the same data set as Ďurech et al. (2020). The data come from the Asteroid Terrestrial-impact Last Alert System (ATLAS) telescopes located in Hawaii (Tonry et al., 2018b,a; Smith et al., 2020; Heinze et al., 2018) and consist of photometric measurements collected from June 2015 to October 2018 in orange (o, 560–820 nm) and cyan (c, 420–650 nm) filters.

**TABLE 1** For nine groups of asteroids with different  $N_{\text{BS}}$ , the table lists the number  $N_{\text{A}}$  of asteroids with a given  $N_{\text{BS}}$ , the number  $N_{\text{U3}}$  of those that have U = 3 period record in the LCDB, the number  $N_{\text{same}}$  of asteroids with the  $P_{\text{A}}$  and  $P_{\text{DB}}$  being the same (±5%), the probability  $p_{\text{same}} = N_{\text{same}}/N_{\text{U3}}$ , the number of wrong ATLAS periods  $N_{\text{A}}^{\text{wrong}}$  (**Table 2**), the number of wrong LCDB periods  $N_{\text{DB}}^{\text{wrong}}$  (**Table 2**), and the probability  $p_{\text{A}}^{\text{correct}}$  that  $P_{\text{A}}$  is correctly determined.

N <sub>BS</sub>	N <sub>A</sub>	N <sub>U3</sub>	N <sub>same</sub>	p <sub>same</sub> [%]	N <sub>A</sub> <sup>wrong</sup>	N <sup>wrong</sup> DB	p <sup>wrong</sup> DB	p <sub>A</sub> correct [%]
25	1784	904	885	97.9	4	14	1.6	99.5
24	795	231	224	97.0	2	4	1.8	98.6
23	667	165	159	96.4	3	2	1.3	97.9
22	639	114	109	95.6	4	1	0.9	97.2
21	642	114	105	92.1				93.6
20	666	99	91	91.9				93.4
19	752	106	90	84.9				86.3
18	696	72	56	77.8				79.0
17	757	74	60	81.1				82.4

The original data set consisted of photometry of about 180,000 asteroids. However, we selected only asteroids with at least 100 observations, which reduced the total number of objects to about 100,000.

We processed this data set at Asteroids@home project (Durech et al., 2015)—the best-fit sidereal rotation period was searched for at an interval of 2-1,000 h, and ten initial spin axis directions were tried for each trial period. The spin and shape parameters then converged to a local minimum in  $\chi^2$ . The global minimum in  $\chi^2$  then defined the best-fit sidereal rotation period  $P_{\rm A}$ . This part of the work was, in fact, ready because we used the periodograms computed already by Durech et al. (2020). In our previous work (Durech et al., 2020), we selected the global minimum in  $\chi^2$ , tested its significance with respect to other global minima, checked the reliability of the shape model using the same processing pipeline as Durech et al. (2018), and reported the shape models with their rotation poles and periods. In our new approach, we concentrated only on rotation periods. We used a bootstrap (BS) method to resample the observations randomly and determine the period and its uncertainty via a Monte Carlo approach. We repeated the period scan for each BS realization, generated a new periodogram, and tested the robustness of the original best-fit period  $P_A$ .

## **3 BOOTSTRAP**

For each asteroid, we created 25 bootstrapped samples of the original data set in both filters independently (we randomly selected the same number of measurements) and repeated the period search, i.e., we computed other 25 periodograms at Asteroids@home. From each periodogram, we selected the best-fit period  $P_{\rm BS}^{(i)}$  defined as having the minimum  $\chi^2$  value. This way, we obtained for each asteroid (95 789 in total) 25 best periods  $P_{\rm BS}^{(i)}$ , i = 1, ..., 25, from bootstrapped data. We decided to compute 25 BS samples as a compromise between the robustness of our analysis and the computational time spent on Asteroids@ home.

The motivation for this approach was our expectation that if the best period is always the same for all BS samples, it is likely to be the actual rotation period. On the other hand, if the original period  $P_A$  is not found in resampled BS data, it is likely just a random value not related to the real rotation period. **Figure 1** shows the distribution of  $N_{\text{BS}}$ , which is the number of cases when the best BS period  $P_{\text{BS}}^{(i)}$  was the same as the original period  $P_A$ . By "the same" we mean that their relative difference was not larger than 1%. In other words, for each asteroid, we define

$$N_{\rm BS} = \sum_{i=1}^{25} \xi_i, \text{ where } \xi_i = 1 \text{ if } \frac{\left|P_{\rm A} - P_{\rm BS}^{(i)}\right|}{P_{\rm A}} \le 0.01, \text{ and}$$
$$\xi_i = 0 \text{ otherwise.}$$

If every BS sample gives the same best-fit period, then  $N_{\rm BS}$  = 25. If no  $P_{\rm BS}^{(i)}$  agrees with the original  $P_{\rm A}$ , then  $N_{\rm BS} = 0$ . As we can see in Figure 1, for about 20,000 asteroids, the best period in each BS sample is just a random value that is, not related to the original period—the number of agreements  $N_{\rm BS}$  is zero. The majority (about 70,000) asteroids have no more than five cases in which  $P_{\rm BS}$  agrees with  $P_{\rm A}$ , their  $N_{\rm BS} \leq 5$ . As expected, the number of asteroids with some value of  $N_{\rm BS}$  decreases with increasing  $N_{\rm BS}$ until the maximum  $N_{\rm BS}$  = 25. The number of asteroids for which all 25 BS samples give the same period as the original data is ~1800. The number of observations plays a crucial role in the robustness of period determination-the mean number of data points for asteroids in each histogram bar is shown in Figure 1; it increases with increasing  $N_{\rm BS}$ . The minimum number of observations was 100. Asteroids with uncertain periods ( $N_{\rm BS} \leq$ 5) have, on average, less than 200 observations; those with almost certain period determination ( $N_{\rm BS} \gtrsim 20$ ) have more than 300.

In **Figure 2**, we show a comparison between periods  $P_A$  determined from the original ATLAS data and periods  $P_{DB}$  taken from the LCDB of Warner et al. (2009) with the uncertainty tag U = 3 (release from June 2021, 3830 asteroids with U = 3). The uncertainty tag evaluates the reliability of the period and U = 3, the highest value, means that the period is unambiguous and uniquely determined. Asteroids with high  $N_{BS}$  (red points,  $20 \le N_{BS} \le 25$ ) lie primarily on the diagonal, which means that the periods  $P_{LCDB}$  and  $P_A$  are the same. For medium-reliability period determinations (blue points,  $10 \le N_{BS} \le 15$ ), many  $P_A$  values do not agree with the LCDB period, and often there is an alias of 24 or 48 h; or  $P_A$  is half of  $P_{DB}$ . For the low-reliability group (grey points,  $1 \le N_{BS} \le 6$ ), there is no apparent relation between the two periods— $P_A$  periods are just arbitrary values not reliable at all.

## 3.1 Reliability of Period Determination

Out of the total sample of ~100,000 asteroids, 1784 have  $N_{\rm BS}$  = 25, i.e., all BS realizations lead to the same best-fit period, so these are those asteroids with the most reliable period determination. Out of them, 904 also have a period compiled in the LCDB with U = 3, which enables us to compare our ATLAS periods with independent values. We assume that  $P_{\rm DB}$  and  $P_{\rm A}$  agree if their relative difference is less than 5%. For 885 cases, the ATLAS period agrees with  $P_{\rm DB}$ . However, 19 asteroids have different periods; they are listed in **Tables 1**, **2**. We checked the LCDB

**TABLE 2** List of asteroids with  $N_{BS} \ge 22$  for which the period  $P_A$  that we obtained from ATLAS data disagrees with the period  $P_{DB}$  in the LCDB. The formal uncertainty of  $P_A$  is  $\sigma_{BS}$ . By " $\checkmark$ ," we mark our decision if either ATLAS period (A) of LCDB period (DB) is correctly determined. Behrend's web is a database of asteroid light curve observations and rotation periods available at https://obswww.unige.ch/behrend/page-cou.html.

Asteroid	<i>P</i> <sub>A</sub> (h)	σ <sub>BS</sub> (h)	<i>Р</i> <sub>DB</sub> (h)	A	DB	Comment
N <sub>BS</sub> = 25						
496 Gryphia	24.5152	0.0005	1072	$\checkmark$	$\checkmark$	The LCDB rotation period is outside the search interval. It is likely to be the correct period because the light curves of Pilcher et al. (2017) are flat with no apparent period of 24 h
526 Jena	11.8764	0.0004	9.474			Our $P_A$ value is the same as the period determined by $\check{D}$ urech et al. (2019) and is consistent also with light curves of Barucci et al. (1994), although they determined the period to 9.474 h
571 Dulcinea 818 Kapteynia	189.12 17.461	0.03 0.003	126.3 16.35	1		According to Stephens (2011), this asteroid is a tumbler so there in no unique rotation period Our period is likely to be correct because it is consistent with other sparse photometry (ASAS-SN, Hanuš et al., 2021). The LCDB period of 16.35 h (Stephens, 2002) might be just a result of incorrect folding of separate light curves
893 Leopoldina 1248 Jugurtha 1332 Marconia 1536 Pielinen	12.5993 12.19042 32.123 33.119	0.000 3 0.000 03 0.001 0.009	14.115 12.91 19.16 66.22	\ \ \	V	Durech et al. (2020) derived a full model with the same period from ATLAS data Our period is the same as an independent determination of Durech et al. (2016) Our period is the same as those derived by Devogèle et al. (2017), Durech et al. (2019) The half period of 33 h was found using a convex model, the ellipsoidal model gives the correct period of 66 h. Also a full model derived from the same ATLAS data by Durech et al. (2020) has period of 66 h.
1586 Thiele	3.296 293	0.000 009	3.086	$\checkmark$		Our period is correct, the LCDB one is based on only two nights of Childers and Church (2007), likely incorrectly phased
1684 Iguassu 1786 Raahe 3066 McFadden 3409 Abramov	9.143 4 30.168 32.752 5 8.503 61	0.000 4 0.002 0.000 5 0.000 04	6.4156 18.72 13.798 7.791	\ \ \ \		Our period is confirmed by independent results of Waszczak et al. (2015) Our period is correct—confirmed by independent sparse data and also Behrend'd database Pál et al. (2020) independently confirmed our period Erasmus et al. (2020) derived the same period form the same ATLAS data, other sparse photometry also confirms this period
3422 Reid 3507 Vilas 5132 Maynard 6192 Javiergorosabel	3.218274 4.7550 3.6090 39.317	0.000 009 0.000 03 0.000 1 0.002	2.91 3.959 3.902 78.85	\ \ \	$\checkmark$	Pál et al. (2020) found the same period The same period was found by Erasmus et al. (2020). Ďurech et al. (2020) derived a full model Independent confirmation of <i>P</i> <sub>A</sub> by Pál et al. (2020) Our period is the same as Pál et al. (2020) but it corresponds to one-peak light curve, ellipsoidal model gives double period 78 h
9033 Kawane 37 635 1993 UJ1	2.88269 662.7	0.000 02 0.3	5.7656 600	$\checkmark$	$\checkmark$	The same as above, false half period The periods are similar although their difference is larger than 5%
N <sub>BS</sub> = 24 520 Franziska 740 Cantabia	8.251 38 32.141 0	0.0003 0.006	16.507 64.453	1	✓	Wrong half period Pál et al. (2020) and also Hanuš et al. (2021) report our P <sub>A</sub> , Stephens et al. (2010) reports a value that is twice larger
1227 Geranium	17.2683	0.004	12.363	?	?	Durech et al. (2020) derived the same period and a full model but the shape has an unrealistic triangular pole-on silhouette. Not clear which period is the correct one
1960 Guisan 2791 Paradise	7.84666 16.3486	0.004 0.005	8.46 9.81	\ \		Two low-quality light curves of Binzel (1987) probably incorrectly phased Hanuš et al. (2016) reports period of 9.81 h (on a limited search interval) but Behrend's web reports 16.361 h
4797 Ako 11 087 Yamasakimakoto	3.870 091 6.279 556	0.000 02 0.000 04	4.085 4.5369	√ √		Durech et al. (2020) derived a full model with the period close to that of Bennefeld et al. (2009) Pál et al. (2020) confirm our period
N <sub>BS</sub> = 23 1539 Borrelly 2425 Shenzhen 2895 Memnon 7783 1994 JD 10 704 1981 RQ1 18 582 1997 XK9	23.831 2 9.838 246 3.760 08 15.908 7 3.754 01 107.712 1	0.01 0.000 02 0.000 1 0.01 0.000 05 0.01	15.922 14.715 7.516 31.83 7.507 114	✓ ✓	√ √ √	Behrend's web and also Polakis (2020) confirm our period Confirmed by other sparse data and Ďurech et al. (2016) False half solution, Ďurech et al. (2020) derived a unique model from the same data False half period False half period. Erasmus et al. (2020) have the correct double period from the same data We consider these periods to be the same within their uncertainty intervals
N <sub>BS</sub> = 22 282 Clorinde 518 Halawe 1949 Messina 7937 1990 QA2 10 037 1984 BQ	49.362 3 7.159 08 3.390 64 3.116 85 7.854 744	0.02 0.000 3 0.000 2 0.000 2 0.000 07	6.42 14.31 3.6491 6.23 6.7482	✓	\ \ \ \	Confirmed by Ďurech et al. (2020) and Bonamico and van Belle (2021) False half period False period Probably false half period Probably incorrect <i>P</i> <sub>A</sub>

records and original publications to decide which period was the correct one. In 14 cases, we concluded that the ATLAS period was correct; in four cases, the LCDB period was correct; and in one case, the asteroid is tumbling, so there is no single rotation period.

So in 885 cases out of 904,  $P_A$  and  $P_{DB}$  are the same (within a 5% interval), and we assume that these periods are correct—they are real rotation periods. The number of incorrect LCDB periods in our sample is 14 out of 904, so the probability that for a randomly

**TABLE 3** For asteroids with  $N_{BS} \ge 20$ , the table lists their rotation period  $P_A$ , the standard error  $\sigma_{BS}$  estimated from bootstrap, the uncertainty  $\sigma_{max}$  of the period estimated from the length of the observing interval, and the number  $N_{BS}$  of cases when  $P_A$  was the same as  $P_{BS}^{(i)}$ . The probability of  $P_A$  being correct is directly related to  $N_{BS}$  according to **Table 1**. The complete table with more than 5000 records is available as **Supplementary Material**.

A	Asteroid	P <sub>A</sub>	$\sigma_{BS}$	$\sigma_{\max}$	N <sub>BS</sub>
		(h)	(h)	(h)	
13	Egeria	7.04634	0.0008	0.000 9	22
24	Themis	8.374 15	0.0006	0.000 2	23
26	Proserpina	13.1054	0.002	0.0003	21
32	Pomona	9.447 690	0.000 08	0.000 2	24
33	Polyhymnia	18.609 12	0.0008	0.0007	25
34	Circe	12.174 549	0.000 1	0.0003	24
37	Fides	7.3327	0.001	0.000 1	21
42	Isis	13.58272	0.000 1	0.000 4	23
48	Doris	11.88992	0.0006	0.0003	22
49	Pales	20.708 14	0.0003	0.000 9	25
217101	2001 XM29	2.7090	0.000 1	0.000 06	23
217298	2004 JY4	38.02	0.07	0.01	20
222655	2001 XW186	3.365 68	0.0004	0.000 1	21
231 865	2000 SY318	3.01651	0.000 2	0.000 08	23
250436	2003 WT137	8.050 50	0.0009	0.0007	21
267090	1999 VS198	8.9523	0.003	0.0007	23
270324	2001 XV96	88.0955	0.08	0.08	23
350872	2002 PG43	19.710	0.03	0.007	20
373534	2001 TR169	5.06367	0.0006	0.000 5	20
411201	2010 LJ14	114.233 02	0.008	0.03	23



Rotation period [hours] 120 2 3 6 12 24 48 240 480 1 ATLAS TESS LCDB U=3 LCDB all 1000 100 10 1 10 1 0.1 Rotation frequency [cycles/day] FIGURE 4 | Comparison of distribution of periods from ATLAS (blue) with the LCDB periods for U = 3 (red), all LCDB periods (dotted red), and TESS data from Pál et al. (2020) (black).

chosen asteroid  $P_{\text{DB}}$  is not correct (for U = 3) is 1.6%. In other words, we estimated that the probability of a period in the LCDB with U = 3 being correct is  $p_{\text{DB}}^{\text{correct}} = 98.4\%$ .

We compared ATLAS and LCDB periods also for asteroids with  $N_{\rm BS} = 24, 23, 22$  and inspected the discrepant cases (**Table 2**). The results are summarized in **Table 1**. The probability that for a

given asteroid both periods are correct is a product of probabilities  $p_A^{\text{correct}}$  that  $P_A$  is correct and  $p_{\text{DB}}^{\text{correct}}$  that  $P_{\text{DB}}$  is correct. From the analysis of the group of asteroids with  $N_{\text{BS}} = 25$ , we know that  $p_{\text{DB}}^{\text{correct}} = 98.4\%$ , so we can compute  $p_A^{\text{correct}}$ . The table lists these probabilities for  $N_{\text{BS}} \ge 17$ . Probability  $p_A^{\text{correct}}$  is

>95% for  $N_{\rm BS}$   $\geq$  22, for  $N_{\rm BS}$  = 21 or 20 it is around 93%, and it drops below 90% for  $N_{\rm BS}$  < 20.

The analysis above depends on the total number of BS samples, however, not critically. If, for some reason, we had only 22 BS samples in total, then for  $N_{\rm BS} = 22$  (according to **Table 1**),  $N_{\rm A} = 3885$ ,  $N_{\rm U3} = 1414$ ,  $N_{\rm same} = 1377$ ,  $p_{\rm same} = 97.4\%$ ,  $N_{\rm DB}^{\rm wrong} = 21$ ,  $p_{\rm DB}^{\rm wrong} = 1.5\%$ , and  $p_{\rm A}^{\rm correct} = 98.9\%$ . So our new estimate of the probability  $p_{\rm DB}^{\rm wrong}$  would be almost the same as before and  $p_{\rm A}^{\rm correct}$  would be somewhere between previous values of probabilities determined for  $N_{\rm BS} = 22$ , 23, 24, 25.

### 3.2 Periods From ATLAS Data

In total, the sample of asteroids with  $p_{DB}^{correct} > 90\%$  consists of 5126 period determinations (we excluded those listed in Table 2 as not correct and other 55 asteroids that were affected by large systematic errors in their input photometric data). We consider the probability > 90% high enough to publish these periods; they are provided as Supplementary Material to this paper. In Table 3, we list a small fraction of the results as an example. The uncertainty  $\sigma_{BS}$  of the rotation period is determined as a standard deviation of values  $P_{\rm BS}^{(i)}$  that agree with  $P_{\rm A}$ . In many cases, this error is unrealistically small. Therefore, as a conservative upper limit of the period uncertainty, we define  $\sigma_{\rm max} = 0.1 \cdot 0.5 P_{\rm A}^2 / \Delta$ , where  $\Delta$  is the length of the time interval covered by the data. This uncertainty of the sidereal rotation period corresponds to a shift of 1/20 in the rotation phase over the interval  $\Delta$  (Kaasalainen, 2004). If  $\sigma_{BS}$  is significantly (several times) larger than  $\sigma_{\text{max}}$  and  $P_{\text{A}}$  is close to 24 h, it is a strong indication that the detected period is not the true rotation period of the asteroid but a false alias period related to 1-day sampling of the data. As can be seen in Figure 3 on a histogram of periods, for asteroids with asteroids with  $\sigma_{\rm BS}/\sigma_{\rm max} > 10$ , there is an excess of those with the rotation period close to 24 h. These are mostly false-positive solutions that consistently yield the same rotation period of ~24 h for all BS samples, but it is a bias caused by the observations being carried out at one location. The 1-day pattern in the data is inevitable for all BS samples.

For a part of asteroids with our ATLAS-based period determination, their rotation period was already known, sometimes also with a corresponding shape model. Namely, there are 3526 asteroids for which some period is reported in the LCDB; however, the number of reliable periods with U = 3 is only 1616. For 1600 asteroids, we derived their rotation period for the first time.

In **Figure 4**, we show a similar plot as Pál et al. (2020), namely the comparison of distribution of periods from the LCDB, TESS, and our ATLAS results. Although there is an apparent lack of long periods in our results when compared with TESS results of Pál et al. (2020), ATLAS sparse photometry can be used for an efficient determination of rotation periods of the order of hundreds of hours. Recent results of Erasmus et al. (2021) show that ground-based surveys are capable of detection rotation periods even longer than thousand hours. However, for the majority of asteroids in our sample, we were not able to determine their rotation period, so it is not possible to use the derived periods for statistical studies without properly accounting for bias.

## **4 CONCLUSION**

We have derived sidereal rotation periods for more than 5000 asteroids; for more than 1600, it is the first period determination. The reliability of these periods is >90%, so some periods can be incorrect, but the whole sample is a significant increase in the number of asteroids with a known rotation period. The method of bootstrapping the original data is simple to implement, although computationally demanding. The same approach can also be used to new ATLAS data, ideally combined with other sparse photometry, for example, from Gaia Data Release 3.

# DATA AVAILABILITY STATEMENT

The data analyzed in this study is subject to the following licenses/ restrictions: ATLAS photometry. Requests to access these datasets should be directed to https://atlas.fallingstar.com.

## AUTHOR CONTRIBUTIONS

JĎ—ATLAS data processing, bootstrap, interpretation; MV—processing of bootstrapped periodograms, interpretation; RV—technical administration of the Asteroids@home project; NE—ATLAS scientist.

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# SUPPLEMENTARY MATERIAL

The Supplementary Material for this article can be found online at: https://www.frontiersin.org/articles/10.3389/fspas.2022.809771/full#supplementary-material

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