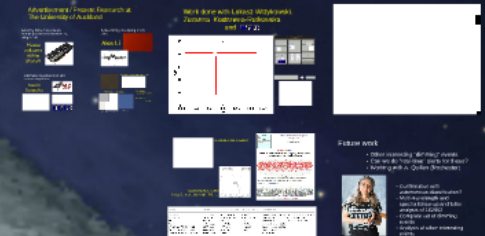


Searching for Transient Dimming Events in Microlensing Datasets

Nicholas J. Rattenbury

Royal Society of New Zealand
Rutherford Discovery Fellow



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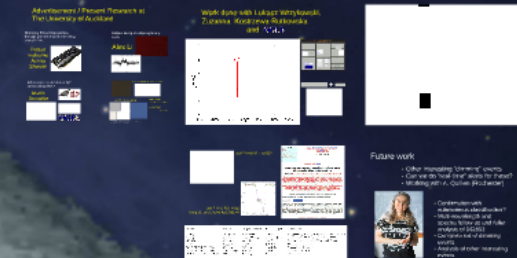
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Te Whare Wānanga o Tāmaki Makaurau

Searching for Transient Dimming Events in Microlensing Datasets

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① Prove that
 $a^n + b^n = c^n$
has no solution with
 $a, b, c,$ and n positive
integers and $n > 2$



1 **Calculator**

The latest for a calculator has replaced the slide rule for solving mathematical and scientific problems.

2 **Slide Rule**

When addition, division, and many other mathematical calculations could be performed with remarkable accuracy on a slide rule.

3 **Steen Kit**

Inventors of modernization learned mechanical drawing, it and how related with computer programs with much greater precision. Many of the instruments in the "Steen Kit" such as dividers, compasses, squares, and pens were useful not only in drafting plans, but also in navigation and printing. This kit shows many years of use of all ages and all nations.

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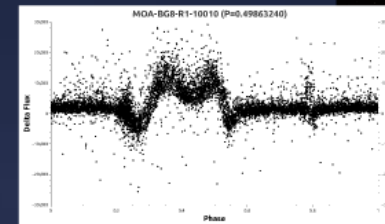
Detecting Extra-Solar planets through gravitational microlensing, using GPUs.

Please welcome Ashna Sharan!



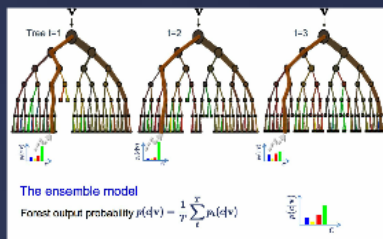
Eclipse timing of eclipsing binary stars.

Alex Li



Automated classification of light curves using WEKA.

Martin Donachie



Microlensing of Protoplanetary Disks, J. Cherrie

$$\frac{8C_{\text{cross}}(P)_{\text{pl}}}{\sigma^2 \text{disk}(P)} \left(\sin \left(2 \left(\sqrt{(r \cos(\theta))^2 - (z \sin(\theta))^2} - \sqrt{a^2 \sin^2(\theta) \sqrt{r^2 + z^2 + a^2 \sin^2(\theta)}} \right) \right) - \sin \left(2 \sqrt{(r - a)^2 - 2z \sqrt{r^2 + z^2 + a^2 \sin^2(\theta)}} \right) \right)$$

$$\frac{8C_{\text{cross}}(P)_{\text{pl}}}{\sigma^2} \sin^{-1} \left(\frac{\sqrt{(r \cos(\theta))^2 - (z \sin(\theta))^2} - \sqrt{a^2 \sin^2(\theta) \sqrt{r^2 + z^2 + a^2 \sin^2(\theta)}}}{\sqrt{r^2 \cos^2(\theta) - z^2 \sin^2(\theta)}} \right) - \sin^{-1} \left(\frac{\sqrt{(r - a)^2 - 2z \sqrt{r^2 + z^2 + a^2 \sin^2(\theta)}}}{\sqrt{r^2 \cos^2(\theta) - z^2 \sin^2(\theta)}} \right)$$

$$\frac{8C_{\text{cross}}(P)_{\text{pl}}}{\sigma^2} \frac{\sqrt{(r \cos(\theta))^2 - (z \sin(\theta))^2} - \sqrt{a^2 \sin^2(\theta) \sqrt{r^2 + z^2 + a^2 \sin^2(\theta)}}}{r^2 \sqrt{(r \cos(\theta))^2 - z^2 \sin^2(\theta)}} + \frac{\sqrt{(r - a)^2 - 2z \sqrt{r^2 + z^2 + a^2 \sin^2(\theta)}}}{r^2 \sqrt{(r \cos(\theta))^2 - z^2 \sin^2(\theta)}}$$

Ana Snegota - site testing



Philip Evans

Real-time parameter estimation

Alexis Drouard

Minor planets

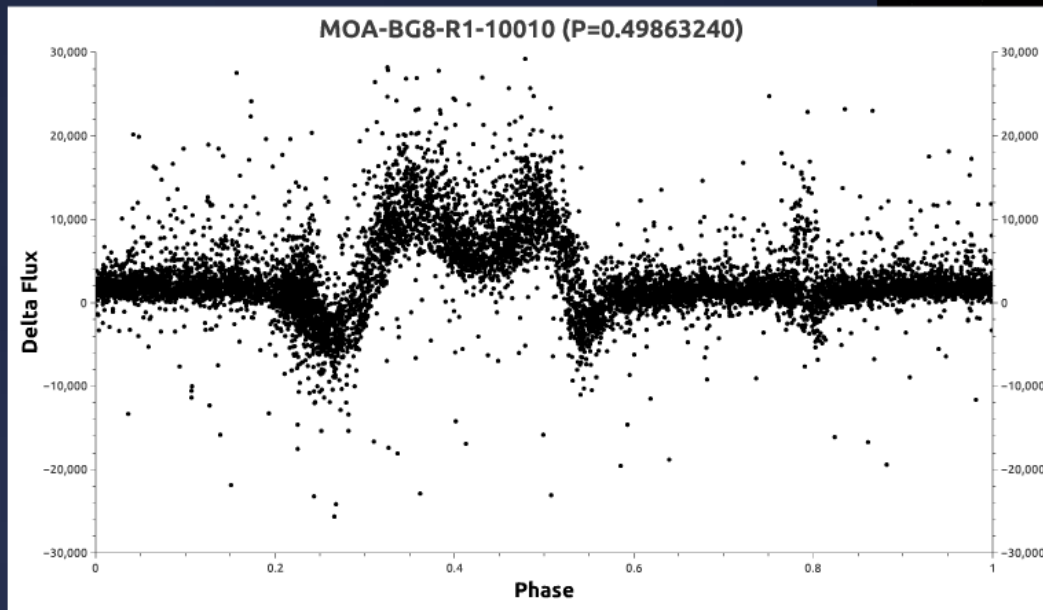
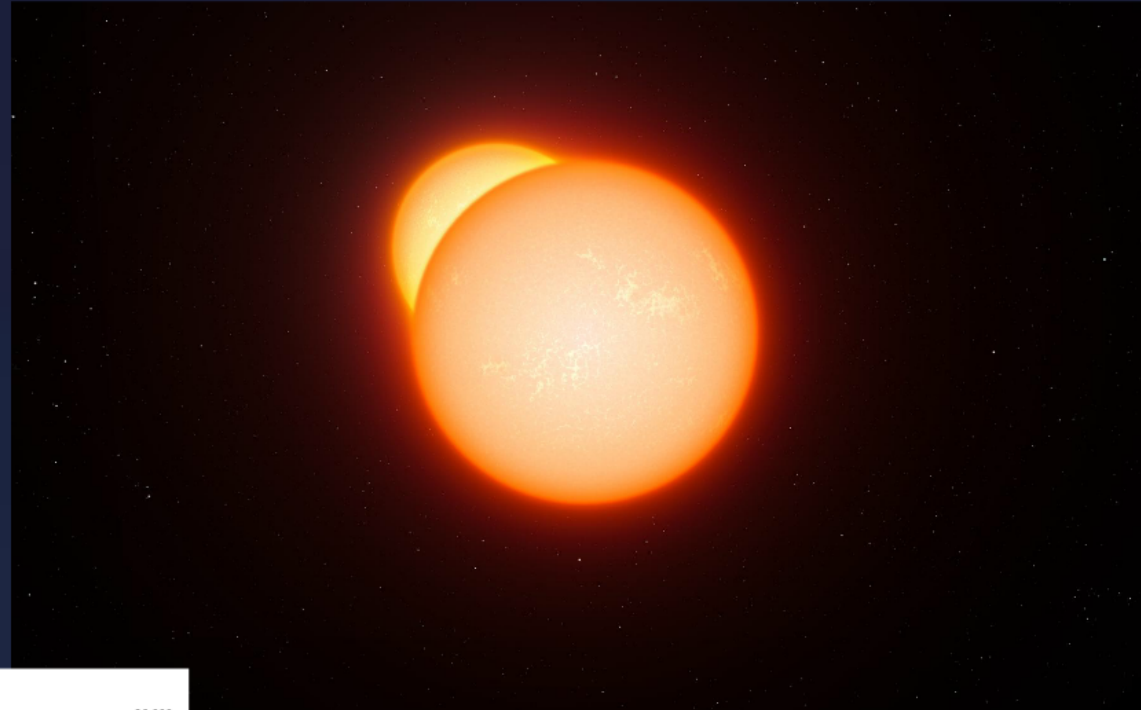
Detecting Extra-Solar planets through gravitational microlensing, using GPUs.

Please
welcome
Ashna
Sharan!



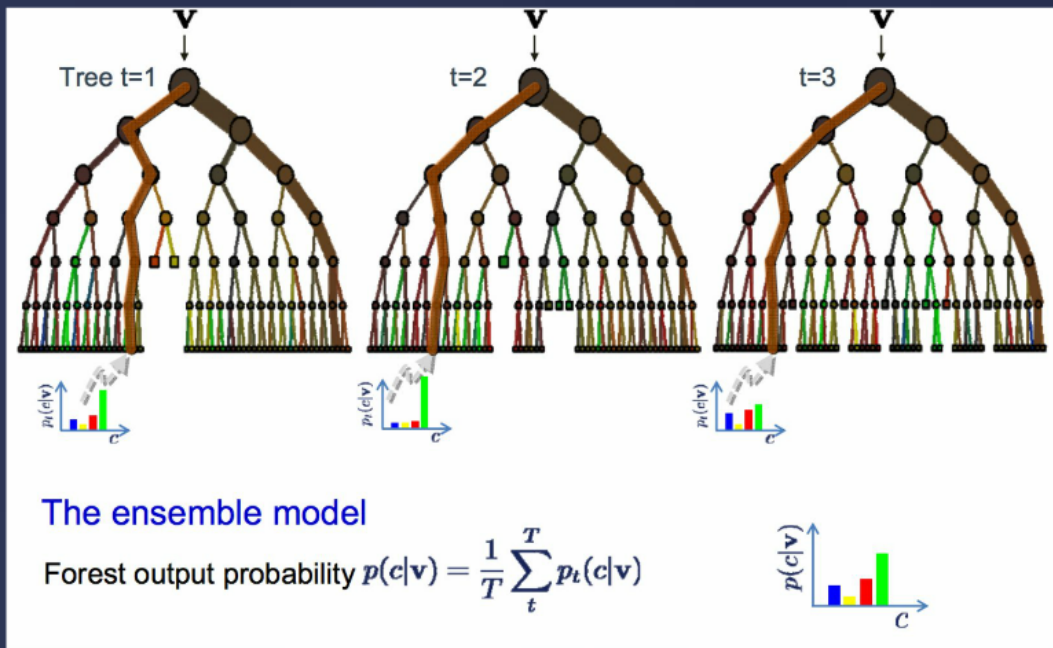
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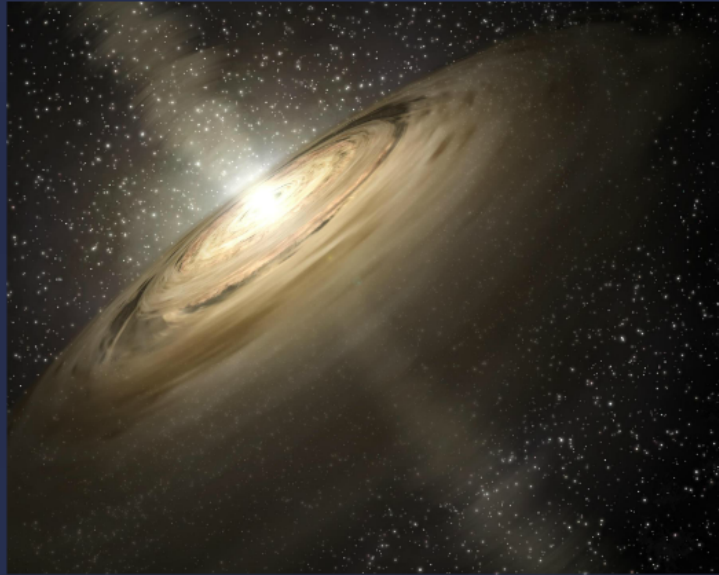


Automated classification of light curves using WEKA.

Martin
Donachie



OGLE



Microlensing of Protoplanetary Disks, J. Cherrie

$$\frac{8G\pi\cos(\theta)r_c}{c^2\sin(\theta)} \left(\log \left(2 \left(\sqrt{(x\cos(\theta) - iy\sec(\theta))^2} - i\sqrt{\sin^2(\theta)}\sqrt{r_c^2 + x^2 + y^2\sec^2(\theta)} \right) \right) - i \log \left(2\sqrt{(x-iy)^2} - 2i\sqrt{r^2}\sqrt{\sin^2(\theta)} \right) \right)$$

$$\frac{8G\pi\cos(\theta)r_c^2}{c^2} \frac{\tan^{-1} \left(\frac{\sqrt{(x\cos(\theta) - iy\sec(\theta))^2}}{\sqrt{r_c^2\cos^2(\theta) - r_c^2 - (x-iy)^2}} \right) - \tan^{-1} \left(\frac{\sqrt{(x-iy)^2}}{\sqrt{r_c^2\cos^2(\theta) - r_c^2 - (x-iy)^2}} \right)}{\sqrt{r_c^2\cos^2(\theta) - r_c^2 - (x-iy)^2}}$$

$$\frac{8G\pi\cos(\theta)r_c^3}{c^2} \frac{\frac{\sqrt{(x-iy)^2}}{r^2c^2} - \frac{\sqrt{(x\cos(\theta) - iy\sec(\theta))^2}}{\sqrt{r^2c^2 + x^2 + y^2\sec^2(\theta)}}}{r^2c^2(-\cos^2(\theta)) + r^2c^2 + (x-iy)^2}$$

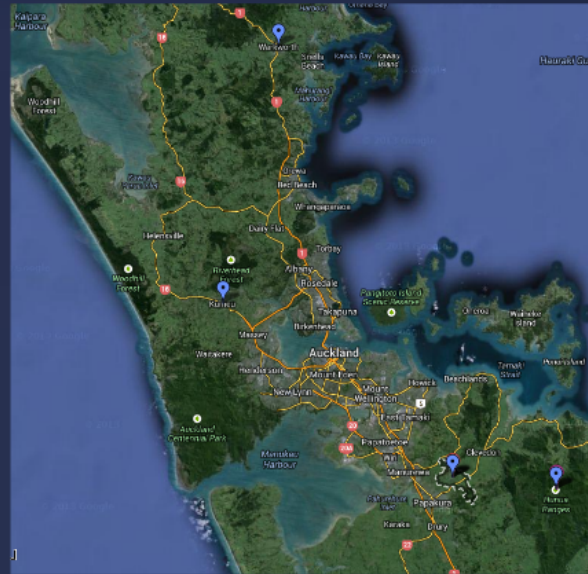
Ana Snegota - site testing

Philip Evans

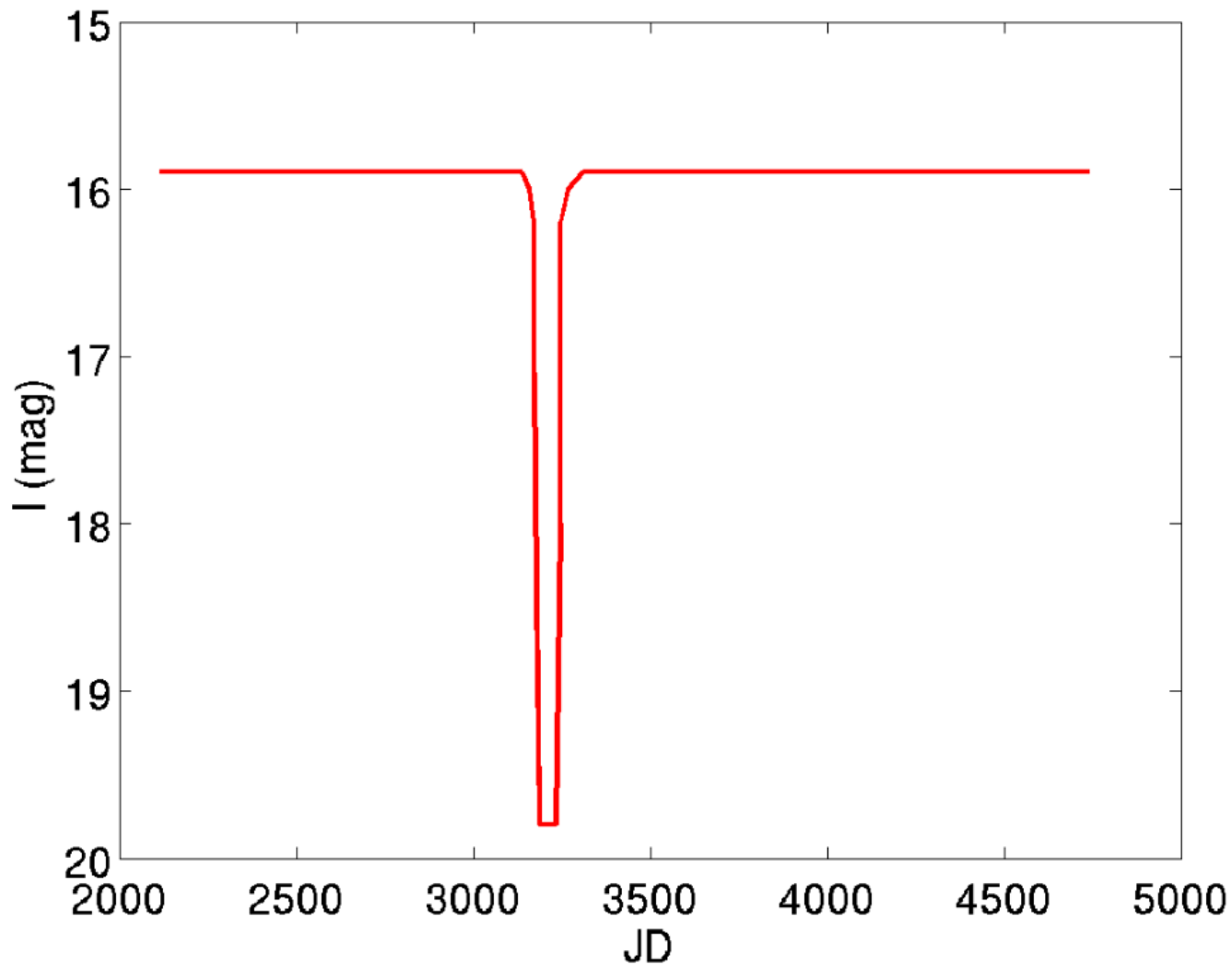
Real-time parameter estimation

Alexis Drouard

Minor planets



Work done with Lukasz Wrzykowski, Zuzanna Kostrzewa-Rutkowska and OGLE



Searching for anomalous light curves in massive data sets

Abstract: The OGLE project has collected a vast amount of light curves. These data are not only interesting in themselves but also provide a unique opportunity to study the properties of the stars in the Galaxy. In this paper, we describe a new algorithm for searching for anomalous light curves in massive data sets. The algorithm is based on the analysis of the light curves and is able to detect anomalies that are not detectable by other methods. We present the results of the search for anomalous light curves in the OGLE data set.

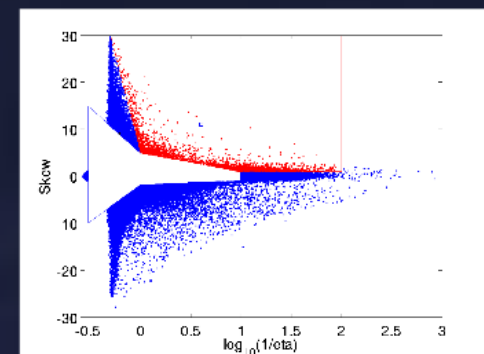
Introduction: The OGLE project has collected a vast amount of light curves. These data are not only interesting in themselves but also provide a unique opportunity to study the properties of the stars in the Galaxy. In this paper, we describe a new algorithm for searching for anomalous light curves in massive data sets. The algorithm is based on the analysis of the light curves and is able to detect anomalies that are not detectable by other methods. We present the results of the search for anomalous light curves in the OGLE data set.

Method: The algorithm is based on the analysis of the light curves and is able to detect anomalies that are not detectable by other methods. We present the results of the search for anomalous light curves in the OGLE data set.

Results: The algorithm is based on the analysis of the light curves and is able to detect anomalies that are not detectable by other methods. We present the results of the search for anomalous light curves in the OGLE data set.

Conclusion: The algorithm is based on the analysis of the light curves and is able to detect anomalies that are not detectable by other methods. We present the results of the search for anomalous light curves in the OGLE data set.

$$\eta = \frac{\sqrt{\sum_i^N (x_{i+1} - x_i)^2 / (N-1)}}{\sum_i^N x_i / N} + \text{skewness}$$



Searching for anomalous light curves in massive data sets

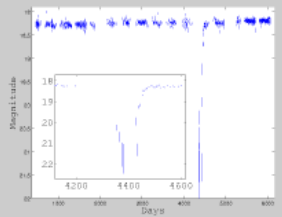
N. J. Rattenbury¹, Ł. Wyrzykowski¹

¹Department of Physics, University of Auckland, Auckland, New Zealand
²Warsaw University Observatory, Warszawa, Poland

Abstract

The photometric surveys currently under way by the MOA and OGLE collaborations have produced and are extending databases of millions of stellar light curves. These databases have allowed investigations into diverse astrophysical fields including variable stars, proper motion studies and Galactic structure. Odd, or otherwise curious events have been discovered in the databases. We consider here one such event and propose methods for discovering more like it in the microlensing databases. A further aim of this initial work is to set out the prospects of the classification scheme for identifying time series that are maximally discordant - i.e. those that do not look like any other time series in the data set, and which therefore, may be of particular interest.

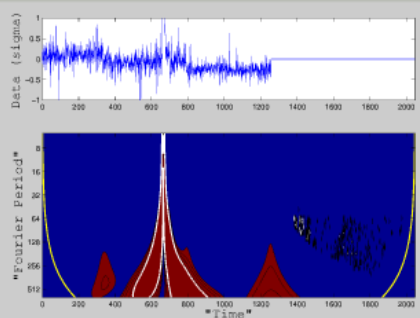
Motivation



This figure shows the light curve of a star which appears constant apart from a dimming event at about $JD' \simeq 4350$, lasting for $\simeq 100$ days. The data are from the OGLE-2, OGLE-3 and OGLE-4 databases. Leaving aside the question of what might have caused the dimming, we instead consider here what techniques could be employed to reliably and quickly extract similar events from a time series database.

Wavelet power spectrum

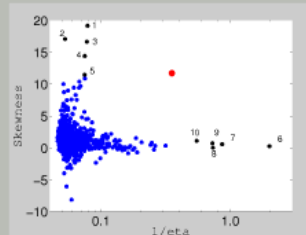
Wavelet analysis is a powerful tool for detecting signals in a time series, especially where the modes of variability change throughout the time series. Following the treatment of Torrence & Compo (1998), the wavelet power spectrum (WPS) for the time series shown above was computed, and shown below. The derivative of a Gaussian mother wavelet was chosen specifically for its ability to detect step changes in data. The solid white line in the WPS is the 95% confidence level (assuming a red noise background). The WPS clearly finds the signal in the time series data. N.B. The light curve data were spaced evenly in order to compute the WPS.



Simple statistics

Several simple statistical measures were considered for their ability to discriminate the data shown above away from all others in a set of more typical light curves. After some experimentation, the combination of the von Neumann ratio and the value of skewness of the data appears to be a useful pairing. The von Neumann ratio is defined as (Price-Whelan 2013; von Neumann, 1941):

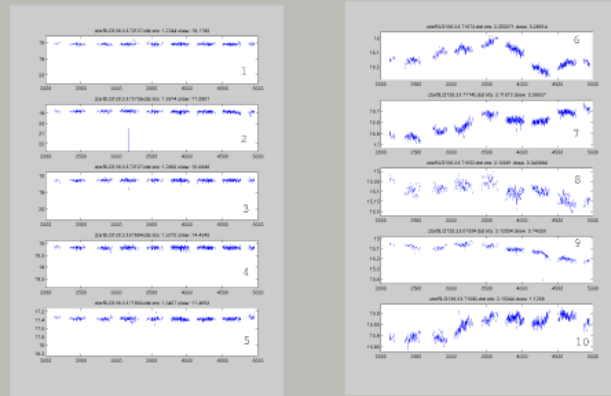
$$\eta = \frac{\sqrt{\sum_{i=1}^N (x_{i+1} - x_i)^2 / (N-1)}}{\sum_{i=1}^N x_i / N}$$



Values of the von Neumann ratio and skewness were computed for 1451 sample OGLE light curves, including the light curve shown above. These values are plotted at left, with those values corresponding to the above light curve shown with a red symbol. This pair of statistics appears to discriminate the target light curve morphology from those of the other light curves in the sample data set. Light curves corresponding to high values of skewness or η are shown below.

Comparing the nature of the light curves having extreme values of either skewness or η demonstrates how these two statistics combined show promise for finding similar light curves.

Skewness and the von Neumann ratio



Light curves corresponding to extreme values of skewness (left) or von Neumann ratio (right) in the sample data set. The numbers in each set of axes correspond to points in the η -skewness plot, above. Instrumental artefacts can readily be identified in light curves having high skewness values. Similarly, light curves with low values of η are of potential interest.

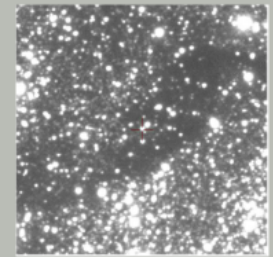
Bag of Patterns

Lin and Li (2009) describe an algorithm for grouping time series based on similar local patterns. This "Bag of Patterns" scheme was investigated for its value in detecting time series such as those shown above. It indicates that this algorithm is not well suited to unevenly sampled data. Furthermore, it is refining and adapting the algorithm for unevenly sampled data. This work on the "Bag of Patterns" scheme is ongoing and will be published in the near future.



Sample OGLE field

The OGLE field corresponding to the 1451 sample light curves is shown at the right. Also seen in this image is a dark nebula. Nieuwenhuizen et al. (2012) recently considered whether Herschel cold clouds in the Galactic halo could embody the Galactic dark matter, further suggesting that massive photometry data sets could contain obscuration events.



Discussion

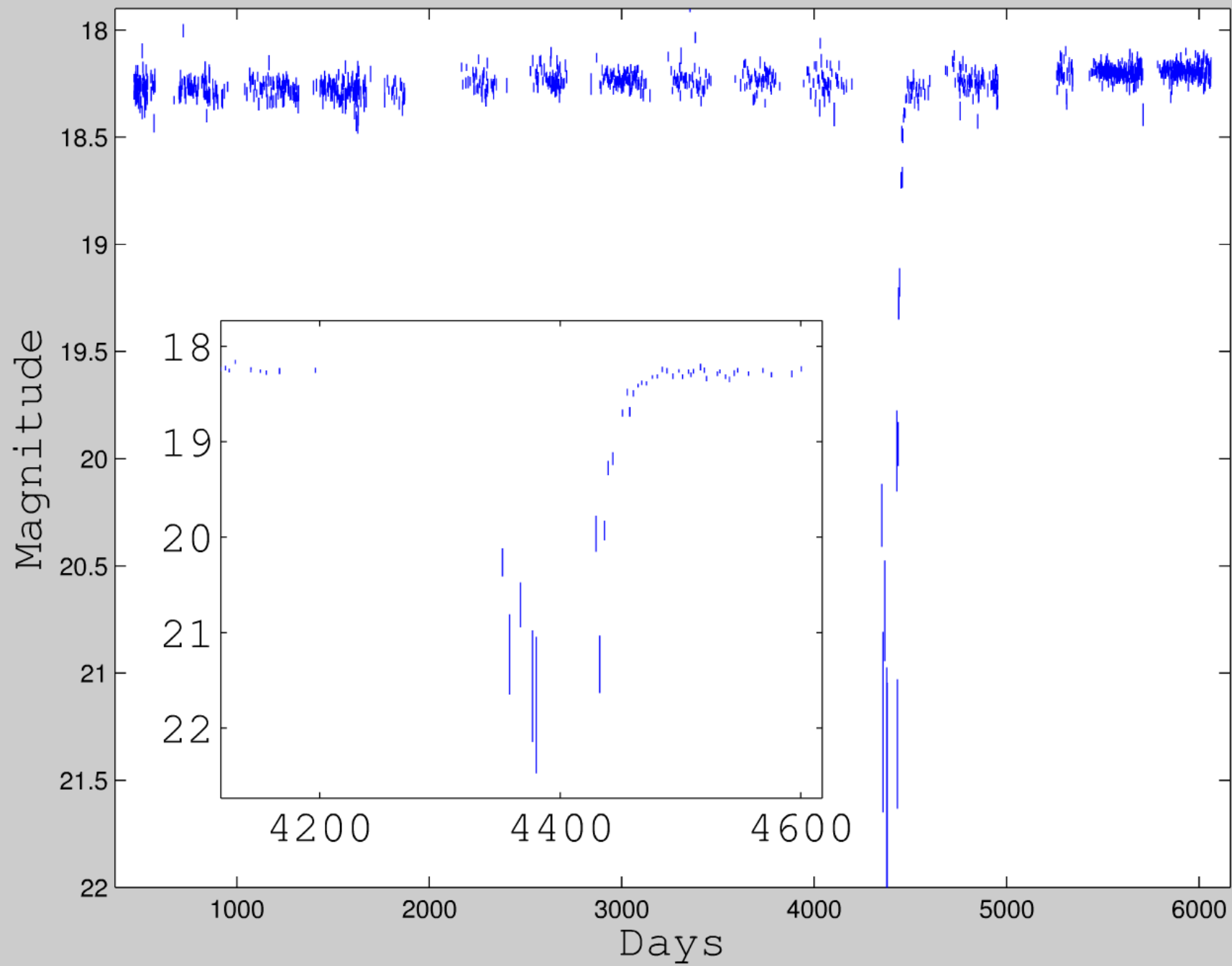
The von Neumann ratio η and skewness of a time series provide a pair of statistics that are simple, fast to compute and appear to be well suited to extracting the light curves having a sudden dimming event. A wavelet-based algorithm also shows promise for detecting dimming events, and has the advantage that an appropriate wavelet kernel may be chosen to match particular signal morphologies. The WPS is computed using Fourier transforms of the data and is therefore relatively efficient. It is hoped that the von Neumann and skewness statistics can be computed for all the light curves in the OGLE and MOA databases in the first instance, in the expectation of finding similar light curves to that shown above.

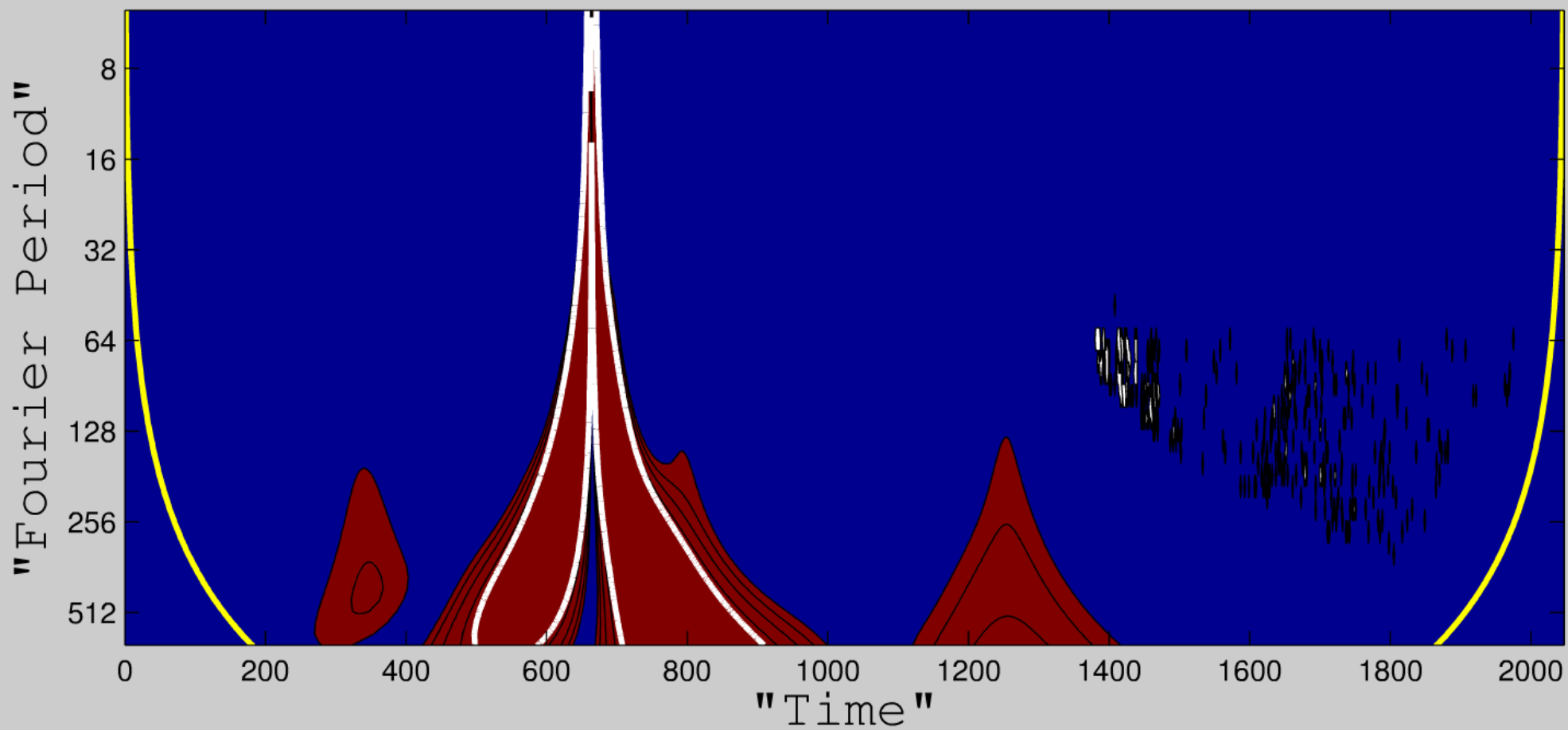
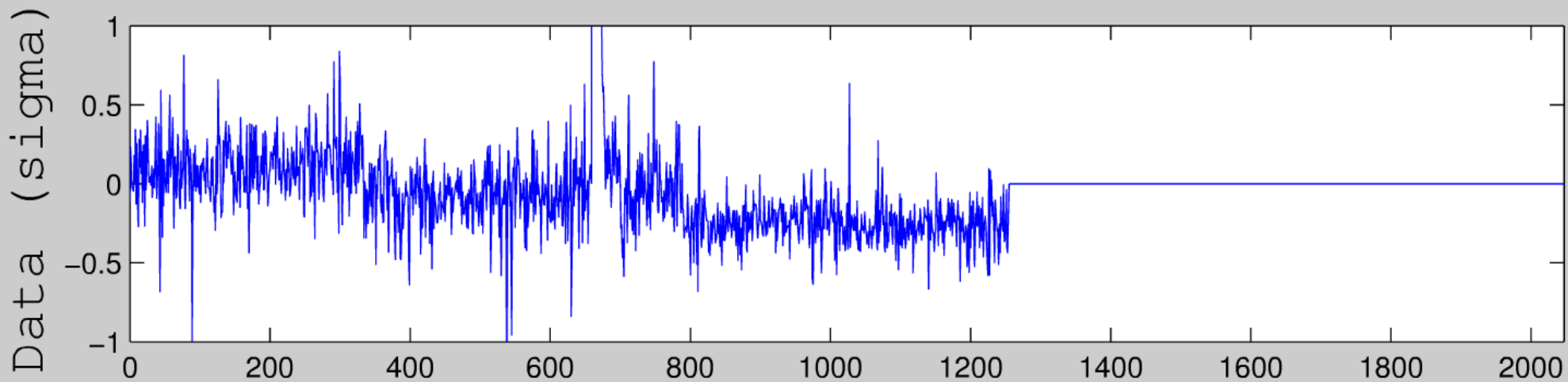
References

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- Nieuwenhuizen, T.M., van Heusden, E.F.G. & Liska, M.T.P., 2012, arXiv:1210.0489
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- von Neumann, J., Kent, R.H., Bellinson, H.R., & Hart, B. I., 1941, The Annals of Mathematical Statistics, 12, 153

Acknowledgements

NJR is a Royal Society of New Zealand Rutherford Discovery Fellow.

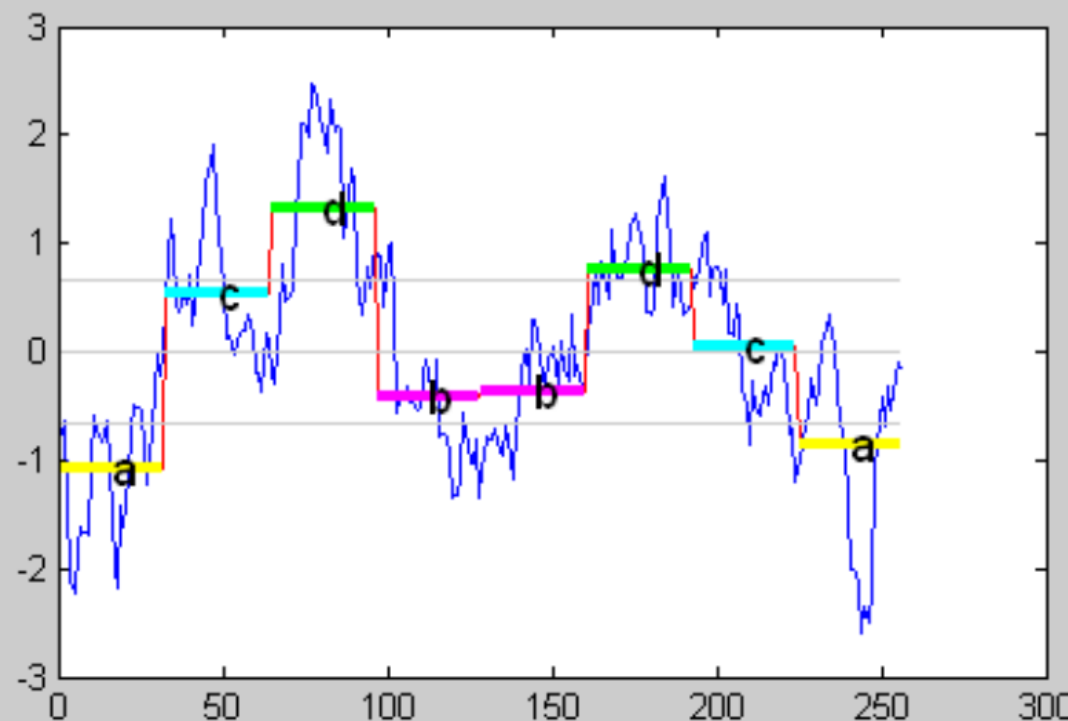




Bag of Patterns

Lin and Li (2009) describe an algorithm for grouping time series into local patterns. This “Bag of Patterns” scheme was investigated for detecting time series such as this. The algorithm is not well suited for this data. Furthermore, it is difficult to refine and adapt the algorithm to new data, but this is beyond the scope of this presentation.

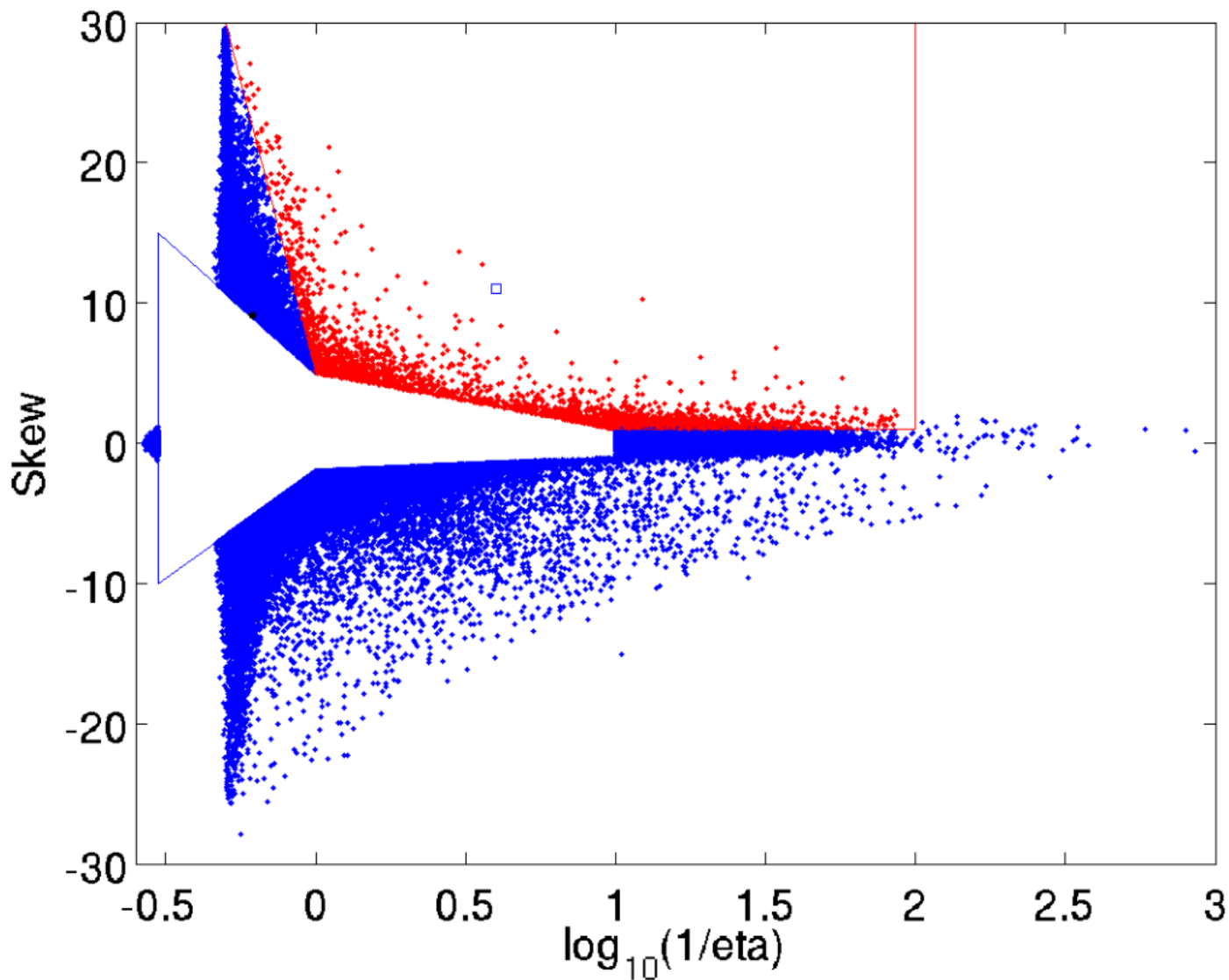
Sample OGLE field

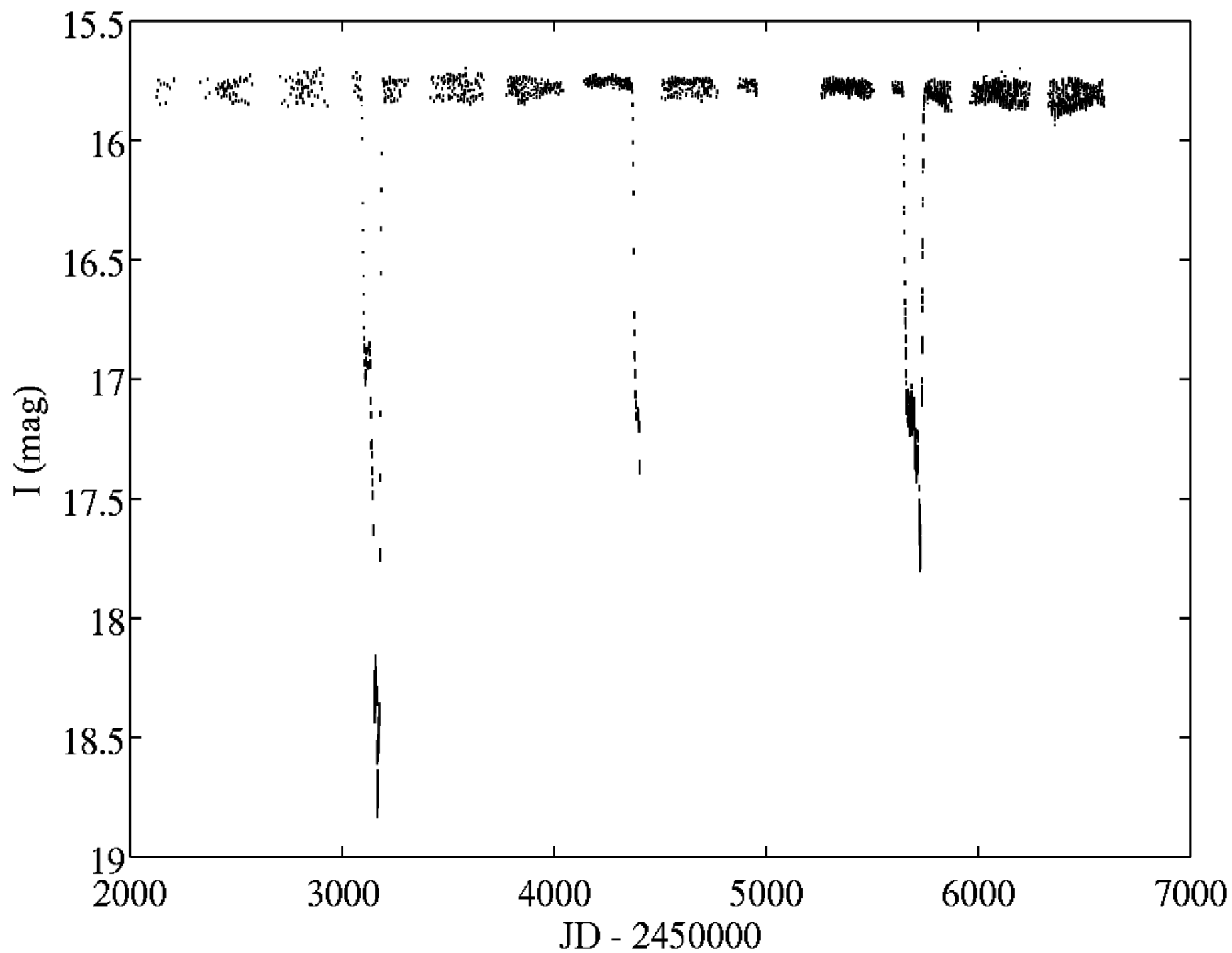


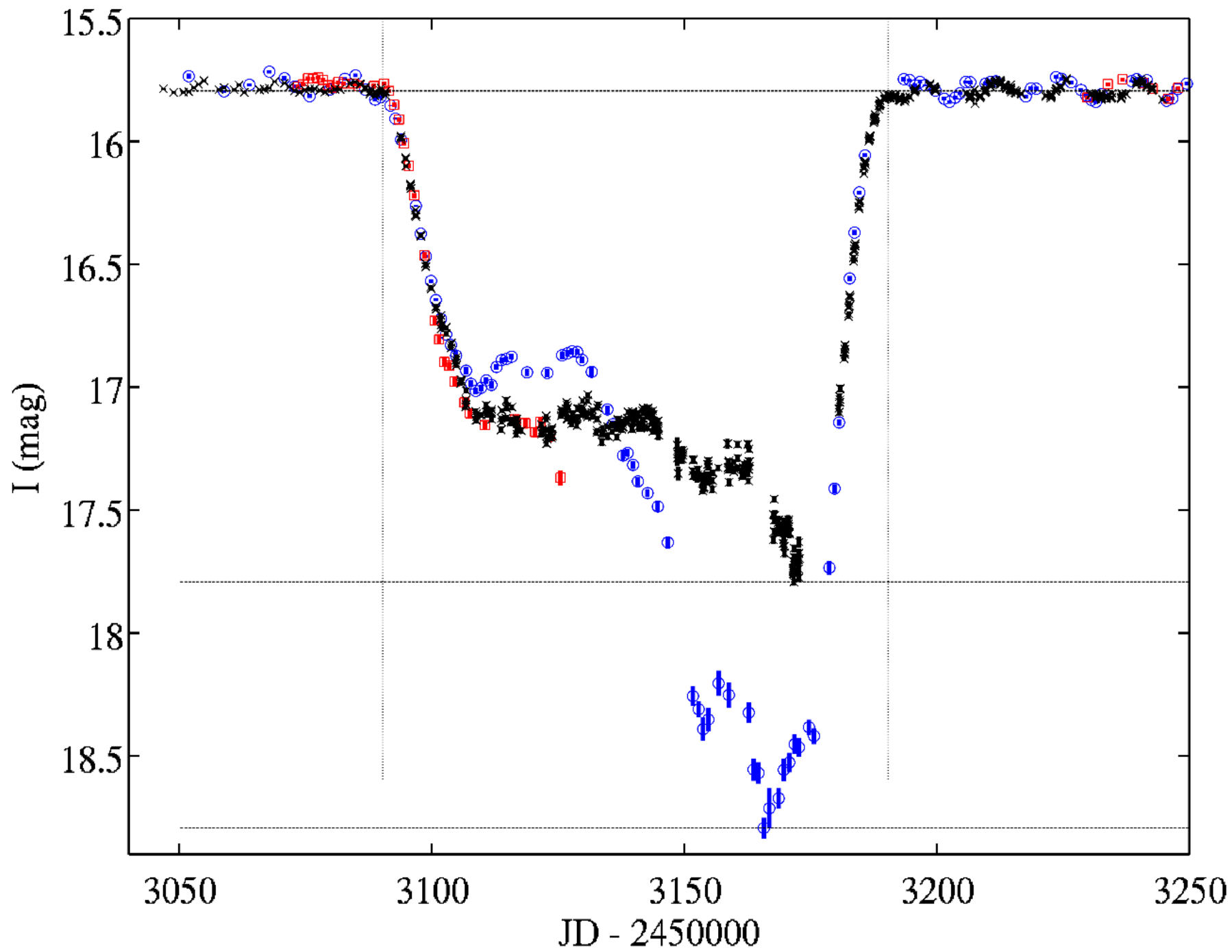
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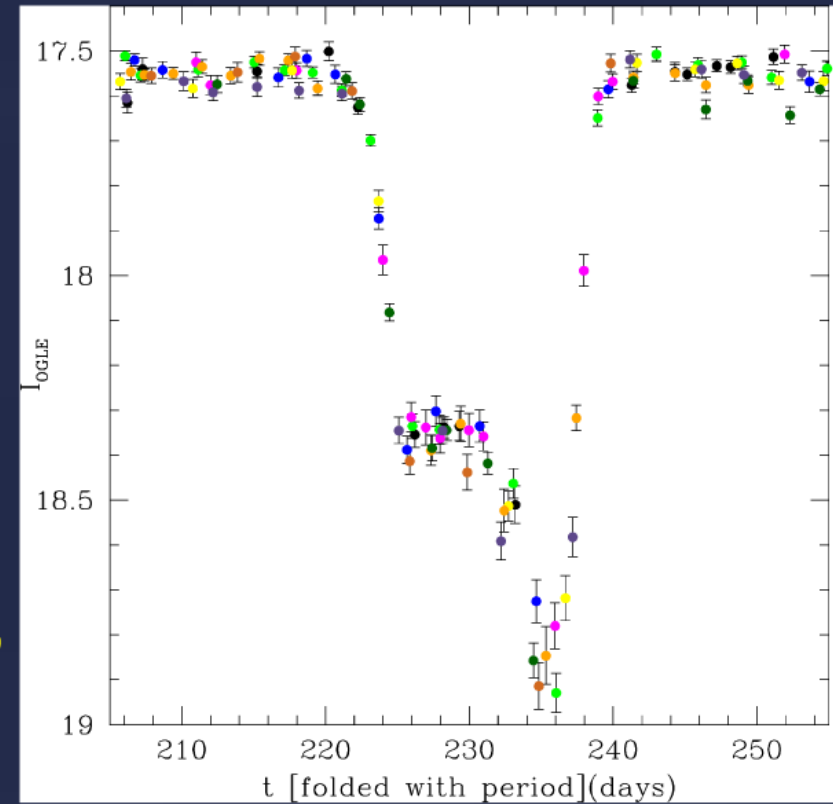
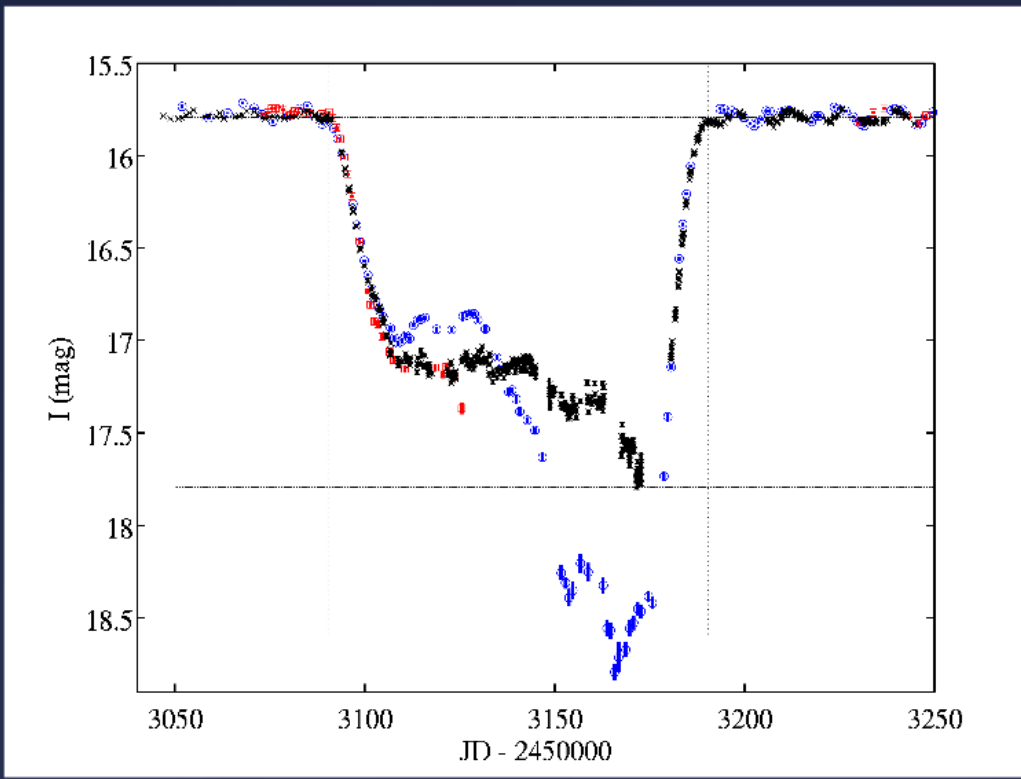
skewness







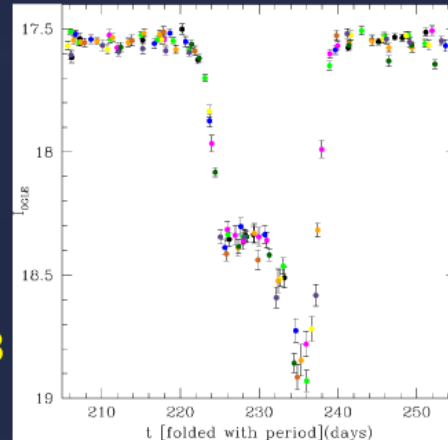
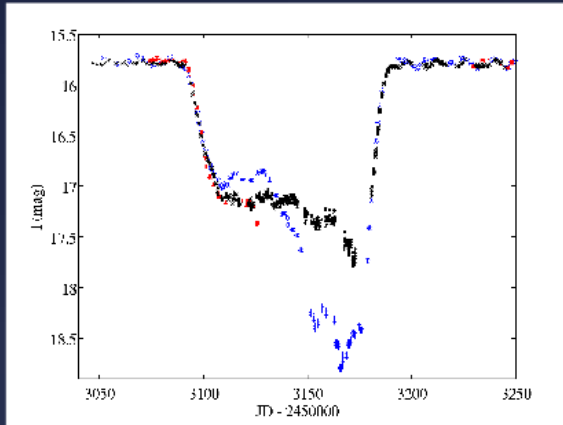
OGLE-BLG182.1.162852



OGLE-LMC-ECL-11893

Dong, S., et al., 2014, ApJ, 788, 41

OGLE-BLG182.1.162852



OGLE-LMC-ECL-11893

Dong, S., et al., 2014, ApJ, 788, 41

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OGLE-BLG182.1.162852: An Eclipsing Binary with a Circumstellar Disk - In Eclipse Now

ATel #6576; *N. J. Rattenbury (The University of Auckland, New Zealand), L. Wyrzykowski (Warsaw University Astronomical Observatory, Poland), Z. Kostrzewa-Rutkowska (Warsaw University Astronomical Observatory, Poland), A. Udalski (Warsaw University Astronomical Observatory, Poland), S. Kozłowski (Warsaw University Astronomical Observatory, Poland), M. K. Szymanski (Warsaw University Astronomical Observatory, Poland), K., G. Pietrzynski (Warsaw University Astronomical Observatory, Poland), I. Soszynski (Warsaw University Astronomical Observatory, Poland), R. Poleski (Warsaw University Astronomical Observatory, Poland), K. Ułaczyk (Warsaw University Astronomical Observatory, Poland), J. Skowron (Warsaw University Astronomical Observatory, Poland), P. Pietrukowicz (Warsaw University Astronomical Observatory, Poland), P. Mroz (Warsaw University Astronomical Observatory, Poland), D. Skowron (Warsaw University Astronomical Observatory, Poland)*

on 14 Oct 2014; 00:41 UT

Credential Certification: Nicholas Rattenbury (n.rattenbury@auckland.ac.nz)

Subjects: Far-Infra-Red, Infra-Red, Optical, Request for Observations, Transient

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Rattenbury et al. (2014) present the discovery of a plausible disk-eclipse system OGLE-BLG182.1.162852. The OGLE light curve for OGLE-BLG182.1.162852 shows three episodes of dimming by $I \sim 2 - 3$ magnitudes, separated by 1277 days. The shape of the light curve during dimming events is very similar to that of known disk eclipse system OGLE-LMC-ECL-11893. The event is presently undergoing a dimming event, predicted to end on December 30th, 2014. The system is presently at approximately $I = 17.5$ magnitudes. Multi-wavelength photometry and spectroscopy are strongly encouraged now to confirm the presence and nature of the disk.

[Link to arXiv paper \(Rattenbury et al., 2014\)](#)

System	Period	Eclipse Duration	Eclipse Depth	Reference(s)
ϵ Aurigae	27.1 years	~ 22 months	0.9 (V)	Kloppenborg et al. (2010); Stefanik et al. (2010)
EE Cephei	5.6 years	$\sim 30 - 90$ days	0.5 - 2.0 (B,V)	Gałań et al. (2012); Graczyk et al. (2003)
KH 15D	48.4 days	variable ^a	~ 4 (I)	Hamilton et al. (2005); Winn et al. (2006)
J1407	> 850 days	$\sim 54^b$ days	> 3.3 (V)	Mamajek et al. (2012)
OGLE-LMC-ECL-17782	13.35 days	2.67 days	~ 0.4 (I)	Graczyk et al. (2011)
OGLE-LMC-ECL-11893	468.124 days	~ 15 days	1.5 (I)	Dong et al. (2014)
OGLE-BLG182.1.162852	1277 days	100 days	2 - 3 (I)	This work

Rattenbury et al., 2015, MNRAS, 447, L31-L34

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1277 days	100 days	2 – 3 (I)

Rattenbury et al., 2015, MNRAS, 447, L31-L34

Future work

- Other interesting "dimming" events
- Can we do "real-time" alerts for these?
- Working with A. Quillen (Rochester)

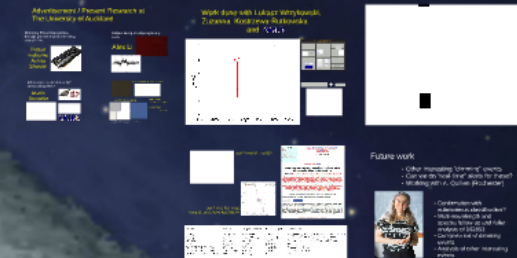


- Confirmation with autonomous classification?
- Multi-wavelength and spectra follow-up and fuller analysis of 162852
- Complete set of dimming events
- Analysis of other interesting events

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