

# Testing the Titius–Bode law predictions for *Kepler* multiplanet systems

Chelsea X. Huang<sup>★</sup> and Gáspár Á. Bakos<sup>†‡</sup>

*Department of Astrophysical Sciences, Princeton University, NJ 08544, USA*

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## ABSTRACT

We use three and half years of *Kepler* long-cadence data to search for the 97 predicted planets of Bovaïrd & Lineweaver in 56 of the multiplanet systems, based on a general Titius–Bode (TB) relation. Our search yields null results in the majority of systems. We detect five planetary candidates around their predicted periods. We also find an additional transit signal beyond those predicted in these systems. We discuss the possibility that the remaining predicted planets are not detected in the *Kepler* data due to their non-coplanarity or small sizes. We find that the detection rate is beyond the lower boundary of the expected number of detections, which indicates that the prediction power of the TB relation in general extrasolar planetary systems is questionable. Our analysis of the distribution of the adjacent period ratios of the systems suggests that the general TB relation may overpredict the presence of planet pairs near the 3:2 resonance.

**Key words:** planets and satellites: detection – planets and satellites: general.

## 1 INTRODUCTION

The *Kepler* mission (Borucki et al. 2010; Batalha et al. 2013) has dramatically increased our knowledge about the architecture of extrasolar planetary systems. More than 3600 planetary candidates have been announced in the  $\sim 4$  yr time span of the mission. A significant fraction of these planet candidates reside in multiple planet systems (Latham et al. 2011). Based on the most recent candidate list, Batalha et al. (2013) report that 20 per cent of the planet hosting stars have multiple planet candidates in the same system.

The multiple planetary systems discovered by *Kepler* show a variety of structures. Various authors (e.g. Lissauer et al. 2011; Fabrycky et al. 2012; Steffen 2013) generally agree on the following features of the *Kepler* multiple systems: (a) the majority of the multiple systems consist of several Neptune or super-Earth size planets packed within 100 d period orbits; (b) the multiple systems are highly coplanar; (c) unlike the Solar system, most of the planet candidates are not in or near mean-motion resonances (MMRs); however, MMRs are clearly preferred to what would be expected from a random distribution of period ratios (Petrovich, Malhotra & Tremaine 2013). To our best knowledge, these features are not fully reproduced by current theories.

Many centuries ago, the architecture of our Solar system was proposed to follow a relation, which describes the semimajor axes of Solar system planets in a logarithmic form as a function of their sequences in the system

$$a(\text{au}) = 0.4 + 0.3 \times 2^n, \quad n = -\infty, 0, 1, 2, \dots \quad (1)$$

<sup>★</sup>E-mail: [xuhuang@princeton.edu](mailto:xuhuang@princeton.edu)

<sup>†</sup>Alfred P. Sloan Research Fellow.

<sup>‡</sup>Packard Fellow.

This Titius–Bode relation (hereafter TB) successfully predicted the existence of the Asteroid Belt and Uranus, based on the knowledge of the orbits of other planets (Mercury through Saturn) in the Solar system.

The physical origin, if any, of the TB relation is not well understood. The explanations that have been proposed to reproduce this phenomenon can be grouped in the following categories: (a) there are physical processes that directly lead to the TB relation, for instance, dynamical instabilities in the protoplanetary disc (Li, Zhang & Li 1995), gravitational interactions between planetesimals (Laskar 2000), or long-term dynamical instabilities (Hills 1970); (b) it is a statistical result of some physical requirements in planetary systems, such as the radius exclusion law based on stability criteria (Hayes & Tremaine 1998); (c) it is a presentation of other spacing laws, for example, the capture in resonances between the mean motion of the planets (Patterson 1987).

Bovaïrd & Lineweaver (2013, hereafter BL13) tested the applicability of TB relation on all of the known high-multiplicity extrasolar planetary systems (those with four or more planets around the same hosting star). Using the systems that they considered to be complete by stability requirements, they found that rather than following the exact same TB relation as our Solar system, 94 per cent of these complete systems favour a more general logarithmic spacing rule (the general TB relation). For a system with  $N$  planets, the general two-parameter TB relation (which, for simplicity, we no longer distinguish from the Solar system law in the rest of text) can be formalized as

$$\log P_n = \log P_0 + n * \log \alpha, \quad n = 0, 1, 2, \dots, N - 1. \quad (2)$$

They further inferred that all the high-multiplicity systems prefer to adhere to this general TB relation: if a system does not follow this relation as tight as the Solar system, there is a high possibility that

one or more planets are not detected in this system. They predicted that  $\sim 32$  per cent of the *Kepler* high-multiplicity systems should host additional planets within the orbit of the outermost detected planets.

It is possible that these planets are missed from the *Kepler* sample due to their small sizes, that they are simply not transiting due to slightly different inclination respect to the rest of disc, or they are missing due to the incompleteness of the *Kepler* pipeline. In this work, we carried out a careful search for the additional planets in these *Kepler* systems to test the predictions in BL13.

We use the Quarter 1–15 *Kepler* long-cadence data in this analysis. We detected five planetary candidates around the predicted periods, found one additional transit signal that were not predicted in these systems. We did not find majority of the predicted systems. We describe our sample and restate the predictions from BL13 in Section 2. We then introduce our method in Section 3. Finally, we present our result and discuss the detection bias and indications in Section 4.

## 2 THE KEPLER SAMPLE

BL13 predicted the existence of 141 additional exoplanets in 68 multiple-exoplanet systems. 60 of these systems were discovered by the *Kepler* mission.<sup>1</sup> The remaining eight are non-transiting planets discovered by radial velocity searches, which we do not include in this analysis. They suggested that altogether 117 planets were missing in these *Kepler* systems.

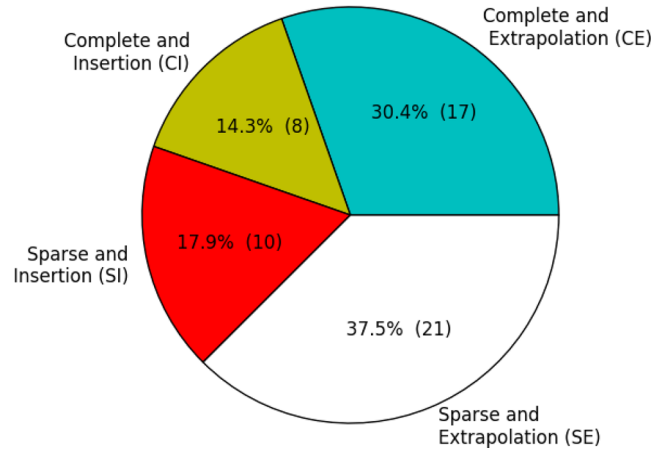
We excluded four systems in our analysis as follows. BL13 reported analysis for Kepler-62 as well as for KOI-701, but these identifications refer to the same planetary systems. Thus, we exclude KOI-701 from our analysis. The period of KIC8280511 (KOI-1151.01) is more likely double the period quoted by the *Kepler* catalogue. With a revised period of 10.435 374 d<sup>2</sup>, this system adheres to the TB relation tighter than the Solar system without the need of inserting additional planets. The other two excluded systems were eliminated, because we could not establish the validity of their fourth planetary candidate. To be more specific, for KIC3447722 (KOI-1198), we were not able to recover the fourth transit (KOI-1198.04, with a period of 1.008 620 d) in our analysis. For KIC8478994 (KOI-245, also known as Kepler-37), the fourth transit listed in the *Kepler* catalogue (KOI-245.04,  $P = 51.198\ 800$  d) was not detected by our pipeline, while the discovery paper of Kepler-37b (Barclay et al. 2013) also stated only three planets in this system.

The predictions from BL13 can be grouped into two categories: the ‘inserted’ planets and the ‘extrapolated’ planets. Among all the *Kepler* high-multiplicity systems (those with four or more planets around the same host star), BL13 found that 38 of them fit the TB relation comparable to or tighter than our Solar system. The tightness of the fitting is determined by the  $\chi^2_{\nu}$  ( $\frac{\chi^2}{\text{d.o.f.}}$ ) derived from the fitting based on the equation 4 of BL13. They predicted 41 ‘inserted’ planets for the remaining 18 systems, arguing that the insertion of additional planets will make a better fit for the TB relation. Additionally, they hinted on the possible existence of one ‘extrapolated’ planet for each system (56 in total) using the best fit of the TB relation accounting for the ‘inserted’ planets.

<sup>1</sup> See Kepler Object of Interest-Cumulative: <http://exoplanetarchive.ipac.caltech.edu/cgi-bin/ExoTables/nph-exotbls?dataset=cumulative>, also known as the 2013 Kepler catalogue.

<sup>2</sup> The period of this planet has been corrected in the 2014 *Kepler* catalogue.

## Kepler high multiplicity sample



**Figure 1.** We show the distribution of *Kepler* high-multiplicity systems in the four subcategories based on BL13. The four subcategories are ‘complete and insertion (CI)’, ‘complete and extrapolation (CE)’, ‘sparse and insertion (SI)’ and ‘sparse and extrapolation (SE)’. The completeness of a system is measured by the spacing between two neighbouring planets. The insertion condition is such that if a system has fitting statistic with the TB relation worse than the Solar system, planet insertions are made to the system.

On the other hand, it is also important to divide these systems according to their completeness. The completeness of a planetary system is measured by the dynamical spacing  $\Delta$ , defined as  $(a_2 - a_1)/R_H$ , where  $a_1$  and  $a_2$  are the semimajor axes of the neighbouring pair of planets. We adopt the Hill radius  $R_H$  defined in Chambers, Wetherill & Boss (1996),

$$R_H = [(m_1 + m_2)/3 M_{\odot}]^{1/3} [(a_1 + a_2)/2], \quad (3)$$

where  $m_1$  and  $m_2$  are the planetary masses. The masses of the planets are estimated by a mass–radius relation conversion  $M_p = (R_p/R_{\oplus})^{2.06} M_{\oplus}$  (Lissauer et al. 2011). BL13 isolated 25 planetary systems as their ‘most complete’ sample using the dynamical spacing criteria.<sup>3</sup>

Therefore, we further divided the *Kepler* high-multiplicity samples, yielding altogether four non-overlapping categories (see Fig. 1) using the above two criteria from BL13. Among the 25 most complete systems, there are 17 systems that originally have a better fit to the TB relation than the Solar system (thus only one ‘extrapolated’ prediction is made in each of the systems) (we call this category ‘CE’ for short in the text, with ‘C’ stands for complete and ‘E’ stands for extrapolated); the remaining eight systems are ‘most’ complete as defined by BL13, but require insertion to fit better than solar (we call it ‘CI’ for short, where ‘I’ stands for insertion). Another 10 systems are sparse and need insertion to fit better than solar (‘SI’ for short, where ‘S’ stands for sparse); 21 systems are sparse but have an original fit better than solar (‘SE’ for short). These 56 systems were analysed and searched for the 97 predicted planets.

<sup>3</sup> The dynamical spacing criteria for completeness of a planetary system are (a) all adjacent planet pairs have  $\Delta$  values smaller than 10 if an additional planet is between each pair; (b) at least two adjacent planet pairs in the system have  $\Delta$  values smaller than 10 if additional planet pairs are inserted.

### 3 ANALYSIS

We revisited all 56 systems with the Q1–Q15 long-cadence *Kepler* public data (with more than 1000 d total time span), looking for additional periodic signals. First, we validated the detectability of all the known *Kepler* planetary candidates in these systems. We applied the Box Least Square Fitting (BLS) algorithm to the pre-filtered light curves. The pre-filtering processes included the removal of bad data points from the *Kepler* raw data (the SAP\_FLUX), the correction of safe modes and tweaks in the light curves, and the filtering of the systematic effects and stellar variations by a set of cosine functions with a minimum period of 1 d. We refer to Huang, Bakos & Hartman (2013) for more details about our pre-filtering technique. We then cross referenced our detected signals with the reported periods and epochs from the 2013 *Kepler* catalogue.

All the known transit signals in these systems have signal-to-noise ratios (SNRs) higher than 12 and dip significance (DSPs) higher than 8. These known transits from the systems were then removed from the raw (SAP\_FLUX) light curves with a window function 1.1 times wider than the reported transit duration from *Kepler* catalogue. The transits with high transit timing variations [TTVs; such as KOI-250 (Steffen et al. 2012a) and KOI-904 (Steffen et al. 2012b)] were removed by visual inspection of the light curves.

After the removal of all the known signals, the raw light curves were then cleaned by the same pre-filtering technique as above. We ran the BLS again on these light curves to ensure that the known signals have been fully removed. We selected the BLS peaks with the same threshold above. We also visually examined local maximums in the BLS spectrum within the predicted range of BL13 (regardless of their SNR). The selected peaks were then checked against our standard vetting procedures in Huang et al. (2013). Five new periodic planetary candidates were detected that passed our

vetting procedures. We then derived the best-fitting parameters and their error bars of the vetted planetary candidates using the Markov Chain Monte Carlo algorithm.

We show the BLS spectrum of KOI-1952 in Fig. 2. The detected period has an SNR of 13.7 for the spectrum peak and a DSP of 9.0. There are three more peaks with comparable SNR in the spectrum, but their DSPs are all less than 8.

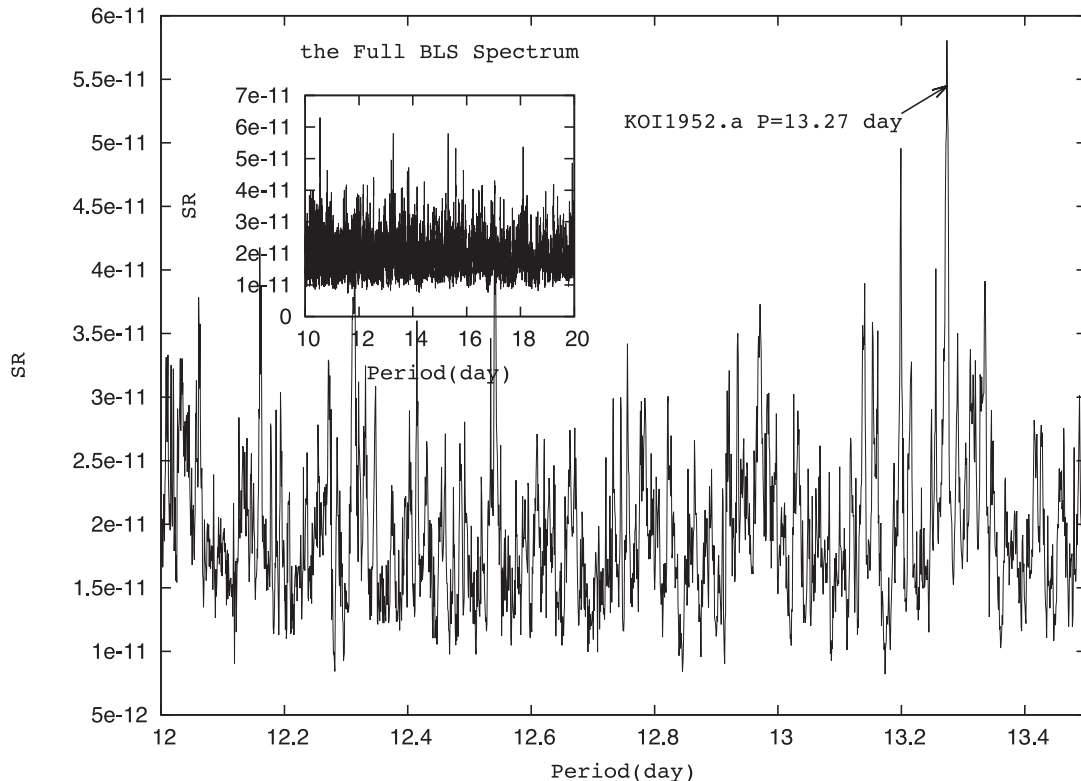
## 4 RESULTS AND DISCUSSION

### 4.1 Summary of detections

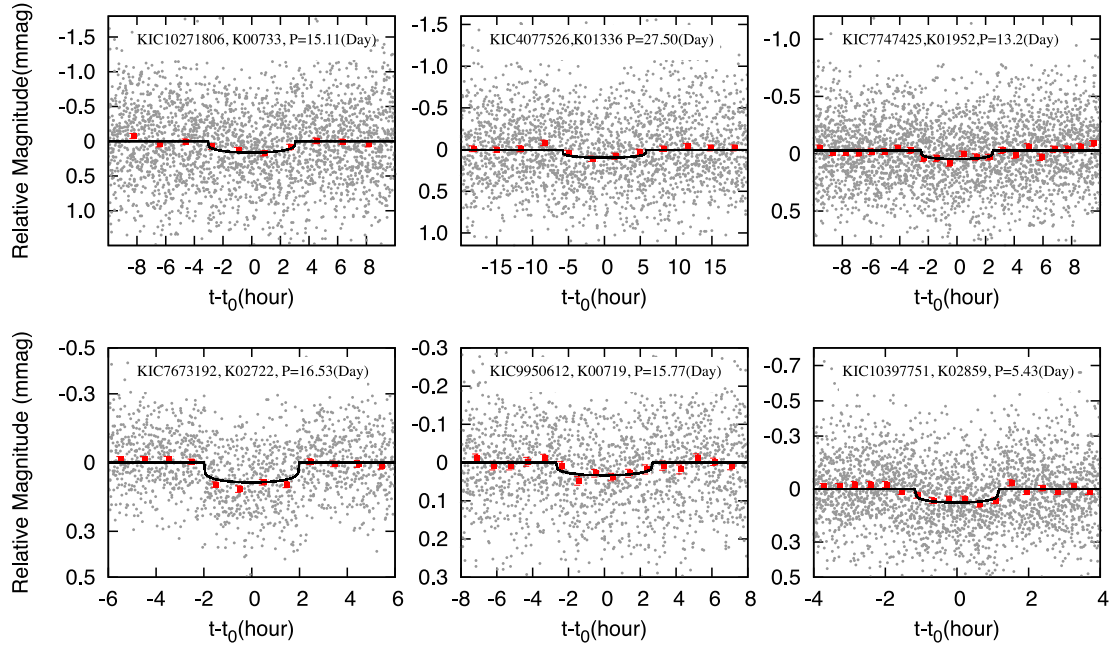
In this search among the 56 *Kepler* high-multiplicity systems, using  $\text{SNR} > 12$  and  $\text{DSP} > 8$  criteria, and visually inspecting the BLS spectrum in the predicted period range, we have not found the majority of the predicted planets from BL13. We found five of the predicted signals, and one periodic transit that was not predicted. We present the newly discovered transit signals in Fig. 3. The transit parameters are listed against the predicted periods in Table 1. We also list the known planetary candidates from *Kepler* team and their detection SNR and DSP in Table 1 as a comparison. Most of the detected signals indicate planets with size smaller than  $2R_{\oplus}$ . The detection SNR and DSP are on the low side of the overall population of *Kepler* candidates. However, the factor that they reside in multiple planet systems enhance their chances to be real planets (Lissauer et al. 2012).

Details specific to each of the systems are spelled at below.

KOI-719 was predicted to host three ‘inserted’ planets and one ‘extrapolated’ planet. We found a planetary candidate with period of 15.77 d around the predicted period  $14 \pm 2$  d. We do not see the rest of predicted planets in this system. Since KOI-719 is a small



**Figure 2.** The BLS spectrum of KOI-1952 after the known transit signals removed. We zoomed in around the predicted period of the transit signal. The full spectrum is shown in the small window. All the other peaks of comparable height with the detected transit signal have much lower dip significance.



**Figure 3.** Folded light curves around the centre of transits  $t_0$  of the newly discovered planetary candidates from *Kepler* Q1-Q15 long-cadence data. The unbinned data are shown in grey dots, while the binned data are shown in red squares with the error bars representing the uncertainties in binned average. Superimposed are the best-fitting models of the transits. We note that the y-axis scales vary between subfigures.

star ( $R_{\text{star}} = 0.66 R_{\odot}$ ), this candidate is extremely small, with best-fitting radius similar to Jupiter’s moon Ganymede,  $\sim 0.42 R_{\oplus}$ . This new signal is around the 7:4 resonance of both its inner neighbour and its outer neighbour, reduces the system  $\chi^2_{\nu}$  from 1.35 to 0.5.

*KOI-1336* was predicted to host a  $6.8 \pm 3$  d and another  $26 \pm 3$  d ‘inserted’ planet. We recovered the latter at 27.5 d period. This signal is outside the 5:3 resonance with the inner planet (*KOI-1336.02*), and near the 2:3 resonance with the outer planet (*KOI-1336.03*). The  $\chi^2_{\nu}$  of this system slightly increased with the insertion of this signal (from 1.06 to 1.35). If the 6.8 d planet exists (which we did not see in this search), this value would drop to 0.25. We failed to recover the ‘extrapolated’  $61 \pm 6$  d signal.

*KOI-1952* was predicted to host two additional ‘inserted’ planets, with periods around  $13 \pm 2$  d and  $19 \pm 2$  d and an ‘extrapolated’ planet with a period of  $65 \pm 7$  d. The detected signal matches well with the first prediction, and has a period of 13.3 d. This period is near the 3:2 resonance of *KOI-1952.01*, and near the 1:2 resonance of *KOI-1952.02*. We did not find any significant signal around the 19 d period. With the insertion of this transit signal, the  $\chi^2_{\nu}$  of this system decreased from 3.25 to 0.64, following a tighter TB relation.

*KOI-2722* was predicted to host an ‘extrapolated’  $16.8 \pm 1$  d transit. With the Q1–Q15 light curves, we recovered a new signal at a period of 16.5 d, which is also reported by *Kepler* team in the recent accumulated catalogue. This outer planetary candidate is near the 3:2 resonance with the previous outmost planetary candidates in the system. The next outer planetary candidate, predicted by [BL13](#) around period of  $24 \pm 2$  d, was not identified in our analysis.

*KOI-2859* was predicted to host an ‘inserted’ planet with period around  $2.41 \pm 0.1$  d and an ‘extrapolated’ planet with period around  $5.2 \pm 0.3$  d. We only found the 5.43 d ‘extrapolated’ signal. It is not in tight resonances with any of the other planets in the system. The  $\chi^2_{\nu}$  is improved to be 1.07.

We also have some detections that do not match the predictions. We found a new ‘inserted’ planetary candidate (with  $P = 15.1$  d) in

the *KOI-733* system, which was predicted to host an ‘extrapolated’ planet with a period of 36 d. Although this system original fits better than solar, it was clarified as dynamically unpacked. Adding in this planet in the system will introduce the 4:3 resonance to the inner planet and the 4:5 resonance to the outer planet. However, this possible insertion will make the TB relation less tight;  $\chi^2_{\nu}$  increased from 0.22 to 4.06.

We put these discoveries in the context of the four subcategories we stated in Section 2 (Table 2). We found three ‘inserted’ and one ‘extrapolated’ planetary candidates around the predicted periods in the 10 ‘sparse and insertion (SI)’ systems, and one ‘extrapolated’ planetary candidate around the predicted period in the 17 ‘complete and extrapolated (CE)’ systems. We did not find any transit signal within the error-bar of the predicted periods of the 8 ‘complete and insertion (CI)’ systems and 21 ‘sparse and extrapolated (SE)’ systems.

#### 4.2 Detection bias analysis

We considered some possible explanations for the discrepancy between the predicted planets and the observed numbers. We first look at the transit probabilities of the predicted planets. The maximum inclined angle for a planet to transit a solar type star can be expressed as a function of its period:

$$i_{\text{max}} \approx 1.06^{\circ} \left( \frac{P}{50 \text{ d}} \right)^{-2/3}. \quad (4)$$

Fabrycky et al. (2012) found that the typical mutual inclinations of *Kepler* multiple systems lie firmly in the range  $1^{\circ}0$ – $2^{\circ}3$ , most consistent with a Rayleigh distribution peaks at  $1^{\circ}8$ . By comparing the planet population properties between the HARPS and *Kepler* surveys, Figueira et al. (2012) also concluded that the planetary system as a whole are likely to have the inclination between the planets and the plane of the system to follow a Rayleigh distribution with  $\sigma_i = 1^{\circ}$ . We consider a Rayleigh distribution of planet

**Table 1.** Planet parameters.

KIC	$\chi_v^{2a}$	Origin <sup>b</sup>	KOI	Period	Epoch(BJD–245 4000)	$R_p/R_*$	$R_p/R_\oplus$	SNR	DSP
9950612	1.35	O	K00719.01	9.03	1004.014	0.023	1.64	1048	59
		O	K00719.02	28.12	979.913	0.0123	0.88	77	18
		O	K00719.03	45.90	999.538	0.0165	1.18	184	25
		O	K00719.04	4.159	966.784	0.0113	0.81	405	25
	0.49	N	K00719.a	15.7687 <sup>+5</sup> <sub>-6</sub>	966.435 <sup>+10</sup> <sub>-8</sub>	0.0059 <sup>+6</sup> <sub>-10</sub>	0.42	12	9
		I	K00719.I	6.2 ± 0.6	–	–	0.6	–	–
		I	K00719.II	14 ± 2	–	–	0.7	–	–
		I	K00719.III	20 ± 2	–	–	0.8	–	–
E	K00719.IV	66 ± 7	–	–	1.1	–	–		
10271806	0.22	O	K00733.01	5.925 020	1002.714	0.010 71	2.84	328	64
		O	K00733.02	11.349 30	967.318	0.010 93	2.47	195	24
		O	K00733.03	3.132 940	968.677	0.008 78	1.52	60	25
		O	K00733.04	18.643 90	974.620	0.009 93	2.55	13	14
	4.06	N	K00733.a <sup>c</sup>	15.111 33 <sup>+3</sup> <sub>-4</sub>	972.676 <sup>+2</sup> <sub>-2</sub>	0.0113 <sup>+6</sup> <sub>-4</sub>	3.00	13	8
		E	K00733.I <sup>d</sup>	36 ± 4	–	–	2.8	–	–
4077526	1.06	O	K01336.01	10.218 500	969.871	0.021 50	2.6	329	19
		O	K01336.02	15.573 800	965.438	0.021 69	2.6	177	11
		O	K01336.03	40.101 000	965.715	0.022 60	2.7	18	13
		O	K01336.04	4.458 250	967.387	0.014 31	1.7	31	9
	1.35	N	K01336.a	27.5066 <sup>+9</sup> <sub>-1</sub>	977.882 <sup>+3</sup> <sub>-3</sub>	0.0086 <sup>+6</sup> <sub>-5</sub>	1.04	nan	nan <sup>e</sup>
		I	K01336.I	26 ± 3	–	–	2.4	–	–
	0.19	I	K01336.II	6.8 ± 3	–	–	1.7	–	–
		E	K01336.III	61 ± 6	–	–	3.0	–	–
7747425	3.26	O	K01952.01	8.010 350	1002.714	0.016 92	1.87	161	27
		O	K01952.02	27.665 000	976.876	0.018 67	2.06	14	17
		O	K01952.03	5.195 500	968.677	0.011 35	1.25	217	15
		O	K01952.04	42.469 900	979.305	0.018 21	2.01	30	13
	0.64	N	K01952.a	13.27242 <sup>+9</sup> <sub>-1.3</sub>	973.014 <sup>+4</sup> <sub>-4</sub>	0.0077 <sup>+9</sup> <sub>-5</sub>	0.85	14	9
		I	K01952.I	13 ± 2	–	–	1.5	–	–
	0.01	I	K01952.II	19 ± 2	–	–	1.6	–	–
		E	K01952.III	65 ± 7	–	–	2.2	–	–
7673192	0.98	O	K02722.01	6.124 820	967.935	0.010 93	1.47	215	28
		O	K02722.02	11.242 800	969.322	0.010 71	1.44	184	17
		O	K02722.03	4.028 710	966.775	0.008 78	1.18	17	15
		O	K02722.04	8.921 080	970.494	0.009 93	1.33	142	16
	N	K02722.a	16.5339 <sup>+1</sup> <sub>-1</sub>	968.407 <sup>+7</sup> <sub>-5</sub>	0.0086 <sup>+8</sup> <sub>-5</sub>	1.16	31	13	
		E	K02722.I	16.8 ± 1.0	–	–	2.8	–	–
10397751	1.69	O	K02859.01	3.446 219	965.2274	0.0132	1.27	89	16
		O	K02859.02	2.005 396	966.2442	0.0074	0.72	99	13
		O	K02859.03	4.288 814	965.3824	0.0075	0.72	105	11
		O	K02859.04	2.905 106	965.5643	0.0086	0.83	150	10
	1.07	N	K02859.a	5.43105 <sup>+6</sup> <sub>-4</sub>	967.41401 <sup>+5</sup> <sub>-3</sub>	0.0079 <sup>+10</sup> <sub>-6</sub>	0.76	160	10
		I	K02859.I	2.41 ± 0.1	–	–	0.6	–	–
		E	K02859.II	5.2 ± 0.3	–	–	0.8	–	–

<sup>a</sup>The first value for every system is based the fitting before the insertion; the value next to the detected planet is based on the fitting including the detection; the value next to the predicted planet is based on the fitting including the prediction (but exclude the detection). A smaller  $\chi_v^2$  indicates tighter fitting to the TB relation.

<sup>b</sup>‘O’ indicates KOI candidate from *Kepler* team. ‘N’ indicates new detections from this work. ‘I’ indicates inserted planets (predicted). ‘E’ indicates extrapolated planet (predicted).

<sup>c</sup>KOI number with letter indicates this is a new detection.

<sup>d</sup>KOI number with roman numbers indicates this is a predicted planet.

<sup>e</sup>This candidate is found by identifying the BLS peaks visually around the predicted periods.

inclinations constrained by Fabrycky et al. (2012), with the Rayleigh width<sup>4</sup>  $\sigma_i = 1.8_{-0.8}^{+0.5} \circ$ , and assume all the stars to have solar radii. If we assume that the mean planes of the known planets in every system lie in the plan including the line of sight and the stellar

mid-disc, the expected number of planets to transit can be expressed with

$$\sum_{i=1}^n \frac{C_0^{i_{\max}}}{C_0^{90}} \approx \sum_{i=1}^n C_0^{i_{\max}} = \sum_{i=1}^n \left( 1 - \exp \left[ -\frac{1.06^2}{2\sigma_i^2} \left( \frac{P_i}{50 \text{ d}} \right)^{-4/3} \right] \right). \quad (5)$$

<sup>4</sup> Here, 1 $\circ$ 0 and 2 $\circ$ 3 are the 3 $\sigma$  lower and upper limit for the possible range of Rayleigh width. See fig. 6 of Fabrycky et al. (2012).

**Table 2.** Detection summary.

Category <sup>a</sup>	Num. predictions <sup>b</sup>	Num. expectations <sup>c</sup>	Num. detections <sup>d</sup>
SI	10 (39)	$7.8^{+3.5}_{-1.7}$	4 (4)
CI	8 (20)	$4.2^{+1.2}_{-0.4}$	0 (0)
CE	17 (17)	$2.2^{+1.8}_{-0.6}$	1 (1)
SE	21 (21)	$0.65^{+0.8}_{-0.2}$	0 (0)

<sup>a</sup>‘S’ (C) – the systems are sparse (complete); ‘I’ (E) – the systems need (do not need) insertion. For detailed definition of each category, see Section 2.

<sup>b</sup>The first number indicates the number of systems predicted, the second number indicates the total number of planets predicted in these systems.

<sup>c</sup>The expected number of planets to be detected after accounting observational bias. We estimate this using the most likely Rayleigh distribution for inclination with  $\sigma_i = 1.8^{+0.5}_{-0.8}$  and the turnover power law for size correction. The upper bound and lower bound are  $3\sigma$  limitations. We note that if using an inclination distribution suggested by Figueira et al. (2012), the expected number of predicted planets would be even higher.

<sup>d</sup>The detected number of systems (planets) that match the predictions.

We use  $C_0^i$  to note the cumulative distribution of a Raleigh distribution from 0 to angle  $i$ . The maximum possible value of  $i$  is  $90^\circ$  due to geometric symmetric reason.  $P_{i=1,n}$  is the discrete period distribution of the predicted planets taken from BL13. In reality, the assumption about the mean planes of the known planets lying in the middle disc of the stars is not strictly true. Therefore, our estimation of the expected number of planets that transit shall be slightly smaller than the true expected number.

We found that  $11^{+12}_{-3}$  out of 56 of the ‘extrapolated’ planets are expected to transit their host stars, while  $22^{+10}_{-4}$  out of 41 of the ‘inserted’ planets are expected to transit their host stars. We estimated the upper limit here using  $\sigma_i = 2:3$ , and the lower limit with  $\sigma_i = 1:0$ . The ‘extrapolated’ planets usually have longer periods, which are less likely to be detected than the ‘inserted’ planets. It would be interesting for future works to search for TTVs of the known planets in these systems to reveal potential non-transiting signals.

The rest of the non-detected planets could also be missing due to their small sizes. Howard et al. (2012) proposed that the planet size distribution follows a power law for all the *Kepler* planetary candidates,

$$\frac{d f(R)}{d R} = 2.9 R^{-2.92}. \quad (6)$$

The power-law distribution in the radius range above  $2 R_\oplus$  has been confirmed by various authors (Dong & Zhu 2013; Petigura, Howard & Marcy 2013a; Petigura, Marcy & Howard 2013b). However, this estimation of planet occurrence rate becomes incomplete for  $R_p < 2 R_\oplus$  (Howard et al. 2012, fig. 5). Petigura et al. (2013a) used an injection-recovery technique to produce the current best estimation of the occurrence rate for the small planets. We fit the distribution from Petigura et al. (2013a, fig. 3A) with  $R_p < 2.8 R_\oplus$  using a power-law distribution as equation (7) and then use it as our default radius distribution in the radius range  $R_p < 2 R_\oplus$

$$\frac{d f(R)}{d R} = k R^{-\alpha}, \quad (7)$$

where  $k = 0.30 \pm 0.013$ ,  $\alpha = 0.36^{+0.05}_{-0.07}$ . The error bar of the power-law index is estimated with a Monte Carlo method, taking into account of the uncertainties in the occurrence rate presented by Petigura et al. (2013a). However, we caution the reader that this fitting is based on only three data bins with planet radius in the range of  $1\text{--}2.8 R_\oplus$ . Therefore, the tightness of these error bars

does not well represent the statistical confidence of the power-law indices. Moreover, the exact turn over point of the distribution is uncertain, likely to lie between  $2$  and  $2.8 R_\oplus$  based on the study of Petigura et al. (2013a). We adopt  $2 R_\oplus$  as the transition point. We assume here for planets with size larger than the transition point, the planets follow a distribution described by equation (6), while smaller planets follow a distribution described by equation (7). The two distributions are scaled such that the  $df(R)/dR$  value at  $2 R_\oplus$  is the same.

For each planet, we take into account the stellar properties and the light-curve precision in the correction and assume completeness in the detection for all the planets with signal eight times than the noise level in phase space. The minimum size of planet we assume to be completely detected for each light curve can be expressed as

$$r_{\min} = r_{\text{star}} \left[ 8\sigma_{\text{lc}} \left( \frac{1400 \text{ d}}{P} \right)^{1/2} \right]^{1/2}.$$

Therefore, the detection probability for each transit is

$$\Pr(\text{Detection}) = \left( 1 - \exp \left[ -\frac{1.06^2}{2\sigma_i^2} \left( \frac{P_i}{50 \text{ d}} \right)^{-4/3} \right] \right) \times \left( \int_0^{r_{\min}} \frac{df(R)}{dR} dR \right). \quad (8)$$

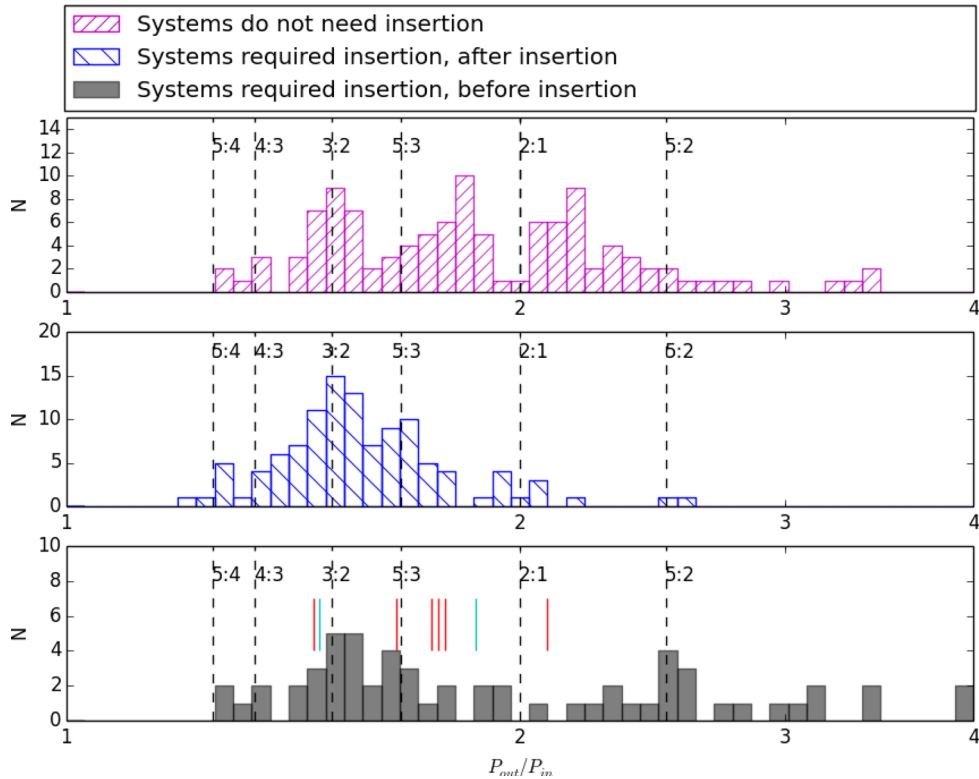
We found  $4.2^{+3.5}_{-1.2}$  extrapolated planets and  $10.7^{+3.6}_{-1.8}$  inserted planets are expected in this detection. We remind the readers that the error bars here represent the  $3\sigma$  limit from the Rayleigh distribution. The number of detections we found for both the ‘extrapolated’ (two detections) and the ‘inserted’ planets (three detections) are far beyond the lower limit of the predicted expectations.

To explore the effect of a different size distribution, we also report the expected number of detections with the power-law distribution  $\frac{df(R)}{dR} = kR^{-1}$  (constant occurrence rate in log space) in this radius range ( $R < 2 R_\oplus$ ), as suggested by Petigura et al. (2013b). To avoid the singularity of integration with the plateau distribution at size 0, we set the lower limit of the planet size distribution to be  $0.1 R_\oplus$ . One could of course argue that all the missing planets might as well be even smaller bodies than this, but it is out of the scope of this paper to discuss the region beyond our understandings. We found  $2.7^{+2.2}_{-0.7}$  extrapolated planets and  $7.3^{+2.3}_{-1.2}$  inserted planets are expected under this assumption.

We summarize the expected number of detection in the context of the four category of systems in Table 2, and compare them with detections. Generally speaking, our number of detections are below the expected lower limit of detections in most of the cases. Predictions in the ‘CI’ systems are ruled out at higher than  $20\sigma$  level. Although BL13 claim majority (94 per cent) of the most complete systems tend to follow a tight TB relation, our findings indicate that those most complete systems that do not follow a tight TB relation could not be explained by missing planets.

### 4.3 Period ratio distributions

It is difficult to validate most of the predictions from the TB relations due to the uncertainty in the size distribution for small planets. However, we can use the period ratio distribution to examine the predicted planet population further, since there is no known strong bias against detections of planets in particular low-order period ratios. Steffen (2013) pointed out that there could be detection bias against adjacent period ratios that are larger than 5:1 or 6:1. In this analysis, we only focus on the region where adjacent period ratios



**Figure 4.** Histogram of period ratio between the neighbouring planet pairs in *Kepler* high-multiplicity samples. We present the systems that do not need insertion in magenta and hatched with ‘/’. The systems that required insertion, with all the inserted planets taken into account are shown in blue and hatched with ‘\’. We also shown the original (before insertion) period ratio distribution of systems needing insertion in grey. We marked out the position of the new discoveries in the bottom panel with vertical bars (red for ‘inserted’ planets and cyan for ‘extrapolated’ planets) for references.

are smaller than 3:1. We expect that the systems that do not need insertion (‘CE’ and ‘SE’) represent the underlying true period ratio distribution; while the planet systems needing insertion (‘CI’ and ‘SI’) should recover the same distribution after accounting for all the inserted planets. Our analysis here is independent of the number of predictions confirmed by our work.

We test the above expectation with these two populations in Fig. 4. The distribution of neighbouring period ratios for the ‘CE’ and ‘SE’ systems is shown with magenta; and the ‘CI’ and ‘SI’ systems with all their predicted inserted planets are shown in blue. For reference, we also plot in grey the distribution of ‘CI’ and ‘SI’ systems before the insertion. A striking feature is that the distribution of planetary systems after insertion looks significantly different from the systems that do not require insertion. We also performed a two-sample Kolmogorov–Smirnov statistic on the two populations, obtaining a KS  $p$ -value of  $3 \times 10^{-11}$ . It is unlikely that the ‘CI’ and ‘SI’ systems together with their inserted planets recovered the period ratio distribution suggested by the systems that do not require insertion. This indicates that some of the ‘insertion’ by BL13 might be problematic.

By observing the detailed structures in the period ratio distribution, we found that systems following a tight TB relation (thus not needing insertion) is more likely to have period ratio around (wider to) the MMRs, such as 3:2, 5:3 and 2:1 resonances. Dynamic models (see Hansen & Murray 2013; Petrovich et al. 2013) can also reproduce these features. We note that the tail of the distribution at a period ratio higher than 3 is not statistically significant, the chance of having non-detected planets in these few sparse systems are not negligible (they follow the same size and inclination distribution arguments as in Section 4.1).

On the other hand, the systems that do not follow well a TB relation before their insertion have less pronounced peaks near the above MMRs. Including all the predicted ‘inserted’ planets, such that the systems can be optimally fitted by a tight TB relation, will preferentially add in (or modify) the period ratios close to the lowest order resonance in the original system. Therefore, the revised period ratio distribution according to the TB relation overpredicts the clustering around the 3:2 MMR and underpredicts the 2:1 MMR. It is hard to explain that most of the missing planets belong to the 3:2 MMR rather than the other MMRs by observation bias, unless there is a strong correlation between the period ratio of the adjacent planet and the size ratio of the adjacent planet, which is not seen in the previous study by Ciardi et al. (2013).

## 5 SUMMARY

The TB relation has been a recurrent theme in astronomy over the past two centuries. Investigations were all based on our Solar system – lacking other multiplanet systems. It is for the first time that validity of the TB relation can be tested on a statistically meaningful sample – thanks to hundreds of multiplanet discoveries made by the *Kepler* Space mission. By analysing the multiple systems and assuming that a general TB relation holds, BL13 predicted 141 new planets. We found only five of the predicted planets in the *Kepler* data. Some of the planets may be not finding because of small size or a non-transiting inclination angle. Nevertheless, even after taking these observational biases into account, the number of detected planets is still fewer than the  $3\sigma$  lower limit of the expected planets from the prediction, hinting that it is questionable to apply such a law to all the extrasolar high-multiplicity systems.

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