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# Updated Catalog of Kepler Planet Candidates: Focus on Accuracy and Orbital Periods

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#### Abstract

We present a new catalog of Kepler planet candidates that prioritizes accuracy of planetary dispositions and properties over uniformity. This catalog contains 4376 transiting planet candidates, including 1791 residing within 709 multiplanet systems, and provides the best parameters available for a large sample of Kepler planet candidates. We also provide a second set of stellar and planetary properties for transiting candidates that are uniformly derived for use in occurrence rate studies. Estimates of orbital periods have been improved, but as in previous catalogs, our tabulated values for period uncertainties do not fully account for transit timing variations (TTVs). We show that many planets are likely to have TTVs with long periodicities caused by various processes, including orbital precession, and that such TTVs imply that ephemerides of Kepler planets are not as accurate on multidecadal timescales as predicted by the small formal errors (typically 1 part in  $10^6$  and rarely  $>10^{-5}$ ) in the planets' measured mean orbital periods during the Kepler epoch. Analysis of normalized transit durations implies that eccentricities of planets are anticorrelated with the number of companion transiting planets. Our primary catalog lists all known Kepler planet candidates that orbit and transit only one star; for completeness, we also provide an abbreviated listing of the properties of the two dozen nontransiting planets that have been identified around stars that host transiting planets discovered by Kepler.

*Unified Astronomy Thesaurus concepts:* Exoplanet catalogs (488); Exoplanet dynamics (490); Exoplanets (498); Transit photometry (1709); Planetary theory (1258)

Supporting material: machine-readable table

#### 1. Introduction

NASA's Kepler spacecraft monitored a single star field for 4 yr during its prime mission, with a duty cycle of almost 90%. The principal objective of the Kepler mission was to take a statistical census of planets having orbital periods of up to  $\sim 1$  yr. The Kepler project released eight catalogs of planet candidates found during the mission (Borucki et al. 2011a, 2011b; Batalha et al. 2013; Burke et al. 2014; Mullally et al. 2015; Rowe et al. 2015; Coughlin et al. 2016; Thompson et al. 2018). Each new catalog used more sophisticated methods, and aside from the last one, each used more Kepler data and listed more planet candidates than its predecessor. The project's later catalogs employed successively more automated procedures.

The primary goal of the Kepler project's final catalog of planetary candidates (Thompson et al. 2018), often referred to as DR25 (which is an abbreviation of Data Release 25), was to produce a listing of planet candidates (PCs) found and vetted in a well-defined and reproducible manner for the exoplanet community to use as input for studies of planet occurrence rates (e.g., Hsu et al. 2021). As such, the data were processed in a

Original content from this work may be used under the terms of the Creative Commons Attribution 4.0 licence. Any further distribution of this work must maintain attribution to the author(s) and the title of the work, journal citation and DOI. highly automated manner, with uniformity and reproducibility prioritized over using all available information to identify and classify each individual potential planet signature. Previously found planet candidates that were not identified by the final search for transit-like patterns do not appear in the Thompson et al. (2018) catalog. Furthermore, their vetting of individual candidates did not include the hands-on treatment (e.g., examination of lightcurves and centroid shifts by eye) that was a feature of the first six Kepler planet catalogs.

The neglect of hands-on vetting from previous catalogs ended up excluding dozens of Kepler planets (some of which are well known and were verified with high confidence) from Thompson et al.'s (2018) list of Kepler objects of interest (KOIs; the integer number refers to the target star, whereas the digits after the decimal point refer to the putative planet) and led to classifying others as false positives (FPs) rather than as viable planet candidates. One particularly relevant example is that the Thompson et al. (2018) catalog is more biased against planets exhibiting significant transit timing variations (TTVs) than are previous catalogs. This limitation leads to a bias against planet pairs with near-resonant orbits, as foreseen by García-Melendo & López-Morales (2011). An unpublished analysis of strategies for detecting planets with large TTVs by A. Moorhead & one of us (E.B.F.) found that most such planets would naturally be detected by applying standard transit search

algorithms to  $\sim 1$  yr long subsets of the data, since large nearresonant TTVs typically accumulate over multiyear timescales. Therefore, the use of candidates from multiple searches conducted with different amounts of data reduces the bias against planets with substantial TTVs. This improvement in sensitivity to planets with large TTVs (i.e., TTVs comparable to or exceeding the transit duration) is most significant for planets that would, in the absence of TTVs, likely be detected using only 13 or 16 months of data (the durations searched for the second and third Kepler PC catalog releases).

Our new catalog is more analogous to the Kepler project's final cumulative catalog, DR25supp, which was not presented in a refereed publication,<sup>11</sup> than to the DR25 catalog. Both the DR25supp catalog and our Table 1 differ from the DR25 catalog in two key respects: the use of manual vetting and including KOIs from multiple sources, including previous Kepler project catalogs. For DR25supp, the cumulative DR24 catalog was combined with the DR25 catalog, and the Kepler False Positive Working Group redispositioned all KOIs whose dispositions were disputed in the last six project catalogs (listed as a planet candidate in at least one catalog but listed as a false positive in at least one other); apart from dispositions, the most recent properties were listed. We began with the DR25supp catalog, added other KOIs from various sources, and manually vetted select KOIs, as described in Section 2.3.

The Kepler mission defined a threshold crossing event (TCE) as a periodic signature with a multiple event statistic (MES) of at least 7.1, where the MES is effectively the signal-to-noise ratio (S/N) of the putative planetary transits in the folded lightcurve, as measured by the Kepler pipeline. The threshold of MES  $\ge$  7.1 was chosen to keep the expected number of KOIs resulting from white noise small (see Section 2.3 for details). The Kepler pipeline looked for planet candidates in the lightcurve of an individual target star one by one, beginning with the signal possessing the largest MES and then performing the search again on a lightcurve from which data at the times of the transits of this KOI were removed. The process was repeated until no additional signal with MES  $\ge 7.1$  was found. Because data were removed from the lightcurve prior to searching for additional candidates, the search for multis (systems with multiple transiting candidates) is less complete than that for singles (systems with only a single transiting candidate). This bias against multis is analyzed quantitatively by Zink et al. (2019).

Various groups have published lists of additional Kepler planet candidates; see Section 2.3 for details. Together with those appearing in the official Kepler PC tabulations, the total number of Kepler PCs listed in one or more catalogs is  $\sim$ 5000, although several hundred of these have subsequently been reclassified as FPs. More than 2700 of these planet candidates have been verified (either confirmed using radial velocity (RV) data or via TTVs or statistically validated as having a high likelihood of being true planets) and assigned official Kepler planet designations such as Kepler-11 g (Lissauer et al. 2011a).

We assembled our catalog using data from the final Kepler project planet candidate catalog (Thompson et al. 2018), previous PC catalogs produced by the Kepler project, and PC lists from other groups (Section 2.3). We incorporated the improved estimates of stellar properties derived using

For ease of reading, we often refer to planet candidates simply as "planets." Planets that are the sole transiting candidate of their host star are referred to as "singles," whereas the term "multis" is used for both systems with more than one transiting planets and individual planets in such systems.

Our goals in compiling a new catalog of Kepler planet candidates are to provide a comprehensive listing of KOIs with significantly more accurate vetting and to give improved estimates of planet properties. As described in more detail in Section 2, our new listing relies on more homogeneous and robust techniques to compute planetary parameters, removing previous biases such as the dependence of orbital period estimates of planets exhibiting TTVs on the amount of data analyzed when they were first announced. We also list more planet properties and use more robust techniques to compute the values and uncertainties of the estimated planetary characteristics.

The primary advantages of using our new catalog are as follows. We present the most complete listing of Kepler planet candidates to date, based on the Kepler project's catalogs, community efforts, and our own analysis. We have provided initial dispositions for new KOIs in our sample. We have also revisited dispositions for those KOIs that were dispositioned as FP in DR25supp despite being listed as a PC in DR24 or DR25 or having a Kepler number according to the NASA Exoplanet Science Institute (NExScI). We provide additional disposition cuts based on S/N, mass measured from RV variations, and derived planetary radius,  $R_n$ .

The parameter values listed in our catalog (Table 1) are more accurate than those in previous catalogs, with a significant effort to systematically and uniformly improve transit models and calculations of posteriors for model parameters, including corrections for bias in impact parameter and the mean stellar density computed from the photometric model,  $\rho_{\star c}$  (Gilbert et al. 2022). Orbital periods have been revisited and in some cases recomputed to address the complications of TTVs by providing the best-fit constant period to transit times (TTs) observed by Kepler. We investigated multiplanet systems with suspiciously close-period planet candidates and corrected period aliasing. Significant improvements in stellar parameters from ground-based follow-up and the parallax survey from Gaia have been incorporated (Fulton & Petigura 2018; Berger et al. 2020). This has allowed for planetary parameters to be derived in a more uniform manner than in other cumulative catalogs. We include a concise description of all planetary characteristics listed (see Section 2.5) to allow for the community to maximize the combined knowledge of exoplanets in the Kepler field of view.

We present our catalog of Kepler planet candidates in Section 2. In Section 3, we characterize the sample of PCs, compare the ensemble of PCs in multis to those in singles, compare PCs in two-planet systems with those in highermultiplicity multis, and quantify the reliability of the sample of multis as representing true planetary systems. We investigate the distribution orbital eccentricity for various subsets of Kepler PCs (Section 3.5), improving on previous studies thanks

<sup>&</sup>lt;sup>11</sup> Documentation for DR25supp is available at https://exoplanetarchive. ipac.caltech.edu/docs/PurposeOfKOITable.html#q1-q17\_sup\_dr25.

 Table 1

 Abbreviated Catalog of Planet Candidates

KOI Disp	KIC Kepler-Name	Period [d] $R_{\rm p} [R_{\oplus}]$	T0 [MJD] d <sub>transit</sub> [ppm]	$\frac{R_{\rm p}/R_{\star}}{T_{\rm dur} \ [\rm h]}$	<i>b</i> <i>T</i> <sub>1.5</sub> [h]	$ ho_{\star c} [g/cm^3] \ \#TT_{obs}$	u <sub>1</sub> #TT	u <sub>2</sub> TTVflag
	$a/R_{\star}$	i [deg]	$S[S_{\oplus}]$	S/N	MES	$\Delta S/N_{ttv}$	$S/N_{wTTV}$	S/N <sub>woTTV</sub>
	Kepillag	$p_{\star}$ [g/cm]	I eff [K]	K <sub>★</sub> [K <sub>☉</sub> ]	™∗ [™⊙]	log g		
1.01	11446443	$2.47061338 \pm 0.00000002$	$787.064865 \pm 0.000009$	$0.123865 \pm \substack{0.000066\\ 0.000062}$	$0.8179 \pm \substack{0.0006\\ 0.0006}$	$1.8365 \pm {}^{0.0062}_{0.0085}$	0.3860	0.2724
PPPP	Kepler-1 b	$14.1 \pm {}^{0.4}_{0.3}$	$14230.5\pm4.6$	$1.7430 \pm 0.0012$	$1.2264 \pm 0.0010$	431	431	008
	$8.4001 \pm \substack{0.0095 \\ 0.0130}$	$84.4130 \pm {}^{0.0096}_{0.0140}$	$874 \pm rac{56}{40}$	4360.4	6468.0	-0.19	7070.7	7323.0 Ê
	11.338	$1.219 \pm {}^{0.062}_{0.061}$	$5815\pm 66$	$1.04 \pm {}^{0.02}_{0.02}$	$0.99 \pm {}^{0.03}_{0.03}$	$4.390 \pm \substack{0.078 \\ 0.078}$	$0.013\pm0.041$	2 5
2.01	10666592	$2.20473545 \pm 0.00000005$	$788.535435 \pm 0.000017$	$0.075182 \pm {}^{0.000010}_{0.000008}$	$0.22 \pm {}^{0.16}_{0.22}$	$0.40810 \pm {}^{0.00024}_{0.00030}$	0.3043	0.3129 🛓
PPPP	Kepler-2 b	$16.18 \pm {}^{0.39}_{0.36}$	$6668.3 \pm 1.4$	$3.87410 \pm 0.00052$	$3.59923 \pm 0.00047$	602	602	006 Ě
	$4.7156 \pm \substack{0.0009 \\ 0.0012}$	$89.9596 \pm {}^{0.0323}_{0.2344}$	$4146 \pm {}^{183}_{183}$	5952.0	3862.2	13.12	20695.8	20905.0 <u>ب</u>
	10.463	$0.2788 \pm {}^{0.0088}_{0.0069}$	$6447\pm 64$	$1.97 \pm {0.04 \atop 0.04}$	$1.51 \pm {}^{0.03}_{0.02}$	$4.15 \pm {}^{0.11}_{0.11}$	$0.192\pm0.042$	2 152
3.01	10748390	$4.88780321 \pm 0.00000024$	$786.095757 \pm 0.000081$	$0.05786 \pm {}^{0.00045}_{0.00012}$	$0.054 \pm {0.186 \atop 0.041}$	$3.693 \pm {}^{0.039}_{0.286}$	0.64	A 01.0
PPPP	Kepler-3 b	$4.914 \pm {}^{0.080}_{0.088}$	$4315.6\pm6.5$	$2.3639 \pm 0.0054$	$2.2327 \pm 0.0030$	184	184	007 Ĕ
	$16.699 \pm \substack{0.081 \\ 0.405}$	$89.79 \pm {}^{0.18}_{0.63}$	$85.3 \pm {4.8 \atop 4.4}$	862.1	2034.6	0.02	4445.0	پر 4449.0 v
	9.174	$2.31 \pm {}^{0.15}_{0.10}$	$4541\pm54$	$0.77 \pm {}^{0.01}_{0.01}$	$0.77 \pm {}^{0.03}_{0.02}$	$4.542 \pm \substack{0.023 \\ 0.014}$	$0.410\pm0.084$	1 024
4.01	3861595	$3.8493714 \pm 0.0000012$	$787.26293 \pm 0.00053$	$0.03960 \pm {}^{0.00072}_{0.00129}$	$0.914 \pm {}^{0.016}_{0.035}$	$0.22168 \pm \substack{0.12742\\ 0.06371}$	0.3150	0.3029 E
PPPP	Kepler-1658 b	$13.073 \pm \substack{0.563 \\ 0.563}$	$1298\pm14$	$2.639 \pm 0.091$	$2.108\pm0.041$	279	279	0-1 ਫ
	$5.56 \pm {0.89 \atop 0.37}$	$80.8 \pm {}^{1.4}_{0.9}$	$5158 \pm \tfrac{588}{452}$	132.7	235.6	-0.27	6624.3	6706.0
	11.432	$0.0868 \pm {}^{0.0080}_{0.0081}$	$6776 \pm 139$	$3.05 \pm {}^{0.09}_{0.08}$	$1.78 \pm {}^{0.06}_{0.14}$	$3.716 \pm {0.026 \atop 0.037}$	$-0.076 \pm 0.082$	1
5.01	8554498	$4.78032745 \pm 0.00000087$	$787.80350 \pm 0.00016$	$0.03654 \pm {}^{0.00022}_{0.00019}$	$0.9517 \pm {}^{0.0017}_{0.0020}$	$0.346 \pm \substack{0.018 \\ 0.015}$	0.3746	0.28
PPPP		$8.70 \pm {}^{0.50}_{0.42}$	$959.3\pm4.2$	$2.020\pm0.015$	$1.383\pm0.019$	282	282	002
	$7.48 \pm {}^{0.12}_{0.11}$	$82.69 \pm {}^{0.13}_{0.13}$	$1387 \pm {}^{142}_{129}$	380.8	360.2	-0.50	5139.5	5446.0
	11.665	$0.182 \pm {}^{0.030}_{0.026}$	$5936 \pm 109$	$2.19 \pm {}^{0.11}_{0.10}$	$1.37 \pm {}^{0.13}_{0.10}$	$3.894 \pm {}^{0.049}_{0.054}$	$0.235\pm0.158$	1
5.02	8554498	$7.05201 \pm 0.00010$	$785.646 \pm 0.031$	$0.00316 \pm \substack{0.00038\\ 0.00051}$	$0.7272 \pm \substack{0.0001\\ 0.6674}$	$0.35 \pm {}^{1.72}_{0.34}$	0.3746	0.28
FFNN		$0.74 \pm {0.13 \atop 0.11}$	$10.8\pm2.6$	$4.3\pm1.1$	$4.3\pm1.1$	191	187	000
	$11.9 \pm {}^{4.3}_{4.7}$	$89.45 \pm {}^{0.55}_{3.57}$	$827 \pm rac{81}{81}$	6.2	0.0	-9.27	6127.5	6329.0
	11.665	$0.182 \pm {0.030 \atop 0.026}$	$5936 \pm 109$	$2.19 \pm {}^{0.11}_{0.10}$	$1.37 \pm {}^{0.13}_{0.10}$	$3.894 \pm {}^{0.049}_{0.054}$	$0.235\pm0.158$	1
6.01	3248033	$1.3341070\pm0.0000032$	$788.4519 \pm 0.0011$	$0.0101 \pm {}^{0.0003}_{0.0002}$	$0.15 \pm {}^{0.35}_{0.14}$	$1.23 \pm {}^{0.11}_{0.42}$	0.3306	0.3007
FFFF		$1.443 \pm \substack{0.066\\ 0.051}$	$120.0\pm3.7$	$2.106\pm0.035$	$2.081\pm0.033$	804	803	1-0
	$4.88 \pm {0.16 \atop 0.62}$	$89.03 \pm rac{0.97}{5.84}$	$3812 \pm {}^{192}_{177}$	43.0	21.5	-8.89	16014.0	16685.3
	12.161	$0.800 \pm {}^{0.045}_{0.049}$	$6344\pm 66$	$1.30 \pm {}^{0.03}_{0.03}$	$1.20 \pm {}^{0.04}_{0.02}$	$4.323 \pm \substack{0.060\\ 0.06}$	$0.041\pm0.042$	2
7.01	11853905	$3.2136689 \pm 0.0000010$	$786.11467 \pm 0.00030$	$0.024505 \pm {}^{0.000138}_{0.000078}$	$0.021 \pm {0.216 \atop 0.016}$	$0.4637 \pm \substack{0.0080\\ 0.0350}$	0.4025	0.2645
PPPP	Kepler-4 b	$4.05\pm {}^{0.12}_{0.11}$	$727.6\pm2.7$	$3.986 \pm 0.010$	$3.8879 \pm 0.0083$	338	338	005
	$6.326 \pm \substack{0.040\\ 0.161}$	$89.40 \pm {}^{0.55}_{1.64}$	$1191 \pm \frac{62}{73}$	346.8	294.5	-0.44	10568.0	10881.0
	12.211	$0.475 \pm {}^{0.023}_{0.032}$	$5833\pm 64$	$1.51 \pm {}^{0.04}_{0.04}$	$1.15 \pm {}^{0.05}_{0.05}$	$4.12 \pm {0.11 \atop 0.11}$	$0.171\pm0.042$	2
8.01	5903312	$1.1601530 \pm 0.0000016$	$787.92102 \pm 0.00072$	$0.01201 \pm \substack{0.00035\\ 0.00028}$	$0.7483 \pm \substack{0.0001\\ 0.5935}$	$4.28 \pm \substack{0.32 \\ 1.47}$	0.3792	0.2764
FFFF		$1.230 \pm {}^{0.052}_{0.044}$	$169.6\pm4.5$	$1.324\pm0.020$	$1.306\pm0.019$	1153	1152	1-0
	$6.73 \pm {}^{0.18}_{0.89}$	$89.32 \pm \substack{0.68 \\ 4.34}$	$2025 \pm {}^{93}_{110}$	48.4	36.6	-8.99	15328.0	16106.1
	12.450	$1.731 \pm {}^{0.042}_{0.071}$	$5883\pm 66$	$0.94\pm {}^{0.02}_{0.02}$	$1.00\pm {}^{0.02}_{0.03}$	$4.460 \pm {}^{0.044}_{0.044}$	$-0.063 \pm 0.042$	2

Note. The positions of the KOI Disp and Kepler-Name columns have been moved relative to the electronic table to facilitate viewing the examples presented in the typeset manuscript. The tabulated information is described in the numbered list in Section 2.5, where the numbers refer to the column numbers in the electronic table. (Alternative values of the stellar and planetary parameters listed in columns (64)–(85) are not presented in this abbreviated sample.)

(This table is available in its entirety in machine-readable form.)



**Figure 1.** Orbital period vs. radius of Kepler's planetary candidates. Those planets that are the only candidate for their given star are represented by black dots, those in two-planet systems as dark blue circles, those in three-planet systems as green triangles, those in four-planet systems as light blue squares, those in systems of five PCs as yellow five-pointed stars, those in systems of six PCs as orange six-pointed stars, the seven PCs associated with KOI-2433 as pink seven-pointed stars, and the eight planets orbiting KOI-351 (Kepler-90) as red eight-pointed stars. The legend lists the number of stars hosting each multiplicity. The planetary candidates are listed in Table 1 (first letter of disposition = "P"). Nontransiting planets (listed in Table 5) and circumbinary planets are not included. Planet candidates only observed to transit once (monotransits) are not plotted because their orbital periods are highly uncertain (see item 4 in the list presented in Section 2.5), but they are accounted for in the multiplicity designation of their companion planets and the total number of systems of each multiplicity given in the legend. KOI-846.01, with a radius  $R_p = 30.043 R_{\oplus}$  (see Section 2.3), falls outside the plotting window. All planets to the right of the dotted gray vertical line at P = 730 days (as well as some of the planets with shorter periods) transited only twice during the Kepler mission and therefore were not detected by the standard Kepler pipeline, which required a minimum of three transits for a detection. It is immediately apparent that there is a paucity of giant planets in multiplanet systems, especially giants with long orbital periods, for which few transits occurred during the time intervals that Kepler observed. Adapted from a previous figure generously provided by Rebekah Dawson.

to the enhanced accuracy of the stellar densities and impact parameters in our catalog. We find significant changes in the eccentricity distribution as a function of the inferred size of the PCs (Section 3.5.4) and the number of Kepler PCs detected around a given host star (Section 3.5.2). We also find significant differences between PCs with orbital periods less than 6 days and those with longer orbital periods (Section 3.5.3). We consider various factors that can lead to orbital period variations of Kepler planets (Section 4). We show that planets on eccentric orbits have variations in the times between successive transits on timescales much longer than the 4 yr duration of the Kepler mission (Section 4.1). Section 4.2 analyzes long-term variations in the mean orbital periods of planets within several Kepler systems showing significant TTVs that have been solved for dynamically. We conclude the main text by summarizing our principal results in Section 5.

We select which objects to include in our catalog of planet candidates and list their properties to maximize accuracy on an object-by-object basis. Therefore, our selection criteria and various planetary properties are not homogeneous, and our PC list is not appropriate for use as input for planetary occurrence rate calculations. Nonetheless, some aspects of our derivation of planetary properties provide estimates that are more accurate and at least as uniform as those found in previous studies. Therefore, we also present a second set of planetary properties using a uniformly derived set of stellar parameters in Table 1 and outline a process for utilizing some of the information tabulated therein for studies of occurrence rates in Appendix A. Our primary PC catalog (Table 1) is restricted to transiting planets orbiting just one star. An abbreviated catalog of nontransiting planets found (using TTVs and/or RV measurements) around stars with transiting Kepler planets is provided in Appendix B.

### 2. Planet Catalog

In this section, we introduce our catalog of Kepler planet candidates and describe the calculation of the properties of the PCs, as well as the sources used for characterizing their host stars. Figure 1 displays the radius-versus-period distribution of the PCs in our Kepler catalog and highlights the abundance of multiplanet systems discovered. Multiplanet systems provide a special opportunity to study the potentially rich dynamical history of exoplanet formation and evolution. Our construction and review of the Kepler exoplanet catalog focuses on orbital periods and the prevalence of multiplanet discoveries.

We discuss stellar parameters in Section 2.1, transit models in Section 2.2, candidate selection and catalog unification in Section 2.3, and the calculation and interpretation of orbital periods in Section 2.4. Our planet catalog is presented in Section 2.5. The weaknesses of this catalog and its previous incarnations are discussed, including the impact of TTVs, relationships between the historical Kepler catalogs, and the nonuniformity of candidate selection and biases of some derived properties. Section 2.6 focuses on the KOI-2433 system, which now has seven planet candidates.

#### 2.1. Input Stellar Properties

In preparing this catalog (Table 1) and throughout our study, we take stellar properties for the hosts of more than 99.7% of the planet candidates from one of three sources. When available, we select parameters from the latest catalog provided by the California Kepler Survey (CKS),<sup>12</sup> which lists properties of Kepler PC hosts that have both spectral measurements from the Keck I telescope and well-determined Gaia properties, especially distances (Fulton & Petigura 2018). This list includes  $\sim 60\%$  of the hosts of multis, as well as  $\sim 60\%$  of the singleplanet hosts brighter than Kepler magnitude Kp = 14.2, but fewer than 6% of the fainter hosts of singles. For stars with Gaia parallaxes/distances that were not included in the CKS sample, we use properties from Berger et al. (2020), which includes  $\sim 95\%$  of the Kepler targets; this list accounts for most of the remaining PC hosts. For stars absent from both catalogs, we use the stellar parameters listed in Kepler DR25 (Thompson et al. 2018).

Parameters for KOI-3206 were obtained from the Gaia online archive. We adopted custom parameters, as described in the following paragraph, for stellar hosts in two binary star systems. No useful data were found for KOIs 2324, 4713, 5226, and 5718, so we have adopted solar parameters with large uncertainties  $(R_{\star} = 1 \pm 1 R_{\odot}, M_{\star} = 1 \pm 1 M_{\odot}, \log g = 4.5 \pm 4.5)$  for these planet-hosting stars.

Transit depths for both KOI-119 (Kepler-108) and KOI-284 (Kepler-132) suffer substantial dilution due to stellar companions. For the case of KOI-119, we adopt the nominal dilution of 69.9% as reported in Mills & Fabrycky (2017) for their (preferred) mutually inclined solution. Observations indicate that the KOI-284 system consists of two nearly identical stars with a total of four known transiting exoplanets. From orbital stability considerations, the orbital periods of KOI-284.02 (6.41 days) and KOI-284.03 (6.17 days) are inconsistent with these planets orbiting the same star. Thus, KOI-284 represents the special case of a split multi; see Section 3.2 for more details on this system and other Kepler split multis. For computing the planetary parameters presented in this paper, we adopted a dilution of 50% for the KOI-284 transit models, which implies that half of the light in the photometric aperture is due to the companion star.

#### 2.2. Transit Models

The calculation of transit models and the preparation of data products is worth reviewing in the context of potential biases and providing motivation for future improvements of the Kepler catalog and its legacy value. For all transit models, we use Presearch Data Conditioning (PDC) lightcurves (Stumpe et al. 2014) as reported in DR25. Observations with a quality flag set for any of bits 1, 2, 3, 4, 6, 7, 9, 13, 15, 16, and 17 were rejected from our analysis for the reasons described in Table 2.3 of the Kepler Archive Manual (Thompson et al. 2016). PDC lightcurves were prepared for transit analysis by detrending using a second-order polynomial filter with a running window of 5 days. The width of the running window was always truncated to avoid gaps larger than 10 long-cadence (30 minute) observations of valid Kepler photometry. Thus, the filter does not cross large gaps in Kepler photometry that arise from monthly data downloads or quarterly spacecraft rotations, and it avoids problems with significant jumps in the reported photometric flux from thermal settling of the spacecraft after attitude adjustments that are not fully captured by PDC (Van Cleve & Caldwell 2016). Observations within one transit duration of the mid-transit time for each observed transit were excluded from the polynomial fit. Thus, the photometric baseline of in-transit data was interpolated based on out-oftransit observations only. Outliers in the detrended data were identified and removed; outliers are defined herein as single long-cadence photometric measurements more than five standard deviations away from the mean after removal of a best-fit transit model.

The DR25 transit models and updated models for this paper use the same software (TRANSITFIT5 transit modeling software; Rowe et al. 2015; Rowe 2016) and techniques for parameter estimation and the calculation of posteriors. Additional details can be found in Rowe et al. (2014, 2015) and Thompson et al. (2018). Briefly, a multiplanet transit model was calculated for each lightcurve and used to isolate the transits for each individual planet in the system by subtracting the model with the depth set to zero for the planet of interest. This lightcurve was then used to fit each KOI separately with a photometric transit model using the analytic quadratic limbdarkening model from Mandel & Agol (2002). Limb-darkening coefficients are based on the tables of Claret & Bloemen (2011) and were fixed to values used in the DR25 KOI catalog. The photometric model parameterization uses the mean stellar density  $(\rho_{\star})$ , fixed quadratic limb-darkening coefficients, photometric zero-point, mid-transit time  $(T_0)$ , orbital period (P), impact parameter (b), and scaled planet radius  $(R_p/R_*)$ . Eccentricity was fixed at zero for these models; thus,  $\rho_{\star}$  is replaced by  $\rho_{\star c}$ . The adoption of mean stellar density as a fitted parameter assumes that the mass of the host star is much larger than the combined mass of the transiting planet and any other planet(s) orbiting closer to the star, whether transiting or not. Errors from TTVs for specific systems (see additional discussion below) were corrected by adjusting the observation times based on a linear interpolation of the measured center-oftransit times to create an aligned ephemeris. We calculated the center-of-transit times for each observed transit by fitting two transit durations of Kepler photometric data centered on the predicted or precalculated time of each observed transit seeded with the best-fit transit model and only allowing the mid-transit time to vary. Biases in TTs can be introduced from overlapping transits, as the multiplanet models used for lightcurve preparation do not simultaneously fit the transit parameters and center-of-transit times.

<sup>&</sup>lt;sup>12</sup> Stellar parameters for KOI-1792 were chosen from Berger et al. (2020) despite the availability of CKS parameters for that target for reasons specified in Section 2.3.

We adopted the Markov Chains calculated for DR25, apart from KOI PCs with large impact parameters (b > 1) and a few other KOIs that required model updates. The DR25 Markov Chain Monte Carlo (MCMC) sampler assumed a noninformative prior for the impact parameter, which works well for nongrazing transits. However, when b > 1, the minimum value of the scaled planetary radius,  $R_{\rm p}/R_{\star}$ , required for a planetary transit grows linearly with b. Uniform sampling would result in a bias toward very large impact parameters, which are unphysical for planetary transits of stars. To sample correctly, a prior was introduced to disfavor large impact parameters by deweighting the model likelihood by  $b^2$  when  $b > 1 - R_p/R_{\star}$ , i.e., multiplying the prior by  $b^{-2}$  for such regions of parameter space and not allowing b > 10. We computed new MCMC models for all KOI PCs with b > 1 and used these models to calculate the values presented in Table 1. Some KOIs in our cumulative catalog required updated best-fit models and new MCMC runs to allow for sufficient sampling of low b parameter space. New models are presented for the following KOIs: 1681.02, 1681.03, 1681.04, 2092.03, 2398.01, 2474.01, 2578.01, 2604.01, 2695.01, 2775.01, 2919.01, 2933.01, 3013.01, 3130.01, 3384.01, 3572.01, 3853.01, 4007.01, 4034.02, 4035.01, 4056.01, 4345.01, 4498.01, 4528.01, 4625.01, 4632.01, 4670.01, 4743.01, 4778.01, 4782.02, 4838.02, 4886.01, 4890.01, 5804.01, 5831.01, 6103.02, 6941.01, and 7368.01, as well as for all of the new KOIs listed in Section 2.3.

The development of the Kepler catalog introduced a few quirks that biased some of the reported best-fit parameters. As the Kepler mission progressed, transit modeling techniques were improved and the methodology of reporting parameters changed, such as the choice of reporting either maximum likelihood versus mode or median from Markov Chains without much consistency between iterations. A more insidious consequence from model evolution were biases that resulted from how subsequent-generation models were initialized based on the ancestral adaptation of previous models as a reference starting point. Prior to the Mullally et al. (2015) catalog, each update introduced new models that incorporated new photometry, resulting in longer time-series observations that ideally should produce more accurate measurements of periods and transit depths and overall better fidelity. However, there are two identifiable deficiencies from this approach: a bias toward extreme values of impact parameter due to the nature of Kepler observations and excessive dependence on the average period measured up to the time that the KOI was initially announced when appreciable TTVs occur.

In general, impact parameters are not well measured for Kepler planets. This is due to the low S/N of a majority of Kepler discoveries and the long (30 minutes) cadence, which is comparable to the ingress and egress durations of the typical observed transit. Combined with a potentially simplistic limb-darkening model, it is common to see the posterior distribution of *b* from the transit model skew toward 0 or 1. From a probabilistic view, the data for most Kepler transits are insufficient to confidently distinguish a model with b = 0 from models with  $b \sim 0.5$ . The evolution of the Kepler models has meant that over time, a large number of models would always be initialized near the boundary of allowable values of *b*. Using least-squares methods such as Levenberg–Marquardt (e.g., More et al. 1980), which explores the local gradient of the model parameter value, can result in many models remaining



**Figure 2.** Comparison of the impact parameter (*b*) distributions for planet candidates from this work (orange) to the values listed for planet candidates in DR25 (green). Only planetary candidates with b < 1.2 are shown; PCs with b > 1.2 represent 0.5% of our sample and 1.4% of the DR25 PCs. Restricting the samples to those KOIs that are classified PCs in both catalogs does not substantially alter either of the distributions.

near b = 0 when initialized there. The solution to this problem is to recognize that distributions of model parameters are more robust when sampling from estimates of posteriors based on methods such as MCMC. For this paper, we explicitly note how all model parameters are reported in Section 2.5. Additional improvements may result from improved modeling of limb-darkening in future studies.

Figure 2 compares the impact distribution of PCs presented in Table 1 (orange) against that in DR25 (Thompson et al. 2018; green). The DR25 catalog shows a pronounced excess of model fits with  $b \sim 0$  and b > 1. Our efforts to reinitialize fits and include priors deweighting large impact parameters produce a distribution of impact parameters more consistent with an isotropic inclination distribution (Kipping & Sandford 2017), although there are still excess populations near b = 0 and for  $b \gtrsim 1$ .

As recognized by Newton (1687), the orbital period of a planet is, in general, not constant. The orbital periods observed by Kepler are the mean values that were observed during the four years of the primary mission, at least to a good approximation. In the case of systems with large TTVs that were discovered early in the mission, the evolution of the models can result in the period reported in catalogs published by the Kepler mission being only valid for the duration of data used for the initial discovery and characterization. This occurred because the transit models assumed a noninteracting Keplerian orbit. Transit timing variations were handled by explicitly measuring the TT of each individual event, then resampling the time stamps with linear interpolation based on the TT of each event to be aligned. Resampling used the observed-minus-calculated (O-C) values with the calculated TT based on the reported mean period from the best-fit model. As the transit models evolved with each new data release, the TTs and O - C values were measured based on the transit model from the previous catalog. The new TTs were incorporated and the model updated. Since the O - C values were fixed when the transit model parameters were updated, any significant change in the orbital period was captured in the O - C, not the reported transit model period. Our solution to this problem is to calculate the mean orbital period, as observed by Kepler, directly from a straightline fit to the measured times of each transit. An O - C diagram (O - C versus time) should have no significant slope. If a single



**Figure 3.** Median S/N for Kepler planet candidates as a function of location in the period–radius plane. Each square represents a factor of  $\approx 1.1$  in radius and  $\approx 1.2$  in period. The left panel shows the total S/N, and the right panel shows the average (mean) S/N per transit. The average S/N was calculated by dividing the total S/N by the square root of the number of observed transits for each planet candidate. Note the differences between the color scales of the two panels. The number of planets represented in each colored square ranges from 1 to 32.

planet demonstrated clear TTVs, then TTVs were typically calculated and included for all planets in the system. See Section 2.5 for an explicit description of how each model parameter is reported, Section 2.4 for extended discussion of orbital periods during the Kepler epoch, and Section 4 for an analysis of period variations over longer timescales.

Transit timing variations are commonly observed when two or more planets interact dynamically (Agol et al. 2005; Holman & Murray 2005). Other potential causes of TTVs include stellar binarity and astrophysical effects such as activity and starspots. (The latter two processes do not cause variations in the actual times of transit, but their observational signals can mimic TTVs.) The process by which TTVs have been accounted for in previous catalogs was inhomogeneous and overall ad hoc. The primary criterion for selecting the solution with TTVs included was either the visual identification of TTVs from examination of O - C diagrams or the inclusion of specific KOIs for the detailed study of individual systems. For example, KOI-8298.01 is reported to use TTVs in the model but has a period of less than 0.2 days. The model with TTVs shows a significantly deeper transit, hence the inclusion of TTVs. However, this may indicate either that KOI-8298.01 is not a transiting planet (e.g., a manifestation of stellar variability) or that the apparent times of transit are significantly affected by spot crossings. Thus, the TTV flag is not a definitive indication of whether or not TTVs are present and should not be used as evidence for the validity of a KOI being a true planet. The first digit of the TTV flag merely reports which KOIs have transit models that include TTVs, and the second and third digits pull tabulations from the published TTV catalogs of Holczer et al. (2016) and Kane et al. (2013), respectively. These external catalogs provide excellent assessments of TTVs for most KOIs.

The S/N of the sum of all observed transits was calculated via

$$S/N = \sqrt{\sum_{i=1}^{n} \left(\frac{m_i - 1}{\sigma_i}\right)^2},$$
(1)

where  $m_i$  is the calculated flux from the fitted transit model at each observation *i* with a total of *n* observations, and  $\sigma_i$  is the

standard deviation of the photometric time series data near the time of the  $i^{th}$  transit based on out-of-transit observations using detrended PDC photometry with outliers removed. The model is scaled to have the out-of-transit flux equal to unity. Figure 3 shows the complex dependence of the S/N of the population of exoplanet transit signatures on planetary radius and orbital period. The trends in S/N are further discussed in Section 2.5.

Figure 4 compares the mean stellar density based on input stellar parameters to the mean stellar density calculated from our circular orbit transit models. Colors denote the source of the adopted stellar parameters. The left panel shows the complete sample. The right panel shows only PCs with reasonably high values of S/Ns, nongrazing transits, and well-measured  $\rho_{\star c}$ . The distribution is clearly skewed such that the mean stellar density estimated by fitting the lightcurve and assuming circular orbits is generally larger than that from stellar parameter tables. This trend is expected because detection bias favors planets that transit near the periastron of their orbits. A simple application of Kepler's second law dictates that for a given impact parameter, transits observed near periastron are shorter than predicted from a circular orbit, and impact parameters should be roughly uniformly distributed for b < 1. The distribution is also biased by impact parameter and dilution (see Section 6.2 of Rowe & Thompson 2015).

A visual examination of the right panel in Figure 4 appears to shows a bias in  $\rho_{\star}$  between the CKS (Fulton & Petigura 2018) and Berger et al. (2020) samples. It is important to note that our stellar parameters give preference to CKS, then Berger et al. (2020), and use those of DR25 only for targets not appearing in either of the preferred catalogs. The CKS sample was skewed toward the inclusion of multiplanet systems. As shown in Section 3.5, planets in compact multiplanet systems tend to have more circular orbits (Figures 20 and 23). Thus, the observed bias is a selection effect. Figure 17 shows that the measured transit duration distributions do not depend on the choice of stellar parameter catalog in any systematic manner. The vertical blue error bars tend to be large because of the high uncertainties in DR25 stellar parameters. These stars were not



Figure 4. Comparison of the mean stellar density from our circular orbit transit models ( $\rho_{*c}$ ) to the mean stellar density from our adopted stellar parameters ( $\rho_*$ ). The red diagonal line is for  $\rho_* = \rho_{*c}$ , and the two parallel darker red lines show a bias of 10% in  $\rho_*$ . The colors of the plotted data points note the source of the stellar parameter: blue = DR25 (Thompson et al. 2018), green = Berger et al. (2020), and orange = CKS (Fulton & Petigura 2018). The left panel shows all planetary candidates from our sample with 0.1 g cm<sup>-3</sup> <  $\rho_*$  < 10 g cm<sup>-3</sup>. The right panel is restricted to planetary candidates that have S/N > 10, b < 0.9, and uncertainty (average of  $\sigma_+(\rho_{*c})$  and  $\sigma_-(\rho_{*c})$ ) of less than 20%. Uncertainties are half-widths of the 68.27% credible interval ( $\pm 1\sigma$ ).

characterized in Gaia DR2 or CKS, which suggests that they may have strong stellar blends or other observational challenges. This also explains the larger scatter of the blue points relative to the middle diagonal line.

#### 2.3. Planet Candidate Selection

We pulled planet candidates from a variety of sources, including 9564 KOIs from the cumulative DR25 supplement catalog<sup>13</sup>; ultrashort-period (USP) planets from Sanchis-Ojeda et al. (2014); long-period ( $P \gtrsim 1$  yr) and transit candidates only observed to transit once, which we refer to as monotransits, from Kawahara & Masuda (2019); the autoregressive planet search from Caceres et al. (2019); PCs from the machinelearning search by Shallue & Vanderburg (2018) that sought additional planet candidates around targets already having two or more PCs; and low-S/N candidates found by revisiting marginal TCEs (Bryson et al. 2021). The inclusion of new catalogs and discoveries yields new KOIs: KOI-1843.03 and 8298-8303 are USP planet candidates (including the three shortest-period PCs in our catalog) from Sanchis-Ojeda et al. (2014); KOI-8304-8335, 1108.04, 4307.02, 408.06, 2525.02, 847.02, 671.05, 3349.02, 693.03, 7194.02, and 1870.02 are long-period planet candidates; KOI-500.06, 351.08, 691.03, 354.03, 191.05, 1165.03, 2248.05, 542.03, 1589.06, 2193.03, 1240.03, 1992.04, 1276.03, 416.05, 1889.03, 4772.04, 2433.08, and 597.04 are from Shallue & Vanderburg (2018)<sup>14</sup>; and KOI-4246.03, 4302.02, 8336.01, 8337.01, and 8338.01 are from Bryson et al. (2021).

Finally, KOI-8339–8394, the majority of which we have dispositioned as false positives/false alarms because their S/N < 7.1, are from Caceres et al. (2019). There are

30 potential candidates from Table 5 of Caceres et al. (2019) not included, as we were unable to compute a best-fit model based on the predicted ephemeris. Table 5 of Caceres et al. (2019) also lists 11 identifications around targets with preexisting KOIs, including 8302.01 from Sanchis-Ojeda et al. (2014), that are already in our table, some of which are discussed below because we corrected their periods to the values given in Caceres et al. (2019).

We provide new transit models and parameter posteriors for these new KOIs using the same models and methodology presented in Section 2.2. We corrected the period of KOI-1353.03 (Kepler-289d) to match the reported value in Schmitt et al. (2014) rather than that in the DR25 catalog because the latter was the result of an aliasing problem. One of our new long-period PCs, KOI-3349.02, was previously only observed to transit once (Kawahara & Masuda 2019 and references therein), but we located a second, nearly identical transit in the simple aperture photometry (SAP) lightcurve, showing that it is a duotransit (only two transits observed) planet with P = 805 days.

We revisited the dispositions of KOIs that have Kepler numbers but were classified as FPs in DR25supp. Since there is no peer-reviewed source for the reasoning leading to the dispositions, we do not know whether or not additional observations beyond Kepler photometry and centroids were used. Based on our assessment of TCERT data validation reports downloaded from the NASA Exoplanet Archive, we reverted the following KOIs from FP disposition to PC: KOI-125.01, 129.01 (but see below), 631.01, 3138.02, and 3184.02. DR25supp listed these KOIs as showing evidence of stellar eclipses; however, we found no evidence of a secondary eclipse in the photometry lightcurve, either directly or through measurement of an odd–even effect.

We confirmed that the following KOIs with Kepler numbers are indeed false positives: KOI-3032.01, 126.01 (see Carter et al. 2011), 1416.01, and 1450.01. Their photometric lightcurves show clear evidence of secondary eclipses that are indicative of stellar companions. Despite an analysis of

<sup>&</sup>lt;sup>13</sup> Retrieved from the NASA Exoplanet Archive on 2022 October 27.

<sup>&</sup>lt;sup>14</sup> We classified 2061.03 from the machine-learning search as an FP because we recognized that it resulted from poor masking of 2061.01, due to large TTVs. We did this by using a quasiperiodic automated transit search (Carter & Agol 2013), determining an approximate ephemeris of  $T_n$ [BJD] = 2454949.27 +  $n \times 14.097 + 0.12 \times \cos(2\pi/P_{ttv}(t - 2455154))$ , where  $P_{ttv} = 1160$  days.

putative TTVs by Hadden & Lithwick (2014), Kepler-37e (KOI-245.04) is a false alarm that was never validated (Barclay et al. 2013).

Table 7 of Carmichael et al. (2019) lists five KOIs, all of which are listed as PCs in DR25supp and three of which have been given Kepler numbers, as having measured masses above the planet/brown dwarf dividing line (see also Carmichael 2023). We have reclassified as false positives all five of these KOIs: KOI-423.01 = Kepler-39 b, KOI-189.01 = Kepler-486 b, KOI-205.01 = Kepler-492 b, KOI-415.01, and KOI-607.01. Note that Kepler-39 b has a mass of ~20  $M_{Jupiter}$ , whereas the others have masses of  $\gtrsim 40 M_{Jupiter}$ .

Santerne et al. (2016) analyze RV measurements of more than 100 KOIs that were listed as giant planet candidates in one or more of the Kepler project's catalogs. They present convincing evidence that the following five KOIs, which we would have otherwise classified as planet candidates, are produced by eclipsing binary stars: 129.01, 969.01, 1465.01, 1784.01, and 3787.01. Furthermore, the following three KOIs, which we would have classified as planet candidates had they not failed our upper size limits, are also produced by eclipsing binary stars: 3411.01, 3811.01, and 5745.01. Table 1 dispositions the 13 KOIs listed in this and the previous paragraph with the letter "M" to distinguish them from other false positives.

We undertook a photometric analysis of new candidates presented in Table 5 of Caceres et al. (2019) to assign dispositions based solely on Kepler photometry. Photometry was processed in a manner similar to DR25 (Thompson et al. 2018) by detrending the data with a second-order Savitzky-Golay filter. Data in the transit window as predicted from the reported transit duration, period, and center-of-transit time were excluded from polynomial fits. This means that we did not complete an exhaustive test against false alarms due to in-phase periodicity (e.g., a depth test as described in Coughlin et al. 2016 for uniqueness). We attempted to compute best-fit transit models through  $\chi^2$  minimization. For 33 of the 86 proposed new candidates, the model either failed to converge or returned a fit consistent with a flat line. In these cases, we then ran a box least-squares (BLS; see Kovács et al. 2002) search restricted to  $\pm 0.1$  days around the reported period, which allowed us to recover three of them. As we could not find evidence of the remaining 30 proposed PCs, we do not include them in our KOI table. The ephemerides reported in Caceres et al. (2019) are only accurate to one Kepler long cadence (~30 minutes), which, combined with uncertainties in the reported period and barycentric drift, may result in poor recovery with our methods. If the BLS search found a candidate event with P within 0.01 days of the reported event, we adopted the period and center-of-transit times from our localized search. Thus, there is risk that we have not recovered all events as previously reported. With best-fit models, we ran our MCMC algorithm to compute posteriors. All new candidates from this activity that had an S/N determined by our transit models to be less than 7.1 have been flagged as false positives in Table 1. The S/Nreported in Table 5 of Caceres et al. (2019) is a detection statistic that appears to not be strongly related to the folded transit S/N that we report (see Equation (1) above). We did not assess the photometric centroids for this sample; however, we noted that there is a substantial mismatch when comparing  $\rho_{\star c}$  from our transit models to  $\rho_{\star}$  from stellar properties catalogs

for KOI-8345.01 and KOI-8366.01, and for this reason, we have flagged these two KOIs as false positives.

We investigated several cases in which the Caceres et al. (2019) table listed signals around existing KOIs with periods that are a small integer multiple or fraction of those listed in DR25supp. This investigation led us to revise the orbital periods of two PCs downward by a factor of 2, KOI-6262.01 from P = 0.673 to 0.3365 days and KOI-4777.01 (which was independently identified with the correct period by Cañas et al. 2022) from P = 0.824 to 0.412 days. Additionally, we revised the periods of FPs (both of which were previously identified as having centroid offsets) KOI-4305.01 (from 0.935 to 0.234 days) and KOI-4872.01 (from 1.035 to 0.207 days). Reported detections for KOI-6749, KOI-6984, KOI-2431, KOI-4788, and KOI-2642 are the secondaries; these targets are already FPs.

KOIs have been vetted into new categories using several criteria. Nonetheless, the vast majority of KOIs are dispositioned as one of the two categories: planetary candidates (PCs) and false positives (FPs, which here, as in previous catalogs, include false alarms). False positives are defined as transit-like astrophysical events that are not produced by a planet. Eclipsing binaries are the primary source of false positives. False alarms are spurious detections caused by features in the target star's lightcurve that are not transit-like. False alarms can be caused by stellar variability and/or instrumental systematics. We provide additional vetting criteria based on S/N and planetary radius. A description of all vetting flags is presented in Section 2.5.

Initial FP and PC classification is adopted from the DR25 and DR25supp catalogs. DR25supp is represented by the cumulative catalog from the NASA Exoplanet Archive retrieved on 2022 October 27. If vetting classification is not available in either DR25 or DR25supp, we use DR24 (Coughlin et al. 2016), which includes KOIs from previous searches that were not seen in the TCE search conducted for DR24.

Consistent with previous Kepler catalogs, we generally require a total transit  $S/N \ge 7.1$  for a KOI to be considered a PC; KOIs below this threshold are considered false alarms. We allowed four exceptions to this rule, KOI-2022.02 = Kepler-349 c, KOI-2034.02 = Kepler-1065 c, KOI-4024.01 = Kepler-1541 b, and KOI-7368.01 = Kepler-1974 b, all of which have been validated as planets and passed our visual inspection—which revealed marginal evidence of a visible transit event in their lightcurves.

The  $S/N \ge 7.1$  criterion was based on limiting the number of false alarms considered to be PCs to one in the 90 day–2 yr period range per 10<sup>5</sup> stars searched the Kepler sample in the presence of white noise on 6 hr timescales. However, much of the noise in the Kepler lightcurves is correlated, so multiple false alarms become problematic for S/Ns in the range of  $10 \ge S/N \ge 7.1$ , as has been verified through injection tests and reliability studies (Thompson et al. 2018; Hsu et al. 2021). Moreover, low-S/N KOIs do not have sufficient signals to allow for precise centroiding and other vetting procedures used to distinguish astrophysical signals such as eclipsing binaries from transiting planets. Therefore, higher-S/N cuts are needed to obtain the purer (higher-confidence) samples of PCs that are required for some studies, including most of our analyses of the characteristics of the population of Kepler's planet candidates.

Some KOIs have all transit model parameter uncertainties listed as zero. This indicates that the MCMC computations did not converge. This can happen when the S/N of a transit event is low, or the event is non-transit-like in shape. While we did not consider MCMC convergence when assigning PC or FP (P or F) dispositions, there is a high probability that these KOIs are indeed false alarms. There are 220 KOIs flagged as "P" or "S" without MCMC computed posteriors; 24 are members of candidate multiplanet systems, and a total of 26 are PCs, 14 of which have an S/N > 10.

There is increasing degeneracy when distinguishing between ultracool stars, brown dwarfs, and planets for transiting objects with radii approaching the size of Jupiter that lack mass information. We have flagged KOIs with estimated planetary radii  $R_p > 21.947 \ R_{\oplus} \approx 2 \ R_{\text{Jupiter}}$ , as well as KOIs with period P > 20 days and a  $1\sigma$  lower limit for the planetary radii  $R_p$  that exceed 13.17  $R_{\oplus} \approx 1.2 R_{\text{Jupiter}}$ , as likely FPs, but as these boundaries are not precisely defined, KOIs that pass all criteria for being classified as PC apart from size are given the disposition "R." The following KOIs have Kepler numbers but radii that exceeded our limit on planetary size using nominal stellar parameters: KOI-846.01, 855.01, and 1792.01. There is no strong evidence from Kepler photometry or in the literature that contradicts their status as confirmed planets. Thus, no change in their disposition as PCs is warranted based on our study. The radius of the star KOI-1792 estimated by Fulton & Petigura (2018) is almost three times as large as that estimated by Berger et al. (2020); the former leads to a radius estimate for KOI-1792.01 of  $R_p = 31.1 R_{\oplus}$ , so we used the Berger et al. (2020) parameters for this star. The other two cases both appear to be evolved stars (KOI-846 being slightly evolved, whereas KOI-854 is a giant), whose radii are difficult to estimate, so we suspect that the stellar radii have been overestimated, but in these cases, we only have one Gaia-constrained radius estimate (from Berger et al. 2020), so we retained the probably overestimated nominal values of  $R_{\star}$  and  $R_{p}$ .

We give new KOIs dispositions based on an assessment of the photometric transit. All new KOIs are assigned a PC status unless they failed to meet our S/N, radius cuts, or visual inspection. Visual inspection includes a determination of whether the observed transit duration is in very rough agreement with the stellar parameters and the phased lightcurve has a transit-like shape. We did not attempt to measure photometric centroids; thus, it is possible that many of the new short-period KOIs from the Caceres et al. (2019) sample (8339–8394) may be background binary blends. As most of the orbital periods from this sample are relatively short, there is a reasonable expectation that the modeled mean stellar density should match stellar tables because the orbits should be nearly circular. For example, KOI-8386.01 is likely a background binary due to the significant order-of-magnitude mismatch in the transit duration and stellar classification, but we nonetheless dispositioned it as a PC, as we have not conducted an analysis of photometric crowding or photometric centroid shift during the transit event. None of the KOIs from the Caceres et al. (2019) sample failed the radius cuts, so all were dispositioned as either "S" (36 cases), "P" (18 cases), or "F" (two cases that were discarded based upon visual inspection of the lightcurve); only five of the PCs have S/N > 12, and only one has S/N > 14.

We visually reexamined the KOIs that were classified as PCs in either DR24 or DR25 but subsequently classified as FPs in DR25supp. Based on our analysis, we reverted the following KOIs back to PCs: 82.06, 198.01, 1693.01, 1796.01, 1902.01,

2306.01, and 2307.01. These KOIs do not exhibit measurable centroid shifts from examination of DR25 or DR25supp vetting reports and show visually identifiable transits that can be modeled with MCMC that meet convergence criteria.

### 2.4. Orbital Periods during the Kepler Epoch

The orbital periods listed in Table 1 are estimated by fitting the Kepler lightcurve assuming a Keplerian, noninteracting orbit and using a limb-darkened transit model. As such, we are estimating something akin to the planet's mean period over the interval of Kepler observations.

Transit times are the measure of when mid-transit occurs. We define the mid-transit as when the projected distance between the center of the star and the planet is minimized. For a circular orbit, this is equivalent to when the transit model is deepest. We measure TTs and then report TTVs relative to the orbital period and reference time. The latter has typically been the first or mid-observation transit. The transit model is used as a template to measure the center-of-transit time for each transit, and the transit model orbital period from the initial fit is used to calculate the difference between the observed transit and the calculated transit (O - C). If TTVs are present, then the transit model is updated by *deTTVing* the lightcurve, whereby the time stamps from Kepler observations are adjusted to have all transits aligned. Time-stamp adjustments use a linear interpolation based on the O - C TTs such that the new time stamps have an effective O - C of zero. A new transit model is then fit to the data with updated time stamps.

If TTVs are not properly accounted for, the ingress and egress of sequential transits become misaligned, leading to errors in the reported characteristics of the transit, especially the transit's duration, depth, and impact parameter. Since the scaled planetary radius  $(R_p/R_{\star})$  and transit model mean that stellar density  $(\rho_{\star c})$  is correlated with the impact parameter (b) due to geometry and stellar limb-darkening, those parameters also have increased errors. The models based on deTTVed lightcurves better estimate the transit shape, often leading to substantially improved estimates of the abovementioned parameters, especially for *b* and  $R_p/R_{\star}$ . However, this process previously led to errors in the reported period that were not accounted for in estimates of period uncertainties.

Transit timing variations are calculated independent of the fitted transit model, and, when possible, initial TTVs were adopted from previous catalogs. Examples where the period reported in previous catalogs is significantly different from the observed mean period (averaged over the time interval during which transits were observed by Kepler) include KOI-142.01 (Kepler-88b) and KOI-377.01 and .02 (Kepler-9b and c). Early KOI catalogs used only a few quarters of observations, and the mean period over that time frame differed significantly from estimates using the entire Kepler observational baseline. The model parameters for each previous catalog were used as a seed for the updated model. Thus, the period from a previous catalog was used as the seed for the best fit in the subsequent catalog in which it appears. If additional TTVs (O - C) were measured, the mean period from a previous catalog was held fixed before the new model fit was made. In some cases, the previously reported period did not represent the true mean period in the presence of strong TTVs.

For the catalog presented herein, the mean observed period from Kepler observations is of interest, as it is the best approximation to the long-term mean period that can be straightforwardly estimated for all KOIs apart from those that only transited once (monotransits). The value of *P* is calculated by applying a correction to the best-fit period,  $P_{\rm bf}$ , from the transit models. For each KOI with four or more measured TTs, a straight-line model is fit to the O - C versus observed (O) values using standard least-squares minimization weighted by measurement uncertainties in O - C values. The slope, *m*, from the fit gives the correction, with

$$P = P_{\rm bf}(1+m).$$
 (2)

We report *P* and propagate the uncertainty in *m* to compute the orbital period uncertainty thereof for all KOIs in Table 1. The measured O - C values are based on  $P_{\rm bf}$ ; thus, any nonzero slope indicates that  $P_{\rm bf}$  does not represent the mean period. This correction specifically addresses the issue of incorrect periods for planets in systems such as Kepler-9 and Kepler-88. For non-TTV planets, there is good agreement between  $P_{\rm bf}$  and *P*. If a planet has just two or three observed transits, we adopt *P* from  $P_{\rm bf}$ . To avoid additional inhomogeneities in our catalog, only *P* is reported.

The incorporation of TTVs in orbital period calculations, as described above, yields more robust estimates of orbital periods of planets with observed TTVs than provided by previous catalogs. For most KOIs, no TTVs are detected, and the revised period is statistically similar to the reported period from DR25. However, there are extreme examples, such as Kepler-9 b and c and Kepler-88 b, where the period changes significantly ( $\sim$ 1 hr) relative to the DR25 catalog. Overall, the distribution of fractional changes in period ratio is non-Gaussian, with substantially larger numbers in the tails of the distribution.

However, we account for TTVs only to the extent that they average out over the time in which Kepler observed the planets to transit. Typically, this cancellation is incomplete for planets with observed TTVs. The periods and uncertainties quoted in Table 1 thus do not account for TTVs that have periodicities that are long compared to the Kepler observations and do not fully account for TTVs with periodicities comparable to the amount of time between Kepler's first and last observations of transits of a particular planet. Some types of TTVs are of very small amplitude over 4 yr (and thus unlikely to have been detected) but grow to become substantially larger on timescales of decades to centuries, affecting the long-term mean orbital period. These differences in orbital period are important for understanding three-body resonances and producing ephemerides that are accurate far into the future. We discuss these issues in more detail in Section 4.

We searched the lightcurves of the 10 duotransit PCs with P > 730 days to determine whether or not there are Kepler data that can exclude the possibility that additional transit(s) were missed because they occurred during a data gap(s) and the actual period of the planet is either half or one-third of the reported value. Data points with SAP\_QUALITY equal to 16 or greater were excluded from the examined lightcurves. The period of KOI-375.01 (=Kepler-1704 b) could, indeed, be half of the reported value of 988.9 days, but Kepler data exclude the possibility of any of the other nine PCs having periods equal to half or one-third of the values listed in Table 1.

# 2.5. Unified Planet Candidate Catalog

Our catalog of Kepler planet candidates is presented in Table 1. We list, from left to right, catalog numbers of the

 Table 2

 Adopted Astrophysical Constants for Derived Planetary Parameters

Name	Value	Units
$R_{\odot}$	$6.957 \times 10^{8}$	m
$R_{\oplus}$	$6.371 \times 10^{6}$	m
G	$6.674  imes 10^{-11}$	$m^3 kg^{-1} s^{-2}$
au	$1.4956 \times 10^{11}$	m
$T_{\rm eff,\odot}$	5778	K

**Note.** The mean radii of the Sun  $(R_{\odot})$  and Earth  $(R_{\oplus})$ , the gravitational constant (G), the astronomical unit (au), and the solar effective temperature  $(T_{\text{eff},\odot})$  are used to calculate absolute planetary radii, orbital inclinations, and incident flux.

target star and planet (columns (1)–(3)), fundamental transit model parameters (columns (4)–(19)), properties derived from the transit model and Kepler photometry (columns (20)–(38)), parameters that depend on the transit model and stellar parameters (columns (39)–(44)), stellar parameters (columns (45)–(62)),<sup>15</sup> and vetting dispositions (column (63)). Data in columns (64)–(85) list the same properties as provided in columns (39)–(44) and (46)–(61) with stellar parameters taken from Berger et al. (2020); these columns are left blank if the properties of the target star are not given by Berger et al. (2020).

Table 2 presents our adopted values for astrophysical constants. The mean radii of the Sun  $(R_{\odot})$  and Earth  $(R_{\oplus})$  are used to calculate the absolute radii of planets  $(R_p)$  and incident flux, *S*, normalized to that of the Earth. The gravitational constant (G) is used to calculate transit durations, the scaled semimajor axis  $(a/R_{\star})$  from the mean stellar density  $(\rho_{\star c})$ , and orbital inclination (*i*). The astronomical unit (au) and solar effective temperature  $T_{\text{eff},\odot}$  are used in the calculation of the flux incident upon Earth,  $S_{\oplus}$ .

For many properties, we report the location of the maximum posterior density and give additional information about the uncertainty. For some properties, these uncertainties are typically well described by a symmetric distribution, so we report the half-width of the 68.27% credible interval, assuming a symmetric distribution. For other properties, the posterior distribution is often significantly asymmetric, so we report separate uncertainties in the positive and negative directions based on the 68.27% credible interval that minimizes the width of the marginal distribution for that parameter. The units for all uncertainties are the same as for the quantities themselves.

Overall, we have updated transit models for more than 1000 KOI systems. Included among these are 121 KOIs that previously had unreasonably large impact parameters. We have updated the dispositions of 11 KOIs from FP to PC and six KOIs from PC to FP. We flagged 361 cases with very weak S/N transit signals as likely false alarms, 100 KOIs with large planet radii that may be due to stellar binaries, and 13 KOIs that previously had a PC flag that now have a mass measurement inconsistent with the exoplanet hypothesis.

We determine the following transit parameters and their uncertainties by fitting the transit models of Mandel & Agol (2002) to Kepler lightcurves assuming circular orbits (and adjusted for TTVs if TTVflag = 1): mean stellar density,  $\rho_{\star c}$ ; orbital period, *P*; impact parameter, *b*; and scaled radius,

 $<sup>\</sup>frac{15}{15}$  Columns (14)–(16) list stellar parameters derived from the transit model. Data in column (45) are taken from DR25. Data in columns (46)–(61) are taken from the source specified in column (62).

 $R_{\rm p}/R_{\star}$ . Limb-darkening coefficients are held fixed. The transit model is used calculate the depth of transit,  $d_{\rm transit}$ , and the S/N. The fitted transit model parameters, together with Equations (2) and (3) from Seager & Mallén-Ornelas (2003), are used to calculate the transit duration measured from first to fourth contact,  $T_{\rm dur}$ , and an alternate measure of transit duration (see items 24–27 in the numbered list below for details). Planetary inclinations are calculated using the formula

$$i = \arccos\left(b\frac{R_{\star}}{a}\right). \tag{3}$$

- 1. KIC. The Kepler input catalog number of the target star.
- 2. *KOI*. The Kepler object of interest number, with the integer portion referring to the target star (source of light) and the decimal portion referring to the particular signal, i.e., the putative planet's transits.
- 3. *Kepler ID*. The number and letter assigned to verified planets. It is blank if the KOI has not been assigned a Kepler planet number/letter. Kepler IDs do not automatically qualify a KOI to be dispositioned a PC (see Section 2.3) and are supplied for cross-identification purposes only.
- 4. *Period*, *P* [days]. Mean orbital period (the period that gives the best fit to the observed TTs). For candidates with only one transit observed, the period is estimated based on transit duration and impact parameter, assuming a circular orbit, and given as a negative value to distinguish it from periods computed for multiple-transit objects. Note that monotransit planet candidates (those observed to transit just once) are not included in any of our analyses, figures, or tabulations that require knowledge of the orbital period but are accounted for in assessing the multiplicity of planetary systems in all cases apart from the analysis presented in Section 3.5.
- 5.  $\sigma(P)$ . Uncertainty (half-width of 68.27% confidence interval for the average period during the epoch of Kepler observations) of *P*. See discussion in Section 2.4. It is based on the uncertainty in the fitted slope of the measured TTs. As discussed in the second and third paragraphs of Section 4, the actual mean orbital periods of Kepler planets over timescales much longer than the 4 yr of Kepler observations can differ from the values given in Table 1 by many times as much as the listed uncertainties. The reported periods and uncertainties for monotransit candidates assume circular orbits and are considered unreliable.
- 6. *Epoch*, T0 [BJD-2454900]. Time, calculated using the constant period reported in column (4), at which the center of the planetary disk is closest to the center of the stellar disk for the last transit that occurred prior to halfway between the start of the first quarter and the end of the final quarter that Kepler observed the target star in question, whether or not said transit was actually observed by Kepler. This is the mode value from MCMC, calculated using the SciPy kernel density estimator stats.gaussian\_kde with default settings (Virtanen et al. 2020). BJD  $\equiv$  Julian Date viewed from the barycenter of the solar system.
- 7.  $\sigma$ (T0). Uncertainty in the epoch.

- 8. *Planet/star radius ratio*,  $R_p/R_{\star}$ . The mode value from MCMC of the ratio of the planet's radius to the stellar radius.
- 9.  $\sigma_+(R_p/R_{\star})$ . Upward (to higher values) uncertainty of the ratio of the planet's radius to stellar radius.
- 10.  $\sigma_{-}(R_{p}/R_{\star})$ . Downward uncertainty of the ratio of the planet's radius to stellar radius.
- 11. *Impact parameter*, *b*. We report the best-fit value. See Section 2.2.
- 12.  $\sigma_+(b)$ . Upward uncertainty of *b*.
- 13.  $\sigma_{-}(b)$ . Downward uncertainty of *b*.
- 14. Stellar density from lightcurve,  $\rho_{\star c} [g \text{ cm}^{-3}]$ . The mean stellar density computed from the photometric model. A circular orbit model has been assumed, and a separate fit is done for each planet in a multi. This is the mode value from MCMC.
- 15.  $\sigma_+(\rho_{\star c})$ . Upward uncertainty of  $\rho_{\star c}$ .
- 16.  $\sigma_{-}(\rho_{\star c})$ . Downward uncertainty of  $\rho_{\star c}$ .
- 17.  $u_1$ . First quadratic limb-darkening parameter.
- 18. *u*<sub>2</sub>. Second quadratic limb-darkening parameter.
- 19. *TTV flag.* A three-digit number preceded by "T" representing the results of three separate searches for TTVs. The first digit is 1 if TTVs have been included in our transit model and 0 otherwise. The second digit refers to results listed in Holczer et al.'s (2016) catalog, with 2 signifying sinusoidal TTVs, 1 polynomial TTVs, and 0 no TTVs found, and a dash means not investigated. The third digit is the overall rating from Kane et al.'s (2013) catalog, with 9 signifying the strongest TTVs, 8 strong TTVs, 7 weak and/or noisy TTVs, and 6 and below no TTVs of interest; we use a dash for KOIs not rated by Kane et al. (2013).
- 20. # transits. Total number of transits observed by Kepler.
- 21. # *TTs*. Number of transits for which the transit time has been measured. This number is always  $\leq$  the number in the previous column.
- 22. *d*<sub>transit</sub> [ppm]. Depth of transit. Specifically, it is the depth of the transit model evaluated at the mid-transit time assuming a circular orbit. We report the mode of the MCMC distribution.
- 23.  $\sigma(d_{\text{transit}})$ . Uncertainty of  $d_{\text{transit}}$ .
- 24. *Transit duration*,  $T_{dur}$  (hr). Transit duration, measured from first to fourth contact ( $T_{dur} \equiv T_{1,4}$ ), which is the standard measurement for exoplanet transit duration. It is based on transit model parameters ( $\rho_{\star c}$ , P,  $R_p/R_{\star}$ , b) using Equation (3) of Seager & Mallén-Ornelas (2003). The mode of the MCMC distribution is reported.
- 25.  $\sigma(T_{dur})$ . Uncertainty of  $T_{dur}$ .
- 26. Alternate measure of transit duration,  $T_{1.5,3.5}$  (hr). Mode of  $(T_{1,4} + T_{2,3})/2$ .  $T_{2,3}$  uses Equation (1) from Seager & Mallén-Ornelas (2003). If  $b > 1 (R_p/R_\star)$ , then  $T_{2,3}$  is set to 0. Note  $T_{dur} > T_{1.5,3.5} \ge 0.5 T_{dur}$ .
- 27.  $\sigma(T_{1.5,3.5})$ . Uncertainty of  $T_{1.5,3.5}$ .
- 28. *S/N*. The ratio of the signal, S, which is the integral of the transit model over all transits, to the noise, N, estimated as the standard deviation of the photometric lightcurve out of transit. It is calculated assuming a constant period if TTVflag = 0 and incorporating TTVs if the first digit of the TTVflag = 1.  $S/N \ge 7.1$  is generally necessary (but not sufficient) for a KOI to be dispositioned as a PC in our catalog. Four exceptions to this general requirement

are made for KOIs with Kepler numbers whose lightcurves also passed our visual inspection (see Section 2.3).

- 29. *MES*. Multiple event statistic, as reported in DR25. KOIs that were not listed in DR25 have 0.0 listed in this column.
- 30. Improvement in S/N when transit model allows for TTVs. S/NwTTV–S/NwoTTV. Difference in S/N calculated without TTVs and with TTVs (e.g., Ofir et al. 2018). It is positive for most KOIs, and it is typically large when the preferred fit uses TTVs (since less out-of-transit data obfuscates the signal) and small when it does not.
- 31.  $\chi^2_{\text{wttv}}$ . Chi-squared calculated with TTVs based on the best-fit transit model. If the first digit of TTVflag = 0, then photometric uncertainties have been scaled to have  $\chi^2_{\text{wottv}}$  = degrees of freedom (DOF). If the first digit of TTVflag = 1, then photometric uncertainties have been scaled to have  $\chi^2_{\text{wttv}}$  = DOF.
- 32.  $\chi^2_{\text{wottv}}$ . Chi-squared calculated without TTVs. The values are normalized as for  $\chi^2_{\text{wttv}}$ .
- 33. Scaled semimajor axis,  $a/R_{\star}$ . Scaled semimajor axis.
- 34.  $\sigma_+(a/R_*)$ . Upward uncertainty of the scaled semimajor axis.
- 35.  $\sigma_{-}(a/R_{\star})$ . Downward uncertainty of the scaled semimajor axis.
- 36. *Inclination*, *i* [deg]. Inclination of the planet's orbit relative to the plane of the sky; an edge-on orbit has  $i = 90^{\circ}$ .
- 37.  $\sigma_+(i)$ . Upward uncertainty of the inclination. Note that  $i + \sigma_+(i) \leq 90^\circ$ .
- 38.  $\sigma_{-}(i)$ . Downward uncertainty of the inclination.
- 39. Planet radius,  $R_p$  [ $R_{\oplus}$ ]. Radius of the planet.
- 40.  $\sigma_+(R_p)$ . Upward uncertainty of  $R_p$ .
- 41.  $\sigma_{-}(R_p)$ . Downward uncertainty of  $R_p$ .
- 42. (Bolometric) incident flux, S  $[S_{\oplus}]$ . Amount of flux intercepted by the planet relative to that intercepted by the Earth.
- 43.  $\sigma_+(S)$ . Upward uncertainty of incident flux.
- 44.  $\sigma_{-}(S)$ . Downward uncertainty of incident flux.
- 45. Kepmag. Target star magnitude in the Kepler passband.
- 46. Stellar density,  $\rho_{\star}$  [g cm<sup>-3</sup>]. The mean stellar density from the stellar parameter tables (not the estimate derived from the transit model, which is given in column (14)).
- 47.  $\sigma_+(\rho_{\star})$ . Upward uncertainty of  $\rho_{\star}$ .
- 48.  $\sigma_{-}(\rho_{\star})$ . Downward uncertainty of  $\rho_{\star}$ .
- 49. Stellar temperature,  $T_{\rm eff}$  [K]. The target star's effective temperature, taken from the stellar properties catalog.
- 50.  $\sigma(T_{\rm eff})$ . Uncertainty of  $T_{\rm eff}$ .
- 51. *Stellar radius*,  $R_{\star}$  [ $R_{\odot}$ ]. Radius of the star as given in the stellar properties catalog.
- 52.  $\sigma_+(R_{\star})$ . Upward uncertainty of  $R_{\star}$ .
- 53.  $\sigma_{-}(R_{\star})$ . Downward uncertainty of  $R_{\star}$ .
- 54. Stellar mass,  $M_{\star}$  [ $M_{\odot}$ ]. Mass of the star.
- 55.  $\sigma_+(M_{\star})$ . Upward uncertainty of  $M_{\star}$ .
- 56.  $\sigma_{-}(M_{\star})$ . Downward uncertainty of  $M_{\star}$ .
- 57. *Stellar surface gravity*,  $\log g$  [cgs]. Surface gravity of the star as given in the stellar properties catalog. For stellar parameters taken from DR25 and Berger et al. (2020),  $\log g$  is from isochrone models. For stellar parameters taken from Fulton & Petigura (2018),  $\log g$  is based on spectroscopy.
- 58.  $\sigma_+(\log g)$ . Upward uncertainty of  $\log g$ .

- 60. Metallicity [dex]. Metallicity of the target star.
- 61.  $\sigma$ (Metallicity). Uncertainty of the metallicity of the target star.
- 62. Stellar model source. 0 = solar parameters, 1 = DR25, 2 = Berger et al. (2020), 3 = Fulton & Petigura (2018), 4 = special (see Section 2.1). Aside from KOI-1792 (for reasons discussed in Section 2.3) and two binary star systems for which special parameters are used, Fulton & Petigura (2018) values are used where available, and the Berger et al. (2020) values are always preferred over those listed in DR25.
- 63. Dispositions. This four-letter code gives the dispensations (status flags) from this work, DR25supp, DR25, and DR24 in reverse chronological order, with F = falsepositive (or false alarm), P = planet/candidate, N = notincluded in specified catalog, S = rejected by us because S/N < 7.1,<sup>16</sup> M = Jupiter-sized objects for which mass measured via RV clearly exceeds the 13  $M_{\text{Jupiter}}$  limit for classification as a planet that otherwise would have been dispositioned "P" or "R," and R = radius too large (see Section 2.3) but meets all other criteria. "N" is never applicable to the first column (our catalog provides dispositions for all KOIs listed) and "S," "M," and "R" are used exclusively for our dispositions. The seven validated planets (with Kepler numbers listed on NExScI) that failed either the radius cut or the S/N cut but passed visual inspection of the lightcurve were dispositioned "P" (see Section 2.3 for details).
- 64. Values of the same properties reported in columns (39)– (44) and (46)–(61) with stellar parameters taken from Berger et al. (2020). They are all zeros if the host star is not characterized by Berger et al. (2020).

We treat KOIs with dispositions beginning with "S" and "M" as false positives throughout our study; KOIs whose dispositions beginning with "R" are treated as false positives for most purposes but are included together with planet candidates in our study of the distribution of planetary radii (Section 3.3). The total number of planet candidates is 4376, including 35 monotransits; additionally, there are 100 KOIs, including two monotransits, that we vetted as "R." There are 709 multiple-transiting planet systems, which account for 1791 candidates, including seven monotransits.

Figure 1 displays the sizes and radii of almost all of the planet candidates in our catalog and indicates the multiplicity of the planetary systems in which they are observed. The bulk of the multiplanet candidates have radii  $R_p \leq 4$   $R_{\oplus}$  and orbital periods 2 days  $\leq P \leq 100$  days. Figure 5 confirms these general observations and demonstrates the paucity of additional transiting planets in systems hosting transiting hot Jupiters (e.g., Steffen et al. 2012) and planets with periods longer than ~100 days. The period–radius valley separating super-Earths from sub-Neptunes slopes downward from ~2  $R_{\oplus}$  at P = 2 days to ~1.5  $R_{\oplus}$  at P = 40 days (left panel of Figure 6).

Figure 3 shows the typical transit S/Ns for planet candidates as a function of  $R_p$  and P. The left panel shows the total S/N calculated using Equation (1), and the right panel shows the average S/N per transit. The total S/N has a floor of 7.1 as discussed in Section 2.3 and marks the boundary where the smallest planets can be found for a specified range in orbital period

<sup>59.</sup>  $\sigma_{-}(\log g)$ . Downward uncertainty of  $\log g$ .

 $<sup>\</sup>frac{16}{10}$  Note that the rounding done to produce the S/N numbers displayed in column (31) of this table is done after assignment of "S" in the flags.



**Figure 5.** The observed multiplicity of transiting planets from the Kepler sample as a function of period and radius, with individual squares representing a factor of  $10^{3/8} \approx 2.371$  in *P* and  $12.5^{1/6} \approx 1.523$  in  $R_p$ . Black dots represent individual Kepler planets, and black stars represent the terrestrial planets in our solar system. The colored squares give the multiplicity fraction for each area that contains at least four planets. A planet is considered to be part of a multiplanet system if more than one transiting planet candidate is seen in the photometric lightcurve. If a square were to contain four planets, three of which were from multiplanet systems, then the multiplanet fraction would be equal to 0.75. The multiplicity fraction shows a paucity in multiplanets observed for hot Jupiters and USP (*P* < 1 day) and long-period (*P* > 100 days) planets, with an observed increase in multiplicity as the planet radius decreases in the well-populated region with periods from 1 to 40 days.



**Figure 6.** The Kepler planet population showing radius  $(R_p)$  vs. period (P) on the left and radius vs. incident flux  $(S_{\oplus})$  on the right. The points have been colored by the radius of the host star  $(R_*)$ . Solar system planets are marked with black stars, and the conservative habitable zone for an Earth-like planet around a Sun-like star (Kopparapu et al. 2014) is shown by the hatched green lines.

before the population is dominated by false alarms. The rate of false alarms drastically increases for periods close to 1 yr because of the rolling band noise, which is video crosstalk between detectors that produces a slowly drifting band of noise and static starlike artifacts. The rolling band is most prevalent on detectors 22, 26, 44, and 58 and creates a mismatch in the sky estimate leading to a semiperiodic instrumental systematic that can resemble a photometric signature of a transit-like signal (see Table 13 from

Van Cleve & Caldwell 2016). The 372 day heliocentric orbit of Kepler and quarterly change of the spacecraft roll results in the rolling band only being present once or twice per year for any given target star. Significant effort was invested to identify and eliminate false alarms with periods centered on 372 days without being overly aggressive against low-S/N Earth-like transits (Thompson et al. 2018). Nonetheless, visual examination of the left panel of Figures 6 and 7 of Thompson et al. (2018) shows an

 Table 3

 The Minimum Orbital Period of Each of the Monotransit Planet Candidates in Multiplanet Systems

KOI	P [Minimum] (days)	P [Estimate] (days)	System Multiplicity	P [Neighbor] (days)
435.02	528.5	934	6	62.30
671.05	691.5	4865	5	16.26
693.03	588.0	719	3	28.78
1108.04	507.0	1289	4	18.93
1870.02	490.0	550	2	7.96
2525.02	418.5	562	2	57.29
4307.02	483.0	993	2	160.85

**Note.** The minimum orbital period of each of the monotransit planet candidates in multiplanet systems based on Kepler lightcurve coverage (the smallest value, stepping by 0.5 Days, in which the data could not rule out a second transit) is listed together with the orbital period estimated from the transit duration and shape and the stellar properties, system multiplicity, and period of the transiting planet orbiting immediately interior to it. The uncertainties of the estimated periods are poorly quantified and likely to be substantial.

overall increase in planet candidates centered on 372 days. As noted by Burke et al. (2019), extra care and analysis is needed when assessing the statistical properties of planets in this regime, and this analysis would strongly benefit from a directed study of noise properties and follow-up observations from facilities such as the Hubble Space Telescope and Plato. Moreover, low-S/N longperiod PCs can also be produced by a few systematic dips in a lightcurve that line up to produce a signal that looks transit-like. Such chance alignments are common for TCEs that appear to transit just three or four times, but their frequency declines with five or more transits (Mullally et al. 2015).

We computed minimum periods of each of the seven monotransit PCs in multis by examining their target's lightcurve to determine the shortest possible period for which no additional transits would have occurred at times when Kepler obtained good data (i.e., was observing and photometric noise was not excessive). These lower bounds, as well as the (crude) estimates of the orbital periods using the duration and shape of the lightcurve, together with the stellar properties and an assumed circular orbit (the absolute value of the negative Plisted for these planets in Table 1) and the periods of the longest-period observed companion planets, are given in Table 3. None of these monotransiting planets in multis have minimum periods significantly shorter than the period estimates from lightcurve analysis, which would be the case if their transverse orbital velocity at the time of transit was larger than that of a planet on a circular orbit with the minimum calculated period. Note that all of the multitransiting PCs in these seven systems, apart from KOI-2525.01 and 4307.01, have been verified as planets and given Kepler numbers.

Figure 7 provides a compact sketch of the architectures of all 709 multiplanet systems discovered by Kepler. Systems are grouped into panels by the number of planets detected and sorted within each panel by the orbital period of the innermost planet. Planetary radii and the presence of detected TTVs are also indicated for planets in systems with four or more PCs. Note that all 81 systems with four or more planets have at least one planet with P < 13.5 days, and only two such systems lack planets with P < 10.4 days. The smallest period ratio of planet candidates plausibly orbiting the same star is 1.1167, between the two small  $\sim 0.75 R_{\oplus}$  PCs KOI-3444.04 (P = 14.15 days) and KOI-3444.01

(P = 12.67 days); no other pair of Kepler PCs orbiting the same star has a period ratio smaller than 1.15.

### 2.6. KOI-2433: A Candidate Seven-planet System

Figures 1 and 7 show that there are now two Kepler systems with more than six transiting planet candidates. One of these is the familiar eight-planet KOI-351 (Kepler-90) system (e.g., Lissauer et al. 2014; Shallue & Vanderburg 2018). With the addition of KOI-2433.08 from Shallue & Vanderburg's (2018) list, a second Kepler target now has eight KOIs, which we elaborate upon in the following paragraphs. According to Table 1, the 10 and 15 day planets, which were validated by Rowe et al. (2014) as Kepler-385 b and c, both have S/N ~ 28. The 56 day planet has S/N = 16.4 and was validated as Kepler-385 d by Armstrong et al. (2021). The S/Ns of the other five KOIs range from 11.1 to 14.3, above the S/N > 10 required as one of many tests for planet validation of PCs in multis by Rowe et al. (2014).

The 0.6 day KOI-2433.05 has disposition FFFF.<sup>17</sup> Its lightcurve clearly exhibits secondary events indicative of an eclipsing binary. Furthermore, pixel-level data show the periodic dimming to be spatially offset from the target star. Thus, we do not consider this USP KOI further.

The three validated planets plus the 28 day KOI have dispositions PPPP. The disposition of the 6 day KOI is PPNP; its S/N = 12.4. The 86 day KOI has PPFN; its S/N = 11.2. The 3.4 day KOI-2433.08 has PNNN; its S/N = 11.1.

The outer three planet candidates have neighboring pairs with period ratios nominally placing them just wide of firstorder mean-motion resonances (MMRs; as does the pair of validated planets orbiting interior to this threesome), increasing the likelihood of them being real planets (Lissauer et al. 2014). Indeed, it is possible that the validated pair of planets is locked within a two-body resonance and that the three outer planets librate within a three-body resonance. Period ratios between the planets all exceed 1.5, which is sufficient for system stability provided the planets have masses typical for their sizes and small eccentricities, which are the norm for Kepler planets in systems of high multiplicity (Figure 20). In sum, we consider KOI-2433 as having seven strong planet candidates. Nonetheless, validation of all of these candidates to well above 99% probability of representing true planets is beyond the scope of this paper.

## 3. Characteristics of the Planet Population: Multis versus Singles

Kepler found far more multiple-planet candidate systems (multis) than would be the case if PCs were randomly distributed among target stars (Lissauer et al. 2011b; Latham et al. 2011). Lissauer et al. (2012) presented a statistical analysis that combined the large numbers of multis observed by Kepler that were listed in Borucki et al. (2011b; as modified by Lissauer et al. 2011b) together with the assumption that false positives are nearly randomly distributed among Kepler targets to demonstrate that the fidelity of Kepler multiple-planet candidates is far higher than that for singles. Lissauer et al. (2012) and developed techniques that Rowe et al. (2014) used

 $<sup>\</sup>frac{17}{17}$  See item 63 in the numbered list in Section 2.5 for an explanation of the dispositions given in the last column of Table 1.



**Figure 7.** These plots show the orbital periods of each of the planets in every Kepler multiplanet system. The three panels show systems of differing multiplicity. Within each panel, all symbols along a given vertical line represent planets belonging to the same star, and the systems are ordered horizontally according to the orbital period of the innermost planet. The top panel presents systems with two (red) or three (blue) detected transiting planets, the middle panel presents systems with four transiting planets, and the bottom panel presents systems with at least five transiting planets. The top panel does not plot KOI-1843.03 due to its short orbital period, 0.177 days, which is <40% as long as that of any other Kepler PC in a multi; however, its two companion planets are represented by blue points touching the vertical axis. In the middle and bottom panels, the symbol size is proportional to the planetary radius, although in the middle panel, planets larger than 5  $R_{\oplus}$  are shown as if  $R_p = 5 R_{\oplus}$ , and the systems are labeled by KOI number at the bottom, with red numbers being used for systems with six to eight transiting planets. Colors of planets in the lower two panels denote the TTV flag given by Kane et al. (2013); bright yellow is 8 or 9 (moderate or strong TTVs), dark green is 7 (probable TTVs), and black is no TTVs (note, however, that recently identified PCs were not examined by Kane et al. 2013). The periods of monotransit objects are constrained to be greater than the plotted values by not showing a second transit in the recorded data; see Table 3.

to validate more than 700 of Kepler's multiple-planet candidates as true planets.

The distribution of stellar host magnitudes for singles and multis are shown in Figure 8. We compare the S/N distributions of Kepler singles and multis in Section 3.1 and estimate the fraction of apparent Kepler multis in Table 1 that do not represent planets orbiting the same star in Section 3.2.

Many groups, dating back to the aforementioned Lissauer et al. (2011b) and Latham et al. (2011), have compared

characteristics of the distributions of single-planet candidates in the Kepler sample with those of individual PCs in multis. We compare size distributions (in Section 3.3) and orbital period distributions (in Section 3.4) for ensembles of planets in singles to those within multis and between PCs in two-planet systems and those in systems of higher multiplicity. The distributions of normalized transit durations and eccentricities of subsets of PCs segregated by multiplicity, orbital period, size, and orbital spacing are presented and analyzed in Section 3.5.



Figure 8. Histogram of Kepler planet-hosting star magnitudes, with hosts of a single PC in blue and stellar hosts of multis in red. All PCs that were observed by Kepler are represented in this plot.



Figure 9. Number of singles (blue) and multis (red) as functions of S/N. The dashed red curve is restricted to the lowest-S/N planet in each multiplanet system. All PCs that were observed by Kepler are represented. See Figure 3 for a plot of how the typical S/N varies with planetary radius and orbital period.

Up through Section 3.4, all PCs are accounted for in the determination of the multiplicity of a planetary system. For our analysis of planetary size distributions (Section 3.3), we treat KOIs dispositioned as "R" as if they were PCs but do not count PCs with a high impact parameter or S/N < 12. In Section 3.4, we omit PCs with S/N < 12, as well as those with only one observed transit. In Section 3.5, we employ somewhat different restrictions, described in the introduction to that subsection.

### 3.1. S/N Distributions and Reliability of the Sample

Figure 9 compares the histograms of singles versus multis as functions of S/N. Note that there are similar numbers of multis

and singles over a wide range in S/N, but singles dominate for both the smallest values of S/N and the largest ones. Examining the distributions more quantitatively, Kepler found almost 50% more planet candidates in singles than in multis, but Figure 9 shows that the numbers of singles and multis are nearly equal across the S/N range 25–180. Below S/N = 12 and above S/N = 300, well over twice as many singles as multis have been identified; intermediate ratios are found in transition regions (see Figure 9). The predominance of singles at high S/N is primarily accounted for by the paucity of large planets, especially hot Jupiters, in multis (Latham et al. 2011; Steffen et al. 2012).

The excess of singles at low S/N is probably caused by a combination of the following effects, the first two of which are related to Kepler multis being a highly reliable subsample of the Kepler planet candidate population (Lissauer et al. 2011b, 2012, 2014; Latham et al. 2011; Rowe et al. 2014). (1) A larger fraction of singles are false alarms (this was not the situation in 2014 because of the more aggressive search for PCs in multis (Rowe et al. 2014), but probably is the case now because of the more automated procedure used to find and vet KOIs in recent catalogs). (2) Planet candidates with low S/Ncannot be tested as rigorously as can PCs with high S/N, so a larger fraction of eclipsing binaries and other FPs are included in the PC list, and low S/N PCs are more common among targets with a single transit-like pattern than around targets with more than one such pattern (Lissauer et al. 2011b; Latham et al. 2011; Lissauer et al. 2012, 2014; Rowe et al. 2014). (3) When multiple planets transit, the detectability of planets other than the highest-S/N candidate by the Kepler pipeline is reduced significantly (Zink et al. 2019), especially if the highest-S/N planet has low S/N, so it is less likely that other transiting planets in the system have been detected. (4) TTVs, which are detected in more than twice as large a fraction of multis compared to singles (Table 1 and Section 3.4), reduce MES, but if they are accounted for in our model fits, they do not reduce S/N. (5) Perhaps real differences between the populations, such as longer-period planets having lower S/N, all other factors being equal, combined with neighboring companion planets typically being within a factor of  $\sim$ 2–3 in period and planets with longer periods being less likely to transit unless typical relative inclinations of planetary orbits decrease significantly as periods increase. Determining what fraction of the difference is caused by item 3 is important both to a comparison between multis and singles and to understanding the fidelity of the sample of single-planet candidates, but it is beyond the scope of this work.

### 3.2. Split Multis and Orbital Period Aliases

Searching through photometric time series for transiting planets may yield false positives, a term that conventionally means a real astrophysical signal within the same detector pixels but caused by something other than a planetary transit. For the purpose of computing occurrence rates, a subclass of FPs is signals resulting from transits of real planets that are not hosted by the intended target star, such as the planets observed to transit KOI-119 (Section 2.1). Such blending causes the planetary radius to be significantly underestimated (as the target star is invariably the one providing the most photons absorbed by the pixels), and the stellar host type and other parameters can be incorrect, to the detriment of statistical occurrence efforts. These real planets, which we classify as PCs, should therefore be termed false positives for the purposes of computing planetary occurrence rates. (The number of Kepler planet candidates identified as likely to orbit stars other than the Kepler target star is quite small, and all prime suspects that we know of are discussed within the first half of this subsection.)

In the case of candidate multiplanet systems, it could be that each periodic signal is due to a real planet, but these planets are not orbiting the same star. Recognizing the planets' reality, we do not use the word "false" here but instead call these systems "split multis." Although they are real planets, split multis can be a source of contamination for dynamical studies. Given that the orbital periods of planet candidates span a very large range, random planets around different stars will not necessarily appear strange when (mis)interpreted as orbiting the same star. In some fraction of cases, however, we would notice that their periods are too close together to be stable if interpreted as being around the same star. Given the steep dependence of occurrence rates on planet size, split multis are expected to be most common for binary stars of similar luminosities. Therefore, when studying multiple-planet systems, it can be advantageous to restrict one's attention to a subset of Kepler targets that have been filtered to minimize contamination from binary stars with similar luminosities (e.g., He et al. 2020; Hsu et al. 2021).

Here we discuss a few potential split multis. KOI-284, first listed in the catalog of Borucki et al. (2011b) and introduced here in Section 2.1, includes the planet candidates KOI-284.02 (with orbital period P = 6.415 days) and KOI-284.03 (with P = 6.178 days), both of which appear to be larger than Earth. Lissauer et al. (2011b) noted that if both of these planet candidates represented planets orbiting the same stellar host, then for any reasonable densities, their proximal orbits would lead to dynamical instability on a short timescale. Thus, they do not represent planets in the same planetary system; this system is the prototypical Kepler example of a split multi. Further investigation revealed that the target "star" is actually a binary system with nearly identical components (Lissauer et al. 2012), and both of these PCs were subsequently validated as true planets, one orbiting each star, by Lissauer et al. (2014). These two planetary systems are now known collectively as Kepler-132. There are two additional validated planets, with orbital periods of 18 and 110 days. However, it is not yet known which member of the stellar binary any of the planets orbit, apart from the two 6 day period planets needing to orbit different stars.

Two planet candidates apparent in the lightcurve of KOI-2248, denoted KOI-2248.01 (P = 2.818 days) and KOI-2248.04 (P = 2.646 days), were first listed in the Batalha et al. (2013) catalog, and they were highlighted as a split multi by Fabrycky et al. (2014). Neither of these KOIs has ever been dispositioned as a false positive in any KOI catalog, including our own (Table 1). Two other planet candidates in the system were listed in DR25supp, KOI-2248.02 (P = 9.49 days) and KOI-2248.03 (P = 0.762 days). Shallue & Vanderburg (2018) listed a "new" candidate associated with the same Kepler target and P = 4.745 days that we have included in our catalog and dubbed KOI-2248.05 (Section 2.3). None of the KOIs in the system has yet been verified as a bona fide planet. One member of the pair of planet candidates with similar periods, KOI-2248.04, has S/N = 8.4 in our catalog, which is quite peculiar given that it was identified so early in the Kepler mission, calling its veracity into question. The other member of that nominally unstable pair, KOI-2248.01, has a fairly low DR25 disposition score of 0.895, but we find that it has a respectable S/N = 16.5. The 9.5 day signal, KOI-2248.02, has an unacceptably low S/N = 4.5, so we classify it as a false alarm, probably an alias of KOI-2248.05, which has a period almost exactly half as long.

Thus, KOI-2248 hosts four planet candidates, two of which (both somewhat suspect for other reasons) could not represent planets orbiting the same star, as a system containing both of these putative planets would be dynamically unstable. Highresolution imaging of the target star KOI-2248 has been carried out by Furlan et al. (2017), whose Table 8 (accessed by Vizier, 2018 July 16) lists KOI-2248 with two stellar near neighbors on the sky plane detected by WFC3 (Hubble Space Telescope): one (denoted B) that is 0.169 mag fainter in the F555W filter band (a nearly equal-brightness companion) with a separation of just 0."148, so it could well host one of the  $P \sim 2.7$  day PCs. The other stellar sky-plane neighbor (denoted C) is 3."872 away and 5.318 mag fainter, so it is not likely to be the host of either planet. The only survey using WFC3 listed in Table 1 of Furlan et al. (2017) is that by Gilliland et al. (2015) and Cartier et al. (2015), but neither of these latter papers addresses KOI-2248, so we suspect that the results were posted to the Kepler Follow-up Observing Program website but not published in the refereed literature.

Although Table 1 does not list any proximate-period split multis other than those in KOI-284 and KOI-2248, as discussed above, an early draft version of this table listed the planet candidate KOI-521.02 with an orbital period P = 10.82 days, which would place it too close to the Neptune-sized PC KOI-521.01 (P = 10.16 days) for dynamical stability. We therefore reexamined the Kepler lightcurve of this target and found that alternate transits of KOI-521.02 had been missed, so the actual period of this PC is only half of what is listed in previous catalogs, P = 5.41 days. The Q1–Q16 KOI catalog was the first to list KOI-521.02 and dispositioned it as an FP (Mullally et al. 2015). In the subsequent catalogs, DR24, DR25, and DR25supp, it was listed as a PC, albeit one with a weak S/N (initially 8.7 and later 7.3; with the corrected period, it has a more respectable S/N = 9.7). The estimated orbital periods of both KOI-521.01 and 521.02 changed by less than one part in 10<sup>4</sup> between previous catalogs and were similarly close to these estimates in early drafts of our catalog. The TCE searches for DR24 and DR25 both identified KOI-521.02 with the correct 5.41 day period. However, because this TCE had a period that differed by a factor of 2 from a previously cataloged KOI on the same target, and the orbital phases matched, it was assigned the previous period in both of those PC catalogs.

A systematic search for period aliasing was done in Section 5.4 of the Batalha et al. (2013) catalog paper. However, it is unlikely that the error in the initial period estimate for KOI-521.02, which was not identified as a KOI until a later catalog search, would have been recognized had we not given it special scrutiny because it appeared to be part of a split multi. This example suggests that some nontrivial fraction of low-S/N PCs in our catalog could have listed periods that err by a factor of 2. Several other PCs have had their estimated periods changed by a factor of roughly 2 subsequent to their first appearance in an official Kepler KOI catalog, most notably KOI-730.03, which was initially listed with a period of half its true value (Borucki et al. 2011b) that would have placed it within a 1:1 (co-orbital) resonance with KOI-730.02, but the additional scrutiny that this putative pair of Trojan planets received quickly led to its estimated period being corrected by Lissauer et al. (2011b). Using data from the entire Kepler mission, the DR24 TCE table lists KOI-730.03 with its correct period, with a large MES of 17. So in the calculation below, we do not count it as an alias corrected by dynamical considerations.

Note that PCs with estimated periods (nearly) identical to or a factor of 2 different from the period of another KOI of the same target may suffer from the discarding of data surrounding the transit of the first candidate (Schmitt et al. 2017), a type of aliasing that is not an issue when periods are not commensurate. This effect contributed in the case of KOI-2248.02 but not for KOI-730.03, whose transit phase differed substantially from that of its commensurate sibling. Both KOI-730.03 and KOI-521.02 had their periods adjusted only after receiving additional attention due to apparent co-orbital planets or unstable systems. We do not know of other PCs whose orbital periods were corrected for dynamical reasons.

Motivated by these examples, we next estimate the number of period aliases that likely remain in the sample of multis. The number of PCs with measured periods in multis that have at least one other PC with a measured period is 1781. We took each of the pairs of planets in the same target, 1610 in total, multiplied the lower orbital period by 2, and counted how often that change would make the pair unstable. Following Lissauer et al. (2011b) and Fabrycky et al. (2014), planetary masses were taken as  $(R_p/R_{\oplus})^{\alpha}M_{\oplus}$ , where  $\alpha = 3$  for  $R_p < R_{\oplus}$  (sub-Earths),  $\alpha = 2.06$  for  $R_{\oplus} < R_p < R_{\text{Saturn}}$ , and finally,  $M_{\text{Saturn}}$  for  $R_p > R_{\text{Saturn}}$ . Pairs of planets were deemed unstable if their difference in semimajor axis was less than  $2\sqrt{3}$  their mutual Hill separation (Gladman 1993). No higher-order accounting of stability (for triples, for instance) was performed for this calculation. Stability requirements for systems of ≥three planets are more restrictive, but cannot be expressed in such simple terms (see, e.g., Petit et al. 2020 and Lissauer & Gavino 2021).

Of these 1610 mock pairs, 281 (17.5%) were unstable. Since only one out of 1610 real pairs of planets was found (via instability) to be an alias, the estimated rate for a planet candidate to have an aliased period is  $(1/281) \approx 0.36\%$ . This rate is small enough that we can safely neglect the rate of systems becoming unstable due to multiple PCs being affected by aliases in the same system. Among planets with multiple transits in multitransiting systems, we expect roughly  $0.0036 \times 1781 \approx 6$  aliased planets, five of which are vet undiscovered, though since this is based on only one such detected system, it should be considered an order-of-magnitude statement. If the systems with just a single transiting planet with a quoted period also have this aliasing problem at the same rate, then  $0.0036 \times 2550 \approx 9$  are also aliased. Aliasing may occur at a different rate among singles, however, as the S/N distribution differs (Figure 9), and the data set when searching for additional transits needs to be censored in certain areas.

Using a similar approach, we update the estimated rate of split multis from Fabrycky et al. (2014). We choose pairs of  $(P, M_p/M_{\star})$  values of all of the planet candidates and determine that  $453,281/9,419,770 \approx 4.8\%$  are unstable.<sup>18</sup> Having two detected unstable pairs (via the split multi channel) out of 1610 PC pairs, we estimate that  $2/0.048 \sim 42$  of our pairs may actually be split multis. Thus, split multis are likely a larger contaminant for the study of planetary system architectures than are period aliases, even though only ~2.6% of sampled pairs in multis are expected to be planets orbiting different stars.

The above estimates suggest that, among planets in multis, there are  $\sim$ 7 times as many split multis as period aliases. A factor of 2 comes from twice as many split multis having been

<sup>&</sup>lt;sup>18</sup> Fabrycky et al. (2014) restricted their choice to pairs of planet candidates in multis. Applying that prescription to our data set results in 88,758/1,590,436  $\approx$  5.6% being unstable, a slightly larger percentage, since the period distribution of PCs overall is broader than that of PCs in multis (Figure 13). This yields an estimate of ~36 split multis. We prefer using all PCs because split multis can include planets that are single and/or those that are in multis.



**Figure 10.** The cumulative impact parameter distributions of various subsets of planet candidates, as well as KOIs rejected solely because they are too large (dispositioned as R in Table 1), that were observed by Kepler. Red curves represent PCs in multis, and blue curves represent single-planet candidates; small planets are shown by solid lines and large PCs by dashed lines. There are six small ( $R_p < 5 R_{\oplus}$ ) and 54 large singles that have b > 1. In multis, there are two small and one large PCs that have b > 1. Planet candidates with S/N <12 are not counted for the cumulative distribution functions, but they are considered when determining the multiplicity of the systems in which the counted PCs reside.

identified. A slightly larger factor is because period aliases are more likely to result in instability, since it is fairly common for a pair of planets in the same system to have a period ratio near 2 (Figure 7; see also Fabrycky et al. 2014), but the overall distribution of periods is quite broad (Figure 13), so few pairs of randomly selected planets have a period ratio near unity.

The estimates of the number of period aliases calculated in this section do not account for the aliases found for planets with periods  $\leq 1$  day, analogous to those noted in Section 2.3, which are caused by Kepler automated pipeline searches for TCEs being limited to signals with periods >0.5 day. Aliases among USP planets are very unlikely to be found via the techniques discussed in this section because only one planetary system (Kepler-42) is known to have more than a single planet with P < 2.25 days (e.g., Steffen & Farr 2013; Lissauer et al. 2023).

### 3.3. Size Distribution

A total of 100 KOIs, none of which are in multis and 73 of which have P > 10 days, are dispositioned as "R" in Table 1, indicating that they were rejected as planet candidates solely due to their estimated size. The placement of our upper bound on the estimated radius of a body that we classify as a planet candidate (Section 2.3) is somewhat arbitrary, so we consider KOIs that are rejected based on size alone together with planet candidates (KOIs vetted as "P") for all studies presented in this subsection.

Figure 10 contrasts the fractional cumulative distributions of the impact parameters of small and large planets in singles and multis. Small planets are clearly underrepresented for *b* very close to unity because near-grazing transits of small planets are difficult to detect, and they are quite rare for larger impact parameters because  $R_p/R_* \gtrsim b-1$  is a requirement for a transit to be observable. Therefore, when comparing radius distributions, we only consider planets with estimated impact parameters  $b + \sigma_+(b) < 0.95$ . (Because we report planet sizes using the modes of the distributions, we do not need to adopt the stricter b < 0.8 cutoff used by Petigura 2020.) We also exclude from our analysis in this subsection those candidates with S/N < 12 because the population of low-S/N candidates has more FPs and typically higher fractional uncertainties on estimates of  $R_p$ ; this cut removes the four PCs around targets for which solar parameters were assumed, and for which planetary radii are especially poorly estimated. Planets that are excluded from the counts by these cuts are nevertheless included when determining the multiplicity of the system in which companion planets that meet these criteria reside.

Figures 11 and 12 compare the size distributions of ensembles of planets in systems of different multiplicity. In all cases, we lump together systems with three or more PCs to have adequate numbers of PCs for statistically robust results.

Giant planets are more common among Kepler singles than among Kepler multis (Latham et al. 2011). Nonetheless, when the cumulative size distributions for singles and planets in multis are normalized to unity at  $R_p = 5 R_{\oplus}$  (Figure 11), the curves for planets up to this size are very similar. Over the size range  $R_p < 5 R_{\oplus}$ , the differences between the distributions are of marginal statistical significance, and for  $R_p < 2.5 R_{\oplus}$ , the distributions of singles and planets in multis are consistent with being drawn from the same population.

There are, however, various biases in the discovery of planet candidates in multis as opposed to singles that could allow the actual distributions of transiting planets with  $R_p < 2.5 R_{\oplus}$  to have some size dependence. The biases that make the size distribution of small planets appear more prevalent in singles than in multis include: detecting a PC in a Kepler lightcurve reduced the amount of data used by the Kepler pipeline to search for additional PCs and thereby lowered the efficiency of detecting any other transiting planets associated with the same target star, reducing the probability of finding more PCs,



**Figure 11.** Normalized cumulative distribution function of planetary radii of planets for specified system multiplicity. The panel on the left compares singles with planets in multis, whereas the panel on the right compares planets in two-planet systems with those in systems of higher multiplicity. We normalized the cumulative distribution functions to unity at  $R_p = 5 R_{\oplus}$ . Candidates with S/N < 12 or  $b + \sigma_+(b) \ge 0.95$  are excluded from this radius distribution, although planets are considered to be in multis even if all of their companions fail to meet one or both of these cuts. These plots include KOIs rejected because they are too large (dispositioned as R in Table 1). Only the portions of the distributions with  $R_p < 30 R_{\oplus}$  are shown, although larger bodies that satisfy our criteria are included in the computation of the numbers given within brackets. No candidates in multis satisfying our upper limit on impact parameter have  $R_p > 30 R_{\oplus}$ , whereas one single with status P and 12 with status R are larger than this value and not shown. (The green triangle with  $P \approx 150$  days in Figure 1 represents KOI-1426.03, which has V-shaped transits and b > 1.)

especially small ones (Zink et al. 2019); geometric factors imply that a larger fraction of planets of a given orbital period transit large stars than small stars, and small planets are difficult to detect around large stars. By contrast, less photometrically noisy, brighter, and/or smaller stars make all (but especially small) planets easier to detect, yielding a bias toward detecting multiple small PCs around the best target stars. Searching for additional planet candidates has at times been more aggressive for targets with at least one candidate already identified, and some searches for transiting planet signatures, such as that of Shallue & Vanderburg (2018), have focused exclusively on lightcurves of targets already known to possess planet candidates.

Plotting a similar comparison between the size distributions of planets in systems with two planet candidates versus those in higher-multiplicity systems (right panel in Figure 11) shows a slight excess of super-Earth-sized planets relative to (sub-) Neptunes in systems with three or more PCs, with the distribution of two-planet systems lying between those for single planets and those for high-multiplicity systems. While the differences between singles and multis over the entire range in radii are highly significant, both the Kolmogorov–Smirnov (K-S) test and the Anderson–Darling (AD) test show marginally significant differences between 2's and 3+'s. These marginal differences persist when restricting to the range  $R_p < 5 \ R_{\oplus}$ , but such differences are no longer evident if restricting to  $R_p < 2.5 \ R_{\oplus}$ , even though the majority of PCs in multis are smaller than 2.5  $R_{\oplus}$ .

The divergence between the curves in the left panel of Figure 11 comes in gradually as  $R_p$  increases. There is no sign of divergence below  $4R_{\oplus}$ , but it is plainly there above  $5R_{\oplus}$ . Nonetheless, it is clear that multis are deficient relative to singles for planets that are larger than Neptune. Note that because Kepler has detected far more small planets than large ones, errors in estimates of  $R_p$  could well mean that a small fraction of  $\sim 3 R_{\oplus}$  PCs with overestimated sizes contribute a substantial fraction of the population of apparently Neptune-sized objects, and the actual transition between the multis-rich population of "small" planets that are  $\leq 1\%$  H/He by mass and the multis-poor population of gas-rich planets may occur closer

to  $4R_{\oplus}$ . Indeed, although this transition appears to occur at a somewhat larger radius than that of the radius cliff, which is the sharp reduction in the overall occurrence rate of Kepler PCs observed near  $3R_{\oplus}$  (Kite et al. 2019; Hsu et al. 2021) that manifests as a reduction in slope in all of the curves in Figure 11, the break in the ratio of the number of multis to that of singles could be coincident with the radius cliff.

Figure 12 compares cumulative size distributions of large planet candidates (and KOIs that we dispositioned as R because they failed our upper radius cutoff) in multis versus singles and in two-PC systems versus higher-multiplicity systems. The size distributions of singles and multis are essentially indistinguishable over the range 4.5–10  $R_{\oplus}$ , but the number of PCs in multis in this range is only a little more than half the number in singles, whereas similar numbers are present for smaller planets. Very few PCs in multis have  $R_p > 12 R_{\oplus} \approx$ 1.1  $R_{\text{Jupiter}}$ , but plenty of singles have radii larger than  $12 R_{\oplus}$ (e.g., Santerne et al. 2016). The divergence of the curve for singles with P > 10 days from that for all singles shows that almost half of the members of the plotted population with  $R_p > 12$   $R_{\oplus}$  orbit within the period range of inflated hot Jupiters. Most of the excess at longer periods (as well as some at short periods) is probably caused by false positives, which could be nearby (on the sky plane) eclipsing binaries or transits of the target star by ultracool dwarfs that are too faint to show an occultation (sometimes referred to as a secondary eclipse) deeper than can be explained by heating of the dayside by radiation from the primary star or which travel on sufficiently eccentric and inclined orbits that no such occultation occurs. This was our motivation for classifying KOIs that otherwise would have been considered PCs that have P > 20 days and  $R_p > 1.2 R_{\text{Jupiter}} \approx 13 R_{\oplus}$ , i.e., significantly, albeit not substantially, larger than this boundary, with the disposition "R." Further investigation of KOIs vetted "R" is a topic worthy of investigation by observers interested in small stars within eclipsing binary systems but is beyond the scope of this work.

Overall, there appears to be an abundant population of planets with sizes less than  $3 R_{\oplus}$  (in agreement with Kite et al. 2019; Hsu et al. 2021), 44% of which are in multis. Kepler found a much less abundant population of giant planets;



**Figure 12.** Cumulative distribution function of planetary radii comparing "large" PCs in multiplanet systems with similarly sized PCs in singles, as well as with planets in singles with the additional constraint P > 10 days; all curves are normalized to unity at  $10 R_{\oplus}$ . The four panels, upper left, upper right, lower left, and lower right, consider planets larger than 3, 4, 4.5, and 5  $R_{\oplus}$ , respectively. The numbers in square brackets represent PCs (plus KOIs rejected solely because they are too large and therefore dispositioned as "R" in Table 1) larger than the minimum value represented in the particular panel (no upper size cutoff). This plot uses the same criteria for inclusion as used in Figure 11.

29% within the size range  $5 R_{\oplus} < R_p < 10 R_{\oplus}$  reside in multis, whereas the population of larger objects is dominated by singles that include hot Jupiters and FPs. Boundaries are smoothed over by a combination of radius errors and true fuzziness. Note that the size range from 5 to  $10 R_{\oplus}$  includes a huge diversity of planets from superpuffs (currently only known in systems with multiple transiting planets because no cool, very low-mass/low-density Kepler transiting planets have RV mass measurements) to exo-Jupiters that are more enriched in heavy elements than the prototype present in our solar system. However, all planets in this size range are clearly gasrich, with H/He abundances by mass of the same order as or larger than that of astrophysical metals.

## 3.4. Period Distribution

We now compare the distributions of the orbital periods of Kepler single-planet systems, planets in two-planet systems, and planets in systems of higher multiplicity. As in Section 3.3, we consider only planet candidates with S/N > 12 but nonetheless count objects that are classified as PCs yet are rejected from these samples due to an S/N below this threshold in determining the multiplicity of a planetary system. However, here we do not include monotransit PCs and KOIs with dispositions of R in our sample, and apart from the portion of our analysis wherein we compare the period distributions of

different ranges of PC sizes, we do not impose any restriction on estimated impact parameters.

Figure 13 displays the orbital period distributions of single Kepler PCs, planets in two-planet systems, and PCs in systems with three or more transiting planets. The vast majority of PCs within multis,  $\sim 90\%$ , have orbital periods between 2 and 100 days, whereas 78% of singles are in that same period range (10% of singles have periods less than 2 days, and  $\sim$ 12% have periods longer than 100 days). The difference is even larger when restricting to the shortest periods (P < 1.6 days), at which only  $\sim 20\%$  of the Kepler PCs have known transiting siblings. A K-S test shows highly significant differences between the distributions of singles and multis (*p*-value  $\approx 10^{-6}$ ), but one comparing two-planet systems with higher multiplicity fails to show significance, with *p*-value  $\approx 0.27$ . These results reinforce the findings of Lissauer et al. (2014) and Rowe et al. (2014). Geometric factors reduce the probability of longer-period planetary siblings of a transiting planet also transiting when viewed from the solar system. The tendency of hot Jupiters to lack nearby companions (Figure 5) contributes to the smallness of the fraction of short-period planets residing in multis; larger period ratios for neighboring PCs with short periods (perhaps due to tidal decay of the orbits of very short period planets) and tides driving very short period PCs to the host star's equatorial plane also likely contribute. See Appendix B of



Figure 13. The value of the vertical coordinate gives the fraction of planets within systems of specified multiplicity having orbital periods less than the value of the horizontal coordinate. Although multis are deficient in planets relative to singles at both the shortest and longest orbital periods, the ensembles of planets in multis and singles both have median periods of  $\sim 10$  days. This plot uses the same criteria for inclusion as stated in the first paragraph of Section 3.4.



**Figure 14.** Cumulative period distribution of Kepler planet candidates, considering the singles (blue curves) and multis (red curves) independently and separating the planets by radius into four bins ( $R_p < 1.8 R_{\oplus} < R_p < 5 R_{\oplus}$ ,  $5 R_{\oplus} < R_p < 10 R_{\oplus}$ ,  $10 R_{\oplus} < R_p$ ). Only planets with  $b + \sigma_+(b) < 0.95$ , S/N > 12, and more than one transit observed are included, as the radii of planets with grazing transits are not well constrained, and the false-positive rate is relatively high among PCs with low S/N. For clarity, each of the curves begins at its first nonzero value.

Lissauer et al. (2014) for a more comprehensive discussion of possible additional causes of the paucity of very short period planets in multis.

The normalized distribution of orbital periods of planets with exactly one companion PC is very similar to that of planets in higher-multiplicity systems for periods up to ~20 days (Figure 13). The fraction of PCs with two or more companions having periods in the range 20 days < P < 80 days is larger than that of PCs possessing one transiting sibling, with a compensating deficit of PCs with multiple companions for P > 80 days, but despite this visual divergence, the overall differences between the two period distributions are not statistically significant (neither the K-S test nor the AD test allows us to reject the hypothesis that the curves were drawn from the same distribution at the 95% confidence level). Nonetheless, since the two-PC systems are intermediate

between single PCs and high-multiplicity systems, there may well be real differences that are obscured by the small number statistics. He et al. (2019) compute conditional occurrence rates of an additional putative planet as a function of both the period and radius of the detected and putative planets.

Figure 14 shows the period distributions of various subsets of Kepler PCs that have been grouped by planet size and system multiplicity. Of the eight curves in Figure 14, seven conform to the following trends. For a given size range, singles have a broader period distribution (more planets at both very short and very long periods) than do multis, with the cumulative fractions crossing "near" 10 days. For all size ranges considered in multis and for nongiant singles, larger planets tend to have longer periods. The exceptional curve is for giant PCs in singles, a larger fraction of which are detected at short periods than is the case for mid-sized PCs in singles.



**Figure 15.** The normalized cumulative distributions of orbital periods of single planet candidates with TTVs, singles without TTVs, multis with TTVs, and multis lacking TTVs. Here we consider PCs to have TTVs if the first digit in their TTV flag in Table 1 is 1 (which somewhat overestimates the number of PCs in multis with TTVs because TTVs are used for fitting all PCs in a system if any PC in the system is found to exhibit TTVs), the second digit is 1 or 2, and/or the third digit is 8 or 9. Only PCs with at least three TTs measured and S/N > 12 are counted for these distributions. The plot on the left uses a linear scale in period and is truncated at 80 days, whereas the one on the right has a logarithmic period scale and extends to the longest-period Kepler PCs displaying at least three transits.

The tendency to observe smaller transiting planets at shorter periods is consistent with observational biases. Mid-sized PC with  $P \lesssim 2$  days are quite uncommon (the hot Neptune desert), consistent with H/He envelopes being stripped from close-in planets with  $M_p \lesssim 20 M_{\oplus}$ .

Figure 15 shows the distributions of orbital periods of planet candidates with and without TTVs, with the PCs also being categorized as singles or members of a multi. Here, we consider PCs to have TTVs if our lightcurve fitting prefers solutions with TTVs, they are listed as having TTVs in the Holczer et al. (2016) catalog, and/or they are classified as having strong or moderate TTVs by Kane et al. (2013; 8 or 9 overall rating).<sup>1</sup> Note that only 7% of single PCs with S/N > 12 have TTVs that meet our criteria, whereas 15%-20% of such planets in multis have TTVs.<sup>20</sup> This result is consistent with Xie et al. (2014), who found TTV rates that grow with transit multiplicity. For both singles and multis with P < 200 days, we find that TTVs are more likely to be observed in planets having longer periods, with the period differences being larger in singles than in multis. For self-similar (scale-invariant) planetary system architectures, both TTV amplitudes and near-resonant superperiods increase linearly with orbital period, so the dependence of the fraction of PCs with TTVs on orbital period may be explained in whole or in part by observational selection effects (small TTV amplitudes for the shortest-period planets and small observational baselines compared to TTV superperiods for long-period planets).

We next examine the "cumulative" fraction of planet candidates with inner companions as a function of planetary orbital period. The green curves in Figure 16 show  $\mathcal{F}_{inner}$ (Period), the fraction of transiting PCs with periods less than the value specified on the horizontal axis that have at least one transiting sibling on an interior orbit. This fraction can be calculated from the formula

$$\mathcal{F}_{\text{inner}}(\text{Period}) \equiv \frac{N_{\text{inner}}^{P < \text{Period}}}{N^{P < \text{Period}}},$$
(4)

where  $N^{P < \text{Period}}$  gives the total number of PCs with P < Periodand  $N_{\text{inner}}^{P < \text{Period}}$  represents the number of such PCs having one or more transiting companions with a period shorter than its own period. The resulting distribution (in green) increases at any orbital period where a PC has an inner sibling, and (once its value exceeds zero) decreases where a PC lacking inner companions is added to the count, since the denominator accounts for all PCs, including singles and PCs within multis with no inner neighbors.

Similarly, we examine the fractions of PCs with outer companions. The orange curves in Figure 16 show  $\mathcal{F}_{outer}$ (Period), the fraction of transiting planets with at least one transiting sibling with P > Period, which is given by

$$\mathcal{F}_{\text{outer}}(\text{Period}) \equiv \frac{N_{\text{outer}}^{P > \text{Period}}}{N^{P > \text{Period}}}.$$
(5)

The terms on the right-hand side of Equation (5) are defined analogously to those in Equation (4), but note that in this case, planets are added to the distribution starting from the longest period and moving to the shortest. To zeroth order, the solid orange and green curves appear to be mirror images of one another, albeit a bit stretched out toward longer periods. The symmetry and "reflection" near 10 days and somewhat broader shape at long periods all mimic trends visible in the right panel of Figure 13.

The solid curves in Figure 16 can be compared to subsamples (dashed curves) that show the fraction of large planets ( $R_p > 5 R_{\oplus}$ ) that have transiting siblings, where siblings of any size are included. It is well known that giant transiting planets, especially hot Jupiters, rarely have companions that also transit (Latham et al. 2011; Steffen et al. 2012). The dashed curves in Figure 16 quantify the differences, showing (among other things) that large PCs are only one-third as likely

<sup>&</sup>lt;sup>19</sup> The criteria for being counted as having TTVs in Figure 15 differ from those used for coloring planets to denote TTVs in the bottom two panels of Figure 7. Here, we do not count PCs based on a tentative TTV signature identified by Kane et al. (2013), but we include PCs with TTVs identified by Holczer et al. (2016), as well as TTVs being used in our fits (which is the case for all PCs in a multi if we detect TTVs in any of the PCs associated with that target star). The latter criterion includes PCs in multis that do not show TTVs themselves, but we prefer including a small number of planets in multis without TTVs in the distribution of planets with TTVs to the alternative of not testing for TTVs in PCs added to the KOI table in recent years and small number statistics.

<sup>&</sup>lt;sup>20</sup> Our decision to use TTVs in fitting is made on a system-by-system basis. The lower limit quoted here for multis only counts planets with Holczer or Kane TTVs plus one for each system for which we used TTVs in the fits that does not have any planets with Holczer or Kane TTVs, whereas the upper limit includes all planets in systems for which our fits used TTVs.



**Figure 16.** Cumulative fraction of candidates with inner (outer) companions as a function of orbital period, as specified by Equation 4 (Equation 5). The solid green curve shows the cumulative fraction of PCs up to the plotted orbital period that have inner planetary companions (shorter-period PCs associated with the same target star). The solid orange curve marks the cumulative fraction of PCs with *P* larger than the specified period that have even longer-period transiting companions. The dashed curves show the analogous curves for large planets (PCs with  $R_p > 5 R_{\oplus}$ ) having inner or outer planetary companions, with PCs of all sizes except monotransits counting as companion planets. Again, only PCs with S/N > 12 are included for these distributions, although this requirement is not enforced for companions.

to have outer companions and two-thirds as likely to have inner companions as are Kepler PCs overall (note that no effort has been made to attempt to correct these numbers for possible detection biases). Although large planets overall are substantially less likely to have outer companions, large and small planets with  $P \gtrsim 30$  days are equally likely to have one or more outer companions.

### 3.5. Eccentricity and Transit Duration Distributions

The improved estimates of stellar, planetary, and transit parameters in our new catalog (Table 1) enable us to characterize the eccentricity distribution of various subsets of the Kepler planet candidates using the distribution of periodnormalized transit durations. As accurate period estimates are required for this analysis, monotransits (planet candidates with only a single detected transit) were excluded from the analysis in this section. Our analysis presented below shows that there is no evidence for changes in the eccentricity distribution of Kepler PCs as a function of the host star effective temperatures over the range from 4000 to 6200 K. Similarly, we see no dependence on period for the eccentricity distribution for PCs with orbital periods greater than 6 days. In contrast, we show that there are significant differences in the eccentricity distribution as function of planet size and the number of PCs detected by Kepler in a given system. We find marginal evidence suggestive of a trend for planets with a known companion within a factor of 2.04 in orbital period to have a smaller eccentricity than more widely spaced planets. Below, we describe the specific comparisons and statistical tests performed to support these findings.

In order to compare the eccentricity distributions of various subsets of Kepler planet candidates, we begin by measuring the transit duration for each PC. We calculate the posterior mode of the average of the full transit duration,  $T_{1,4}$ , and the duration of the "flat bottom" portion of the transit,  $T_{2,3}$ , normalized by the analogous predicted transit duration for the measured orbital period and host star properties, assuming a circular orbit and central transit (b = 0). Using the notation introduced in Section 2, the normalized transit duration,  $\tau$ , is given by

$$\tau \equiv \frac{T_{1.5}}{T_{1.5}(e = b = 0, P, \rho_{\star})} = \frac{T_{1.4} + T_{2.3}}{T_{1.4}(e = b = 0, P, \rho_{\star}) + T_{2.3}(e = b = 0, P, \rho_{\star})}.$$
 (6)

For planet candidates with  $b \ge 1 - R_p/R_{\star}$ ,  $T_{2,3} = 0$ , and we exclude these cases from our analysis due to difficulty in precisely constraining physical parameters for grazing and near-grazing transits. The particular definition of the normalized transit duration given in Equation (6) was chosen for robustness in measurement, as well as its independence (to first order) of the value of  $R_p/R_{\star}$ . By defining  $\tau$  relative to the duration for b = 0 (rather than the best estimate of b), we avoid a dependence on b, which is advantageous because estimates of the value of impact parameters can have significant measurement uncertainties (Section 2.2 and Table 1).

Planets with  $\tau > 1$  (when accounting for measurement uncertainties) must transit while the planet-star separation exceeds the semimajor axis, and there can be an interesting constraint on the pericenter direction  $\omega$  (e.g., Dawson & Johnson 2012). In most cases,  $\tau$  is comparable to or less than unity, and there is only a minimal constraint on the marginal distribution of  $\omega$ , since the transit duration could be shortened due to either the planet being near pericenter or the impact parameter  $b \neq 0$  (or both). Star-planet orbital planes are isotropically distributed and thus randomly oriented relative to Kepler's line of sight; hence, the intrinsic distributions of the impact parameters (within the range  $b \leq 1$ ) and the pericenter angles (of all planets, not just transiting ones) are nearly uniform. Therefore, the distribution of  $\tau$  provides a useful probe of the eccentricity distribution of a population of transiting planets (Ford et al. 2008). In practice, the distribution of observed impact parameters is affected by detection biases, since shorter transits that occur for larger *b* provide less time in transit to accumulate signal. Fortunately, this is a relatively modest effect for most PCs, since the changes in transit duration, and hence transit signal, are typically small, and most detected PCs have an S/N much greater than required for detection.

Multiple studies have begun to characterize the eccentricity distribution based on the observed period-normalized transit duration ( $\tau$ ) distribution. Moorhead et al. (2011), Kane et al. (2012), Plavchan et al. (2014), and Xie et al. (2016) focused on using the  $\tau$  distribution to characterize the eccentricity distribution (as opposed to modeling the several observed properties at once, as in, e.g., Mulders et al. 2018; Zhu et al. 2018; He et al. 2019; Sandford et al. 2019; He et al. 2020; MacDonald et al. 2020; Yang et al. 2020). The strength of conclusions from these early studies was limited due to the uncertainty in the host star density. While random measurement errors can be easily incorporated into the analysis (Ford et al. 2008), the potential for systematic error is more concerning. For example, Moorhead et al. (2011) showed a trend for the  $\tau$ distribution to broaden with increasing host star temperature, which could be attributed to either the eccentricity distribution changing with host star temperature or the errors in host star densities increasing for stars that have had time to evolve far from the zero-age main sequence. Such concerns helped to motivate follow-up campaigns to characterize host star properties using high-resolution spectroscopy (Fulton & Petigura 2018) and more detailed stellar modeling (Berger et al. 2020), both of which incorporate improved distance measurements from Gaia.

To assess the effects of potential systematic errors in the host star density on the eccentricity distribution, we focus our analysis on planets whose host star properties are available from either Fulton & Petigura (2018) or Berger et al. (2020), both of which represent dramatic improvements of stellar properties from those derived using photometric data (e.g., the KIC). (Asteroseimic densities are expected to be even more accurate but are available for only a substantially smaller subset of planet candidates; Van Eylen & Albrecht 2015; Van Eylen et al. 2019.) While the stellar properties estimated using highresolution spectroscopy (Fulton & Petigura 2018) are likely more accurate than those with lower-resolution spectroscopy, they are not available for a substantial fraction of the stars in the full sample (e.g., most faint stars with a single known transiting planets and stars whose planets were identified after the CKS survey). However, the Fulton & Petigura (2018) properties are available for a substantial majority of the hosts of systems with multiple transiting planets.

Figure 17 compares the cumulative distribution of normalized transit durations ( $\tau$  values) based on using the host star properties from Fulton & Petigura (2018; CKS) and Berger et al. (2020). The orange and green curves are for an overlap sample for which both sets of stellar parameters are available. The thick blue curve shows the results using the Berger et al.

(2020) properties for the full sample. (The result for all transiting planet candidates for which CKS parameters are available is not plotted because it is visually indistinguishable from the overlap sample using stellar properties from CKS.) The distributions of  $\tau$  values for planets using host star properties from Fulton & Petigura (2018) show small, but statistically significant, differences from those using the stellar properties of Berger et al. (2020). Most of this difference arises due to the fact that the CKS sample is significantly less complete than the Berger et al. (2020) sample, particularly for targets with a single transiting planet candidate, and the distributions using the overlap sample are statistically indistinguishable.

In order to minimize the risk of systematic biases, we perform nearly all of our subsequent analyses of the  $\tau$ distribution based on stellar properties from Berger et al. (2020), even when parameters from Fulton & Petigura (2018) are available. The single exception is for comparing the distributions between multiple transiting planet systems of differing multiplicity, where we make comparisons using each set of stellar parameters (since the CKS sample has much better completeness for hosts of multiplanet systems than for singleplanet hosts). We also applied cuts so that our subsequent analysis only includes PCs with a measured orbital period, transit  $S/N \ge 12$  (so other transit parameters are well measured), impact parameter  $b < 1 - R_p/R_{\star}$ , host star temperature between 4000 and 6600 K, planet radii estimated to be smaller than 12.5  $R_{\oplus}$ , and reported uncertainty in the stellar density of less than 25%.

Having defined a sample of 2762 planets for which systematic biases should be minimal, we performed several checks. We verified that there were no significant differences in the  $\tau$  distribution if we increased the thresholds for the minimum transit S/N to be included in our primary analysis. Similarly, we confirmed that using a fixed maximum impact parameter of 0.95 or greater would not affect our conclusions.

Motivated by Moorhead et al. (2011), we divided the sample into four bins based on host star temperature (Figure 18) and performed a four-sample AD test of the null hypothesis that each subsample was drawn from the same distribution. (The AD test is usually more powerful than the more common K-S test. The K-S test is most sensitive to a shift of the distribution but significantly less sensitive to differences in the shape of the wings.) The AD *p*-value was  $<3 \times 10^{-5}$ . The highesttemperature bin is clearly the most discrepant from the other three. If we exclude this bin, the *p*-value from a three-sample AD test is 0.016, much less extreme, but still low enough to reject, at the level comparable to  $2.4\sigma$ , the null hypothesis that the  $\tau$  distribution is the same for the three remaining subsets of host stars with 4000 K  $\leq T_{\text{eff}} \leq 6200$  K.

Moorhead et al. (2011) also saw significant differences between planets orbiting stars with temperatures above and below the Kraft break ( $\approx$ 6200 K). (Main-sequence stars with effective temperatures greater than the Kraft break have negligible convective envelopes, resulting in dramatically reduced tidal dissipation in the star compared to cooler main-sequence stars.) However, uncertainty in stellar parameters led them to focus on stars with  $T_{\rm eff} \leq 5100$  K, rather than risk confusing changes in the  $\tau$  distribution due to the eccentricity distribution with those caused by measurement uncertainties and selection effects. Thanks to improved stellar parameters made possible by Gaia distance measurements, we no longer find differences in the  $\tau$  distribution for stars cooler than the



**Figure 17.** Cumulative distribution of  $\tau$ , the normalized transit duration (Equation 6), based on stellar properties from either Berger et al. (2020) or Fulton & Petigura (2018; CKS). The thick blue curve is the sample used for our primary analysis of transit durations. The orange and green curves are for a smaller sample of PCs for which both Berger and CKS stellar parameters are available. The period-normalized transit duration distributions based on the different stellar properties do not differ significantly if we restrict the comparison to the same sample. The difference between the full and overlap samples is primarily due to the CKS sample favoring stellar hosts of multiplanet systems (see Figure 20) and bright target stars, which implicitly affects both the stellar properties and Kepler's sensitivity to PCs around those stars.

Kraft break and see a more significant difference between the  $\tau$  distribution of planets with stars on either side of the Kraft break.

These differences are unlikely to be due to uncertainties in stellar properties for stars with 6200 K  $\leq T_{eff} \leq 6600$  K, since imposing strict cuts on uncertainty in stellar densities has a minimal effect on this subset. The observed differences could be partially due to the reduced efficiency of tidal dissipation in hotter stars with no significant convective envelope. However, we caution that the differences do not go away, even if we focus only on planets with periods greater than 10 days, for which tidal effects during the main sequence would be small.

Therefore, subsequent analyses of the  $\tau$  distribution are focused on planets with host stars with 4000 K  $\leq T_{\text{eff}} \leq 6200$  K, so as to minimize the risk of systematic bias (e.g., due to small planets being more readily detectable around bright stars). These restrictions leave us with 2485 planets. For the analyses below, we only consider those PCs that passed all of these cuts in determining system multiplicity. However, we do consider PCs that were rejected by these cuts in determining the smallest period ratio to a neighboring planet in Section 3.5.5.

#### 3.5.1. Fitting the Eccentricity Distribution

We attempted to fit multiple simple analytic models to the observed  $\tau$  distribution. For each analytic model, we generate

simulated populations of planets assuming a uniform distribution of  $\omega \sim U[0, 2\pi)$  and  $b \sim U[0, b_{\text{max}})$ , where  $b_{\text{max}} =$  $1 - R_p/R_{\star}$  is based on the value reported in Table 1 for each planet. We sample the planet-star radius ratio, orbital periods, and stellar densities from those of the observed sample and add measurement noise based on the reported uncertainties (parameterized as mixture of two half-Gaussians). We weight each simulated planet by its geometric transit probability, which accounts for the dependence on the e and  $\omega$  drawn for each planet. (However, this does not account for how differences in transit duration affect the detection probability conditional on the planet transiting, as done in He et al. 2019, 2020). We find that a Rayleigh distribution of eccentricities that is truncated to be less than 1, which is best fit with a Rayleigh parameter of 0.053, is not sufficient to reproduce the observed  $\tau$  distribution (see Figure 19, red dashed curve). Using a small Rayleigh parameter underpredicts the number of extreme  $\tau$  values, while using a large Rayleigh parameter results in too broad a distribution. This led us to consider a continuous mixture of Rayleigh distributions, where the weights for each Rayleigh parameter are proportional to a Rayleigh distribution (with Rayleigh parameter 0.043), i.e., a Rayleigh of Rayleighs, as in Section 6.1.2 of Lissauer et al. 2011b. While this results in a slight improvement in the fit for long-duration transits, it does not significantly improve the fit



**Figure 18.** Cumulative distribution of  $\tau$ , the normalized transit duration, for four subsets of PCs based on the effective temperature of their host star reported in Berger et al. (2020). The subsets are 4000–5200 K (black dotted), 5200–5600 K (blue solid), 5600–6200 K (green dashed–dotted), and 6200–6600 K (red dashed). A four-sample AD test strongly rejects the null hypothesis that the  $\tau$  distributions are drawn from a single population. Excluding the 6200–6600 K bin, a three-sample AD test still nominally rejects the null hypothesis that the remaining bins are drawn from a common distribution, but with weak significance.

for  $\tau$  in the range of 0.8–1.0 (see the left panel of Figure 19, green dotted–dashed curve).

More detailed modeling of the joint probability density function (PDF) of multiplicity, inclination, and eccentricity distributions suggests that the joint PDF is not simply the product of the distribution for each quantity individually (Millholland et al. 2017; He et al. 2019, 2020; Yang et al. 2020). Therefore, we do not attempt to perform a detailed characterization of the uncertainties in such a model.

While the transit duration distribution can provide a powerful constraint on parameters given an assumed functional form for the eccentricity distribution, it has much less statistical power for comparing different functional forms for the eccentricity distribution. This is illustrated by the substantial differences between the two histograms in the right panel of Figure 19, despite the very similar predictions of the two models for the transit durations (dashed and dotted–dashed curves in left panel).

#### 3.5.2. Transit Duration versus Multiplicity

Long-term orbital stability and planet formation models suggest that the eccentricity and mutual inclination distributions of planets depend on the multiplicity of their host planetary system (Pu & Wu 2015; Bartram et al. 2021; Gratia & Lissauer 2021). Indeed, previous studies of the observed transit duration ratio distribution find evidence that the mutual inclination distribution decreases with the multiplicity of the inner planetary system (He et al. 2020; Yang et al. 2020). Therefore, in Figure 20, we compare the  $\tau$  distributions for (i) systems with a single known transiting planet candidate ("singles"), (ii) systems with two known transiting PCs ("doubles"), (iii) systems with three known transiting PCs ("triples"), and (iv) systems with four or more known transiting PCs ("high multiplicity").

Both the K-S and AD tests strongly reject the null hypotheses that the  $\tau$  distributions of planets smaller than 5  $R_{\oplus}$  are the same when comparing singles and doubles  $(p_{\rm KS} \approx 3.3 \times 10^{-4}, p_{\rm AD} \approx 1.5 \times 10^{-5})$ . Comparing all multiples to singles, both the K-S and AD tests very strongly reject the null hypothesis that the  $\tau$  distributions are the same  $(p < 10^{-14})$ , confirming the result that Xie et al. (2016) obtained for a smaller sample of Kepler PCs whose host stars had been characterized using spectra obtained by LAMOST. When comparing the  $\tau$  distributions of PCs in doubles to those of PCs in higher-multiplicity systems, the *p*-values for the K-S and AD tests are  $\approx 1.3 \times 10^{-5}$  and  $\approx 1.4 \times 10^{-6}$ , respectively. (If using the CKS stellar properties, then the *p*-value for the K-S test decreases to  $\approx 2.4 \times 10^{-6}$ , but the *p*-value for the AD test does not change significantly.) The significance is strengthened by the clear pattern of the  $\tau$  distribution becoming more highly concentrated near unity as one moves from singles to doubles to higher-multiplicity systems. When comparing the  $\tau$  distributions of PCs in triples to those of PCs in systems with  $\geq$  four detected PCs (using CKS stellar parameters), the *p*values for the K-S and AD tests are  $\approx 0.01$  and  $\approx 0.009$ , respectively.



**Figure 19.** Left: cumulative distributions of  $\tau$ , the normalized transit duration, for our sample of Kepler (dotted black curve) and two simulated populations. The eccentricity is drawn from a single Rayleigh distribution with Rayleigh parameter  $\sigma = 0.053$  (red dashed curve), and the eccentricity distribution is drawn from a continuous mixture of Rayleigh distributions with weights given by a Rayleigh distribution with  $\sigma = 0.043$  (green dotted–dashed curve). Neither model reproduces both the rapid rise of the  $\tau$  distribution due to low-eccentricity planets and the tail of planets with  $\tau$  larger than unity seen in the Kepler sample. Right: the eccentricity distributions implied by either the best-fit Rayleigh distribution (green) or the Rayleigh distributions (orange) described above. While the two models make very similar predictions for the distribution of normalized transit durations, they have substantially different implications for the tail of the eccentricity distribution.

Note that the observed transit duration distributions for multiple-planet systems are subject to complex observational biases due to a combination of transit S/N and geometric transit probabilities that can be correlated within a planetary system. Properly accounting for these biases requires a full forward model that accounts for the joint distribution of planet sizes, orbital periods, eccentricities, and inclinations. For example, He et al. (2019, 2020) find that the mutual inclination distribution is narrower for systems with more detected transiting planets. However, a narrow distribution of mutual inclinations does not imply a narrow distribution of impact parameters. Even small mutual inclinations can cause significant  $\Delta b$  between planets (by construction, since Kepler detects planets with  $b \leq 1$ ). Further, the  $\Delta b$  can have either a positive or negative sign. Indeed, we have verified that the distribution of maximum-likelihood estimates of bs is not more narrowly peaked for widely spaced multiple-PC systems than for closely spaced multiplanet systems (nor that of systems with only a single detected PC). Therefore, we conclude that the difference in normalized transit duration distribution shown in Figure 20 is primarily due to differences in the eccentricity distributions between systems with one, two, or more detected transiting PCs. The strength of these differences is consistent with the change in eccentricity distribution as a function of the number of detected transiting planets resulting primarily from the constraints imposed by long-term orbital stability (He et al. 2020).

#### 3.5.3. Transit Duration versus Orbital Period

We next compare the  $\tau$  distribution for planets as a function of orbital period. Dividing the sample at 11.8 days (near the median orbital period of our sample), the *p*-values for the K-S and AD tests are  $\approx 0.092$  and 0.045, respectively. Figure 21 partitions the sample into five subsets with boundaries at 2, 6, 12, and 24 days, for which the five-sample AD test *p*-value is 0.15. The biggest difference across subsets is that the two shortest-period subsets have the sharpest  $\tau$  distributions (implying lower eccentricities). If we combine PCs with periods of 0–2 and 2–6 days, then the

*p*-value for a four-sample AD test is 0.08. If we perform a twosample AD test for PCs with periods of 0–6 days and PCs with period in 6–1200 days, then the *p*-value for an AD test is 0.012. It is tempting to attribute the differences in transit duration as primarily due to the increased efficiency of orbital circularization for small orbital periods. However, we caution that the size distribution of the PCs with P < 6 days is weighted toward significantly smaller values than the size distribution of PCs with larger periods, since Kepler has greater sensitivity for detecting planets at shorter orbital periods.

#### 3.5.4. Transit Duration versus Planet Size

Splitting the cumulative  $\tau$  distributions for planet candidates by planet radius at 2.16  $R_{\oplus}$  (near the median planet size of our sample), the *p*-value for the K-S test is 0.15, and the *p*-value for the AD test is 0.07. Thus, neither of these tests finds statistically significant differences between the two samples.

For the left panel of Figure 22, we divide the population into subsets based on theoretically motivated size bins with boundaries of 0.5, 1.0, 1.6, 1.8, 2.7, 5.0, 9.0, and  $12.5 R_{\oplus}$ . Visual inspection shows a similarity between the distributions of the two smallest size bins; the three middle size bins also appear to have similar size distributions to one another, as do the distributions for the two largest size bins. Furthermore, statistical tests do not find any significant differences among the distributions within any of these three subsets of planet size bins.

Thus, we combine PCs into three size bins, 0.5–1.6, 1.6–5, and 5–12.5  $R_{\oplus}$ , in the right panel of Figure 22. The hypothesis that all three of these bins have the same underlying distributions can be strongly rejected, with *p*-value ~ 10<sup>-11</sup> (using a threesample AD test), and comparing any pair of these three results in a *p*-value of <10<sup>-3</sup> (K-S tests) or <10<sup>-4</sup> (AD tests), showing highly significant evidence for differences in the eccentricity distributions between these three broad size bins. Further supporting this interpretation, PCs with  $R_p \leq 1.6 R_{\oplus}$  have a particularly concentrated  $\tau$  distribution (i.e., small eccentricities), while that for PCs with  $R_p > 5 R_{\oplus}$  has a relatively large tail



**Figure 20.** Comparison of the  $\tau$  distribution of planet candidates with  $R_p \leq 5 R_{\oplus}$  in systems with a single known transiting PC ("singles"; solid curve), two known transiting PCs ("doubles"; dotted curves), three known transiting PCs ("triples"; dotted–dashed curves), and four or more known transiting PCs ("4+" systems; dashed curves). Light blue curves are based on stellar properties from CKS (Fulton & Petigura 2018) instead of the Berger et al. (2020) catalog (shown in black). Since CKS parameters are not available for all stars, the PC samples used to compute the blue curves differ somewhat from those used for the the black curves. No blue curve is shown for singles because CKS only analyzed a small fraction of the fainter stars hosting just one PC. In contrast, the CKS survey devoted extra effort to survey hosts of multiplanet systems (Petigura et al. 2017), so the differences in the samples are smaller and more random. Both the K-S and AD tests strongly reject the null hypothesis that the distributions for PCs in singles and doubles are drawn from the same population. Similarly, we reject the null hypothesis that any pair of  $\tau$  distributions for doubles, triples, and higher-multiplicity systems is drawn from the same distribution.

(i.e., larger eccentricities), with PCs 1.6  $R_{\oplus} < R_p \le 5 R_{\oplus}$  having an intermediate distribution of  $\tau$  values.

These differences are consistent with the observation that planet sizes (and likely masses) are correlated within a planetary system (Ciardi et al. 2013; Millholland et al. 2017; Weiss et al. 2018; He et al. 2020), together with the theoretical idea that more massive planets excite larger eccentricities in neighboring planets via planet-planet scattering and/or secular perturbations (Laskar 2000; Ford & Rasio 2008; Johansen et al. 2012; Pu & Wu 2015). However, they run counter to (although do not necessarily conflict with) the expectation that within a given planetary system, equipartition of the angular momentum deficit would typically lead to more massive planets having smaller eccentricities (Lissauer 1995). To contrast the eccentricities of large and small PCs within the same system, we looked at all systems with two or more PCs with 6 days < P < 1200 days (the lower limit being chosen to minimize the effects of tidal damping; see Figure 21) that meet our criteria for analysis in this section and found that in 136 out of 273 cases (50%), the largest such planet has a larger value of  $\tau$  than the smallest planet. This implies that there is not a strong preference for PCs within a given inner planetary system to have different eccentricity distributions (after one removes planets potentially affected by tidal circularization). These conclusions are not affected

by restricting the sample to PCs with orbital periods greater than 8 days (rather than 6 days).

#### 3.5.5. Transit Duration versus Spacing between Orbits

We divided planets in multiple-planet systems (excluding the split multis KOI-284 and KOI-2248; see Section 3.2) into two or four nearly equal-size subsets based upon their period ratios with their nearest detected neighbor in  $\log P$ . The period ratio boundaries are the first three quartiles of the period ratio distribution, 1.65, 2.06, and 2.94. Very closely spaced planet pairs typically need to have small eccentricities to avoid close encounters (with potential for exceptions related to resonances). As expected, the period-normalized transit duration distribution is more sharply peaked for PCs with a nearby neighbor. However, there was not a statistically significant difference in the  $\tau$  distribution between these subsets of PCs based on performing a two- or four-sample AD test using our nominal sample of PCs. However, if, as shown in Figure 23, we exclude planets with orbital periods less than 8 days (intentionally larger than 6 days to be confident that we exclude all PCs that are likely to be significantly affected by tidal circularization), then the two-sample AD test rejects the null hypothesis that the observed normalized transit duration distributions for the different subsets of planets (based on



**Figure 21.** Comparison of the cumulative  $\tau$  distribution for planets divided into five subsets based on their orbital period. The curves correspond to P < 2 days (solid light blue), 2 days < P < 6 days (dashed royal blue), 6 days < P < 12 days (dotted black), 12 days < P < 24 days (dotted-dashed green), and 24 days < P < 1200 days (double dotted-dashed red). A five-sample AD test fails to reject the null hypothesis that the  $\tau$  distribution for all subsets is drawn from a common distribution. However, if we compare planets with P < 6 days to planets with 24 days < P < 1200 days, then a two-sample AD test rejects the null hypothesis that the  $\tau$  distribution for all subsets is drawn from a common distribution with a p-value of 0.01. This is consistent with expectations if tidal forces are effective at circularizing a significant fraction of planets with P < 6 days.

period ratio to nearest detected neighbor) are drawn from the same underlying distribution with a *p*-value of 0.037.

We also compared the duration distributions of planet candidates in multiple-planet systems near first-order MMRs with those of other PCs in multiple-planet systems and did not find statistically significant differences. However, we note that the number of PCs near resonances is small (214), so nontrivial differences in the distributions may become evident when larger samples become available for study (e.g., combining Kepler, K2, TESS, and PLATO data).

# 4. Long-term Average Planetary Orbital Periods

The fractional uncertainties quoted for the periods of the vast majority of planet candidates listed in Table 1 are  $<10^{-5}$ , with  $\sim 10^{-6}$  being typical (corresponding to 2 minutes per 4 yr). These values represent the formal uncertainties in the best-fit, constant-period ephemeris computed using the measured midpoints of transits and adjusted for the motion of the spacecraft relative to the rest frame of the barycenter of our solar system (Section 2.4). However, as discussed below, the actual mean orbital periods of the planets can differ from the values given in Table 1 by many times the listed uncertainties. For studies of the architectures and dynamics of planetary systems, the mean orbital period,  $\bar{P}$ , is generally far more important than the mean time interval between transits measured directly from Kepler data, *P*.

Typical radial velocities of Kepler target stars relative to the barycenter of the solar system are of order  $10^{-4}$  times the speed of light, so the actual periods of the planets in the rest frame of their planetary system differ from the measured orbital periods by that fractional amount due to time dilation. This small error in tabulated orbital periods is not important to understanding the dynamics of an exoplanetary system because relativistic effects within these systems are small and the periods of all planets in a given system are altered by the same factor, so period ratios remain unchanged. Moreover, the radial velocities of these planetary systems do not vary substantially, so ephemerides are also not significantly affected.<sup>21</sup>

In contrast to time dilation caused by uniform stellar motion relative to our solar system, TTVs may produce errors in estimated planetary orbital periods that must be accounted for in some dynamical investigations and also when making ephemeris predictions. Periodic TTVs with timescales that are short compared to the interval of Kepler observations largely

<sup>&</sup>lt;sup>21</sup> If the planet's host star is a member of a binary star system, then its RV relative to the solar system can vary by a nontrivial amount. Consider a binary of two 1  $M_{\odot}$  stars on a circular orbit with a semimajor axis of 100 au that is viewed edge-on. The orbital period is 707 yr, and when the stars are near one of the eclipses, their relative RV observed from our solar system is changing at a rate of ~18 m s<sup>-1</sup> yr<sup>-1</sup>  $\approx 6.1 \times 10^{-8} c yr^{-1}$ , where *c* represents the speed of light in vacuo. Thus, ignoring other factors, the ratio of the periods of planets around one of these stars to those around the other should be changing by  $\sim 6 \times 10^{-8} yr^{-1}$ , which for a precision of 1 part in 10<sup>6</sup> would be detectable from two sets of observations taken a few decades apart.



**Figure 22.** Comparison of the normalized cumulative  $\tau$  distributions for planets grouped by size. Left panel: subsets are  $0.5 R_{\oplus} < R_p \leq 1.0 R_{\oplus}$  (dotted light blue),  $1.0 R_{\oplus} < R_p \leq 1.6 R_{\oplus}$  (solid dark blue),  $1.6 R_{\oplus} < R_p \leq 1.8 R_{\oplus}$  (dotted light green),  $1.8 R_{\oplus} < R_p \leq 2.7 R_{\oplus}$  (dashed dark green),  $2.7 R_{\oplus} < R_p \leq 5.0 R_{\oplus}$  (dotted light red),  $5 R_{\oplus} < R_p \leq 9 R_{\oplus}$  (dashed-dotted dark red), and  $9 R_{\oplus} < R_p \leq 12.5 R_{\oplus}$  (double dashed-dotted orange). A seven-sample AD test strongly rejects the null hypothesis that each subset is drawn from a common distribution (*p*-value  $\approx 4 \times 10^{-11}$ ). The two smallest radius curves are among the three subsets with the most highly concentrated  $\tau$  distribution, whereas the two largest radius curves are the subsets with the largest tails. Both of these would be expected if larger (and thus more massive) planets have typically experienced more significant dynamical excitation (e.g., planet–planet scattering followed by secular evolution). Right panel: subsets are  $0.5 R_{\oplus} < R_p \leq 1.6 R_{\oplus}$  (solid blue),  $1.6 R_{\oplus} < R_p \leq 5 R_{\oplus}$  (dotted green), and  $5 R_{\oplus} < R_p \leq 12.5 R_{\oplus}$  (dashed red). A three-sample AD test strongly rejects the null hypothesis that each subset is drawn from a common distribution (*p*-value  $\sim 10^{-11}$ ).

average out and do not produce significant errors in our estimates of orbital periods. However, when the TTV timescale is long compared to the Kepler observations, the period estimated from a hypothetical future set of TT observations of similar quality and duration to the Kepler data could differ significantly. For example, using the integrations of planets in the Kepler-80 (KOI-500) system performed by MacDonald et al. (2016), we see that the observed orbital period changes by as much as a few  $\times 10^{-4}$  days—several times larger than the reported uncertainties-when averaged over 8 yr of data instead of 4 yr. The cause of this discrepancy is that the Kepler observations cover less than half of a TTV cycle (Figure 27), and therefore the observed orbital period is not the same as the long-term mean period. Note that in this case, some of the planets' periods were observed near the turning points in their evolution, far from the mean, as should often be the case. This is compounded by other subtle issues like uncertain apsidal/nodal precession and differences between the measured anomalistic period and the true orbital period.

Holczer et al. (2016) produced a catalog of Kepler planet candidates displaying periodic TTVs with timescales that are comparable to or shorter than the interval of Kepler observations. Their Table 6 lists estimated long-term mean orbital periods for 199 PCs based upon fitting a period plus a sinusoidal modulation to observed TTs. Figure 24 compares our estimates of orbital periods to those in their Table 6. Inspection of these plots shows that the differences between Holczer et al.'s (2016) sinusoidal-fit estimates of planetary periods and the ones that we list in Table 1 are positively correlated with the uncertainties listed in our table. In most cases, the difference between the estimates given in the two papers is less than our tabulated uncertainties, although the difference greatly exceeds our error estimates for some planets. The uncertainties given in Holczer et al.'s (2016) Table 6 are typically much smaller than ours; however, since the period uncertainties that they obtained using constant-period fits (their Table 2) are even smaller for most planets, we caution the reader against overinterpreting their quoted uncertainties.

### 4.1. Apse Precession and TTVs

Precession causes the time interval between successive periapse passages to differ from the time interval required to travel 360° in azimuth (which is the reason that anomalistic periods differ from orbital periods). This non-Keplerian behavior leads to eccentric planets spending a little less time at some radial distances between successive transits, resulting in variations in time intervals between successive transits that average out only over timescales much longer than that of Kepler observations (Agol et al. 2005).

The eccentricity of a planet near resonance can be viewed as a superposition of its free and forced eccentricity vectors in the  $(e \sin \omega, e \cos \omega)$  plane. The precession of the forced eccentricity is relatively rapid and accounts for some of the TTVs that are found among Kepler planets; its effects are partially accounted for in period estimates. The precession of the free eccentricity is much slower. It is another source of TTVs, which we refer to as secular TTVs. However, if  $\Delta \varpi T_{obs}/P \ll 1$ , i.e., precession is  $\ll 2\pi$  during Kepler's prime mission, then the secular TTVs will not be recognized and thus cannot be removed from/accounted for in calculations of the planet's period. Secular precession of the planets' free eccentricities is unrelated to resonances and generally has a period much longer than the baseline of the Kepler observations, so it is not accounted for in our estimates of mean periods and the uncertainties thereof (nor was it in previous Kepler planet candidate catalogs). Consider a planet with eccentricity  $e \ll 1$  whose longitude of periapse precesses by  $\Delta \varpi \ll 1$  rad orbit<sup>-1</sup> and that transits near periapse. During the interval of time between successive periapse passages, the planet moves through  $2\pi + \Delta \varpi$  rad. As the planet completes one radial oscillation during this interval, its average angular velocity is equal to the long-term average value. However, from Kepler's second law, we know a line from the star to the planet sweeps out angle at a rate 1 + e times as fast near periapse. Thus, the (measured) time interval between successive transits, P, is related to the mean orbital period  $\bar{P}$  and the difference between



**Figure 23.** Comparison of cumulative  $\tau$  distributions for planet candidates in multiplanet systems with orbital periods greater than 8 days. The two curves show results for subsets chosen based on the orbital period ratio. Here, the closely spaced subset of PCs is defined as those having a detected companion PC (which could have P < 8 days) with a period within a factor of 2.06, a value selected so that each curve represents nearly the same number of PCs. The widely spaced subset is the complement of the closely spaced PCs. A two-sample AD test rejects the null hypothesis that the  $\tau$  distributions for the closely and widely spaced PCs are drawn from a common distribution (*p*-value = 0.037).

the longitude of periapse and that of the transit midpoint by

$$\frac{P}{\bar{P}} = 1 - \frac{e\Delta\varpi}{2\pi}\cos\varpi.$$
(7)

As the cosine term in Equation (7) integrates to zero, this effect averages out over one precession period of the eccentricity. Nonetheless, the long-term mean orbital period can differ significantly from the mean period between successive transits during the Kepler era, even for planets having TTVs that are too small to be observable during the epoch of Kepler observations.

As planets in Kepler multis typically have eccentricities of one to several percent (Jontof-Hutter et al. 2016; Xie et al. 2016),  $\overline{P} - P \ll P$ , but can nonetheless be much larger than the formal uncertainties in measured orbital periods. The difference between these periods is so small that it can be ignored for our comparisons of the period distributions of various subsets of the Kepler sample (Section 3.4) and for most studies of the period ratios of two planets. However, the (illquantified) errors in our estimates of  $\overline{P}$  are important for studies of the distribution of three-body resonances (J. J. Lissauer et al. 2024, in preparation).

### 4.2. Case Studies of Select Dynamically Solved Planetary Systems

TTVs have been used for detailed dynamical analyses of a small fraction of the Kepler multiplanet systems. Most of the

publications presenting these studies list osculating orbital periods at an epoch near the midpoint of the Kepler data. For several landmark systems, we integrated numerous (in most cases, 101) samples of system parameters from the MCMC chains deduced via photodynamical or TTV analyses of the Kepler data to compute estimated TTs during and after the Kepler epoch. Table 4 compares orbital periods (in most cases, at an epoch near the midpoint of Kepler observations) from the dynamical solutions to long-term average periods of these planets that we computed by integrating these dynamically solved systems, our standard estimates of the orbital periods obtained via a best constant-period fit to observed TTs (Table 1), and (where available) to the average orbital periods estimated in the sinusoidal fits of Holczer et al. (2016). The values of "P at epoch" in Table 4 for the planets of Kepler-29 and Kepler-60 represent osculating orbital periods at the epochs listed in the subsections below, following our dynamical fits to the TTs reported by Rowe & Thompson (2015).

Period variations for one or more of the planets in each of these dynamically active multiplanet systems are shown in Figures 25–31. Each panel within these figures shows three samples, which we selected by ordering the solutions by the long-term average period of the first KOI found in the system (KOI number ending in .01), then selecting the median member of the list (usually the sample with the 51st longest value, in black), one with that planet's period roughly one standard deviation shorter than the mean (17th sample, in red), and one



**Figure 24.** Comparison between the orbital periods listed in our Table 1 (*P*, denoted  $P_{const}$  here) and those presented in Table 6 of Holczer et al. (2016),  $P_{sin}$ . The horizontal coordinate represents the fractional uncertainty given in Table 1, the length of the bars shows Holczer et al. 's (2016) fractional uncertainty, and the vertical coordinate represents the fractional differences between our periods and those of Holczer et al. (2016). Open circles represent planets in multis; black filled circles represent single planets. The plot on the upper left shows the largest scale, and successive plots (upper right, lower left, and lower right) zoom in by a factor of 5 relative to the previous plot. The green diagonal lines divide planets whose period estimates differ between the two tables by more than their uncertainties in our table (above and to the left) from those whose period differences are less than our uncertainties (below and to the right). One planet, the single KOI-1209.01, which has an orbital period of about 9 months, lies outside the range of the plots, with a fractional period difference of  $3.9 \times 10^{-3}$ , far larger than either the fractional uncertainty in Table 1 ( $3.6 \times 10^{-6}$ ) or that in Holczer et al.'s (2016) table ( $5.2 \times 10^{-6}$ ); its location is pointed to by the arrow at the upper left of the largest-scale plot. Colored points indicate planets in the dynamically "solved" systems of interest explored in this section: Kepler-11 (orange), Kepler-36 (cyan), Kepler-60 (purple), Kepler-80 (blue), Kepler-223 (magenta), and Kepler-419 (olive).

with this planet's mean period one standard deviation longer than the mean (85th sample, in blue).

All of the systems that we analyze in this subsection have strong interactions among all or most of the known planets, leading to substantial TTVs. Three of these systems, Kepler-11, Kepler-36, and Kepler-419, do not have any planets known to be librating within orbital resonances. One system, Kepler-29, has two planets that are locked in a 9:7 (second-order) MMR. The other three systems considered below, Kepler-60, Kepler-80, and Kepler-223, each have three or more planets locked into a resonant chain that includes (zeroth-order) three-body resonances and probably first-order two-body MMRs (in some cases, it is not known whether or not the two-body resonance variables are librating). To estimate the long-term periods of all known transiting planets in the abovementioned seven Kepler planetary systems, we ran simulations with an embedded Runge–Kutta Prince–Dormand integrator (Prince & Dormand 1981; gsl\_odeiv2\_-step\_rk8pd within the GNU Scientific Library, Gough 2009). From the TTs (more precisely, the times near inferior conjunction when the distance between the center of the planet and that of the star projected onto the plane of the sky reaches a minimum, as we typically do not have sufficient information on the impact parameter to know whether or not a transit actually occurs) simulated over the specified interval (typically 1000 yr) beginning with the start of Kepler observations, we determine the best-fitting linear ephemeris. The transit periods thus derived are given in the final column of Table 4. Due to

 Table 4

 Orbital Periods, in Days, of Selected Well-studied Planets Estimated Using Various Methods

Comparison of Estimates of Orbital Periods of Select Planets						
KOI	Kepler-	P (Table 1)	P (Holczer et al. 2016)	P at Epoch	Ē	
157.06	11 b	$10.304031 \pm 0.000026$		$10.30260 \pm 0.00027$	$10.30391 \pm 0.00004$	
157.01	11 c	$13.024917 \pm 0.000018$	$13.0249115 \pm 0.0000014$	$13.02555 \pm 0.00018$	$13.02507 \pm 0.00004$	
157.02	11 d	$22.687141 \pm 0.000037$		$22.68546 \pm 0.00037$	$22.68708 \pm 0.00003$	
157.03	11 e	$31.995517 \pm 0.000067$	$31.9954254 \pm 0.0000009$	$31.99834 \pm 0.00052$	$31.99555 \pm 0.00004$	
157.04	11 f	$46.68587 \pm 0.00027$	$46.6857474 \pm 0.0000036$	$46.6933 \pm 0.0018$	$46.6855 \pm 0.0005$	
157.05	11 g	$118.37857 \pm 0.00025$		$118.38089 \pm 0.00057$	$118.3782 \pm 0.0005$	
277.02	36 b	$13.84899 \pm 0.00034$	$13.848692 \pm 0.000006$	$13.849194 \pm 0.00004$	$13.848063 \pm 0.0002$	
277.01	36 c	$16.231949 \pm 0.00026$	$16.232080 \pm 0.000001$	$16.231774 \pm 0.00002$	$16.232628 \pm 0.0002$	
500.05	80 f	$0.9867860 \pm 0.0000013$		$0.9867873 \pm 0.0000044$	$0.9867862 \pm 0.0000012$	
500.03	80 d	$3.0721523 \pm 0.0000058$		$3.07253 \pm 0.00029$	$3.0721293 \pm 0.0000086$	
500.04	80 e	$4.6453934 \pm 0.0000084$		$4.64474 \pm 0.00022$	$4.645410 \pm 0.000014$	
500.01	80 b	$7.0535287 \pm 0.0000094$	$7.0535152 \pm 0.0000013$	$7.05357 \pm 0.00036$	$7.053570 \pm 0.000025$	
500.02	80 c	$9.521646 \pm 0.000014$	$9.5216221 \pm 0.0000013$	$9.52330 \pm 0.00030$	$9.521525 \pm 0.000047$	
500.06	80 g	$14.64538 \pm 0.00011$		$14.6503 \pm 0.0018$	$14.6457 \pm 0.0013$	
730.04	223 b	$7.384456 \pm 0.000072$		$7.38449 \pm 0.00022$	$7.3845 \pm 0.0002$	
730.02	223 с	$9.848211 \pm 0.000082$		$9.84564 \pm 0.00052$	$9.84934 \pm 0.00014$	
730.01	223 d	$14.78701 \pm 0.00018$	$14.7869296 \pm 0.0000095$	$14.78869 \pm 0.00029$	$14.7841 \pm 0.0002$	
730.03	223 e	$19.72434 \pm 0.00033$	$19.725722 \pm 0.000018$	$19.72567 \pm 0.00055$	$19.7256 \pm 0.0007$	
738.01	29 b	$10.339236 \pm 0.000056$		$10.33842 \pm 0.00029$	$10.336927 \pm 0.000025$	
738.02	29 c	$13.28712 \pm 0.00011$		$13.28841 \pm 0.00053$	$13.290961 \pm 0.000037$	
1474.01	419 b	$69.7262 \pm 0.0012$	$69.7281819 \pm 0.0000004$	$69.7960 \pm 0.0042$	$69.7869 \pm 0.0454$	
2086.01	60 b	$7.132950 \pm 0.000041$		$7.13335 \pm 0.00013$	$7.1325157 \pm 0.000025$	
2086.02	60 c	$8.918977 \pm 0.000041$	$8.91867 \pm 0.00020$	$8.91866 \pm 0.00018$	$8.919029 \pm 0.000004$	
2086.03	60 d	$11.89825 \pm 0.00010$		$11.89810 \pm 0.00020$	$11.899566 \pm 0.000070$	

Note. From left to right, the columns give the values presented in Table 1 of this work, Table 6 of Holczer et al. (2016), period at epoch (typically near the mid-time of Kepler observations) from dynamical fits to TTs, and long-term (averaged over the same intervals used for ordering the samples to select representative systems shown in Figures 25–31;  $10^4$  yr for Kepler-419 b,  $10^6$  days  $\approx 2738$  yr for Kepler-11's planets, 100 yr for Kepler-80, 1000 yr for planets in other systems) average periods computed by integrating the systems using samples of the initial conditions at epochs obtained from dynamical studies.

numerical dissipation, our nonsymplectic code causes the orbital periods to decrease slightly; in a run for 1 million days with only the 10 day planet Kepler-11 b,  $P_b$  decreased by  $-1.16 \times 10^{-6}$  day. For simulations with all six planets of Kepler-11,  $P_b$  averages a loss of  $-5.8 \times 10^{-7}$  days, which is a systematic bias but is dwarfed by the statistical uncertainty of  $\sim 4 \times 10^{-5}$  days for that system. (We would advocate using a symplectic algorithm for integrations longer than those reported here.)

We present the results of our modeling in the rightmost columns of Table 4 and Figures 25–31. Note the differences in the mean period and period at the epoch of the various solutions that fit the observed data, as well as the differences of the periods averaged over 4 yr when taken starting at differing times for three representative solutions for each of the planets.

#### 4.2.1. Kepler-11 = KOI-157

Six transiting planets are known to orbit Kepler-11, all larger and more massive than the Earth but less massive than Uranus. Each of the five inner planets is located near but not in a firstorder MMR with one or two of its neighbors. The inner pair, b and c, are slightly wide of the 5:4 MMR; the third and fifth planets, d and f, are just wide of the 2:1 resonance, whereas the fourth and fifth planets, e and f, are orbiting a bit closer to one another than the 3:2 resonance. The outer planet, g, orbits well exterior to the inner five. Values of the osculating orbital periods for Kepler-11's planets, taken from Bedell et al. (2017), are at epoch  $T_{\rm BJD} = 2455700$ . Figure 25 shows the orbital period evolution of all six planets as calculated for three of the 101 simulations, selected by rank according to the mean period of Kepler-11 c (KOI-157.01) over the  $10^6$  day interval as discussed above. Note that 4 yr running averages of the periods of the dynamically active five inner planets vary substantially more than the uncertainties in the measured mean periods during the Kepler epoch, especially for the two shortest-period planets.

### 4.2.2. Kepler-36 = KOI-277

Kepler-36 has two planets, each more than four times as massive as Earth, on orbits moderately close to the 7:6 MMR. The planets are not in a low-order MMR, but their proximal orbits lead to strong dynamical interactions. The outer planet, which is a bit less than twice as massive as the inner one, nonetheless has 15 times the volume. Some planetary parameters allowed by short-term fits to the Kepler data in the system discovery paper by Carter et al. (2012) were subsequently eliminated by imposing the requirement for long-term stability (Deck et al. 2012).

We performed a photodynamical analysis of the data using the PhotoDynamical Multiplanet Model (PhoDyMM; D. Ragozzine et al. 2024, in preparation), similar to other analyses in the past (e.g., MacDonald et al. 2021). Each of the 101 samples from the posterior distribution was then integrated using REBOUND's WHFast integrator (Rein & Tamayo 2015) with a time step of 2% of the inner planet's orbit for  $10^6$  inner planet orbits. Inspection of the final orbital states for all 101 systems showed that they were still on stable orbits very similar to those of the



**Figure 25.** Transit-to-transit and 4 yr average periods for each of the planets known to orbit Kepler-11, with panels ordered from top to bottom by increasing orbital period. The small dots in the panels on the left show transit-to-transit orbital periods (the length of the time interval between the midpoint of one transit and the midpoint of the subsequent transit) from three samples of the 101 solutions used to compute the period estimates and uncertainties listed in Table 4. Specifically, the 101 solutions are ordered by increasing mean long-term ( $10^6$  days) orbital period of KOI-157.01 = Kepler-11 c, and blue represents the 17th sample (one standard deviation below the median), black the 51st sample (the median), and red the solution that is 85th (one standard deviation above the median) on this list. The more brightly colored points with a larger symbol size in the left panels and all points in the middle and right panels represent the running average of 4 yr segments centered on the given time. Time is measured from the beginning of Kepler science operations. The green crosses near the left of each panel represent our fits to the Kepler TTs assuming constant period (Table 1). Blue points are plotted first, then black, and finally red points on top. The upper five panels in the right column have been thinned to show only every ninth, seventh, fourth, third, and second transit-to-transit interval to limit the size of the manuscript file.

current system. While our integrations are substantially shorter than those of Carter et al. (2012), they are still much longer than the typical Lyapunov time of 10 yr (Deck et al. 2012). Therefore, it seems likely that the change in stability properties results from having a more accurate set of initial conditions that were derived from the full Kepler lightcurve, which included an additional year of short-cadence data.

In analogy with Figure 25, Figure 26 shows orbital period evolution for three of the 101 simulations, selected as described in the caption. Note that the orbital periods of both planets averaged over 4 yr intervals vary by almost 10 times as much as the uncertainties in their orbital periods measured during the Kepler epoch.

### 4.2.3. Kepler-80 = KOI-500

Kepler-80 harbors six known transiting planets. The innermost is a USP planet that is (at least on the timescales relevant here) dynamically detached from its siblings. The middle four planets, with periods of 3.1, 4.6, 7.1, and 9.5 days, were studied extensively by MacDonald et al. (2016). Two years later, a sixth transiting planet, with P = 14.6 days, was discovered by Shallue & Vanderburg (2018).

All six planets were included in a full photodynamical analysis by MacDonald et al. (2021). This photodynamical analysis was performed using PhoDyMM (D. Ragozzine et al. 2024, in preparation), with all six masses allowed to float, but all the longitudes of ascending node were fixed at  $0^{\circ}$ . The



**Figure 26.** Transit-to-transit and 4 yr average periods for Kepler-36 b and Kepler-36 c. The dots in the left panels show transit-to-transit orbital periods from three samples following photodynamical fits to the lightcurve. The solid curves in the left panels and the curves on the right show the average of 4 yr segments centered on the given time. Black represents the sample with the median long-term (1000 yr) average period of KOI-277.01 (=Kepler-36 c), blue is the sample with the 17th lowest average period, and red is the one that is 85th on this list. Time is measured from the beginning of Kepler science operations. The green crosses near the left side of all panels represent our fits to the measured TTs assuming constant period (i.e., the orbital period and uncertainty of that planet listed in Table 1).

middle four planets form a resonance chain, with each neighboring pair having a period ratio  $\sim 1\%-3\%$  larger than either 3/2 or 4/3 and each neighboring threesome librating within a three-body resonance. The orbital period of the outer planet suggests that it, too, is a member of the resonance chain. However, transits of the outer planet are much shallower, and only 14% of the fits to the Kepler data by MacDonald et al. (2021) find it to be librating within a resonance.

As for Kepler-36, 101 samples were taken from the posterior distribution from PhoDyMM. Each of these mock systems was integrated for 100 yr (nearly  $4 \times 10^4$  orbits of the innermost planet). The 9th–14th numerical rows of Table 4 list the mean and dispersion of the periods of each planet in this sample at epoch  $T_{epoch}$ = 800.0 days and averaged over 100 yr. Figure 27 shows period variations of each of the planets derived from our integrations that used three samples from the posteriors calculated by D. Ragozzine et al. (2024, in preparation). The 4 yr averaged periods of the five planets in the resonance chain have fractional variations of  $\sim 10^{-5}$ -10<sup>-4</sup>.

### 4.2.4. Kepler-223 = KOI-730

Kepler-223 is a system of four planets in MMR, where the three-body angles are consistent with libration, and the TTVs have a few-hour amplitude with a timescale of a few years (Mills et al. 2016). The planets have higher eccentricities than typical for closely spaced planetary systems, and the period ratios of the planets are extremely close to the ratios of small integers, with departures of order 0.1% or less (Lissauer et al. 2011b; Mills et al. 2016).

To understand how the observed TTVs manifest on a timescale beyond the Kepler time series, we draw samples from the posterior of the photodynamic fits to the data. Mills et al. (2016) produced a sample of solutions that ensure that the two Laplace angles, one relating the inner three planets and the other relating the outer three planets, librate with small amplitude over a 100 yr span and called it the C3 posterior. Values of their osculating orbital periods for Kepler-223's planets are given at  $T_{epoch}$ = 800.0 days.

Mills et al. (2016) ran *N*-body simulations of 300 systems from the C3 posterior for  $10^7$  yr, with outputs every  $10^4$  yr, and found all of them to be stable. We inspected the osculating semimajor axes over that time. In many cases, the oscillations in semimajor axes on 100 yr timescales are small but then grow by a factor of several or even an order of magnitude and simultaneously lose the libration of the three-body angles, indicating that these solutions were not in secular steady state.

We found that only 12 systems out of the 300 in the C3 posterior seemed to keep the same semimajor axis behavior from the first 100 yr for all  $10^7$  yr. If the other trajectories were taken as models of the observed system, then the system must have been observed at a special time, which violates the Copernican Principle and thus is highly unlikely. Therefore, we consider that the 12 continually librating solutions likely represent better models of the system, and we restrict our attention to them for our analysis of long-term orbital period variations of this system.

The long-term (1000 yr) mean periods of each of Kepler-223's four planets and the standard deviations thereof are listed in Table 4. Figure 28 shows the period variations of three of these possible realizations, with black representing the system with the median mean period of KOI-730.01 (we broke the degeneracy caused by the even number of systems in the sample by selecting the one with a period closer to the mean of the 12 samples) and blue and red showing the sample systems for which KOI-730.01 has the second-shortest and secondlongest mean values, respectively.

On shorter timescales, due to orbital fluctuations, the period ratios cross back and forth across the nominal period ratios of 4:3 and 3:2—this is true when computing the ratios with either osculating periods (Mills et al. 2016, their Extended Data Figure 5) or modeled transit periods. The 4 yr average periods vary by a few parts in  $10^{-4}$ , and the period ratio for the inner pair of planets drops slightly below 4/3 for some portions of the simulated interval in each of the 12 samples. In contrast, the ratio of periods of the middle pair of planets stays slightly above these small integer ratios.



Figure 27. Transit-to-transit and 4 yr average periods for each of the planets known to orbit Kepler-80, ordered by increasing orbital period. The dots in the left panels show transit-to-transit orbital periods from three samples of the solution posteriors, as in Figure 26. Time is measured from the beginning of Kepler science operations. The green crosses at the midpoint of Kepler observations represent our fits to the TTs assuming constant period (Table 1). The upper right panel has been thinned to show every fourth mean transit-to-transit interval.

### 4.2.5. Kepler-29 = KOI-738

We took 101 samples from the TTV posteriors of Kepler-29 from Jontof-Hutter et al. (2021) and simulated TTs over 10<sup>6</sup> days. The system contains two sub-Neptunes on proximate, dynamically interacting orbits with orbital periods close to the 9:7 MMR (Migaszewski et al. 2017).

In Figure 29, we see that Kepler observed Kepler-29 when the transit-to-transit periods of Kepler-29 b and c were near their extrema. Four-year mean periods vary by a few parts in  $10^{-4}$ , with the periods of the two planets being highly anticorrelated. The ratio of orbital periods over the Kepler baseline is 1.2851, slightly (about 1 part in 2000) less than that of the 9:7 commensurability (1.285714). The average period ratios over 1000 yr of the samples shown in Figure 29 are 1.285812 (17th), 1.285754 (51st), and 1.285729 (85th), respectively, all just above commensurability. Indeed, much of the variation averages out on decadal timescales, but 4 yr average period ratios oscillate about 9/7, and the long-term



**Figure 28.** Transit-to-transit and 4 yr average periods for each of the planets known to orbit Kepler-223, ordered by increasing orbital period. The dots in the left panels show transit-to-transit orbital periods from three samples of the C3 posterior from the photodynamical models of Mills et al. (2016) for which the three-body resonant arguments of the inner and outer threesomes of planets remain in libration for  $10^7$  yr. The solid curves show the average of 4 yr segments centered on the given time. Black represents the sample with the median long-term (1000 yr) average period of KOI-730.01 among the 12 samples that remained in libration (since this number is even, we broke the degeneracy by choosing the one whose period was closer to the average of the ensemble); the sample with the second-shortest average period of this planet is shown in blue, and red represents the one with the second-longest average period. Time is measured from the beginning of Kepler science operations. The green crosses at the beginning represent our fits to the measured TIs assuming constant period (Table 1).

average period ratio in this system is several standard deviations away from the value implied by the orbital periods for the planets listed in our catalog.

Holczer et al. (2016) found strong TTVs for both planets in KOI-738, but each planet's TTs were fit by a polynomial rather than a sine wave, so mean orbital periods were not estimated. This fit was likely selected because the orbital periods of the planets oscillate with a periodicity of about 10 yr, and their TTVs during the 4 yr of the Kepler mission resemble parabolas; see the panels on the left in Figure 29.

# 4.2.6. Kepler-419 = KOI-1474

Two planets are known to orbit Kepler-419: a transiting inner planet (Table 1) on a quite eccentric orbit ( $e \approx 0.8$ ) and a nontransiting super-Jupiter that has a period almost 10 times as long but nonetheless induces large TTVs because of its high mass and the large eccentricity of the transiting planet's orbit. The system is well characterized by both RV and TTV analysis (see Table 5 for the properties of the nontransiting planet). The transiting planet, Kepler-419 b, displays a quintessential "photoeccentric effect" (Dawson et al. 2012), wherein a lower bound on the eccentricity of a planet can be estimated from the shape and duration of the transit lightcurve. The period ratio of these two planets is ~9.657.

Table 4 lists the value of the osculating orbital period for Kepler-419 b at  $T_{BJD} = 2454958$  from Almenara et al. (2018). We took the 4044 posterior samples of the system parameters from the combined RV/photodynamical fits of Almenara et al. (2018) and ran simulations for 10,000 yr. For each of these samples, we computed a long-term orbital period by taking a linear fit to simulated TTs. We tabulated the average and standard deviation of these 4044 long-term periods. The transit-to-transit interval of the inner planet and its 4 yr running average for three of the samples are plotted in Figure 30. Note



**Figure 29.** Transit-to-transit and 4 yr average periods for both of the planets known to orbit Kepler-29, ordered by increasing orbital period. The dots in the left panels show transit-to-transit orbital periods from three samples following Jontof-Hutter et al.'s (2021) dynamical fits to the long-cadence TTs of Rowe & Thompson (2015). The solid curves show the average of 4 yr segments centered on the given time. Black represents the sample with the median long-term (1000 yr) average period of KOI-738.01, blue represents the sample with the 17th lowest average period, and red represents the sample that is 85th on this list. Time is measured from the beginning of Kepler science operations. The green crosses near the left side of all panels represent our fits to the TTs assuming constant period (Table 1).

that the plots in this figure cover longer timescales than those for other planets considered in this subsection because the longer orbital periods of the planets lead to larger characteristic time intervals over which major variations are observed.

At the present epoch, Kepler-419 b is close to periapse when its transits. The dips in orbital period near 2700 and 7300 yr occur when the planet passes through apoapse near the time when it transits. This illustrates the variations predicted from Equation (7) with  $\varpi \ll 1$ .

We examined the intervals between times when the center of the nontransiting planet Kepler-419 c was closest to the skyprojected location of its host star Kepler-419 and closer to the solar system than is Kepler-419. These intervals varied with the same periodicity and opposite phase as the corresponding variations of the averaged transit-to-transit period of Kepler-419 b. However, unlike its transiting companion (right panel of Figure 30), this planet's variations are nearly sinusoidal. These behaviors are consistent with Almenara et al.'s (2018) findings that the periapse locations of the two planets oscillate about antialignment with a small amplitude and that the orbital eccentricity of Kepler-419 c is small (e < 0.2), whereas Kepler-419 b has  $e \approx 0.8$ .

### 4.2.7. Kepler-60 = KOI-2086

The Kepler-60 system contains three confirmed planets with periods between 7 and 12 days, with both neighboring pairs orbiting near first-order MMRs. The lightcurve also reveals an unverified planet candidate with an orbital period of 336 days that we do not consider in our analysis of the inner threesome.

We took 101 samples from the TTV posteriors of Kepler-60 from Jontof-Hutter et al. (2021). From simulations of these 101 samples, we estimated uncertainties on the period ratios of Kepler-60 c/b (5:4) and Kepler d/c (4:3) given the 17th, 51st, and 85th period ratio after averaging period ratios over 1000 yr simulations and sorting. We found that the inner pair has a period ratio of  $1.250473 \pm 0.000015$ , and the outer pair has a period ratio of  $1.334176 \pm 0.000027$ . Averaged over 4 yr, none

of the neighboring planet pairs dropped below the ratio of small integers signifying their resonance in any of the three samples plotted in Figure 31.

## 5. Conclusions

We have assembled in Table 1 a catalog of Kepler planet candidates that prioritizes completeness and makes use of additional information to improve accuracy whenever practical rather than providing a sample that has been defined and analyzed homogeneously, as done for the final PC catalog produced by the Kepler project (Thompson et al. 2018). We have also listed an alternative set of planetary properties (Section 2.5) for most planet candidates that inputs the more uniformly derived set of stellar properties from Berger et al. (2020). Berger et al.'s (2020) results are available for  $\sim$ 95% of Kepler target stars that host one or more PCs (and also for the vast majority of other Kepler targets), and selecting the values listed in the appropriate columns in Table 1 therefore yields measurements of planetary properties that are well suited for studies of occurrence rates (see Appendix A for details). Figure 1 displays the planet candidates on the orbital periodplanetary radius plane, showing the multiplicity of the system in which each PC resides. Figure 7 shows the periods of the planets in each of the multiplanet systems included in our catalog.

Table 1 presents an extensive set of stellar and planetary properties for each of almost 9700 KOIs, almost half of which are considered viable planet candidates. Section 2.5 provides a column-by-column list of the types of data presented in Table 1, and more details on the derivation of many key planetary and stellar properties are provided elsewhere in Section 2. A less comprehensive listing of the properties of nontransiting planetary companions to transiting Kepler planets is provided in Table 5; see Appendix B.

Table 1 is superior to previous cumulative catalogs of Kepler planet candidates in that it provides a more complete listing of KOIs, more accurate and diverse dispositions of KOIs THE PLANETARY SCIENCE JOURNAL, 5:152 (46pp), 2024 June



**Figure 30.** Transit-to-transit and 4 yr average periods for Kepler-419 b, the only known transiting planet in this system. We integrated 4044 samples of system parameters from Almenara et al. (2018) for  $10^4$  yr, sorted them by averaged orbital period in Kepler-419 b, and display results from the 642nd (blue), 2023rd (black), and 3403rd (red) members of the resultant list. Left panel: the small points mark the transit-to-transit period, while the larger points mark a 4 yr running average period over 100 yr. The middle and right panels include only the 4 yr running averages over intervals of 1000 and  $10^4$  yr, respectively. The panel on the right has been thinned to show every fourth mean transit-to-transit interval.



**Figure 31.** Transit-to-transit and 4 yr average periods for each of the planets known to orbit Kepler-60, ordered by increasing orbital period. The dots in the left panels show transit-to-transit orbital periods from three samples (of the 101 considered) following dynamical fits to the long-cadence TTs of Rowe & Thompson (2015). The solid curves represent the average of 4 yr segments centered on the given time. Black represents the sample with the median long-term (1000 yr) average period of KOI-2086.01; blue represents the 17th sample in the list ranked by average period, and red represents the 85th member of the list. Time is measured from the beginning of Kepler science operations. The green crosses at the beginning represent our fits to the lightcurve assuming constant period (Table 1). The top right panel has been thinned to show every fourth mean transit-to-transit interval, whereas the middle and bottom right panels show every third mean transit-to-transit interval.

(for details, see item 63 in the list of tabulated properties provided in Section 2.5), and more accurate stellar and derived planetary properties. Because we utilize information from previous Kepler planet candidate catalogs, community studies, and our own analyses, our assessments of dispositions should be at least as reliable as those of any previous Kepler PC catalog for the portion of the sample listed in both catalogs. The most substantial improvements in planetary properties are for orbital periods of planets exhibiting TTVs (Sections 2.4 and 5.1), as well as transit models and calculated radii of planets with grazing transits (Section 2.2) and/or substantially revised estimates of host star size.

Figure 32 illustrates all planet candidates in our catalog as they transit their stars. This image is the successor to diagrams released as part of press packages for some of the official Kepler project catalogs of planet candidates; we show it here to emphasize the fact that with substantial improvements in estimates of stellar radii and planetary impact parameters, the current version now has substantial scientific content.

### 5.1. Estimating Orbital Periods

We have made special efforts, both in data analysis (Section 2.4) and theoretically (Section 4), to improve the accuracy of planetary orbital periods to aid in ephemeris

predictions and dynamical studies. The values of *P* listed in Table 1 are generally of equal or higher accuracy than those in previous tabulations, with estimates for many of the planets exhibiting TTVs that are significantly improved. Fractional uncertainties quoted for the orbital periods of the majority of planet candidates listed in recent Kepler catalogs, including those presented herein, are  $<10^{-5}$ , with values of  $\sim10^{-6}$  (corresponding to 2 minutes per 4 yr) being typical. These small uncertainties suggest (in some cases misleadingly) that ephemeris predictions for most Kepler planets are robust for decades to come. However, the tabulated periods and quoted uncertainties are for the mean times between midpoints of successive transits during the time interval in which transits were observed and do not reflect possible long-timescale TTVs (Section 4).

TTVs produce errors in estimates of some planets' orbital periods that need to be accounted for in certain dynamical investigations and ephemeris predictions. Periodic sinusoidal TTVs with timescales that are short compared to the interval of Kepler observations largely average out and do not produce significant errors in estimates of orbital periods. TTVs with timescales comparable to the 4 yr interval of Kepler observations have been fit for dozens of Kepler planet candidates to estimate long-term average orbital periods by Holczer et al. (2016), and more detailed dynamical models have been used to estimate



**Figure 32.** Visualization of all planet candidates listed in Table 1 transiting in front of their host stars. The radii of all of the planets and stars are shown to the same scale, and the vertical distance of each planet from the center of its star shows the impact parameter of the transit. Systems are ordered by stellar size, and the color of each stellar disk represents the star's  $T_{\text{eff}}$ , with the color scale shown below. The single star located between the top two rows on the right shows Jupiter and the Earth transiting the solar disk (for scale). The 12 host stars that have T < 3500 K and the two with T > 10,000 K are represented by colors shown at the extrema of the scale bar. The version of this image included within the pdf manuscript is compressed to reduce the size of the file; a full-resolution version that clearly displays each of the transiting planets upon the disk of its host star is provided within the electronic version of the manuscript.

long-term average periods of a small number of well-studied planets, including the seven systems presented herein (Section 4.2, Figures 25–31). These figures show that in many cases, the 4 yr average transit-to-transit orbital period deviates from the long-term average orbital period by a factor many times as large as the formal uncertainty of the 4 yr average. Most Kepler planets that show large TTVs are near mean-motion orbital resonances with other planets. The largest effect for planets moderately close to two-body resonances is due to rotation of the forced eccentricity vector by resonant perturbations; the timescale of this precession for most Kepler planets is short compared to the 4 yr of Kepler observations, so the variations tend to average out.

Libration of planets locked in resonances typically occurs on timescales longer than the Kepler baseline, but most Kepler planets do not appear to be resonantly locked. The more general but smaller (during the era of Kepler observations) effect is caused by secular precession of the planets' free eccentricities, which usually takes much longer than the 4 yr baseline of the Kepler observations to complete a revolution, so it is not accounted for in estimates of mean periods or uncertainties. This precession causes a discrepancy between Kepler-era mean orbital period and long-term mean orbital period to exist even for planets having TTVs that are too small to be observable during the epoch of Kepler observations, and the magnitude of this discrepancy increases with the eccentricity of the planet's orbit. Thus, some systems/planets that do not show TTVs, for which an observer might assume that the linear ephemeris is reliable, could have deviations on longer timescales, although for most planets without clear TTVs, the Kepler predictions are likely to be very good. The main concern is systems where the variations on 4 yr timescales are too small to be detected but the amplitude of the decadal timescale TTVs is substantial. Because of the very complicated and poorly quantified selection biases of the Kepler sample, as well as small number statistics applying to some classes of dynamical configurations, we do not attempt to quantify the number of systems that exhibit the types of behavior seen within these systems. Nonetheless, it should thus be kept in mind that the actual uncertainties in future TTs have broad (albeit low) tails that are not captured by tabulated uncertainties and are growing in length and height with time until additional transits are observed.

We identify multiplanet candidates that have periods that are too close to each other to remain stable, which we use to estimate the percentage of apparent multiplanet systems wherein the planets are distributed between two blended stars as ~2.6%. Similarly, we use an error of a factor of 2 in the estimated period of a planet candidate that we identified by stability considerations to estimate the number of orbital periods that are aliases of the true periods to be ~0.36% (Section 3.2). Other evidence suggests that a somewhat larger fraction of planets with estimated orbital periods of  $\leq 1$  day actually complete two or more complete orbits within the period listed in catalogs (Section 2.3).

# 5.2. Correlations between Planetary Properties and System Multiplicity

We find that the vast majority of PCs with low S/N are candidate single planets rather than being in multiplanet systems (multis). In contrast, for those with moderate S/N, there are similar numbers of PCs in multis and singles (Figure 9). Since the fraction of actual planetary detections that are in multis probably is similar for PCs with low S/N and those with moderate S/N, we suspect that a substantial fraction of these low-S/N single-planet candidates are false positives.

An early Kepler result was that the fraction of large planets among systems with multiple transiting planets is smaller than among lone transiting planets (Latham et al. 2011). A few years later it was pointed out that multis are more concentrated to the period range 1.6–100 days than are singles (Lissauer et al. 2014; Rowe et al. 2014).

The size distributions of singles and multis are quite similar over the range  $\sim 0.5-3 R_{\oplus}$  (Figure 11), although there is a hint of a larger fraction of planets in multis below the radius valley at  $\sim 1.7 R_{\oplus}$ . The size distributions of singles and multis are also indistinguishable over the range  $\sim 5-10 R_{\oplus}$  (Figure 12), although the fraction of planets with sizes 5–10  $R_{\oplus}$  that are found in multis is only about two-thirds that among small planets; planets in the 5–10  $R_{\oplus}$  size interval range from lowmass superpuffs with tens of percent H/He by mass to cool giant planets hundreds or even thousands of times as massive as the Earth; mature brown dwarfs and the smallest mainsequence stars also fall within this size range. The transition between this multis/singles abundance ratio is gradual in the range of 3–5  $R_{\oplus}$ , which may imply a fuzzy boundary or simply be the result of errors in estimated planetary sizes (primarily small planets having sizes overestimated, since there are far more small planets than large ones). Placing the boundary between "small" and "large" planets near the size of Neptune is consistent with the results of the contemporaneous study of Ghezzi et al. (2021), who investigated correlations between stellar metallicity and maximum radius of observed transiting planets. Above 10  $R_{\oplus}$ , the number of multis drops off steeply

relative to singles, with few planets of radius  $R_p > 12 R_{\oplus}$  found in multitransiting systems. The concentration of the largest planets in singles is partly due to inflated hot Jupiters rarely having close companions, but the singles also appear to have inflated Jupiters at longer periods—perhaps on eccentric orbits that bring them close. Alternatively, it may be that most PCs significantly larger than Jupiter with P > 10 days are FPs caused by eclipsing binary stars. Both the size distribution and the period distribution of planets in two-planet systems are intermediate between the distributions of single planets and those in systems with more than two transiting planets.

#### 5.3. Planetary Eccentricities

We analyze the distributions of normalized transit durations (Equation (6)) to confirm the previous result that single transiting planets are more likely to have high eccentricity than are planets in multiply transiting systems. We extend this result by demonstrating that planets in systems with two transiting planets are typically more eccentric than those in systems with three transiting planets, and the orbits of PCs in systems with four or more transiting planets tend to be even less elongated (Figure 20).

Planets with orbital periods P > 6 days are typically more eccentric than short-period transiting planets. In contrast, we find no other clear trends in the eccentricity distribution with orbital period (Figure 21).

Transiting planets in the rocky size range  $(R_p < 1.6 R_{\oplus})$  have a lower average *e* than do sub-Neptunes and Neptunes, which in turn are typically less eccentric than planets with  $R_p > 5 R_{\oplus}$ (Figure 22). However, no such trend exists within the population of planets in systems with both large and small transiting planets.

# 5.4. Epilogue

It has been more than a decade since Kepler ceased its collection of data from its prime field of view. Nevertheless, the list of Kepler planet candidates remains the largest and most homogeneous collection of small and mid-sized exoplanets known. Our new catalog contributes to the understanding of Kepler planet candidates, especially with our focus on the information-rich systems with multiple transiting planets. Improvements in estimates of orbital periods and a better understanding of processes that alter apparent orbital periods on a variety of timescales advance our understanding of planetary dynamics and improve ephemerides for prediction of future transits. More accurate impact parameters, identification of correlations with multiplicity, and identifying trends with eccentricities also provide new avenues for research into the formation and evolution of planetary systems.

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Facility: Kepler space telescope

# Appendix A Tabulated Properties Useful for Planetary Occurrence Studies

As noted in Section 2, our primary stellar and planetary properties catalog (first 63 columns of Table 1) prioritized accuracy over uniformity. In contrast, replacing the values given in columns (39)-(44) and (46)-(61) of Table 1 by those given in columns (64)–(85) provides an analogous listing using the stellar parameters from Berger et al. (2020) for all KOIs whose stellar parameters are listed in Berger et al.'s (2020) tabulation. Berger et al. (2020) provides stellar properties of >90% of Kepler's targets, unbiased by whether or not they host planet candidates. Stellar properties from the Fulton & Petigura (2018) catalog incorporated information from spectra taken by the Keck I telescope, which are only available for a tiny fraction of Kepler target stars, most of which are KOIs and either host multiple PCs or are brighter than  $K_p = 14.2$ . Most of the planetary properties listed in Table 1 that were derived using the stellar parameters in Berger et al. (2020) or are independent of stellar parameters were derived in a uniform manner that makes them suitable for use in planetary occurrence rate studies. We provide specific recommendations for such studies in this Appendix.

When performing occurrence rate studies, we recommend that researchers only include planetary systems associated with target stars that pass a uniform set of selection criteria that do not contain an implicit dependence on the presence of KOIs. We also recommend using those stellar and planetary properties that are listed in columns (64)-(85) of Table 1, which are based upon tabulations of Berger et al. (2020), rather than the heterogeneous listing presented in columns (39)-(44) and (46)-(61). Additionally, our best-available dispositions of KOIs, given by the first letter of the 63rd column in this table, were derived by heterogeneous methods and thus are not appropriate to adopt without modification. Specifically, no KOIs other than those found and classified as planet candidates by a homogeneous and well-characterized process such as that used for DR25 should be counted. Nonetheless, it may be of use to include our dispositions of DR25 PCs in assessing the reliability of the sample, i.e., in rejecting some KOIs that were classified as PCs in DR25. Analogously, dispositions from the DR25 supplemental catalog should not be used to add candidates that were not listed as such in DR25, as their selections, like our own choices, were not identified by a fully automated and reproducible process. The Kepler DR25 planet catalog (Thompson et al. 2018) is the premier catalog derived

from a uniform and systematic analysis of Kepler lightcurves, and the dispositions from DR25 are given by the third letter of the four-letter code given in the 63rd column in Table 1.

Hsu et al. (2021) performed an analysis of planet occurrence rates that makes use of stellar properties from Gaia DR2. The Hsu et al. (2021) target star criteria is just one example of a set of selection criteria that do not have an implicit dependence on whether KOIs were identified for a given target. Future studies may wish to make use of other large surveys (e.g., LAMOST, Gaia DR3, and beyond) that provide stellar information for most of the Kepler planet search targets. When updating stellar parameters, care must be exercised to update derived quantiles self-consistently. For example, the measured transit epoch, depth, and duration do not depend on the stellar properties, but the inferred planet size, semimajor axis, incident flux, and orbital inclination would need to be updated to be consistent with the alternative set of stellar properties.

While we recommend that the selection of planet candidates be based on DR25 data products due to their automated detection and vetting process, the planetary parameters from DR25 can be improved upon while still maintaining a nearly homogeneous analysis, e.g., by using those values listed in the abovementioned columns of Table 1. In particular, the DR25 planet properties table was based on a "best fit" and did not make use of MCMC simulations to characterize the uncertainties in planetary properties. While MCMC posterior samples were provided for all DR25 planet candidates, these are not the basis for the catalog values. Therefore, statistical analyses can likely be improved upon by updating the planet parameters with information from the MCMC chains. The MCMC posterior samples provided herein feature important improvements that are advantageous for occurrence rate studies. First, our MCMC posterior samples correct a bug that caused a biased distribution of impact parameters in the previously released MCMC posteriors. Additionally, our results are derived from simultaneously fitting all the identified planets in a system, rather than by iteratively fitting one planet at a time and masking out observations near transits of previous planets. Therefore, we expect that the precision and accuracy of our MCMC posterior samples represent an improvement on those originally provided with Kepler DR25. Occurrence rate studies may thus choose to update measured parameters (e.g., transit depths, durations, impact parameters) with the results from this study.

# Appendix B Supplemental Catalog of Nontransiting Planets

The planet catalog presented in Table 1 does not include circumbinary planets (CBPs) found by Kepler, nor does it list photometrically identified nontransiting planets or nontransiting planets found around stars known to also host transiting planets found by Kepler. For completeness, we provide references to lists of the first two classes of PCs and a tabulation of nontransiting companions to transiting Kepler planets in this Appendix.

Circumbinary transiting planets are searched for and analyzed quite differently from Kepler planets that orbit around just one star (whether or not said star has more distant stellar companions). Table 1 of Martin & Fitzmaurice (2022) summarizes the properties of all 12 confirmed Kepler CBPs. Welsh (2019) identifies one additional Kepler candidate

Table 5List of Nontransiting Kepler Planets

Source	Method	KOI	Kepler-	P (days)	$M_p$ or $M_p \sin i (M_{\oplus})$
Y18	RV	3	3 c	$3407^{+360}_{-190}$	$507^{+30}_{-27}$
B16	RV	70	20 g	$34.940^{+0.038}_{-0.035}$	$19.96^{+3.08}_{-3.61}$
M17	TTV+RV	84	19 c	$28.731^{+0.012}_{-0.005}$	$13.1 \pm 2.7$
M17	TTV+RV	84	19 d	$62.95^{+0.04}_{-0.30}$	$22.5^{+1.2}_{-5.6}$
M19	RV	85	65 e	$258.8^{+1.5}_{-1.3}$	$260^{+200}_{-50}$
M14	RV	104	94 c	$820.3 \pm 3$	$3126 \pm 200$
W20	TTV+RV	142	88 c	$22.2649 \pm 0.0007$	$214\pm5$
W20	RV	142	88 d	$1403 \pm 14$	$965 \pm 44$
M14	RV	148	48 e	$982\pm8$	$657\pm25$
E14	RV	214	424 c	223	2215
M19	RV	244	25 d	$122.4_{-0.7}^{+0.8}$	$72\pm10$
B23	RV	246	68 d	$632.62 \pm 1.03$	$238\pm5$
B23	RV	246	68 e	$3455^{+348}_{-169}$	$86 \pm 10$
B23	RV	273	454 c	$524.19\pm0.20$	$1433\pm38$
B23	RV	273	454 d	$4073^{+399}_{-186}$	$734^{+86}_{-51}$
F19	TTV	448	159 d	$88.73_{-0.05}^{+0.60}$	$121^{+5}_{-4}$
S17	TTV	872	46 c	$57.325_{-0.098}^{+0.116}$	$115\pm5$
Fr19	TTV	880	82 f	$75.732 \pm 0.012$	$20.9 \pm 1.0$
N14	TTV	884	247 e	$60.05\pm0.1$	$850\pm200$
O16	RV	1241	56 d	$1002 \pm 5$	$1784 \pm 120$
Q15	RV	1299	432 c	$406.2^{+3.9}_{-2.5}$	$772^{+70}_{-76}$
M14	RV	1442	407 c	$3000\pm500$	$4000\pm2000$
A18	<b>RV+TTV</b>	1474	419 c	$673.35 \pm 0.84$	$2432\pm86$
S19	TTV	1781	411 e	$31.509728 \pm 0.000085$	$10.8\pm1.1$

Note. References (sources of the parameters reported herein, not necessarily the discovery paper): Y18=Yee et al. (2018), B16=Buchhave et al. (2016), M17=Malavolta et al. (2017), M19=Mills et al. (2019), M14=Marcy et al. (2014), W20=Weiss et al. (2020), E14=Endl et al. (2014), B23=Bonomo et al. (2023), F19=Fox & Wiegert (2019; substantially longer period and larger mass solutions for this planet are consistent with the data, but all of them provide poorer fits to the TTV data and are less likely a priori based on planetary demographics), S17=Saad-Olivera et al. (2017), Fr19=Freudenthal et al. (2019), N14=Nesvorný et al. (2014), O16=Otor et al. (2016), Q15=Quinn et al. (2015), A18=Almenara et al. (2018), S19=Sun et al. (2019). Only the integer portions of KOI numbers are given; the Kepler project's protocol was to use decimals beginning with .20 for nontransiting planet candidates, but the Marcy et al. (2014) study used .10, and most other sources do not use any decimal numerical designators appended to KOI numbers for nontransiting planets. Letters in most of the Kepler names are those assigned by the authors, even if they did not use Kepler numbers; the 60 day period planet orbiting Kepler-247 is designated "e" despite it being referred to as KOI-884 c in the discovery paper because three transiting planets were announced prior to the publication of said paper. Planet masses are given for discoveries using TTVs;  $M_p \sin i$  is listed for RV detections.

transiting CBP. Only one Kepler multiplanet CBP system is known.

Phase variation photometry has been used to identify nontransiting hot Jupiter candidates around stars that do not have transiting planet candidates. A few of these candidates have been confirmed via RV observations. See Lillo-Box et al. (2021 and references therein) for lists of these objects.

Table 5 lists nontransiting Kepler planets found from TTVs and RVs. Only planets with at least moderately well-constrained orbital periods are included; planet candidates with poorly constrained periods (from multiple possible TTV solutions or just a lower bound from RV data) are omitted. All of the listed planets are in multiple-planet (although not necessarily multitransiting) systems, since the detection of one or more transiting planet(s) motivated further study. Note that Kepler-407 c is quite massive and may be above the giant planet/brown dwarf boundary.

The orbital periods of most nontransiting planets found by RV measurements are not known to high precision, and the ability to detect nontransiting planets from TTVs strongly depends on period ratios, leading to a biased sample. Also, radii of nontransiting Kepler planets have not been measured. Thus, we do not use any of the planets listed in Table 5 for our statistical studies, even when computing the multiplicity of the systems hosting their sibling transiting planets, nor are they represented in any of the figures within this article.

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