# Improving light curve parameters of exoplanets based on TESS data

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Abstract. We revise parameters of four transiting hot Jupiter planets discovered by ground-based surveys. We use follow-up observations carried by *TESS* mission together with PyTransit software. Space telescopes like *TESS* provide better coverage and photometry precision than ground-based telescopes. PyTransit is fast and user-friendly exoplanet transit light curve modelling package, implementing optimised versions of the Gimenéz and the Mandel & Agol transit models. After applying PyTransit to *TESS* data, our results show an improvement in the exoplanets parameters estimation.

**Key words:** Methods: data analysis – Techniques: photometric – Stars: planetary systems – Stars: individual: HAT-P-5, HATS-33, HATS-24

# 1. Introduction

Extrasolar planets are exotic substellar objects which were discovered only recently. This field of research is evolving quickly and opening new possibilities, surprises and challenges.

There are different methods for detecting exoplanets. The major part of exoplanets was discovered using transit and radial velocity methods. Transit photometry is based on decreasing of stellar brightness while exoplanet moves across the disc of the host star. Planets that eclipse their host star during their orbit are key objects for the study of exoplanetary systems. Our main goal is to improve the precision of known exoplanet parameters using new data from the Transiting Exoplanet Survey Satellite (*TESS*).

The TESS, launched in 2018, was designed as all-sky space survey searching for exoplanets orbiting the bright stars – brighter than 12 mag (Ricker et al.,

2014). The spacecraft consists of four 100-mm telescopes (f/1.4) with four CCD cameras each with resolution 4 Mpx. The complete field of view is  $24 \times 96$  degrees. *TESS* uses the broad bandpass filter (600 - 1000 nm) which is centred on the traditional  $I_{\rm C}$  filter. During the primary mission (from July 2018 to July 2020), the nearly whole sky was observed in 26 sectors. Each sector is 27.4-days long. Every 30 minutes, the full-frame image was obtained. For selected targets, the short-cadence data is available. They are collected every 2 minutes.

Up to date (24 September 2020)<sup>1</sup>, 74 confirmed planets and more than 2300 candidates were discovered by *TESS*. The first exoplanet discovered by *TESS* is Super-Earth  $\pi$  Mensae c (Huang et al., 2018). At the beginning of 2020, the discovery of the first Earth-sized exoplanet in the habitable zone TOI-700 d was reported (Gilbert et al., 2020). Vanderburg et al. (2020) recently, in September 2020, presented the planet candidate (TIC 267574918) transiting a white dwarf. Many of exoplanets discovered by other missions were already observed by *TESS* with very high precision which allows us to analyse these planets in more details. Compared with most of the ground-based surveys, *TESS* provides much better coverage and photometry precision. This allows us to collect more reliable data about known exoplanets.

In this report, we summarised our results obtained during "GAIA & TESS: Tools for understanding of the Local Universe" summer school. We used the data obtained by the *TESS* mission to study transiting exoplanets. Our main task was to study the already known transiting exoplanets using the *TESS* data and compare the obtained values of parameters with the literature.

# 2. Transit Modelling

During our work on exoplanet characterisation, we used PyTransit software created by Parviainen (2015). PyTransit is a package for exoplanet transit light curve modelling. PyTransit combines a Bayesian approach to inference with Markov chain Monte Carlo (MCMC) sampling for the posterior estimation. This allows improving characterisation of model parameters uncertainties. The package includes necessary utility routines to calculate circular or elliptic orbits, transit durations, eclipse centres etc. PyTransit needs normalised de-trended light curve for work. Some small additional trend and/or stellar variability could be removed using gaussian processes (Foreman-Mackey et al., 2017) during the fitting. Initial distributions of prior parameters (orbital period, time of primary transit, transit depth) are also required. The package can use Giménez (2006), Mandel & Agol (2002), Maxted & Gill (2019) or RoadRunner (Parviainen, 2020) transits models with various limb darkening laws.

The Bayesian approach allows finding posterior probability density of target parameters if likelihood function and prior density are known. This method can be implied iteratively after each new piece of data arrives. This allows us to

<sup>&</sup>lt;sup>1</sup>https://exoplanetarchive.ipac.caltech.edu/

use known exoplanet parameters from the literature as priors for PyTransit. From previous studies, we use transit depth, orbital period and time of primary transit as initial values which were optimized with other parameters during the fitting.

In this work, we use Mandel & Agol transit model with quadratic limb darkening law as the most common one. Limb darkening coefficients were optimised by **PyTransit**. We assume that the shapes of the planet and star are spherical and orbits are circular. The algorithm operates by phase-folding data over a range of trial parameters (transit depth, orbital period, time of primary transit, impact parameter, stellar density and limb darkening coefficients). It calculates the  $\chi^2$  statistic of the phase-folded light curve between the data points of the respective transit model and the observed values. Then the global  $\chi^2$  minimum is used. Markov chain Monte Carlo methods create samples from a continuous random variable, with probability density proportional to a known function. Creating synthetic light curves with this method and running the model fitting on them gives us a reliable estimation of uncertainties of parameters of our model. Finally, we calculated the values of some common planetary parameters (semi-major axis, radius ratio, planet radius and inclination) from the obtained values of optimized parameters (mentioned above).

## 3. Studied systems

For the purpose of this study, we selected three transiting exoplanets (see Tab. 1) discovered by ground-based projects HAT (Hungarian Automated Telescope Network; Bakos et al., 2004) and HAT South (Bakos et al., 2013). These targets were already observed by *TESS* mission and have not been studied using these data, yet. The selected planets belong to the category of hot Jupiter planets. These are Jupiter-size planets orbit the parent star on very close orbits with periods of only a few days.

#### 3.1. HAT-P-5 b

The hot Jupiter HAT-P-5 b was discovered by HATNet project in 2005 and confirmed in 2007 by Bakos et al. (2007). This exoplanet was named by Slovak citizens in IAU campaign "NameExoWorlds" (Penteado et al., 2019). The name of the planet is Kráľomoc and parent star is Chasoň. The names come from Slavic mythology. The parent star is a sun-like star with effective temperature 5960  $\pm$  100 K, radius  $1.12 \pm 0.09 \,\mathrm{R}_{\odot}$  and mass  $1.04 \pm 0.29 \,\mathrm{M}_{\odot}$  (Stassun et al., 2017). Its distance is 306.0  $\pm$  1.8 pc (Gaia Collaboration, 2018). Parameters of the planet are listed in Tab. 1. Southworth et al. (2012) studied HAT-P-5 using ground-based follow-up observations. They obtained similar results to Bakos et al. (2007).



**Figure 1.** *TESS* light-curve (*left*) and phase curve (*right*) of HAT-P-5 b. Black curve corresponds to model created with **PyTransit**.



Figure 2. Posterior distributions of fitted parameters of HAT-P-5 b transit.

TESS mission observed HAT-P-5 in Sector 26 (from 8 June to 4 July 2020). The nine transit events were observed (see Fig. 1). However, the last transit was observed only partially – only ingress part.

We obtained asymmetric posterior distributions of more fitted parameters from MCMC sampling (Fig. 2). These distributions are not normal (Gaussian). Therefore, we had to calculate the separate values of the upper and lower uncertainties of these parameters. We could also put only the upper limit on the impact parameter (< 0.485) for the same reason. Except for this, the obtained values of parameters (Tab. 2) agree with the values from the literature (Tab. 1).

#### 3.2. HATS-24 b

HATS-24 b was discovered by HATS outh project in 2017 (Bento et al., 2017). HATS outh survey is a network of 6 astrograph telescope systems designed to detect transiting exoplanets in orbit around relatively bright stars visible from the Southern hemisphere (Bakos et al., 2013). The exoplanet is orbiting F-dwarf star with mass  $1.218 \pm 0.036 \, \rm M_{\odot}$ , radius  $1.194 \, ^{+0.066}_{-0.041} \, \rm R_{\odot}$  and effective temperature 6346  $\pm$  81 K (Bento et al., 2017). HATS-24b is high-mass hot Jupiter and main parameters are listed in Tab. 1.



**Figure 3.** *TESS* light-curve (*left*) and phase curve (*right*) of HATS-24 b. Black curve corresponds to model created with PyTransit.



Figure 4. Posterior distributions of fitted parameters of HATS-24 b transit.

TESS observed HATS-24 b in 13<sup>th</sup> sector and detected 22 transits. Data from TESS are shown in Fig. 3. Using this data we tried to improve parameters. We used PyTransit for fitting and we obtained almost symmetric posterior distributions of fitted parameters (see Fig. 4). In Tab. 2 are listed obtained values from our MCMC fitting. Our results are in good agreement with the values from the literature.

## 3.3. HATS-33 b

HATS-33 b was discovered by de Val-Borro et al. (2016) in the boundaries of the *HATSouth* survey. HATS-33 b planet was classified as typical hot Jupiter with period 2.549 d and radius  $1.23 R_{Jup}$ . Main parameters of the planet are listed in Tab. 1.



Figure 5. TESS light-curve (*left*) and phase curve (*right*) of HATS-33 b. Black curve corresponds to model created with PyTransit.



Figure 6. Posterior distributions of fitted parameters of HATS-33 b transit.

The host star is a sun-like star with effective temperature  $5659 \pm 85$  K, radius  $1.022 \pm 0.05 R_{\odot}$  and mass  $1.062 \pm 0.032 M_{\odot}$  (de Val-Borro et al., 2016). HATS-33 b was observed by *TESS* in 13<sup>th</sup> sector. With this new data, we tried to improve exoplanet parameters. The model of transit created with **PyTransit** is displayed in Fig. 5. New parameters of exoplanet are listed in Tab. 2. We obtained almost symmetric posterior distributions of most of the fitted parameters from MCMC sampling (Fig. 6). These distributions are close to normal (Gaussian). **PyTransit** allowed us to obtain 10 times better precision for the orbital period and 5 times better precision for radius ratio. In general, obtained values of parameters (Tab. 2) are in good agreement with the values from the literature.

## 4. Summary

We used photometric data collected by space mission *TESS* to redetermine the basic parameters of three exoplanets HAT-P-5 b, HATS-33 b and HATS-24 b. *TESS* provides data with high precision and high cadence. It allows to

**Table 1.** Parameters of exoplanets and parent stars from literature:  $R_{\star}$  - radius of the star,  $M_{\star}$  - mass of the star,  $T_{\rm eff}$  - effective temperature of the star,  $t_c$  - transit epoch (BJD - 2450000), p - orbital period,  $\Delta$  - transit depth, b - impact parameter,  $\rho_{\star}$  - stellar density,  $q_1$ ,  $q_2$  - coefficients of quadratic limb-darkening (given by Claret 2017), a - semi-major axis, i - orbital inclination, k - radius ratio,  $r_{\rm p}$  - planet radius.

	HAT-P-5 b <sup>(1,2)</sup>	HATS-24 b $^{(3,4)}$	HATS-33 b $^{(5)}$
$R_{\star} [\mathrm{R}_{\odot}]$	$1.12 \pm 0.09$	$1.194 \stackrel{+0.066}{_{-0.041}}$	$1.022 \pm 0.05$
$M_{\star}  [\mathrm{M}_{\odot}]$	$1.04 \pm 0.29$	$1.218 \pm 0.036$	$1.062 \pm 0.032$
$T_{\rm eff}$ [K]	$5960\pm100$	$6346\pm81$	$5659\pm85$
$t_{\rm c}~[{\rm BJD}]$	$4241.7766 \pm 2 \cdot 10^{-4}$	$7948.709321 \pm 4 \cdot 10^{-5}$	$6497.23181 \pm 5 \cdot 10^{-4}$
p [d]	$2.7884910 \pm 2.5 \cdot 10^{-5}$	$1.3484954 \pm 1.3 \cdot 10^{-6}$	$2.5495551 \pm 6.1 \cdot 10^{-6}$
$\Delta$ [%]	$1.240 \pm 0.013$	$1.638 \pm 0.004$	$1.530 \pm 0.198$
$b [R_{\star}]$	$0.425 \pm 0.048$	—	$0.33 \pm 0.12$
$\rho_{\star}  [\text{g/cm}^3]$	$1.03 \pm 0.18$	—	$1.42 \pm 0.17$
$q_1$	0.275	0.240	0.342
$q_2$	0.294	0.299	0.260
$a [R_{\star}]$	$7.50\pm0.19$	$4.561 \pm 0.029$	$7.843 \pm 0.078$
a [au]	$0.04075 \pm 0.00076$	$0.02380\pm0.00100$	$0.03727 \pm 0.00037$
i [°]	$86.75 \pm 0.44$	$85.97 \pm 0.26$	$87.62 \pm 0.92$
k []	$0.1106 \pm 0.0006$	$0.12801 \pm 0.00017$	$0.1237 \pm 0.0080$
$r_{\rm p} \; [{\rm R}_{\rm jup}]$	$1.260 \pm 0.050$	$1.395 \pm 0.057$	$1.230 \begin{array}{c} +0.112 \\ -0.081 \end{array}$

Source: (1) Bakos et al. (2007), (2) Stassun et al. (2017), (3) Bento et al. (2017), (4) Oliveira et al. (2019), (5) de Val-Borro et al. (2016).

	HAT-P-5 b	HATS-24 b	HATS-33 b
$t_{\rm c}  [{\rm BJD}]$	$5432.4551 \pm 5 \cdot 10^{-4}$	$7038.47339 \pm 3.7 \cdot 10^{-4}$	$6497.2318 \pm 5 \cdot 10^{-4}$
p [d]	$2.7884732 \pm 4 \cdot 10^{-7}$	$1.34849750 \pm 3.3 \cdot 10^{-7}$	$2.549564 \pm 6.2 \cdot 10^{-7}$
$\Delta$ [%]	$1.235 \begin{array}{c} +0.054 \\ -0.036 \end{array}$	$1.779 \pm 0.051$	$1.346 \pm 0.035$
$b [R_{\star}]$	< 0.485	$0.34 \pm 0.12$	$0.35\pm0.08$
$\rho_{\star}  [\mathrm{g/cm^3}]$	$1.18 \substack{+0.09 \\ -0.16}$	$1.039 \pm 0.096$	$1.38 \pm 0.12$
$q_1$	$0.482 \pm 0.235$	$0.170 \pm 0.152$	$0.565 \pm 0.210$
$q_2$	$0.170 \ {}^{+0.214}_{-0.104}$	$0.299 \pm 0.264$	$0.144 \pm 0.130$
$a [R_{\star}]$	$7.86 \stackrel{+0.20}{_{-0.36}}$	$4.64\pm0.14$	$7.85\pm0.28$
a [au]	$0.04097 \stackrel{+0.00097}{_{-0.00189}}$	$0.02576 \pm 0.00078$	$0.03731 \pm 0.00133$
i [°]	> 86.16	$85.82 \pm 1.58$	$87.55 \pm 1.03$
k []	$0.1111 \stackrel{+0.0028}{_{-0.0017}}$	$0.1334 \pm 0.0019$	$0.1160\pm0.0015$
$r_{\rm p} \ [{\rm R_{jup}}]$	$1.211 \begin{array}{c} +0.026 \\ -0.018 \end{array}$	$1.550 \pm 0.022$	$1.154 \pm 0.015$

Table 2. New parameters of exoplanets. For detail description see Table 1.

characterise the transiting planets in more details than from ground-based observations. Time span of one TESS sector is only 27.4 days but it includes several transits of short-period planet such as hot Jupiters. The exposure time of TESS data (2 min) is short enough, therefore the brightness of the occulted star does not change significantly during this time and the shape of transit is not deformed.

We confirmed the basic parameters of studied planets given in the literature. We improved the values of many of them. We used MCMC method to estimate their uncertainties which are very reliable. In the case of HAT-P-5 b, we obtained very asymmetric posterior distributions of a few parameters. And for the impact parameter, we could only put an upper limit of it. In other studied planets, the distributions were close to normal (Gaussian) distribution. Obtained values of limb-darkening coefficients do not fully agree with the values calculated by Claret (2017). One reason for these differences could be the large step of stellar parameters in the calculated values. Our coefficients  $q_1$  and  $q_2$  which could affect our results. However, another explanation of our large uncertainties may be the fact that even a large change of limb-darkening coefficients has minimal effect on the shape of transit.

Our results show that TESS data should be used to study already discovered transiting exoplanets to improve their parameters.

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