

# High precision ground-based photometry with 1-m class telescopes

M. Lendl

*Space Research Institute, Austrian Academy of Sciences, (E-mail:  
monika.lendl@oeaw.ac.at)*

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**Abstract.** Recent years have seen an improvement of photometric precision with ground-based observatories routinely achieving a relative precision at the sub-mmag level. With optimized instrumentation and observing strategies, as well as ample time resources, ground-based 1m-class facilities are important players in a wide range of fields. I here summarize the main instrumental and observational strategies conducive to obtaining high-precision ground-based photometry, and review data analysis methods to account for instrumental correlated noise. Finally, I review the main applications of high-precision photometry related to the search for, and characterization of, extrasolar planets.

**Key words:** photometry – exoplanets – observing techniques

## 1. Introduction

The technique of monitoring the brightness of stars, photometry, is one of the fundamental pillars of observational astronomy. Thanks to major advances in technology (in particular the rise of CDD detectors, which have enabled digitized data processing), the attainable precision has improved by several orders of magnitude over the last few decades. While measurements at the part-per-million level remain reserved for space mission such as Kepler (Borucki et al., 2010), TESS (Ricker et al., 2014) and soon CHEOPS (Broeg et al., 2013), small ground-based observatories have shown to routinely achieve precisions at the sub-mmag level. Operating at this level of precision, small ground-based telescopes have become key players in a wide variety of fields, ranging from Solar System research to extragalactic astronomy. Ground-based photometry with 1m-class telescopes benefits from ample time resources, cost-efficient facilities and high operational flexibility.

In the following, I summarize the main aspects of instrumentation related to high-precision ground-based telescopes and detail the most common observational and data analysis strategies. I further review recent results of high-precision photometry in the framework of exoplanet research.

## 2. Instrumentation, observing techniques and data analysis

### 2.1. Optimizing instrument and setup

Most current set-ups for photometric instruments at 1-m class telescopes consist of a CCD camera paired with a set of photometric filters designed to match – as closely as possible – the requirements imposed on the system by its scientific purpose. The wavelength range often presents a prime constraint, as some observations might target specific emission or absorption lines, obtain precise measurements across different wavelength ranges, or simply maximize the overall photometric precision. To this end, back-illuminated CCDs have found widespread use as these offer improved quantum efficiencies compared to traditional front-illuminated designs. Further enhancements in terms of S/N can be reached by using deep-depletion chips, which allow for better efficiency towards the near-IR.

While improved quantum efficiency and broad filters serve to optimize the signal photon noise, detector readout noise and thermal noise (*dark current*) can remain an issue. The former may be limited by choosing optimal exposure times that both, maximize the duty cycle and limit the number of readouts necessary. The latter can be efficiently controlled by actively cooling the instrument. While temperatures below -100 C previously necessitated the use of coolants such as liquid Nitrogen, low temperatures can now be obtained through multi-stage Peltier elements.

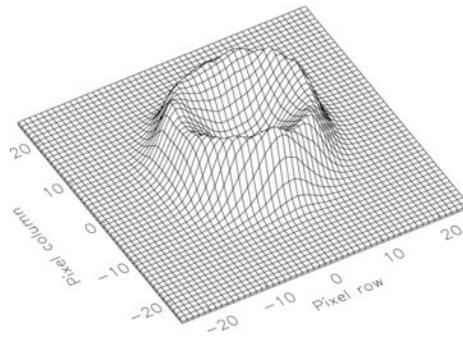
Finally, uneven CCD sensitivity and system throughput manifest in flat field variations across the detector frame. While occasional cleaning of detector entrance window and filters can help reduce some flat field inhomogeneities, defects located at the CCD itself cannot be easily eliminated. In practice, the best way for the user to avoid these is to map their location on the CCD and optimize pointing such that no imperfections coincide with any target of interest.

### 2.2. Observing techniques

Any observation using relative photometry is naturally limited by the quality and number of the available reference sources. The first and most basic step for successful high-precision photometry thus consists in optimizing the pointing direction such that the field of view contains a maximum number of stable reference sources with magnitudes similar to that of the target. As the on-sky density of stars of a given magnitude decreases drastically for bright stars, the need to fit at least two objects onto the detector usually places a natural limit on the typical magnitudes accessible by any given instrument. Small telescopes here benefit from large fields of view that allow them to often outperform large facilities on bright stars.

Two approaches are commonly used (often in concert) to minimize the effects of detector sensitivity variations in high precision photometry:

- **Improved guiding:** Ideally, if the targets' location on the detector is invariant, the flat-field remains constant throughout the observations. Precise guiding is employed to approach as much as possible to this ideal case. However, many 1-m class telescopes do not possess their own guiding camera. This situation can be remedied by employing a self-guiding mechanism using the science frames to measure guiding drifts. If absolute positional information is required, this can be done matching the frames against a catalog (as done e.g. with EulerCam, Lendl et al., 2012). Alternatively, frames can also be matched directly against each other using e.g. the DONUTS algorithm (McCormac et al., 2013).
  
- **Widening the PSF:** The second approach to limit flat-field effects consists in artificially widening the stellar PSFs on the detector. Most commonly, this is done by slightly defocusing the telescope and thereby spreading the starlight over many pixels and averaging out sensitivity variations. An added advantage of this technique is that exposure times can be increased without saturating the detector, which in turn leads to improved duty cycles and observation efficiency. Defocusing has been used widely, and Figure 1 shows a typical PSF of a defocused observation (Southworth et al., 2009) dedicated to exoplanet science. Recently, also diffusers have been used to this end, leading to encouraging results (Stefansson et al., 2017, 2018). Limits of this technique are naturally imposed by the observed field. Well-suited to low-density star fields or bright stars, defocusing will decrease the overall precision when crowded fields, e.g. stellar clusters, are observed and defocusing leads to a high degree of blended sources.



**Figure 1.** Example of a heavily defocused PSF by Southworth et al. (2009).

### 2.3. Data analysis techniques

Once photometry has been obtained and extracted, relative photometry is usually obtained by constructing a reference source by co-adding several stable field stars and dividing the target by this reference flux. At this point, the most prominent signatures of the Earth’s atmosphere, such as variable transparency and absorption due to changing air mass, are removed. Usually however, at this point, a light curve is not entirely free of systematic effects. These are often smooth trends caused by differential extinction and sky background variations, or effects due to variable seeing or pointing jitter. As this *red noise* is usually related to external parameters, we can attempt to model its behavior and eventually account for it when making astrophysical inferences. To do so, two methods are currently widely used.

- **Parametric baseline models:** In this approach, one assumes that the red noise can be approximated by parametric functions of a set of state variables ( $\bar{\xi}$ ) describing the observations. Typical state variables are time ( $t$ ), the stellar FWHM, coordinate offsets ( $\Delta x, \Delta y$ ), or the sky background (see e.g. Gillon et al., 2010, 2012). One then assumes that the observed signal can be modeled by an equation of the form

$$F(t) = M(t) B(\bar{\xi}), \quad (1)$$

where  $F(t)$  is the observed flux,  $M(t)$  is the astrophysical effect and  $B(\bar{\xi})$  is the photometric baseline function. In principle,  $B(\bar{\xi})$  may take any analytic form deemed adequate, however, it is most commonly assumed to be relatively simple, such as combinations of low-order polynomials. As an example  $B(\bar{\xi})$  may be a second-order polynomial in time combined with a linear drift in coordinate shifts:

$$B(t, \Delta x, \Delta y) = A_0 + A_1 t + A_2 t^2 + A_3 \Delta x + A_4 \Delta y, \quad (2)$$

where  $A_i$  are coefficients. To correctly propagate errors, baseline coefficients are best fitted at the same time as the astrophysical model. Further, care should be taken at selecting the most appropriate baseline model and avoid over-fitting. A common approach for model selection is via the Bayesian Information Criterion (e.g. Schwarz, 1978). When several models show similar evidence, it is advantageous to combine results obtained from a range of models to avoid biasing the results (Gibson, 2014).

- **Gaussian processes:** Often correlations are too complex to be easily described with parametric models, or their dependence on external parameters does not follow a simple analytic form. In this case, Gaussian Processes offer a remedy to account for red noise in the data analysis while at the same time correctly accounting for uncertainties (see e.g. Rasmussen & Williams, 2006 for a detailed introduction to GPs). In short, within the GP framework, a

time-series is interpreted as a multivariate Gaussian distribution around a mean function defined by the astrophysical model and having a covariance matrix  $C$ . The elements of the covariance matrix take a functional form (the *kernel*). An example of a widely used kernel is the square exponential kernel,

$$C_{i,j} = \xi \exp\left(-\frac{1}{2} \frac{(t_i - t_j)^2}{l}\right), \quad (3)$$

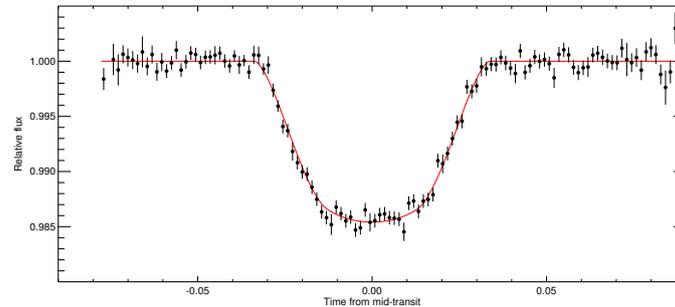
where  $\xi$  denotes the maximum covariance and  $l$  is the length scale parameter. In this example, time is the only state variable included, however kernels incorporating one or several other state variables are easily devised. If desired, an additional term  $\delta_{i,j}\sigma^2$  can be added to account for extra white noise. As with parametric models, the kernel parameters “*hyperparameters*” are usually fit at the same time as the parameters of the mean function. Since the introduction of GPs to high precision photometry (Gibson et al., 2012), several open-source software packages (Aigrain et al., 2016; Foreman-Mackey et al., 2017) have become available simplifying the use of GPs in the framework of light curve analysis.

### 3. High-precision photometry for exoplanet science

Transiting exoplanets have been one of the key fields pushing ground-based photometric observations to their optimum: for the detection of transiting sub-Jovian planets, relative precisions at the sub-mmag level have to be obtained throughout several hours. Furthermore, photometric observations open up a range of characterization avenues. I will briefly outline a set of projects and results related to exoplanets that have been obtained with 1-m class telescopes.

#### 3.1. Transit searches and follow-up

Until the advent of the TESS space mission (Ricker et al., 2014), ground based surveys were the only means of discovering transiting planets across the entire sky. While monitoring mostly relied on very small aperture facilities (e.g. Bakos et al., 2004; Pollacco et al., 2006), 1-m-class facilities have been instrumental in the follow-up efforts, eliminating false positives such as blended eclipsing binaries, and obtaining high-precision transit light curves. Figure 2 shows an example of a follow-up transit light curve of the hot Jupiter WASP-164b observed with the 1.2m Euler telescope. Some surveys have been making use of 1-m-class instrumentation (e.g. OGLE (Konacki et al., 2003), NGTS (Wheatley et al., 2018) and TRAPPIST-UCDTS/SPECULOOS (Gillon et al., 2016; Delrez et al., 2018a)) to search for the signatures of transiting planets. In these cases, the choice for larger instruments has mostly been driven by needs of observing faint sources (see e.g. the discovery of a planetary system around an ultra-cool dwarf, Gillon et al. 2016), or the need for high photometric precision (see e.g. the detection of a sub-Neptune, West et al. 2018).

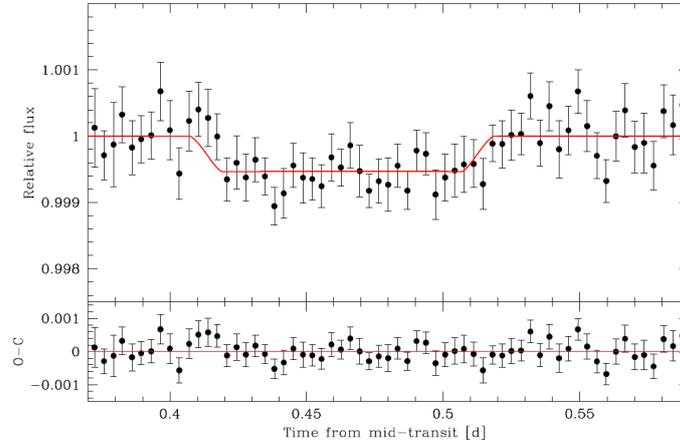


**Figure 2.** Follow-up photometry for the hot Jupiter WASP-164 obtained with Euler-Cam at the 1.2m Euler telescope, Lendl et al. (2019).

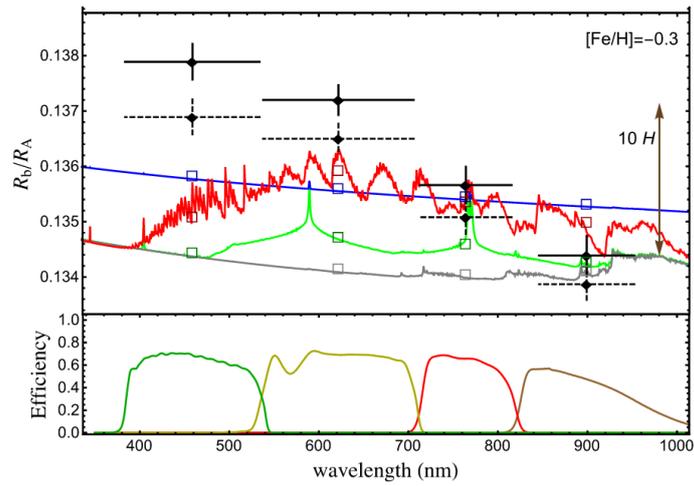
### 3.2. Atmospheric characterization: occultations and transmission spectra

Going beyond the mere detection of exoplanets, 1-m class ground-based facilities have also provided ample opportunities to study these planets in detail. For hot Jupiters (close-in gas giants), thermal emission from the planetary dayside produces occultation depths of several hundreds of ppm in the red optical or near-IR (I or z' band). By combining several individual occultation light curves, 1-m class facilities have secured a number of detections (Abe et al., 2013; Lendl et al., 2013; Mancini et al., 2013; Delrez et al., 2016, 2018b). The example of the hot Jupiter WASP-103b (Delrez et al., 2018b), a detection for which 13 individual light curves were combined, is shown in Figure 3.

Similarly, precise measurements of transit light curves at different wavelengths allow to obtain a planetary transmission spectrum at low resolution. While the most prominent features of Na and K (Seager & Sasselov, 2000; Charbonneau et al., 2002) are too narrow-band to be accessible with small facilities, broad spectral features, such as slopes due to high-altitude hazes can be detected (Pont et al., 2008). A wide range of facilities and observing programs (e.g. de Mooij et al., 2012; Mancini et al., 2013; Mallonn et al., 2015; Southworth et al., 2017) have been dedicated to this science case. As an example, the detection of increased atmospheric absorption towards the blue (as expected from high-altitude hazes), in the hot Jupiter WASP-36b is shown in Figure 4. Since stellar spots (occulted or unocculted during transit) can bias the observed transit depth, this technique is most ideally pursued with simultaneous multi-band observations.



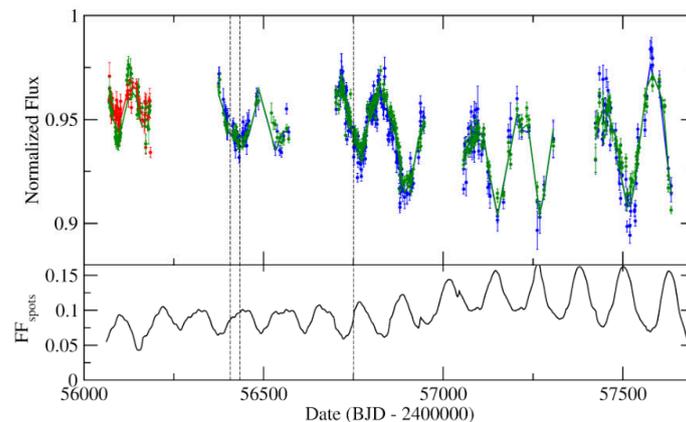
**Figure 3.** Occultation light curve of the hot Jupiter WASP-103b (Delrez et al., 2018b) using EulerCam and TRAPPIST.



**Figure 4.** Low-resolution transmission spectrum of WASP-36 by Mancini et al. (2016) using the MPG 2.2m telescope.

### 3.3. Transit timing variations

While in single-planet systems, transits are expected to occur in equally-spaced intervals, the observed transit periods can vary in multi-planet systems, owing to the dynamical interactions between the host and its several planets. If detected, these *transit timing variations (TTVs)* (Agol et al., 2005; Holman & Murray, 2005) can reveal additional planets and serve to measure planet masses. For extremely close-in planets, TTVs can even occur due to tidal interactions between the planet and the host: planets are losing angular momentum and slowly spiraling into inwards. Measuring the decay rate of the planetary orbit can thus reveal the dissipation of tidal energy in the host star, constraining the tidal quality parameter  $Q'_*$  (see e.g. Collier Cameron & Jardine, 2018, and references therein). A range of surveys have targeted hot Jupiters with 1m-class facilities, searching for TTVs (e.g. Holman et al., 2006; Lendl et al., 2010; Maciejewski et al., 2010). While TTVs can be substantial for planets in multiplanet systems (e.g. Holman et al., 2010), tentative evidence for a period decay has only been found in one hot Jupiter to date (Maciejewski et al., 2018). The same technique can be used to determine the nature of planet candidates identified by the Kepler satellite (von Essen et al., 2018), in cases where the radial-velocity method cannot be used (e.g. faint objects).



**Figure 5.** The long-term variability (top) and spot filling factors (bottom) of the planet host star GJ 1214 by Mallonn et al. (2018).

### 3.4. Stellar hosts

Next to the planets themselves, information on the activity and rotation of stellar hosts can be gathered with high-precision photometry. This is either done

through long-term monitoring (e.g. Mallonn et al., 2018, see Fig. 5), capturing the stellar variability induced as star spots move in- and out-of view. In transit light curves observed at very high precision, short-term brightenings have been observed (Tregloan-Reed et al., 2013; Juvan et al., 2018). These can be attributed to the planet crossing over a star spot, and consequently blocking light from a less emissive stellar region. As similar short-term variations can easily be due to correlated noise rather than a physical effect, simultaneous observations from several facilities have shown to help to distinguish real star spot crossings from instrumental systematics (e.g. Lendl et al., 2013; Mancini et al., 2017; Juvan et al., 2018). When observed in several subsequent transits, spot crossings can reveal the stellar rotation rate and constrain the planetary orbital obliquity.

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