A precise optical transmission spectrum of the inflated exoplanet WASP-52b

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ABSTRACT

We have measured a precise optical transmission spectrum for WASP-52b, a highly inflated hot Jupiter with an equilibrium temperature of 1300 K. Two transits of the planet were observed spectroscopically at low resolution with the auxiliary-port camera on the William Herschel Telescope, covering a wide range of 4000–8750 Å. We use a Gaussian process approach to model the correlated noise in the multiwavelength light curves, resulting in a high precision relative transmission spectrum with errors of the order of a pressure scaleheight. We attempted to fit a variety of different representative model atmospheres to the transmission spectrum, but did not find a satisfactory match to the entire spectral range. For the majority of the covered wavelength range (4000–7750 Å), the spectrum is flat, and can be explained by an optically thick and grey cloud layer at 0.1 mbar, but this is inconsistent with a slightly deeper transit at wavelengths >7750 Å. We were not able to find an obvious systematic source for this feature, so this opacity may be the result of an additional unknown absorber.

Key words: atmospheric effects – methods: statistical – techniques: spectroscopic – planets and satellites: atmospheres – planets and satellites: individual: WASP 52b – stars: individual: WASP 52.

1 INTRODUCTION

Exoplanet science is rapidly developing into a mature discipline where detailed characterization of individual planets is beginning to build a picture of the population of planets as a whole. The characterization of exoplanet atmospheres, primarily through transmission and emission spectroscopy, has become a key topic. Hot Jupiter atmospheres have been shown to display a wide variety (Sing et al. 2016), but broadly can be categorized into atmospheres that are ‘clear’, displaying large sodium and potassium features (e.g. HD 209458b), ‘cloudy’, which display muted, or no features at all at optical wavelengths, and ‘hazy’ atmospheres, such as HD 189733b where the dominant feature is a Rayleigh scattering slope caused by sub-micron scale scattering particles high in the atmosphere of the planet. While many high profile discoveries have been space based (e.g. Vidal-Madjar et al. 2003; Sing et al. 2008; Kreidberg et al. 2014), increasingly, ground-based telescopes have also been found to be suitable for the task for the detection and characterization of both narrow (e.g. Redfield et al. 2008; Louden & Wheatley 2015) and broad-band features (e.g. Gibson et al. 2013b; Bento et al. 2014; Gloria, Snellen & Albrecht 2015; Borsa, Rainer & Poretti 2016).

While susceptible to their own systematic issues, progress has been made in identifying and improving the major problems, such as differential slit loss (Sing et al. 2012) and upgrading the linear atmospheric dispersion corrector on the FOcal Reducer and low dispersion Spectrograph (FORS2) (Moehler et al. 2010; Sedaghati et al. 2015).

Many exoplanets have been shown to present a flat, cloud-dominated spectrum (e.g. Gibson et al. 2013b; Lendl et al. 2016). Data from HST shows that broad wavelength coverage is required to characterize a hot Jupiter, as most appear flat over ranges of several hundred angstroms without the aid of high resolution measurements (Sing et al. 2016). So far, there is no obvious correlation between planetary parameters, e.g. equilibrium temperature, surface gravity and host spectral type, though there are broad predictions about what kinds of condensates are available at different temperature ranges and their impact on observational properties (e.g. Wakeford & Sing 2015; Parmentier et al. 2016). The transmission spectrum of a planet is an emergent property of many branches of atmospheric physics, that likely depends quite sensitively on the specifics of heat transport and vertical mixing in each individual planet. It will probably be necessary to analyse many more systems before the underlying trends begin to emerge.

Ground-based observations have the advantage of being relatively cheap to perform in large number, compared to space-based observations, and they also fill an important role in validating the
results from *HST* and *Spitzer*, where exoplanet observations are known to suffer from the idiosyncratic systematic errors of these instruments (e.g. Evans et al. 2015; Wakeford et al. 2016). The way these systematics are treated can have a large impact on the resulting transmission spectra, and many early results are controversial (e.g. the detection of a thermal inversion on HD 209458b Knutson et al. 2008; Line & Yung 2013). Independent detections with a wider range of instruments would remove some of the uncertainty stemming from these systematic concerns.

Additionally, wavelength dependent trends in the data injected by, for example, stellar activity could be mistaken for real atmospheric features on the planet. The repeatability of a purported signal over several observations is a powerful diagnostic, giving immense value to having multiple nights on target. Ground-based, broad-band transmission spectroscopy therefore remains a vital tool in building an accurate picture of exoplanet atmospheres.

WASP-52b is a Saturn-mass planet with an inflated radius that orbits a K type star on a 1.75 d orbit (Hebrard et al. 2012). WASP-52b is an excellent target for transmission spectroscopy due to its large scaleheight, relatively deep transit, and the presence of a nearby bright comparison star. The low density of WASP-52b gives it a scaleheight of 700 km, which is over three times greater than HD 189733b, despite having a similar equilibrium temperature of 1300 K. Although it orbits a comparatively faint star ($V_{\text{mag}} = 12$), this high scaleheight means that the signal-to-noise achievable on atmospheric features is comparable with HD 189733b, assuming that white noise is the dominant noise component, and potentially better where red noise is a limiting factor. The similarity of the planet’s equilibrium temperature and parent star spectral type to HD 189733b makes WASP-52b an interesting test of the variations in exoplanet atmospheres.

We present two high precision spectroscopic transits of WASP-52b. This paper is organized as follows: a summary of the observations are given in Section 2, the reduction of the data is described in Section 3.1 and a short description of the common-mode Gaussian process (GP) detrending analysis is presented in Section 3.3. The system parameters are defined in Section 4.1 and a low resolution spectrum is presented with a discussion of its features in Section 5.

## 2 OBSERVATIONS

WASP-52 was observed for two full nights on 2014 August 22 and 29 using the auxiliary-port camera (ACAM) on the William Herschel Telescope (WHT). ACAM was used in single slit spectroscopy mode with a custom made extra wide slit of 27 arcsec. This was to minimize slit losses, which have been found to be a limiting factor in past observations with other instruments (Sing et al. 2012), though a slit is still of course necessary to avoid contamination from other stars in the field of view and to lower sky background contribution. A slit of 27 arcsec was chosen after an earlier analysis of the point spread function (PSF) of the instrument in an earlier data set, with the goal of there being less than 0.1 per cent slit losses. A comparison star with $V_{\text{mag}} = 13$ and a similar spectral type located 3 arcmin away, well within the unvignetted slit length, was selected to perform differential spectroscopy. The slit was rotated such that both stars were at the centre. An exposure time of 100 s was used to keep the peak flux well below saturation at all times. The windowed observing mode reduced the readout time to 11 s, giving a duty cycle efficiency of 90 per cent. In order to keep the stars centred in the slit, the data were reduced in realtime and the resulting spectra were cross-correlated to produce guiding offsets, using the position of the spectral traces in the X-direction on the chip, and the positions of strong absorption features in the spectra in the Y-direction. Pointing corrections were entered manually at intervals of approximately 20 min throughout the observations; with typical amplitudes of 0.1 pixels, these small and frequent corrections prevented the formation of a sawtooth pattern in the trace positions. A small defocus was applied to the telescope (~2 arcsec) to spread the light over a larger number of pixels to reduce the contribution of flat-fielding errors, and to create a more stable PSF that is less effected by variable seeing.

## 3 METHOD

### 3.1 Extraction

The reduction was carried out with custom scripts written in *Python*. Standard bias corrections were made. However, it was not possible to flat-field the data satisfactorily with the sky flats taken due to differential vignetting between the imaging and spectral modes of ACAM. Spectroscopic dome flats did not contain enough blue light to be useful across the whole spectral range. Due to the large number of pixels used during the analysis and the small spatial scale of flat-field variations compared to the variations within the spectra, the flat-fielding errors are not expected to be an important error source, so the reduction was carried out without flat-fielding.

The combination of vignetting towards the edge of the chip and the broad wings of the brighter comparison star made it difficult to judge where to place sky background traces. However, the background was found to vary smoothly and predictably over the rest of the chip, so we decided to fit this function directly using a third-order iterative sigma clipped polynomial and subtract it from the image on a row by row basis (here rows are perpendicular to the dispersion direction). This approach has the advantage of leveraging information from a larger number of pixels, which increases the accuracy of the background estimate. There is a small curvature in the sky lines in the $x$-direction due to the alignment of the instrument, but it is significantly less than the width of the lines, so does not effect the background subtraction.

We fit the spectral trace for the target and reference star with an iterative cubic spline. Several extraction widths were tested, and it was found that a width of 20 pixels provided the lowest scatter in the final light curves on both nights. The adjustments to the guiding kept the brightest region of the spectrum dispersed over the same set of pixels, but the spectral trace was found to rotate slowly throughout the night due to differential refraction, meaning the extreme blue end of the spectrum traversed a slightly larger distance throughout the observation and may suffer an increased noise budget due to the lack of flat-fielding. The bluest end of the usable spectrum at 4000 Å (Pixel row 674) was found to drift by two pixels throughout the night, while the central regions and the red end drift by less than a pixel (0.25 arcsec).

An example spectral extraction is shown in Fig. 1. The colour scale has been selected to emphasize the target and reference star trails. It is clear that the resulting spectra and their ratios are well behaved with high S/N between pixels ~600 and 2200, which are found to correspond to wavelengths ~4000–9000 Å.

Persistent artefacts are visible in the images, which we suspect are caused by fringing. These become visible beyond ~8750 Å, and make it more difficult to trust the spectra extracted in this region. Bluewards of 4000 Å a combination of low intrinsic flux, detector response and instrument vignetting drop the count rate below the background, making a total usable range of 4000–8750 Å.
Figure 1. Spectral trace for target and comparison star. Top: The spectrum image after background subtraction. For display purposes, the image has been normalized by dividing each pixel row by its standard deviation, such that the colour scale represents the significance above the background. This is only for visual clarity, and is not a part of the actual data reduction. The extraction region for each trace is represented by red lines. The central line indicates the distance between the two traces, as a function of pixel position. Bottom: Normalized extracted spectra for target (orange) and comparison (blue). The ratio between the two is plotted in green. The usable region of the spectrum between pixels $\sim 600$ and $2200$ corresponds to wavelengths of $\sim 4000–9000$ Å, the wavelength solution is marked on the top panel. [A colour version of this figure is available in the online version.]

An accurate and stable wavelength calibration is important, as errors in wavelength calibration can cause systematic bluewards and redwards slopes in the transmission spectrum that can be mistaken for spectral features in the atmosphere of the planet. Due to the very wide slit, arc calibration frames taken with the same slit produce very few useful features, particularly at the blue ends of the spectrum where the CuAr and CuNe calibration lamps available at the WHT produce very few lines. Using a smaller slit and removing the offset in slit positions is possible, but we found that the wavelength solution drifted noticeably over the 8 h observation period, which is caused by flexure of the ACAM instrument. Breaking science observations and changing the instrument setup to take regular arcs to recalibrate is undesirable, so we elected instead to self-calibrate the science spectra using telluric and strong stellar features. At the resolution of these observations, the velocity difference between the stellar and telluric features is unimportant. The line positions are measured by fitting a Gaussian profile, which well describes the instrumentally broadened profiles. The central pixel co-ordinates of these features are used to generate a wavelength solution using a third-order polynomial fit. Each spectrum is then re-sampled on to a common wavelength grid using $\text{PYSYNPHOT}$, which conserves flux. This produces a stable and consistent wavelength solution for the entire set of observations.

Obvious cosmic ray hits are removed from the individual spectra at this stage. A sliding Gaussian weighted average with the full width at half-maximum of the instrument is run along the spectra, and points that are $5\sigma$ or greater discrepant with this value are replaced by it. Typically only a small number of points per spectrum are affected.

To generate a light curve, we took the sum of the flux in the desired wavelength range at each time point for both target and comparison, and then took the ratio. To reduce computing time in the systematic noise model analysis (described in Section 3.3), we performed a basic fit first to remove extreme outliers. We fit a simple transit model (Mandel & Agol 2002) with a second-order polynomial baseline fit, and removed any points greater than $5\sigma$ from the model. Most light curves did not require more than one point to be removed. Each light curve was then normalized such that the median of the out-of-transit data is 1.

Figure 2. Raw white-light curves for the flux from WASP-52 (orange) and the comparison star (blue), and their ratio (green), for night 1 (top) and night 2 (bottom). For night 1, a dashed line indicates the position of a feature visible in both of the raw light curves which is removed by the ratio, in order to distinguish it from the nearby feature in the light-curve ratio, which is most likely astrophysical in nature. [A colour version of this figure is available in the online version.]

During the first night there is a feature close to the middle of transit, this feature is discussed in more detail in Section 3.5. This potential spot-crossing feature is distinct from a bump in the data that is closer to the centre of the transit, which is present in both the target and comparison light curves and is removed by taking the ratio. The location of this non-astrophysical bump is marked in Fig. 2.

\[^{1}\text{Distributed as part of the Space Telescope Science Institute STSCI\_PYTHON package, www.stsci.edu/institute/software_hardware/pyraf/stsci\_python}\]
Figure 3. The raw differential spectral light curves for night 1 (left) and night 2 (right). The remaining low level trends and systematics are found to be largely independent of wavelength, and are removed by subtracting the systematic model calculated from the white light curve for each night. The light curves have been offset in flux for clarity. [A colour version of this figure is available in the online version.]

3.2 Fitting procedure

In order to generate the final transmission spectrum for each night, we follow several steps, each of which will be expanded on in detail. First, the transit and systematics model (described in Section 3.3) is fit to the whole of the usable spectral range (4000–8750 Å). We then divide the spectrum into 250 Å spectral bins and fit the transit model to each separately, after removing the best-fitting systematics model for that night, and fixing the system parameters to the values found for the white light curve. This removes the dominant systematics of the whole spectral range from the individual bins, which significantly lowers the error bars. The raw light curves for each spectral bin are plotted in Fig. 3, before the systematic model removal.

A Markov Chain Monte Carlo (MCMC) approach is used to maximize model parameter likelihood and estimate their errors. To perform the MCMC integration, we use the EMCEE code of Foreman-Mackey et al. (2013), which implements the affine-invariant ensemble sampler described in Goodman & Weare (2010).

To fit the transit light curve, we use the analytic models described in Mandel & Agol (2002). The eccentricity is fixed to 0, and at each step we draw the period from a distribution with mean and standard deviation values from Hebrard et al. (2012). The inclination (i), system scale (a/R_∗), radius ratio (R_p/R_*) and quadratic limb darkening coefficients (u1, u2) are free parameters, as well as the parameters of the systematics model. LDTK (Limb Darkening Toolkit) (Parviainen & Aigrain 2015) was used to calculate the priors on the limb darkening parameters for each wavelength range.

Each fit has 50 000 steps with 100 walkers, with the first 10 000 steps discarded as burn in. Convergence was checked by visual inspection of the walker chains and the evolution of their mean and standard deviation for each parameter.

The light curves for the full spectral range for the two nights are first fit simultaneously in order to calculate the best-fitting system parameters, but at all other times the two nights are treated independently.

3.3 Gaussian process and white noise model

GPs are a generalized class of functions that can be used to model correlated noise in time series data. They have a wide range of applications, but have increasingly become popular for accurate parameter estimation for exoplanet transits (e.g. Gibson et al. 2013b; Evans et al. 2015; Parviainen et al. 2016). The covariance between

\[ \text{cov}(x_i, x_j) = \sigma^2 \exp(-\frac{|i-j|}{\ell}) \]

where \( \sigma^2 \) is the variance, \( \ell \) is the correlation length, and \( x_i, x_j \) are the time points.
data points is modelled with a ‘kernel’, which has a simplified functional form. Including a GP noise model allows one to effectively marginalize over the sets of functions that can represent the systematic noise in the data that do not hold any scientific interest. In our case, we use the GP to model everything in the data that is not explained by the transit model.

In this work the Matern 3/2 kernel is used, following Gibson et al. (2013a) who found it performed marginally better than other common kernels for transmission spectroscopy. The Matern kernel is similar to the commonly used squared exponential function, but is more sharply peaked, resulting in more flexibility at short time-scales:

\[ k(t_i, t_j) = \sigma^2 \left( 1 + \sqrt{3} \left( \frac{t_i - t_j}{\tau} \right) \right) \exp \left( -\sqrt{3} \left( \frac{t_i - t_j}{\tau} \right) \right), \] (1)

where \( \alpha \) is the amplitude of the kernel, and \( \tau \) represents a characteristic time-scale of the correlation. In practice we fit for the logarithm of these values, as they are expected to vary over several orders of magnitude.

The Python package GEORGE\(^3\) (Ambikasaran et al. 2016) is used to efficiently calculate the GP covariance matrices and the likelihood at each Markov chain step.

There was a slightly higher level of white noise in the data than could be explained by photon noise alone, presumably due to scintillation. To account for this, and other sources of white noise, a GP model will often include an additional term, \( \sigma_* \), to increase the calculated error bars by a fixed amount.

For the spectrally resolved fits, we found that in the bluest regions the level of additional white noise required was time varying, so we chose to take a similar approach to Gibson et al. (2013b) and model the white noise as a smoothly time varying function. This makes sense, since an enhancement to the white noise, most likely due to the white noise as a smoothly time varying function. This makes

\[ \sigma(t_i) = \sigma_* \exp \left( -\frac{t_i}{\tau} \right) + \sigma_c, \] (2)

where \( \sigma_*, \sigma_\tau, \) and \( \sigma_c \) are additional terms in the model fit.

For consistency, we fit all the spectral light curves with this white noise model. We did not think it was necessary to re-fit the white light curves with this new model, as their residuals do not vary significantly with time. We find that for most wavelength regions the posteriori using the time varying white noise model are no different to those with the fixed increase, but in the bluest channels, where scintillation is expected to have the greatest effect, the more accurate characterization of the noise properties slightly narrows the credible intervals of the transit depth, but only marginally changes the mean values.

3 Available at https://github.com/dfm/george

### 3.4 Application of the model

Due to the presence of the spot-crossing event on the first night, we chose to initially fit the two nights separately to ensure that the GP systematic model was capable of fitting out the event without introducing bias into the other parameter values. Comparison of the parameter values satisfied us that, apart from a small difference in absolute depth which is expected from changes in activity levels, the parameters are consistent on both nights (see Table 1). The final parameter values are calculated by fitting the two nights simultaneously.

Ultimately, what we are interested in is the relative depth of the wavelength channels, or their conditional probability distribution with respect to each other in order to build a transmission spectrum. Systematic noise sources, such as guiding instability or changes in atmospheric transparency, will be the same or subject to a small scaling factors between bands. It is therefore incorrect to treat a resulting transmission spectrum as a set of independent data points, and their calculated error bars will be higher than the intrinsic scatter between them. This could also lead to unrealistic model fits, since most goodness of fit statistics, such as \( \chi^2 \), assume that the data points are independent.

We use the white light curves for each night to remove the common noise trends. A transit model with our GP noise model is fit to the normalized white light curve for each night. The best GP model is then taken and assumed to represent the systematic noise and trends in the data and the spectroscopic light curves are divided by this model, thereby removing the systematic components that are common.

### 3.5 Spot-crossing event

Due to the changing activity levels of the star, it would not a priori be expected that the depth, and hence inferred radius should be consistent between the two nights, as the stellar surface brightness distribution may be inhomogeneous due to spots or plages. Indeed, we find that on the night with the apparent spot-crossing event the implied transit depth is slightly deeper than the other, although the difference in absolute depths between the two nights is not formally significant, at 0.0102 ± 0.0067. Taking these results at face value, they would imply that the stellar surface was on average 0.4 per cent dimmer on that night. Whilst we unfortunately did not have access to contemporaneous monitoring of WASP-52 during the observation period, Hebrard et al. (2012) found that during their second observing season WASP-52 displayed a 16.4 ± 0.04 d period with an amplitude of 0.89 per cent, though there was no significant periodicity found in the first season. The separation between the two transits we observed is 7 d, or roughly half of the rotation period of the star – so it might be expected that the observed spot coverage fraction could be different, despite the observations being close in time.

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**Table 1.** Derived system parameters for WASP-52b. The combined fit includes constraints from Kirk et al. (2016) and Hebrard et al. (2012).

| Parameter | Symbol | Night 1 | Night 2 | Combined | Unit |
|-----------|--------|---------|---------|----------|------|
| Epoch (JD\(_{UTC} - 2450000\)) | \( T_0 \) | 6892.53861 ± 0.00029 | 6899.53749 ± 0.00016 | 5793.676184 ± 0.000033 | d |
| Epoch (BJD\(_{TDB} - 2450000\)) | \( T_0 \) | 6892.54464 ± 0.00029 | 6899.54374 ± 0.00016 | 5793.682045 ± 0.000033 | d |
| Orbital period | \( P \) | – | – | – | d |
| Inclination | \( i \) | 85.33±0.22 \( \pm 0.23 \) | 85.28±0.18 \( \pm 0.17 \) | 85.32±0.14 \( \pm 0.14 \) | deg |
| System scale | \( a/R_* \) | 7.23±0.12 \( \pm 0.13 \) | 7.176±0.087 \( \pm 0.076 \) | 7.200±0.071 \( \pm 0.071 \) | – |
| Radius ratio | \( R_p/R_* \) | 0.1741±0.0063 \( \pm 0.0064 \) | 0.1639±0.0030 \( \pm 0.0030 \) | – | – |

\( \chi^2 \) of these values, as they are expected to vary over several orders of magnitude. Due to the changing activity levels of the star, it would not a priori be expected that the depth, and hence inferred radius should be consistent between the two nights, as the stellar surface brightness distribution may be inhomogeneous due to spots or plages. Indeed, we find that on the night with the apparent spot-crossing event the implied transit depth is slightly deeper than the other, although the difference in absolute depths between the two nights is not formally significant, at 0.0102 ± 0.0067. Taking these results at face value, they would imply that the stellar surface was on average 0.4 per cent dimmer on that night. Whilst we unfortunately did not have access to contemporaneous monitoring of WASP-52 during the observation period, Hebrard et al. (2012) found that during their second observing season WASP-52 displayed a 16.4 ± 0.04 d period with an amplitude of 0.89 per cent, though there was no significant periodicity found in the first season. The separation between the two transits we observed is 7 d, or roughly half of the rotation period of the star – so it might be expected that the observed spot coverage fraction could be different, despite the observations being close in time.

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3 Available at https://github.com/dfm/george
Since Hebrard et al. (2012) carried out their analysis, an additional season of SuperWASP-North (Faedi et al. 2011) data on WASP-52 has become available. We carried out a harmonic analysis to assess how the activity levels vary between seasons. We used a generalized weighted Lomb Scargle periodogram (Zechmeister & Kürster 2009) to search for significant periods in the data, which were taken between HJD 2455400 and 2455800. We generate false alarm probability (FAP) power levels by using the night shuffling technique presented in Collier Cameron et al. (2009) and Maxted et al. (2011). Randomly sampling the nights instead of individual data points preserves correlated noise in the data, whilst removing any periodicities greater than 1 d, this gives a more realistic and conservative estimate of the FAP. The results are plotted in Fig. 4; there is a highly significant peak at 17.79 d in the most recent season. To estimate the errors on the period and the amplitude, we fit a sine curve to the data and ran an MCMC of 10 000 steps, centred around the peak of the periodogram, with a burn in of 1000 steps. We find that the fractional amplitude is 0.0142$^{+0.0007}_{-0.0003}$ and the period is 17.79$^{+0.01}_{-0.01}$ d. The amplitude is significantly higher than during the first and second seasons observed with WASP, which may be indicative of activity cycles. The period is 1.4 d longer than the period found in the second season, which is likely caused by the active regions occurring at different latitudes and differential rotation.

Despite the lack of contemporaneous coverage, the difference in absolute depth between the two nights is therefore consistent with the historical activity levels of the star. Note that the depth on the uncontaminated night is consistent with both the original published value, and the faculae model in Kirk et al. (2016), but is inconsistent with their spot model. All other parameter values agree to within 1σ, and there is no sign of correlation between the GP hyper-parameters and transit parameters (except depth) in the MCMC corner plots. The significant difference between the spot model in Kirk et al. (2016) and both the discovery paper and this work strongly supports their conclusion that their data show the planet crossing faculae rather than spots.

Since the spot-crossing event appears in our data to be grey to within the level of precision, the approach of removing the common GP noise model is preferred over attempting to model the spot directly. This would add additional model parameters and degeneracies, and would not improve the level of precision attained in the recovered transmission spectrum. Inspection of the GP model for night 1 (Fig. 5) reveals at least two distinct components that indicate that the idealization of a single ‘spot crossing’ is unsuitable to this case, and it is more likely to be the crossing of an active region, with multiple spots simultaneously transited. Given the success of the GP model (see Section 4.2), we feel it would be unnecessary to attempt to model this explicitly.

Modelling the spot crossing with the GP is not strictly correct, as the implicit assumption of the GP approach is that the noise properties are the same for the whole observation window. In principle, it would be possible to specify a compound GP that had an additional kernel active only during the transiting portion of the data set in order to simulate the additional correlated noise component from inhomogeneities of the stellar surface. However, since the event is not visible in the individual spectral bins after common-mode removal (see Figs 6 and 7), we chose not to add additional complexity to the model.

An additional possibility is that this feature is not in fact a spot crossing, but an instrumental systematic with no wavelength dependence, features like this are not uncommon in exoplanet light curves. Since the systematic appears to be successfully removed by the common-mode noise model, and the system parameters for the two independent nights agree well, the source of the feature is not important, as it will not have an effect on our results.

4 RESULTS

4.1 Updated system parameters

We fit the white light curves simultaneously for both nights, using the MCMC GP model, the results are shown in Fig. 5. We included the transit epoch data from the discovery paper and Kirk et al. (2016) in order to improve the global system parameter estimates.

Since the mean stellar surface brightness and the noise properties are not expected to be the same on both nights, they are allowed to fit separately, but the other system parameters (a/R∗, limb darkening coefficients and inclination) are fit simultaneously. Our final system parameters are listed in Table 1, and agree to within 1σ with the values in the discovery paper. This provides the system parameters that are fixed during calculation of the spectroscopic light curves.

4.2 Transmission spectra

For each 250 Å bin, the median value of the transit depth and the 68 per cent credible region are calculated from the MCMC posterior. We present the resulting transmission spectra for the two nights in Table 2 and Fig. 8.

Having measurements on two nights fitted independently proved valuable, as we were able to use them as an independent test of the assigned error bars. Assuming that the same transmission spectrum is present on both nights, it is expected that the error-normalized deviation of the points from their average will behave like a set of independent Gaussian measurements, with standard deviation proportional to 1/√2. Performing this test on the two nights, we find that they do indeed behave as expected for a set of independent measurements of the same distribution, once an absolute depth difference between the two nights has been removed. This indicates that the GP/MCMC method has not underestimated the relative uncertainty in each wavelength bin, and that little common-mode uncertainty remains. It also shows that the spot-crossing event has not introduced any bias to our transmission spectrum.
Figure 5. White light model fits for night 1 (top) and night 2 (bottom). In each, the first panel shows the GP model fit to the raw data, the second panel shows the model fit to the data with the systematics model removed, the third panel shows the systematic model and the fourth panel shows the normalized residuals. The dark and light shaded grey regions are the 1σ and 3σ confidence regions, respectively. [A colour version of this figure is available in the online version.]

Since the spectra of the two nights do appear to be describing the same underlying spectrum, and the error bars are reasonable, we use the variance weighted average of the two nights as our final result, shown in Fig. 9.

It is worth emphasizing that since the common noise has been removed, these error bars are only correct relative to each other, and are not a valid measurement of uncertainty of the absolute depth.
As a test for sodium absorption, we repeated the process with increasingly narrow down to 50 Å around the 5900 Å doublet, but found no significant difference to the broader bands. Bands narrower than 50 Å had significantly larger noise, so could not provide further constraints. Whilst the narrow line core of sodium may be present in the spectrum of WASP-52b, it is not possible to detect it at the resolution of the instrument. Higher resolution observations are capable of detecting the line core of sodium even above a cloud/haze deck (e.g. Redfield et al. 2008; Louden & Wheatley 2015).

5 DISCUSSION

5.1 Model atmospheres
Inspecting the final transmission spectrum in Fig. 9, the spectrum appears to be largely flat to within a few pressure scaleheights, and devoid of any obvious absorption features, though the redmost four points are slightly above the median level. Due to the quality and resolution of the available data, a full atmospheric retrieval is not appropriate, especially considering the degeneracies involved in reproducing the flat region of the spectrum (≈4000–7750 Å). Instead we generate a sample of representative atmosphere classes to compare to the data set. A list of all models tested and their goodness of fits are given in Table 3.

All of the model atmospheres are generated using the Non-linear optimal Estimator for Multivariate spectral analySIS radiative transfer code (Irwin, Calcutt & Taylor 1997; Irwin et al. 2008), with precalculated correlated k-tables described in Lee, Fletcher & Irwin (2012). Unless otherwise stated, we assume solar abundances of elements. The only major carbon or oxygen bearing molecule with features in our spectral range is water, for which we assume a volume mixing ratio of 3.83 × 10^{-4}, based on the disequilibrium chemistry model of the terminator of HD 189733b described in Moses et al. (2011).

We assume simple parametrized temperature–pressure profiles generated using the equations presented in Heng et al. (2012). For all models except the hot haze model, we assume the zero albedo equilibrium temperature for WASP-52b in the case of uniform redistribution, which is 1300 K [using f = 0.25 from Seager (2010)]. We first calculate a temperature–pressure profile appropriate for a clear atmosphere with low levels of short-wave scattering $k_s = 6 \times 10^{-4}$ cm$^{-2}$ g$^{-1}$ and $\gamma_0 = 0.06$.

A clear atmosphere with solar metallicity without TiO and VO absorption is found to be very poor due to a clear lack of a broadened sodium feature and Rayleigh slope. These features could be masked to the data set.
Figure 7. Left: Spectrally resolved light curves and best-fitting GP noise models for night 2, after the common mode has been removed. Right: Residuals to the best-fitting model. Dark grey shaded region indicates $1\sigma$ confidence region, dark grey indicates $3\sigma$ confidence. [A colour version of this figure is available in the online version.]

Table 2. Transmission spectrum for WASP-52b. To produce the combined values the absolute offset between night 1 and night 2 was removed and a weighted average of the two nights was taken.

| Wavelength (Å) | Night 1         | Night 2         | Combined         |
|----------------|-----------------|-----------------|-----------------|
| 4000–4250      | $0.1771 \pm 0.0018$ | $0.1647 \pm 0.0022$ | $0.1643 \pm 0.0014$ |
| 4250–4500      | $0.1750 \pm 0.0014$ | $0.1672 \pm 0.0026$ | $0.1632 \pm 0.0013$ |
| 4500–4750      | $0.1780 \pm 0.0020$ | $0.1660 \pm 0.0014$ | $0.1656 \pm 0.0012$ |
| 4750–5000      | $0.1762 \pm 0.0016$ | $0.1646 \pm 0.0012$ | $0.1641 \pm 0.0010$ |
| 5000–5250      | $0.1739 \pm 0.0015$ | $0.1641 \pm 0.0011$ | $0.1629 \pm 0.0009$ |
| 5250–5500      | $0.1752 \pm 0.0013$ | $0.1618 \pm 0.0009$ | $0.1619 \pm 0.0008$ |
| 5500–5750      | $0.1762 \pm 0.0015$ | $0.1653 \pm 0.0017$ | $0.1641 \pm 0.0011$ |
| 5750–6000      | $0.1764 \pm 0.0013$ | $0.1645 \pm 0.0015$ | $0.1639 \pm 0.0010$ |
| 6000–6250      | $0.1769 \pm 0.0012$ | $0.1637 \pm 0.0009$ | $0.1638 \pm 0.0007$ |
| 6250–6500      | $0.1779 \pm 0.0013$ | $0.1637 \pm 0.0012$ | $0.1640 \pm 0.0009$ |
| 6500–6750      | $0.1777 \pm 0.0012$ | $0.1625 \pm 0.0007$ | $0.1630 \pm 0.0006$ |
| 6750–7000      | $0.1806 \pm 0.0016$ | $0.1635 \pm 0.0009$ | $0.1645 \pm 0.0007$ |
| 7000–7250      | $0.1782 \pm 0.0017$ | $0.1644 \pm 0.0009$ | $0.1646 \pm 0.0008$ |
| 7250–7500      | $0.1786 \pm 0.0018$ | $0.1652 \pm 0.0009$ | $0.1652 \pm 0.0008$ |
| 7500–7750      | $0.1789 \pm 0.0015$ | $0.1649 \pm 0.0009$ | $0.1651 \pm 0.0008$ |
| 7750–8000      | $0.1791 \pm 0.0007$ | $0.1659 \pm 0.0009$ | $0.1660 \pm 0.0006$ |
| 8000–8250      | $0.1778 \pm 0.0010$ | $0.1669 \pm 0.0010$ | $0.1658 \pm 0.0007$ |
| 8250–8500      | $0.1780 \pm 0.0007$ | $0.1667 \pm 0.0017$ | $0.1664 \pm 0.0016$ |
| 8500–8750      | $0.1798 \pm 0.0024$ | $0.1681 \pm 0.0022$ | $0.1675 \pm 0.0016$ |

Figure 8. Top: Spectrum of the target (orange) and comparison (blue) stars and their ratio (green). The 250 Å bins used to generate the spectrum are indicated with dashed lines. Bottom: Transmission spectra from night one (pink) and night two (blue). The absolute offset between the two nights has been removed from the second night; this offset is likely caused by changes in spot coverage. The error bars are the 68 per cent credible intervals from the MCMC posteriors for each spectral bin. Night 2 has been offset slightly in wavelength for clarity. [A colour version of this figure is available in the online version.]
We assume the same parameters as for the reproducing the strong Rayleigh feature seen in the with a thermosphere that reaches 2000 K. This would be capable of equations of Heng et al. (2012) with a strong thermal inversion layer analytical temperature–pressure profile for HD 189733b using the 500 K (Sing et al. 2011). Pont et al. (2013) generate an example temperature of the planet), but bluewards of 6000 Å for data taken by high altitude clouds, or de-emphasized by additional molecular absorption. Several hot Jupiters have been found to have optical spectra that are dominated by Rayleigh slopes, presumably caused by haze. For HD 189733b, which has a similar equilibrium temperature and parent star spectral type to WASP-52b, Pont et al. (2013) find that the majority of the data taken with HST/Advanced Camera for Surveys are well fit by a Rayleigh slope model with an equilibrium temperature of ~1300 K (matching the expected equilibrium temperature of the planet), but bluewards of 6000 Å for data taken with HST/Space Telescope Imaging Spectrograph (STIS) the slope is somewhat steeper, having a best-fitting temperature of 2100 ± 500 K (Sing et al. 2011). Pont et al. (2013) generate an example analytical temperature–pressure profile for HD 189733b using the equations of Heng et al. (2012) with a strong thermal inversion layer with a thermosphere that reaches 2000 K. This would be capable of reproducing the strong Rayleigh feature seen in the HST/STIS data. We assume the same parameters as for the T–P profile ($k_s = 0.0670, \gamma_0 = 10.0, n = 0.1$) which is equivalent to a geometric albedo of 0.5. For WASP-52b, this results in a thermosphere that reaches 2100 K at 0.1 mbar. The steep Rayleigh slope a haze produces in this hot thermosphere is clearly a very poor fit to the data, as seen in Fig. 9.

We also test a more subdued Rayleigh slope, using our original non-inverted T–P profile. The slope can be further de-emphasized by assuming slightly larger particles that exhibit settling and hence have a smaller effective scaleheight in the atmosphere, we parametrize this by using a fractional scaleheight for the scattering particles that is 0.3 of the gas pressure scaleheight. This still produces a poor fit that can be confidently ruled out (see Table 3).

Sing et al. (2016) show that many hot Jupiters have their optical and near-infrared spectral features partially or fully obscured by grey cloud layers, so it seems likely that our spectrum of WASP-52b could also be flattened by high altitude clouds. Kirk et al. (2016) find a flat spectrum compatible with a cloudy interpretation in their analysis of WASP-52b with high precision three-band photometry. To model the effect of clouds, we insert opaque layers to the radiative transfer code at 0.1, 1 and 10 mbar. All provide significant improvement over the clear spectrum. The flat spectrum provided by the 0.1 mbar cloud layer is the best fit to the data. We are unable to distinguish between clouds at any higher altitude than 0.1 mbar, as the spectrum is already completely flattened. This is consistent with cloud formation theories for HD 189733b, which has the same equilibrium temperature as WASP-52b (Lee & Juncher 2015). These clouds would likely be composed of a range of chemical species, with magnesium silicates as important contributors.

An alternate explanation could be that unresolved molecular features in the planet’s atmosphere are de-emphasizing the Rayleigh slope and sodium features. As an example, we consider an atmosphere with TiO and VO absorption. In hot Jupiter atmospheres, T and V in the gas phase are expected to be practically entirely in the oxide forms from chemical equilibrium, but for cooler planets like WASP-52b with equilibrium temperatures below 1600 K condensation and cold trapping remove significant fractions from the atmosphere (Fortney et al. 2008). A full treatment of TiO and VO abundance is beyond the scope of this work, instead, we test the effect of several different un-condensed fractions on the spectrum. We assume solar abundances of T and V (Asplund, Grevesse & Jacques Sauval 2006).

A fraction of 1 part per million is indistinguishable from the clear spectrum but increasing the fraction above this level begins to improve the fit by de-emphasizing the Rayleigh slope and sodium feature. We find that an abundance fraction of 0.01 produces a good fit, which is formally indistinguishable from the goodness of fit provided by the cloud-dominated model. However, the coolness of

![Figure 9. Final combined transmission spectrum for the two nights. Overplotted are a variety of atmosphere classes. Clear, with solar metallicity and no TiO (orange), an HD 189733b style Rayleigh scattering slope that covers the entire optical range, with a temperature inversion (blue). A clear atmosphere with a solar abundance of T and V, assuming 100 per cent is locked up in TiO and VO (pink). A Rayleigh slope with settling (green) representing a hazy atmosphere with larger particles. A grey absorbing cloudbase at 0.1 mbar (yellow). [A colour version of this figure is available in the online version.](image-url)
the atmosphere of WASP-52b and the lack of firm detections of TiO in other hot Jupiter atmospheres make this explanation unlikely, so we favour the cloudy model.

A higher resolution search for the presence of the sodium feature (which is still present in the TiO case, but mostly obscured in the cloud-dominated case except for a narrow line core) could potentially help break the degeneracy. A search for the water feature in the infra-red would also be a useful diagnostic, as Sing et al. (2016) shows this is typically obscured in cloudy atmospheres. Our results highlight the need for both low and high resolution observations with a large wavelength coverage to break the degeneracies of exoplanet atmosphere retrieval.

Of the models tested, a flat, cloud-dominated spectrum provided the best fit to the full data set – however, the residuals are dominated by the reddest four points in the spectrum (7750–9000 Å). The significant difference in goodness of fit when including these points may be an unexplained systematic error in the data, or indicate the presence of an unknown absorber.

This feature appears to be present on both nights, showing that it is repeatable, but it may be a common artefact of the instrument or the reduction and analysis.

The feature may have been introduced as an instrumental or atmospheric effect. There are signs of fringing at the reddest ends of the chip. It is not on the region of the chip (γ pixel > 2200), but not in the wavelength region corresponding to the feature. The regions of the chip affected by fringing show a dramatically increased high frequency noise, which is distinct to a persistent increase in radius ratio. The error bars in the 7750–8750 Å region are only somewhat larger than the errors elsewhere in the spectrum. OH Meinel bands are present in the telluric spectrum at these wavelengths, but they are removed by our sky background subtraction and differential photometry. An optical blocking filter was not used when taking these data, so redwards of 6000 Å the spectrum is weakly contaminated by the blue end of the second order spectrum. However, this effect is low order and is not able to increase the observed transit depth above the blue end of the spectrum.

Incorrect limb darkening parameters can cause errors in radius retrieval (e.g. Csizmadia et al. 2012; Espinoza & Jordan 2015) and could introduce a correlated bias to a transmission spectrum. The limb darkening values and errors were generated with LDTK. LDTK fits a parametrized limb darkening profile to PHOENIX-calculated specific intensity spectra (Husser et al. 2013). To test that these model profiles were not influencing the shape of the resulting transmission spectrum, the fit was repeated without the LDTK derived priors on the limb darkening parameters. To improve convergence and prevent unphysical profiles, we followed the formalism of Holman et al. (2006) and Burke et al. (2008). We find that without the additional limb darkening constraints the errors on the resulting spectrum are slightly higher, but the shape of the spectrum is preserved. Therefore, it is not likely that limb darkening can account for the four outlier points.

We can find no obvious systematic reason for this feature in our analysis. While this does not rule additional instrumental effects that we have not considered, it may be a hint of an additional high altitude opacity source. Nikolov et al. (2014) find a similar redward feature in their HST/STIS G750L low-resolution transmission spectrum of HAT-P-1b. A similar effect can also be seen on HD 209733b (Knutson et al. 2007), WASP-19b with FORS2 (Sedaghati et al. 2015) and TrES-3b with OSIRIS (Parviainen et al. 2016). However, we note that in all these cases, including ours, the unexplained feature is found at the edge of the usable region of the spectra, where the signal to noise is lower and systematics are more likely. This may imply a common instrumental source that we have so far been unable to identify. Alternatively, if this is in fact a real feature, it could be caused by absorption from a molecule not currently included in hot Jupiter atmosphere models. It is also possible that it could be caused by the composition of the particles in the cloud deck, if this layer is vertically extended and has a higher opacity in the red.

5.2 Un-occulted spots

WASP-52 is known to be an active star, and as discussed in Section 3.5, the star shows periodic modulations in brightness of the order of ~1 per cent, which is likely due to starspots rotating in and out of view. The temperature of the starspots on the very similar K star HD 189733 were found to be 4250 K by Sing et al. (2011). Using this temperature, which is 750 K cooler than the photosphere, gives a spot coverage fraction of about 4 per cent. This corresponds well to the lower limit of 4 per cent spot coverage on HD 189733 calculated by McCullough et al. (2014), and is significantly higher than the 0.3 per cent spot coverage of the Sun at solar maxima (Deming et al. 2013). The value of 4 per cent spot coverage is an average across an observing season however, and as previously mentioned there was no contemporaneous photometry of WASP-52, so it is possible that the spot coverage was higher than this at the time of these observations.

Un-occulted spots can have an effect on a transmission spectrum, mimicking a Rayleigh scattering slope or molecular features such as water (e.g. McCullough et al. 2014), so before comparing planetary atmosphere models to the spectra, it is important to quantify what effects un-occulted spots may have.

We simulate the effects of spots on the transmission spectrum using stellar spectra synthesized from a grid of ATLAS9 stellar atmosphere models by Howarth (2011). We use a log(g) of 4.5 and a temperature of 5000 K for the photosphere, and a range of temperatures for the starspots. The transmission spectrum is generated as

\[
\tilde{\delta}(\lambda) = \delta(\lambda) \frac{1}{1 - \eta \left(1 - \frac{F_{\lambda,\text{spot}}}{F_{\lambda,\text{phot}}}\right)},
\]

where \(\eta\) is the spotted fraction of the visible stellar surface, \(F_{\lambda,\text{spot}}\) and \(F_{\lambda,\text{phot}}\) are the spectral radiance of the spots and photosphere, \(\delta(\lambda)\) is the ‘true’ transit depth at wavelength \(\lambda\), here assumed to be a constant value of 0.164, and \(\tilde{\delta}(\lambda)\) is the observed value.

The results are plotted in Fig. 10 for a range of spot temperatures and coverage fractions. The nominal case of ~4 per cent coverage with 4250 K spots does not show any significant features within our level of precision. Increasing the spot contrast and the coverage fraction produces a spectrum with a bluewards slope that does not correspond to the observed spectrum.

We therefore do not expect that un-occulted spots have an appreciable impact on our transmission spectrum.

5.3 Transit timing

Baluev et al. (2015) searched for periodic Transit Timing Variations in 10 exoplanet systems, including WASP-52b and found no evidence of periodic variations. We leverage the high precision of the white noise light curves and the longer time baseline between the ephemeris reported in the discovery paper (Hebrard et al. 2012) in order to test for secular drifts in the ephemeris of WASP-52b. The error bars on our ephemerides are probably larger than those
Figure 10. The effect of several un-occulted spot scenarios, plotted against the weighted average of the two nights transmission spectrum (black). Top: Effect of varying the spotty fraction of the star, from light to dark: 0.04, 0.1, 0.2, all with a spot temperature of 4250 K. Bottom: Effect of varying the temperature contrast of the starspots, from light to dark: 4750, 4250, 3750 K, all with a spot coverage fraction of 0.1. [A colour version of this figure is available in the online version.]

Figure 11. Transit timing residuals from a linear ephemeris. The 1σ contour for a linear ephemeris drift model is plotted in grey. No significant deviation from a linear ephemeris is found. [A colour version of this figure is available in the online version.]

reported in Kirk et al. (2016) and Hebrard et al. (2012) due to the greater model flexibility allowed by our GP analysis.

We convert the transit dates to BJD in order to calculate the ephemeris using an online tool4 (Eastman, Siverd & Gaudi 2010). Hebrard et al. (2012) report their central transit time in HJD, which can introduce errors at the ∼1 s level compared to calculating BJD(BJD) directly, so we add this uncertainty in quadrature to their reported errors.

We calculated the errors using an MCMC with a chain length of 100 000 steps and a burn in chain of 1000 steps. The best-fitting ephemeris is shown in Fig. 11. A linear ephemeris is formally a poor fit, which could be interpreted as evidence of a non-linear ephemeris in this system. However, we believe it is more likely that previous work may have systematically underestimated the size of their errors by not properly accounting for the presence of correlated noise through GPs or some other technique. Future measurements of the ephemeris of this system may shed more light on the possibility of additional companions.

The large time baseline (4 yr) between the discovery paper and this work allows a significant improvement in the uncertainty of the period. The aforementioned concern over underestimated errors is not particularly important, as the error budget is dominated by the gradient over time periods this long.

6 CONCLUSIONS

We have performed transmission spectroscopy on WASP-52b, a highly inflated hot Jupiter orbiting an active K star. Our GP and common noise model approach to modelling resulted in a precise relative transmission spectrum that was consistent across two nights despite the presence of a potential spot. Our errors are of the order of a single scaleheight.

The possible ‘spot-crossing’ feature on the first night appears to be grey, and is not visible in the spectrally resolved light curves after common noise term removal. This implies that it is either a wavelength independent systematic, or that the temperature contrast of the spot to the rest of the photosphere is high, which is an expected feature for cooler stars such as WASP-52. We have performed a harmonic analysis of the long-term photometry of WASP-52, and find that the activity level may be changing over time, with evidence of differential rotation.

We attempted to fit representative model atmospheres to the transmission spectrum, but were unable to find a satisfactory fit to the entire spectral range. For the majority of the spectrum (4000–7750 Å), a cloud layer at 0.1 mbar provides an acceptable fit to the data, but is inconsistent with a slightly deeper transit at wavelengths >7750 Å. We explore several different systematic reasons for this excess depth, and are unable to find a compelling cause. If it is a real feature of the atmosphere it may be the result of an additional unknown absorber.

The cloud layer at 0.1 mbar is consistent with cloud formation theories for HD 189733b, which has the same equilibrium temperature as WASP-52b (Lee et al. 2015). These clouds would likely be composed of a range of chemical species, with magnesium silicates as important contributors.

The transmission spectrum is dramatically different to HD 189733b, which is dominated by a Rayleigh slope caused by high altitude haze. The difference between these transmission spectra provides further evidence of the rich and as yet unexplained diversity within exoplanet atmospheres.

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