Efficient identification of exoplanetary transit candidates from SuperWASP light curves

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ABSTRACT

Transiting extrasolar planets constitute only a small fraction of the range of stellar systems found to display periodic, shallow dimmings in wide-field surveys employing small-aperture camera arrays. Here we present an efficient selection strategy for follow-up observations, derived from analysis of the light curves of a sample of 67 SuperWASP targets that passed the selection tests we used in earlier papers, but which have subsequently been identified either as planet hosts or as astrophysical false positives. We determine the system parameters using Markov-chain Monte Carlo analysis of the SuperWASP light curves. We use a constrained optimization of χ^2 combined with a Bayesian prior based on the main-sequence mass and radius expected from the Two Micron All Sky Survey $J - H$ colour. The Bayesian nature of the analysis allows us to quantify both the departure of the host star from the main-sequence mass–radius relation and the probability that the companion radius is less than 1.5 Jupiter radii. When augmented by direct light-curve analyses that detect binaries with unequal primary and secondary eclipses, and objects with aperture blends that are resolved by SuperWASP, we find that only 13 of the original 67 stars, including the three known planets in the sample, would qualify for follow-up. This suggests that planet discovery 'hit rates' better than

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one-in-five should be achievable. In addition, the stellar binaries that qualify are likely to have astrophysically interesting stellar or substellar secondaries.

Key words: methods: data analysis – techniques: photometric – planetary systems.

1 INTRODUCTION

Wide-field photometric surveys using commercial, small-aperture camera lenses and large-format CCDs have yielded several discoveries of new transiting extrasolar planets (Alonso et al. 2004; McCullough et al. 2006; O'Donovan et al. 2006; Bakos et al. 2007a,b; Burke et al. 2007; Collier Cameron et al. 2007; O'Donovan et al. 2007). Deeper surveys based on light curves from the Optical Gravitational Lensing Experiment (OGLE) project have produced a further five such planets (Konacki et al. 2003; Bouchy et al. 2004; Konacki et al. 2004; Pont et al. 2004; Konacki et al. 2005).

The most efficient follow-up strategies (in terms of telescope time expended per false positive) are high-resolution radial-velocity surveys using 2-m and larger telescopes. Pont et al. (2005a) points out that a single spectrum quickly unmasks double-lined spectroscopic binaries and rapid rotation resulting from tidal locking of the primary's rotation by a stellar mass companion. It also reveals pressure broadening of strong absorption-line wings, distinguishing K giants from K dwarfs. Second-epoch spectra then eliminate the narrow, single-lined stellar spectroscopic binaries among the surviving main-sequence stars. All the teams engaged in such searches report high rates of astrophysical false positives. For example, Pont et al. (2005a) carried out a detailed analysis of targets followed up in the OGLE Carina field. They found that nearby blended eclipsing binaries, grazing equal-mass stellar binaries and transits by planet-sized stars near the bottom of the main sequence are the most common impostors.

Several authors have described methods for pre-selecting targets for such programmes in order to minimize the number of astrophysical false positives in samples selected for radial-velocity follow-up. Seager & Mallén-Ornelas (2003) pointed out that the relative radii of the planet and star can be estimated from the transit depth, while the durations of ingress and egress can break the degeneracy between the impact parameter and the star's radius. The transit duration then yields the radius of the primary, and Kepler's third law establishes its density, allowing dwarf–giant separation. The masses of bona fide main-sequence primaries are then estimated from the mass–radius relation.

In practice, however, the signal-to-noise ratios of transit profiles secured with wide-field cameras are seldom good enough to determine the duration of ingress and egress reliably. This problem led Tingley & Sackett (2005) to propose a simpler test, based on transit duration, depth and orbital period, for the selection of transit candidates worthy of follow-up. Drake (2003) and Sirko & Paczyński (2003) used ellipsoidal variations in the out-of-transit light curve to eliminate stellar binaries. Even with careful pre-selection on transit depth, duration and primary star colour and ellipsoidal variations using a combination of all these methods, the success rate of such follow-up programmes currently runs at about one planet per 10 or more stars surveyed (Pont et al. 2005a). To make the most efficient use of follow-up facilities, more efficient candidate-selection methods are clearly needed. Our goal is to perform efficient selection using the discovery observations in conjunction with data mining of publicly available data bases of photometry and

proper motions, without having to perform further time-consuming observations.

Here we present a Bayesian approach to identifying targets whose light-curve morphologies and infrared colours are consistent with expectations for main-sequence stars with transiting Jupiter-sized companions. In Sections 2 and 3 we describe the SuperWASP photometry and follow-up spectroscopy. The spectra, augmented by photometric tests for eliminating blends with nearby eclipsing binaries and grazing stellar binaries with observable secondary eclipses, yield spectroscopic and photometric classifications of 67 high-priority transit candidates selected from the 2004 SuperWASP transit survey data.

In Section 4 we analyse the light curves of all 67 stars to derive posterior probability distributions for their orbital parameters and radii via Markov-chain Monte Carlo (MCMC) analysis. In Section 5 we show that the stellar and planetary parameters obtained for WASP-1 and WASP-2 with this method compare well with results obtained from high-precision transit photometry with larger instruments. In Section 6 we develop candidate-selection criteria based on the posterior probability that the companion has a radius appropriate to a planet, and apply them to the SuperWASP sample. An ancillary method of dwarf–giant separation based on the reduced proper motion (RPM) and the $J - H$ colour is given in Section 7.

2 OBSERVATIONS

Among the 109 SuperWASP transit candidates selected for potential spectroscopic follow-up, 67 stars were examined in sufficient detail to establish their nature. These 67 objects are listed in Table 1 together with their spectroscopic and photometric classifications. They were initially selected for follow-up using criteria described by Collier Cameron et al. (2006), Christian et al. (2006), Street et al. (2007) and Lister et al. (2007). Among them are the three known planet host stars XO-1 (McCullough et al. 2006), WASP-1 and WASP-2 (Collier Cameron et al. 2007). The remaining 64 were eliminated as planet candidates using the spectroscopic and photometric criteria described here and in Section 3.

2.1 SuperWASP photometry

The light curves analysed in this paper were secured between 2004 May and September using the SuperWASP wide-field camera array. The SuperWASP instrument and data pipeline are described in full by Pollacco et al. (2006). During 2004, the instrument comprised five f/1.8 Canon lenses of 200-mm focal length backed by Andor CCD arrays of 2048 × 2048 13 μm pixel. Each camera imaged an area of sky 7.8 deg^2. The automated observing routine followed a raster pattern sweeping from 3.5 h east to 3.5 h west of the meridian, returning to a given field every 6 min on average. The light curves of most targets comprise some 3000 observations secured over a period of 100–150 d.

The ensemble photometry from each camera on each night was calibrated and corrected for extinction, colour and zero-point terms using networks of local secondary standards. Additional patterns of

Table 1. Classification criteria for 67 SuperWASP transit candidates. The codes in the Tel/Inst column are E = OHP 1.93 m with ELODIE, S = OHP 1.93 m with SOPHIE, I = INT with IDS, T = Tautenburg 2-m telescope, W = SuperWASP, X = XO project. Spectroscopic classifications denote whether the spectrum is rotationally broadened (Gaussian $\sigma > 8$ km s^{-1}), single or double, upper limits on radial-velocity variability and BisVar = line-bisector variability. The presence of interstellar sodium or Class III pressure broadening in the wings of strong lines indicates a giant. Photometric classifications are AB = aperture blend, SE2 = secondary eclipse seen when folded on twice best-fitting period, EV2 = ellipsoidal variation seen when folded on twice best-fitting period. The values of the main-sequence (MS) prior and the probability that the companion radius is less than 1.5 R_{Jup} yield the selection criteria in the penultimate column; the final selection including photometric rejection criteria is given in the final column. The acronyms RPM and MCMC denote reduced proper motion and Markov-chain Monte Carlo, respectively.

1SWASP	Tel/Inst	Spectral classification	Photometric classification	RPM classification	MS prior $S = -2 \ln \mathcal{P}(M_*, R_*)$	Probability $(R_{\mathrm{p}} < 1.5\, R_{\mathrm{Jup}})$	Select? (MCMC only)	Select? (MCMC and photometric)
Planets								
J002040.07+315923.7	S	Planet (WASP-1)	–	Dwarf	0.98	0.989	TRUE	TRUE
J160211.83+281010.4	X	Planet (XO-1)	–	Dwarf	0.04	0.958	TRUE	TRUE
J203054.12+062546.4	S	Planet (WASP-2)	–	Dwarf	0.84	1.000	TRUE	TRUE
Spectral binaries			–					
J130322.00+350525.4	I	SB1	–	Dwarf	3.87	0.445	TRUE	TRUE
J133339.36+494321.6	E	SB1	–	Dwarf	0.24	0.992	TRUE	TRUE
J134815.27+464811.0	E	Broad	–	Dwarf	0.01	0.864	TRUE	TRUE
J174118.30+383656.3	S	SB1	–	Dwarf	0.86	0.983	TRUE	TRUE
J175401.58+322112.6	E	SB1	–	Dwarf	0.00	0.995	TRUE	TRUE
J181858.42+103550.1	E	Broad	–	Dwarf	0.26	0.905	TRUE	TRUE
J184119.02+403008.4	T	SB1	–	Dwarf	0.86	0.970	TRUE	TRUE
J203704.92+191525.1	T	SB1	–	Dwarf	0.08	0.999	TRUE	TRUE
J210009.75+193107.1	E	Broad	–	Dwarf	0.30	0.998	TRUE	TRUE
J211608.42+163220.3	S	SB2	–	Dwarf	1.42	0.396	TRUE	TRUE
J212855.03+075753.5	I	SB1	–	Dwarf	0.11	0.312	TRUE	TRUE
J223320.44+370139.1	S	SB1	–	Dwarf	0.22	0.998	TRUE	TRUE
J234318.41+295556.5	S	SB1	–	Dwarf	0.10	0.988	TRUE	TRUE
J010151.11+314254.7	S,T	SB1 broad	–	Dwarf	17.56	0.970	FALSE	FALSE
J023445.65+251244.0	T	SB1	–	Dwarf	7.37	0.034	FALSE	FALSE
J031103.19+211141.4	S	Broad	–	Dwarf	10.52	0.000	FALSE	FALSE
J051221.34+300634.9	S	Multiple	–	Dwarf	7.36	0.001	FALSE	FALSE
J115718.66+261906.1	I	SB1	–	Dwarf	0.42	0.074	FALSE	FALSE
J141558.71+400026.7	E	Broad	–	Dwarf	0.12	0.002	FALSE	FALSE
J152131.01+213521.3	I	SB1	–	Dwarf	2.21	0.000	FALSE	FALSE
J153135.51+305957.1	E	Broad	–	Dwarf	11.67	0.000	FALSE	FALSE
J165949.13+265346.1	S	Broad	–	Dwarf	8.41	0.032	FALSE	FALSE
J172549.13+502206.4	E	Broad	–	Dwarf	2.66	0.150	FALSE	FALSE
J173650.17+105557.9	E	Broad	–	Dwarf	0.60	0.000	FALSE	FALSE
J173748.98+471348.7	I	SB1	–	Dwarf	7.84	1.000	FALSE	FALSE
J174327.81+582512.7	E	Broad	–	Dwarf	14.02	0.002	FALSE	FALSE
J175511.09+134731.5	E	Broad	–	Dwarf	10.39	0.042	FALSE	FALSE
J175620.84+253625.7	T	SB2	–	Dwarf	3.35	0.005	FALSE	FALSE
J180010.55+214510.2	T	SB1	–	Giant	0.13	0.010	FALSE	FALSE
J182620.36+475902.8	E	SB2	–	Giant	90.38	0.000	FALSE	FALSE
J202824.02+192310.2	E	Broad	–	Dwarf	0.86	0.000	FALSE	FALSE
J203906.39+171345.9	E	SB1	–	Dwarf	4.67	0.015	FALSE	FALSE
J215802.14+253006.1	S	SB2	–	Dwarf	32.53	0.906	FALSE	FALSE
J231533.56+232637.5	T	SB1	–	Dwarf	59.89	0.017	FALSE	FALSE
Photometric binaries								
J003039.21+205719.1	T,W	SB2	SE2	Dwarf	1.60	0.022	FALSE	FALSE
J015711.29+303447.7	T	SB2	SE2	Dwarf	1.42	0.927	TRUE	FALSE
J160242.43+290850.1	W	–	SE2	Giant	16.32	0.000	FALSE	FALSE
J165423.72+241335.7	W	–	SE2	Giant	2.88	0.847	TRUE	FALSE
J183104.01+323942.7	S	SB2	SE2	Dwarf	0.68	0.997	TRUE	FALSE
J183805.57+423432.3	W	–	SE2	Giant	4.08	0.995	TRUE	FALSE
J205308.03+192152.7	S	SB2	SE2	Dwarf	3.22	1.000	TRUE	FALSE
J210909.05+184950.9	W	–	EV2	Dwarf	0.36	0.991	TRUE	FALSE
J222353.83+412813.5	W	–	EV2	Dwarf	53.32	0.000	FALSE	FALSE
J223651.20+221000.8	S	SB2	SE2	Giant	1.13	0.021	FALSE	FALSE

Table 1 – *continued.*

1SWASP	Tel/Inst	Spectral classification	Photometric classification	RPM classification	MS prior $S = -2 \ln \mathcal{P}(M_*, R_*)$	Probability $(R_p < 1.5\,R_{Jup})$	Select? (MCMC only)	Select? (MCMC and photometric)
Aperture blends								
J025500.31+281134.0	S,T	<10 m s^{-1}	AB	Giant	15.19	0.000	FALSE	FALSE
J133156.81+460026.6	W	–	AB	Giant	82.69	0.000	FALSE	FALSE
J161644.68+200806.8	W	–	AB	Giant	79.66	0.000	FALSE	FALSE
J181454.99+391146.0	W	–	AB	Giant	2.55	1.000	TRUE	FALSE
J184303.62+462656.4	S	I/S Na I, Class III	AB	Giant	60.26	0.971	FALSE	FALSE
J204142.49+075051.5	W	–	AB	Giant	1.54	1.000	TRUE	FALSE
J204712.42+202544.5	W,T	<1 km s^{-1}	AB	Giant	1.93	1.000	TRUE	FALSE
J204745.08+103347.9	W	–	AB	Giant	65.54	0.780	FALSE	FALSE
J213416.37+205644.4	W,T	–	AB	Dwarf	35.47	0.000	FALSE	FALSE
J215226.17+331424.7	W	–	AB	Dwarf	52.29	0.036	FALSE	FALSE
J222317.60+130125.8	S	I/S Na I, Class III	AB	Giant	38.09	0.994	FALSE	FALSE
J223809.90+401038.1	W	–	AB	Giant	5.55	1.000	FALSE	FALSE
J224104.57+363648.3	W	–	AB	Giant	43.77	0.994	FALSE	FALSE
Other blends, giants								
J161732.90+242119.0	S,E	<10 m s^{-1}	–	Dwarf	0.53	1.000	TRUE	TRUE
J210318.01+080117.8	S	I/S Na I, BisVar	–	Dwarf	0.26	0.983	TRUE	TRUE
J005225.90+203451.2	S,T	<10 m s^{-1}	–	Dwarf	14.03	0.008	FALSE	FALSE
J181252.03+461851.6	S,E	<10 m s^{-1}	–	Dwarf	2.46	0.036	FALSE	FALSE
J204125.28+163911.8	S	Class III	–	Giant	37.85	1.000	FALSE	FALSE
J205027.33+064022.9	S	<10 m s^{-1}	–	Dwarf	33.23	0.986	FALSE	FALSE
J214151.03+260158.5	S	–	–	Giant	26.81	1.000	FALSE	FALSE

systematic error affecting all the stars were identified and removed using the SysRem algorithm of Tamuz, Mazeh & Zucker (2005). The search for transit-like events and selection of astrophysically plausible transit candidates was performed using the methodology of Collier Cameron et al. (2006), backed up by visual inspection of the light curves to verify the reality of the transits as described by Christian et al. (2006).

In total these procedures yielded a 'long list' of 109 transit candidates with periods less than 5 d, from which obvious impostors such as ellipsoidal variables and objects showing clear secondary eclipses on the best-fitting period had been eliminated.

2.2 OHP 1.93-m spectroscopy

The initial spectroscopic follow-up of transit candidates identified from the 2004 SuperWASP survey was carried out during three four-night observing runs on the 1.93-m telescope at l'Observatoire de Haute-Provence (OHP). The first two runs, in 2006 May and June, utilized the ELODIE spectrograph and radial-velocity software (Bouchy et al. 2006). ELODIE was replaced by its successor SOPHIE in time for the third run of the series, in 2006 August. Both instruments were used in their 'high-efficiency' modes, which cover the wavelength range from 387 to 694 nm with resolving power $\lambda/\Delta\lambda = 35\,000$. Radial velocities are computed at the telescope, using cross-correlation with a mask spectrum, using ThAr arc spectra to monitor the stability of the instrument. The typical radial-velocity precisions were of the order of 40 m s^{-1} for narrow-lined objects observed with ELODIE, and 12 m s^{-1} with SOPHIE. The cross-correlation functions allow several types of astrophysical false positive to be identified from a single exposure. Targets were rejected if the first-epoch spectrum revealed them to be double lined or rapidly rotating (and hence presumably tidally locked by a stellar mass companion). Examples of such cross-correlation functions are illustrated in fig. 1 of Pont et al. (2005a). Velocity shifts of more than a few hundred m s^{-1} between the first spectrum and a second measurement on a subsequent night also led to rejection as a stellar binary.

As Table 1 shows, 14 targets were eliminated as broad, single-lined or double-lined binaries during the ELODIE runs. 12 stars were identified as binaries with SOPHIE, while a further 10 were found to be either giants (deduced visually from absence of pressure-broadening wings on the Na ID and Mg I*b* lines, and/or from the presence of narrow foreground interstellar sodium absorption), or to exhibit no detectable radial-velocity variation (suggesting blending with a nearby eclipsing binary).

2.3 Tautenburg spectroscopy

Further spectra of several targets were secured using the coudé echelle spectrograph on the 2-m Alfred Jensch telescope at the Thüringer Landessternwarte Tautenburg over the winter of 2006–07. A 2-arcsec slit width was used, yielding a spectral resolving power $\lambda/\Delta\lambda = 35\,000$. For most observations, velocities were obtained by cross-correlation referenced to the ThAr wavelength calibration, using telluric lines as a secondary reference to monitor and correct possible instrumental shifts. The overall velocity precision was typically of the order of 200 m s^{-1}. The rejection criteria were similar to those described above for the OHP observations. Six additional stars were eliminated as binaries on the basis of these observations.

2.4 INT spectroscopy

Spectra were secured of several previously unobserved targets using the intermediate-dispersion spectrograph (IDS) on the 2.5-m Isaac Newton Telescope (INT) at the Observatorio del Roque de los Muchachos, La Palma, during 2007 April. Similar rejection criteria were applied. Five stars were found to be single-lined binaries.

3 FURTHER PHOTOMETRIC TESTS

3.1 Resolved aperture blends

Eclipsing binary systems blended with nearby bright, non-variable stars represent the most common type of mimic in planetary transit surveys (Pont et al. 2005a). The WASP data reduction pipeline performs photometry in three concentric circular apertures centred on each object, with radii of 2.5, 3.5 and 4.5 13.5-arcsec pixels. In cases where an eclipsing binary system lies just outside the main (3.5-pixel radius) photometric aperture of a non-variable star, the two systems will contribute different amounts of light to different apertures. Light leaking from the wings of the binary's image into the apertures of the non-variable star may mimic a shallow transit at times when the binary is in eclipse. The amount of leakage is the greatest in the outer apertures. As a consequence, the depth of the 'transit' in the non-variable object is the greatest when measured in the outer apertures.

The eclipsing binary BQ Pegasi is a typical example. This is an Algol system with primary eclipses 2.6 mag deep, located 69 arcsec away from a 12-mag non-variable star (1SWASP J213416.37+205644.4). The centre-to-centre separation of these two systems is approximately 5 pixels causing a small amount of overlap between the photometric apertures. This overlap was sufficient to induce a 2 per cent dip in brightness in the non-variable star, closely mimicking the photometric signal of a transiting planet with a period of 1.574 55 d – identical to BQ Peg. As a result the non-varying star was flagged by the transit detection algorithm as a high-priority planet candidate. The planet candidate light curve is shown in Fig. 1 together with the light curve for BQ Peg. We see that the phase of the false transit, folded on the period of BQ Peg, matches that of the binary's primary eclipse. Without knowledge of the variable nature of the blending system this candidate would be difficult to eliminate without further follow-up. However, a plot of the difference in magnitudes between the main and outer photometric apertures (Fig. 2), phase folded on the orbital period determined for the planet candidate, shows a clear V-shaped eclipse indicating that the star is blended. A non-blended system would not
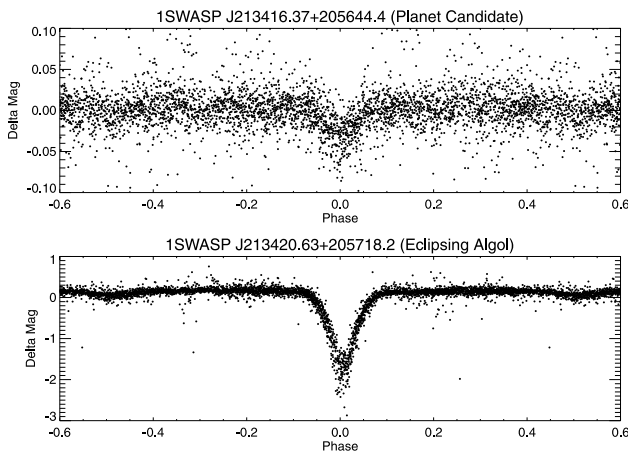

Figure 2. Aperture-blend test for planet candidate 1SWASP J213416.37+205644.4. The plot shows the magnitude in the main photometric aperture minus that in the larger outer aperture, phase folded on the determined period of the planet candidate. A V-shaped eclipse is clearly seen indicating this object is blended with a resolved eclipsing binary system, in this case BQ Peg.

be expected to produce a change in the flux ratio between different apertures in this situation.

13 objects failed the photometric aperture-blend test. Five among these were also observed spectroscopically. Two were found to be giants; of the two that were observed more than once, neither showed significant radial-velocity variability.

3.2 Ellipsoidal variables and secondary eclipses

Because the transit search was restricted to periods less than 5 d, a few objects were detected in which secondary eclipses and/or ellipsoidal variability were present, but in which the best-fitting period found by the transit-search algorithm was half the true period. To guard against this possibility we examined the light curves of all candidates phase-folded on twice the best-fitting period.

Two were eliminated photometrically as exhibiting ellipsoidal variability on twice the orbital period found by the transit detection software. A further seven objects were found to exhibit unequal depths or displacements in phase between odd- and even-numbered transits, indicating that the periods were indeed twice those found by the transit-search software, and that secondary eclipses were present. The five among these that were also observed spectroscopically were all found to be double-lined binaries.

4 MARKOV-CHAIN MONTE CARLO MODELLING

MCMC methods are rapidly gaining popularity as an efficient and informative means of solving of multivariate parameter-fitting problems in astronomy and many other branches of science. They provide not just a means of optimizing the fit of a model to data, but their mode of operation allows a precise exploration of the joint posterior probability distribution of the fitted parameters. Tegmark et al. (2004) give a clear description of the technique and its use for deriving limits on cosmological parameters from the spatial power spectrum of the cosmic microwave background. Ford (2006) and Gregory (2007) have applied MCMC to the derivation of orbital parameters and detection of additional planets from radial-velocity

Figure 1. Blended eclipse of the planet candidate 1SWASP J213416.37+205644.4. The top panel shows the low-amplitude eclipse induced in the light curve by the eclipsing Algol BQ Peg at a distance of 69 arcsec. The bottom panel shows the light curve for BQ Peg itself. The lack of a sharp minimum on the primary eclipse is due to the poorer data quality as the flux approaches the SuperWASP faint limit at the $V = 16.7$ primary minimum. Both are phase folded on the BQ Peg period of 1.574 520 d.
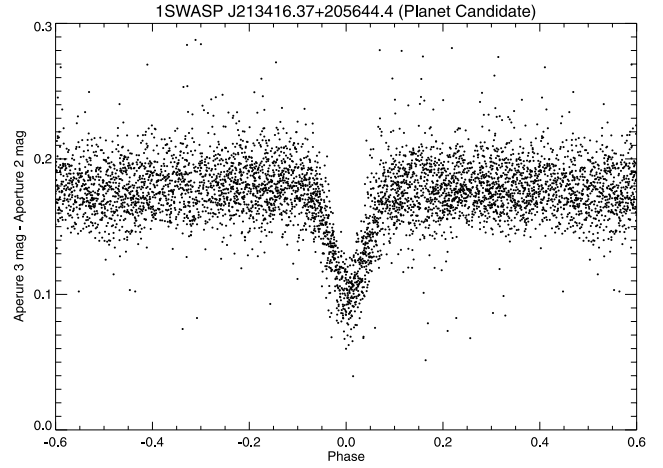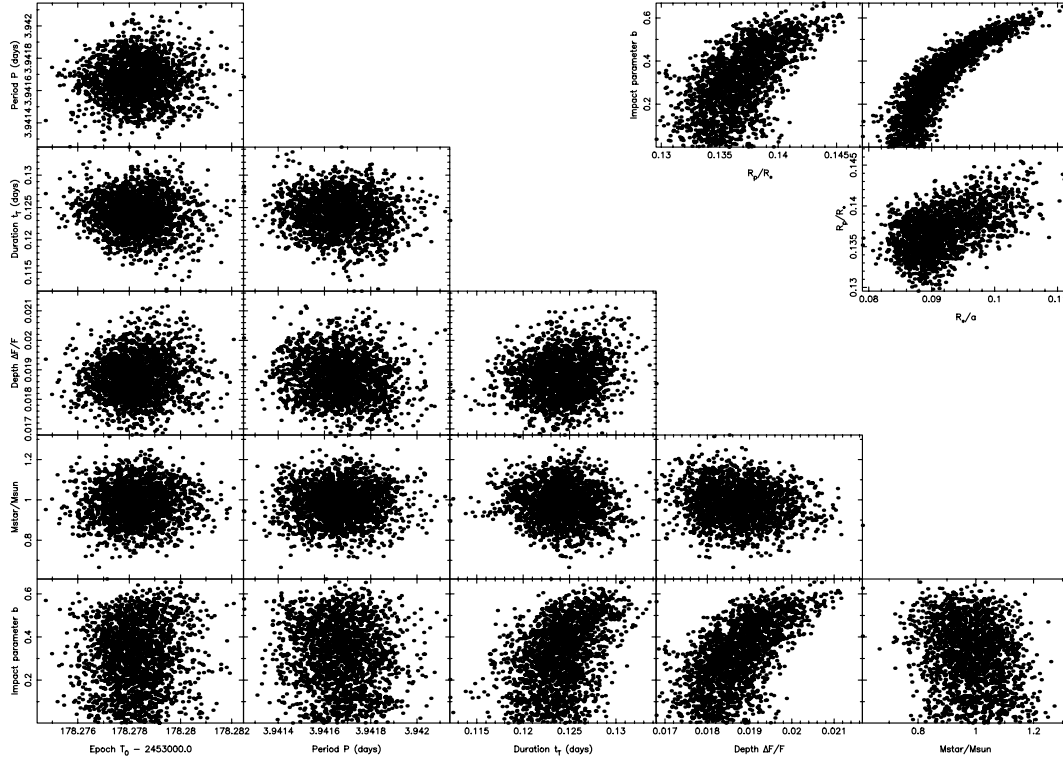
Figure 3. The lower triangular matrix shows the correlation diagram for the six proposal parameters $\{T_0, P, \Delta F, t_T, b, M_*\}$ for an MCMC analysis of the 2004 SuperWASP light curve of the planet host star XO-1. The MCMC run imposed Bayesian priors on both the stellar mass and the stellar radius, derived from the $J - H$ colour and the main-sequence mass–radius relation. The shape of the transit profile allows a wide range of intermediate values for the impact parameter b. None the less, the majority of the proposal parameters are very close to being mutually uncorrelated, with the exception of b and ΔF, which are correlated through the effect of limb darkening. The upper triangular matrix shows the mutual correlations among the physical parameters b and R_*/a and R_p/R_*. The well-known correlation between b and R_*/a is very much stronger than those seen among the six observational parameters that we have adopted here.

curves. Holman et al. (2006) have shown MCMC methods also to be particularly well suited to the problem of deriving the physical parameters of star–planet systems by optimizing model fits to the light curves of transiting exoplanets.

In our implementation of MCMC, we assume the planet's orbit to be circular. We characterize the system using the six parameters $\{T_0, P, \Delta F, t_T, b, M_*\}$. Here T_0 is the epoch of mid-transit, P is the orbital period, ΔF is the fractional flux deficit that would be observed during transit in the absence of limb darkening, t_T is the total duration of the transit from first to last contact, b is the impact parameter of the planet's path across the stellar disc in units of the primary's radius and M_* is the mass of the primary in solar units. These six quantities constitute the 'proposal parameters', which are allowed to perform a random walk through parameter space, generating a cloud of points that map out the joint posterior probability distribution (Fig. 3). The best-fitting values of the proposal parameters are listed for all 67 stars in Table 2.

At each step in the MCMC procedure, each proposal parameter is perturbed from its previous value by a small random amount:

$$T_{0,i} = T_{0,i-1} + \sigma_{T_0} G(0, 1) f,$$
$$P_i = P_{i-1} + \sigma_P G(0, 1) f,$$
$$\Delta F_i = \Delta F_{i-1} + \sigma_{\Delta F} G(0, 1) f,$$
$$t_{T,i} = t_{T,i-1} + \sigma_{t_T} G(0, 1) f,$$
$$b_i = T_{0,i-1} + \sigma_b G(0, 1) f,$$
$$M_{*,i} = M_{*,i-1} + \sigma_M G(0, 1) f,$$

where $G(0, 1)$ is a random Gaussian deviate with mean zero and unit standard deviation. The scalefactor f is an adaptive step-size controller whose value is initially set to 0.5, but which evolves together with the estimated parameter uncertainties as described in Section 4.1.

The first four parameters (T_0, P, ΔF and t_T) are more or less directly measurable from the folded light curve. Their initial values and their associated 1σ uncertainties are taken directly from the results of the accelerated box least-squares algorithm of Collier Cameron et al. (2006). The impact parameter is given an initial value $b_0 = 0.5$ and a 1σ uncertainty $\sigma_b = 0.05$. The stellar mass M_* is initially set to the value M_0 derived from the $J - H$ colour using the calibration described in Appendix B, and assigned an arbitrary but plausible 1σ uncertainty $\sigma_M = 0.1 M_0$.

Once the physical parameters R_*, R_p, a and $\cos i$ have been derived from the proposal parameters ΔF, t_T, b and P using the relationships presented in Appendix A, it is straightforward to compute the projected separation of centres (in units of the primary radius) at any time t_j of observation

$$z(t_j) = \frac{\sin^2 \phi_j + (b R_*/a)^2 \cos^2 \phi_j}{R_*/a}. \tag{1}$$

The orbital phase angle at time t_j is $\phi_j = 2\pi(t_j - T_0)/P$.

We compute the flux deficit at all observed orbital phases using the algorithm of Mandel & Agol (2002) for small planets with the four-coefficient limb-darkening model of Claret (2000). The four limb-darkening coefficients are interpolated from Claret's tables for the R band (whose mean wavelength approximates the effective

Table 2. Observable and physical parameters for the 67 stars in the sample, computed by optimizing the posterior probability Q incorporating the main-sequence prior constraint on the primary mass and radius.

1SWASP	Transit epoch T_0 (HJD)	Orbital period P (d)	Transit duration t_T/P	Transit depth ΔF	Impact parameter b	Stellar mass $M_*/M_\odot$	Primary radius $R_*/R_\odot$	Secondary radius R_2/R_{Jup}
Planets								
J002040.07+315923.7	3219.5240	2.520 65	0.055	0.010	0.028	1.24	1.38	1.36
J160211.83+281010.4	3178.2780	3.941 64	0.032	0.019	0.402	0.99	0.97	1.30
J203054.12+062546.4	3216.7138	2.152 02	0.034	0.015	0.696	0.84	0.83	1.02
Spectral binaries								
J130322.00+350525.4	3167.4755	2.673 82	0.055	0.014	0.038	1.05	1.28	1.48
J133339.36+494321.6	3175.1566	3.649 42	0.038	0.009	0.021	1.33	1.19	1.08
J134815.27+464811.0	3169.5603	1.056 03	0.056	0.009	0.807	1.04	1.04	0.98
J174118.30+383656.3	3197.8605	4.244 81	0.037	0.010	0.280	1.28	1.32	1.28
J175401.58+322112.6	3194.0863	1.949 18	0.050	0.012	0.537	1.13	1.10	1.15
J181858.42+103550.1	3170.8197	2.465 30	0.056	0.010	0.113	1.41	1.39	1.34
J184119.02+403008.4	3188.2544	3.737 65	0.040	0.013	0.058	1.06	1.15	1.29
J203704.92+191525.1	3215.3230	1.680 08	0.045	0.009	0.762	1.12	1.11	1.02
J210009.75+193107.1	3194.0029	3.055 62	0.041	0.007	0.516	1.61	1.40	1.13
J211608.42+163220.3	3219.5782	3.468 29	0.031	0.015	0.842	1.23	1.35	1.60
J212855.03+075753.5	3220.9833	4.689 94	0.023	0.030	0.757	0.95	0.92	1.56
J223320.44+370139.1	3240.4446	1.874 78	0.050	0.010	0.565	1.29	1.17	1.11
J234318.41+295556.5	3245.1886	4.240 98	0.030	0.021	0.008	0.78	0.85	1.20
J010151.11+314254.7	3230.3097	3.650 98	0.050	0.014	0.010	0.76	1.28	1.45
J023445.65+251244.0	3234.8368	1.553 73	0.082	0.018	0.020	0.93	1.26	1.65
J031103.19+211141.4	3250.5698	2.729 25	0.063	0.031	0.020	0.94	1.36	2.35
J051221.34+300634.9	3253.3499	1.237 58	0.085	0.028	0.657	1.03	1.36	2.22
J115718.66+261906.1	3156.3795	2.453 97	0.058	0.014	0.066	1.36	1.38	1.60
J141558.71+400026.7	3170.0586	1.642 77	0.055	0.050	0.995	1.33	1.29	3.95
J152131.01+213521.3	3154.5622	4.014 93	0.043	0.026	0.082	1.19	1.32	2.08
J153135.51+305957.1	3181.9327	4.467 54	0.047	0.029	0.070	0.94	1.40	2.31
J165949.13+265346.1	3200.5994	2.683 05	0.042	0.023	0.885	1.11	1.48	2.35
J172549.13+502206.4	3198.8106	2.271 29	0.044	0.025	0.785	1.01	1.19	1.84
J173650.17+105557.9	3193.1694	3.441 02	0.041	0.030	0.037	0.94	1.03	1.74
J173748.98+471348.7	3182.5662	3.337 91	0.046	0.008	0.025	0.86	1.19	1.05
J174327.81+582512.7	3213.7625	2.844 93	0.064	0.013	0.016	1.01	1.53	1.69
J175511.09+134731.5	3203.1171	2.443 67	0.057	0.019	0.602	1.03	1.43	1.92
J175620.84+253625.7	3204.0353	4.416 02	0.034	0.031	0.667	1.05	1.28	2.18
J180010.55+214510.2	3198.2836	4.415 13	0.023	0.051	0.751	0.67	0.75	1.66
J182620.36+475902.8	3205.5267	3.044 16	0.086	0.068	0.935	0.05	0.91	2.99
J202824.02+192310.2	3211.1395	1.257 88	0.092	0.018	0.016	1.30	1.36	1.76
J203906.39+171345.9	3209.4011	2.697 05	0.045	0.021	0.758	1.16	1.42	1.99
J215802.14+253006.1	3215.6417	1.512 72	0.046	0.018	0.332	0.75	0.67	0.87
J231533.56+232637.5	3225.8489	4.562 89	0.061	0.016	0.003	0.35	1.39	1.74
Photometric binaries								
J003039.21+205719.1	3230.6250	4.566 17	0.028	0.020	0.792	1.21	1.34	1.86
J015711.29+303447.7	3237.7106	2.043 21	0.056	0.012	0.428	1.05	1.17	1.27
J160242.43+290850.1	3187.2622	1.304 33	0.082	0.044	0.681	0.66	1.13	2.30
J165423.72+241335.7	3188.8269	2.571 22	0.045	0.031	0.030	0.60	0.80	1.36
J183104.01+323942.7	3210.9015	2.378 43	0.040	0.008	0.769	1.30	1.33	1.18
J183805.57+423432.3	3199.0823	3.517 09	0.036	0.016	0.046	0.59	0.82	0.99
J205308.03+192152.7	3204.4935	1.676 30	0.076	0.005	0.008	1.22	1.41	1.00
J210909.05+184950.9	3216.9989	2.917 66	0.044	0.007	0.470	1.70	1.45	1.16
J222353.83+412813.5	3239.3999	1.553 04	0.130	0.038	0.112	0.48	1.51	2.87
J223651.20+221000.8	3205.6264	3.226 59	0.032	0.056	0.865	0.77	0.91	2.42

wavelength of the unfiltered WASP instrumental bandpass) using the stellar effective temperature determined from the $J - H$ colour via equation (B1). We adopted surface gravity $\log g = 4.5$, a microturbulent velocity $v_{turb} = 2$ km s^{-1} and a metallicity [Fe/H] = 0.1 on the grounds that planet-bearing stars tend to have heavy-element abundances slightly above solar. After converting these flux deficits to model magnitudes μ_j relative to the flux received from the system outside transit, we compute the zero-point offset from the observed

magnitudes m_j:

$$\Delta m = \frac{\sum_j (m_j - \mu_j) w_j}{\sum_j w_j},$$ (2)

where the observational errors σ_j define the inverse-variance weights $w_j = 1/\sigma_j^2$. We thus obtain the fitting statistic for the set of

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Table 2 – *continued*

1SWASP	Transit epoch T_0 (HJD)	Orbital period P (d)	Transit duration t_T/P	Transit depth ΔF	Impact parameter b	Stellar mass $M_*/M_\odot$	Primary radius $R_*/R_\odot$	Secondary radius R_2/R_{Jup}
Aperture blends								
J025500.31+281134.0	3237.4163	2.165 94	0.068	0.029	0.034	0.70	1.14	1.88
J133156.81+460026.6	3166.2329	3.166 78	0.091	0.063	0.072	0.08	0.91	2.22
J161644.68+200806.8	3243.4648	3.968 30	0.069	0.178	0.994	0.10	0.85	4.90
J181454.99+391146.0	3192.6921	1.102 69	0.067	0.018	0.081	0.47	0.65	0.85
J184303.62+462656.4	3192.1856	3.338 71	0.060	0.020	0.066	0.22	0.94	1.30
J204142.49+075051.5	3207.5200	2.762 43	0.037	0.008	0.110	0.59	0.75	0.65
J204712.42+202544.5	3208.9201	2.613 03	0.041	0.020	0.004	0.60	0.76	1.06
J204745.08+103347.9	3200.9224	3.236 10	0.062	0.021	0.061	0.18	0.88	1.23
J213416.37+205644.4	3220.5575	1.574 55	0.105	0.019	0.013	0.63	1.42	1.89
J215226.17+331424.7	3226.5888	1.065 91	0.149	0.018	0.039	0.41	1.34	1.75
J222317.60+130125.8	3227.4250	1.613 85	0.085	0.016	0.060	0.39	1.00	1.23
J223809.90+401038.1	3240.3573	1.406 52	0.065	0.016	0.023	0.52	0.77	0.94
J224104.57+363648.3	3245.1212	1.733 99	0.081	0.019	0.100	0.31	0.92	1.24
Other blends, giants								
J161732.90+242119.0	3182.9227	1.453 78	0.055	0.012	0.436	0.72	0.82	0.87
J210318.01+080117.8	3214.3962	1.223 95	0.077	0.013	0.255	1.06	1.10	1.22
J005225.90+203451.2	3230.5589	1.718 94	0.059	0.031	0.869	0.81	1.27	2.36
J181252.03+461851.6	3210.2889	2.525 01	0.039	0.033	0.831	0.91	1.10	1.98
J204125.28+163911.8	3214.3614	1.221 54	0.096	0.006	0.027	0.38	0.97	0.74
J205027.33+064022.9	3209.8236	1.229 27	0.125	0.007	0.007	0.74	1.58	1.31
J214151.03+260158.5	3238.9321	1.825 88	0.064	0.007	0.031	0.38	0.84	0.69

model parameters pertaining to the ith step of the Markov chain:

$$\chi_i^2(T_0, P, \Delta F, t_T, b, M_*) = \sum_j \frac{(m_j - \mu_j - \Delta m)^2}{\sigma_j^2}. \quad (3)$$

4.1 Main-sequence prior

In Bayesian terms, the likelihood of obtaining the observed data D given the model defined by a particular set of proposal parameters is

$$\mathcal{P}(D \mid T_0, P, \Delta F, t_T, b, M_*) \propto \exp\left(-\frac{\chi^2}{2}\right), \quad (4)$$

but the full posterior probability distribution for the data and the model depends on the prior probability distribution for each of the model parameters. We are only interested in solutions for which the companion is a planet-sized object yielding a transit of observable depth, so we restrict the impact parameter to the range $0 < b < 1.0$, rejecting proposal steps that fall outside this range.

For most of the remaining parameters the uniform prior implied by the random-walk nature of MCMC is valid, but the stellar mass and radius are already determined a priori from the $J - H$ colour, under the implicit assumption that the star is single and on the main sequence. Under this prior assumption we expect the stellar mass to lie somewhere within an approximately Gaussian distribution with mean M_0 and standard deviation $\sigma_M = M_0/10$ (i.e. the same arbitrary but plausible value used to determine the average jump size in M_*). We use a power-law approximation to the main-sequence mass–radius relation to define a prior probability distribution for R_* with mean $R_0 = M_0^{0.8}$ (Tingley & Sackett 2005) and hence standard deviation $\sigma_R = 0.8(R_0/M_0)\sigma_M$.

This gives a joint prior probability distribution for the values of the proposal parameter M_* and the derived physical parameter R_*

of the form

$$\mathcal{P}(M_{*,i}, R_{*,i}) = \exp\left[-\frac{(M_{*,i} - M_0)^2}{2\sigma_M^2} - \frac{(R_{*,i} - R_0)^2}{2\sigma_R^2}\right]. \quad (5)$$

Since the posterior probability distribution is $\mathcal{P}(M_{*,i}, R_{*,i}) \mathcal{P}(D|T_0, P, \Delta F, t_T, b, M_*)$, we impose the prior on $M_{*,i}$ and $R_{*,i}$ by replacing χ_i^2 with the logarithm of the posterior probability distribution

$$Q_i \equiv \chi_i^2 + \frac{(M_{*,i} - M_0)^2}{\sigma_M^2} + \frac{(R_{*,i} - R_0)^2}{\sigma_R^2} \quad (6)$$

as the statistic on which acceptance of a set of proposal parameters is decided.

For every new proposal set generated, the decision as to whether or not to accept the set is made via the Metropolis–Hastings rule: if $Q_i < Q_{i-1}$ the new set is accepted; if on the other hand $Q_i > Q_{i-1}$, the new set is accepted with probability $\exp(-\Delta Q/2)$, where $\Delta Q \equiv Q_i - Q_{i-1}$. The algorithm first converges to, then explores the parameter space around a constrained optimum solution that represents a compromise between fitting the light curve and reconciling the resulting stellar dimensions with prior expectations derived from the $J - H$ colour. As we shall see later, the value of the main-sequence prior $\mathcal{P}(M_{*,i}, R_{*,i})$ at the global minimum of Q constitutes a useful measure of how far the stellar parameters must be displaced from the main-sequence values appropriate to the star's colour in order to fit the transit light curve.

We introduce a step-size controller f which is adjusted on every 100th step to ensure that the acceptance rate is held close to the optimal value of 0.25 (Tegmark et al. 2004). The value of f is determined by the simple linear algorithm $f_{new} = 400 f_{old}/j$, where j is the total number of proposals generated and tested during the previous 100 successful steps. We find that values in the range $0.5 < f < 1$ achieve the necessary acceptance rate when the correct values of the parameter uncertainties are used. In any case, we find that all six

parameters invariably converge to their optimal values within 500 steps. Once this 'burn-in' phase is complete, the uncertainties on the data are adjusted to take account of correlated errors by rescaling to ensure that the value of χ^2 at the optimal solution is equal to the number of degrees of freedom. The parameter uncertainties are subsequently allowed to evolve as the computation progresses, being recomputed from the Markov chains themselves every 100 successful steps. This ensures that the step size in each dimension samples the parameter space adequately. After discarding the first 500 steps we compared the variances within and between five independent subchains, using the test statistic of Gelman & Rubin (1992). The value of the Gelman–Rubin statistic was invariably within a fraction of 1 per cent of unity, verifying that the chains were properly converged and well mixed.

For all its advantages, MCMC is a discrete, stochastic process. After each MCMC run was completed, we therefore refined the values of the six proposal parameters that represent the optimum solution for Q using the AMOEBA (downhill simplex) algorithm (Press et al. 1992), using the best-fitting step of the Markov chain as one of the initial vertices and the first six successful steps of the chain as the others. The derived primary and secondary radii (in solar and Jovian Units), are listed alongside the best-fitting proposal parameters for all 67 stars in Table 2.

4.2 Orthogonality properties

We note that the proposal parameter set $\{T_0, P, \Delta F, t_T, b, M_*\}$ is particularly well suited to MCMC, because the first four parameters have approximately Gaussian probability density functions that are directly related to observationally determined quantities. As Fig. 3 illustrates, all six are close to being mutually uncorrelated. This circumvents the difficulty commonly encountered in some applica-

tions of MCMC to transit modelling, in which the normalized stellar radius R_*/a is used directly in place of t_T. The parameters R_p/R_*, R_*/a and b are strongly covariant, leading to correlation lengths of several hundred to 1000 steps in the Markov chain (Holman et al. 2006; Winn, Holman & Roussanova 2007) if they are used directly as proposal parameters. Shorter correlation lengths are desirable, since they allow more statistically independent samples of the parameter space to be generated in less computing time. In our parameter space the equivalent observational parameters ΔF, t_T and b are only very weakly covariant. Their use reduces the correlation lengths in the chains for these parameters to between 4 and 20 steps, yet they yield R_*/a and R_p/R_* directly via equations (A1) and (A2). We note that Burke et al. (2007) have arrived at a very similar conclusion, and that further shortening of the correlation length is possible if their orthogonalization procedure is employed.

5 SECONDARY RADII AND IMPACT PARAMETERS

The use of the Two Micron All Sky Survey (2MASS) $J - H$ colour to place prior constraints on the stellar mass and radius is of key importance in extracting essential information about the system dimensions from SuperWASP light curves. The value of the prior at the constrained optimum solution gives a powerful diagnostic for the presence of multiple stellar spectra, and for the host star's proximity to the main sequence.

To illustrate this point we show in Figs 4–6 the MCMC realizations of the relationship between impact parameter and planet radius for WASP-1, WASP-2 and the broad double-lined spectroscopic binary 1SWASP J215802.14+253006.1. We performed two MCMC analyses. The first imposed a prior on the stellar mass only. The posterior probability density is then proportional to $\exp(-Q_i/2)$,
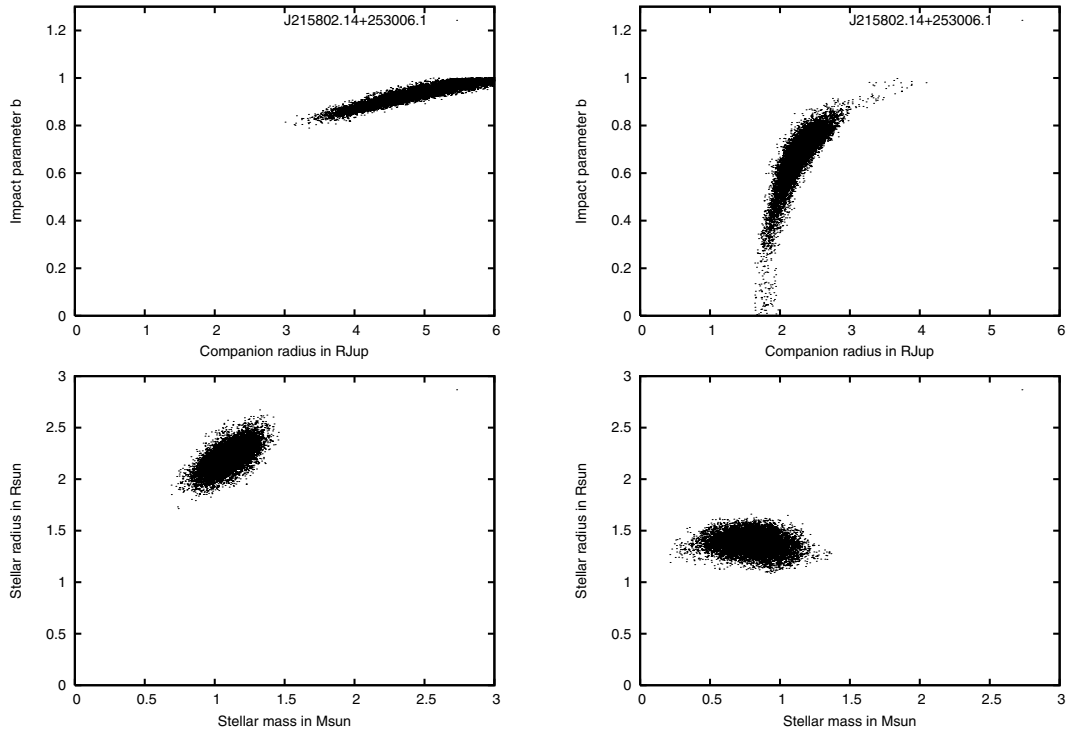

Figure 4. Impact parameter versus planet radius and stellar radius versus stellar mass for MCMC analysis of the SuperWASP light curves of the grazing broad-lined spectroscopic binary 1SWASP J215802.14+253006.1. The left-hand realization imposes a prior on the stellar mass, derived from the $J - H$ colour. The right-hand panels show the effect of imposing an additional main-sequence prior on the stellar radius.
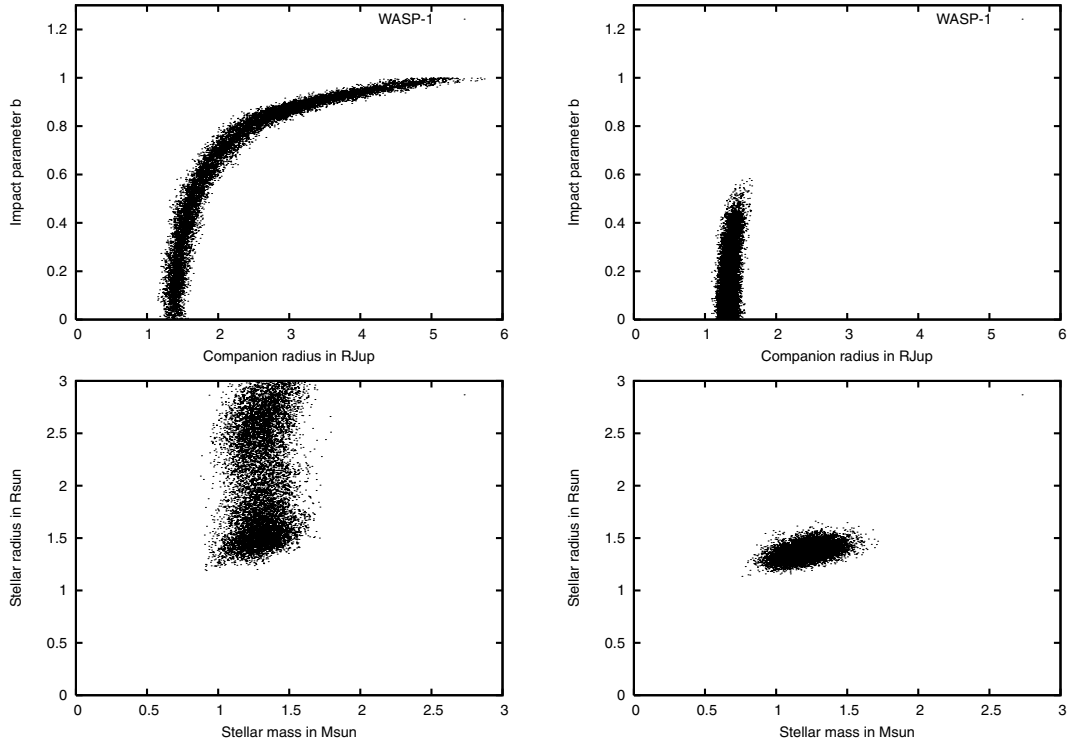
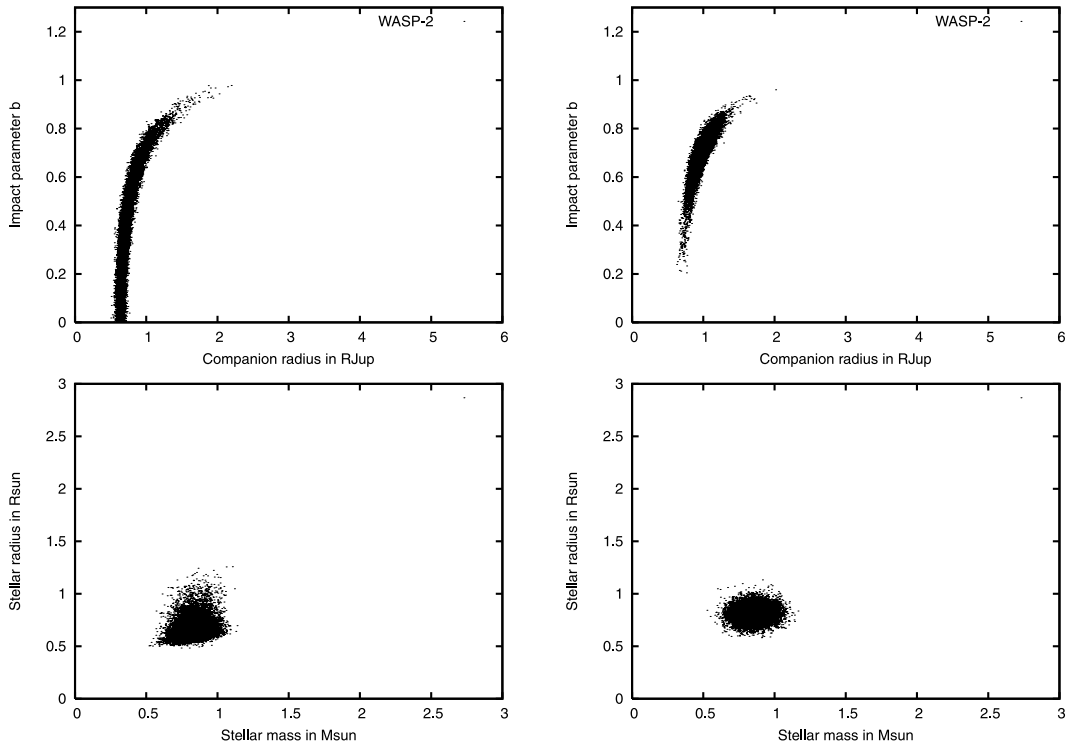**Figure 5.** As for Fig. 4, but for the known exoplanet host star WASP-1.

Figure 6. As for Fig. 4, but for the known exoplanet host star WASP-2.

where

$$Q_i = \chi_i^2 + \frac{(M_*, i - M_0)^2}{\sigma_M^2}$$

is used as the statistic to which the Metropolis–Hastings rule is applied. The second analysis imposed the full main-sequence prior as described in equation (6).

1SWASP J215802.14+253006.1 was selected as a candidate, having been found to exhibit transits 0.024 mag deep. Its 2MASS $J - H = 0.29$ suggests an early G spectral type. It passed the transit depth and duration tests of Tingley & Sackett (2005) and all other photometric selection tests. A single SOPHIE spectrum, however, revealed the presence of two rotationally broadened stellar spectra.

The left-hand panel of Fig. 4 shows the MCMC joint posterior probability distributions of the impact parameter and secondary radius, and of the primary mass and radius of 1SWASP J215802.14+253006.1. The MCMC results for which the prior is applied to the stellar mass only show that the impact parameter is high, indicating a grazing eclipse. The mass–radius plot reveals a further inconsistency: the inferred primary radius is twice that expected for a main-sequence star. Imposing the further Bayesian constraint on the primary radius does little to improve matters. The prior's attempt to pull the primary's dimensions towards the main sequence is thwarted by the need to fit the V shape of the transit light curve. The impact parameter is reduced somewhat, but the primary mass is pulled towards a value too low to be consistent with the colour. The primary's radius remains too large for its mass. The probability that the secondary has a radius less than 1.5 times that of Jupiter remains negligible, while the statistic representing the main-sequence prior is driven to the very high value $S = 32.53$. The star 1SWASP J215802.14+253006.1 thus fails two important statistical tests, and can be eliminated as a viable exoplanet transit candidate without the need for spectroscopic follow-up.

For those systems that appear to have single main-sequence primaries, the mass–radius constraint also serves to reduce the uncertainty in the impact parameter of the transit. By imposing a prior that pulls the stellar radius towards the main-sequence mass–radius relation, we reduce the degeneracy between the stellar radius and impact parameter that arises from the transit duration. Since the ratio of the secondary's radius to that of the primary depends on the transit depth and impact parameter, the uncertainty in the secondary's radius is substantially improved.

In Table 3 we compare the stellar and planetary dimensions inferred from the SuperWASP light curves using this method, with the values determined by Shporer et al. (2007) from high-quality *I*-band transit photometry of WASP-1, and by Charbonneau et al. (2007) from high-quality *z*-band observations of both WASP-1 and WASP-2. The imposition of the main-sequence prior fixes the impact parameter at values for both stars that agree well with those of both sets of authors. Our values for the radii of both planet and host star in the WASP-2 system are also in excellent agreement with those of Charbonneau et al. (2007).

Our radii for WASP-1 and its planet are systematically smaller than those found by Charbonneau et al. (2007) and by Shporer et al. (2007). These authors both determine a primary radius that is consistent with the star being somewhat above the main sequence and hence slightly evolved, whereas our method artificially pulls the radius towards the expected main-sequence value. The mass that we derive from $J - H$ is consistent with the range of values determined by Stempels et al. (2007) from their recent spectroscopic abundance analysis of WASP-1. The inflated radius found by

Table 3. Comparison of stellar and planetary dimensions derived by other authors from high-precision photometry with those derived from Super-WASP photometry in the present study using the constrained MCMC analysis. The middle columns show the radius values of Shporer et al. (2007) and Charbonneau et al. (2007) rescaled as $M_*^{1/3}$ to account for the differences in the other authors' assumed and our fitted stellar masses.

Parameter	Shporer et al. (2007) rescaled	Charbonneau et al. (2007) rescaled	This study
WASP-1			
$R_*/R_\odot$	1.46 ± 0.06	1.490 ± 0.033	$1.382^{+0.047}_{-0.116}$
R_p/R_{Jup}	1.44 ± 0.06	1.480 ± 0.040	$1.358^{+0.048}_{-0.104}$
b	0.03 ± 0.17	< 0.336	$0.215^{+0.091}_{-0.156}$
$M_*/M_\odot$	1.24 (matched)	1.24 (matched)	$1.24^{0.12}_{-0.17}$
WASP-2			
$R_*/R_\odot$	–	0.830 ± 0.033	$0.834^{+0.066}_{-0.083}$
R_p/R_{Jup}	–	1.059 ± 0.051	$1.017^{+0.111}_{-0.153}$
b	–	0.731 ± 0.026	$0.753^{+0.033}_{-0.151}$
$M_*/M_\odot$	–	0.84 (matched)	$0.84^{0.07}_{-0.11}$

Shporer et al. (2007) and Charbonneau et al. (2007) is consistent with the rather low $\log g = 4.28 \pm 0.15$ found by Stempels et al. (2007). WASP-1 thus provides valuable verification that the selection criteria suggested in Section 6 below are not so strict as inadvertently to exclude inflated planets orbiting slightly evolved stars.

6 SELECTION OF EXOPLANETARY TRANSIT CANDIDATES

Instruments such as SuperWASP are capable of detecting the transits of gas-giant planets orbiting stars on or at most slightly above the main sequence. The $J - H$ colour of a viable candidate should thus yield a stellar mass and radius that lie near the main sequence, and which are consistent with the duration of the transit. The value of the main-sequence prior $\mathcal{P}(M_*, R_*)$ measures the displacement of the fitted stellar mass and radius at the global minimum of Q from the main-sequence values we expect from the star's $J - H$ colour.

The radius derived for the companion should be consistent with its being a planet. Although the SuperWASP light curves are not always of sufficient quality to discern the shape of the transit, the main-sequence prior helps to break the well-known degeneracy between the impact parameter b and the stellar radius R_* (which is strongly correlated with the companion radius via the transit depth). The use of MCMC allows us to determine directly the probability that the companion radius is less than some specified amount.

For convenience we define the quantity

$$S = -2 \ln \mathcal{P}(M_*, R_*) = \frac{(M_{*,i} - M_0)^2}{\sigma_M^2} + \frac{(R_{*,i} - R_0)^2}{\sigma_R^2}$$

as a measure of the discrepancy between the constrained optimum stellar dimensions and the values derived from $J - H$.

In Fig. 7 we plot S against the probability that the companion has a radius less than 1.5 times that of Jupiter, for the three planet host stars and the various classes of astrophysical false positive in our survey sample. The diagram shows clearly that the sample is cleanly partitioned into objects with high and low probabilities of having Jupiter-sized secondary components.

There is a tight cluster of objects in the lower right-hand corner of Fig. 7, with the main-sequence prior giving $S < 1$ and
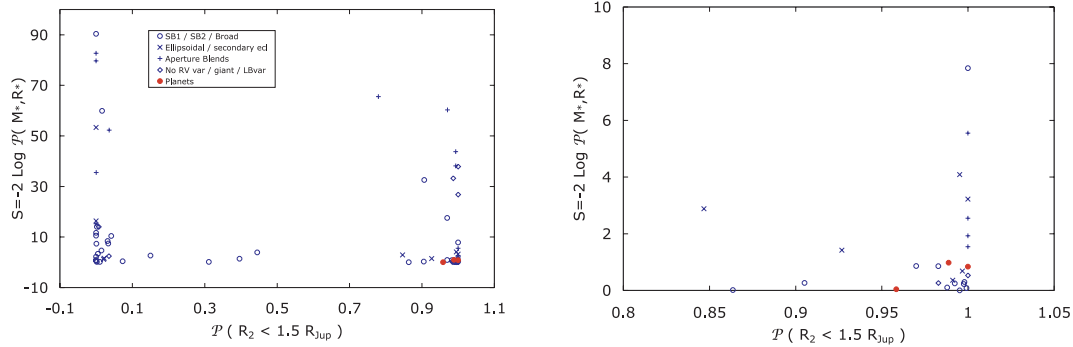
Figure 7. Logarithm of main-sequence prior probability versus probability that companion radius is less than 1.5 R_{Jup} for known planets (red circles) and other forms of astrophysical false positive. Open circles and diamonds represent spectroscopic binaries and unresolved aperture blends, which could only be identified spectroscopically as false positives. Upright and diagonal crosses are eclipsing binaries and resolved aperture blends, detected using the methodology of Sections 3.2? and 3.1, respectively. The right-hand panel gives an enlarged view of the lower right-hand corner of the left-hand panel.

probabilities greater than 0.95 that the secondary radius is less than 1.5 times that of Jupiter. This cluster includes all three known planets in the sample, together with two unresolved aperture blends and 10 spectroscopic binaries, two of which can be eliminated photometrically as exhibiting ellipsoidal variations or unequal odd- and even-numbered transits.

In selecting targets for spectroscopic follow-up it would be unwise to set thresholds as tight as the bounds of this cluster. The light curve of the recently discovered TrES-3 (O'Donovan et al. 2007) is a good illustration of the need for caution. The light curve of TrES-3 was recorded by the SuperWASP cameras as 1SWASP J175207.01+373246.3 and its transits were detected with the correct period (Lister et al. 2007) even though it did not satisfy our original selection criteria for follow-up at high priority. Applying the MCMC test to the SuperWASP light curve of TrES-3, we find that $S = 0.06$, indicating a stellar mass and radius consistent with expectations, but $\mathcal{P}(R_2 < 1.5R_{Jup}) = 0.236$. The reason for the apparently low probability of the secondary having a planet-like radius arises because TrES-3 has a high impact parameter. Limb darkening produces a strong positive correlation between b and R_p, giving a range of solutions with $0.8 < b < 1$ and $1.3 < R_p < 2.0$ R_{Jup}. By requiring candidates for follow-up spectroscopy to have $S < 5$ and $\mathcal{P}(R_2 < 1.5R_{Jup}) > 0.2$, we leave a sufficient margin to allow for the possibility of detecting inflated planets transiting slightly evolved main-sequence stars at high impact parameters.

Six of the 19 binaries that satisfy these more relaxed selection criteria are represented by diagonal crosses in Fig. 7, having been identified photometrically as mimics from their ellipsoidal variations or secondary eclipses. Similarly, three of the five surviving blends, denoted by upright crosses in Fig. 7, fail the photometric aperture-blend test. They could thus have been eliminated without requiring spectroscopic follow-up. With the wisdom of hindsight, we would thus retain 18 candidates from our original sample of 67 stars for spectroscopic follow-up, of which two are unresolved aperture blends, 13 are stellar binaries and three are planet host stars. The final selection decisions are given in the last column of Table 1.

7 DWARF–GIANT SEPARATION

If proper motion information is available, a useful secondary check can be made on the luminosity class of the primary. Evolved giant and subgiant stars have very similar photometric colours to their main-sequence counterparts and are frequently a source of contamination in exoplanetary transit surveys. They can easily be identified, however, from their proper motions. Giant stars are significantly more distant than dwarfs of the same magnitude, and so exhibit substantially smaller proper motions.

Gould & Morgan (2003) found that a plot of RPM against Tycho-2 $B_T - V_T$ provided an effective means of separating giants from dwarfs. We adapted this method using the $J - H$ colour index and proper motions from the all-sky USNO-B1.0 catalogue (Monet et al. 2003). Our model is calibrated using stars from the catalogues of Valenti & Fischer (2005) and Cayrel de Strobel et al. (2001) which list over 2000 FGK stars with high-resolution, high signal-to-noise ratio spectra from which the surface gravity has been determined to better than ± 0.1 dex. The stars were cross-matched with the USNO-B1.0 catalogue to determine proper motions and with the 2MASS catalogue to determine $J - H$ using a simple nearest neighbour search within a radius of 10 arcsec. The stars were partitioned into dwarfs with $\log g \geqslant 4.0$ and giants with $\log g \leqslant 3.0$. These conservative limits reduce the chances of accidental elimination of mildly evolved dwarfs. This resulted in 1526 dwarfs and 1145 giants. Although this is a much smaller sample than that used by Gould & Morgan (2003), the luminosity class determination is based on more accurate spectroscopic measurements rather than broad-band photometric calibrations. The RPM, H_J, is defined as

$$H_J = J + 5 \log(\mu), \tag{7}$$

where J is the 2MASS J apparent magnitude and μ is the proper motion. In Fig. 8 we plot H_J against $J - H$. A clean separation is seen between the giants and dwarfs. As predicted the giants, in general, have lower RPMs than the dwarfs with the same $J - H$ colour. A fourth-order polynomial has been fitted to a subjectively drawn boundary showing the best separation between the two luminosity classes where

$$y = -141.25(J - H)^4 + 473.18(J - H)^3$$
$$-583.6(J - H)^2 + 313.42(J - H) - 58.$$

The greatest cross-contamination occurs for early K dwarfs/giants ($J - H \sim 0.5$) in agreement with Gould and Morgan's findings. Unfortunately, this sample lacks large numbers of K and M dwarfs due to the inherent difficulty in obtaining high signal-to-noise ratio spectra for these faint stars. As a result, the dwarf/giant determination becomes increasingly uncertain with decreasing temperature.

We stress that although the RPM test is a very useful secondary check on the MCMC statistics, we do not use it as a primary
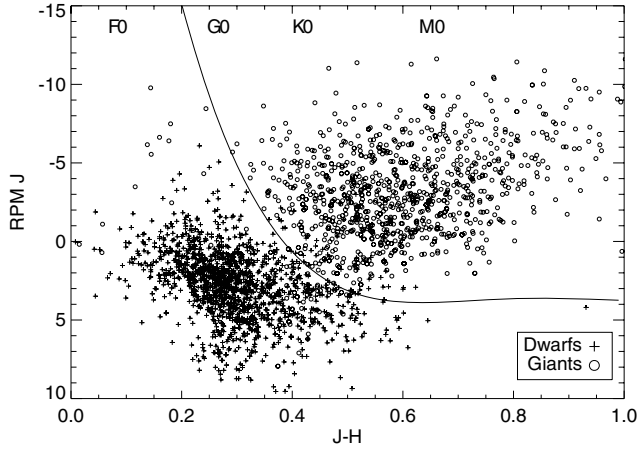
Figure 8. RPM against $J - H$ for dwarfs (log $g \geqslant 4.0$) and giants (log $\leqslant$ 3.0).

Figure 9. SOPHIE spectra of the Mg ib triplet region in the K giant 1SWASP J204125.28+163911.8 (upper) and the K dwarf planet host star WASP-2. Note the difference in pressure broadening of the wings of the Mg ib triplet lines at 5167.3, 5172.7 and 5183.6 Å.

selection criterion. It carries too high a risk of inadvertently rejecting genuine K dwarfs which just happen to have low proper motions. None the less, we note that all the objects classified as giants on the basis of their RPMs fail one or other of the selection criteria. In particular, we note from Table 1 that the photometric aperture blends are almost invariably also classified as giants. The RPM giants among the aperture that were observed with SOPHIE showed the low pressure broadening in the line wings expected of giants (Fig. 9).

8 DISCUSSION AND CONCLUSIONS

We conclude that MCMC analyses of transit light curves can be carried out in such a way as to break the degeneracy between impact parameter and stellar radius, if a Bayesian prior is imposed to constrain the stellar mass and radius to values consistent with the host star's $J - H$ colour. The posterior probability distributions for the stellar and planetary parameters are obtained directly from the Markov chain. They provide a straightforward estimate of the probability that the secondary has a radius consistent with planetary status.

The prior carries the implicit assumption that the star is single and on the main sequence. We have found in this study that in a large fraction of astrophysical false positives for which these assumptions are invalid, the value of the prior at the optimum solution (in the sense of minimizing the quantity Q_i defined in equation 6) is significantly greater than unity, if the uncertainty in the stellar mass derived from $J - H$ is fixed (arbitrarily but reasonably) at 10 per cent. The three known planets in our sample and the newly discovered TrES-3 all yield values of the prior less than unity at their optimal solutions.

The probability that the secondary is of planetary dimensions and the value of the prior at the optimum solution provide the two-dimensional classification scheme shown in Fig. 7. For the sample of stars studied here, which had already passed the preliminary selection procedures of Collier Cameron et al. (2006), this classification scheme is effective at identifying 75 per cent of all types of aperture blend. The figure improves to 90 per cent if the flux ratio in different photometric apertures is used to identify blends of non-variable stars with eclipsing binaries near the edge of the photometric aperture.
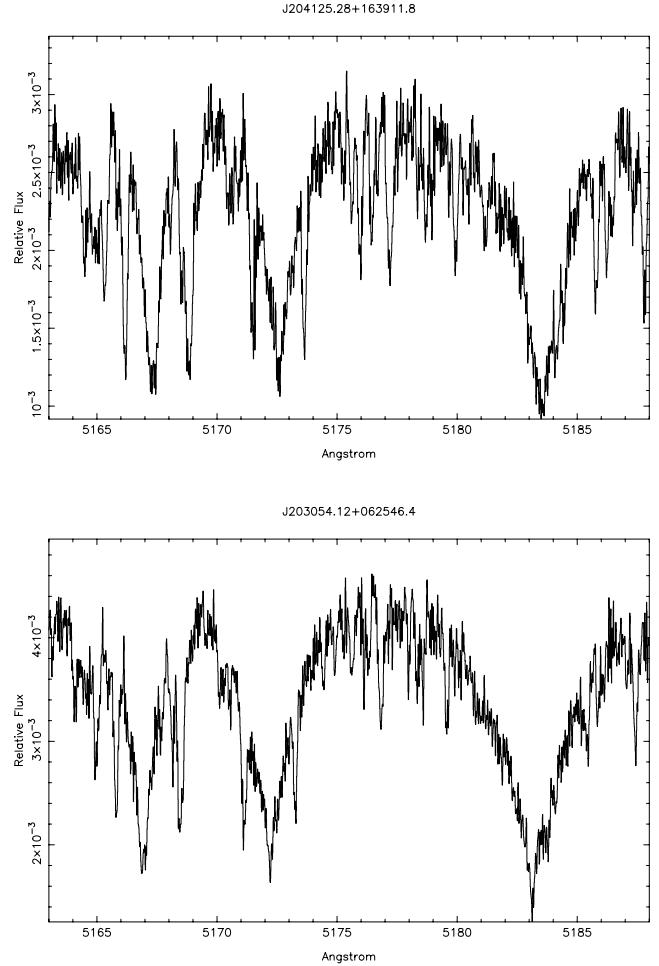
The Bayesian selection scheme also eliminates roughly 67 per cent of all spectroscopic binaries. It is particularly effective at removing grazing stellar binaries, most of which yield very low probabilities of having planet-sized secondaries, and many of which also produce values of the main-sequence prior that are too high to be consistent with a single, main-sequence primary of the observed $J - H$ colour. Grazing binaries frequently show either ellipsoidal variations or unequal eclipses when folded on twice the best period found by the accelerated box least-squares algorithm, giving an effective second line of defence against this type of impostor.

The remaining candidates have demonstrably low companion radii, generally low impact parameters, and primaries that appear to be close to the part of the main sequence suggested by their observed $J - H$ colours. Many of them are likely to be astrophysically interesting binaries, whose Jupiter-sized stellar or substellar companions will add to our knowledge of the mass–radius relation at and below the bottom of the main sequence once their spectroscopic orbits are established. Other teams pursuing similar studies have already achieved important advances in this area (Bouchy et al. 2005; Pont et al. 2005a,b, 2006). In planet-hunting terms alone, however, the prospects for a high 'hit rate' in future follow-up campaigns are good: in our sample, confirmed transiting planets comprise nearly 20 per cent of the survivors.

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APPENDIX A: OBSERVABLE AND PHYSICAL PARAMETERS

Seager & Mallén-Ornelas (2003) characterized the light curve of a transit candidate in terms of four observable quantities: the transit depth ΔF expressed as a fraction of the system flux outside transit, the total transit duration t_T from first to fourth contact, the duration t_F of the flat part of the transit from second to third contact and the orbital period P. Assuming that the transit is total, that all the light emanated from the primary star and that the orbit was circular, they derived expressions for the ratio of the planet's radius R_p to that of the star R_*, the ratio of R_* to the orbital separation a and the impact parameter $b = a \cos i / R_*$. Kepler's third law then gives the stellar density $\rho / \rho_\odot$, under the further assumption that the mass ratio $M_p / M_* \ll 1$.

Here we adopt a similar approach, generalized to allow for grazing as well as total eclipses. Following Seager & Mallén-Ornelas (2003) and using the approximation that $R_p + R_* \ll a$ we determine the stellar radius from the transit depth, duration and impact parameter via the relation

$$\frac{R_*}{a} = \frac{t_T}{P} \frac{\pi}{(1 + \sqrt{\Delta F})^2 - b^2}. \tag{A1}$$

For transits where the companion is fully silhouetted against the primary during the middle part of the transit we neglect limb darkening and define

$$\frac{R_p}{R_*} = \sqrt{\Delta F}. \tag{A2}$$

For partial transits, or at phases where the projected separation z of the centres lies in the range $1 - R_p/R_* < z < 1 + R_p/R_*$, the fraction of the primary's disc that is obscured by the companion is

$$\Delta F = \frac{R_p}{R_*} (\pi - \beta + \sin \beta \cos \beta + \alpha - \sin \alpha \cos \alpha). \tag{A3}$$

The angle α is subtended at the centre of the primary by the line of centres and the radius of the primary at the point where the two limbs intersect. The angle β is subtended at the centre of the planet by the line of centres and the radius of the planet at the point where the two limbs intersect (Fig. A1). The angles α and β are defined by

$$\cos \alpha = \frac{3}{2} z + \frac{1 + (R_p/R_*)^2}{2z} \tag{A4}$$
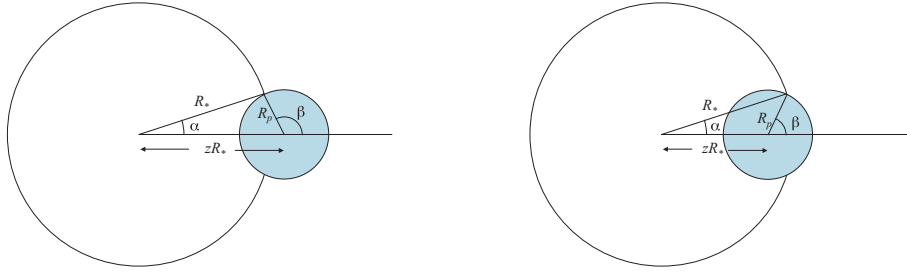
Figure A1. Geometry of partial transit phases, showing the angles α and β used in computing the fraction of the stellar disc obscured by the companion.

and

$$\cos \beta = \frac{1 - (R_p/R_*)^2 - z^2}{2zR_p/R_*}. \tag{A5}$$

For cases where $R_p/R_* < 0.3$ or so, the fractional obscuration of the primary's disc can be approximated to better than 4 per cent by a linear function of the separation z of the centres:

$$\Delta F = \frac{R_p}{2R_*} \left(1 + \frac{R_p}{2R_*} - z \right). \tag{A6}$$

This equation is quadratic in R_p/R_* and has the positive solution

$$\frac{R_p}{R_*} = \frac{z - 1 + \sqrt{(1-z)^2 + 8\Delta F}}{2}. \tag{A7}$$

Since $z = b$ at mid-transit, the ratio of the planetary and stellar radii can be determined from the transit depth ΔF at mid-transit even for grazing eclipses, provided b is known.

In practice, the combination of observational errors and the effects of limb darkening make it very difficult to determine the duration t_F of the middle phase of the transit with any degree of reliability. For this reason we parametrize the form of the transit profile in terms of ΔF, t_T, b and P. Like Seager & Mallén-Ornelas (2003) we use Kepler's third law to determine the stellar density in solar units:

$$\frac{\rho}{\rho_\odot} = 0.013\,4063 \left(\frac{a}{R_*} \right) \left(\frac{P}{1\,\mathrm{d}} \right)^{-2}. \tag{A8}$$

In order to close the system, we need either an additional equation or an independent determination of the stellar mass. It is then straightforward to determine the stellar radius (in solar units) from the stellar density.

Seager & Mallén-Ornelas (2003) chose the former approach, imposing a main-sequence mass–radius relation on the primary of the form $R_* \propto M_*^{0.8}$. We choose instead to use the $J - H$ colour index taken from the 2MASS Point Source Catalogue of Cutri et al. (2003) to estimate the stellar effective temperature and hence the corresponding main-sequence stellar mass, as described in Appendix B.

APPENDIX B: RADIUS ESTIMATION USING $J - H$

The 2MASS $J - H$ colour index was calibrated using stellar temperatures from a sample of 100 000 Tycho-2 FGK dwarf stars from Ammons et al. (2006), selected to assist in target selection for radial-velocity planet searches. The temperatures were calculated by fitting spline functions to broad-band *Hipparcos*/Tycho-2 and 2MASS
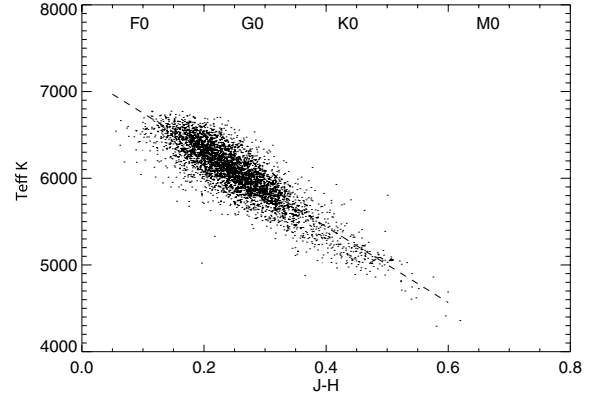

Figure B1. $J - H$ colour index against temperature for FGK dwarfs from the Tycho-2 catalogue (only 1/15 data points are shown for clarity).

photometry using a training set of stars observed with the Keck High-Resolution Echelle Spectrometer. The temperature model is quoted with an accuracy of better than 100 K. We extracted a subset of approximately 65 000 stars from this sample for which the errors in the effective temperature were less than 150 K and the photometry errors less than 1 per cent. The $J - H$ index was then plotted against temperature (Fig. B1) and fitted with a linear relation

$$T_{\rm eff} = -4369.5(J - H) + 7188.2, \tag{B1}$$

which is valid over the approximate temperature range $4000 < T_{\rm eff} < 7000\,\mathrm{K}$. The $J - H$ index is preferred over $J - K$ as the 2MASS errors for H magnitude are generally lower than for K.

The scatter of the data about the linear fit is 114 K and is an improvement of the fit given by the relations of Cox (2000).

The stellar radius is then calculated from a polynomial fit to the temperature/radius relation for main-sequence stars tabulated in appendix B1 of Gray (1992), which is again valid over the temperature range $4000 < T_{\rm eff} < 7000\,\mathrm{K}$.

$$\frac{R_*}{R_\odot} = -3.925 \times 10^{-14}(T_{\rm eff})^4 + 8.3909 \times 10^{-10}(T_{\rm eff})^3$$
$$-6.555 \times 10^{-6}(T_{\rm eff})^2 + 0.022\,45(T_{\rm eff}) - 27.9788.$$

The stellar mass is then estimated via the main-sequence mass–radius relationship

$$\frac{M_*}{M_\odot} \simeq \left(\frac{R_*}{R_\odot} \right)^{1/0.8}. \tag{B2}$$

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