# New OB star candidates in the Carina Arm around Westerlund 2 from VPHAS+ 

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#### Abstract

O and early B stars are at the apex of galactic ecology, but in the Milky Way, only a minority of them may yet have been identified. We present the results of a pilot study to select and parametrise OB star candidates in the Southern Galactic plane, down to a limiting magnitude of $g=20$. A 2 square-degree field capturing the Carina Arm around the young massive star cluster, Westerlund 2, is examined. The confirmed OB stars in this cluster are used to validate our identification method, based on selection from the $(u-g, g-r)$ diagram for the region. Our Markov Chain Monte Carlo fitting method combines VPHAS $+u, g, r, i$ with published $J, H, K$ photometry in order to derive posterior probability distributions of the stellar parameters $\log \left(\mathrm{T}_{\text {eff }}\right)$ and distance modulus, together with the reddening parameters $A_{0}$ and $R_{V}$. The stellar parameters are sufficient to confirm OB status while the reddening parameters are determined to a precision of $\sigma\left(A_{0}\right) \sim 0.09$ and $\sigma\left(R_{V}\right) \sim 0.08$. There are 489 objects that fit well as new OB candidates, earlier than $\sim$ B2. This total includes 74 probable massive O stars, 5 likely blue supergiants and 32 reddened subdwarfs. This increases the number of previously known and candidate OB stars in the region by nearly a factor of 10 . Most of the new objects are likely to be at distances between 3 and 6 kpc . We have confirmed the results of previous studies that, at these longer distances, these sight lines require non-standard reddening laws with $3.5<R_{V}<4$.


Key words: stars: early-type, (Galaxy:) open clusters and associations: individual: Westerlund 2, (ISM:) dust, extinction, Galaxy: structure, surveys

## 1 INTRODUCTION

Stars of spectral type O and early B, more massive than $\sim 8 M_{\odot}$, are massive enough to form collapsing cores at the end of their nuclear-burning lifetimes (see e.g. Langer 2012

[^0]Smartt 2009). It is widely recognised that these stars - henceforward OB stars - are an important source of kinetic energy, driving turbulence and mixing of the interstellar medium, powered by a range of phenomena (stellar winds, wind-blown bubbles, expanding HII regions and supernova explosions). They are the main source of ultra-violet radiation in galaxies and, being short-lived ( $\lesssim 40 \mathrm{Myr}$ ), they are excellent tracers of recent star formation.

In the Galaxy, clusters containing OB stars and OB associations have played an important role in tracing spiral arm structure (e.g. Russeil 2003; Vallée 2008). The typical scale height estimated for OB stars, forming in the Galactic disk, is a few 10 s of pc (e.g. Reed 2000; Garmany et al. 1982), in keeping with estimates of the scale height for giant molecular clouds, their birth sites (e.g. Stark \& Lee 2005). OB stars are usually regarded as forming in clustered environments (Zinnecker \& Yorke 2007) and are less common in the field. However, examples of isolated field O stars are known and the question has arisen as to whether these highmass stars have formed in situ, perhaps as the result of stochastic sampling of the initial mass function (IMF) as outlined by Parker \& Goodwin (2007), or have been ejected from clusters as runaways (see e.g. Portegies Zwart et al. 2010. Bestenlehner et al. 2011). In the Milky Way $\sim 96 \%$ of known O-type stars have been identified as members of young open clusters, OB associations or as otherwise kinematically linked to clustered environments de Wit et al. 2005). This leaves up to $\sim 4 \%$ of Galactic O-type stars possibly forming in isolation. Deep comprehensive searches for OB stars away from clusters have not been undertaken hitherto.

As luminous objects detected to great distances across the Galactic disk and through substantial obscuration, OB stars have long been recognised as a highly-suitable means for characterising the spatial variation of interstellar extinction, in terms of both dust column and extinction law (e.g. Cardelli et al. 1989; Fitzpatrick \& Massa 2007). This is aided by their relatively simple optical near-infrared (OnIR) spectral energy distributions (SEDs). It follows from this that the more densely we can map the positions and extinctions towards these luminous probes, the more high-quality empirical constraints we can set on the 3-D distribution of dust and dust properties across the Galactic Plane.

Both of the above areas of enquiry will be well served by a deeper, more comprehensive mapping of the OB stars in the Milky Way. Past cataloguing efforts have been limited to brighter, nearer objects (e.g Garmany et al. 1982 Reed 2003, Maíz-Apellániz et al. 2004). Indeed the most comprehensive collection so far, 'The Catalog of Galactic OB Stars' (Reed 2003) contains $\sim 16000$ known or suspected OB stars taken from across the literature: around $95 \%$ of the entries are brighter than $13^{\text {th }}$ magnitude in the visual bands. Now is the right time to push the magnitude limit much fainter, to $\sim 20^{\text {th }}$ magnitude, given the likely delivery of astrometry to this depth by the Gaia mission from $\sim 2017$ onwards (both parallaxes and proper motions, for details on expected performance see de Bruijne 2012). Efficient, purely photometric selection of OB stars in the field as well as in clusters continues to be best undertaken at blue optical wavelengths, where colour selection via the $Q$ method (initiated by Johnson \& Morgan 1953a) is proven to separate O and early B stars from later type stars.

The practical motivation of this paper is to establish a method of photometric selection and analysis that can form the basis for a new homogeneous census of Galactic OB stars as faint as $g \simeq 20$. Based on a restrained extrapolation of the first results presented here, we can surmise that a new census will more than double the numbers known. A suitable source for the new census will be the VST Photometric $\mathrm{H} \alpha$ Survey of the Southern Galactic Plane and Bulge (VPHAS+

Drew et al. 2014). VPHAS+ is a deep, uniform, photometric survey of the entire southern Galactic Plane and Bulge in broad-band $u, g, r, i$ and narrow-band H $\alpha$ filters on ESO's VLT Survey Telescope (VST). The survey footprint includes the entire southern Galactic Plane within the Galactic latitude range of $|b|<5^{\circ}$. The VST's OmegaCam imager provides a full square degree field of view with very good spatial resolution ( 0.2 " pixels sample a median seeing of $0.8-1.0$ arcsec in the $u / g / r$ bands).

Here, we present a first study that uses broadband VPHAS+ data to select and parametrize OB stars in a $\sim 2$ square-degree area, roughly centred on $\ell=284^{\circ}, b=-0.7^{\circ}$, in the part of the Plane containing the young massive cluster, Westerlund 2 (Wd 2), the larger associated HII region RCW 49, and the diffuse nebula NGC3199 (see Figure 11. Previous optical and near-infrared studies on the stellar content of Westerlund 2 have focused on the immediate environment of the cluster itself - a patch of sky 4 arcmin across (Moffat et al. 1991 Ascenso et al. 2007, Vargas Álvarez et al. 2013), while the x-ray study by Tsujimoto et al. (2007) focused on an area $\sim 17$ arcmin across. Most recently, Hur et al. (2015) have revisited optical photometry of this cluster over a 17.9' x 9.3 ' footprint.

By tracing $8 \mu \mathrm{~m}$ warm-dust emission Rahman \& Murray (2010) have identified this same region as part of a large star-forming complex (G283). On the sky, Wd 2 falls close to the Carina Arm tangent direction (e.g. Russeil 2003): the CO data presented by Dame (2007) show persuasively that Wd 2 and its environs fall just inside the sky position of the tangent point, but further away. This cluster is estimated to be $1-3 \mathrm{Myr}$ old (Vargas Álvarez et al. 2013; Ascenso et al. 2007). It contains a large number of spectroscopicallyconfirmed OB stars, albeit behind a dust column giving rise to over 6 magnitudes of visual extinction (Moffat et al. 1991 . Rauw et al. 2007. Carraro et al. 2012, Vargas Alvarez et al. 2013). Estimates of the distance to Wd 2 in the literature have varied enormously, ranging from 2.8 kpc (Ascenso et al. 2007) up to $\sim 8 \mathrm{kpc}$ (e.g. Rauw et al. 2011). However, it is not our aim to enter into this debate. More important is the likelihood that much of the scientific gain from VPHAS+ discoveries of OB stars will be in the domain of visual extinctions of up to 8-10 magnitudes, and distance scales of $2-10 \mathrm{kpc}$ (according to Galactic longitude). In this regard, the field around Wd 2 is highly typical of the task ahead.

A recent study on Wd 2 by Vargas Álvarez et al. (2013) uses data from the Hubble Space Telescope (HST) that offers much better spatial resolution than is achievable from the ground. This is the only dataset that offers better angular resolution than the new VPHAS+ data analysed here. These authors' values of $R_{V}$ and $A_{V}$ were derived by fitting, to 32 individual OB stars in or near Wd 2, reddened model optical/near-infrared SEDs appropriate for the selected stars' spectroscopically-confirmed spectral types. The best fits were computed by seeking the global chi-squared minimum among all plausible values of $R_{V}$ and $A_{V}$ - resulting in a mean outcome of $R_{V}=3.77 \pm 0.09$ and $A_{V}=6.51 \pm 0.38 \mathrm{mag}$ combining results from different reddening law prescriptions. We use a comparison of our OnIR SED fit results for this same set of OB stars to bench-mark our method.

This paper is organised as follows. In Section 2 more details on the data used for this study are given. Section 3


Figure 1. RGB image of the $\sim 2$ square degree region $(\mathrm{H} \alpha, \mathrm{g}, \mathrm{i})$. This region falls within the star forming complex G283 identified by Rahman \& Murray (2010) - an elliptical region slightly larger than the sky area shown. Westerlund 2 is embedded in the HII region RCW49, while the diffuse nebulae NGC3199 is located to the right (West) as marked. The dashed line traces the Galactic equator.
is a presentation of our method, beginning with the updated version of the $Q$ method of OB star selection that we use, and ending with a description of the Markov Chain Monte Carlo (MCMC) sampling of the posterior distributions of the OnIR SED model fit parameters. The stage is then set to compare our results for Wd 2 stars with those of Vargas Álvarez et al. (2013), in Section 4. The results of the fits to the final list of 527 new OB candidates drawn from across the full 2 square degrees are presented in Section 5. This is followed by a discussion of the results in Section 6, in which we consider the extinction trends revealed in this region, and draw attention to the newly discovered O stars outside the confines of Wd 2. The outlook and our conclusions are summarised in Section 7.

## 2 THE DATA

We make use of the photometry from two VPHAS+ fields, numbered 1678 and 1679, that are respectively centred on RA 1018 10.91, Dec -58 0352.3 (J2000) and on RA 10 25 27.27, Dec -58 0352.3 (J2000). These were observed in succession in the $u, g$ and $r$ filters on the night of $22^{\text {nd }}$ January 2012. The red filter data in $\mathrm{H} \alpha, r$ and $i$ were obtained on $29^{\text {th }}$ April 2012. The seeing, as measured from the data point spread function, was variable on the earlier night ranging from 0.62 at best in $g$ up to 1.24 at worst in $r$. When the exposures in the red filters were obtained 3 months later, conditions were more stable, with the typical
seeing ranging from 0.8 to 1.0 arcsec. Viewed in comparison to all the VPHAS+ data collected so far, these observations rank as $2^{\text {nd }}$-quartile quality in $u$ and $g$ (i.e. relatively high quality), and $3^{\text {rd }}$-quartile in $r, i$ and $\mathrm{H} \alpha$. The $5 \sigma$ magnitude limits on the single exposures are $u: 21.0, g: 22.4, r: 21.5, i$ : 20.6, and $\mathrm{H} \alpha:$ 20.4. All magnitudes are in the Vega system. Full details on the survey strategy, the offsets, the exposure times, photometric quality and the data-processing pipeline used are given by Drew et al. (2014).

Our analysis begins with band-merged catalogues created from the single-band catalogues emerging from the CASU pipeline. In order to correct for the uncertainty in the initial calibration of VPHAS+, a comparison has been made with empirical $g, r$ and $i$ observations from the APASS survey and with synthetic tracks in the $(u-g, g-r)$ plane. The median difference between $g, r$ and $i$ in the two surveys was applied to the VPHAS+ data. The $u$ band was then calibrated by applying an offset to the $u-g$ scale such that the number density of stars between the synthetic G0V reddening track and the unreddened main sequence is maximised. This ensures that the top and bottom edge of the main stellar locus are aligned with the synthetic tracks as shown in Figure 2 This resulted in offsets relative to the pipeline reduction of $u:-0.35, g: 0.05, r: 0.01$ and $i: 0.05$ for field 1678 and $u:-0.34, g: 0.06, r: 0.01$ and $i: 0.01$ for field 1679. With an improved calibration in place, we select stars in the magnitude range $13<g<20$ and require random photometric errors to be less than 0.1. Mean magnitudes were taken when repeat photometry was available from the


Figure 2. Calibration of VPHAS+ data with respect to synthetic reddening tracks from Drew et al. (2014). Both the main sequence and G0V reddening vector line up with the main stellar locus.
offset fields. Objects were removed if the photometry in the offset field differed by $>0.2$ mags. This removes unreliable photometry due to objects that fall on a CCD edge.

## 3 SELECTION AND FITTING METHOD

### 3.1 Photometric selection and cross matching

We select OB stars using a method that has its origins in the Q Method of Johnson \& Morgan (1953b). On the ( $u-$ $g, g-r$ ) diagram reddened OB stars of spectral type earlier than B3 are located above and away from the main stellar locus. We initially select our candidate objects above the reddening vector associated with a B3V. In principle no star can be bluer than the Rayleigh-Jeans (RJ) limit which sets an upper bound on the likely location of OB stars in the diagram. The blue objects that lie above the RJ reddening vector were nevertheless included in the selection and their origins are discussed in section 5

Figure 3 shows the selection of OB candidates (blue crosses) across the two fields as well as the known OB stars from Vargas Álvarez et al. (2013) that were successfully cross matched with VPHAS+ (shown as red triangles). Overplotted are the reddening tracks of a B3V, a B1V and that of a pure RJ spectrum all taken from Drew et al. (2014). The tracks we use take into account the measured red leak associated with the $u$-band filter.

Previous results from Carraro et al. (2012) and Vargas Álvarez et al. (2013) suggest an $R_{V}=3.8$ reddening law is required towards Wd 2. The B1V and RJ reddening vectors have been drawn using this law. To avoid a bias towards this non-standard reddening law we have used the B3V $R_{V}=$ 3.1 reddening vector as our lower selection limit and have dropped its position by 0.1 mags in $u-g$ in order to capture


Figure 3. Selection of OB stars in and around Wd2. The lower reddening curve is that of a B3V, dropped by 0.1 in u-g in order to capture all early type B stars, and is characterised by an $R_{V}=3.1$ law. The other reddening curves are that of a B1V and an ideal Rayleigh-Jeans spectrum and are characterised by an $R_{V}=3.8$ law. Selected OB candidates are blue crosses while the known objects from Vargas Álvarez et al. 2013) are red triangles.
any early B stars that may have been missed. The lower the value of $R_{V}$, the steeper the reddening vector will be.

Each object was then cross matched to within $1^{\prime \prime}$ of the best available near infra-red detection in order to access $J, H, K$ photometry. The mean angular cross-match distance was 0.09 ". As the stellar density in the central $\sim 4^{\prime}$ of Wd 2 is very high, the Ascenso et al. (2007) NIR catalogue was the preferred partner on account of its superior angular resolution. Everywhere else 2MASS was used. This follows the approach taken by Vargas Álvarez et al. (2013).

### 3.2 SED fitting

We calculate the probability distribution of a range of model parameters corresponding to a set of empirical measurements, in a Bayesian scheme. This approach is chosen over a straight forward $\chi^{2}$ minimisation scheme so that we may recover the full posterior probability distribution. This can reveal covariance between different parameters.

Given a set of empirical data, $d=\left\{d_{1}, . ., d_{i}\right\}$, and a model, parametrised by a set of parameters, $\theta=\left\{\theta_{1}, . ., \theta_{i}\right\}$, the posterior probability of the parameters can be calculated using Bayes' Theorem:

$$
\begin{equation*}
P(\theta \mid d)=\frac{P(d \mid \theta) \cdot P(\theta)}{P(d)} \tag{1}
\end{equation*}
$$

In this expression, $P(d \mid \theta)$, the likelihood is the probability of the data being measured given a set of model parameters. The posterior and the likelihood are related by the prior, $P(\theta)$, which encodes any known constraints on the model parameters, including known physical bounds. Here
$P(d)$ can be treated as a normalising constant and ignored. Hence the posterior probability distribution can be found by the relation:

$$
\begin{equation*}
P(\theta \mid d) \propto P(d \mid \theta) \cdot P(\theta) \tag{2}
\end{equation*}
$$

In this work the empirical data are derived from the observed SED of each star and they consist of optical and near infrared apparent magnitudes:

$$
\begin{equation*}
S E D_{o b s}=\left\{u, g, r, i, J, H, K_{S}\right\}, \tag{3}
\end{equation*}
$$

and their uncertainties:

$$
\begin{equation*}
\sigma\left(S E D_{o b s}\right)=\left\{\sigma_{u}, \sigma_{g}, \sigma_{r}, \sigma_{i}, \sigma_{J}, \sigma_{H}, \sigma_{K_{S}}\right\} \tag{4}
\end{equation*}
$$

Along with the random flux errors supplied by the surveys, we have included a systematic uncertainty to account for the independent absolute calibration errors in each band. The values adopted for the latter are 0.04 in the $u$ band, 0.03 in $g, r$ and $i, 0.03$ in the $J$ band and 0.02 in $H$ and $K_{s}$ (see Drew et al. 2014 Skrutskie et al. 2006).

The model parameters that we are interested in estimating are:

$$
\begin{equation*}
\theta=\left\{\log \left(\mathrm{T}_{\mathrm{eff}}\right), \mathrm{A}_{0}, \mathrm{R}_{\mathrm{V}}, \mu\right\} \tag{5}
\end{equation*}
$$

Where $\log \left(\mathrm{T}_{\text {eff }}\right)$ is the effective temperature, $A_{0}$ is the monochromatic extinction at $4595 \AA, R_{V}$ is the ratio of total to selective extinction and $\mu$ is the distance modulus.

### 3.2.1 Likelihood function

Defining the likelihood function requires us to define a forward model $S E D_{\text {mod }}(\theta)$, which predicts the apparent SED of OB stars based on the model parameters $\theta$. The intrinsic SEDs used in the model are taken from the Padova isochrone database (CMD v2.2 ${ }^{1}$ Bressan et al. 2012, Bertelli et al. 1994) and are supplied in the Vega system. The optical/NIR colours of OB stars do not vary significantly with luminosity class Martins et al. 2005). Therefore $\log (g)$ was fixed and only main-sequence models were used $(\log (g) \sim 4.0)$. Solar metallicity $Z=0.019$ has been adopted throughout, in view of the fact that the sight lines we explore do not sample a wide range of Galactic radii. This is the same value as used by Vargas Álvarez et al. (2013). Fixing these parameters provides a simple grid of absolute magnitude, $M_{\lambda}$, as a function of $\log \left(\mathrm{T}_{\text {eff }}\right)$ in each of the seven bands.

To obtain a continuous grid, each $M_{\lambda}-\log \left(\mathrm{T}_{\text {eff }}\right)$ relationship was fit with a $2^{\text {nd }}$ order polynomial. It can be noted that a linear fit was also trialled but failed to characterize the distributions especially for the low-end values of $\log \left(\mathrm{T}_{\text {eff }}\right)$. Table 1 provides sample SEDs.

The SEDs are then reddened using a Fitzpatrick \& Massa (2007) reddening law, parametrised by $A_{0}$ and $R_{V}$, and then shifted according to a distance modulus. The apparent OnIR SEDs of O and early B stars are largely controlled by these quantities. This is because the OnIR intrinsic colours of OB stars change very slowly as a function of

[^1]Table 1. Sample values of the intrinsic SEDs with approximate spectral type equivalents. Magnitudes are in the Vega system.

| ST | $\log \left(\mathrm{T}_{\text {eff }}\right)$ | $u$ | $g$ | $r$ | $i$ | $J$ | $H$ | $K s$ |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| O3V | 4.65 | -7.32 | -5.78 | -5.48 | -5.33 | -4.88 | -4.73 | -4.63 |
| O9V | 4.50 | -5.28 | -3.86 | -3.60 | -3.45 | -3.03 | -2.90 | -2.80 |
| B1V | 4.40 | -3.97 | -2.70 | -2.47 | -2.34 | -1.98 | -1.85 | -1.77 |
| B3V | 4.27 | -2.31 | -1.33 | -1.16 | -1.07 | -0.80 | -0.70 | -0.65 |

effective temperature (Martins et al. 2005), as the RayleighJeans limit is approached. This means that $\log \left(T_{\text {eff }}\right)$ is only weakly constrained, albeit well enough to reach our goal of confirming OB status. As we have no handle on luminosity class, the distance modulus takes the role of a normalisation factor and will also be weakly constrained. In contrast $A_{0}$ and $R_{V}$ are very informative and well constrained.

We can now use the forward model to construct a likelihood model $P\left(S E D_{\text {obs }} \mid \theta\right)$ that computes the probability of $S E D_{\text {obs }}$ given the set of physical parameters $\theta$. Assuming that the uncertainties on the measurements are normally distributed and uncorrelated, this can be described by a multi-variate Gaussian:

$$
\begin{align*}
& P\left(S E D_{o b s} \mid \theta\right) \propto \\
& \exp \left[-\frac{1}{2}\left(S E D_{o b s}-S E D_{m o d}\right)^{T} \Sigma^{-1}\left(S E D_{o b s}-S E D_{m o d}\right)\right] \tag{6}
\end{align*}
$$

Where $\Sigma$ is the covariance matrix containing the variance $\sigma^{2}\left(S E D_{o b s}\right)$ in the leading diagonal. In this case Equation 6 reduces to the familiar sum for $\chi^{2}$ :

$$
\begin{equation*}
P\left(S E D_{o b s} \mid \theta\right) \propto \exp \left(-\frac{1}{2} \sum_{i}^{n} \frac{\left(m(o b s)_{i}-m(m o d)_{i}\right)^{2}}{\sigma_{i}^{2}}\right) \tag{7}
\end{equation*}
$$

Where $m(o b s)_{i}$ and $m(m o d)_{i}$ are the observed and model magnitudes in each band $i$.

### 3.2.2 Priors

We adopt a uniform prior on each of the model parameters:

$$
P(\theta)=\left\{\begin{array}{l}
1 \quad \text { if }\left\{\begin{array}{l}
4.2 \leqslant \log \left(\mathrm{~T}_{\mathrm{eff}}\right) \leqslant 4.7 \\
0 \leqslant A_{0} \leqslant 15 \\
2.1 \leqslant R_{V} \leqslant 5.1 \\
0 \leqslant \mu \leqslant 20
\end{array}\right.  \tag{8}\\
0 \text { else }
\end{array}\right.
$$

The upper bound on $\log \left(\mathrm{T}_{\text {eff }}\right)$ is governed by the available models and the lower bound is slightly less than the the typical temperature of a B3V star (Zorec \& Briot 1991) in accordance with our selection in the $(u-g, g-r)$ diagram. The constraints on $R_{V}$ are the upper and lower limits measured in the Galaxy (Fitzpatrick \& Massa 2007). The upper limit on $A_{0}$ is much larger than maximum extinction allowed for detection of OB stars in VPHAS+ down to $g=20$, assuming a typical rise in visual extinction of 1 magnitude per kpc. This makes the prior on $A_{0}$ essentially unbound. The upper limit on the distance modulus $\mu$ of 20 is well beyond the realms of the galaxy and so is also essentially unbound.

Placing a large but finite limit on $A_{0}$ and $\mu$ enables the MCMC algorithm to converge more quickly.

### 3.2.3 Sampling the posterior distribution using MCMC

Characterising the posterior distribution by computing the probability at all values in the parameter space is computationally expensive. Instead one can sample the distribution using an MCMC algorithm.

In this study we use the Python package emcee developed by Foreman-Mackey et al. (2013). In brief, the software takes a set of parameters and supplies them to a group of $n$ walkers. The walkers then use a pseudo-random walk to sample the parameter space. At each sample the probability is calculated. By communicating their relative probabilities to one another the walkers are able to quickly find and sample the region of high probability without wasting computational time on the parameter combinations of very low probability. The software then returns what are known as chains which contain the values of the parameters at every step in the walk. The frequency at which each region in the parameter space is visited is proportional to its probability. The finer details can be found in Foreman-Mackey et al. (2013).

## 4 VALIDATION OF METHOD

First it is appropriate to verify that our selection method recovers known objects. Second we verify that the fitting algorithm delivers the expected results. To achieve this, we have chosen to compare with the results of the recent study by Vargas Álvarez et al. (2013). This is an informative comparison to make both because this study benefited from the superior angular resolution of HST and because Vargas Álvarez et al. (2013) used a combination of optical and NIR photometry to derive stellar reddenings as we do here.

### 4.1 Photometric selection

Vargas Álvarez et al. (2013) derived the extinction properties of 29 known OB stars in the central region of Wd 2, of which, 24 were successfully cross matched with VPHAS+ to within 1". Using the nomenclature from Vargas Álvarez et al. (2013), the five missing objects are \#597, \#826, \#843, $\# 903$ and \#906. They appear in some of the most crowded regions of the cluster: the angular resolution of VPHAS+ compared to that of HST is insufficient to separate them from brighter neighbours. Figure 4 shows the positions of the 24 cross-matched objects and the positions of those that are missing (relative to Vargas Álvarez et al. 2013) over plotted on the g -band image.

Figure 5 is the highly magnified section of Figure 3 that contains the objects with known spectral type. The red and blue shaded regions are where we expect to find late-type (O9 - O6) and early-type (O6 - RJ) O stars respectively. We find that the majority of the objects are correctly separated into their respective early or late spectral-type zones defined by the $R_{V}=3.8$ reddening tracks. This gives an early indication that an $R_{V} \sim 3.8$ reddening law is required for this sight-line and that the calibration of the data is in good agreement with the synthetic photometry.


Figure 4. Inverse VPHAS $+g$ band image of the central region of Wd 2 showing the objects with known spectral type from Vargas Álvarez et al. (2013). The red triangles are the positions of the objects detected in VPHAS+ and the blue squares are the positions of those that are not detected due to crowding.

Object \#771 falls well above the 'RJ limit'. As a confirmed O8V star, its position in the $(u-g, g-r)$ diagram is clearly anomalous. Close inspection of the image suggests that the photometry of this star is affected by a bright neighbour.

### 4.2 SED fitting

Ultimately 21 of the 24 known objects were suitable for SED fitting. These objects are tabulated in Table 2 Two of the objects left out are \#896 and \#771 for which there is no detection in one or more of the the optical bands due to blending. The third is object \#1004 for which the near-infrared photometry is incomplete.

For each of the 21 objects for which we have computed SED fits, the posterior distribution was sampled with 100 walkers over 10000 iterations with a 1000 iteration burn in. The typical autocorrelation time for each walk (or number of steps per independent sample) was found to be well below 100, which indicates that the posteriors are thoroughly sampled. We can determine the probability distributions for each parameter by marginalising over all other parameters. We visualize this by constructing 1-D histograms of the values of each parameter visited in the random walk. We can also check for covariance or degeneracy between parameters by constructing marginalised 2-D histograms for each pair of parameters. Figure 6 shows an example of these diagrams for an O 4 V and a B1V star in the sample ( $\# 913$ and $\# 549$ ).

The obvious difference between the two cases is apparent in the 1-D marginalisation of parameters. We see that the hotter the object the more skewed the probability distributions in $\log \left(\mathrm{T}_{\text {eff }}\right)$ and $\mu$ become. This can be attributed to


Figure 5. Testing the selection process of OB stars associated with Wd2. Objects with known spectral type tend to fall into the correct synthetic spectral type range with an $R_{V}=3.8$ reddening law.
the fact that the hotter SEDs are approaching the RJ tail. This makes it more difficult to differentiate the temperature of the hottest stars and consequently the luminosity and distance. This makes the drop off in probability at the hot end more shallow. This intrinsic feature also means that the uncertainties on $\log \left(\mathrm{T}_{\text {eff }}\right)$ and $\mu$ increase with temperature but has the positive effect of decreasing the uncertainties on $A_{0}$ and $R_{V}$. For the later type stars $\log \left(\mathrm{T}_{\text {eff }}\right)$ is better defined but still uncertain.

The value adopted for each parameter is the median of the marginalised posterior distribution with upper and lower uncertainties defined by the $16^{\text {th }}$ and $84^{\text {th }}$ percentiles. We find that we are able to determine the values of $A_{0}$ and $R_{V}$ with relatively high precision (better than $\pm 0.09 \mathrm{mag}$ and $\pm 0.08$ respectively in all cases). These uncertainties are similar to those found by Vargas Álvarez et al. (2013). We note that $R_{V}$ and $A_{0}$ are well defined and show negligible covariance relative to each other and only modest covariance with respect to $\log \left(\mathrm{T}_{\text {eff }}\right)$ and $\mu$.

However, as expected, our determination of temperature and distance are not so informative. For object \#913, $\log \left(\mathrm{T}_{\text {eff }}\right)=4.61_{-0.07}^{+0.06}$ and $\mu=13.23_{-0.89}^{+0.78}$. This corresponds to values of $T_{\text {eff }}=40.7_{-6.1}^{+6.0} \mathrm{kK}$, or a spectral type range from O 8 V to O 2 V . The results for $\mu$ translate to $d=4.4_{-1.5}^{+1.9} \mathrm{kpc}$. This already significant distance uncertainty is nevertheless an underestimate given that neither the luminosity class or metallicity uncertainties have been formally incorporated. In addition we are treating all stars as if single which biases the inferred distance moduli to lower values by up to 0.75 mag. Because of the relative lack of constraint on $\log \left(\mathrm{T}_{\text {eff }}\right)$ from the intrinsic colours of OB stars, the error in $\log \left(\mathrm{T}_{\text {eff }}\right)$ is driven mainly by the error in $\mu$. In comparison the direct effect of binarity on $\log \left(\mathrm{T}_{\text {eff }}\right)$, through colour-changes, will be small. It is plainly apparent in Figure 6 that $\log \left(T_{\text {eff }}\right)$


Figure 6. PDFs of the fitting parameters as a result of the MCMC simulation for stars \#913 an O4V (top) and \#549 and B1V (bottom) using the numbering system from Vargas Álvarez et al. (2013).
and $\mu$ are strongly and positively covariant. The role of the distance modulus is essentially that of a normalisation parameter.

Figure 7 shows the results for the O 4 V star from Figure 6 translated into the original SED data space. The top panel shows the observed SED over-plotted by 30 randomly sampled model SEDs that are drawn from the posterior distributions shown in Figure 6 The lower panel shows the residuals


Figure 7. Visualisation of the posterior distributions of objects \#913 and \#549 (from Vargas Álvarez et al. 2013) in SED data space. The top panel shows 30 model SEDs for both objects (gray solid lines), generated from a random sampling of the posterior parameter distributions shown in Figure 6 Our photometric data is plotted on top (circles). The bottom panels show the residuals.
between them. We can see that for each band, across all the posterior distributions, the differences between the models and the data never exceed $\sim 0.1 \mathrm{mag}$. The discrepancies between the model and data can be attributed to one or more of the following: inaccuracies in the intrinsic SEDs of OB stars in the Padova isochrones; inaccuracies in the shape of the reddening law; a calibration offset between the optical and NIR catalogues.

Table 2 compares the stellar parameters of the 21 known OB stars derived in this study with those from Vargas Álvarez et al. (2013). Here $A_{0}$ has been converted to $A_{V}$ and the VPHAS+g band magnitudes have been converted to $V$ band using the Sloan to Johnson conversion from Lupton $(2005)^{2}$ for ease of comparison. We also note that our SED-derived $\log \left(\mathrm{T}_{\text {eff }}\right)$ values are compared to spectroscopic values where available (Vargas Álvarez et al. 2013 Rauw et al. 2007). Otherwise effective temperatures are derived from spectral types according to the temperature scales of


Figure 8. The difference between stellar parameters found in this study and those found by Vargas Álvarez et al. (2013). The solid line shows zero difference while the dashed line shows the median difference.

Martins et al. (2005) and Zorec \& Briot (1991). We restrict our comparison to the results in Vargas Alvarez et al. (2013) based on the Fitzpatrick \& Massa (2007) extinction curves.

Figure 8 plots the difference between the values derived in the two studies. It must be noted that star \#584 has not been included in this analysis as extreme blending has substantially affected its photometry (see Figure 4 and Table 2.

A significant difference is found between the transformed $V$ band magnitudes in VPHAS+ and HST of $\sim$ 0.18 mag , such that VPHAS+ is brighter. Vargas Álvarez et al. (2013) compare their empirical $B$ and $V$ band measurements with those of Moffat et al. (1991) and Rauw et al. (2007) and find that those ground based measurements are also systematically brighter, by 0.18 and 0.15 mag , and by 0.22 and 0.12 respectively. Vargas Álvarez et al. (2013) suggest that the difference may be due to source blending following on from the effects of atmospheric seeing. If this were the case we would expect to find objects in the most crowded/blended region of the cluster to be consistently more discrepant. As we do not see this effect we suspect a real calibration difference. Hur et al. (2015) have also uncovered a similar problem but find good agreement between their optical photometry and that of Rauw et al. (2007). If

[^2]Table 2. Table comparing the derived stellar parameters of objects with known spectral type from Vargas Álvarez et al. (2013) with the results in this study. The ID given corresponds to the numeration given by Vargas Álvarez et al. (2013) . Most of the effective temperatures in the HST column were derived spectroscopically by Vargas Álvarez et al. 2013) and uncertainties were given. The rest have no provided uncertainty as they were estimated from their spectral types using the temperature scales from Martins et al. 2005) and Zorec \& Briot 1991).

| ID | ST | $\mathrm{A}_{\mathrm{V}}$ |  | $\mathbf{R}_{V}$ |  | $\log \left(\mathrm{T}_{\text {eff }}\right)$ |  | $\mu$ |  | V |  |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
|  |  | VPHAS+ | HST | VPHAS+ | HST | VPHAS+ | HST | VPHAS + | HST | VPHAS+ | HST |
| 137 | O 4 V | $7.47_{-0.04}^{+0.04}$ | $7.41 \pm 0.22$ | $4.05_{-0.05}^{+0.05}$ | $3.84 \pm 0.07$ | $4.63{ }_{-0.06}^{+0.05}$ | $4.633 \pm 0.004$ | $13.43_{-0.79}^{+0.62}$ | $13.19 \pm 0.45$ | $15.496 \pm+0.056$ | $15.591 \pm 0.006$ |
| 178 | O4 V-III((f)) | $6.34_{-0.04}^{+0.04}$ | $6.38 \pm 0.07$ | $4.03_{-0.06}^{+0.06}$ | $3.93 \pm 0.03$ | $4.63_{-0.07}^{+0.05}$ | $4.629 \pm 0.002$ | $13.38_{-0.82}^{+0.64}$ | $11.79 \pm 0.16$ | $14.385 \pm+0.055$ | $14.490 \pm 0.004$ |
| 395 | O7.5V | $6.78_{-0.08}^{+0.07}$ | $6.92 \pm 0.07$ | $4.08_{-0.07}^{+0.07}$ | $3.77 \pm 0.03$ | $4.52_{-0.07}^{+0.09}$ | $4.544 \pm 0.000$ | $12.91_{-0.76}^{+1.09}$ | $12.78 \pm 0.18$ | $15.688 \pm+0.056$ | $16.019 \pm 0.062$ |
| 505 | O8.5V | $6.19_{-0.06}^{+0.05}$ | $6.36 \pm 0.14$ | $3.84_{-0.06}^{+0.06}$ | $3.71 \pm 0.06$ | $4.59_{-0.08}^{+0.07}$ | $4.531 \pm 0.006$ | $14.57_{-0.95}^{+0.93}$ | $13.29 \pm 0.30$ | $15.889 \pm+0.056$ | $16.094 \pm 0.005$ |
| 528 | O8 V | $6.72_{-0.07}^{+0.06}$ | $6.97 \pm 0.14$ | $4.02_{-0.06}^{+0.07}$ | $3.99 \pm 0.05$ | $4.56{ }_{-0.08}^{+0.09}$ | $4.544 \pm 0.005$ | $13.34_{-0.89}^{+1.10}$ | $12.55 \pm 0.30$ | $15.571 \pm+0.056$ | $15.841 \pm 0.005$ |
| 548 | O4 V | $6.34_{-0.05}^{+0.05}$ | $6.48 \pm 0.10$ | $4.02_{-0.06}^{+0.06}$ | $3.76 \pm 0.04$ | $4.61_{-0.07}^{+0.06}$ | $4.633 \pm 0.002$ | $13.11_{-0.90}^{+0.81}$ | $13.19 \pm 0.23$ | $14.361 \pm+0.055$ | $14.522 \pm 0.002$ |
| 549 | B1 V | $6.02_{-0.09}^{+0.09}$ | $6.09 \pm 0.08$ | $4.14_{-0.08}^{+0.09}$ | $4.01 \pm 0.04$ | $4.45_{-0.06}^{+0.08}$ | $4.398 \pm 0.000$ | $12.59_{-0.56}^{+0.81}$ | $11.68 \pm 0.19$ | $15.485 \pm+0.056$ | $15.562 \pm 0.005$ |
| 584 | O8 V | $4.60_{-0.04}^{+0.04}$ | $6.19 \pm 0.05$ | $2.91_{-0.04}^{+0.04}$ | $3.73 \pm 0.02$ | $4.66_{-0.05}^{+0.03}$ | $4.544 \pm 0.002$ | $15.24_{-0.64}^{+0.42}$ | $12.94 \pm 0.12$ | $14.195 \pm+0.055$ | $15.442 \pm 0.004$ |
| 620 | B1 V | $5.77_{-0.09}^{+0.09}$ | $5.77 \pm 0.08$ | $4.00_{-0.08}^{+0.08}$ | $3.82 \pm 0.04$ | $4.46{ }_{-0.06}^{+0.08}$ | $4.398 \pm 0.000$ | $13.46_{-0.56}^{+0.86}$ | $12.56 \pm 0.19$ | $16.007 \pm+0.057$ | $16.086 \pm 0.006$ |
| 640 | O9.5V | $6.32_{-0.07}^{+0.05}$ | $6.37 \pm 0.05$ | $3.97_{-0.06}^{+0.07}$ | $3.73 \pm 0.02$ | $4.57_{-0.08}^{+0.08}$ | $4.505 \pm 0.002$ | $14.30_{-0.91}^{+1.07}$ | $13.11 \pm 0.13$ | $16.065 \pm+0.057$ | $16.234 \pm 0.006$ |
| 704 | O4 V | $6.03_{-0.05}^{+0.05}$ | $6.27 \pm 0.29$ | $3.94_{-0.06}^{+0.06}$ | $3.76 \pm 0.12$ | $4.61_{-0.07}^{+0.06}$ | $4.681 \pm 0.008$ | $12.91_{-0.85}^{+0.77}$ | $14.26 \pm 0.63$ | $13.844 \pm+0.055$ | $14.059 \pm 0.002$ |
| 714 | O3 V | $5.61_{-0.05}^{+0.04}$ | $6.08 \pm 0.11$ | $3.67_{-0.06}^{+0.06}$ | $3.73 \pm 0.05$ | $4.62_{-0.07}^{+0.05}$ | $4.643 \pm 0.000$ | $14.29_{-0.82}^{+0.69}$ | $14.53 \pm 0.26$ | $14.642 \pm+0.055$ | $15.017 \pm 0.003$ |
| 722 | O6 V | $7.21_{-0.06}^{+0.05}$ | $7.23 \pm 0.04$ | $3.94_{-0.05}^{+0.06}$ | $3.65 \pm 0.01$ | $4.61_{-0.08}^{+0.06}$ | $4.584 \pm 0.001$ | $12.79_{-0.94}^{+0.84}$ | $12.04 \pm 0.11$ | $14.944 \pm+0.055$ | $15.060 \pm 0.030$ |
| 738 | O5.5V | $5.84_{-0.05}^{+0.05}$ | $6.02 \pm 0.08$ | $3.88{ }_{-0.06}^{+0.06}$ | $3.73 \pm 0.04$ | $4.61{ }_{-0.07}^{+0.06}$ | $4.602 \pm 0.000$ | $13.91_{-0.90}^{+0.81}$ | $13.39 \pm 0.19$ | $14.696 \pm+0.055$ | $14.896 \pm 0.003$ |
| 769 | O9.5V | $6.50_{-0.09}^{+0.06}$ | $6.63 \pm 0.06$ | $3.86_{-0.06}^{+0.07}$ | $3.65 \pm 0.02$ | $4.54_{-0.08}^{+0.10}$ | $4.491 \pm 0.002$ | $14.12_{-0.89}^{+1.20}$ | $13.04 \pm 0.13$ | $16.351 \pm+0.057$ | $16.576 \pm 0.008$ |
| 804 | O6 III | $7.11_{-0.11}^{+0.11}$ | $6.91 \pm 0.04$ | $4.11_{-0.09}^{+0.09}$ | $3.71 \pm 0.01$ | $4.60{ }_{-0.08}^{+0.07}$ | $4.582 \pm 0.001$ | $12.14_{-0.96}^{+0.89}$ | $11.78 \pm 0.10$ | $14.290 \pm+0.055$ | $14.433 \pm 0.003$ |
| 857 | O4.5V | $6.50_{-0.08}^{+0.08}$ | $6.13 \pm 0.08$ | $4.17_{-0.08}^{+0.09}$ | $3.63 \pm 0.03$ | $4.56_{-0.08}^{+0.09}$ | $4.623 \pm 0.002$ | $11.30_{-0.91}^{+1.08}$ | $12.65 \pm 0.18$ | $13.335 \pm+0.055$ | $13.869 \pm 0.003$ |
| 879 | O9.5V | $6.77_{-0.07}^{+0.06}$ | $6.98 \pm 0.07$ | $3.82_{-0.06}^{+0.06}$ | $3.70 \pm 0.03$ | $4.57_{-0.08}^{+0.08}$ | $4.519 \pm 0.003$ | $14.37_{-0.98}^{+1.05}$ | $13.11 \pm 0.16$ | $16.510 \pm+0.058$ | $16.645 \pm 0.056$ |
| 913 | O3-4V | $6.23_{-0.06}^{+0.05}$ | $6.42 \pm 0.11$ | $3.87_{-0.06}^{+0.06}$ | $3.66 \pm 0.04$ | $4.61_{-0.07}^{+0.06}$ | $4.642 \pm 0.002$ | $13.23_{-0.89}^{+0.78}$ | $13.45 \pm 0.24$ | $14.344 \pm+0.055$ | $14.531 \pm 0.002$ |
| 924 | O8 V | $6.25_{-0.07}^{+0.06}$ | $6.40 \pm 0.07$ | $3.68_{-0.06}^{+0.06}$ | $3.60 \pm 0.03$ | $4.57_{-0.08}^{+0.08}$ | $4.544 \pm 0.000$ | $14.08_{-0.91}^{+1.02}$ | $13.16 \pm 0.16$ | $15.680 \pm+0.056$ | $15.960 \pm 0.005$ |
| 1039 | O4-5V | $6.43{ }_{-0.05}^{+0.05}$ | $6.42 \pm 0.10$ | $3.80{ }_{-0.05}^{+0.06}$ | $3.47 \pm 0.04$ | $4.62{ }_{-0.07}^{+0.05}$ | $4.622 \pm 0.002$ | $13.26_{-0.86}^{+0.70}$ | $12.98 \pm 0.22$ | $14.429 \pm+0.055$ | $14.523 \pm 0.030$ |

the scale of Rauw et al. (2007) is the right one, our photometry may be too bright by $\sim 0.05 \mathrm{mag}$.

The apparent systematic calibration difference between the two data sets is reflected in the derived values of $A_{V}$. In particular the median of the star-by-star differences in $A_{V}$ shows that our extinctions are on average 0.14 mag less than those derived by Vargas Álvarez et al. (2013). The median $A_{V}$ with the $16^{\text {th }}$ and $84^{\text {th }}$ percentiles in this study and in Vargas Álvarez et al. (2013) are; $A_{V}($ VPHAS +$)=6.34_{+0.44}^{-0.32}$ and $A_{V}(\mathrm{HST})=6.41_{+0.56}^{-0.32}$. With brighter optical magnitudes there is also an offset in $R_{V}$ such that our values are higher: the median star-by-star difference in $R_{V}$ is 0.20 , while sample medians are respectively $R_{V}(\mathrm{VPHAS}+)=$ $3.96_{+0.12}^{-0.14}$ and $R_{V}(\mathrm{HST})=3.73_{+0.11}^{-0.08}$.

Despite the expectation of poor constraints on distance, the difference in the median values of $\mu$ happen to be very small: $\mu($ VPHAS +$)=13.36_{+0.92}^{-0.57}$ and $\mu(\mathrm{HST})=13.07_{+0.31}^{-1.02}$. This is likely to be due to the O stars in Wd 2 being on the main sequence, matching our assumption. Similarly there is only a modest offset on average in the measures of effective temperature.

The results of this comparison are encouraging. We have found good quantitative agreement, within the uncertainties, between our derived parameters and those of Vargas Álvarez et al. (2013) drawing on HST optical photometry. Where there are differences, we understand their origin. This gives us confidence that both our method and the underlying VPHAS+ data are producing reliable results.

## 5 RESULTS

Here we apply the SED fitting methods discussed above to the full selection of $O B$ candidates from our pilot $\sim 2$ sq.deg field.

## 5.1 'Goodness-of-fit'

The posterior distributions obtained tell us the most probable parameters given the data, however they do not tell us anything about 'goodness-of-fit'. As some objects in our selection may be contaminants or may just have bad photometry, it is important to determine how well the data fit the model in order to obtain a 'clean' selection of OB stars. We have opted to use the value of $\chi^{2}$, given by the SED fits, at the median values in the marginalised posterior distribution. We are aware that the posterior medians may not exactly trace the maximum likelihood, but they provide a representative sample.

Figure 9 shows the $\chi^{2}$ distribution of the fits to all 1050 objects in the wider selection above the distribution obtained for the known objects from Vargas Álvarez et al. (2013). Since we are fitting 7 data points with 4 parameters we expect a $k=3 \chi^{2}$ distribution peaking at 1 - the top panel of Figure 9 indicates this is what happens and, by implication, that the uncertainties on our data points are not significantly over- or under- estimated. In keeping with this, we have chosen to use the commonly adopted $5 \%$ significance level, at $\chi^{2}=7.82$ as the limit beyond which


Figure 9. $\chi^{2}$ distributions for the known objects (bottom) and the wider selection (top). The $\chi^{2}$ distribution for the wider selection peaks at $\sim 1$ as a expected from a distribution with $k=3$ degrees of freedom. Using a $5 \%$ significance level we judge objects with $\chi^{2}>7.82$ to be unsatisfactorily fit. The known objects with poor fits are subject to photometric blending in the cluster's core.
we judge the fits to the applied model to be unsatisfactory. This cut makes reasonable sense when applied to the $\chi^{2}$ distribution for the known objects (in common with Vargas Álvarez et al. 2013), in that the 10 confirmed OB stars beyond the chosen cut are mainly there because of the impact on the photometry of the blending in the crowded central parts of Wd 2 present in the VST data. For this reason we have still tabulated those objects not meeting our selection criteria but have not used them in any further analysis. We note that if both 2MASS Skrutskie et al. (2006) and Ascenso et al. (2007) photometry are available we keep which ever yields a better $\chi^{2}$.

### 5.1.1 Further cross-matches with previously catalogued objects

All of the objects in the initial selection were cross-matched to $<1^{\prime \prime}$ with the SIMBAD (Wenger et al. 2000) database to check for further examples of objects of known type.

Tsujimoto et al. (2007) conducted a $17 \times 17$ arcmin high resolution X-ray imaging survey centred on Wd2 and the surrounding star forming region RCW 49. They identified 17 new X-ray emitting OB candidates in this larger region, enclosing that studied by Vargas Álvarez et al. (2013). On using a 1 " cross match radius we find 8 of these objects make it into our selection. Five of the missing objects are picked up by VPHAS+ but have $g<13$ and hence were too bright to be selected. Conversely, the remaining 4 objects are detected by VPHAS+ but are too faint $(g>20)$ to be in our selection. It is likely that these objects are highly reddened.

Across all other literature sources, accessed via SIMBAD, fourteen further stars of confirmed type were found (see Table 3). The breakdown of their classifications is as follows: six stars with a Wolf-Rayet (WR) component, three OV, two OIII, one OVb, one B5Vne, one carbon star and
one star listed as M1III. All six WR stars, the carbon star and one of the OV stars could not be fitted convincingly as reddened OB stars (i.e. $\chi^{2}>7.82$ ), while the others were ( $\chi^{2}<7.82$ ). The OVb was confirmed as an O3V +O 5.5 V binary system by Vargas Álvarez et al. (2013) but was not used in their SED fitting analysis - hence it did not feature in Section 4.2. On close inspection of the literature, it became clear that the SIMBAD M1III attribution matching one of our selected objects is wrong, resulting from confusion over the sky position of the previously catalogued HAeBe candidate, THA 35-II-41. THA 35-II-41 is indeed one of our selected objects but it is not at the position attributed to it by Carmona et al. (2010) where these authors observed an M giant spectrum.

We also detect seven bright objects in the originally NIR selected open cluster DBS2003 45 (Dutra et al. 2003) centred at $10 \mathrm{~h} 19 \mathrm{~m} 10.5 \mathrm{~s}-58^{\circ} 02^{\prime} 22.6^{\prime \prime}$. The study by Zhu et al. (2009) identifies seven OB stars in this cluster estimated as ranging from spectral type B 0 to O 7 from low resolution NIR spectroscopy. However, six out of seven of the positions given in Table 2 of Zhu et al. (2009) do not match with the VPHAS+ positions nor with any detections in the 2MASS point source catalogue. We therefore suspect that there is an error in the positions that they give whilst our objects are in common. We find these are among the most highly extinguished objects in our selection with an average $A_{V}=8.37$.

### 5.1.2 Summary of results

Figure 10 shows the stages in the selection process: first, those stars without a match to good quality NIR photometry have to be set aside (shown as grey crosses in the Figure); next, those with 'poor' $\chi^{2}$ values (the cyan-coloured squares); finally the good fits are divided in two groups based on their effective temperature. Those with a median posterior effective temperature exceeding 20000 K , or equivalently $\log \left(\mathrm{T}_{\text {eff }}\right) \geqslant 4.3$, are shown as red triangles while those that are assigned cooler fits are shown as blue squares. The hotter stars are our target group of spectral type B2 and earlier.

Counter-intuitively perhaps, it can be seen in Figure 10 that in the domain where $g-r<0.5$, only 12 stars could be matched with good NIR photometry. This is because lowly reddened UV-excess objects detected in VPHAS+ are commonly too faint for detection in 2MASS due to their blue SEDs - for instance, some of these objects will be under-luminous hot compact objects. Unsurprisingly the cyan coloured squares representing objects with poor fits are frequently to be found above the Rayleigh-Jeans limit - only 2 objects with accepted fits fall into this part of the diagram. It is reassuring that there is some offset between the $R_{V}=3.1 \mathrm{~B} 3 \mathrm{~V}$ reddening vector, serving as lower bound to the selection region, and the spread of hotter objects: it suggests that few, if any, stars hotter than $\log \left(\mathrm{T}_{\text {eff }}\right)=4.3$ have been missed (given our other constraints, such as the magnitude limits). It is worth noting that the selection of objects that occupied the 0.1 mag wide band directly below the B3V reddening vector in $u-g$ provided just 1 star out of 374 with $\log \left(\mathrm{T}_{\text {eff }}\right) \geqslant 4.3$ and $\chi^{2}<7.82$.

The main groupings emerging from the fitting process of all 1073 objects are shown in table 4 All of the objects along with their photometry and derived parameters are tabulated in Tables 5 and 6

New OB stars in the Carina Arm

Table 3. Objects crossed matched with SIMBAD in the selection which have known spectral type. Derived parameters of highly evolved objects will be inaccurate due to the main-sequence assumption as shown by their large $\chi^{2}$ values. On further inspection of the literature the classification object \#895 is much different from that in SIMBAD(see Section )

| ID | RA | DEC | Identifier | Spectral Type | $g$ | $\log \left(T_{e f f}\right)$ | $R_{V}$ | $A_{0}$ | $\mu$ | $\chi^{2}$ |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| 282 | 101804.98 | -58 1626.27 | WR 19 | WC5 + O9 | 14.02 | $4.37{ }_{-0.04}^{+0.05}$ | $5.79{ }_{-0.09}^{+0.09}$ | $4.14_{-0.08}^{+0.09}$ | $9.60_{-0.38}^{+0.48}$ | 39.60 |
| 335 | 101853.39 | -58 0752.94 | WR 19a | WN | 15.45 | $4.54{ }_{-0.08}^{+0.10}$ | $8.59{ }_{-0.09}^{+0.06}$ | $4.322_{-0.06}^{+0.07}$ | $9.87{ }_{-0.89}^{+1.19}$ | 10.21 |
| 437 | 102017.50 | -574459.39 | C* 1665 | C* | 16.54 | $4.66{ }_{-0.03}^{+0.02}$ | $12.30_{-0.04}^{+0.04}$ | $4.54_{-0.03}^{+0.03}$ | $8.05{ }_{-0.39}^{+0.32}$ | 436.47 |
| 560 | 102205.75 | -5753 46.03 | 2MASS J10220574-5753460 | B5Vne | 15.71 | $4.422_{-0.05}^{+0.07}$ | $5.64{ }_{-0.09}^{+0.09}$ | $3.80{ }_{-0.07}^{+0.07}$ | $11.988_{-0.49}^{+0.68}$ | 1.53 |
| 644 | 102323.50 | -58 0020.80 | SS 215 | O2If*/WN5 | 13.48 | $4.41_{-0.05}^{+0.06}$ | $5.67{ }_{-0.09}^{+0.09}$ | $4.27_{-0.09}^{+0.10}$ | $9.60_{-0.44}^{+0.57}$ | 16.06 |
| 687 | 102358.01 | -574548.93 | V* V712 Car | O3If*/WN6+O3If*/WN6 | 14.48 | $4.48{ }_{-0.06}^{+0.08}$ | $7.50{ }_{-0.09}^{+0.08}$ | $4.27{ }_{-0.07}^{+0.07}$ | $9.39_{-0.63}^{+0.91}$ | 10.47 |
| 717 | 102401.20 | -574531.03 | Cl* Westerlund 2 MSP 188 | $\mathrm{O} 3 \mathrm{~V}+\mathrm{O} 5.5 \mathrm{~V}$ | 14.34 | $4.53_{-0.08}^{+0.10}$ | $6.79_{-0.09}^{+0.09}$ | $4.41_{-0.09}^{+0.10}$ | $10.70_{-0.88}^{+1.19}$ | 5.69 |
| 743 | 102402.44 | -574436.05 | Cl Westerlund 25 | $\mathrm{O} 5 / 5.5 \mathrm{~V} / \mathrm{III}(\mathrm{f})$ | 13.80 | $4.54_{-0.07}^{+0.09}$ | $5.95{ }_{-0.08}^{+0.06}$ | $4.24_{-0.08}^{+0.09}$ | $11.188_{-0.81}^{+1.08}$ | 10.56 |
| 770 | 102406.64 | -57 4715.88 | $\mathrm{Cl}^{*}$ Westerlund 2 NRM 3 | O9.5V | 17.61 | $4.58{ }_{-0.08}^{+0.08}$ | $7.75{ }_{-0.07}^{+0.05}$ | $4.144_{-0.05}^{+0.06}$ | $13.444_{-0.98}^{+1.03}$ | 2.07 |
| 789 | 102416.25 | -574343.75 | $\mathrm{Cl}^{*}$ Westerlund 2 NRM 2 | O8.5III | 15.94 | $4.622_{-0.07}^{+0.05}$ | $7.38{ }_{-0.05}^{+0.04}$ | $4.02_{-0.05}^{+0.05}$ | $12.73_{-0.87}^{+0.68}$ | 2.47 |
| 793 | 102418.40 | -574829.77 | WR 20b | WN6ha | 14.61 | $4.38{ }_{-0.05}^{+0.06}$ | $7.97{ }_{-0.10}^{+0.09}$ | $4.60{ }_{-0.07}^{+0.08}$ | $7.944_{-0.43}^{+0.55}$ | 22.34 |
| 797 | 102421.29 | -574727.53 | Cl* Westerlund 2 NRM 1 | O6V | 15.70 | $4.64{ }_{-0.06}^{+0.04}$ | $7.04{ }_{-0.04}^{+0.04}$ | $4.144_{-0.05}^{+0.06}$ | $13.12_{-0.76}^{+0.55}$ | 3.59 |
| 822 | 102439.20 | -5745 21.20 | 2MASS J10243919-5745211 | O 5 V | 16.03 | $4.61{ }_{-0.08}^{+0.06}$ | $7.03_{-0.05}^{+0.04}$ | $4.00_{-0.05}^{+0.06}$ | $13.10_{-0.93}^{+0.77}$ | 1.68 |
| 895 | 102547.07 | -58 2127.66 | THA 35-II-41 | HAeBe | 13.55 | $4.56{ }_{-0.08}^{+0.09}$ | $4.144_{-0.07}^{+0.05}$ | $4.788_{-0.13}^{+0.15}$ | $13.31_{-0.87}^{+1.08}$ | 4.89 |
| 907 | 102556.51 | -574843.54 | WR 21a | WN+ | 13.62 | $4.37_{-0.04}^{+0.05}$ | $6.34_{-0.09}^{+0.09}$ | $4.45_{-0.09}^{+0.09}$ | $8.59_{-0.39}^{+0.49}$ | 42.02 |



Figure 10. $(u-g, g-r)$ diagram showing the stages of selection. Red triangles are the final selection used for further discussion. All of the objects clearly above the RJ reddening vector are returned as bad fits.

### 5.1.3 Contaminants

The $\left(\chi^{2}>7.82\right)$ fits have a range of causes. The most frequent are likely to be contact binaries or the products of poor photometry.

Contact binaries may find their way into the selection because they are both quite common and rapidly variable. Figure 11 shows how around half of the $\chi^{2} \leqslant 7.82$ objects clearly separate in the $(r-i, g-r)$ colour-colour diagram away from the OB stars towards redder $g-r$ at fixed $r-i$. This is plausibly the signature of contact binary (W UMa) interlopers. W UMa systems are doubly eclipsing binaries in which the brightness in any one band scarcely remains con-

Table 4. Breakdown of the number of new OB candidates, previously identified OB candidates and objects with known spectral type according to effective temperature and fit quality.

| All Objects: 1073 |  |  |
| :---: | :---: | :---: |
| $\log \left(\mathrm{~T}_{\text {eff }}\right) \geqslant 4.3$ | $\chi^{2} \leqslant 7.82$ | $\chi^{2}>7.82$ |
| Total | 527 | 145 |
| New Candidate OBs | 489 | 98 |
| Old Candidate OBs | 19 | 28 |
| Known O - B2 stars | 19 | 10 |
| Other | 0 | 1 C star \& 6 WR stars |
| $\log \left(\mathrm{T}_{\text {eff }}\right)<4.3$ | $\chi^{2} \leqslant 7.82$ | $\chi^{2}>7.82$ |
| Total | 321 | 80 |
| New Candidate OBs | 320 | 78 |
| Old Candidate OBs | 0 | 2 |
| Known O - B2 stars | 1 | 0 |
| All $\log \left(\mathrm{T}_{\text {eff }}\right)$ | 848 | 225 |

stant over time. These objects have typical orbital periods of 8 hours with two pronounced minima per cycle (Rucinski 1992). The $u / g / r$ VST exposures are taken sequentially with about 15 minutes elapsing between $u$ and $g$, and $g$ and r . If the g band exposure of a W UMa system is taken at or near minimum light, its measured $u-g$ colour is bluer than true, while $g-r$ is redder, potentially pushing the star up into our OB selection. However these objects fail to pass as OB stars when the whole OnIR SED fit is performed, hence their poor $\chi^{2}$ values. It has been estimated that there is around 1 W UMa system for every $\sim 130$ main sequence stars (Rucinski 1992). So finding perhaps as many as $\sim 100$ in our OB selection, given $\sim 100000$ stars across the 2 square degrees with $u / g / r$ photometry, is reasonable.

The second common origin for the poor fits is likely due to photometry affected by blending or incorrect crossmatching between bands. In the crowded core of Wd 2 this is an obvious difficulty (see Figures 4 and 10).

The literature search already reported in section 5.1.2

| － | $89^{\circ}$ I | 9T＇ZI | 0T＇\＆I | 9T＇ZI | 96.8 | 00＇\％ | 968 | 86.9 | $80 \cdot 2$ | 86.9 |  | L9＇も | ¢9．7 | 778 |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| － | $69^{\circ} \mathrm{E}$ | 98． CI | ZT＇EL | 98．\％I | $60^{\circ} \mathrm{\square}$ | 顽而 | $60^{\circ} \mathrm{\square}$ | $00 \%$ | ¢0： 2 | $00^{\circ} \mathrm{L}$ | $89^{\circ} 7$ | 79＇\％ | $89^{\circ} 7$ | $\angle 62$ |
| － |  | 98．LI | \＆L＇ZI | 98．LI | 86.8 | \％\％${ }^{\text {\％}}$ | $86^{\circ} \mathrm{E}$ | 88 2 | $88^{\circ} \mathrm{L}$ | $88^{\circ} \mathrm{L}$ | G9＇t | 79＇ヵ | G9．7 | 682 |
| － | $20 \%$ | $97^{\circ} \mathrm{ZI}$ | 䛔\＆L | 97＊ ZI | $60^{\circ}$ ¢ | 理•无 | $60^{\text {¢ }}$ | 89.2 | 92.2 | $89^{\circ} \mathrm{L}$ | $09^{\prime}$ | $89^{\circ} 7$ | $0{ }^{\circ} \mathrm{F}$ | 024 |
| － | \＆7＇8I | 0 O＇ZI $^{\text {¢ }}$ | $97^{\prime}$ ¢L | 0才゙てI | \％ $2 \cdot \varepsilon$ | $08^{\circ} \mathrm{E}$ | DL＇ $\mathcal{L}$ | $68 \cdot 9$ | 比9 | 68.9 | 9．7 | 79＇7 | 9．7 | ¢92 |
| － | \％9＇\％ | $68^{\circ} 0 \mathrm{I}$ | 0¢＇LI | 68．0］ | $0 L^{\prime}$ ¢ | LI＇t | 0 L＇t $^{\text {¢ }}$ | $87^{\circ} 9$ | LG9 | $8 \square^{\circ} 9$ | $87^{\circ} \mathrm{T}$ | $99^{\circ}{ }^{\circ}$ | $87^{\circ}$ | L\＆L |
| － | $68^{\text {＇}}$ | 81＇LI |  | 81＇LI | 80＇t | LI＇t | 80＇ヵ | $80 \%$ | 钡し | $80 \%$ | Z9＇T | 09＊＊ | 79．7 | 782 |
| － | 79\％ | 78＇LI | 62＇ZI | 78＇LI | $68^{\circ} \mathrm{\varepsilon}$ | 76\％ | $68^{\circ} \mathrm{E}$ | $6 \mathrm{I}^{2}$ | 97.2 | $6 \mathrm{I}^{\circ} \mathrm{L}$ | ¢9＇\％ | L9＊ | E9＇7 | もちL |
| － | L8．72 | 09＇もI | $\dagger Z^{\prime} \mathrm{GI}$ | 09＇もT | $98^{\circ} \mathrm{Z}$ | L6 ${ }^{\text {\％}}$ | $98^{\prime} 7$ | $99^{\circ} \mathrm{t}$ | 09＇\％ | $99^{\circ} \mathrm{T}$ | L9＇酎 | 99 ${ }^{\circ}$ | L9＇も | ZIL |
| － | 82＇も\％ | $99^{\circ} \mathrm{ZI}$ | $88^{\circ} \mathrm{EL}$ | $99^{\circ} \mathrm{FL}$ | L68 | 80＇t | L68 | L\＆9 | 989 | L\＆9 | $99^{\circ} \mathrm{T}$ | 89＇も | $99^{\circ} \mathrm{F}$ | $\angle 29$ |
| ยกร | L6．0 |  | \＆8＇玱 | 9才理 | $\angle 9.8$ | $69 \cdot 8$ | $\angle 9.8$ | $98 \%$ | $9 ¢^{6} \mathrm{E}$ | 98.8 | 78＇${ }^{\circ}$ | $98^{\circ} \mathrm{F}$ | 78＇7 | L09 |
| ĐSG | 78.7 | 88．8 | \＆Z 6 | \＆8．8 | $92 \cdot 8$ | $08 \%$ | $92 \cdot 8$ | てI＇8 | 7\％ 8 | ZI＇8 | Z $8^{\prime}$＇ | L8＇\％ | 78＇${ }^{\circ}$ | 849 |
| － | L9＇ヵ | $80^{\circ} \mathrm{ZI}$ | $66^{\circ} \mathrm{ZI}$ | $80^{\circ} \mathrm{ZI}$ | $69^{\circ} \mathrm{E}$ | $9 L^{\circ} \mathrm{E}$ | $69 \cdot 8$ | E9．9 | $79^{\circ} 9$ | E9．9 | 97＇⿱一𫝀口儿 | 79\％ | 97＇t | 967 |
| ZロM | $99^{\prime} 9$ | $6 \mathrm{~T}^{\circ} \mathrm{EL}$ | \＆て＇もI | $6 \mathrm{~T}^{\circ} \mathrm{EL}$ | 72＇$\%$ | LL＇$\%$ | $72 \cdot 8$ | LL．9 | 889 | LL9 | TS＇T | ［9\％ | 79．7 | EIT |
| DSG | ¢0．I | $69^{\circ} 8$ | ¢t．6 | $69^{\circ} 8$ | $72 \cdot 8$ | LL＇\％ | $72 \cdot \mathcal{L}$ | 87.8 | $69^{\circ} 8$ | 87.8 | LE＇T | \＆゙も | LE＇T | GLI |
| N＇A | 86．68 | 68.9 I | \＆Z＇LI | 68．9］ | 80＇ヵ | \＆1＇t | 80 | ¢9．9 | \＆ $2 \cdot 9$ | 79 9 | $97^{\circ}$ ¢ | ¢9．tis | 97＇${ }^{\text {¢ }}$ | ¢9I |
| ยกS | $90^{\circ} \mathrm{G}$ | $68^{\circ} \mathrm{CI}$ | 89．9T | $68^{\circ} \mathrm{GI}$ | $L 7^{\prime} \varepsilon$ | $98 \%$ | $27 \cdot 8$ | $69^{\circ} \mathrm{\nabla}$ | 08＇${ }^{\text {\％}}$ | $69^{\circ}$ | 0才， | $\angle V^{\circ} \mathrm{T}$ | 0才＇t | 791 |
| ยกร | L6． I | $69^{\circ} \mathrm{CI}$ | L9．9T | 69 CI | $29^{\circ} \mathrm{E}$ | $6 L^{\circ} \mathrm{E}$ | 298 | $60^{\circ} 9$ | $97^{\prime} \mathrm{C}$ | $60^{\circ} 9$ | E8＇\％ | ¢\％$\nabla^{\circ}$ | E\＆＇${ }^{\circ}$ | 68 |
| DSG | $87^{\prime} 7$ | ¢G\％ | 86\％ | ¢G．L | $72 \cdot 8$ | LL＇ $\mathcal{E}$ | $72 \cdot 8$ | $67^{\prime} 8$ | 88．8 | $67^{\circ} 8$ | LE＇${ }^{\text {\％}}$ | $98^{\circ} \mathrm{T}$ | LE＇7 | 79 |
| WH | 78．28 | もT＇ZI | 99＇7I | もT＇ZI | $99^{\circ} \mathrm{E}$ | \＆ $2 \cdot 8$ | 998 | ¢ $9^{\circ}$ | 79＇\％ |  | $68^{\prime}$ | 比も | $68^{\prime}$ | I |
| səъo ${ }^{\text {N }}$ | $z^{\chi}$ | ${ }_{47} \ddagger 8 \mathrm{~d}$ ING | ${ }_{47} 09 \mathrm{~d} \mathrm{ING}$ | ${ }_{47} 9 \mathrm{Id}$ ING | ${ }_{47}{ }_{7} 78 \mathrm{~d} \Lambda 4$ | ${ }_{47} 09 \mathrm{~d} \Lambda 4$ | ${ }_{\text {ч7 }} 9 \mathrm{Id} \Lambda 4$ | ${ }_{47} 788 \mathrm{~d} \mathrm{0V}$ | ${ }_{47} 09 \mathrm{~d} \mathrm{0V}$ | ${ }_{47} 9 \mathrm{Id} 0 \mathrm{~V}$ |  |  | ${ }_{47} 9 \mathrm{Ld}\left({ }^{\text {² }} \mathrm{L}\right)^{80} \mathrm{O}$－ | CI |


| ID | MSP ID | VA ID | TFT ID | SIMBAD ID | ST | RA（J2000） | DEC（J2000） | u | err u | g | rr | r | err r | i | err | Ha | err Ha | J | err J | H | err H | K | err K |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| 1 |  |  |  |  |  | 101309.25 | －58 0158.10 | 15.061 | 0.002 | 5.00 | 0.001 | 13.64 | 0.001 | 2.86 | 13.044 | 001 | 0.001 | 1.69 | 0.021 | 11.255 | 0.022 | 0．83 | 0.021 |
| 52 |  | － | － |  |  | 101440.36 | －57 2426.24 | 16.937 | 0.006 | 15.487 | 0.00 | 12.959 | 0.001 | 11.468 | 12.345 | 0.001 | 0.001 | 8.69 | 0.024 | 7.870 | 0.03 | 7.41 | 0.027 |
| 89 |  | － | － |  |  | 101524.77 | －57 4409.28 | 20.081 | 0.101 | 19.776 | 0.025 | 18.265 | 0.016 | 17.376 | 17.914 | 0.022 | 0.019 | 15.900 | 0.089 | 15.331 | 0.094 | 14.970 | 0.121 |
| 162 | － |  |  |  |  | 101631.33 | －57 4818.68 | 19.199 | 0.034 | 18.923 | 0.010 | 17.323 | 0.006 | 16.565 | 17.392 | 0.017 | 0.007 | 15.246 | 0.054 | 14.763 | 0.079 | 14.509 | 0.096 |
| 164 |  |  |  |  |  | 101631.97 | －57 5602.37 | 19.675 | 0.050 | 19.702 | 0.026 | 17.937 | 0.014 | 17.316 | 16.223 | 0.008 | 0.019 | 15.476 | 0.064 | 14.878 | 0.062 | 14.549 | 0.090 |
| 175 |  |  |  |  |  | 101642.53 | －57 3247.65 | 17.559 | 0.009 | 16.168 | 0.002 | 13.576 | 0.001 | 12.078 | 13.053 | 0.001 | 0.001 | 9.327 | 0.026 | 8.474 | 0.049 | 7.953 | 0.027 |
| 413 |  |  |  |  |  | 101947.82 | －57 5038.64 | 17.677 | 0.014 | 17.057 | 0.004 | 15.127 | 0.002 | 13.894 | 14.697 | 0.003 | 0.001 | 11.830 | 0.026 | 11.179 | 0.027 | 10.872 | 0.027 |
| 496 |  |  |  |  |  | 102120.56 | －57 4309.40 | 15.521 | 0.003 | 15.231 | 0.001 | 13.666 | 0.001 | 12.692 | 13.284 | 0.001 | 0.001 | 11.014 | 0.023 | 10.524 | 0.023 | 10.292 | 0.021 |
| 578 |  |  |  |  |  | 102219.90 | －57 4611.21 | 17.855 | 0.011 | 16.506 | 0.002 | 14.037 | 0.001 | 12.592 | 13.513 | 0.001 | 0.001 | 9.870 | 0.024 | 9.100 | 0.024 | 8.600 | 0.021 |
| 601 |  |  |  |  | － | 102235.02 | －58 3337.82 | 16.554 | 0.005 | 16.692 | 0.002 | 15.716 | 0.002 | 15.153 | 15.471 | 0.004 | 0.002 | 14.220 | 0.056 | 13.883 | 0.066 | 13.810 | 0.064 |
| 677 | 182 | 178 | 112 | Cl＊Westerlund 2 MSP 182 | O4V－III（（f）） | 102356.18 | －57 4530.00 | 15.587 | 0.004 | 15.349 | 0.002 | 13.624 | 0.001 | 12.613 | 13.211 | 0.001 | 0.001 | 10.520 | 0.015 | 10.050 | 0.008 | 9.750 | 0.020 |
| 712 | 157 | 584 |  | 2MASS J10240073－5745253 | O8V | 102400.76 | －57 4525.65 | 15.376 | 0.004 | 15.137 | 0.002 | 13.450 | 0.001 | 12.437 | 13.044 | 0.001 | 0.001 | 11.660 | 0.038 | 11.150 | 0.027 | 10.790 | 0.031 |
| 724 | 263 | 722 | 202 | C1＊Westerlund 2 MSP 263 | 06 V | 102401.52 | －57 4557.00 | 16.696 | 0.008 | 16.094 | 0.003 | 14.055 | 0.001 | 12.859 | 13.633 | 0.002 | 0.001 | 10.520 | 0.025 | 9.910 | 0.035 | 9.530 | 0.036 |
| 732 | 167 | 804 | 217 | C1＊Westerlund 2 MSP 167 | O8V | 102402.04 | －57 4527.94 | 15.858 | 0.005 | 15.398 | 0.002 | 13.430 | 0.001 | 12.306 | 13.007 | 0.001 | 0.001 | 9.960 | 0.122 | 9.357 | 0.158 | 8.982 | 0.095 |
| 737 | 203／444 | 857 | 224 | Cl＊Westerlund 2 NRM 4 | O4．5V | 102402.29 | －57 4535.26 | 14.604 | 0.003 | 14.310 | 0.001 | 12.566 | 0.001 | 11.560 | 12.170 | 0.001 | 0.001 | 9.450 | 0.063 | 8.950 | 0.090 | 8.520 | 0.050 |
| 763 | 171 | 1039 | 298 | C1＊Westerlund 2 MSP 171 | O4－5V | 102404.90 | －57 4528.35 | 15.886 | 0.005 | 15.470 | 0.002 | 13.616 | 0.001 | 12.552 | 13.206 | 0.001 | 0.001 | 10.480 | 0.018 | 10.000 | 0.039 | 9.740 | 0.033 |
| 770 | 383 |  | 314 | C1＊Westerlund 2 NRM 3 | 09.5 V | 102406.64 | －57 4715.88 | 18.263 | 0.023 | 17.608 | 0.006 | 15.502 | 0.003 | 14.248 | 14.952 | 0.003 | 0.002 | 11.736 | 0.028 | 11.008 | 0.025 | 10.536 | 0.023 |
| 789 | － |  | 388 | C1＊Westerlund 2 NRM 2 | O8．5III | 102416.25 | －57 4343.75 | 16.495 | 0.007 | 15.936 | 0.003 | 13.883 | 0.001 | 12.664 | 13.432 | 0.001 | 0.001 | 10.316 | 0.023 | 9.624 | 0.023 | 9.236 | 0.021 |
| 797 |  |  | 405 | Cl＊Westerlund 2 NRM 1 | O6V | 102421.29 | －57 4727.53 | 16.048 | 0.006 | 15.703 | 0.002 | 13.796 | 0.001 | 12.636 | 13.367 | 0.001 | 0.001 | 10.435 | 0.024 | 9.745 | 0.022 | 9.386 | 0.019 |
| 822 | － | － | 447 | 2MASS J10243919－5745211 | O5V | 102439.20 | －57 4521.20 | 16.519 | 0.007 | 16.033 | 0.003 | 14.084 | 0.001 | 12.919 | 13.644 | 0.002 | 0.001 | 10.709 | 0.026 | 10.060 | 0.027 | 9.679 | 0.023 |
| Table 6：Sample table containing the derived parameters of all 1073 objects．The $16^{\text {th }}, 50^{\text {th }}$ and $84^{\text {th }}$ percentiles are given for each parameter as well as the $\chi^{2}$ percentile．The notes column indicates if the object shows emission（EM），is a sub－luminous candidate（SUB），is a blue supergiant candidate（BSG）or is a new O st Wd 2 （WD2）with similar reddening．The full table can be found in the electronic version of this paper． |  |  |  |  |  |  |  |  |  |  |  |  |  |  |  |  |  |  |  |  |  |  |  |




Figure 11. Positions of objects with $\chi^{2} \leqslant 7.82$ (blue dots) and $\chi^{2}>7.82$ (grey crosses) in the $(r-i, g-r)$ plane. The solid black line is the reddening vector of an O9V with $R_{V}=3.8$. The dashed line is the unreddened main sequence. We find that a large number of objects with 'poor' fits fall away from the OB star reddening vector. These objects show colours that are consistent with eclipsing W UMa contact binaries.
revealed that high $\chi^{2}$ may be linked to extreme objects like WR stars ( 6 examples) and carbon stars (1 only). Another rare contaminant may be white dwarf/M dwarf binaries that can present blue $u-g$, alongside red $r-i$. The blue white-dwarf light begins to be overwhelmed by the red dwarf's light with increasing wavelength, shifting the combined colours below and to the right of the OB reddening track in the ( $g-r, r-i$ ) diagram (fig 11). Such objects are known to co-locate with reddened OB stars in the $(u-g, g-r)$ diagram or they may fall beyond the RJ reddening vector (Smolčić et al. 2004).

### 5.2 Parameters of the candidate OB stars

Figure 12 shows the distribution of stellar parameters across the entire selection for the objects fitting successfully to a reddened OB-star SED $\left(\chi^{2} \leqslant 7.82\right.$ and $\left.\log \left(T_{\text {eff }}\right) \geqslant 4.3\right)$. Coloured in red are the results for all objects within an 8 arcmin box centred on Wd 2 (drawn in Figure 17). It can be seen that those objects in or near the cluster are reported to have similar extinction in the range $5.5 \leqslant A_{0} \leqslant 7$ (top right panel in Figure 12). Otherwise, the reddenings range more broadly across the full 2 square degrees from $A_{0} \simeq 3$ up to $A_{0} \simeq 8$. Other features of this particular sight-line are that larger than standard $R_{V}$ is favoured - a roughly normal distribution in $R_{V}$ about a mean value of $R_{V}=3.84 \pm 0.25$ is obtained - and that most of the selected stars are attributed distances of between $\sim 2 \mathrm{kpc}(\mu \simeq 11)$ and $\sim 6 \mathrm{kpc}(\mu \simeq 14)$. The objects in/near Wd2 tend toward the higher end of the
distance modulus range and show a fairly wide spread in extinction law with $3.5 \leqslant R_{V} \leqslant 4.5$.

Echoing the initial mass function (IMF), the distribution in median $\log \left(\mathrm{T}_{\text {eff }}\right)$ values is heavily skewed towards the lower end. The turn over in the $\log \left(\mathrm{T}_{\text {eff }}\right)$ distribution at just below $\log \left(\mathrm{T}_{\text {eff }}\right)=4.3$ further supports the conclusion that our initial selection of VPHAS+ sources in the $(u-g, g-r)$ diagram is essentially complete in the desired O to B 2 effective temperature range (given our magnitude limits). The coolest object in the candidate list is $\sim 16000 \mathrm{~K}$.

Stars with median estimated effective temperatures in excess of $30000 \mathrm{~K}\left(\log \left(\mathrm{~T}_{\text {eff }}\right) \geqslant 4.477\right)$ are regarded as candidate $O$ stars. Of the new discoveries 74 meet this criterion. We can further subdivide this group to distinguish the highly probable $O$ stars: 28 objects have a $16^{\text {th }}$ percentile $\log \left(\mathrm{T}_{\text {eff }}\right)$ exceeding 4.477. Seven of these may be sdO stars (see section 5.3).

Predictably, many of the hottest candidates are in and around Wd 2: this young massive cluster does indeed stand out in this part of the Galactic Plane. Moreover the top left panel in 12 suggests a relative lack of cooler OB stars within the 8 arcmin box centred on the cluster. This could be taken to imply that the stellar mass function of Wd 2 and environs is top heavy. At the same time, there are biases that can favour the detection of more massive stars at the likely distance of the cluster ( $\mu \sim 13-14$ ) - namely, the effects of crowding (less massive fainter stars are more likely to be lost in blends) and of magnitude limited selection. However this is unlikely to be all of the explanation given that there are plenty of examples of $A_{0} \sim 5.5-7$ cool candidates with a similar estimated distance modulus.

Figure 13 shows the upper and lower uncertainties on each parameter as a function of $g$-band magnitude for all $\chi^{2}<7.82$ objects. The uncertainty on $\log \left(\mathrm{T}_{\text {eff }}\right)$ and $A_{0}$ increases for fainter objects, tracking the increase with rising magnitude of the photometric errors. Conversely the uncertainty on $R_{V}$ shows a slight increase with decreasing magnitude at the bright end. $R_{V}$ is more difficult to determine for bright objects as they tend to be less obscured. Nevertheless it is evident that both $R_{V}$ and $A_{0}$ are consistently well determined across the entire magnitude range. Our OnIR SED fits deliver $A_{0}$ to within $\lesssim 0.09 \mathrm{mag}$ up to $18^{\text {th }} \mathrm{mag}$ nitude, rising up to $\lesssim 0.25 \mathrm{mag}$ at $20^{\text {th }}$ magnitude. We find the median uncertainty on $R_{V}$ to be 0.081 .

### 5.3 Inferences from the best-fit parameters and other aspects of the photometry

A richer understanding of the candidate objects can be obtained from a combination of more scrutiny of the fit parameters obtained and from a fuller utilisation of the VPHAS+ photometry at our disposal. So far the focus has been on the information to be extracted from the individual OnIR SEDs - treating all candidates as if they are well described as reddened, single, main-sequence OB stars. We can learn more through consideration of the ensemble of objects, and if use is made of the narrowband $\mathrm{H} \alpha$ band to separate out emission line stars.

First we acknowledge and relax the main sequence assumption applied so far. The first two panels of Figure 14 show scatter plots of the best-fit median distance modulus, $\mu$, vs. $\log \left(\mathrm{T}_{\text {eff }}\right)$ and vs. $A_{0}$ for the candidate OB stars. Differ-

Candidates
$\bigcirc$ OBs Sub-luminous $\bigcirc$ Blue supergiants
$\Delta \mathrm{OV} \boldsymbol{\mathrm { OIII }} \square \mathrm{OV}+\mathrm{OV} \star \mathrm{WR} \wedge \mathrm{BV} \bullet \mathrm{HAeBe}$




Figure 14. 2-D distribution of the best fit parameters for the final selection of OB candidates $\left(\chi^{2} \leqslant 7.82\right.$ and $\left.\log \left(T_{\text {eff }}\right) \geqslant 4.3\right)$ and objects in the selection with known spectral type (the carbon star lays outside the range of 2 of these diagrams and was therefore not included). Objects shown in red and yellow are thought to be candidate sub-luminous OB stars and candidate blue supergiants respectively. The areas shaded in grey are where we cannot detect $O B$ stars given the survey limits.


Figure 12. Distribution of the best fit parameters for the selection of objects with $\chi^{2}<7.82$. The red bars are objects within and 8 arcmin box of Wd 2 while the grey bars are the wider selection. We find that the objects spatially associated with Wd 2 show a tight distribution in $A_{0}$ and provide an over density of objects in the $5.5 \leqslant A_{0} \leqslant 7$ range and also show a wider spread in $R_{V}$.
ent symbols are over-plotted to pick out the already known objects listed in SIMBAD as well as the O stars of Vargas Álvarez et al. 2013). The areas shaded in grey are where we cannot detect OB stars given the survey limits. The objects plotted as red circles have relatively low extinction but, if


Figure 13. Uncertainty on each parameter as a function of $g$ band magnitude. Uncertainties are derived from the $16^{\text {th }}$ and $84^{\text {th }}$ percentiles of the posterior distributions.
we take the returned distance moduli at face value, they would have to be construed as very distant ( $>10 \mathrm{kpc}$ ) when compared to the known OB stars. It is more plausible that these are intrinsically sub-luminous objects rather than distant OB stars located in remarkably clear reddening holes.

Their scattered spatial distribution across the whole field shown in Figure 17 supports this argument.

The converse argument can be applied to those objects plotted as yellow circles: they are found to have more than 6 magnitudes of extinction but are seemingly very close (less than $\sim 700 \mathrm{pc}$ away, $\mu<9$ ). We suspect that these objects are intrinsically much higher-luminosity, evolved B stars. The proximity of these stars in the figures to the (poorlyfit) known WR stars, including the highly-luminous WR20a, lends credibility to this interpretation.

Referring back to the photometry in the form of a $(g, g-r)$ colour magnitude diagram (CMD), these interpretations are seen to make sense - the sub-luminous and over-luminous objects form tracks separated from the mainsequence - see the third panel of Figure 14 Table 7 lists these extreme objects. There will be further discussion of them in Section 6. The main concentration of objects appears in the $11.5<\mu<14 \mathrm{mag}$ range which equates to distances ranging from $2-6 \mathrm{kpc}$. This encloses the derived distance range of the Carina arm traced in CO by Grabelsky et al. (1988), near its tangent.

We can also use the VPHAS $+\mathrm{H} \alpha$ measurements to uncover any emission line stars in our selection. The presence of emission lines implies the presence of ionized circumstellar gas which, among massive OB stars, most commonly indicates classical Be stars with circumstellar disks. Although the OnIR SEDs of classical Be stars are not greatly different from normal B stars of similar effective temperature, the derived interstellar extinctions from SED fits that do not take into account the circumstellar continuum emission will nevertheless be overestimated. We have used the ( $r-i, r-\mathrm{H} \alpha$ ) diagram to select all objects that lie more than 0.1 mag in $r-\mathrm{H} \alpha$ above the O9V reddening vector (this equates to $\sim 10 \AA$ in emission line equivalent width). Figure 15 shows this selection. Using the relation between $E W(\mathrm{H} \alpha)$ and added colour excess $E(B-V)$ due to the presence of a circumstellar disk in classical Be stars from Dachs et al. (1988), we can estimate that the derived reddenings $\left(A_{0}\right)$ for our $\mathrm{H} \alpha$-excess stars will have been inflated by between $\sim 0.1$ and $\sim 0.3$ magnitudes. There are 17 of these objects in the $\chi^{2} \leqslant 7.82$ and $\log \left(\mathrm{T}_{\text {eff }}\right) \geqslant 4.3$ group and a further 63 with $\chi^{2}>7.82$ and/or $\log \left(\mathrm{T}_{\text {eff }}\right)<4.3$. Objects with $\mathrm{H} \alpha$ excess are marked in Table 6

### 5.4 Reddening

After removing the obvious sub/over-luminous objects and the emission line stars from the selection we are left with a cleaner selection of $458 \sim$ non-emission OB candidates and 19 known OB stars available for further examination of their reddening properties.

Given our tight grasp on $A_{0}$ and $R_{V}$, it is of interest to consider their interdependence. $R_{V}$ is plotted as a function of $A_{0}$ in Figure 16. The left panel of this Figure includes those objects within an 8 arcmin box around Wd 2 and the right hand panel excludes them. The areas shaded in grey are where we cannot detect OB stars given the survey limits. In both cases we can see a moderate positive correlation in $R_{V}$ as a function of $A_{0}$ (correlation coefficient $r=0.47$ and $r=0.45$ respectively). On comparing the two panels, it is evident that the members of Wd 2 drive up the $R_{V}$ trend more sharply when they are included. The shaded


Figure 15. 13 of the $\chi^{2} \leqslant 7.82$ and $\log \left(T_{\text {eff }}\right) \geqslant 4.3$ objects show $\mathrm{H} \alpha$ excess. As emission is usually associated with circumstellar dust; the derived extinction may be incorrect. The solid line is the reddening vector of an O9V raised by 0.1 in $r-\mathrm{H} \alpha$.
background shows that the trends seen are independent of the boundaries set by the survey selection limits. Given that it was demonstrated in Section 4.2 that the fitting method generates negligible covariance between $A_{0}$ and $R_{V}$, we can say with confidence that the correlation apparent now is related to the physical nature of the volume of space under study.

It is commonly accepted that increasing $R_{V}$ is linked to increasing typical dust grain size, and that values of 3.5 and more are associated with denser molecular cloud environments (see e.g. Draine 2003). The $\sim 2$ square degrees under examination here sample sight-lines lying just inside the Carina Arm tangent direction. Our pencil beam is evidently one that would initially pass through the atomic diffuse interstellar medium and then enter the dense clouds of the Carina Arm, wherein Wd 2 is located. In this situation it makes sense that as the dust column grows it becomes ever more dominated by the dense/molecular ISM component i.e. $R_{V}$ tends to rise. However the rise is not dramatic, and the data points show significant dispersion, which may imply that the variation in the dust properties within the sampled volume is not especially coherent. The effect of the bright limit of the survey is to remove sensitivity to $A_{0}$ much below $2-3$, or to distances less than $\sim 3 \mathrm{kpc}$ (see below). Current maps of Galactic spiral arm structure place this distance already within the Carina Arm (Russeil 2003, Vallée 2014).

The clear message of Figure 16 is that the typical, if necessarily idealised, reddening law for this sight-line is $R_{V} \sim 3.8$, which rises much less sharply with decreasing wavelength than the Galactic average of $R_{V}=3.1$ (see Figure 13 in Fitzpatrick \& Massa 2007).

Table 7. Table containing the derived stellar parameters of the sub-luminous and blue supergiant candidates in the $\chi^{2} \leqslant 7.82$ and $\log \left(\mathrm{T}_{\text {eff }}\right) \geqslant 4.3$ group.

| ID | RA | DEC | g | $\log \left(T_{e f f}\right)$ | $A_{0}$ | $R_{V}$ | $\mu$ | $\chi^{2}$ |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| Sub-Luminous |  |  |  |  |  |  |  |  |
| 19 | 101340.87 | -57 4315.38 | 18.13 | $4.65{ }_{-0.05}^{+0.04}$ | $4.32{ }_{-0.09}^{+0.09}$ | $4.95{ }_{-0.15}^{+0.16}$ | $18.82_{-0.69}^{+0.50}$ | 7.09 |
| 28 | 101354.74 | -58 1433.73 | 18.91 | $4.31-0.04$ | $4.36{ }_{-0.13}^{+0.13}$ | $3.82{ }_{-0.16}^{+0.17}$ | $15.44_{-0.37}^{+0.45}$ | 3.53 |
| 82 | 101521.46 | -5753 30.64 | 19.43 | $4.37-0.06$ | $5.94{ }_{-0.13}^{+0.13}$ | $4.03_{-0.10}^{+0.10}$ | $14.82_{-0.52}^{+0.77}$ | 1.11 |
| 86 | 101522.76 | -57 4821.73 | 18.67 | $4.57_{-0.08}^{+0.08}$ | $4.34{ }_{-0.17}^{+0.16}$ | $4.17{ }_{-0.21}^{+0.23}$ | $18.33_{-0.99}^{+0.98}$ | 2.10 |
| 89 | 101524.77 | -57 4409.28 | 19.78 | $4.43{ }_{-0.09}^{+0.13}$ | $5.266_{-0.17}^{+0.15}$ | $3.79_{-0.12}^{+0.13}$ | $16.57{ }_{-0.88}^{+1.47}$ | 1.97 |
| 96 | 101536.78 | -57 4658.03 | 17.65 | $4.37{ }_{-0.05}^{+0.05}$ | $3.34{ }_{-0.10}^{+0.10}$ | $3.13_{-0.10}^{+0.11}$ | $15.933_{-0.42}^{+0.53}$ | 0.82 |
| 153 | 101625.54 | -58 3318.54 | 18.93 | $4.61{ }_{-0.08}^{+0.06}$ | $4.70_{-0.09}^{+0.09}$ | $3.84{ }_{-0.11}^{+0.11}$ | $18.57_{-0.99}^{+0.83}$ | 6.51 |
| 162 | 101631.33 | -57 4818.68 | 18.92 | $4.47_{-0.07}^{+0.09}$ | $4.80{ }_{-0.11}^{+0.10}$ | $3.35{ }_{-0.09}^{+0.09}$ | $16.588_{-0.69}^{+1.04}$ | 5.05 |
| 177 | 101644.32 | -58 0129.97 | 19.02 | $4.32{ }_{-0.05}^{+0.06}$ | $4.17{ }_{-0.13}^{+0.13}$ | $3.60{ }_{-0.13}^{+0.14}$ | $15.84_{-0.42}^{+0.54}$ | 2.71 |
| 202 | 101701.28 | -58 0529.31 | 19.35 | $4.47{ }_{-0.08}^{+0.11}$ | $4.89{ }_{-0.14}^{+0.13}$ | $3.87{ }_{-0.14}^{+0.15}$ | $17.11_{-0.86}^{+1.34}$ | 3.96 |
| 219 | 101715.78 | -57 2313.80 | 19.53 | $4.37{ }_{-0.06}^{+0.07}$ | $4.60_{-0.15}^{+0.15}$ | $3.57{ }_{-0.15}^{+0.16}$ | $16.43_{-0.54}^{+0.75}$ | 1.31 |
| 274 | 101759.10 | -58 0105.92 | 18.16 | $4.31{ }_{-0.04}^{+0.05}$ | $2.866_{-0.13}^{+0.13}$ | $3.27_{-0.18}^{+0.20}$ | $16.35_{-0.36}^{+0.43}$ | 3.30 |
| 275 | 101759.67 | -57 4812.93 | 17.03 | $4.30_{-0.04}^{+0.04}$ | $2.71_{-0.10}^{+0.10}$ | $3.61{ }_{-0.17}^{+0.18}$ | $15.377_{-0.30}^{+0.35}$ | 1.17 |
| 292 | 101811.80 | -58 2012.24 | 19.21 | $4.33-0.05$ | $4.68{ }_{-0.13}^{+0.13}$ | $3.82_{-0.14}^{+0.15}$ | $15.57_{-0.41}^{+0.50}$ | 1.62 |
| 402 | 101939.37 | -58 2918.43 | 19.76 | $4.31-0.06$ | $5.27{ }_{-0.15}^{+0.15}$ | $3.72_{-0.11}^{+0.12}$ | $15.27_{-0.47}^{+0.64}$ | 3.79 |
| 468 | 102048.03 | -57 4545.52 | 18.35 | $4.35{ }_{-0.05}^{+0.05}$ | $4.46{ }_{-0.12}^{+0.12}$ | $3.47{ }_{-0.12}^{+0.12}$ | $15.10_{-0.41}^{+0.51}$ | 0.35 |
| 472 | 102053.73 | -575841.78 | 17.95 | $4.55{ }_{-0.08}^{+0.10}$ | $4.422_{-0.09}^{+0.08}$ | $3.94{ }_{-0.11}^{+0.12}$ | $17.14_{-0.89}^{+1.22}$ | 3.28 |
| 474 | 102054.07 | -58 0232.59 | 18.92 | $4.30_{-0.04}^{+0.05}$ | $3.88{ }_{-0.12}^{+0.12}$ | $3.40_{-0.13}^{+0.14}$ | $15.87_{-0.35}^{+0.42}$ | 6.59 |
| 484 | 102107.91 | -5733 52.74 | 18.16 | $4.57{ }_{-0.08}^{+0.09}$ | $4.37{ }_{-0.09}^{+0.08}$ | $3.70_{-0.10}^{+0.11}$ | $17.66_{-0.95}^{+1.09}$ | 3.39 |
| 486 | 102110.28 | -58 1046.02 | 18.62 | $4.36{ }_{-0.05}^{+0.05}$ | $4.30_{-0.11}^{+0.11}$ | $4.33_{-0.16}^{+0.17}$ | $15.82_{-0.43}^{+0.50}$ | 1.42 |
| 601 | 102235.02 | -58 3337.82 | 16.69 | $4.36_{-0.04}^{+0.05}$ | $3.45_{-0.10}^{+0.10}$ | $3.69_{-0.13}^{+0.13}$ | $14.83_{-0.38}^{+0.46}$ | 0.97 |
| 647 | 102327.84 | -575456.79 | 19.03 | $4.54_{-0.09}^{+0.11}$ | $5.47{ }_{-0.10}^{+0.09}$ | $4.39_{-0.12}^{+0.13}$ | $16.99_{-1.04}^{+1.38}$ | 5.40 |
| 810 | 102431.14 | -5733 45.22 | 16.99 | $4.60_{-0.08}^{+0.07}$ | $3.27{ }_{-0.15}^{+0.15}$ | $4.03_{-0.24}^{+0.26}$ | $18.17_{-1.01}^{+0.94}$ | 1.71 |
| 819 | 102436.96 | -58 2247.18 | 17.28 | $4.31{ }_{-0.04}^{+0.04}$ | $2.59_{-0.11}^{+0.11}$ | $3.51{ }_{-0.18}^{+0.20}$ | $15.91_{-0.33}^{+0.39}$ | 5.83 |
| 842 | 102458.98 | -575956.24 | 17.45 | $4.42{ }_{-0.05}^{+0.07}$ | $3.91{ }_{-0.14}^{+0.14}$ | $4.11{ }_{-0.21}^{+0.23}$ | $15.83_{-0.57}^{+0.77}$ | 0.66 |
| 870 | 102525.08 | -5759 04.50 | 17.98 | $4.31{ }_{-0.04}^{+0.04}$ | $4.21_{-0.12}^{+0.12}$ | $4.99_{-0.23}^{+0.22}$ | $14.91_{-0.33}^{+0.42}$ | 0.71 |
| 894 | 102547.01 | -57 4651.19 | 19.09 | $4.32{ }_{-0.05}^{+0.06}$ | $4.41_{-0.15}^{+0.15}$ | $3.84{ }_{-0.17}^{+0.18}$ | $15.70_{-0.43}^{+0.54}$ | 1.49 |
| 956 | 102657.82 | -57 3616.66 | 17.39 | $4.54_{-0.08}^{+0.09}$ | $4.01_{-0.10}^{+0.10}$ | $4.44{ }_{-0.17}^{+0.19}$ | $17.05_{-0.88}^{+1.11}$ | 7.77 |
| 989 | 102734.13 | -573625.34 | 18.79 | $4.31{ }_{-0.04}^{+0.05}$ | $4.46{ }_{-0.13}^{+0.13}$ | $3.59_{-0.13}^{+0.14}$ | $15.23_{-0.39}^{+0.46}$ | 3.04 |
| 1024 | 102814.60 | -57 4136.33 | 17.24 | $4.44{ }_{-0.06}^{+0.07}$ | $3.62{ }_{-0.14}^{+0.14}$ | $4.22{ }_{-0.24}^{+0.26}$ | $16.14_{-0.61}^{+0.82}$ | 1.70 |
| 1052 | 102850.85 | -57 4556.73 | 17.63 | $4.63{ }_{-0.06}^{+0.05}$ | $3.39_{-0.12}^{+0.12}$ | $3.80{ }_{-0.17}^{+0.18}$ | $18.99_{-0.81}^{+0.61}$ | 2.77 |
| 1059 | 102856.00 | -58 0902.55 | 18.46 | $4.42_{-0.05}^{+0.07}$ | $4.42_{-0.10}^{+0.10}$ | $3.27_{-0.09}^{+0.09}$ | $16.02_{-0.53}^{+0.72}$ | 5.96 |
| Blue supergiants |  |  |  |  |  |  |  |  |
| 52 | 101440.36 | -57 2426.24 | 15.49 | $4.36{ }_{-0.05}^{+0.05}$ | $8.388_{-0.10}^{+0.10}$ | $3.77_{-0.05}^{+0.05}$ | $7.93{ }_{-0.40}^{+0.51}$ | 2.28 |
| 175 | 101642.53 | -57 3247.65 | 16.17 | $4.43{ }_{-0.06}^{+0.08}$ | $8.59_{-0.10}^{+0.10}$ | $3.77_{-0.05}^{+0.05}$ | $9.155_{-0.56}^{+0.82}$ | 1.04 |
| 188 | 101653.91 | -575502.11 | 14.26 | $4.47{ }_{-0.06}^{+0.09}$ | $6.844_{-0.09}^{+0.09}$ | $3.81{ }_{-0.06}^{+0.06}$ | $9.67_{-0.63}^{+0.99}$ | 0.25 |
| 452 | 102031.60 | -58 0308.72 | 14.95 | $4.43{ }_{-0.05}^{+0.07}$ | $7.29_{-0.10}^{+0.09}$ | $4.03_{-0.07}^{+0.07}$ | $9.51{ }_{-0.53}^{+0.77}$ | 0.91 |
| 578 | 102219.90 | -57 4611.21 | 16.51 | $4.37{ }_{-0.05}^{+0.06}$ | $8.22_{-0.10}^{+0.10}$ | $3.80{ }_{-0.05}^{+0.05}$ | $9.233_{-0.41}^{+0.54}$ | 2.32 |



Figure 16. $A_{0}$ vs. $R_{V}$ plot for the final selection with and without the objects within the 8 arcmin box surrounding Wd 2 . There modest increase in $R_{V}$ as a function of $A_{0}$ in either case with correlation coefficient $r=0.47$ and $r=0.45$ respectively. The areas shaded in grey are where we cannot detect OB stars given the survey limits.

## 6 DISCUSSION

### 6.1 The number and spatial distribution of the OB candidates

Figure 17 shows the location of each new candidate in the 2 square degrees for which the SED fit returned $\chi^{2} \leqslant 7.82$ and $\log \left(\mathrm{T}_{\text {eff }}\right) \geqslant 4.3$, over-plotted on the VPHAS $+\mathrm{H} \alpha$ mosaic. Each star is colour-coded according to its derived extinction, $A_{0}$. The 527 objects are scattered across the field, with lower reddenings $\left(A_{0}<5\right)$ dominating in the southern half. Apart from in Westerlund 2 itself, the distribution is sparser and more highly-reddened in the north. Towards the NW and the tangent direction, roughly at RA 10h11m, Dec -56 14 (J2000) (Dame 2007), the most reddened objects $\left(A_{0}>8\right)$ are found.

489 of the objects shown have not been identified previously as confirmed or candidate OB stars. Previous works by Reed (2003), and by Kaltcheva \& Golev (2012) have noted a further 26 stars earlier than B3 within this region - all of which are brighter than $V=11$, and therefore not in our sample. Also for reasons of brightness, our sample does not include any stars obviously associated with IC 2581. Turner (1978) studied the cluster - home to a number of early B stars - establishing a distance of 2.87 kpc , and a typical reddening corresponding to $A_{0} \sim 1.5$. For the present selection, this cluster is too close and too lowly-reddened: a B3 main sequence star with $A_{0}=1.5$ needs to be at a distance of 3.8 kpc to achieve $g=13$. The one star that has been uncovered close to IC 2581 is a candidate sub-luminous object, likely to be at a much shorter distance and unconnected to IC 2581. It can be seen in Figure 16 that $A_{0}=1.9$ for the least reddened candidate OB star in the sample.

It has been argued before by e.g. Grabelsky et al. (1988) and Dame (2007) that the Carina Arm tangent region traced in CO spans the distance range from 3 to 5 kpc . At larger distances the conical volume captured here reaches beyond
the Solar Circle where declining amounts of molecular gas are detected. Taking note of these considerations, it seems likely that the high values of $R_{V}$, trending from 3.6 to 3.9 , revealed by our SED fits (Figure 16) are largely a product of the dominant and increasing contribution to the total extinction from the dust column of the Carina Arm. Similarly Povich et al. (2011) found it necessary to adopt $R_{V}=4$ for embedded Carina Arm objects at $l \sim 287^{\circ}$. In contrast, Turner (1978) determined $R_{V}$ to be $3.11 \pm 0.18$ across this region, based on bright OB stars with extinctions below $A_{V}$ of 2 - clearly the foreground to our sample. Indeed it seems likely that much of the extinction of the OB population spanning $A_{0} \sim 2$ to $A_{0} \sim 9$ accumulates within the Carina Arm. The appearance of Figure 14 indicates few detected main sequence OB stars beyond a distance modulus of $14(6 \mathrm{kpc})$.

### 6.2 Westerlund 2

Figures 12 and 16 tell us that a single value of $R_{V}$ cannot be used to describe the extinction law of sight lines towards all objects in Wd 2. Instead we find that $R_{V}$ ranges from approximately 3.5 to 4.5 within the cluster. Similar spreads in $R_{V}$ within star clusters has previously been found by Fitzpatrick \& Massa (2007) and highlights the importance of deriving $R_{V}$ on a star-by-star basis. Hur et al. (2015) describe a hybrid extinction model with $R_{V}=3.33 \pm 0.03$ to $A_{0} \sim 3$ (based on three stars), while $R_{V}=4.14 \pm 0.08$ is required for stars in Wd 2. Figure 16 cautions against this clear-cut interpretation, even while our results are numerically consistent with theirs. Reality is more fractal and it is best not to place too much weight on small numbers of stars.

In Figure 12 we noticed a tight distribution in $A_{0}$ for the objects close to Wd 2 as projected on the sky. While there are no new OB star candidates in the central region of


Table 8. The reddening parameters and angular separation from the centre of Wd 2 (RA 102418.5 DEC -57 4532.3 (J2000)) of new O star candidates with similar reddening to the cluster, outside the 8 arcmin box shown in figure 17 All objects have $\log \left(\mathrm{T}_{\mathrm{eff}}\right)>4.477$ and $5.8>A_{0}>7.2$. See Tables 5 and 6 for the full set of data.

| ID | $g$ | $A_{0}$ | Separation <br> (arcmin) |
| :---: | :---: | :---: | :--- |
| 44 | 16.62 | $6.88_{-0.09}^{+0.07}$ | 80.21 |
| 121 | 14.28 | $6.21_{-0.08}^{+0.06}$ | 70.59 |
| 191 | 17.43 | $6.05_{-0.09}^{+0.09}$ | 64.98 |
| 144 | 16.94 | $6.13_{-0.09}^{+0.07}$ | 68.46 |
| 161 | 19.28 | $7.11_{-0.12}^{+0.07}$ | 62.73 |
| 346 | 16.60 | $6.76_{-0.09}^{+0.07}$ | 46.51 |
| 413 | 17.06 | $6.83_{-0.06}^{+0.05}$ | 36.42 |
| 576 | 15.40 | $6.42_{-0.07}^{+0.05}$ | 23.13 |
| 916 | 15.01 | $6.19_{-0.07}^{+0.05}$ | 19.67 |
| 646 | 15.58 | $6.69_{-0.08}^{+0.06}$ | 12.60 |
| 796 | 16.37 | $7.03_{-0.07}^{+0.05}$ | 12.50 |
| 662 | 15.33 | $6.30_{-0.06}^{+0.05}$ | 12.06 |
| 846 | 16.82 | $6.39_{-0.05}^{+0.04}$ | 6.03 |
| 661 | 17.21 | $6.81_{-0.05}^{+0.04}$ | 5.05 |

Wd 2 (within the 8 arcmin box shown in fig 17), there are a handful of probable O stars scattered across the field that share its extinction. All objects that have extinctions consistent to within $1 \sigma$ of the mean of known objects in Wd 2 ( $5.8>A_{0}>7.2$ ) and have $\log \left(\mathrm{T}_{\text {eff }}\right)>4.477$ are identified in Table 8 . It is possible that these have been ejected from Wd 2 by dynamical interactions or after supernova explosions in binary systems (Allen \& Poveda 1971, Gies \& Bolton|1986). Given a derived distance of $\sim 5 \mathrm{kpc}$ to Wd 2 , an object that is separated from the cluster by $\sim 20$ arcmin on the sky would have to have travelled a minimum distance of $\sim 30$ pc in $1-2$ Myr. This would equate to a minimum (plane-ofsky) velocity of $\sim 25 \mathrm{~km} / \mathrm{s}$. Given that massive stars can attain runaway velocities of up to $\sim 200 \mathrm{~km} / \mathrm{s}$ through dynamical encounters between binary systems Gvaramadze et al. 2010), it is not unreasonable to consider that these objects have been ejected recently from Wd 2. Alternatively these stars may have formed in situ within the wider star forming region on a similar time scale to the cluster. Low resolution spectroscopy of object \#916 and \#646 suggests their spectral types may be early as O3-O4 (Mohr-Smith et al in prep). Their positions are marked on Figure 17

As a final point of interest, we note that the more reddened cluster DBS2003 45, picked out in figure 17 as well, also appears to be surrounded by a scatter of OB stars that are reddened similarly to the cluster.

### 6.3 Candidate blue supergiants and sub-luminous stars

The results from Section 5.3 suggest the presence of 5 high luminosity B stars scattered across the field. If they are early-B supergiants, their absolute visual magnitudes would be in the region of $\sim-6.5$ (Crowther et al. 2006). On
correcting the previous main-sequence assumption, we find their derived distance moduli, $\mu$, rise from $\sim 9$ to $\sim 13.5$, placing them amongst the general OB population that we pick out. Meylan \& Maeder (1983) estimate a surface density of around 10-20 blue supergiants (BSGs) per $\mathrm{kpc}^{2}$ in the Galactic Plane. Assuming that our selection spans distances from 2-6 kpc we are sampling a projected disk surface area of a little over $1 \mathrm{kpc}^{2}$; so finding 5 candidates undershoots the surface density prediction but not to the extent that it can be claimed to be inconsistent with it. Given that these candidates are affected by saturation in the $i$ band ( $i \lesssim 12$ ), there may one or two BSGs that have fallen into the 'poorfit' group due to saturation in one or more bands.

We also find evidence for the presence of a population of subdwarf stars (see table 7 and figure 14. Of these 9 may be sdO stars, leaving 23 in the sdB category. The absolute magnitudes of the latter range from $M_{V}=3-6$ (Stark \& Wade 2003). Since these objects are $\sim 6 \mathrm{mag}$ fainter than their main-sequence counterparts, their distance moduli are likely to be $\sim 10$ as opposed to the estimated values of $\sim 16$. This behaviour and the spatial scattering of the subdwarf candidates suggests that we are looking at a group of moderately reddened $A_{0} \sim 4$ stars in the foreground of the main OB population. We are biased to select more highly reddened subdwarf stars due to the 2MASS faint limit as discussed in Section 5.1.2 If this limit was not in place we would expect to find more lowly reddened sdB stars in the selection.

Although the SED-fitting we have performed has no sensitivity to surface gravities and limited sensitivity to stellar effective temperature, the fact that the Carina Arm region studied falls near the tangent has allowed us to pick out the extreme objects purely from their outlying distance moduli - relative to the near MS stars concentrated in the range $11<\mu<14$. While this approach works here, it is evident that in other sight-lines, where the population of OB stars may be spread more uniformly across a larger distance range, the luminosity extremes would not stand out in the same way.

## 7 CONCLUSIONS

In summary, we have demonstrated a method for selecting and parametrizing the reddening and basic stellar properties of OB stars uniformly across large areas of the Southern sky using VPHAS+, and NIR survey data. The selection presented here has resulted in reddening parameters for 848 O and B stars (see table 4). Of these, 489 are well-fit new OB stars hotter than 20000 K , including 74 probable O stars. This has been achieved by reaching down to $g=20 \mathrm{mag}$ and approaches a factor of 10 increase relative to the small number of known and candidate O to B 2 stars in the region.

By bringing together VPHAS+ $u, g, r, i$ photometry with NIR 2MASS photometry, we are able to determine both the value of the extinction, $A_{0}$, and test and select the most appropriate reddening law, as parametrised by $R_{V}$, to a high degree of accuracy: both are typically measured to better than 0.1 (magnitudes in the case of $A_{0}$ ). Pleasingly there are signs that the still preliminary nature of the photometric calibration of the VPHAS+ survey data blends well with the now well-established 2MASS calibration.

We set out expecting to only gain a crude impression of
stellar effective temperatures (and hence distance moduli), and so it has turned out. But we have found a satisfying consistency with earlier results in our benchmark region around the much-studied cluster Westerlund 2, confirming that our methods are sound and able to e.g distinguish early O stars from late-O and early-B stars. This represents an efficient start to selection that needs to be followed up by spectroscopic confirmation and measurement of stellar parameters. With precise spectroscopic parameters in hand, the photometry can be re-used for direct and even more precise measurement of reddening laws.

We have also seen how the high resolution and wide field of view of OmegaCam can bring a wider context to the study of open clusters and OB associations, through an ability to identify potentially-related stars that have either been ejected from clusters or simply have formed - perhaps as part of a wider star-formation event - in relative isolation in the surrounding field. This study has also uncovered 5 BSG candidates as well as 32 reddened candidate subdwarfs of which 9 may be sdO stars.

In the future, we aim to roll out this method to support the complete characterisation of the massive-star population and the patterns of extinction they can reveal across the entire Southern Galactic mid-plane to distances of $\sim 5 \mathrm{kpc}$ or more. Garmany et al. (1982) were able to claim a volumelimited census to $\sim 2.5 \mathrm{kpc} 3$ decades ago - now it should be possible to expand the effective volume by a factor of 4 or so, with the difference this time that Gaia parallaxes as they appear will bestow a confidence as to what the volume limits actually are.

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## REFERENCES

Allen C., Poveda A., 1971, Astrophysics and Space Science, 13, 350
Ascenso J., Alves J., Beletsky Y., Lago M. T. V. T., 2007, A\&A, 466, 137

Astropy Collaboration et al., 2013, A\&A, 558, A33
Bertelli G., Bressan A., Chiosi C., Fagotto F., Nasi E., 1994, A\&AS, 106, 275
Bestenlehner J. M. et al., 2011, A\&A, 530, L14
Bressan A., Marigo P., Girardi L., Salasnich B., Dal Cero C., Rubele S., Nanni A., 2012, MNRAS, 427, 127
Cardelli J. A., Clayton G. C., Mathis J. S., 1989, ApJ, 345, 245
Carmona A., van den Ancker M. E., Audard M., Henning T.,
Setiawan J., Rodmann J., 2010, A\&A, 517, A67
Carraro G., Turner D., Majaess D., Baume G., 2012, ArXiv eprints
Crowther P. A., Lennon D. J., Walborn N. R., 2006, A\&A, 446, 279
Dachs J., Kiehling R., Engels D., 1988, A\&A, 194, 167
Dame T. M., 2007, ApJL, 665, L163
de Bruijne J. H. J., 2012, Astrophysics and Space Science, 341, 31
de Wit W. J., Testi L., Palla F., Zinnecker H., 2005, A\&A, 437, 247
Draine B. T., 2003, ARA\&A, 41, 241
Drew J. E. et al., 2014, MNRAS, 440, 2036
Dutra C. M., Bica E., Soares J., Barbuy B., 2003, A\&A, 400, 533
Fitzpatrick E. L., Massa D., 2007, ApJ, 663, 320
Foreman-Mackey D., Hogg D. W., Lang D., Goodman J., 2013, PASP, 125, 306
Garmany C. D., Conti P. S., Chiosi C., 1982, ApJ, 263, 777
Gies D. R., Bolton C. T., 1986, ApJS, 61, 419
Grabelsky D. A., Cohen R. S., Bronfman L., Thaddeus P., 1988, ApJ, 331, 181
Gvaramadze V. V., Gualandris A., Portegies Zwart S., 2010,
in IAU Symposium, Vol. 266, IAU Symposium, de Grijs R.,
Lépine J. R. D., eds., pp. 413-416
Hur H., Park B.-G., Sung H., Bessell M. S., Lim B., Chun M.-Y., Sohn S. T., 2015, MNRAS, 446, 3797
Johnson H. L., Morgan W. W., 1953a, ApJ, 117, 313
Johnson H. L., Morgan W. W., 1953b, ApJ, 117, 313
Kaltcheva N. T., Golev V. K., 2012, PASP, 124, 128
Langer N., 2012, ARA\&A, 50, 107
Maíz-Apellániz J., Walborn N. R., Galué H. Á., Wei L. H., 2004, ApJS, 151, 103
Martins F., Schaerer D., Hillier D. J., 2005, A\&A, 436, 1049
Meylan G., Maeder A., 1983, A\&A, 124, 84
Moffat A. F. J., Shara M. M., Potter M., 1991, AJ, 102, 642
Parker R. J., Goodwin S. P., 2007, MNRAS, 380, 1271
Portegies Zwart S. F., McMillan S. L. W., Gieles M., 2010, ARA\&A, 48, 431
Povich M. S. et al., 2011, ApJS, 194, 6
Rahman M., Murray N., 2010, ApJ, 719, 1104
Rauw G., Manfroid J., Gosset E., Nazé Y., Sana H., De Becker
M., Foellmi C., Moffat A. F. J., 2007, A\&A, 463, 981

Rauw G., Sana H., Nazé Y., 2011, A\&A, 535, A40
Reed B. C., 2000, AJ, 120, 314
Reed B. C., 2003, AJ, 125, 2531
Rucinski S. M., 1992, AJ, 104, 1968
Russeil D., 2003, A\&A, 397, 133
Skrutskie M. F. et al., 2006, AJ, 131, 1163
Smartt S. J., 2009, ARA\&A, 47, 63
Smolčić V. et al., 2004, ApJL, 615, L141
Stark A. A., Lee Y., 2005, ApJL, 619, L159
Stark M. A., Wade R. A., 2003, AJ, 126, 1455
Taylor M. B., 2005, in Astronomical Society of the Pacific Conference Series, Vol. 347, Astronomical Data Analysis Software and Systems XIV, Shopbell P., Britton M., Ebert R., eds., p. 29
Tsujimoto M. et al., 2007, ApJ, 665, 719
Turner D. G., 1978, AJ, 83, 1081
Vallée J. P., 2008, AJ, 135, 1301
Vallée J. P., 2014, AJ, 148, 5

Vargas Álvarez C. A., Kobulnicky H. A., Bradley D. R., Kannappan S. J., Norris M. A., Cool R. J., Miller B. P., 2013, AJ, 145, 125
Wenger M. et al., 2000, A\&AS, 143, 9
Zhu Q., Davies B., Figer D. F., Trombley C., 2009, ApJ, 702, 929
Zinnecker H., Yorke H. W., 2007, ARA\&A, 45, 481
Zorec J., Briot D., 1991, A\&A, 245, 150


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[^1]:    ${ }^{1} \mathrm{http}: / /$ stev.oapd.inaf.it/cgi-bin/cmd

[^2]:    2 https://www.sdss3.org/dr8/algorithms/sdssUBVRITransform.php

