A Method for Selecting M dwarfs with an Increased Likelihood of Unresolved Ultra-cool Companionship

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ABSTRACT
Locating ultra-cool companions to M dwarfs is important for constraining low-mass formation models, the measurement of sub-stellar dynamical masses and radii, and for testing ultra-cool evolutionary models. We present an optimised method for identifying M dwarfs which may have unresolved ultra-cool companions. We construct a catalogue of 440,694 M dwarf candidates, from WISE, 2MASS and SDSS, based on optical and near-infrared colours and reduced proper motion. With strict reddening, photometric and quality constraints we isolate a sub-sample of 36,898 M dwarfs and search for possible mid-infrared M dwarf + ultra-cool dwarf candidates by comparing M dwarfs which have similar optical/near-infrared colours (chosen for their sensitivity to effective temperature and metallicity). We present 1,082 M dwarf + ultra-cool dwarf candidates for follow-up. Using simulated ultra-cool dwarf companions to M dwarfs, we estimate that the occurrence of unresolved ultra-cool companions amongst our M dwarf + ultra-cool dwarf candidates should be at least four times the average for our full M dwarf catalogue. We discuss possible contamination and bias and predict yields of candidates based on our simulations.

Key words: stars: low-mass - stars: binaries - stars: brown dwarfs - infrared: stars - planets and satellites: detection

1 INTRODUCTION

The ultra-cool (\(T_{\text{eff}} < 2500\) K, >M7) field population has been greatly expanded over the last 15 years using large-scale red and infrared surveys; The Two Micron All-Sky Survey (2MASS, Skrutskie et al. 2006), The Sloan Digital Sky Survey (SDSS, York et al. 2000), The UKIRT Infrared Deep Sky Survey (UKIDSS, Lawrence et al. 2007), The Visible and Infrared Survey Telescope for Astronomy (VISTA, Emerson & Sutherland 2002) and The Wide-Field Infrared Survey Explorer (WISE, Wright et al. 2010). Evolutionary cooling means the masses of these sources are age-sensitive, ranging from old low-mass stars through younger brown dwarfs (e.g. in Nakajima et al. 1995, Delfosse et al. 1997, Burgasser et al. 1999, Kirkpatrick et al. 1999, Pinfield et al. 2003, Burgasser et al. 2004, Leggett et al. 2010, and Kirkpatrick et al. 2011) and down into the planetary regime (e.g. in Lucas et al. 2006, Caballero et al. 2007, Luhman & Muench 2008, Marsh et al. 2010, Lodieu et al. 2011, Delorme et al. 2012, and Scholz et al. 2012).

Ultra-cool dwarfs (UCDs) can be extremely informative. Statistical studies of UCD companions aid the theoretical study of low-mass star formation and provide constraints on the initial mass function (Parker & Reggiani 2013; Chabrier et al. 2014). Specifically, companion statistics can be used to decide between different formation processes. For wide binaries, e.g., it is difficult

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to explain formation via dynamical processes or disc fragmentation with such systems possibly forming via early stage core fragmentation (Chabrier et al. 2014). There is also a lack of 10 to 100 Jupiter mass companions (the brown dwarf desert) in separation ranges covered by radial velocity surveys. Observationally, the frequency of companions increases for planetary-mass objects but decreases for objects with larger mass (Howard et al. 2010). Giant planets are also less frequent around lower-mass stars than higher mass stars (Johnson et al. 2010) whereas, in the same separation range, brown dwarf companions become more frequent around low-mass stars and other brown dwarfs (Joergens 2008).

Ultra-cool companions are also useful as benchmark sources to test structure and atmospheric evolutionary models (Pinfield et al. 2006). Companions where physical parameters can be directly measured can be used for testing atmospheres and structure models of both the primaries and companions (Baraffe et al. 2003; Burrows et al. 2011; Luhman et al. 2012; Allard et al. 2012; Saumon et al. 2012). Companion properties such as age and composition can generally be inferred from the primary star (Leggett et al., 2010), and mass and radius constraints can come from radial velocity and light curve studies over multiple orbital periods (e.g. Agol et al. 2005; Cumming et al. 2008; Jones et al. 2015), via astrometry (e.g. with Gaia, de Bruijne 2012), or via adaptive optics (e.g. Dupuy et al. 2010).

Unresolved companions have been identified using a variety of observational techniques. High contrast systems are generally revealed through radial velocity variability, with much lower contrast systems (e.g. late M dwarf+UCD or UCD+UCD systems Burgasser et al. 2006, 2010; and Bardage Galgliufl et al. 2013, 2015) more amenable to spectroscopic and photometric study (e.g. in Reid & Mahoney 2000, Reid et al. 2001, Oppenheimer et al. 2001, Nidever et al. 2002, Pinfield et al. 2003, Burgasser et al. 2003, Close et al. 2003, Reiners 2004, Burgasser & McElwain 2006, Joergens 2008, Luhman et al. 2012, and Todorov et al. 2014).

Low number statistics and observational bias make it difficult to robustly constrain the M dwarf companion fraction with varying mass-ratio and separation. It is clear however, that for separations of ≤ 100 AU the M dwarf+UCD companion fraction is at the level of approximately one per cent (i.e. 2-4 per cent, via Adaptive optics; Neuhäuser & Guenther 2004; 0-2 per cent, 0.001<σ<0.01 AU, Reid & Mahoney 2000; 1-3 per cent, 10<σ<100 AU Oppenheimer et al. 2001; 1 per cent, 0.1<σ<1 AU, Nidever et al. 2002; and 1 per cent, 1.0<σ<10.0 AU Nidever et al. 2002, where σ is separation).

In this paper we present a new photometric method which aims to provide significant benefits to targeted searches for unresolved UCD companions to M dwarfs. We take advantage of the extensive multi-band photometry (optical to mid-infrared) available by combining the WISE, 2MASS and SDSS surveys, and the large M dwarf sample size this reveals (Section 2). By constructing a large catalogue of well measured M dwarfs in un-reddened regions of the sky, we isolate a sample which can be searched for mid-infrared outliers within a multi-colour parameter-space. We then optimise a method to search for such outliers, which could be due to unresolved UCD companions, by carefully minimising the colour variation expected from effective temperature and metallicity differences. We interpret our results via simulations, by artificially injecting an unresolved companion population into our sample, and assessing the increased likelihood of such systems appearing in different regions of the multi-colour parameter-space. This allows us to select a sample of M dwarfs with significantly increased potential for unresolved UCD companionship (Section 3). We present our candidates, discuss possible contamination and bias, and predict yields and the expected companion spectral type distribution based on our simulations. We summarise our results and discuss planned follow-up in Section 4.

2 CATALOGUE SELECTION

As a foundation for our analysis procedures, we construct a catalogue of M dwarf candidates with high quality WISE/2MASS/SDSS photometry. We chose not to use SDSS u band (0.3551 μm) due to its increased uncertainties (Padmanabhan et al. 2008), and chose not to use the WISE W3 and W4 bands due to the greatly reduced sensitivity (Magnitude limit at 5σ of 11.40 for the 12 μm, W3 band, and 7.97 and for the 22 μm, W4 band; Wright et al. 2010) as we would not have detections for many of our M dwarf candidates.

2.1 Initial colour and photometric cuts

We began by downloading all 563,921,603 sources in the WISE All-Sky catalogue, of which 280,909,458 had 2MASS counterparts within three arcsec. Table 1 summarises the multi-band photometric sensitivity limits that we used when selecting sources from these surveys. We applied near-infrared colour cuts to help remove contaminating giants and earlier spectral type stars from our sample. We made use of the J − H and H − Ks colour constraints from Lépine & Gaidos (2011, hereafter LG11). After these initial cuts 57,510,435 sources remained.

We then cross-matched the catalogue with The Tenth Data Release of SDSS5 (Ahn et al. 2012, SDSS DR10). Of the 57 million sources, 9,944,123 sources had SDSS photometry and were flagged as stars (type = 6 in DR10 PhotoObjAll). Using the g − r to V − g transformation3 of Jordi et al. (2006), we were able to calculate an estimate of the V band magnitudes. This enabled a spectral type estimation via V − J (see equation 12; Lépine et al. 2013). We removed all sources which have an estimated spectral type early than ~M3.5 (equivalent to a V − J > 4.0, see Section 3.3). This is a slightly redder cut than (LG11, which aimed to remove stars earlier than K7 dwarfs with V − J > 2.7). This left 1,352,931 sources with estimated spectral type M3.5 or later.

To reduce the number of sources which had poor photometry we used basic accuracy cuts of 0.1 in the uncertainties of V, J, H, K, W1 and W2. This left a total of 704,723 sources. We impose more strict photometric requirements for the excess analysis in Section 3.1.

2.2 Reduced proper motion

Reliable, accurate proper motions (μ) allows the separation of dwarf stars from background stars and galaxies through reduced proper motion. We therefore cross-matched our sample with the Position and Proper Motion Extended-L1 catalogue (Roezer et al. 2010, PPMLX). A total of 691,421 of the 704,723 sources had proper motion measurements thus we decided not to use any additional proper motion catalogues. Any sources without proper motions in PPMLX were rejected as possible contaminants. We selected only sources whose proper motion uncertainties were <25 per cent (4σμ) of the measured value. Of those sources with proper motion, 464,655 met

3 Access to data releases via http://irsa.ipac.caltech.edu
2 Access via http://skyserv.sdsu3.org/CasJobs/
3 SDSS photometric transformations available via https://www.sdss3.org/dr8/algorithm/ sdssUBVRITransform.php
the 4σa cut. Reduced proper motion, $H_V = V + 5 \log(\mu) + 5$, was then calculated and possible contamination rejected following the same approach as LG11 ($H_V > 2.2(V - J) + 2.0$). This offers a good balance between contamination rejection and M dwarf retention. LG11 estimated associated M dwarf rejection rates of no more than 1.1 per cent. After the reduced proper motion cut we were left with 450,440 M dwarf candidates. We used the 2MASS proximity flag ($prox$), to make sure none of our M dwarfs had another 2MASS counterpart within six arcsec. This avoids source blending which can affect photometric accuracy. This left a total of 440,694 sources in our full catalogue of M dwarf candidates.

2.3 Catalogue properties

The comparison in $J$ magnitude and the spectral type comparison can be seen in Figure 1. Our M dwarf candidates compliment other catalogues of M dwarfs, including M dwarf catalogues from Gliese & Jahreiß (1991); West et al. (2011), LG11, Frith et al. (2013) and Theissen et al. (2015). Our catalogue is not a continuation of the Frith et al. (2013) nor LG11 catalogue due to our use of the SDSS sky. Our catalogue dominates numerically in the magnitude range $J=10$–15.5, but does not go as deep as the West et al. (2011) spectroscopic catalogue.

We estimated distances using the Bochanski et al. (2010) $M_R$ fits to $r - z$ and $r - i$. Note these were only used for comparison purposes in Figure 2. The bulk of our M dwarf candidates lie between 100 and 200 pc consistent with M dwarfs of spectral type M3 to M5.

2.4 Sources of contamination and bias

We expect our M dwarf candidate catalogue to contain non-Mdwarf contamination for two main reasons. Scatter in the $V - J$ colours will lead to the inclusion of some earlier types ($<$M3). These will be mostly early M dwarfs but could include some F, G and K stars. Reduced proper motion uncertainty is also expected to lead to a low level of giant contamination as previously discussed.

To assess the contamination levels we cross-matched our full M dwarf candidate catalogue with the Set of Identifications, Measurements and Bibliography for Astronomical Data (SIMBAD) catalogue (cross-matched to three arcsec). In total there were 20,286 matches with our full M dwarf candidate catalogue. Of these 7,360 had spectral types from SIMBAD. From this we gauge our contamination from early (FGK) stars, M giants, and white dwarfs. The full catalogue has ~1.3 per cent contamination from these sources (see Appendix A). It should however be noted some of the spectral types carry little information, e.g. only as an M-type star (~1.4 per cent), and thus we may slightly underestimate our contamination from sources such as M giants. SIMBAD also shows a bias toward the brighter stars in our sample, thus our fainter catalogue may contain more contamination from fainter sources. In our full M dwarf candidate catalogue we find thirteen (~0.2 per cent) white dwarfs.

\begin{table}
\centering
\begin{tabular}{l c c c c}
Survey & Band & Wavelength & PSF-FWHM & Magnitude-limit (5\%) & Notes \\
& & $\mu$m & arcsec & mag & \\
\hline
SDSS & $g$ & 0.4686 & 1.3 & 22.2 & a \\
SDSS & $r$ & 0.6165 & 1.3 & 22.2 & a \\
SDSS & $i$ & 0.7481 & 1.3 & 21.3 & a \\
SDSS & $z$ & 0.8931 & 1.3 & 20.5 & a \\
2MASS & $J$ & 1.25 & 2.9 & 16.55 & b \\
2MASS & $H$ & 1.65 & 2.8 & 15.85 & b \\
2MASS & $K_S$ & 2.16 & 2.9 & 15.05 & b \\
WISE & W1 & 3.4 & 6.1 & 16.5 & c \\
WISE & W2 & 4.6 & 6.4 & 15.5 & c \\
\end{tabular}
\caption{Summary of SDSS (Ahn et al. 2012), 2MASS protect (Skrutskie et al. 2006) and WISE (Wright et al. 2010) photometric bands used in our selection process.}
\end{table}
are cool enough to be selected by our initial selection process. We also find twenty-two (∼0.3 per cent) of our M dwarf candidates have white dwarf companions, twenty (∼0.3 per cent) are known M+M binaries, and one is a known M+L binary.

We also used our SIMBAD cross-match to count the source classifications given and grouped them by type (see Appendix A). From this we gauge our contamination from sources classified as galaxies, variable stars and white dwarfs as ∼2.7 per cent for our full M dwarf candidate catalogue. It is also interesting to note we find 1.7 per cent of our excess sample are classified as known multiple or binary systems. As with spectral type some of the source classifications carry little information (i.e. classified only as being stars or as being in an association or a cluster) therefore we also take this contamination as a rough estimate.

We obtain additional optical spectral types by exploring data from LAMOST and we repeated this exercise with the LAMOST DR1 and DR2 catalogue spectral types (again cross-matched to three arcsec). In total there were 9,262 sources with spectral types in our full M dwarf candidate catalogue. From this we gauge our contamination from early-than-M stars and white dwarfs. The full catalogue has ∼9.6 per cent contamination from these sources, (see Appendix A), however it should be noted LAMOST does not distinguish between giants and dwarfs nor between spectral types of the double stars thus our contaminations are a rough estimate. In our full M dwarf candidate catalogue we find 8 (∼0.1 per cent) white dwarfs are cool enough to be selected by our initial selection process.

3 SELECTING M DWARFS WITH MID-INFRARED EXCESS

3.1 Catalogue sub-sample for excess studies

To facilitate our search for M dwarfs with mid-infrared excess we identified a sub-sample from within our M dwarf catalogue, using more stringent and additional constraints (hereinafter the ‘excess sample’). Our colour excess signal could be confused with interstellar reddening and/or photometric uncertainty, thus we aim to minimise their contribution. With an estimated three per cent excess from an unresolved companion (see Section 3.3) we require all uncertainties to be less than this level. Reddening and photometric uncertainty cuts were designed to achieve or better this requirement, while maintaining a sufficiently high number of candidate M dwarfs.

To enable reddening cuts we obtained extinction information from dust maps (Schlegel et al. 1998), and updated the extinctions using Schlafly & Finkbeiner (2011). We required little to no reddening, comparable to the uncertainties in the photometric data and reddening in \( J - W1 \), \( J - W2 \), \( H - W1 \), and \( H - W2 \), (i.e. \( E(J - W1) \), \( E(J - W2) \), \( E(H - W1) \), and \( E(H - W2) \) re-
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Figure 2. Distribution in estimated spectral type - distance space. Spectral types from Lépine et al. (2013)'s fit to V − J. Distance was estimated using Bochanski et al. (2010)'s $M_R$ fits to $r - z$ and $r - i$ (averaged).

Figure 3. A proper motion vector-point-diagram showing the overall distribution of M dwarfs in our catalogue as well as our candidate M+UCDs. Distributions are skewed towards the bottom left due to SDSS being a northern hemisphere survey, and in the candidates case being localised around the northern galactic cap. Excess candidates are all within 300 mas yr$^{-1}$ due to the catalogue cross-matching radius selected.

- were not flagged$^6$ as using photometry from bad images (using the PEAKCENTER, NOTCHECKED and DEBLEND_NOPEAK; 439,641, 429,979 and 419,436 sources respectively in the full M dwarf candidate catalogue)
- were not flagged$^6$ as having photometry from images containing saturated pixels (SATURATED; 416,889 sources in the full M dwarf candidate catalogue)
- were not flagged$^6$ as having more than 20 per cent of the point spread function flux interpolated (using the PSF_FLUX_INTERP flag; 380, 868 sources in the full M dwarf candidate catalogue)

Combining all of these cuts left 36,898 M dwarf candidates in our excess sample. These cuts effectively remove the galactic plane from our excess sample (one is within galactic latitude of ±15$^\circ$ and 255, 0.7 per cent, are within galactic latitude of ±20$^\circ$).

3.2 Simulating photometry

Although M dwarf colours are intrinsically scattered at some level$^7$, the effects of adding an unresolved binary companion may be well determined. As a tool in our analysis we thus simulated M dwarf and UCD photometry which we used to interpret the observational parameter-space of the excess sample. For M dwarfs we constructed a probabilistic fitting routine (see Appendix C) which we applied to an M dwarf sample constructed using the following catalogues: The Spectroscopic Catalog

\[^5\] The ‘score’ is a number between zero and one rating the quality of an SDSS image field, see http://www.sdss3.org/dr10/ algorithms/resolve.php
\[^6\] We chose which SDSS flags to use by assessing the quality flags for photometric outliers in our sample. Detailed information on these flags can be found at https://www.sdss3.org/dr9/algorithms/photo_flags.php.
\[^7\] M dwarf colours may be intrinsically scattered by many factors including differences in temperature, surface gravity and composition, e.g. in Burrows et al. (1997); rotation, e.g. in McQuillan et al. (2014); and activity, e.g. in Robertson et al. (2013).
of The 1,564 Brightest (J<9) M-dwarf Candidates in the Northern Sky\(^8\) (selected from the SUPERBLINK proper-motion catalogue; Lépine et al. 2013), The Database of Ultra-cool Parallaxes\(^9\) (from Dupuy & Liu 2012), and The Preliminary Version of the Third Catalog of Nearby Stars (Gliese & Jahreiß 1991). We thus determined relationships between \(M_J\) and infrared colours that led to synthetic absolute magnitudes in the \(J\), \(H\), \(K\), \(W1\), and \(W2\) bands. In addition we used the synthesised colour-colour relations from Covey et al. (2007) to generate SDSS magnitudes, making use of cubic spline fits for spectral types M0.5, M1.5, M3.5, M4.5, M5.5 (See Table 3 from Covey et al. 2007).

For the UCDs we combined absolute magnitudes and colours from Hawley et al. (2002); Chiu et al. (2006) and Dupuy & Liu (2012), and used our probabilistic fitting routine to determine the full range of UCD optical-infrared magnitudes (see Table C2 for relationships not taken directly from Dupuy & Liu 2012).

3.3 Choosing the optimal photometric colours

To optimise the photometric analysis of our excess sample we used our simulated M dwarf and UCD photometry to synthesis the expected changes in colour due to the presence of unresolved UCD companions, as well as the expected changes in colour due to spectral type variation. Our full results are shown in Appendix C (Figures C.3 and C.4) with a representative plot shown in Figure 4. This plot shows the colour excess due to a companion (companion sensitivity), against the change in primary colour for delta-spectral-type=1.0 (primary sensitivity). The results were averaged for L0-L4 companions and for M3-M6 primaries. Using this plot as a guide we selected two categories of colour. We defined ‘companion sensitive’ (CS) colours as those that are sensitive to the presence of unresolved UCD companions but are insensitive to variations in primary spectral type. We also defined ‘primary sensitive’ (PS) colours as those that are sensitive to changes in the primary spectral type, but are insensitive to

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\(^8\) Accessed on-line at http://heasarc.gsfc.nasa.gov/W3Browse/all/bnmdspecat.html

\(^9\) Accessed on-line at https://www.cfa.harvard.edu/~tdupuy/plx/Database_of_Ultracool_Parallaxes.html
the presence of unresolved UCD companions. In addition we also considered sensitivity to metallicity when selecting PS colours (see West et al. 2011 and Newton et al. 2014), even when there was little sensitivity to spectral type.

Our final selection of CS colours are shown in yellow in Figure 4. They all have primary sensitivity below 0.1 mag, and companion sensitivity above 0.03 mag. Our selected PS colours are shown in green, and all have secondary sensitivity below 0.01 mag. The \((r - i)\) and \((g - i)\) colours have good sensitivity to spectral type, while \((g - r)\) is sensitive to metallicity (West et al. 2011).

3.4 Identifying excess using multi-colour parameter space

In order to estimate the mid-infrared excess of the candidate M dwarfs in our excess sample we defined a three-dimensional colour parameter-space using the chosen PS colours \((g - r)\), \((r - i)\) and \((g - i)\). For each candidate M dwarf (target M dwarf) in our excess sample we then defined a sub-volume within this PS colour-space, centred on the target M dwarf colours and with a size of \(\pm 0.01\) in each colour (see Figure 5). We then established ‘no companion’ comparison colours for each candidate by selecting all excess sample members within a target M dwarf’s PS colour sub-volume, and measured the mean CS colours in this volume. This approach assumes that the vast majority of the excess sample are M dwarfs without UCD companions, and thus the ‘no companion’ comparison colours should provide a good zero excess reference from which the mid-infrared excess of target M dwarfs can be estimated.

We required at least 20 comparison objects in a target M dwarf’s PS colour sub-volume (this was the case for 22,579 members of the excess sample), and measured the mid-infrared excess using the most sensitive of our CS colours \((J - W2)\). The resulting excess distribution is shown in Figures 6 and 7, against \(V - J\) (a proxy for spectral type).

The excess distribution will be discussed further in Section 3.5, and Figure 7 also shows the selection contours that will be discussed in Section 3.6. The excess distribution of the sample lies generally in the range \(-0.15\) to \(+0.15\), and as we will see (Section 3.6) the excess values of M dwarfs with L dwarf companions lie at the upper end of this range (see also the L dwarf excess vectors shown in Figure 7 as a guide). We note that these are significantly lower excess levels than have been previously analysed in the context of M dwarf disc excess. Several studies (Esplin et al. 2014; Theissen & West 2014; Luhman & Mamajek 2012) have identified M dwarfs that may have discs, by selecting those with mid-infrared excess values of \(\sim 1\) or greater. These studies probe excess levels that are \(\sim 5\) times greater than we focus on here, since M dwarf discs are generally much brighter in the mid-infrared than UCDS.

3.5 Colour excess distribution

Figure 8 (top plot) shows the histogram of our excess measurements. Overall it is similar to a Gaussian distribution, but as we will see it has some asymmetries. Firstly it is apparent that the peak of this histogram is found at a slightly negative excess value which seems unexpected. However, we believe this bias is introduced by our analysis method, and results from the finite size of the PS colour sub-volumes. The number density of objects varies across the sub-volumes in our multi-colour parameter-space, leading to average values that can be slightly different to the central value. We suggest that on average this effect leads to the small negative offset that is seen. For our symmetry analysis we offset the histogram by \(+0.003\) magnitudes to remove this offset.

To assess the symmetry of the histogram we reflected the negative side of the distribution in the Y-axis and subtracted this from the positive distribution (see Figure 8). Although the histogram is fairly symmetrical, it contains an important feature. The positive wing has relatively lower frequencies (compared to the negative wing) for excesses of \(0.0-0.05\), and has relatively higher frequencies for excesses of \(0.05-0.15\) (an excess bump). To assess the nature of this excess bump we carried out a comparison analysis using the \(H - K_S\) colour as our CS colour (instead of \(J - W2\)). This comparison analysis should not be sensitive to companion excesses, or indeed to spectral type variations (see Figure 4), but should produce the kind of distribution we expect in the absence of any significant excess (albeit with some scatter due to a metallicity spread). Figure 8 also contains the histogram for the \(H - K_S\) excess distribution (green line), and it can be seen that it has a similar form to the \(J - W2\) excess histogram. However, when one studies the symmetry of this histogram (bottom plot) it is clear that the \(H - K_S\) excess distribution is much more symmetrical by comparison. The mirror-subtracted trace for the \(H - K_S\) excesses is close to zero with just a few short-range deviations. This contrasts with the bump feature seen when excess values are calculated using \(J - W2\), and thus supports the idea that the bump is caused by a population of M dwarfs with mid-infrared excess, rather than by some unidentified bias in our analysis method.

The mid-IR bump represents \(\sim 2.01\) to \(\geq 2\) per cent of our excess sample, and we thus expect unresolved M+UCD systems to only form a fraction of this population (see further treatment in Section 3.6). We also expect the bump population to include a variety of contaminating objects such as M+M binaries (where the cooler companion causes an excess), M dwarfs in regions of local reddening (not picked up by our reddening assessments), and M dwarfs with some low level of disc emission. These objects will be mixed with M dwarfs whose colours have scattered to the red due to photometric uncertainty.

3.6 Excess selection contours

In order to identify M dwarfs likely to have mid-infrared excess consistent with unresolved UCD companions, we used our simulated M dwarf and UCD photometry (from Section 3.2). As a starting point we took the photometry of our excess sample to represent a population without any unresolved UCD companions. This assumes that UCD companions are reasonably rare, which is consistent with previous constraints (Section 1)) and our interpretation of the excess bump feature. We then simulated unresolved UCD companions around a randomly selected fraction \(\beta\) of our sample by modifying the M dwarf colours to account for L2 companions (since we expect the most significant UCD reddening from companions in the range \(\sim L0-L3\); see Appendix C). We used these simulated M dwarfs to map out a so-called ‘improvement’ parameter-space. We define ‘improvement’ to be the factor by which the probability improves that an M dwarf has an unresolved UCD companion, compared to a completely random selection.

\[
\text{Improvement} = \frac{N_{SB}}{N_T} \cdot \frac{1}{\beta}
\]

(1)

where \(N_{SB}\) is the total number of simulated M dwarf+UCD unresolved binary systems present in the region, \(N_T\) is the total number of M dwarfs present in a region \((N_T = N_D - N_{SS} + N_{SB})\), and \(\beta\) is the simulated binary fraction. Here \(N_D\) is the number of original M dwarfs in the region and \(N_{SS}\) is the number of simulated M
Figure 5. Colour-colour contour diagrams for $g - r$ against $r - i$ and, $g - r$ against $g - i$, for the populations of M dwarfs used in the multi-colour-space analysis. Red boxes represent 10 targets and their respective PS colour volumes (in two dimensions). These volumes are used to define similar M dwarfs, the colour volume means and standard deviations are used to calculate colour excesses compared to those in each target colour volume. This process was undertaken for each M dwarf, except those which had less than 20 M dwarfs in their colour volume.

Figure 6. Excess distribution of our sample of M dwarfs after the colour-space analysis (for the CS colour $J - W2$). The colour distribution represents the local improvement grid created simulating M dwarf+UCD unresolved binary systems through the multi-colour-space analysis. The red box shows the size of the improvement grid used.

Figure 7. The local improvement grid was used to define contours of improvement (coloured contours). For comparison the excess gained (in $J - W2$) by a sample of M dwarfs is shown. The red arrows start at an M dwarfs location in excess/$V - J$ space without a simulated companion and end at the location where the M dwarf + UCD companion is in excess/$V - J$ space. The shaded region is the final selected contour equivalent to an improvement of $\geq 4$ over randomly selecting an M dwarf from our full catalogue of M dwarf candidates.
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Figure 8. Assuming the deficit section of the excess $J - W^2$ distribution is from Gaussian, random or likewise symmetric contamination process (and not from a UCD companion), we show the histogram of our excess distribution, compared to a mirrored deficit (negative) distribution around zero (non-shifted, magenta) and around an overall deficit value of -0.0030 (shifted, red). This is then compared to the excess $H - K_S$ distribution (an independent colour that also shows a very low sensitivity to companions and spectral type, see Figure 4, shown in cyan and blue for non-shifted and shifted respectively). The residuals of $J - W^2$ are also shown in red (bottom plot). The positive bump at an excess of $>0.05$ magnitudes is evidence of processes contributing to making the targets redder than their mean PS colour volume colour, including M dwarfs with unresolved UCD companions and is not seen in our companion insensitive ($H - K_S$) residuals in blue.

We calculated improvement values across the excess $V - J$ parameter-space of our excess sample using a box-smoothed approach and running our simulation 1000 times to smooth out the random noise. Figure 6 shows the ‘improvement’ levels (colour-scaled) across the excess $V - J$ parameter-space. The box size we used for smoothing is indicated in the upper left of the diagram.

A set of improvement contours were defined to aid selection of potential M+UCD binaries. These are shown in Figure 7, where the contours range from 3-8. We required improvement $\geq 4$ for our final selection, and this region is shaded in grey in the Figure. We used these contours as selection regions for our candidates and the results can be seen in Table 2, for a simulated binary fraction of 0.01 (1 per cent). For $J - W^2$ and $\beta = 0.01$ this led to 1,082 objects which constitutes our ‘candidate M+UCD sample’.

3.7 Measuring improvement in detection

By varying the fraction of simulated binaries added ($\beta$, Section 3.6) we were able to estimate the expected yield of candidate M+UCDs at certain improvement levels. The binary fraction for mid-type M dwarfs with a UCD companion is rather uncertain, so we present a range of estimates for $\beta=0.2-8$ per cent. We run the same selection method as above to create additional candidate M+UCD samples, with the only difference being $\beta$. We count the number of candidates found for each binary fraction and show this in Figure 9. The higher the binary fraction the lower our yield, this is expected because more of our reference PS colour M dwarfs have companions thus diluting the colour excess detectable. For a binary fraction of 0.01 we expect over 1000 candidate M+UCDs for $J - W^2$.

3.8 Predicting candidate companion subtype

To estimate the subtypes of the expected companions we ran our simulation (Section 3.6) for L0-T4 companions (in steps of two subtypes). We run the same selection method as above (except varying the companion we added) to create additional candidate M+UCD samples. Figure 10 shows the result for the number of candidate dwarf+UCD unresolved binary systems present in the region before the UCDs were added. Hence an improvement of one is equivalent to no improvement (i.e. randomly selecting M dwarfs from the distribution).

A set of improvement contours were defined to aid selection of potential M+UCD binaries. These are shown in Figure 7, where the contours range from 3-8. We required improvement $\geq 4$ for our final selection, and this region is shaded in grey in the Figure. We used these contours as selection regions for our candidates and the results can be seen in Table 2, for a simulated binary fraction of 0.01 (1 per cent). For $J - W^2$ and $\beta = 0.01$ this led to 1,082 objects which constitutes our ‘candidate M+UCD sample’.

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Table 2. Using a locally defined Improvement, $I_{\text{imp}}$, based on our simulated M dwarf+UCD unresolved binary systems, contours of improvement were defined (i.e. $I_{\text{imp}} \geq 3$) and the number of M dwarfs in excess/$V - J$ space which fell inside a contour were recorded. The simulated binary fraction, $\beta$ in this case was $\beta = 0.01$ (1 per cent).

| Colour   | $I_{\text{imp}} \geq 3$ | $I_{\text{imp}} \geq 4$ | $I_{\text{imp}} \geq 5$ | $I_{\text{imp}} \geq 6$ | $I_{\text{imp}} \geq 7$ | $I_{\text{imp}} \geq 8$ |
|----------|--------------------------|--------------------------|--------------------------|--------------------------|--------------------------|--------------------------|
| $J - W1$ | 1,800                    | 654                      | 330                      | 169                      | 110                      | 83                       |
| $J - W2$ | 2,934                    | 1,082                    | 511                      | 269                      | 128                      | 82                       |
| $H - W1$ | 705                      | 176                      | 85                       | 34                       | 26                       | 15                       |
| $H - W2$ | 1,095                    | 301                      | 118                      | 57                       | 23                       | 17                       |
| $K_S - W2$ | 616                  | 221                      | 98                       | 34                       | 14                       | 8                        |

Figure 9. After varying the initial binary fraction of our simulated companion systems, the final detected fraction was calculated and thus the yield of candidate M+UCDs was calculated and the improvement over randomly selecting M dwarf was defined for each CS colour. Plot shows candidate M+UCDs for an improvement $\geq 4$. $J - W2$ yields the most candidate M+L dwarf systems.

M+UCD systems with a binary fraction of 0.01. For comparison we show the predictions when a range of other CS colours are used instead of $J - W2$. It can be seen that $J - W2$ yields the most candidate M+L dwarf systems because it is the most sensitive to M+L unresolved binaries. If the companion distribution is flat, similar to the field population (See Figures 11 and 12 from Cruz et al. 2003) we can use Figure 10 to predict roughly our expectation of companion subtypes. We expect up to 60 per cent of our candidates to have companions of spectral subtype earlier than L3 and $\sim 35$ per cent to be later L dwarfs. The remaining $\sim 5$ per cent may be late L dwarfs or early T dwarfs.

3.9 Contamination in the excess sample and candidate M+UCDs

In total there were 3,928 matches out of the 36,898 excess sample and 66 matches out of the 1,082 candidate M+UCDs to the SIMBAD catalogue (three arcsec cross-match). Of these 1,475 and 32 respectively had spectral types from SIMBAD. From this we gauge our contamination from early (FGK) stars, M giants, and white dwarfs. Our excess sample has a contamination of $\sim 0.14$ per cent from these sources and there is no contamination from these sources found in our candidate M+UCDs (see Table A1). It should however be noted, as with the full catalogue, some of the spectral types are defined only as M type star (at 1.35 per cent) and thus we may slightly underestimate our contamination from M giants.

We repeated this exercise with the LAMOST DR1 and DR2 catalogue spectral types (again with a three arcsec cross-match). In total there were 1,851 with spectral types out of our 1,072 candidate M+UCDs. From this we gauge our contamination from early stars, multiple stars (which we assume are all from contamination) and white dwarfs. Our excess sample has a contamination of $\sim 2.38$ per cent from these sources and there is a $\sim 2.44$ per cent contamination from these sources found in our candidate M+UCDs (see Table A2). However, as with the full catalogue, it should be noted LAMOST does not distinguish between giants and dwarfs nor between spec-

Figure 10. After varying the simulated companion between L0 and T4 we are able to gain insight into the possible companion spectral type distribution. As with Figure 9, $J - W2$ yields the most candidate M+L dwarf systems.
tural types of the double stars thus our contaminations are a rough estimate.

We counted the source classifications given in SIMBAD and grouped them (see Table A3). From this we gauge our contamination from galaxies, variable stars and white dwarfs as $\sim 0.97$ per cent for our excess sample and $\sim 1.52$ per cent for our candidate M+UCDs. As with the spectral types some of the source classifications are not specific enough to gauge possible contamination (i.e. classified as stars or as being in an association or a cluster) therefore we take these contaminations as rough estimates.

4 SUMMARY AND FUTURE WORK

We present a new photometric method to target unresolved UCD companions to M dwarfs. Using WISE, 2MASS and SDSS we create a large catalogue of 440,694 M dwarfs candidates. By requiring high accuracy photometry in un-reddened regions of sky, we isolate a sample of 36,694 M dwarfs candidates. By picking those with $J - W 2$ outliers in tightly constrained multi-colour ($g - r, g - i,$ and $r - i$) sub-volumes centred on each object. These colours were chosen to optimise our methodology, which isolates a comparison sample of M dwarfs (similar $T_{\text{eff}}$ and metallicity) for each target M dwarf, and then measures mid-infrared excess with respect to this comparison.

We select a region in excess $V - J$ parameter-space where the likelihood of systems is greater than a factor of four over the chance of randomly selecting a companion, assuming a companion fraction of $\sim 0.01$. In total we obtain 1,082 candidate M+UCDs for $J - W 2$. We discuss the excess distribution and conclude there is good evidence for an overall excess in $J - W 2$ in our distribution due to unresolved UCCom companions. Based on simulation we expect up to 60 per cent of our candidates to have companions of spectral subtype earlier than L3 and $\sim 35$ per cent to be later L dwarfs. The remaining $\sim 5$ per cent may be late L dwarfs or early T dwarfs. For our full catalogue, excess sample and candidate M+UCDs we estimate the contamination using SIMBAD and LAMOST ($\sim 3$ per cent), thus confirming that we have very high quality, clean samples of M dwarfs.

Further analysis of our candidate M+UCD binary sample is needed to confirm the UCD companions. Optical spectroscopy will confirm M dwarfs and identify any whose colours are scattered away from their typical location (thus leading to contamination in the selection). High resolution imaging (e.g. adaptive optics, lucky imaging, HST) may reveal the UCD companions directly if their angular separation is $\geq 0.1$ arcsec. Closer systems may be constrained through radial velocity measurements, with very close systems potentially being amenable to transit light curve studies. Gaia may also be capable of constraining some systems if there is a detectable astrometric wobble.

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APPENDIX A: ESTIMATES ON CONTAMINATION

We cross-matched our full M dwarf candidate catalogue (440,694 M dwarf candidates), our excess sample (36,898 M dwarf candidates) and our M+UCD sample (1,082 M dwarf candidates) with SIMBAD. In total there were 20,286 matches with our full M dwarf candidate catalogue; 3,928 matches out of the 36,898 excess sample and 66 matches out of the 1,082 candidate M+UCDs. Of these 7,360, 1,475 and 32 respectively had spectral types from SIMBAD (See Table A1). We repeated this exercise with the LAMOST DR1 and DR2 catalogue spectral types. In total there were 9,262 with spectral types in our full M dwarf candidate catalogue; 1,851 with spectral types out of our 36,898 excess sample and 61 with spectral types out of our 1,082 candidate M+UCDs (see Table A2). We also counted the source classifications given in SIMBAD and grouped them (see Table A3).

APPENDIX B: MODIFIED REDDENING EQUATION

We used equation B1 from Massa & Savage (1989) and thus derived equation B2, where $V_{\lambda}$ was calculated by taking the weighted average of cubic splines fits to $A_{\lambda}$ from Cardelli et al. (1989), Fitzpatrick (1999) and Schlegel et al. (1998) for an $R_V$ of 3.1. Note

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Table A1. Statistics on SIMBAD spectral types for the cross-match between the full catalogue of M dwarf candidates, the excess sample and the candidate M+UCDs with SIMBAD. Spectral types are only shown for those SIMBAD spectral types with non-zero cross-matches. Note some spectral types have no subtype, e.g. ‘M’, and thus for these sources we cannot identify whether they are dwarfs or giants (and thus whether these sources contribute to the contamination)

\[
A_\lambda - A_\lambda = E(\lambda_1 - \lambda_2) \quad \text{(B1)}
\]

\[
A_V \leq E(\lambda_1 - \lambda_2) \left( \frac{A_{\lambda_1}}{A_V} - \frac{A_{\lambda_2}}{A_V} \right)^{-1} \quad \text{(B2)}
\]

APPENDIX C: PHOTOMETRIC SIMULATION

A polynomial was fit to the data points using a Bayesian approach (using EMCEE\textsuperscript{10} and the fitting routine used by Foreman-Mackey et al. 2013 and Hogg et al. 2010).

The probabilistic fitting routine allowed the polynomial parameters \((a_i = a_1, a_2, ..., a_n)\) to vary as well as allowing the variance

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| Group                  | LAMOST spectral types selected for group | Number in full candidate catalogue | Number in excess sample | Number in candidate M+UCDs |
|------------------------|----------------------------------------|----------------------------------|------------------------|--------------------------|
| Total                  | -                                      | 440,694                          | 36,898                 | 1,082                    |
| Total with LAMOST types| -                                      | 9,262                            | 1,851                  | 41                       |
| A                      | A0, A1IV, A1V, A2V, A3IV, A6V, A7IV    | 8 (0.09%)                        | 0                      | 0                        |
| D                      | WD, WDMagnetic                         | 8 (0.09%)                        | 1 (0.05%)              | 0                        |
| F                      | F0 F2 F3 F4 F5 F6 F7 F9               | 42 (0.45%)                       | 6 (0.32%)              | 0                        |
| G                      | G0 G1 G2 G3 G4 G5 G6 G7 G8 G9        | 286 (3.09%)                      | 33 (1.78%)             | 1 (2.44%)                |
| early K                | K0 K1 K2 K3 K4                        | 44 (0.48%)                       | 1 (0.05%)              | 0                        |
| late K                 | K5 K7 S03 (5.43%)                     | 3 (0.16%)                        | 0                      |                          |
| M0 - eM1               | M0 MOV                                 | 540 (5.83%)                      | 2 (0.11%)              | 0                        |
| M1 - eM2               | M1                                     | 442 (4.77%)                      | 2 (0.11%)              | 0                        |
| M2 - eM3               | M2 M2V                                 | 827 (8.93%)                      | 110 (5.94%)            | 2 (4.88%)                |
| M3 - eM4               | M3                                     | 5,874 (63.42%)                   | 1,505 (81.31%)         | 33 (80.49%)              |
| M4 - eM5               | M4                                     | 607 (6.55%)                      | 154 (8.32%)            | 5 (12.20%)               |
| M5 - eM6               | M5                                     | 11 (0.12%)                       | 2 (0.11%)              | 0                        |
| M6 - eM7               | M6                                     | 28 (0.30%)                       | 8 (0.43%)              | 0                        |
| M7 - eM8               | M7                                     | 0                                | 0                      | 0                        |
| M8 - eM9               | M8                                     | 0                                | 0                      | 0                        |
| early L                | DoubleStar                             | 40 (0.43%)                       | 7 (0.38%)              | 0                        |

Table A2. Statistics on LAMOST source classifications for the cross-match between the full catalogue of M dwarf candidates, the excess sample and the candidate M+UCDs with LAMOST. Object classifications are only shown for those LAMOST spectral types with non-zero cross-matches. Note spectral types are only given to integer spectral types and giants and dwarfs are not distinguished.

| Group                  | SIMBAD Object Types selected for group | Number in full candidate catalogue | Number in excess sample | Number in candidate M+UCDs |
|------------------------|----------------------------------------|----------------------------------|------------------------|--------------------------|
| Total                  | -                                      | 440,694                          | 36,898                 | 1,082                    |
| Total with SIMBAD cross-matches| -                                      | 20,286                          | 3,928                  | 66                       |
| Potential M dwarfs     | PM*, low-mass*, star, *inCl, Candidate_low-mass*, WD*, Candidate_WD* | 17,670 (87.10%)                  | 3624 (92.26%)          | 55 (83.33%)              |
| White dwarfs           | WD*, Candidate_WD*                     | 29 (0.14%)                       | 2 (0.05%)              | 0 (0.00%)                |
| Brown dwarfs           | brownD*, Candidate_brownD*            | 45 (0.22%)                       | 584 (2.88%)            | 321 (1.58%)              |
| X-ray sources          | X                                      | 303 (1.49%)                      | 96 (2.44%)             | 22 (0.11%)               |
| Infrared sources       | IR, IR<10µm                            | 1035 (5.10%)                     | 92 (2.34%)             | 9 (0.12%)                |
| Known multiple systems | *in**, **, EB*Algal, EB*, multiple_source, SB | 584 (2.88%)                     | 68 (1.73%)             | 29 (0.74%)               |
| Extragalactic          | Galaxy, EmG, GinGroup, GinCl, QSO_Candidate | 196 (0.97%)                     | 29 (0.74%)             | 7 (0.18%)                |
| Variable stars         | V*, RV*, Flare*, RRLyr                 | 321 (1.58%)                      | 7 (0.18%)              | 0 (0.00%)                |
| Other sources          | Unknown Transient DiNeB SNR? HI Blue Symbiotic* Inexistant RGB* | 22 (0.11%)                      | 2 (0.05%)              | 0 (0.00%)                |
| Non contaminated sources | Blue source, Radio source, Brown dwarfs, Young stellar Objects, Infrared sources, Known multiple systems, Unknown, Potential M dwarfs, X-ray sources | 19733 (99.27%)                  | 3890 (99.03%)          | 65 (98.48%)              |
| Contaminated sources   | Not an source, Symbiotic Star, ISM, White dwarfs, Extragalactic, Variable stars, Red Giant Branch Star | 553 (2.73%)                    | 38 (0.97%)             | 1 (1.52%)                |

Table A3. Statistics on SIMBAD source classifications for the cross-match between the full catalogue of M dwarf candidates, the excess sample and the candidate M+UCDs with SIMBAD. Object classifications are only shown for those SIMBAD spectral types with non-zero cross-matches. Note some source classifications, e.g. ‘star’, carry little information and hence contamination levels may be underestimated.

\[
\ln p(y|x, \sigma, model, f) = - \frac{1}{2} \sum_{i=1}^{n} \frac{(y_n - \text{model}_n)^2}{s_n^2} + \ln(2\pi s_n^2) + \frac{1}{2} f^2(\text{model}_n)^2 \quad \text{where} \quad s_n^2 = \sigma_n^2 + f^2(\text{model}_n)^2 \quad \text{and} \quad \text{model}_n = \sum_{i=0}^{m} a_i x_i^n.
\]

\(^{11}\) See http://dan.iel.fm/emcee/current/user/line/ for a full example.

11 To vary, represented below by \( f \). The probability distribution is assumed Gaussian and is shown in equation C1.
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| Colour | $E(\lambda_1 - \lambda_2)$ | $A_V(CCM)$ | $A_V(F99)$ | $A_V(SFD)$ | $A_V(\bar{x})$ | No. of M dwarfs after cut |
|--------|---------------------------|------------|-----------|------------|---------------|-------------------------|
| $H - W1$ | 0.01 | $0.081 \pm 0.004$ | $0.093 \pm 0.017$ | $0.080 \pm 0.001$ | $0.081 \pm 0.001$ | ... |
| $H - W2$ | 0.01 | $0.069 \pm 0.003$ | $0.077 \pm 0.005$ | $0.069 \pm 0.001$ | $0.069 \pm 0.001$ | ... |
| $J - W1$ | 0.01 | $0.044 \pm 0.003$ | $0.047 \pm 0.005$ | $0.044 \pm 0.001$ | $0.044 \pm 0.001$ | ... |
| $J - W2$ | 0.01 | $0.040 \pm 0.003$ | $0.042 \pm 0.002$ | $0.041 \pm 0.001$ | $0.041 \pm 0.001$ | $13,036$ |

Table B1. Using Equation B2 and $A_\lambda/A_V$ estimated from CCM: Cardelli et al. (1989), F99: Fitzpatrick (1999) and SFD: Schlegel et al. (1998). Here $R_V = 3.1$ and $\bar{x}$ is the weighted average of the three estimations. Note errors from CCM are described as a lower limit only.

Using Equation B2 and $A_\lambda/A_V$ estimated from CCM: Cardelli et al. (1989), F99: Fitzpatrick (1999) and SFD: Schlegel et al. (1998). Here $R_V = 3.1$ and $\bar{x}$ is the weighted average of the three estimations. Note errors from CCM are described as a lower limit only.

The maximum brightness of an unresolved binary for two stars of equal brightness giving a factor of two in flux (in magnitudes equivalent to $-2.5 \log (2) \approx -0.75 \rightarrow \pm 0.375$ uncertainty).

SpeX Prism Spectral Libraries, maintained by Adam Burgasser at http://pono.ucsd.edu/~adam/browndwarfs/spexprism.
M dwarfs M0 - M6 using our probabilistic fitting routine (equation C1) using the data from Lépine et al. (2013); Gliese & Jahreiß (1991) and Dupuy & Liu (2012).

Table C1. M dwarf Synthetic Photometry Generation: Colour-colour fits ($y = \sum_{i=0}^{N} c_i x^i$), where $x=0$ corresponds to M0 and $x = 6$ corresponds to M6, were produced for M dwarfs M0 - M6 using our probabilistic fitting routine (equation C1) using the data from Lépine et al. (2013); Gliese & Jahreiß (1991) and Dupuy & Liu (2012).

| $y$ | $x$ | $c_0$ | $c_1$ | $c_2$ | $c_3$ |
|-----|-----|------|------|------|------|
| $M_J$ | $M_{0.0}$ | $+0.81^{+0.10}_{-0.09} \times 10^{-1}$ | $+0.55^{+0.05}_{-0.05} \times 10^{-1}$ | $+1.76^{+0.20}_{-0.19} \times 10^{-1}$ | $-1.37^{+0.12}_{-0.10} \times 10^{-2}$ |
| $J - H$ | $M_{1.0}$ | $+0.20^{+0.37}_{-0.31} \times 10^{-1}$ | $+2.84^{+0.57}_{-0.50} \times 10^{-1}$ | $+1.83^{+0.23}_{-0.25} \times 10^{-2}$ | $-0.20^{+0.02}_{-0.02} \times 10^{-2}$ |
| $J - K_S$ | $M_{2.0}$ | $+0.18^{+0.37}_{-0.31} \times 10^{-1}$ | $-0.32^{+0.57}_{-0.50} \times 10^{-1}$ | $-0.20^{+0.02}_{-0.02} \times 10^{-2}$ | $-0.20^{+0.02}_{-0.02} \times 10^{-2}$ |
| $J - W1$ | $M_{3.0}$ | $+0.06^{+0.37}_{-0.31} \times 10^{-1}$ | $-0.40^{+0.57}_{-0.50} \times 10^{-1}$ | $+0.30^{+0.02}_{-0.02} \times 10^{-2}$ | $+0.20^{+0.02}_{-0.02} \times 10^{-2}$ |
| $J - W2$ | $M_{4.0}$ | $+0.13^{+0.37}_{-0.31} \times 10^{-1}$ | $+0.58^{+0.57}_{-0.50} \times 10^{-1}$ | $+2.76^{+0.02}_{-0.02} \times 10^{-2}$ | $-0.20^{+0.02}_{-0.02} \times 10^{-2}$ |

Table C2. UCD Synthetic Photometry Generation: $u, v, r, i$ and $z$ were generated using the probabilistic fitting routine on data from Hawley et al. (2002); Chiu et al. (2006) and Dupuy & Liu (2012) crossmatched with 2MASS and SDSS and J from Dupuy & Liu (2012), where $y = \sum_{i=0}^{N} c_i x^i$, and $x$ is spectral type.

| $y$ | $x$ | $c_0$ | $c_1$ | $c_2$ | $c_3$ |
|-----|-----|------|------|------|------|
| $u - g$ | $M_{0.0}$ | $+6.68^{+0.75}_{-0.74} \times 10^{-1}$ | $-1.02^{+0.32}_{-0.32} \times 10^{-1}$ | $+5.24^{+0.37}_{-0.37} \times 10^{-2}$ | $-0.09^{+0.15}_{-0.14} \times 10^{-2}$ |
| $g - r$ | $M_{1.0}$ | $+8.74^{+0.36}_{-0.36} \times 10^{-1}$ | $+2.61^{+0.50}_{-0.50} \times 10^{-1}$ | $-0.98^{+0.71}_{-0.71} \times 10^{-2}$ | $-0.23^{+0.40}_{-0.40} \times 10^{-2}$ |
| $r - i$ | $M_{2.0}$ | $+2.40^{+0.37}_{-0.37} \times 10^{-1}$ | $+8.10^{+0.37}_{-0.37} \times 10^{-1}$ | $-0.31^{+0.39}_{-0.39} \times 10^{-2}$ | $-0.03^{+0.03}_{-0.03} \times 10^{-2}$ |
| $i - z$ | $M_{3.0}$ | $+7.10^{+0.37}_{-0.37} \times 10^{-1}$ | $+9.06^{+0.37}_{-0.37} \times 10^{-1}$ | $+1.31^{+0.39}_{-0.39} \times 10^{-2}$ | $+0.04^{+0.04}_{-0.04} \times 10^{-2}$ |
| $z - J$ | $M_{4.0}$ | $+6.30^{+0.37}_{-0.37} \times 10^{-1}$ | $+6.10^{+0.37}_{-0.37} \times 10^{-1}$ | $-1.53^{+0.39}_{-0.39} \times 10^{-2}$ | $-0.04^{+0.04}_{-0.04} \times 10^{-2}$ |

Figure C1: Absolute magnitude against spectral type for Lépine et al. (2013); Gliese & Jahreiß (1991) and Dupuy & Liu (2012) M dwarfs. Shown in purple is the fit Lépine et al. (2013) proposed, in yellow is an interpolated fit of data from Covey et al. (2007) and in red is our spectral type fit (see equation C2), shaded regions show outer most bounds of the uncertainties and the added uncertainty due to the contribution of an unresolved equal binary ($\pm 0.375$ orders of magnitude).
Figure C.2. Absolute magnitude against wavelength, simulated M dwarf and UCD photometry as calculated by the fits in Table C1 and Table C2. From our fit we include shaded regions bounded by dashed red line to show the uncertainties of our fit.

Figure C.3. Expected colour excess for simulated M0 + UCD to M6 + UCD for (a) $g - r$: an identified PS colour and (b) $J - W_2$: an identified CS colour. Note the difference in scales of the colour excess (y) axis. The dashed line shows the average colour uncertainties for these colours in our catalogue.
Figure C.4. Expected primary colour variation in (a) $g-i$ and (b) $J-W2$ as a function of primary spectral type for simulated M dwarf+UCD unresolved binary systems. A large change in colour with primary spectral type without a large change across companion spectral type identifies a good colour for identifying M dwarfs. Note the difference in scales of the colour (y) axis.

Figure C.5. Using spectra from SpeX\cite{13} we combined M dwarf and UCD near-infrared spectra to simulate M dwarf+UCD unresolved binary systems. We calculated the $J - H$, $H - K_S$ and $J - K_S$ colours for each and compared them to the colours of the isolated M dwarfs. The excess seen is complimentary to the photometric simulations (Figure 4 where we average over M3 to M6 and L0 to L4).