

A sample of 554 white dwarfs showing infrared excess from *Gaia* EDR3 and CatWISE catalogs[★]

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ABSTRACT

Context. White dwarfs (WDs) are generally intrinsically faint in the infrared (IR). Excess emission in the infrared results from low-mass companions or dusty material, potentially linked to the on-going accretion of planetary material.

Aims. This work presents a new catalog of white dwarfs with (candidate) infrared excess.

Methods. The final sample comes from a cross-match between the *Gaia* Early Data Release (EDR3) white dwarf candidates, and the CatWISE catalog, with candidate infrared excesses determined considering both magnitude and color excess. A magnitude excess is found to be more reliable than a color excess.

Results. The final catalog contains 554 infrared excess candidates (446 are presented for the first time here) from 41 020 white-dwarf candidates with a *Gaia* magnitude of $G < 18.5$ mag. Our infrared excess candidate sample extends to a white-dwarf temperature range of 4500–98 000 K and a white-dwarf mass range of 0.1–1.2 M_{\odot} . We caution that these objects should be treated as infrared excess candidates until confirmed with other methods.

Conclusions. We present a three-fold increase in the sample of white dwarfs known to have infrared excesses. Among the sample applications is the study of the accretion of planetary material by white dwarfs and the identification of new white-dwarf-brown-dwarf pairs.

Key words. catalogs – circumstellar matter – white dwarfs – infrared: stars

1. Introduction

Over the past decade, white dwarfs (WDs) have played an important role in the study of exoplanets, particularly in constraining their composition (Zuckerman et al. 2007; Klein et al. 2010). White dwarfs have pure hydrogen or helium-dominated atmospheres, as heavier elements sink quickly due to the high surface gravity ($\log g \approx 8 \text{ cm s}^{-2}$)¹. In other cases, some white dwarfs show traces of heavier elements (metals) due to the accretion of disrupted extrasolar minor planets, or companions (Jura 2003). Such “polluted” white dwarfs provide the bulk elemental abundances of planetary building blocks. These systems are perfect for studying the formation and evolution of planets, as well as the potential habitability of other worlds (Kaltenegger et al. 2020; Xu & Bonsor 2021). The most heavily “polluted” white dwarfs often have a debris disk (e.g., Xu et al. 2019). Evidence of debris around white dwarfs is provided by the infrared (IR) excess in their spectrum, which indicates the presence of a cooler object or dust (Zuckerman & Becklin 1987).

The common assumption is that these debris disks are remnants of extrasolar or minor planets that were destroyed within the tidal radius of the white dwarf (Debes & Sigurdsson 2002; Gänsicke et al. 2012; Bergfors et al. 2014; Farihi 2016). The debris disks eventually accrete onto the white dwarf and would cause pollution of the photospheres of the white dwarfs (Jura 2003; Harrison et al. 2018; Putirka & Xu 2021). Spectroscopic observations of “polluted” white dwarfs can be used to measure the chemical composition of the extrasolar planetary material (e.g., Xu et al. 2019).

White dwarfs are the perfect candidates to search for infrared emission from dust, as they are intrinsically faint in the infrared. With their relatively high temperatures, most of their emission is in the ultraviolet or the optical. Dusty white dwarfs have been found with cooling ages between 30 Myr and 1 Gyr, with temperatures decreasing from 34 000 to 8000 K (Lai et al. 2021). For both the hottest and coolest white dwarfs, conditions are thought to prevent the presence of dust disks. For the hot white dwarfs, dust inside the tidal radius would sublimate (von Hippel et al. 2007). Around cool white dwarfs, dust disks might be too faint to be detected (Xu & Jura 2012). However, pollution is common around these stars, and the question as to what dynamical mechanisms that lead to white dwarf pollution can continue functioning for such a long time (Gigayear timescale) at such temperatures

[★] Full Tables 1 and 3 are available at the CDS via anonymous ftp to [cdsarc.cds.unistra.fr \(130.79.128.5\)](https://cdsarc.cds.unistra.fr/130.79.128.5) or via <https://cdsarc.cds.unistra.fr/viz-bin/cat/J/A+A/688/A168>

¹ Although carbon molecules can be dredged up from deeper layers by the convection zone (Koester 2008).

Table 1. Bright white dwarfs ($G \leq 17$ mag) confirmed to have infrared excess.

SIMBAD	RA <i>Gaia</i> DR2 (deg)	Dec <i>Gaia</i> DR2 (deg)	G (mag)	IR excess EDR3	Ref
Dust disks					
<i>Gaia</i> DR2 2860923998433585664	1.644751	28.979653	16.4	Color+Mag	Melis et al. (2020)
PG 0010+281	3.338109	28.338806	15.7	OnlyMag	Xu et al. (2015)
<i>Gaia</i> DR2 2529337507976700928	12.690832	-3.448819	16.8	OnlyMag	Lai et al. (2021)

Notes. Dust disks, white-dwarf-main sequence or M dwarf are confirmed by *Spitzer* observations, and the white-dwarf–brown-dwarf pairs do not have *Spitzer* observations, so we list the discovery paper. [Steele et al. \(2013\)](#) confirmed the infrared excess spectroscopically using radial velocity measurements and [Wilson et al. \(2019\)](#) suggested it is not a dust disk because the white dwarf’s atmosphere is not polluted. IR excess EDR3 is the assessment of the infrared excess made on this paper: N means there is no CatWISE photometry; empty entry means the source has been lost in one of the steps of our criteria. We show the reference where the *Spitzer* observations are reported. We show, for reference, the first three lines of 107 in total.

remains unanswered ([Debes et al. 2012](#)). Nevertheless, some dust disks have been found around white dwarfs outside this temperature range ([Chu et al. 2009; Bilikova 2012; Su et al. 2013; Debes et al. 2019; Shestakova et al. 2022; Blouin & Xu 2022; Hollands et al. 2017, 2018](#)).

White dwarfs with low-mass companions in the brown-dwarf regime will also have an IR excess. Such binaries are rare (0.1–0.5%; [Girven et al. 2011](#)); however, these binaries are especially valuable for studying the properties of brown dwarfs. The total age of the binary can be obtained by the cooling age of the white dwarf plus its main sequence life time ([Kiman et al. 2022](#)), and it can be used to calculate the physical properties of the brown dwarfs ([Fontaine et al. 2001](#)). However, it is important to consider the evolution of the system. Wide resolved binaries are unlikely to suffer effects from the companion during their evolution and will have evolved as single stars. In the case of close systems, the common envelope stage may have disturbed the evolution of each component ([French et al. 2023](#)).

The spectral energy distribution in the 1–5 μm range of dusty white dwarfs appears to be very similar to those with low-mass companions. However, [Lai et al. \(2021\)](#) proposed a method to distinguish both cases with high-precision J -band photometry. Low-mass companions, including M dwarfs, have a wider range of temperatures and therefore a greater range of wavelengths in which infrared excess is shown. On the contrary, dust disks are not expected to show excess in the near-infrared J band. This characteristic helps to determine whether the excess comes from a dust disk or not.

The advent of modern all-sky surveys renders the search for white dwarfs with infrared excess effective and can provide candidates for follow-up work. Similar efforts have been pursued in the past ([Hoard et al. 2007, 2013; Debes et al. 2011; Xu et al. 2020; Lai et al. 2021; Wang et al. 2023](#)) and are briefly described in Sect. 2. Here, we carried out a similar search taking advantage of data from two new catalogs: (1) new white dwarf candidates from the Early Data Release 3 (EDR3) of Global Astrometric Interferometer for Astrophysics (*Gaia*; [Gentile Fusillo et al. 2021](#)); and (2) the CatWISE catalog ([Marocco et al. 2021](#)) of infrared sources based on the Wide-field Infrared Survey Explorer (WISE). WISE photometry is crucial for identifying white dwarfs with infrared excesses from dust disks, because the first two WISE bands are where the disk flux peaks ([Wang et al. 2014; Swan et al. 2019](#)). Furthermore, WISE is sensitive enough to observe a significant portion of the bright end of the *Gaia* white-dwarf population.

We summarize the previous work in Sect. 2, highlighting possible improvements. In Sect. 3, we describe our selection

criteria used to define an infrared excess. We discuss the final sample and its properties in Sect. 4 and provide some conclusions in Sect. 5.

2. Previous work

After the first discovery of a debris disk around the white dwarf G 29–38 ([Graham et al. 1990; Zuckerman & Becklin 1987](#)), the two micron all sky survey (2MASS) was used to search for infrared excesses around white dwarfs ([Hoard et al. 2007](#)) at wavelengths shorter than 2.4 μm , without access to longer wavelengths.

2.1. *Spitzer*-confirmed known WDs with IR excess

The first systematic identification of cool infrared excess around white dwarfs became possible after the launch of the *Spitzer* Space Telescope ([Mullally et al. 2007](#)). Several studies have increased the number of *Spitzer*-confirmed white dwarfs, ([Farihi et al. 2010; Barber et al. 2016; Dennihy et al. 2020; Melis et al. 2020; Lai et al. 2021](#); all of them are specified in Sect. 1). A total of 107 white dwarfs (with $G \leq 17$ mag) with an infrared excess have been identified so far. This modest sample extends over a wide range of space parameters, with a temperature range from 7300 to 34 000 K and a mass range from 0.3 to 1.2 solar mass (Table 1). Fourteen of them are more likely to have a companion than a disk. For ten, the companion is probably an M dwarf (they have a J -band excess), and the other four are known brown dwarfs. The remaining 93 are known dusty white dwarfs ([Lai et al. 2021](#)).

The *Spitzer* sources are important for this work, as objects detected from the WISE survey (see below) can only be considered candidates, due to the large beam size of WISE (i.e., occasional contamination by nearby infrared-bright objects is possible ([Dennihy et al. 2020](#))). In Sect. 4.2, we discuss the *Spitzer*-confirmed sources found in our work.

2.2. Previous work based on *Gaia* and WISE

Prior to our work, a number of WISE catalogs have been used to search for infrared excesses around white dwarfs ([Hoard et al. 2013; Dennihy et al. 2017; Rebassa-Mansergas et al. 2019](#)). One of the latest used the *Gaia* DR2-based white-dwarf catalog ([Gentile Fusillo et al. 2019](#)) matched with the unWISE catalog ([Xu et al. 2020](#)). It produced a set of 188 high-confidence white dwarfs showing infrared excess. These candidates were

identified from an initial sample of 6002 *Gaia* white dwarf candidates with $G < 17$ mag. 188 showed an infrared excess via either a magnitude excess or a color excess. 147 of them were new discoveries, with an order of magnitude increase compared to previously known dusty white dwarfs. However, due to the large beam size of WISE, background confusion is unavoidable (Dennihy et al. 2020). This sample was followed up using the *Spitzer* Space Telescope to reveal that 80% of the candidate IR excesses are associated with the target rather than background sources (Lai et al. 2021). Taking advantage of the improvements in the catalogs with the arrival of *Gaia* EDR3 and CatWISE2020, this work aims to augment the catalog of white dwarfs with IR excess using similar techniques.

3. Selection criteria for white dwarfs with IR excess

3.1. Differences between unWISE and CatWISE; *Gaia* DR2 and EDR3

The number of white-dwarf candidates has significantly increased with *Gaia* EDR3 compared to *Gaia* DR2. Gentile Fusillo et al. (2019) identified 262 480 high-confidence white dwarfs from *Gaia* DR2. Of those, 247 525 are identified again in the new EDR3 catalog (Gentile Fusillo et al. 2021)². The EDR3 catalog contains a total of 359 073 high-confidence white-dwarf candidates, that is 111 548 new ones compared to DR2. Most of the new candidates have magnitudes between $G = 19$ and $G = 20$ mag. The brightest white dwarfs already had reliable photometric data in DR2. The interest of repeating the study with the newer versions of the *Gaia* and WISE catalogs was to push the magnitude limit of the sample from $G = 17.0$ to $G = 18.5$. The *Gaia* EDR3 white-dwarf candidate catalog contains 41 020 sources with $G < 18.5$ mag, while the *Gaia* DR2 white-dwarf candidate catalog contained only 38 117 sources.

The increase in new white dwarf candidates is particularly evident in crowded areas of the sky. The measurements have improved and have allowed many of the strict limitations that were imposed in DR2 in these dense regions of the sky to be removed. However, even with the improvements, the catalog remains incomplete in the central part of the Galactic plane (Gentile Fusillo et al. 2021).

The WISE mission mapped the entire sky simultaneously in four infrared bands centered at 3.4, 4.6, 12, and 22 μm (denoted W1, W2, W3, and W4, respectively; Wright et al. 2010). In 2013, the data release called ALLWISE was based on co-adding the two dozen exposures per position from the initial year of WISE surveying, and building a catalog of source fluxes and positions from these exposures (Cutri et al. 2021). Later, a new data release called the unWISE catalog (Schlafly et al. 2020) was made available; it combines the 2010 and 2011 data used for ALLWISE with the 2013–2016 NEOWISE data. The unWISE uses a crowded-field point-source photometry code called *crowdsource*, which improves the reliability of photometry, especially in crowded regions. For faint targets (W1, W2 > 16 mag), the unWISE values and uncertainties have a much smaller scatter compared to ALLWISE, particularly in the longer W2 filter. Despite the clear advantages of unWISE over ALLWISE, unWISE is a static-sky catalog; that is, it does not account for the proper motion of the sources.

In order to remedy this shortcoming, the CatWISE catalog was created (Marocco et al. 2021). It combines sources from WISE and NEOWISE, selected simultaneously in both W1 and W2 bands, and provides proper-motion estimates. It adapted the ALLWISE software to measure the sources in co-added images created by the unWISE team from six-month subsets, each representing one coverage of the inertial sky or epoch. For the CatWISE Preliminary Catalog (Eisenhardt et al. 2020), data for sources were collected between 2010 and 2016. This includes four times as many exposures and spans over ten times the timeline of ALLWISE. The total time spanned by CatWISE epochs at a given inertial position is over 6 yr, compared to a typical value of six months for ALLWISE. Thus, the CatWISE motion estimates are far more accurate. As one caveat, the number of sources per square degree in CatWISE shows little variation over the sky. While the method followed for the sources' detection is optimal for isolated objects, it results in incompleteness for high-source-density regions. The CatWISE2020 catalog addresses this issue thanks to an improvement in the updated version of the unWISE catalog. It includes two more years, increasing the number of epochs to 12 and the time span to over 8 yr, and the number of sources to more than twice that of the CatWISE Preliminary Catalog.

3.2. Initial white-dwarf sample

Seeking to increase the sample of white dwarfs with infrared excess and taking advantage of the improved CatWISE2020 catalog, this work respects a *Gaia* magnitude limit of $G < 18.5$ mag. This means that this work starts with a larger number of sources, which are then reduced step by step following selection criteria (see next section), avoiding the elimination of a large number of potentially interesting sources directly. For our initial sample, we applied the white dwarf probability as defined in Gentile Fusillo et al. (2021) as $P_{\text{WD}} > 0.75$. Our initial sample contains 41 020 high-probability white dwarf candidates around which we search for infrared excess.

3.3. Selection criteria

Inspired by Xu et al. (2020), we developed five steps, described below in detail, to select infrared-excess candidates (see also Fig. 1). The initial set of sources is Sample A (described in Sect. 3.2), with 41 020 high-confidence white-dwarf candidates.

3.3.1. Cross-correlate with CatWISE2020

The first step was to cross-match (via coordinates) the objects in *Gaia* EDR3 Sample A with the CatWISE2020 catalog. To do so, a coordinate transformation was carried out in *Gaia* EDR3 to have the same epoch in both catalogs, using *Gaia* proper motions. *Gaia* EDR3 coordinates (right ascension and declination) are given in the JD2016 epoch, and CatWISE2020 catalog coordinates in the JD2000 epoch. The JD2000 epoch was chosen for our analysis.

For the cross-matching, we used the tool TOPCAT (Taylor 2005). A matching radius of 3'' was selected to maximize the number of stars converging at this value and to cover the entire WISE beam of 6''. We obtained 23 914 matches.

We checked the signal-to-noise ratio (S/N) of both W1 and W2 magnitude data in the sample obtained from the cross-match. The S/N decreases significantly at the faint end of our sample. We decided to set a lower limit of five for the S/N. In the W1 band, only 133 white dwarfs were rejected due to the low S/N.

² The missing 14 955 white dwarfs are either no longer high-confidence white dwarfs or are missing entirely from the white-dwarf catalog because of the improved photometry and astrometry.

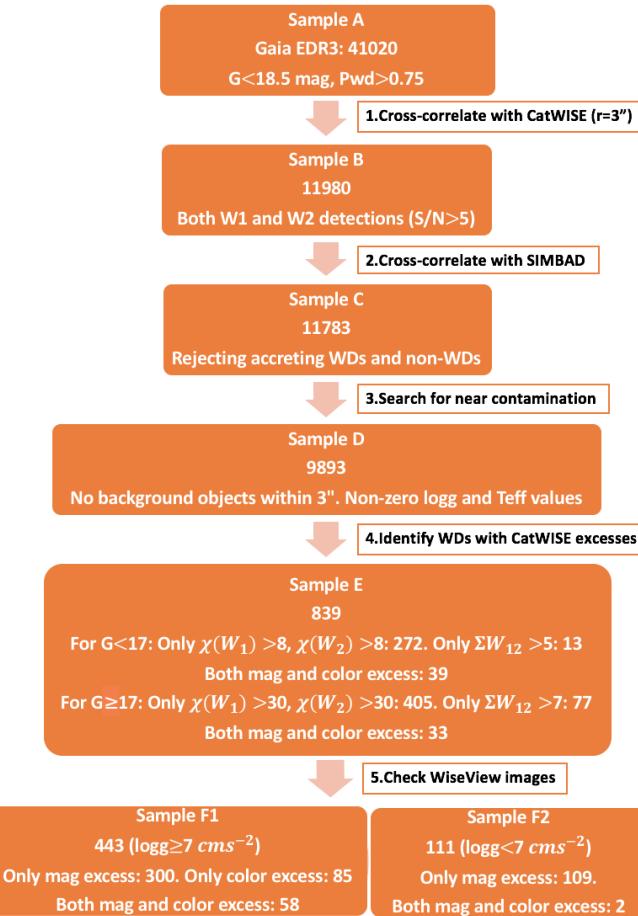


Fig. 1. Flowchart showing the five steps of our selection of infrared excess candidates.

In the W2 band, the clear limiting measurement, 11 906 white dwarfs were rejected. Eventually, we found 11 980 white dwarfs with a $S/N > 5$ in both the W1 and W2 bands (our Sample B).

3.3.2. Cross-correlation with SIMBAD

Some of the sources could be accreting white dwarfs in a binary system, or these may not even be white dwarfs – both of which we wanted to exclude. This can be done by looking at their spectral type (when it is known). We cross-correlated Sample B with the SIMBAD database (Egret et al. 1991). From the 11 980 white dwarfs of Sample B, 11 659 are cataloged in SIMBAD. Among them, 3532 have a spectral type listed. The majority are white dwarfs, but 197 are rejected from our study because the spectral type does not correspond to an isolated white dwarf. We removed these objects even though some spectral types can be erroneous. The rest of the sources do not have a confirmed spectral type or do not appear in SIMBAD, and therefore they cannot be reliably assessed and were kept in this step.

Our final sample after this step (Sample C) was composed of the 3335 confirmed white dwarfs by their spectral type, the 8127 sources cross-matched with SIMBAD but without a confirmed spectral type, and the 321 sources that do not appear on SIMBAD. The total number of sources remaining after Step 3 was 11 783 (Sample C).

3.3.3. Search for background contamination

As mentioned above, WISE has a beam size of 6'', which is much larger than the *Gaia* resolution (on the order of milliarcseconds). The matching by coordinates that we performed between the two catalogs would not be able to detect a false-positive infrared excess due to a background source within the WISE beam (i.e., within 3'' of the *Gaia* white dwarf).

To exclude such contamination, we cross-matched the WISE coordinates of Sample C with the *entire* (not just white dwarfs) *Gaia* EDR3 catalog. Hence, we verified whether more than one *Gaia* source (i.e., potential an infrared emitter) lay within 3'' of the WISE coordinates. We found two or more *Gaia* sources within the WISE beam in 1740 cases. These were excluded from Sample C as potentially contaminated infrared sources.

Additionally, we excluded 111 sources lacking effective temperature and $\log g$ values in the *Gaia* catalog. As these values are required for the next selection step, these sources were removed. This left a final sample of 9893 white dwarfs (Sample D) to be checked for a potential infrared excess.

3.3.4. Identify white dwarfs with infrared excess

The last step was to identify, in Sample D, the white dwarfs that show infrared excess (i.e., that potentially host a debris disk or a companion). As a benchmark for the expected infrared flux in the absence of an excess, we used model fluxes for uncontaminated white dwarfs: pure-hydrogen white-dwarf model atmospheres from Holberg & Bergeron (2006)³. We used the model, providing W1 and W2 absolute magnitude values as a function of a grid of effective temperature, surface gravity, and parallax values. We then interpolated the model fluxes using the *Gaia* Teff and $\log(g)$ values for the individual candidates in our sample (Gentile Fusillo et al. 2021). We note that the uncertainties in Teff and $\log(g)$ are small enough not to play a role in our infrared excess error budget. We computed the apparent W1 and W2 model magnitudes ($m_{\text{mod},i}$) and compared them with the actual observed magnitudes, the difference being interpreted as infrared excess. The uncertainties on the measurements of W1 and W2 magnitude, dominated by the errors in the WISE photometry, are taken into account as described below.

We adopted two measures for an infrared excess: the magnitude excess (in W1 and/or W2) and the (W1–W2) color excess. For a given wavelength, the magnitude excess is $\chi(i)$:

$$\chi(i) = \frac{m_{\text{mod},i} - m_{\text{obs},i}}{\sqrt{\sigma_{\text{mod},i}^2 + \sigma_{\text{obs},i}^2}}, \quad (1)$$

with $i = \text{W1 or W2}$. $\sigma_{\text{mod},i}$ is the model uncertainty, assumed to be 5% of the model flux. $m_{\text{obs},i}$ is the measured W1 and W2 magnitude from WISE. $\sigma_{\text{obs},i}$ is the uncertainty also given by WISE measurements. $m_{\text{mod},i}$ is the predicted WISE magnitude from the model of white dwarfs. The (W1–W2) color excess is characterized by Σ_{W12} :

$$\Sigma_{W12} = \frac{m_{\text{obs},W1} - m_{\text{obs},W2} - (m_{\text{mod},W1} - m_{\text{mod},W2})}{\sqrt{\sigma_{\text{obs},W1}^2 + \sigma_{\text{obs},W2}^2 + \sigma_{\text{mod},W1}^2 + \sigma_{\text{mod},W2}^2}}. \quad (2)$$

In order to define criteria for which values represent an “excess”, we analyzed the magnitude and color-excess distributions ($\chi(i)$ for both W1 and W2, and Σ_{W12}). We considered

³ <https://www.astro.umontreal.ca/~bergeron/CoolingModels/>

Table 2. Median and standard deviation of the magnitude and color-excess methods from Sample D.

Sample D	Median	Standard deviation
<i>G</i> < 17 mag		
$\bar{\chi}$ (W1)	0.34	2.39
$\bar{\chi}$ (W2)	-0.35	2.33
$\bar{\Sigma}_{W12}$	-0.54	1.44
$17 \leq G < 18.5$ mag		
$\bar{\chi}$ (W1)	4.23	8.29
$\bar{\chi}$ (W2)	5.89	6.05
$\bar{\Sigma}_{W12}$	1.02	1.49

two groups of sources, according to their G mag (sources with $G < 17$ mag and $17 \leq G < 18.5$), the second (fainter) one being largely dominated by errors in the WISE photometry. For each group, we calculated the median and standard deviation⁴ of the magnitude excess (for W1 and W2) and the color excess, not considering the upper and lower 10% values of $\chi(i)$ and Σ_{W12} to avoid them being dominated by extreme outliers. Due to the considerable difference between W1 and W2 in the quality of the photometry, we decided to define one magnitude excess criterion for each subgroup. Table 2 collects the values.

Positive values indicate that the model magnitude is fainter than the observed one; that is, the observed one shows an excess. We set the criteria for a white dwarf to have an infrared excess when both $\chi(W1) > 8$ and $\chi(W2) > 8$ for $G < 17$ mag and $\chi(W1) > 30$ and $\chi(W2) > 30$ for $17 \leq G < 18.5$ mag. In our sample, 749 white dwarf candidates showed an infrared excess using these criteria.

Looking at the color excess, positive color means that the flux in the W2 band is higher than the flux in the W1 band. Then, positive color-excess values mean that the difference between the observed colors is larger than the difference between modeled colors. In other words, a greater $\bar{\Sigma}_{W12}$ value means stronger infrared excess. We defined an infrared color excess as $\bar{\Sigma}_{W12} > 5$ for $G < 17$ mag and $\bar{\Sigma}_{W12} > 7$ for $17 \leq G < 18.5$ mag. We found 162 white-dwarf candidates in our sample showing a color excess.

Looking simultaneously at infrared excess and infrared color excess, we found 72 sources in our sample. Our final Sample E contained 839 sources: 677 with only a magnitude excess, 90 with only a color excess, and 72 with both magnitude and color excess.

Figure 2 plots W1 and W2 magnitudes as a function of the infrared magnitude and color excess. Sample D sources are shown in two groups (for $G < 17$ mag in the three upper panels, and $17 \leq G < 18.5$ mag in the three lower panels). Our final infrared-excess candidates are shown in light blue and black, while most sources (shown in purple) are statistically compatible with a magnitude/color excess around zero; that is, compatible with predicted model fluxes for white dwarfs without excess. This confirms a) that the infrared fluxes of the models match the fluxes of a large sample of observed white dwarfs, and b) that white dwarfs with a statistically significant infrared excess are uncommon objects, while still representing on the order of 10% of our Sample D.

⁴ As calculated by TOPCAT for our non-normal distribution; i.e., the square root of the second central moment.

3.3.5. Check WiseView images for contamination

Our final step was to make an additional check for background contamination. In Step 3, we based our criteria entirely on an optical catalog (*Gaia* EDR3), removing background sources found inside the matching radius selected (3 arcsec). Bright infrared background sources, either too faint to be detected in the optical or outside the matching radius, might still contaminate our targets. To identify the possible contaminated sources, we used the WiseView tool (Caselden et al. 2018), allowing us to check the WISE images manually and to identify possible background contamination. We visually checked 839 sources from Sample E, and we eliminated the ones that appeared to be blended or located in very crowded fields (making it very difficult to assess the origin of the infrared excess). We found 285 sources for which the infrared excess cannot be associated with the white dwarf with full certainty – these are listed in our table as “Contaminated”. Our final Sample F contained 554 objects that we qualified as candidate white dwarfs with infrared excess.

We note that in Sample F, we still included white dwarfs with very low surface gravity ($\log g < 7$) cm s⁻², which are potentially unresolved binaries (i.e., double white dwarfs or white dwarf – main sequence binaries). Following our intention to assemble a high-confidence sample, we subdivided the final sample into Sample F1 (with $\log g \geq 7$ cm s⁻²) and Sample F2 (with $\log g < 7$)⁵. Of the 554 sources of Sample F, 443 belong to Sample F1, these are likely to be dusty white dwarfs or white dwarfs with a companion. While our selection steps were thorough, we remind the reader that objects in our Sample F must be treated as candidates, as faint infrared background contamination cannot be excluded with a 100% success rate (Dennihy et al. 2020).

In summary, our final Sample F contains 554 white dwarfs with infrared excess. 409 of these only have a magnitude excess, 85 only have a color excess, and 60 have both magnitude and color excesses (Table 3).

3.4. Magnitude and color excess

Both magnitude and color excesses are frequently used to identify white dwarfs with infrared excess (Kennedy et al. 2012; Wilson et al. 2019; Xu et al. 2020). The magnitude excess requires the measured flux in the infrared to be above predictions for the white dwarf photosphere. This criterion strongly depends on the white dwarf atmosphere models, the flux calibrations of the observations, and the accuracy of the computed distance.

The color excess requires the infrared luminosity of the object to be brighter in the W2 than the W1 band and has the advantage of being a measurement independent of the distance. However, WISE is less sensitive in the W2 than in the W1 band, eventually leading to unreliable results for the color at fainter magnitudes.

Gaia delivers very reliable distances for our entire sample down to our magnitude limit, and the color excess relies on finding a higher W2 magnitude value to identify the source. In our case, sources with both magnitude and color excesses are most reliably identified.

⁵ Understanding that $\log g < 7$ is not a sharply defined limit to exclude binaries, but a good compromise between significantly reducing their number and keeping a sizable high-confidence sample.

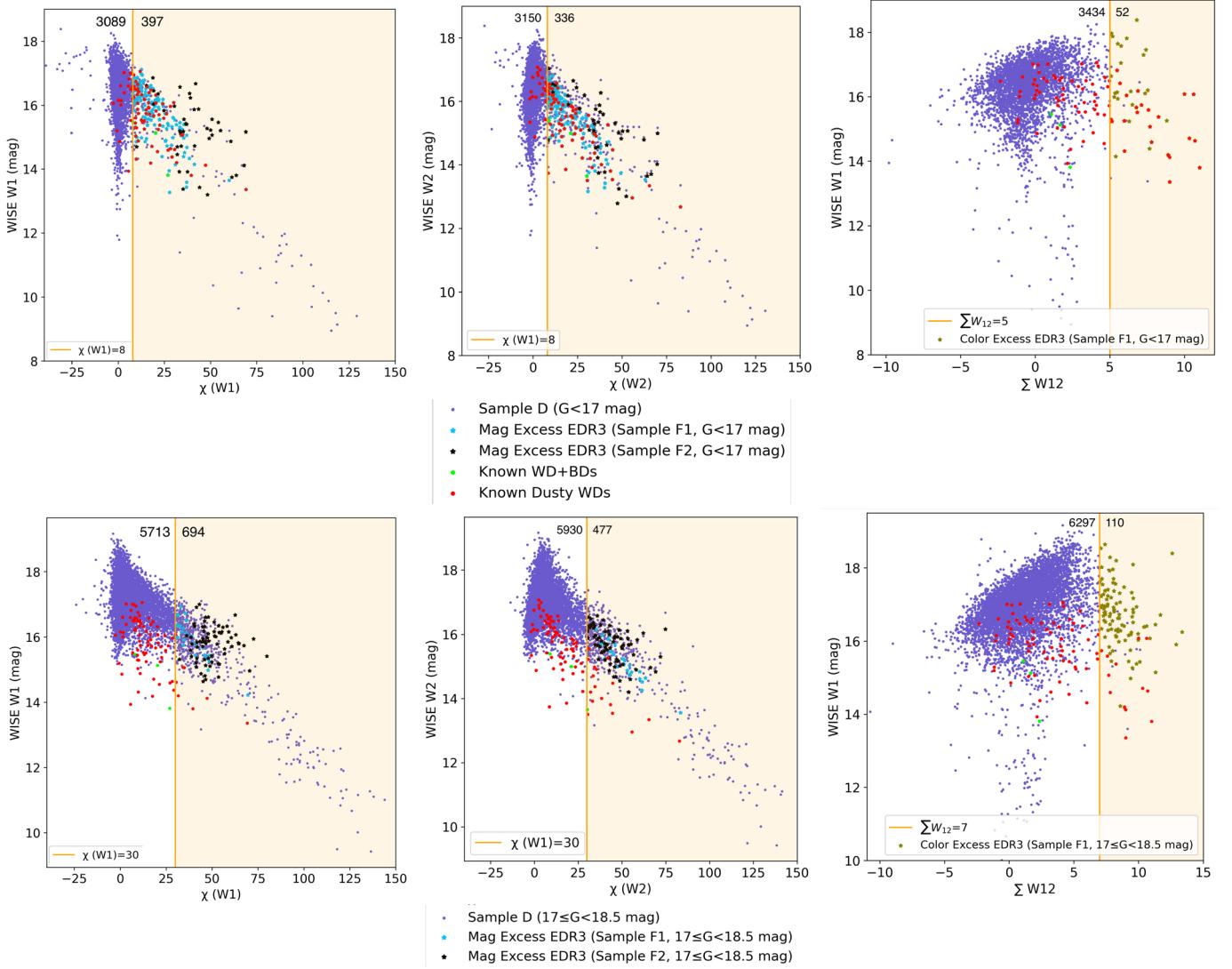


Fig. 2. W1 and W2 mag values as a function of their magnitude and color excess in Sample D. Sample D is divided into white dwarfs with $G < 17$ (first row) and with $17 \leq G < 18.5$ (second row). *Spitzer*-confirmed dusty white dwarfs and white dwarf-main sequence or M dwarf pairs (red); and white dwarfs with brown dwarf companion (green) are represented. The orange line is the cut chosen to consider IR excess beyond it. The numbers next to the line are the number of sources we found on each side. We note that the IR excess distributions are non-normal and that the limit of three standard deviations from the median typically leaves us with 10% of the sample.

4. Discussion

4.1. Final sample

The final high-confidence sample of white-dwarf candidates with infrared excess (hereafter “WD-IR candidates”) contains 554 sources, which is 1.4% of the initial Sample A. The frequency of infrared excess around white dwarfs in our work is $554/9893 \approx 6\%$. The positions on the *Gaia* Hertzsprung–Russell (HR) diagram of the WD-IR candidates are shown in Fig. 3. The majority of the sources (Sample F1, pink) are located on the white dwarf main sequence, in a similar manner to the *Spitzer*-confirmed white dwarfs with infrared excess (black, green). On the other hand, sources with $\log g < 7 \text{ cm s}^{-2}$ (Sample F2, turquoise) lie outside this white dwarf main sequence. As mentioned above, these 111 sources are likely to be binaries.

4.2. Identification of the *Spitzer*-confirmed white dwarfs with infrared excess in the final sample

With our selection criteria, we found 58 out of the 107 *Spitzer*-confirmed white dwarfs to have an infrared excess (these 107 include 93 with debris disks and 14 white dwarf-brown dwarf or M dwarf or main sequence pairs). Twenty-two of our detected sources have both magnitude and color excesses that are under our criteria, 35 only have magnitude excess, and one only has color excess, as shown in Table 4. Seven *Spitzer*-confirmed infrared excess white dwarfs do not have catWISE photometry. Thus, this work finds $58/97=59.8\%$ of the previously identified infrared excesses. The remaining 39 objects present in the *Spitzer* sample were missed in our study, mostly because they do not fulfill our stringent infrared excess criteria (29 sources); the remaining ones were missed due to a low S/N in the W2

Table 3. Sample D, specifying those sources with infrared excesses (Sample F), as well as the contaminated sources (the ones excluded in the step from Sample E to Sample F).

RA (deg)	Dec (deg)	G (mag)	Teff (K)	log g (cm s $^{-2}$)	Plx (mas)	M (M_{\odot})	SpT	W1 (mag)	unW1 (mag)	W2 (mag)	unW2 (mag)	W1Mod (mag)	W2Mod (mag)	$\chi(W2)$	$\chi(W2)$	Σ_{W12}	Final excess
0.030479	29.949942	15	47 982	7.79	5.85	0.59	DA.9	16.25	0.03	16.33	0.08	16.06	16.1	-3.06	-2.44	-0.4	No Excess
0.046868	-26.452967	18	34 592	8.09	2.32	0.71	No	17.71	0.09	16.68	0.12	19.05	12.55	17.88	6.38	6.38	No Excess
0.075741	18.965382	18.2	8505	7.86	7.42	0.52	No	17.02	0.07	17.06	0.2	17.77	17.78	8.31	3.51	-0.12	No Excess
0.115731	43.546467	17.8	11 682	6.13	1.65	0.14	No	16.12	0.03	16	0.06	19.45	19.46	54.9	42.83	1.35	Only Mag
0.147239	31.147528	17.8	11 211	8.02	6.62	0.62	No	16.41	0.03	15.61	0.04	17.91	17.93	23.94	33.57	8.88	Only Color
0.178756	1.539292	16.2	10 186	8	15.03	0.6	DA	16.21	0.03	16.19	0.07	16.2	16.22	-0.2	0.39	0.43	No Excess
0.210338	-20.858767	16.3	17 078	7.86	8.15	0.54	No	16.32	0.04	16.39	0.11	16.86	16.89	8.24	4.16	-0.35	No Excess
0.222155	-38.737207	17.4	6164	7.99	20.01	0.58	No	16.23	0.03	16.34	0.08	16.16	16.14	-1.14	-2.08	-1.15	No Excess
0.446258	-60.809296	17.4	13 664	7.88	6.1	0.54	No	16.42	0.04	16.07	0.07	17.73	17.75	19.31	19.22	3.36	No Excess
0.480890	45.342468	17.8	6315	8.39	20.84	0.84	No	16.22	0.03	16.4	0.08	16.63	16.62	6.83	2.27	-1.73	No Excess
0.563613	7.566252	17.7	7529	7.97	12.11	0.58	DA	16.87	0.05	16.66	0.12	17	17	1.73	2.55	1.4	No Excess
0.566957	7.563682	17.9	7864	8.26	12.35	0.76	DAH	17.48	0.08	17.22	0.19	17.32	17.33	-1.65	0.61	1.28	No Excess
0.581903	-52.490671	16.8	10 035	8.05	12	0.63	No	16.27	0.03	16.12	0.07	16.78	16.8	8.08	7.83	1.6	No Excess
0.645717	17.455259	15.8	21 271	7.96	9.2	0.61	DA2.4	16.68	0.04	16.46	0.1	16.52	16.55	-2.42	0.88	2.02	No Excess
0.679885	7.648940	17.7	18 706	7.98	4.54	0.61	DA	17.18	0.06	16.92	0.17	18.21	18.24	13.04	7.56	1.53	No Excess
0.725319	-65.552751	18.3	5778	8.06	15.81	0.62	No	17.53	0.07	17.37	0.18	16.84	16.81	-7.91	-2.96	0.64	No Excess
0.726501	46.234035	17.8	5262	7.91	22	0.53	No	15.79	0.02	15.73	0.04	16.07	16.01	4.73	4.11	0.11	No Excess
0.796327	-18.3666871	16.2	14 695	7.92	10.1	0.57	DA3.3	16.73	0.04	16.85	0.15	16.63	16.66	-1.47	-1.23	-0.53	No Excess
0.803584	-56.708302	17.4	21 552	7.76	3.79	0.5	No	17.95	0.1	17.53	0.21	18.13	18.16	1.55	2.97	1.91	No Excess
0.812131	-20.121792	17.9	9553	8.28	9.47	0.78	No	16.42	0.04	16.22	0.1	17.71	17.73	18.63	13.78	1.68	No Excess

Notes. The RA, Dec, G magnitude, effective temperature (Teff), parallax (Plx), and mass (M) are taken from *Gaia* EDR3 catalog (Gentile Fusillo et al. 2021). The spectral type (SpT), if it is known, is taken from SIMBAD. W1 and W2 magnitudes, as well as their uncertainties (unW1 and unW2) are taken from CatWISE. The calculated W1 and W2 model values (W1Mod and W2Mod) are also represented in the table. Magnitude ($\chi(W1)$) and color (Σ_{W12}) excesses values are shown. Final excess is the assessment of the infrared excess based on the methods used in this work. OnlyMag and OnlyColor mean the infrared excess is identified from the W1 and W2 magnitude excesses or the (W1–W2) color excess, respectively. Color+Mag means the infrared excess has been identified with both methods. Contaminated refers to sources rejected due to visual contamination in WISEView images. We show, for reference, the first 20 lines of 9893 in total.

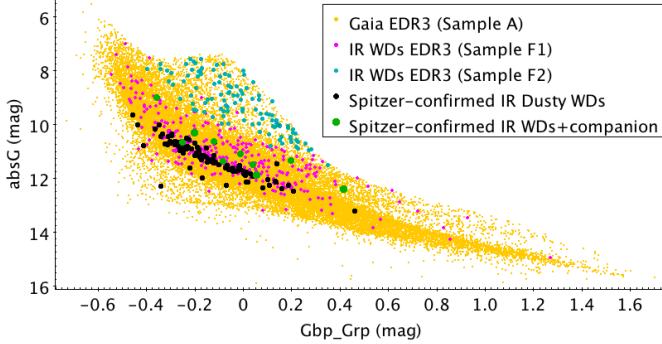


Fig. 3. *Gaia* HR diagram of white dwarfs from initial Sample A (yellow) and final Sample F (pink).

Table 4. Summary of the *Spitzer*-confirmed white dwarfs with an infrared excess as identified by this work.

Samples EDR3	A	B	C	D	E	F
<i>Spitzer</i> dust disks	91	83	82	77	49	48
<i>Spitzer</i> WD+companion	13	13	13	11	10	10

band (1), being a confirmed hot subdwarf by SIMBAD (1), likely background contamination (7), and contamination seen in the WiseView images (1).

This demonstrates that for individual objects, *Spitzer* is able to identify infrared emission at significantly fainter levels than when using WISE, as in this study. Using the WISE survey has the advantage of being able to assemble a much larger sample of infrared excess candidates. The comparison also shows that our criteria for including objects in our final infrared excess sample are rather conservative and only include the *Spitzer*-confirmed candidates with the strongest infrared excesses.

4.3. Comparison with the previous WISE searches

Two studies before this one searched for white dwarfs with infrared excess using the WISE catalog. Barber et al. (2014; following up on 16 sources of a study that found 52 candidates using SDSS DR7 for the optical part) found the frequency of white dwarfs with infrared excess to be 3–4% using *Spitzer*, which is slightly lower than what is presented in our work ($\approx 6\%$, which is comparable to 6.6% from Xu et al. (2020)). We believe that this difference can be explained by their smaller sample size and their stringent attempt to exclude false-positives.

Using unWISE and *Gaia* DR2, Xu et al. (2020) reported 188 white dwarfs with infrared excess, with a frequency of $188/2847 \approx 7\%$, which is similar to our findings. In Fig. 4, we compare the number of white dwarfs with infrared excess found in their study and in this work, as a function of their W1 and W2 magnitude. First, we note that using the more recent versions of the WISE and *Gaia* catalogs as in this study, the sample is increased by a factor of about three (see yellow vs. pink histogram). The two samples overlap, and we recovered 106 of the 188 infrared excess candidates identified by Xu et al. (2020); that is, $106/188=56\%$. All 188 sources are found in our initial Sample A, but 82 were eliminated in our selection steps as detailed in Table 5.

Most of the sources (56 of 82) are discarded when applying our infrared excess criteria (from our Samples D to E). We compared the parameters used for each white dwarf for

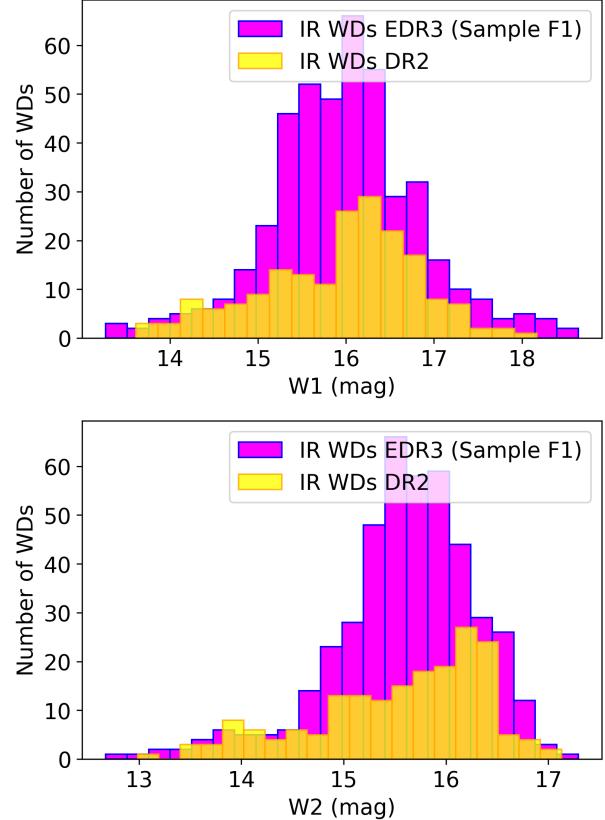


Fig. 4. Comparison of the number of infrared excess candidates found in this study (Sample F1, pink) and in (Xu et al. 2020; using the *Gaia* DR2 and unWISE catalogs – in yellow) as a function of their W1 (upper panel) and W2 (lower panel) magnitudes.

Table 5. Summary of the number of infrared excess candidates (Sample E) in *Gaia* DR2 from Xu et al. (2020) that are found in each sample of our work.

	A	B	C	D	E	F
DR2 candidates recovered	188 (all)	171	168	165	109	106

the infrared excess calculation in Xu et al. (2020) and in our work: effective temperature, $\log g$, parallax, W1, W2, and the uncertainties of W1 and W2. All the values are (as expected) very similar (whether using *Gaia* DR2 or DR3; CatWISE or unWISE), except for the quoted uncertainties in W1 and W2. CatWISE uncertainties are smaller than the ones reported in unWISE for almost all of the sources. A smaller uncertainty implies computing greater magnitude excess and color excess values and, accordingly, greater derived median and standard deviation. Consequently, the infrared excess limit used as selection criteria changed between the two studies. Xu et al. (2020) considered a white dwarf to have infrared excess if $\chi(W1) > 5$, $\chi(W2) > 5$ and $\sum_{W12} > 3$, while we incremented in this study these numbers to $\chi(W1) > 8$, $\chi(W2) > 8$ for $G < 17$ mag and $\chi(W1) > 30$, $\chi(W2) > 30$ for $17 \leq G < 18.5$ mag; and $\sum_{W12} > 5$ for $G < 17$ mag and $\sum_{W12} > 7$ for $17 \leq G < 18.5$ mag.

Eventually, while following very similar methodologies in the two studies, the reduced uncertainties in the CatWISE catalog compared to unWISE led us to re-evaluate the exact limits above which we considered a source to have an infrared excess

Table 6. Summary of the number of white-dwarf infrared-excess candidates (Sample E) from Xu et al. (2020) that are recovered in this work as a function of the method used (magnitude excess, color excess, or both).

	Previous work	Match samples E DR2 and F EDR3	Success rates
MagOnlys	88	74	84.1%
ColorOnly	53	8	15.1%
Color+Mag	47	25	51.1%

with high confidence. The sample presented in this work used more stringent criteria than Xu et al. (2020) and only includes their strongest infrared excess candidates.

We also compare the number of matches found between infrared excess candidates (Samples E DR2 and F EDR3) depending on the infrared excess methods (Table 6). Color excess does not recover the sources well, but this is consistent with the fact that this method is not as useful due to the uncertainties of the W2 band. For the magnitude method, we confirm our work has a relatively high success rate and that both works are consistent.

4.4. Properties of the infrared-excess candidates

Finally, we assessed the temperature and mass of the 443 white dwarfs with infrared excess with $\log g \geq 7 \text{ cm s}^{-2}$. The upper plot of Fig. 5 shows that white dwarfs have a mean temperature on the order of 10 000 K. For the coolest white dwarfs, we found 89 (out of 443) sources with temperatures lower than 10 000 K, in comparison with the 21 (out of the 1252) found in Xu et al. (2020), and we confirm that there are fewer dust disks around cooler white dwarfs, as found previously. For the hottest white dwarfs ($>30 000 \text{ K}$), the number of candidates has tripled with our work compared to previous work Xu et al. (2020). The hottest *Spitzer*-confirmed white dwarf with infrared excess has a temperature of around 34 000 K (Lai et al. 2021). We found 26 sources with a temperature higher than this limit. However, dust around these hot white dwarfs cannot reside within the tidal disruption radius due to the high levels of stellar irradiation leading to sublimation. Instead, this dust must reside further from the star, posing questions as to whether these objects represent a different, exciting set of dusty objects (Farihi et al. 2014; Bonsor & Wyatt 2010).

The bottom panel of Fig. 5 shows a histogram of the WD masses, indicating that there is no apparent trend with white-dwarf mass. Moreover, we checked that the population with and without IR excesses are consistent and that they follow the same distribution, with a few objects having small and large masses, and most of the candidates having an intermediate mass around 0.6 solar masses. Below around 0.3 solar masses, white dwarfs are called extremely low-mass (ELM) white dwarfs. We found 24 infrared excess candidates of this type, which is unexpected and very unusual. These white dwarfs are likely the result of binary processes, including envelope stripping (Sarna et al. 2000). The infrared excesses likely have a different origin to the main population, highlighting evolutionary processes related to binarity.

5. Conclusions

This work presents a catalog of 554 high-confidence white dwarfs with infrared excess. The catalog was created by cross-matching the *Gaia* EDR3 white-dwarf catalog (with magnitude

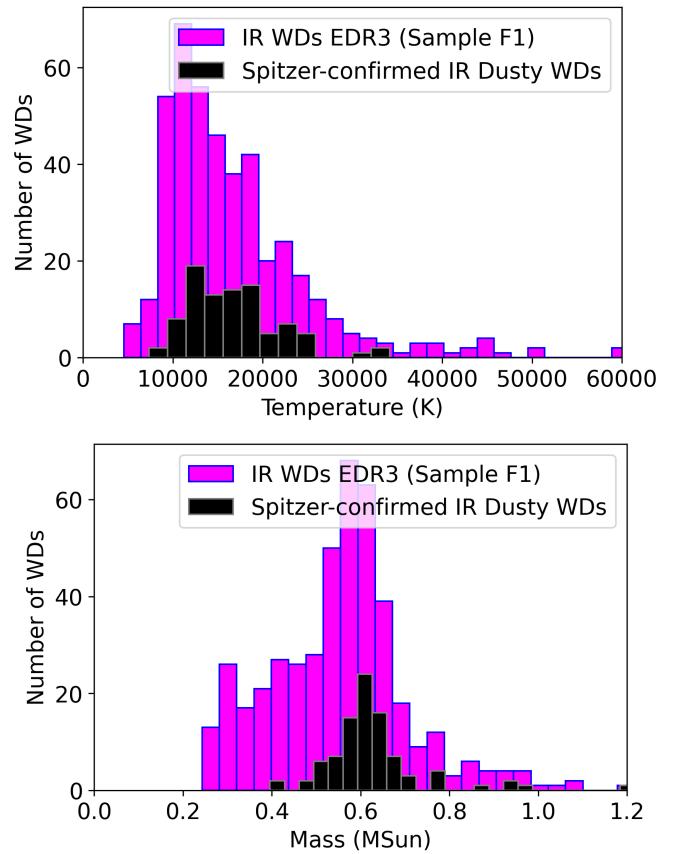


Fig. 5. Comparison of final infrared excess EDR3 candidates from our work (Sample F1, pink) and *Spitzer*-confirmed dusty white dwarfs (black) depending on their temperature and mass.

limit of $G < 18.5 \text{ mag}$) and the CatWISE infrared catalog. Successive selection criteria were applied to exclude sources in which the infrared excess is not reliably associated with the white dwarf star. Improvements to the reliability of CatWISE over the previous WISE catalogs made this work possible, as good quality infrared measurements were essential to this study.

Pure-hydrogen white-dwarf model atmospheres were used to identify excess emission in the infrared. Both color and magnitude excess were used to identify excess emission. Due to the rapidly decreasing photometric quality in the W2 band as sources become fainter, magnitude excesses are deemed to be more reliable than color excesses.

In our final sample, 443 of the 554 objects have a $\log g \geq 7 \text{ cm s}^{-2}$, representing a subsample with a low probability of containing unresolved white-dwarf binaries. Of these, 300 show only a magnitude excess, 85 show only a color excess, and 58 show both magnitude and color excesses. These white dwarfs with excess infrared emission are good candidates for accreting planetary debris. This work provides a significant (a factor ≈ 3) increase in the number of dusty white-dwarf candidates potentially suited for a follow-up investigation of their planet composition. Although from this study alone, we cannot determine whether these objects show infrared excess because of dust disks or low-mass companions; moreover, some cases of faint background contamination cannot be fully excluded either.

The work presented here was aimed at identifying “high-confidence” candidates, and we therefore remained conservative in our identification of excess infrared emission. 59.6% of the

Spitzer-confirmed white dwarfs with infrared excess were identified, as were 56% of the sources found in Xu et al. (2020) using *Gaia* DR2 and unWISE. The remaining *Spitzer*-confirmed white dwarfs are likely intrinsically too faint to be seen in CatWISE.

This new catalog of white dwarfs with infrared excess has many potential applications, including the study of the accretion of planetary material by white dwarfs and the identification of new white-dwarf-brown-dwarf pairs. White dwarfs that have accreted planetary material provide key information regarding exoplanetary composition and bring us closer to the detection of life beyond the Solar System.

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