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Population of X-ray Sources in the Intermediate-Age Cluster NGC 3532: a Test Bed for Machine-Learning Classification

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ABSTRACT

Open clusters are thought to be the birth place of most stars in the Galaxy. Thus, they are excellent 10 laboratories for investigating stellar evolution, and X-ray properties of various types of stars (includ-11 ing binary stars, evolved stars, and compact objects). In this work, we investigate the population of 12 X-ray sources in the nearby 300-Myr-old open cluster NGC 3532 using Chandra X-ray Observatory 13 and multi-wavelength data from several surveys. We apply a random-forest machine-learning pipeline 14 (MUWCLASS) to classify all confidently detected X-ray sources (S/N > 5) in the field of NGC 3532. 15 We also perform a more detailed investigation of brighter sources, including their X-ray spectra and 16 lightcurves. Most X-ray sources are confirmed as coronally-active low-mass stars, many of which are 17 confidently identified by MUWCLASS. Several late B or early A-type stars are relatively bright in 18 X-rays, most of which are likely binaries. We do not find any compact objects among X-ray sources 19 reliably associated with NGC 3532, down to the limiting X-ray flux of $\sim 2 \times 10^{-15} \,\mathrm{erg \, s^{-1} \, cm^{-2}}$, cor-20 responding to $L_X \sim 6 \times 10^{28} \,\mathrm{erg \, s^{-1}}$ at the cluster's distance. We also identify several Galactic sources 21 beyond NGC 3532 that differ from typical coronally active stars, and were classified by MUWCLASS 22 as potential compact objects. Detailed investigation reveals that these sources may indeed belong to 23 rarer classes, and deserve follow up observations. 24

1. INTRODUCTION

²⁶ Most stars are born in dense, gravitationally bound ²⁷ star clusters which are broadly classified into globular ²⁸ clusters (GC) and open clusters (OC). GCs are ancient ²⁹ (~ 10 Gyr), massive (> $10^6 M_{\odot}$) and are typically lo-³⁰ cated off the Galactic disk, while OCs tend to be young ³¹ (< 1 Gyr), less massive (< $10^5 M_{\odot}$), and located within ³² the Galactic disk (Larsen 2010). Old (several Gyr) OCs ³³ are known to exist, but are rare, indicating that they ³⁴ tend to gravitationally dissolve on timescales of hun-³⁵ dreds of Myrs.

By the age of a few million years, gas which is not used in star formation is expelled from the cluster via several mechanisms, including ionization, stellar winds, supernovae, and radiation pressure (Larsen 2010; Farias 40 et al. 2015). At this age, the largest stars (O- and early ⁴¹ B-type) have gone supernova, leaving behind compact ⁴² objects (CO) in the form of neutron stars (NSs) and ⁴³ black holes (BHs).

⁴⁴ The expulsion of gas reduces the cluster's gravitational ⁴⁵ binding energy, and may cause the dissolution of more ⁴⁶ than 90% of OCs before 100 Myrs (Larsen 2010; Lada ⁴⁷ & Lada 2003). At that epoch, if the cluster survived gas ⁴⁸ expulsion, mass transfer in binaries becomes the prime ⁴⁹ factor for stellar evolution, while cluster evolution is pri-⁵⁰ marily driven by stellar dynamics and external interac-⁵¹ tions. These clusters still undergo dissolution due to ⁵² two-body relaxation, external shocks, and stellar evolu-⁵³ tion. Only clusters with total initial mass > $10^4 M_{\odot}$ are ⁵⁴ likely to survive beyond 1 Gyr (Larsen 2010).

In clusters that are a few hundred Myr old or younger,
X-ray sources are typically represented by coronally active lower mass stars and various types of Young Stellar
Objects (YSOs), Active Binaries (e.g. RS CVn and
BY Drac. systems), Cataclysmic Variables (CVs),
and colliding-wind binaries (CWBs). Most NSs and BHs

⁶¹ born in supernova (SN) explosions are expected to re⁶² ceive strong natal kicks and, hence, should escape the
⁶³ cluster quickly (van der Meij et al. 2021). However, some
⁶⁴ NSs and BHs could still remain bound to the cluster,
⁶⁵ e.g., NSs formed from electron capture SNe, especially
⁶⁶ if the SN explosion takes place in a binary system (Igo⁶⁷ shev et al. 2021; Stevenson et al. 2022; Gessner & Janka
⁶⁸ 2018).

With the exception of sources from a few special vo classes, (e.g., accreting NS with cyclotron lines in their spectra, AGN with redshifted broad iron lines, pulsatze ing X-ray sources), little can be learned about the X-ray source nature *solely* from X-ray data, especially if the source is not bright enough for a high resolution spectrum (e.g., detecting spectral lines helps to distinguish between thermal plasma and nonthermal emission). The vast majority of X-ray sources in clusters are relatively faint and their nature is largely unknown. Therefore, multi-wavelength analysis of these sources is crucial to discern their nature.

This paper, which is the first in a series of papers about the intermediate age clusters observed by the Chandra X-ray Observatory (CXO), presents the methodology and analysis of multiwavelength (MW) data for a well-known nearby cluster, NGC 3532, which has been studied in detail in the optical and near infrared (NIR).

88

1.1. NGC 3532

⁸⁹ NGC 3532 is located 484^{+35}_{-30} pc away (Fritzewski ⁹⁰ et al. 2019) in the Carina region of the southern Milky ⁹¹ Way. Its distance and Galactic coordinates ($l = 289.6^{\circ}$, ⁹² $b = 1.3^{\circ}$) place it well within the Galactic plane. NGC ⁹³ 3532 has an accepted age of ~300 Myr (Fritzewski et al. ⁹⁴ 2019). Fernandez & Salgado (1980) estimated the total ⁹⁵ cluster mass to be a moderate 2000 M_☉, with brighter ⁹⁶ stars covering a $14' \times 20'$ (2×3 pc) central region and ⁹⁷ fainter stars extending over $1^{\circ} \times 1^{\circ}$ ((8×8 pc, see Fig-⁹⁸ ure 1). NGC 3532 exhibits a relatively low extinction ⁹⁹ $E(B-V) = 0.034 \pm 0.012$ (Fritzewski et al. 2019) which ¹⁰⁰ allows for the detection of fainter and softer sources.

NGC 3532 is covered by modern optical surveys, including the VST Photometric H α Survey of the Southros ern Galactic Plane and Bulge (VPHAS+; Drew et al. 2014), the DECam Plane Survey 2 (DECaPS2; Saydros jari et al. 2022), and Gaia eDR3 (Brown et al. 2021) and has also been the subject of dedicated spectroscopic ror (Fritzewski et al. 2019) and photometric studies (Clem ros et al. 2011).

¹⁰⁹ Temporal monitoring of NGC 3532 has been carried ¹¹⁰ out with a 42-day long campaign with CTIO's Yale 1-¹¹¹ m telescope (Fritzewski et al. 2021). Identifications of ¹¹² variable stars in the NGC 3532 field are also available ¹¹³ from the catalog of large-amplitude variables in Gaia ¹¹⁴ DR2 (Mowlavi et al. 2021).

¹¹⁵ Spectral classifications of optical stars in NGC 3532 ¹¹⁶ have been performed by Eggen (1981) and Fritzewski ¹¹⁷ et al. (2019). Fritzewski et al. (2019) confirmed 660 ¹¹⁸ member stars within NGC 3532 using proper motion ¹¹⁹ data from Gaia DR2, with the expectation that the ¹²⁰ cluster hosts over 1,000 stars in total, while Clem et al. ¹²¹ (2011) estimated over 2,000 stars in total when account-¹²² ing for binaries.

Using a deep optical survey with the Cerro Tololo 123 ¹²⁴ Inter-American Observatory, Clem et al. (2011) derived ¹²⁵ a mass function power-law index of -2.54 for the higher $_{126}$ mass star range (> 2 M_{\odot}; assuming 40 stars > 2 M_{\odot}) ¹²⁷ from Figure 21 of Clem et al. 2011), which corresponds $_{128}$ to ~ 21 stars with initial mass $> 3 \,\mathrm{M}_{\odot}$ that have died at $_{129}$ the cluster age of 300 Myr, including $\sim 5 \text{ stars} > 8 \text{ M}_{\odot}$ 130 that could form NSs or BHs, leaving lower mass B8V-¹³¹ B9V stars as the heaviest remaining stars. Clem et al. $_{132}$ (2011) also estimated a binary fraction of ~ 27%, based ¹³³ on the excess brightness, and listed 32 known and candi-¹³⁴ date WDs, with photometry and location on the CMD ¹³⁵ compatible with NGC 3532 membership. Dobbie et al. ¹³⁶ (2012) confirmed spectroscopically the cluster member-¹³⁷ ship of a total of seven WDs in NGC 3532. They in- $_{138}$ ferred the WD masses to be 0.76-1.00 ${\rm M}_{\odot}$ and corre-¹³⁹ sponding progenitor masses to be $3.7-6.9 \text{ M}_{\odot}$. Raddi ¹⁴⁰ et al. (2016) confirmed three more member WDs, with ¹⁴¹ VPHAS J110358.0-583709.2 being one of the most mas-142 sive WDs found in open clusters. This WD has a mass of $_{143}$ 1.13 M_{\odot}, and a modeled progenitor mass of 8.80 or 9.78 $_{144}$ M_{\odot}. This may be an Oxygen/Neon WD, or otherwise ¹⁴⁵ was formed from a binary merger (Raddi et al. 2016). ¹⁴⁶ No NSs or BHs have been reported in NGC 3532.

¹⁴⁷ Dedicated analysis of X-ray sources in NGC 3532 ¹⁴⁸ dates back to the ROSAT era. Franciosini et al. (2000) ¹⁴⁹ analyzed ROSAT data for NGC 3532 observed from ¹⁵⁰ 1996-1997, discovering ~50 X-ray sources, above 4σ de-¹⁵¹ tection significance level, fifteen of which have optical ¹⁵² counterparts (belonging to the cluster) located within ¹⁵³ 10" from the corresponding X-ray source. Most ROSAT ¹⁵⁴ X-ray sources were matched to cluster F-type stars. ¹⁵⁵ Four A-type stars were also detected, with their X-ray ¹⁵⁶ emission suspected to be due to unseen companions. Si-¹⁵⁷ mon (2000) analyzed the same ROSAT data, discovering ¹⁵⁸ 43 X-ray sources above 4σ detection significance level.

¹⁵⁹ With 174 optical cluster stars selected by Franciosini ¹⁶⁰ et al. (2000) within 17' of the ROSAT pointing, the ¹⁶¹ chance coincidence probability of one X-ray source to be ¹⁶² matched **with at least one** cluster star, assuming the

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¹⁶³ stars are uniformly distributed across the sky, is 1.7%.¹ ¹⁶⁴ However, with an updated list of cluster members from ¹⁶⁵ Gaia DR2 (Jaehnig et al. 2021), ~ 550 probable cluster ¹⁶⁶ member sources are detected in the same 17' radius field. ¹⁶⁷ The chance coincidence probability is then 5.1%. As ¹⁶⁸ NGC 3532 sits in the Galactic plane, there's also a large ¹⁶⁹ number of Galactic background stars. With > 48,000 ¹⁷⁰ Gaia DR3 sources in the 12' field around the cluster cen-¹⁷¹ ter, the probability that an X-ray source is matched to ¹⁷² at least one star is nearly 100%.

Thus, in both ROSAT studies, large positional uncertainties (PUs) of ROSAT sources prevented definitive to determination of counterparts in most cases, and the autropy three than flaring low mass three three the studying X-ray sources in the densely populated galactic fields. Both ROSAT studies indicated the hydrogen column density toward NGC 3532 to be $n(H) = 2 \times 10^{20} \text{ cm}^{-2}$.

The archival CXO data on NGC 3532 offer broader 182 coverage in photon energies, better sensitivity, and sub-183 ¹⁸⁴ arcsecond angular resolution. The greatly improved ¹⁸⁵ positional accuracy and access to fainter X-ray source populations motivated us to carry out a detailed multi-186 wavelength study of NGC 3532, with a focus on classifi-187 188 cation of X-ray sources and identification of any unusual 189 objects. For this purpose, we make use of our machine ¹⁹⁰ learning multi-wavelength classification pipeline, MUW-CLASS, described in detail in Yang et al. (2022). In Sec-191 ¹⁹² tion 2, we describe the CXO observation of NGC 3532, ¹⁹³ the multi-wavelength catalogs, and the crossmatching ¹⁹⁴ procedure. In Section 3, we assess bulk properties of ¹⁹⁵ CXO sources using multi-wavelength plots, including ¹⁹⁶ color-magnitude diagrams (CMDs) and color-color Diagrams (CCDs). In Section 4, we present Machine Learn-197 ¹⁹⁸ ing (ML) classification results of X-ray sources in NGC ¹⁹⁹ 3532. In Section 5, we follow up with more detailed ²⁰⁰ analysis of selected X-ray sources using their X-ray spectral and multi-wavelength properties in conjunction with 201 ²⁰² the ML classification results, including a discussion of candidate compact objects. Finally, Section 6 summa-203 204 rizes our findings.

2.0BSERVATIONS AND ARCHIVAL DATA2062.1. CXO data

²⁰⁷ CXO conducted a single observation (ObsID 8941) of ²⁰⁸ NGC 3532 with the Advanced CCD Imaging Spectrom-²⁰⁹ eter (ACIS; Garmire et al. (2003)) from 2008-10-23 to 210 2008-10-25 (MJD 54762-54764), for a total of 131,858 s $_{211}$ (~36 hours). About half of the cluster (see Figure 1; ²¹² top panel) was imaged on the ACIS-I array operated in $_{213}$ timed exposure mode (with time resolution of 3.2 s) us-²¹⁴ ing the Very Faint telemetry format (which provides a ²¹⁵ lower background). The CXO image is shown in the bot-²¹⁶ tom panel of Figure 1. The Chandra Source Catalogue 217 2.0 (hereafter CSC2; Evans et al. 2020), released in 2020, ²¹⁸ contains detailed information (e.g., fluxes and variability ²¹⁹ measures) on a per-observation level, a stack-level, and ²²⁰ a master-level. We use CSC2 to extract fluxes in three ²²¹ non-overlapping energy bands (hard band h = 2.0-7.0 $_{222}$ keV, medium band m = 1.2-2.0 keV, soft band s = 0.5- $_{223}$ 1.2 keV), as well as the broadband flux (b = 0.5-7.0 keV). $_{224}$ CSC2 provides the mode (F_{mode}), as well as the lower $_{225}$ and upper limits at 1- σ confidence ($F_{\rm lo}$ and $F_{\rm hi}$) to the ²²⁶ mode to characterize the flux distribution for each source ²²⁷ in the catalog. We calculate the mean and the variance, ²²⁸ using the same equation from Yang et al. (2022), i.e. 229 assuming the flux distribution to be the Fechner distri-²³⁰ bution with the equations from Possolo et al. (2019).

We only select sources with signal-to-noise ratio > 5and with off-axis angles < 10'. We also require the Xray sources to have valid flux measurements (that are not missing/null values) in at least one energy band for ML classification (see Section 4). From an initial list of 300+ X-ray sources available in CSC2, 131 sources pass our selection criteria. The properties of these sources are compiled into a comprehensive machine-readable master table available online (a subset of this large table is shown in Table 2). Each source in the master table is assigned a unique identification number which is used throughout the rest of this paper.

We construct three hardness ratios (HRs) from the three CSC2 fluxes:

$$\mathrm{HR}_{ms} = \frac{f_m - f_s}{f_m + f_s},\tag{1a}$$

$$HR_{hm} = \frac{J_h - J_m}{f_h + f_m},$$
 (1b)

$$HR_{h(ms)} = \frac{f_h - (f_m + f_s)}{f_h + f_m + f_s}.$$
 (1c)

CSC2 does not apply any astrometric corrections to their X-ray coordinates, which is accounted for with a systematic error of 0.71" (95% confidence) to account for this. Rather than using these PUs with uniformly added systematic uncertainty, we calculate the X-ray PUs using the empirical equation 12 from Kim et al. (2007).

Then, we apply our own astrometric corrections. We use the CIAO wcs_match algorithm to align the co-

¹ The chance coincidence probability obeys a Poisson distribution, with λ given by the average number of stars expected within the area of the X-ray source's positional uncertainty.



Figure 1. The top panel shows the Digital Sky Survey image of NGC 3532 with the CXO ObsID 8941 (analyzed in this paper) ACIS field of view overlayed (white squares). The red cross shows the cluster center (Clem et al. 2011). The bottom panel shows the ACIS-I image. An animated version of this image is available, showing 0.5 ks slices of the observation.

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²⁵⁹ ordinates of CSO sources to the Gaia eDR3 catalog ²⁶⁰ (see Appendix B). We find an astrometric correction of ²⁶¹ Δ RA cos(DEC) = 0.23" and Δ DEC = 0.15" with a 1- σ ²⁶² alignment uncertainty of 0.092", which is then added to ²⁶³ the X-ray PUs in quadrature.

Several metrics for detecting intra-observation source variability are available from CSC2, including P-values based on Kolmogorov-Smirnov and Kuiper's statistics. We decided to use Kuiper's statistics, as it is more robust.² In this work, sources with Kuiper variability probability above 99% ($\approx 2.6\sigma$) are taken as variable.

2.2. Gaia

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The Gaia eDR3 catalog was released on December 272 2020 (Brown et al. 2021). It contains positions, pho-273 tometry, parallax, and proper motion data for 1.8 billion 274 sources. Typical PUs range from ~ 0.02 mas at G < 15 275 to ~ 1.0 mas at G = 20.

Gaia's photometric information is provided in the 276 broad G band (330-1050 nm) and two narrower BP (330-277 278 680 nm) and RP (640-1050 nm) bands. The Gaia G $_{279}$ band is sensitive to about G = 21, with a magnitude uncertainty of 0.3 mmag at G < 13, rising to 6 mmag 280 at G = 20 (Brown et al. 2021). The BP band overes-281 282 timates the flux of faint red sources, leading to these sources appearing bluer than they should be. BP uncer-283 tainties increase from 0.9 mmag at G < 13 to 108 mmag 284 285 at $G = 20.^3$ (Brown et al. 2021)

From Gaia eDR3, distances to 1.3 billion objects were 286 287 estimated from parallax data by Bailer-Jones et al. (2021). These distances, $r_{\rm geo}$, are purely geometric, i.e., 288 ²⁸⁹ they do not rely on photometry. The accuracy of these ²⁹⁰ distances depends heavily on the reliability of the parallax measurement, so only distances inferred from pos-291 ²⁹² itive parallax measurements, with $\pi/\sigma_{\pi} >= 2$ are used ²⁹³ in our ML classification (see Section 4). A large peak is seen in the distribution of source distances around 475 294 ²⁹⁵ pc, consistent with the NGC 3532 cluster distance of 484 pc derived from Gaia DR2 (Fritzewski et al. 2019). 296

Shortly before the submission of this work, Gaia DR3 was released. While the release did not include new astrometry or photometry, many derived astrophysical parameters for millions of sources were made available, including distance, mass, age, temperature, spectral type, and emission lines (Collaboration et al. 2022). These parameters were derived using the Apsis Pipeline, which includes multiple, independent analysis modules. Although the quality of any one parameter should be taken with caution, when the stellar parameters from independent modules are consistent, these parameters should be more reliable. Therefore, we supplement our analysis of NGC 3532 with Gaia DR3 astrophysical parameters, when they are consistent **between** Gaia modules and applicable. We primarily used the ESP-ELS module for the classification of spectral types, the FLAME module for mass and age, and the GSP-Phot Aeneas module for temperature. While multiple modules provide distances, Collaboration et al. (2022) suggested that they may not be reliable, so we continued to use the Gaia of eDR3 distances from Bailer-Jones et al. (2021).

2.3. 2MASS

The Two Micron All-Sky Survey (2MASS) is a nearinfrared (NIR) all sky survey conducted between 1997-2001 (Skrutskie et al. 2006). 2MASS conducted observations in the near-infrared J (1.25 μ m), H (1.65 μ m), and K (2.16 μ m) bands, with 10 σ point source detection levels at 15.8, 15.1, and 14.3 mag respectively. For sources with magnitudes in the K band between 8.5-13 mag, the photometric uncertainty is about 0.03 mag. The astrometric accuracy ranges from < 100 mas for brighter sources to > 200 mas for fainter sources above 16 mag.

2.4. WISE

The WISE telescope is an infrared (IR) all-sky survey mission launched in 2009. WISE conducts observations in 4 infrared bands, W1 (3.4 μ m), W2 (4.6 μ m), W3 (12 μ m), and W4 (22 μ m), with a full width at half maximum (FWHM) of 6", translating to a typical subarcsecond level angular resolution. The 5 σ point source are detection levels for the 4 bands occur at the equivalent of 16.5, 15.5, 11.2, and 7.9 Vega mags respectively, with a uncertainty of 0.185 mag (Wright et al. 2010). The All-WISE catalog, released in 2013, combines WISE data from the primary mission phase, as well as the NEO-WISE mission phase (Cutri et al. 2021).

The UnWISE (Schlafly et al. 2019) and CatWISE2020 (Marocco et al. 2021) catalogs combine previous catalog data with more recent NEOWISE observations to increase sensitivity beyond AllWISE. In particular, Un-WISE has 5 times, and CatWISE2020 has 6 times longer exposure times compared to AllWISE. UnWISE 50% completeness limits are W1 = 17.93 mag and W2 = 16.72 mag. CatWISE2020 S/N=5 limits are W1 = 17.43 mag and W2 = 16.47 mag. UnWISE and CatWISE2020 to not offer W3 or W4 data.

In this work, observations from all three catalogs are
used for plotting and ML classification (Section 4). UnWISE fluxes in the W1 and W2 bands were converted to

² For additional details, see https://cxc.harvard.edu/csc/why/ks_test.html

 $^{^3\}sim 60$ mmag at BP=20 for the field of NGC 3532

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³⁵⁶ magnitudes. AllWISE sources and magnitudes are pre-³⁵⁷ ferred over CatWISE2020 sources when both are avail-³⁵⁸ able to maintain consistency with the use of W3 mag-³⁵⁹ nitudes from AllWISE, while both are preferred over ³⁶⁰ UnWISE sources.

2.5. DECaPS2 and VPHAS+

To complement the above all-sky, but relatively shallow surveys, we used the deeper DECam Plane Survey 2 (DECaPS2; Saydjari et al. 2022). DECaPS2 is an optical and NIR survey conducted with the Dark Energy Camera at the Cerro Tololo Inter-American Observatory in Chile. It reaches a typical single-exposure depth of 268 23.7, 22.7, 22.2, 21.7, and 20.9 mag⁴ in the optical and 369 NIR g, r, i, z, Y bands, with a typical seeing of 1".

DECaPS2 magnitudes were converted into Gaia mag-370 $_{371}$ nitudes using a linear model fit for $\sim 40,000$ sources ³⁷² with both Gaia and DECaPS2 magnitudes in the field $_{373}$ of NGC 3532. The g, r, i, z bands were fit to Gaia G $_{374}$ band; q, r, bands to RP band; and r, i, z bands to BP ³⁷⁵ band. Since DECaPS2 extends significantly deeper than 376 the surveys used in the training dataset, this survey was not used to classify sources in the ML pipeline as 377 378 it may introduce biases. The standard deviation of con-³⁷⁹ verted magnitudes at Gaia G = 21 is ~ 0.2 mag for ₃₈₀ G, and ~ 0.5 mag for G_{BP} and G_{RP} . Extrapolation of converted DECaPS2 magnitudes to fainter ranges than 382 Gaia reaches may result in larger errors. However, for ³⁸³ the purposes of this work, having precise magnitudes is 384 not essential.

We also analyzed the VST Photometric H α Survey ³⁸⁵ of the Southern Galactic Plane and Bulge (VPHAS+; ³⁸⁷ Drew et al. 2014) data of NGC 3532. However, only ³⁸⁸ 1 CXO source (Source 77) had VPHAS+ counterparts ³⁸⁹ without Gaia counterparts, and this source was detected ³⁹⁰ in more bands in DECaPS2.

2.6. Crossmatching

CXO sources in NGC 3532 were crossmatched to opti-392 ³⁹³ cal and infrared counterparts to enable multi-wavelength analysis, plotting, and ML classification. After the as-394 trometric correction (see Appendix B), CXO sources 395 were first cross-matched to Gaia eDR3 sources using the 396 combined 2σ PUs by adding (in quadrature) the X-ray 397 ³⁹⁸ and Gaia PUs. Source positions at the Gaia eDR3 epoch (2016) are propagated to the epoch of the CXO obser-399 vation (2008) using proper motions, when available. 400

The CXO PU is calculated by combining the empirical PU using equation 12 from Kim et al. (2007) and the ⁴⁰³ alignment uncertainty measured from the astrometric ⁴⁰⁴ correction (see Appendix B) in quadrature. Gaia PUs ⁴⁰⁵ include the Gaia coordinate uncertainty, uncertainty in ⁴⁰⁶ proper motions, parallaxes and their uncertainties, and ⁴⁰⁷ astrometric excess noise. The CXO PUs for sources in ⁴⁰⁸ the NGC 3532 field range from 0.25" to 2.4" with a ⁴⁰⁹ median value of 0.79".

⁴¹⁰ 2MASS and ALLWISE counterparts were then identi-⁴¹¹ fied using the Gaia eDR3 pre-computed cross-matched ⁴¹² sources, using the "best neighbor" source (Marrese ⁴¹³ et al. 2021). For multi-wavelength counterparts from ⁴¹⁴ other catalogs (DECaPS2, CatWISE2020, UnWISE) ⁴¹⁵ that do not have pre-computed cross-matches, or the ⁴¹⁶ 2MASS and ALLWISE counterparts of sources that do ⁴¹⁷ not have Gaia counterparts (such that pre-computed ⁴¹⁸ cross-matches are not available), the counterparts were ⁴¹⁹ matched using the PUs of the multi-wavelength and X-⁴²⁰ ray catalogs added in quadrature. For all multiwave-⁴²¹ length catalogs but Gaia eDR3, we multiply the Gaia ⁴²² eDR3 proper motion by the catalog reference epoch dif-⁴²³ ference, and add it to the total PU.

The recalculated CXO source PUs are significantly 424 ⁴²⁵ smaller than the PUs in CSC2, and we suspect they ⁴²⁶ may be underestimated (e.g., several soft X-ray sources $_{427}$ were < 1'' away from fairly bright optical stars). There-⁴²⁸ fore, we increased the combined CXO and multiwave-⁴²⁹ length catalog PUs by a factor of 1.5. As a result, 6 430 additional sources previously lacking any counterparts ⁴³¹ are matched to a counterpart, while 31 additional coun-⁴³² terparts are added in total.⁵ Given that the CXO PUs $_{433}$ are 2σ uncertainties, these 6 additional matches are ex- $_{434}$ pected. Assuming a median of 1.2'' for the ex-435 panded CXO PU, the chance coincidence prob-436 ability for a CXO source to be matched with at 437 least one cluster member, assuming an average 438 density of $\sim 1,000$ cluster members in a 20' ra-439 dius field that covers the CXO field (see Sec-440 tion 3.1), is $\sim 0.1\%$, while the probability to be 441 matched with any Gaia source (including back-⁴⁴² ground sources), assuming an average density of $_{443} \sim 48,000$ Gaia sources in the 12' radius field di-⁴⁴⁴ rectly surrounding the CXO field, is $\sim 12.5\%$. We 445 emphasize this mostly affects sources near the ⁴⁴⁶ edge of the CXO field with large PUs that were ⁴⁴⁷ not already matched to Gaia counterparts (which ⁴⁴⁸ in most cases are well within CXO PUs), and we 449 discuss some of these sources in Section 5.

⁴ This is the photometric depth corresponding to 50% source recovery rate(Saydjari et al. 2022).

⁵ A CXO source that only has one counterpart, may be matched to counterparts in other catalogs after the expansion of the combined PU.

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Of the 131 CXO sources in the field of NGC 3532
that pass our selection criteria, 109 have Gaia counterparts; 15 have DECaPS2+ counterparts but not Gaia;
95 have 2MASS counterparts; 82 have WISE counterparts, of which 47 were from AllWISE, 25 were from
CatWISE2020, and 10 were from UnWISE.

3. CLUSTER ANALYSIS

⁴⁵⁷ We summarize various multiwavelength properties of ⁴⁵⁸ CXO sources in the field of NGC 3532 with several plots, ⁴⁵⁹ including luminosity function plots, color-magnitude di-⁴⁶⁰ agrams (CMDs), color-color diagrams (CCDs), and a ⁴⁶¹ hardness ratio diagram (HRD).

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3.1. Cluster membership

Cluster membership is determined by a set of distance 463 464 and proper motion cuts using Gaia eDR3 data (Brown 465 et al. 2021; Bailer-Jones et al. 2021). About 134,000 466 Gaia sources within 20' from the center of the ACIS-I ⁴⁶⁷ array field-of-view (see Figure 1) were included in the ⁴⁶⁸ analysis. First, we apply a preliminary cut by excluding 469 sources outside $\pm 33\%$ pc and ± 5 mas/yr of the mean 470 cluster distance of 484 pc, and proper motion of μ_{α} = $_{471}$ -10.37 mas/yr, μ_{δ} = 5.18 mas/yr (Fritzewski et al. 472 2019). Then, the sources within one standard deviation 473 of the median value of all three parameters are taken 474 as cluster members. This process produces a member-⁴⁷⁵ ship list of 916 stars which is relatively pure. Compared 476 to a list of 660 members produced by Fritzewski et al. 477 (2019) from radial velocity data and Gaia DR2, our list 478 is larger, but may be less pure. Within our 20' radius 479 field, Fritzewski et al. (2019) select 356 members, from which we also select 344 as members. However, we have 480 close to three times the total number of members. Com-481 482 pared to another list of 1,300 members produced from 483 Gaia DR2 parallax and proper motions using Gaussian ⁴⁸⁴ mixture models (Jaehnig et al. 2021), our list is less 485 complete, because we restricted our selection of sources 486 to r < 20', but it is more pure, having less contam-487 inants with obviously wrong proper motions and dis-488 tances. The number of CXO sources crossmatched to 489 cluster members also increases to 57 compared to 40 490 from Jaehnig et al. (2021)

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3.2. Variability

Using the definition of variability discussed in Section
2, we find that 37 X-ray sources out of 131 (i.e. 28%) are
significantly variable. Of these, 34 have Gaia, 30 have
2MASS, 24 have WISE, and 2 have DECaPS2 counterparts. About 20 variable sources are likely to be cluster members, and 18 display flares. For the 16 flaring
sources having Gaia distances, their average flare lumi-

⁴⁹⁹ nosities⁶ are in the range $7 \times 10^{29} - 9 \times 10^{31} \text{ erg s}^{-1} \text{ cm}^{-2}$. ⁵⁰⁰ The largest flare from a cluster member is the flare of ⁵⁰¹ Source 29 at $3.4 \times 10^{30} \text{ erg s}^{-1} \text{ cm}^{-2}$.

3.3. Luminosity Function

The cumulative luminosity function of CXO sources in the field of NGC 3532 is shown in Figure 2. Luminosty is calculated from the CXO broadband (0.5-7 keV) flux using Gaia distances (Bailer-Jones et al. 2021) for sources with a Gaia counterpart. Sources without Gaia counterpart are not shown. The top curve shows the 108 CXO sources with a distance measurement, while the bottom curve shows the 60 cluster members.

All sources brighter than $10^{31} \text{ erg s}^{-1}$ are not cluster members. At higher luminosities the cluster luminosity function may be approximated by a power-law, while at lower luminosities it comes to a plateau. While the plateauing can be explained by the limiting sensitivity of the observation, below which objects are not which objects are not been break near $L_X \approx 3 \times 10^{29} \text{ erg s}^{-1}$ should not be related to the sensitivity limit of $\sim 5 \times 10^{28} \text{ erg s}^{-1}$.

3.4. Color-Magnitude Diagrams

A color-magnitude diagram (CMD) of NGC 3532 con-521 ⁵²² structed from Gaia and DECaPS2 data is shown in Fig-⁵²³ ure 3. All Gaia eDR3 sources within the 12'-radius 524 around the center of ACIS-I field of view are shown 525 in black. Cluster members are shown in cyan. Gaia 526 sources with CXO counterparts are shown with a red-⁵²⁷ yellow color scale, with color indicating the value of the 528 medium-soft hardness ratio, HR_{ms} . The sizes of the 529 markers for these sources scale with the logarithm of the $_{530}$ CXO broad-band flux, log(F_b). Variable X-ray sources ⁵³¹ are marked with asterisks. Several known WDs in NGC ⁵³² 3532 crossmatched to Gaia sources are shown in green, ⁵³³ and appear below the main sequence.⁷ An isochrone for ⁵³⁴ the age of 300 Myr, distance 484 pc, solar metallicity, $_{535}$ and extinction E(B-V)=0.034 (discussed in Section 1.1) 536 is also shown.⁸

The cluster members form a clear main sequence. A final few evolved cluster stars are well-fitted by the isochrone (except for one). The isochrone appears to be slightly final offset to the left of the main sequence, with the deviation more apparent in the lower mass range. This deset viation is due to an issue with how isochrone models

 $^{^{6}}$ All flare luminosities we provide hereafter are average flare luminosities.

 $^{^7}$ See also Table 4.

⁸ Isochrones are constructed with Python Isochrones package, using MIST stellar evolution models (Morton 2015).



Figure 2. Cumulative luminosity function of CXO sources in the field of NGC 3532. Top: 108 sources in field with a distance measurement. Bottom: 60 CXO sources crossmatched to cluster members.

⁵⁴³ transform colors, and is also present in isochrones in ⁵⁴⁴ Fritzewski et al. (2019). One cluster member appears ⁵⁴⁵ near the known white dwarfs, but is not classified as a ⁵⁴⁶ white dwarf by Gaia DR3 DSC-Combmod (Fouesneau ⁵⁴⁷ et al. 2022). There are a few sources that passed our ⁵⁴⁸ fairly strict cut for cluster membership (Section 3.1) but ⁵⁴⁹ are still located below the main sequence. The origin of ⁵⁵⁰ these sources is unclear. Since none of these outliers co-⁵⁵¹ incides with CXO sources, we do not investigate them ⁵⁵² further.

Many sources with X-ray counterparts are located hear the isochrones, indicating their cluster membersis ship. Given the optical properties and the relative X-ray softness (see colormap), these sources are probably stars with active coronae (this conclusion is confirmed later in Section 4 with ML classification and in Section 5 with spectral analysis). Most variable X-ray sources appear at the fainter part of the NGC 3532 main sequence populated by low-mass stars.

There are two additional structures that are visible in the CMD plot, one above and one below the main sequence. These structures were also noticed by Clem tet al. (2011). The structure below the main sequence are contaminating field stars withing the plane of the for Galaxy beyond NGC 3532. A number of counterparts hardness can be attributed to the additional absorption ⁵⁷⁰ through the plane, and/or to the intrinsically harder ⁵⁷¹ spectra. The plume of sources above the main sequence ⁵⁷² (mostly field giant stars according to Clem et al. 2011) ⁵⁷³ merges with the main sequence at fainter magnitudes, ⁵⁷⁴ but branches off at brighter magnitudes. The two CXO ⁵⁷⁵ sources with DECaPS converted magnitudes at G > 22⁵⁷⁶ are discussed in 4.

Similarly constructed NIR and IR CMDs are shown in Figure 5. In the NIR CMD, the same three structure sin the optical CMD are visible. Most X-ray sources still appear on the main sequence, with a number of NIR-faint sources with harder X-ray spectra clustering toward the bottom of the main sequence. Many of these sources are variable in X-rays. These are likely to represent a mix of flaring low-mass stars in the cluster, or beyond it.

The structures seen in the optical and NIR CMDs are not apparent in the IR CMD. The main sequence is still visible, but non-cluster sources now appear close to the main sequence at brighter magnitudes. Most variable sources are clustered at the fainter end of the CMD similarly to the optical and NIR CMDs.

3.5. Hardness Ratio Diagram

⁵⁹³ A hardness ratio plot for all X-ray sources in the field ⁵⁹⁴ of NGC 3532 is shown in Figure 4. Any counterparts ⁵⁹⁵ are indicated by overlapping markers, see plot legend.



Figure 3. Color Magnitude Diagram (CMD) of NGC 3532. All Gaia sources located within 20' from the center of CXO observation are shown in black. Cluster members are shown in cyan. Cluster WDs with Gaia counterparts are shown in green. Sources with X-ray counterparts are shown in red-yellow color scale, with color indicating the CXO hardness ratio HR_{ms} (redder color corresponds to softer spectrum), and size proportional to the logarithm of the broadband flux (F_b) . Variable X-ray sources marked with asterisks. An extinction vector corresponding to $A_V = 1$ is shown in blue, while the total Galactic A_V in this direction is ≈ 4 . An isochrone corresponding to the age of 300 Myrs, d = 484 pc, and extinction E(B - V) = 0.034 is also plotted. Reference labels for several spectral types based on isochrone masses are shown.

The numerous sources with soft ($HR_{ms} < -0.7$) spec-596 tra and fairly blue optical counterparts (0 < BP-RP <597 ⁵⁹⁸ 1.5) are main sequence stars (cf. Figure 3) belonging to ⁵⁹⁹ NGC 3552. The soft X-ray emission can be attributed 600 to active stellar coronae with typical temperatures of a ⁶⁰¹ few million degrees (a fraction of a keV). As we show ⁶⁰² in Section 4, the MUWCLASS pipeline indeed classifies 603 these sources as low-mass stars. The softest and bluest ⁶⁰⁴ of these sources (lying solely on the main sequence) are ⁶⁰⁵ virtually all non-variable, implying that the 130 ks CXO 606 observation was too short to catch any flares. Their X-⁶⁰⁷ ray luminosities correspond to a steady level of coronal activity at $\sim 10^{29} \,\mathrm{erg}\,\mathrm{s}^{-1}$. For comparison, the Sun's $_{609}$ quiescent X-ray luminosity ranges from $10^{27} \,\mathrm{erg \, s^{-1}}$ to $_{610}$ 10²⁸ erg s⁻¹ (Judge et al. 2008), significantly lower than 611 the luminosities of these cluster stars. This is consis-612 tent with the expectation that younger stars are more 613 coronally active (Güdel & Nazé 2009; Davenport et al. 614 2019)**.**

The redder sources (1.5 <BP-RP< 3) mostly correspond to the bottom part of the cluster's main sequence (see Figure 3) with most of these sources exhibiting somewhat harder X-ray spectra. The central part of the HR diagram contains a number of these redder variable sources, which could be active binaries or flaring coronae of more active solitary stars. Finally, there are several soft X-ray sources that lack optical and NIR/IR counterparts, or with only faint DECaPS2 counterparts. Their properties are discussed in more detail in Section 5.4.

The upper right region of the HR diagram features strongly absorbed sources with relatively hard (either due to strong absorption or intrinsically hard) X-ray spectra. Twenty of these sources have optical counterparts, 13 of which have only faint ones in DECaPS2. As discussed in Section 4 and Section 5.5, many of these sources are likely AGNs, while the ones for which we can exclude an extragalactic origin may be Galactic CO systems.

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3.6. Color-Color Diagrams

Color-Color Diagrams of NGC 3532 constructed from Gaia, 2MASS, and WISE data are shown in Figure 6, with the same color scheme as in Figure 3. The sources along the diagonal locus of points are mostly stellar, while the outliers are more likely to be binaries or nonstellar sources. The harder sources are typically associated with redder sources in BP-RP and J-W2 colors, suggesting that both X-ray HRs and colors are affected (at least partly) by the extinction (see extinction vectors). The W2 band is too red to be affected by the ⁶⁴⁶ extinction, and must be more representative of the in-⁶⁴⁷ trinsic spectrum of the source.

4. MACHINE LEARNING CLASSIFICATION

We supplement our analysis with automated classification of X-ray sources using a multiwavelength machinelearning classification (MUWCLASS) pipeline described in detail by Yang et al. (2022). The pipeline makes use of a training dataset (TD; see also Yang et al. (2022)) with $\sim 3,000$ X-ray sources of known classes and 33 multiwavelength features from CSC2, Gaia, 2MASS, and three WISE catalogs, including fluxes, magnitudes, coltors, X-ray variability characterization, distances, and luminosities.⁹

MUWCLASS uses a Random Forest algorithm to classify X-ray sources into eight classes: low-mass stars (LM-STARs, up to late B-type), high-mass stars (HM-G2 STARs, OB and Wolf-Rayet), AGNs, Young Stellar Objects (YSOs, protostars and pre-main sequence stars), Low-Mass X-ray Binaries (LMXBs, including binaries in quiescence, and spider-type systems), High Mass X-ray Binaries (HMXBs, including gamma-ray binaries), Cataclysmic Variables (CVs), and Neutron Stars (NSs, only isolated ones are included). For additional details of which types of sources and catalogs comprise each class, please r refer to Section 2.1 of Yang et al. (2022).

Since NGC 3532 is near the Galactic plane, and nearly all AGNs included in the TD are located outside of the plane, the reddening through the Galactic plane in the (Ruiz 2018), as well as photoelectric absorption correform sponding to $n_H = 9 \times 10^{21} \text{ cm}^{-2}$ (Güver & Özel 2009) TB has been applied to all TD AGNs in the optical-NIR-Galactic plane in the optical-NIR-Gal

For each feature of each source (in both the TD and the field data to be classified), MUWCLASS creates a probability distribution function of the feature values based on the measurement uncertainties. We run MUWCLASS 1,000 times, each time sampling features from their probability distribution functions, and each time producing classification probabilities for each class, based on the percent of trees in the random forest that

⁹ Note that the pipeline described in Yang et al. (2022) did not use distances and luminosities. We added these features in this work.



Figure 4. HR diagram for CXO sources. Variable sources are marked with asterisk. Sources with WISE counterpart marked with dark gray circle; 2MASS counterpart with light gray circle; optical counterparts have colormap corresponding to Gaia BP-RP color, with sources missing BP-RP color shown in black. Sources with multiple counterparts have overlapping markers. Non-variable sources without counterparts are marked with small 'x' crosses.



Figure 5. Color-Magnitude Diagrams of NGC 3532 in near-IR (left) and IR (right). The left panel also shows the isochrone corresponding to the age of 300 Myrs, d = 484 pc, and extinction E(B - V) = 0.034. Cluster members shown in cyan, field sources shown in black, sources with X-ray counterparts in red-yellow color scale (with color indicating medium-soft hardness ratio (HR_{ms}), and size proportional to the logarithm of the broadband flux (F_b). Variable X-ray sources marked with asterisks. For the left panel, the AllWISE catalog, which cross-matches to 2MASS sources, are used for background sources. For the right panel, AllWISE+UnWISE+CatWISE2020 sources are used for background sources.



Figure 6. Optical and Infrared CCDs of NGC 3532, constructed similar to 5 are used. An extinction vector corresponding to $A_V = 1$ is shown in blue.

⁶⁸⁹ predict that class.¹⁰ After 1,000 samplings, the mean ⁶⁹⁰ probability (P_{class}) of a source belonging to each class, $_{691}$ and its standard deviation (ΔP_{class} ; hereafter the classi-⁶⁹² fication probability uncertainty) which characterizes the width of the P_{class} distribution, can thus be calculated 693 ⁶⁹⁴ by incorporating uncertainty information for each fea-⁶⁹⁵ ture (see (Yang et al. 2022) for further details).

Confidently classified CXO sources are selected using 696 classification confidence threshold defined as: 697 a

where the class index runs through the classes that are 699 different from the predicted class. We define confidently 700 classified sources as those with CT > 2. 701

Unlike Yang et al. (2022), we use distance mea-702 r_{03} surements, r_{geo} , from the Gaia eDR3 distance catalog (Bailer-Jones et al. 2021) to the list of features. This 704 allows for the incorporation of NIR J-band, optical G-705 band and broadband X-ray luminosities for sources with 706 ⁷⁰⁷ reliable distances, defined by a cut on the Gaia eDR3 ⁷⁰⁸ parallax measurements $\pi/\sigma_{\pi} >= 2$. This cut removes the distances of most sources in the TD where a real par-709 ⁷¹⁰ allax measurement is not expected, e.g., AGNs. About 711 one third of all CXO sources in the TD, and in the field $_{712}$ of NGC 3532, have distances after the cut. About 95% 713 of CXO sources with Gaia counterparts in the field of ⁷¹⁴ NGC 3532 have distances, which is expected due to the 715 proximity of the cluster, and its location in the Galactic 716 plane.

Due to the inclusion of the additional features, we re-717 ⁷¹⁸ evaluate the performance of the MUWCLASS pipeline, 719 which is summarized by the confusion matrices in Appendix A. Overall, the addition of these distance-720 721 dependent features slightly improves the performance 722 of the pipeline. Similar to the unmodified pipeline, 723 the best performing classes are AGNs, LM-STARs, and 724 YSOs, which are the best represented classes in the TD. 725 Since sources that include stellar COs are both diverse 726 in nature, and lower in number in the TD, the classi-727 fication performance of CO classes (LMXBs, HMXBs, 728 CVs, NSs) tend to be worse, and classifications tend to 729 be confused among these classes.

Therefore, to more efficiently search for CO candidates 730 ⁷³¹ in NGC 3532, we combined LMXBs, HMXBs, CVs and 732 NSs into a candidate CO class, with the classification 733 probability calculated as the sum of the probabilities to 734 belong to each of the four classes, and the correspond-735 ing classification probability uncertainties combined in 736 quadrature. After merging the four classes into one, ⁷³⁷ the previous 8-class scheme turns into a 5-class scheme 738 which includes AGNs, HM-STARs, LM-STARs, YSOs 739 and candidate COs. The same confidence threshold in 740 equation 2 was recalculated to evaluate the confident 741 classifications in the 5-class scheme. The performance 742 evaluation of the pipeline using the 5-class scheme is ⁷⁴³ shown in the lower panel in Fig. 22 in Appendix A.

4.1. Classification Summary

Among the 131 X-ray sources in the NGC 3532 field, 745 746 70 have already been classified in Yang et al. (2022) ⁷⁴⁷ while others were dropped either because they have large 748 PUs or have confused and extended CSC2 flags raised. 749 Of these 70 sources, 31 are confidently classified in this ⁷⁵⁰ work, with their classification mostly consistent with the ⁷⁵¹ results of Yang et al. (2022).¹¹ These include 19 LM-752 STARs, 6 AGNs, 4 YSOs, 1 HM-STAR, and 1 LMXB. The classification breakdown of the 131 X-ray sources 753 ⁷⁵⁴ in this work is shown in Figure 7, with the 8-class scheme 755 results shown in the first two panels, and the 5-class ⁷⁵⁶ scheme results shown in the last two panels. The second ⁷⁵⁷ and fourth panels show the sources that passed the con-⁷⁵⁸ fidence cut at CT=2 for their respective class schemes. In the 8-class scheme, only 3 out of 31 sources clas-759 ⁷⁶⁰ sified as one of the CO classes pass the confidence cut. ⁷⁶¹ After combining the 4 classes into a single CO class (the ⁷⁶² 5-class scheme), 14 sources out of 37 classified as a candi-⁷⁶³ date CO pass the confidence cut. None of the candidate ⁷⁶⁴ COs were crossmatched to a cluster member. Two of ⁷⁶⁵ the 14 only have DECaPS counterparts, which ⁷⁶⁶ were not used in ML classification, while one of ⁷⁶⁷ the 15 have no MW counterparts in any catalog. In both schemes, MUWCLASS confidently classify 40 768 769 LM-STARs, 7 AGNs, and 2 HM-STARs, while the 5-770 class scheme confidently classify three less YSOs due to 771 differences in the candidate CO class uncertainties be-⁷⁷² tween the two schemes. As the goal of the 5-class scheme ⁷⁷³ is to identify candidate COs, for the purposes of plotting ⁷⁷⁴ we use the 8-class scheme, and overlay candidate COs 775 on top.

All confidently classified stellar objects (including LM-776 777 STARs, HM-STARs and YSOs) have multi-wavelength

¹⁰ For example, a source to be classified may have Gaia feature G = 15 mag with uncertainty $e_G = 0.05$ mag. For the 1,000 778 counterparts, while all confidently classified AGNs do samplings, one sampling may produce G = 14.99 mag, while another could give G = 15.02 mag. As a result, for one sampling, 80% of trees in the random forest may classify the source as a LM-STAR, 20% a YSO, while for another sampling the probability outcomes will be slightly different.

¹¹ Among the confidently classified in this work sources, only 3 sources classified as LM-STARs were classified as HM-STARs in Yang et al. (2022) albeit at lower confidence.

⁷⁷⁹ not, except for faint (> 20 mag) DECaPS counter-⁷⁸⁰ parts, which may be caused by the substantial extinction ⁷⁸¹ $(E(B-V) = 1.3 \text{ or } A_V \approx 4)$ through the Galactic plane ⁷⁸² in the direction of NGC 3532.

⁷⁸³ 4.2. Diagrams with Classification Results

Figure 8 shows the CMD with confidently classified res sources marked by various symbols. Most sources classified as LM-STARs and YSOs are located on the main rear sequence. LM-STARs appear to be brighter in the Gband and are redder in color. One LMXB, along with reso other candidate COs appear below the main sequence. **The two CXO sources with DECaPS converted magnitudes at** G > 22 **have highest AGN probabilities, with one passing the confidence thresh**reso **old**. This is consistent with the reddening procedure reso the TD being reddened to BP-RP> 2, G > 18.

⁷⁹⁶ Classified sources lacking optical colors do not appear ⁷⁹⁷ on the CMD plot. Therefore, we also plot a HR diagram ⁷⁹⁸ with classification results in Figure 9. A clear segrega-⁷⁹⁹ tion of source classes along the medium-soft HR scale ⁸⁰⁰ is seen: LM-STARs are soft; many unconfidently clas-⁸⁰¹ sified sources, including a majority of variable sources ⁸⁰² are slightly harder; YSOs, LMXBs, and some candidate ⁸⁰³ COs are closer to the middle; other candidate COs are ⁸⁰⁴ harder on both scales; and AGNs appear as the hardest ⁸⁰⁵ class.

The larger HRs for classified AGNs are consistent with the expected high X-ray absorption of AGNs through harder spectra compared to stars. Note that the uncertainties **on** HRs (not shown in the figure to reduce to reduce Fig. 4) can be very large for fainter sources, and their actual location may be significantly different than the observed location.

Figure 10 shows a diagram of X-ray versus optical fluxes with classification results. **Optical fluxes are** calculated with

$$F_G = \Delta \nu Z P_\nu 10^{M_G/2.5} \tag{3}$$

where $\Delta \nu$ is the frequency range, and ZP_{ν} is the zero point of the G-band..¹² CXO sources lacking an optical counterpart are shown on a line corresponding to DECaPS2 z = 21.7 (photometric depth at which sources are recovered; Saydjari et al. 2022). Confidently classified LM-STARs are seen to the right of the $(F_X/F_O) = 10^{-3}$ line, while unconfidently classified ⁸²⁵ variable X-ray sources, as well as candidate COs, are ⁸²⁶ relatively brighter in X-rays and located to the left of ⁸²⁷ this line.

We also plot X-ray versus optical luminosities in Figure 11. For elucidation, all available Gaia distances are used, but sources with $\pi/\sigma_{\pi} < 4$ (stricter than the cut used for ML classification) are marked as having unreliable parallaxes. For sources showing flares in their lightcurves, the flare luminosities are indicated by arrows pointing from the mean source luminosity to the flare luminosity (see Section 5 for details). This plot confirms that sources classified as YSOs, HM-STARs, and candidate COs are more luminous in the X-ray compared to LM-STARs.

The majority of variable sources have fairly low mean X-ray luminosities, as well as low optical luminosities consistent with M-dwarfs. As we discuss in Section 5, most of these are likely coronally flaring cluster LM-STARs.

4.3. X-ray Sources without Counterparts

Since a lack of MW counterparts may be an indication of an unusual (non-stellar) nature of X-ray emission,
we compiled the 7 CXO sources without Gaia, 2MASS,
WISE, and DECaPS2 counterparts in Table 1.

The X-ray fluxes of these sources span from 4.5×10^{-15} to 10^{-14} erg s⁻¹ cm⁻², similar to sources with counterparts. The X-ray to optical flux ratio limit for these sources ranges from 0.15 to 0.4, while most X-ray sources with MW counterparts are significantly brighter in the optical than in the X-ray. These source cluster on the hard-hard region in Figure 4, and some of them are confidently classified as AGNs.

5. DETAILED ANALYSIS OF SELECTED SOURCES

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Beyond summarizing the bulk properties of the X-ray sources in the field of NGC 3532 above, we perform a more detailed analysis of these sources to draw further conclusions about X-ray source populations in and beyond the cluster, and to check the accuracy of our ML classifications.

Spectra for 107 CXO sources with more than 50 net counts and S/N> 5 in CSC2 were extracted using the wavdetect and specextract functions in CIAO tools version 4.14, and fitted using the Sherpa package (Fruscione et al. 2006). Spectra for two additional sources (# 118, 119), with slightly lower number of counts were also extracted because of their classifications as candidate COs. The extracted spectra were fit with the thermal plasma emission model (mekal) and the powerlaw

¹² Values taken from http://svo2.cab.inta-csic.es/ svo/theory/fps3/index.php?mode=browse&gname= GAIA&asttype=



Figure 7. Summary of the classification outcomes for X-ray sources in NGC 3532. The green histograms show the classification distributions of all sources per class while the yellow histograms show the subsets without multiwavelength counterparts (DECaPS2 counterparts, which were not used for classification, are not counted here). The bins are labeled with the number of source belong to each class. The first panel shows the distributions for all classifications using the 8-class scheme. The second panel shows the distributions for confident classifications (CT> 2) using the 8-class scheme. The third and forth panels show the same but for the 5-class scheme.



Figure 8. CMD of NGC 3532. Gaia cluster members shown in cyan. Classifications of CXO sources with optical counterparts are labeled according to legend. Candidate COs marked with orange stars. Sources discussed in Section 5 are labeled. This figure is available online as an interactive figure, with the ability to zoom, pan, and display detailed information for each source.



Figure 9. HR diagram of CXO sources with classifications labeled according to legend. Candidate COs marked with yellow stars. Sources discussed in Section 5 are labeled with numbers. This figure is available online as an interactive figure, with the ability to zoom, pan, and display detailed information for each source.



Figure 10. X-ray and optical fluxes for CXO sources in the field of NGC 3532. X-ray source classifications labeled according to legend. Lines of constant X-ray to optical flux ratios are shown. CXO sources without optical counterparts are shown to the left, on a line corresponding to DECaPS2 z = 21.7 (photometric depth at which 50% sources are recovered; Saydjari et al. 2022). Sources discussed in Section 5 are labeled. This figure is available online as an interactive figure, with the ability to zoom, pan, and display detailed information for each source.

NGC 3532



Figure 11. X-ray and optical luminosities for CXO sources with Gaia counterparts. Arrows extending from mean luminosity to flare luminosity for flaring sources are shown. Lines of constant X-ray to optical luminosity ratios are shown. Sources discussed in Section 5 are labeled. This figure is available online as an interactive figure, with the ability to zoom, pan, and display detailed information for each source.

Source	2CXO Name	Det. Signif.	Class	P_{Class}	Can. CO	F_b	HR_{MS}	HR_{HM}	$P_{\rm var}$
54	J110453.3-584900	7.8	NS?	0.46 ± 0.27	Ν	0.85 ± 0.13	0.55 ± 0.16	0.71 ± 0.07	0.52
53	J110434.8-584908	6.8	AGN	0.93 ± 0.09	Ν	0.60 ± 0.12	0.84 ± 0.12	0.66 ± 0.10	0.5
60	J110525.5-584727	6.4	AGN?	0.68 ± 0.18	Ν	0.95 ± 0.16	0.72 ± 0.26	0.90 ± 0.04	0.52
36	J110458.3-585053	6.4	AGN	0.93 ± 0.07	Ν	0.64 ± 0.11	0.83 ± 0.13	0.80 ± 0.06	0.013
17	J110538.0-585419	6.1	AGN	0.80 ± 0.14	Ν	1.08 ± 0.18	0.85 ± 0.12	0.86 ± 0.05	0.39
23	J110526.1-584225	5.8	LMXB?	0.56 ± 0.11	Υ	1.06 ± 0.21	-0.33 ± 0.16	0.63 ± 0.11	1
92	J110445.4-584807	5	AGN	0.93 ± 0.14	Ν	0.45 ± 0.10	0.70 ± 0.27	0.83 ± 0.08	0.83

Table 1. CXO sources without optical or NIR/IR counterparts. Columns include detection significance, most probable ML classification and its probability, candidate CO status in 5(if CT> 2 for CO class probability, see Equation 2), broadband (0.5-7 keV) flux in units of $10^{-14} \text{ erg s}^{-1} \text{ cm}^{-2}$, hardness ratios, and variability probability. Unconfident classifications (as determined by Eq. 2) are marked with "?".

874 xspowerlaw (PL) models modified by the interstellar 875 photoelectric absorption according to xsphabs (phabs) 876 model (Wilms et al. 2000). For sources that were not 877 well fit by either model, we attempted fits with a two-878 component thermal plasma (mekal) model. We also 879 tried fits with a blackbody model bbodyrad, but it did 880 not fit any source significantly better than other models. 881 The wstat statistic was used in all of the fits performed 882 with Sherpa.¹³

Additionally, we extracted lightcurves for the same sources using the dmextract function in CIAO tools, with 500 s bins. To extract flare spectra for flaring sources, we determine the flare time interval from their lightcurves with the following procedure: The lightcurve set is split into 50 bins. The starting point of the flare is set at the bin with 4.5σ probability that it did not have ending point of the flare is set at the next bin where this probability drops below 99% (2.56 σ).

We discuss some groups of sources below, selected 893 ⁸⁹⁴ based on their X-ray brightness (> 100 net counts), pres-⁸⁹⁵ ence of flares in their lightcurves, their ML classifications ⁸⁹⁶ as a candidate CO, or if the optical counterparts are higher mass stars (A or earlier type; see Figure 3). These 897 ⁸⁹⁸ sources are categorized into **lower mass** cluster mem-⁸⁹⁹ bers, higher mass cluster members, background sources ⁹⁰⁰ in the Galaxy, hard background sources with coun-⁹⁰¹ terparts, sources with only DECaPS counterparts, and ⁹⁰² sources without any counterparts. The most interesting sources of each group are presented here, 903 while additional sources are presented in Section 904 ⁹⁰⁵ C of the Appendix. For convenience, variable sources ⁹⁰⁶ are labeled with an asterisk next to the source number. The properties of these sources, including classification 907 ⁹⁰⁸ results and best-fit spectral model parameters are shown ⁹⁰⁹ in Table 2. The full table of all CXO sources detected $_{910}$ with S/N> 5 is available electronically.

Potential binary sources were identified using Gaia's Pla Renormalised Unit Weight Error (RUWE) parameter, Which measures goodness of fit of the astrometric data and to a single star model. A value significantly greater than 1 (around 1.4) indicates binarity, or potential problems with the astrometric solution (Brown et al. 2021). Since and NGC 3532 has a well-defined binary sequence visible above the solitary star main sequence in Figure 3, an offset from the main sequence can also indicate binarity.

5.1. Cluster Lower Mass Stars

Sources 7, 10^{*}, 22^{*}, 25, 35, 57^{*}, 61^{*}, 66^{*}, and 68^{*} have Gaia counterparts that are low-mass members of MGC 3532. Their spectra and lightcurves are shown in Figures 13 and 14.

During the CXO observation, the average luminosi-925 $_{\rm 926}$ ties of these sources range from $10^{29}\,{\rm erg\,s^{-1}}$ to 9 \times $_{927}$ 10²⁹ erg s⁻¹, with the most luminous source being source $_{928}$ 57^{*}. Their X-ray to optical flux ratios range from 10^{-4} $_{929}$ to 10^{-2} . Several sources are variable, and three display ⁹³⁰ flares. Source 22^{*} is borderline variable by Kuiper's 931 statistics (variability probability 0.987), but visibly 932 shows a minor flare. The X-ray spectra of all these $_{933}$ sources are soft or relatively soft (with $-0.8 < HR_{ms} <$ $_{934}$ -0.3 and -0.6 <HR_{hm} < 0.4). Most can be fitted 935 with an absorbed PL with $\Gamma \approx 2.4 - 3.7$ or mekal with $_{936}$ kT = 0.4-1.0 keV. Sources 35, 57^{*}, **66**^{*}, and 68^{*} are not ⁹³⁷ well fit by either simple model, while a two-temperature 938 mekal model fits well with $kT_1 = 0.2 - 0.4$ keV and $_{939} kT_2 = 1.2 - 2.5 \text{ keV}$. The lightcurves of sources 10^* and ⁹⁴⁰ 61^{*} show flares with a sharp-rise and slow-decay profile ⁹⁴¹ typical for stellar (coronal) flares (Pye et al. 2015). The $_{942}$ profiles of the flares of sources 22^* and 66^* appear more ⁹⁴³ symmetric, possibly due to noisier data.

The optical colors of these sources are consistent with being low-mass stars on the cluster's main sequence or the binary track right above it. Source 22* has Gaia P47 eDR3 RUWE of 1.3, possibly indicating binarity, which is consistent with its location on the binary track. Sources P49 7, 25, 35, 57*, and **66*** are visibly above the main sepso quence in the binary track, but do not have high RUWE p51 values. The two-temperature spectra of the latter three P52 sources could be explained if they are systems of corop53 nally active binary stars (McGale et al. 1996).

⁹⁵⁴ All of these sources are confidently classified as
⁹⁵⁵ LM-STAR, or otherwise have high combined LM⁹⁵⁶ STAR/YSO probabilities, consistent with their soft
⁹⁵⁷ spectra, and probable coronal X-ray emission.

Based on the above analysis we conclude that the X-⁹⁵⁹ ray emission of most CXO sources matched to a clus-⁹⁶⁰ ter member have a coronal origin, although some of ⁹⁶¹ these sources may be active binaries rather than soli-⁹⁶² tary stars.¹⁴ We find that the ML classifications of these ⁹⁶³ sources are mostly accurate (see main sequence on Fig-⁹⁶⁴ ure 8), but we note that four K/M-type stars are ⁹⁶⁵ classified as YSOs. (The other YSOs are not ⁹⁶⁶ cluster members.)

⁹⁶⁷ The large number of unconfidently classified variable ⁹⁶⁸ sources at the fainter end of the CMD (Figure 8) corre-

¹⁴ We currently do not have an active binary class in our TD, so these systems may be classified as another class, such as YSOs.

¹³ see https://cxc.cfa.harvard.edu/sherpa/

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⁹⁶⁹ spond to the variable sources in the middle of the HR ⁹⁷⁰ diagram (Figure 9), and the variable sources with low X-⁹⁷¹ ray and optical luminosity in Figure 11. Many of these ⁹⁷² sources are cluster members on the main sequence, and ⁹⁷³ their multi-wavelength properties make them likely to ⁹⁷⁴ be coronally active LM-STARs.

These unconfident classifications (which have 975 ⁹⁷⁶ high combined LM-STAR/YSO probabilities), as 977 well as the four YSO classifications, are likely 978 due to the large number of YSOs with proper-⁹⁷⁹ ties similar to those of underrepresented K/M $_{980}$ stars in the TD (>1000 YSOs, compared to ~ 40 $_{981}$ K/M stars). Additionally, the pre-main se-⁹⁸² quence stage of lower-mass stars (> $0.5M_{\odot}$) can ⁹⁸³ last tens or hundreds of Myrs, during large portions of which they evolve slowly through the 984 985 optical and infrared feature spaces close to the ⁹⁸⁶ main sequence (Amard et al. 2019). Therefore, 987 at the cluster age of 300 Myr, some M-type stars ⁹⁸⁸ may still be in their pre-main sequence stage, ⁹⁸⁹ while other LM-STARs may be easily confused 990 for YSOs

The coronal activity of low-mass stars is known to 991 ⁹⁹² be correlated with the star's rotation rate (Pizzocaro 993 et al. 2019; Notsu et al. 2019; Fritzewski et al. 2021). We crossmatched CXO sources to stars with rotation 994 periods derived in Fritzewski et al. (2021). An X-ray 995 ⁹⁹⁶ luminosity vs. rotation period plot is shown in Fig. 12. ⁹⁹⁷ As expected, there is an inverse correlation between the ⁹⁹⁸ stellar rotation period and X-ray luminosity. However, it ⁹⁹⁹ shows substantial scatter (which is also seen in Fig. 11 ¹⁰⁰⁰ of Pizzocaro et al. 2019) suggesting that factors other 1001 than rotation period, such as the presence of a close 1002 companion, may be important. Somewhat surprisingly, only two of these sources are variable in X-rays, and 1003 1004 none exhibit significant flares. This may be because the ¹⁰⁰⁵ more frequently flaring stars tend to be less massive, and 1006 therefore fainter, and less likely to have their rotation 1007 periods measured.

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5.2. Cluster A-Type and B-Type Stars

Several A-type (Sources 29^* , 55, 64) and B-type 1009 Sources 51, 65, 111, and 131) stars belonging to the 1010 cluster are also coincident with X-ray sources. Their 1011 ¹⁰¹² spectra and lightcurves are shown in Figures 15 and 16. Sources 51, 65, 111, and 131 (identified as HD 96192 1013 A, CPD-58 3069 - A1V, V* GV Car - A0, HD 96246 -1014 ¹⁰¹⁵ A0V, respectively) have similarly high RUWE values, posi-1016 tions above the solitary star track of the main sequence, 1017 non-variability, and X-ray luminosities $\sim 10^{29} \,\mathrm{erg \, s^{-1}}$. ¹⁰¹⁸ Source 131 has too few counts to extract a spectrum, 1019 while the other sources have soft spectra with $kT \approx 0.4$

¹⁰²⁰ to 0.5 keV. Their literature A-type classifications con-¹⁰²¹ flict somewhat with the Gaia DR3 classifications as B-¹⁰²² type stars. Source 51, in particular, appears slightly ¹⁰²³ lower than sources 55 and 64 on the main sequence. ¹⁰²⁴ Isochrone fitting suggests their masses to be between 2-3 ¹⁰²⁵ M_{\odot} , broadly consistent with late-B or early-A classes. ¹⁰²⁶ Source 111 is not confidently classified as a LM-STAR ¹⁰²⁷ by MUWCLASS, because its X-ray spectrum shows a ¹⁰²⁸ hard excess (above 6 keV) in its otherwise typical stel-¹⁰²⁹ lar spectrum. Given the RUWE value of 1.3, it's possible ¹⁰³⁰ that interactions with a companion star is responsible ¹⁰³¹ for the hard excess. The nature of the companion could ¹⁰³² be constrained by a radial velocity study.

Source 29^* (HD 96157) is identified as an A0 star in 1033 ¹⁰³⁴ SIMBAD. It is strongly variable, exhibiting the largest 1035 flare among all CXO sources detected in NGC 3532, 1036 with a sharp rise, slow decay, and a duration of ~ 5 ¹⁰³⁷ ks. The average flare luminosity is $4.1 \times 10^{30} \,\mathrm{erg \, s^{-1}}$, 1038 a factor of ~ 10 larger than the average quiescent lu-¹⁰³⁹ minosity of the source. The average spectrum can be 1040 described by mekal with $kT \simeq 1.4$ keV, but shows a ¹⁰⁴¹ soft excess that's better described by a two-temperature 1042 mekal model with $kT_1 = 0.37$ keV and $kT_1 = 2.5$ keV. ¹⁰⁴³ The RUWE of 0.84 does not indicate binarity, but it has ¹⁰⁴⁴ a slightly elevated position on the solitary star track of $_{1045}$ the main sequence. The source is classified as 60% LM-1046 STAR, and 33% as HM-STAR. (Note, that in our TD 1047 HM-STAR class consists of OB type stars and WR stars, ¹⁰⁴⁸ which do not extend down into A-type stars.)

It is commonly accepted that solitary A stars should 1050 be very faint in X-rays, since they have fairly small con-1051 vective zones (compared to late type stars) and lack 1052 strong winds (compared to OB stars) (Günther et al. 1053 2022). Therefore, the detection of X-ray bright soli-1054 tary A-type stars is unexpected. Since most of these 1055 sources are likely to be binaries, the detected X-ray 1056 emission may be attributed to a lower mass compan-1057 ion. However, there is *only weak* evidence of binarity 1058 for the strongly flaring Source 29^{*}. Sensitive optical 1059 spectroscopy is needed to perform an additional search 1050 for a low-mass companion. If it is indeed a binary sys-1061 tem, then the companion may be very low mass, which 1062 would be consistent with the strong flare.

5.3. AGNs

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¹⁰⁶⁴ All seven confidently classified AGNs appear in the ¹⁰⁶⁵ hard-hard region of the HR diagram (see Figure 9), have ¹⁰⁶⁶ corresponding hard spectra ($\Gamma < 1.5$, except for source ¹⁰⁶⁷ 49 with $\Gamma = 3$), are non-variable, and have relatively ¹⁰⁶⁸ few counts (~ 60). Three of these sources have faint ¹⁰⁶⁹ (magnitude > 20) counterparts in the DECaPS2 survey, ¹⁰⁷⁰ and none have any other counterparts. Based on these



Figure 12. Rotation period of cluster stars from Fritzewski et al. (2021) vs. CXO broadband luminosity for crossmatched sources. Colormap shows Gaia DR3 spectral types (Fouesneau et al. 2022).

¹⁰⁷¹ properties, we consider the AGN classifications to be ¹⁰⁷² reliable.

¹⁰⁷³ 5.4. Background Sources with Gaia Counterparts

1074 Sources 8, 15, 27, 30, 42, 49, 70, and 119 have medium 1075 hardness ratios in Figure 9, and are bright enough 1076 for more detailed analysis. They have Gaia counter-1077 parts with distances beyond the cluster which are well-1078 constrained, except for sources 30 and 49, which still 1079 have significant proper motions that exclude an extra-1080 galactic nature. Their spectra and lightcurves are shown 1081 in Figures 17 and 18.

¹⁰⁸² Sources 30^{*}, 42^{*}, and 49^{*} ($d \approx 3$, 1.5, 1.2 kpc, re-¹⁰⁸³ spectively) show similar flares with symmetric profiles ¹⁰⁸⁴ (unlike the sharp-rise slow-decay flares **common for** ¹⁰⁸⁵ **LM-STARs** discussed above) and relatively hard spec-¹⁰⁸⁶ tra with HR_{ms} ≈ 0.2 and HR_{hm} = 0.3, 0.5, -0.1 respec-¹⁰⁸⁷ tively. Their spectra can be described by an absorbed ¹⁰⁸⁸ PL model with $\Gamma = 2.0 - 3.1$, and show some evidence of ¹⁰⁹⁹ hardening during the flares. The X-ray flare luminosities ¹⁰⁹⁰ for these sources are $\approx 10^{31} \text{ erg s}^{-1}$, while their quiescent ¹⁰⁹¹ emission is much fainter. The preferred ML classifica-¹⁰⁹² tion for these sources is LMXB, but at fairly low confi-¹⁰⁹³ dence, with other possibilities being YSO or CV. Sources ¹⁰⁹⁴ 30^{*} and 42^{*} are classified as candidate COs, which is ¹⁰⁹⁵ supported by the atypical flare profiles and higher lumi-¹⁰⁹⁶ nosities.

¹⁰⁹⁷ Source 70, located at $d \approx 1.8$ kpc, is similar to these ¹⁰⁹⁸ three sources in all respects (including the classifica-¹⁰⁹⁹ tions) except that it does not exhibit a flare during the ¹¹⁰⁰ CXO observation. Its highest classification probability ¹¹⁰¹ is YSO at 57%.

1102 5.5. Hard Sources with MW Counterparts

¹¹⁰³ Sources 4, 9, 12, 62, and 90 have at least one mul-¹¹⁰⁴ tiwavelength counterpart in Gaia, 2MASS, or WISE ¹¹⁰⁵ surveys. Of these, sources 4, 12, and 90 are located ¹¹⁰⁶ at the edge of ACIS field of view, and thus have par-



Figure 13. Spectra and lightcurves for selected cluster CXO sources. Spectral model fitted to each source shown in plot title.



Figure 14. Spectra and lightcurves for selected cluster CXO sources.



Figure 15. Spectra and lightcurves for CXO sources matched to cluster A-type stars.

¹¹⁰⁷ ticularly large PUs that increases the chance coinci-¹¹⁰⁸ dence probability. They appear in the hard-hard (up-¹¹⁰⁹ per right) corner on the HR diagram, being slightly ¹¹⁰⁰ softer than confidently classified AGNs (see Figure 9). ¹¹¹¹ Their spectra resemble those of AGNs (see Figure 19), ¹¹¹² and are well fit by both models, with PL photon in-¹¹¹³ dices $\Gamma \approx 2.0$, 1.6 and mekal $kT \approx 5.4$, 6.5 keV. ¹¹¹⁴ The lightcurves are not variable. The distances (when ¹¹¹⁵ present) of the Gaia counterparts have large uncertain-¹¹¹⁶ ties (in excess of 1,000 pc), and most of the parallaxes ¹¹¹⁷ do not pass the $\pi/\sigma_{\pi} >= 2$ cut that determines whether ¹¹¹⁸ their distances are used in ML classification. However, ¹¹¹⁹ these sources still have highly significant proper motions, ¹¹²⁰ and their BP-RP colors (when present) are bluer than ¹¹²¹ the color of any AGN in the TD after applying extinc-¹¹²² tion through the plane. These factors exclude an ex-¹¹²³ tragalactic origin. At their fiducial distances, the X-ray ¹¹²⁴ luminosities $\sim 10^{30} - 10^{31} \text{ erg s}^{-1}$ are at the high end for ¹¹²⁵ coronally active stars and at the low end for X-ray bi-¹¹²⁶ naries. The RUWE values of ~ 1 do not indicate binarity, ¹¹²⁷ but this could be due to the large distances and opti-¹¹²⁸ cal faintness. The ML pipeline classifies some of these ¹¹²⁹ sources as candidate COs in the 5-class scheme, which ¹¹³⁰ is supported by the hard spectra and fairly high X-ray ¹¹³¹ luminosities.



Figure 16. Spectra and lightcurves for CXO sources matched to cluster B-type stars.

Source 9 has a Gaia counterpart with a large RUWE 1132 value of 1.9, which suggests a background Galactic bi-1133 nary system. Its extremely large proper motion of 1134 $18.3\pm0.2\,\mathrm{mas/yr}$ translates to a large tangential veloc-1135 ity of $\sim 300 \,\mathrm{km \, s^{-1}}$ at its fiducial distance of $4 \pm 2 \,\mathrm{kpc}$, 1136 which after accounting for differential Galactic rota-1137 tion, is still in excess of $100 \,\mathrm{km \, s^{-1}}$. Its hard spectrum 1138 $(\Gamma = 1.6 \pm 0.5)$, combined with its inferred large veloc-1139 1140 ity and RUWE may indicate a binary system containing non-accreting pulsar responsible for the hard emission 1141 a (Jennings et al. 2018). 1142

Source 12 only has an UnWISE counterpart in the W2 1143 band, and a faint DECaPS2 counterpart in the i and z1144 bands (> 21 mag). It has the highest X-ray flux among 1145 detected sources with $F_X = 4.1 \times 10^{-14} \,\mathrm{erg \, s^{-1} \, cm^{-2}}$. 1146 The absorbed PL fit indicates $n_H = 1.0 \pm 0.2 \times 10^{22} \,\mathrm{cm}^{-2}$ 1147 which is compatible with an extragalactic origin (based 1148 on the total $n_H \approx 9 \times 10^{21} \text{ cm}^{-2}$ expected for $A_V \approx 4$; 1149 Güver & Ozel (2009)), unless the source is intrinsically 1150 obscured. This source also has the highest limiting flux ¹¹⁵² ratio $L_X/L_O \gtrsim 1.5$ of all sources (see Figure 10).

¹¹⁵³ Source 62 has a highly significant proper motion $(7.5 \pm$ ¹¹⁵⁴ 0.6 mas/yr) which implies a Galactic nature. Given its ¹¹⁵⁵ faintness in the optical/NIR, and the very high X-ray to ¹¹⁵⁶ optical flux ratio (see Figure 10) it could be an LMXB, ¹¹⁵⁷ in agreement with its ML classification.

1158 5.6. Sources with Only DeCAPS2 Counterparts

¹¹⁵⁹ Sources 13, 18, 26, 52, 43^{*}, and 77 do not have coun-¹¹⁶⁰ terparts, except for faint counterparts in DECaPS2. Be-¹¹⁶¹ cause of this, it is difficult to confirm or exclude these ¹¹⁶² sources as AGNs, except for source 43. Their spectra ¹¹⁶³ and lightcurves are shown in Figure 20.

¹¹⁶⁴ Source 43^{*} is variable (most counts are seen during ¹¹⁶⁵ the ~5-ks long flare), with a hard spectrum which is ¹¹⁶⁶ fit by the absorbed PL or mekal models, with $\Gamma \approx 1.9$ ¹¹⁶⁷ or $kT \approx 4.3$ keV, respectively. On the hardness ra-¹¹⁶⁸ tio diagram, this source appears near the middle of the ¹¹⁶⁹ medium-hard scale, harder than LM-STARs, and away ¹¹⁷⁰ from confidently classified AGNs and other hard sources ¹¹⁷¹ on the top right. The flare itself reaches peak luminosity ¹¹⁷² in ~ 1 ks, and plateaus for ~ 4 ks. During the flare the ¹¹⁷³ spectrum is quite hard with the absorbed PL fit having



Figure 17. Spectra and lightcurves for CXO sources matched to cluster background sources.

¹¹⁷⁴ $\Gamma \approx 1.8$. This behavior is distinct from typical coronal ¹¹⁷⁵ flares. The source is classified as 70% LMXB, and con-¹¹⁷⁶ sequently, is identified as a candidate CO. This source ¹¹⁷⁷ is only 1.5" away from a bright (G = 12.6) background ¹¹⁷⁸ A-type star. Although the star is likely too offset to be ¹¹⁷⁹ the counterpart of the X-ray source, its brightness may ¹¹⁸⁰ be precluding the detection of a fainter counterpart to ¹¹⁸¹ the X-ray source. In fact, in the DECaPS2 survey, this ¹¹⁸² source has 2 counterparts within a 1" radius in the Y-¹¹⁸³ band, Y = 17.7 and 18.6 respectively. However, the ¹¹⁸⁴ reliability is uncertain, given the proximity of the bright ¹¹⁸⁵ star. If the source does have an optical counterpart, its ¹¹⁸⁶ classification is likely to change. Source 77 lacks counterparts, except for a faint coun-1187 Source 77 lacks counterparts, except for a faint coun-1188 terpart in VPHAS+ and DECaPS2, with VPHAS+ 1190 Being near the edge of the CXO observation field, the 1191 source has a large PU (1.08") and a higher chance coinci-1192 dence probability. This source appears on the top right 1193 corner of the HR diagram, close to confidently classi-1194 fied AGNs. It shows a very hard spectrum that's well 1195 fit by the PL model with $\Gamma \approx 1.3$. Significant classifi-1196 cation probabilities are 81% NS, and 17% AGN. The 1197 source is probably not a member of NGC 3532, be-1198 cause of substantial absorption in the X-ray spectrum 1199 $(n_H = 0.9 \pm 0.3 \text{ cm}^{-2})$. If the DECaPS2 counter-



Figure 18. Spectra and lightcurves for CXO sources matched to cluster background sources.

¹²⁰⁰ part is a true match, then this source would not ¹²⁰¹ be classified as a NS.

¹²⁰² Sources 13, 18, 26, and 52 are similar to source 77, ¹²⁰³ except that they have fainter DECaPS2 counterparts ¹²⁰⁴ (> 22 mag within 0.5" of CXO positions). They have ¹²⁰⁵ high AGN and NS classification probabilities, but the ¹²⁰⁶ presence of faint IR counterparts makes them more likely ¹²⁰⁷ to be AGNs. This underscores the importance of hav-¹²⁰⁸ ing deep NIR survey coverage to discriminate between ¹²⁰⁹ AGNs and possible CO classes. Sources 20, 54, and 110 have no reliable MW counterparts, even in the DECaPS2 survey. Sources 20 and 212 terparts, even in the DECaPS2 survey. Sources 20 and 213 54 exhibit X-ray properties similar to those of sources 214 discussed in Section 5.5, including location on the HR 215 diagram, and hard or relatively hard spectra (see Fig-216 ure 21) which are mostly well fitted by PL models with 217 $\Gamma = 1.4 - 1.9$.

¹²¹⁸ Neither of these sources are confidently classified, but ¹²¹⁹ the most probable classes are LMXB and NS, as well ¹²²⁰ as AGN for source 54. Given the relative brightness in ¹²²¹ X-rays, but the lack of counterparts down to the lim-¹²²² iting magnitude of 21.7 (at 50% recovery rate) in the

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5.7. Sources without MW Counterparts



Figure 19. Spectra and lightcurves for hard CXO sources matched to background sources.

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¹²²³ z band of the DECaPS2 survey, we consider these CO ¹²²⁴ classifications plausible.

Source 110 has an absorbed PL index with high un-1225 1226 certainty $\Gamma = 3.1 \pm 0.8$, which may indicate a soft spectrum. Its X-ray spectrum resembles those of magnetars. 1227 At an assumed typical Galactic distance of ~ 4 kpc, its 1228 X-ray luminosity would be $\sim 2 \times 10^{31}$ erg s⁻¹. This 1229 1230 absorbed luminosity is compatible with those of mag-1231 netars in quiescence (Olausen & Kaspi 2014). The cor-¹²³² responding unabsorbed luminosity of $\sim 10^{32} \,\mathrm{erg \, s^{-1}}$ is too large for a non-flaring low mass star, while a higher 1233 mass star should be visible in DECaPS2. Source 110 is 1234 unconfidently classified by MUWCLASS as a NS at 56%1235 probability. 1236

¹²³⁷ Sources 20 and 110 have 1 "bad" detection $\sim 1''$ ¹²³⁸ away in the DECaPS2 *g*-band, but without any reported ¹²³⁹ fluxes. A deeper NIR observation would help to firmly ¹²⁴⁰ establish the nature of these sources.

6. SUMMARY

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¹²⁴² We performed multiwavelength analysis and classifi-¹²⁴³ cation of 131 X-ray sources detected in the field of the ¹²⁴⁴ 300 Myr-old nearby cluster NGC 3532. Of these X-ray ¹²⁴⁵ sources, 28% are variable, and 95% have multiwave-¹²⁴⁶ length counterparts in at least one of the surveys we ¹²⁴⁷ used. We summarize the main results from our study ¹²⁴⁸ below:

- We confidently classified 40 CXO sources to be low-mass stars or young low-mass stars, of which 31 belong to the cluster. Six flaring sources belong to the cluster, with the largest flare luminosity being 3.4×10^{30} erg s⁻¹ cm⁻².
- We confirm the previously reported inverse correlation between X-ray activity and rotation period in low-mass stars.
- Eight late B-type or early A-type cluster stars were detected in X-rays. While most of them likely have low-mass companions responsible for X-ray emission, Source 29* does not have reported evidence of binarity, and yet shows a strong, 5ks long flare with an average flare luminosity of $3.4 \times 10^{30} \text{ erg s}^{-1}$.

• Detailed analysis of ML classification results con-1264 firms that the precision of LM-STAR and AGN 1265 classifications in the field of NGC 3532 are high, 1266 while completeness is lower. This could be due 1267 to biases and imbalances in the distribution of 1268 source classes in our TD. The classifications for 1269 CO classes are mostly unconfident, due to under-1270 representation in the TD, and require additional 1271 observations/analysis to confirm. 1272

- Among galactic background sources with MW counterparts, we found flaring sources (Sources 30, 42, 43, 49) showing symmetric flare profiles which differ from sharp-rise slow-decay profiles typical for flaring stars. Since such profiles are relatively rare for coronal stellar flares, these sources may have a different nature. Of these, Source 43 is the most interesting source, showing a strong flare distinct from typical coronal flares. Deeper CXO ACIS observations of these sources could uncover a possible compact object nature.
- We identified several other background sources as candidate compact objects (Sources 4, 9, 12, 20, 54, 62, and 110), based on their spectral properties and higher X-ray luminosities at their fiducial distances. In particular, source 9 has a high tangential velocity of 340 km s⁻¹ which, combined with the hard X-ray spectrum, makes it likely to be a non-accreting neutron star in a binary system.
- The candidate compact objects are not likely to be cluster members of NGC 3532, because they lack reliable optical/IR counterparts. The CO remnants of the ~ 20 massive stars that have gone supernova at the cluster age have likely all escaped the cluster by this time. In theory, some types of COs (e.g., CVs or NSs from electron-capture SNe) could exist in NGC 3532. However, electroncapture SNe that form NSs are thought to be only a few percent of core collapse SNe (Wanajo et al. 2010), and thus may not have occurred in the cluster. Additionally, any companion stars of WDs may not hav had enough time to evolve to form CVs. The only two cluster members that could, in principle, harbour a CO are associated with the evolved star (Source 99) and the A0 star with a hard excess (Source 111).

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7. ACKNOWLEDGEMENT

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Source	2CXO Name	Class	P_{Class}	Can. CO	$C_{\rm net}$	$P_{\rm var}$	Gmag	Dist.	γ	kT
4	J110522.5-585718	HMXB?	0.36 ± 0.10	Υ	131	0.47	16.8	6090^{+2090}_{-1020}	$2.03_{-0.42}^{+0.45}$	$5.40^{+9.72}_{-1.99}$
7	J110450.0-585559	LM-STAR	1.00 ± 0.01	Ν	325	0.85	11.7	$286^{+1.03}_{-1.06}$	$9.80^{+-}_{-1.25}$	$0.56\substack{+0.04 \\ -0.04}$
8	J110439.4-585550	YSO?	0.55 ± 0.15	Ν	53	0.97	17.77	$616\substack{+44.7\\-35.8}$	$8.03^{+-}_{-3.38}$	$0.39\substack{+0.10\\-0.09}$
9	J110449.9-585549	CV?	0.39 ± 0.07	Υ	91	0.18	17.82	3890^{+2130}_{-1500}	$1.63^{+0.49}_{-0.45}$	$5.33^{+2.40}_{-1.48}$
10	J110455.3-585516	YSO?	0.45 ± 0.10	Ν	56	1	18.92	$561^{+66.8}_{-51.4}$	$2.43_{-0.39}^{+0.75}$	$0.67\substack{+0.16\\-0.09}$
12	J110423.1-585445	AGN?	0.47 ± 0.07	Ν	382	0.96			$2.21_{-0.24}^{+0.26}$	$4.70^{+2.79}_{-1.17}$
13	J110548.8-585438	NS?	0.62 ± 0.32	Ν	104	0.44			$1.66^{+0.47}_{-0.44}$	$14.36^{+29.66}_{-7.03}$
15	J110443.6-585425	HM-STAR	0.61 ± 0.10	Ν	183	1	11.44	$1850_{-63.0}^{+77.6}$	$2.67^{+0.32}_{-0.30}$	$1.04\substack{+0.06\\-0.07}$
18	J110428.3-585400	AGN?	0.69 ± 0.33	Ν	114	0.42	22.37		$1.90^{+0.41}_{-0.38}$	$4.22_{-1.35}^{+5.26}$
20	J110605.6-585334	LMXB?	0.53 ± 0.23	Ν	124	0.88			$1.78^{+0.51}_{-0.45}$	$6.23^{+27.09}_{-3.52}$
22	J110414.8-585305	LM-STAR	1.00 ± 0.01	Ν	222	0.99	12.47	$493^{+3.62}_{-3.61}$	$5.12^{+0.68}_{-0.60}$	$0.61\substack{+0.04\\-0.04}$
25	J110535.7-585212	LM-STAR	1.00 ± 0.00	Ν	153	0.82	12.04	$483^{+4.15}_{-3.35}$	$9.63^{+-}_{-1.33}$	$0.40\substack{+0.10\\-0.10}$
26	J110507.7-585206	NS?	0.65 ± 0.18	Ν	165	0.83			$1.72_{-0.32}^{+0.34}$	$15.32^{+38.65}_{-7.58}$
27	J110610.7-585154	YSO?	0.53 ± 0.12	Ν	139	1	18.13	1110^{+170}_{-118}	$3.09\substack{+0.63\\-0.53}$	$0.75_{-0.18}^{+0.08}$
29	J110430.1-585147	LM-STAR?	0.60 ± 0.11	Ν	330	1	9.84	$466^{+2.83}_{-3.45}$	$2.93_{-0.26}^{+0.29}$	$1.38^{+1.17}_{-0.04}$
30	J110443.6-585132	LMXB?	0.38 ± 0.08	Y	53	1	19.87	2920^{+1280}_{-1530}	$2.67^{+0.62}_{-0.54}$	$0.59\substack{+0.08\\-0.10}$
35	J110543.3-585053	LM-STAR?	0.63 ± 0.13	Ν	220	0.64	15.55	$482^{+6.31}_{-5.54}$	$3.75_{-0.42}^{+0.46}$	$0.67\substack{+0.74 \\ -0.04}$
41	J110456.3-585015	YSO?	0.52 ± 0.06	Ν	219	1	16.74	$371^{+18.9}_{-15.2}$	$3.75_{-0.39}^{+0.43}$	$0.79\substack{+0.05\\-0.05}$
42	J110420.3-585010	LMXB?	0.36 ± 0.08	Y	131	1	16.6	$1480^{+113}_{-83.3}$	$2.02_{-0.30}^{+0.35}$	$0.65^{+-}_{-0.05}$
43	J110445.0-585009	LMXB	0.70 ± 0.11	Υ	151	1			$1.93_{-0.30}^{+0.32}$	$4.27^{+1.60}_{-0.99}$
49	J110423.6-584935	LMXB?	0.45 ± 0.08	Ν	51	1	19.61	1220^{+1060}_{-341}	$3.17^{+1.12}_{-0.79}$	$0.63^{+0.18}_{-0.12}$
51	J110438.6-584929	LM-STAR	0.83 ± 0.07	Ν	71	0.91	9.73	$513^{+49.9}_{-38.0}$	$8.78^{+-}_{-1.93}$	$0.51\substack{+0.07\\-0.10}$
52	J110524.4-584913	AGN?	0.66 ± 0.14	Ν	101	0.97			$1.50^{+0.43}_{-0.40}$	$31.10_{-22.36}^{+-}$
54	J110453.3-584900	NS?	0.46 ± 0.27	Ν	89	0.52			$1.60^{+0.38}_{-0.36}$	$24.56_{-17.68}^{+-}$
55	J110554.8-584859	LM-STAR	0.87 ± 0.07	Ν	357	0.57	9.73	$434_{-23.9}^{+26.7}$	$8.22_{-0.86}^{+0.97}$	$0.45\substack{+0.04\\-0.07}$
57	J110435.5-584824	LM-STAR	1.00 ± 0.01	Ν	619	1	12.34	$475^{+3.00}_{-3.11}$	$4.80\substack{+0.36 \\ -0.34}$	$0.60\substack{+0.03\\-0.03}$
59	J110520.7-584757	LM-STAR	0.78 ± 0.09	Ν	285	0.19	14.23	$406^{+2.63}_{-2.40}$	$5.40^{+0.64}_{-0.57}$	$0.52\substack{+0.11\\-0.05}$
61	J110529.6-584720	LM-STAR?	0.34 ± 0.12	Ν	74	1	18.54	$463^{+39.5}_{-30.1}$	$3.06\substack{+0.65\\-0.56}$	$1.02\substack{+0.41\\-0.21}$
62	J110439.8-584701	LMXB	0.49 ± 0.09	Υ	321	0.09	20.02	3980^{+1990}_{-1480}	$1.54_{-0.24}^{+0.25}$	$17.64^{+-}_{-8.69}$
64	J110518.4-584615	LM-STAR	0.73 ± 0.07	Ν	66	0.06	9.65	$460^{+8.35}_{-6.46}$	$10.00^{+-}_{-1.82}$	$0.44_{-0.18}^{+0.11}$
65	J110535.8-584609	LM-STAR	0.70 ± 0.10	Ν	66	0.17	8.97	$538^{+21.4}_{-18.1}$	$10.00^{+-}_{-1.78}$	$0.37\substack{+0.18 \\ -0.12}$
66	J110535.5-584547	CV?	0.42 ± 0.09	Ν	144	1	17.39	$450^{+16.6}_{-15.6}$	$3.32_{-0.47}^{+0.54}$	$0.67\substack{+0.06\\-0.06}$
68	J110450.7-584543	LM-STAR?	0.43 ± 0.11	Ν	179	1	16.46	$451_{-6.86}^{+8.26}$	$3.19\substack{+0.49\\-0.43}$	$0.53\substack{+0.12\\-0.05}$
70	J110542.6-584540	YSO?	0.57 ± 0.12	Ν	209	0.14	15.95	1810^{+130}_{-111}	$3.00\substack{+0.39\\-0.36}$	$0.99\substack{+0.08\\-0.08}$
71	J110521.8-584528	LMXB?	0.60 ± 0.14	Ν	135	1	17.95		$3.19\substack{+0.51\\-0.45}$	$0.64\substack{+0.06\\-0.05}$
77	J110441.4-584352	NS	0.82 ± 0.12	Υ	227	0.65			$1.29_{-0.29}^{+0.31}$	$79.90_{-54.75}^{+-}$
90	J110621.8-585133	CV?	0.35 ± 0.08	Υ	109	0	19.62	4560^{+1810}_{-1200}	$1.65\substack{+0.54\\-0.47}$	$6.52\substack{+20.21\\-3.36}$
99	J110435.9-584520	LM-STAR	0.90 ± 0.07	Ν	130	1	7.41	$429_{-6.21}^{+6.09}$	$3.81\substack{+0.85\\-0.68}$	$0.24\substack{+0.06\\-0.04}$
110	J110429.5-584406	NS?	0.56 ± 0.15	Ν	97	0.9			$3.15\substack{+0.86\\-0.77}$	$1.88\substack{+0.85\\-0.69}$
111	J110532.7-584349	LM-STAR?	0.55 ± 0.10	Ν	56	0.93	8.91	$470\substack{+6.40 \\ -5.91}$	$10.00^{+-}_{-1.75}$	$0.56\substack{+0.06 \\ -0.21}$
118	J110515.6-585437	LMXB?	0.43 ± 0.10	Υ	36	0.94	20.78	$4690\substack{+1870 \\ -1870}$	$1.86\substack{+0.82\\-0.70}$	$5.05^{+-}_{-2.69}$
119	J110518.3-584842	LMXB?	0.44 ± 0.11	Υ	34	0.01	17.62	1550^{+278}_{-219}	$3.28\substack{+0.95\\-0.79}$	$0.61\substack{+0.24 \\ -0.11}$
131	J110457.9-584742	LM-STAR	0.89 ± 0.07	Ν		0.59	8.39			

Table 2. Table of sources discussed in detail in Section 5. This table represents a subset of a larger machine-readable table (MRT) which includes all 131 X-ray sources detected with S/N > 5, available electronically. Columns shown in this table include: CSC2 name, most probable ML classification and probability, candidate CO status in 5-class scheme (if CT> 2 for CO class probability, see Equation 2), net CXO counts, variability, Gaia eDR3 distance (pc), PL fit photon index Γ , and kT (keV) from the mekal fit. Unconfident classifications in 8-class scheme (as defined by Eq. 2) are marked with "?" Note that a source with the highest probability for a CO class in the 8-class scheme may still not be a candidate CO in the 5-class scheme, if its combined probabilities for the CO-related classes (LMXB, NS, CV, and HMXB) are not high enough.



Figure 20. Spectra and lightcurves for CXO sources with only DECaPS2 counterparts.



Figure 21. Spectra and lightcurves for CXO sources without MW counterparts.

¹³²⁰ istered by Oak Ridge Associated Universities through a¹³²¹ contract with NASA.

Database: This work has made use of the Chandra
Source Catalog, provided by the Chandra X-ray Center (CXC) as part of the Chandra Data Archive (Evans
et al. 2020); the SIMBAD database, operated at CDS,
Strasbourg, France (Wenger et al. 2000); and the VizieR
catalogue access tool, CDS, Strasbourg, France (Ochsenbein et al. 2000).

¹³²⁹ Software: Astropy (Collaboration et al. 2013), As-¹³³⁰ troquery (Ginsburg et al. 2019), scikit-learn (Pedregosa t al. 2011), imbalanced-learn (Lemaître et al. 2017),
isochrones (Morton 2015), hvplot, and related holoviz
packages.¹⁵

Hardware: This work was completed in part with resources provided by the High Performance Computing
Cluster at The George Washington University, Research
Technology Services.

Facilities: CXO, Gaia, CTIO:2MASS, WISE, NEOWISE, CTIO: DECAM, CTIO: VST

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APPENDIX

A. CONFUSION MATRICES

To validate the performance of MUWCLASS applied to the NGC 3532 field, we use the same TD (with additional distance and luminosity information) and leave-one-out-cross-validation (LOOCV) method as described in Yang et al. 1344 (2022). Before running the LOOCV procedure, We apply reddening on AGNs in the TD using the extinction and 1345 absorption parameters (E(B-V) = 1.3, Ruiz (2018), $n_H = 9 \times 10^{21}$ cm⁻², Güver & Özel (2009)) through the Galactic

Figure 22. Normalized precision confusion matrices (CMs) of the TD using the Leave-One-Out cross validation method where every AGN has been reddened using the extinction/absorption parameter from the NGC 3532 field. Compared to (Yang et al. 2022), Gaia eDR3 distances (Bailer-Jones et al. 2021) and associated luminosities are added, which improves performance slightly. The left panels shows the CMs of all classifications while the right panels shows the CMs for the confident classifications ($CT \ge 2$). The upper panels show the CMs under the 8-class scheme and the lower panels show the CMs under the 5-class scheme. The value within each element of the CM is the percentage of sources in a true class, shown on the horizontal axis, that are from the predicted class, shown on the vertical axis. The values under the class labels along the vertical axis in the left panels are the total numbers of the sources in the corresponding classes, while in the right panels these values are the fractions of the sources surviving the confidence cut ($CT \ge 2$) for each class. Redder colors indicate higher classification percentage.

¹³⁴⁶ plane in the direction of NGC 3532. The confusion matrices that summarize classification performance are shown in ¹³⁴⁷ Figure 22.

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B. ASTROMETRIC CORRECTION

We apply astrometric corrections to CSC2 source coordinates by aligning the master level X-ray coordinates to Gaia eDR3 source coordinates. The Gaia eDR3 reference sources are built with a few filters applied to ensure the reliability of their astrometry (G < 23, Gaia position errors e_RA_ICRS< 1, e_DE_ICRS< 1, Gaia parallax and parallax error -2 < Plx < 2, e_Plx < 1, Gaia proper motion and proper motion error PM< 20, e_PM< 1, RUWE< 1.4 and Gaia astrometric excess noise epsi< 1.898, corresponding to the 90% of the epsi distribution).

residlim	$\Delta RA \cos(DEC)$	ΔDEC	$\mathrm{PU}_{\mathrm{astro}}$	RMS Residuals $^{\rm a}$	# of matched pairs
arcsec	arcsec	arcsec	arcsec	arcsec	
0.1	0.32	0.12	0.124	0.041	5
0.2	0.23	0.15	0.092	0.092	9
0.3	0.19	0.11	0.086	0.117	12
0.4	0.23	-0.03	0.062	0.190	22

Table 3. Astrometric solutions of CXO observation of NGC 3532 (ObsID=8941) using a set of reslim parameter from wcs_match. ^a RMS Residuals is calculated from wcs_match.

¹³⁵⁵ proper motions (if no proper motion value is available, we use the initial ICRS coordinates from Gaia eDR3 catalog at ¹³⁵⁶ epoch MJD = 57388. at 2016-01-01). The X-ray sources are filtered on broadband significance > 5 and broadband net ¹³⁵⁷ counts (src_cnts_aper90_b)>20 before they are matched to the proper-motion-corrected Gaia sources using the CIAO ¹³⁵⁸ wcs_match algorithm. For wcs_match, we use "trans" method with only translational correction, source match radius ¹³⁵⁹ = 1.0, residtype=0, esidfac=0. The residlim is the residual limit used to eliminate the largest source pair position ¹³⁶⁰ error, and we tested several different values of this parameter (0.1, 0.2, 0.3, 0.4).

¹³⁶¹ The astrometric (alignment) uncertainty ("PU_astro_68" column) is calculated using the following equation:

$$PU_{astro} = \left(\sum_{i=1}^{N} \left(\frac{1}{\delta_{X,i}^{2} + \delta_{Gaia,i}^{2}}\right)\right)^{-1/2}$$
(B1)

where *i* goes through all matched pairs that remain after the final iteration of wcs_match, $\delta_{\rm X}$ is the 1σ X-ray PU as calculated using the equation 14 from Kim et al. (2007), and $\delta_{\rm Gaia}$ is the standard error in the Gaia coordinates. The final astrometric PUs are the arithmetic mean of the astrometric PUs in the RA and DEC directions. The astrometric solutions are summarized in Table 3 with different setting of residlims. We use residlim=0.2 since it is consistent with astrometric solutions calculated from residlim=0.1 and residlim=0.3 and the RMS residuals and the alignment uncertainties converge.

¹³⁶⁹ We calculated the combined X-ray PU ("PU" column) by adding the 95% level PU from Kim et al. (2007) ¹³⁷⁰ ("PU_kim95" column) and the alignment uncertainty ("PU_astro_68" column, multiplied by 2 to convert 1- σ to 2-¹³⁷¹ σ) in quadrature.

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C. DETAILED ANALYSIS FOR ADDITIONAL SOURCES

¹³⁷⁴ Here we present detailed analysis for additional ¹³⁷⁵ sources not covered in Section 5.

1376 C.1. Cluster Members

Source 71^{*} misses 2MASS/Gaia counterparts by a tiny 1377 margin (0.002'') outside combined PU.), but is matched 1378 to a DECaPS2 counterpart. However, because DE-1379 CaPS2 is not used in the ML pipeline, this source is 1380 unconfidently classified as an LMXB. The Gaia coun-1381 $_{1382}$ terpart has proper motion (-9.981, 5.295) mas/yr and 1383 distance (≈ 483 pc) consistent with those of NGC 3532, 1384 is slightly above the main sequence on the binary track, 1385 and appears to be K-type. However, the RUWE value 1386 of 1.0 does not indicate binarity. Source 71 exhib-¹³⁸⁷ ited a large flare with luminosity of $3 \times 10^{30} \,\mathrm{erg \, s^{-1}}$

1388 assuming a cluster distance. Since the spectrum and
1389 lightcurve of Source 71 resemble those of a relatively
1390 nearby coronally flaring low-mass star, we consider the
1391 2MASS/Gaia counterpart to likely be the real match.

C.2. Cluster A-Type and B-Type Stars

¹³⁹³ Sources 55 and 64, identified as CPD-58 3086B, ¹³⁹⁴ CPD-58 305 in SIMBAD, were seen in ROSAT (Fran-¹³⁹⁵ ciosini et al. 2000). They exhibit evidence of binarity ¹³⁹⁶ (RUWE=6.0, 1.5, and elevated positions above the soli-¹³⁹⁷ tary star track of the main sequence in the CMD). The ¹³⁹⁸ X-ray spectra are soft and can be well-described by a ¹³⁹⁹ mekal model with $kT \approx 0.4$ keV. They are non-variable, ¹⁴⁰⁰ and have X-ray luminosities of ~ 10^{29} erg s⁻¹.

¹⁴⁰¹ Source 99* has a Gaia DR3 counterpart coincident ¹⁴⁰² with the "red clump" region on the NGC 3532 isochrone ¹⁴⁰³ shown in see Figure 3, and is known as HD 96175 in ¹⁴⁰⁴ SIMBAD. Its distance and proper motion are compat-¹⁴⁰⁵ ible with cluster membership. Using the isochrone fit, ¹⁴⁰⁶ this star has initial mass $\approx 3.3 \,\mathrm{M}_{\odot}$, or spectral type

¹⁴⁰⁷ \approx B8V. The source is variable in X-rays, displaying a ¹⁴⁰⁸ small flare. The Gaia RUWE value is 1.79, consistent with ¹⁴⁰⁹ previous identification as a spectroscopic binary. This ¹⁴¹⁰ source also appears in the Gaia DR3 "Non-single stars ¹⁴¹¹ catalog" (Collaboration et al. 2022) with a measured pe-¹⁴¹² riod of 240 days and **primary** semi-major axis of 0.286 ¹⁴¹³ AU. This source is likely in binary with a lower-¹⁴¹⁴ mass star responsible for the X-ray emissions.

1415 Source 99 and 131 appear in the TD as LM-STARs,
1416 and were classified as such. As our manual analysis
1417 agrees with the classifications, we do not consider this
1418 to be of much concern.

C.3. Foreground Stars

¹⁴²⁰ Sources 41^{*} and 59 are coincident with foreground ¹⁴²¹ stars at $d \approx 370$ and 400 pc, respectively, according to ¹⁴²² Gaia eDR3 distances (Bailer-Jones et al. 2021). Their ¹⁴²³ spectra and lightcurves are shown in Figure 23. Both ¹⁴²⁴ sources exhibit soft X-ray spectra which are adequately ¹⁴²⁵ described by the **mekal** model with kT = 0.78 and 0.26 ¹⁴²⁶ keV respectively. The former source is classified as 52% ¹⁴²⁷ YSO and 30% LM-STAR while the latter is classified as ¹⁴²⁸ 86% LM-STAR.

The lightcurve of Source 41 shows a minor flare, while 1430 its RUWE value of 2.2 indicates binarity. Given the some-1431 what harder spectrum (compared to Source 59), it may 1432 be an active binary, which could be classified as a YSO 1433 by the ML pipeline. Source 59 is likely a coronally active 1434 low-mass star.

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C.4. Background Sources

¹⁴³⁶ Source 8, at $d \approx 616 \pm 40$ pc, is slightly beyond NGC ¹⁴³⁷ 3532, although its Gaia PM ((-10.025, 5.026) mas/yr) is ¹⁴³⁸ consistent with cluster membership. The source has a ¹⁴³⁹ soft X-ray spectrum, which fits with the **mekal** model, ¹⁴⁴⁰ having $kT \approx 0.39$ keV. Its **RUWE** value of 1.3 may indicate ¹⁴⁴¹ binarity. The CXO lightcurve shows a small flare. The ¹⁴⁴² source is classified as 55% YSO and 38% LM-STAR, ¹⁴⁴³ suggesting either a coronally active low-mass star or an ¹⁴⁴⁴ active binary.

¹⁴⁴⁵ Source 15^{*} was catalogued by Fernandez & Salgado ¹⁴⁴⁶ (1980) and is listed as Cl^{*} NGC 3532 FERN 299 in ¹⁴⁴⁷ SIMBAD. However, Gaia proper motion $(\mu_{\text{RA}},\mu_{\text{Dec}})=(-$ ¹⁴⁴⁸ 6.137, 0.351) mas yr⁻¹, distance $d \approx 1850\pm75$ pc, as well ¹⁴⁴⁹ as the position off the main sequence on the optical CMD ¹⁴⁵⁰ are inconsistent with cluster membership. The source is ¹⁴⁵¹ significantly (but slowly) variable in X-rays with a rela-¹⁴⁵² tively hard spectrum that's fit by an absorbed PL with ¹⁴⁵³ $\Gamma \approx 2.7$. The X-ray luminosity is 5.7×10^{30} erg s⁻¹. The ¹⁴⁵⁴ RUWE value of 1.5 indicates binarity. Gaia DR3 astro-¹⁴⁵⁵ physical parameters are conflicting, with the ESP-ELS ¹⁴⁵⁶ module suggesting a K-type star with $T \approx 5,000$ K while ¹⁴⁵⁷ the FLAME module gives a stellar mass of $3.4M_{\odot}$, im-¹⁴⁵⁸ plying a B-type star. The distance, brightness, and color ¹⁴⁵⁹ suggests an evolved star, possibly of K-type. The X-ray ¹⁴⁶⁰ source is classified by the pipeline as 74% HM-STAR and ¹⁴⁶¹ 16% YSO. The relatively bright X-ray emission may be ¹⁴⁶² from interaction with a companion.

¹⁴⁶³ Source 27^{*}, at $d \approx 1100$ pc, has UnWISE, 2MASS ¹⁴⁶⁴ and Gaia counterparts and shows a relatively hard X-ray ¹⁴⁶⁵ spectrum which can be described by **mekal** with $kT \approx$ ¹⁴⁶⁶ 0.7 keV, with most of the photons detected during the ¹⁴⁶⁷ flare. The flare has a sharp rise and slow decay profile ¹⁴⁶⁸ typical for stellar flares. The source is classified as 53% ¹⁴⁶⁹ YSO, 26% CV, and 18% LMXB. The classifications are ¹⁴⁷⁰ likely affected by the spectral hardening during the flare ¹⁴⁷¹ which dominates most of the spectral counts.

Source 119 only has a Gaia counterpart, which is only detected in the G-band. This source is non-variable during the CXO observation. Its spectrum fits the absorbed two problem is harder and more two problem is the counce is harder and more two problem is the counce is harder and more two problem is the counce is harder and more two problem is the counce is harder and more two problem is the counce is harder and more two problem is the counce is harder and more two problem is the counce is harder and more two problem is the counce is harder and more the counce is harder and more two problem is the counce is harder and more th

¹⁴⁶² Source 118 is faint both in optical and X-rays, and ¹⁴⁸³ has a negative parallax in Gaia DR3 and a rather un-¹⁴⁸⁴ certain proper motion ($\mu = (6.1 \pm 1.6)$ mas yr⁻¹). The ¹⁴⁸⁵ faintness of this source prevents us from drawing further ¹⁴⁸⁶ conclusions.

C.5. Hard Sources with MW counterparts

Sources 4 and 90 have Gaia and NIR counterparts. 1488 with Gaia distance beyond the cluster. The sources lie 1489 ¹⁴⁹⁰ near the edge of the ACIS-I field-of-view, so the chance 1491 coincidence probability is larger. The spectra are rela-¹⁴⁹² tively hard, and are well fit by both models, with PL ¹⁴⁹³ photon indices $\Gamma \approx 2.0$, 1.6 and mekal $kT \approx 5.4$, 6.5 ¹⁴⁹⁴ keV. Their X-ray luminosities $(L_X > 10^{31} \,\mathrm{erg \, s^{-1}})$ are 1495 higher than a typical solitary low-mass star at their fidu-1496 cial distances of 6 and 4.5 kpc, while their optical lu-¹⁴⁹⁷ minosity $L_{\rm O} \sim 10^{32}$, $10^{34} \, {\rm erg \, s^{-1}}$ are compatible with ¹⁴⁹⁸ stellar luminosities. The RUWE values of ~ 1 do not provide evidence of binarity. Their total proper motion of 1499 $_{1500}$ (6.4 ± 0.6 mas/yr, 7.0 ± 0.4 mas/yr) translates to high ¹⁵⁰¹ velocities of $\approx 180 \,\mathrm{km \, s^{-1}}$, $150 \,\mathrm{km \, s^{-1}}$. However, these ¹⁵⁰² velocities may be mostly due to differential galactic ro-¹⁵⁰³ tation. These sources are classified as candidate COs ¹⁵⁰⁴ in the 5-class scheme, which is supported by their hard ¹⁵⁰⁵ spectra and high X-ray luminosities.

Figure 23. Spectra and lightcurves for CXO sources matched to cluster foreground stars.

1532

D. WHITE DWARFS

We cross-matched WDs and WD candidates in NGC 1507 ¹⁵⁰⁸ 3532 in the literature to CXO sources. Only three WDs (None of them are the heavy WD VPHAS J110358.0-1509 583709.2) are located within the field of view of the CXO 1510

¹⁵¹¹ observation, and none of them had an X-ray counter-¹⁵¹² part. The list of WDs in NGC 3532 is given in Table 4. ¹⁵¹³ Non-detection in X-rays is consistent with solitary WDs ¹⁵¹⁴ with temperatures of $\sim 3 \times 10^4$ K, derived in Dobbie 1515 et al. (2009) at the age of NGC 3532.

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NGC 3532

Identifier	Object Type	RA	DEC	Reference
Cl* NGC 3532 RK 8	WD*	168.2033	-58.8306	[1]
NGC 3532-WDC J1107-5848	${\rm Candidate_WD}^*$	166.8698074	-58.80675485	[1]
NGC 3532-WDC J1107-5842	${\rm Candidate_WD}^*$	166.8415686	-58.7034724	[1]
NGC 3532-WDC J1106-5847	${\rm Candidate_WD}^*$	166.7460896	-58.79267942	[1]
NGC 3532-WDC J1106-5843	${\rm Candidate_WD}^*$	166.7151416	-58.73028971	[1]
NGC 3532-WDC J1106-5905	${\rm Candidate_WD}^*$	166.5764723	-59.08813626	[1]
NGC 3532-WDC J1106-5856	${\rm Candidate_WD}^*$	166.5702729	-58.93469326	[1]
Cl* NGC 3532 RK 5	WD^*	166.5173497	-58.92221326	[1]
Cl* NGC 3532 RK 6	WD^*	166.4710669	-58.49197324	[1]
Cl* NGC 3532 RK 1	WD^*	166.3993072	-58.87401832	[1]
NGC 3532-WDC J1105-5857	${\rm Candidate_WD}^*$	166.3494859	-58.95636597	[1]
Cl* NGC 3532 RK 10	WD^*	165.8130725	-58.36229544	[1]
VPHAS J110358.0-583709.2	WD	165.9916069	-58.6191961	[2]
VPHAS J110434.5-583047.4	WD	166.14375	-58.51317	[2]
VPHAS J110547.2-584241.8	WD	166.44667	-58.71161	[2]
Cl* NGC 3532 RK 9	WD^*	165.9054929	-58.31119815	[3]

Table 4. WDs and candidate WDs suggested to be cluster members of NGC 3532. WDs within the field of the CXO observation of NGC 3532 bolded. Some WDs have Gaia counterparts inconsistent with cluster membership, and are not shown in Fig. 3. References: [1]: Dobbie et al. (2012), [2]: Raddi et al. (2016), [3]: Koester & Reimers (1993)

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