The GALAH Survey: No chemical evidence of an extragalactic origin for the Nyx stream

DANIEL B. ZUCKER ^[1], ^{1,2,3} JEFFREY D. SIMPSON ^[2], ^{4,3} SARAH L. MARTELL ^[0], ^{4,3} GERAINT F. LEWIS ^[0], ⁵ JOSS BLAND-HAWTHORN ^[0], ^{5,3} SVEN BUDER ^[0], ^{6,3} ANDREW R. CASEY ^[0], ^{7,8} GAYANDHI M. DE SILVA ^[0], ^{9,2} VALENTINA D'ORAZI ^[0], ¹⁰ KEN C. FREEMAN ^[0], ⁶ MICHAEL R. HAYDEN ^[0], ^{5,3} JANEZ KOS, ¹¹ JANE LIN, ^{6,3} KARIN LIND, ¹² KATHARINE J. SCHLESINGER ^[0], ⁶ SANJIB SHARMA ^[0], ^{5,3} AND TOMAŽ ZWITTER ^[0]

¹Department of Physics and Astronomy, Macquarie University, Sydney, NSW 2109, Australia

²Macquarie University Research Centre for Astronomy, Astrophysics & Astrophotonics, Sydney, NSW 2109, Australia

³Centre of Excellence for Astrophysics in Three Dimensions (ASTRO-3D), Australia

⁴School of Physics, UNSW Sydney, NSW 2052, Australia

⁵Sydney Institute for Astronomy, School of Physics, A28, The University of Sydney, NSW 2006, Australia

⁶Research School of Astronomy & Astrophysics, Australian National University, ACT 2611, Australia

⁷Monash Centre for Astrophysics, Monash University, Australia

⁸School of Physics and Astronomy, Monash University, Australia

⁹Australian Astronomical Optics, Faculty of Science and Engineering, Macquarie University, Macquarie Park, NSW 2113, Australia

¹⁰Istituto Nazionale di Astrofisica, Osservatorio Astronomico di Padova, vicolo dell'Osservatorio 5, 35122, Padova, Italy

¹¹Faculty of Mathematics and Physics, University of Ljubljana, Jadranska 19, 1000 Ljubljana, Slovenia

¹²Department of Astronomy, Stockholm University, AlbaNova University Centre, SE-106 91 Stockholm, Sweden

(Received June 1, 2019; Revised January 10, 2019; Accepted November 6, 2020)

Submitted to ApJL

ABSTRACT

The ESA *Gaia* astrometric mission and deep photometric surveys have revolutionized our knowledge of the Milky Way. There are many ongoing efforts to search these data for substructure to find evidence of individual accretion events that built up the Milky Way and its halo. One of these newly identified features, called Nyx, was announced as an accreted stellar stream traveling in the plane of the disk. Using a combination of abundances and stellar parameters from the GALAH and APOGEE surveys, we find that the abundances of the highest likelihood Nyx members are entirely consistent with the thick disk, and inconsistent with a dwarf galaxy origin. We conclude that the postulated Nyx stream is most probably a high-velocity component of the Milky Way's thick disk. With the growing availability of large data sets including kinematics, stellar parameters, and detailed abundances, the probability of detecting chance associations increases, and hence new searches for substructure require confirmation across as many data dimensions as possible.

Keywords: Milky Way disk – Milky Way dynamics – Galactic abundances – Stellar abundances

1. INTRODUCTION

In the Λ CDM paradigm for the formation and growth of galaxies and large-scale structures in the Universe, the growth of large galaxies like the Milky Way happens as a result of mergers with smaller bodies. As a smaller galaxy is accreted by the Milky Way, its stars will be tidally stripped into long tails, which can remain spatially coherent for many orbits because of the long dynamical time in the Galactic halo,

and will retain their kinematic association for longer (e.g., Freeman & Bland-Hawthorn 2002; Bullock & Johnston 2005; Johnston et al. 2008). As a consequence, a history of accretion events will lead to an accumulation of stellar streams and tidal debris throughout the Milky Way, which serve as the fossil record of those events, even in the Solar neighborhood (e.g., Helmi et al. 1999). These structures provide opportunities to explore the gravitational potential of the Galaxy and the presence of substructure in the dark matter distribution, as well as the properties of the systems that have contributed to the growth of the Milky Way. The *Gaia* mission (Gaia Collaboration et al. 2016, 2018) is revolutionizing this work, providing accurate and precise spatial and kinematic information for a huge sample of stars in the nearby Galaxy. These data can be combined with the results from large spectroscopic surveys to identify and investigate streams and other stellar substructures of the Galaxy.

One of the major results from the Second Data Release of the Gaia mission (Gaia DR2; Gaia Collaboration et al. 2016, 2018) was that a significant proportion of the halo stars near the Sun appear to have been accreted some 9 Gyr ago from a single dwarf galaxy, dubbed "Gaia-Enceladus" by Helmi et al. (2018), and independently confirmed (including Myeong et al. 2018a,b; Haywood et al. 2018; Fattahi et al. 2019; Belokurov et al. 2018, among others). Spurred by this dramatic discovery, researchers have continued to sift through Gaia DR2 data for evidence of more accretion events. Recently one group searching for structures of accreted stars used a deep neural network classifier on the subset of stars for which Gaia provided astrometry and radial velocity measurements to identify an apparent prograde stellar stream in the Solar vicinity, which they named Nyx (Necib et al. 2019). The stars identified as members of Nyx were found to be on orbits that trail the Galactic disk by about 90 km s⁻¹, which is at the edge of the velocity distribution of the thick disk. In Necib et al. (2020) this structure was explored further using abundance data from the publicly available RAVE-on (Casey et al. 2017) and GALAH DR2 (Buder et al. 2018) catalogues. Based on the orbital information and elemental abundances of the stars, the authors concluded that Nyx must be the remnant of a disrupted dwarf galaxy.

The key abundance information applied was the magnesium abundance of the stars relative to iron, [Mg/Fe]. The evolution of α element abundances (Mg, Si, S, Ca, Ti) with overall metallicity is sensitive to the mass and star formation history of a galaxy, in the sense that the $\left[\alpha/\text{Fe}\right]$ ratio, which always begins at a super-Solar level at low metallicity, declines as [Fe/H] increases, and the start of that decline occurs at lower [Fe/H] in lower-mass galaxies (Venn et al. 2004; Tolstoy et al. 2009). Seven of the Nyx stars had been observed by the RAVE survey and had abundance results in the RAVE-on catalogue, and when Necib et al. (2020) compared their [Mg/Fe] values to literature abundances for the thick disk and halo, they found that the stars had systematically lower magnesium abundances than what would be expected for thick disk stars at the same [Fe/H], which would suggest they formed in a dwarf galaxy, rather than in situ in the Milky Way (e.g., Sheffield et al. 2012).

In this work, we re-examine Nyx using high quality abundance data from the Third Data Release of the GALAH Survey (Buder et al., in prep.) and the Sixteenth Data Release of the APOGEE Survey (Ahumada 2020). Looking at the abundances of key elements from these catalogs we find that Nyx in fact shows the same abundance patterns as the α -rich thick disk of the Milky Way, and the abundances considered by Necib et al. (2020) — key evidence for an accretion origin — were likely erroneous. We therefore conclude that Nyx is probably just a group of stars at the tail of the thick disk's kinematic distribution.

This paper is structured as follows: Section 2 introduces the surveys we draw data from, Section 3 considers the abundance data for Nyx stars, Section 4 compares the abundances in Nyx to those in the thick disk and dwarf galaxies, and in Section 5 we discuss the results.

2. DATA

In this work we make use of abundance data from three large stellar spectroscopic surveys: GALAH DR3, APOGEE DR16, and RAVE-on. The Third Data Release (DR3; Buder et al. in prep.) of the GALactic Archaeology with HERMES (GALAH) survey presents stellar parameters, radial velocities, and up to 30 elemental abundances for 588,571 stars. We use the following criteria to select a reliable data set for this project: GALAH flag flag_sp = 0 (no problems noted in the input data, reduction, or analysis); (ii) GALAH flag flag_fe_h = 0 (no problems noted in the iron abundance determination); (iii) GALAH flag flag_x_fe = 0 when considering an individual abundance [x/Fe]; (iv) a signal-to-noise in the red camera greater than 30.

The Sixteenth Data Release (DR16; Ahumada 2020) of the Apache Point Observatory Galactic Evolution Experiment (APOGEE) contains stellar parameters, radial velocities, and abundances of up to 20 elements for more than 430,000 stars. We only considered stars with ASPCAPFLAG = 0, indicating no problems in the data, reduction, or analysis, and when considering an individual abundance [x/Fe], we required $X_FE_FLAG = 0$.

The Fifth Data Release (DR5; Kunder et al. 2017) of The Radial Velocity Experiment (RAVE) covers 457,588 stars. In this work we use results from the RAVE-on catalog (Casey et al. 2017), as this was the catalog primarily used by Necib et al. (2020). RAVE-on is a re-analysis of RAVE DR5 spectra using the data-driven "label transfer" method of The Cannon (Ness et al. 2015), and it provides stellar parameters and abundances of up to seven elements per star (O, Mg, Al, Si, Ca, Fe, and Ni). Here we required qc = 1 (indicating that stars meet data quality constraints), and for stars with multiple spectra, we chose the one with the highest signal to noise ratio.

For all surveys, the Galactic orbital properties of the stars were calculated in the same manner as used to construct the GALAH DR3 kinematic value-added catalog. This is described in detail in the GALAH DR3 data release paper (Buder et al., in prep). Briefly, we used GALPY, with the McMILLAN2017 potential (McMillan 2017) and the values $R_{\rm GC} = 8.21$ kpc and $v_{\rm circular} = 233.1$ km s⁻¹. We set $(U, V, W)_{\odot} = (11.1, 15.17, 7.25) \text{ km s}^{-1}$ in keeping with Reid & Brunthaler (2004) and Schönrich et al. (2010). For APOGEE and RAVE stars we used the radial velocities reported by each survey, and distances from Bailer-Jones et al. (2018). For GALAH we used DR3 radial velocities and distances from the age and mass value-added catalog, which primarily incorporated distances found by the Bayesian Stellar Parameters estimator (BSTEP; described in Sharma et al. 2018), which calculates distance simultaneously with mass, age, and reddening.

3. ABUNDANCES FOR NYX STARS

The primary aim of our work is to compare Nyx in the context of abundance space to the disk and halo of our Galaxy, as well as to nearby dwarf galaxies. Necib et al. (2020) provided a catalogue of 232 high confidence members of Nyx found in Gaia DR2. We cross-matched these stars with each of the surveys described in Section 2 using their Gaia DR2 source_id and found that 18 Nyx stars had results in GALAH DR3, 19 stars were in RAVE-on, and 9 stars were included in APOGEE DR16. There is one Nyx star in common between all three surveys. We used the velocities and orbital properties of the stars to confirm that the Nyx stars in GALAH, APOGEE and RAVE-on are kinematically unbiased relative to the overall Nyx population. The orbital properties we calculate are consistent with those in Necib et al. (2020); namely, these stars are on prograde orbits (i.e., $J_{\phi} > 0$) with relatively large orbital energies for disk stars.

Figure 1 shows the [Fe/H]-[Mg/Fe] plane as recovered by each of the three surveys. The background distribution includes all stars that meet the relevant quality flags. Each survey is dominated by the Milky Way disk, so we see the canonical α -poor and α -rich populations. On each panel are highlighted the Nyx stars as identified by Necib et al. (2020) that were observed by each survey. There was a roughly even split between dwarfs and giants (defined as $\log g > 3.5$ and $\log g \le 3.5$, respectively); however, none of the RAVEon dwarfs (nor the one common star) had reliable RAVE-on [Mg/Fe] abundances.

The key piece of evidence that Necib et al. (2020) used to conclude that the Nyx stars were accreted was the [Mg/Fe] abundance data from RAVE-on. They noted that the stars had low [Mg/Fe] for their metallicity, compared to thick disk abundances collated from the literature by Venn et al. (2004). This direct comparison between RAVE-on and literature abundances could be problematic, but from Figure 1c, we would draw the same conclusion as Necib et al. (2020) — in the RAVE-on data set, the Nyx stars are systematically lower in [Mg/Fe] for their metallicity compared to the α -rich thick disk.

However, the sample of Nyx stars in the GALAH DR3 and APOGEE DR16 catalogues sit squarely in the region of



Figure 1. Comparison of the [Mg/Fe] abundances for Nyx stars identified by Necib et al. (2020) as determined by (a) GALAH DR3, (b) APOGEE DR16, and (c) RAVE-on. The background distribution on each panel is a scatter log-density plot of all stars from a given catalogue. For each survey the dwarfs and giants in Nyx have been identified by their log g (log g > 3.5 or log $g \le 3.5$, respectively). We find that GALAH DR3 and APOGEE DR16 place the Nyx stars in the same range of [Mg/Fe] as the thick disk, while RAVE-on locates Nyx stars at lower [Mg/Fe] values, as presented in Necib et al. (2020).

the [Fe/H]-[Mg/Fe] plane occupied by the thick disk. We only show [Mg/Fe] here, but this consistency with the thick disk also holds for other α elements. There are a number of potential explanations for this, including the possibility of a systematic issue with RAVE-on [α /Fe] abundances, or, alternatively, the existence of a large intrinsic [α /Fe] scatter in Nyx, with the subset of stars with RAVE-on abundances coincidentally all having low $\rm [Mg/Fe].$



Figure 2. There are 891 stars in common between GALAH DR3 (top), APOGEE DR16 (middle) and RAVE-on (bottom). The background distribution in each panel is a scatter log-density plot of all stars with reliable [Mg/Fe] from the appropriate catalog. Highlighted are the all stars in common between each survey, categorized by their GALAH [α /Fe], with upward black triangles showing stars with [α /Fe] > 0.16, and downward orange triangles having [α /Fe] \leq 0.16. While GALAH and APOGEE [Mg/Fe] abundances follow the GALAH [α /Fe] well, the RAVE-on [Mg/Fe] abundances for the two groups have larger scatter and similar mean values.

Pursuing this first explanation, we look at the 891 stars in common between GALAH DR3, APOGEE DR16, and RAVE-on (as identified by *Gaia* DR2 source_id). It should be noted that direct comparison of the surveys requires comparing results from GALAH and APOGEE, which have broad spectral coverage at high resolution (R > 20,000), to RAVE, whose spectra covered only the calcium triplet region at moderate resolution ($R \sim 7,500$). There will also be data quality differences due to differing target selection choices, and, because RAVE has the brightest limiting magnitude of the three surveys, most of the stars in common are at the faint end of the RAVE sample and have signal to noise ratios below 100 per resolution element. In contrast, the common stars are the bright end of the APOGEE sample, and so their signal to noise ratios tend to be over 100 per resolution element.

In Figure 2 we show the [Mg/Fe] distributions of the 891 common stars. These are classified as α -rich or α -poor based on their GALAH [α /Fe] ratios, splitting at [α /Fe] = 0.16. Since magnesium is an α element, we would expect the [Mg/Fe] ratio determined by each survey to correlate well with the overall α abundance. This is true for GALAH and APOGEE, where there is a clear distinction in [Mg/Fe] between the α -rich and α -poor populations. The RAVE-on results show a rough correspondence between our [α /Fe] selection and [Mg/Fe], in that the mean [Mg/Fe] for the α -rich stars is higher than the mean [Mg/Fe] for the α -poor stars. However, with the RAVE-on data there is no obvious high/low α distinction, since both the α -rich and α -poor groups cover the full range in [Mg/Fe].

From this comparison of the abundance values reported by the three surveys we can say that it is more likely that the RAVE-on abundances used in Necib et al. (2020) are inaccurate than it is that Nyx has a large intrinsic $[\alpha/Fe]$ range, and that the RAVE-on Nyx stars are all by coincidence at the low end of the distribution. Nyx stars in both the GALAH and APOGEE data sets have high measured [Mg/Fe] abundances that correlate well with high $[\alpha/Fe]$ ratios, and those abundances do not show a large scatter.

4. COMPARING NYX TO THE THICK DISK AND TO DWARF GALAXIES

The principal aim of the GALAH and APOGEE surveys is to measure the abundances of elements from different stellar nucleosynthetic channels. Here we use these abundance sets to consider the similarity between Nyx stars and those from different formation environments.

In particular, we consider the accretion origin hypothesis from Necib et al. (2020) by comparing Nyx stars to those from dwarf galaxies. The differing galactic chemical enrichment timelines of dwarf galaxies (e.g., Venn et al. 2004) mean that the stars that form in them show different abundance patterns to those of *in situ* Milky Way stars, e.g., lower α abundances than Milky Way stars at a given metallicity. In this section we compare the Nyx stars to samples of stars from three dwarf galaxies: the Sgr Dwarf, the Large Magellanic Cloud, and the accretion remnant Gaia-Enceladus. Noting that in Figure



Figure 3. The orbital properties of the entire GALAH survey within 3 kpc of the Sun. The highlighted are the Nyx stars (red dots), Gaia-Enceladus stars (black dots), and a kinematic selection of thick disk stars (blue dots), and the background distribution in each panel is a scatter log-density plot of all stars.

1 the Nyx stars look broadly like the thick disk, given their



Figure 4. Comparison using GALAH DR3 results of Nyx (red dots) to a kinematically-selected sample of thick disk stars (blue dots), and stars from the Gaia-Enceladus accretion event (black dots).

similarly high $[\alpha/Fe]$ ratios, we also select a sample of thick disk stars using kinematic (rather than abundance) criteria for comparison.

The LMC and Sgr stars were identified in APOGEE DR16 by first taking all stars with programname set to "magclouds" or "sgr" and then applying further selections on radial velocity and proper motion. For Sgr we then required RV > 100 km s⁻¹ and proper motions within 0.5 mas yr⁻¹ of (μ_{RA}, μ_{Dec}) = (-2.71, -1.37) mas yr⁻¹; for the LMC we required RV > 150 km s⁻¹ and proper motions within 1.0 mas yr⁻¹ of (μ_{RA}, μ_{Dec}) = (1.85, 0.30) mas yr⁻¹. The Gaia-Enceladus stars were selected from both surveys using angular momentum, J_{ϕ} , and radial action, J_R , (as employed by Feuillet et al. 2020, and Simpson et al., in prep.),



Figure 5. Comparison of APOGEE results for Nyx (red dots) to a sample of thick disk stars (blue dots), stars in the Sagittarius dwarf (orange dots), stars in the LMC (green dots) and stars from the Gaia-Enceladus accretion event (black dots).

requiring $(-0.5 < J_{\phi} < 0.5)$ Mpc km s⁻¹ and $\sqrt{J_R} > 30$ [kpc km s⁻¹]^{1/2}. The J_R - J_{ϕ} selection identifies many of the same stars as the different kinematic selections used by other researchers, but it has the advantage of less contamination from non-Gaia-Enceladus stars. We selected comparison sets of thick disk stars from both GALAH and APOGEE for comparison against Nyx by taking all stars in the region of Toomre space with $|V_{\rm UVW} + 150$ km s⁻¹| < 20 km s⁻¹ and $(0 \le \sqrt{U_{\rm UVW}^2 + W_{\rm UVW}^2} \le 50)$ km s⁻¹, well away from the Nyx stars.

Figure 3 shows the orbital properties of all GALAH stars within 3 kpc of the Sun in four different kinematic coordinate systems. The Nyx stars are shown as black dots, and they

clearly do have orbital properties at the extreme end of the distribution of disk stars. The thick disk comparison stars are plotted as blue dots, and the Gaia-Enceladus stars are red dots. This figure shows that the three groups can be more clearly separated in some kinematic spaces than others. In Figure 4, we follow the overall GALAH sample and these three specific groups through the $[\alpha/Fe]$, [Mg/Fe], [Ni/Fe], and [Al/Fe] abundance planes. These elements are chosen because they represent different stellar nucleosynthetic channels. Here we see that the Gaia-Enceladus stars have markedly lower abundances of all these elements at a given metallicity than the thick disk and the Nyx stars. Conversely, the abundances of the Nyx stars are indistinguishable from those of the thick disk stars, although they are on very different orbits.

Figure 5 makes a similar comparison using APOGEE data, and adds stars from Sgr (in orange) and the LMC (in green). The stellar abundance patterns of these additional galaxies are broadly similar to the Gaia-Enceladus stars and different from the overall APOGEE data set, the thick disk, and Nyx. Again, Nyx is more similar to the thick disk in these abundance planes than to dwarf galaxies. What overlap there is with the dwarf galaxies is confined to the two most metal-poor stars, in the regime where the dwarf galaxies are difficult to distinguish from the Galactic halo, and where stars from Gaia-Enceladus appear coincident with the metal-poor end of the thick disk (although it is not clear if this latter feature represents real overlap in abundance space or simply thick disk contamination in the Gaia-Enceladus selection).

5. DISCUSSION

We would expect stars accreted from dwarf galaxies to be distinct from stars formed *in situ* in a number of their properties. They should be clustered in orbital parameters, and possibly spatially; their age distribution should be truncated at the time of accretion, with no younger stars; and their abundance patterns should show key signs of their low-mass formation environment, with a lower minimum metallicity and faster $[\alpha/Fe]$ depletion, as well as potentially other chemical signatures (e.g., Das et al. 2020; Nissen & Schuster 2011). In this study we investigated those aspects of the Nyx stream using data from GALAH DR3, APOGEE DR16, and RAVE-on.

We calculated orbital parameters for the Nyx stars in all three spectroscopic data sets, confirming that the Nyx stars are kinematically similar to each other, and have higher orbital energies and eccentricities than typical thick disk stars.

Necib et al. (2020) find that the colour-magnitude diagram of their stars is consistent with an older isochrone. They take this as support for Nyx being a discrete accreted population, as the Milky Way's disk displays a range of ages. However, age is not a strong discriminant in this case because the thick disk has been shown to be relatively old (e.g., Sharma et al. 2019, 2020), with a mean age of 10 Gyr. Comparing abundances for Nyx stars from GALAH, APOGEE, and RAVE-on against the thin and thick disk and dwarf galaxies, we find no elemental abundance differences between Nyx stars and thick disk stars – whether selected kinematically or by $[\alpha/\text{Fe}]$ – in the GALAH DR3 and APOGEE DR16 data sets. While RAVE-on abundances do appear to show a difference, we consider the RAVE-on [Mg/Fe] abundances unreliable for these stars, as there is no clear distinction between high and low $[\alpha/\text{Fe}]$ (Figure 2).

Analysis of abundance information from both the GALAH and APOGEE surveys shows that the LMC, Sagittarius, and Gaia-Enceladus can be distinguished rather well from Galactic thin and thick disk populations and from each other across the space of α elements, iron-peak elements, and light odd-Z elements. In that same abundance space, the kinematically identified Nyx members are entirely consistent with the thick disk.

The disk and spiral structure of the Milky Way display large-scale perturbations which have been attributed to close interactions with satellites such as the Sgr dwarf (e.g., Antoja et al. 2018; Bland-Hawthorn et al. 2019), so it is entirely plausible that Nyx could be the *result* of an accretion event even if its constituent stars formed *in situ* in the Milky Way. In this sense it joins other kinematically identified streams such as Aquarius (Williams et al. 2011; Casey et al. 2014) and Hercules (Famaey et al. 2005; Bensby et al. 2007) in the category of stellar substructures created by past interactions or secular processes, and not the debris of a disrupted satellite.

ACKNOWLEDGMENTS

The GALAH survey is based on observations made at the Anglo-Australian Telescope, under programs A/2013B/13, A/2014A/25, A/2015A/19, A/2017A/18, A/2019A/15, A/2020B/23. We acknowledge the traditional owners of the land on which the AAT stands, the Gamilaraay people, and pay our respects to elders past and present. This paper includes data that have been provided by AAO Data Central This work has made use of data from the European Space Agency (ESA) mission Gaia (https://www.cosmos.esa.int/gaia), processed by the Gaia Data Processing and Analysis Consortium (DPAC, https://www.cosmos.esa.int/web/gaia/dpac/ consortium). Funding for the DPAC has been provided by national institutions, in particular the institutions participating in the Gaia Multilateral Agreement. Parts of this research were conducted by the Australian Research Council Centre of Excellence for All Sky Astrophysics in 3 Dimensions (ASTRO 3D), through project number CE170100013. DBZ, JDS, and SLM acknowledge the support of the Australian Research Council through Discovery Project grant DP180101791. SLM and JDS are supported by the UNSW Scientia Fellowship scheme.

Facilities: AAT

Software: TOPCAT (v4.7-2; Taylor 2005), astropy (v4.0.1; Astropy Collaboration et al. 2018) matplotlib (v3.1.3; Hunter 2007; Caswell et al. 2020), scipy (v1.4.1; SciPy 1.0 Contributors et al. 2020), galpy (v1.6.0; Binney 2012; Bovy & Rix 2013; Bovy 2015)

REFERENCES

- Ahumada, R. 2020, The Astrophysical Journal Supplement Series, 21, doi: 10.3847/1538-4365/ab929e
- Antoja, T., Helmi, A., Romero-Gómez, M., et al. 2018, Nature, 561, 360, doi: 10.1038/s41586-018-0510-7
- Astropy Collaboration, Price-Whelan, A. M., Sipőcz, B. M., et al. 2018, AJ, 156, 123, doi: 10.3847/1538-3881/aabc4f
- Bailer-Jones, C. A. L., Rybizki, J., Fouesneau, M., Mantelet, G., & Andrae, R. 2018, AJ, 156, 58, doi: 10.3847/1538-3881/aacb21
- Belokurov, V., Erkal, D., Evans, N. W., Koposov, S. E., & Deason, A. J. 2018, MNRAS, 478, 611, doi: 10.1093/mnras/sty982
- Bensby, T., Oey, M. S., Feltzing, S., & Gustafsson, B. 2007, ApJL, 655, L89, doi: 10.1086/512014
- Binney, J. 2012, Monthly Notices of the Royal Astronomical Society, 426, 1324, doi: 10.1111/j.1365-2966.2012.21757.x
- Bland-Hawthorn, J., Sharma, S., Tepper-Garcia, T., et al. 2019, MNRAS, 486, 1167, doi: 10.1093/mnras/stz217
- Bovy, J. 2015, The Astrophysical Journal Supplement Series, 216, 29, doi: 10.1088/0067-0049/216/2/29

- Bovy, J., & Rix, H.-W. 2013, The Astrophysical Journal, 779, 115, doi: 10.1088/0004-637X/779/2/115
- Buder, S., Asplund, M., Duong, L., et al. 2018, MNRAS, 478, 4513, doi: 10.1093/mnras/sty1281
- Bullock, J. S., & Johnston, K. V. 2005, ApJ, 635, 931, doi: 10.1086/497422
- Casey, A. R., Keller, S. C., Alves-Brito, A., et al. 2014, MNRAS, 443, 828, doi: 10.1093/mnras/stu1031
- Casey, A. R., Hawkins, K., Hogg, D. W., et al. 2017, The Astrophysical Journal, 840, 59, doi: 10.3847/1538-4357/aa69c2
- Caswell, T. A., Droettboom, M., Lee, A., et al. 2020, Matplotlib/Matplotlib v3.1.3, Zenodo, doi: 10.5281/ZENODO.3633844
- Das, P., Hawkins, K., & Jofré, P. 2020, MNRAS, 493, 5195, doi: 10.1093/mnras/stz3537
- Famaey, B., Jorissen, A., Luri, X., et al. 2005, A&A, 430, 165, doi: 10.1051/0004-6361:20041272

Fattahi, A., Belokurov, V., Deason, A. J., et al. 2019, MNRAS, 484, 4471, doi: 10.1093/mnras/stz159

Feuillet, D. K., Feltzing, S., Sahlholdt, C. L., & Casagrande, L. 2020, MNRAS, 497, 109, doi: 10.1093/mnras/staa1888

Freeman, K., & Bland-Hawthorn, J. 2002, ARA&A, 40, 487, doi: 10.1146/annurev.astro.40.060401.093840

Gaia Collaboration, Prusti, T., de Bruijne, J. H. J., et al. 2016, A&A, 595, A1, doi: 10.1051/0004-6361/201629272

Gaia Collaboration, Brown, A. G. A., Vallenari, A., et al. 2018, A&A, 616, A1, doi: 10.1051/0004-6361/201833051

Haywood, M., Di Matteo, P., Lehnert, M. D., et al. 2018, ApJ, 863, 113, doi: 10.3847/1538-4357/aad235

Helmi, A., Babusiaux, C., Koppelman, H. H., et al. 2018, Nature, 563, 85, doi: 10.1038/s41586-018-0625-x

Helmi, A., White, S. D. M., de Zeeuw, P. T., & Zhao, H. 1999, Nature, 402, 53, doi: 10.1038/46980

Hunter, J. D. 2007, Computing in Science & Engineering, 9, 90, doi: 10.1109/MCSE.2007.55

Johnston, K. V., Bullock, J. S., Sharma, S., et al. 2008, ApJ, 689, 936, doi: 10.1086/592228

Kunder, A., Kordopatis, G., Steinmetz, M., et al. 2017, AJ, 153, 75, doi: 10.3847/1538-3881/153/2/75

McMillan, P. J. 2017, MNRAS, 465, 76, doi: 10.1093/mnras/stw2759

Myeong, G. C., Evans, N. W., Belokurov, V., Sanders, J. L., & Koposov, S. E. 2018a, ApJ, 863, L28, doi: 10.3847/2041-8213/aad7f7

---. 2018b, ApJ, 856, L26, doi: 10.3847/2041-8213/aab613

Necib, L., Lisanti, M., Garrison-Kimmel, S., et al. 2019, ApJ, 883, 27, doi: 10.3847/1538-4357/ab3afc

Necib, L., Ostdiek, B., Lisanti, M., et al. 2020, Nature Astronomy, doi: 10.1038/s41550-020-1131-2

Ness, M., Hogg, D. W., Rix, H. W., Ho, A. Y. Q., & Zasowski, G. 2015, ApJ, 808, 16, doi: 10.1088/0004-637X/808/1/16

Nissen, P. E., & Schuster, W. J. 2011, A&A, 530, A15, doi: 10.1051/0004-6361/201116619

Reid, M. J., & Brunthaler, A. 2004, ApJ, 616, 872, doi: 10.1086/424960

Schönrich, R., Binney, J., & Dehnen, W. 2010, MNRAS, 403, 1829, doi: 10.1111/j.1365-2966.2010.16253.x

SciPy 1.0 Contributors, Virtanen, P., Gommers, R., et al. 2020, Nature Methods, doi: 10.1038/s41592-019-0686-2

Sharma, S., Hayden, M. R., & Bland-Hawthorn, J. 2020, arXiv:2005.03646 [astro-ph]. https://arxiv.org/abs/2005.03646

Sharma, S., Stello, D., Buder, S., et al. 2018, MNRAS, 473, 2004, doi: 10.1093/mnras/stx2582

Sharma, S., Stello, D., Bland-Hawthorn, J., et al. 2019, MNRAS, 490, 5335, doi: 10.1093/mnras/stz2861

Sheffield, A. A., Majewski, S. R., Johnston, K. V., et al. 2012, ApJ, 761, 161, doi: 10.1088/0004-637X/761/2/161

Taylor, M. B. 2005, in Astronomical Society of the Pacific Conference Series, Vol. 347, Astronomical Data Analysis Software and Systems XIV, ed. P. Shopbell, M. Britton, & R. Ebert, 29

Tolstoy, E., Hill, V., & Tosi, M. 2009, ARA&A, 47, 371, doi: 10.1146/annurev-astro-082708-101650

Venn, K. A., Irwin, M., Shetrone, M. D., et al. 2004, The Astronomical Journal, 128, 1177, doi: 10.1086/422734

Williams, M. E. K., Steinmetz, M., Sharma, S., et al. 2011, ApJ, 728, 102, doi: 10.1088/0004-637X/728/2/102