Icarus: A Flat and Fast Prograde Stellar Stream in the Milky Way Disk

Paola Re Fiorentin1, Alessandro Spagna1, Mario G. Lattanzi1,2, and Michele Cignoni3,4,5

1 INAF - Osservatorio Astrofisico di Torino, Strada Osservatorio 20, I-10025 Pino Torinese (TO), Italy; paola.refiorentin@inaf.it
2 Department of Physics, University of Torino, Via Giuria 1, I-10125 Torino, Italy
3 Department of Physics, University of Pisa, Largo Pontecorvo 3, I-56127 Pisa, Italy
4 INFN, Largo B. Pontecorvo 3, I-56127 Pisa, Italy
5 INAF - Osservatorio di Astrofisica e Scienza dello Spazio, Via Gobetti 93/3, I-40129 Bologna, Italy

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Abstract

We explore the local volume of the Milky Way via chemical and kinematical measurements from high-quality astrometric and spectroscopic data recently released by the Gaia, APOGEE, and GALAH programs. We chemically select 1137 stars up to 2.5 kpc of the Sun and [Fe/H] ≤ −1.0 dex, and find evidence of statistically significant substructures. Clustering analysis in velocity space classifies 163 objects into eight kinematical groups, whose origin is further investigated with high-resolution N-body numerical simulations of single merging events. The two retrograde groups appear associated with Gaia-Sausage-Enceladus (GSE), while the slightly prograde group could be connected to GSE or possibly Wukong. We find evidence of a new 44-member-strong prograde stream that we name Icarus; to our knowledge, Icarus is the fast-rotating stream closest to the Galactic disk to date (\(|z_{\text{max}}| \lesssim 0.5\) kpc, \(|V + V_{\text{LSR}}| \approx 231 \text{ km s}^{-1}\)). Its peculiar chemical (\(\langle[\text{Fe}/\text{H}]\rangle \approx -1.45\), \(\langle[Mg/Fe]\rangle \approx -0.02\)) and dynamical (mean eccentricity \(\approx 0.11\)) properties are consistent with the accretion of debris from a dwarf galaxy progenitor with a stellar mass of \(\sim 10^7\)\(M_\odot\) on an initial prograde low-inclination orbit, \(\sim 10^\circ\). The remaining prograde groups are either streams previously released by the same progenitor of Icarus (or Nyx), or remnants from different satellites accreted on initial orbits at higher inclination.

Unified Astronomy Thesaurus concepts: Milky Way formation (1053); Milky Way stellar halo (1060); Milky Way dynamics (1051); Stellar abundances (1577)

1. Introduction

According to current formation models, galaxies like the Milky Way (MW) grow by mergers of smaller satellites over their lifetime. Simulations based on this cosmological paradigm show that tidal forces can distort or even disrupt low-mass systems orbiting a MW analog. This process rips out stars from the progenitors, leaving them as fossil debris with inhomogeneous distributions in the spheroidal (halo-like) component of the host (Johnston 1998; Bullock & Johnston 2005; Cooper et al. 2010; Fattahi et al. 2020).

Considerable structure is still present in the Galactic halo that does retain memory of its accretion history in the form of streams of stars (e.g., Ibata et al. 1994; Malhan et al. 2018; Naidu et al. 2020). Besides, in the vicinity of the Sun (within, say, 3 kpc), where strong phase-mixing takes place, merger debris can still be identified as kinematical coherent streams despite of being spatially undetectable (Helmi et al. 1999; Smith et al. 2009; Klement 2010; Re Fiorentin et al. 2015).

Recent studies confirmed that a massive dwarf galaxy, named Gaia-Sausage-Enceladus (GSE), merged with the MW \(\sim 10\) Gyr ago (Belokurov et al. 2018; Helmi et al. 2018; Di Matteo et al. 2019; Gallart et al. 2019).

More kinematical and chemical substructures with retrograde motions have been found among MW halo stars, i.e., Sequoia by Myeong et al. (2019), Thamnos by Koppelman et al. (2019b), and dynamically tagged groups (DTGs) of Yuan et al. (2020). Conversely, the prograde part of the halo has been little explored. Likely, the reason is the traditional kinematical selection criteria that reject as halo stars objects with \(|v - v_{\text{LSR}}| < v_{\text{lim}}\), where \(v_{\text{lim}} = 180 \pm 230 \text{ km s}^{-1}\) (Nissen & Schuster 2010; Koppelman et al. 2019b).

The detection of accreted stars in the Galactic disk is more challenging, as these stars are difficult to distinguish being dominated by the in situ disk stars, even when chemical and dynamical details are added (Ruchti et al. 2015). Nevertheless, three new prograde streams were recently discovered: Nyx (Necib et al. 2020), Aleph, and Wukong (Naidu et al. 2020).

Large unbiased (non-kinematically selected) samples of stars with accurate 6D phase-space information and chemical properties for classification and characterization can be obtained from high-precision data already (or soon to be) available.

The Gaia second Data Release (DR2; Gaia Collaboration et al. 2018) provides unprecedented accurate measurements of parallax and proper motion for more than 1.3 billion stars across the whole sky. The Apache Point Observatory Galactic Evolution Experiment sixteenth Data Release (APOGEE DR16; Majewski et al. 2017; Ahumada et al. 2020) and the Galactic Archaeology with HERMES second Data Release (GALAH DR2; De Silva et al. 2015; Buder et al. 2018) have contributed high-resolution (\(R \sim 22,500\) near-infrared and \(R \sim 28,000\) optical, respectively) spectra yielding precise radial velocities, stellar parameters, and abundances for more than 20 chemical elements.

Here, we exploit the excellent synergy between the aforementioned surveys, and take advantage of these high-quality data to study chemo-kinematical signatures in the local halo, with particular attention to finding and characterizing accreted material toward the disk.
2. Data and Sample Selection

This study starts with assembling a chemo-kinematical catalog by cross-matching Gaia DR2, APOGEE DR16, and GALAH DR2.

It contains Gaia positions, parallaxes, and proper motions (Lindegren et al. 2018), plus radial velocities and chemical abundances derived with the APOGEE and GALAH stellar spectra parameters pipelines (e.g., Holtzman et al. 2015; García Pérez et al. 2016; Kos et al. 2017; Buder et al. 2018). In case of multiple spectroscopic observations, we adopt the one with highest nominal signal-to-noise ratio (S/N).

First, we select objects having renormalized unit weight error (RUWE) ≤ 1.4, as extracted from Gaia. This is to discard sources with problematic astrometric solutions, astrometric binaries, and other anomalous cases (Lindegren 2018). Next, we retain only stars with three Gaia photometric bands and relative parallax error $\sigma_\pi / \pi > 5$ (i.e., inverse-parallax distances better than 20%) for a total of 578,976 objects.

For the selection of sufficiently good APOGEE spectra, we reject stars with $S/N < 50$ and $\chi^2 < 25$ (Queiroz et al. 2020). As for the GALAH data, we remove stars with flags warning of poor stellar parameters, and those with $S/N < 20$, as per Hayden et al. (2020).

Therefore, we are left with a “science” sample of 437,572 stars down to $G = 18$ mag. Median uncertainties are: 0.03 mas in parallax, $\sim 50 \mu$as yr$^{-1}$ in proper motion, and $\sim 40$ m s$^{-1}$ in line-of-sight velocity for the 247,013 Gaia-APOGEE and 190,559 Gaia-GALAH sources.

Galactic coordinates and velocity components are derived by assuming that the Sun is 8.2 kpc away from the MW center, the local standard of rest (LSR) rotates with $V_\odot^\text{LSR} = 232$ km s$^{-1}$ around the Galactic center (McMillan 2010), and the LSR peculiar velocity of the Sun is $(U, V, W_\odot) = (11.1, 12.24, 7.25)$ km s$^{-1}$ (Schönrich et al. 2010). Median uncertainties of the resulting Galactocentric velocities are below 0.5 km s$^{-1}$ for each component.

We also compute the orbital parameters of each entry (e.g., eccentricity and $Z_{\text{max}}$) by adopting the Galactic potential model MWPotential2014 from Bovy (2015).

Figure 1 shows the chemical plane, [Mg/Fe]–[Fe/H], for the full chemo-kinematical catalog. Clearly, the sample is dominated by thin and thick disk stars. We chemically identify halo stars by taking objects with [Fe/H] < −1.0 and with [Mg/Fe] according to the relation

$$[\text{Mg/Fe}] < -0.2 - 0.5 \cdot ([\text{Fe/H}] + 0.2),$$

that we derived from Mackereth et al. (2019).

We emphasize that this selection allows us to look for the metal-poor component of accreted streams with disk-like kinematics right down the Galactic plane. Alternatively, prograde streams can be also detected using stellar samples selected above the plane without any metallicity cuts (e.g., $|Z| > 2$ kpc as in Naidu et al. 2020); however, such a methodology cannot clearly identify accreted debris with thin disk-like kinematics.

In the kinematical analysis below we further remove known members of globular clusters, dSph (e.g., Gaia Collaboration et al. 2018), visual binaries, and common proper motion pairs. This last selection leaves 3781 halo stars up to 10 kpc.

3. Results

Focusing on the sample of 1137 stars to 2.5 kpc of the Sun, we attempt detection and characterization of kinematical halo substructures in the solar vicinity as stars moving with similar space-velocities.

3.1. Stream Detection

The velocity distribution of the above sample is consistent with the superposition of stars belonging to the MW halo and metal-weak thick disk.

Following the two-point velocity correlation function methodology in Re Fiorentin et al. (2015), we quantify deviations from the smooth kinematical distribution expected for the background population, possibly due to moving groups; $K$-medoids cluster analysis in velocity space is then applied for final confirmation of substructures.
Figure 2 shows $\langle \xi \rangle$ for the full sample of 1137 stars (circles), and separately for the subsample of the 10% fastest (diamonds). Clumping due to kinematical substructures (i.e., groups of particles moving coherently) is evident for values of $\langle \xi \rangle > 1$. There is a statistically significant signal for the full sample that peaks at 10–15 km s$^{-1}$; it appears even stronger for the fastest subset.

Next, we concentrate on the 163 stars with velocity differences less than 15 km s$^{-1}$; this number excludes stars generating isolated velocity-pairs to make the analysis more robust.

We assign membership to these objects by using the implementation of the $K$-medoids clustering in 3D ($U$, $V$, $W$) velocity space (see e.g., Hastie et al. 2001) developed as part of the R Project for Statistical Computing: www.r-project.org.

In order to get final identification, we compare runs with different $K$-classes and we choose the solution with the best Jaccard’s index, $J$, that is an indicator of the stability of the groups (Tan et al. 2018).

Figure 2 (top-left panel) shows $\xi(||v_i - v_j||)$ for the full sample of 1137 stars (circles), and separately for the subsample of the 10% fastest (diamonds). Clumping due to kinematical substructures (i.e., groups of particles moving coherently) is evident for values of $\langle \xi \rangle > 1$. There is a statistically significant signal for the full sample that peaks at 10–15 km s$^{-1}$; it appears even stronger for the fastest subset.

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Gauging the similarity of the $K$-classes obtained for 100 randomly selected half-samples, we find that $K = 8$ maximizes $J$ for all the detected clusters (Table 1).

In Figure 2 we show in detection space these eight kinematical streams that, among the full sample, are visualized as filled dots with different colors (top-middle and top-right panels); we also present the Toomre diagram of the full selected sample, as above. The 10% fastest are marked with red open dots. Members of GSE (x) and Helmi Stream (HS; +) are highlighted. The approximate location of known substructures (GSE, HS, Nyx, Sequoia, the “arc,” and Thamnos) is shown. The (conservative) kinematical selection threshold for halo stars, $||v - v_{LSR}|| > 230$ km s$^{-1}$, is represented by the dashed line.

8 The regions shown are based on Figure2 in Koppelman et al. (2019b) as well as on known members of HS, GSE, and Nyx listed in Koppelman et al. (2019a), Helmi et al. (2018), and Necib et al. (2020), respectively.
Table 1
Chemo-dynamical Mean Characteristics of the Eight Kinematical Groups

| Group     | N. | J    | ([Fe/H]) | ([Mg/Fe]) | (U) | (V + V_LSR) | (W) | (L_x) | (L_y) | (Z_{max}) | (e) |
|-----------|----|------|----------|-----------|-----|-------------|-----|-------|-------|-----------|-----|
| 1-orange  | 10 | 0.86 | -1.36    | 0.22      | 0.22| 0.06        | 168 | 31    | 5     | 44        | 32  |
| 2-cyan    | 17 | 0.79 | -1.50    | 0.28      | 0.20| 0.16        | -82 | 49    | 8     | 37        | 40  |
| 3-pink    | 29 | 0.74 | -1.37    | 0.28      | 0.14| 0.18        | -3  | 16    | 187   | 16       | -7  |
| 4-yellow^a| 44 | 0.85 | -1.45    | 0.37      | -0.02| 0.25        | 18  | 22    | 231   | 16       | 1   |
| 5-blue    | 16 | 0.81 | -1.50    | 0.37      | 0.20| 0.14        | 64  | 25    | 131   | 33       | 53  |
| 6-green   | 18 | 0.82 | -1.43    | 0.33      | 0.19| 0.15        | -62 | 18    | 176   | 18       | -13 |
| 7-magenta | 19 | 0.94 | -1.56    | 0.38      | 0.21| 0.19        | 61  | 19    | 144   | 20       | -45 |
| 8-red     | 10 | 0.83 | -1.37    | 0.19      | 0.21| 0.08        | -139| 55    | -37   | 10       | -42 |

Note.
^a This group is named “Icarus” in this article.
Instead, the six new prograde streams clearly belong to the region usually associated with the Galactic disk, \[ |v - V_{LSR}| < 230 \text{ km s}^{-1}. \]

3.2. Chemo-dynamical Properties

Table 1 lists mean values and dispersions of \([\text{Fe/H}], [\text{Mg/Fe}], (U, V, W), (L_{\alpha}, L_{\gamma}), Z_{\text{max}}\) and eccentricity \(e\). Also, Figure 3 (left panel) shows the distribution \([\text{Mg/Fe}]-[\text{Fe/H}]\) for the full chemo-kinematical catalog, the members of the eight groups, and the GSE objects. The loci of the prograde structures Nyx, Aleph, Wukong, HS, and Sagittarius are marked with their published values (squares).

Group 1 (orange filled dots) and Group 8 (red) are slightly retrograde substructures, which appear associated with GSE: they have high eccentricity \((e) \geq 0.7\) and \(Z_{\text{max}}\) (up to 7 kpc), confirming that such debris are part of the accreted halo.

Among our six prograde substructures, the most noticeable is Group 4 (yellow). It is a circular structure \((e) \leq 0.11\) confined to move close to the Galactic plane \((Z_{\text{max}}) \lesssim 0.5 \text{ kpc}\) with typical thin disk kinematics \((V + V_{LSR}) \sim 231 \text{ km s}^{-1}\) and \(\sigma_V \sim 16 \text{ km s}^{-1}\). However, its chemical composition is not consistent with the abundances expected for the native MW thin disk. The low-metallicity, \([\text{Fe/H}] \sim -1.4\), and low \(\alpha\)-abundance, \([\text{Mg/Fe}] \approx 0\) of Group 4 indicate that these stars are most likely debris from an accreted satellite. To the best of our knowledge, this is the first detection of a flat prograde fast-rotating stream in the MW disk. Because of its characteristics, we name Group 4 “Icarus.”

Group 3 (pink) and Group 6 (green) are characterized by quite flat and circular orbits with \((Z_{\text{max}}) \lesssim 1 \text{ kpc}\) and \(e \lesssim 0.3\). Despite a rotation velocity that is similar to the thick disk, \((V + V_{LSR}) \sim 180 \text{ km s}^{-1}\), these groups are significantly more metal-poor \(([\text{Fe/H}] \sim -1.4)\); furthermore, they show intermediate \(\alpha\)-abundances \((\text{Mg/Fe}) \lesssim 0.2\) that are not consistent even with the \(\alpha\)-enhanced metal-weak tail of the thick disk (Naidu et al. 2020).

Figure 3. Distribution of the eight kinematical streams and GSE members as shown in Figure 2. Left panel: chemical abundances, \([\text{Mg/Fe}]-[\text{Fe/H}]\). In the background, all of the stars in our data set. Published values for the prograde structures Nyx, Aleph, Wukong, HS, and Sagittarius (Sgr) are highlighted with squares (Necib et al. 2020; Naidu et al. 2020). Right panel: color–magnitude diagram (CMD) \(M_V\) vs. \((G_{BP} - G_{RP})\). We only show the stars with \(|b| > 30^\circ\). Isochrones of ages 10, 12, and 14 Gyr for \([\text{M/H}] = -1.0\) (aqua), \([\text{M/H}] = -1.5\) (silver), and \([\text{M/H}] = -2.0\) (gold) are from Maíz Apellániz & Weiler (2018).

3.3. Hints on the Age

An accreted origin is also expected for Group 5 (blue) and Group 7 (magenta), which show chemical compositions similar to Group 3 and 6 \(([\text{Fe/H}] \sim -1.5\) and \([\text{Mg/Fe}] \sim 0.2)\). We argue that they are debris from two passages of the same satellite, as their mean angular momentum and eccentricity are quite similar, while the vertical velocity components are close in modulus but opposite directions: \(\langle W \rangle = +53 \text{ km s}^{-1}\) and \(-45 \text{ km s}^{-1}\) for Group 5 and Group 7, respectively.

Finally, Group 2 (cyan) is a halo stream with mean velocity \((\langle U \rangle, \langle V + V_{LSR} \rangle, \langle W \rangle) \approx (-82, 88, 40) \text{ km s}^{-1}\) and high-eccentricity \(e \approx 0.68\). Its chemical composition similar to Groups 5, 6, and 7 \(([\text{Fe/H}] \approx -1.5\) and \([\text{Mg/Fe}] \approx +0.20)\) confirms that it belongs to the accreted component of the MW halo.
of the stars is redder than our most metal-rich isochrones (with the exception of the star with \((G_{\text{BP}} - G_{\text{RP}})_0 \approx 0.63\) and \(M_G \approx 1\), which shows evidence of variability). These less extreme outliers may be due to unresolved binaries, enhancement in \(\alpha\)-elements (the PARSEC-COLIBRI isochrones have solar-scaled composition), underestimated chemical composition errors, or lower accuracy of extinction estimates.

### 3.4. Comparison to Simulations

The analysis above has revealed two substructures associated with GSE and six new prograde streams. Their stars are old and their chemo-dynamical properties are clearly evidence of ancient mergers.

In order to better characterize the six co-rotating substructures, we compare our results to high-resolution \(N\)-body numerical simulations of minor\(^{11}\) mergers published by Murante et al. (2010) and used to study galaxy interactions and properties of accreted debris around the Sun by Re Fiorentin et al. (2015).

We explore the space of “integrals of motion” defined by the components of angular momentum in and out the Galaxy’s disk. Figure 4 shows the plane \(L_{xy}-L_z\) for the full sample of 1137 metal-poor stars chemically selected by means of Equation (1) (dots); stars associated with the eight lumps recovered by our cluster analysis in velocity space, as well as GSE and HS members, are visualized as before. Solid boxes show the loci of GSE, HS, and Nyx. The 3585 simulated stars from the 10°-inclination prograde satellite \((S+10^\circ)\), selected within a sphere of 2.5 kpc centered at the “Sun,” are overplotted (diamonds).

The consistency between the simulation and the prograde substructures is remarkable. In particular, Figure 4 indicates that Icarus represents the debris of a low-inclination prograde satellite with a stellar mass \(\sim 10^5M_\odot\) similar to the LMC. In fact, a massive satellite on a 10°-inclination prograde orbit, because of the efficient action of dynamical friction, quickly loses its orbital energy and circularize. Thus, it proceeds to the inner regions of the main halo, and leaves debris, stripped during multiple passages, with disk-like kinematics (see Figures 6–7 in Re Fiorentin et al. 2015, yellow dots).

Groups 3, 5, 6, and 7 might be either streams produced by previous orbital passages of the same progenitor of Icarus, or remnants from different satellites accreted along an initial prograde orbit with inclination \(>10^\circ\). It is also plausible that these groups belong to Nyx and include its low-energy members; such accreted objects are more difficult to be separated from the in situ stars and could not be efficiently detected by the classification algorithm of Necib et al. (2020).

Finally, the nature of Group 2 remains uncertain, as it does not appear to be associated with either Icarus, HS, or Nyx; it might represent the prograde tail of GSE. However, its progenitor should be a satellite on an intermediate-inclination, prograde, or slightly retrograde, orbit.

### 4. Discussion and Conclusions

We have assembled a chemo-kinematical catalog based on top-quality astrometric and spectroscopic data from Gaia DR2, APOGEE DR16, and GALAH DR2. This data set can be exploited to explore a spherical volume around the Sun up to 10 kpc.

We have chemically selected a sample of 1137 stars to 2.5 kpc, and carried out statistical analysis and classification of their kinematics. Members of known substructures (e.g., HS, GSE, Sequoia, and Thamnos, by Helmi et al. 1999, Belokurov et al. 2018, Helmi et al. 2018, Myeong et al. 2019, and Koppelman et al. 2019b, respectively) are present in the 10% fastest subsample.

Among the subsample of 163 objects with relative velocity less than 15 km s\(^{-1}\), we have found statistical evidence of eight kinematical substructures. The low \(\alpha\)-abundances of their members is quite consistent with the low-metallicity tail of a progenitor dwarf galaxy similar to the LMC (Nidever et al. 2020). Also, comparing their CMD to PARSEC-COLIBRI isochrones, these substructures appear to be older than 10 Gyr.

The two retrograde groups are associated with GSE, while the six prograde substructures are located in a region that was difficult to explore with the halo sample selection criteria traditionally applied. We have further investigated their origin by means of comparison to high-resolution \(N\)-body numerical

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\(^{11}\) \(M_{\text{primary}}/M_{\text{satellite}} \sim 40\), similar to the estimated mass ratio of the MW relative to the Large Magellanic Cloud (LMC).
simulations of the interaction between a MW-like galaxy and orbiting LMC-like dwarf galaxies (Murante et al. 2010).

Most noticeable, the new Group 4, that we named Icarus, is the “ flattest” among the fast-rotating streams previously found in the Galactic disk. Clearly, the stellar ages greater than 10 Gyr rule out the possibility that this kinematical group is formed by in situ disk stars. Instead, its peculiar chemo-dynamical properties (\(|\text{Fe/H}| \approx -1.45, \langle \text{[Mg/Fe]} \rangle \approx -0.02,\) and \((e) \approx 0.11)\) are consistent with debris from a dwarf galaxy progenitor with a stellar mass of \(\sim 10^9 M_\odot\) on an initial prograde very low-inclination orbit. We notice that it shares dynamical properties similar to Aleph, the metal-rich stream discovered outside the plane \((|Z| > 2 \text{kpc})\) by Naidu et al. (2020) and extending up to 10 kpc.

It is plausible that Groups 3, 5, 6, 7 are either streams previously released by the same progenitor of Icarus, or remnants from different satellites accreted along an initial prograde orbit, but with inclinations \(> +10^\circ\). These debris could also be low-energy members of Nyx (Necib et al. 2020).

As for Group 2, the high eccentricity and low angular momentum \((e) \approx 0.7, \langle L_{y} \rangle \approx 377 \text{ kpc } \text{ km s}^{-1}\) exclude its association with any of Icarus, HS, and Nyx. It is chemically similar to Wukong (Naidu et al. 2020) and GSE; if they could have a common origin, Group 2 would represent debris from a more recent passage of the Wukong progenitor or the prograde tail of GSE.

Future work will have to disentangle on the common origin of these streams, based on even better data from the next releases of Gaia and in continuous synergy with ground-based spectroscopic surveys.

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**ORCID iDs**

Paola Re Fiorentini https://orcid.org/0000-0002-4995-0475

Alessandro Spagna https://orcid.org/0000-0003-1732-2412

Mario G. Lattanzi https://orcid.org/0000-0003-0429-7748

Michele Cignoni https://orcid.org/0000-0001-6291-6813

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