Chasing the impact of the Gaia-Sausage-Enceladus merger on the formation of the Milky Way thick disc

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ABSTRACT

We employ our Bayesian Machine Learning framework BINGO (Bayesian INference for GalacticarchaeOlogy) to obtain high-quality stellar age estimates for 68,360 red giant and red clump stars present in the 17th data release of the Sloan Digital Sky Survey, the APOGEE-2 high-resolution spectroscopic survey. By examining the denoised age-metallicity relationship of the Galactic disc stars, we identify a drop in metallicity with an increase in [Mg/Fe] at an early epoch, followed by a chemical enrichment episode with increasing [Fe/H] and decreasing [Mg/Fe]. This result is congruent with the chemical evolution induced by an early-epoch gas-rich merger identified in the Milky Way-like zoom-in cosmological simulation Auriga. In the initial phase of the merger of Auriga 18 there is a drop in metallicity due to the merger diluting the metal content and an increase in the [Mg/Fe] of the primary galaxy. Our findings suggest that the last massive merger of our Galaxy, the Gaia-Sausage-Enceladus, was likely a significant gas-rich merger and induced a starburst, contributing to the chemical enrichment and building of the metal-rich part of the thick disc at an early epoch.

Key words: Galaxy: formation – Galaxy: abundances – asteroseismology

1 INTRODUCTION

Our Galaxy has an entangled history that challenges our understanding of its formation. Early in its evolution, it experienced a Galactic-altering event known as the Gaia-Sausage-Enceladus (GSE) merger (Belokurov et al. 2018; Helmi et al. 2018), which recast its chemical and dynamical make-up. The extent of its impact is now well-established thanks to the new kinematic information extracted from ESA’s flagship astrometric survey Gaia (Gaia Collaboration et al. 2016) and the high-quality spectroscopic data coming from surveys such as APOGEE (Majewski et al. 2017), GALAH (Buder et al. 2021), Gaia-ESO (Gilmore et al. 2012) or LAMOST (Zhao et al. 2012).

The consensus is that the GSE was the last massive merger (\(M_\odot \approx 10^9\ M_\odot\)) of the Milky Way and happened early (\(8 – 11\ Gyr\) ago) (e.g., Vincenzo et al. 2019; Belokurov et al. 2020). It greatly impacted the Galactic halo, delivering approximately two-thirds of its stellar component in the form of stars on highly-eccentric orbits (e.g., Mackereth & Bovy 2020). These stars inhabit a sausage-like distribution in the radial-azimuthal velocity distribution (Brook et al. 2003; Belokurov et al. 2018) and the blue sequence of the Hertzsprung–Russell diagram of the halo stars. GSE members also appear to be more metal-poor and less \(\alpha\)-enhanced than the redder halo counterpart (Haywood et al. 2018; Helmi et al. 2018). The origin of these red-sequence stars referred to as the Splash by Be-
The age-metallicity relation for the stars within $4 < R < 6$ kpc. The top panel displays the original distribution of the age and [Fe/H] for stars coloured by [Mg/Fe]. The middle panel shows the same population of stars as the top panel but is coloured by the age uncertainty, $\sigma_\tau$. The bottom panel shows the age-metallicity and [Mg/Fe] relation reconstructed with an extreme deconvolution algorithm (see Section 2), which recovers the noise-free probability distribution spanned by the age, metallicity and [Mg/Fe] after deconvolving the noisy distribution with a measurement error model assumed to be Gaussian.

Figure 2. The denoised distribution of metallicity as a function of age, $\tau$, across the radial extent of the Galactic disc. Ellipses in the top panels highlight the GGS (see text).

Following the same method as in Ciucă et al. (2021), we construct a Bayesian Neural Network to map the stellar parameters, $T_{\text{eff}}$, log $g$, [Fe/H] and the [Mg/Fe], [C/Fe] and [N/Fe] abundances together with their associated uncertainties to the asteroseismic ages derived by Miglio et al. (2021) for the APOKASC-2 stars (Pinsonneault et al. 2018). To use only the highest quality data and the tracer stars with a reliable asteroseismic age, from the data of Miglio et al. (2021), we select red clump (RC) stars with a mass higher than $1.8 \ M_\odot$ and red giant branch (RGB) stars, with high signal-to-noise (SNR) greater than 100 in the associated APOGEE-2 spectrum.

We employ the BINGO model only on a set of stellar data that traces the same population as the training data, i.e. to a specific population of RC stars with a mass higher than $1.8 \ M_\odot$ or RGB stars, as done in Ciucă et al. (2021). To this end, we train a neural network model built using Keras and TensorFlow (Abadi et al. 2016) on the original APOKASC-2 data to classify RC stars with a mass higher than $1.8 \ M_\odot$ and RGB stars. Our strategy is similar to that used in Ting et al. (2018) to identify RC stars.

We then apply the trained classifier to the sample of APOGEE-2 stars with SNR $> 100$, $T_{\text{eff}}$ between 4,000 and 5,500 K, and log $g$ between 1 and 3.5, to be within the training set limits of BINGO. We only select stars with a probability higher than 0.95 of being classified as RGB or high-mass RC stars. Finally, we remove the duplicates of the spectra for the same star by only retrieving the highest SNR ones.

We are left with 89,591 stars, for which we obtain the age estimates by applying BINGO on their stellar parameters and the [Mg/Fe], [C/Fe] and [N/Fe] abundances. To further ensure the quality of our sample, we remove the data with an age uncertainty of $\sigma_{\log \tau} > 0.2$. We further discard the stars younger than 8 Gyr.
that have [Mg/Fe] > 0.2 dex, which we deem to be merged binary stars, i.e. artificially younger stars (e.g. Silva Aguirre et al. 2018; Ciucă et al. 2021). Our final sample contains 68,360 stars. We employ the Galactic radius, R, which we compute from the recommended distance in the aatrolloh (Leung & Bovy 2019) catalogue of APOGEE DR17, assuming a solar radius of $R_0 = 8$ kpc.

Using the data described above, we analyse the AMR of the stars in the different Galactic radial, R, bins. Fig. 1 shows the AMR for our stars within $4 < R < 6$ kpc. Note that the ages of some of the old stars are much older than the age of the Universe. This is because Miglio et al. (2021) used a highly uninformative prior on the maximum age of 40 Gyr that reflects in our asteroseismic age measurement (Miglio et al. 2021). This is deliberate since using a strong prior could compress the old end of the AMR and potentially obscure the GSE signature. We consider that our age estimate is reliable in terms of relative age. The absolute age scale is only indicative but follows the asteroseismic age scale in Miglio et al. (2021). Also, note that the sizable number of stars younger than $\sim 1.5$ Gyr is due to our cut of the low-mass RC stars.

The top panel of Fig. 1 displays the original distribution of the age and [Fe/H] for stars coloured by [Mg/Fe]. We notice the presence of a high-metallicity ([Fe/H] > 0), old ($\tau > 13$ Gyr) population with low [Mg/Fe] < 0.1, which is intriguing given that we expect low [Mg/Fe] to be associated with a younger population. However, the middle panel shows that these stars have a large uncertainty (up to 4 Gyr in linear age) in their age estimates, and the existence of such stars is not statistically significant. Here, we define the linear age uncertainty of $\sigma_\tau$ as $0.5 [\log \tau - \log \tau_{\min}]$, because BINGO estimates the age of the stars in log.

To eliminate the spurious features due to the lower confidence data and highlight the statistically significant trends only, we employ scalable extreme deconvolution (XD, Ritchie & Murray 2019). We model the three-dimensional distribution of age, [Fe/H] and [Mg/Fe] as a Gaussian Mixture Model (GMM), considering all the uncertainties. We perform density deconvolution with a 15-component GMM to recover the denoised distribution in the inner radial bin of $4 < R < 6$ kpc, and we use ten components for the other radial bins. Our choice of the number of components for the GMM ensures a low training error per radial bin. The bottom panel of Fig. 1 shows the reconstructed distribution of age, [Fe/H] and [Mg/Fe] from the GMM. XD clears the spurious features from the high uncertainty stars, e.g. high-metallicity and very old stars, which reassures us that XD performs well with this task. Unless otherwise stated, we present the results of the AMR reconstructed with XD, i.e. XD-denoised AMR.

3 RESULTS AND DISCUSSION

Fig. 2 shows the XD-denoised AMR from our stellar sample within four different radial bins, $4 < R < 6$ kpc, $6 < R < 8$ kpc, $8 < R < 10$ kpc and $10 < R < 12$ kpc. For the inner radial bin, we removed all stars with $R < 4$ kpc to minimise contamination from the bulge. Note that we do not employ any data cut using the height from the disc midplane or kinematics. Instead, our results in this Letter focus on the stars with [Fe/H] > −1, i.e. studying the thick and thin disc regime in the Milky Way.

The upper panels, in particular the upper-left panel of $4 < R < 6$ kpc, reveal an old population ($\tau > 13$ Gyr) with a low, but similar metallicity as the thick disc population ([Fe/H] $\approx −0.5$),
which we denote Babi\textsuperscript{1}. This panel displays that the metallicity around the age of $\tau = 13$ Gyr, [Fe/H] $\approx -0.3$, goes down to [Fe/H] $\approx -0.5$ for the younger age of around $\tau \approx 12$ Gyr, which we refer to as the Dip. This drop in metallicity is followed by an increase of [Fe/H] from $\tau \approx 12$ Gyr and [Fe/H] $\approx -0.5$ dex to $\tau \approx 10$ Gyr and [Fe/H] $\approx 0.2$ dex, i.e., the diagonal blob-like phase, which we denote the Great Galactic Starburst or GGS phase. The Dip and GGS features are also present in the lower-left panel of Fig. 2, although the features are clearer in the inner disc. We consider that the Babi and Dip likely correspond to the Thick Disc I and II populations, which were chemically identified in Anders et al. (2018).

Fig. 3 shows the same AMR as in Fig. 2, but colour coded with [Mg/Fe]. We remark that the Dip feature of the drop in [Fe/H], which we identified at $\tau \approx 12$ Gyr, is accompanied by an increase in [Mg/Fe]. Contrastingly, the diagonal GGS shows that [Mg/Fe] decreases with increasing [Fe/H] from $\tau \approx 12$ Gyr to $\tau \approx 10$ Gyr.

Strikingly, we find similar features in one of the Auriga simulations, Auriga 18 (Au18). Auriga is a series of zoom-in cosmological simulations of the Milky Way-like disc galaxies (Grand et al. 2017). Fig. 4 shows the AMR colour coded with [Mg/Fe] for the star particles in Au18 within four different radial bins. We used different radial bins because the Au18 disc is larger than the Milky Way disc, and we discard the star particles within $R < 4$ kpc since our APOGEE-2 data have very few stars in the very inner disc ($R \leq 3$ kpc).

Especially in the panels of $R > 7$ kpc, we can see the drop of [Fe/H] around the age of $\tau \approx 9$ Gyr. Au18 shows a significant gas-rich merger around that time (Grand et al. 2020b). The vertical dotted lines highlight the period of a starburst induced by a gas-rich merger, as seen in Fig. 2 of Grand et al. (2020b). The drop in [Fe/H] coincides with the beginning of the gas-rich merger. Interestingly, the lower [Fe/H] stars that formed at the beginning of the merger show higher [Mg/Fe] than the older stars, in agreement with the observational data of the Dip shown in Fig. 3. Similarly to the GGS feature in the observational data, the Dip feature in Au18 precedes the diagonal feature of increasing [Fe/H] and decreasing [Mg/Fe] for younger stars.

As mentioned above, these features coincide with the gas-rich merger of Au18. As shown in Bustamante et al. (2018) based on the Auriga simulation data, the gas-rich merger can bring the low metallicity gas and dilute the metallicity, and the fresh enrichment from the star formation induced by the merger can drive the higher [Mg/Fe] (see also Brook et al. 2007). Then, as indicated in Grand et al. (2020b), the gas-rich merger induces a starburst, which leads to the chemical enrichment that explains the increase of [Fe/H] apace with the decrease of [Mg/Fe] soon after the peak of the starburst (Brook et al. 2007), as seen in the diagonal GGS feature. Grand et al. (2020b), who focuses on this particular merger in Au18, also suggest that the gas-rich merger also induced the generation of the relatively metal-rich part of the thick disc.

Hence, the observed Dip and GGS features in Fig. 3 can be explained as the impact of the most significant merger. This is close to the epoch of the Milky Way’s last significant merger, the GSE merger (e.g., Montalbán et al. 2021). Therefore, these trends in Fig. 3 could indicate that the GSE merger was a significant gas-rich merger and that the gas brought by the GSE drove the metallicity lower. This was followed by significant star formation during the merger, which enriched the Galaxy. It is interesting to see that although a similar GGS feature is seen in the $4 < R < 6$ kpc bin, the AMR is more populated in metal-poor older stars. This may indicate that the gas-rich merger-induced starburst of the GSE started in the inner disc, which is consistent with the suggested radially-plunging orbit of the GSE merger (e.g., Vasiliev et al. 2022). Also, the similarity between the distribution of [Fe/H] and [Mg/Fe] as a function of age in the GGS among the different radial bins in Fig. 3 suggests that the chemical evolution in this merger phase is relatively well-mixed, which suggests that the star formation in this period happened in a relatively compact region. This is consistent with the small radial size of the high-[Mg/Fe] thick disc stars.

We further examine how the kinematics of the stars changes across the disc’s temporal evolution. For this purpose, we construct the AMR using only high-confidence age data, i.e. $\sigma_{\log \tau} < 0.05$ corresponding to $\sigma_{\tau} \lesssim 1.5$ Gyr for the $\tau = 10$ Gyr stars. Fig. 3 shows that, for the population of stars younger than 8 Gyr, there is a lack of lower [Fe/H] stars in the $R < 6$ kpc bin, while for $10 < R < 12$ kpc, the trend is reversed, with the high [Fe/H] stars missing. Owing to radial migration, the stars in $6 < R < 10$ kpc include both high and low metallicity stars formed in the inner and outer disc, respectively. Therefore, we present the stellar data solely within $6 < R < 10$ kpc. We employ the angular momentum, $L_z$, and the vertical action, $J_z$, for these stars, taken from the astroRHL catalogue of APOGEE DR17.

The upper panel of Fig. 5 shows the AMR of the high-age confidence stars coloured with $L_z$. As expected from the well-established negative radial metallicity gradient, the stars younger than $\tau = 8$ Gyr show the higher $L_z$ for lower [Fe/H] at a fixed age population. Interestingly, the higher [Fe/H] stars show higher $L_z$ during the GGS phase. Also, for a fixed [Fe/H] population, the younger stars have higher $L_z$, which indicates the younger stars formed in the outer disk and/or the younger stars have colder kinematics.

In the lower panel of Fig. 5, we show the $L_z$-[Fe/H] relation for the thin disc population whose ages are between 3 and 5 Gyr (lower right panel) and the GGS phase, i.e. stars with $10 < \tau < 12$ Gyr.

\textsuperscript{1} The word ‘Babi’ comes from the Romanian language and denotes a much cherished grandmother.
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DATA AVAILABILITY
The data underlying this article will be shared on reasonable request to the corresponding author.

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