



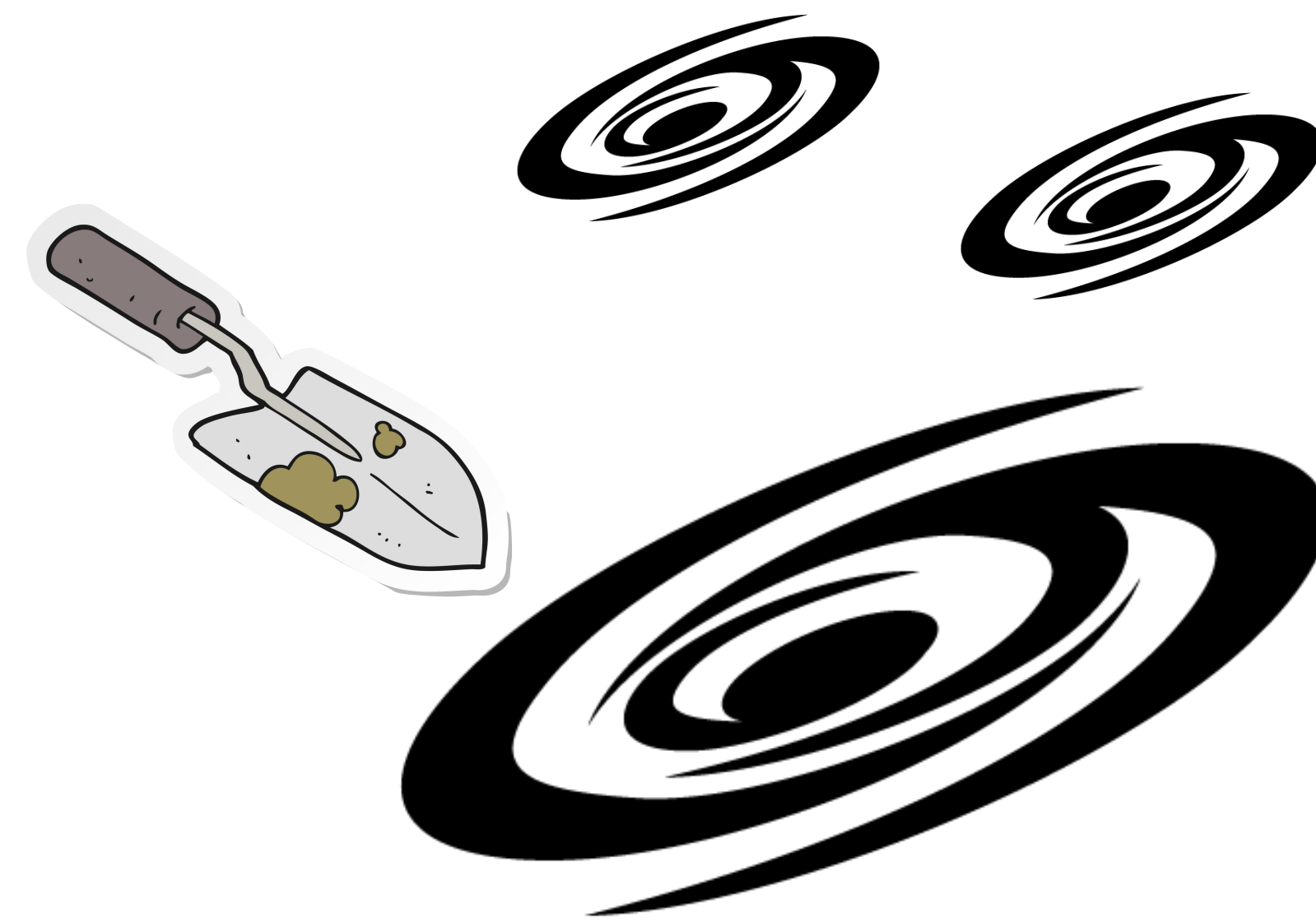
Gonville & Caius  
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CAMBRIDGE

# Searching for a disrupted dwarf binary in Sagittarius

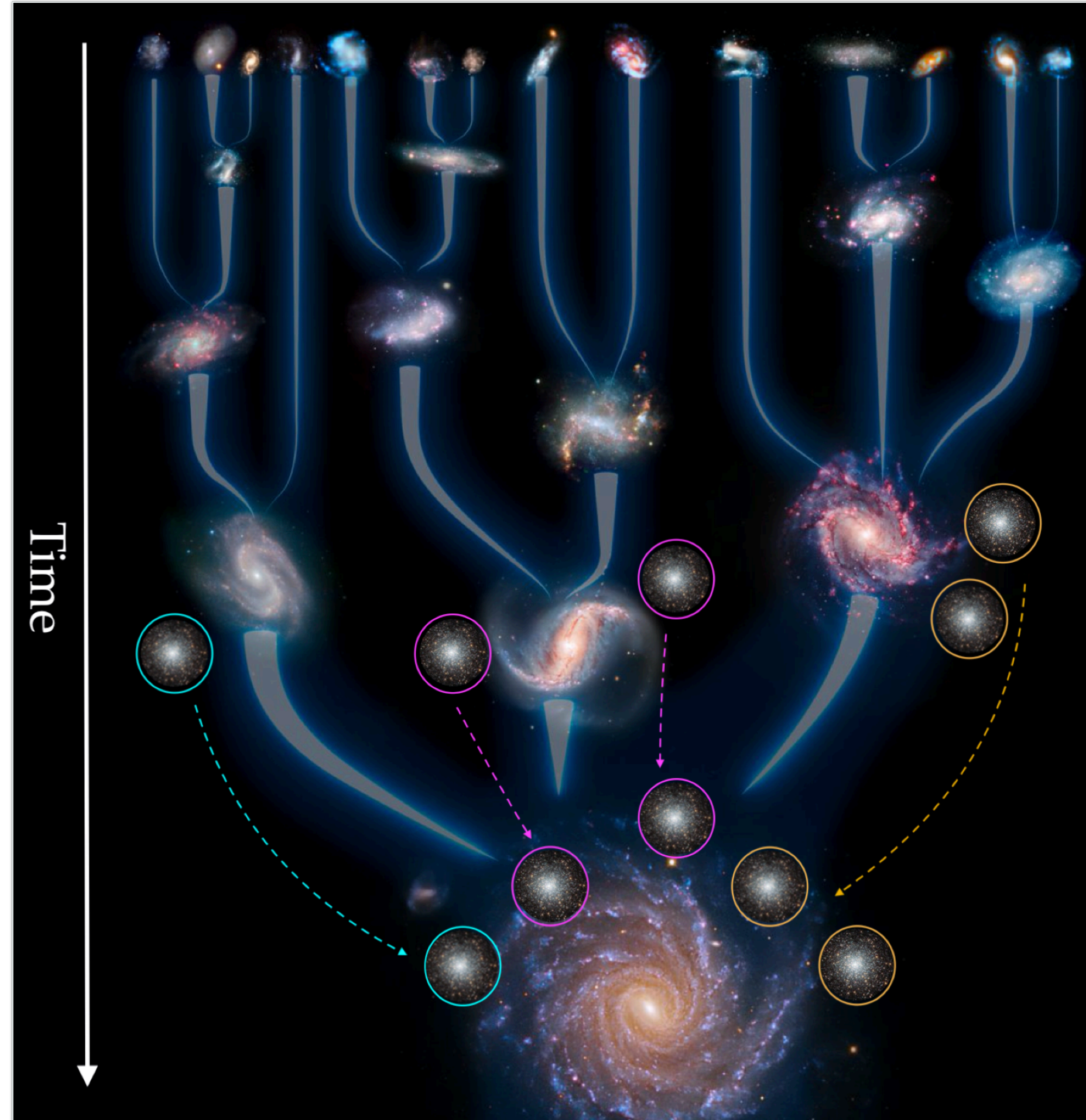
Uncovering the accretion history of the Milky Way with Galactic Archaeology



Elliot Y. Davies (Institute of Astronomy, Cambridge)

Collaborators: **Vasily Belokurov**, N. Wyn Evans, **Stephanie Monty**, Adam M. Dillamore

# How do galaxies form?



Credit: ESO/L. Calçada



# Evidence for hierarchical formation

The Sagittarius dwarf galaxy

**LETTERS TO NATURE**

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## **A dwarf satellite galaxy in Sagittarius**

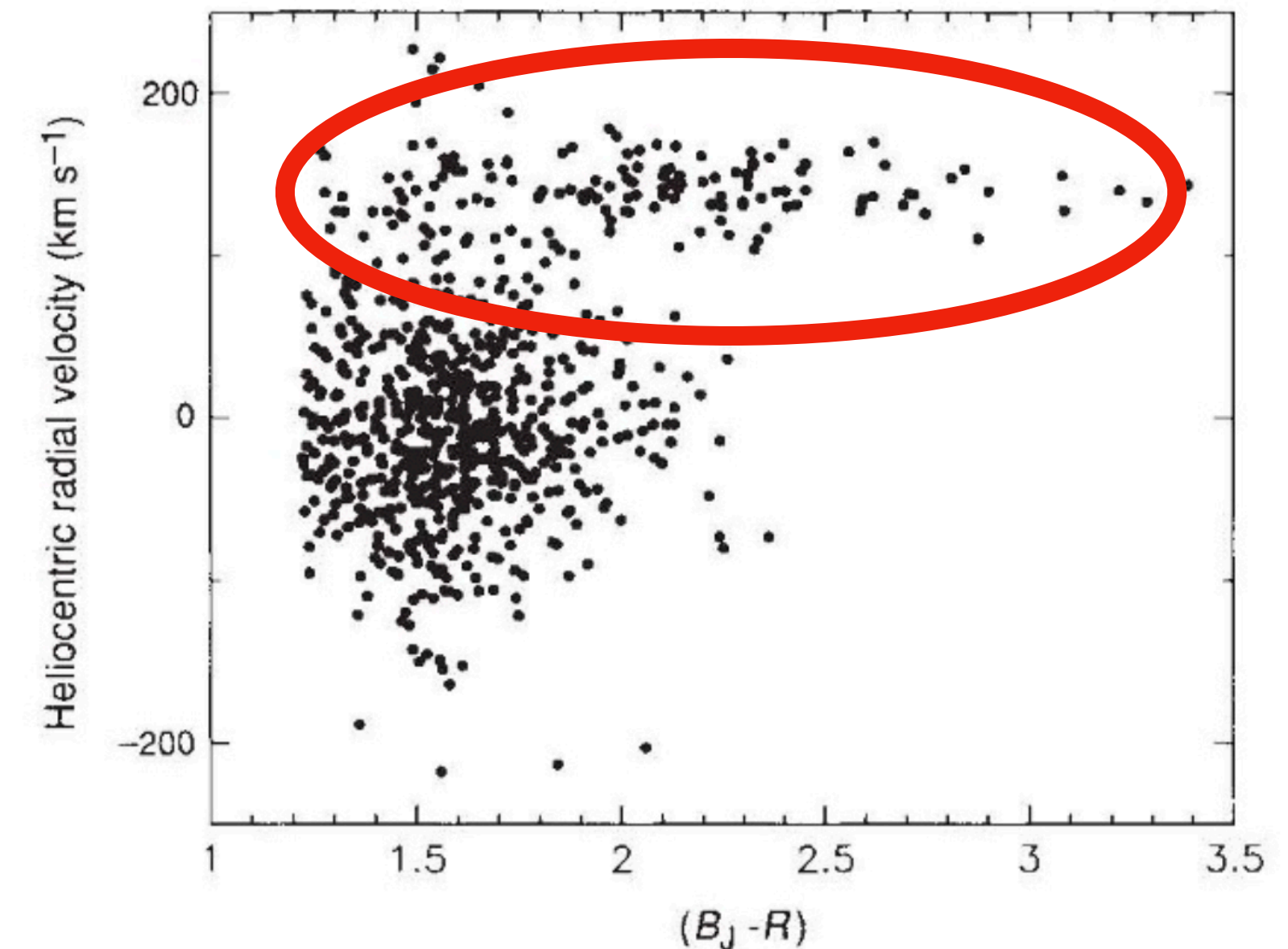
**R. A. Ibata<sup>\*</sup>, G. Gilmore<sup>\*</sup> & M. J. Irwin<sup>†</sup>**

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NATURE · VOL 370 · 21 JULY 1994

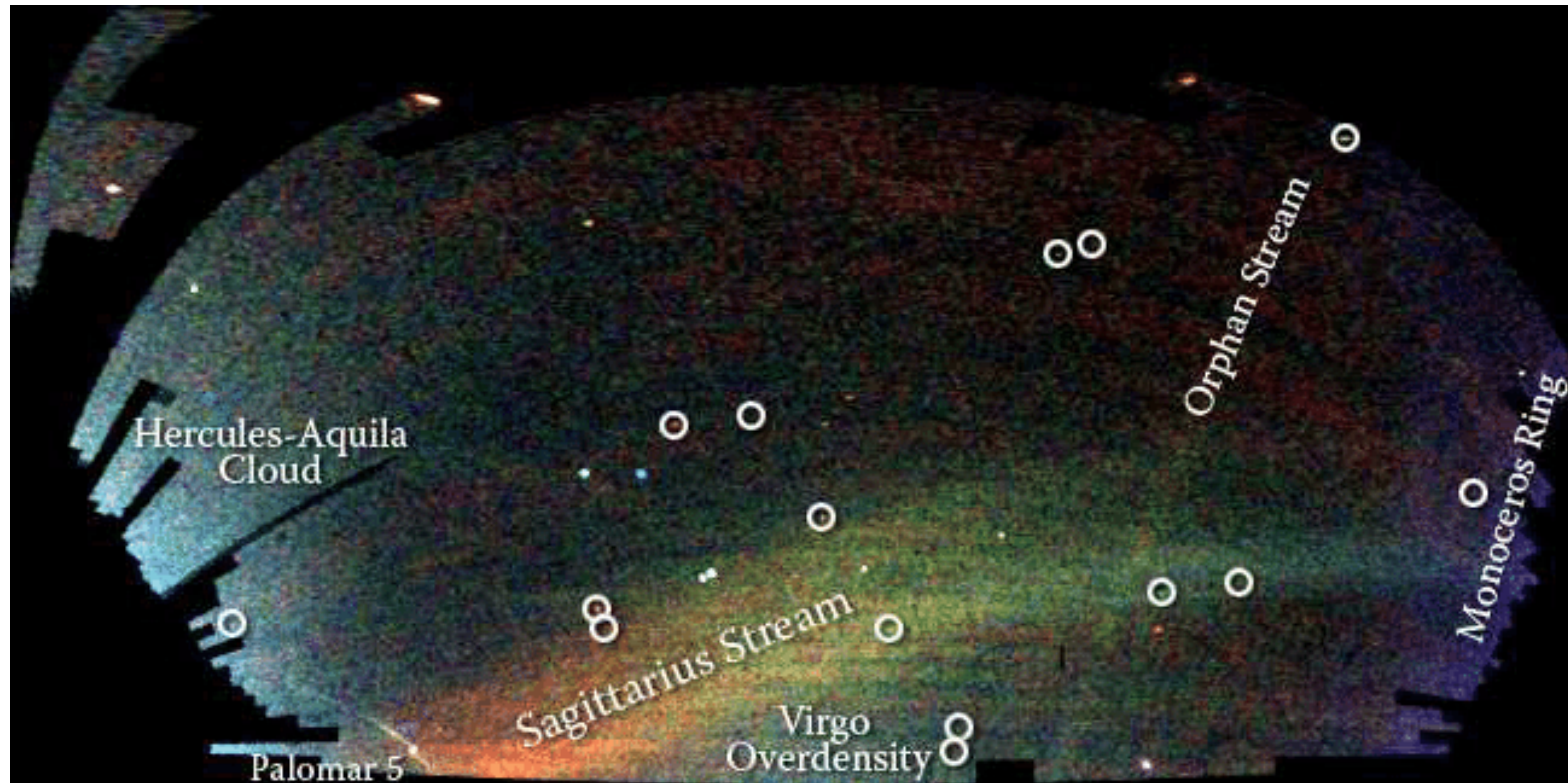




# Unexplained features of Sagittarius

The stream of Sagittarius forks into two branches

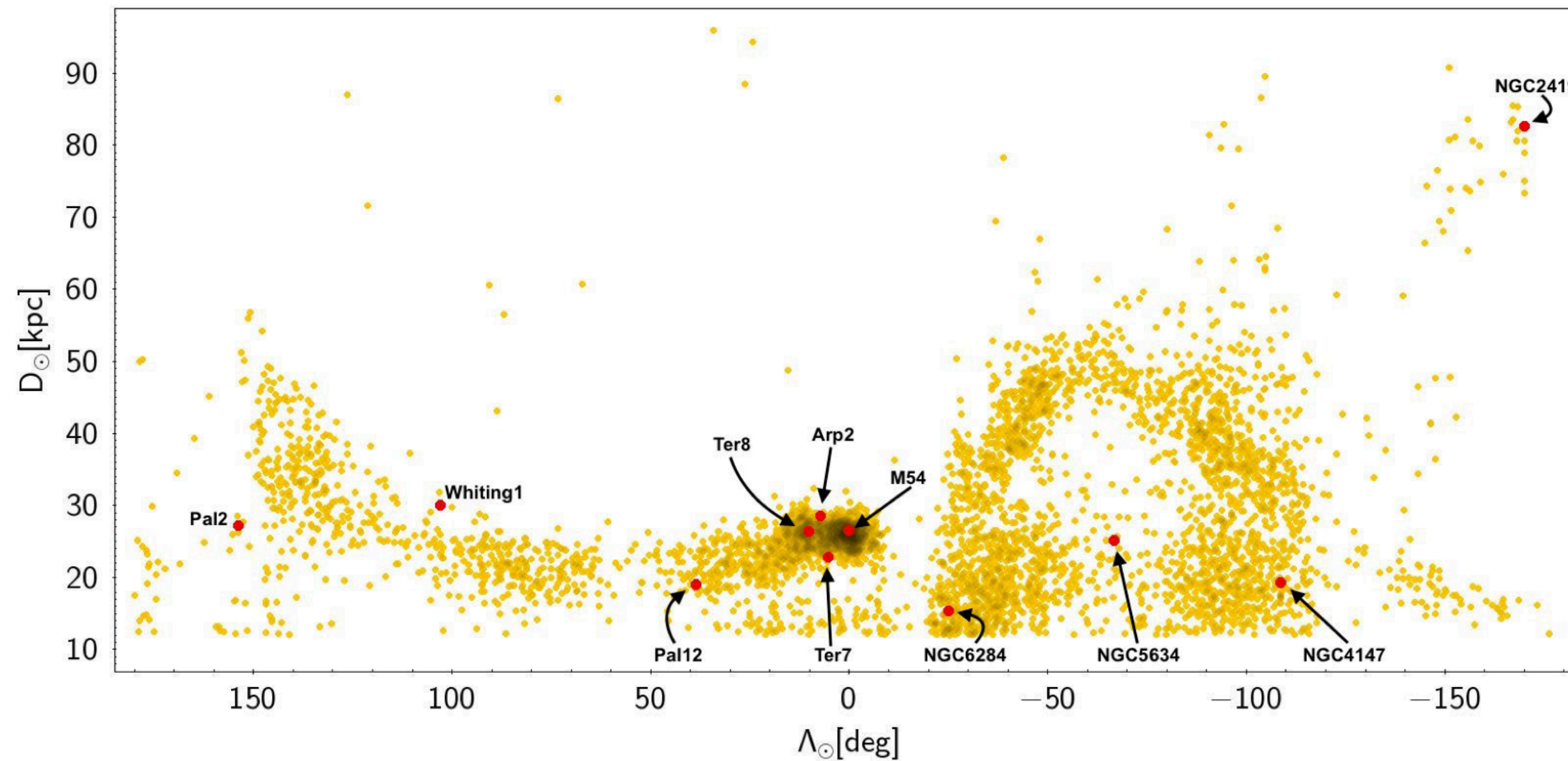
Credit: V. Belokurov et al. (2006)



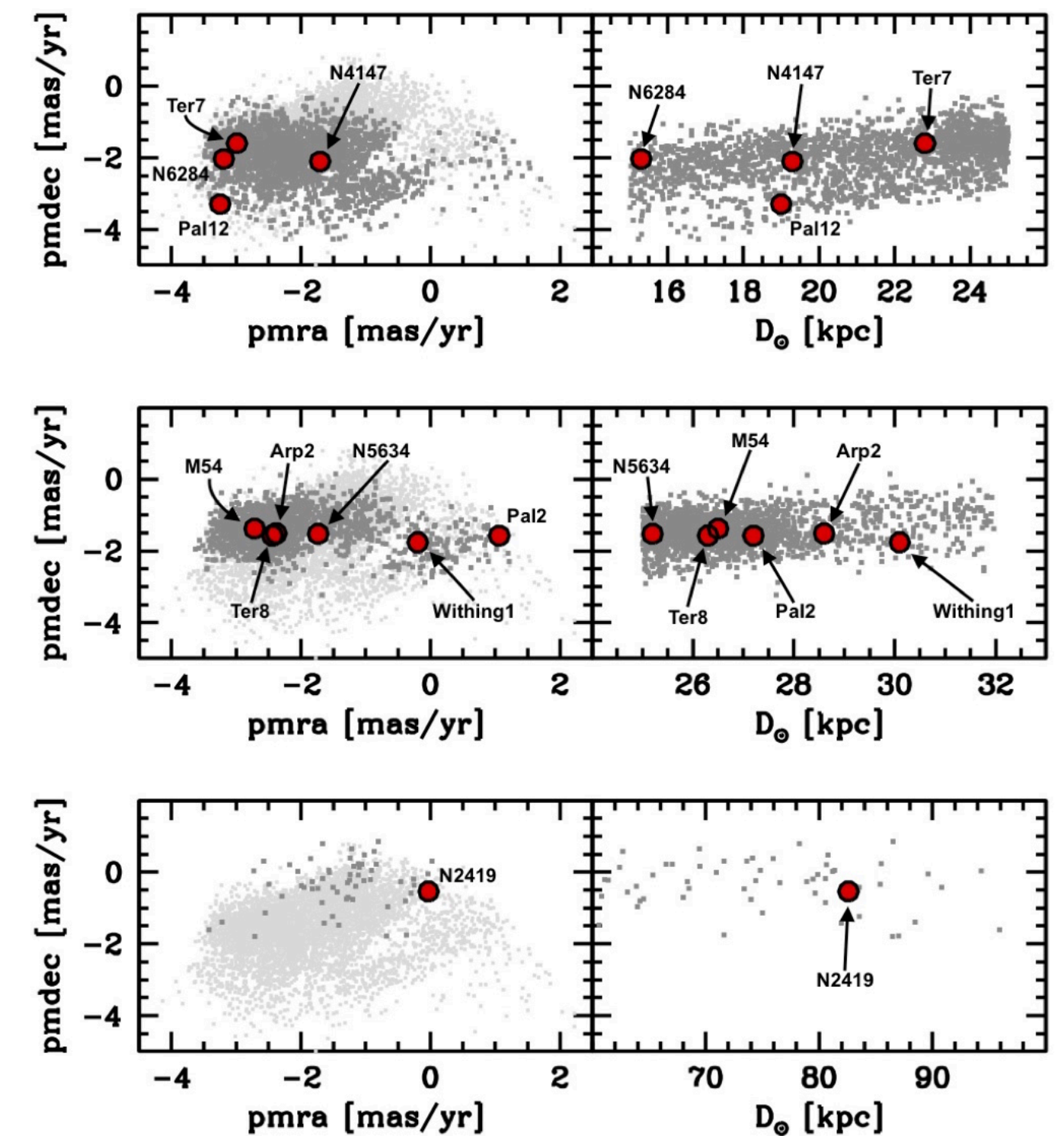


# The globular clusters of Sagittarius

Globular clusters whose properties overlap with Sagittarius.



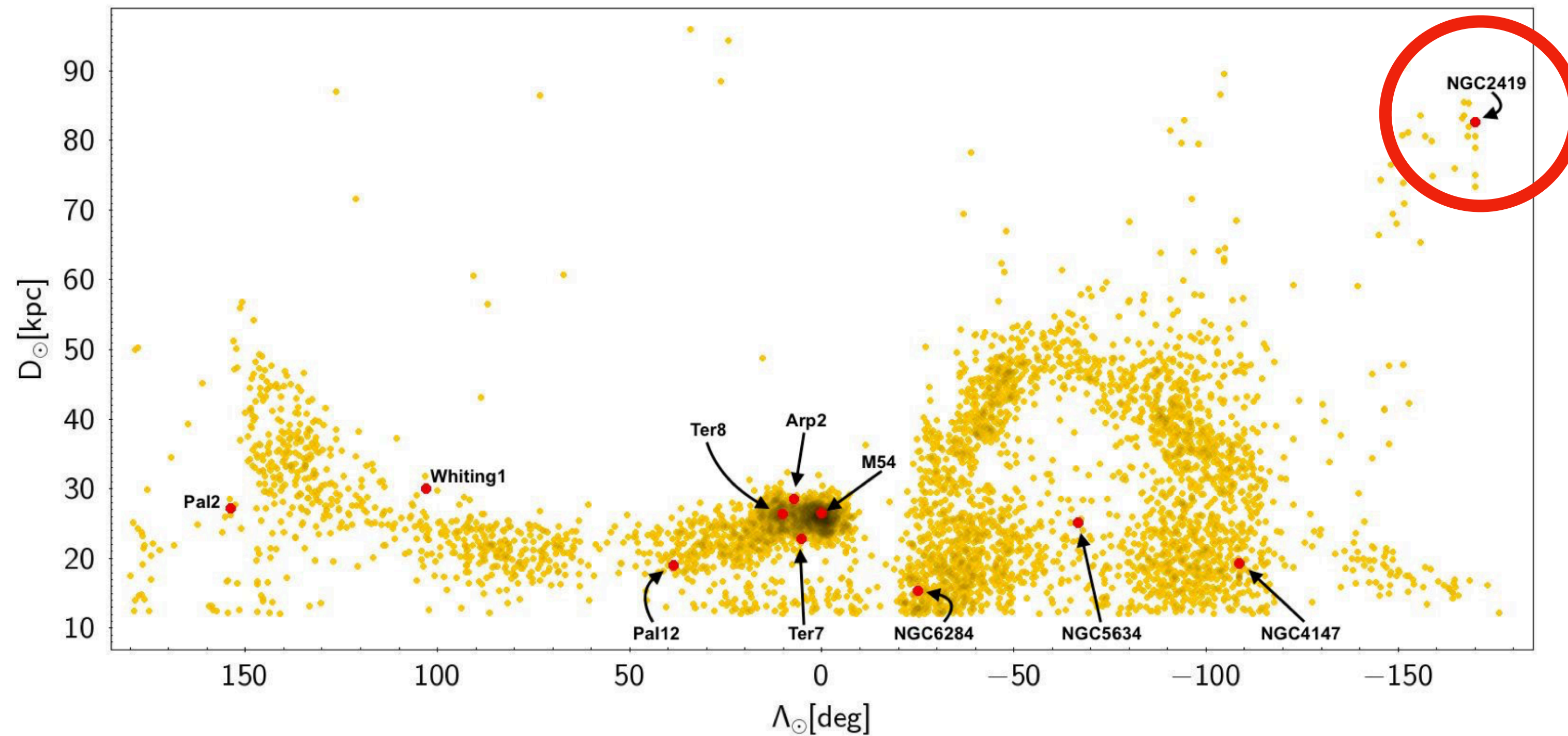
Credit: M. Bellazzini (2020)





# The globular clusters of Sagittarius

Globular clusters whose properties overlap with Sagittarius.



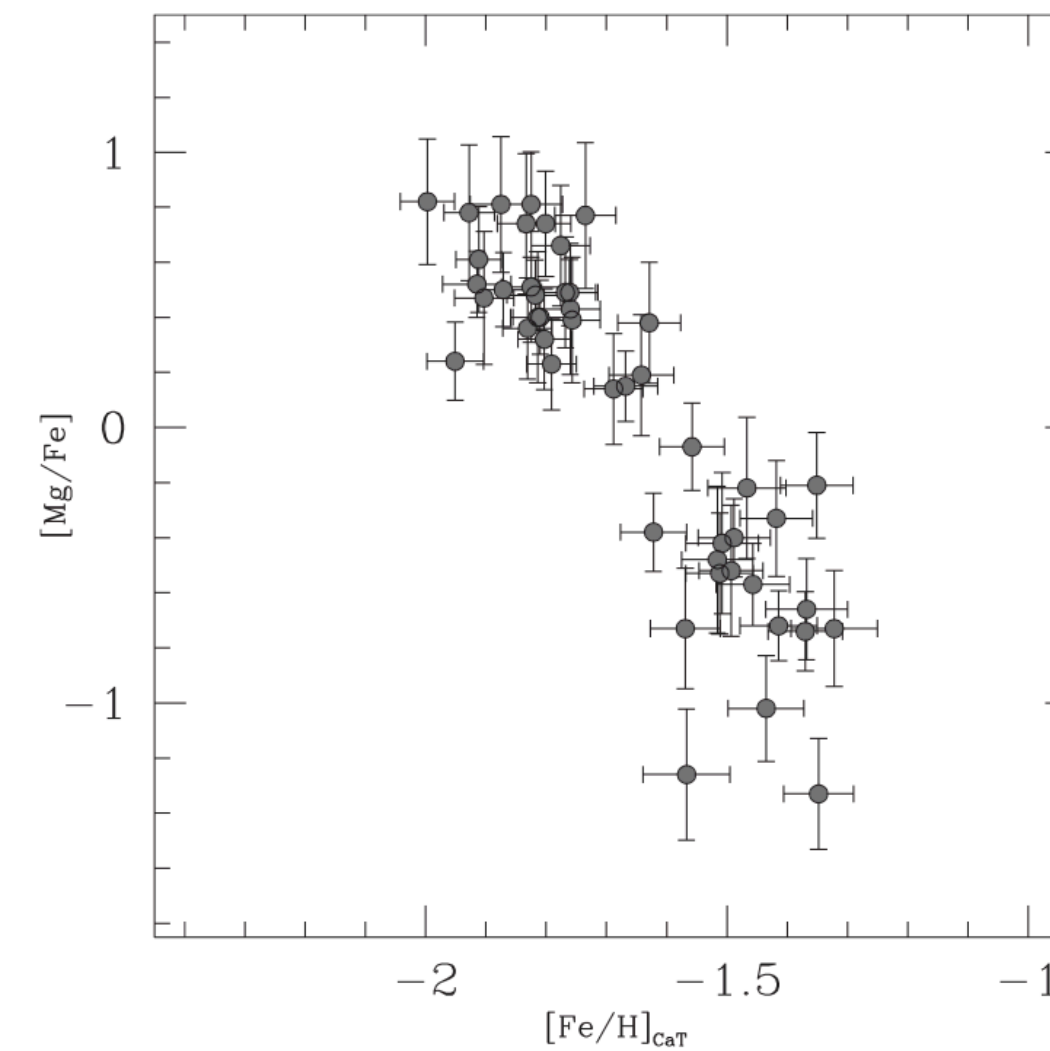


# NGC 2419 (the intergalactic wanderer)

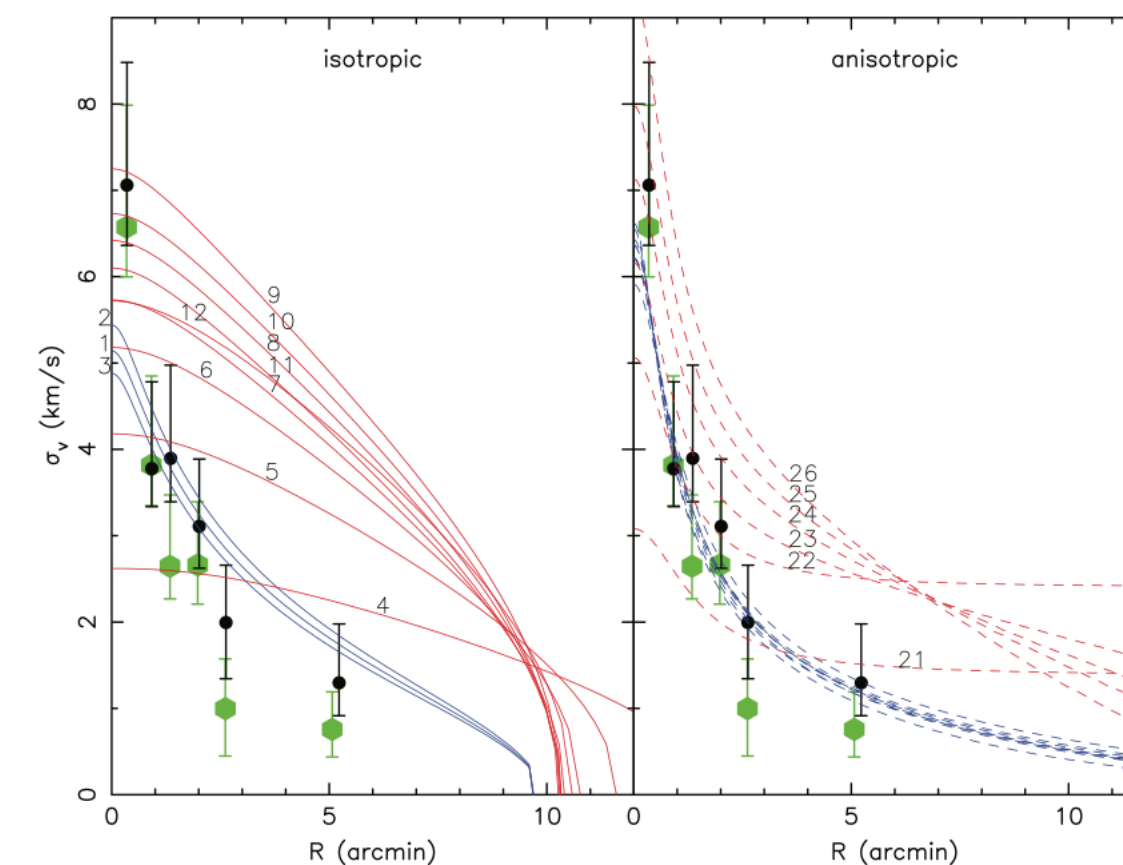
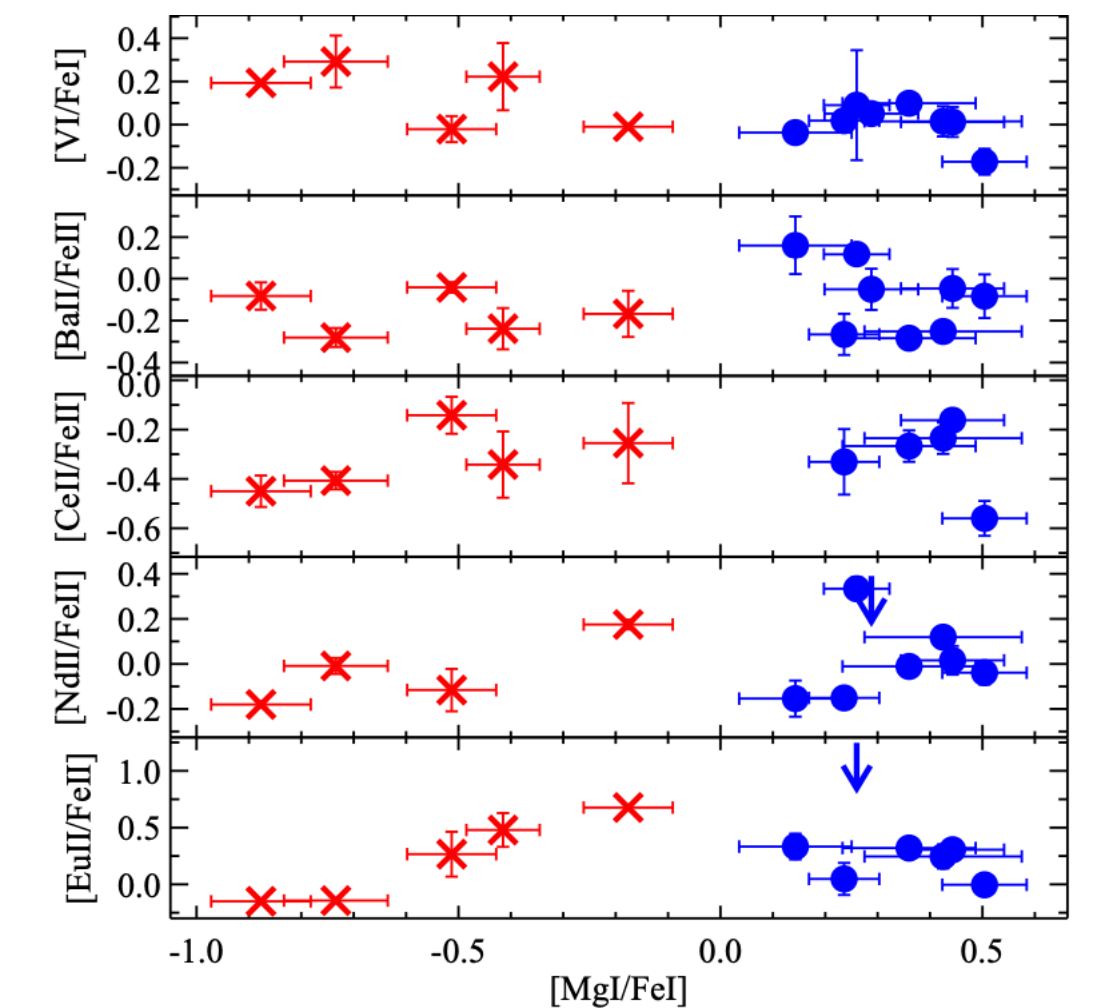


- An atypically large half light radius
- Around 90 kpc from the Galactic centre
- Found within the tail of Sagittarius
- Two chemical populations
- Deficient in dark matter

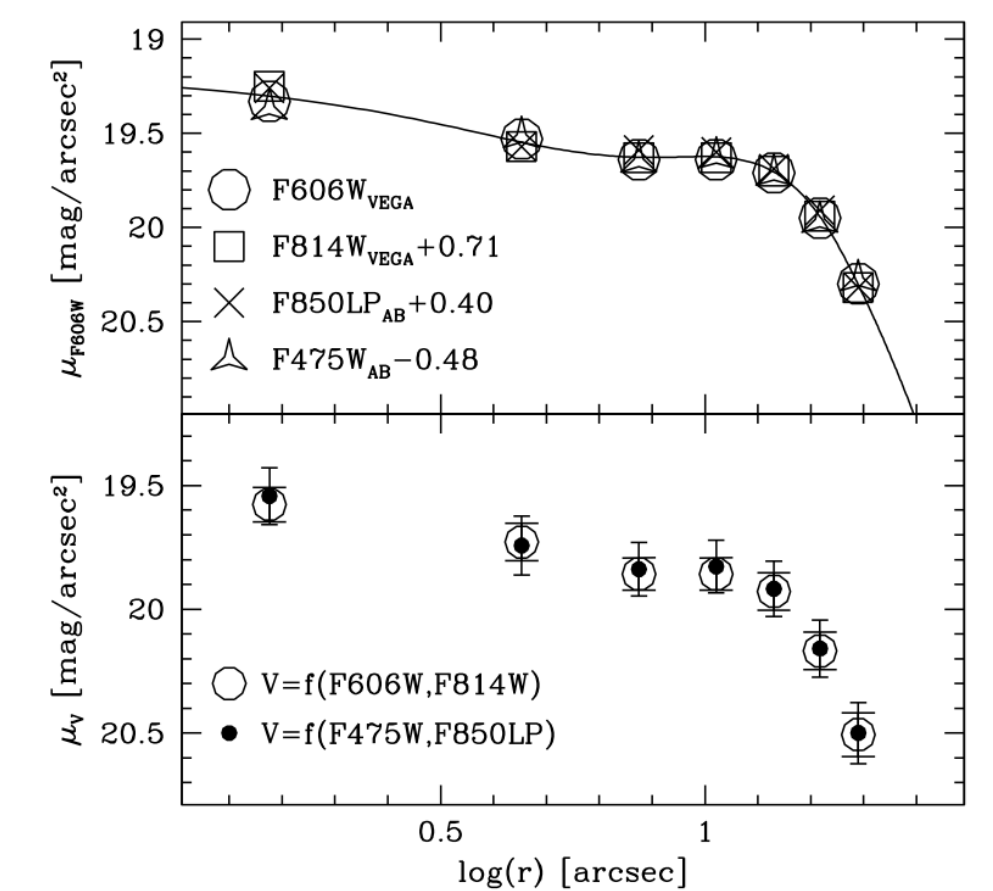
Credit: A. Mucciarelli et al. (2012)



Credit: J. Cohen et al. (2012)



Credit: R. Ibata et al. (2011)

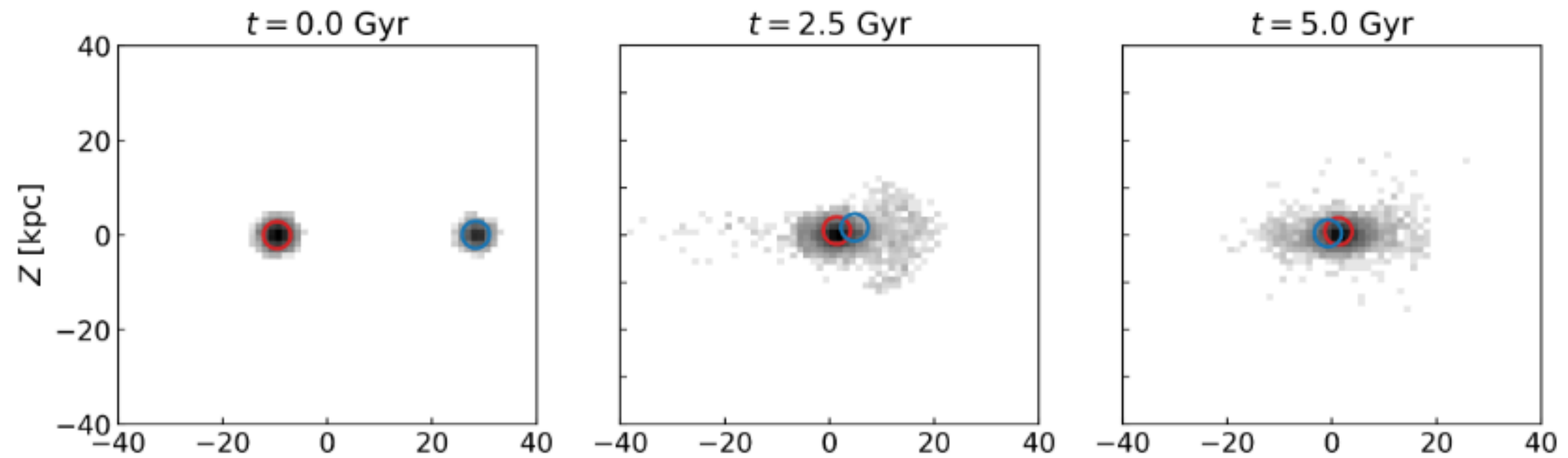


Credit: M. Bellazzini (2011)

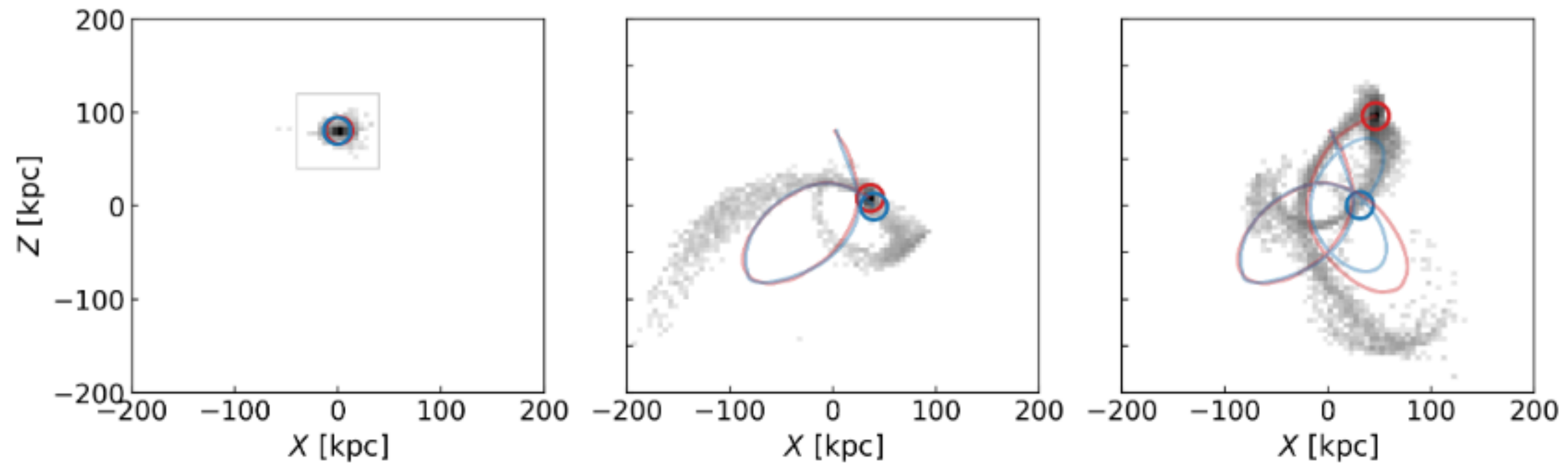


# A new explanation?

pre-infall

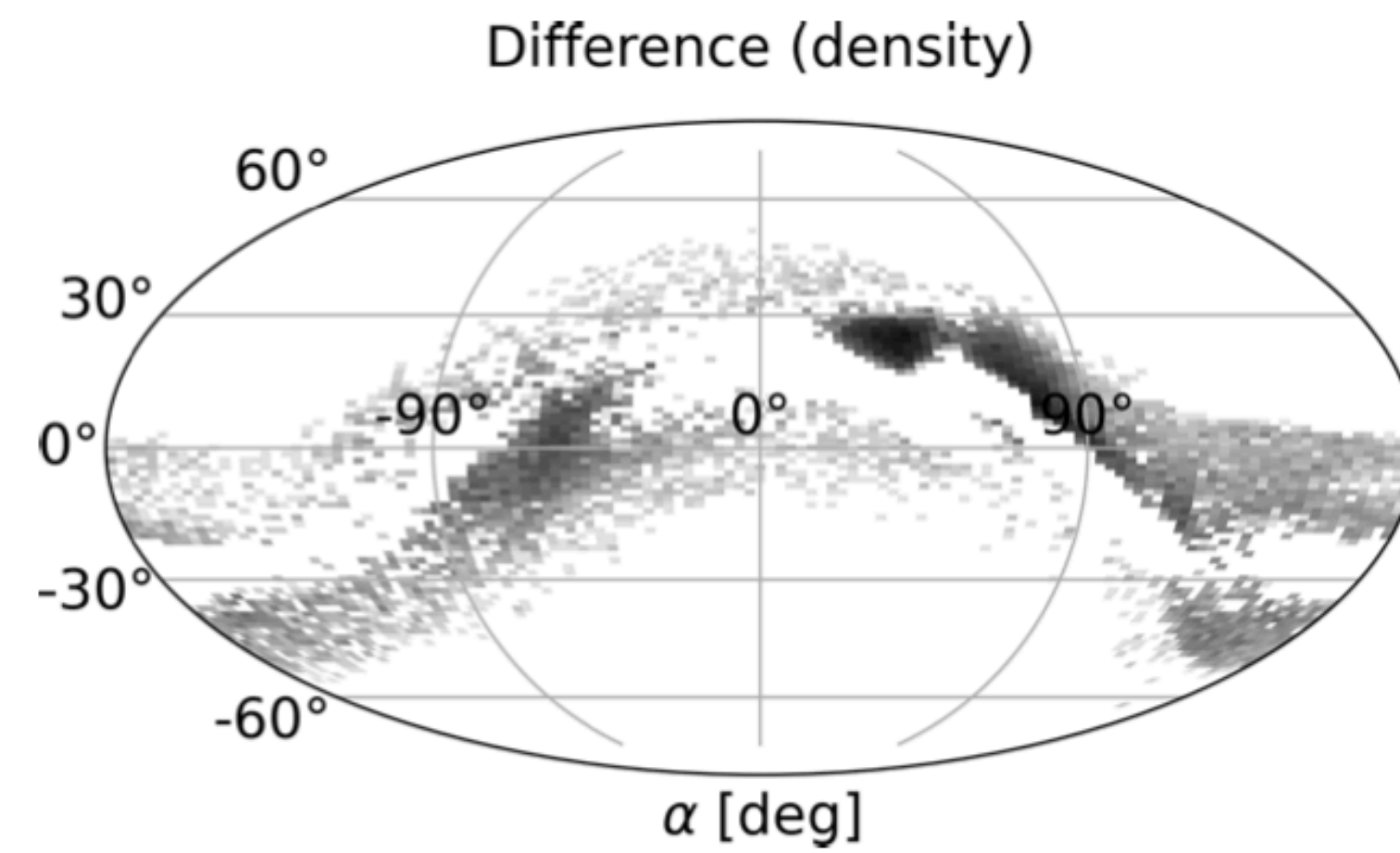
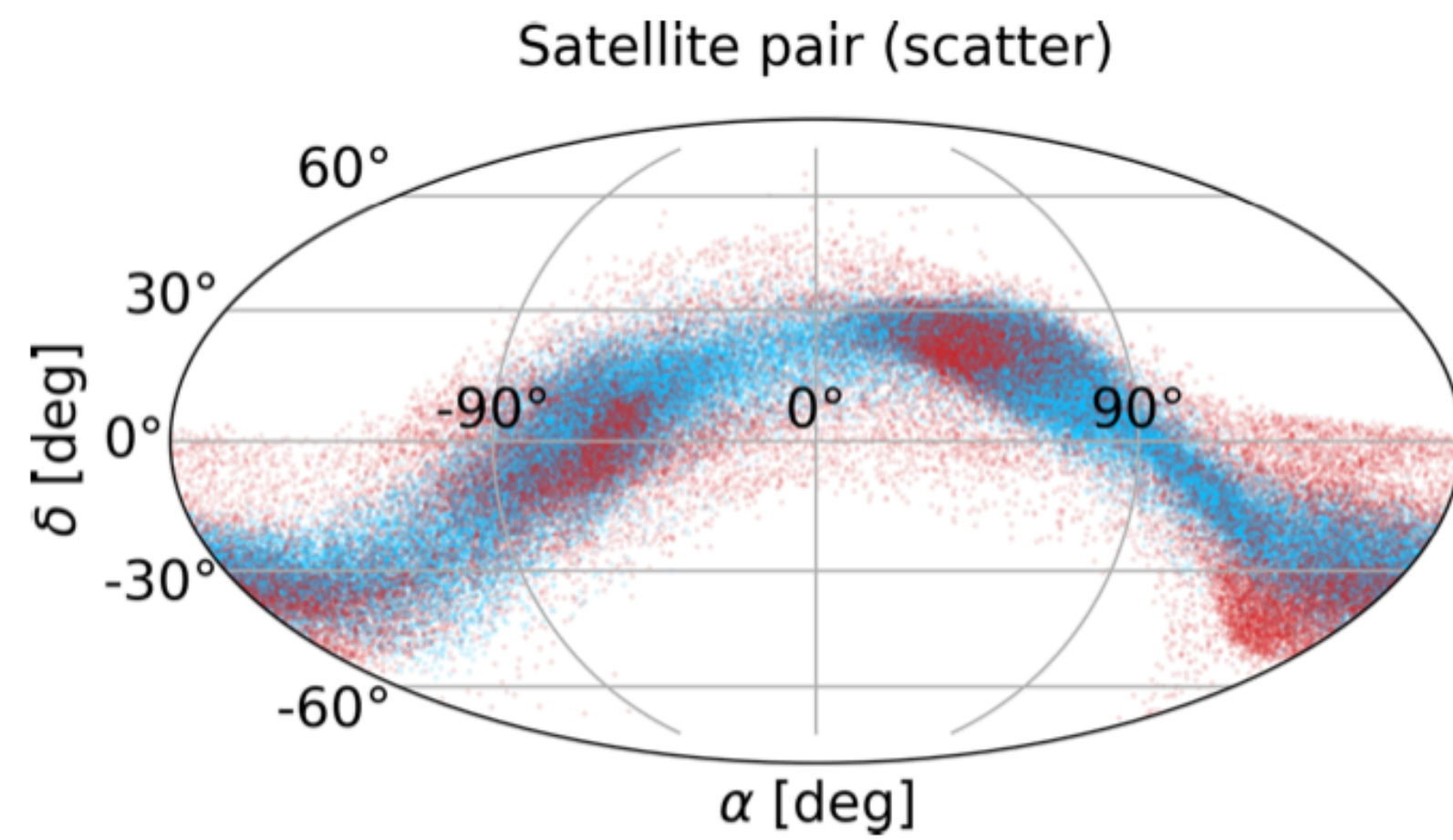
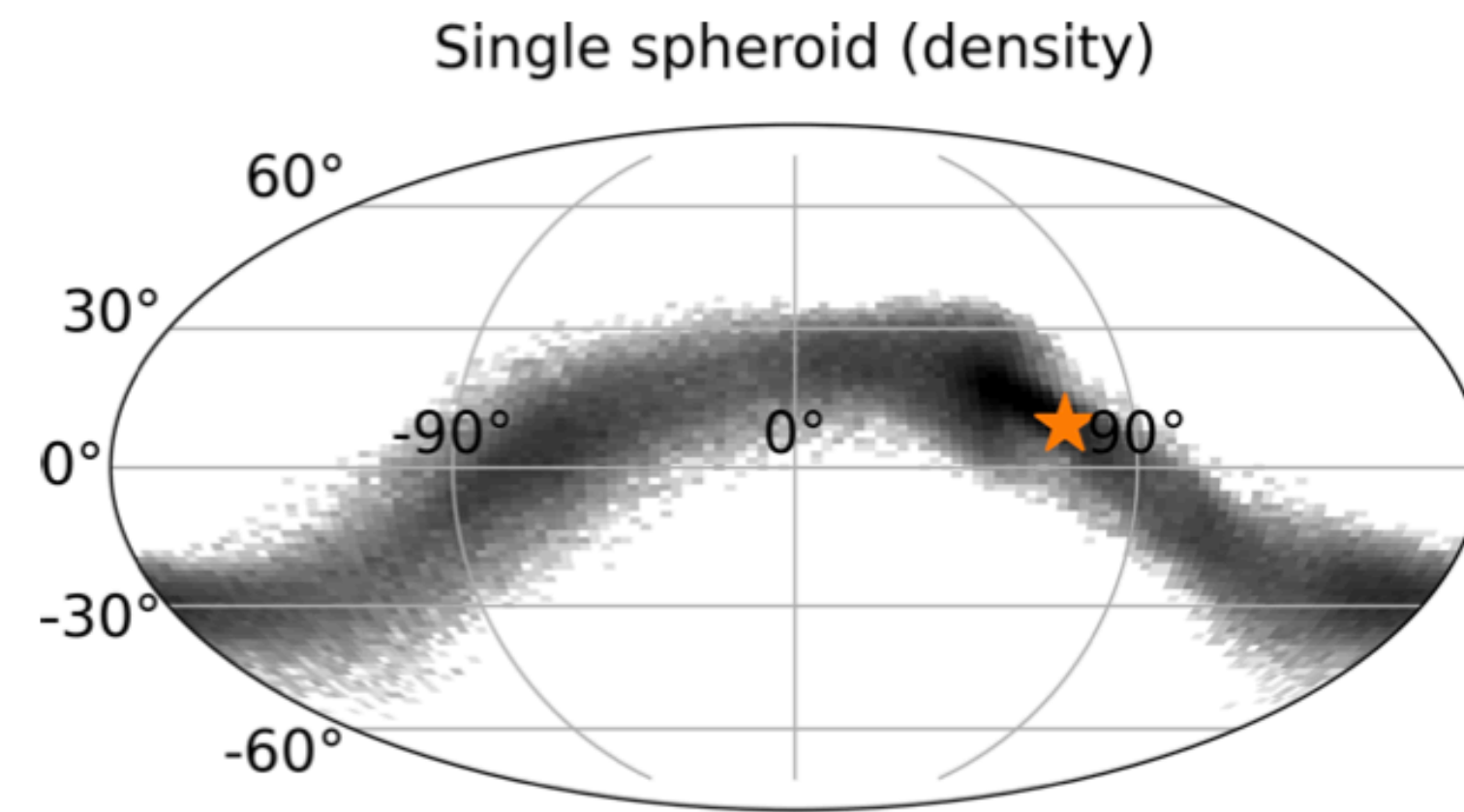
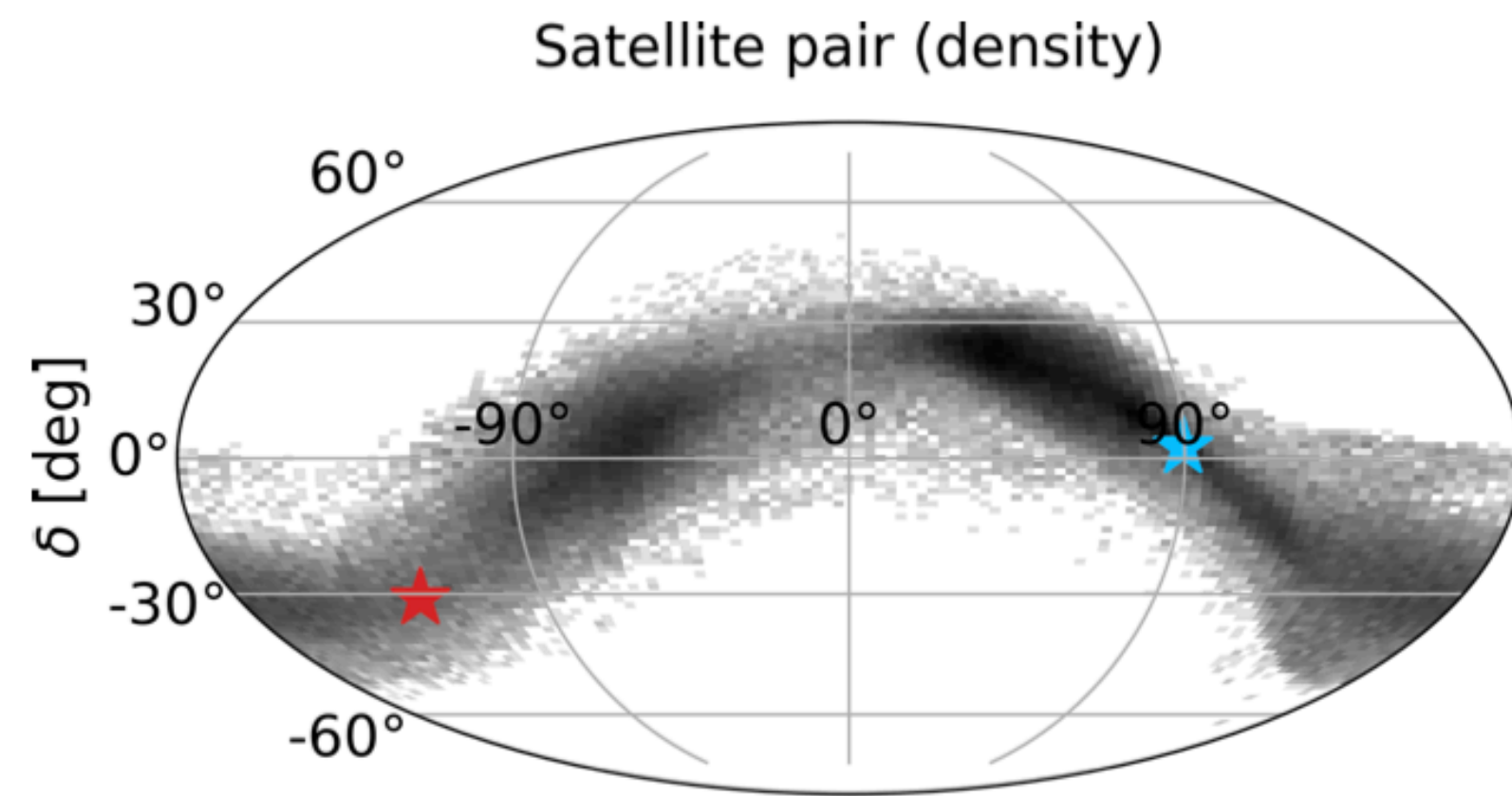


post-infall





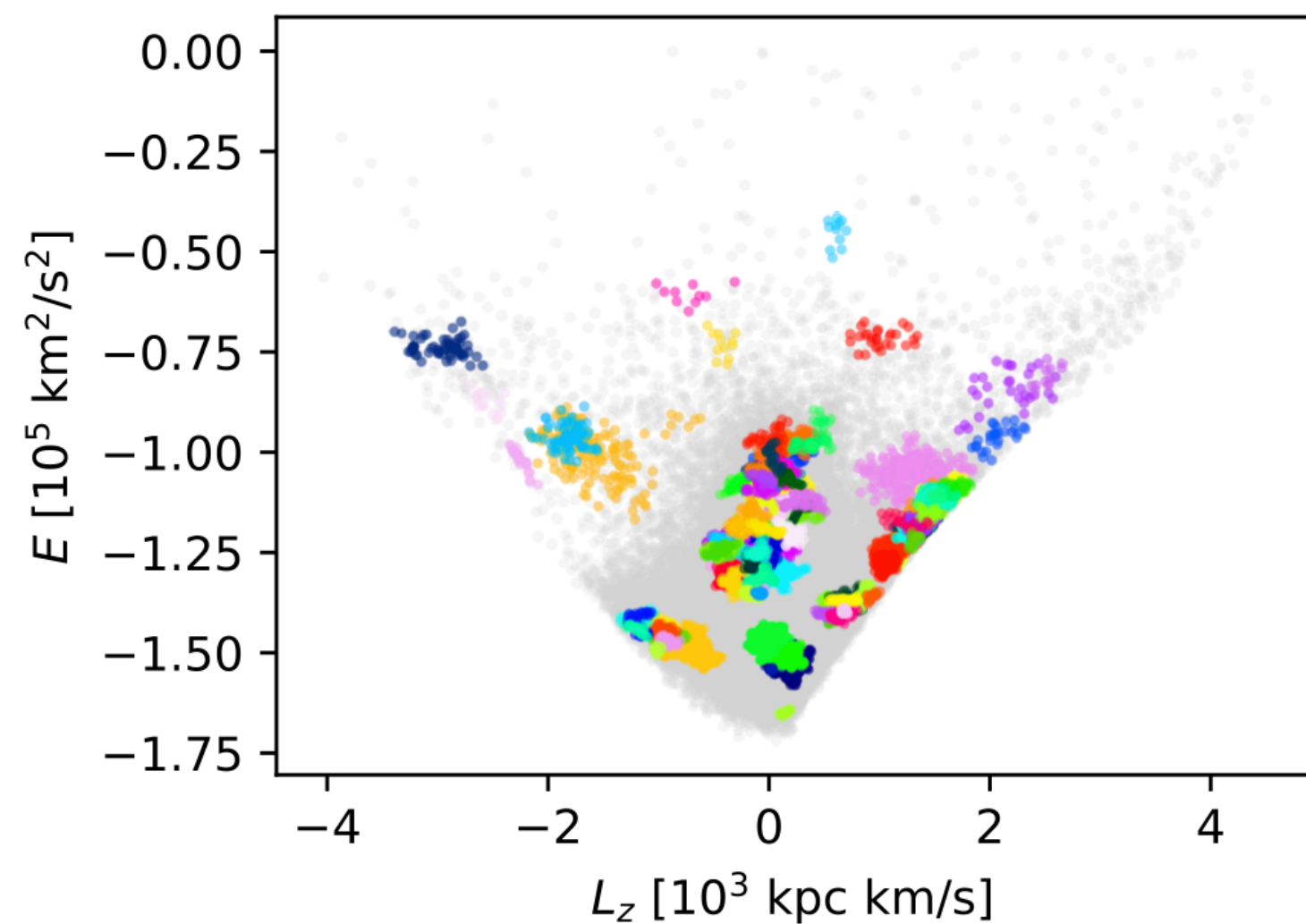
# A new explanation?



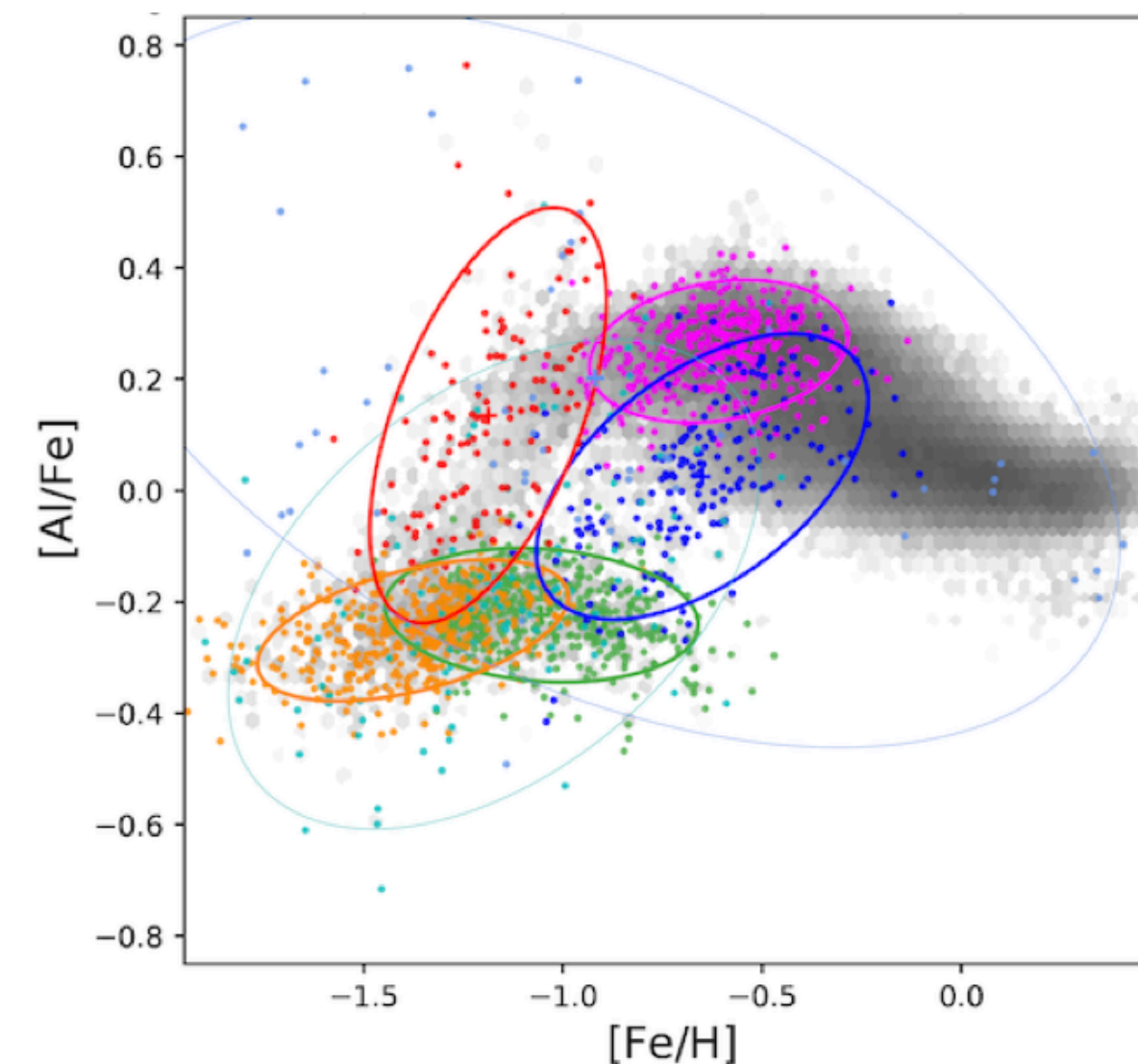


# Galactic Archaeology (a.k.a naming blobs)

- Using observatories (e.g. *Gaia*) we collect both kinematic and chemical data of stars:
- **Kinematic** — position and velocity (e.g.  $x, y, z, v_x, v_y, v_z$ )
- **Chemical** — abundance of certain elements (e.g. Fe, Al, Mg)



Credit: E Dodd et al. (2023)



Credit: G Myeong et al. (2022)

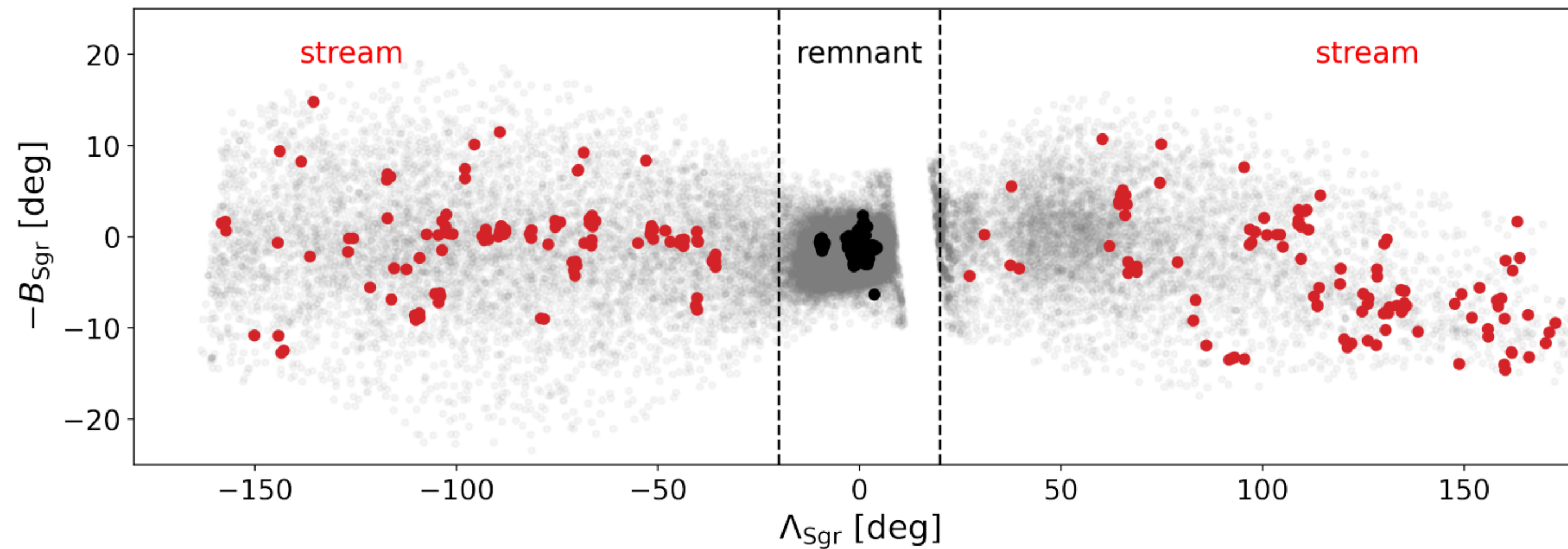


# Chemical populations of the stream

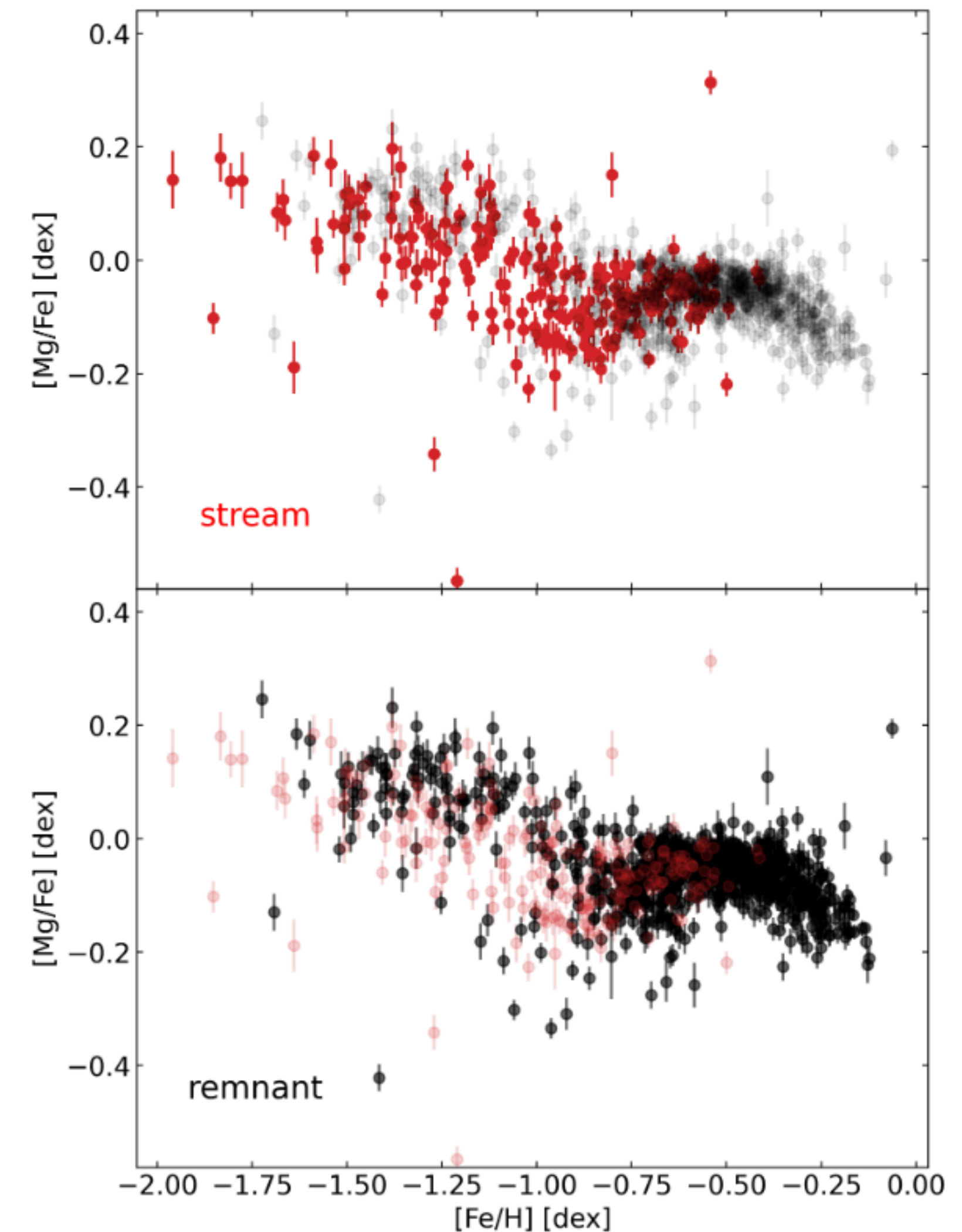
N = 224

N = 886

EY Davies et al. (2024)



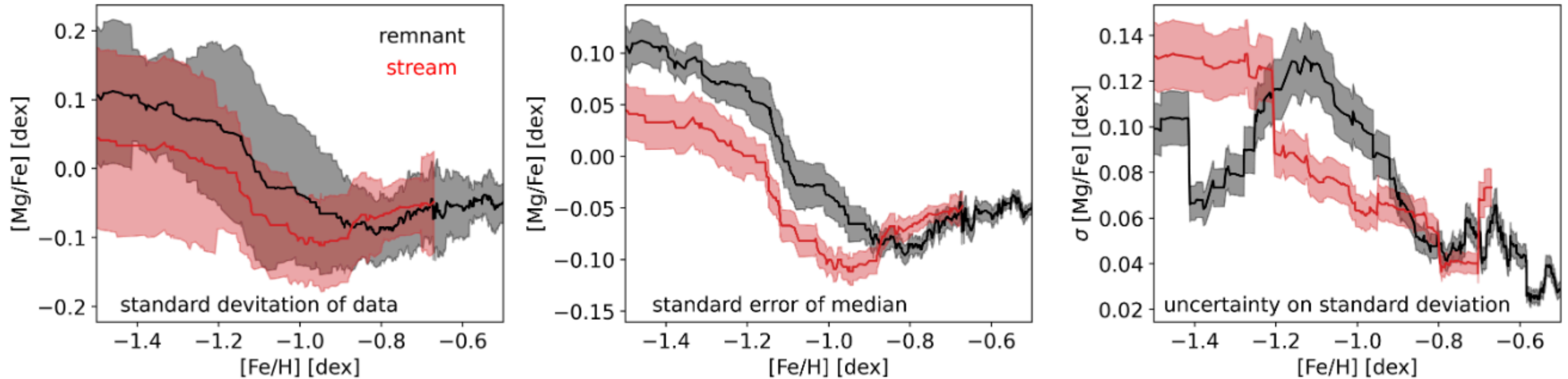
~55,000 Sagittarius stars from Vasiliev et al. (2021)  
~1000 that have alpha measurements from APOGEE



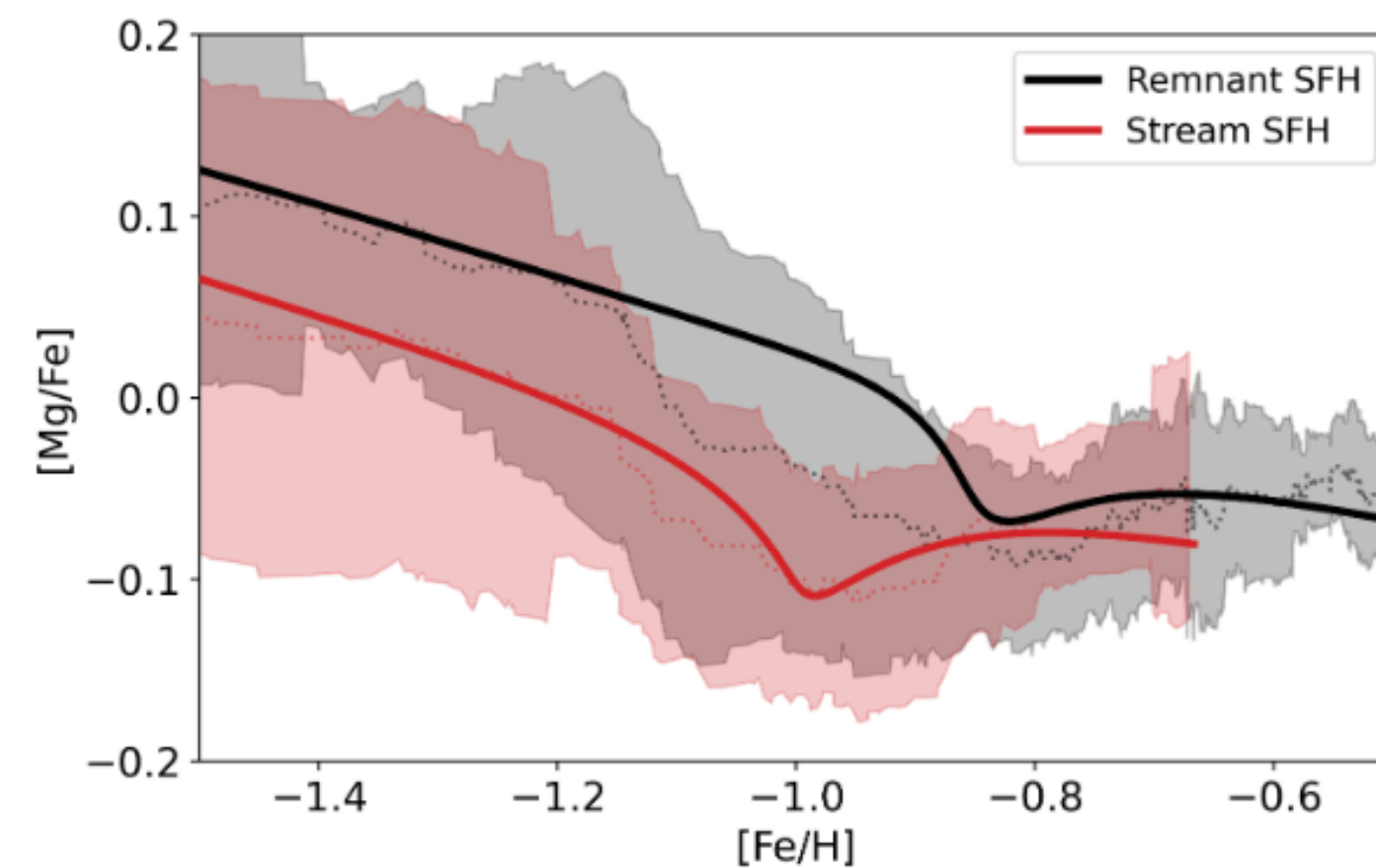


# Fitting tracks to the stream

EY Davies et al. (2024)

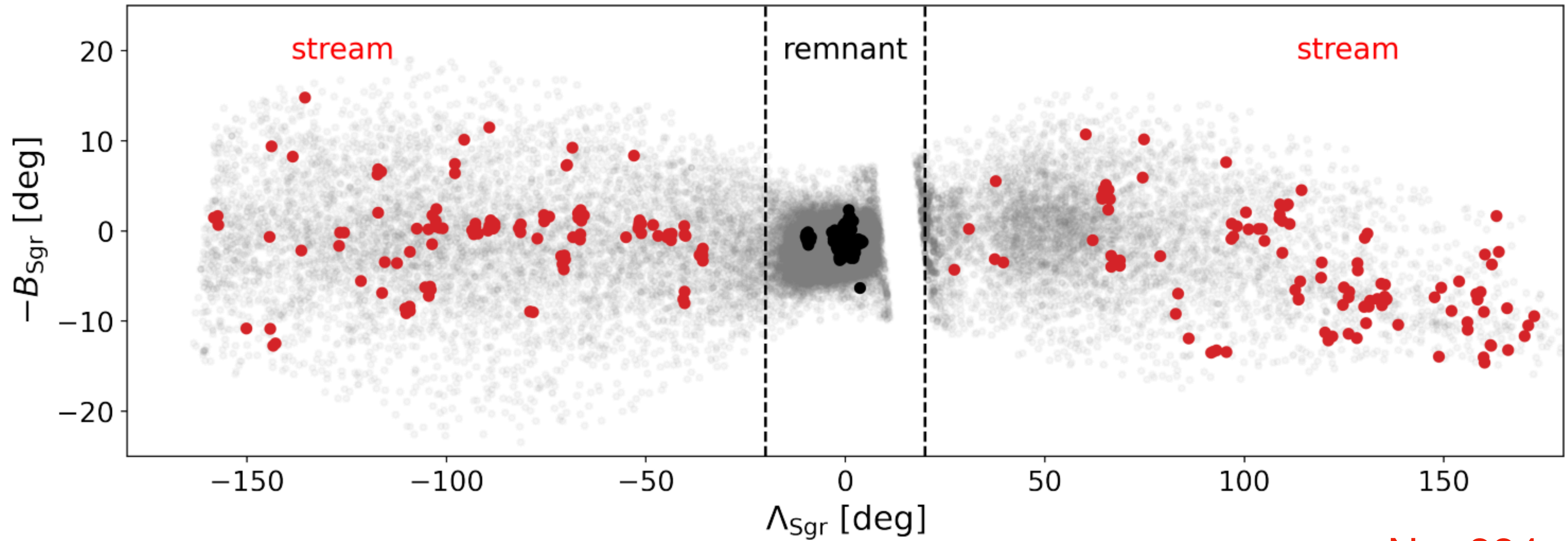


It is possible to fit unique chemical evolution models to these tracks.





# Deconstructing the Sagittarius stream

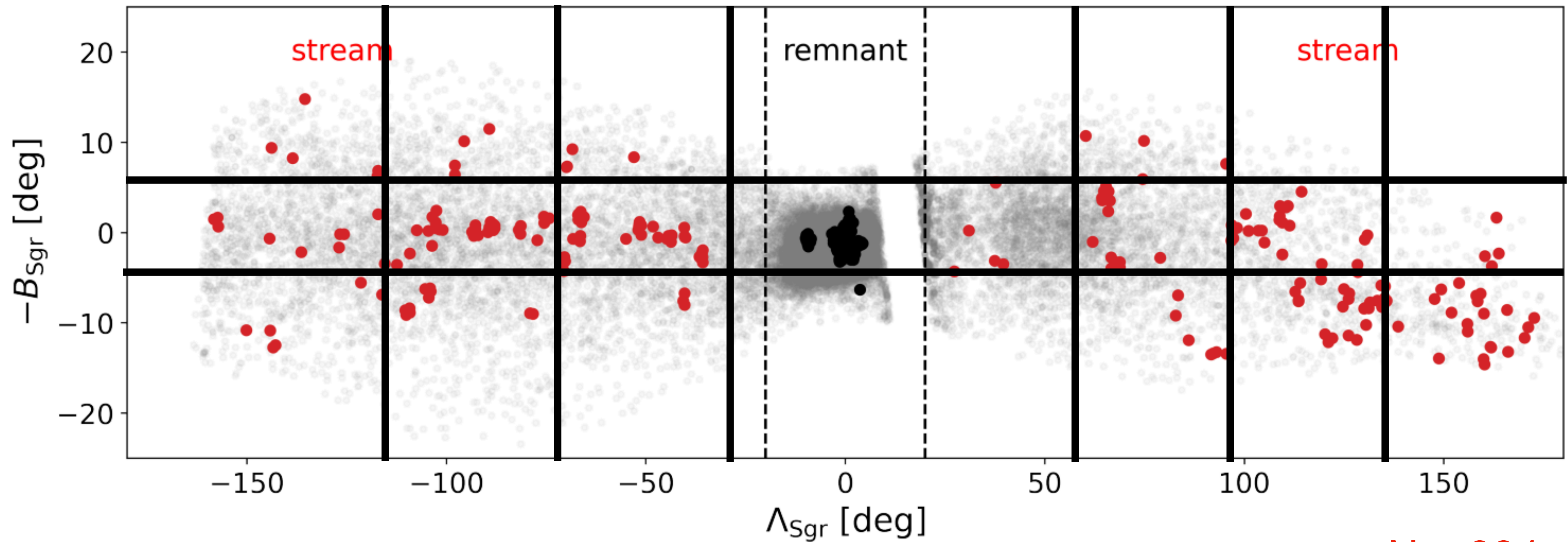


**N = 224**

**N = 886**



# Deconstructing the Sagittarius stream



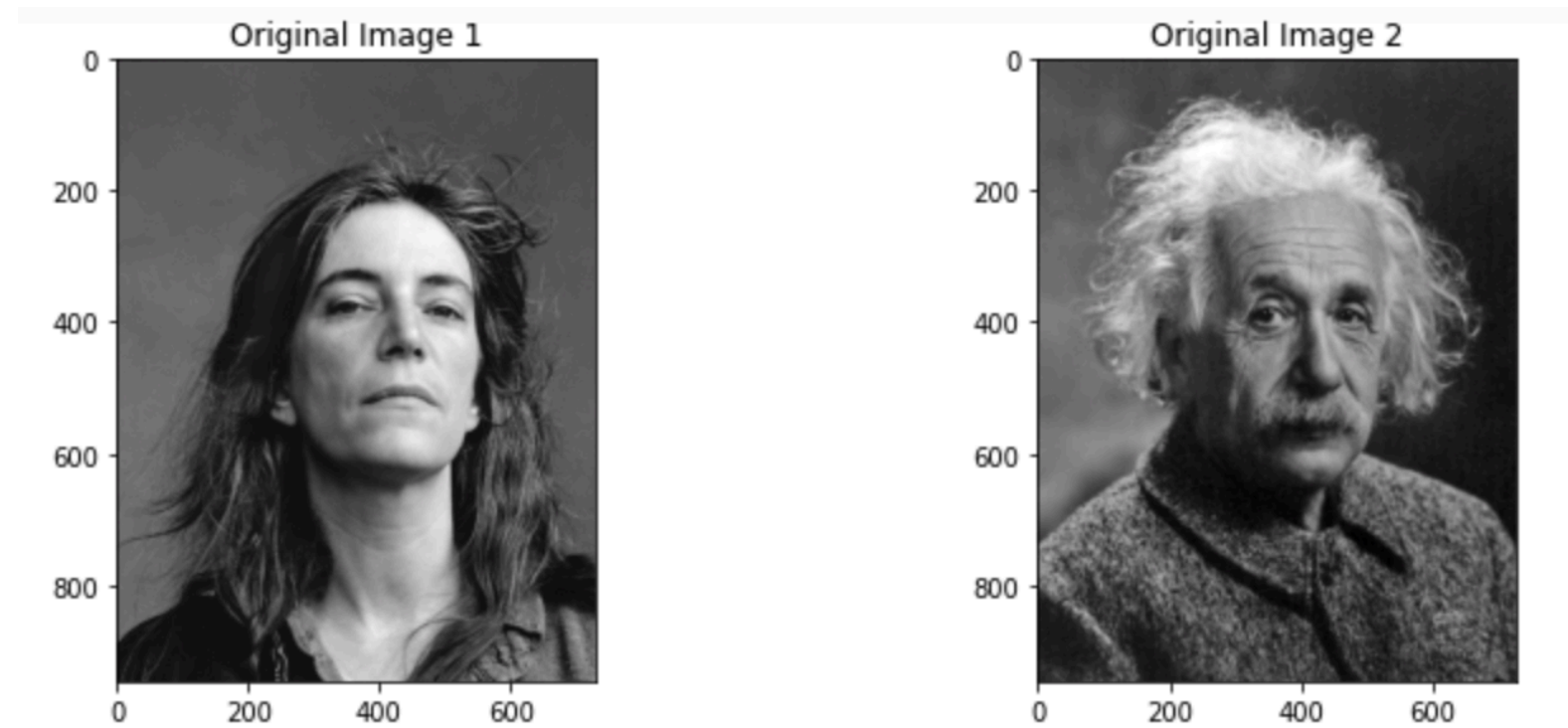
$N = 224$

$N = 886$

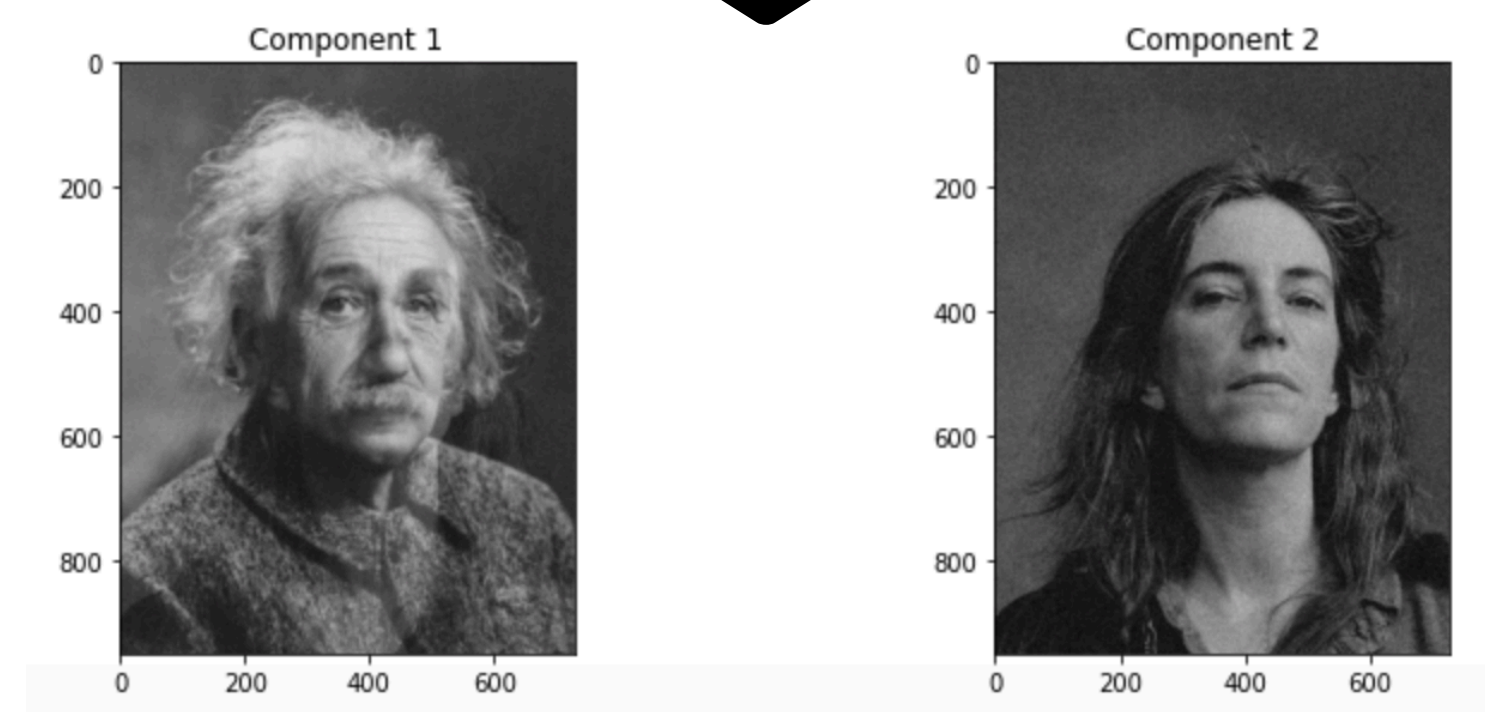


# Deconstructing the Sagittarius stream

Original images

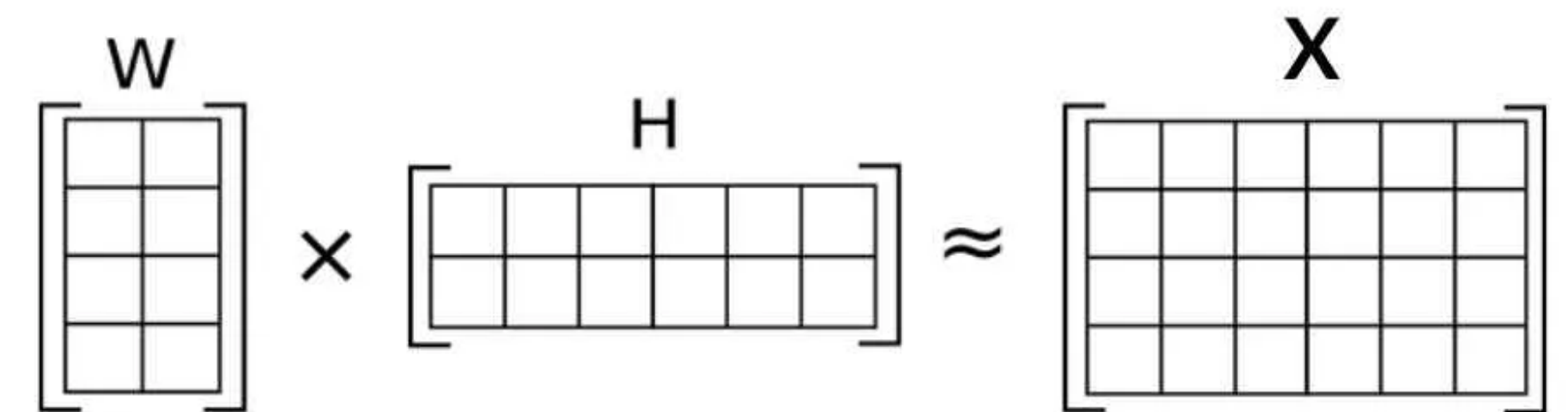


Reconstructed images



**\*Non-negative matrix factorisation**

Rewrite data,  $X$ , as the product of two matrices:



$X$  = data

$H$  = components

$W$  = weights

Set random initial values for  $W$ ,  $H$ .

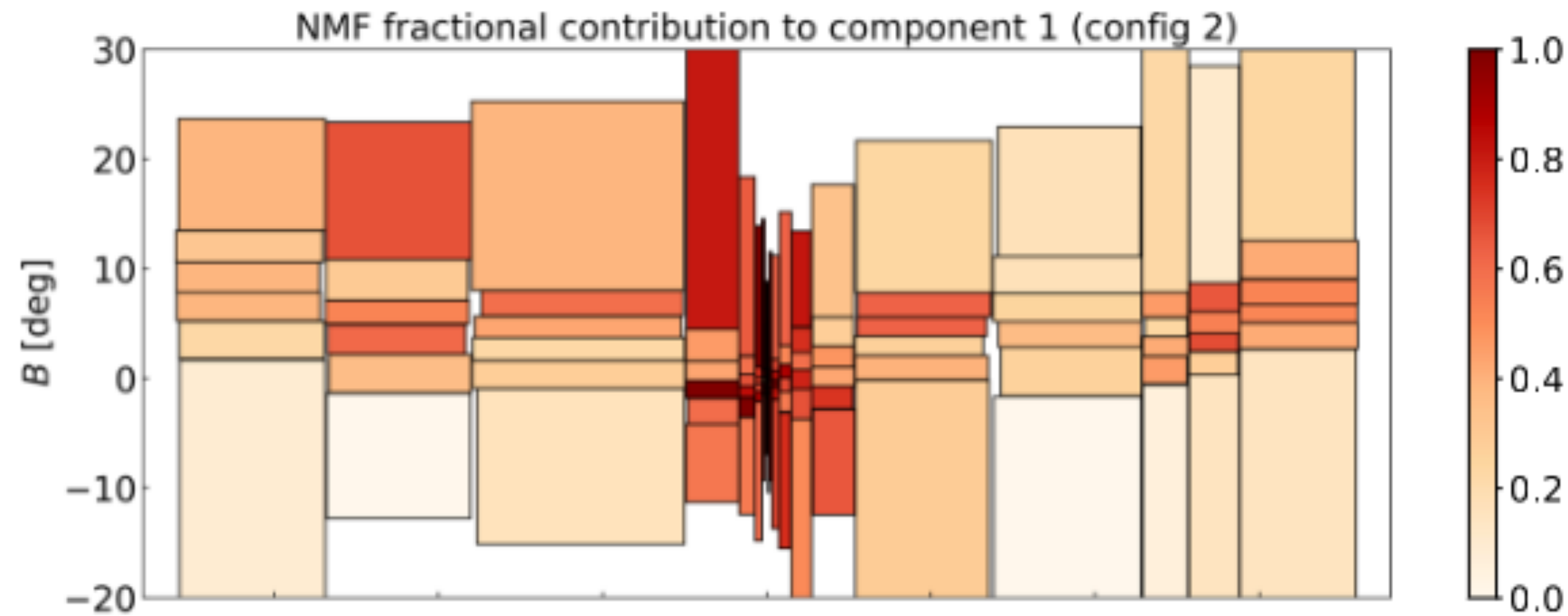
Continuously update  $W$ ,  $H$  so that that the Euclidean distance is minimised:

$$||X - WH|| = \sqrt{\sum_{ij} \left( X_{ij} - \sum_k W_{ik} H_{kj} \right)^2}$$



# Applying NMF to streams

*Work in progress*

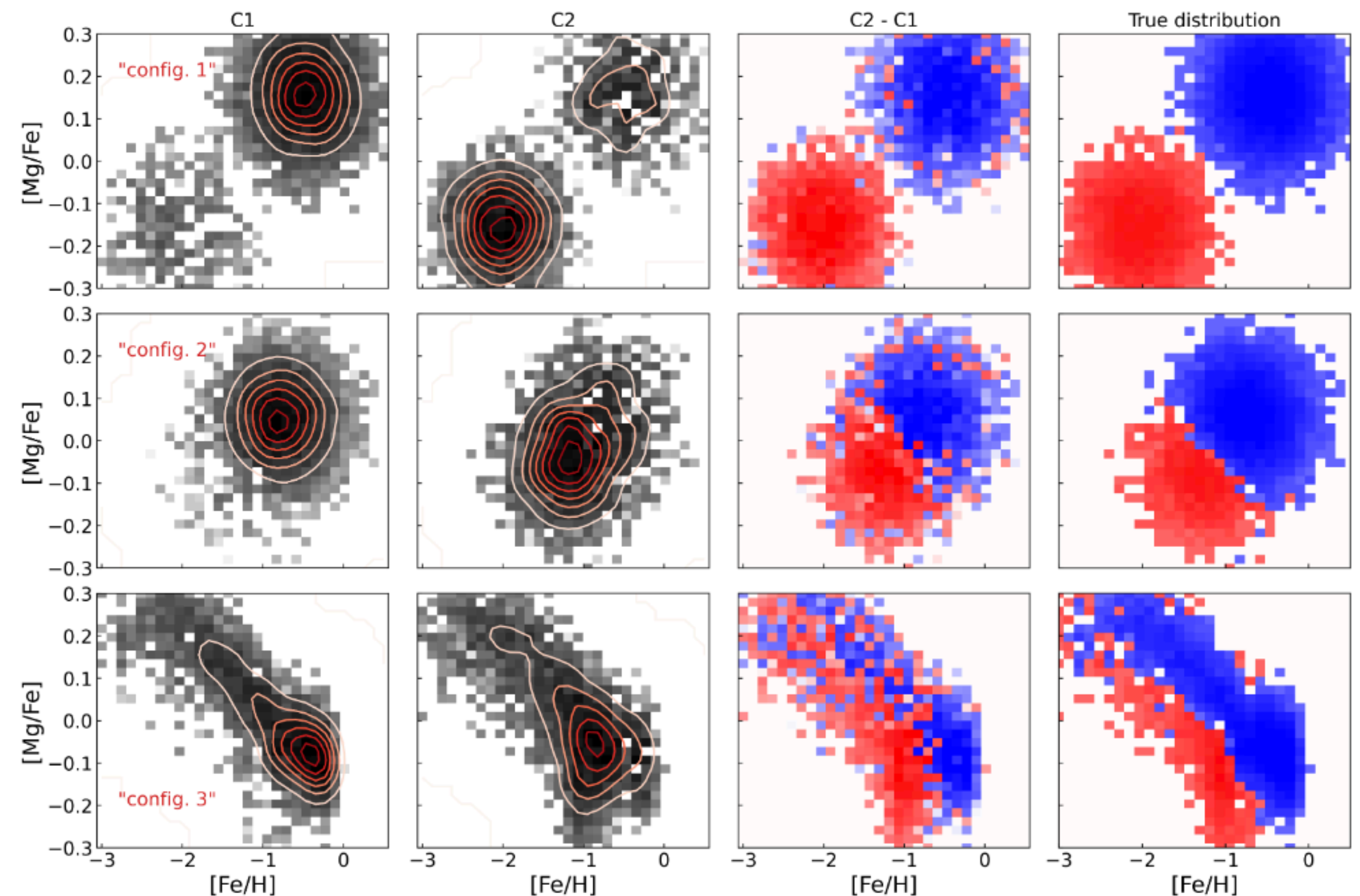


Create bins along the stream such that each bin contains an equal number of stars.

Within each bin there will be a mixture of several components.

Run NMF and see if it is able to reconstruct the populations.

Maybe run NMF on an incomplete sample?





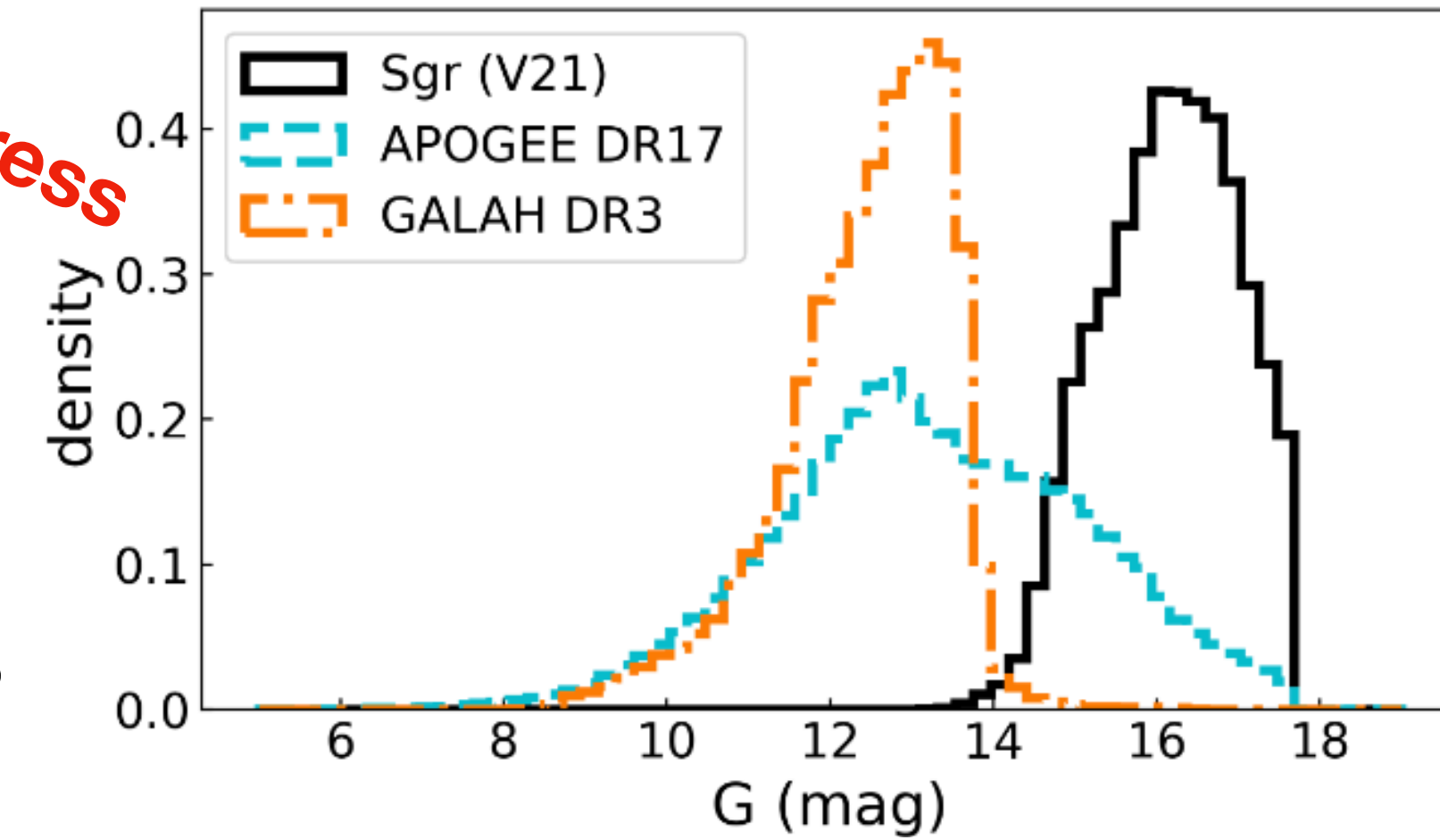
# Building a sample of Sgr stars

- Current only have a few hundred APOGEE stars with chemical information
- There have been many examples of trying to machine-learn stellar parameters (and some alpha abundances)...
  - Andrae et al. (2023) - XGBoost
  - Hattori (2024) - Quantile Random Forest
  - Fallows & Sanders (2024) - Uncertain Neural Network
  - Li et al. (2023) - AspGap

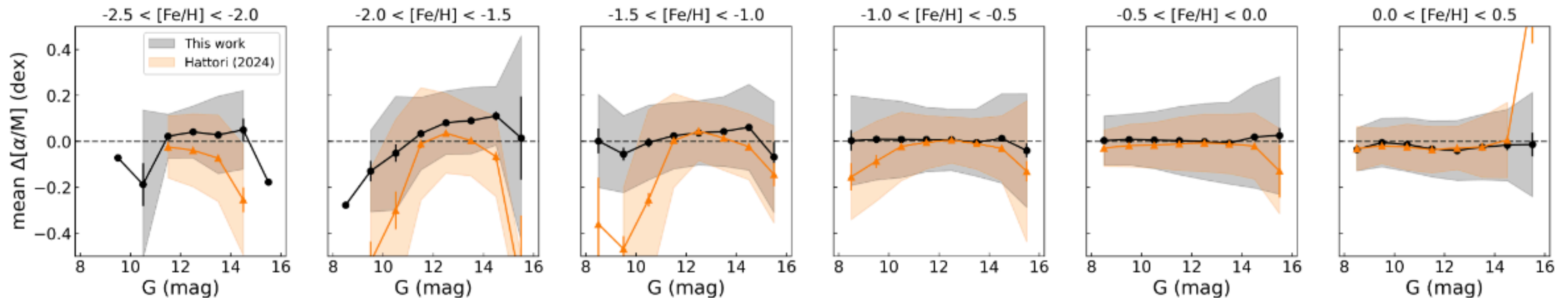


# Building a sample of Sgr stars

*Work in progress*



- Many samples show a bias with respect to brightness
- Crucial for the Sgr stars which are mostly very low brightness
- We are in the process of building our own sample (originally applied crude calibration, now working on training a neural network)

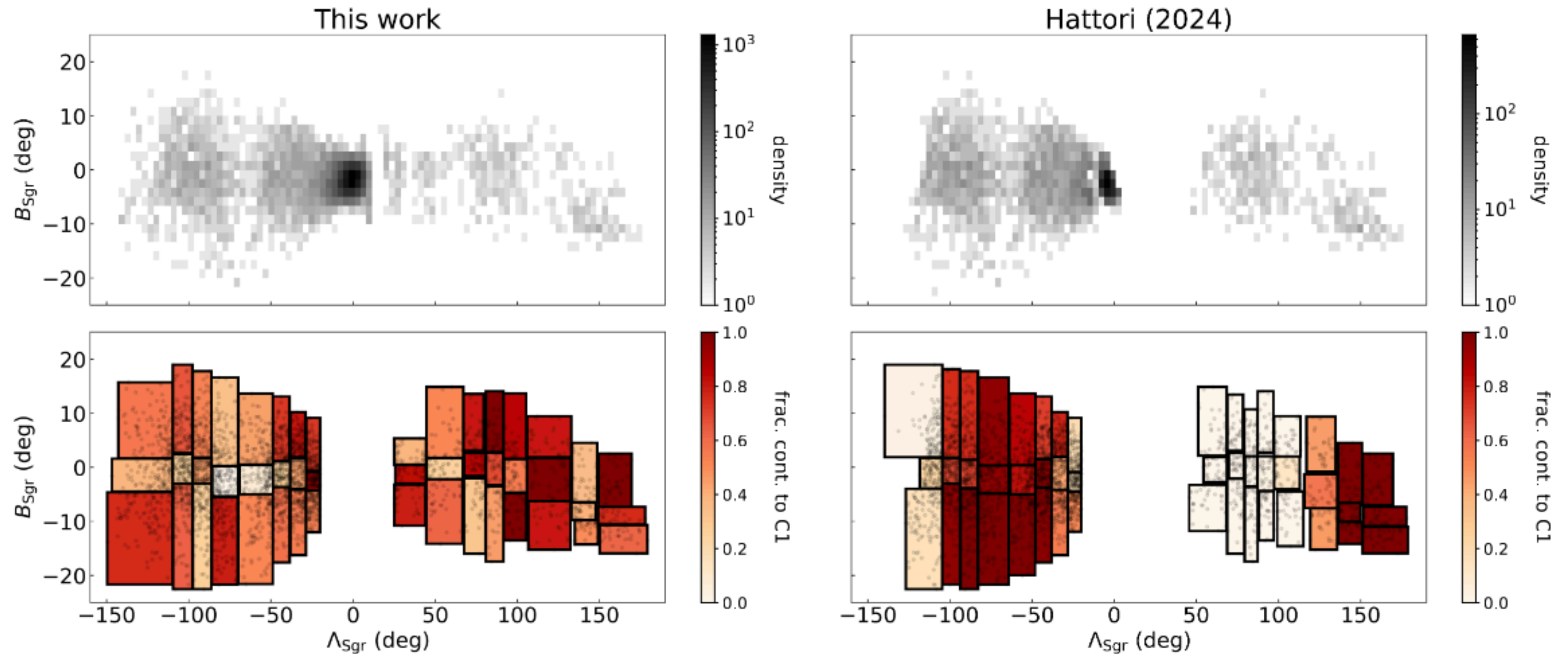




# Deconstructing the Sagittarius stream

Apply the NMF to data.

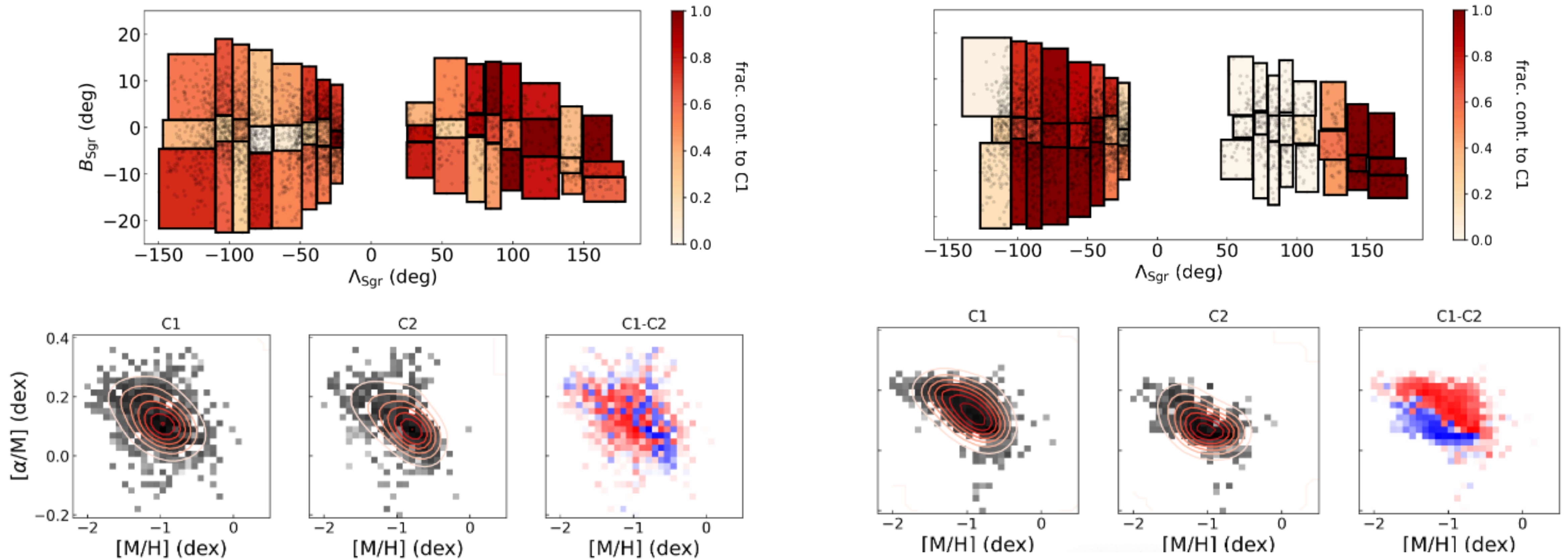
Brightness effect appears to be removed.





# Deconstructing the Sagittarius stream

Compare the reconstructed components.





# Thanks for listening!

## Questions?

### Summary:

- There are unexplained features in Sgr
- Some evidence for two chemical populations
- We are developing a method to disentangle these populations
- Improved data of Sgr star chemistry is needed

**Please talk to me if I can use your cosmological simulations, or if you have advice regarding measurements from XP spectra (or other ML tips!)**

### Relevant papers:

**EY Davies et al. (2024a) - arXiv:2308.01958**

**EY Davies et al. (2024b) - arXiv:2312.08424**