

Title: Gravitational effects of DM & Cosmology

Speakers: Lina Necib

Collection: School on Table-Top Experiments for Fundamental Physics

Date: September 21, 2022 - 9:15 AM

URL: <https://pirsa.org/22090014>

Some references for axion dark matter and the local velocity distribution

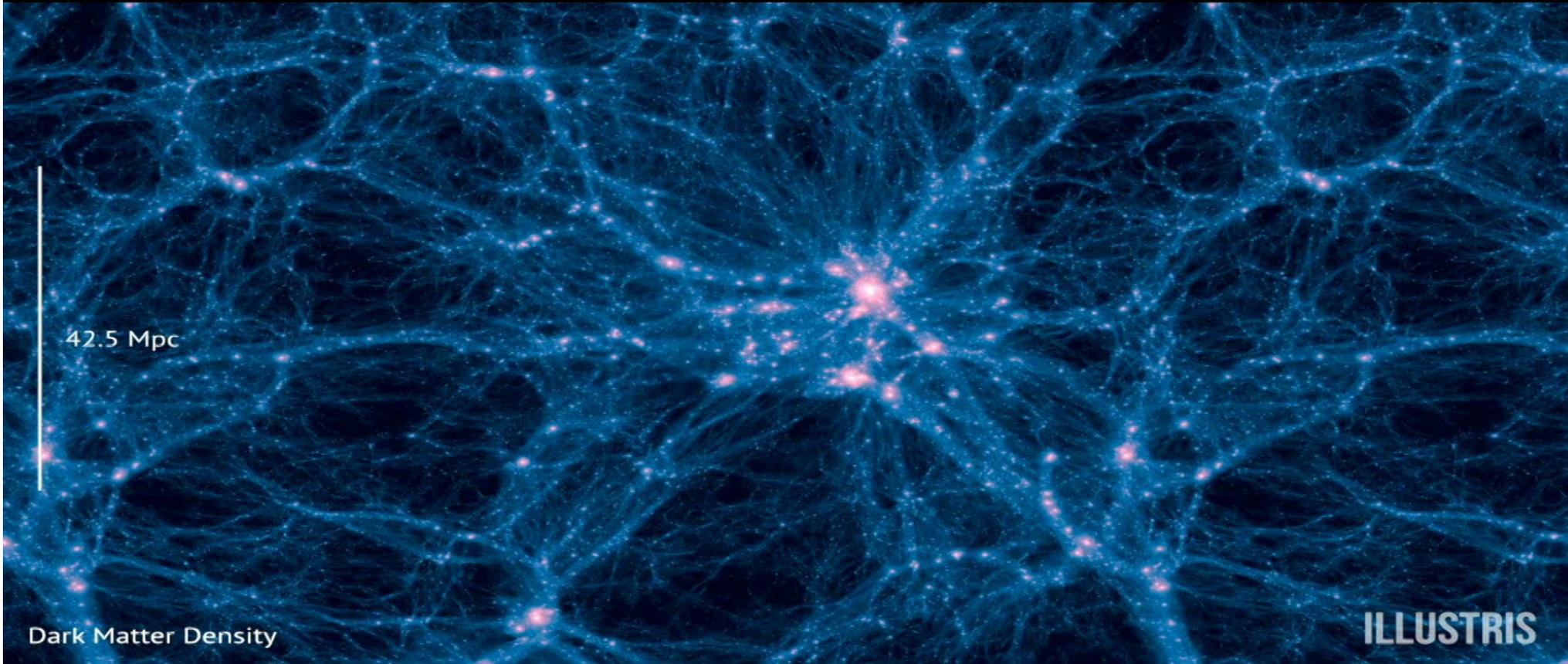
- Knirck et al. 1806.05927
- Foster et al. 1711.10489
- Ohare & Green 1701.03118
- Hoskins et al. 1109.4128
- Ling, Skivie, & Wick (Phys. Rev. D **70**, 123503)

References from Yesterday

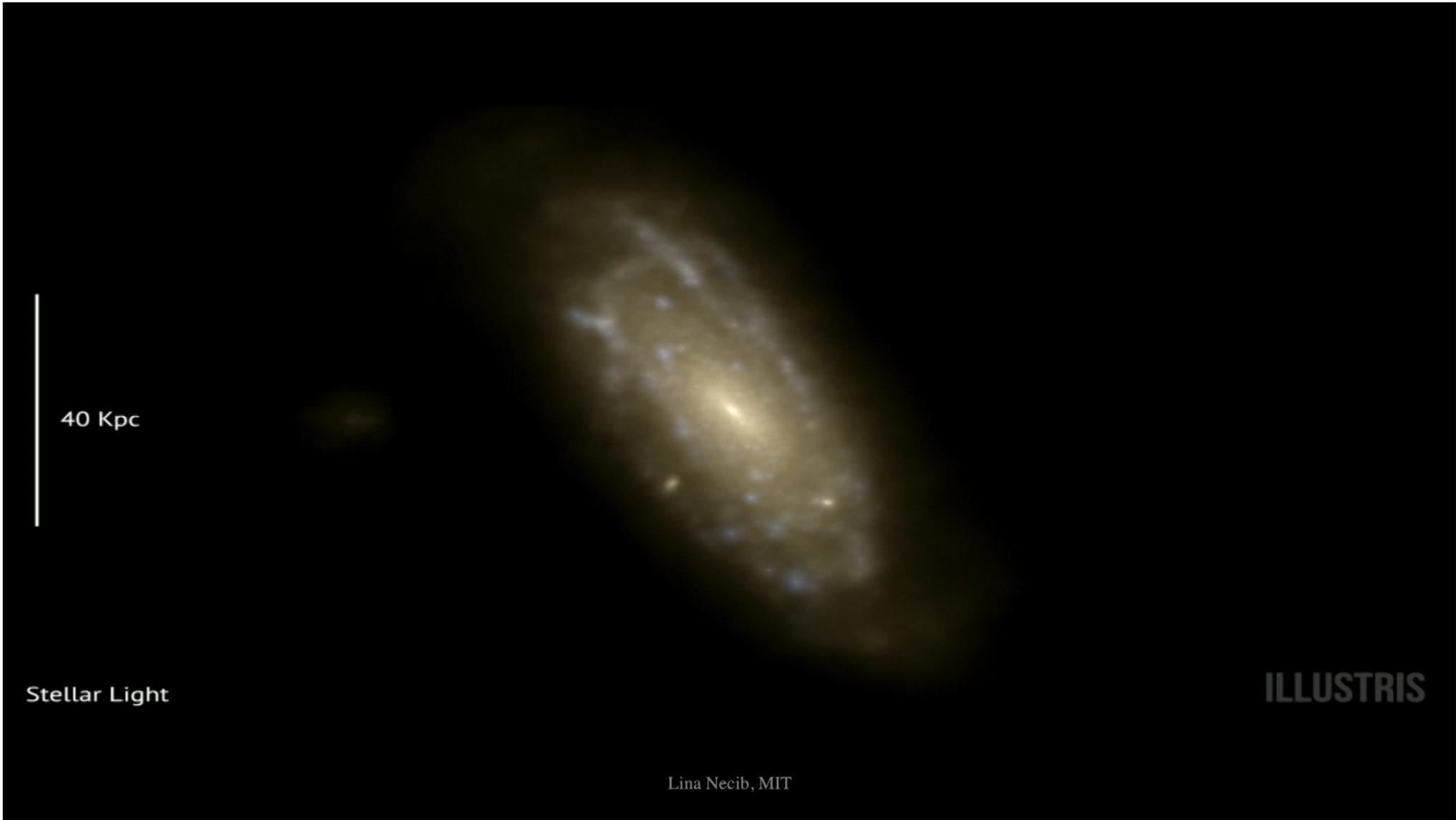
- Read (2014)
- Read et al. (2008)
- Freese, Lisanti, Savage (2013)
- Jungman (1996)
- Bruch et al. (2009)
- Eilers et al. (2019)
- Textbook: Galactic Dynamics, by Binney & Tremaine (2008 edition)

*Underlined are good reviews

We Need to Understand Dark Matter Substructure



Lina Necib, MIT



High
Resolution
Simulations

```
graph LR; A[High Resolution Simulations] --> C((A Local Map of Dark Matter)); B[Gaia Data] --> C;
```

Gaia Data

A Local
Map of
Dark
Matter

Correlation
between the
Stellar and
Dark Matter
Velocity
Distributions



Identification
of Stellar
Structure



Building the
Velocity
Distribution
of Dark
Matter

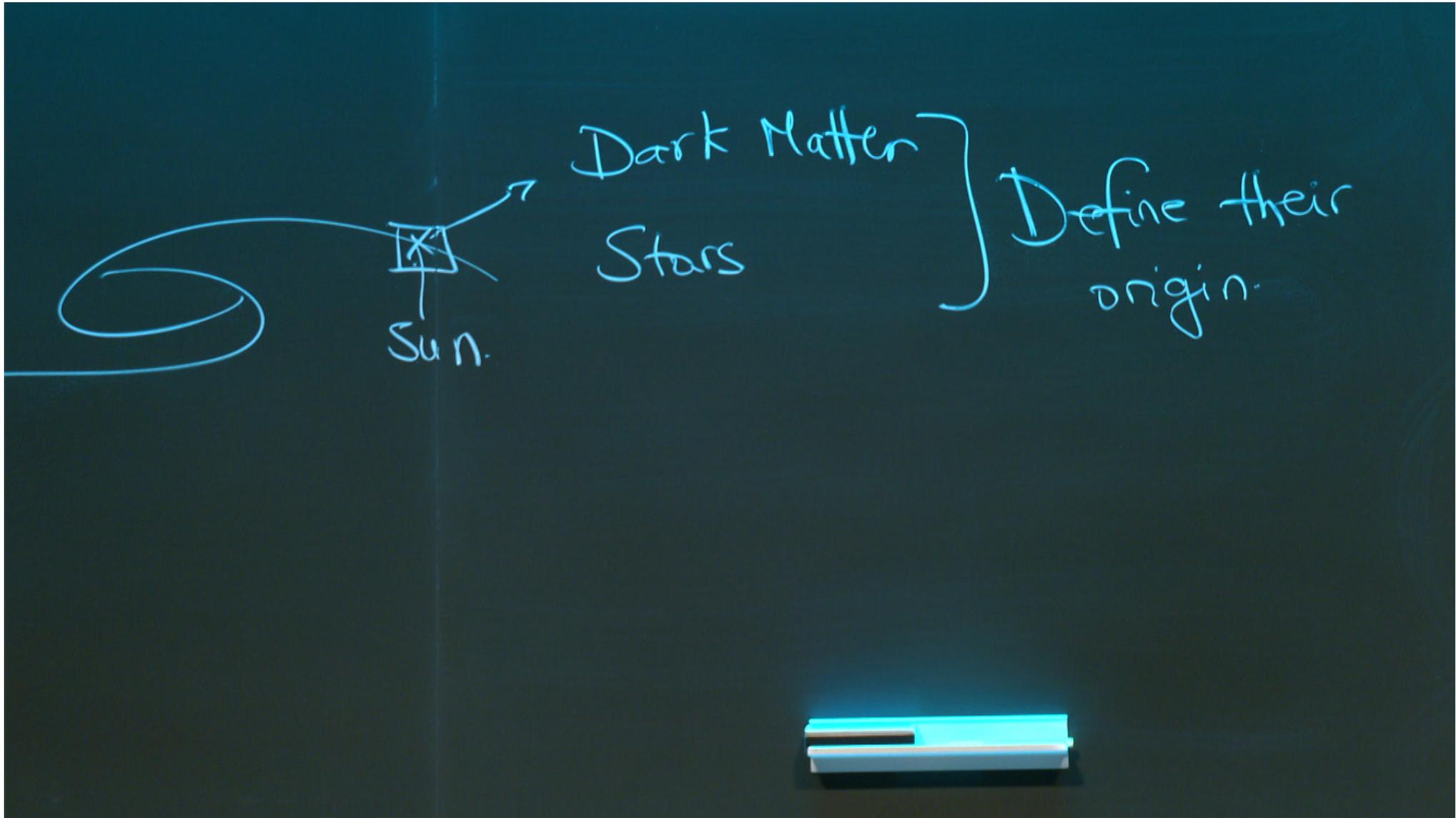
Correlation
between the
Stellar and
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Identification
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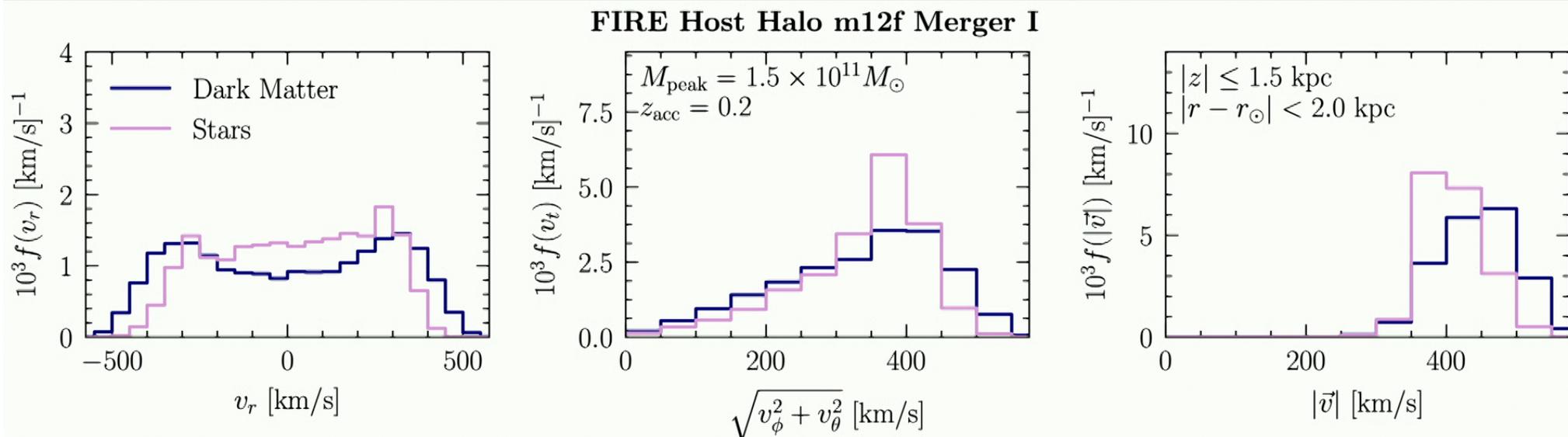


Building the
Velocity
Distribution
of Dark
Matter





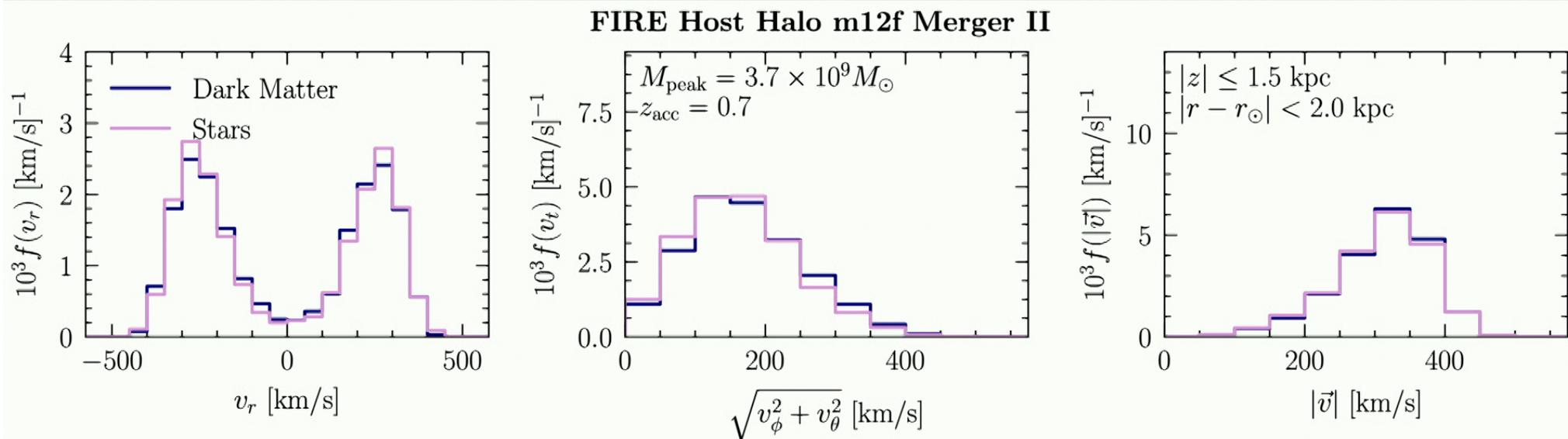
Correlation the velocity distributions of Dark Matter and stars merger by merger.



[Necib, Lisanti, Garisson Kimmel et al. \(2019\)](#)



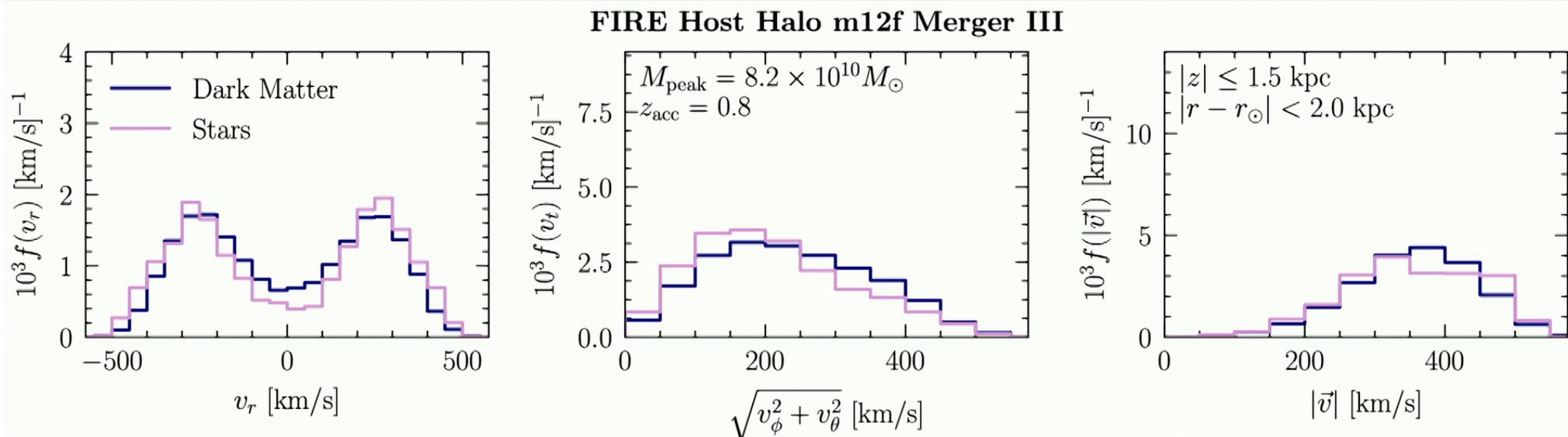
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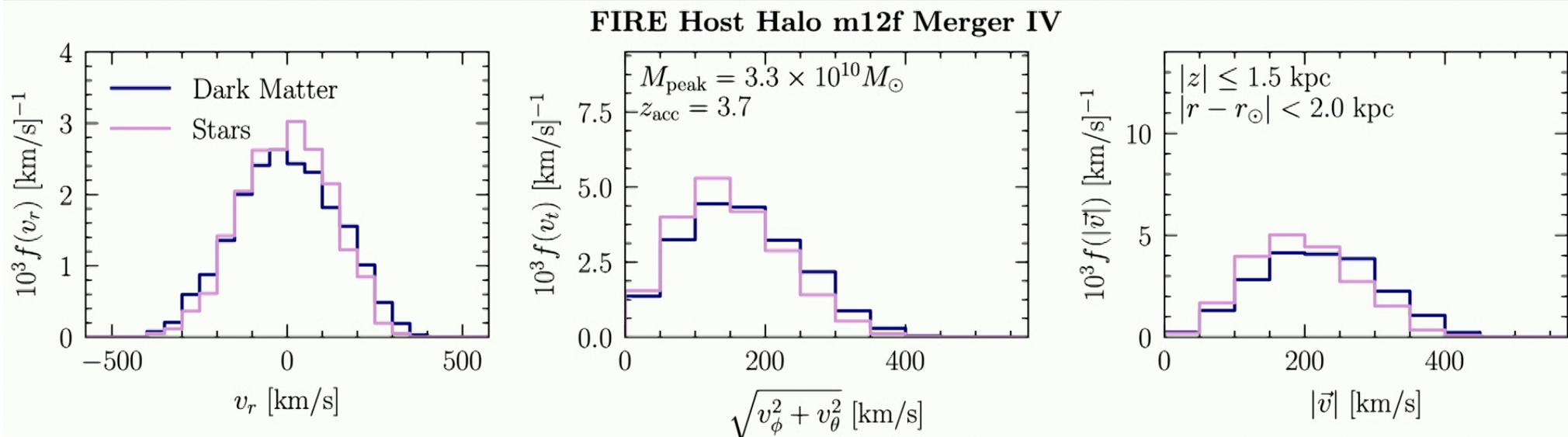
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[Necib, Lisanti, Garisson Kimmel et al. \(2019\)](#)



Correlation the velocity distributions of Dark Matter and stars merger by merger.



[Necib, Lisanti, Garisson Kimmel et al. \(2019\)](#)

Correlation
between the
Stellar and
Dark Matter
Velocity
Distributions

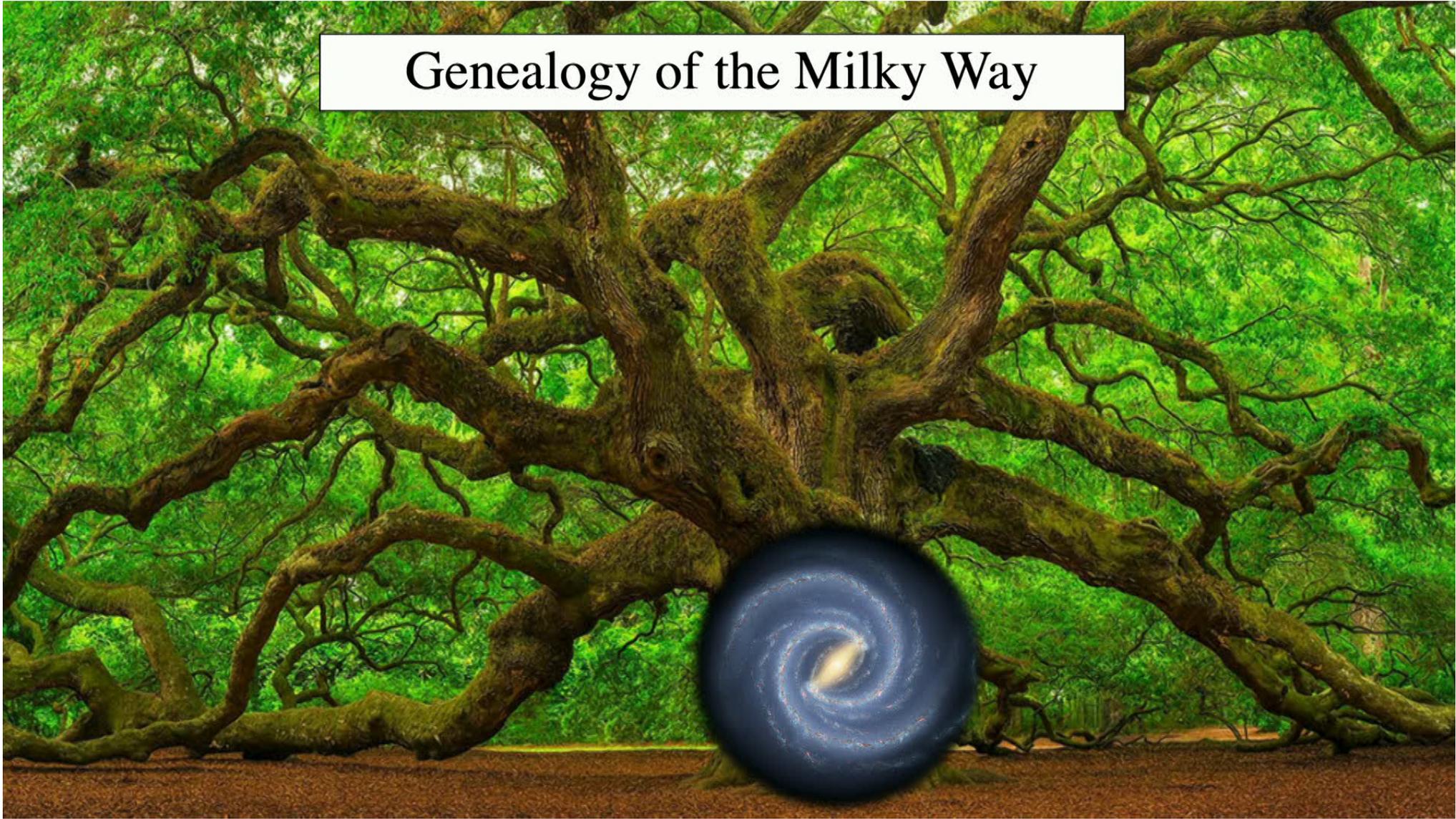


Identification
of Stellar
Structure



Building the
Velocity
Distribution
of Dark
Matter

Genealogy of the Milky Way



Genealogy of the Milky Way

Oldest
Mergers

Time

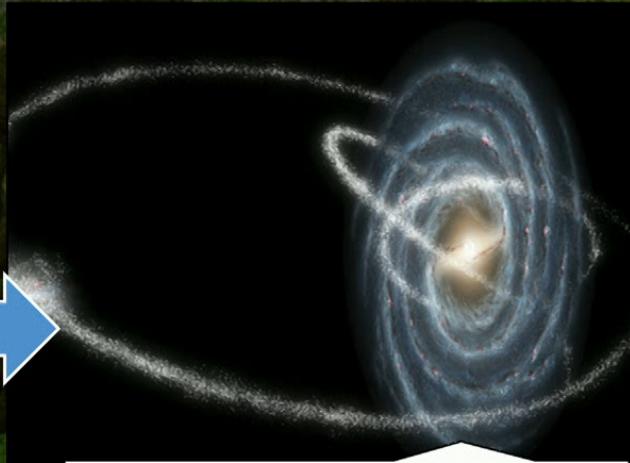
Most Recent
Mergers



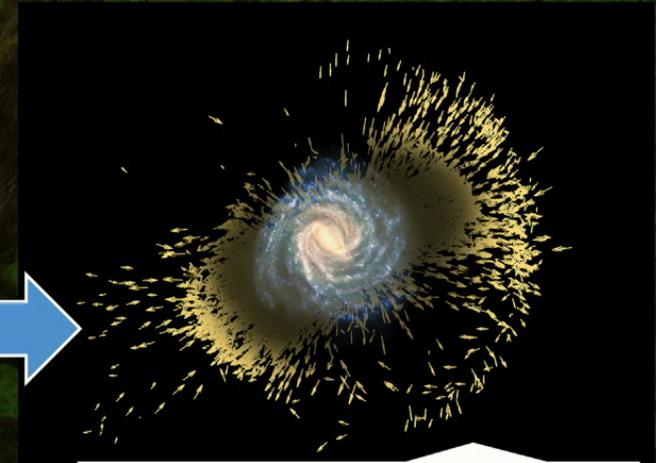
Merging Stages



Merging Galaxy



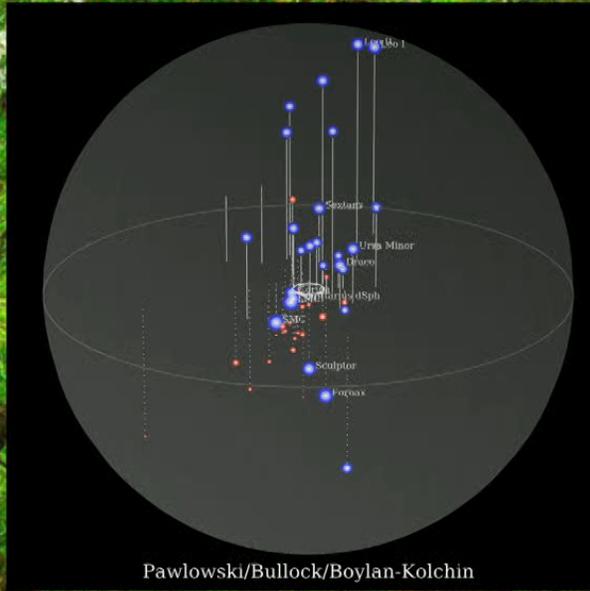
Stream



Debris Flow



Genealogy of the Milky Way



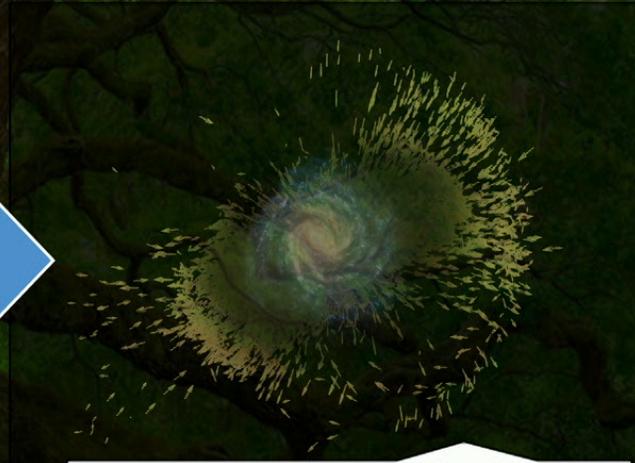
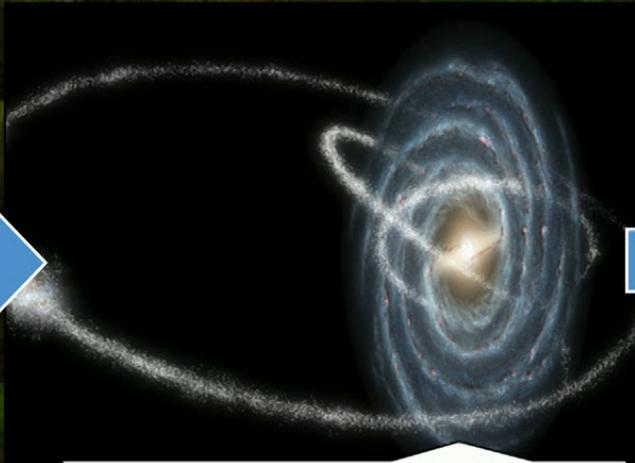
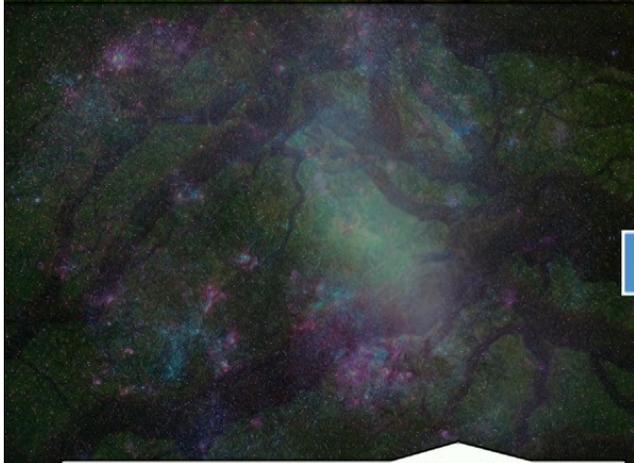
Oldest
Mergers

Time

Most Recent
Mergers

Large Magellanic Cloud

Merging Stages



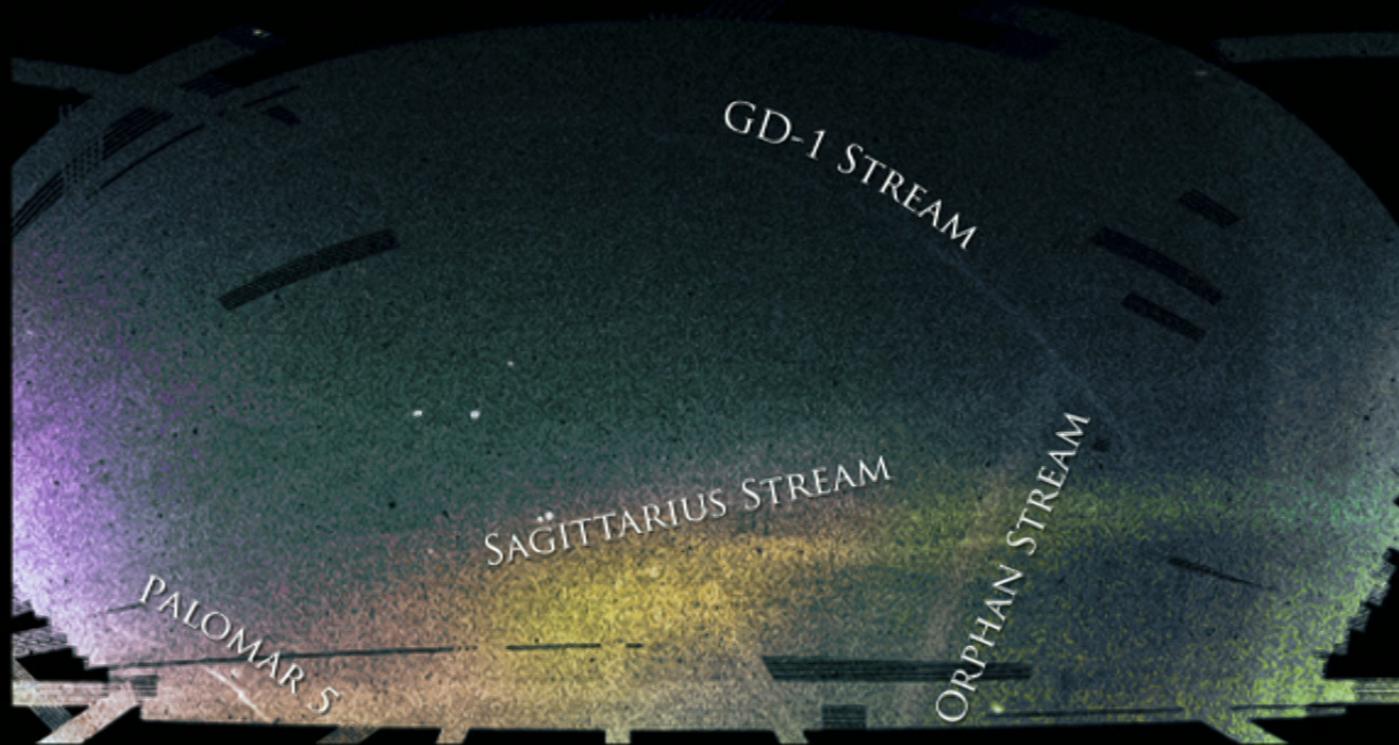
Merging Galaxy

Stream

Debris Flow



Field of Streams



Credit: Bonaca, Geha, Kallivayalil

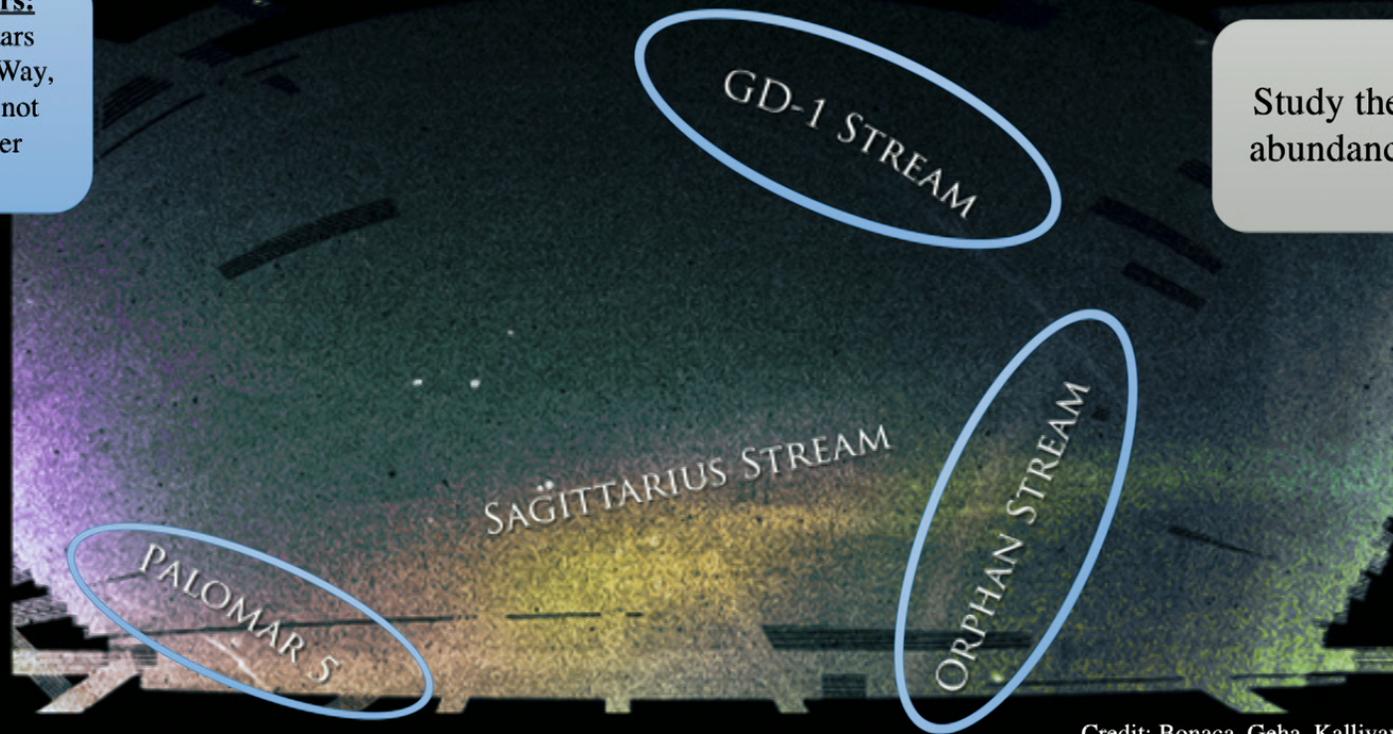
Belokurov, Zucker, Evans, et al. (2007)

Field of Streams

Globular Clusters:

A collection of stars born in the Milky Way, and therefore are not part of the merger history

Study the chemical abundances of stars



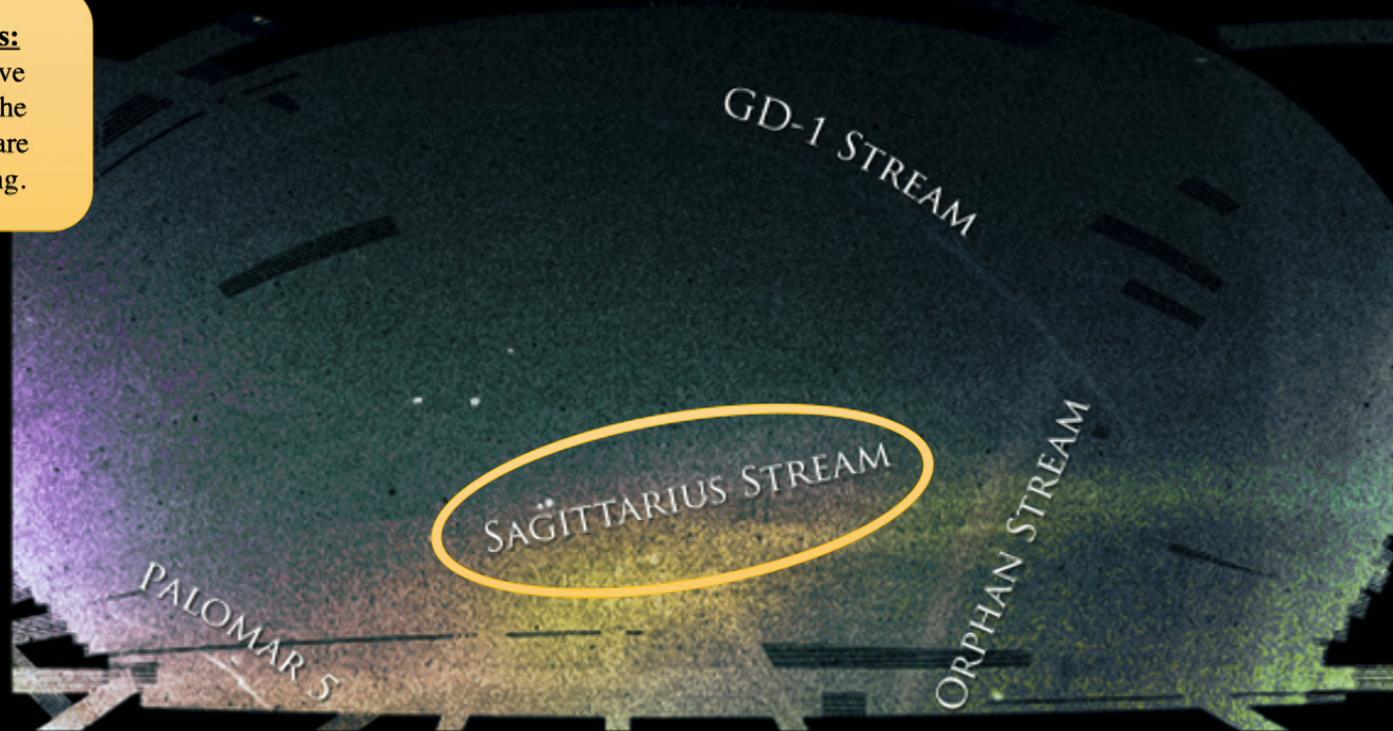
Credit: Bonaca, Geha, Kallivayalil

Belokurov, Zucker, Evans, et al. (2007)

Field of Streams

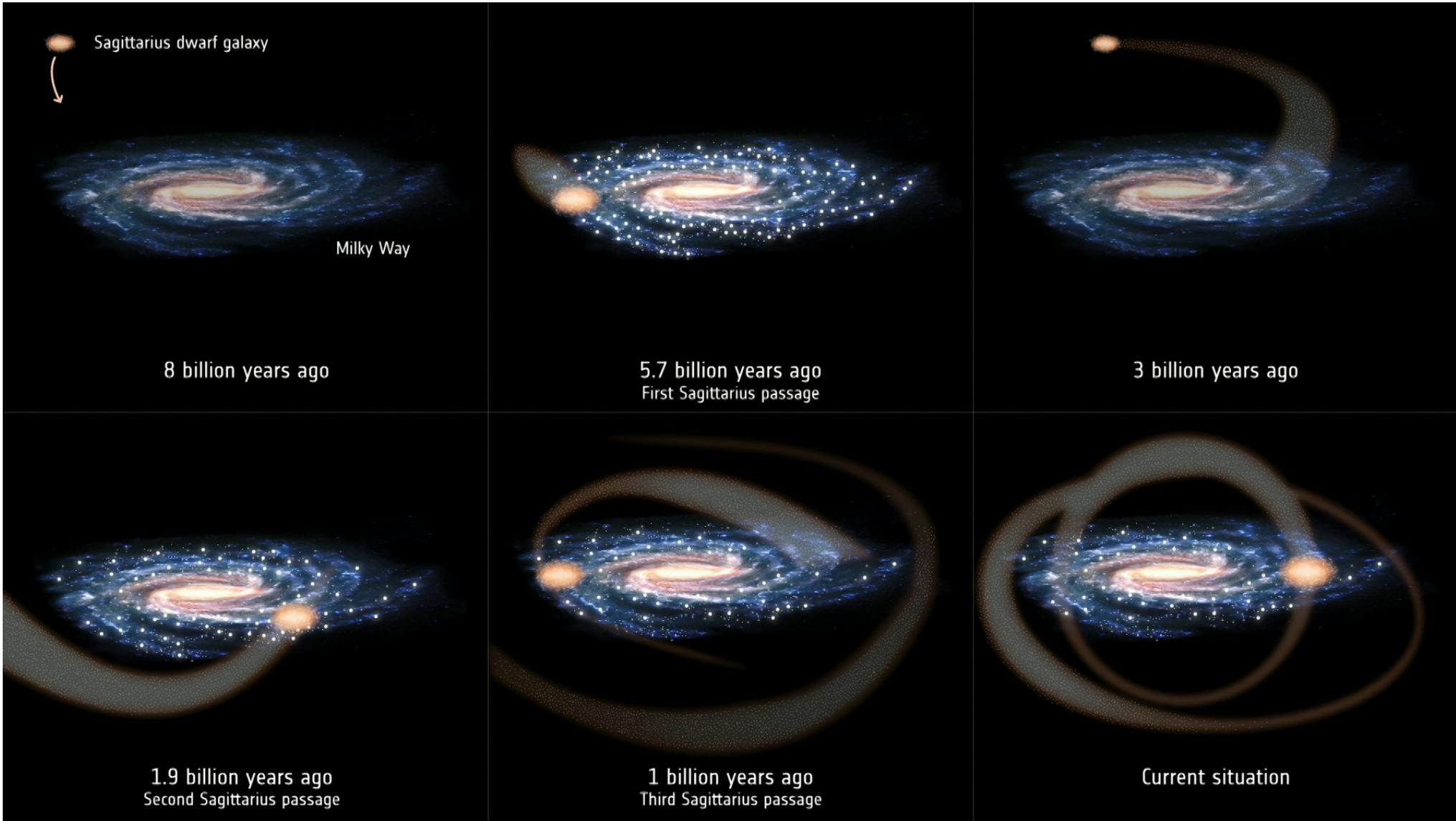
Dwarf Galaxies:

Galaxies that have formed outside the Milky Way and are currently merging.



Credit: Bonaca, Geha, Kallivayalil

Belokurov, Zucker, Evans, et al. (2007)



Genealogy of the Milky Way

Oldest
Mergers

Time

Most Recent
Mergers

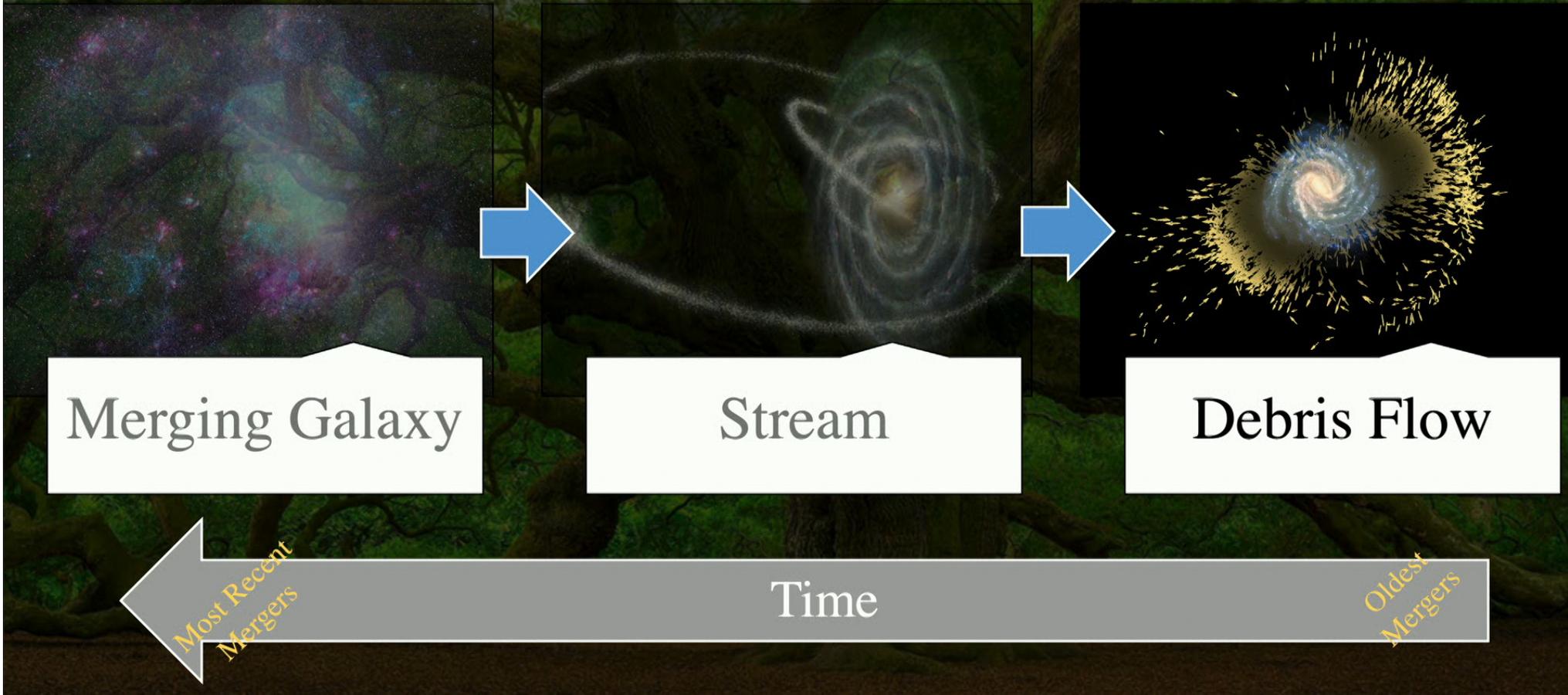


Large Magellanic Cloud



Sagittarius

Merging Stages



Gaia Enceladus

Accretion time: 6-10 billion years ago

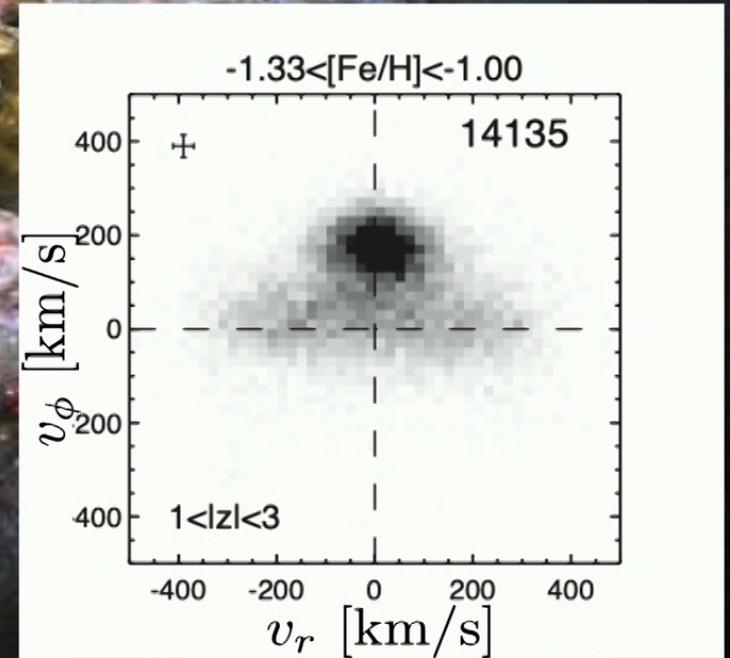
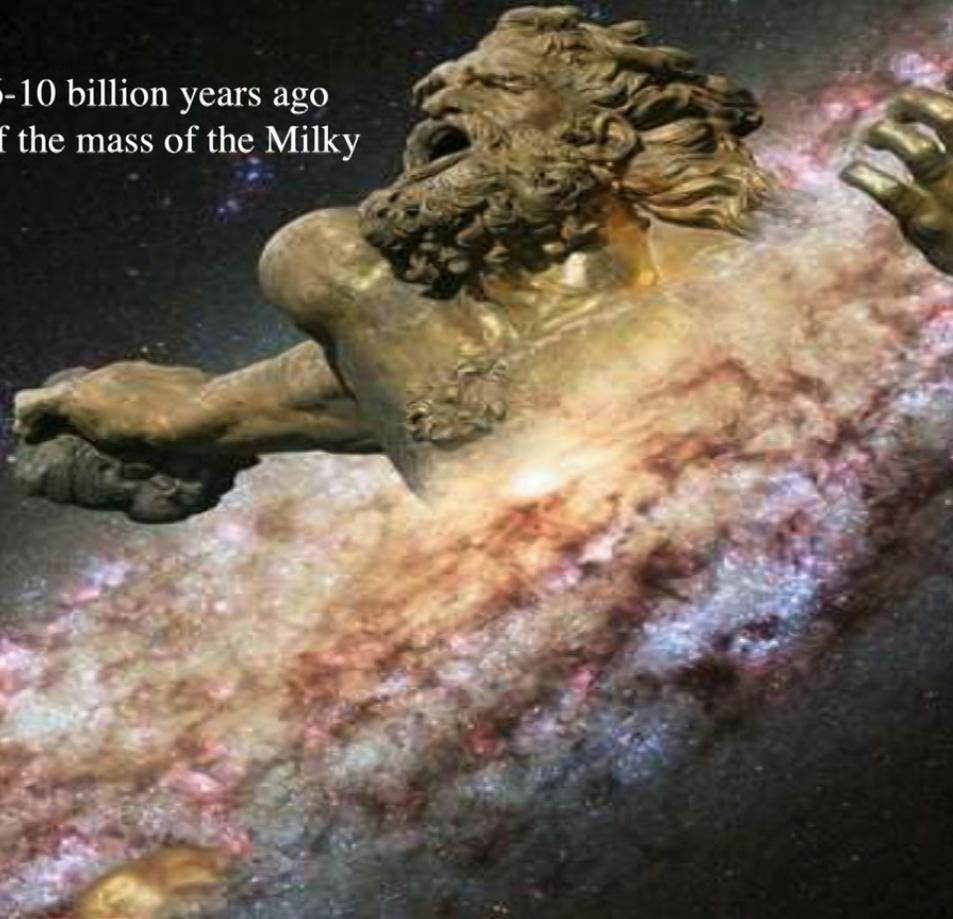
Mass: 1%-10% of the mass of the Milky Way



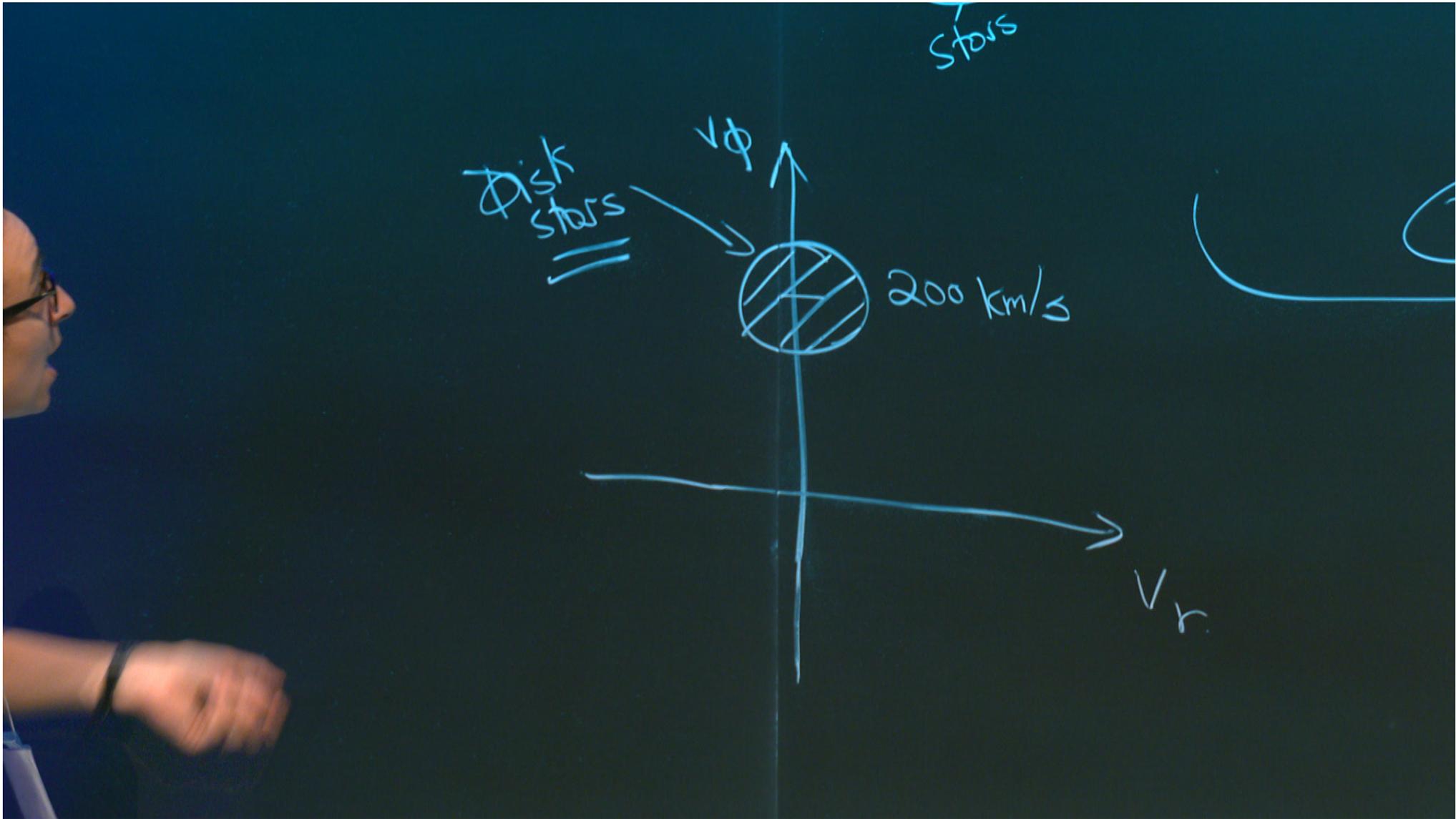
Belokurov et al. (2018)
Helmi et al. (2018)

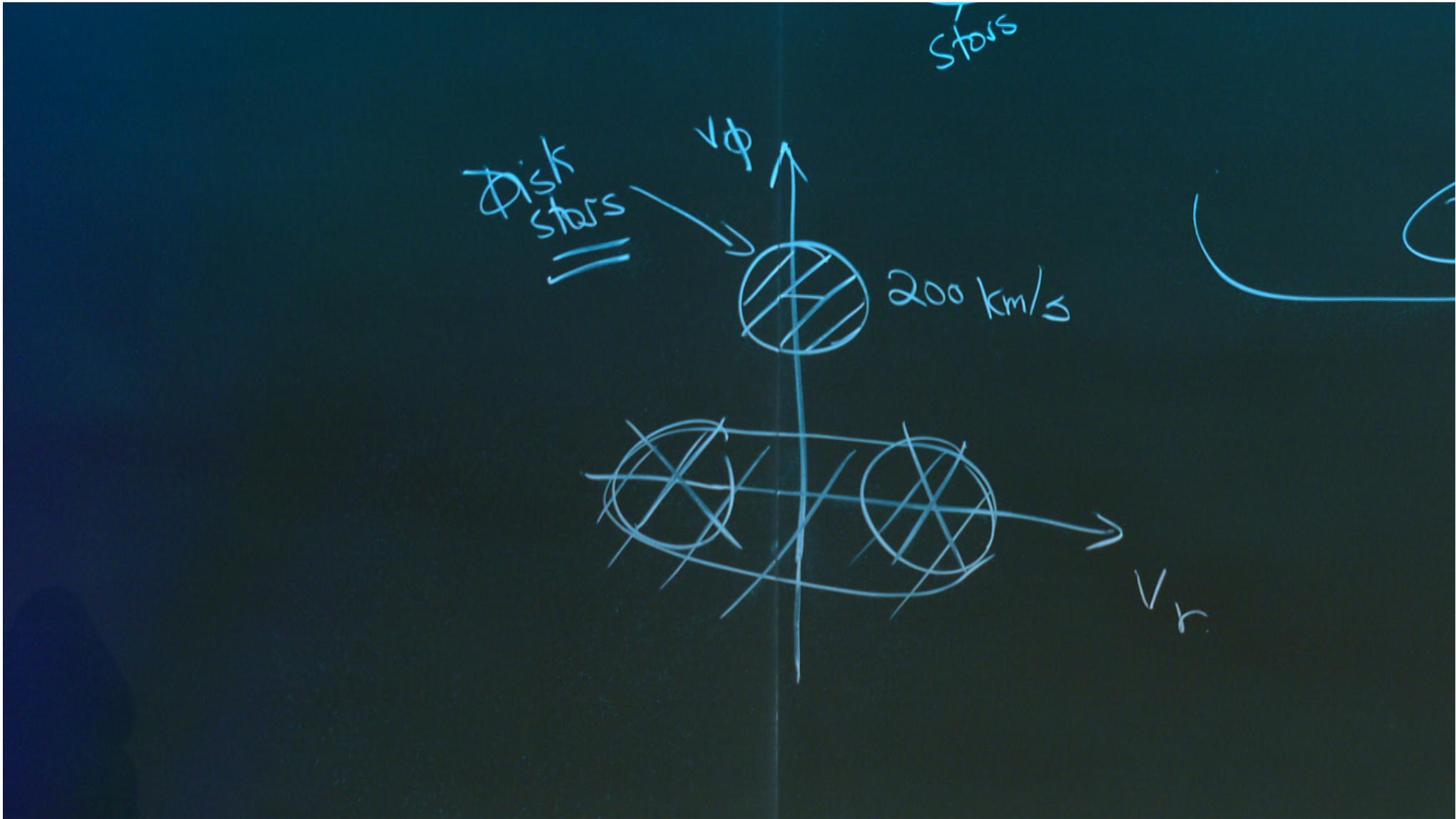
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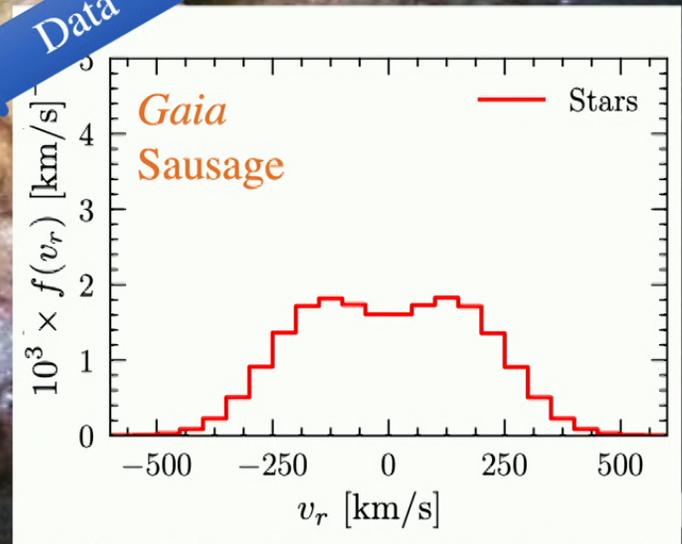
Belokurov et al. (2018)
Helmi et al. (2018)





Gaia Enceladus

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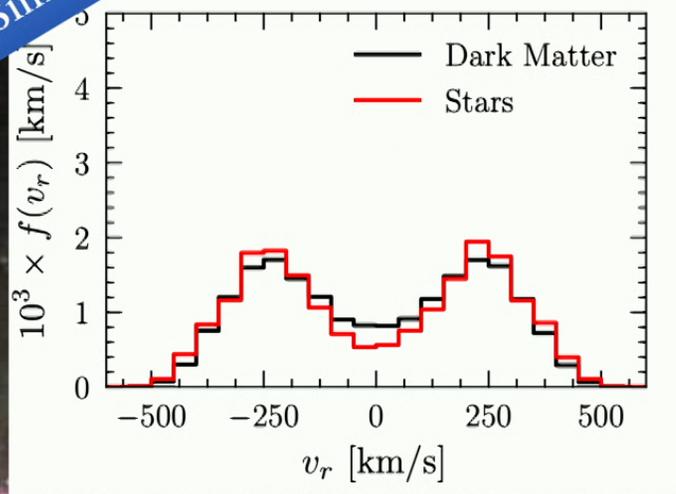


Necib, Lisanti, Belokurov (2019)

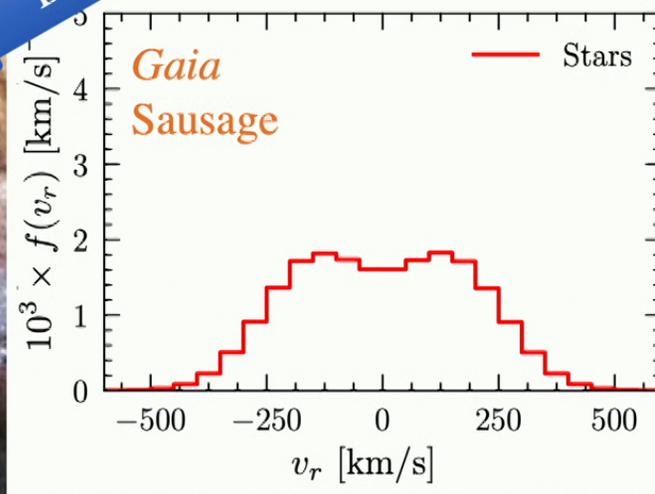
Gaia Enceladus

Accretion time: 6-10 billion years ago
Mass: 1%-10% of the mass of the Milky Way

Simulation



Data



Necib, Lisanti, Belokurov (2019)
Necib, Lisanti, Garrison-Kimmel et al. (2018)

Genealogy of the Milky Way



Gaia Enceladus



Large Magellanic Cloud



Sagittarius

Oldest
Mergers

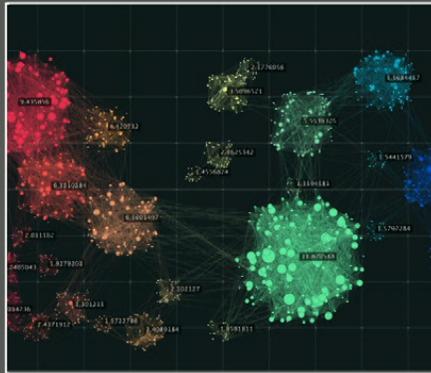
Time

Most Recent
Mergers

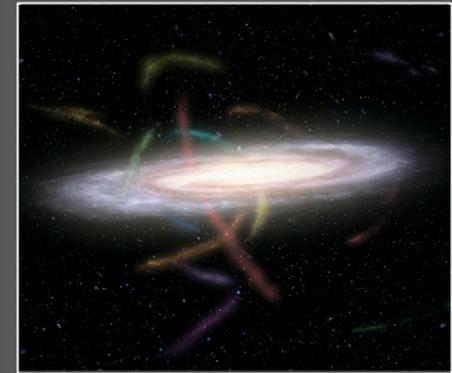
Automating the Identification of Stellar Substructure



Train on Simulations to
Identify Accreted Stars



Cluster Local Stars



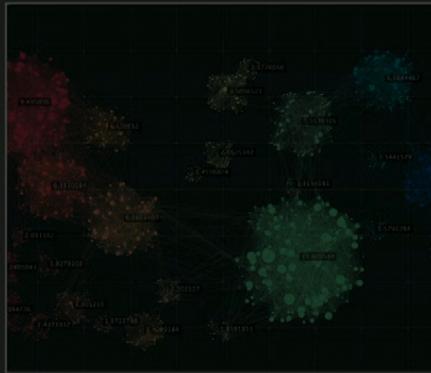
Build a Stream Finder
Algorithm

Lina Necib, MIT

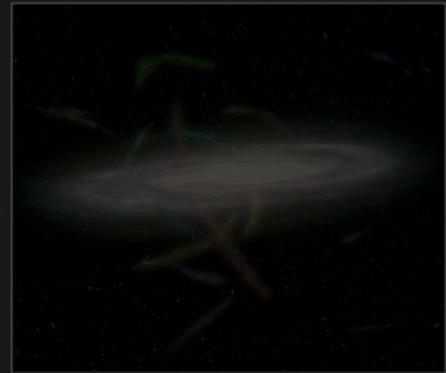
Automating the Identification of Stellar Substructure



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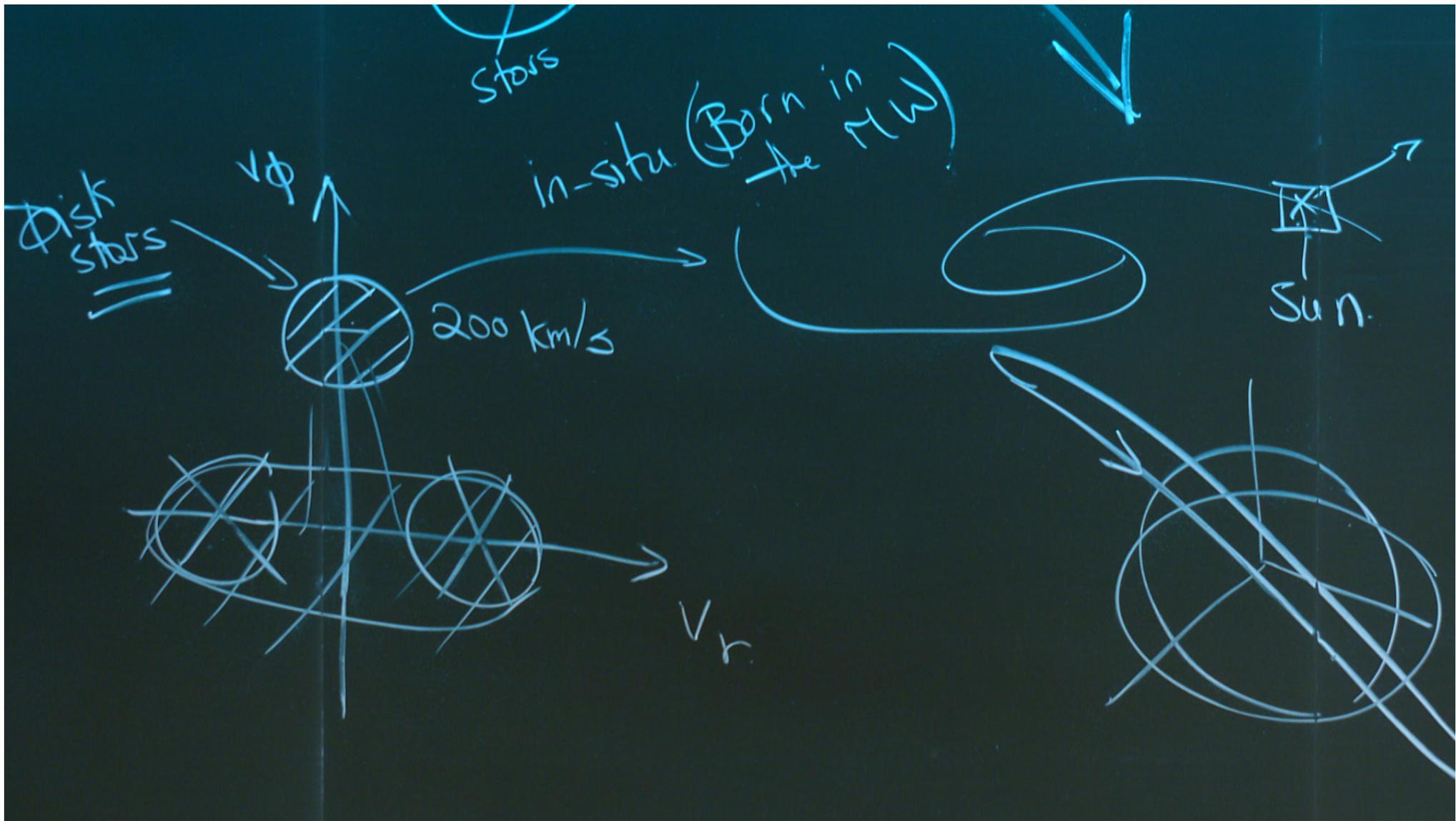


Cluster Local Stars



Build a Stream Finder
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Lina Necib, MIT



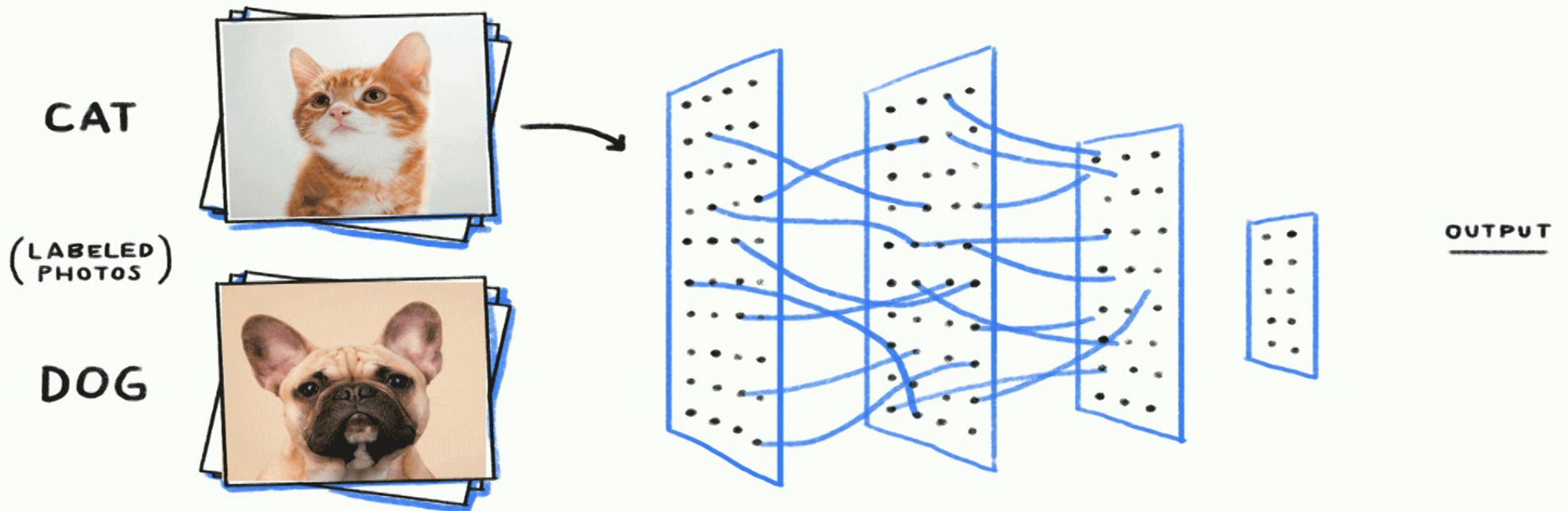
Accreted stars close to the plane?



1% of the stars close to the disk plane are accreted

Lina Necib, MIT

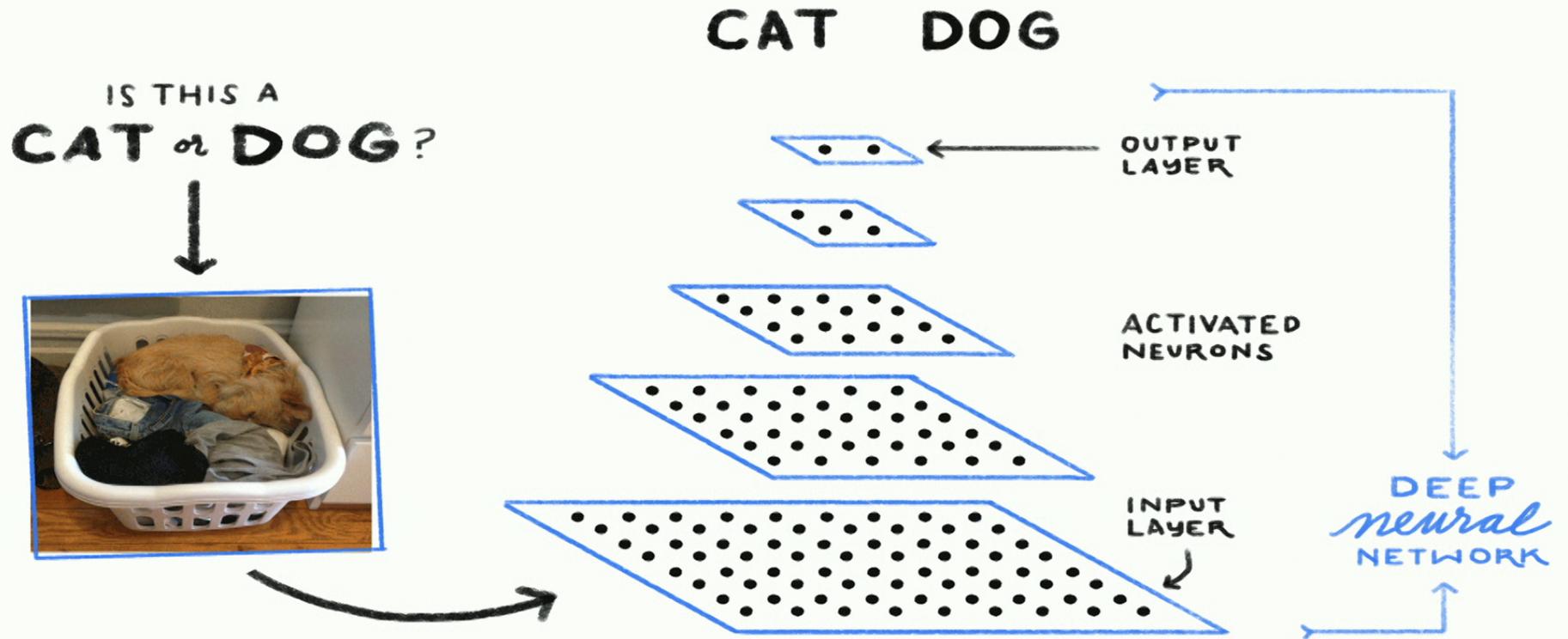
Machine Learning



Lina Necib, MIT

<https://becominghuman.ai/building-an-image-classifier-using-deep-learning-in-python-totally-from-a-beginners-perspective-be8dbaf22dd8>

Machine Learning



Lina Necib, MIT

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Ananke

Gaia

Lina Necib, MIT

Ananke

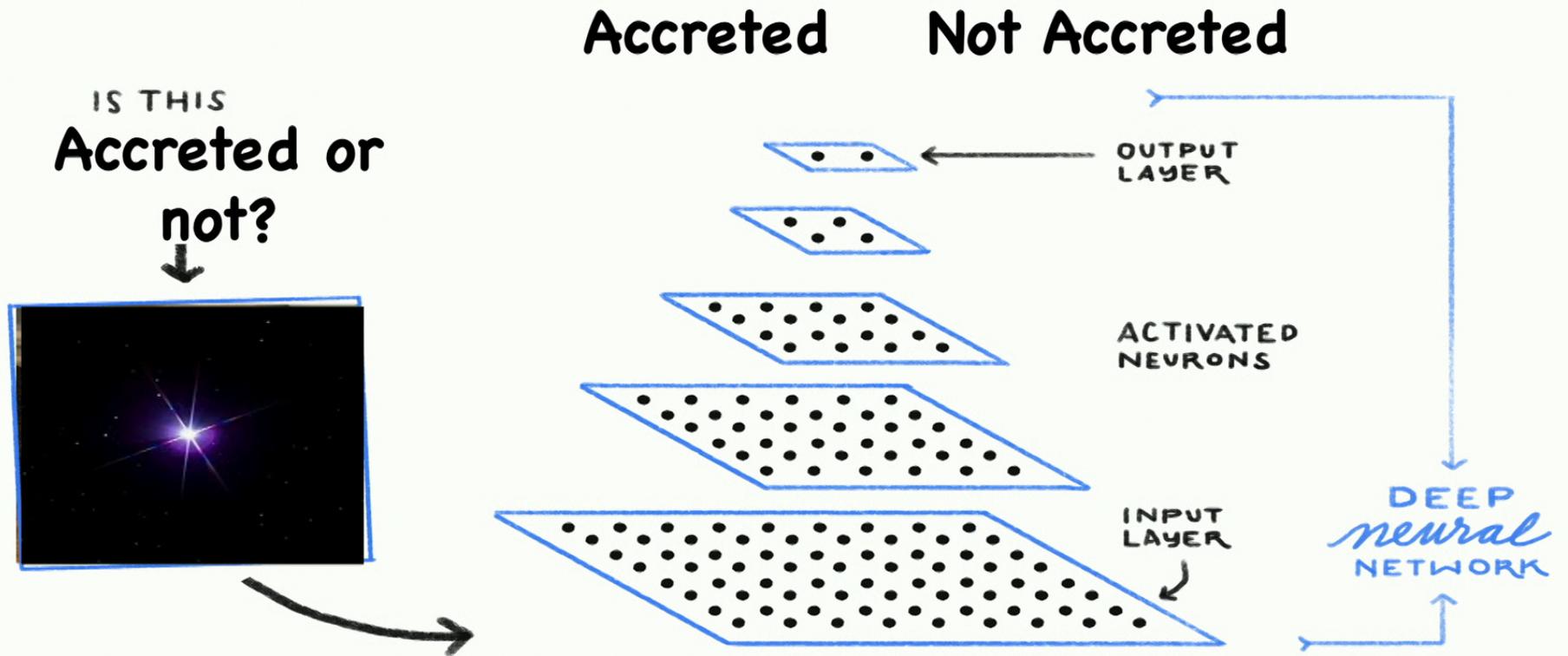
Gaia

1. Train on simulation.
2. Label *Gaia* stars.

Ostdiek, Necib, et al. (2019)
Necib, Ostdiek, et al. (2019b)

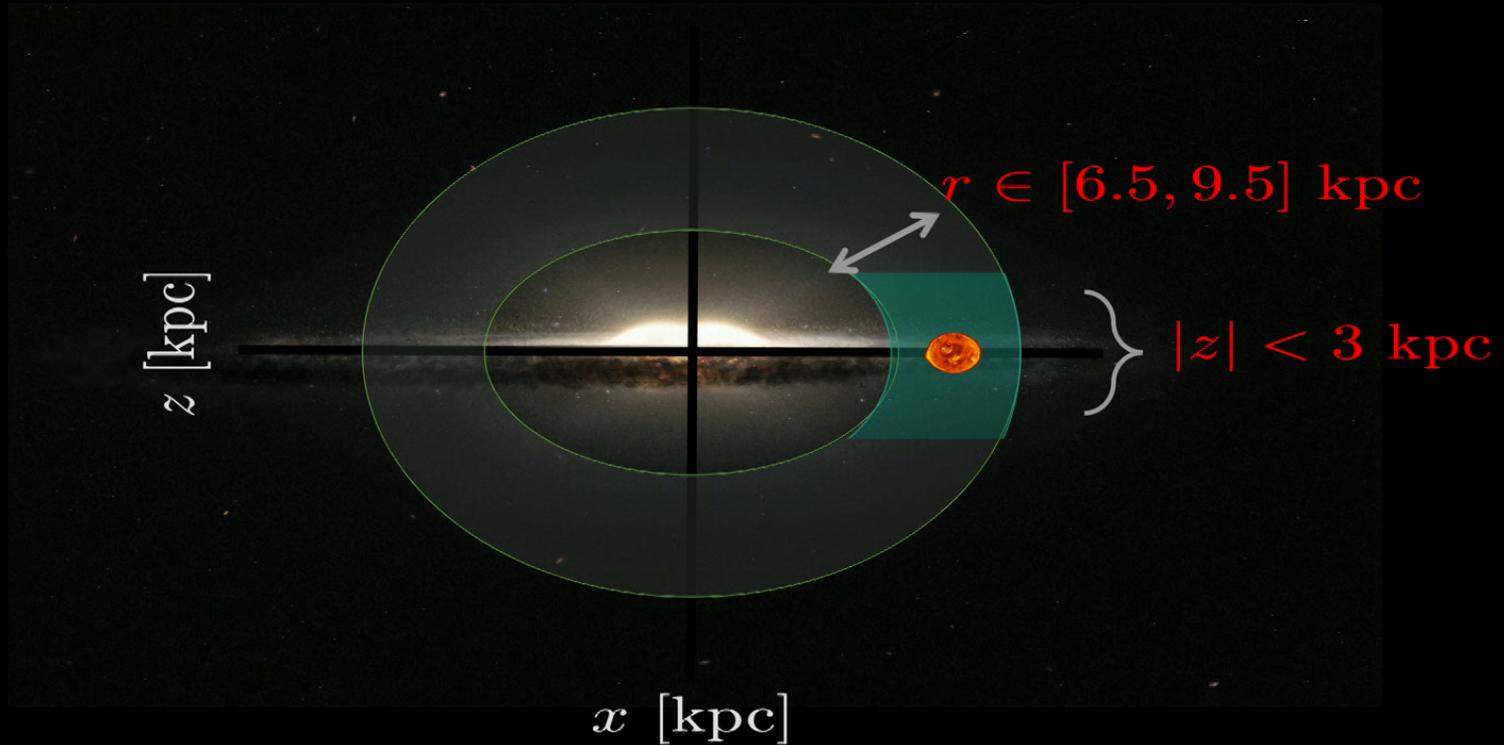
Lina Necib, MIT

Machine Learning

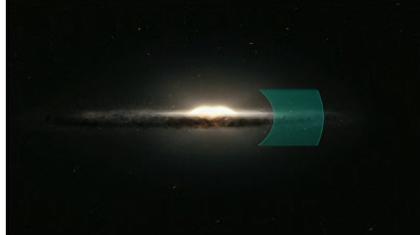


Lina Necib, MIT

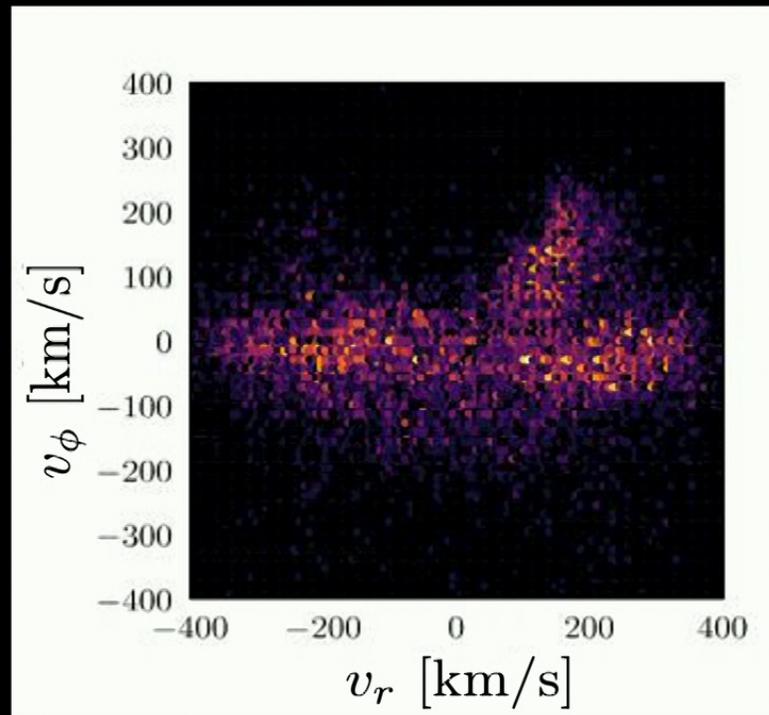
Build the Accreted Catalog of Stars



Lina Necib, MIT



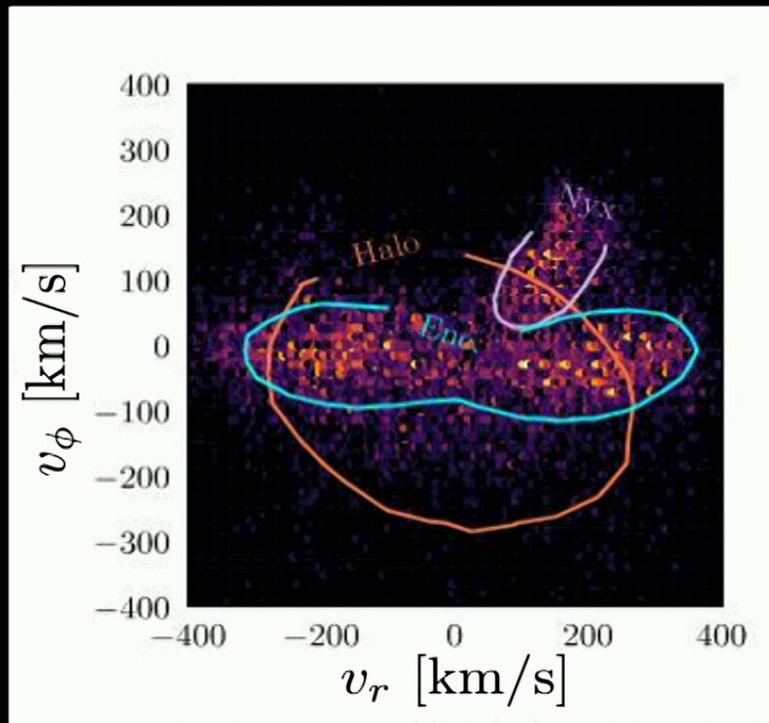
Structures close to the Disk



Lina Necib, MIT

Necib, Ostdiek, et al. (2019b)

Structures close to the Disk



Lina Necib, MIT

Necib, Ostdiek, et al. (2019b)

Genealogy of the Milky Way



Gaia Enceladus



Sagittarius



Large Magellanic Cloud



Oldest
Mergers

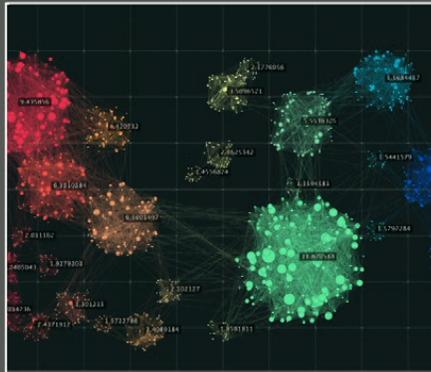
Time

Most Recent
Mergers

How to Automate the Identification of Stellar Substructure?



Train on Simulations to
Identify Accreted Stars



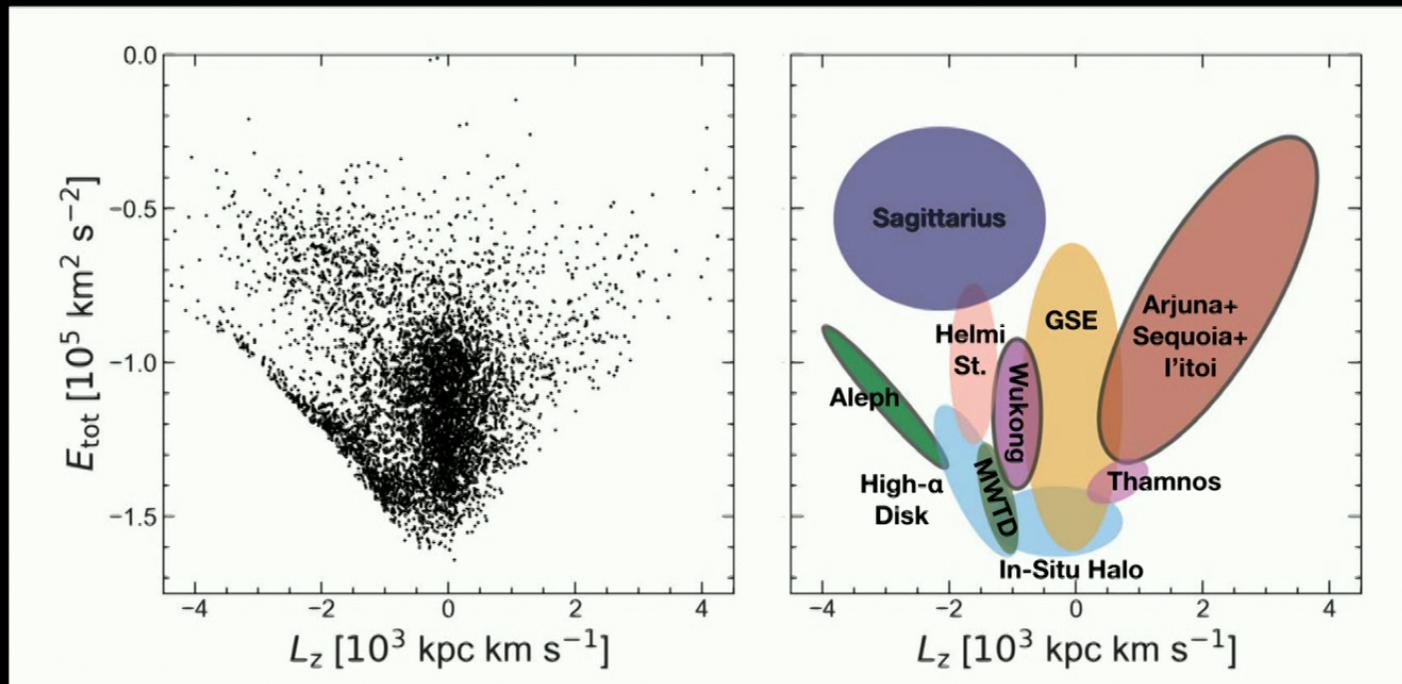
Cluster Local Stars



Build a Stream Finder
Algorithm

Lina Necib, MIT

Identification of Stellar Clusters



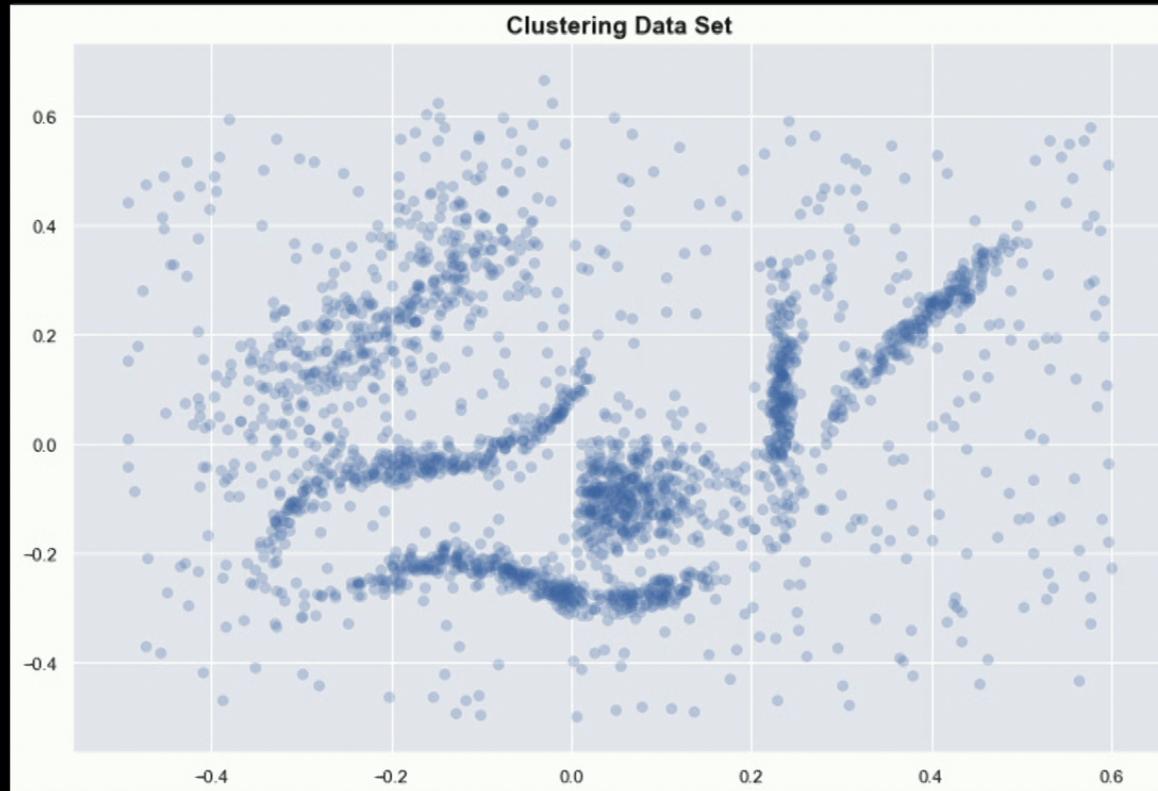
Lina Necib, MIT

Naidu et al. (2020)

90

Alternatively, we can use clustering

- Cluster in action and velocity spaces for kinematic structures

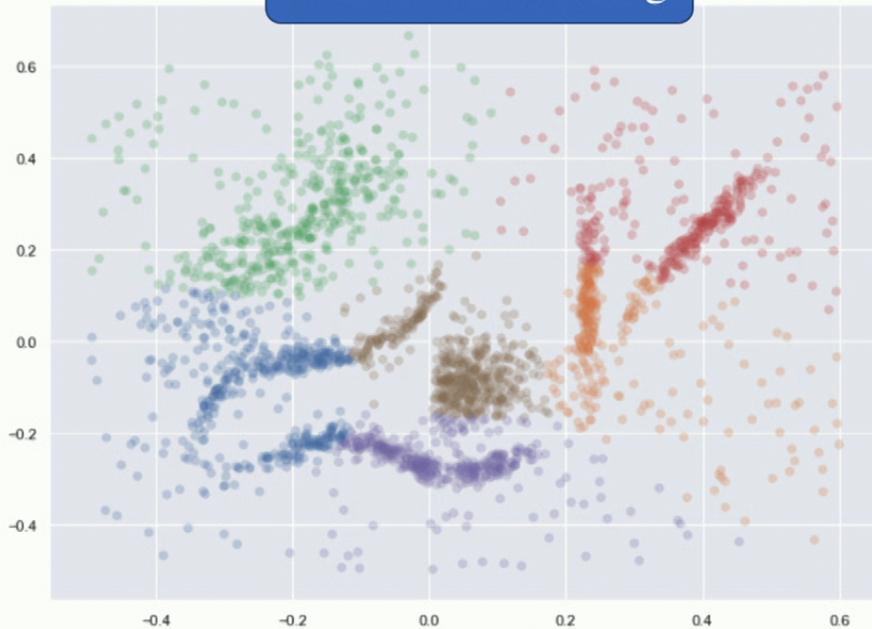


<https://pberba.github.io/stats/2020/01/17/hdbscan/>

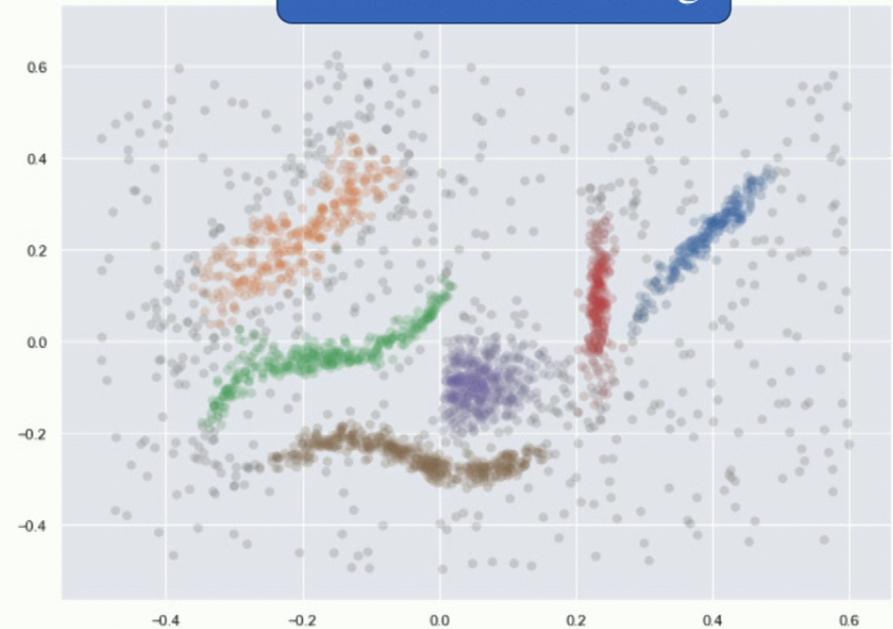
Alternatively, we can use clustering

- Cluster in action and velocity spaces for kinematic structures

K-Means Clustering



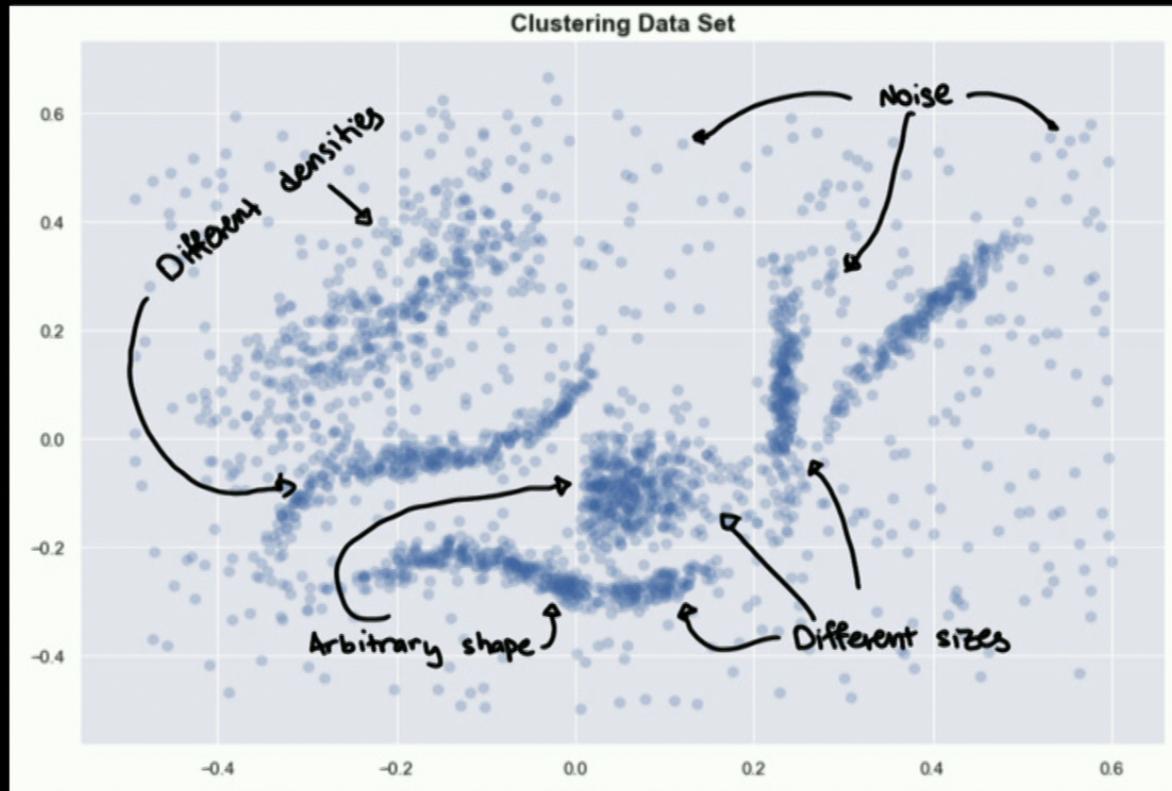
HDBScan Clustering



<https://pberba.github.io/stats/2020/01/17/hdbscan/>

Alternatively, we can use clustering

- Cluster in action and velocity spaces for kinematic structures

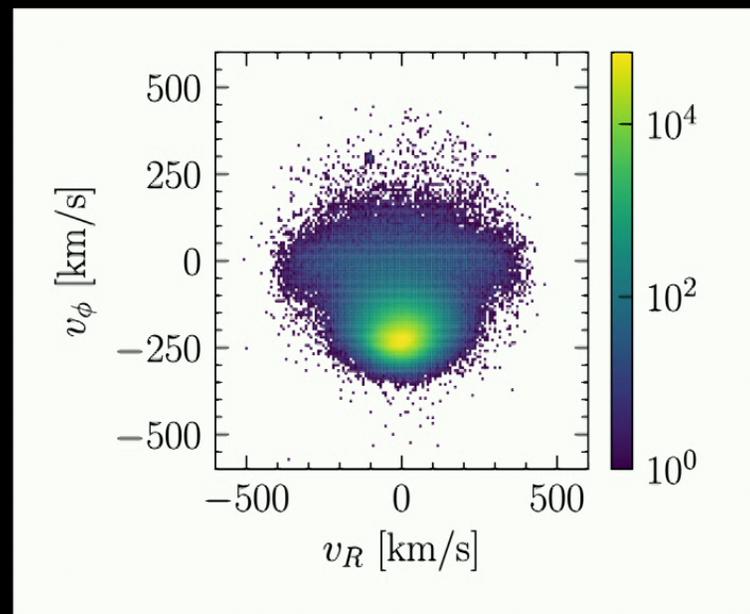
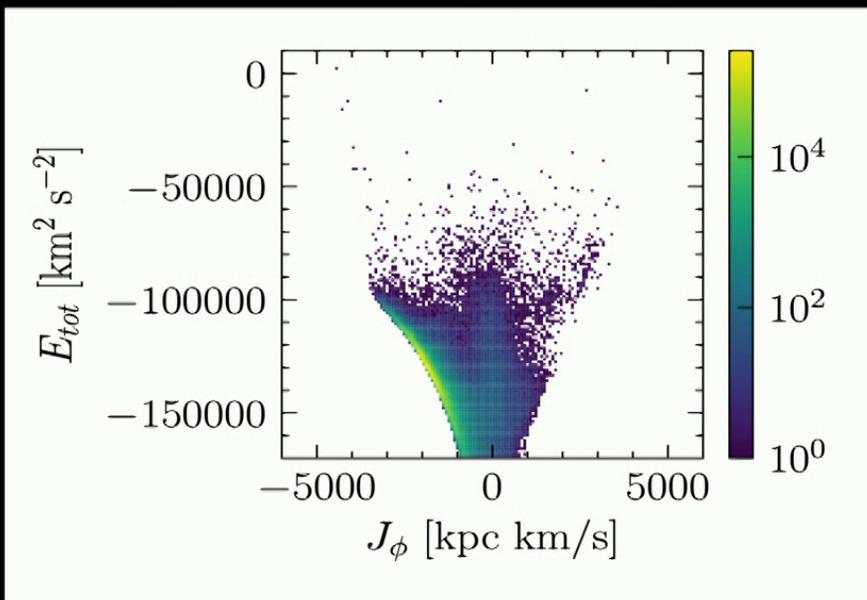


<https://pberba.github.io/stats/2020/01/17/hdbscan/>



Xiaowei Ou

Stability of Clusters



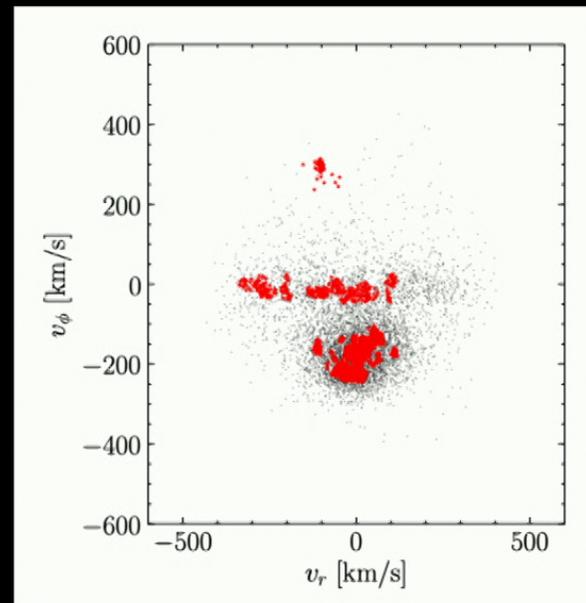
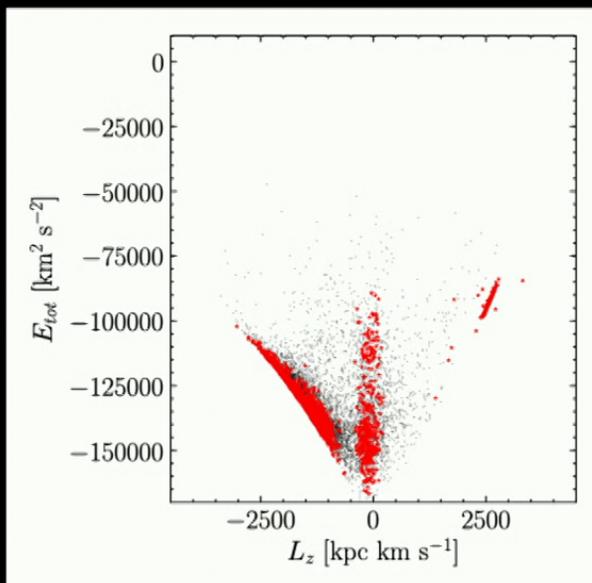
- Gaia eDR3 proper motions
- Gaia DR2 radial velocities
- Quality cuts

Ou, Necib & Frebel (2022)



Xiaowei Ou

Stability of Clusters



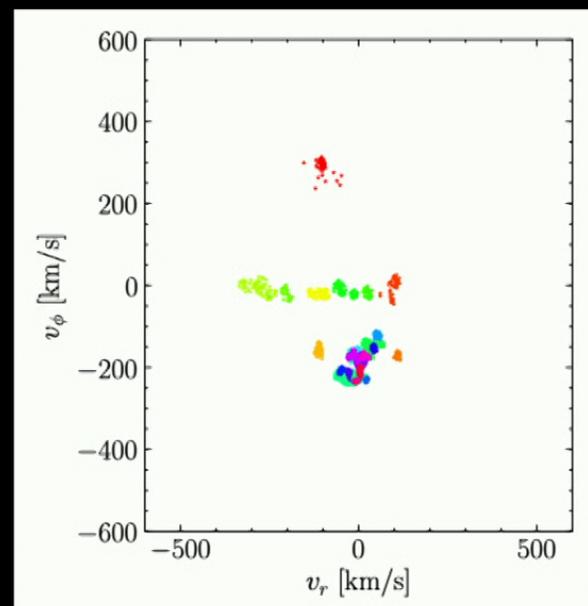
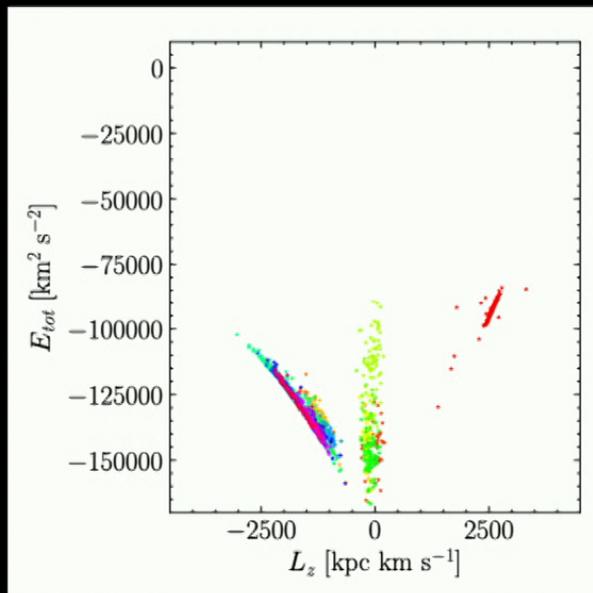
- Prioritized stable clusters.
- Looked at the stars that got clustered at least 40 times through 100 realizations. Dropped the stars always associated as noise.
- These structures are stable, although possibly incomplete.

Ou, [Necib](#) & Frebel (2022)



Xiaowei Ou

Stability of Clusters



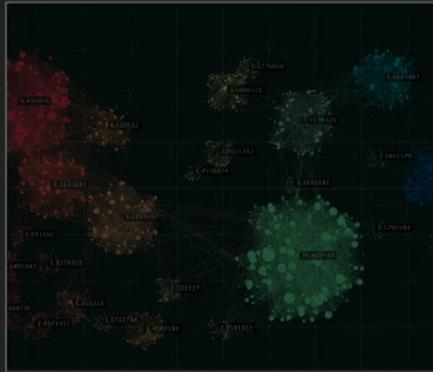
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Ou, [Necib](#) & Frebel (2022)

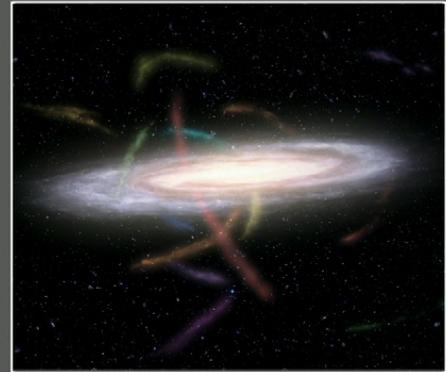
How to Automate the Identification of Stellar Substructure?



Train on Simulations to
Identify Accreted Stars



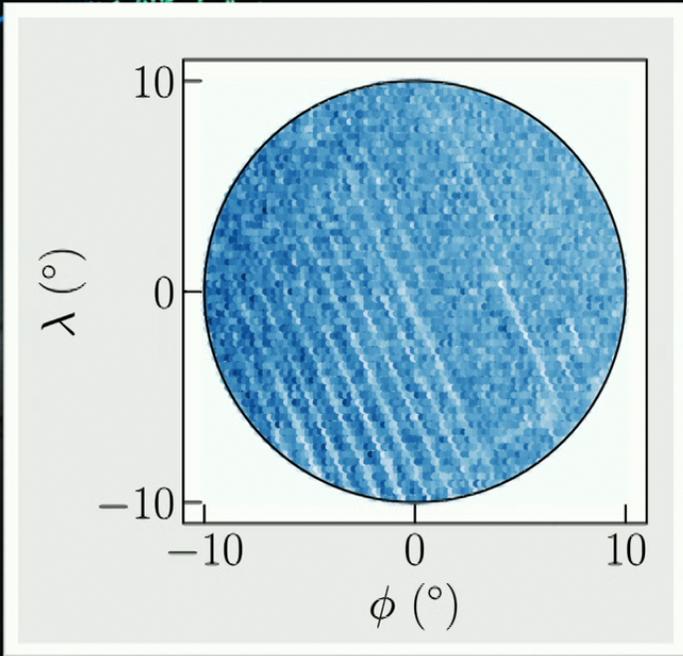
Cluster Local Stars



Build a Stream Finder
Algorithm

Lina Necib, MIT

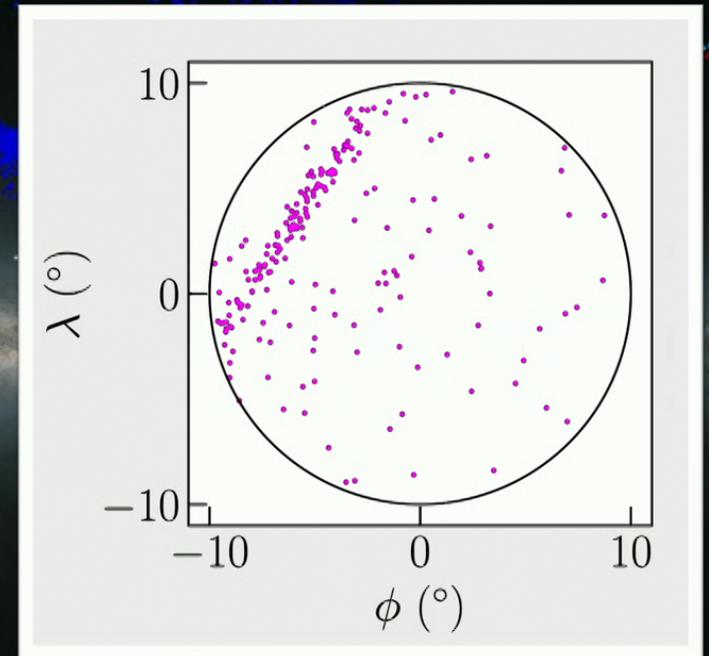
Build a Stream Finder Algorithm



Gaia

Via Machinae

A machine learning algorithm that searches for anomalies in a multi-dimensional distribution.



Galaxy Picture

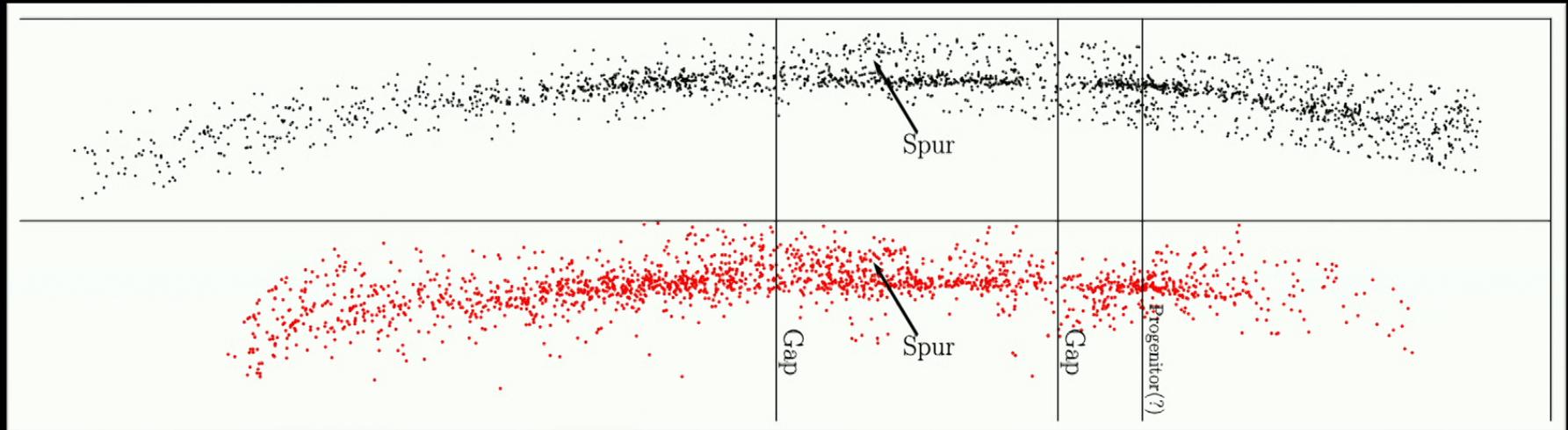
Credit : ESA/Gaia/DPAC

Stellar Streams

Malhan et al. (2018), Ibata et al. (2019)

Shih, Buckley, **Necib**, Tamasas (2021)

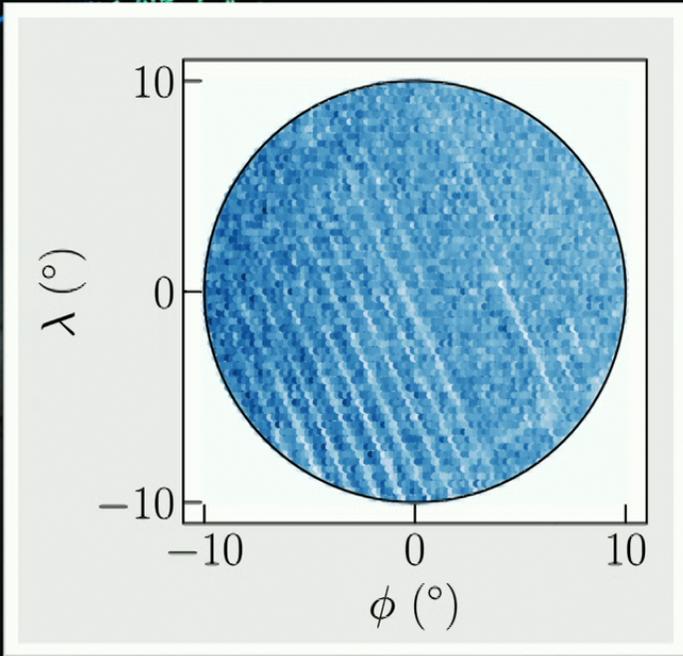
Apply Via Machinae on GD-1



Lina Necib, MIT

Shih, Buckley, **Necib**, Tamanas (2021)

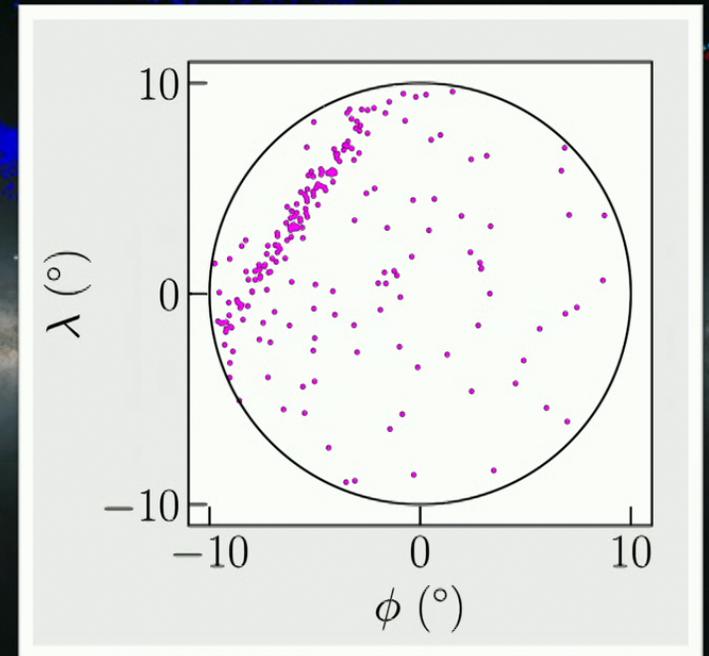
Build a Stream Finder Algorithm



Gaia

Via Machinae

A machine learning algorithm that searches for anomalies in a multi-dimensional distribution.



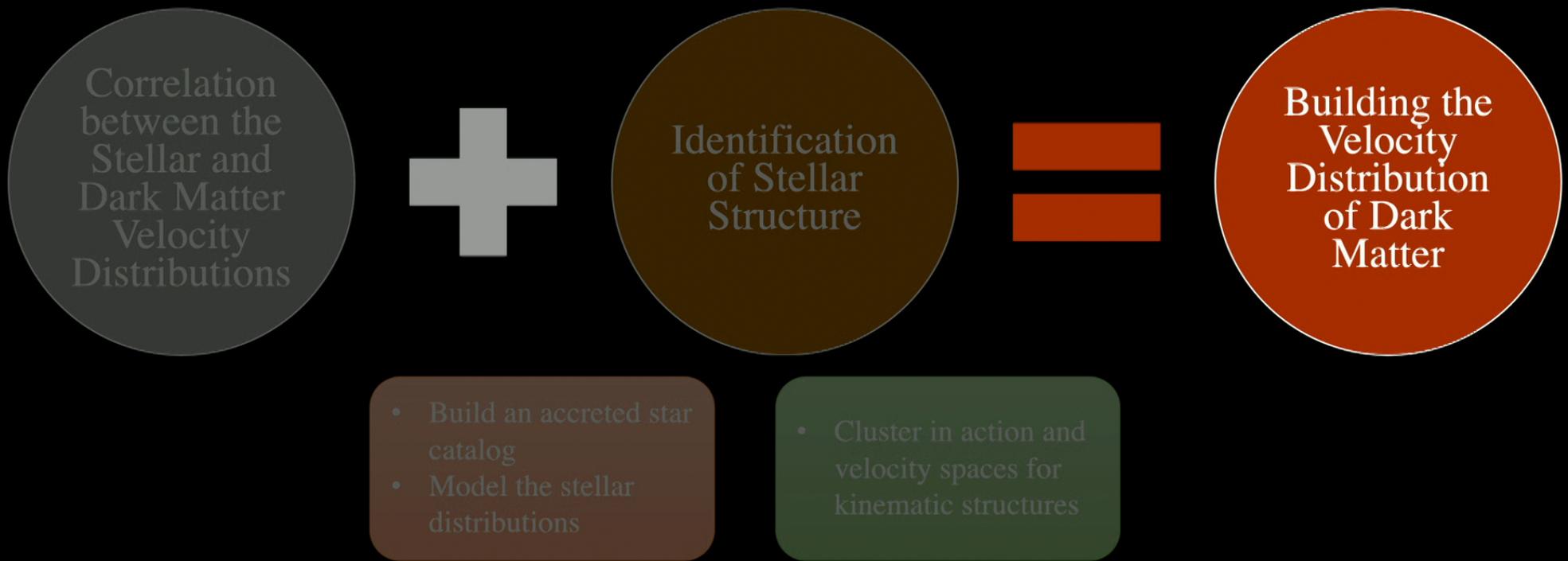
Galaxy Picture

Credit : ESA/Gaia/DPAC

Stellar Streams

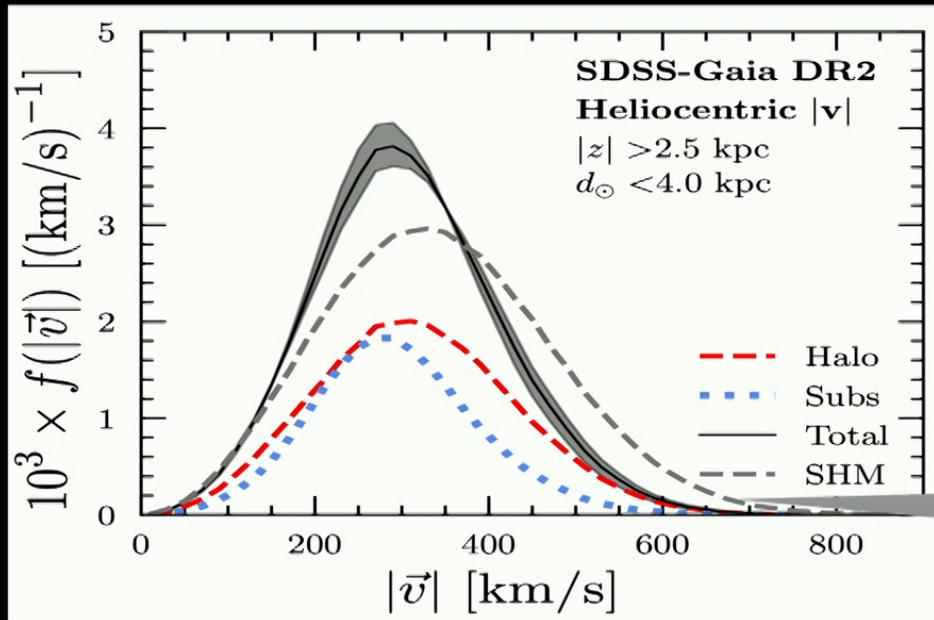
Malhan et al. (2018), Ibata et al. (2019)

Shih, Buckley, **Necib**, Tamasas (2021)



New Dark Matter Velocity Distribution

$$f_{\text{total}}(v) = c_{\text{halo}} f_{\text{halo}}(v) + c_{\text{subs}} f_{\text{subs}}(v)$$



- Fraction Dark Matter \neq Fraction Stars.
- Use Mass-Metallicity relation to estimate fractions.

$$c_{\text{subs}} = 0.42^{+0.26}_{-0.22}$$

Final distribution different from the assumed Maxwell Boltzmann distribution

Kirby et al. (2013)
Garrison-Kimmel et al. (2015)
Necib, Lisanti, Belokurov (2018)
Necib, Lisanti, Garrison-Kimmel et al. (2018)