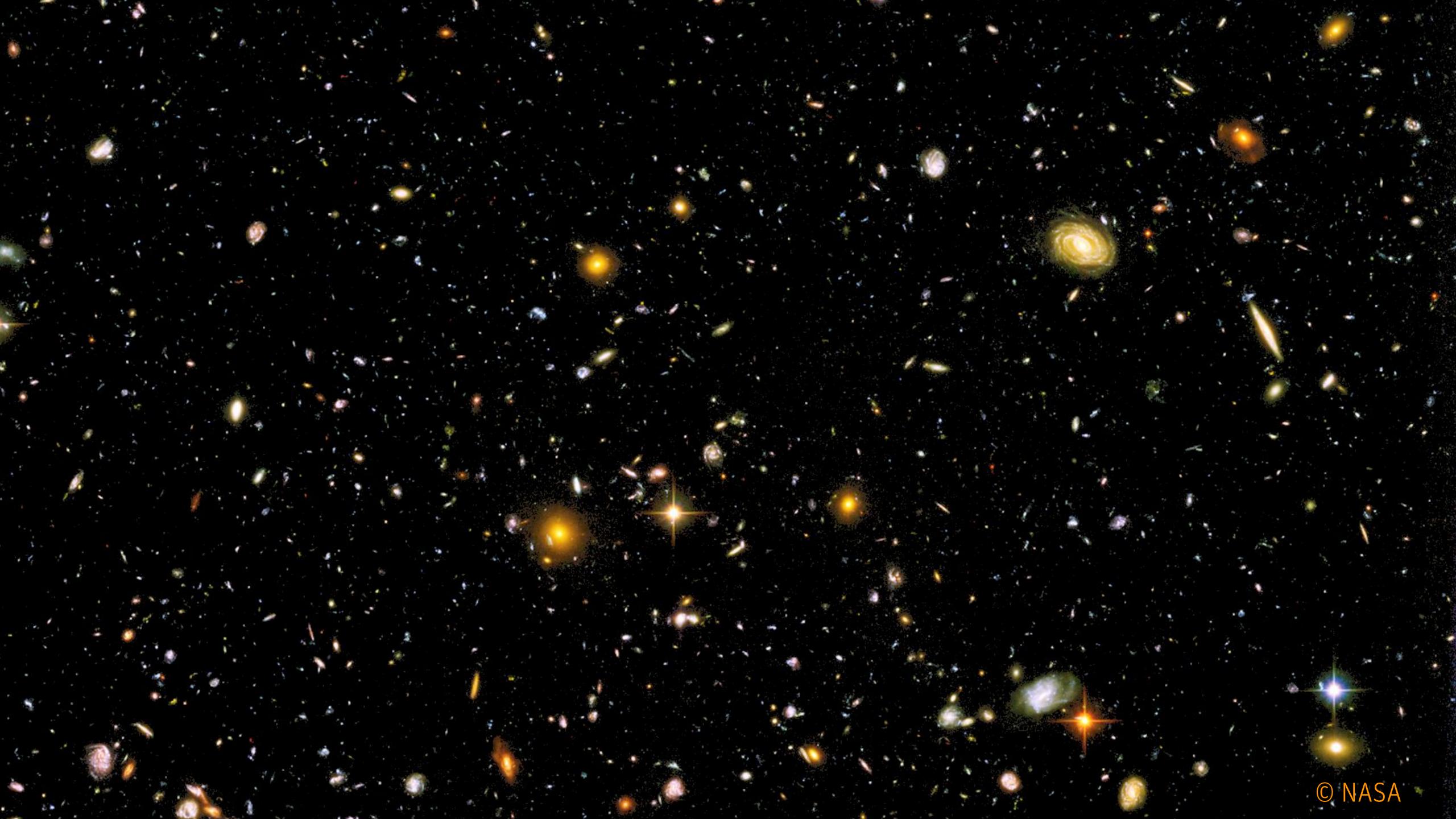
## The Milky Way as a Laboratory for Galaxy Formation

Matthias Steinmetz (AIP)

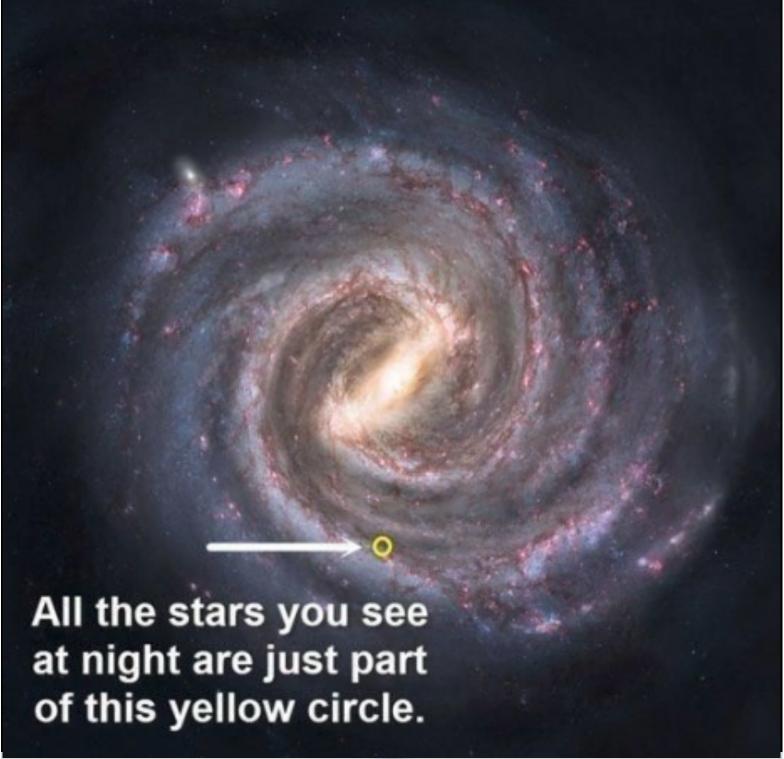
with contributions by Friedrich Anders, Cristina Chiappini, Guillaume Guiglion, Arman Khalatyan, Sergey Khoperskov, Lucy Lu, Lea Marques, Ivan Minchev, Samir Nepal, Anna Queiroz, Bridget Ratcliffe, Katja Weingrill, Glenn Van de Venn, Paola Di Matteo, Misha Haywood and many others

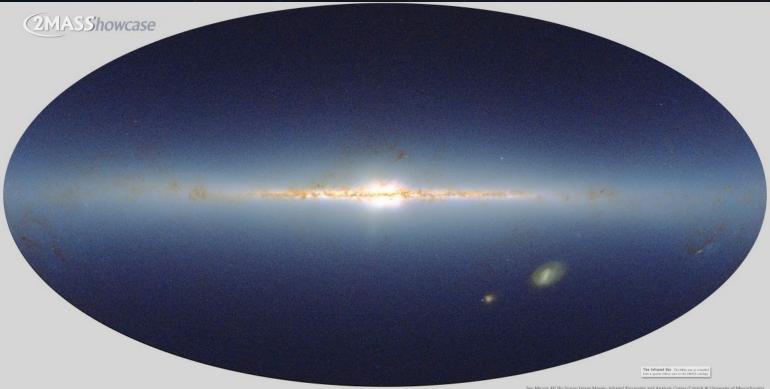




#### The Milky Way





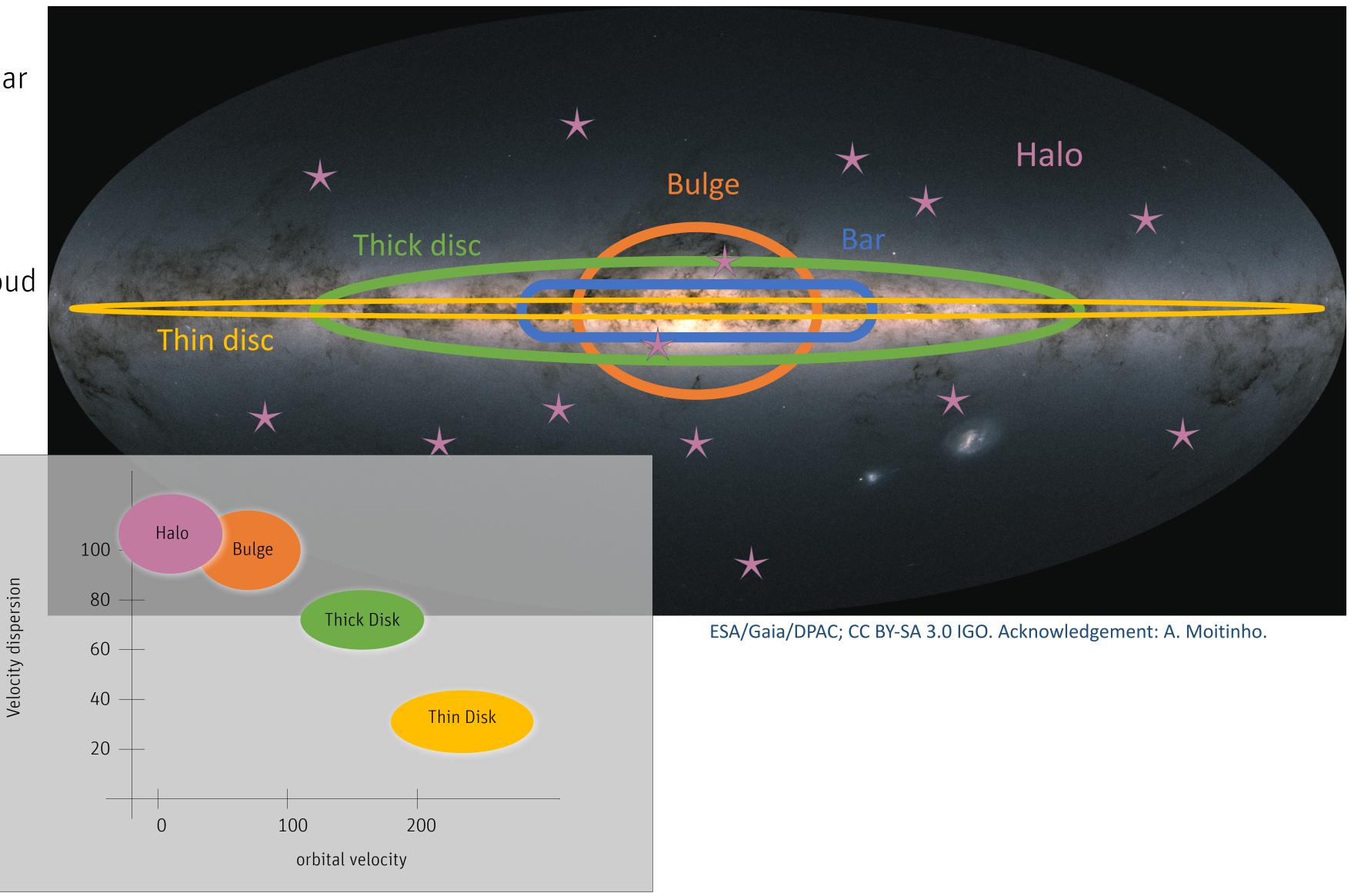


#### The nice things about stars

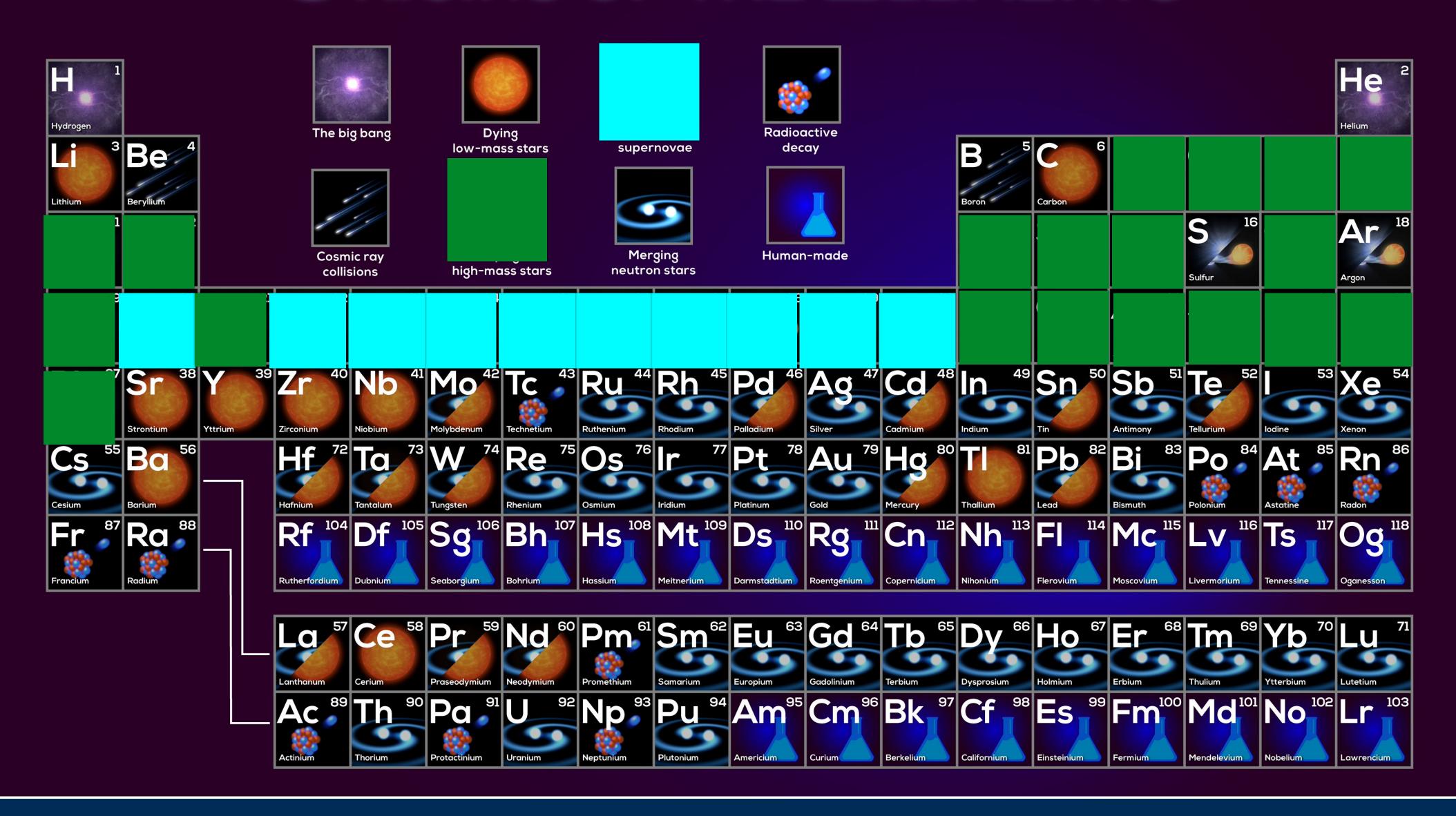
- They come in all ages and compositions
- There are billions of them in the Galaxy
- We understand them (Eddington's conjecture)
- Russel-Voigt theorem: mass, age and composition of a star uniquely determine its inner structure
  - at least as long as rotation and magnetic fields are ignored...
- So by measuring the properties of stars we can get their ages, abundances, i.e. the conditions in their birth cloud
- using their orbits we can chemically tag co-eval groups
- We can dissect the Milky Way into formation epochs

#### The classical view of the Milky Way:

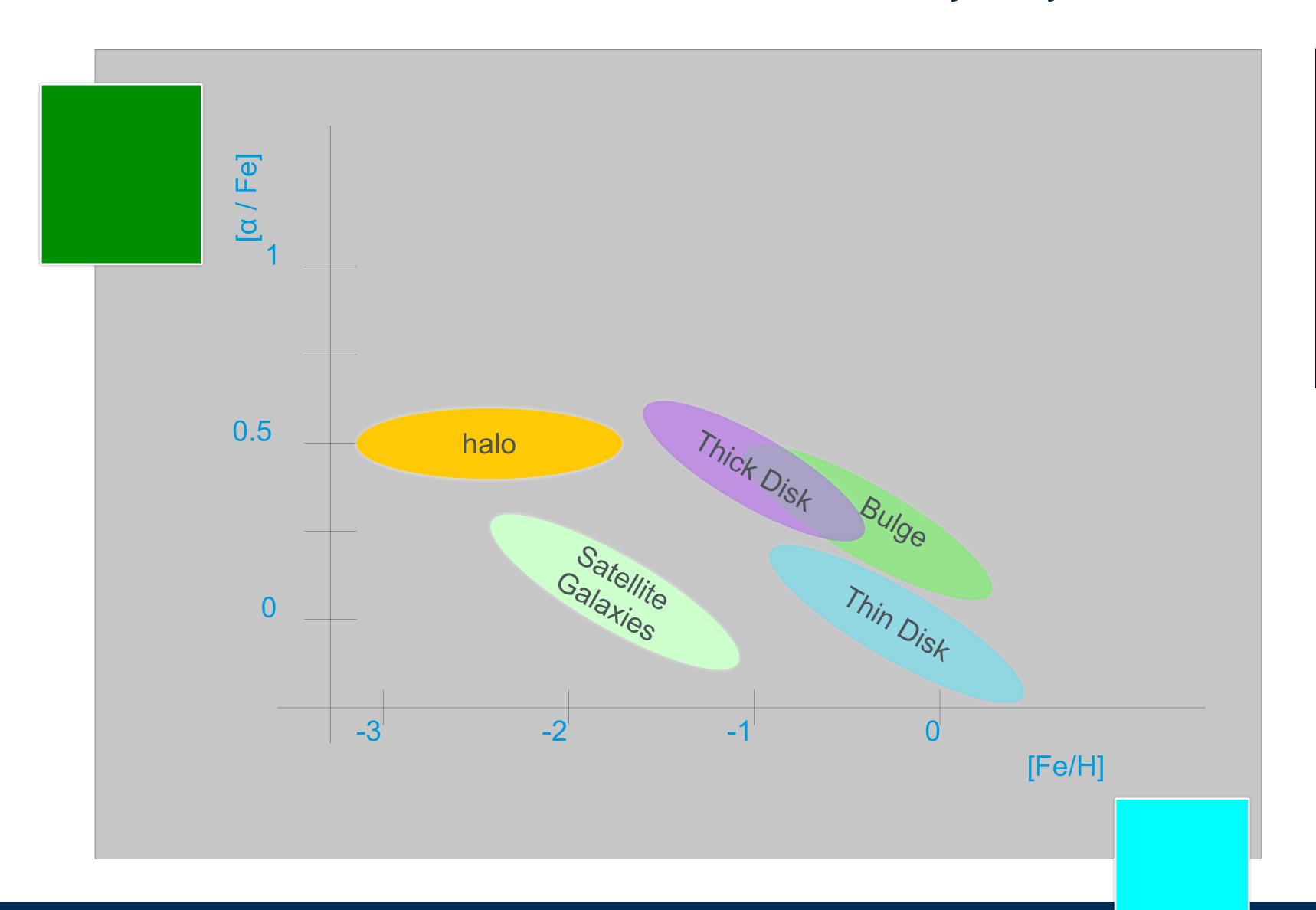
- A galaxy consists of at least one star (Truran & Hillebrandt, Kiel 1993)
- Chemical abundances preserve the star formation and chemical enrichment history of the birth cloud

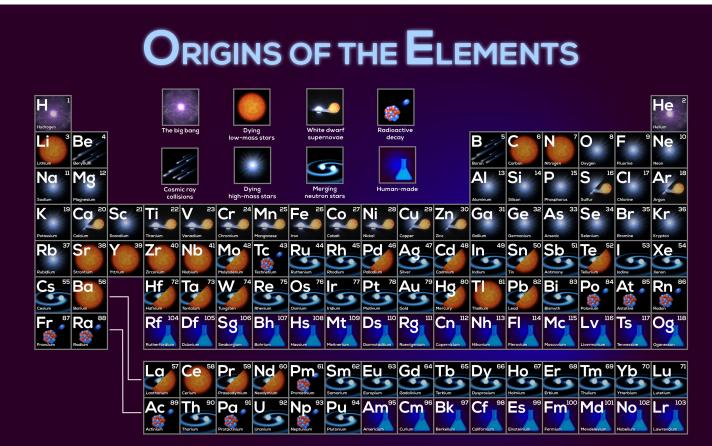


# ORIGINS OF THE ELEMENTS



#### Schematic: Elemental abundances in the Milky Way

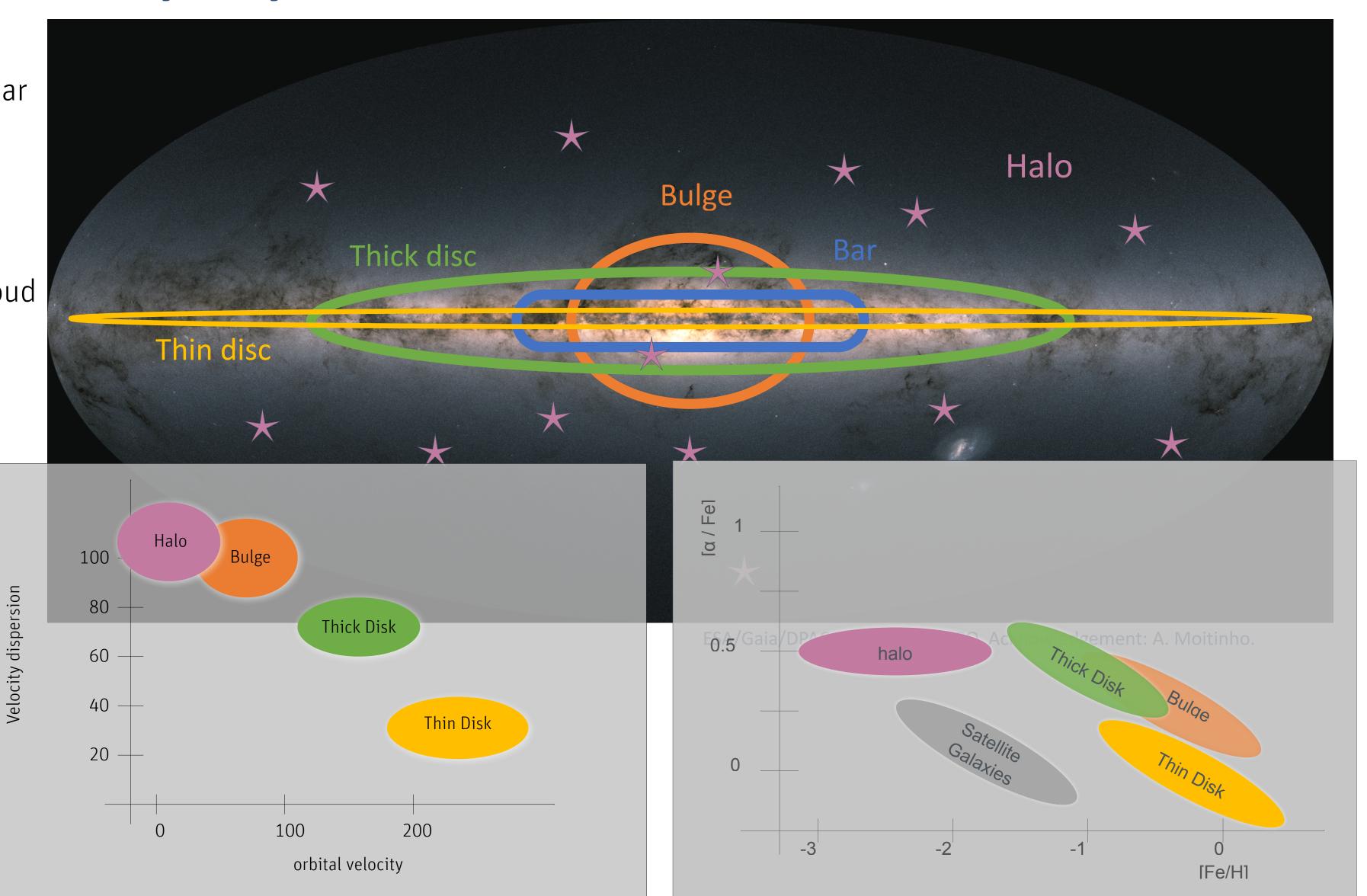




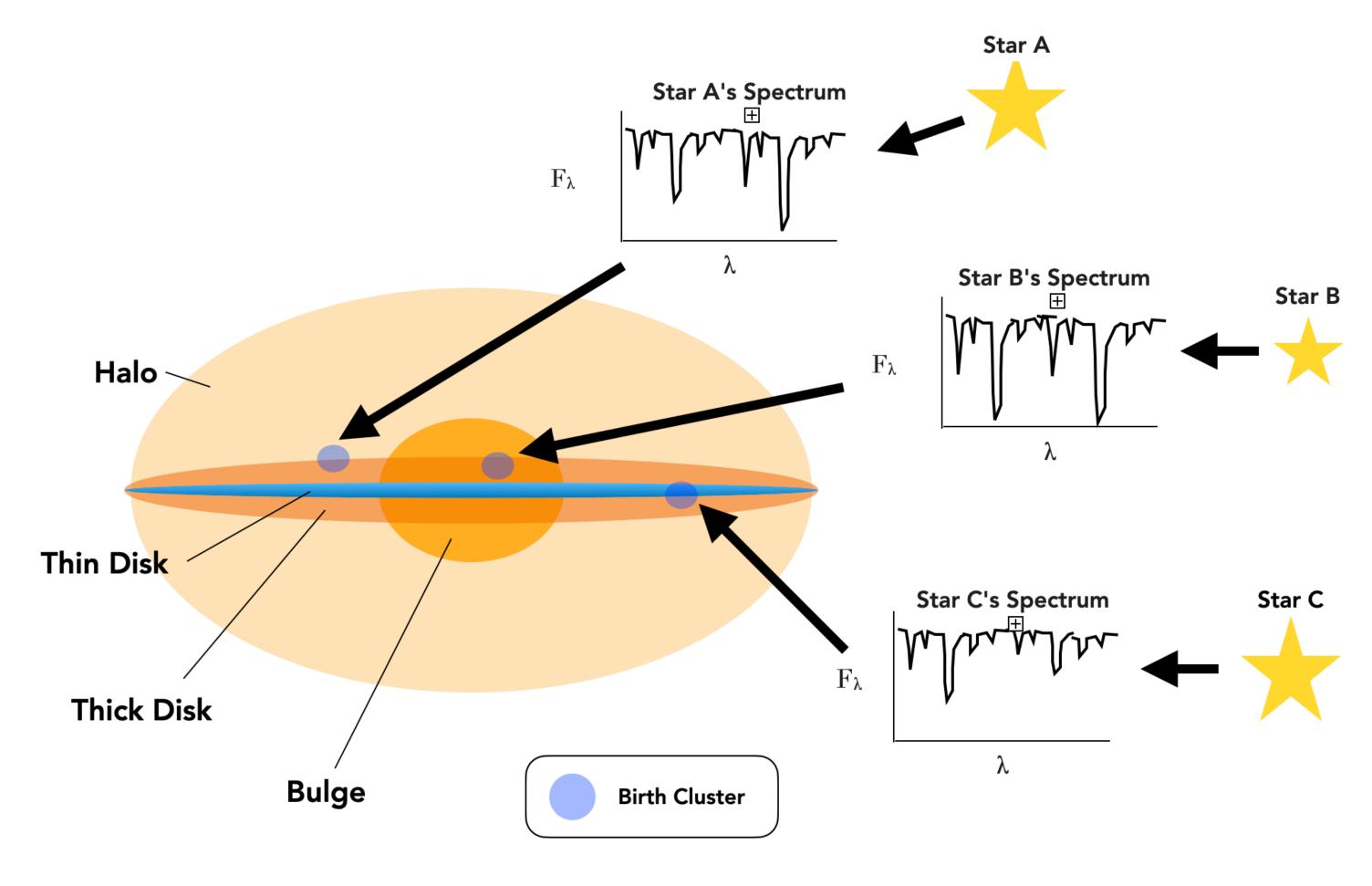
- Type II supernovae: exploding massive stars rapidly recycled (~10 Myr)
- Type Ia supernovae: accreting merging white dwarfs slowly recycled (~1 Gyr)

#### The classical view of the Milky Way:

- A galaxy consists of at least one star (Truran & Hillebrandt, Kiel 1993)
- Chemical abundances preserve the star formation and chemical enrichment history of the birth cloud



#### The goal: Chemical tagging

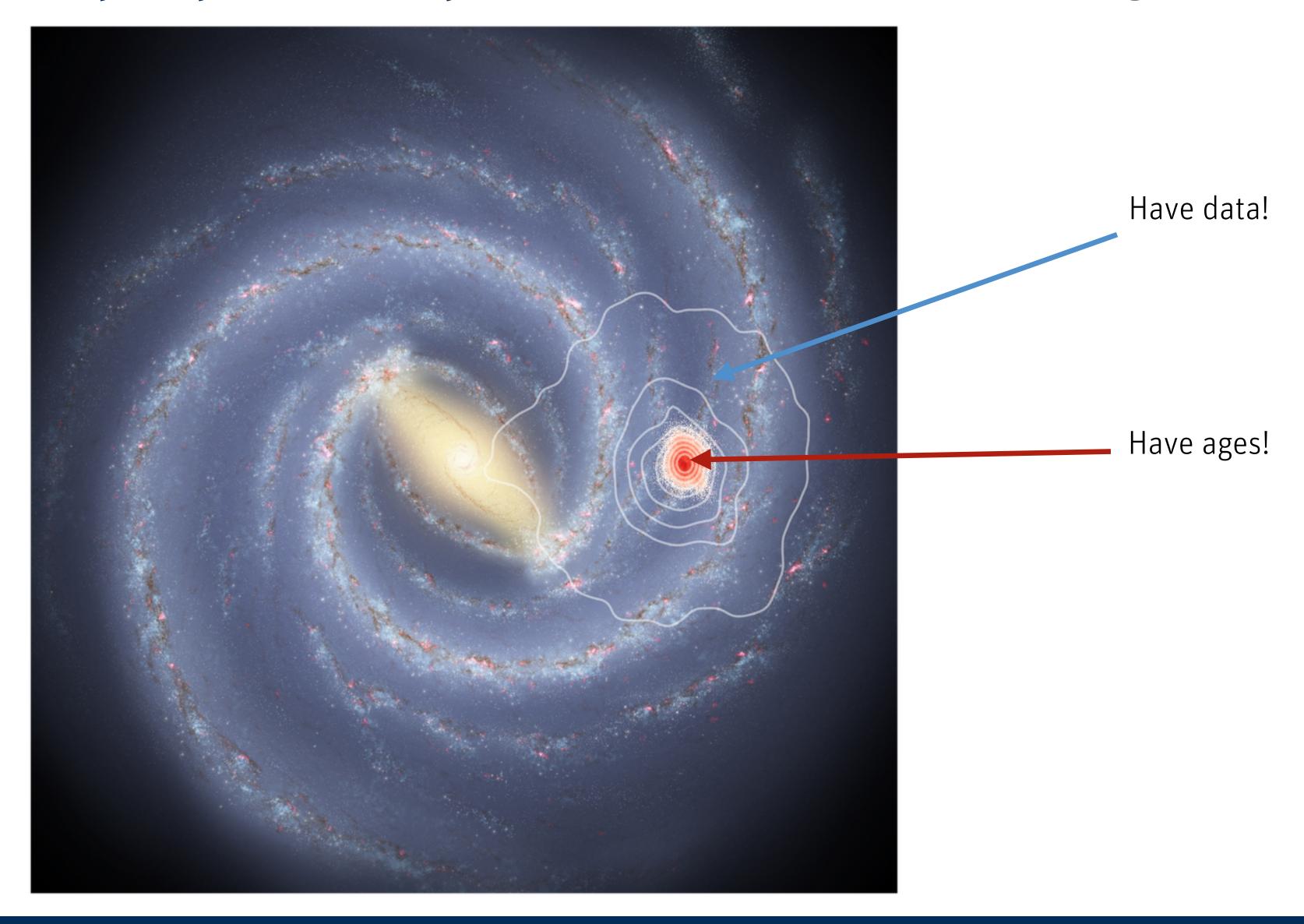


- Chemical tagging: Use the chemical properties of stars to backtrace their birth cluster. As they formed from the same birth cloud, they should have similar, if not identical abundances
- Level to which this is possible, still needs to be proven

© Catherine Manea (U Texas)



#### The Milky Way is not axisymmetric and has substructure - good!



#### The nice things about stars

- They come in all ages and compositions
- There are billions of them in the Galaxy
- We understand them (Eddington's conjecture)
- Russel-Voigt theorem: mass, age and composition of a star uniquely determine its inner structure
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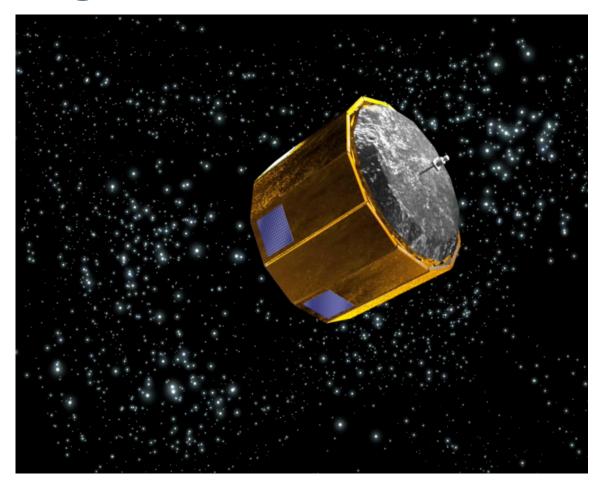
#### The not so nice things about stars

- Getting the data is hard
- Understanding the data is even harder (completeness and selection effects)
- for almost all stars the available data is highly incomplete
- data driven and machine learning approaches
- Galaxies are roughly as old as the universe, not really equilibrium or stationary system
- → modeling is difficult → simulations

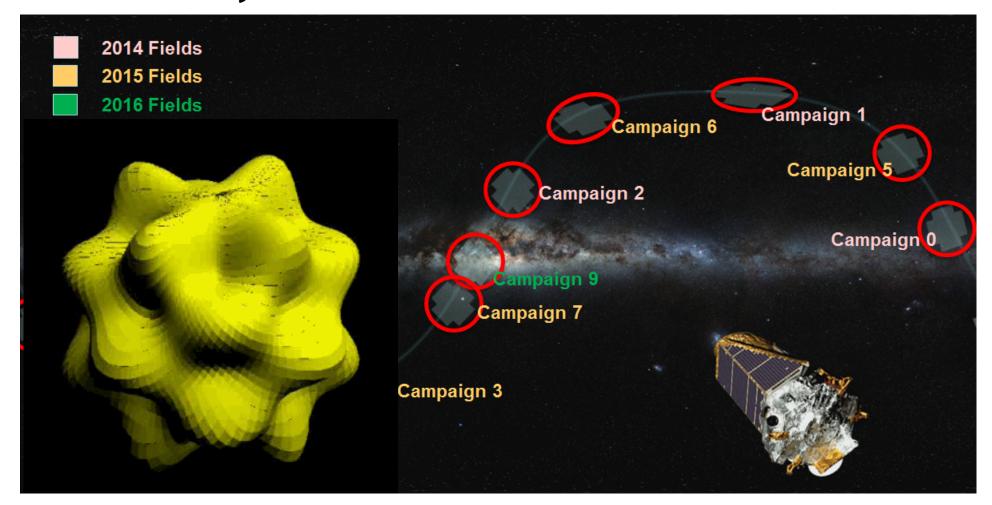
We choose to do these things not because they are easy, but because they are hard



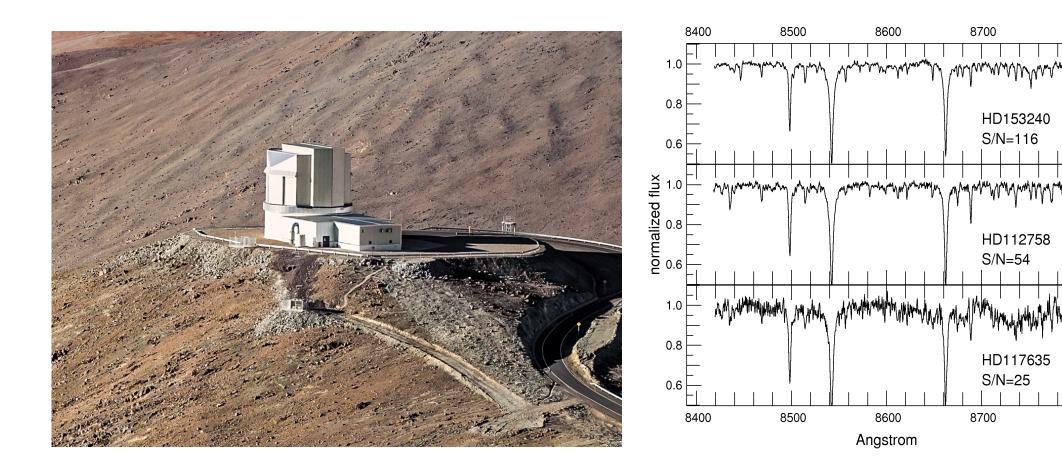
#### Getting the data



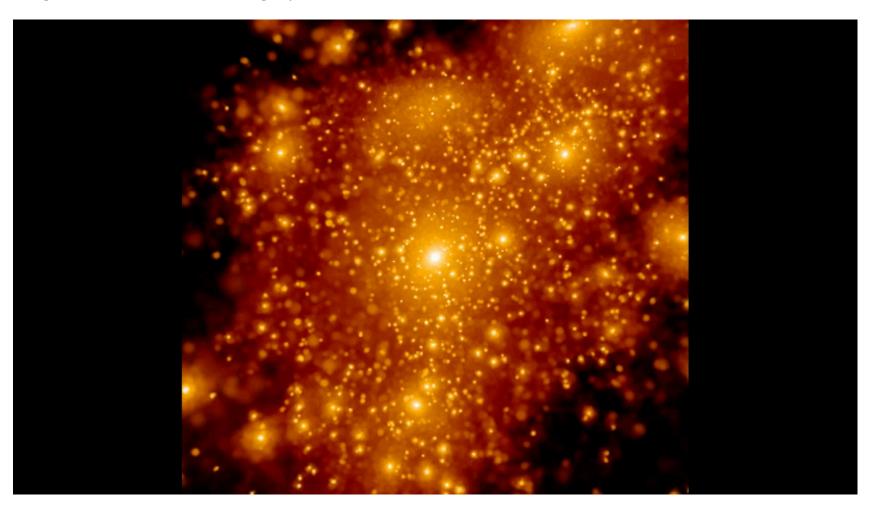
Astrometry: Positions, Distance & Velocities



Astroseismology: Ages

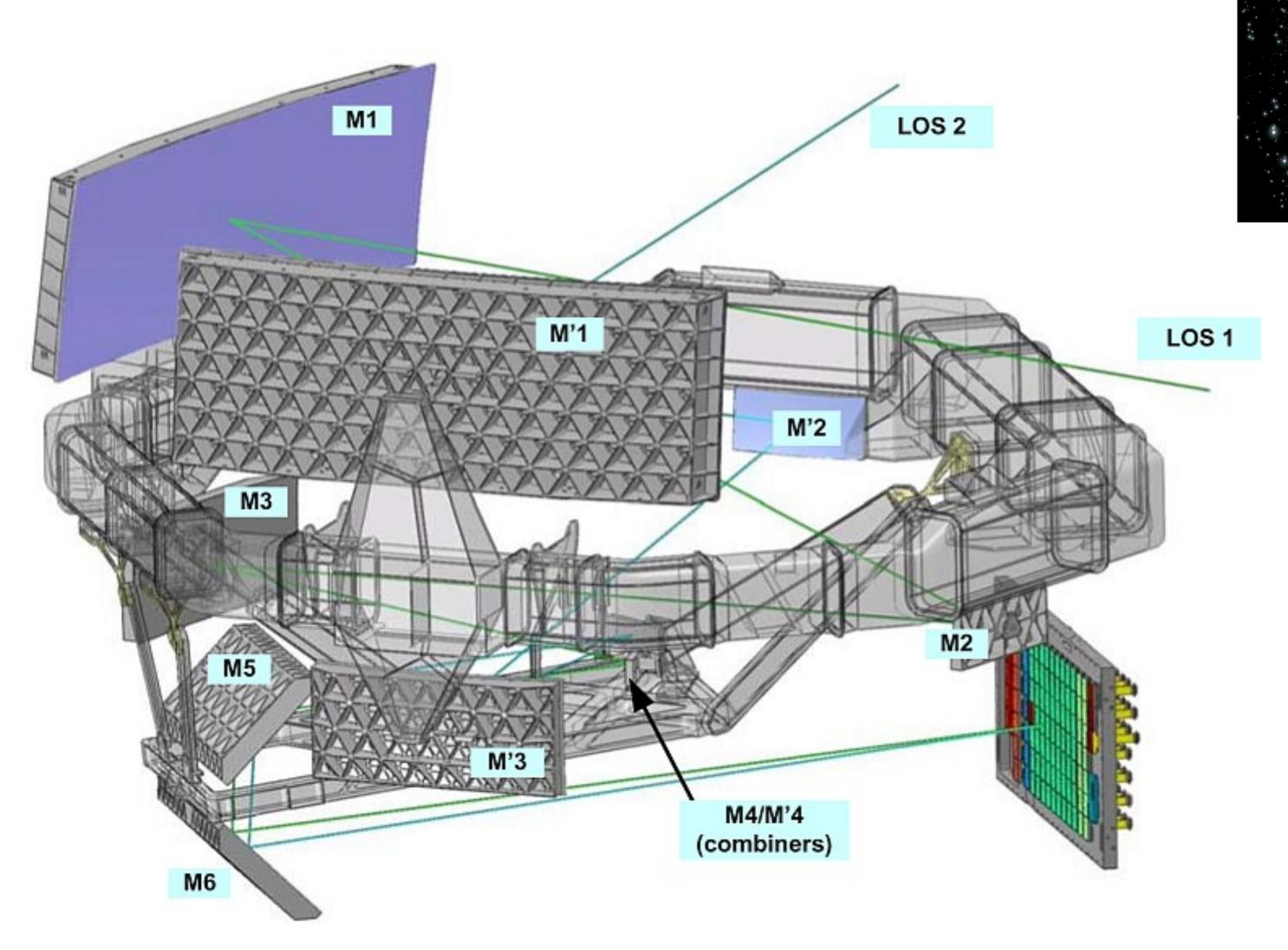


Spectroscopy: Abundances & Radial Velocities



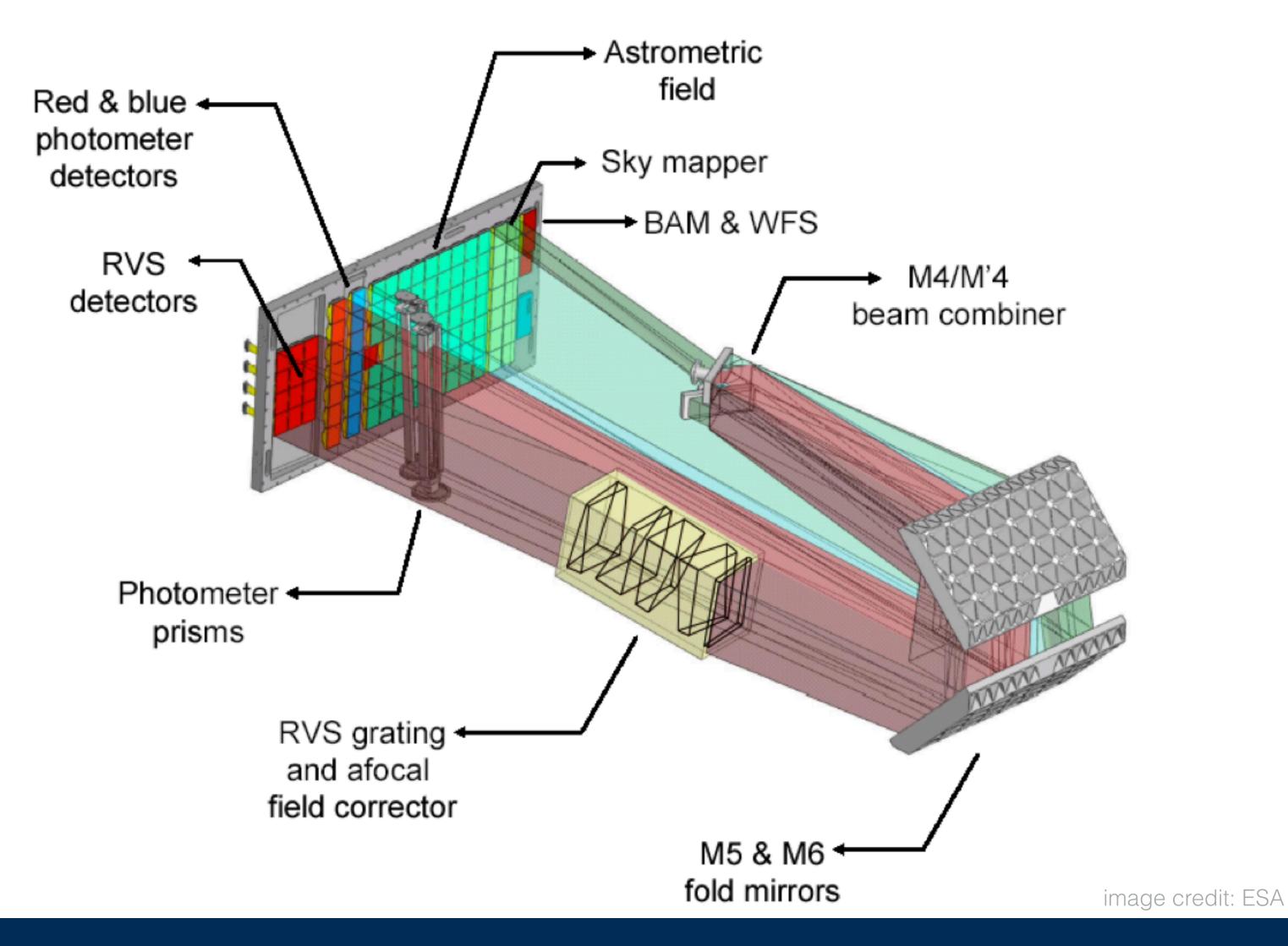
Simulations: Theory backbone

#### The Gaia Telescopes





#### The Gaia Optics



#### **Detectors and Focal Plane**

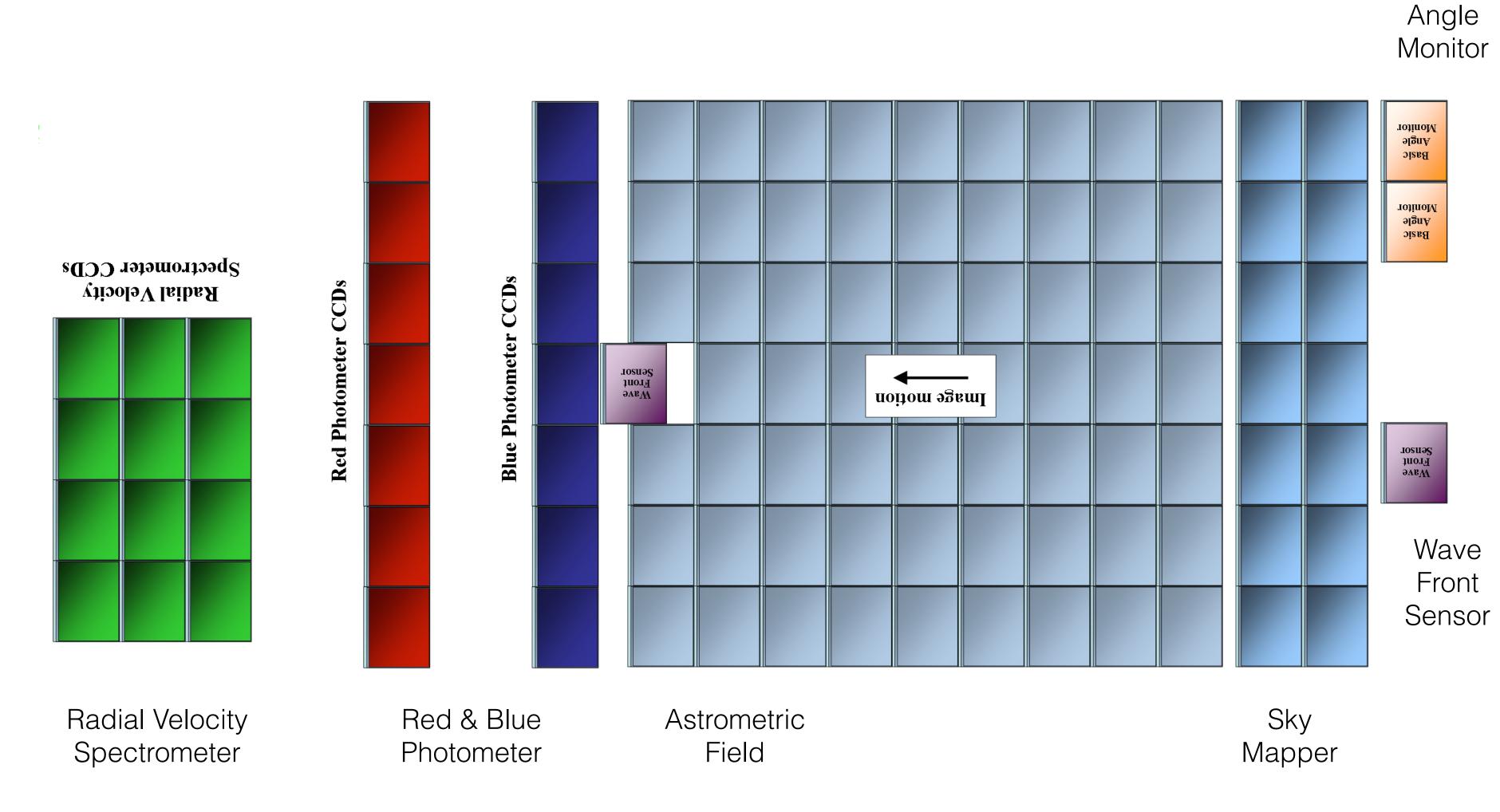
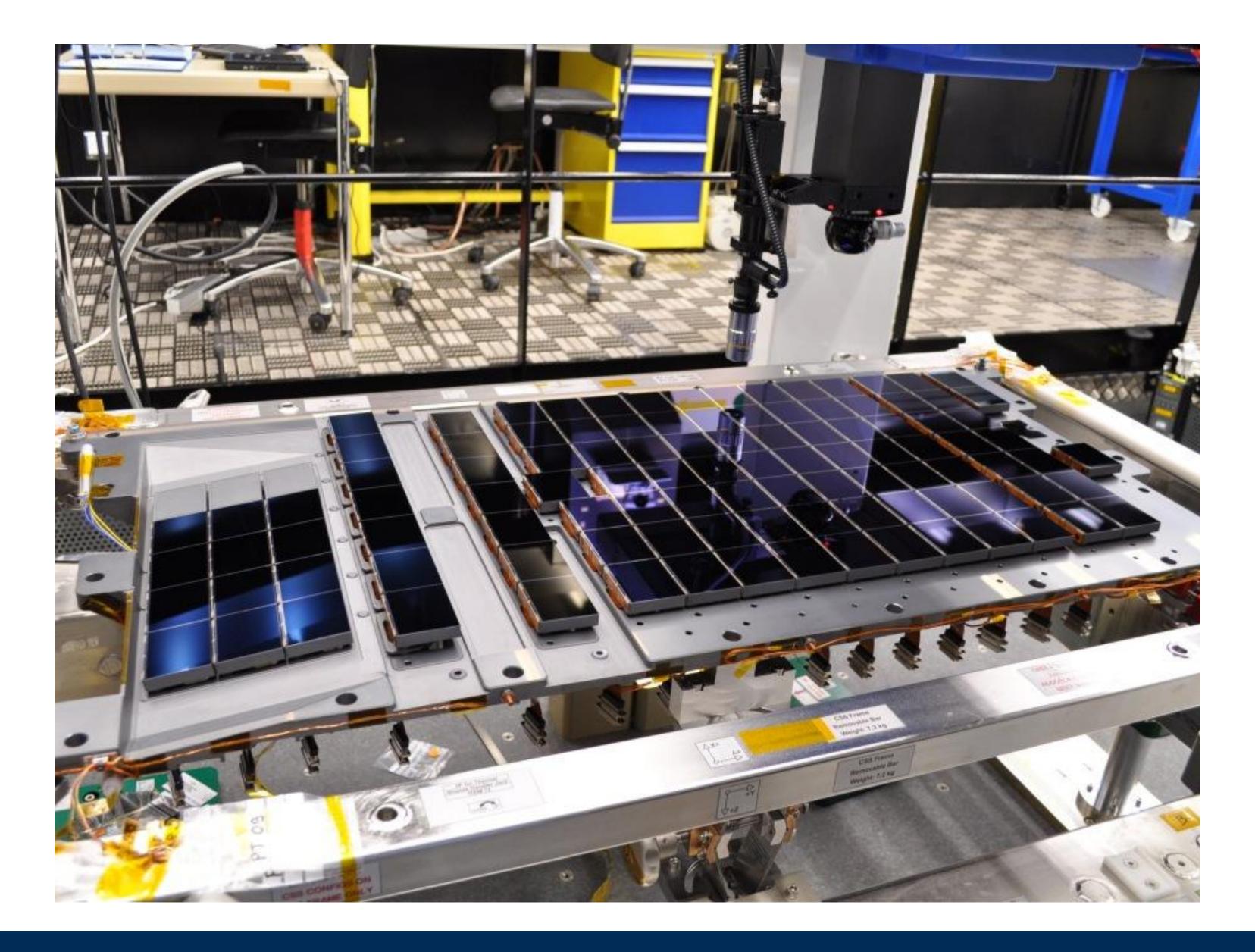


image credit: ESA

Basic

### Gaia recap



#### **Focal Plane**



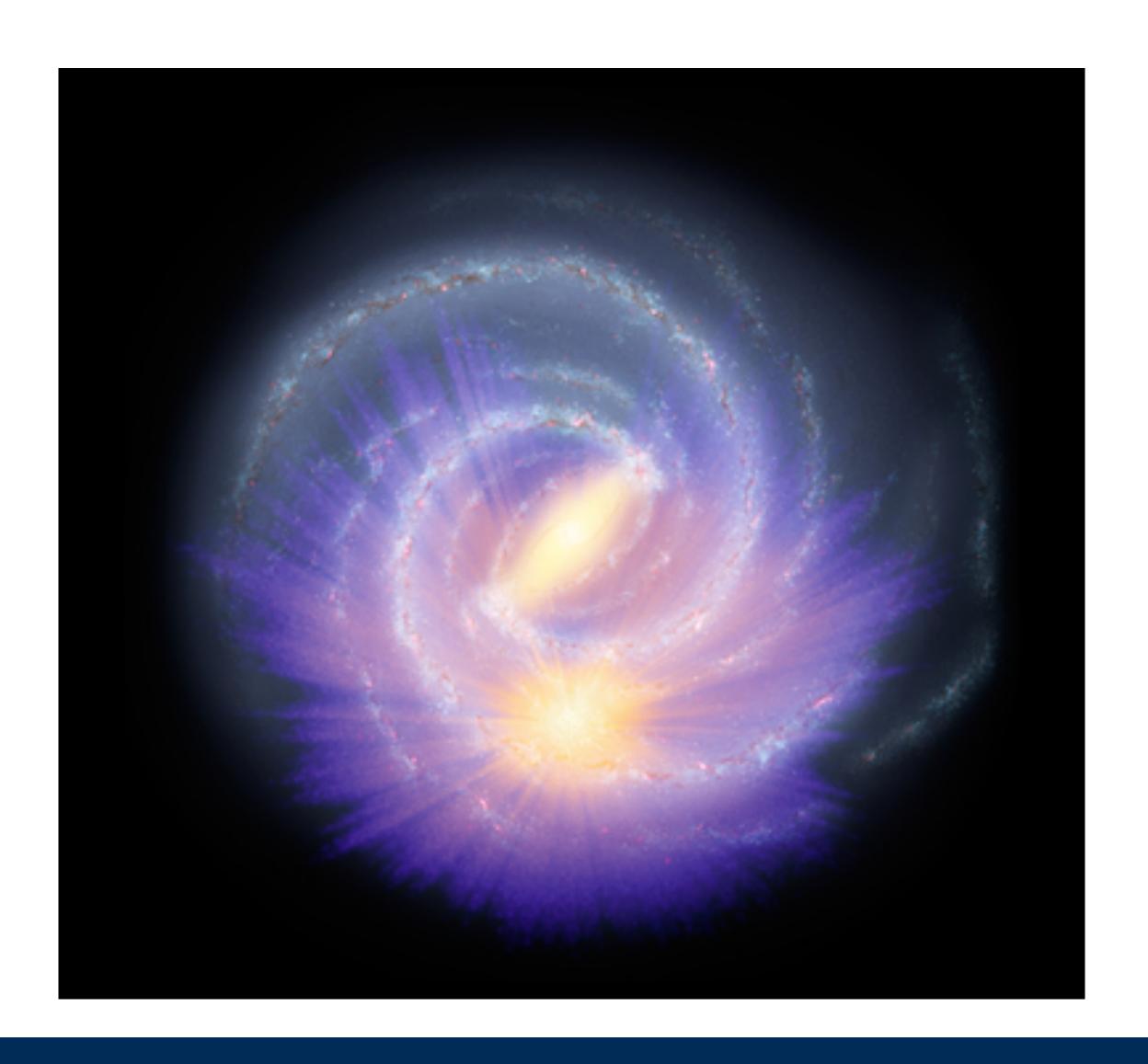
#### 19 December 2013



#### The Gaia challenge

- Measurement challenge:
- Milky Way + satellite system:
  - Extend: ~100 kpc  $\Rightarrow$  10  $\mu$ as
  - Characteristic velocity: 10km/s at 100 kpc  $\Rightarrow$  20  $\mu$ as yr<sup>-1</sup>
- $10~\mu as$  corresponds to the angular size of a quarter (or a Euro) seen at the distance of the Moon
- $20~\mu as~yr^{-1}$  corresponds to the growth rate of the human hair seen at the distance of the Moon
- Data analysis challenge:
- For comparison: relativistic light bending by the Sun at angle 90° (that's what we call night): 3000  $\mu as$ ⇒ Relativistic light bending of all major planets have to be included, Jupiter even in post Newtonian approximation
- Tightly coupled equation system involving all data collected (eventually) over the full mission period
- Systemic biases: distance = parallax $^{-1}$ , and a positively defined properties. Owing to errors, measured parallaxes can be negative. Simple cuts introduce severe biases, in particular when convolved with stellar density distribution
- Spectral data only at medium resolution for a small wavelength range and a limited number of targets, low SNR (but many epochs!)

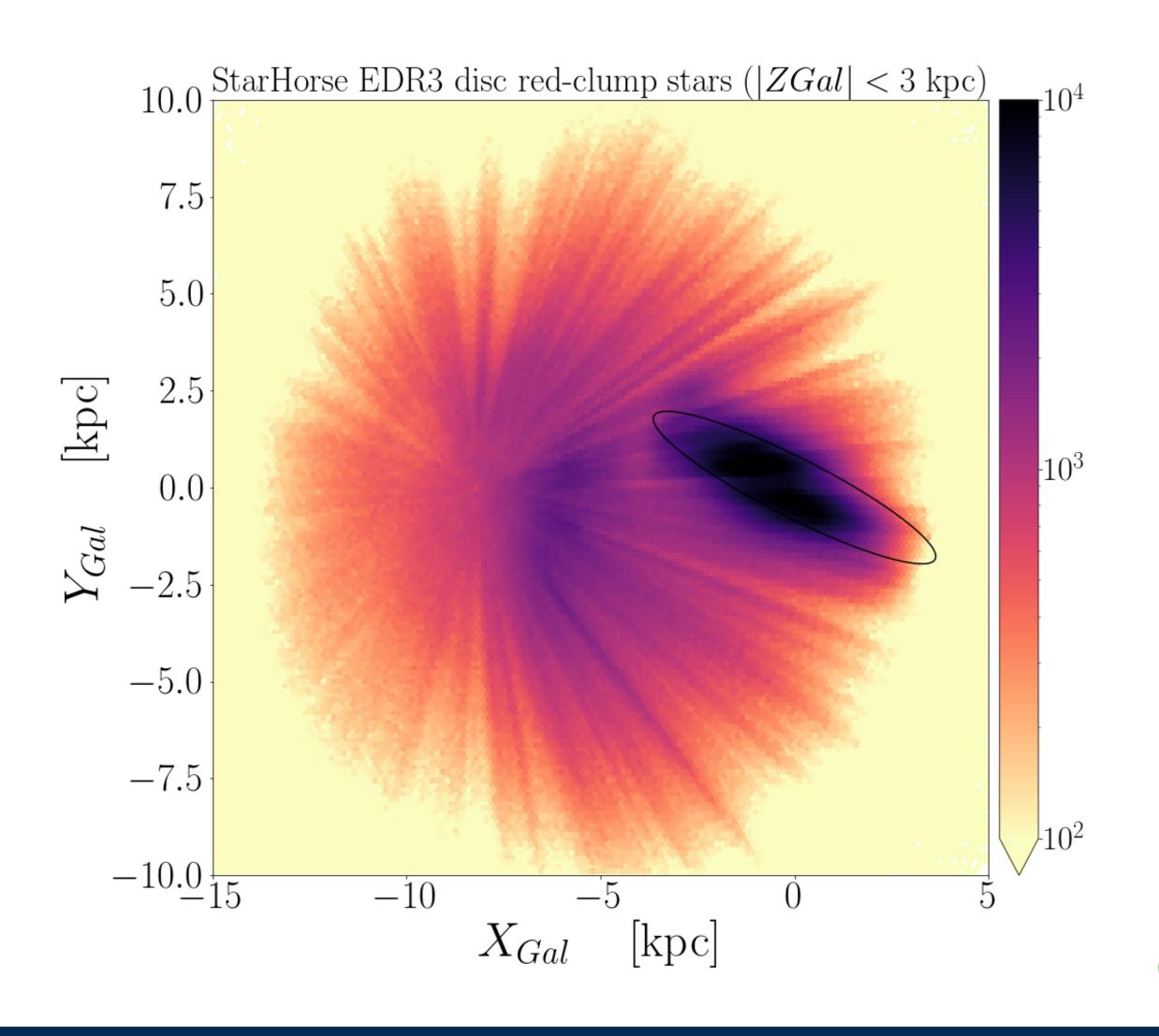
#### Gaia DR2 + photometric catalogues + Bayesian model



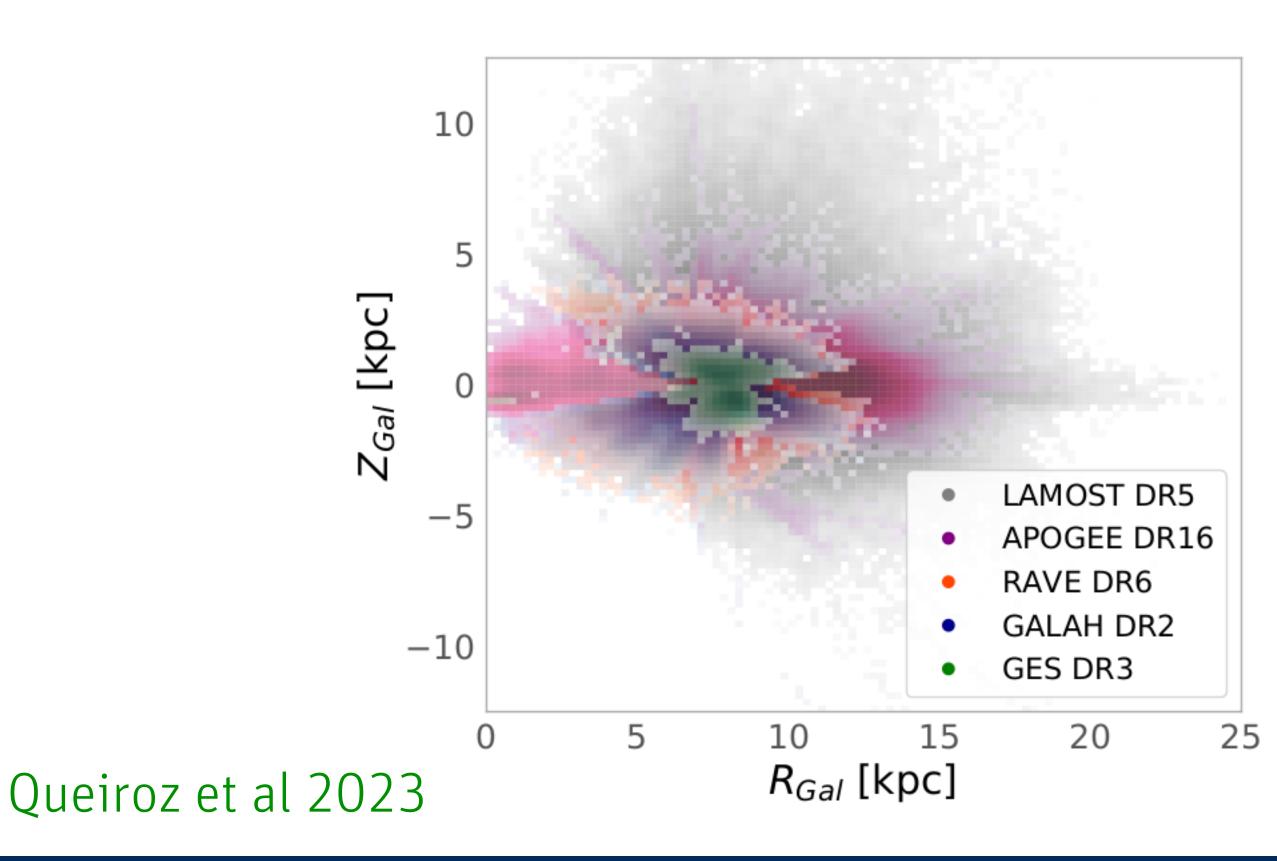
Almost as if we can see our Galaxy from above!

Anders et al 2019 Gaia DR2 (~265 million stars)

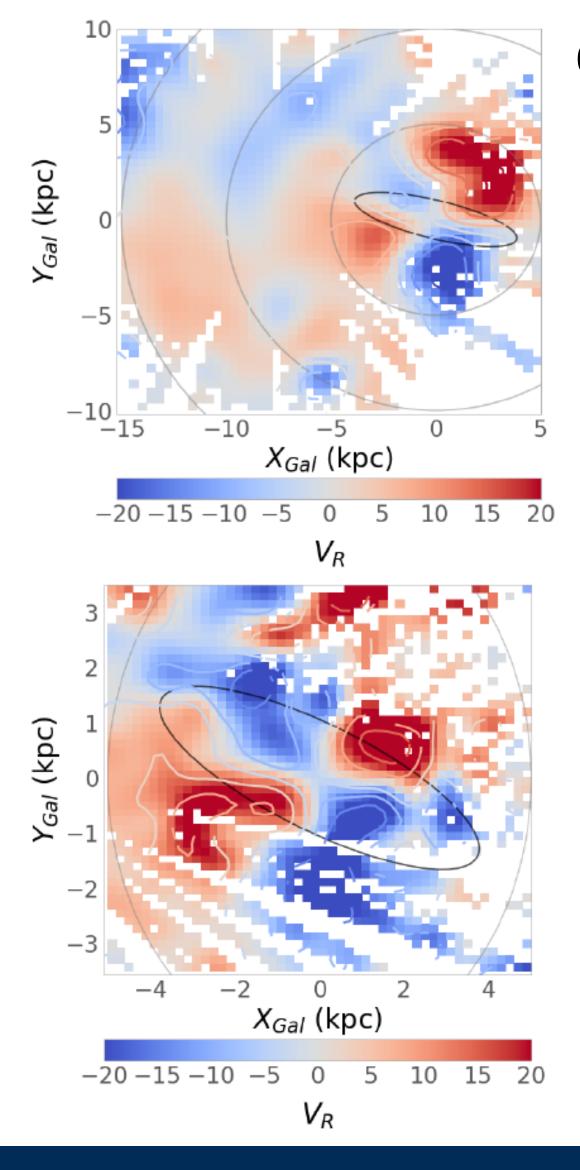
#### Gaia DR3 + photometric catalogues + spectroscopic catalogues+ Bayesian model



#### Now with ~360 Million stars

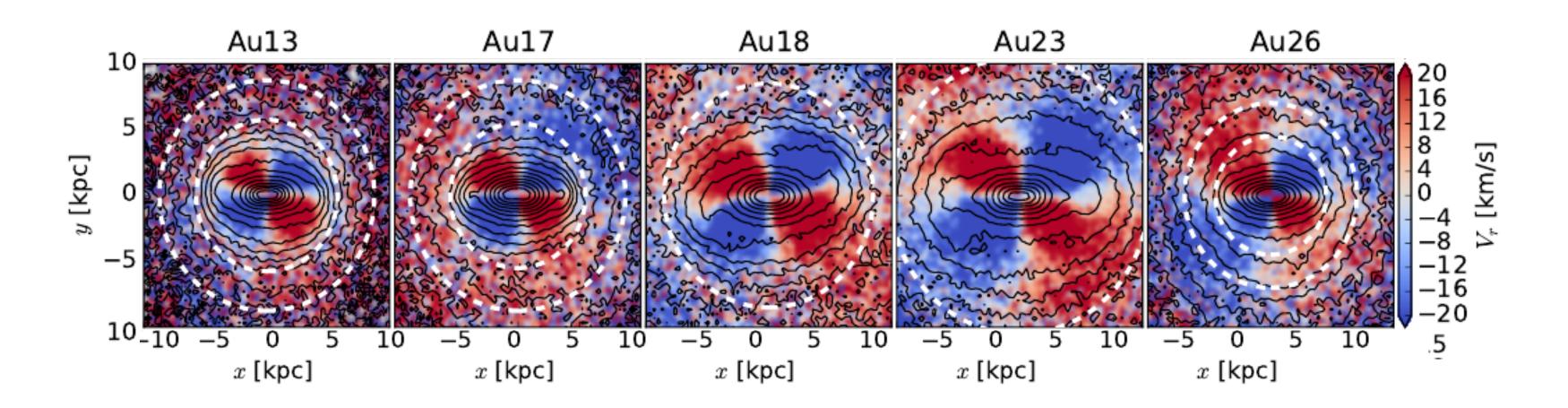


#### Using APOGEE DR17 + Gaia in the inner Galaxy (Kinematics)



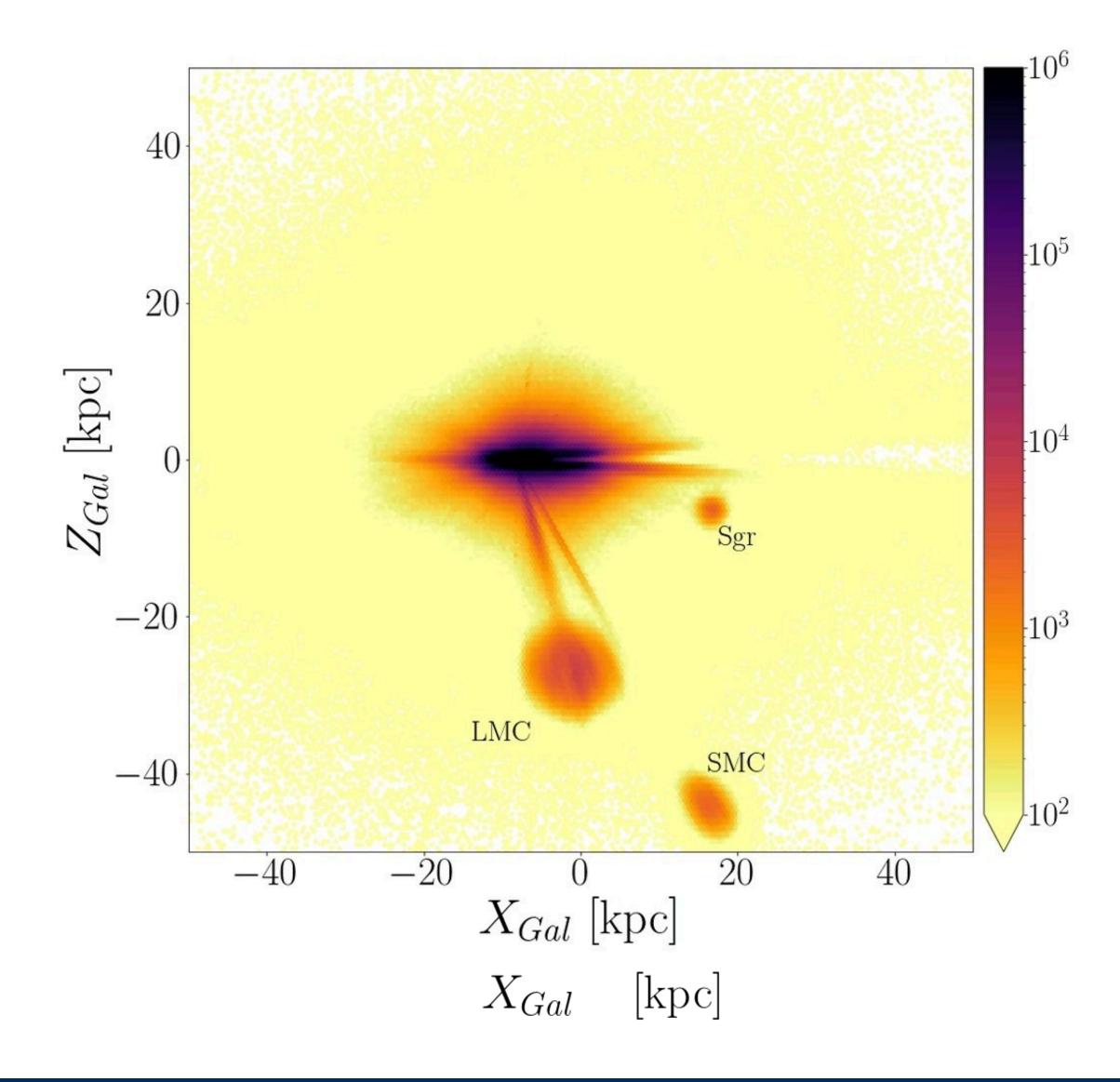
Queiroz et al 2021

The quadrupole of the Galactic bar is confirmed, reassuring distances measurements



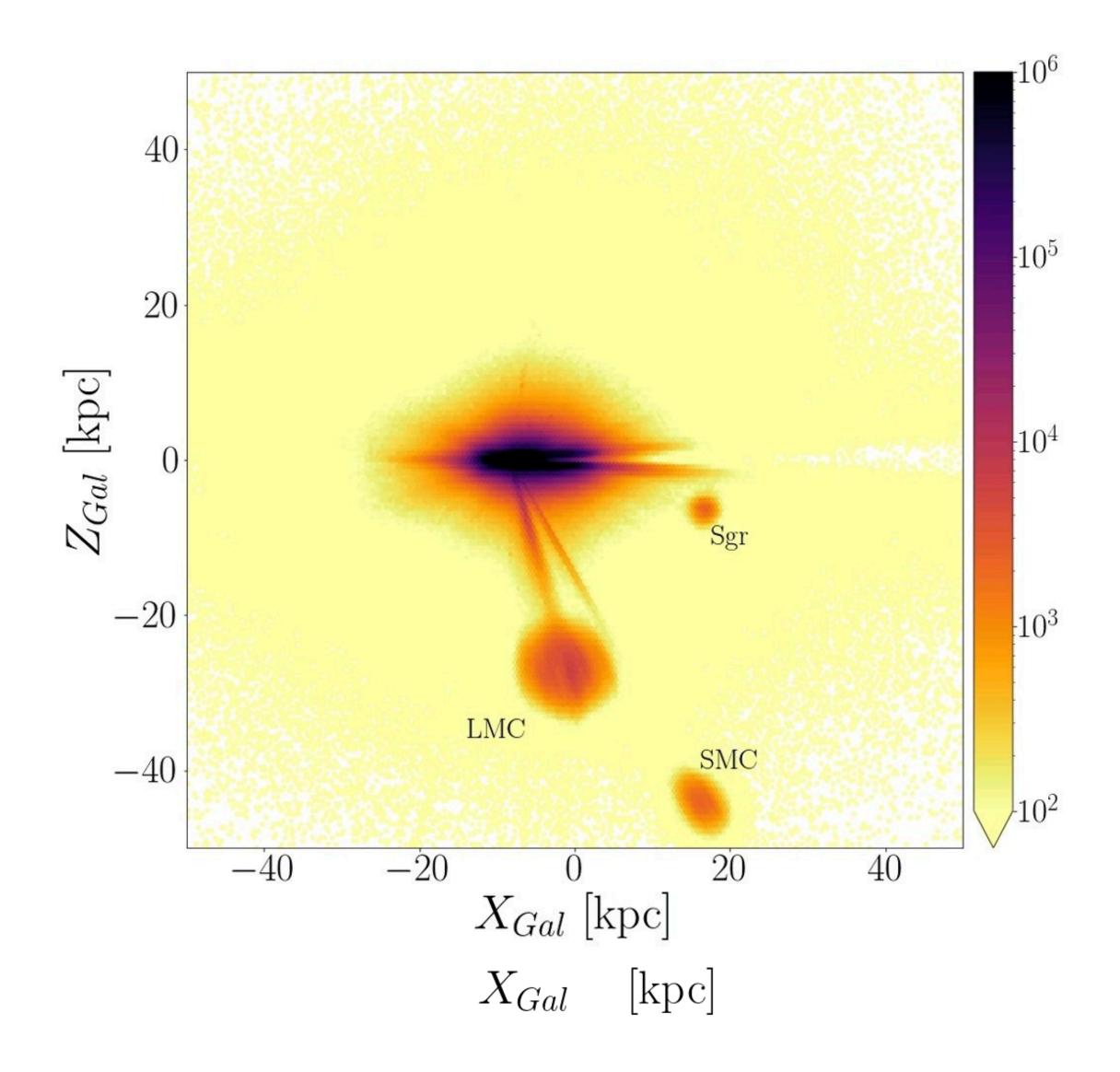
Auriga simulations Fragkoudi et al. 2019

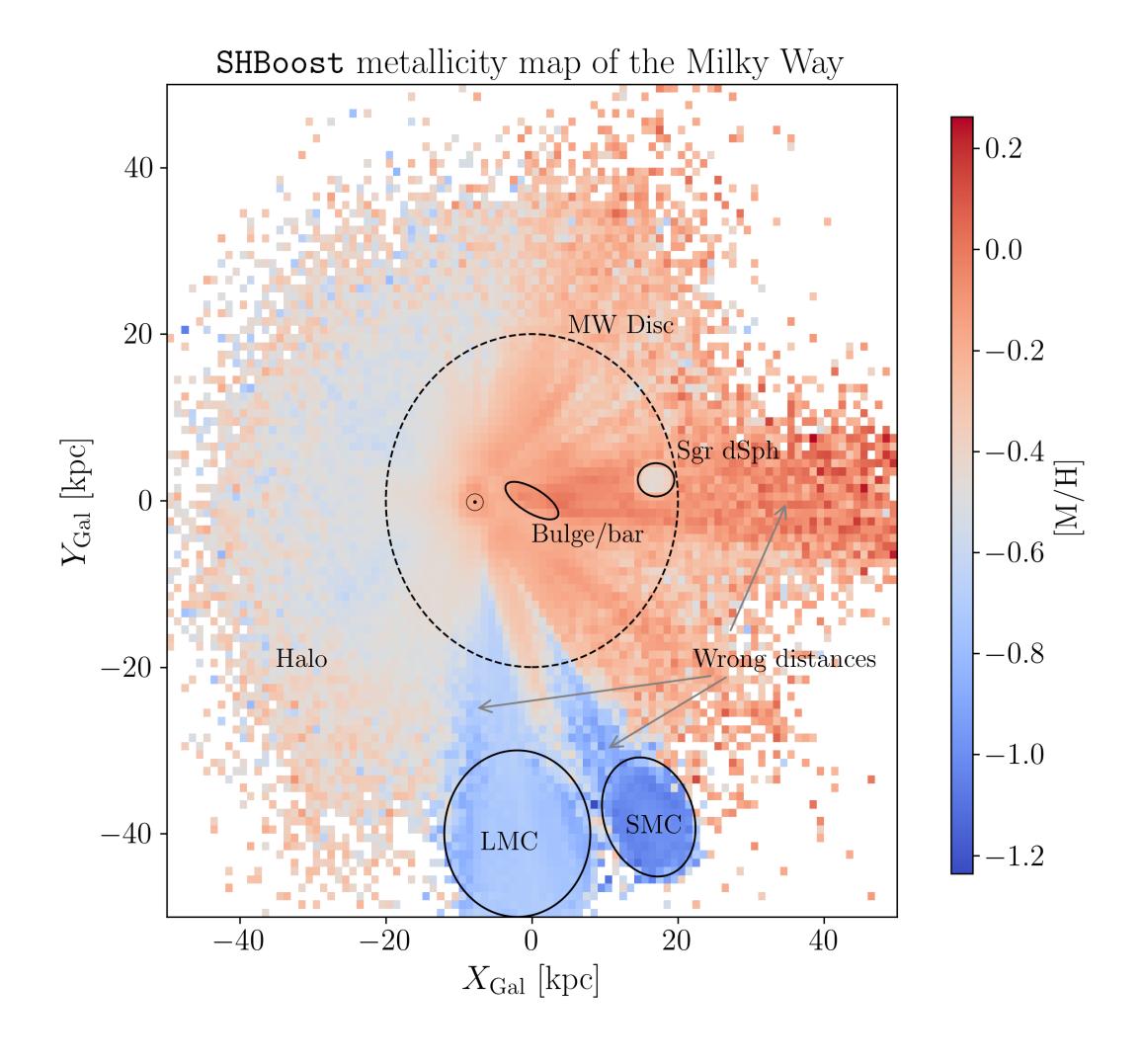
#### Going deeper ...



Queiroz et al 2023

#### Going deeper + constraining abundances using machine learning





Khalatyan et al 2024, arxiv:2407.06963

#### The nice things about stars

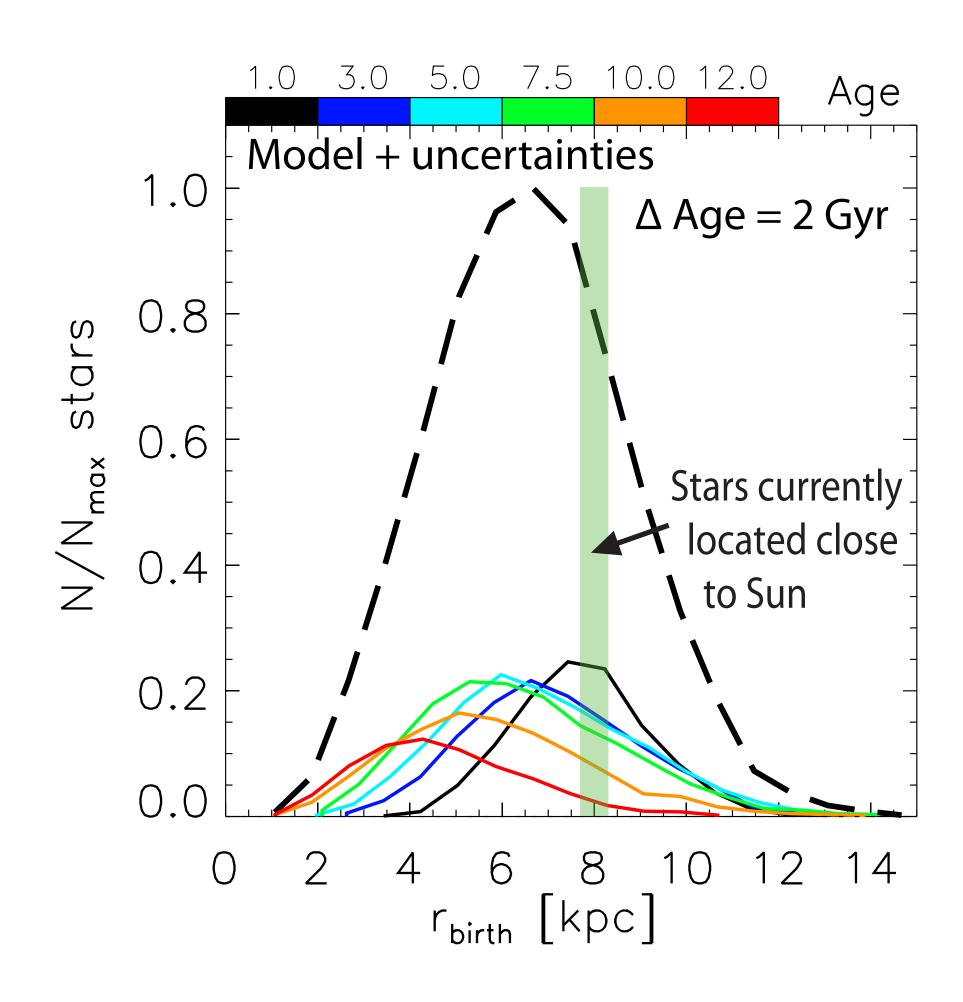
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#### The not so nice things about stars

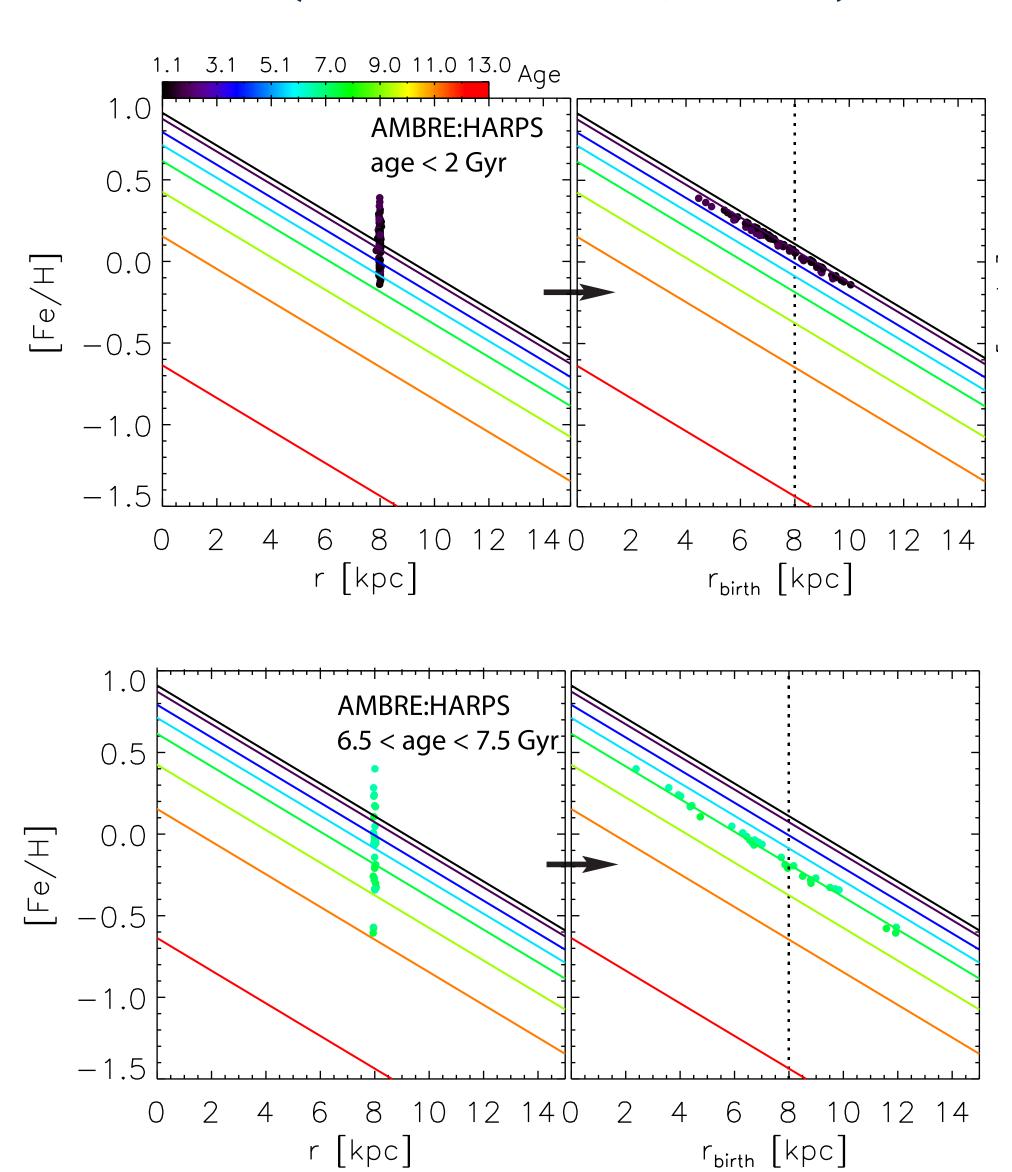
- Getting the data is hard
- Understanding the data is even harder (completeness and selection effects)
- for almost all stars the available data is highly incomplete
- data driven and machine learning approaches
- Galaxies are roughly as old as the universe, not really equilibrium or stationary system

**⇒** modeling is difficult **⇒** simulations

#### First step: tracing back the birth radius of disk stars (Minchev et al, 2018)

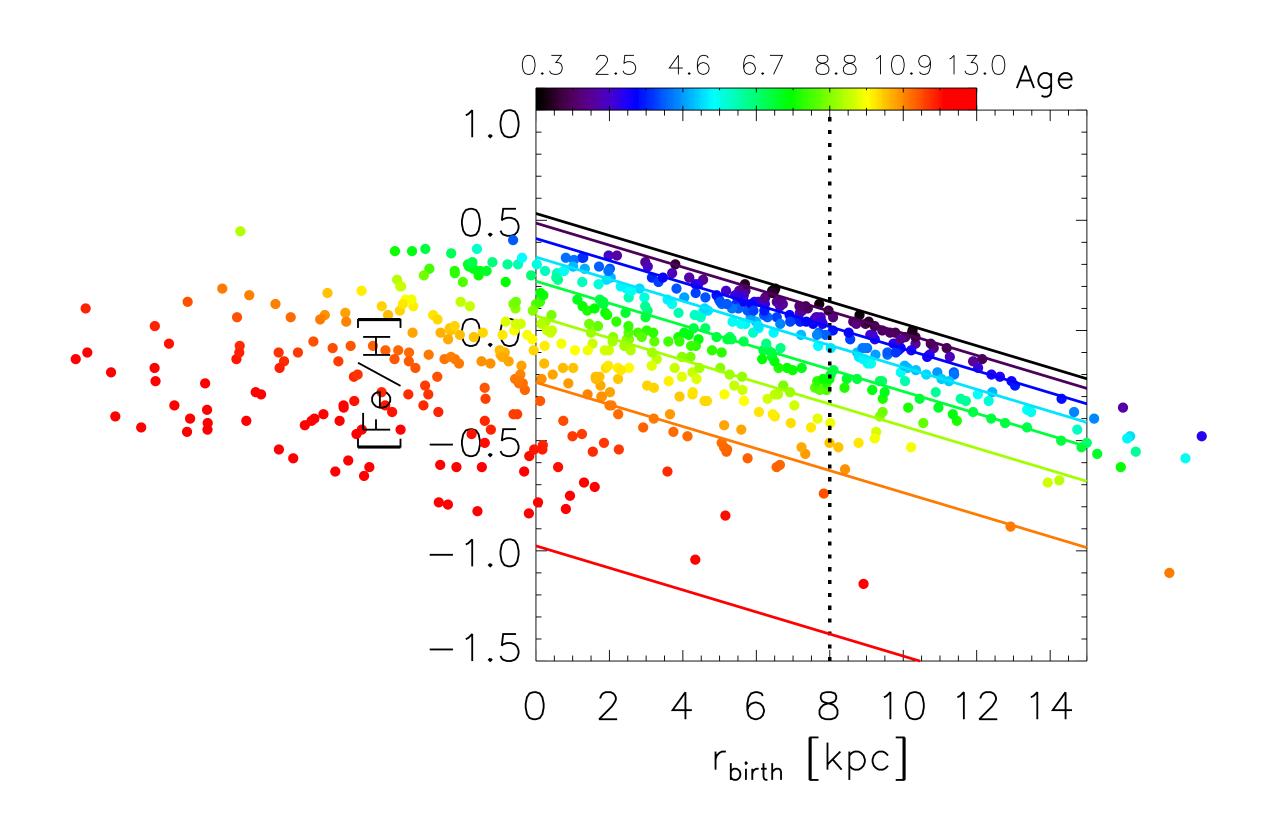


Minchev, Chiappini, Martig 2013 simulations

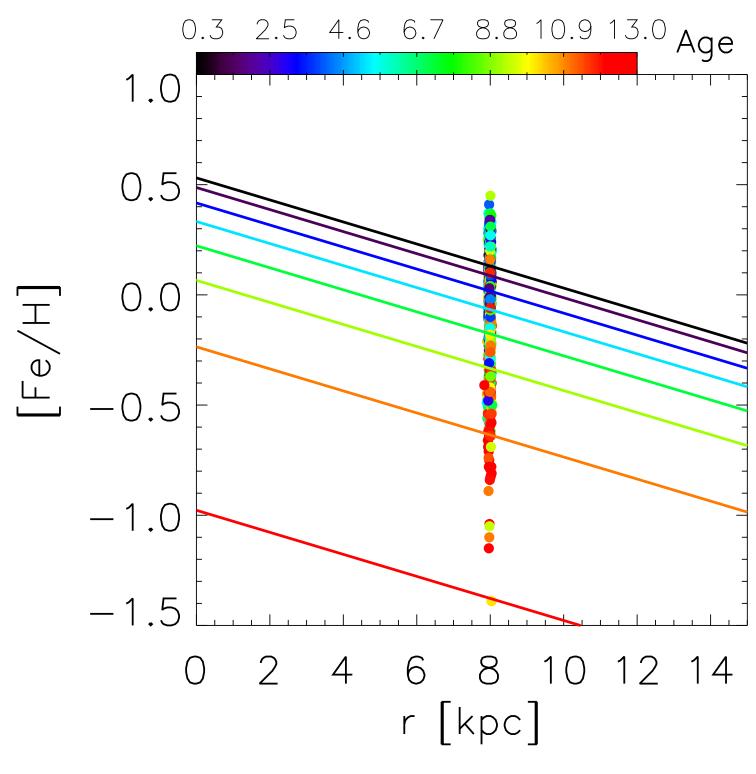


#### What if gradient was flatter? How flat is too flat?

- ✓ Only age and metallicity necessary
- ✓ Assume ISM metallicity gradient evolving with time
- ✓ Place stars on the slope by shifting in r according to age and [Fe/H](r, t)

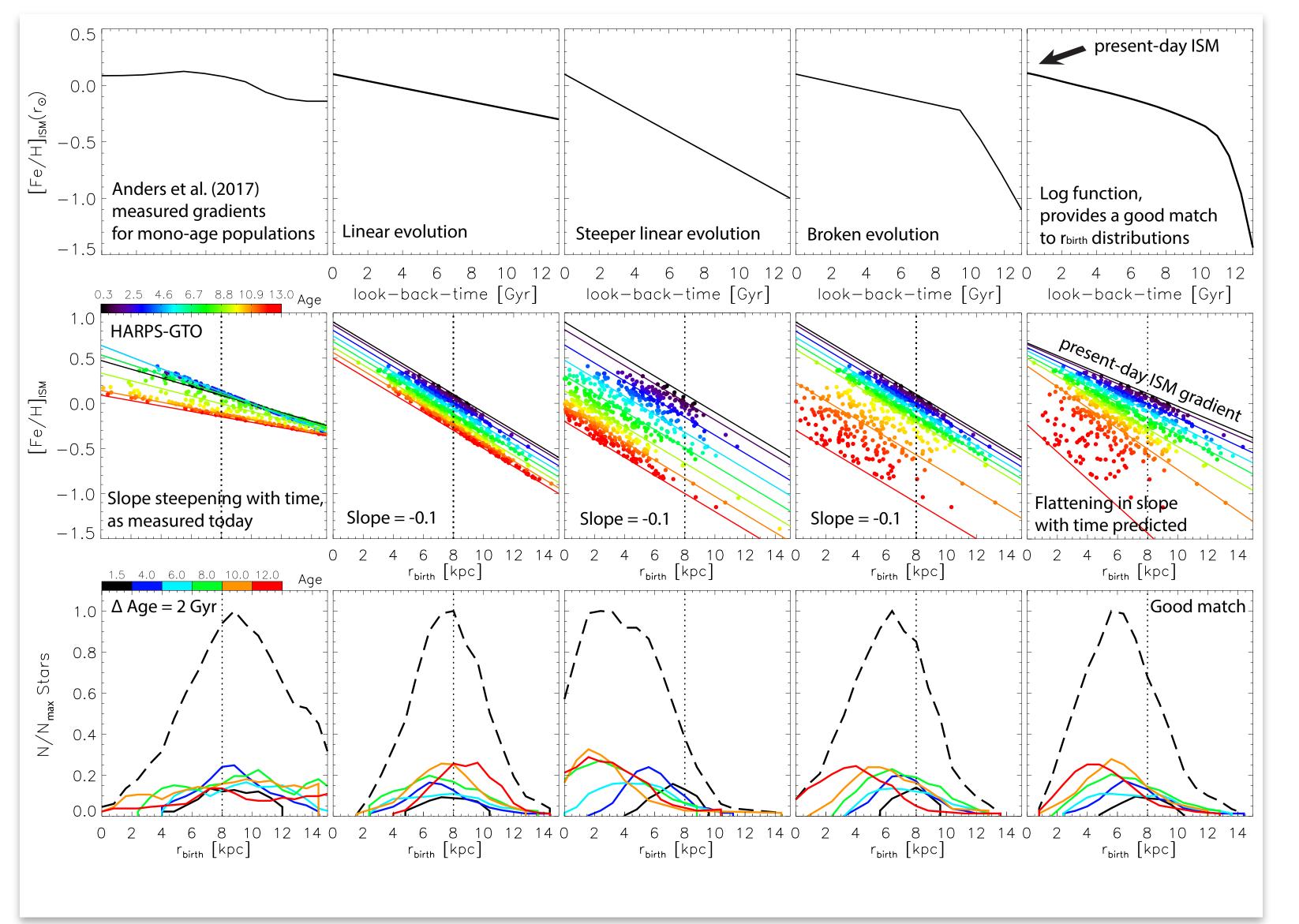


HARPS: AMBRE or HARPS-GTO isochrone ages



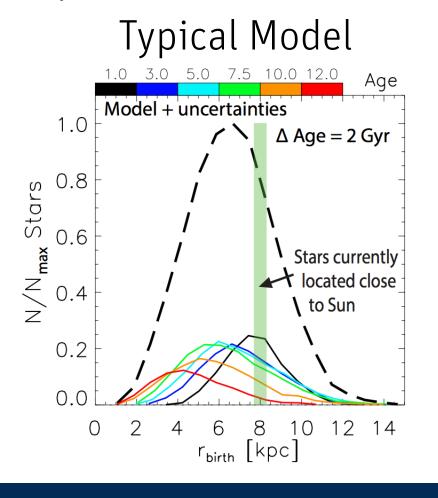
- Same scatter in [Fe/H] gives wider birth radius distributions
- When you start getting negative birth radii you know something is wrong

#### We can try different possibilities for the ISM [Fe/H](r, t)



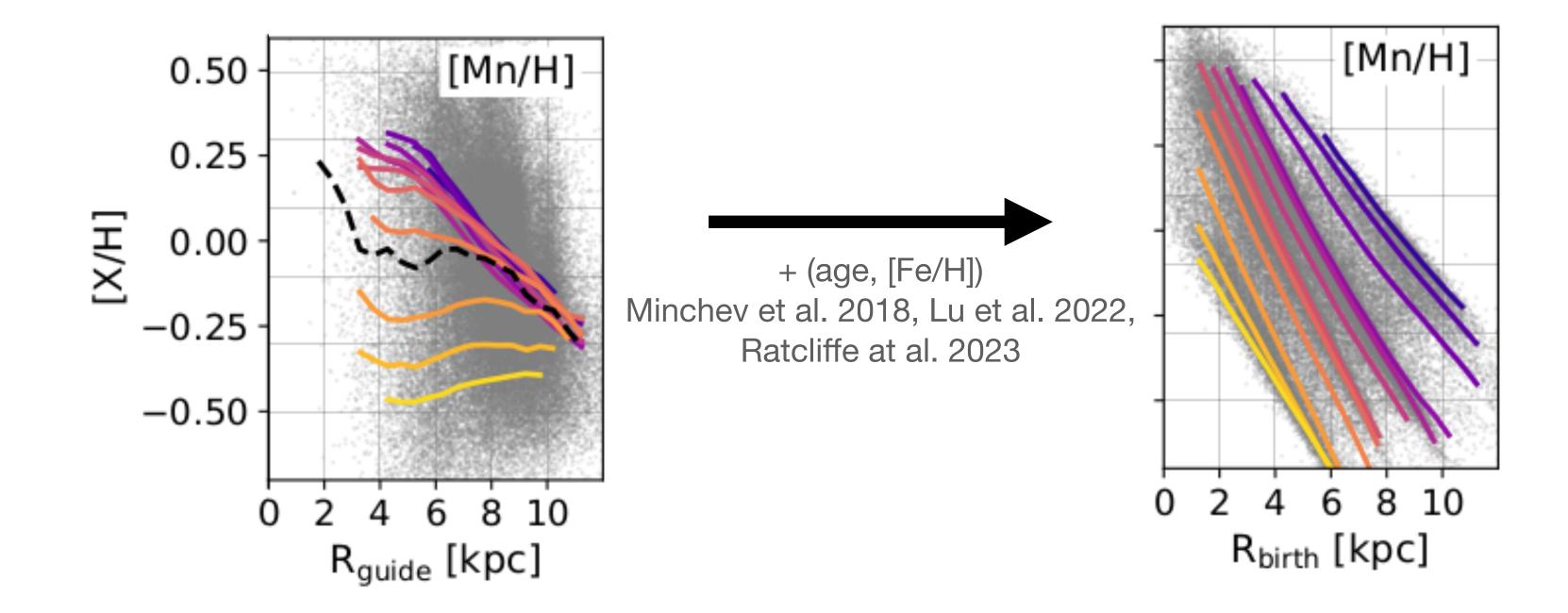
Time evolution of [Fe/H] at Rsol

Time evolution of [Fe/H] slope



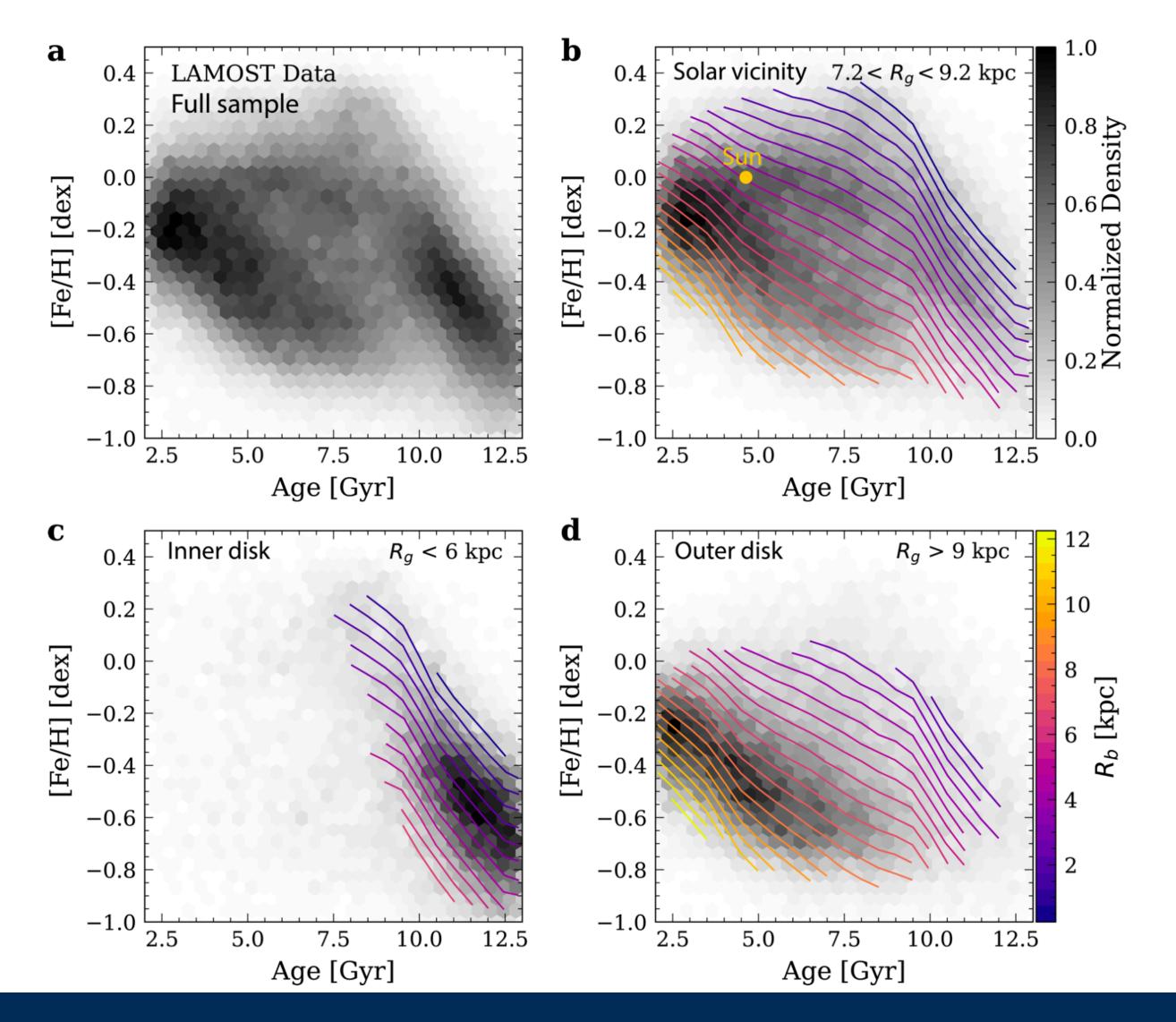
#### **Evolving Galaxy**

- Stars move and their velocities change, but chemical abundances remain preserved
- tension between observed and modeled/simulated data
  - observational gradients with age (Sales-Silva et al. 2022, Myers et al. 2022)
  - weakening of gradients over time due to migration



#### Birth radius tracks in the Age-Metallicity relation

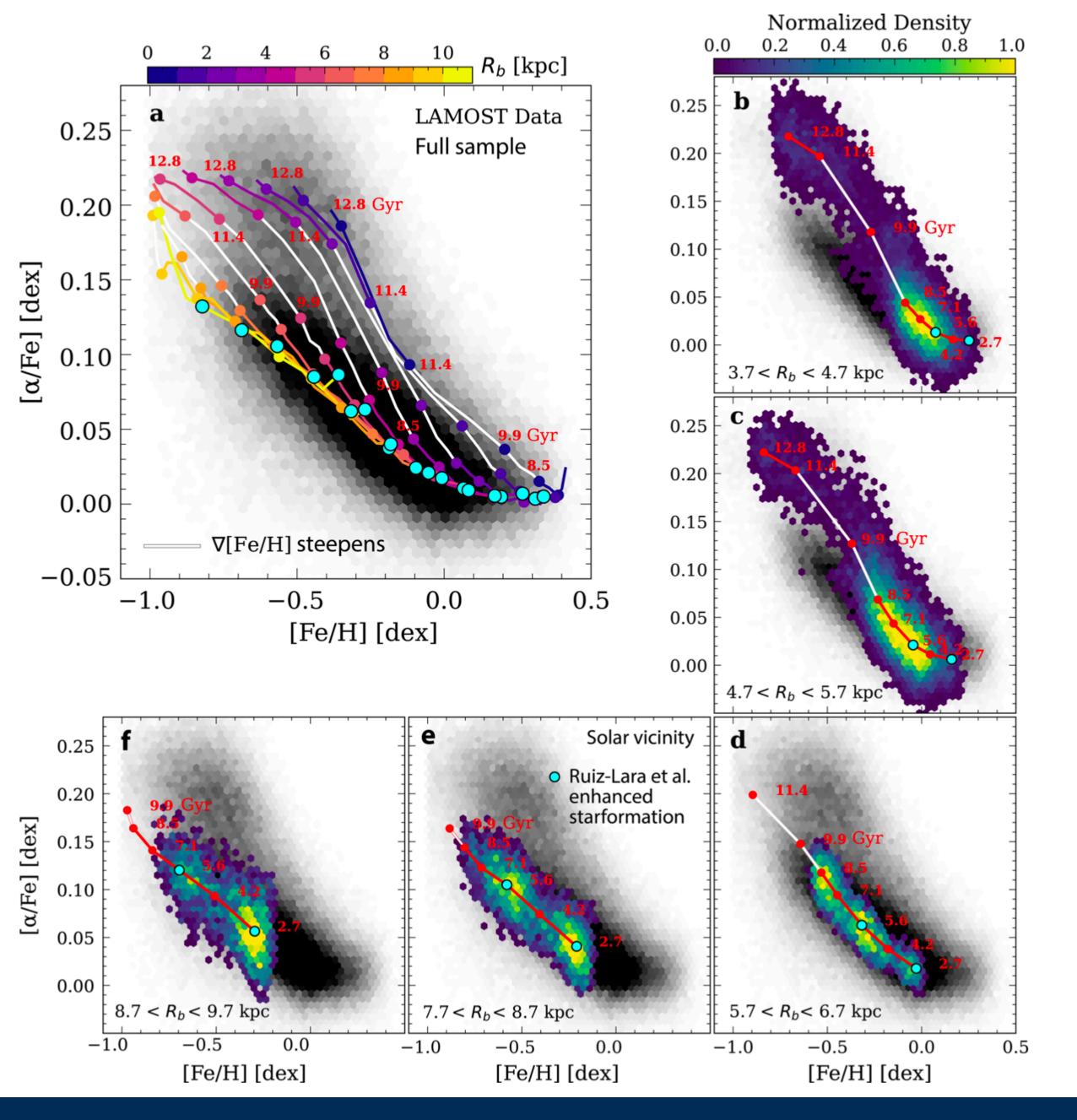
(note change in axis!)



Sun born at  $R = 4.5 \pm 0.5$ 

Old ridge belongs to the inner disk and the young one to the outer disk

Lu et al. (2022)

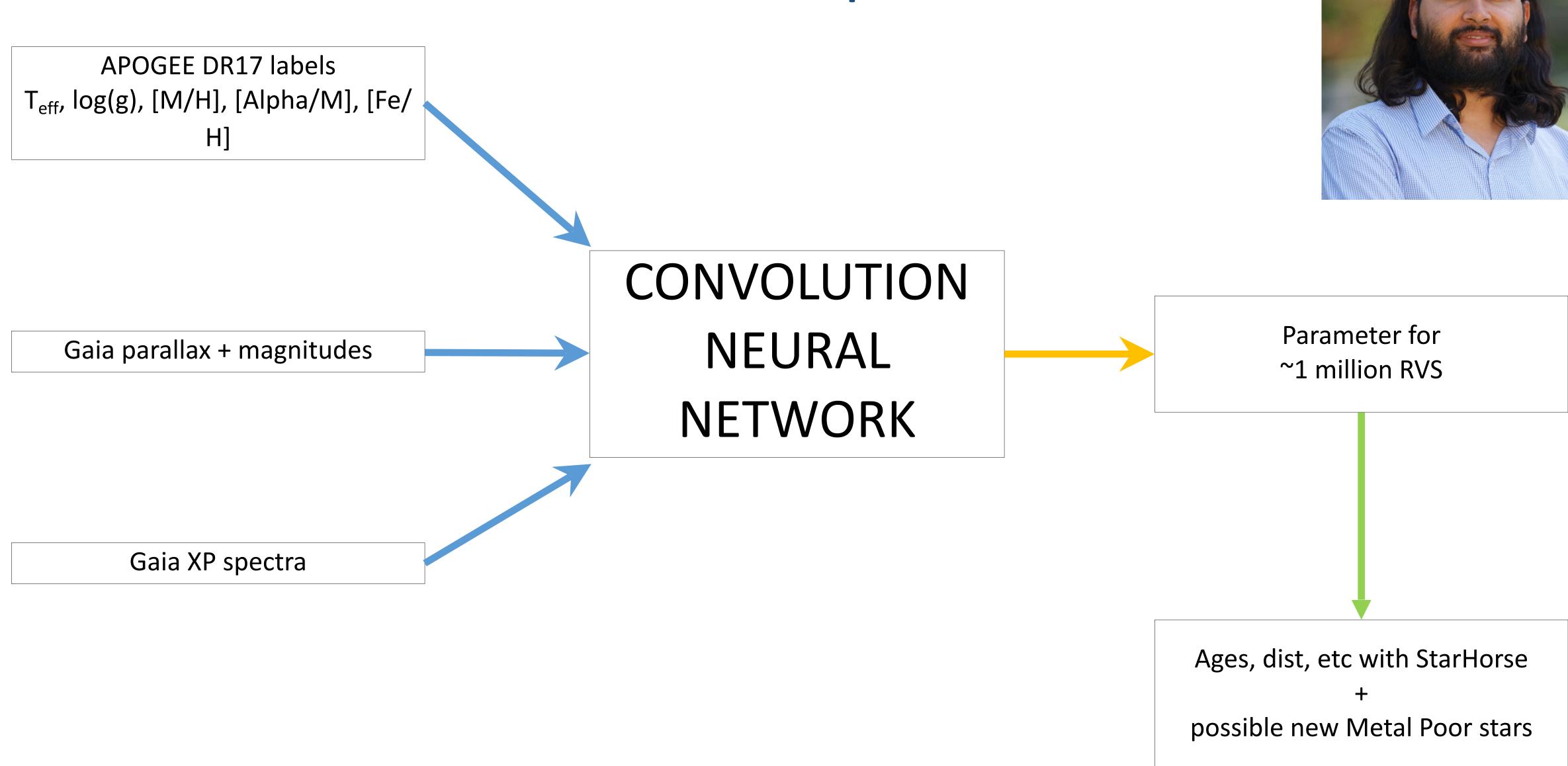


Lu et al. (2022)

[\alpha/Fe]-[Fe/H] distributions narrow in narrow birth radius bins

Clumps found in outer birth radii. Same mean age, although moving around. Could be associated with SF bursts found by, e.g., Ruiz-Lara et al. (2020)

#### Abundances from low resolution Gaia RVS spectra - the idea:



#### Improving Performance of Spectroscopic Surveys with Machine Learning

Astronomy & Astrophysics manuscript no. output October 26, 2023

©ESO 2023

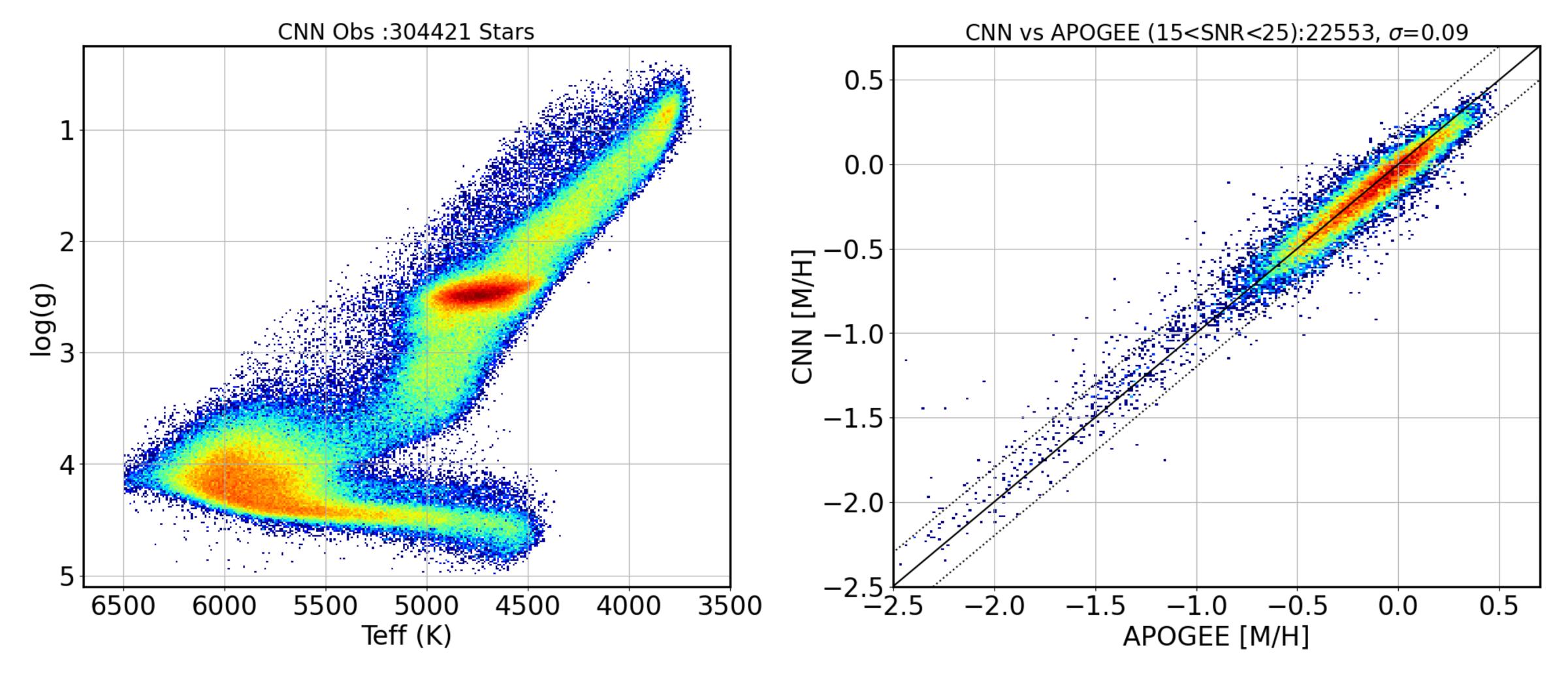
#### Beyond Gaia DR3: tracing the $[\alpha/M] - [M/H]$ bimodality from the Inner to the outer Milky Way disc with Gaia RVS and Convolutional Neural-Networks

G. Guiglion<sup>1,2</sup>, S. Nepal<sup>3,4</sup>, C. Chiappini<sup>3</sup>, S. Khoperskov<sup>3</sup>, G. Traven<sup>5</sup>, A. B. A. Queiroz<sup>3</sup>, M. Steinmetz<sup>3</sup>, M. Valentini<sup>3</sup>, Y. Fournier<sup>3</sup>, A. Vallenari<sup>6</sup>, K. Youakim<sup>7</sup>, M. Bergemann<sup>2</sup>, S. Mészáros<sup>8,9</sup>, S. Lucatello<sup>10,11</sup> R. Sordo<sup>6</sup>, S. Fabbro<sup>12</sup>, I. Minchev<sup>3</sup>, G. Tautvaišienė<sup>13</sup>, Š. Mikolaitis<sup>13</sup>, J. Montalbán<sup>14</sup>

The RVS-CNN Catalog (Guiglion, Nepal et al. 2024 A&A):

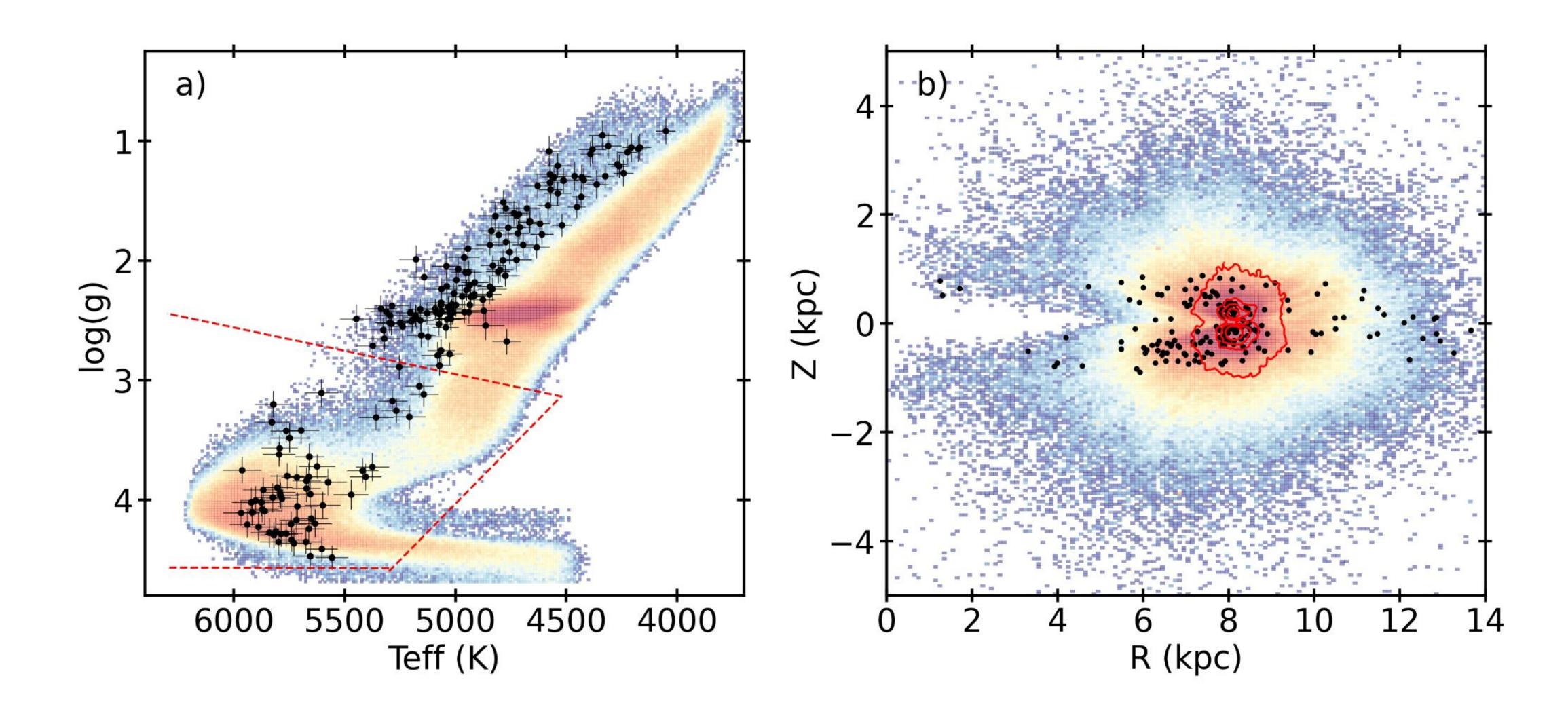
- $T_{eff}$ , log(g), [M/H],  $[\alpha/M]$  and [Fe/H] for >840,000 stars. (Catalog is public, use it!)
- >12,000 metal-poor ([Fe/H]<-1.0) stars with reliable parameters (GSP-spec flags: <100)
- ~19,000 super-metal-rich ([Fe/H]>0.2) stars with reliable parameters (GSP-spec: ~6,500)
- ~4500 bulge candidates with Gaia-RVS (GSP-spec: 8)

#### Fetching abundances from Gaia RVS spectra trained on APOGEE

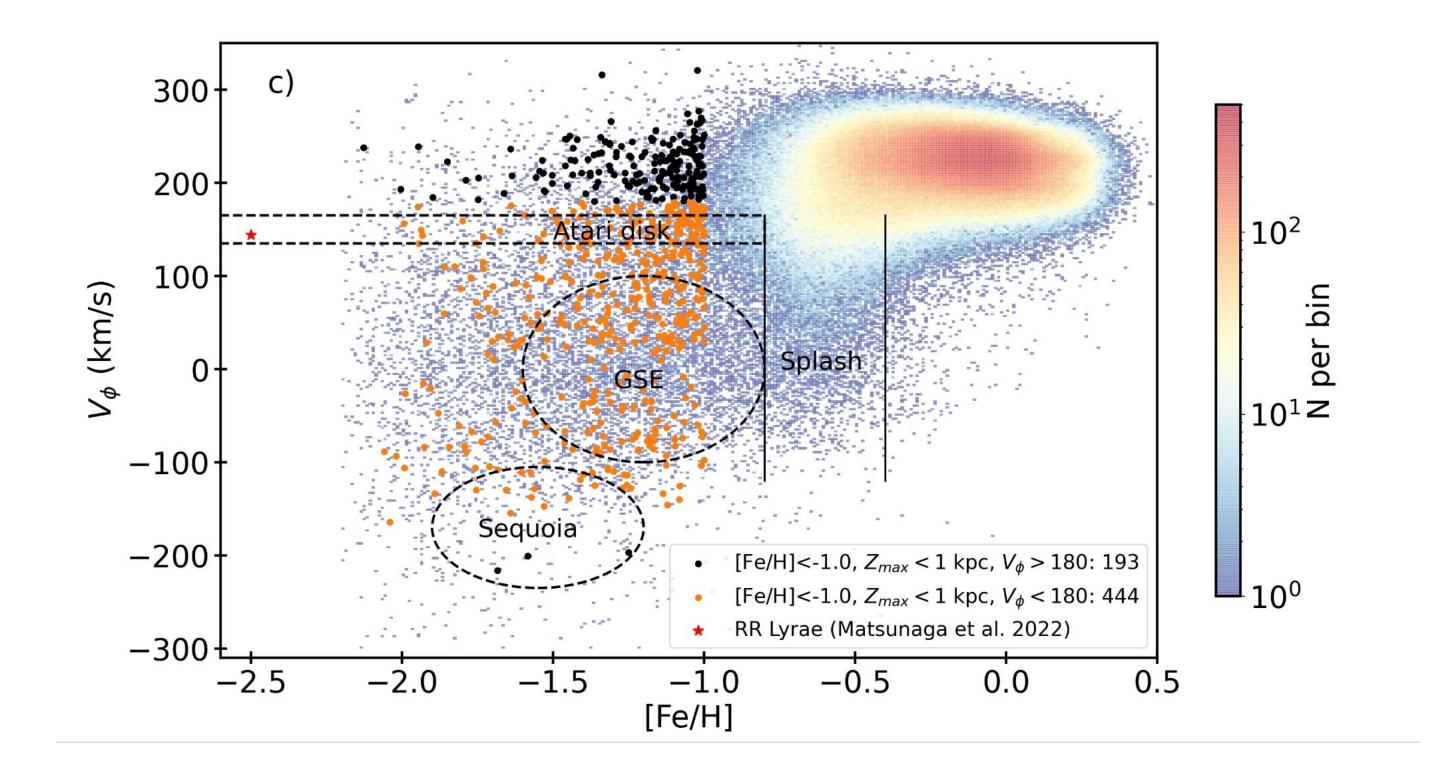


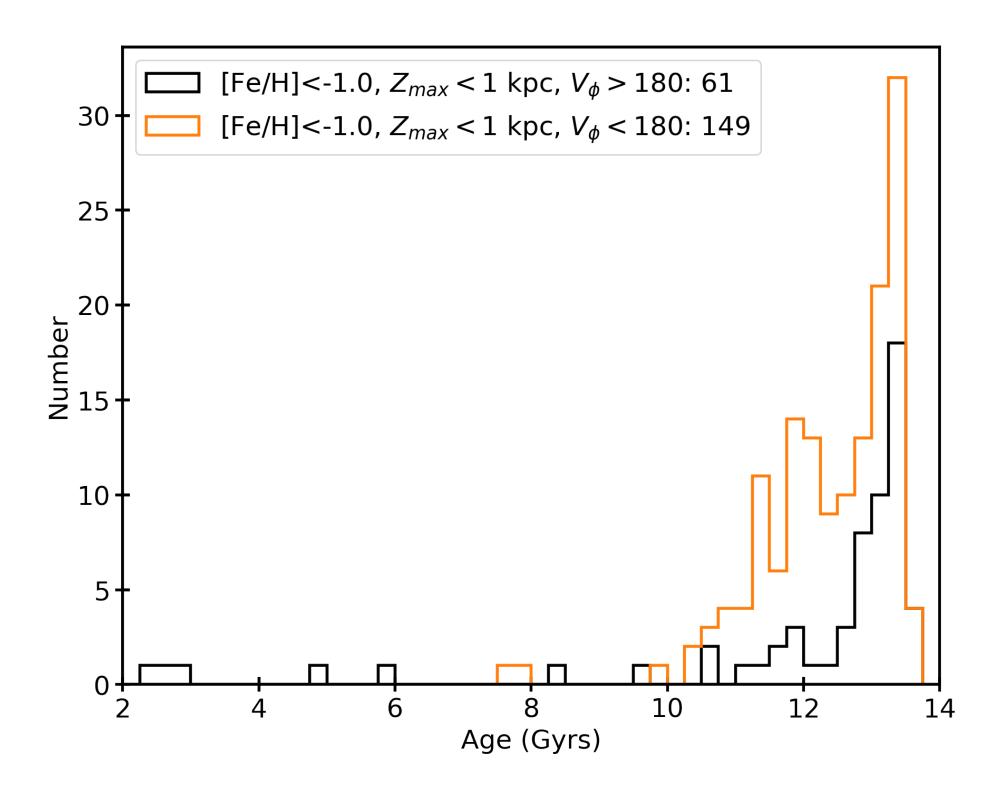
- Left: High-quality result for selected Obs sample. (Total obs sample = 841300)
- 1-to-1 comparison of CNN prediction vs APOGEE [M/H] for low S/N (15-25) RVS spectra.

## The data:



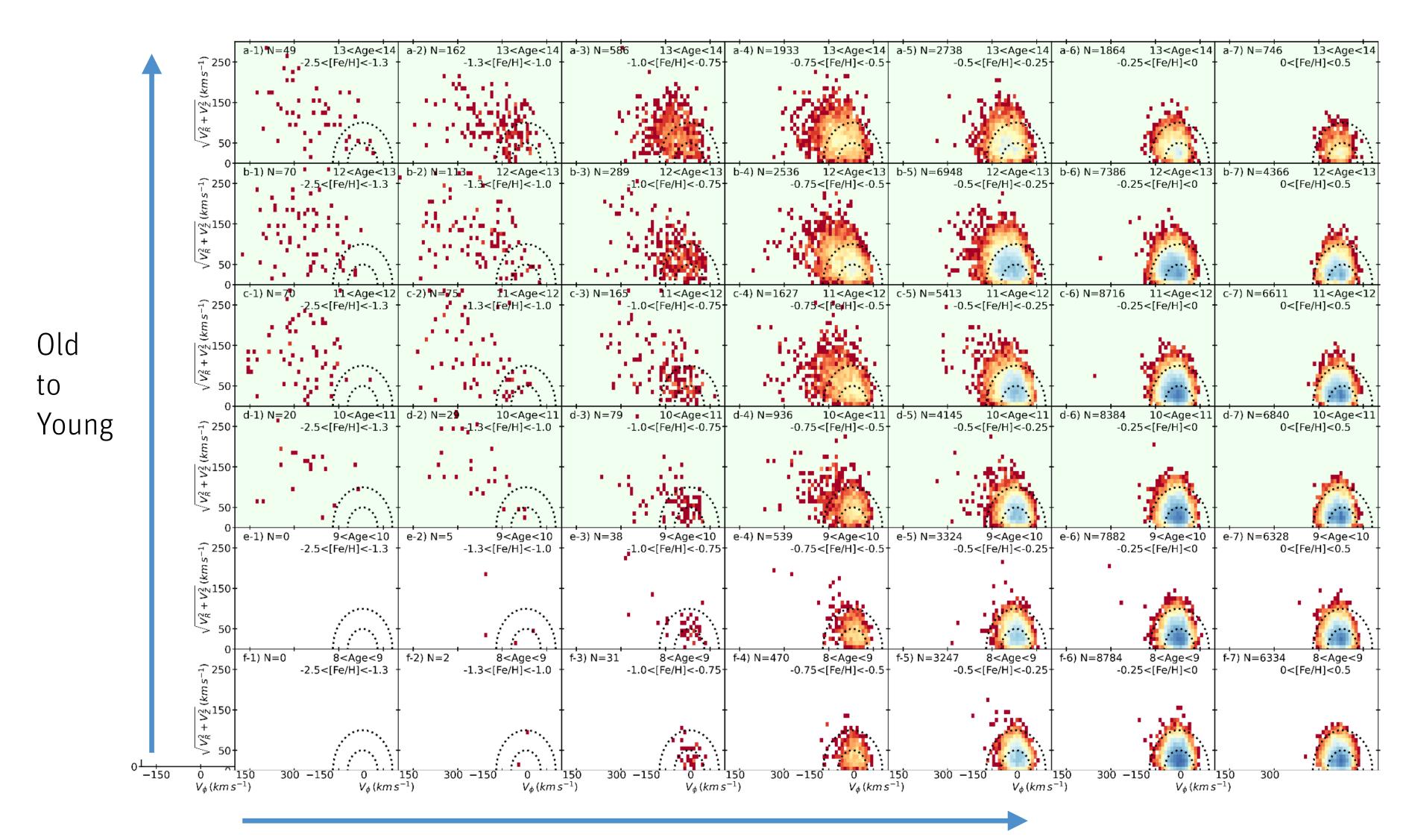
#### The metal-poor thin disc:





> 50% of MP thin disc star > 13 Gyr significant % of kinematically hotter MP stars < 13 Gyr

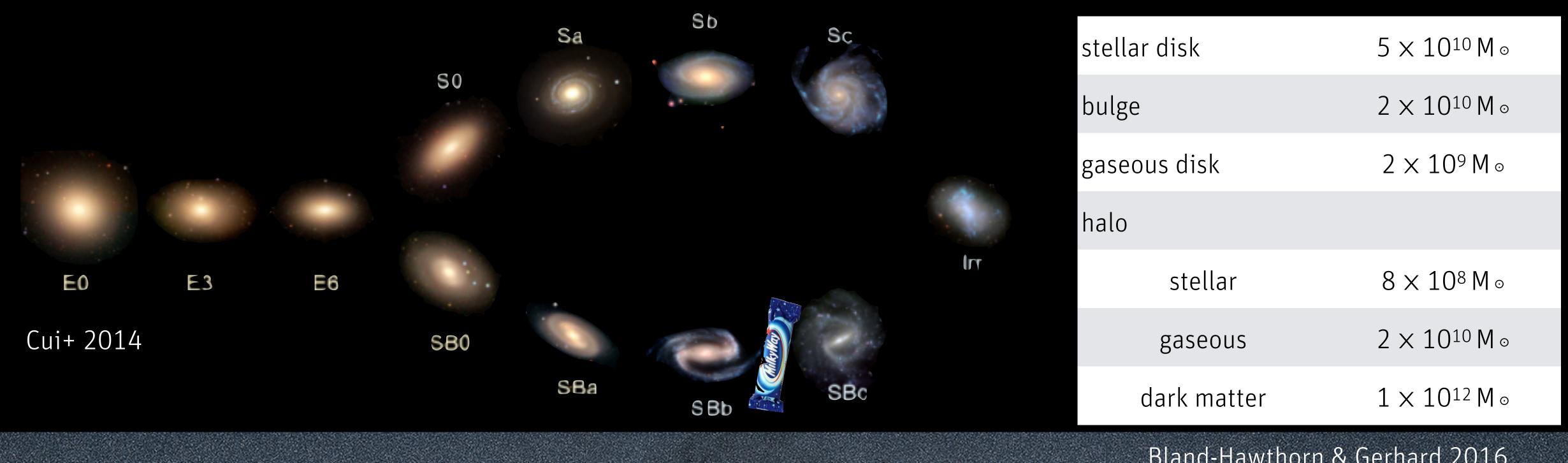
#### The oldest thin disc of MW:



Significant fraction of old stars with wide [Fe/H] range already in thin/thick disc orbits at the oldest ages.

Metal-poor to Metal-rich





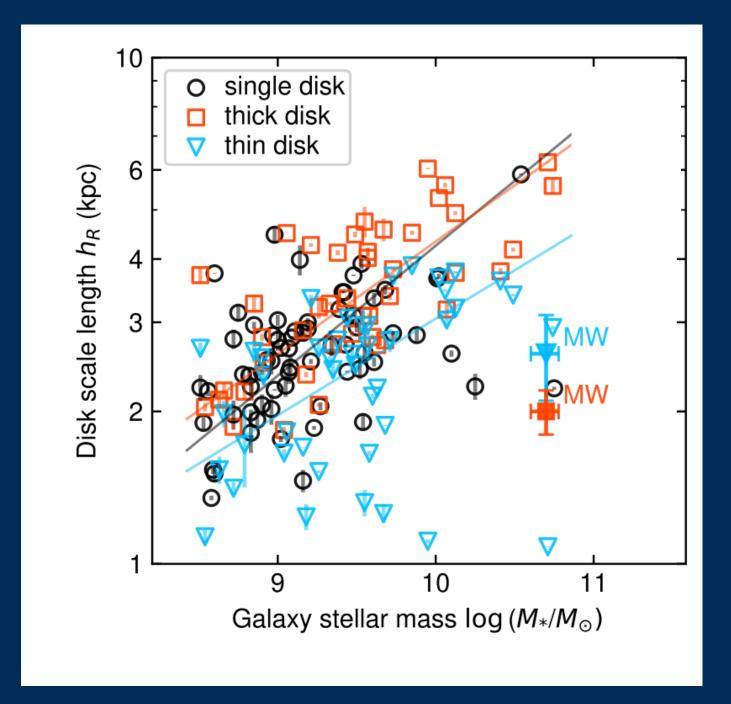
Bland-Hawthorn & Gerhard 2016



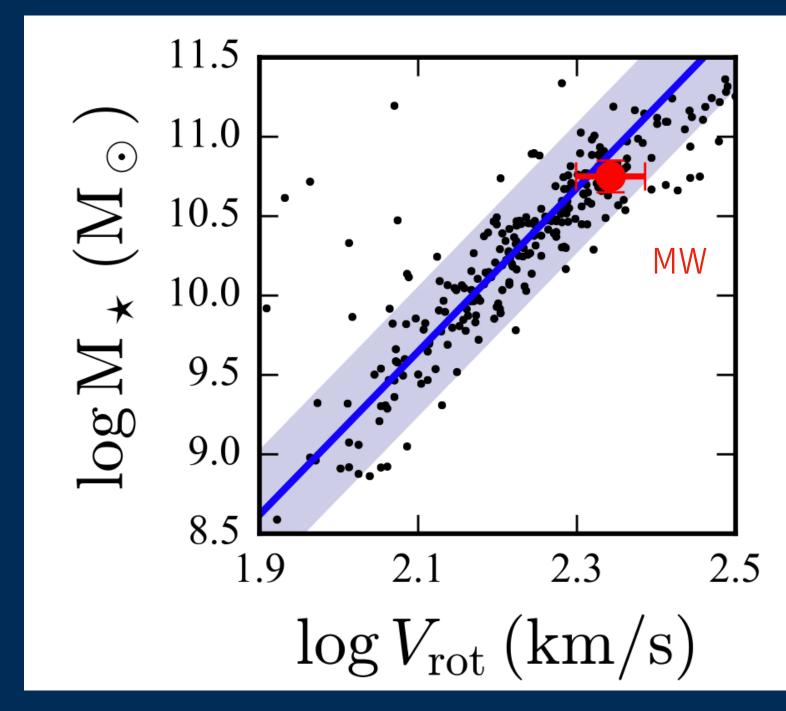
van Dokkum+ 2013

#### Milky Way galaxy: normal or weird?

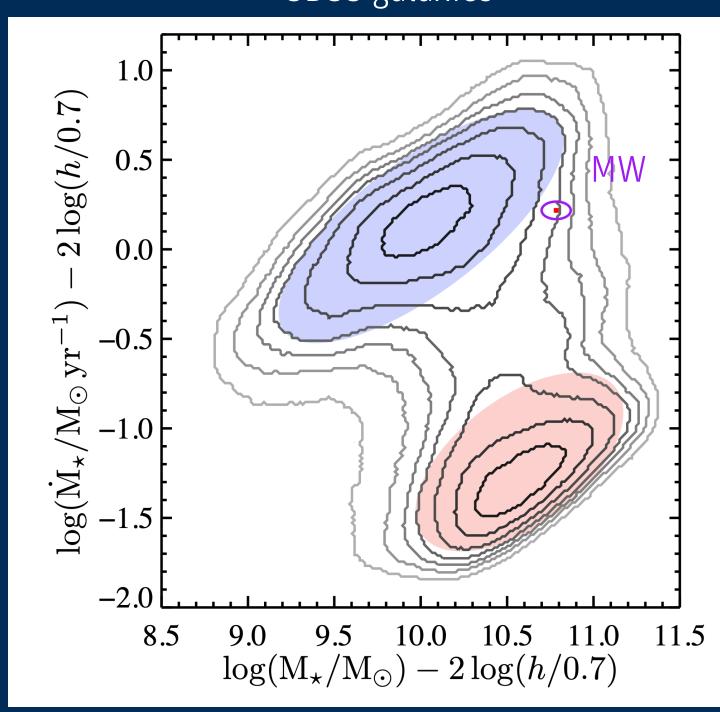




#### 258 SDSS spiral galaxies



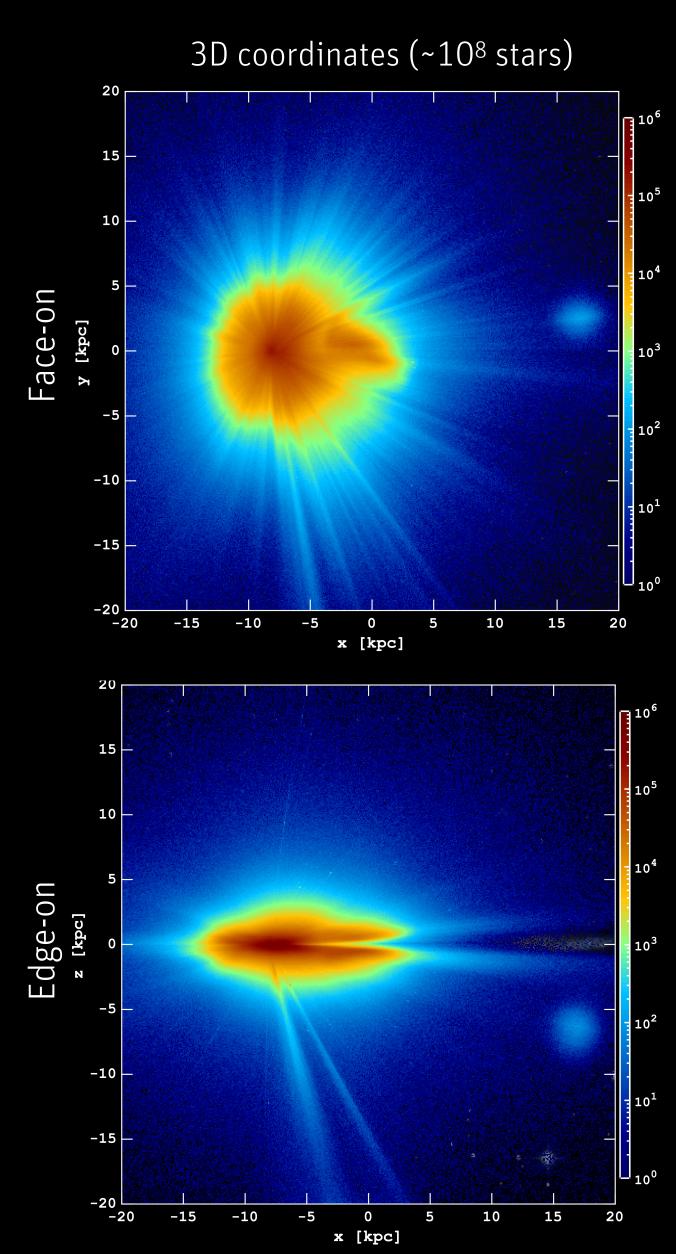
#### SDSS galaxies



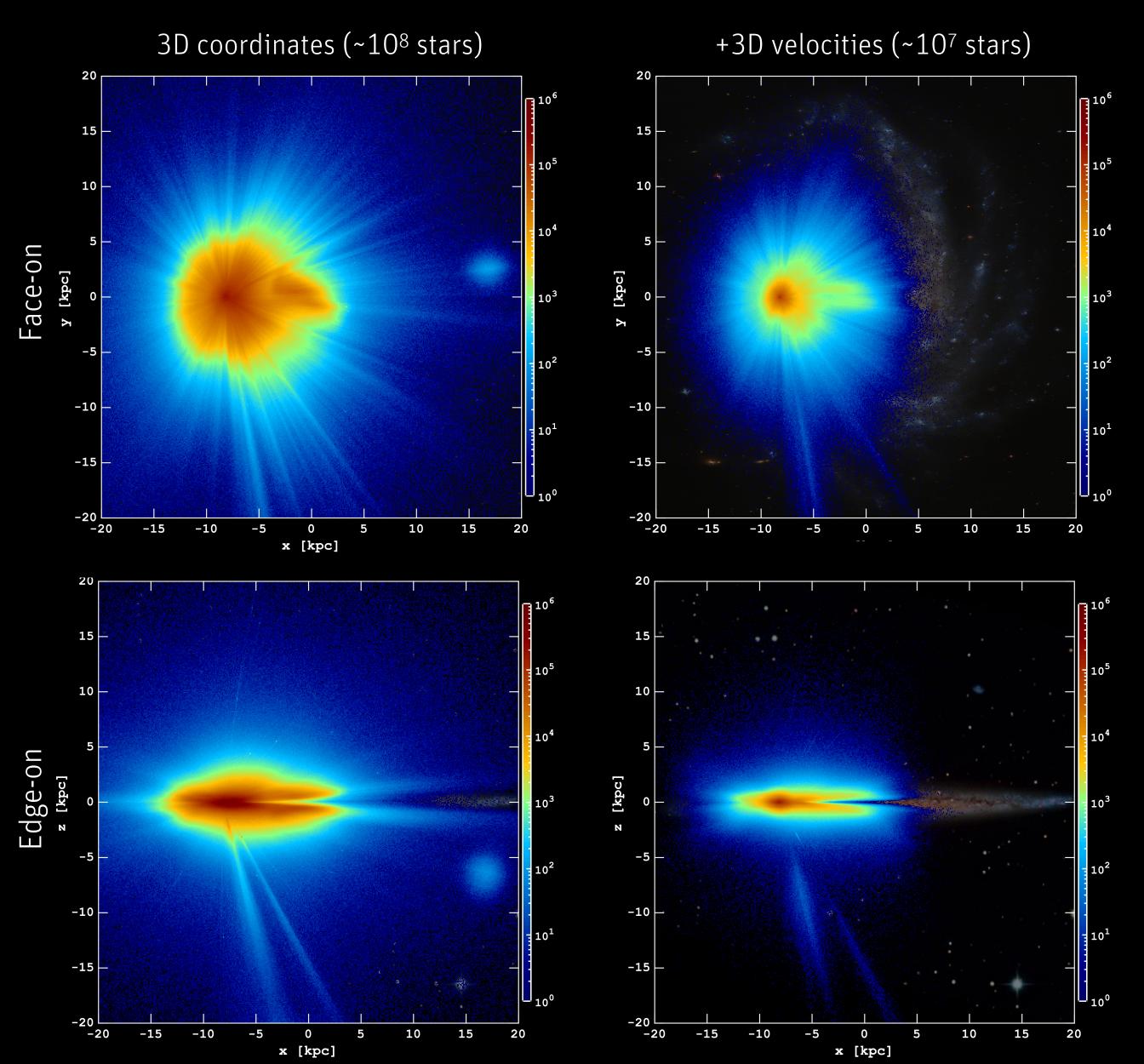
Tsukui+ 2024

Licquia+ 2016

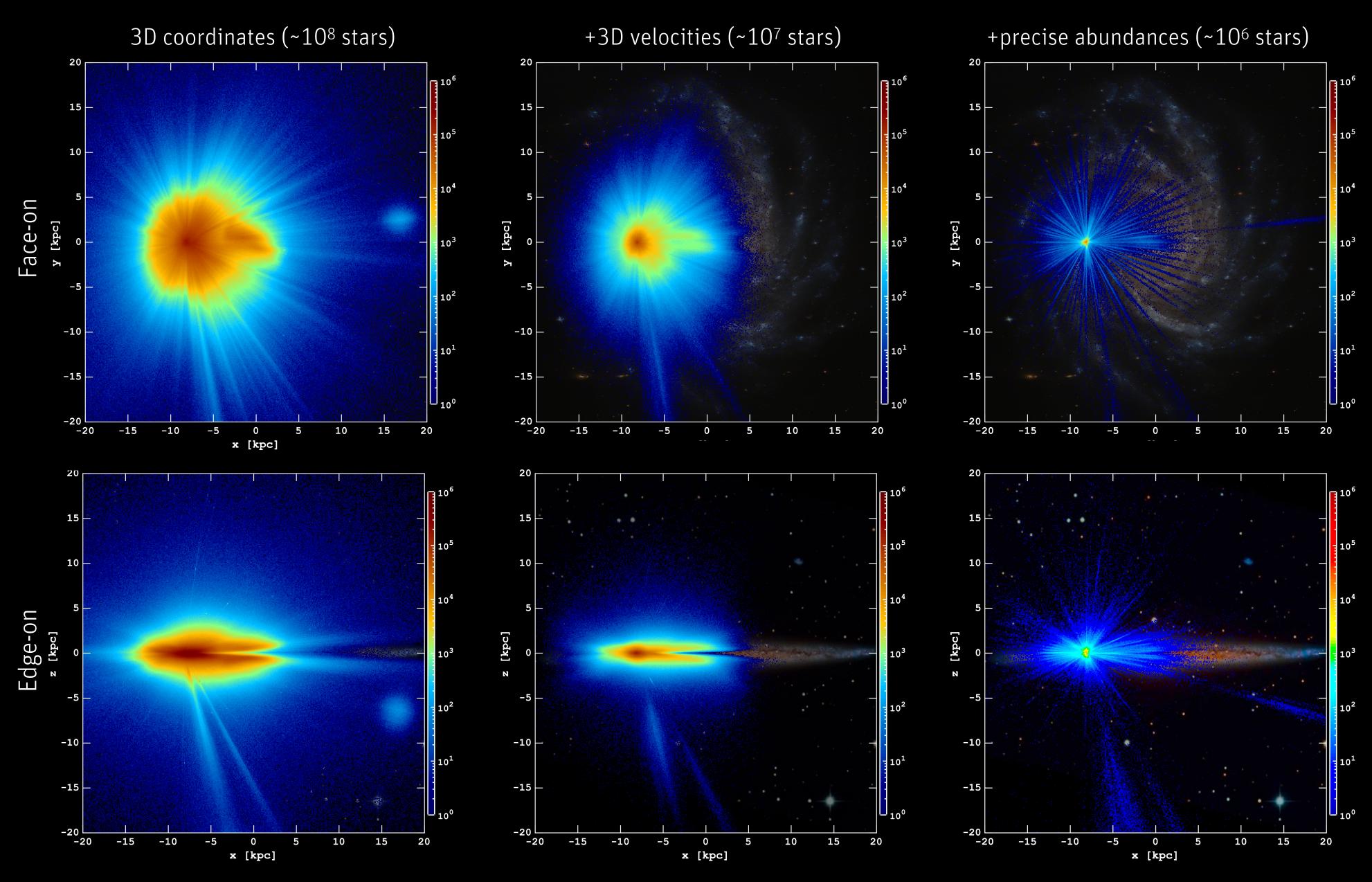
# Milky Way disc coverage



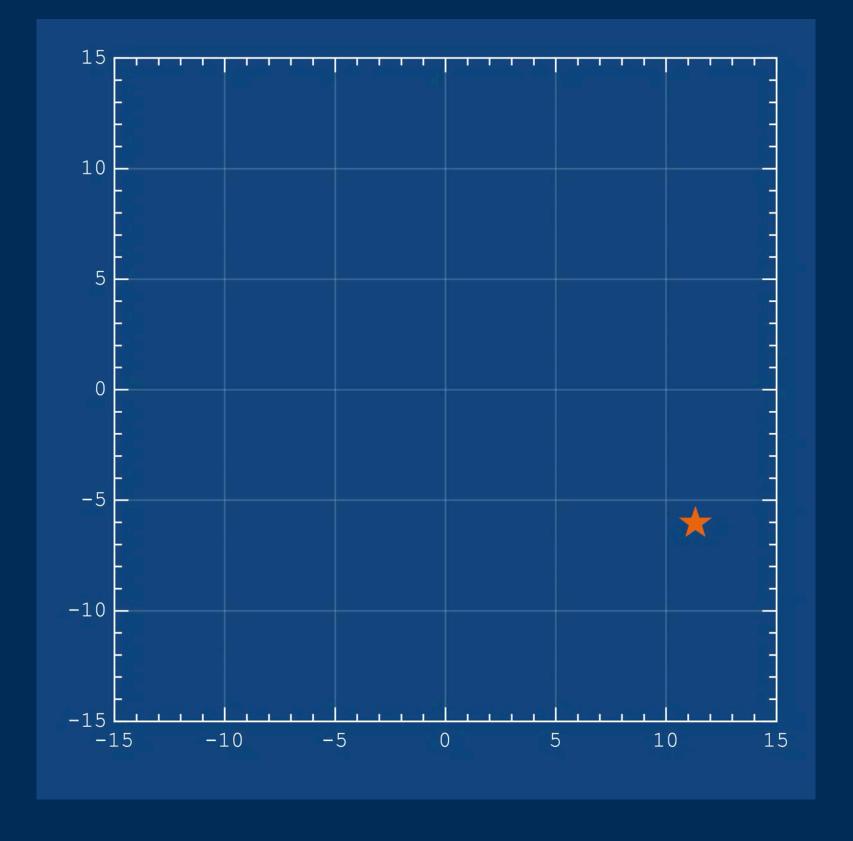
# Milky Way disc coverage



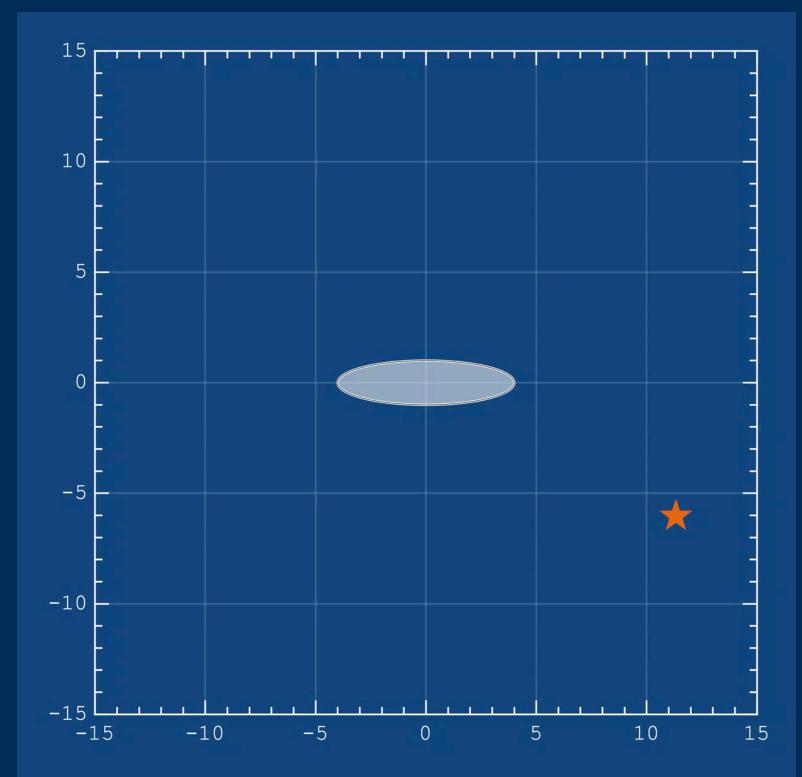
# Milky Way disc coverage



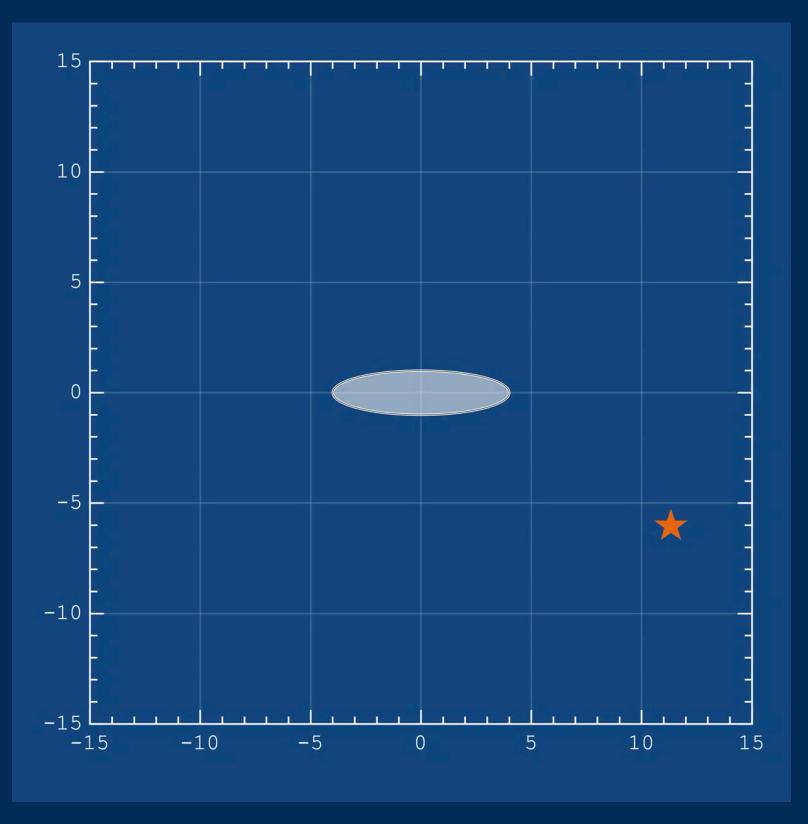
Axisymmetric potential



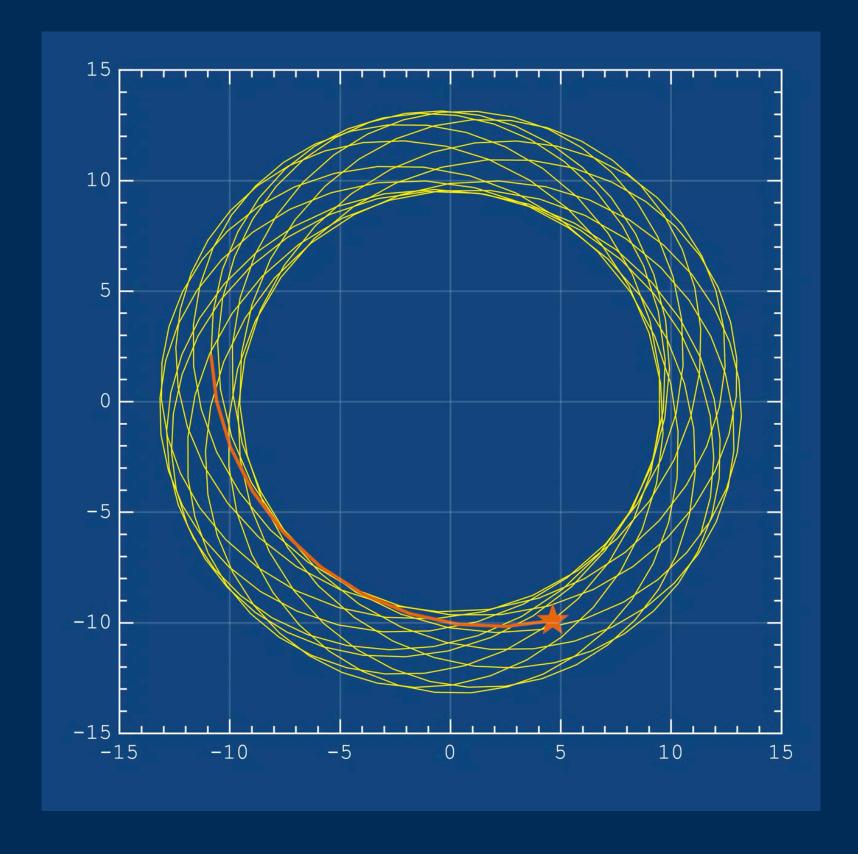
Barred potential inertial rest frame



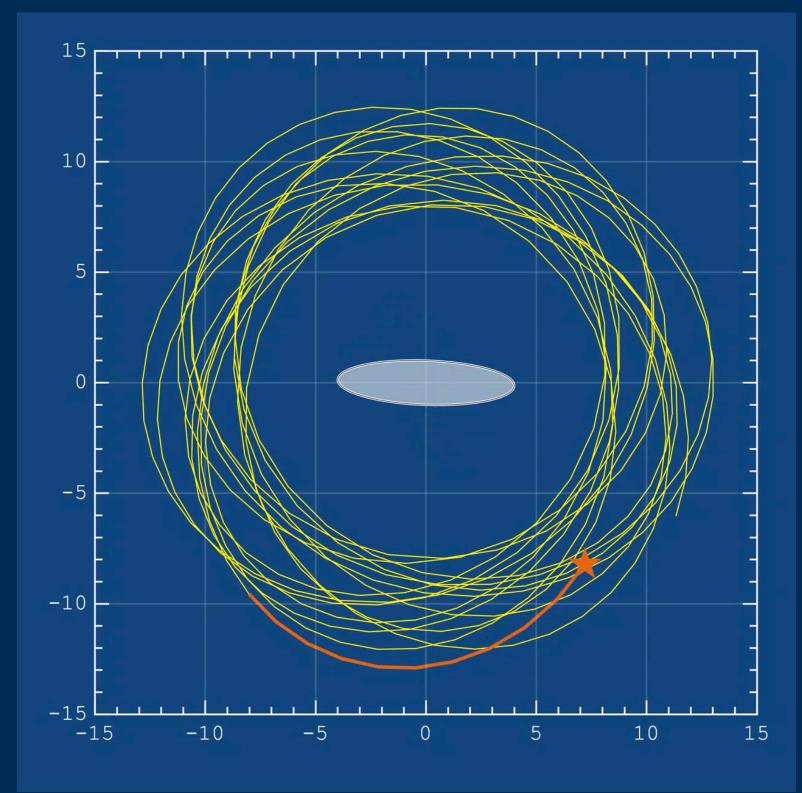
Barred potential rotating rest frame



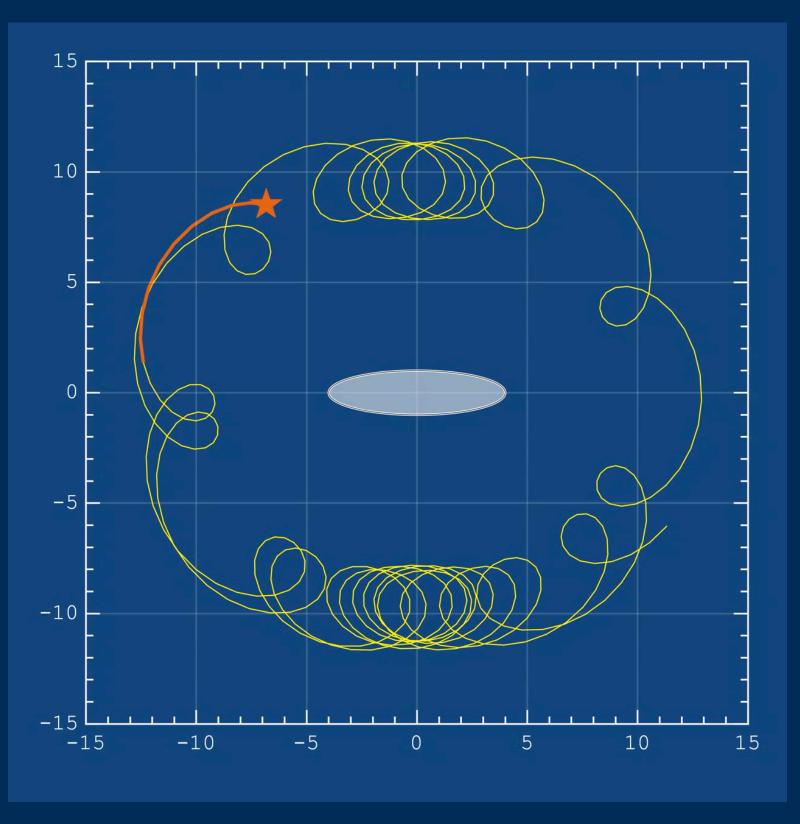
Axisymmetric potential

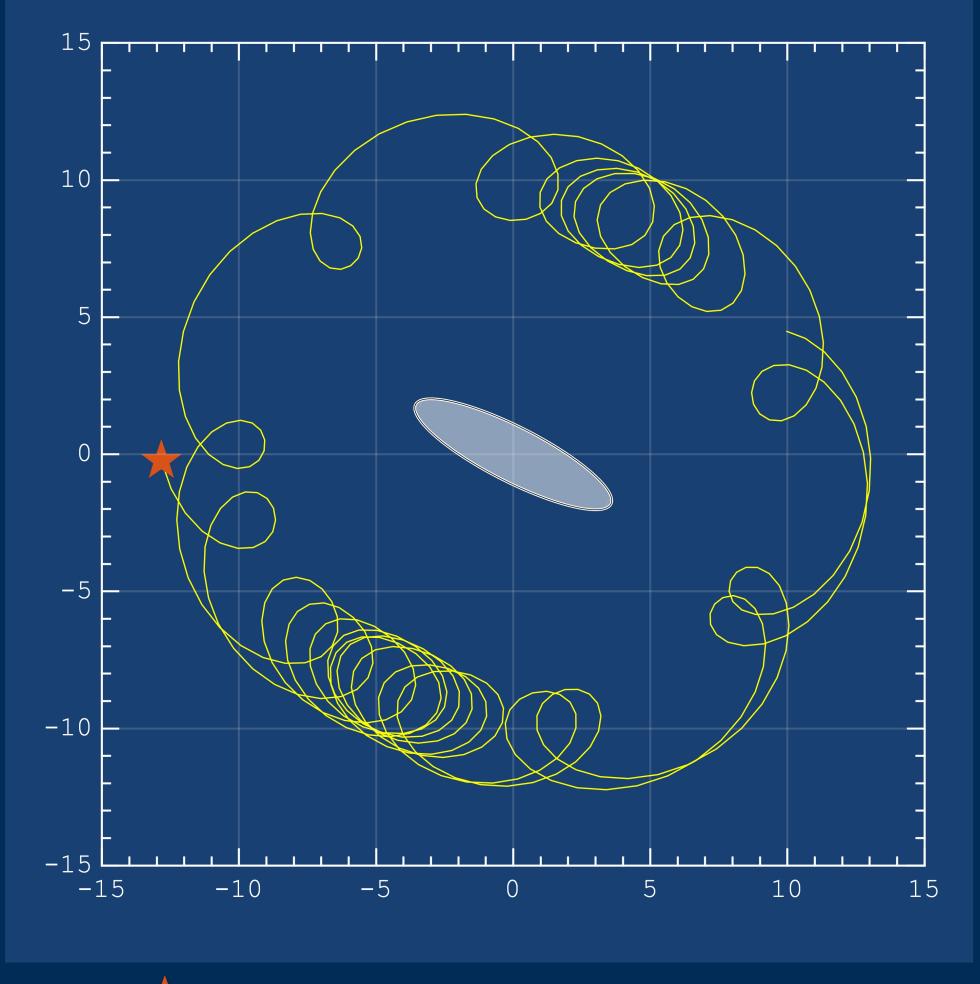


Barred potential inertial rest frame



Barred potential rotating rest frame

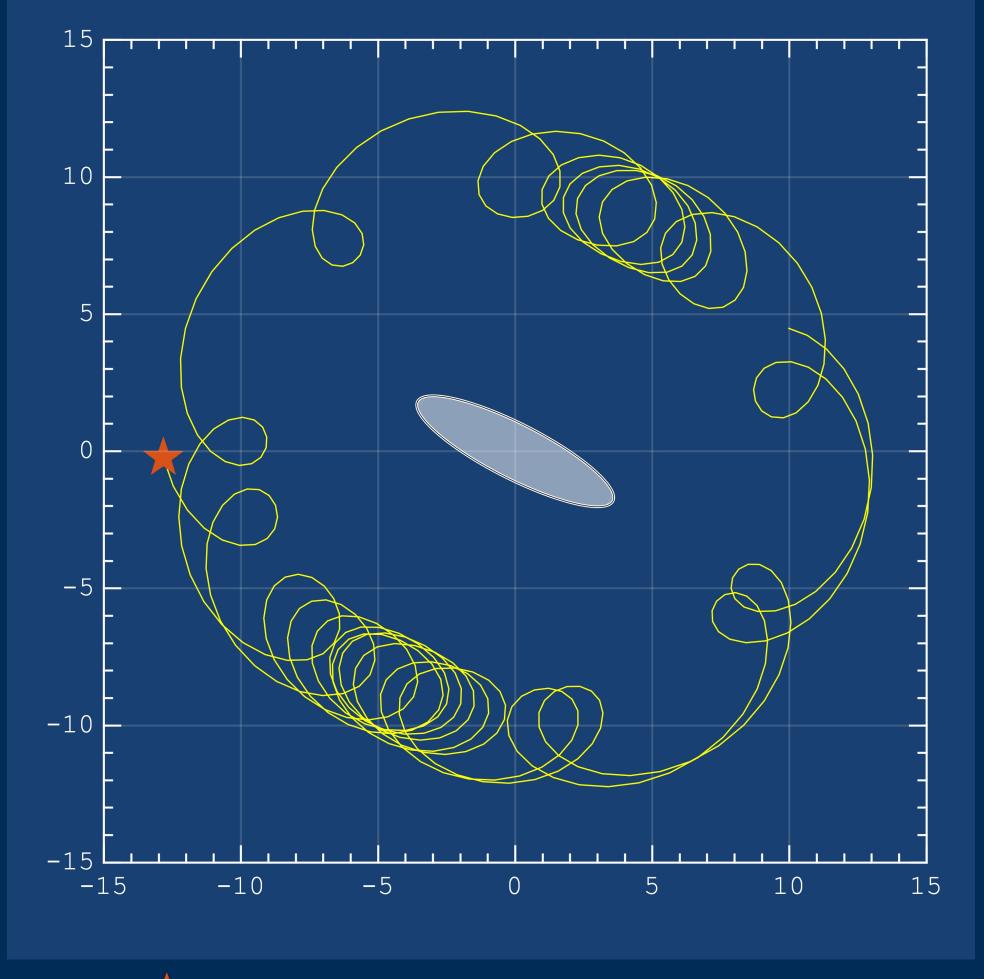


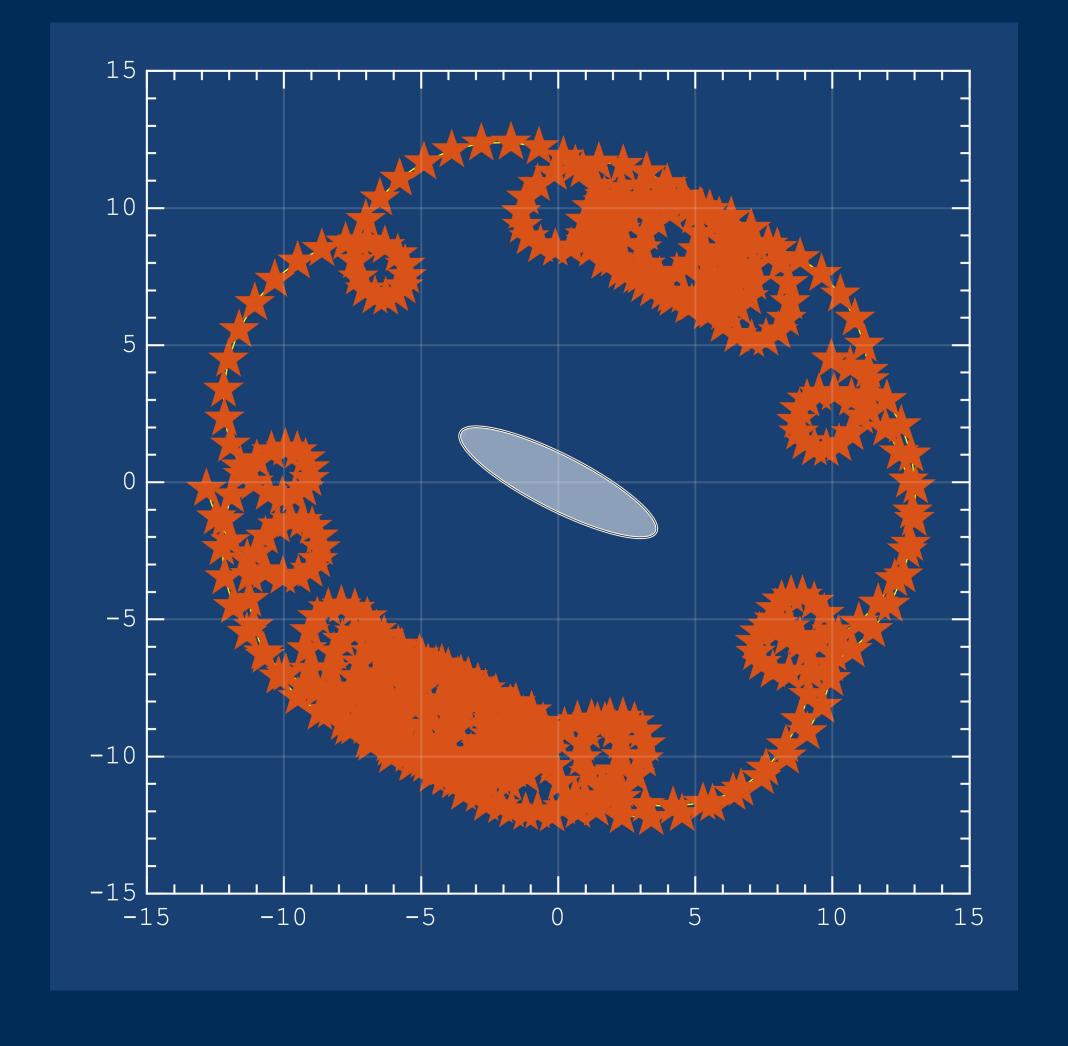




Observed star with 6D phase-space information

Orbit of the star - nositions of the star in the nast

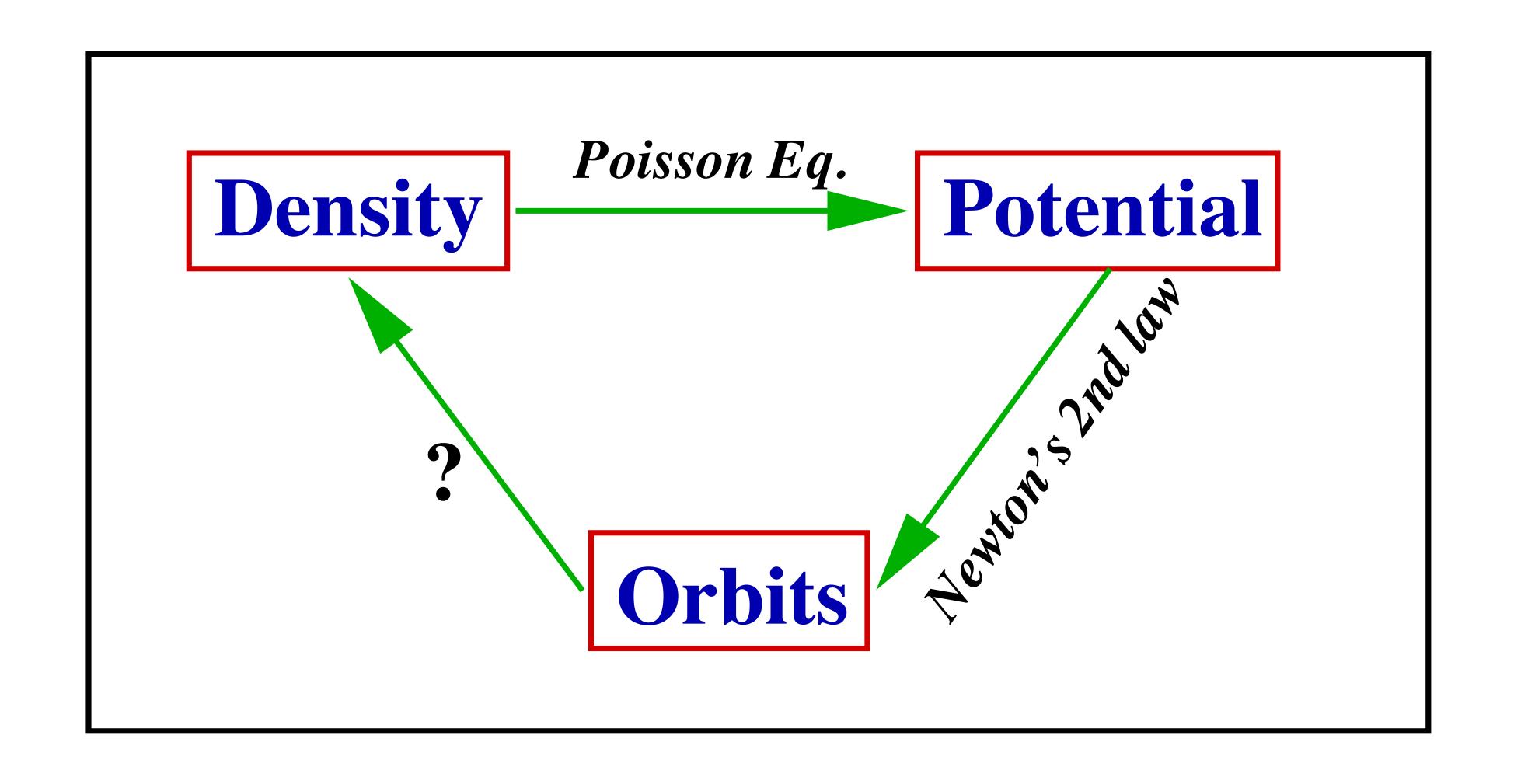




Observed star with 6D phase-space information

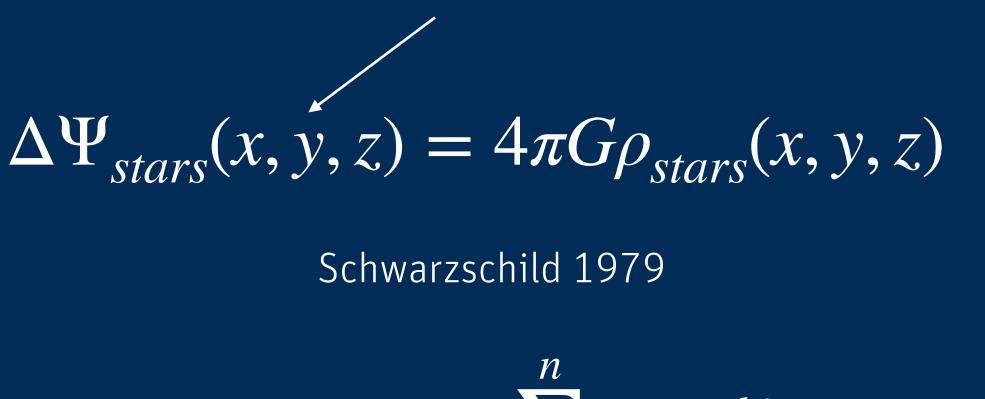
Orbit of the star — positions of the star in the past

"Invisible" population of stars following the orbit of a single observed star



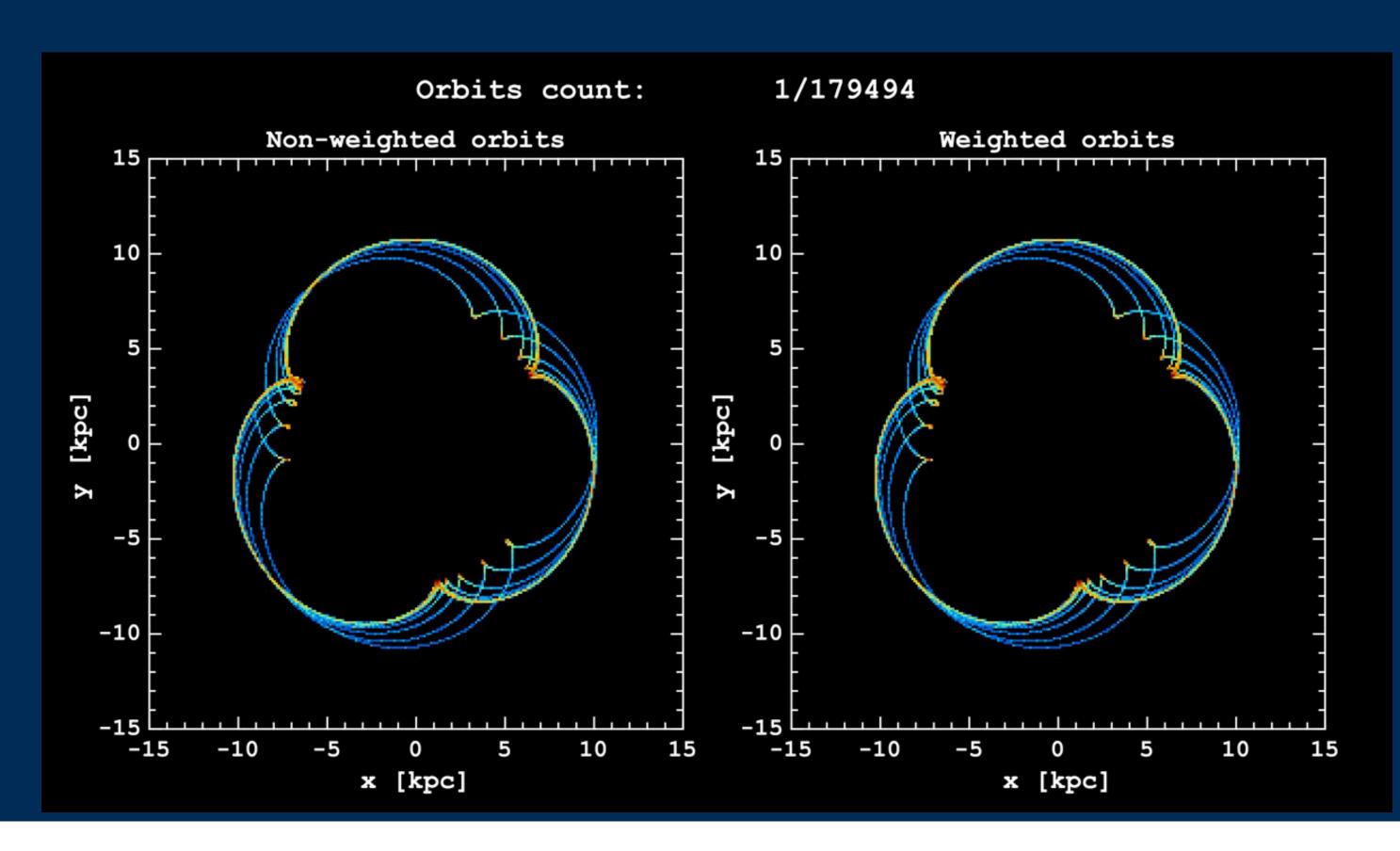
#### Reconstruction of the MW with orbit superposition

$$\Psi_{total}(x, y, z) = \Psi_{stars}(x, y, z) + \Psi_{DM}(x, y, z) + \Psi_{gas}(x, y, z) + \dots$$



$$ho_{stars}(x,y,z) = \sum_{i=1}^n w_i 
ho_i^{orbit}(x,y,z)$$
 $\Psi_{total}(x,y,z)$  + 6D phase-space MW data

APOGEE data + 3D MW potential from Portail+2017 & Sormani+2022

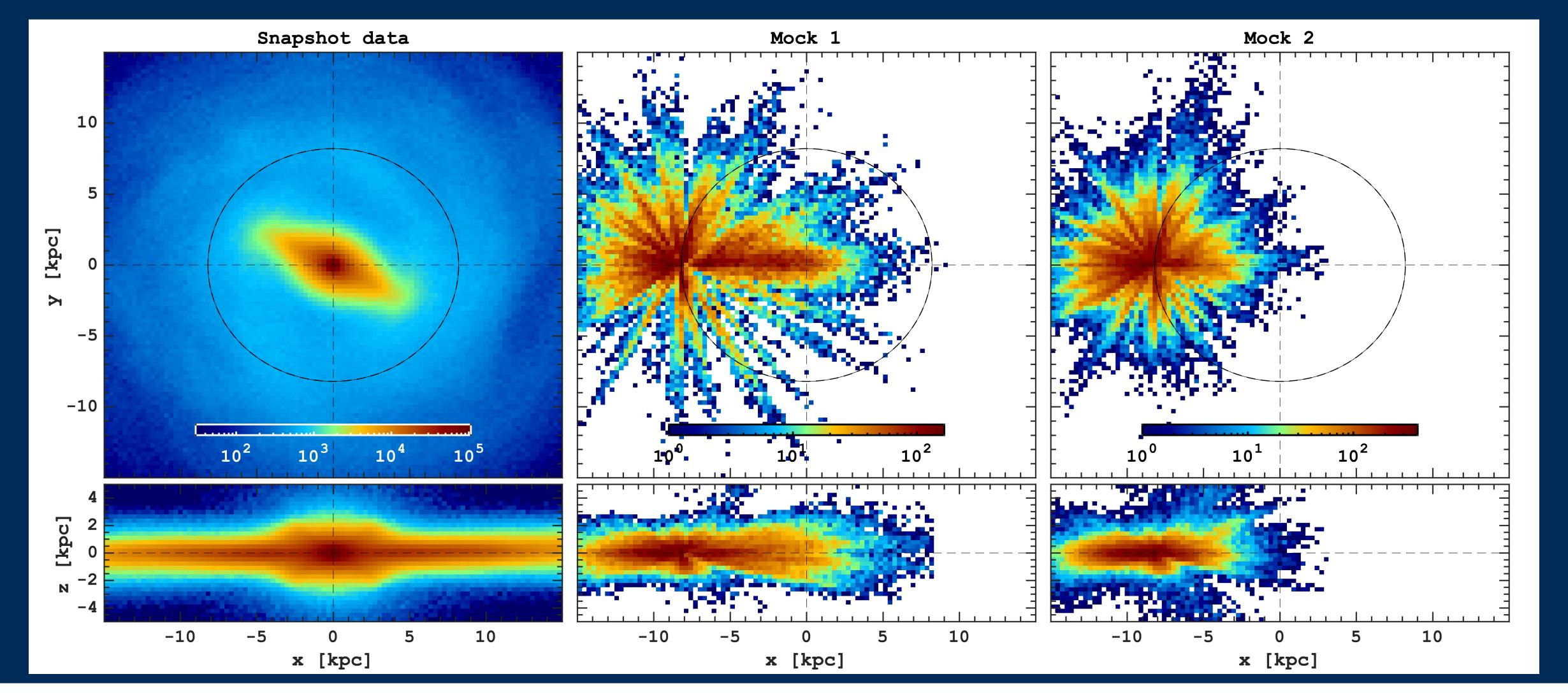


#### Testing orbit superposition on mock galaxy

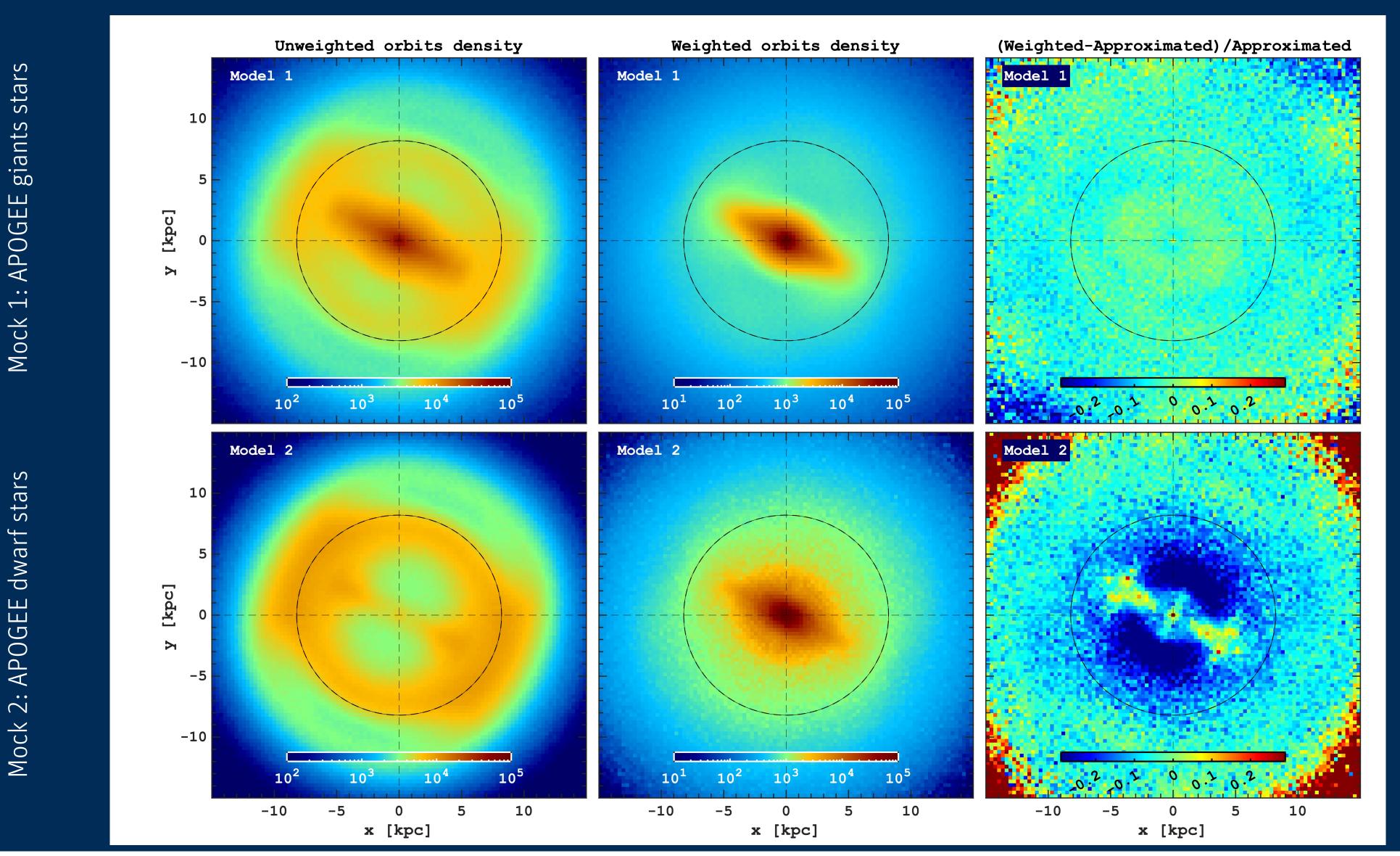
Complete simulation data

Mock 1: APOGEE giants stars

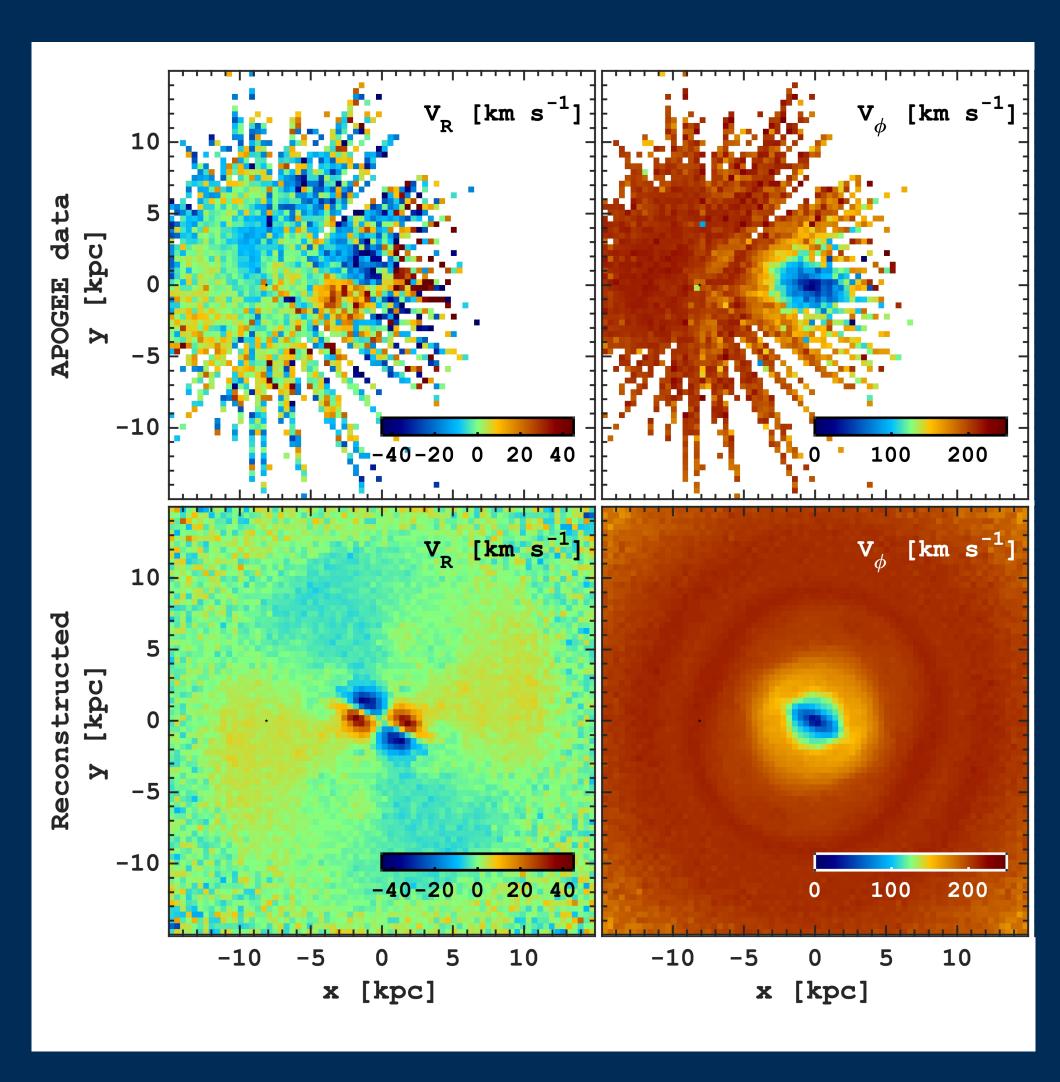
Mock 2: APOGEE dwarf stars



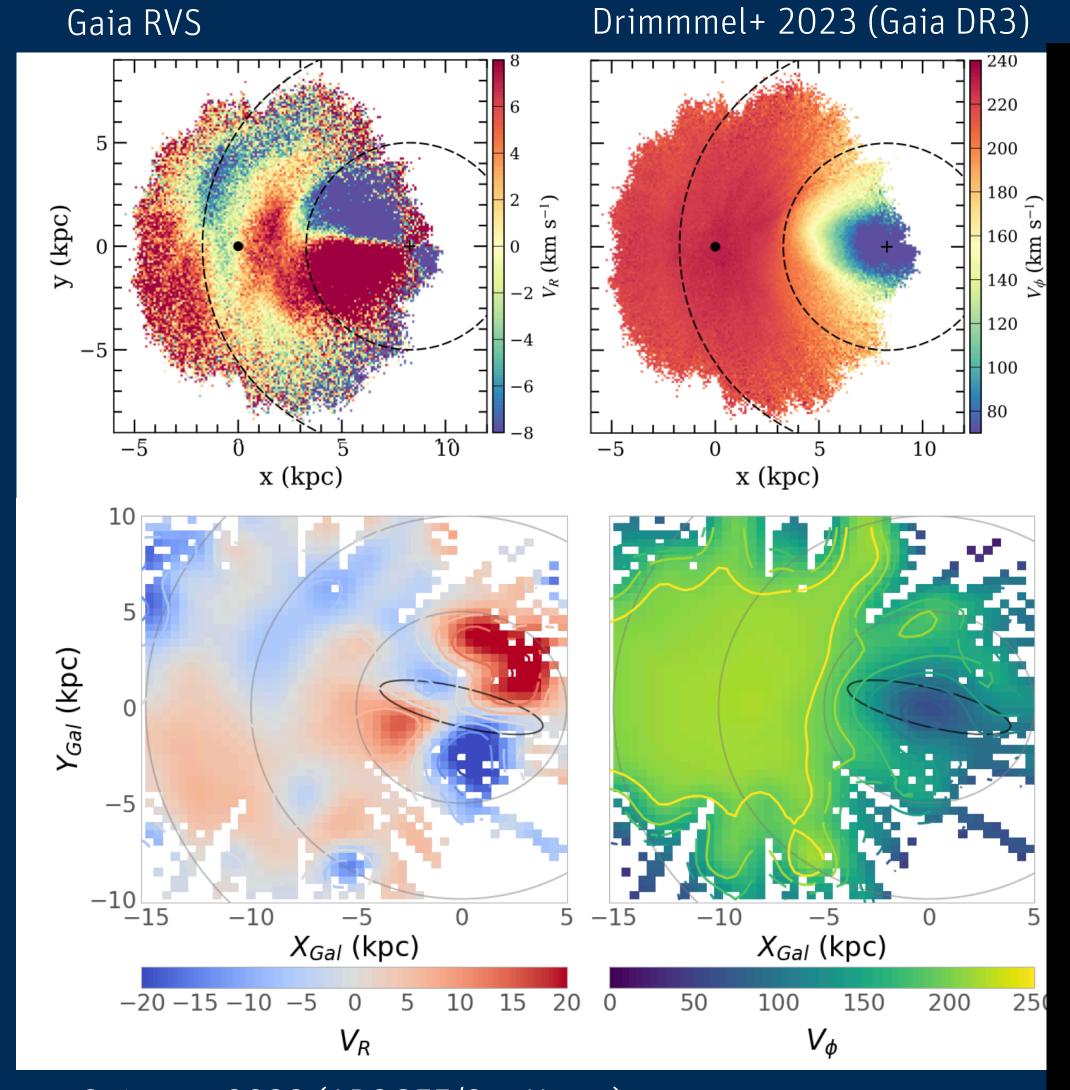
## Testing orbit superposition on mock galaxy



#### MW disc reconstructed kinematics vs Gaia/StarHorse

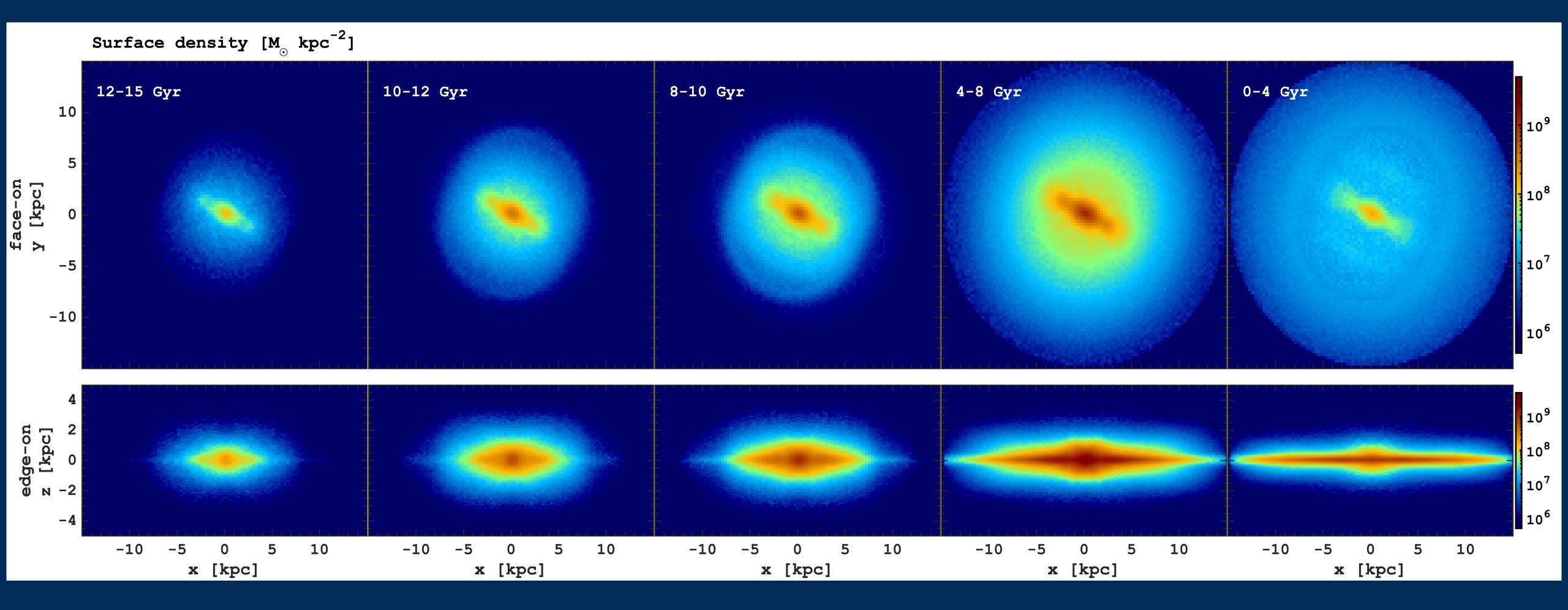


Khoperskov+ 2024b



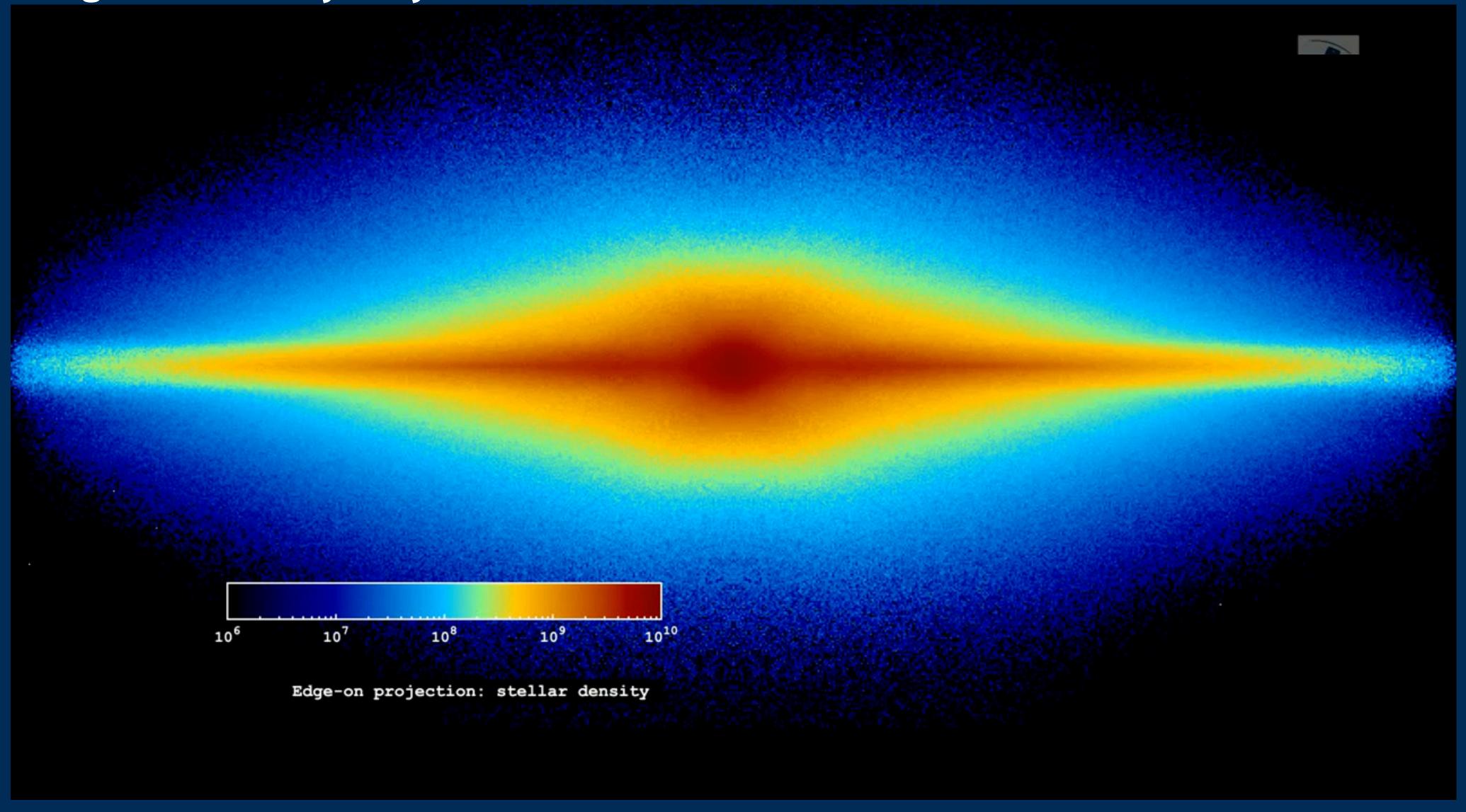
Quieroz+ 2022 (APOGEE/StarHorse)

## Age structure of the MW disc

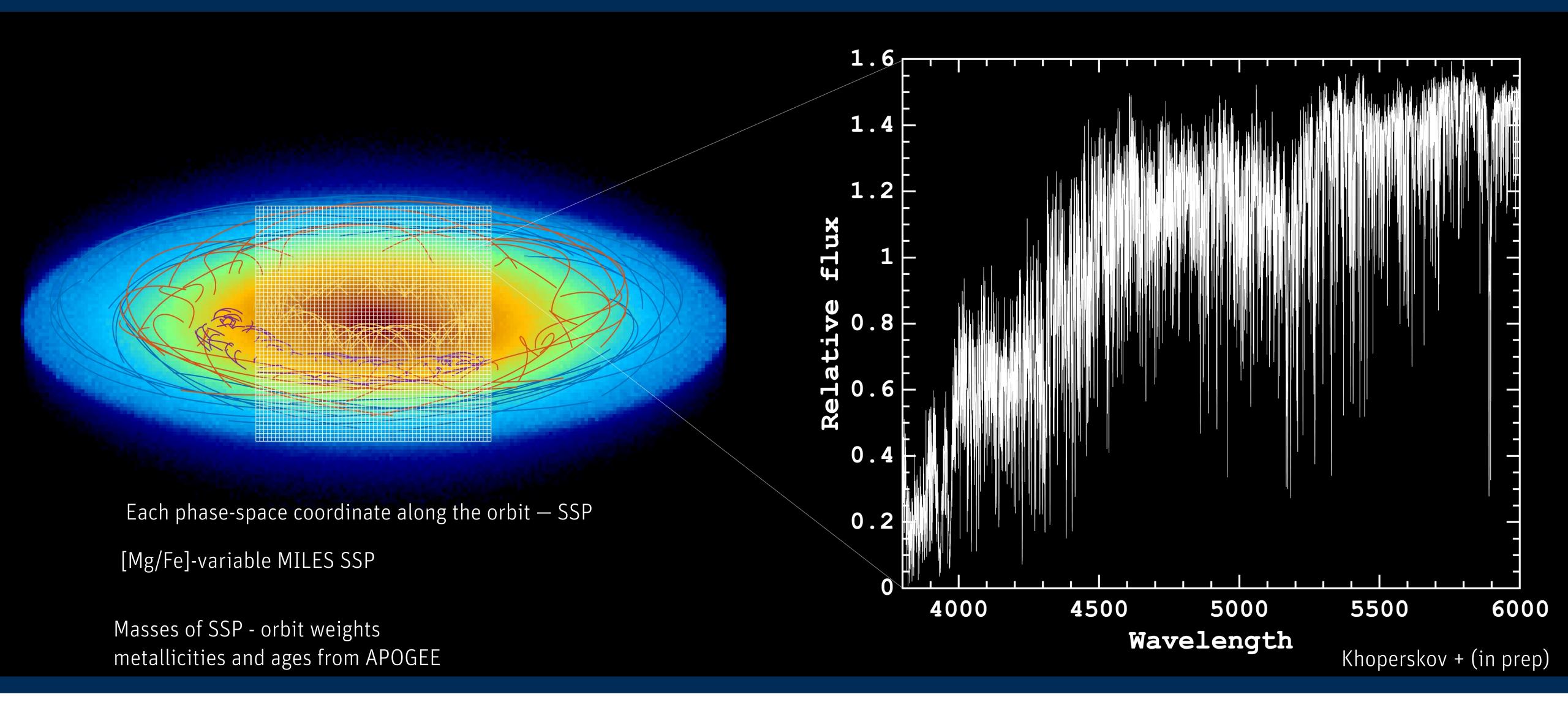


Khoperskov, MS+ 2024b

The extragalactic Milky Way

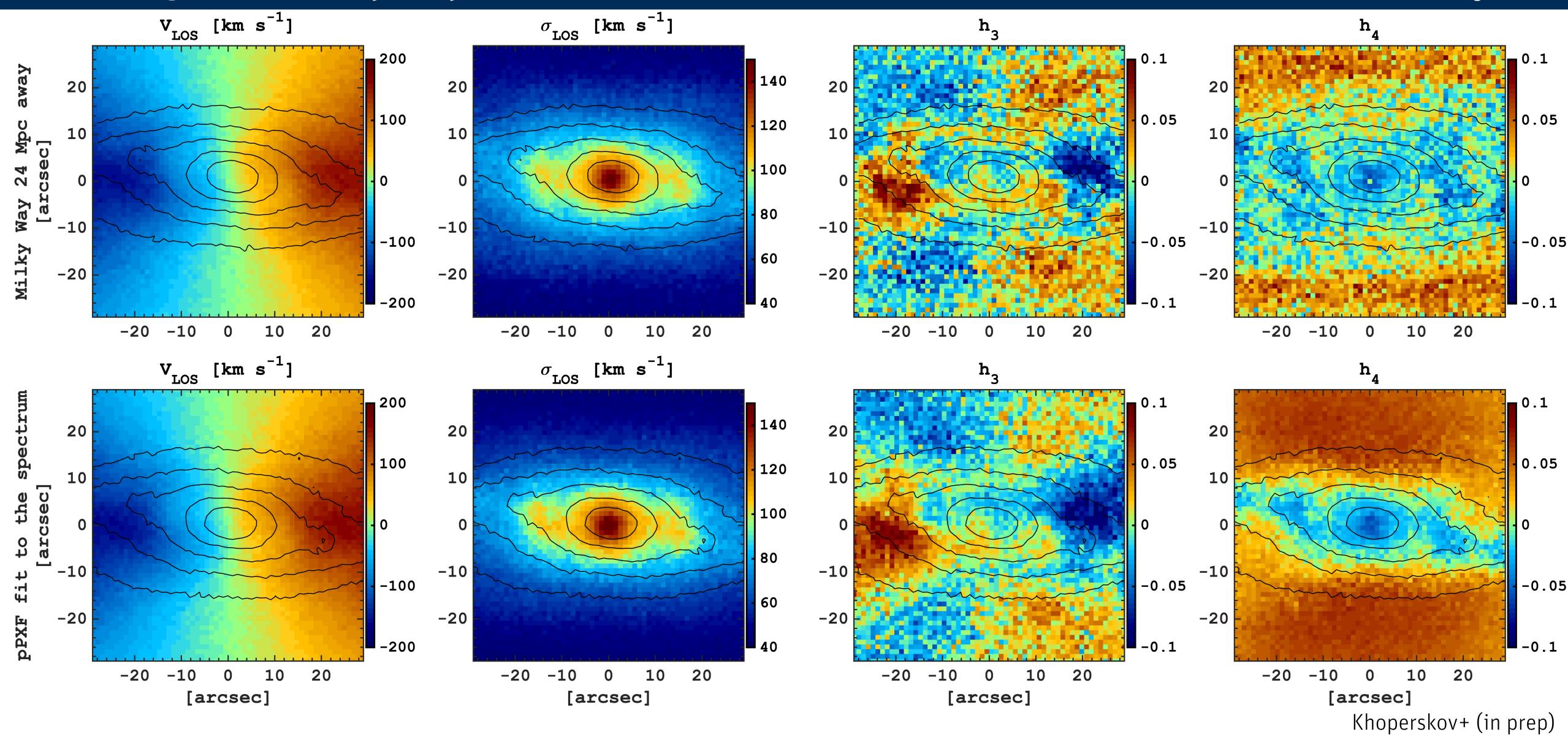


## Milky Way: mock IFU observations



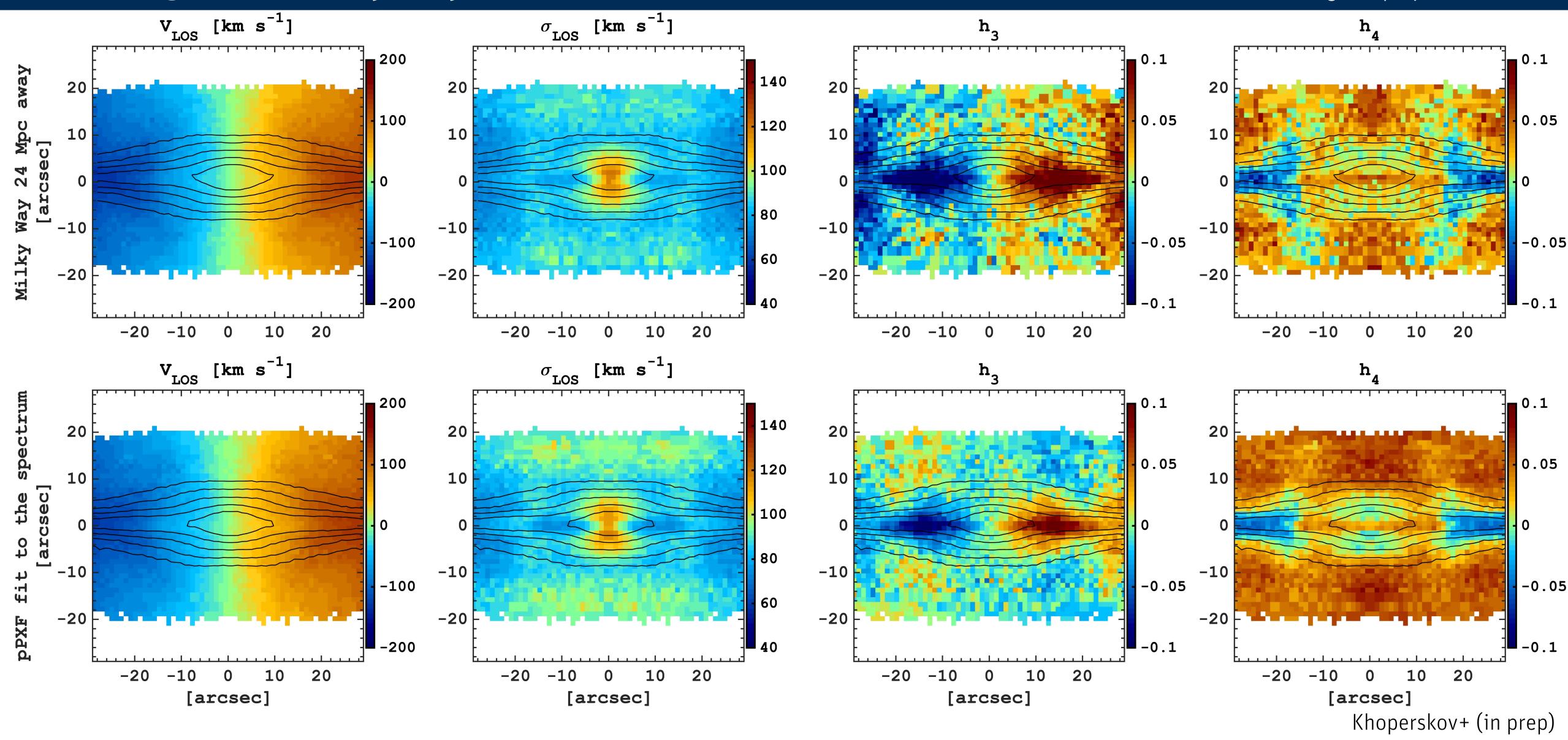
#### Extragalactic Milky Way from IFU: kinematics

#### Inclination = 70 deg



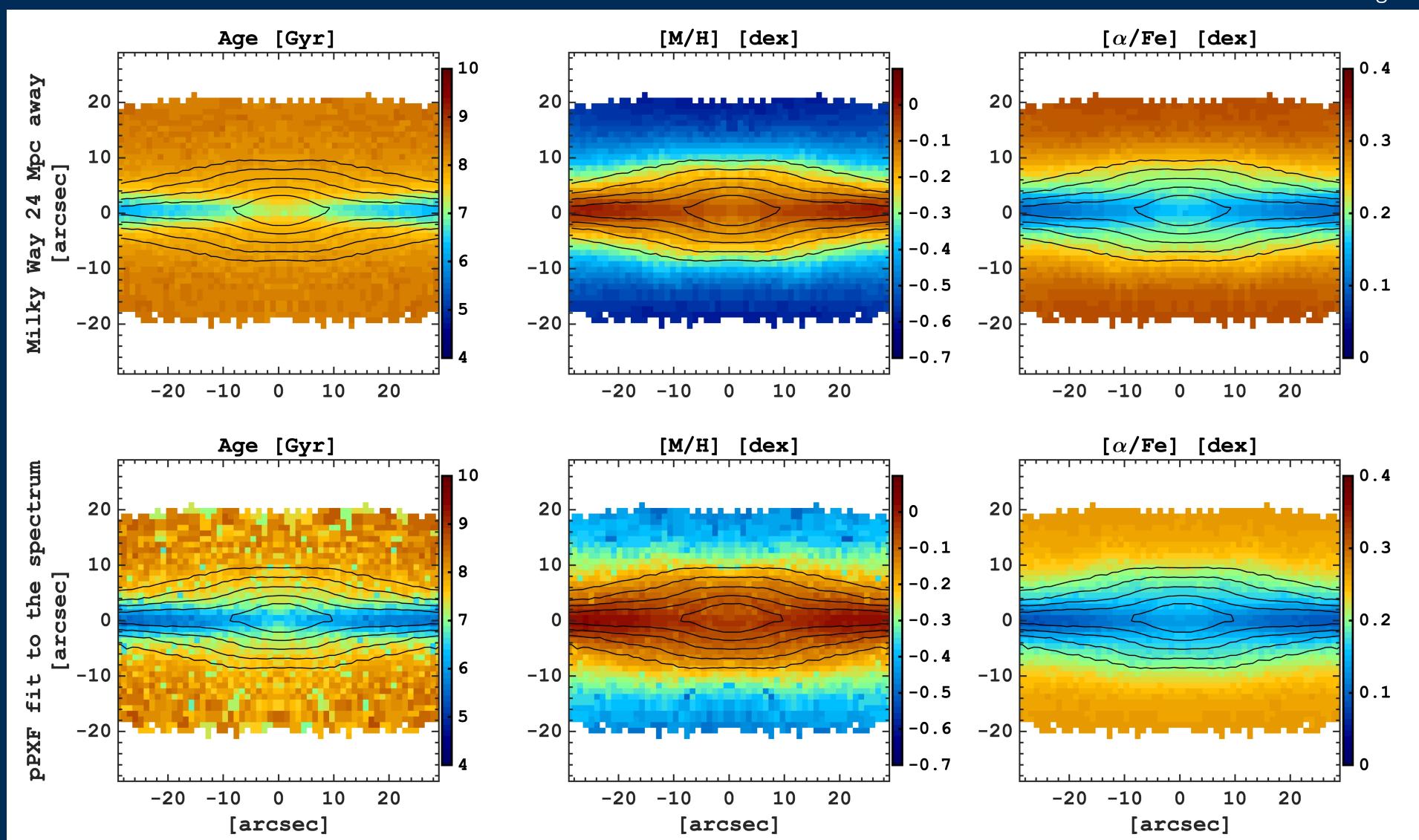
#### Extragalactic Milky Way from IFU: kinematics

#### Edge-on projection



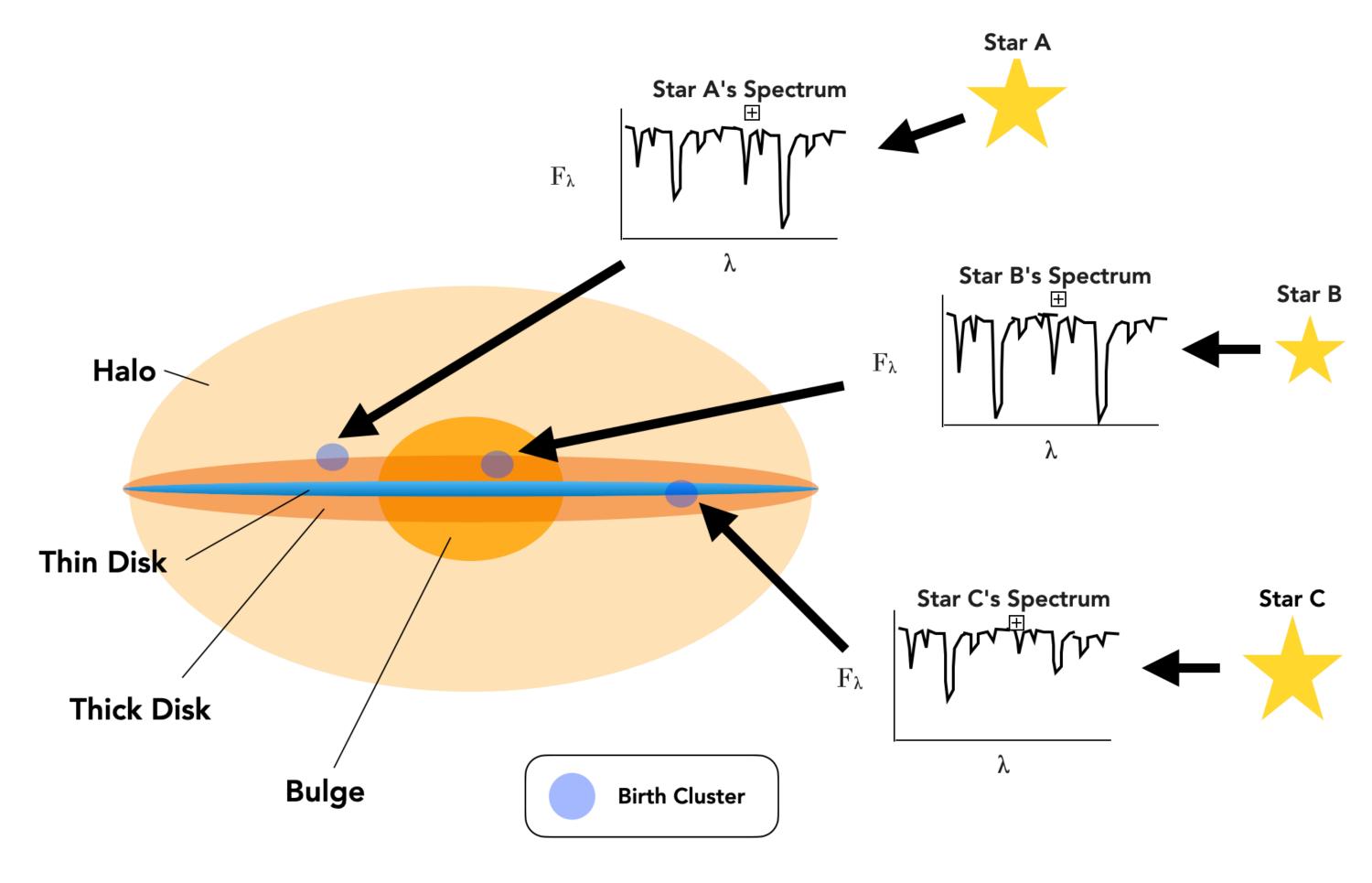
## Extragalactic Milky Way: chemical composition

Edge-on projection



Khoperskov+ (in prep)

#### The goal: Chemical tagging



- Chemical tagging: Use the chemical properties of stars to backtrace their birth cluster. As they formed from the same birth cloud, they should have similar, if not identical abundances
- Level to which this is possible, still needs to be proven

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# 4MOST – 4m Multi-Object Spectroscopic Telescope

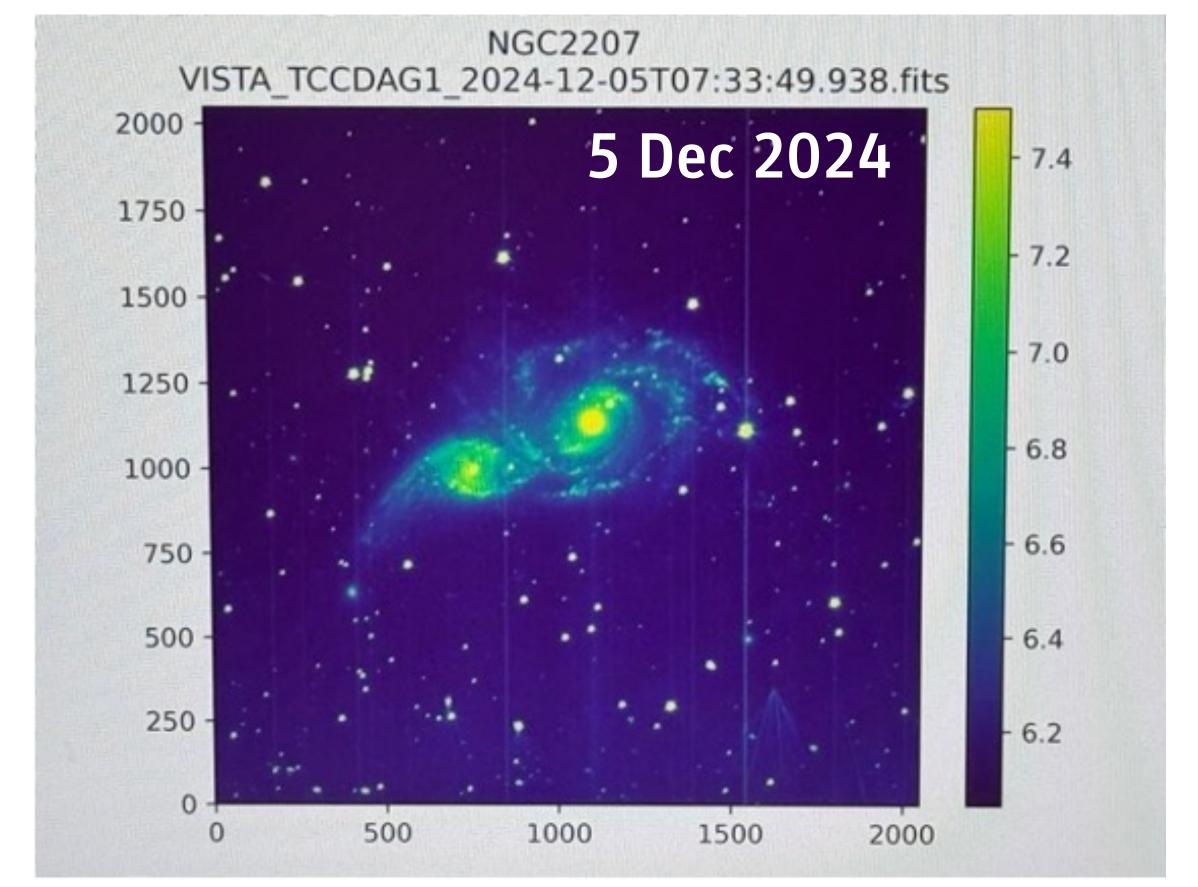




#### **Instrument Characteristics**

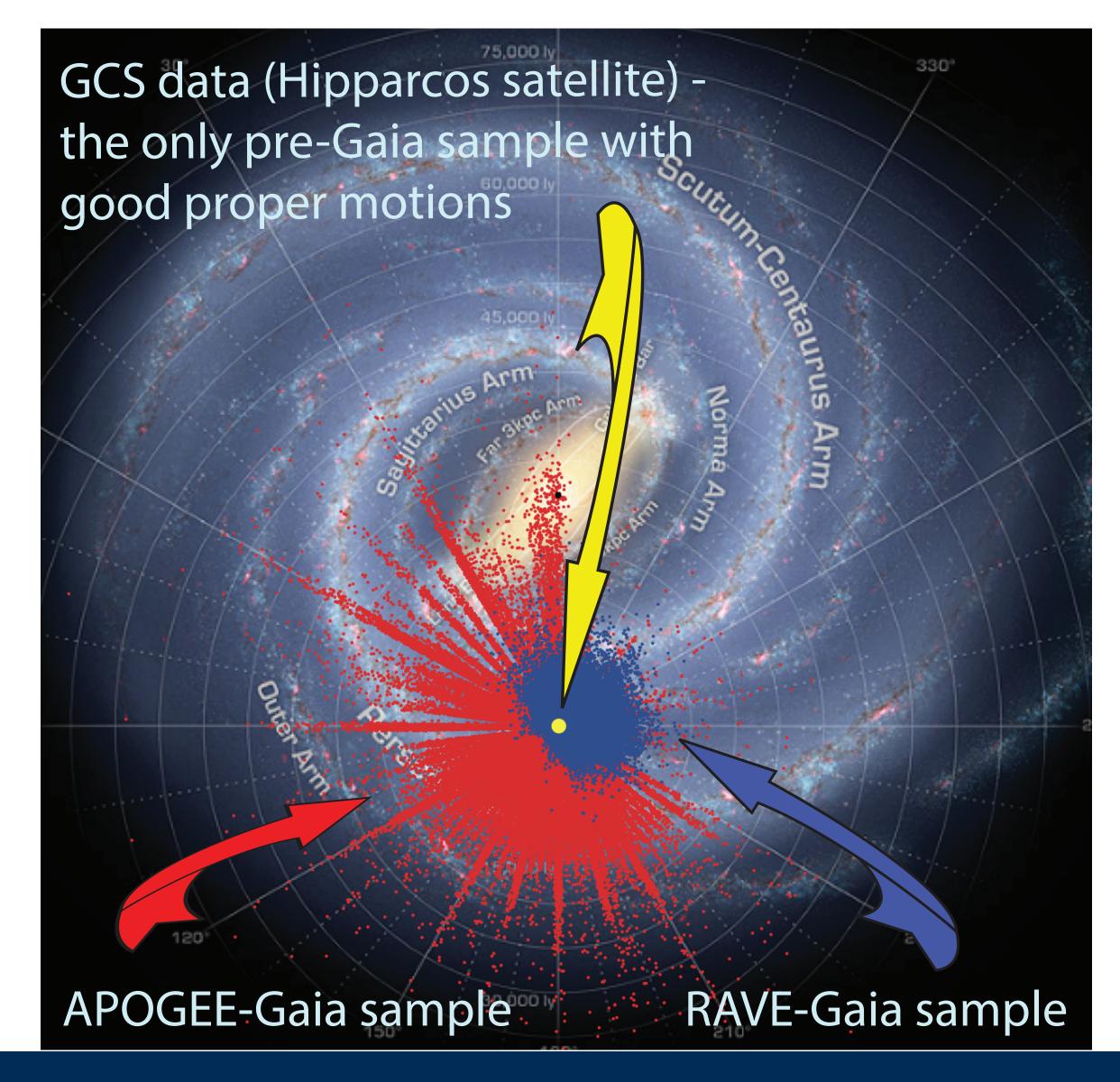
Specification	Design value
Field-of-View (hexagon)	~4.2 degree <sup>2</sup> ( $\varnothing$ > 2.6°)
Multiplex fiber positioner	2436
Medium Resolution Spectrographs (2x) # Fibres Passband Velocity accuracy Spectral sampling (pixels/FWHM)	R~4000-7500 812 fibres (2x) 370-950 nm < 1 km/s > 2.8 pixels
High Resolution Spectrograph (1x) # Fibres Passband Velocity accuracy Spectral sampling (pixels/FWHM)	R~20,000 812 fibres 392.6-435.5 nm, 516-573 nm, 610-679 nm < 1 km/s > 2.56 pixels
# of fibers in $\emptyset$ =2' circle	> 3
Fibre diameter	$\varnothing$ =1.42 arcsec



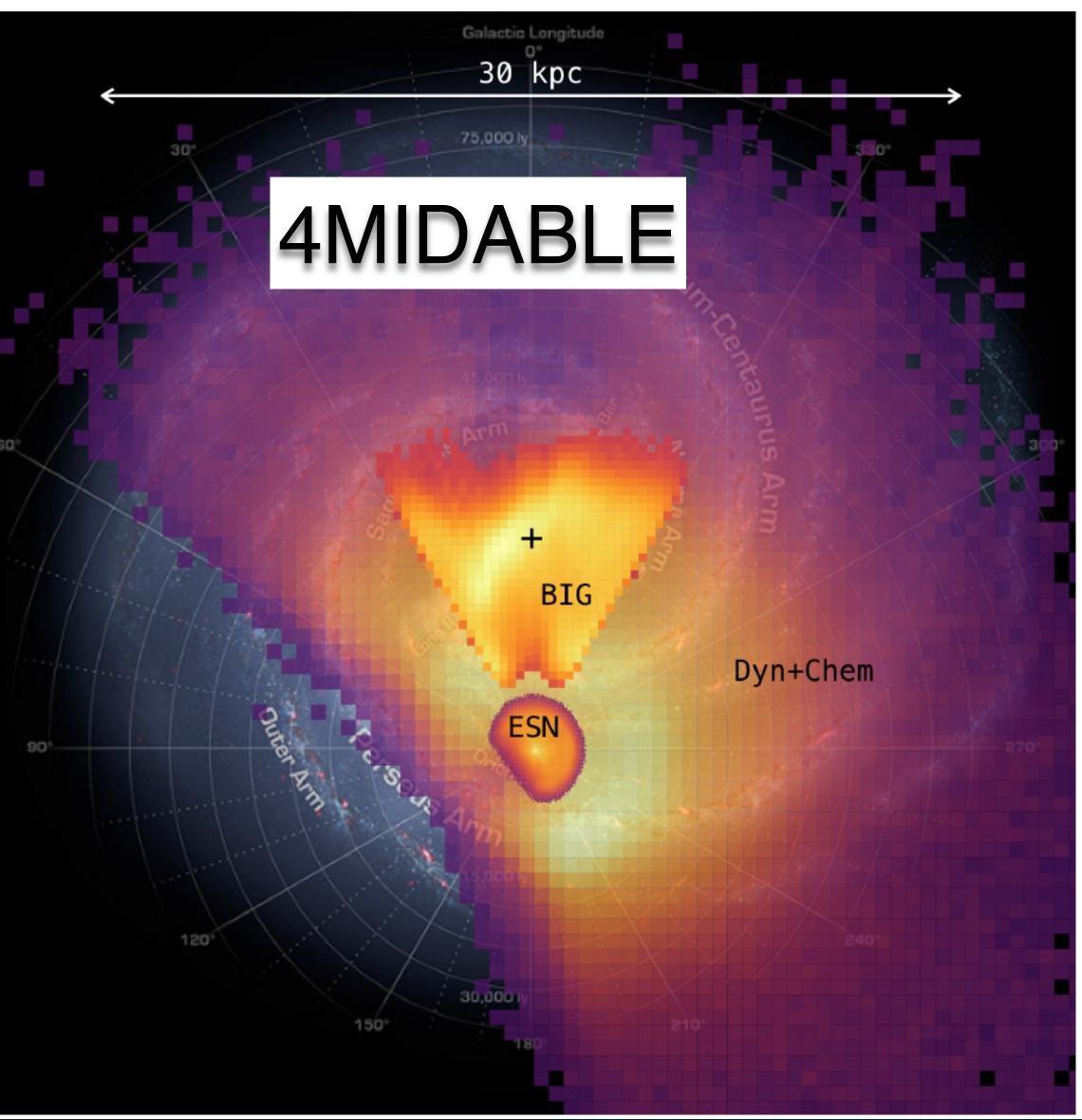




#### 2025: Gaia + RAVE + APOGEE + ...



## Starting 2026: Gaia and 4MOST





# Summary and Conclusion

- Ongoing revolution in stellar science driven by Gaia  $\Rightarrow$  "precision stellar science"
- We can chemically map fair fractions of the MW and reach out to its satellite system
- We can use Scharzschild's method to
  - map into Galaxia incognita
  - analyze the Milky Way as it would be an external galaxy
- Critical feature: base data needs to adequately sample relevant orbital families
- Soon to come: Massive systematic spectroscopic campaigns