

# Photometric ages with Gaia - Studying the Milky Way disc

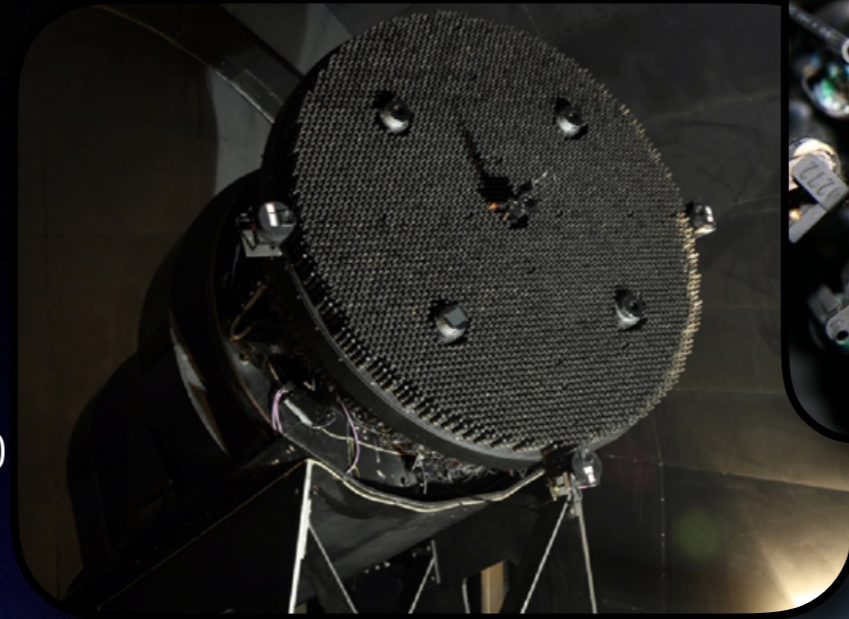
Martin C. Smith  
Shanghai Astronomical Observatory  
KITP - 22nd March 2019



# LAMOST

- A 4m telescope with 4000 fibers across a 20 sq deg field of view, taking  $R \sim 2000$  spectra covering approx. 3,500-9000 Å
  - In 2017 it completed first 5-year survey, obtaining 1M stellar spectra per year, to  $g \sim 16$ th
    - 3.9M unique stars with  $S/N > 20$
    - 1.2M unique stars with  $S/N > 100$
  - Latest public data release is DR4, which is ~70% of the current internal release
- <http://dr4.lamost.org>
- There are caveats (e.g. radial velocity offset) but pipelines are improving. Error estimation is now more reliable.

<http://dr4.lamost.org/doc/The-warning>





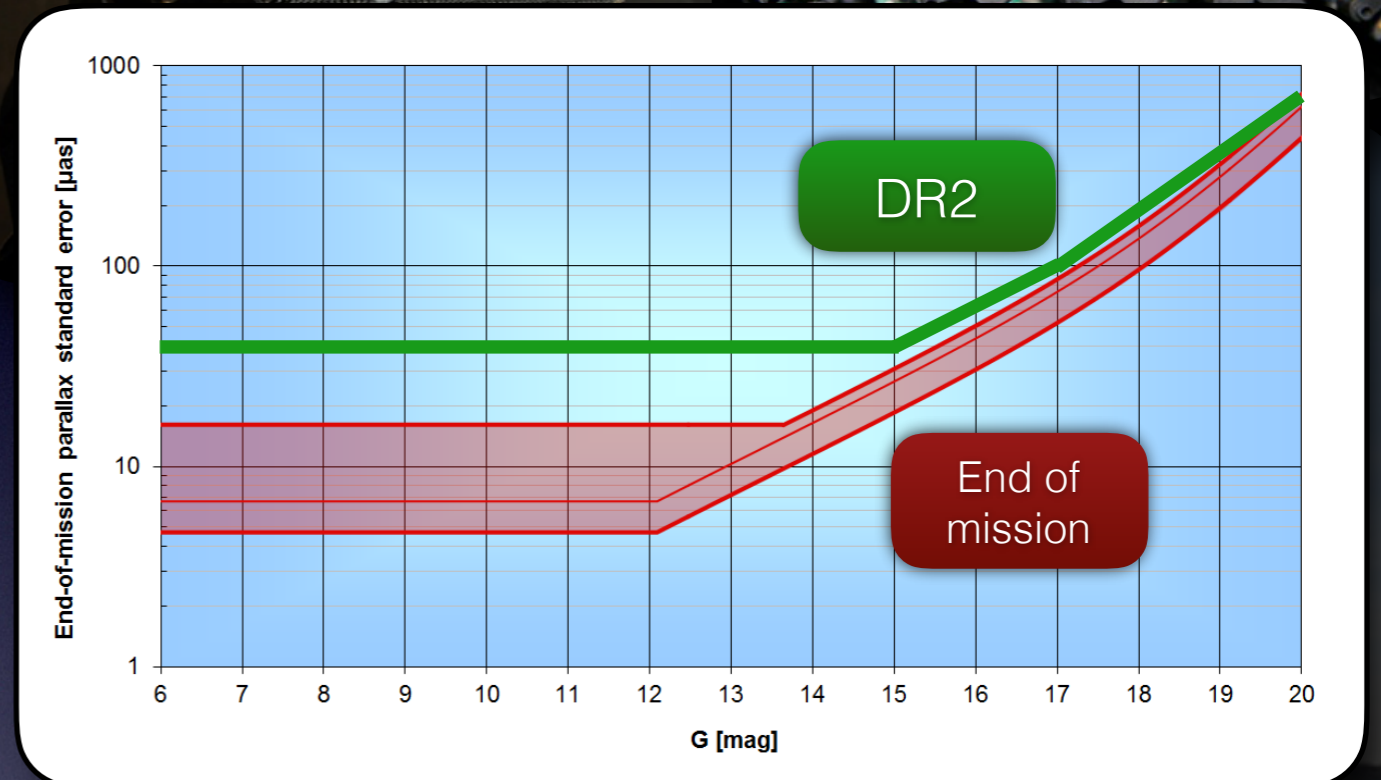
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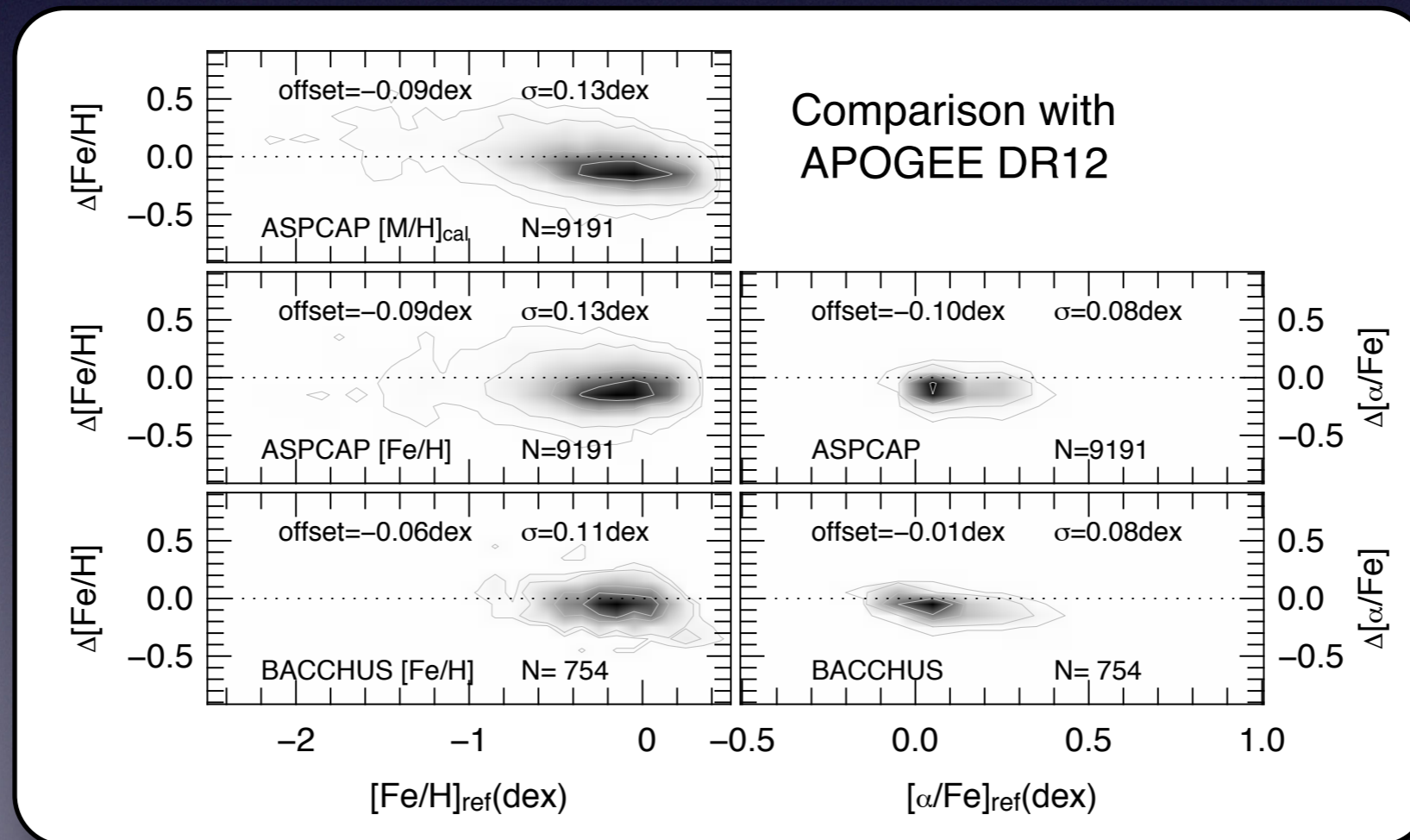
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# LAMOST chemistry

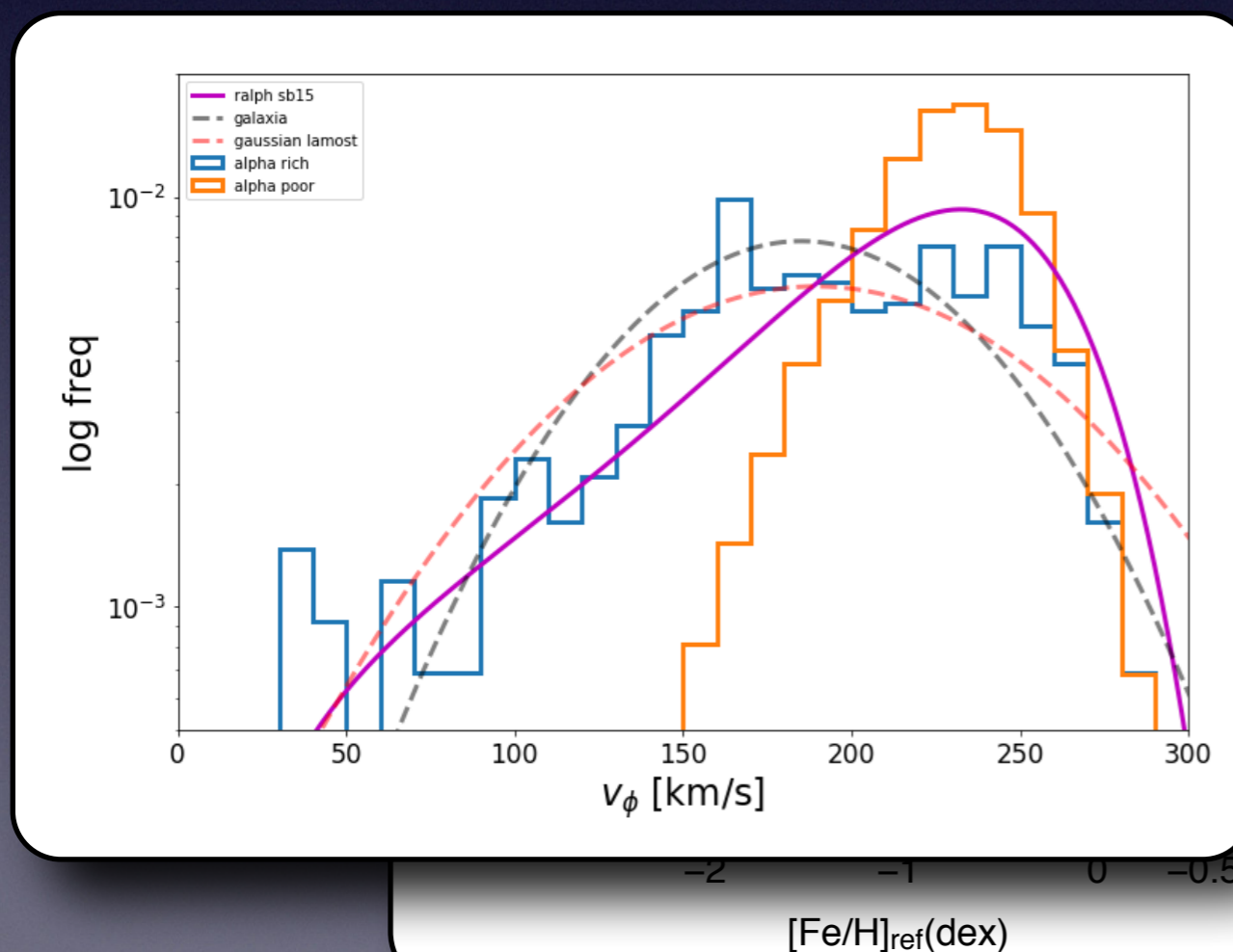
- Corrado Boeche applied his SP\_Ace pipeline to LAMOST, which is based on general curves-of-growth method (Boeche et al. 2018)
- This provides similar precision to the standard LAMOST pipeline (LASP) but with the added benefit of reliable alpha-element abundance to  $\sim 0.1$  dex (NB. alternative data-driven approaches exist, such as Xiang et al. 2017, Ho et al. 2017, Ting et al. 2017)





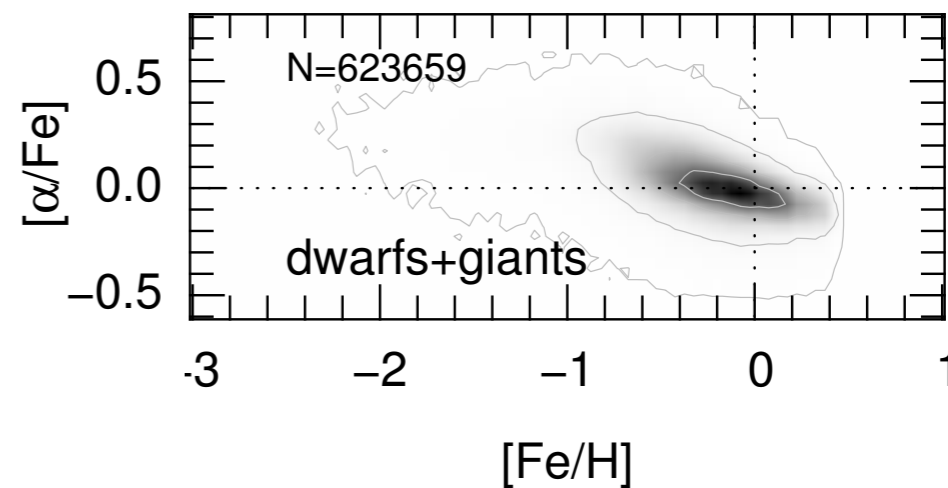
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Comparison with  
APOGEE DR12

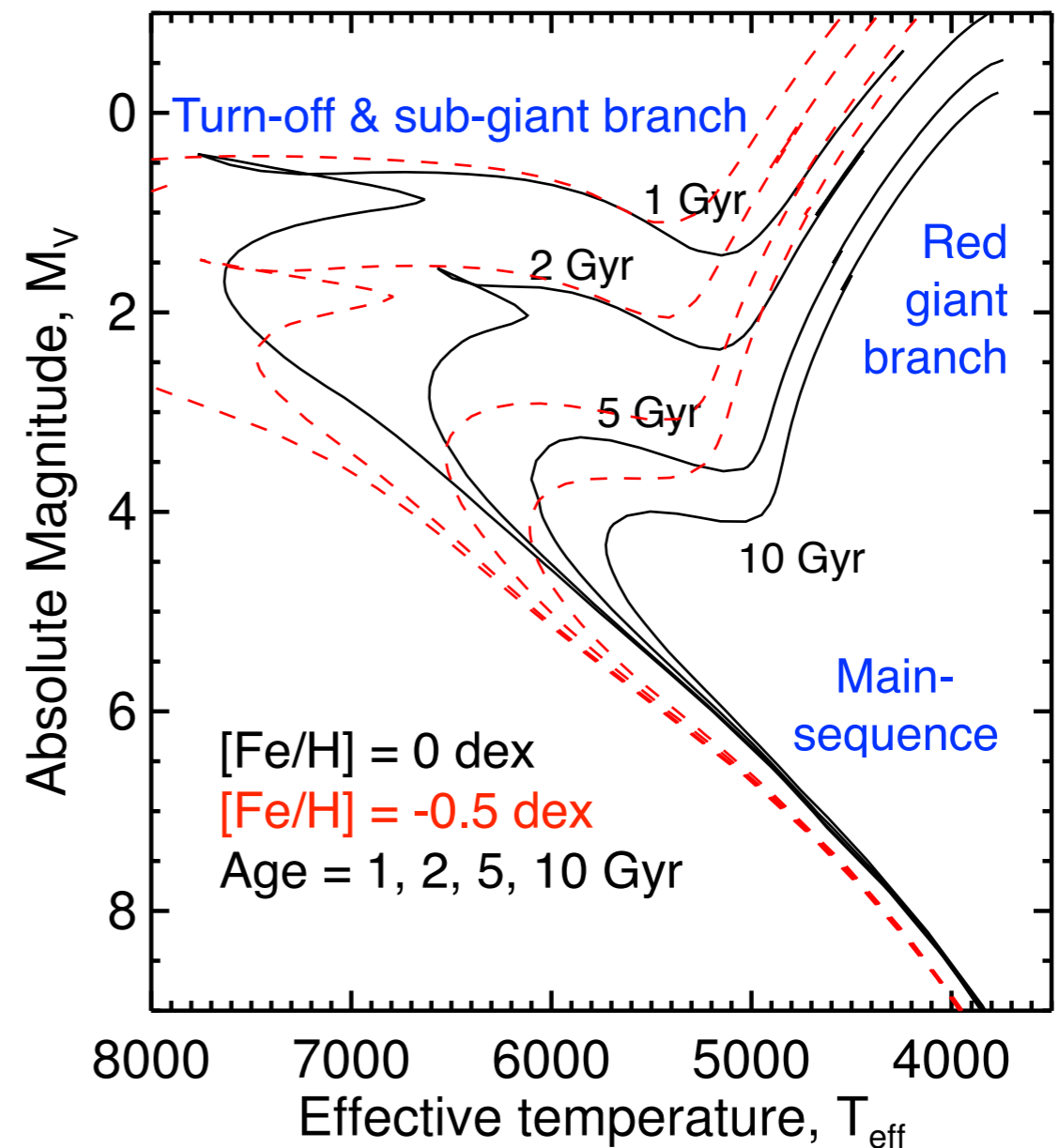
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# Great survey for ages

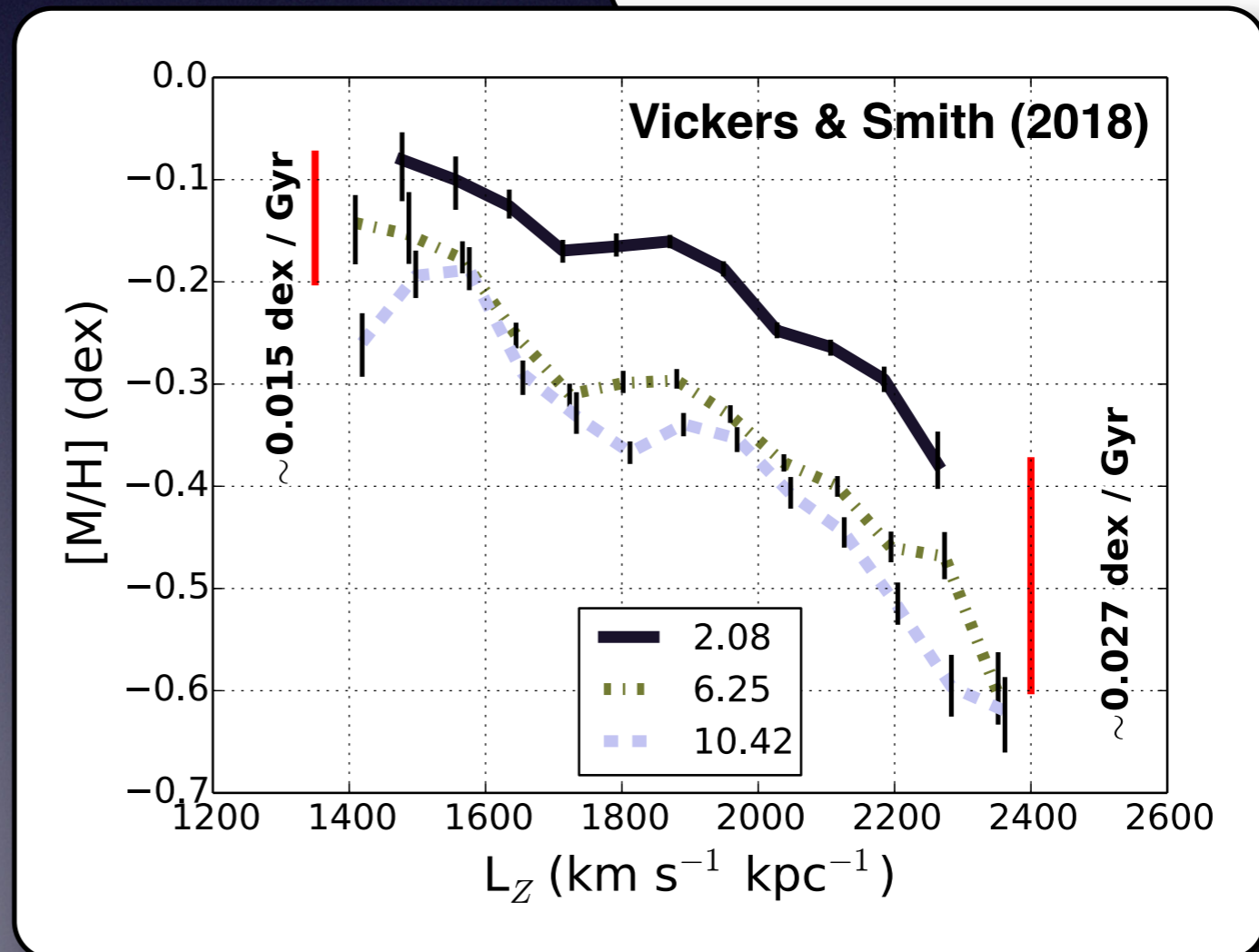
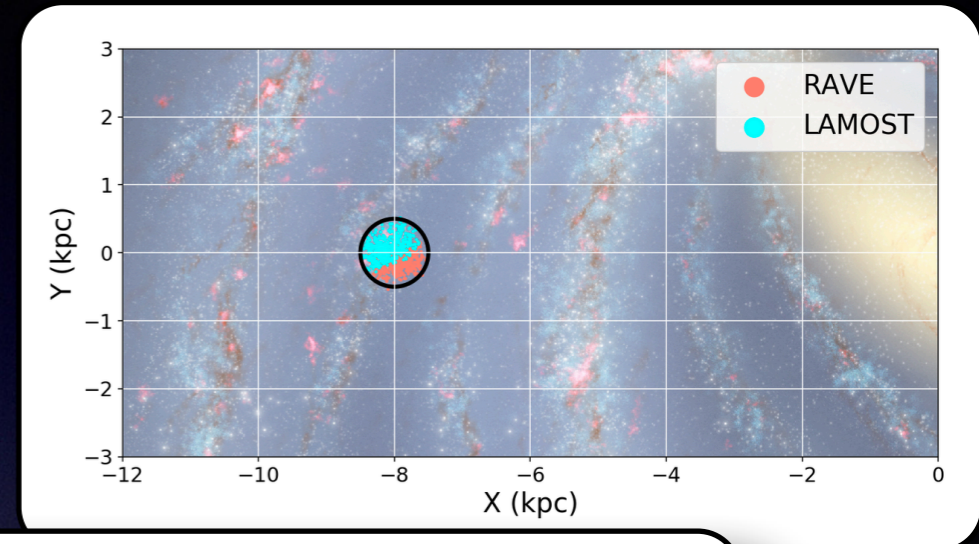
- Gaia+spectroscopy great for ages. Main-sequence stars are difficult, but good prospects for turn-off stars and giants
- Many papers using ages, such as Xiang et al. 2017, Sanders et al. 2018, Wu et al. 2018, etc...
- Paper analysing the dynamics and chemistry of the disc, using 125k stars (Vickers & Smith 2018)





# Disc evolution with LAMOST+Gaia

- Combine Gaia with LAMOST/RAVE to estimate ages for 125k stars (Vickers & Smith, 2018, ApJ)
- Probe the chemo-dynamical evolution of the disc, looking at inside-out formation, heating and bulk flows
- Investigate radial migration through machine learning

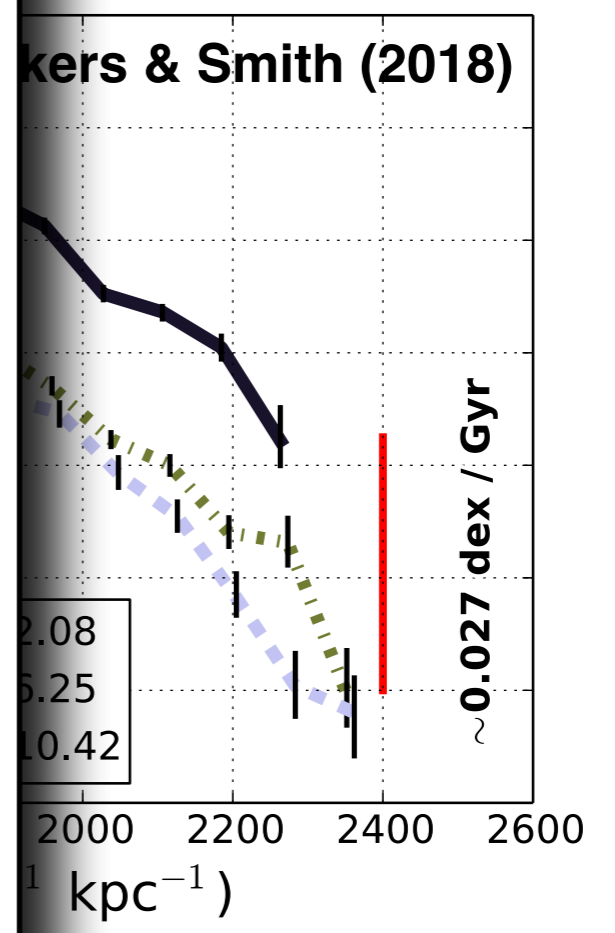
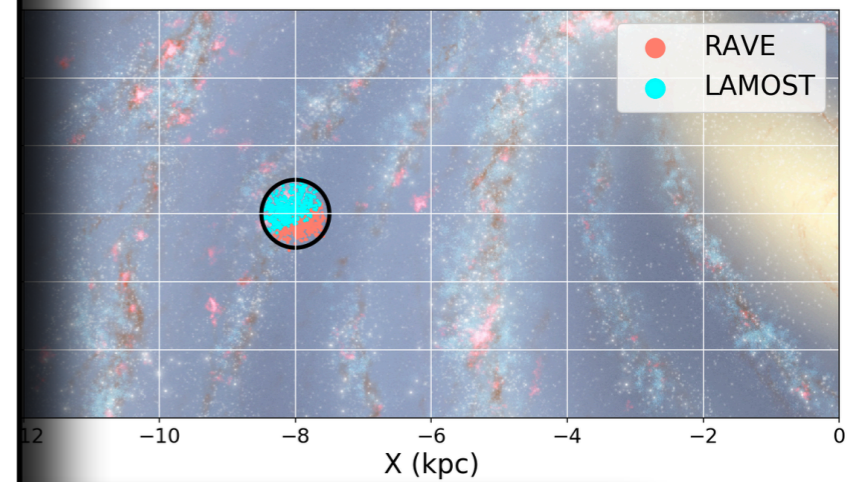
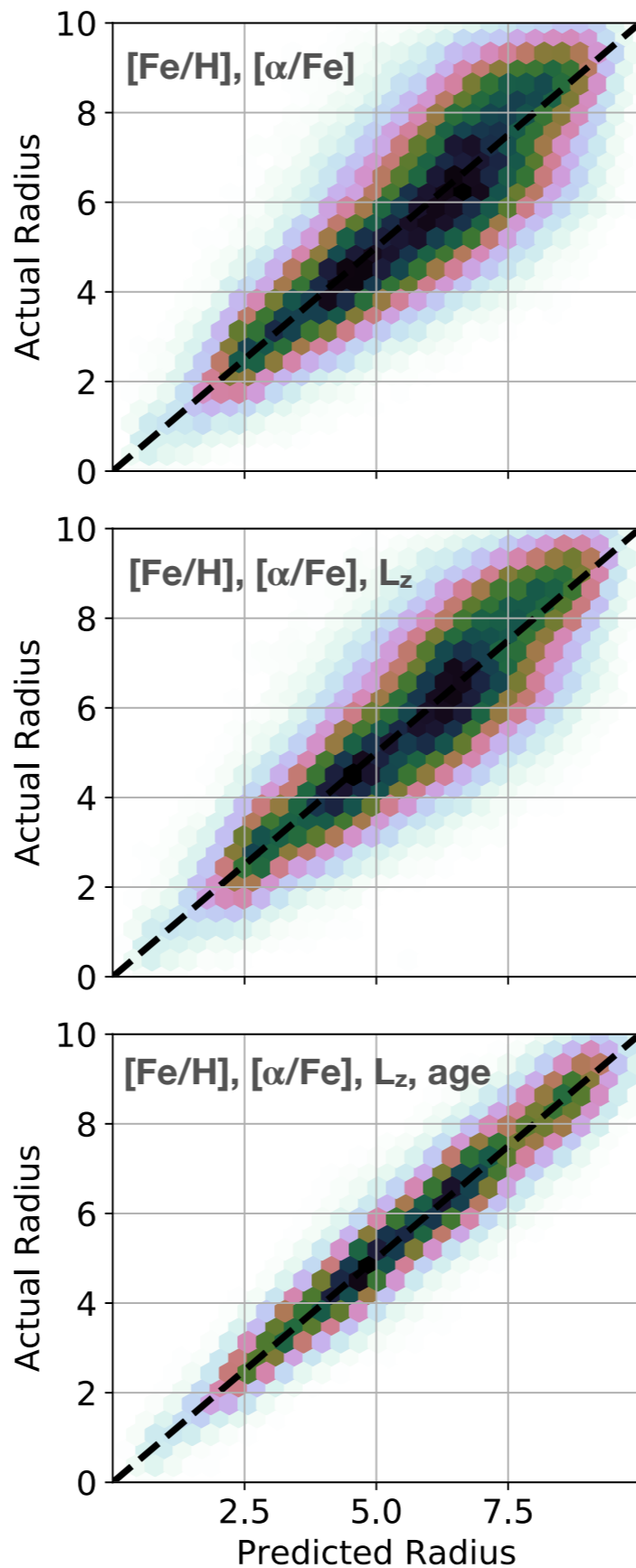




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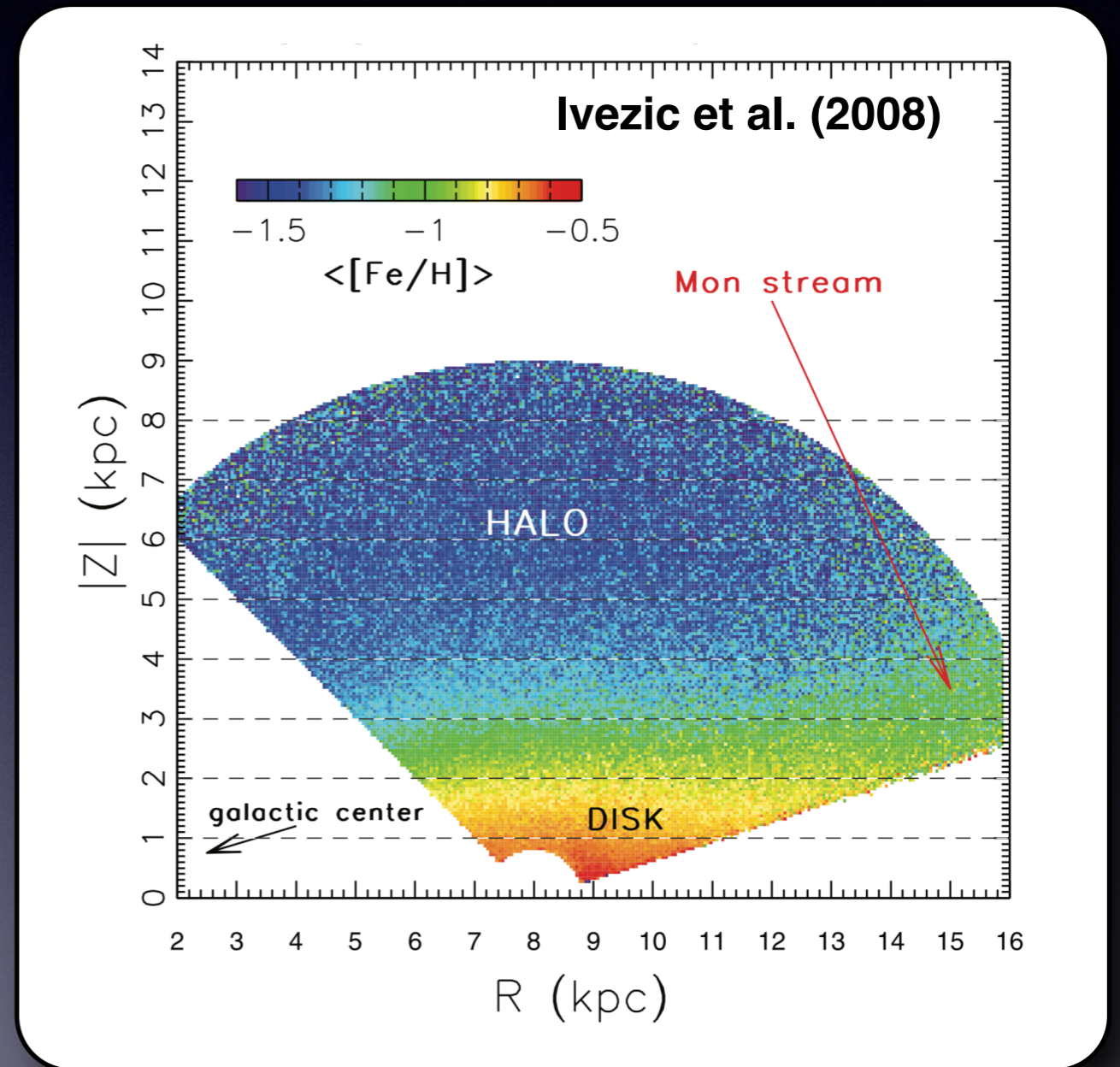
# OST+Gaia





# Can we avoid spectroscopy?

- Spectroscopy is extremely useful, but it is also expensive
- For many years people have been estimating metallicities from photometry, most-effectively through the uv-excess (e.g. Ivezic et al. 2008)
- If we can estimate metallicities, why can we not estimate ages?!
- Use subset with  $\sim 10\%$  ages from Vickers et al. (2018) to train a random forrest regression tool to calculate ages from photometry

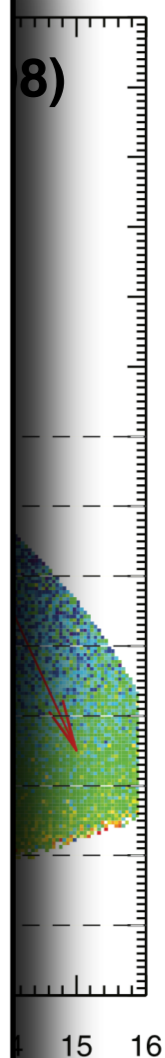
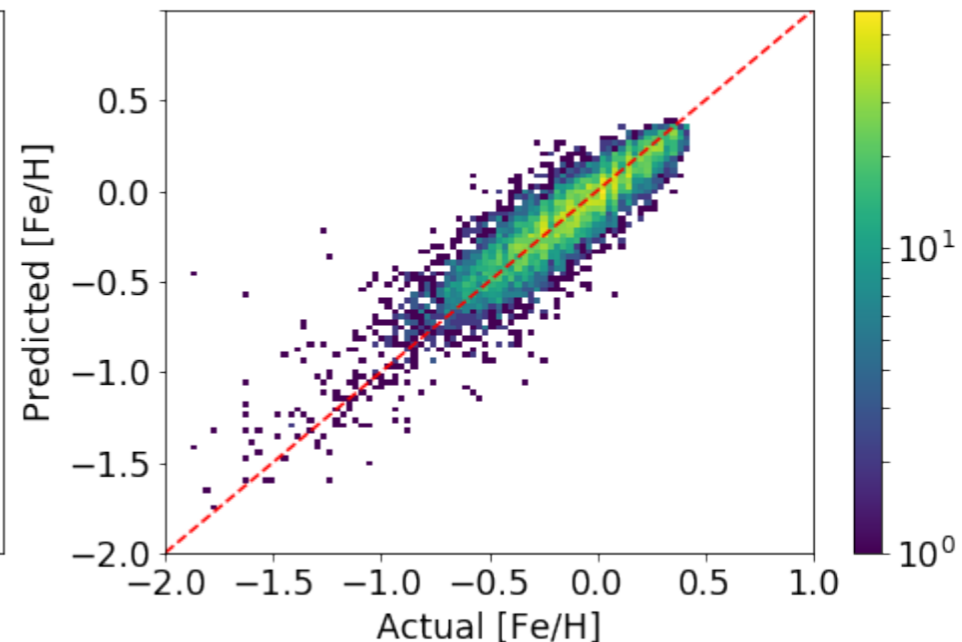
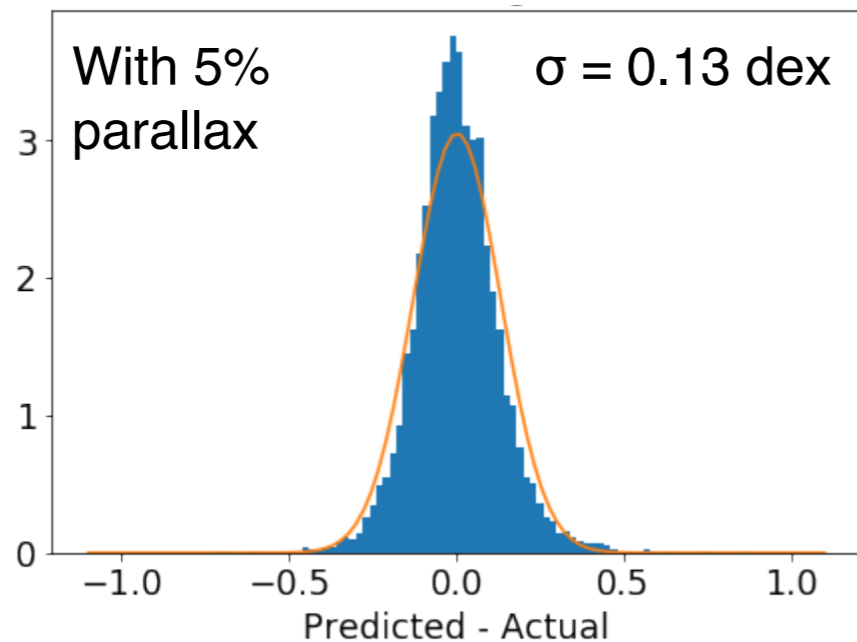
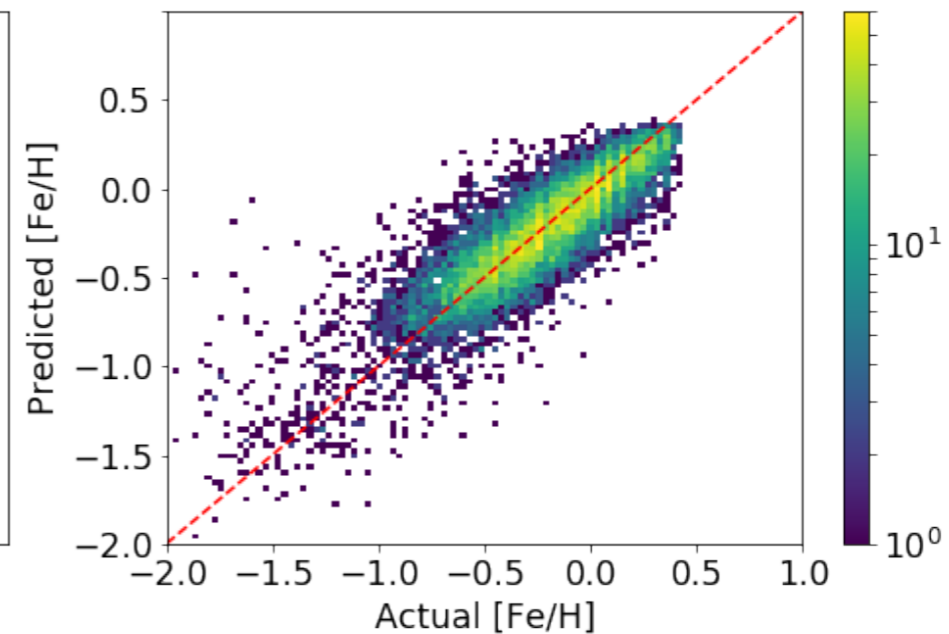
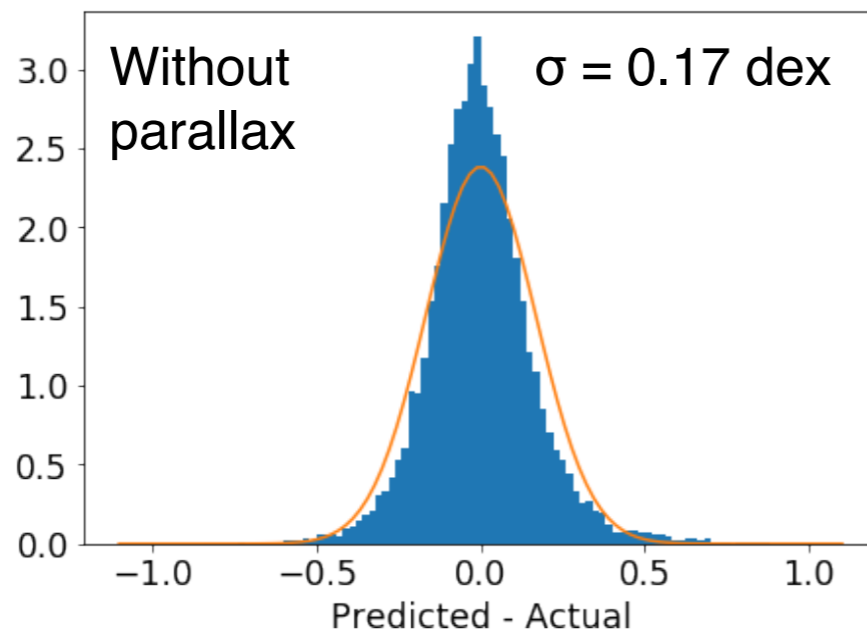




# Can we avoid spectroscopy?

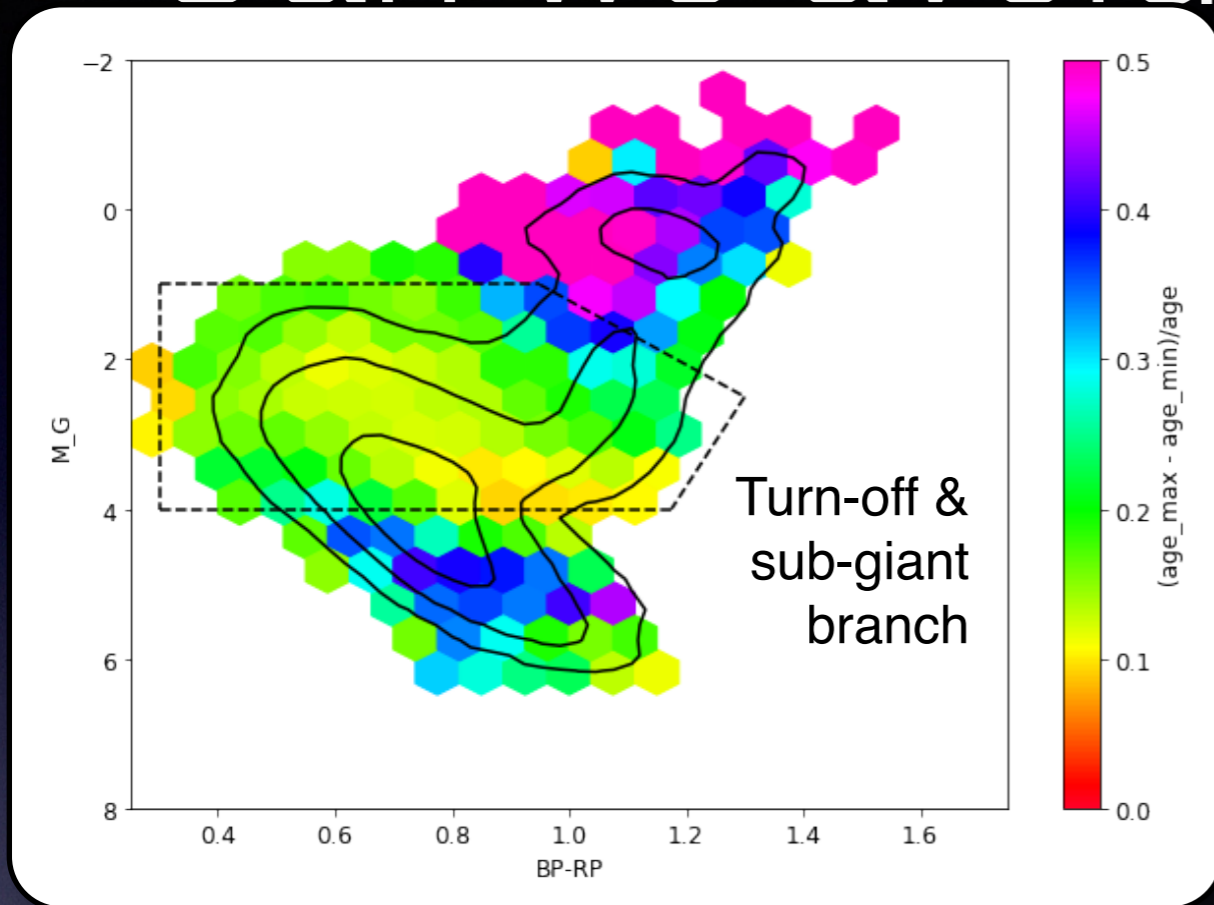
- Spectroscopy is the gold standard for metallicity, but it is expensive and time-consuming.
- For many stars, photometric metallicity estimates from SDSS are available through the SDSS database (e.g., et al. 2003).
- If we can improve photometric metallicity estimates, why can't we avoid spectroscopy?
- Use simulated stars (e.g., Vickers & Bell 2006) to test random photometric metallicity calculations.

## Photometric metallicities $\nabla$ stars with SDSS

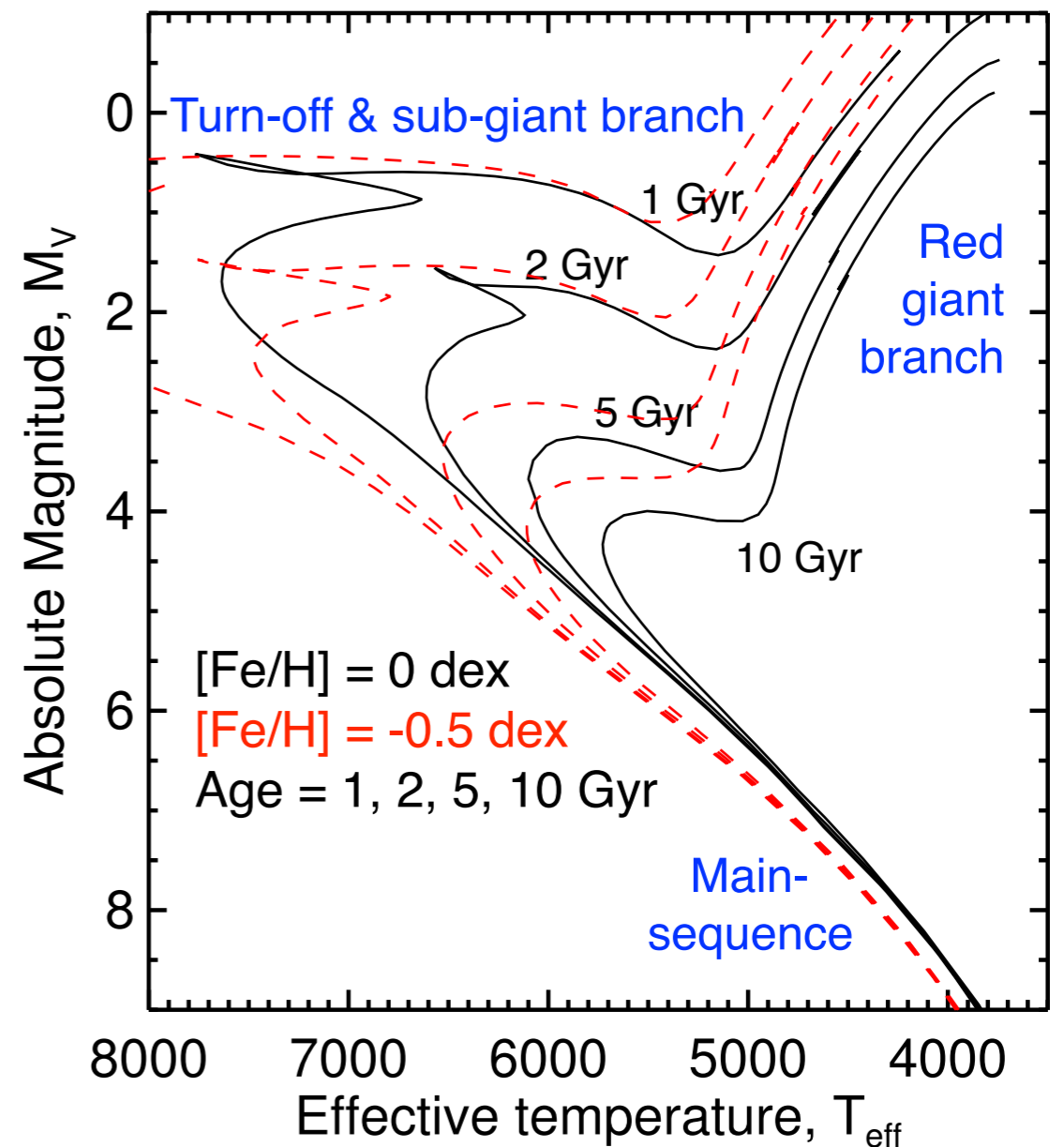




# Can we avoid spectroscopy?

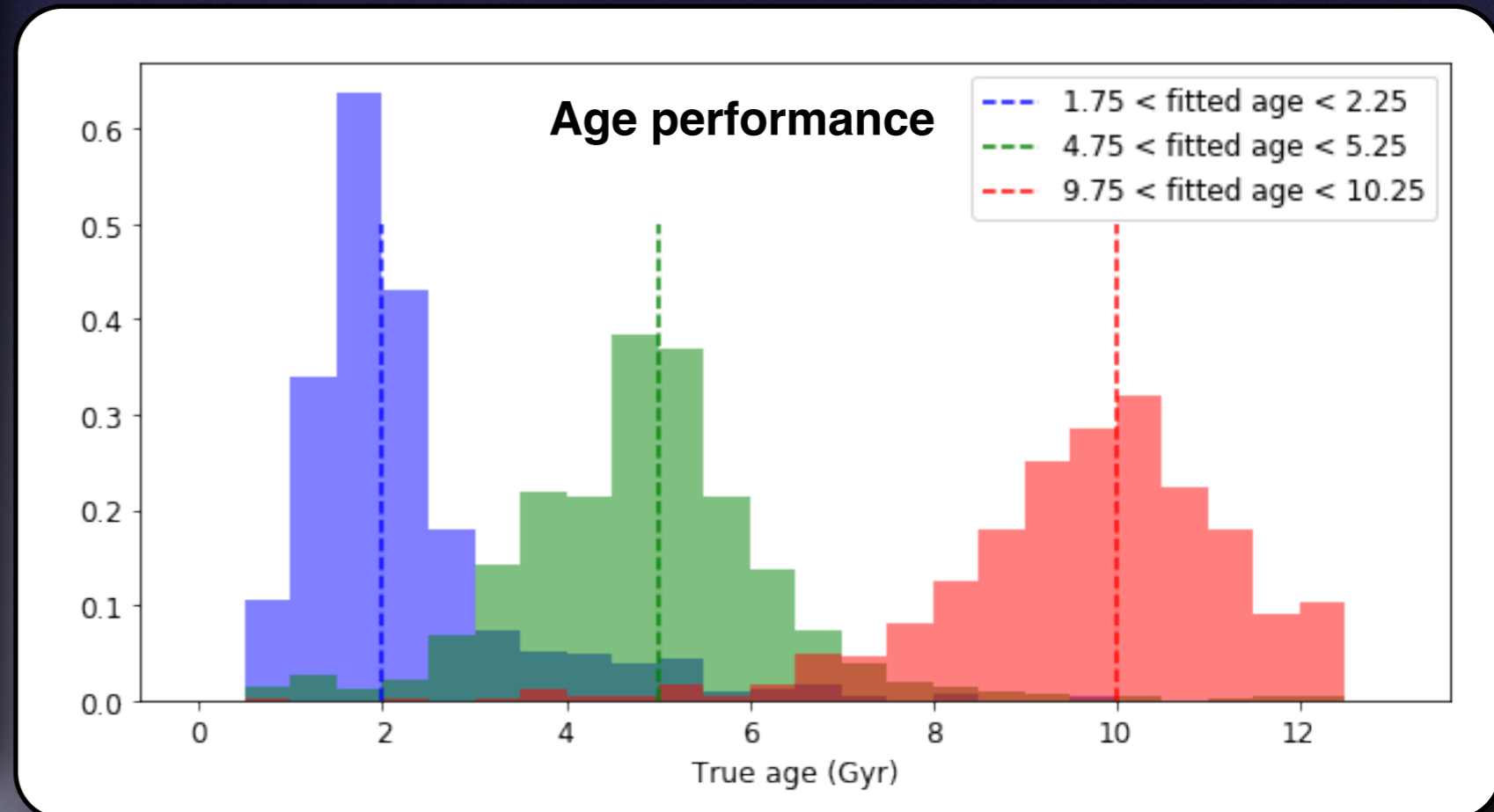
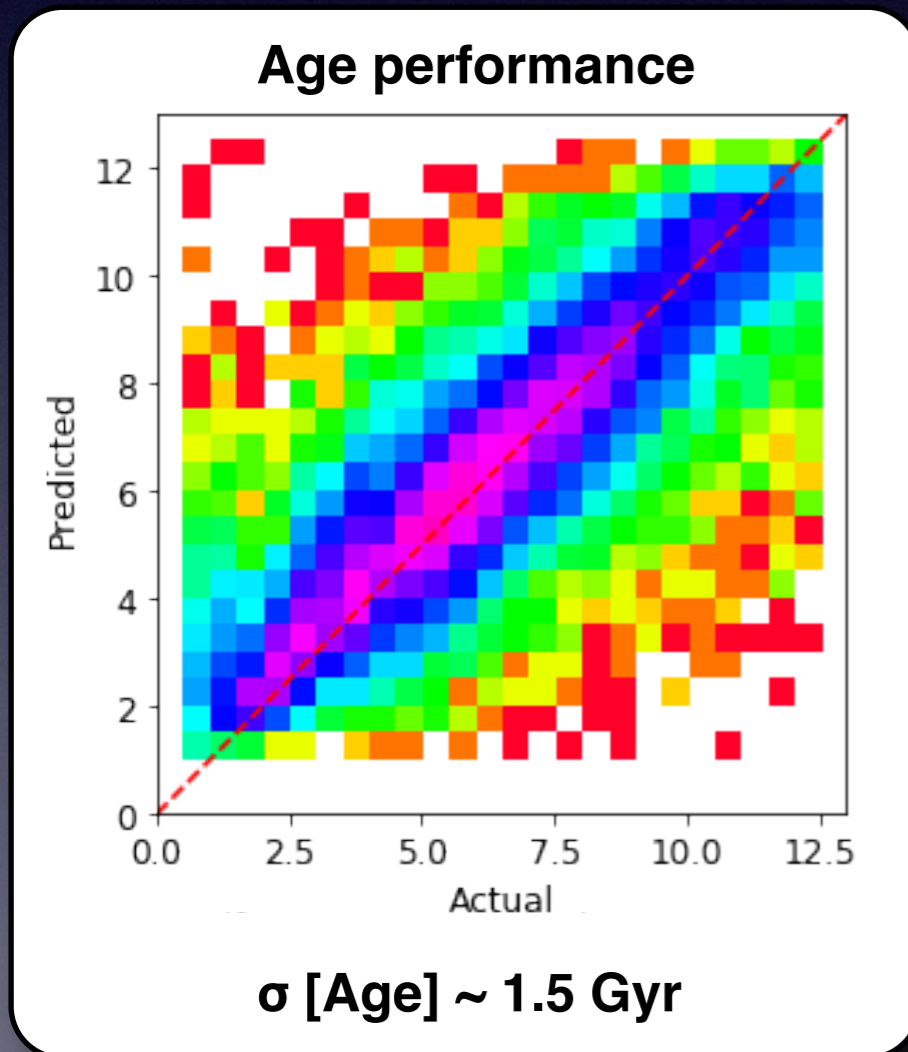
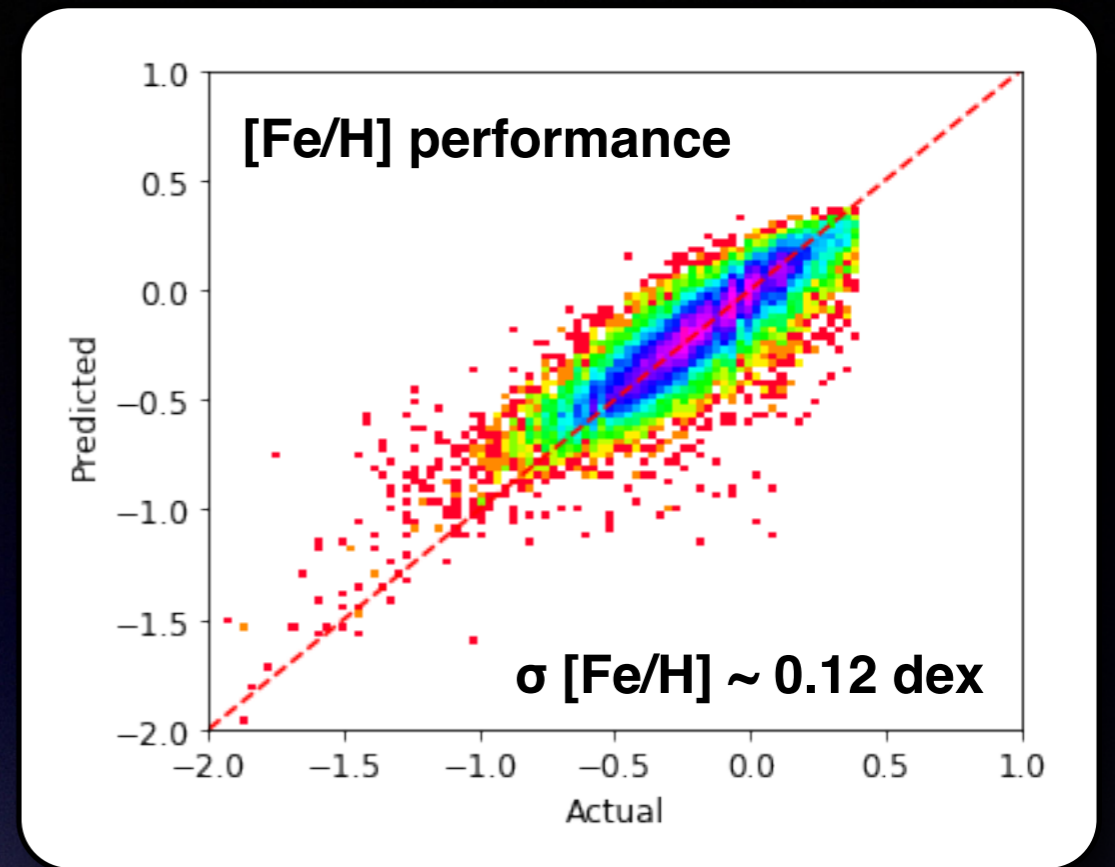


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- Use subset with  $\sim 10\%$  ages from Vickers et al. (2018) to train a random forest regression tool to calculate ages from photometry





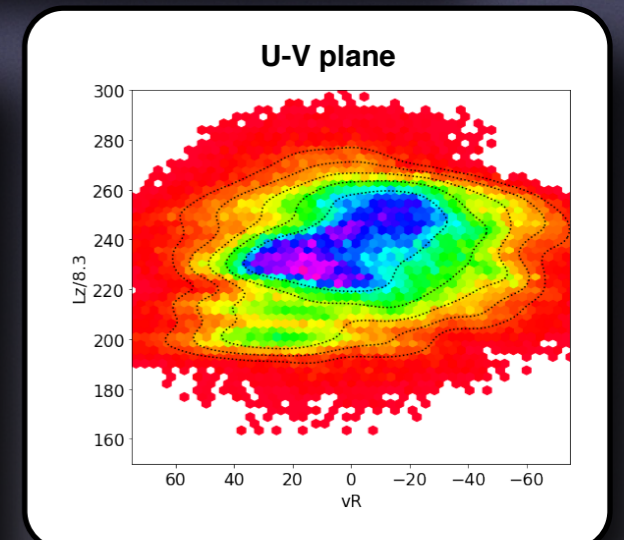
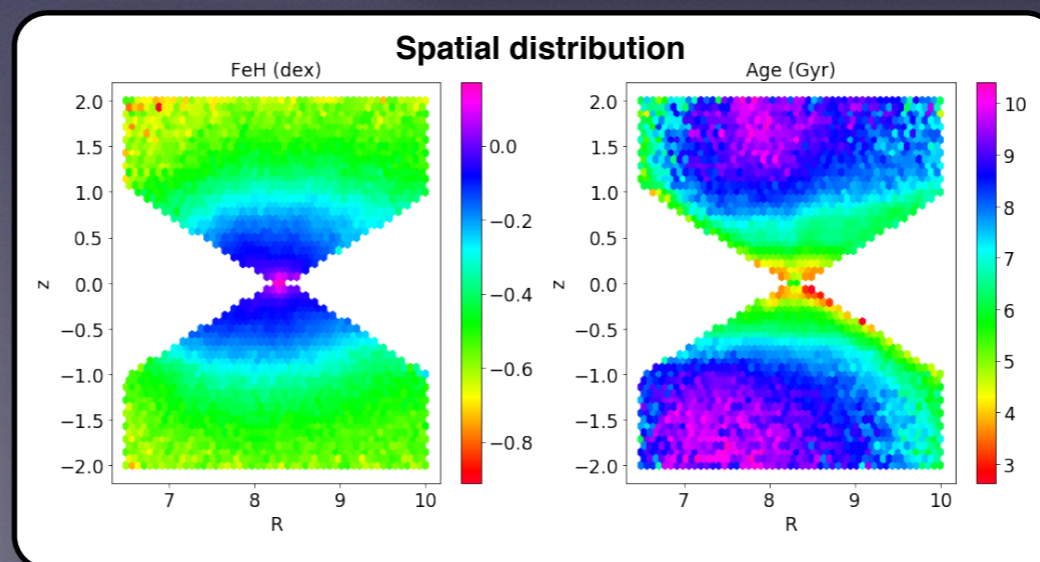
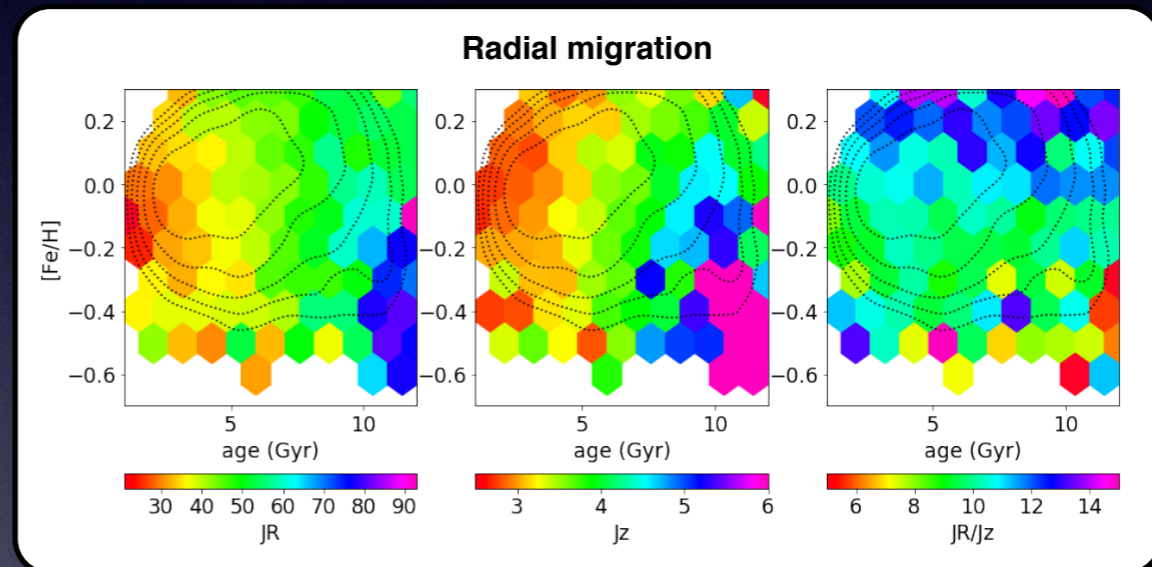
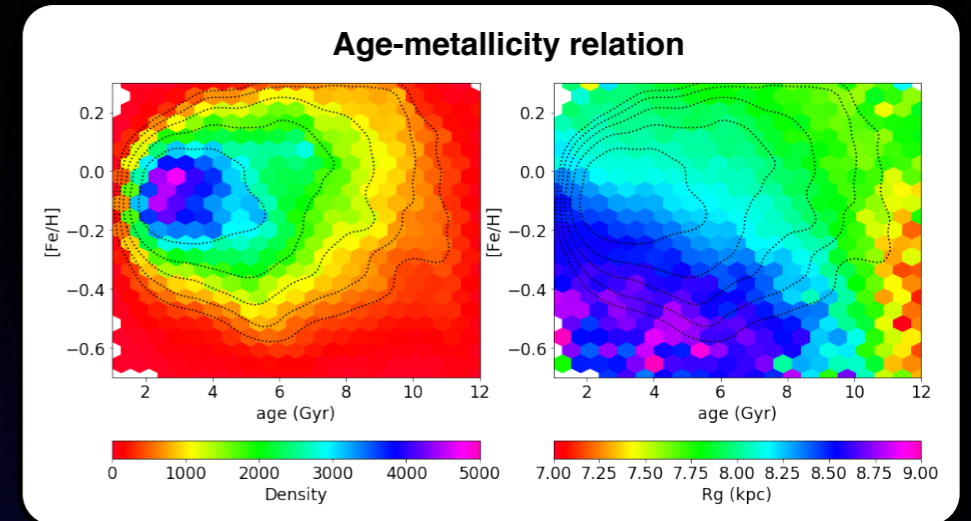
# How well can we recover metallicities and ages?





# Applications

- Using all-sky GALEX data gives us around 2 million turn-off stars with good ages (SDSS gives ~6M)
- If we want 6D phase-space we can cross-match GALEX and Gaia's onboard spectrograph RVS, giving around 0.5 million stars
- Other avenues not discussed here include the phase-space snail (more prominent in younger stars) & substructures in action space





## Spatial distribution

- Using Gaia+Galex can probe the extended solar neighbourhood
- When looking at ages can see clear flaring and/or stubby thick disc

good ages (SDSS gives ~6M)

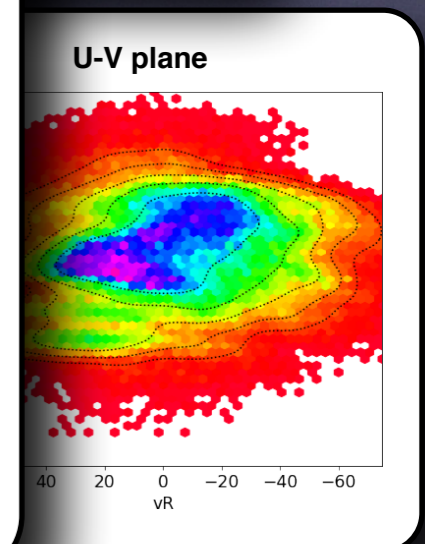
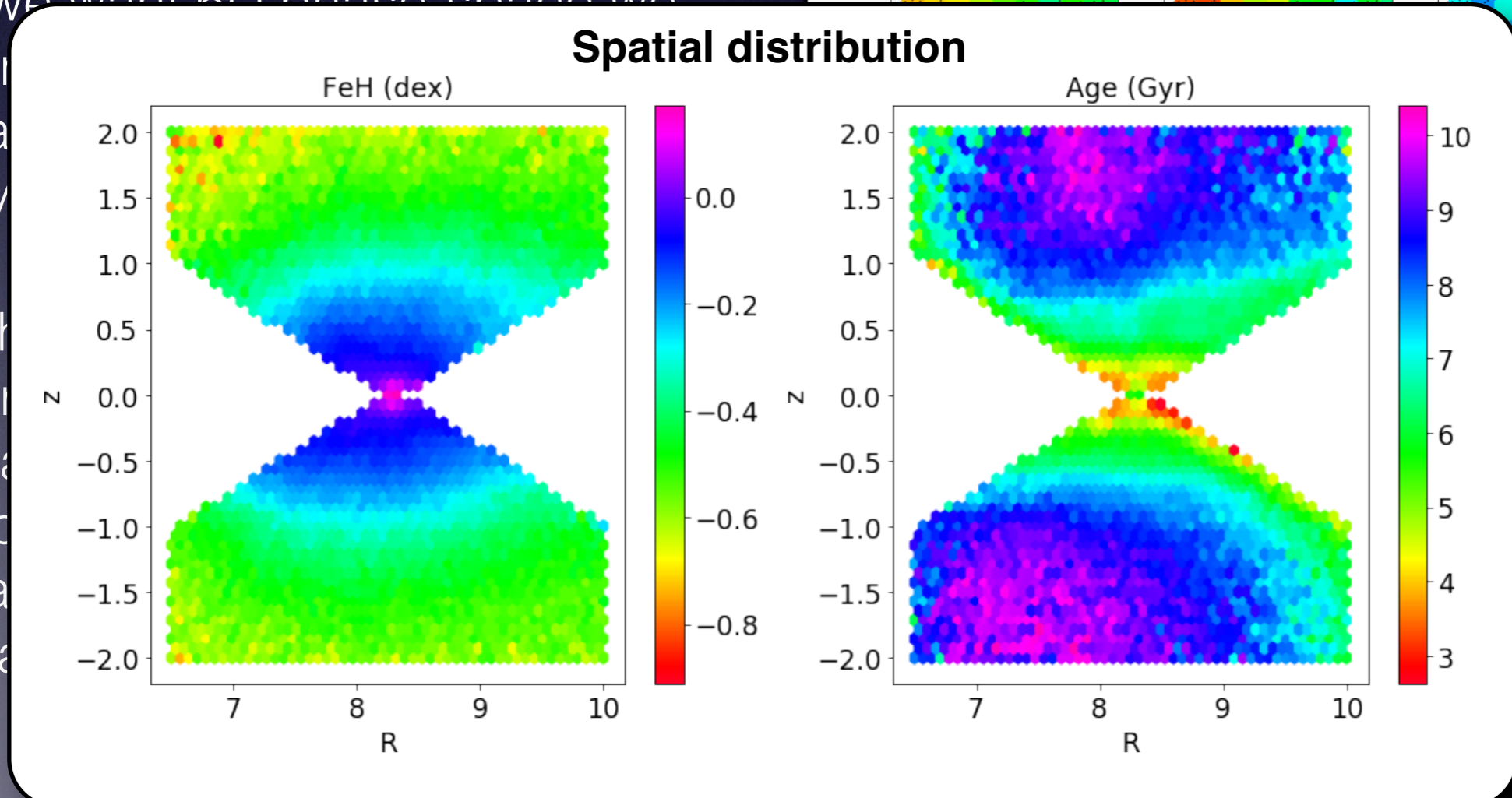
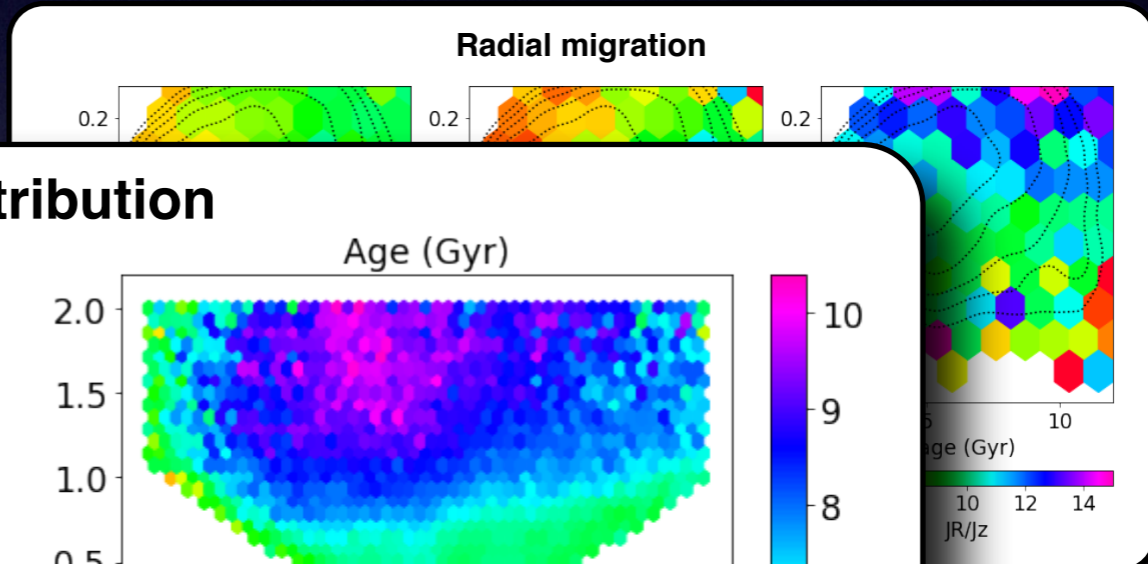
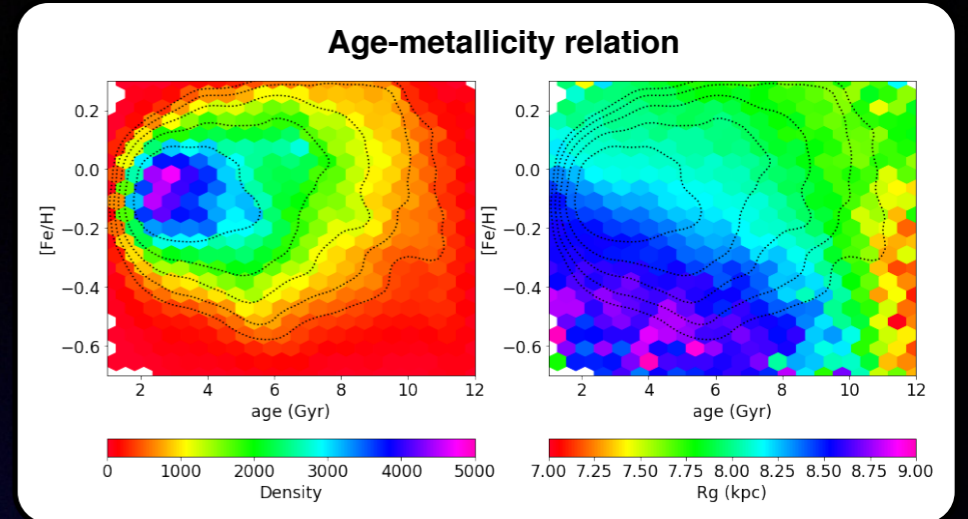
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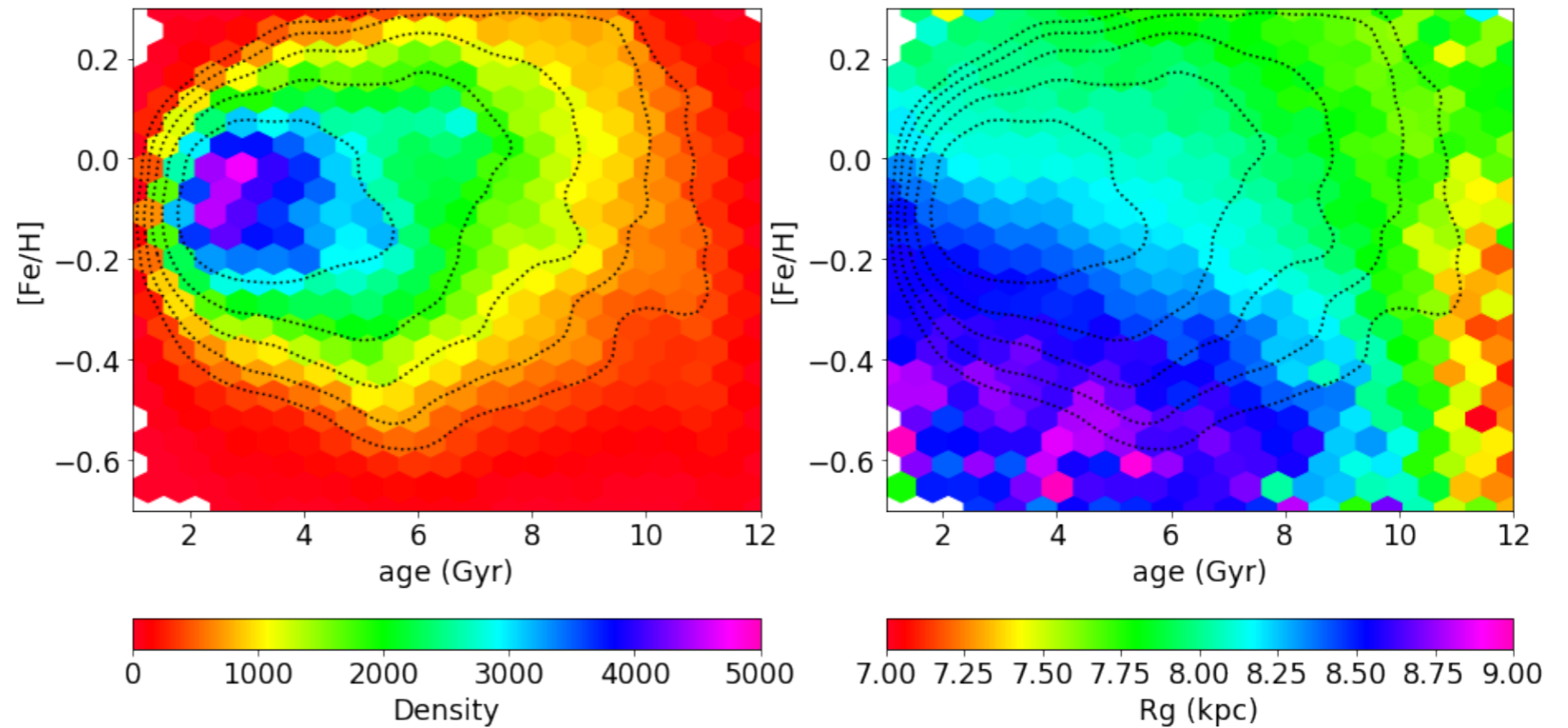
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# Applications

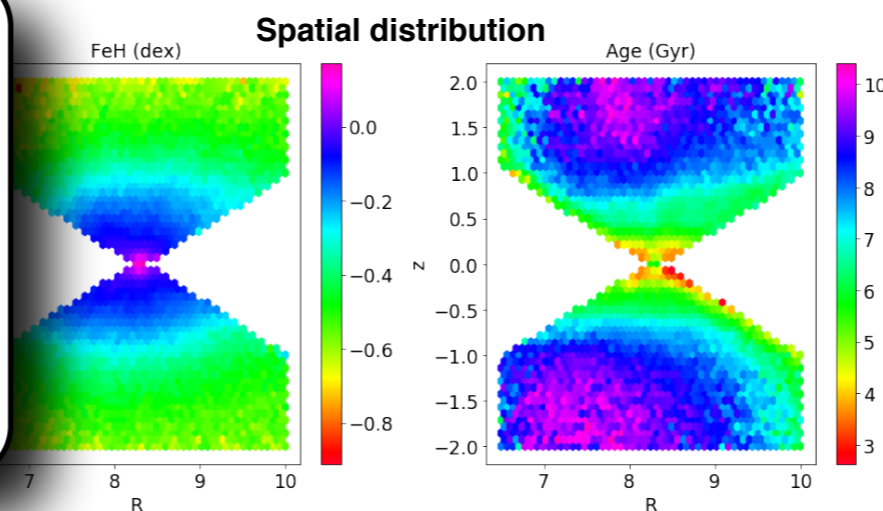
## Age-metallicity relation



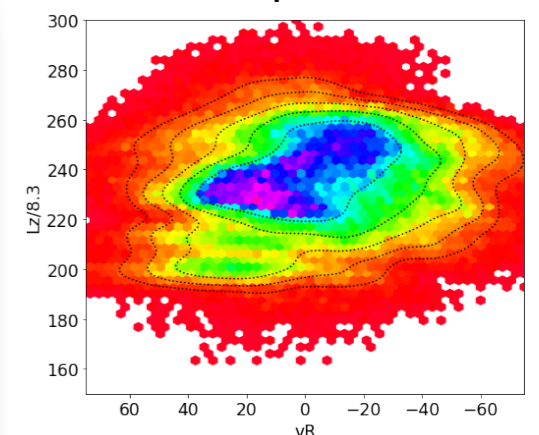
- Using all-sky GAIA data, we have identified around 2 million stars with good ages (SDSS) and metallicities (Gaia) giving around 0.5 dex.
- If we want 6D phase space, we can cross-match Gaia's onboard spectroscopy with SDSS giving around 0.5 dex.
- Other avenues not discussed.

### Age-Metallicity relation

- By plotting the guiding centre radii we can see the effects which work to broaden this relation.



### U-V plane

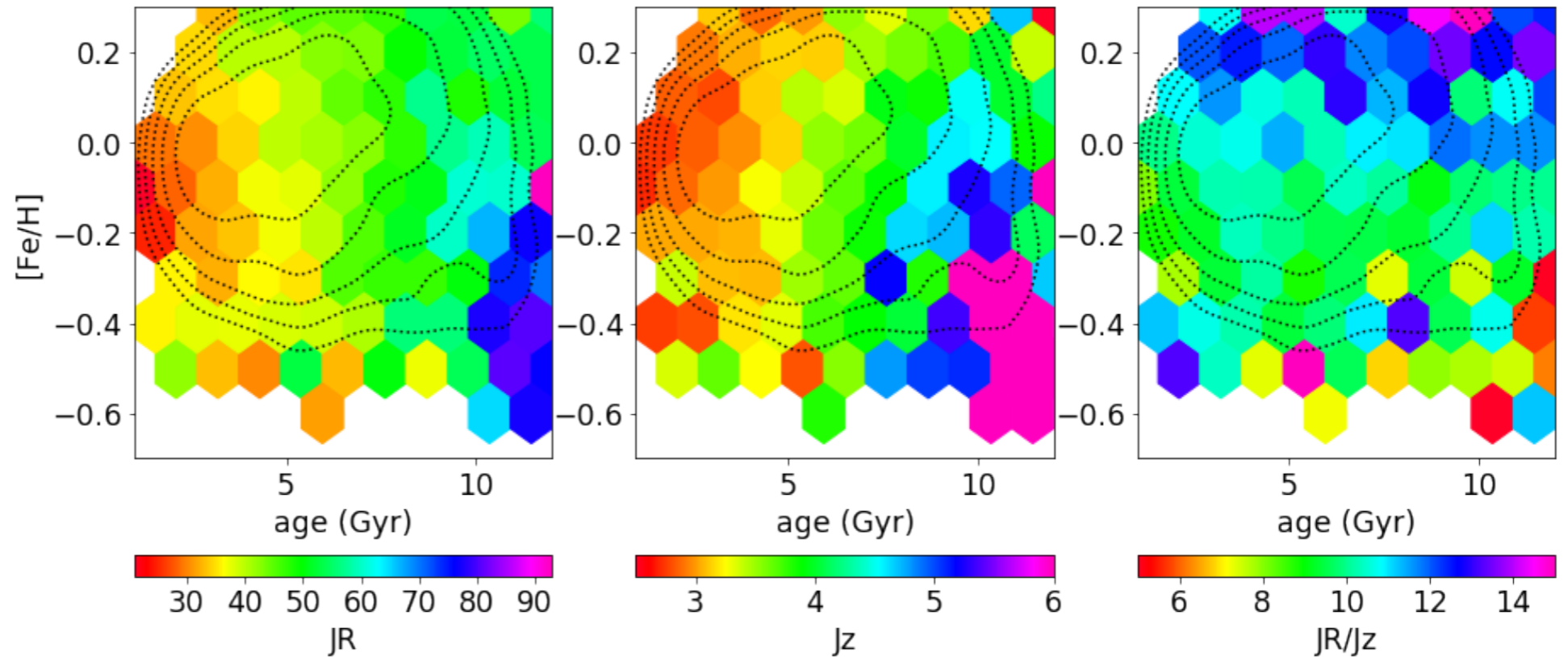




# App

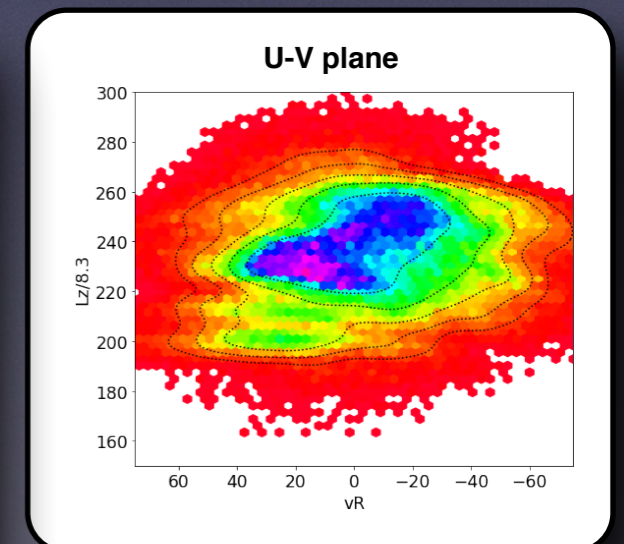
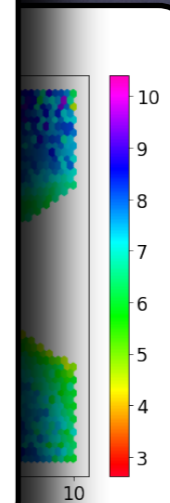
- Using all-sky Gaia DR2 data, we have identified around 2 million stars with good ages (SDSS)
- If we want 6D phase space, we can cross-match Gaia's onboard parallaxes, giving around 0.5 million stars

## Radial migration



## Radial migration

- Here we show the age-metallicity plane for stars with  $R_g = 7$  kpc.
- As expected, older stars are hotter in both  $J_R$  and  $J_z$ .
- However, plotting the ratio shows that the (probable) migrated stars have high values of  $J_R/J_z$ . Is this because migration preferentially occurs for stars with proportionally smaller  $J_z$ ?

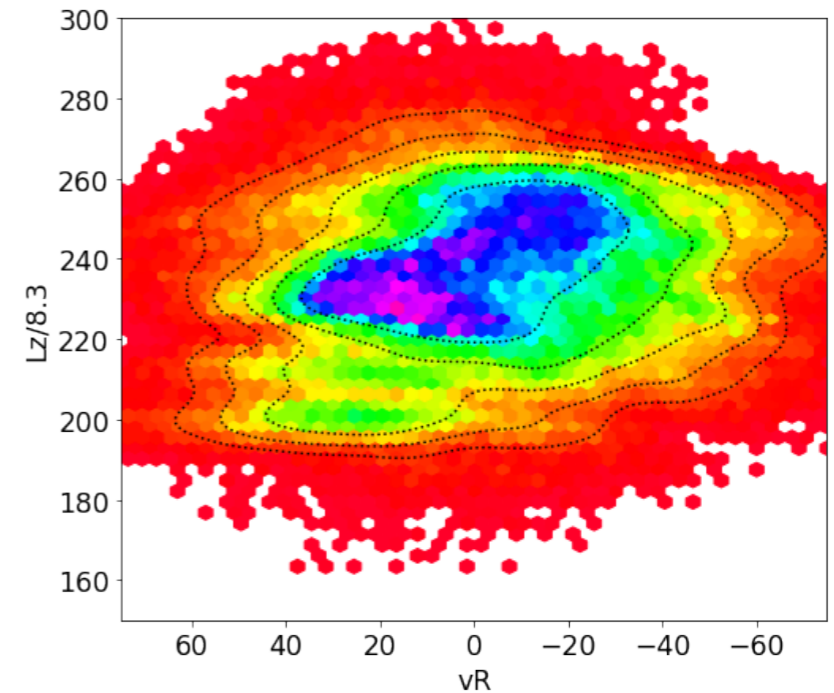




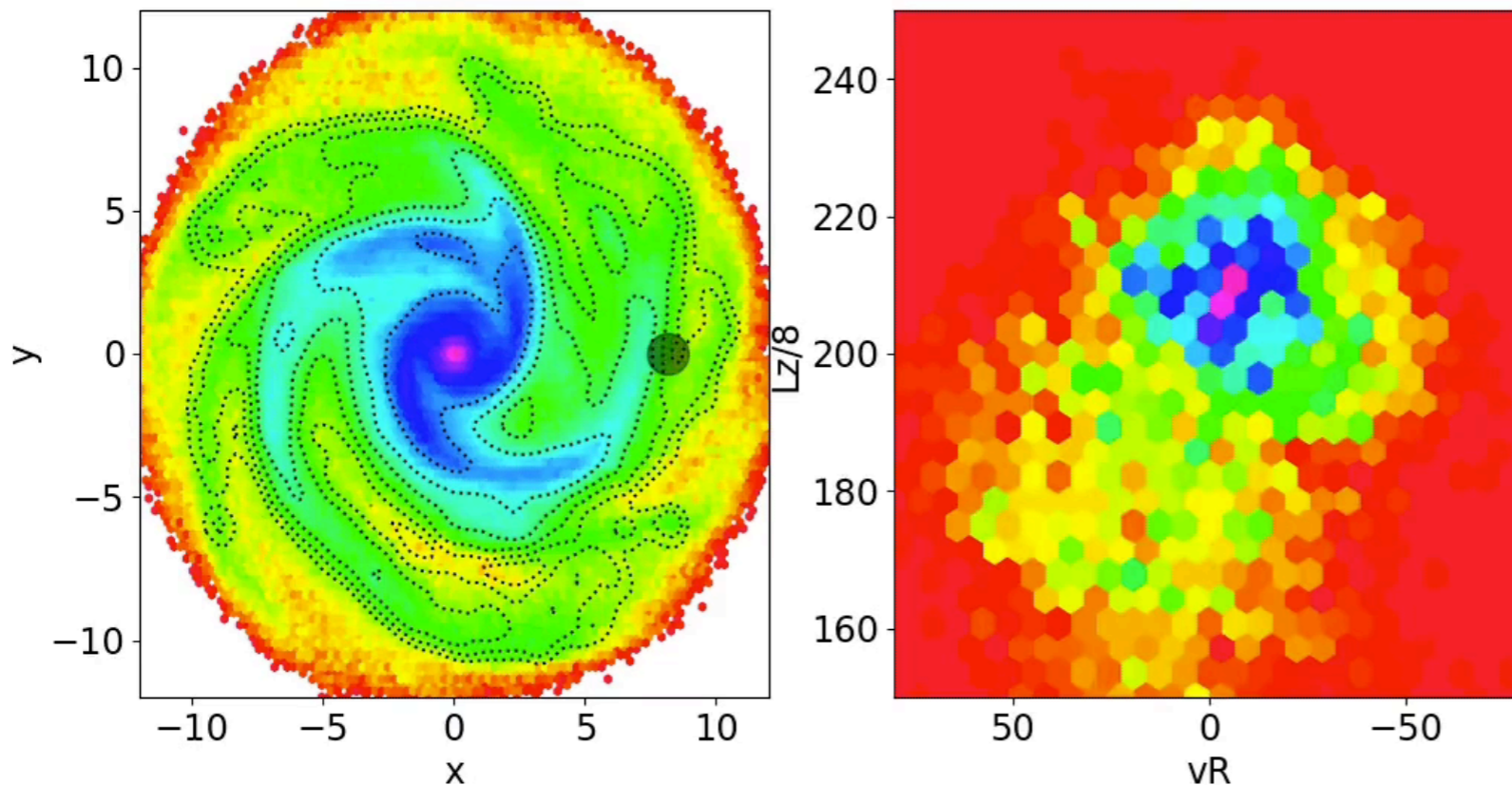
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**U-V plane**



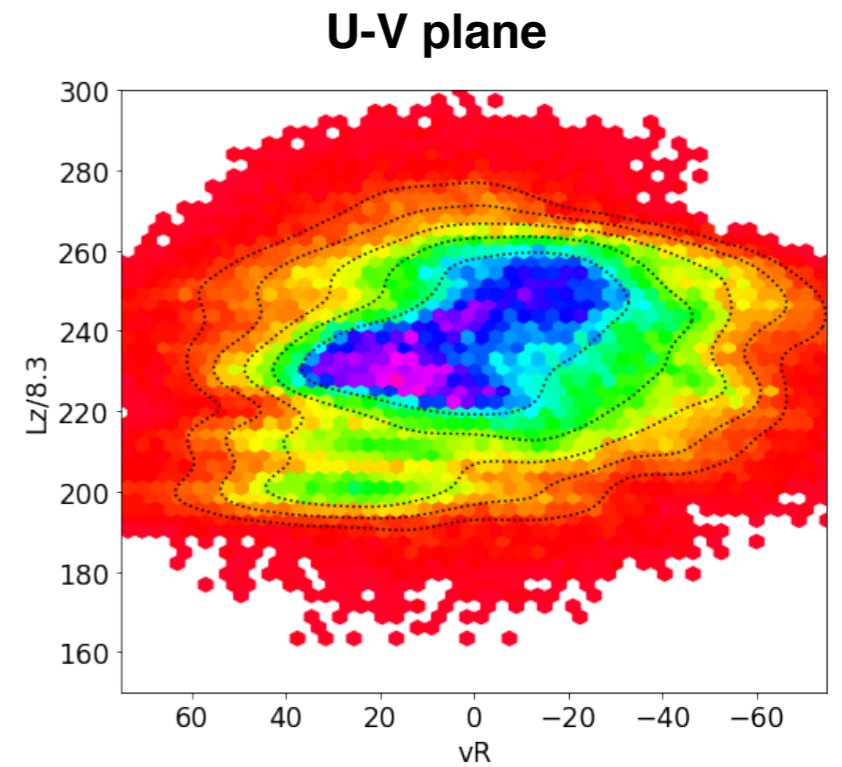
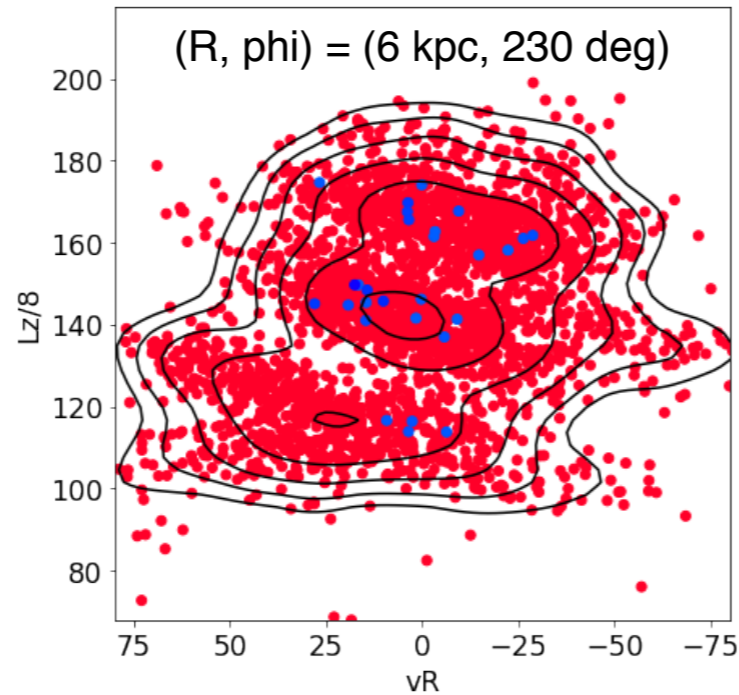
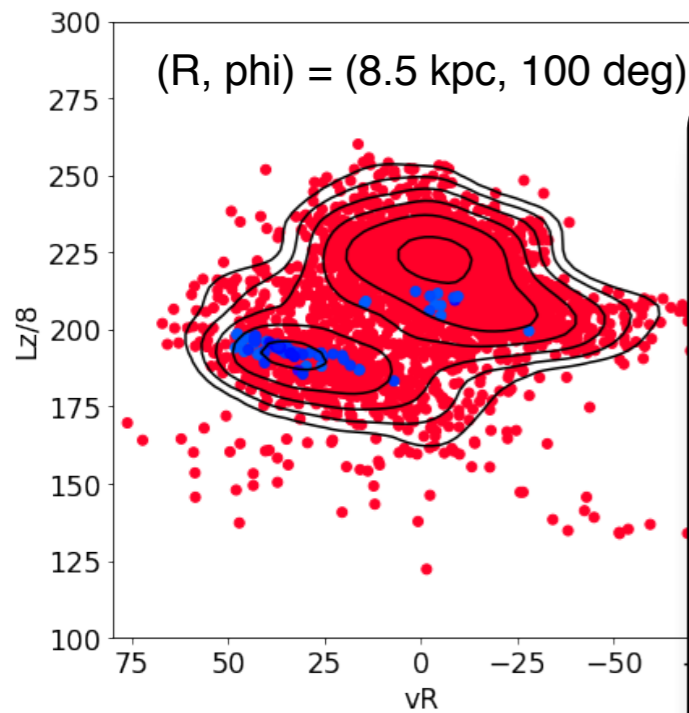
**Simulation from Alex Pettitt**



**U-V plane**

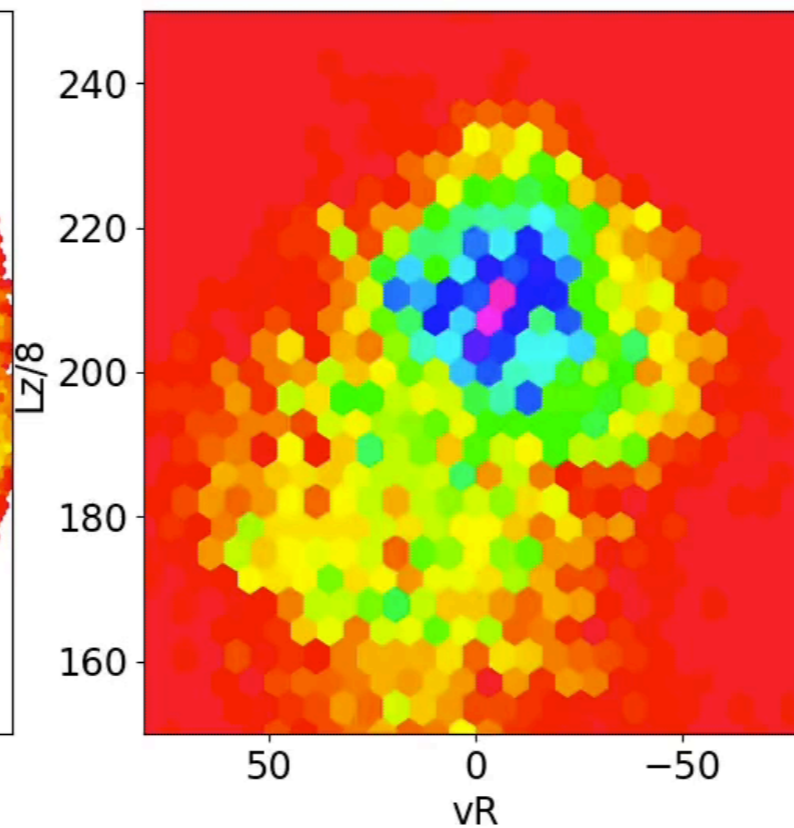
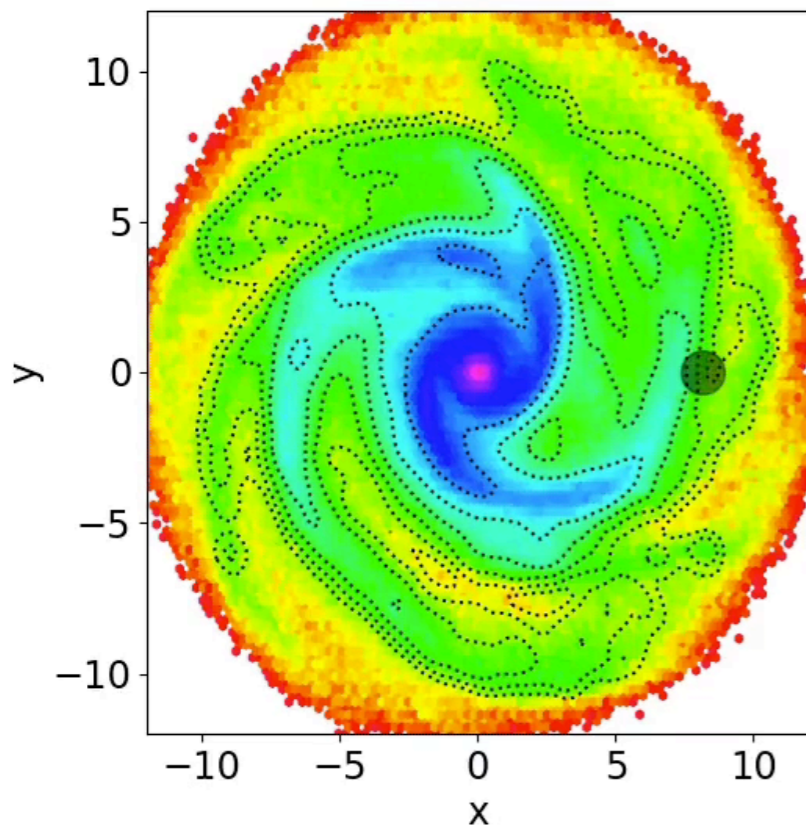
- Vertex deviation and complex substructure
- Spirals are able to match overall structure, but how much of substructure too?
- Hercules stream seems to bifurcate, showing signature in age but not  $[Fe/H]$





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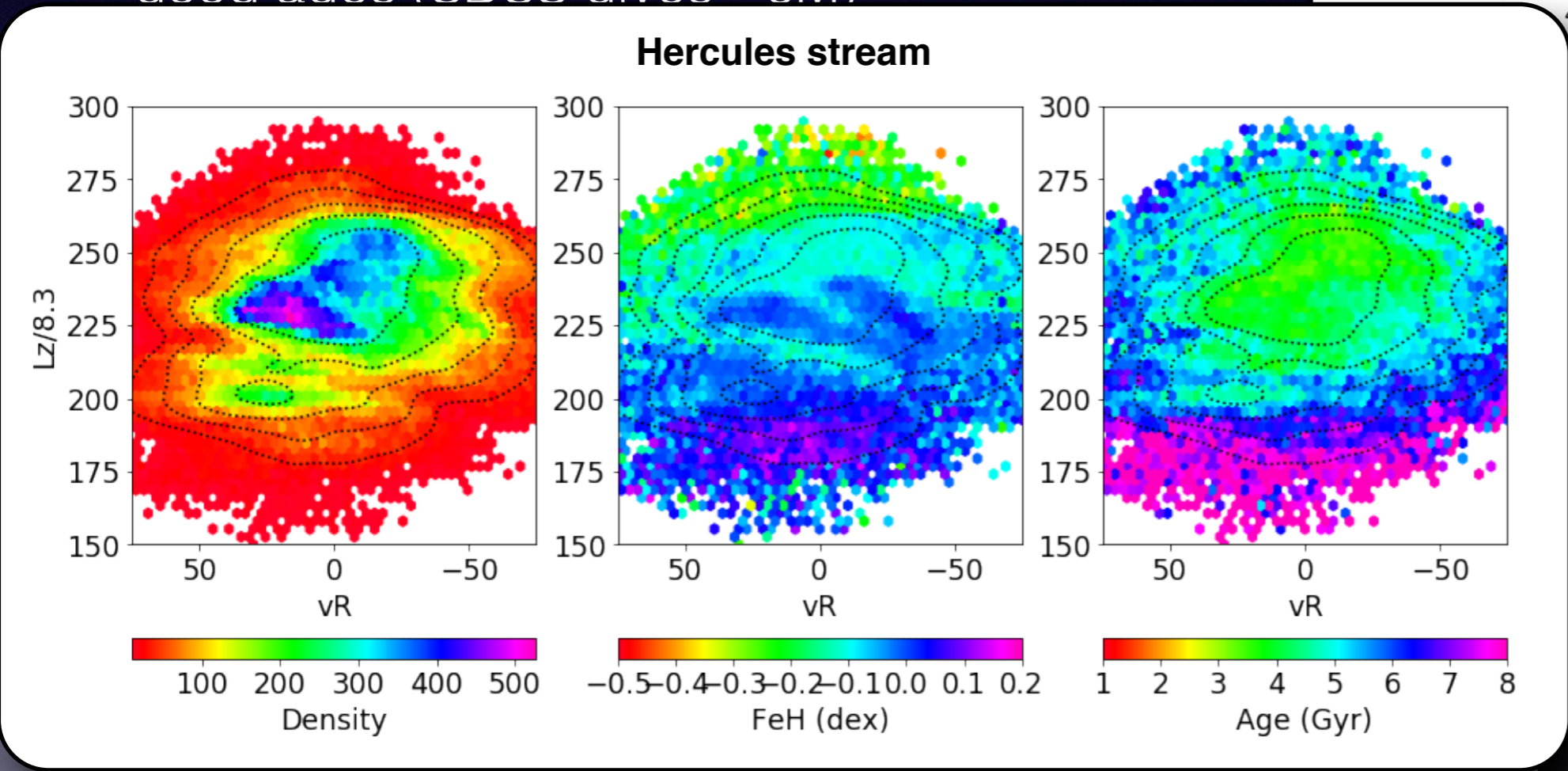
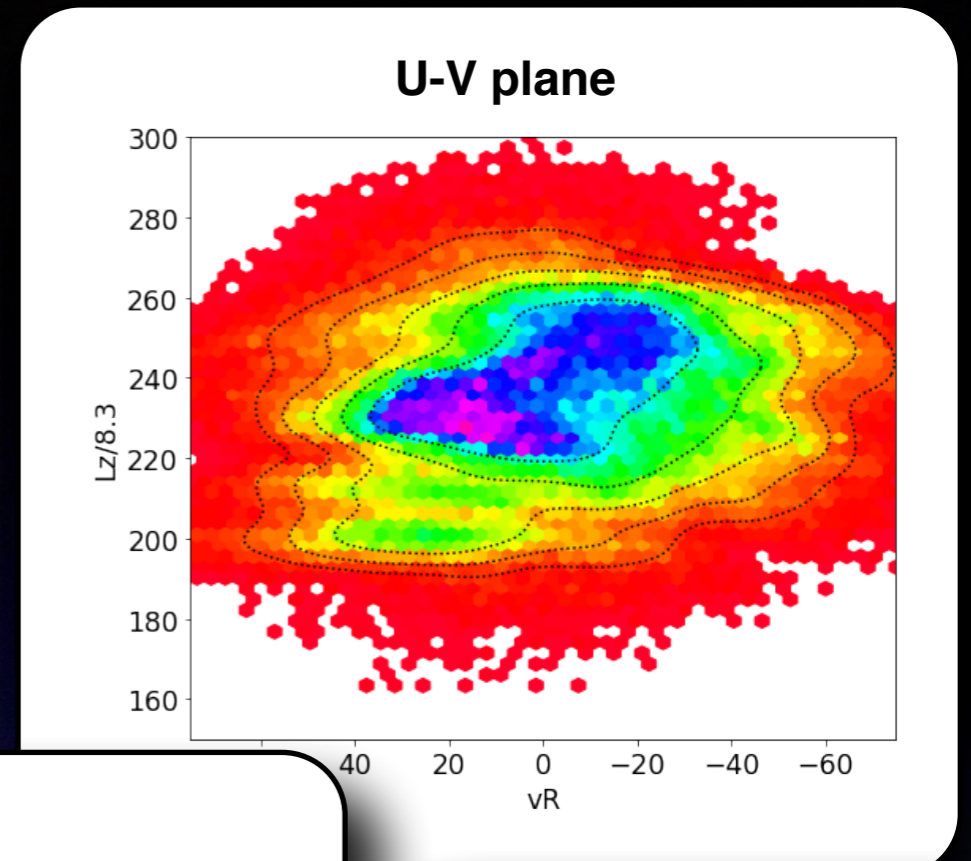
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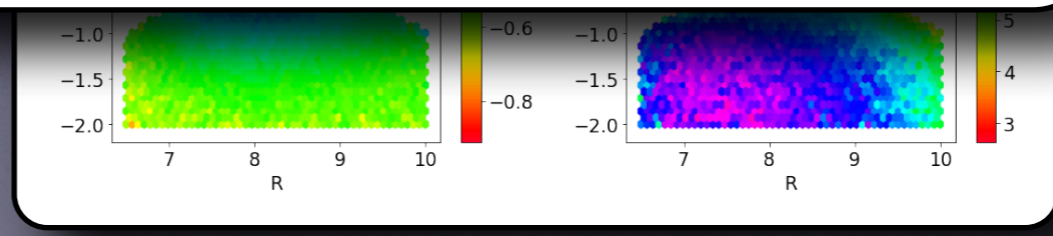
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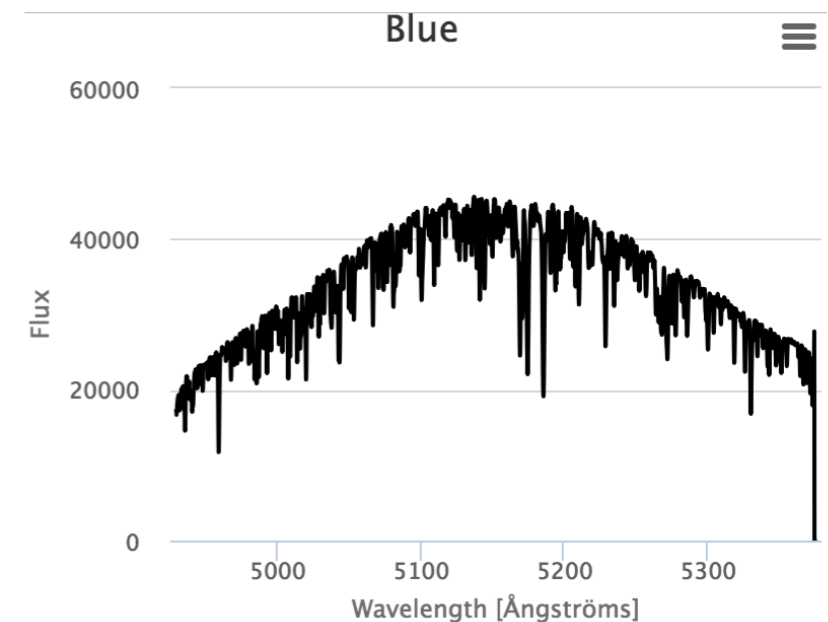
in action space



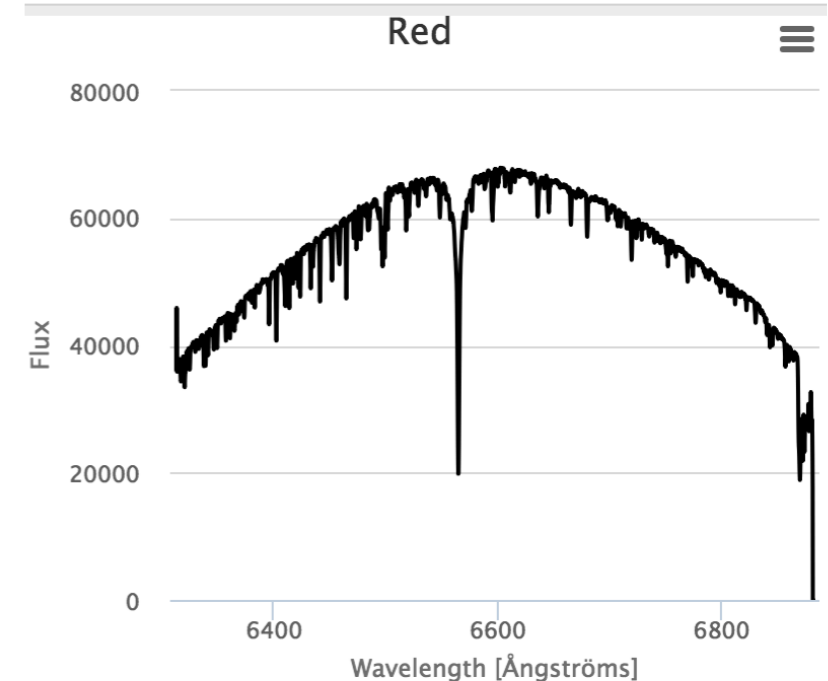


# LAMOST-2

- 5-year survey from Oct 2018 to Jun 2023. Continuation of LAMOST-1 survey, but with new medium resolution component.
- $R \sim 7,500$  for two windows: 496-533 nm (Mg Triplet, metal lines) & 630-680 nm (H $\alpha$ , Li). Aim to get  $\sim 20$  elemental abundances.
- Med-res:  $\sim 2$  million stellar spectra (for  $G < 15$ ) and  $\sim 0.2$  million stars with time-domain spectra (60 epochs for  $G < 14$ )
- Time-domain science: Variable stars and exoplanet host stars (Kepler/K2 & TESS), star clusters, nebula regions (HII regions, SNR, PNe, etc), field binaries.



— COADD\_B — B-84107311 — B-84107335  
— B-84107359 — B-84107383 — B-84107415  
— B-84107440 — B-84107464 Highcharts.com



— COADD\_R — R-84107311 — R-84107335  
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— R-84107440 — R-84107464 Highcharts.com