

# Statistical analysis of large scale surveys for constraining the Galaxy evolution

ESO/S. Brunier



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# Outline

- Introduction
  - Thick disc
- The Besançon Galaxy Model
- SEGUE data
  - SEGUE plates
  - Simulations
  - Sample selection
  - Results from the SEGUE analysis
    - The metallicity distribution
    - Distances
    - MCMC-ABC analysis
- Conclusions
- Perspectives
- ~~Preliminary analysis of the Gaia-ESO survey~~

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# Milky Way thick disc

- **Milky Way** → We can study the **chemical composition** and the **Galactic dynamics** based on individual star measurements.
- **The thick disc** → Old component of the Galaxy
  - Remnant of the early galaxy formation and evolution.
- The first stages of galaxy formation are printed in the **chemical** and **kinematic** properties of the thick disc.
- To understand the Milky Way formation and evolution it is crucial to understand thick disc formation.

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# Besançon Galaxy Model

SFR : **Thin disc** – Constant  
**Thick disc** – One burst  
**Halo** - One burst

**Thick disc** → Modified exponential  
 (parabolic + exponential)

- A short scale length:  $\sim 2.3$  kpc
- Scale height:  $\sim 530$  pc
- Position of the change:  $\xi \sim 660$  pc

Robin et al. (2014)

|              | Age (Gyr) | $[\frac{\text{Fe}}{\text{H}}]$ (dex) | $\frac{d[\text{Fe}/\text{H}]}{dR}$ |
|--------------|-----------|--------------------------------------|------------------------------------|
| Disc         | 0–0.15    | $0.01 \pm 0.12$                      | –0.07                              |
|              | 0.15–1    | $0.03 \pm 0.12$                      |                                    |
|              | 1–2       | $0.03 \pm 0.10$                      |                                    |
|              | 2–3       | $0.01 \pm 0.11$                      |                                    |
|              | 3–5       | $-0.07 \pm 0.18$                     |                                    |
|              | 5–7       | $-0.14 \pm 0.17$                     |                                    |
|              | 7–10      | $-0.37 \pm 0.20$                     |                                    |
| Thick disc   | 11        | $-0.78 \pm 0.30$                     | 0.00                               |
| Stellar halo | 14        | $-1.78 \pm 0.50$                     | 0.00                               |

Robin et al. (2003)

**Age metallicity relation:** Haywood (2006)

**Thin disc:**

Implicit vertical metallicity gradient:  
 $\sim -0.06$  dex kpc<sup>-1</sup>

Age-scale height relation

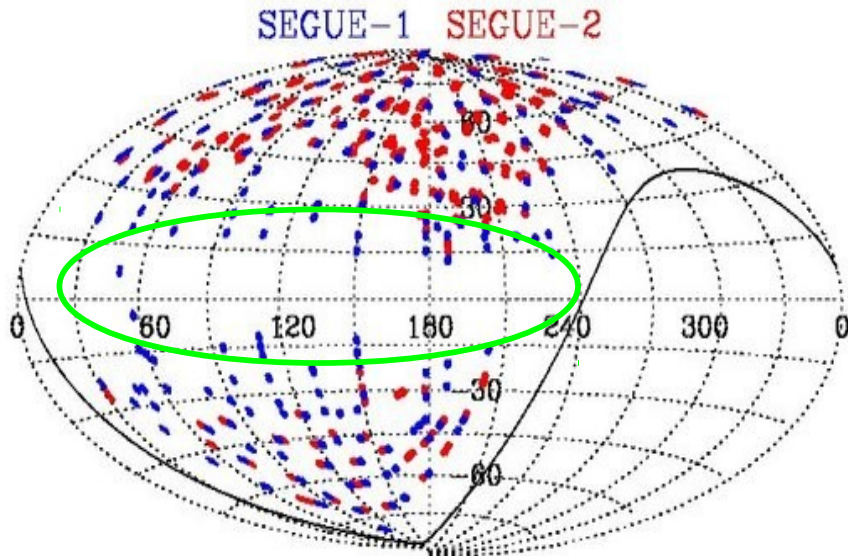
Age-metallicity relation

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# Data

- Low latitude plates of the **SEGUE** survey.



(<http://www.sdss3.org/>)

Table 5.1:  
SEGUE survey plates used for the present analysis

| Plate bright/faint | l<br>(°) | b<br>(°) | Ra<br>(°) | Dec<br>(°) |
|--------------------|----------|----------|-----------|------------|
| 2534/2542          | 50       | 14       | 277.60    | 21.33      |
| 2536/2544          | 70       | 14       | 286.66    | 39.11      |
| 2537/2545          | 110      | 10.5     | 334.17    | 69.39      |
| 2538/2546          | 110      | 16       | 323.07    | 73.64      |
| 2554/2564          | 94       | 14       | 302.97    | 60.01      |
| 2555/2565          | 94       | 8        | 312.39    | 56.59      |
| 2556/2566          | 94       | -8       | 330.15    | 45.06      |
| 2668/2672          | 187      | -12      | 79.49     | 16.61      |
| 2678/2696          | 187      | 8        | 98.13     | 26.67      |
| 2681/2699          | 178      | -15      | 71.50     | 21.98      |



- **Spectroscopy (dr8)**

- Bright ( $g = 15 - 18$ ) and faint ( $g = 17.5 - 19.5$ ) plates are treated separately.

- **Simulations**

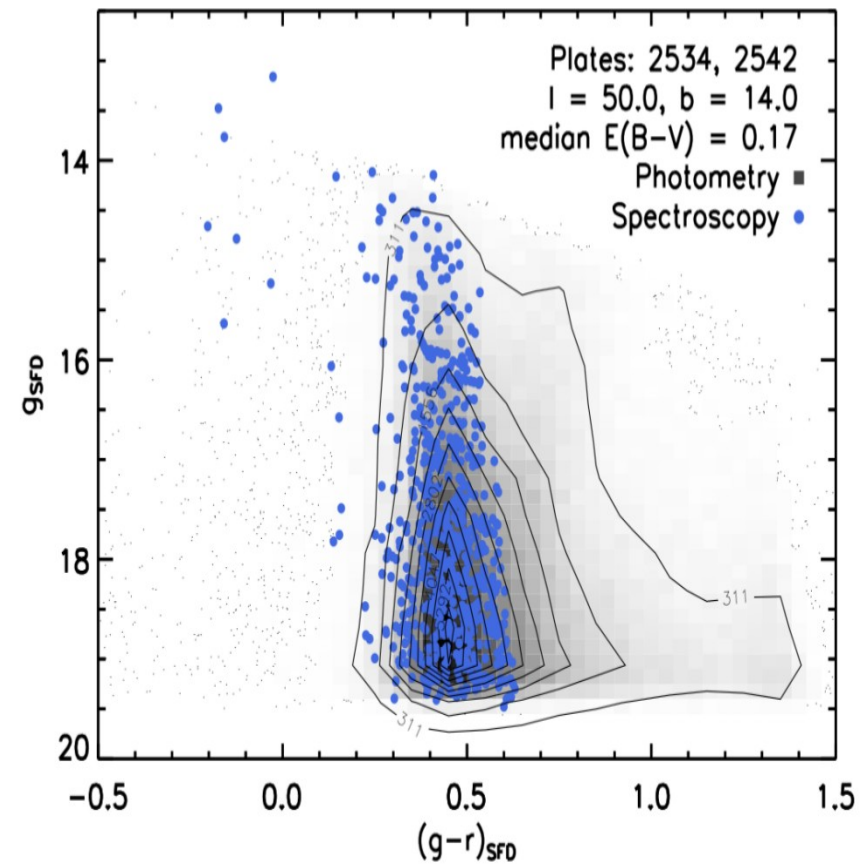
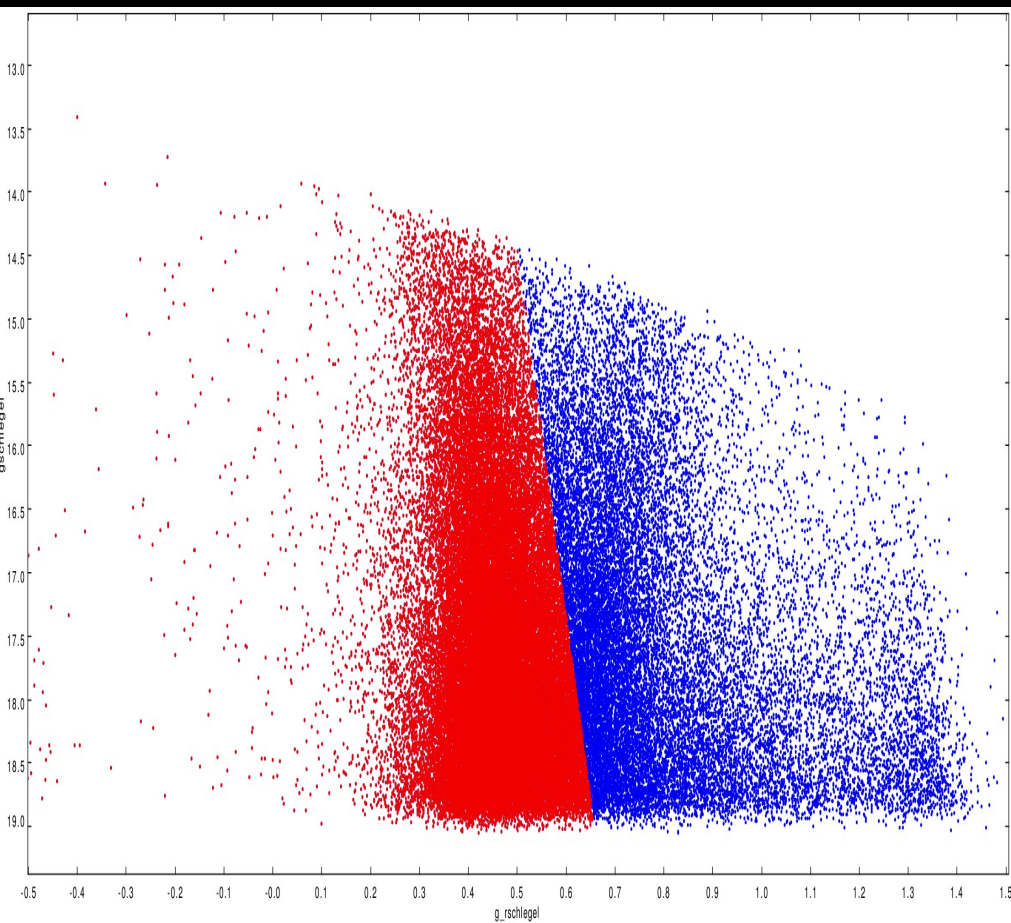
- Correct the magnitudes and color of stars with modified extinction model. Martins et al. (submitted)
- We apply the same selection function to simulations (Selection of the stars that will receive fibers).
- S/N and spectral parameters errors are simulated.
- Errors are 0.23 dex, 180 k and 0.24 dex respectively for metallicity, effective temperature and  $\log g$  (Smolinski et al. (2011))

- **Compare to observations** → selected stars in bins of  $g$  and  $g-r$ .

# Sample selection

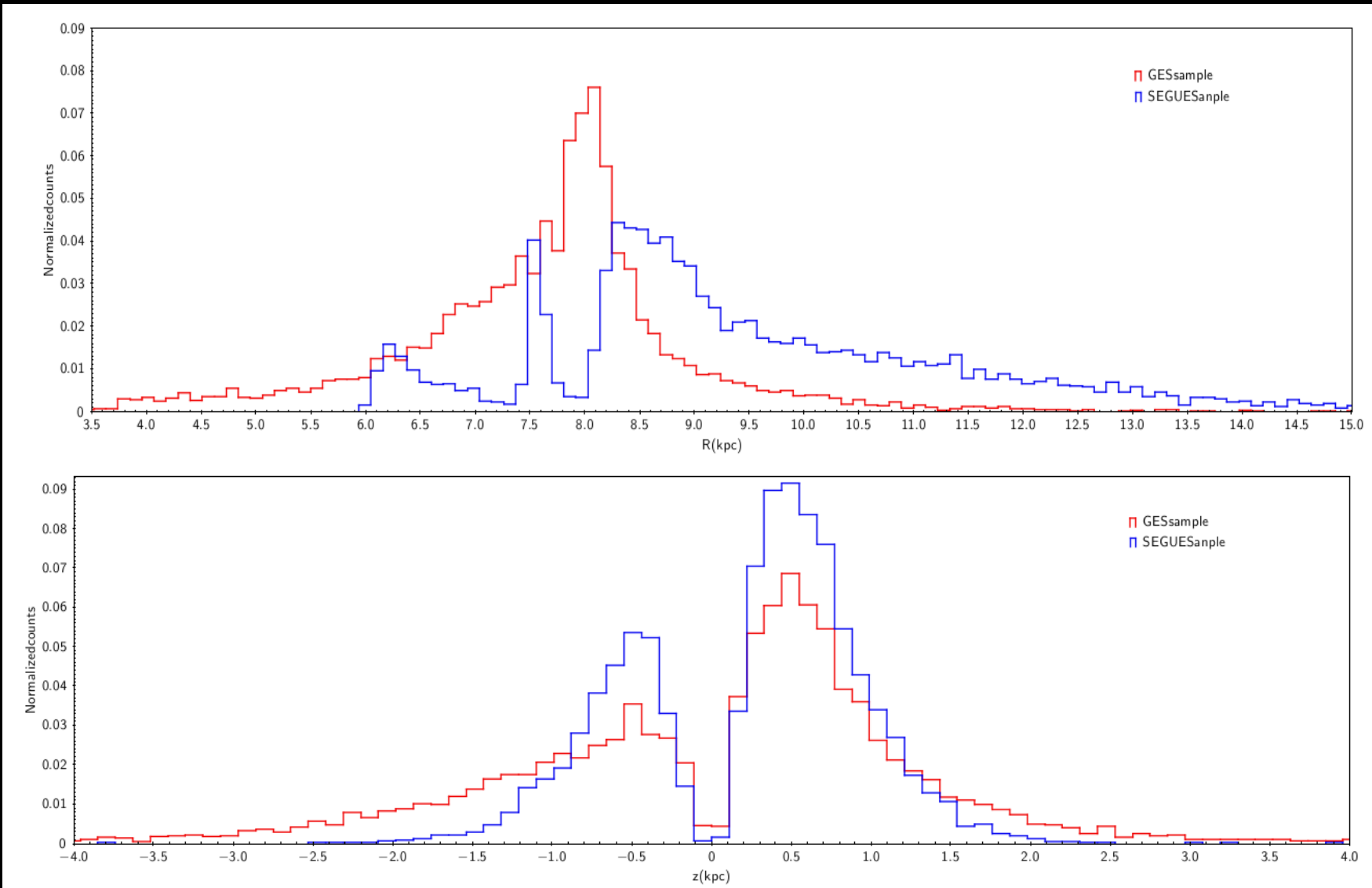
## Main Sequence Turn-Off stars

- Follow the low latitude sample selection (Cheng, J. Y., Rockosi, C. M., Morrison, H. L., et al. 2012, ApJ, 746, 149)



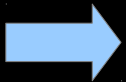
# Spatial coverage

- We cover regions:  $6.0 \text{ kpc} < R_{\text{gal}} < 14.0 \text{ kpc}$   
 $0.15 \text{ kpc} < |Z| < 1.5 \text{ kpc}$



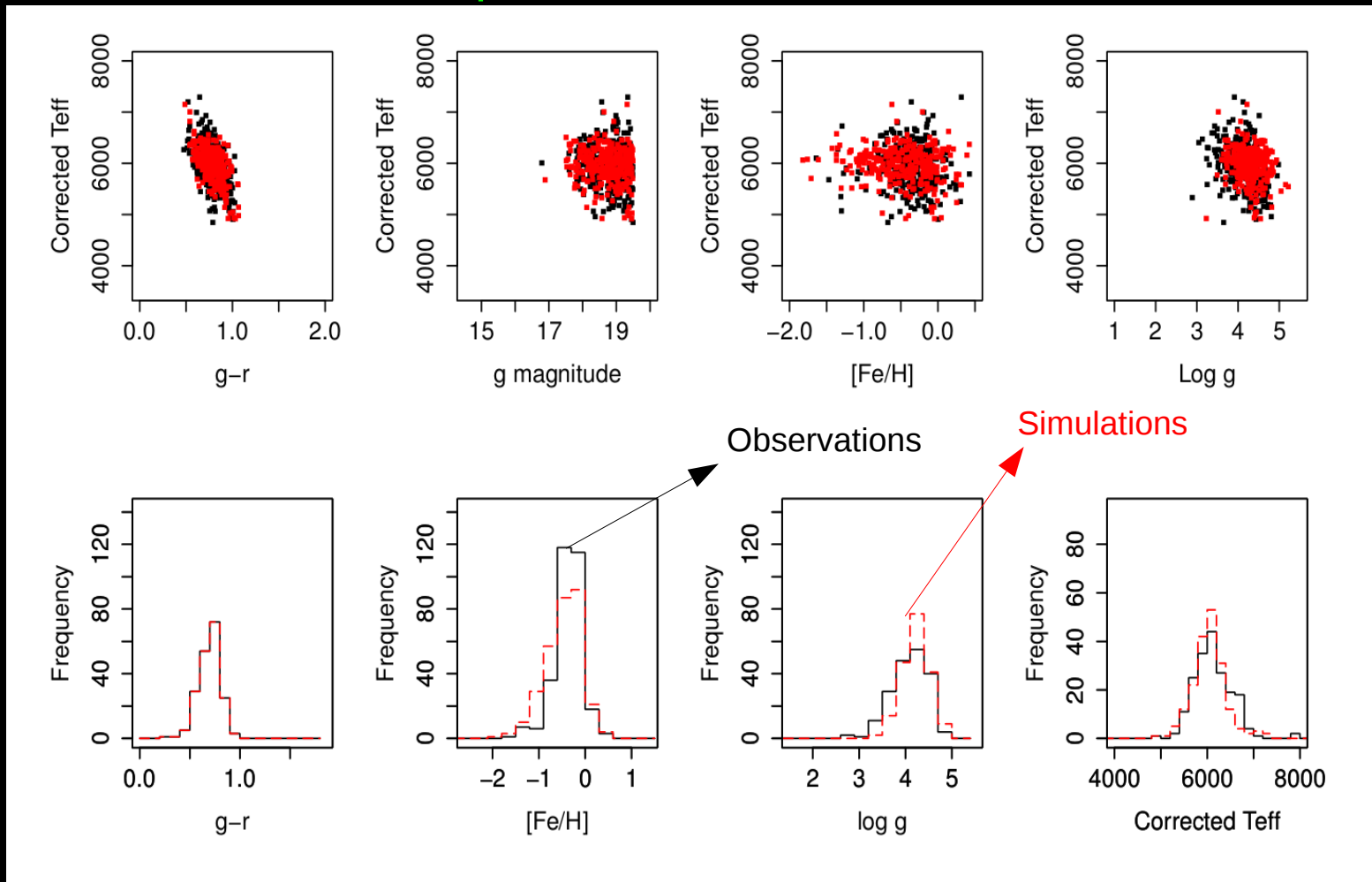
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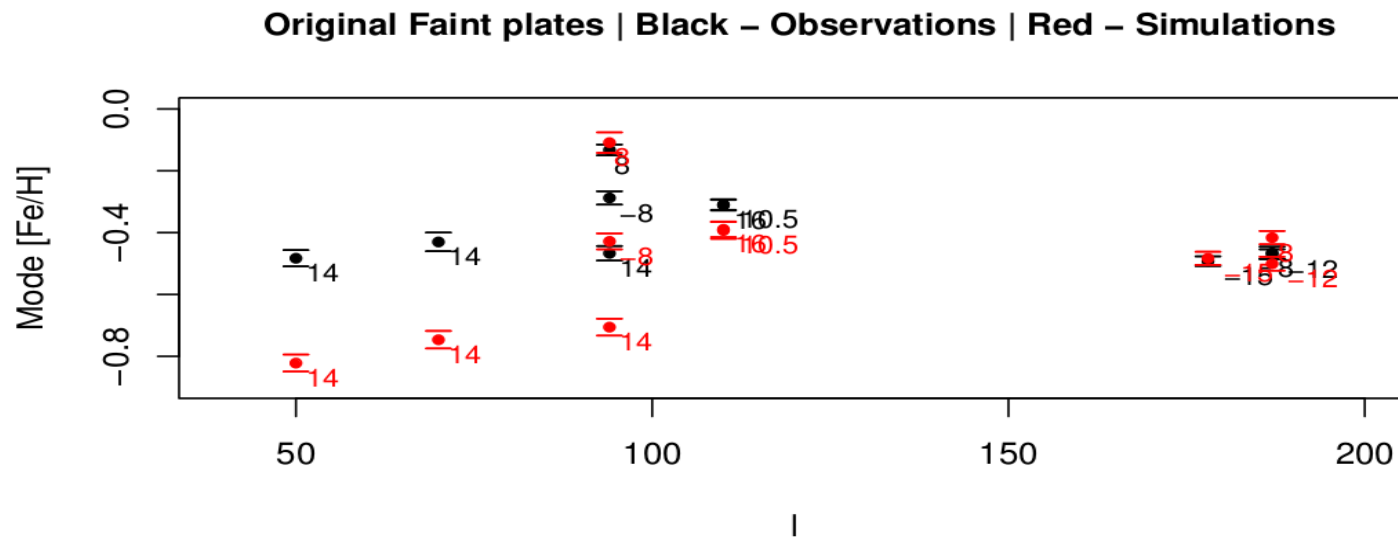
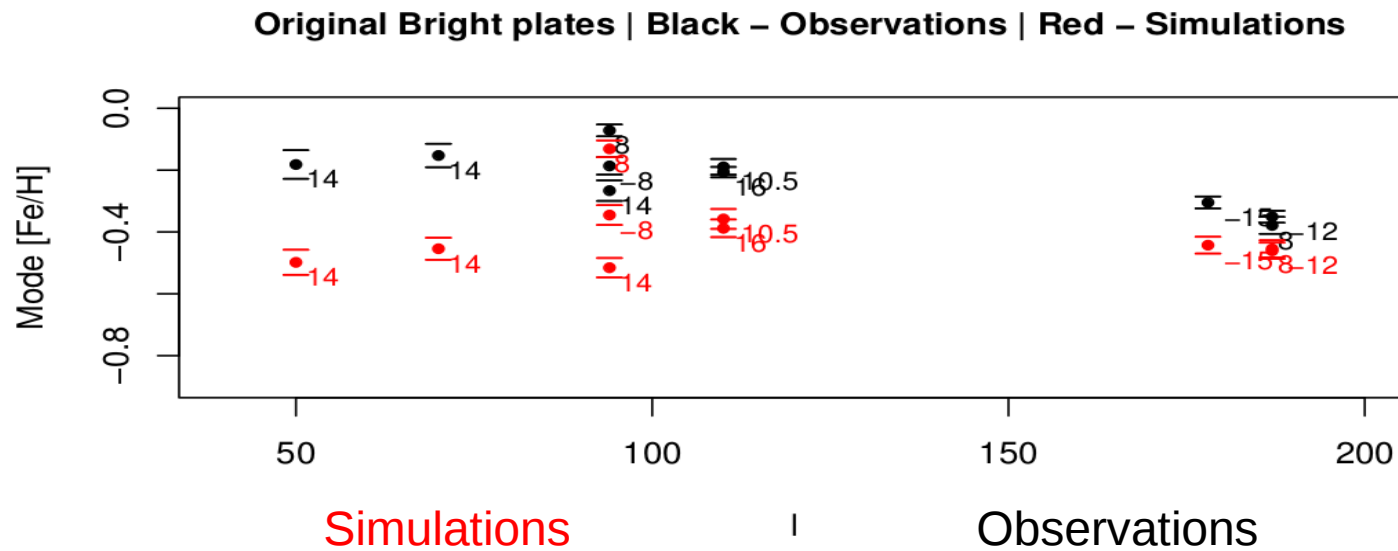


# Observations vs simulations

Faint plate  $\rightarrow l = 110^\circ$   $b = 10.5^\circ$



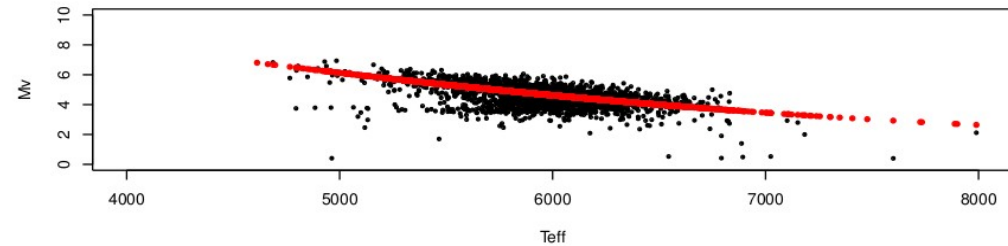
# Observations vs simulations



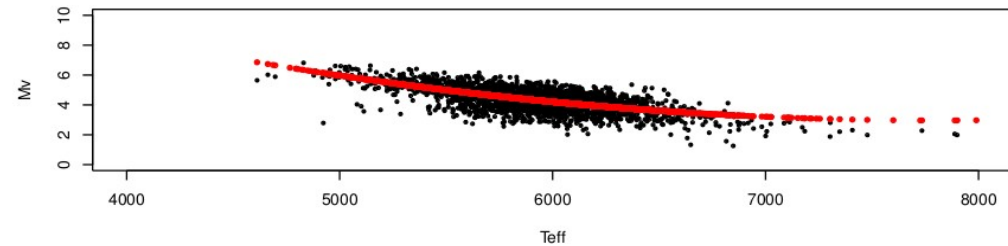
# Distances

- **Main Sequence Turn-Off stars** ➤ from the model we fit a relation between temperature  $T_{\text{eff}}$  and absolute magnitude ( $M_V$ ).
- The relation is established independently in three metallicity bins.

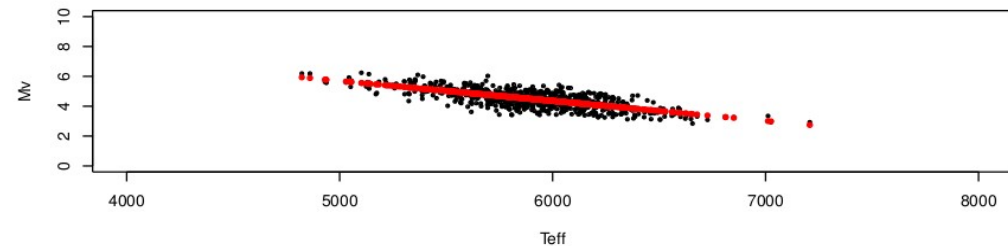
◆  $[\text{Fe}/\text{H}] < -0.5 \text{ dex}$  →

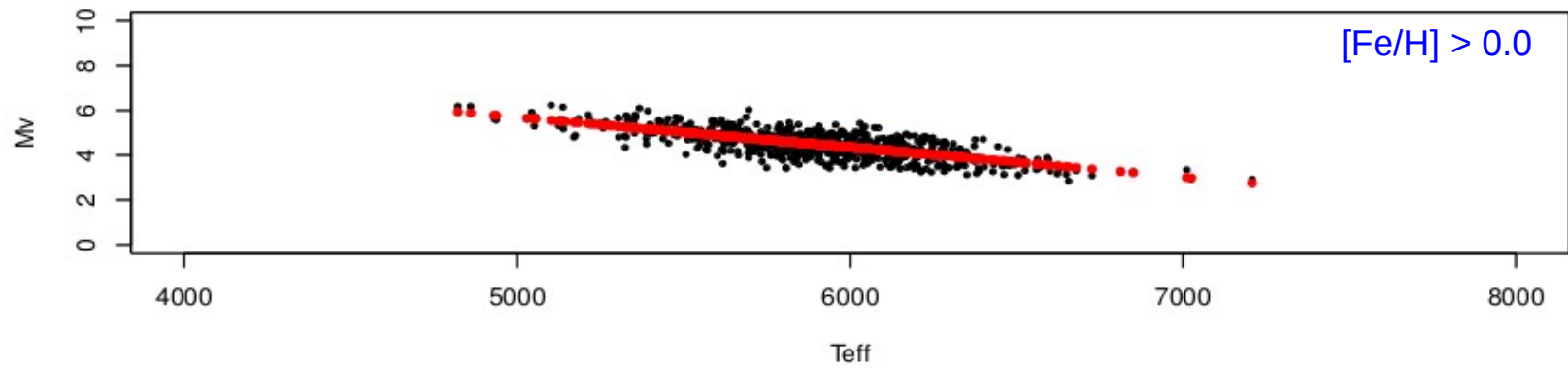
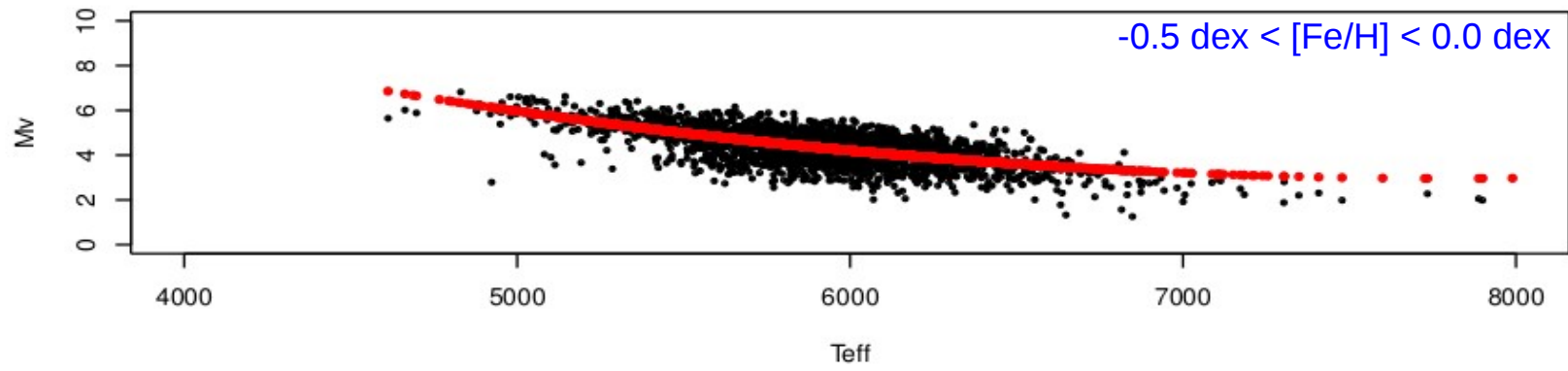
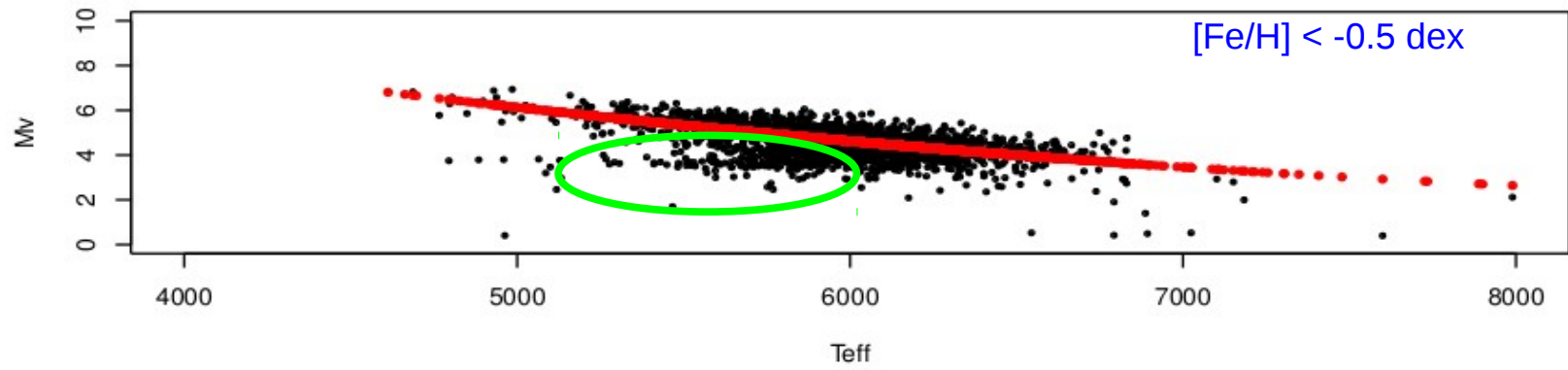


◆  $-0.5 \text{ dex} < [\text{Fe}/\text{H}] < 0.0 \text{ dex}$  →



◆  $[\text{Fe}/\text{H}] > 0.0$  →

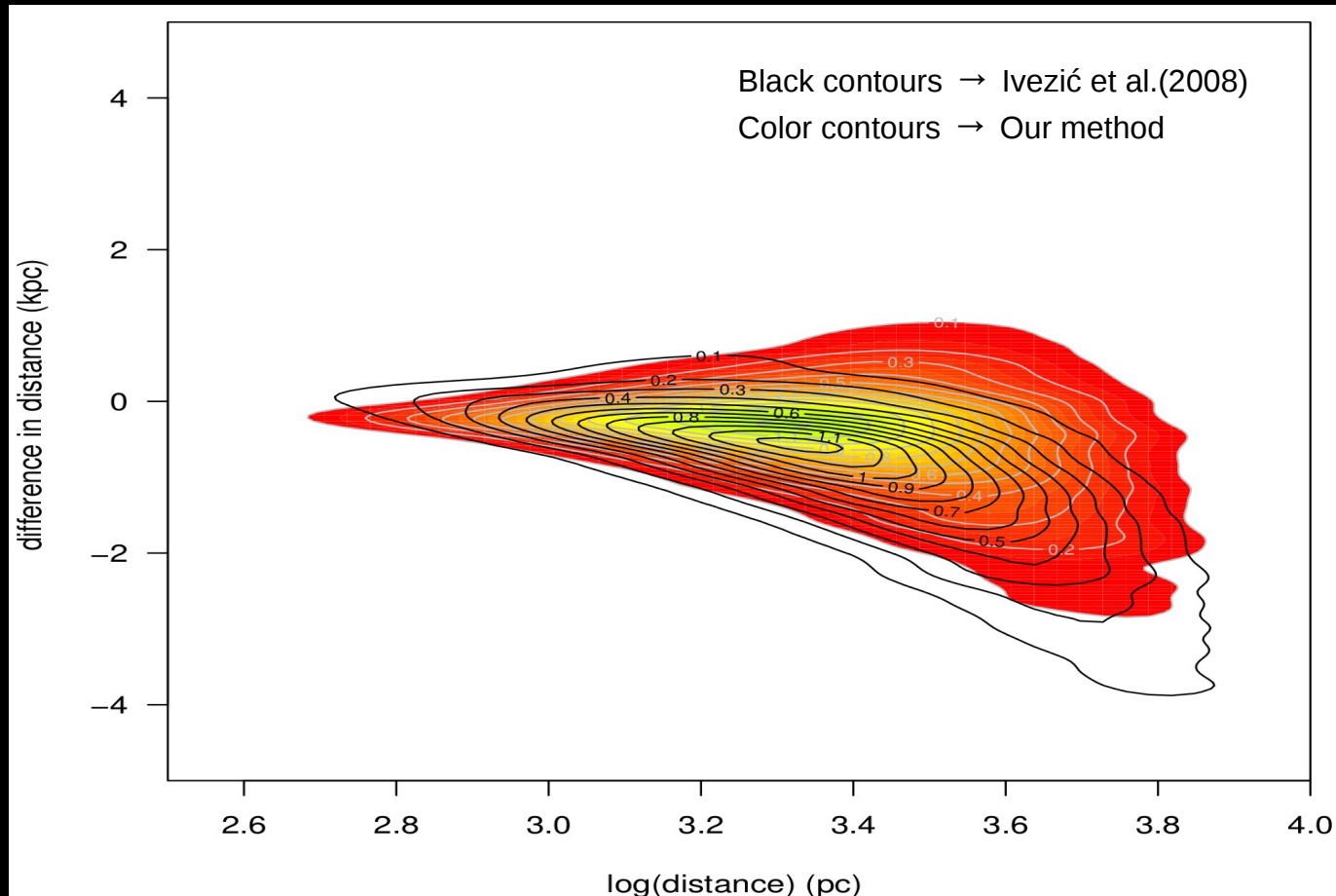






# Distances

- Compute the absolute magnitude for the obs/sim
  - Compute the distance modulus.
  - **Extinction is taken in account.**
- **The same bias**
- **A clear bias**  
 $d > 4.0$  kpc



# Fitting method

- We use the **log-likelihood** (Bienaymé et al. 1987) .

$$L_r = \sum_{i=1}^N q_i (1 - R_i + \ln(R_i))$$

- The data and simulations are binned in the distance metallicity space.
- The log-likelihood is a statistical distance (pseudolikelihood) so we have to use an **ABC/MCMC** (Approximate Bayesian Computation) method, where the sampling is done by a Metropolis-Hasting algorithm.

## MCMC/ABC Fitting method

For iter=1 to maxiter do

Repeat

Generate  $\theta'$  from the prior distribution  $\pi(\cdot)$

Generate  $z$  from the likelihood  $f(\cdot|\theta')$

until  $\rho \leq \varepsilon$

set  $\theta_i = \theta$

end for

$\rho$  → pseudolikelihood (Distance)

$\varepsilon$  → tolerance

$z$  → simulated distribution

## Bin size

→  $\text{Bin}_{[\text{Fe}/\text{H}]} = 0.25 \text{ dex}$

→  $\text{Bin}_{\text{distance}} = 1.0 \text{ kpc}$

# Results

- We fit for the thin and thick disc:
  - Local [Fe/H]
  - Radial metallicity gradients
  - Dispersion
- We fit:
  - i. Thick disc.
  - ii. Thick disc along with the thin disc
  - iii. Thick disc along with the old thin disc.
  - We have analyzed three cases for point ii.
    - Case 1: We use all fields.
    - Case 2: We don't use the anticenter fields.
      - ♦  $l = 187^\circ$ ;  $l = 178^\circ$ ;
    - Case 3: We don't use the inner fields.
      - ♦  $l = 50^\circ$ ;  $l = 70^\circ$ ;

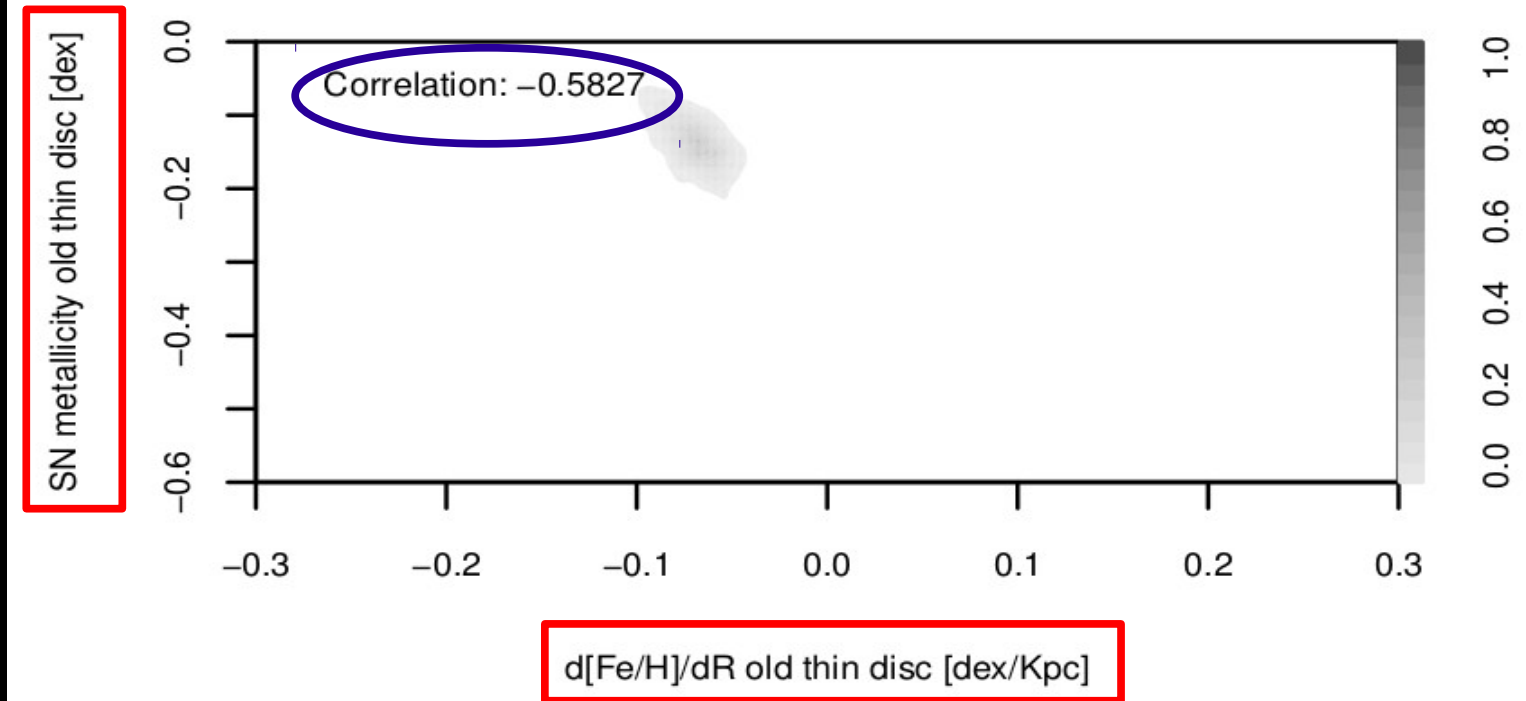
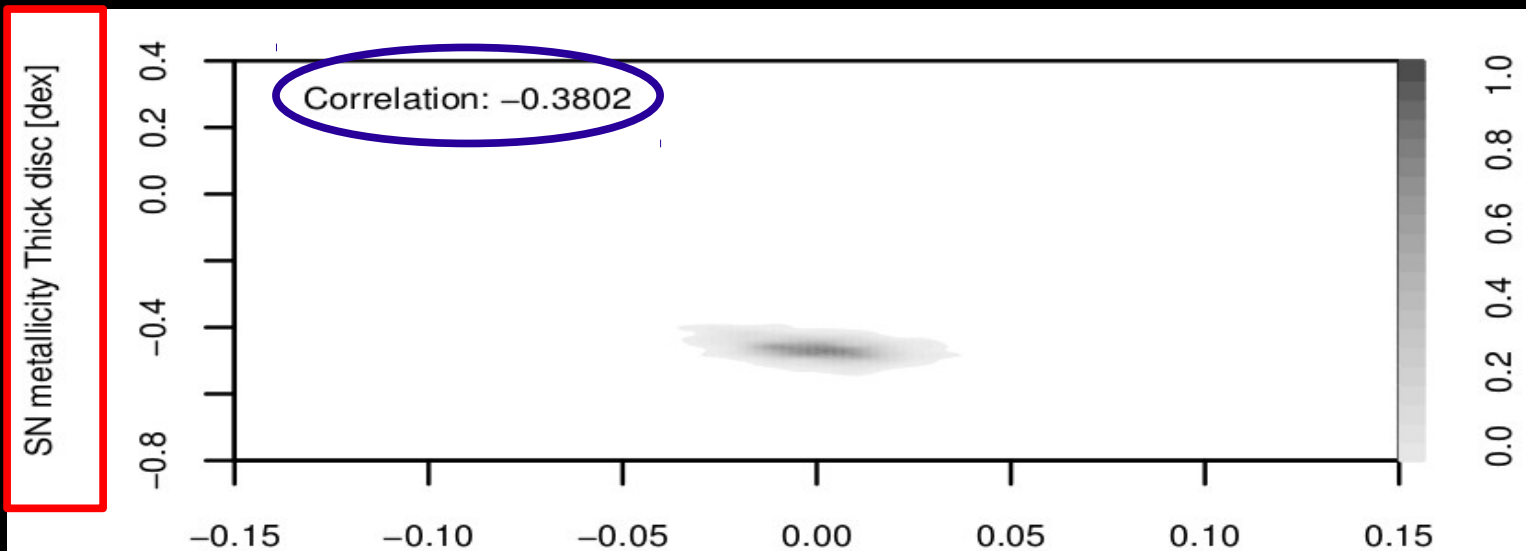
# Results - Thick disc along with the old thin disc

- Considering 10 independent runs:
  - The results are the mean.
  - The  $\sigma$  is the standard deviation.

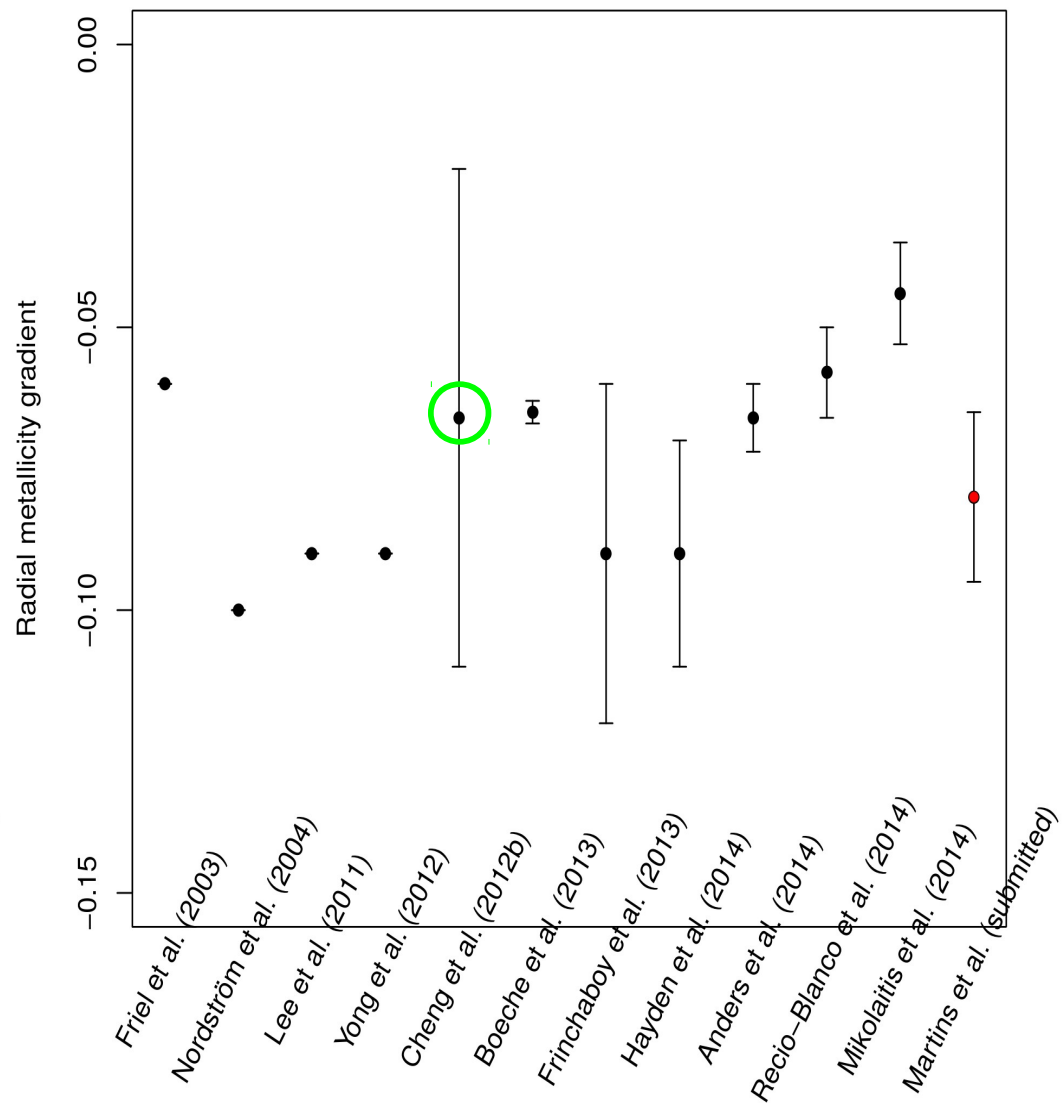
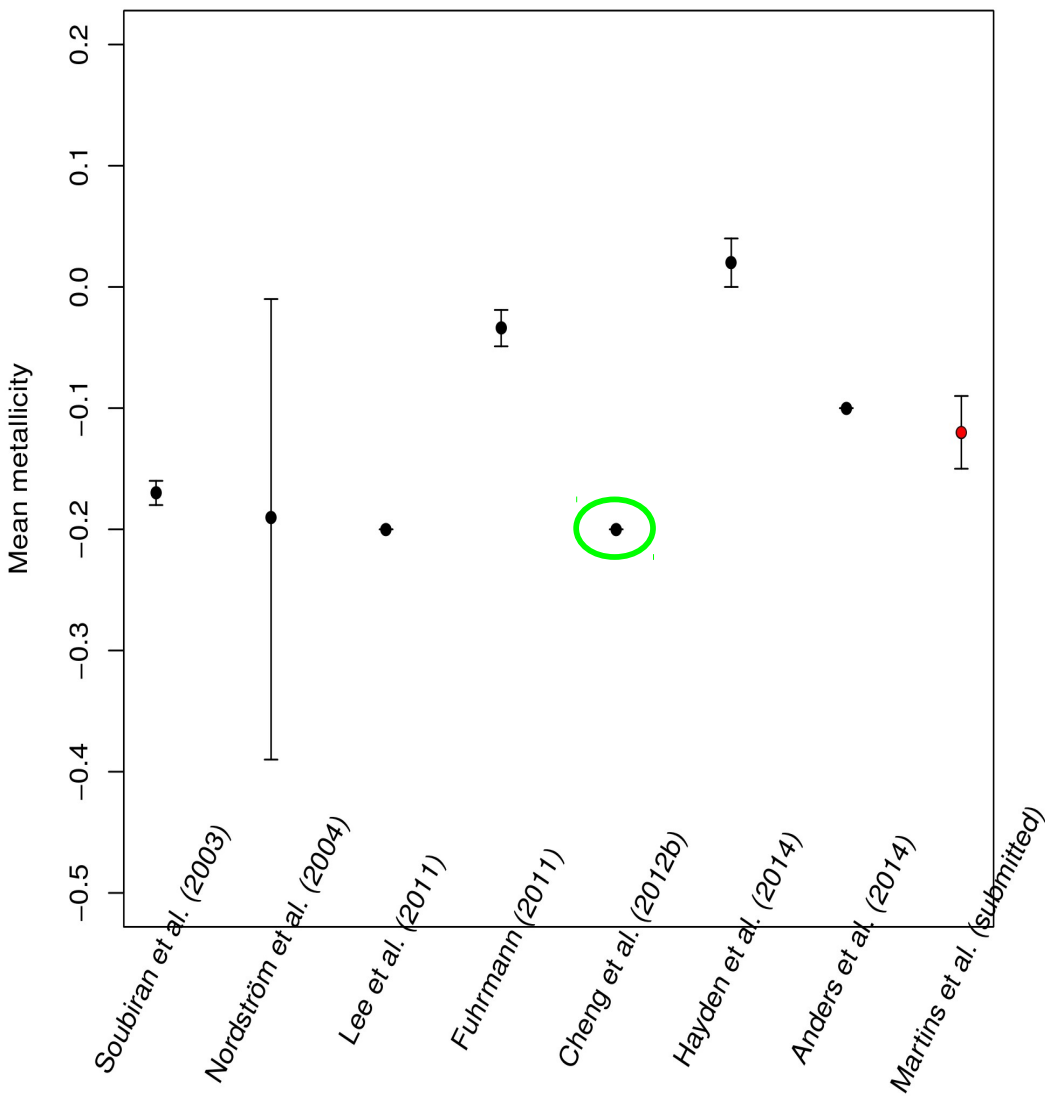
| case                 | $[Fe/H]_{SN_{Thick}}$<br>(dex) | $\frac{d[Fe/H]}{dR}$<br>(dex kpc <sup>-1</sup> ) | Disp<br>(dex) | $[Fe/H]_{SN_{Old Thin}}$<br>(dex) | $\frac{d[Fe/H]}{dR}$<br>(dex kpc <sup>-1</sup> ) | Disp<br>(dex) | $\mathcal{L}$ | BIC     |
|----------------------|--------------------------------|--|---------------|-----------------------------------|--|---------------|---------------|---------|
| All fields           | 1                              | -0.465   | -0.008        | 0.319                             | -0.116   | -0.079        | 0.135         | -511.05 |
|                      |                                | ±0.033   | ±0.015        | ±0.029                            | ±0.012   | ±0.015        | ±0.011        | ±16.63  |
| No anticenter fields | 2                              | -0.449   | 0.031         | 0.319                             | -0.116   | -0.086        | 0.135         | -269.10 |
|                      |                                | ±0.028   | ±0.025        | ±0.032                            | ±0.021   | ±0.040        | ±0.011        | ±9.08   |
| No inner fields      | 3                              | -0.418   | -0.030        | 0.304                             | -0.113   | -0.076        | 0.135         | -440.37 |
|                      |                                | ±0.024   | ±0.050        | ±0.038                            | ±0.017   | ±0.017        | ±0.011        | ±16.10  |

## Case 1

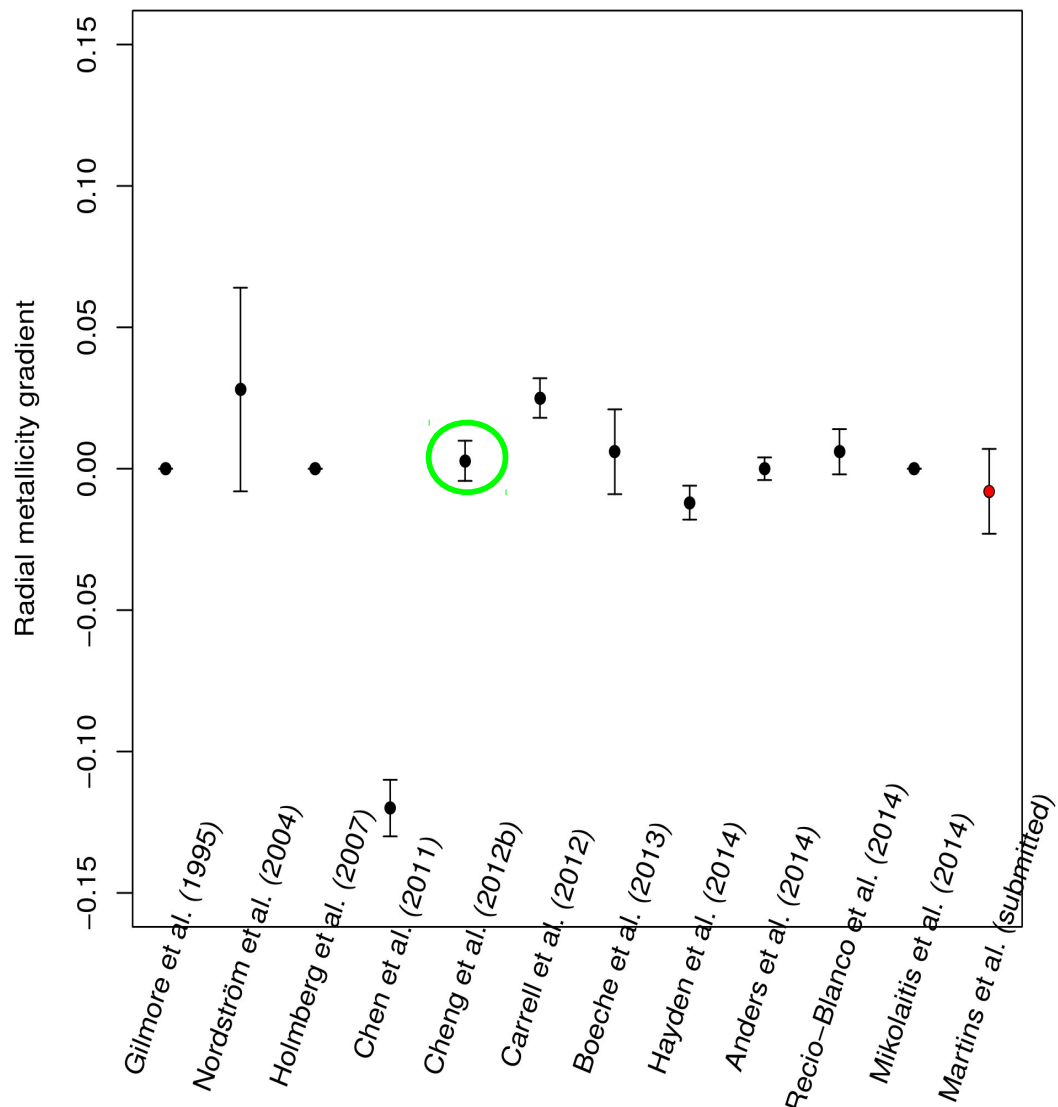
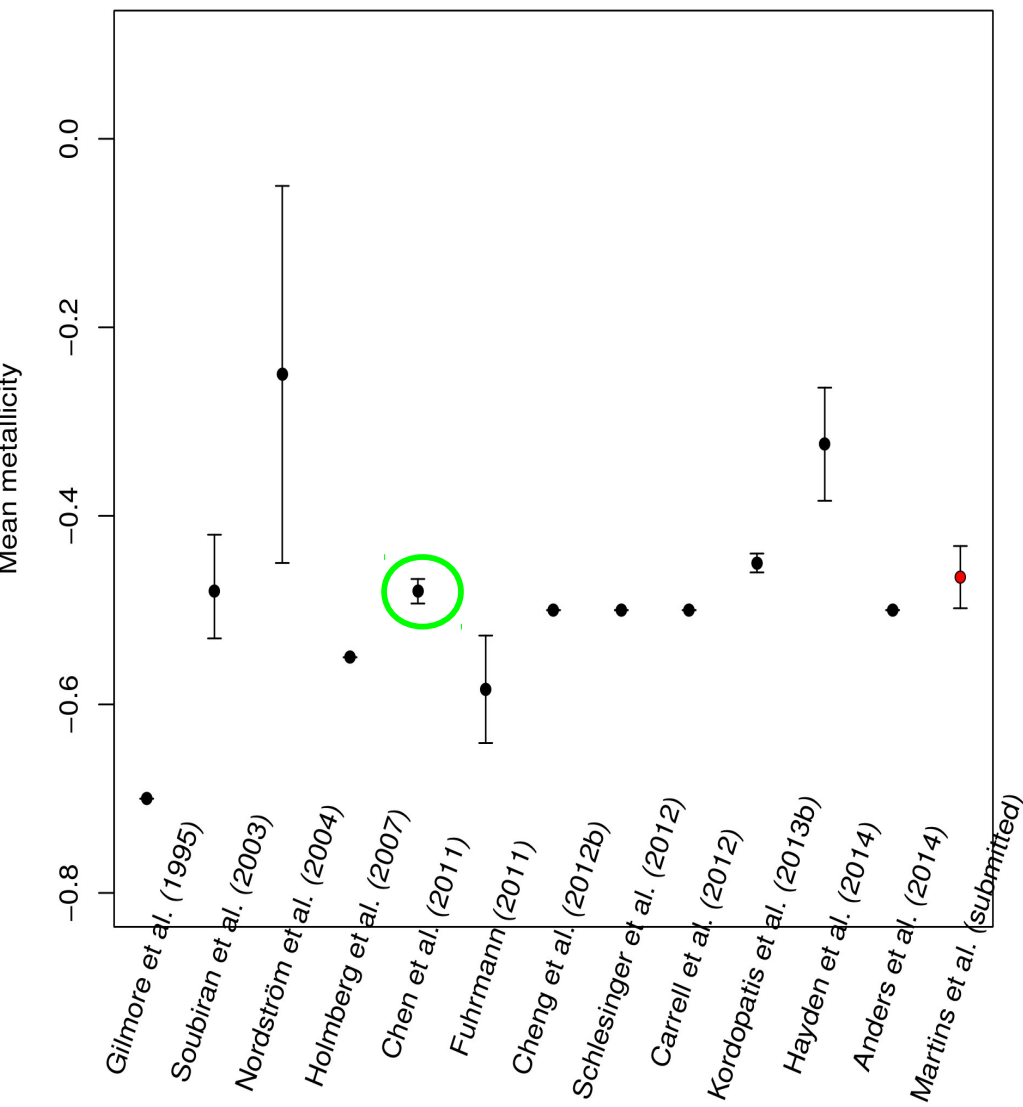
# Correlations



# Thin disc metallicity distribution from the literature



# Thick disc metallicity distribution from the literature



# The age of the thick disc

Case 1 → All fields

Table 8.11:

Sum of the likelihood values, for different ages of the thick disc, for the spectroscopic parameters (MSTO stars) with the fitted parameters.

| Age    | [Fe/H]  | $\sigma$ | $T_{\text{eff}}$ | $\sigma$ | $\log g$ | $\sigma$ |
|--------|---------|----------|------------------|----------|----------|----------|
| 8 Gyr  | -734.31 | 23.34    | -1133.74         | 49.38    | -424.284 | 17.06    |
| 9 Gyr  | -693.68 | 10.78    | -1032.26         | 10.84    | -400.93  | 5.780    |
| 10 Gyr | -695.19 | 15.90    | -990.16          | 39.27    | -449.12  | 14.49    |
| 11 Gyr | -695.84 | 10.09    | -969.23          | 10.22    | -388.55  | 6.63     |
| 12 Gyr | -605.94 | 11.72    | -790.60          | 13.46    | -361.15  | 9.108    |
| 13 Gyr | -706.82 | 13.56    | -1025.64         | 31.84    | -448.57  | 13.79    |



# Results

- If thick disc has a single epoch formation
  - 12 Gyr is the best age for this population.
  - The isochrone from Bergbush and vandenbergh (1992) that best fits these data is the one with  $\text{Fe}/\text{H}=-0.5$  and age of 12 Gyr.
- We tried to fit two radial metallicity gradients in the thick disc adding a parameter  $R_{\text{change}}$  → Results are compatible with no slope in the thick disc.

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# Discussion – Thick disc formation scenarios

- The confirmation of a null radial metallicity gradient in the thick disc  
→ **Radial mixing in gas or stars is important**

## ➤ Gas mixing

- High SFI → strong turbulent gaseous disc Brook et al. (2004), Lehnert et al (2009), Bournaud et al. (2009), Haywood et al. (2013)

*Thick disc was formed in a highly mixed gas producing a **chemically homogeneous thick disc***

## ➤ Star + Gas mixing

- **Radial migration** (Sellwood & Binney (2002), Schönrich & Binney (2009a), Schönrich & Binney (2009b)) can also flatten gradients
- The radial mixing in a disc can be also a consequence of the **minor mergers** Kazantzidis et al. (2008), Quillen et al. (2009), Bird et al. (2012).
  - Radial mixing becomes **stronger at large  $|z|$** . Explains a flat gradient in the thick disc, not found in the thin disc.

- Direct accretion of stars (Statler (1988), Toth & Ostriker (1992), Quinn et al. (1993), Velazquez & White (1999) and Abadi et al. (2003)).

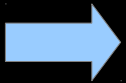
- Results cannot rule out this scenario

# Conclusions

- The thin disc local metallicity and radial metallicity gradient are in agreement with literature
- The thick disc local metallicity is found to be around  $-0.5$  dex in SEGUE
  - There is no radial metallicity gradient in the thick disc
    - This result indicates the existence of radial mixing in gas or stars
  - An inversion of the thick disc radial metallicity gradient seems less probable
- ★ The method allowed the study of correlations

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# Perspectives

- The GES analysis (DR2) will be performed on future releases with larger samples and improved calibrations.
  - Use the  $[\text{Fe}/\text{H}]$  vs  $[\alpha/\text{Fe}]$  sequence
- Apply the analysis tools and techniques, developed with SEGUE and Gaia ESO survey, to APOGEE.
- Combine the results from different surveys.

It will help to constrain better:

- Vertical metallicity gradients.
- SFH of the thick disc.
- Explore chemical evolution in thick disc phase

Robin, A. C., Reylé, C., Fliri, J., et al. 2014, Czeka M., Robert C. P., and Martins A. M. M., A&A, 569, A13

- Increase the precision of our results.

# Perspectives

- Use of kinematical data combined with metallicity distributions to understand the thick disc formation.
  - Study the **rotational velocity** as a function of **metallicity**
  - $\sigma_{u,v,w}$  as a function of **metallicity**
  - Study the **eccentricity** as a function of **metallicity**

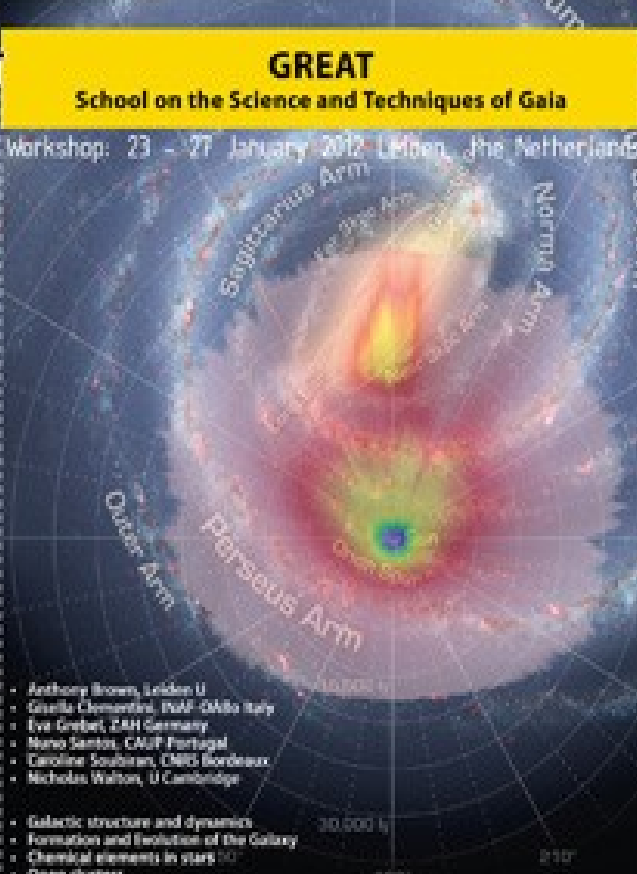
# Thanks

**Lorentz center**

## GREAT

### School on the Science and Techniques of Gaia

Workshop: 23 - 27 January 2012, Leiden, The Netherlands



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- Giulia Clementini, INFN-OABo Italy
- Eva Grebel, ZAH Germany
- Nuno Santos, CAUP Portugal
- Caroline Soubiran, CNRS Bordeaux
- Nicholas Walton, U Cambridge

**Topics**

- Galactic structure and dynamics
- Formation and evolution of the Galaxy
- Chemical elements in stars
- Open clusters
- Exoplanets
- Asteroids and the origins of the solar system
- Variable stars
- Asteroseismology of stellar populations
- The distance scale of the universe
- The transient sky
- Introduction to the Gaia mission

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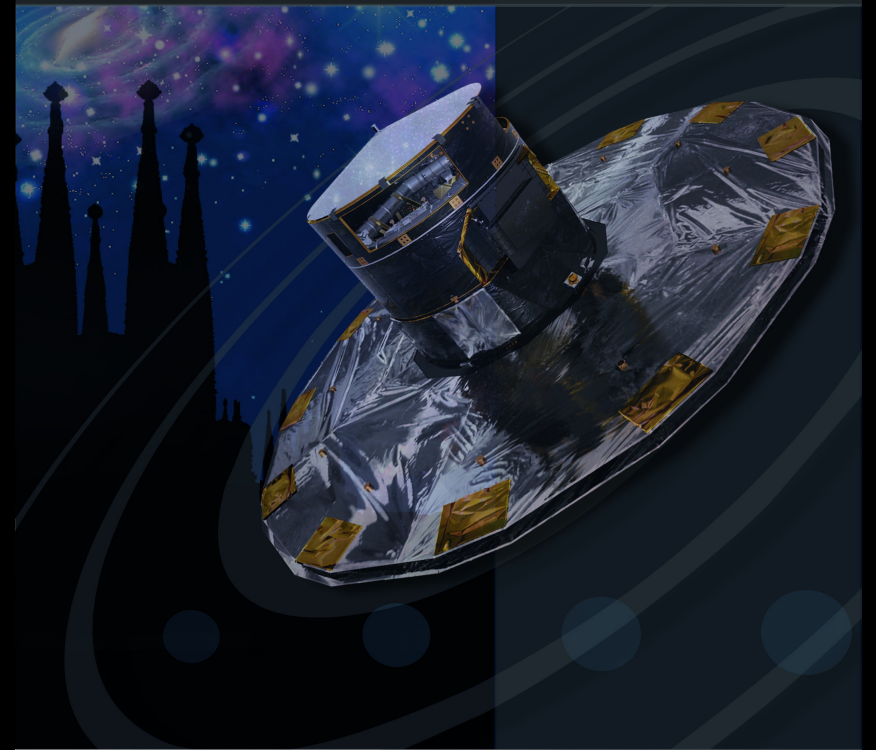
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## The Milky Way Unraveled by Gaia

### GREAT Science from the Gaia Data Releases



**1-5 December 2014**

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