

# A new kinematic survey (from SDSS-DR7 & GSC-II) to search for fossil records in the Milky Way

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Univerza v Ljubljani



Gaia: at the frontiers of Astrometry © Sevres - 9 June 2010

## The beginning...

To determine the intrinsic properties of individual objects observed by Galactic Surveys (e.g., RAVE and SDSS)

- ★ discrete source classification

  - ↪ star, binary, etc.

  - ↪ identification of new types of objects

- ★ (stellar) astrophysical parameter estimation

  - ↪  $T_{\text{eff}}$ ,  $\log g$ ,  $[\text{Fe}/\text{H}]$ ,  $([\alpha/\text{Fe}], V_{\text{rot}}, A_V, \dots)$

- ★ learning from (astronomical) data, e.g. spectra: kNN, ANN, SVM, PCA

↪ Catalog with astrophysical information (e.g. [A new kinematic survey!](#))

*Thank to: Tomaž Zwitter & RAVE Collaboration; Coryn Bailer-Jones & CU8, Tim Beers & SEGUE Collaboration; B. Bucciarelli, R.E. Drimmel, M.G. Lattanzi, R.L. Smart, A. Spagna (OATo team)*

## Galactic Surveys

### ★ SDSS-II/SEGUE: The Sloan Digital Sky Survey

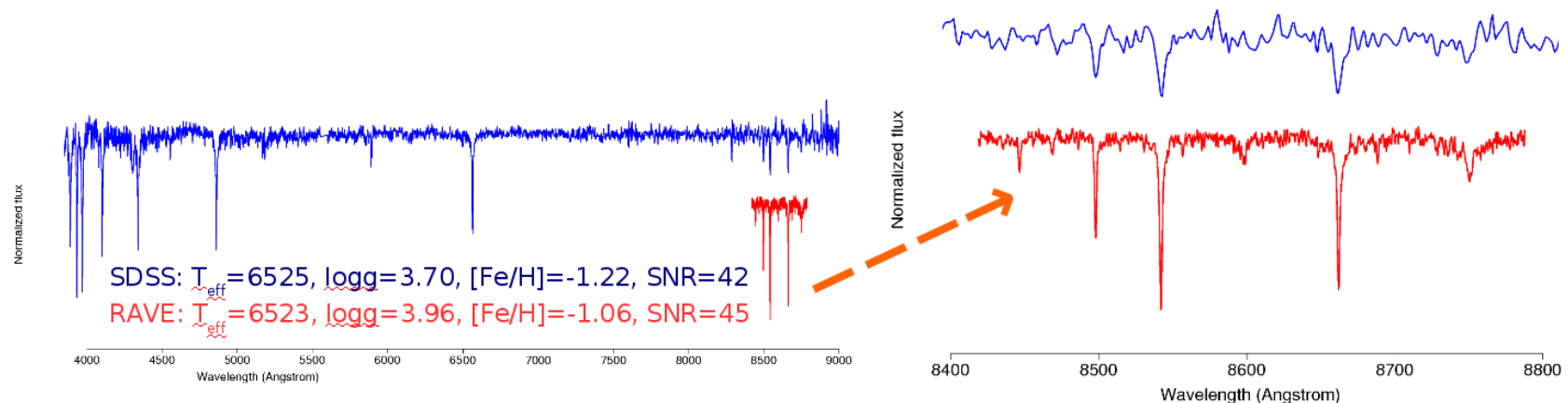
northern hemisphere, one-quarter of the sky in 2008 (CCD camera on the 2.5-m telescope on Apache Point, New Mexico)

- ↪ 11 663 deg<sup>2</sup> of imaging data (position and multicolor photometry,  $14.0 \leq g \leq 20.5$ ) of  $\sim 357$  million stars; including data (3500 deg<sup>2</sup>) at lower Galactic latitudes ( $|b| < 40^\circ$ ),
- ↪ Spectra ( $\lambda\lambda$  3850–9000 Å) with  $R=2000$  for approximately  $\sim 300\,000$  Galactic stars,
- ↪ Radial velocities with typical accuracy of  $10 \text{ km s}^{-1}$ .

### ★ RAVE: The RAdial Velocity Experiment

southern hemisphere,  $\sim 1$  million bright stars by 2010 (6dF multi-object spectrograph on the 1.2-m UK Schmidt Telescope of the Anglo-Australian Observatory)

- ↪ Spectra ( $\lambda\lambda$  8410–8795 Å) with  $R=7500$  for approximately  $\sim 350\,000$  Galactic stars off the Milky Way plane ( $|b| > 25^\circ$ ),
- ↪ Radial velocities accuracy better than  $2 \text{ km s}^{-1}$  (RV:  $\# 50\,k / \sim 150\,k$ ; APs:  $\# 25\,k / \sim 100\,k$ ),
- ↪ cross-identification with photometric ( $9 \leq I \leq 12$ ) and astrometric catalogues.



## Dimensionality reduction: Principal Components Analysis

Represent a set of  $N(788)$ -dimensional data ( $\mathbf{x}_p$ ) by means of their projection ( $a_{kp}$ ) onto a set of  $r < N$  optimally defined axes ( $\mathbf{u}_k$ ).

- admixture coefficients:

$$a_{kp} = \mathbf{x}_p \cdot \mathbf{u}_k$$

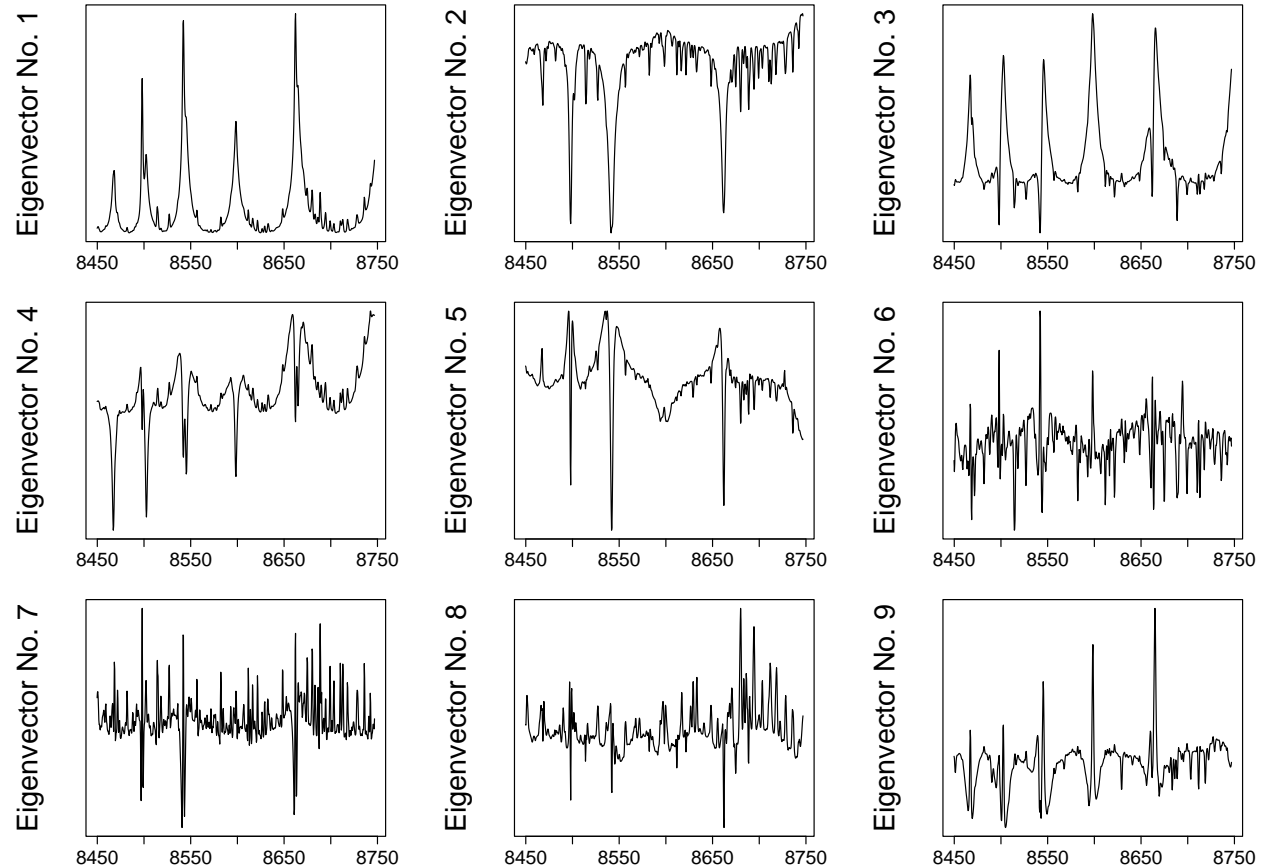
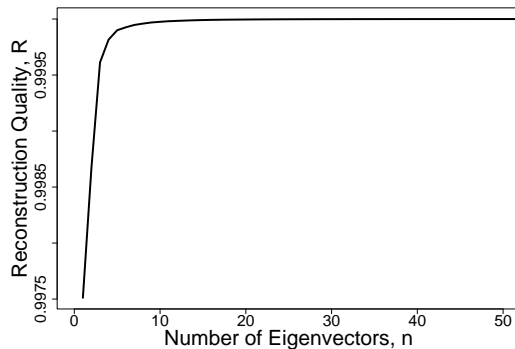
- reduced reconstruction:

$$\mathbf{y}_p = \sum_{k=1}^{k=r} a_{kp} \mathbf{u}_k$$

$r < N$

- reconstruction quality:

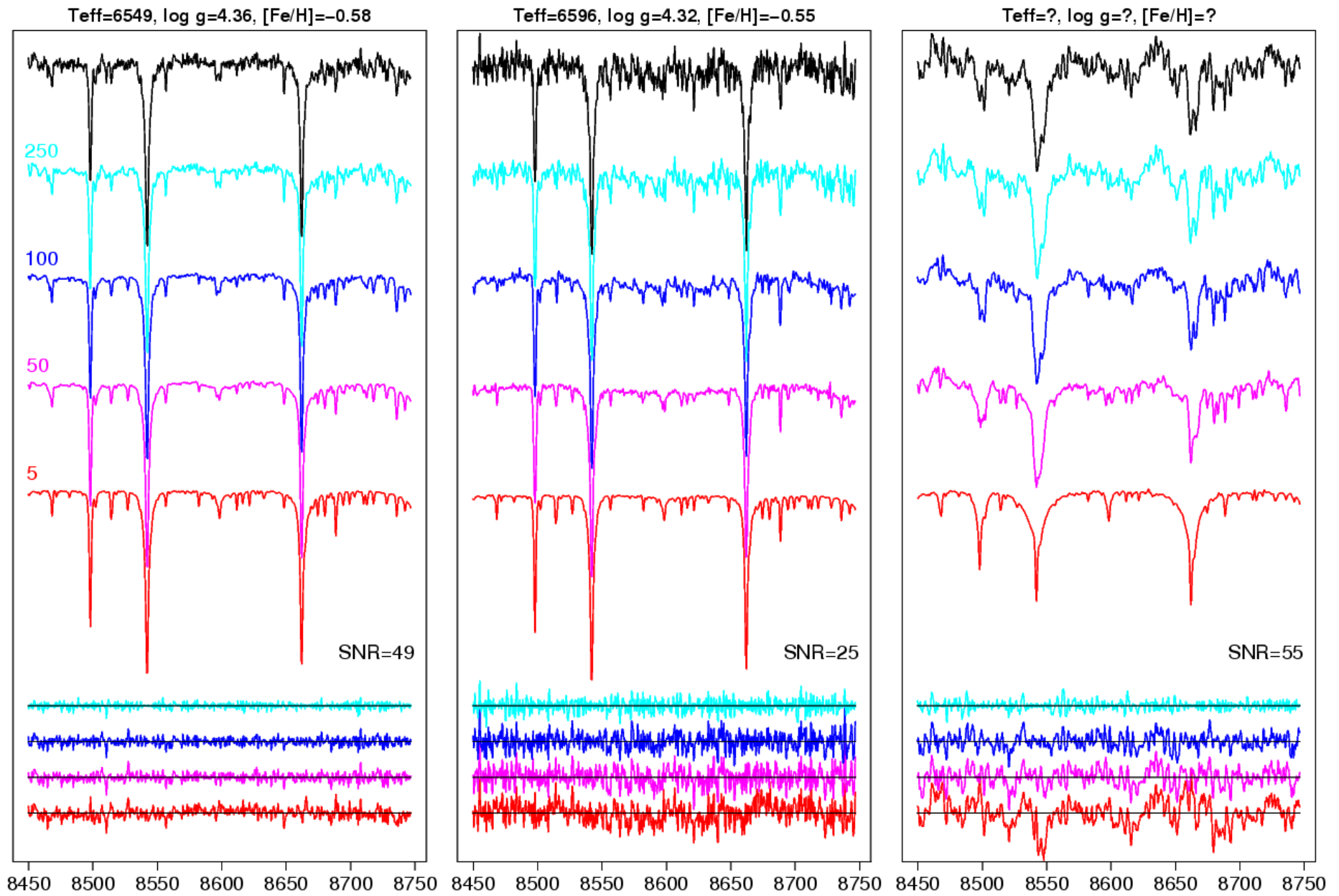
$$R = \frac{\sum_{k=1}^{k=r} \lambda_k}{\sum_{k=1}^{k=N} \lambda_k}$$



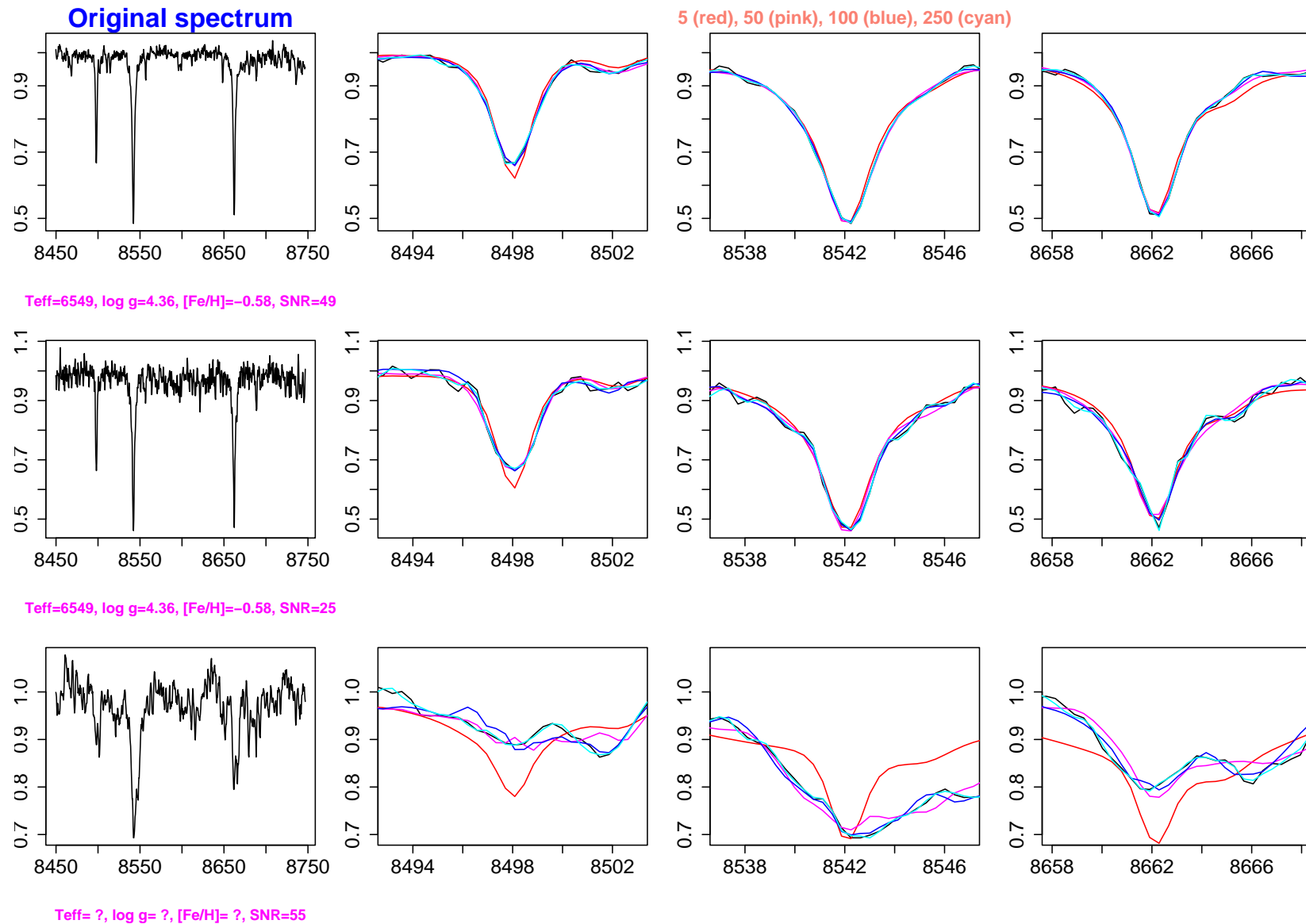
1:9 PCs (eigenvectors plotted against wavelength) of the spectra in training set.

Removal of noise/rare features!

# Constructing RAVE spectra by projection onto the synthetic PCs



## Constructing RAVE spectra by projection onto the synthetic PCs



RAVE spectra. Zooming in around CaII triplet, color coded lines indicate the number of eigenvectors used to reconstruct the spectrum.

## In this talk...

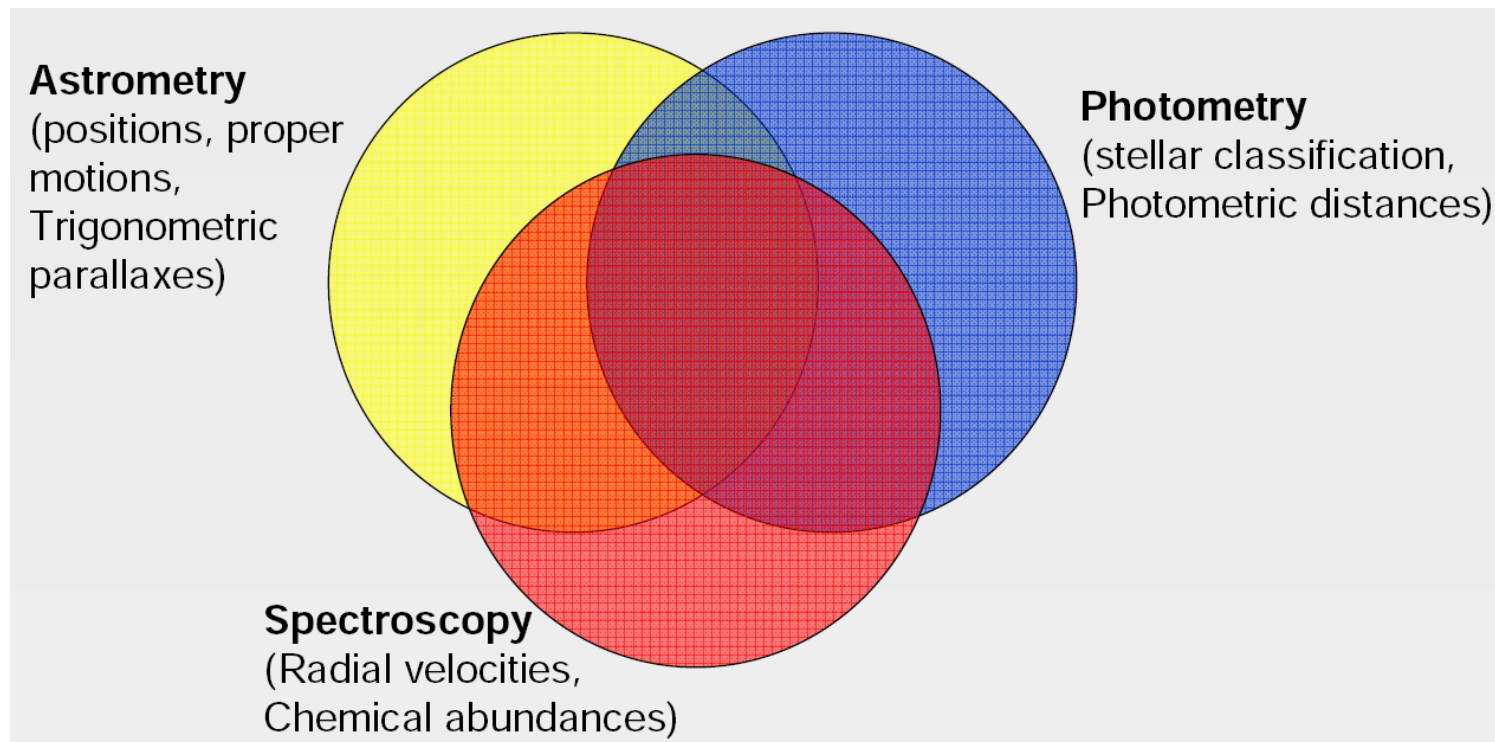
### ★ What do we do? A new wide field kinematic survey

- ★ ingredients: survey/data base (SDSS, GSC-II)
- ★ preparation:
  - ↪ proper motions (calculation & precision/accuracy)
  - ↪ astrophysical parameter estimation (e.g.  $T_{\text{eff}}$ ,  $\log g$ ,  $[\text{Fe}/\text{H}]$  & validation/improvement)
  - ↪ distance...plus  $RV$ : phase-space!
- ★ 6D  $\rightarrow$  7D (9D)

### ★ Where do we go from here? Exploiting the results...

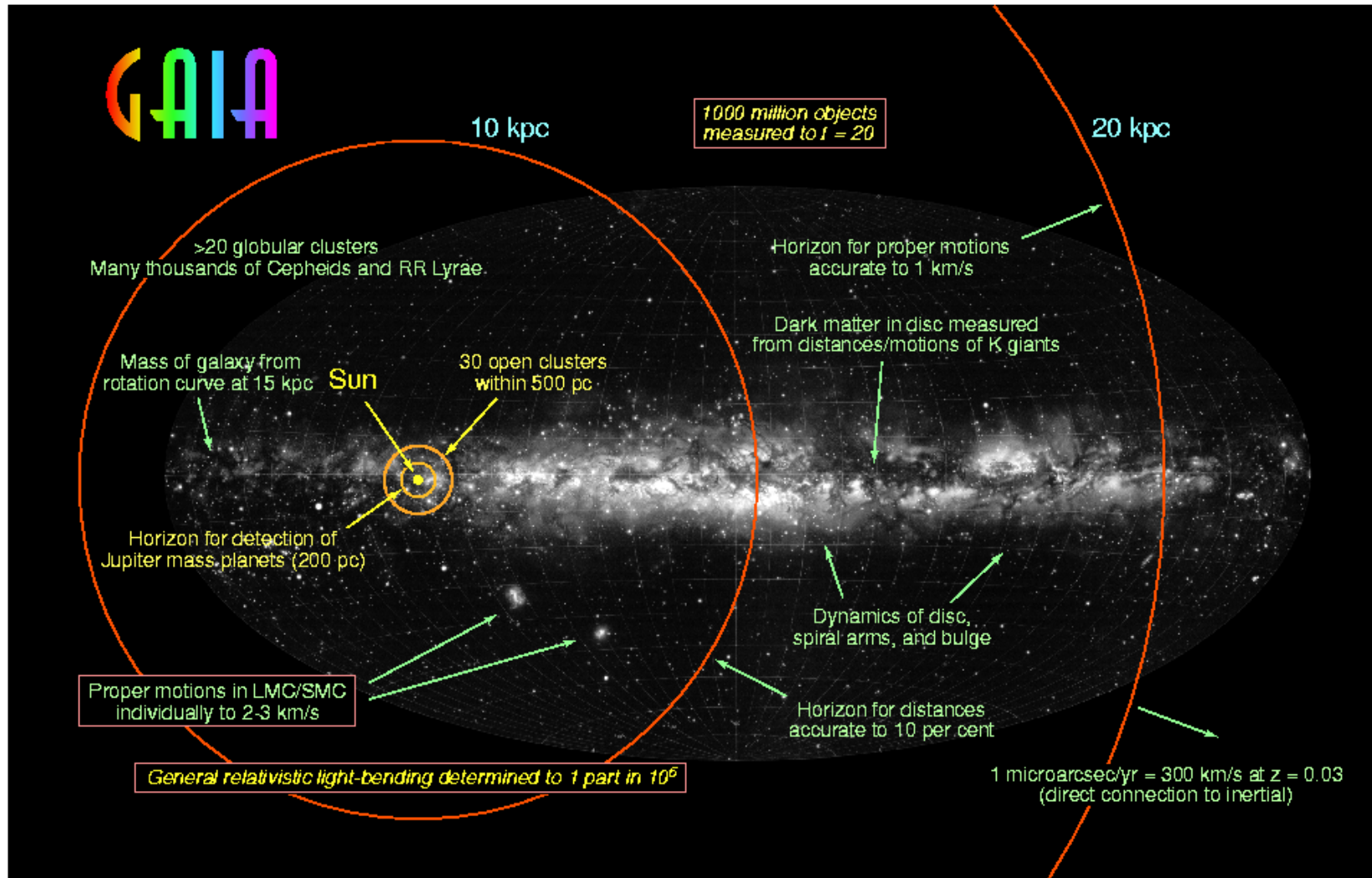
- ★ Define & describe (kinematic & chemical properties) new samples of stellar tracers for Galactic investigations
- ★ Kinematic & chemical analysis: search for fossil records in the Milky Way

## Surveys of galactic stellar populations: basic ingredients



- ...Crucial points!
  - ↪ identification of stellar **populations** (Halo, Disk);
  - ↪ investigation of methods for estimating **stellar parameters** from **photometric** and **spectroscopic data**, e.g.  $[\text{Fe}/\text{H}]$ ;
  - ↪ **distance** estimate: e.g. photometric, trigonometric;
  - ↪ combination of **astrometric data**, in order to derive velocities and remove degeneracies;





Illustrative summary of the primary Gaia scientific goals, superimposed on the Lund map of the MW and Local Group galaxies. From Gilmore et al. 1998, SPIE 3350, 541

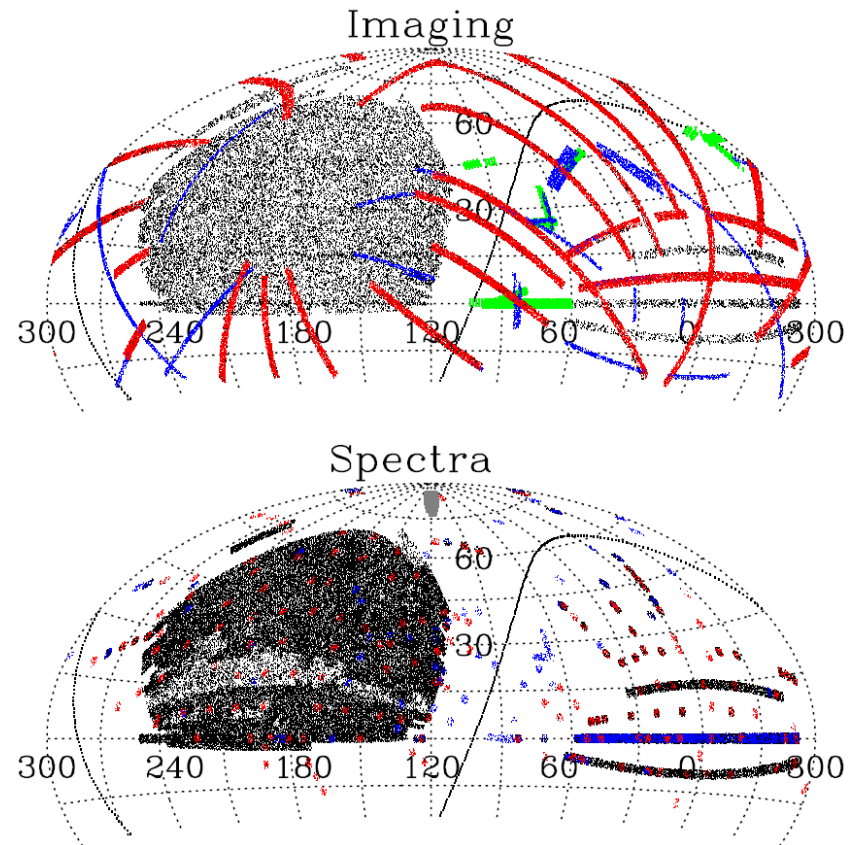
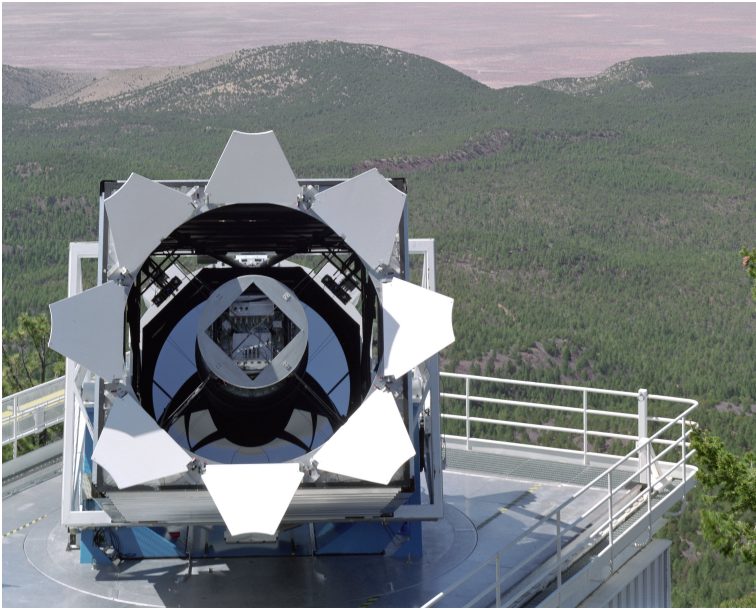
↪ **large samples** of astrometric and spectro-photometric data: e.g. GSC-II, SDSS-I, & SDSS-II/SEGUE (SDSS-III/SEGUE), RAVE, Gaia (spring 2012).

# The Sloan Digital Sky Survey

## ★ SDSS-I & SDSS-II/SEGUE (DR7)→ III

northern hemisphere, one-quarter of the sky (CCD camera on the 2.5-m telescope on Apache Point, New Mexico)

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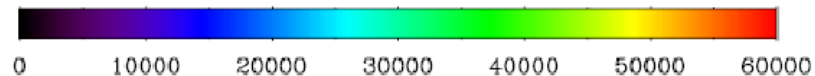
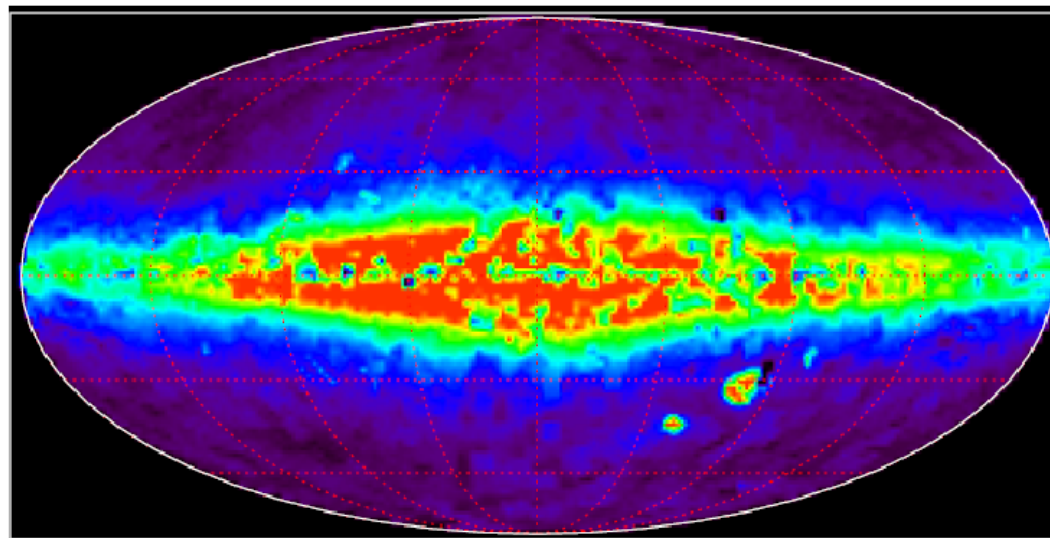
e.g., Abazajian+2008, ApJS 175, 297; Abazajian+2009, ApJ in press; Yanny+2009, AJ 137, 4377

# The Second Guide Star Catalog

## ★ GSC-II (OATo & STScI)

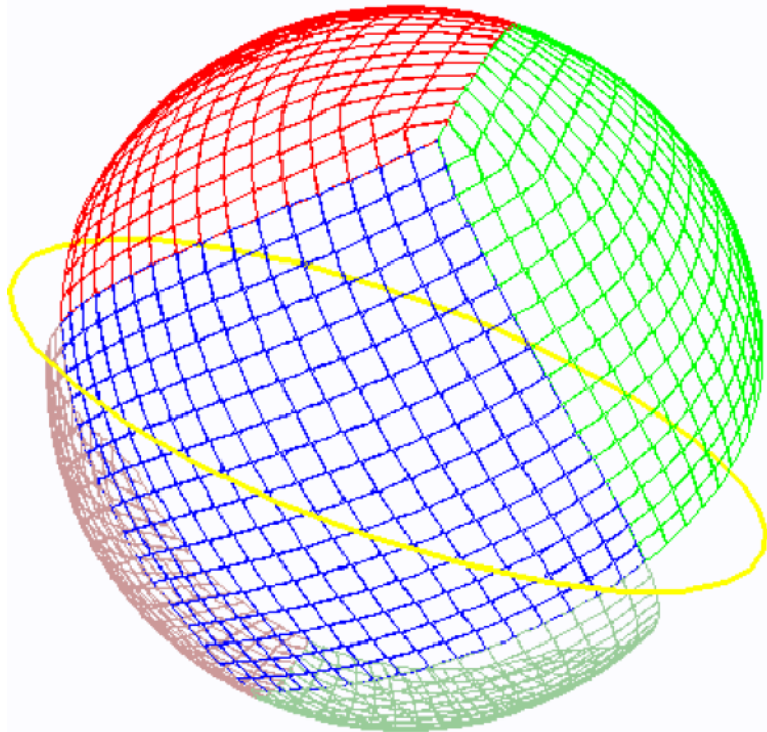
- ↪ All-sky database, compiled from Schmidt plate surveys (AAO, POSS-I and POSS-II), from which the GSC 2.2 (2001) and GSC 2.3 (2007) have been exported.
- ↪  $\sim 1$  billion objects down to  $B_J < 22.5$ ,  $R_F < 20.5$  and  $I_N < 19.5$ .
- ↪ Multi-epoch positions (0.2–0.3'' accuracy) and multicolor photographic photometry (0.15–0.20 mag accuracy).
- ↪ Object Classification.

GSC 2.3 counts: objects per deg<sup>2</sup> down to  $R_F = 20$



Lasker, Lattanzi, McLean et al. 2008, AJ 139, 735

## Proper motions - I

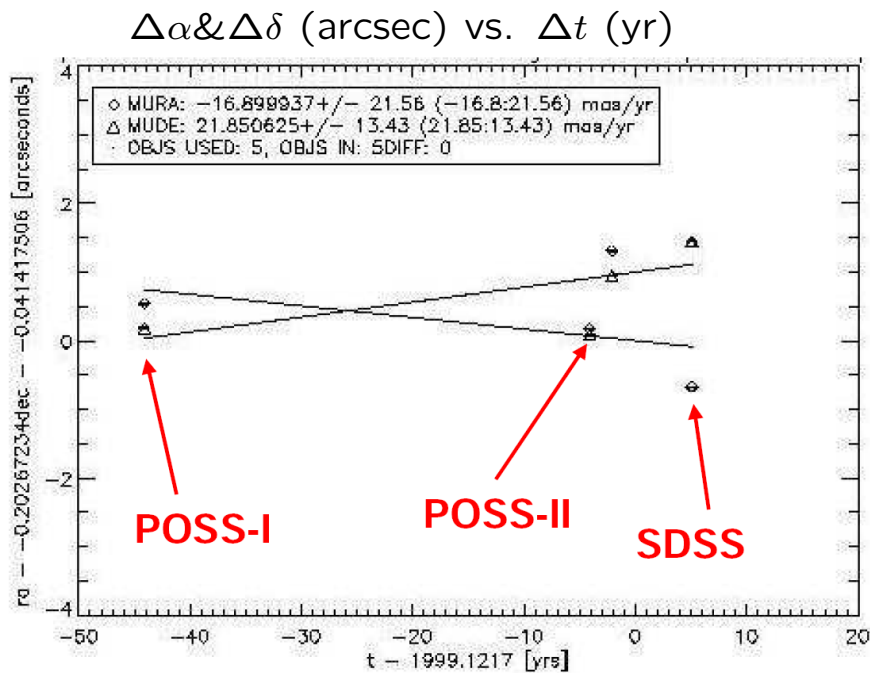


- ★ **Multi-epoch positions** from SDSS and GSC-II (mainly POSS-I and POSS-II) available in the GSC-II DB mirror in Torino
- ★ Database structure: **HEALPix tessellation** level 6, i.e. 49 152 regions ( $0.839 \text{ deg}^2$ )
- ★ **Transformations** from  $(X, Y)$  plate coordinates to standard coordinates  $(\xi, \eta)$  computed for HEALPix level 7 ( $27' \times 27'$ )
- ★ **Relative** proper motions
- ★ **Absolute proper motions** computed with zero-point derived from extra-galactic sources (SDSS classification adopted)

Spagna et al. 1996, A&A 311, 758



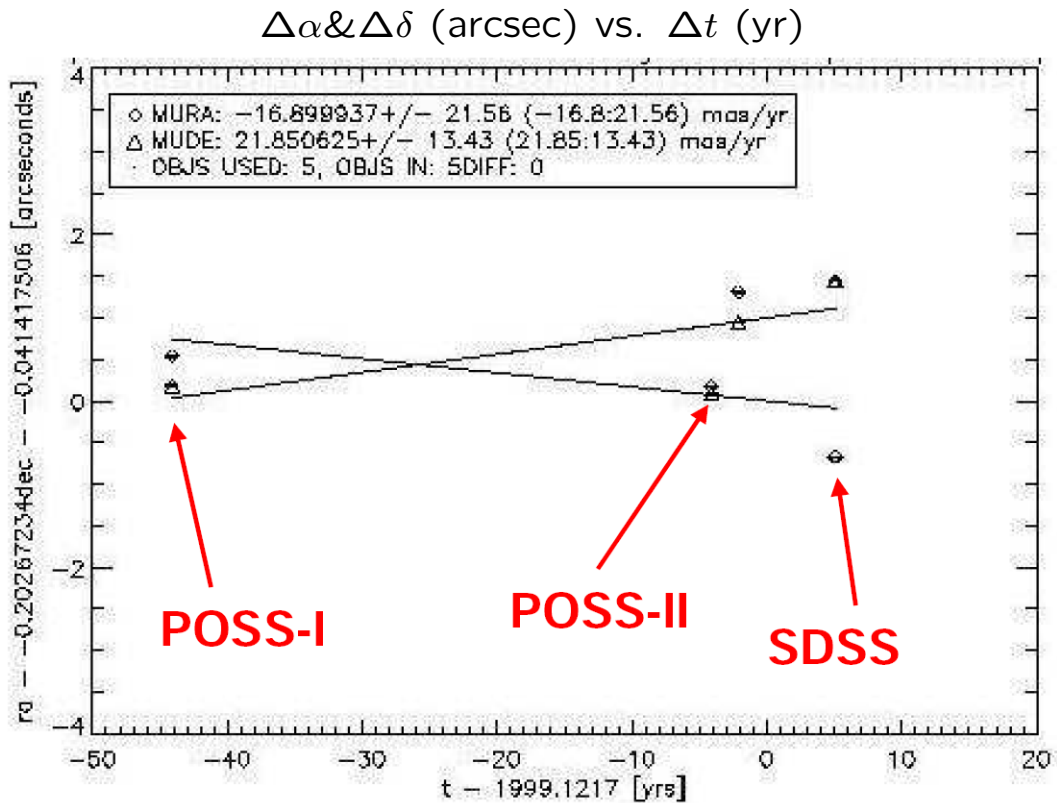
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## Proper motions - II



★ Proper motion formal errors  
 $\sigma(\mu) = 2 - 3$  mas/yr

★ Proper motion accuracy  
 235 QSOs  $\triangleright$  galactic anticenter:

★ GSC-II catalog

- ↪  $\langle \mu_{\alpha \cos \delta} \rangle = 0.13 \pm 0.20$  mas/yr
- ↪  $\langle \mu_{\delta} \rangle = 0.10 \pm 0.18$  mas/yr
- ↪  $\sigma(\mu_{\alpha \cos \delta}) = 3.0$  mas/yr
- ↪  $\sigma(\mu_{\delta}) = 2.7$  mas/yr

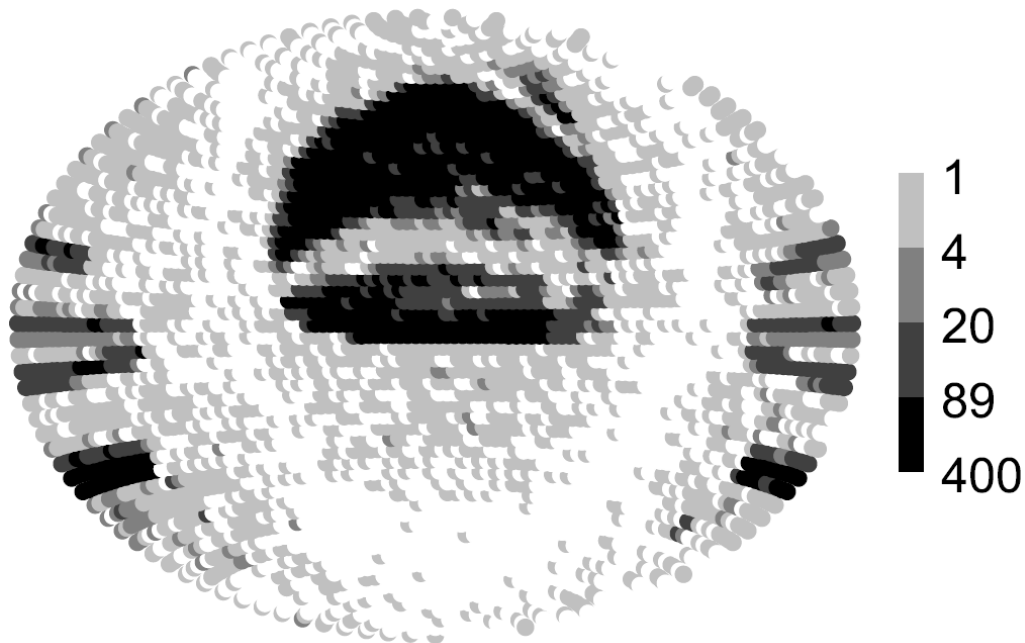
★ Munn's catalog

- ↪  $\langle \mu_{\alpha \cos \delta} \rangle = 0.07 \pm 0.29$  mas/yr
- ↪  $\langle \mu_{\delta} \rangle = 1.07 \pm 0.31$  mas/yr
- ↪  $\sigma(\mu_{\alpha \cos \delta}) = 4.5$  mas/yr
- ↪  $\sigma(\mu_{\delta}) = 4.8$  mas/yr

## Proper motions - III

★ Proper motion accuracy, test based on  $\sim 80\,000$  QSOs:

$g$	$\langle \mu_\alpha \cos \delta \rangle$		$\sigma(\mu_\alpha \cos \delta)$		$\langle \mu_\delta \rangle$		$\sigma(\mu_\delta)$	
	GSC-II	Munn	GSC-II	Munn	GSC-II	Munn	GSC-II	Munn
14	$0.20 \pm 0.60$	$-1.90 \pm 0.53$	5.04	4.34	$-0.30 \pm 0.57$	$-0.20 \pm 0.78$	4.83	6.35
15	$0.20 \pm 0.19$	$-0.90 \pm 0.25$	3.28	4.33	$-0.10 \pm 0.20$	$1.20 \pm 0.27$	3.56	4.61
16	$-0.20 \pm 0.08$	$-0.20 \pm 0.10$	2.92	3.69	$-0.30 \pm 0.08$	$0.50 \pm 0.10$	2.95	3.60
17	$-0.30 \pm 0.04$	$0.20 \pm 0.04$	2.86	3.25	$-0.30 \pm 0.04$	$0.20 \pm 0.04$	2.96	3.23
18	$-0.10 \pm 0.02$	$0.30 \pm 0.02$	3.43	3.37	$0.10 \pm 0.02$	$0.20 \pm 0.02$	3.56	3.39
19	$-0.10 \pm 0.03$	$0.30 \pm 0.03$	4.83	4.36	$0.00 \pm 0.03$	$0.00 \pm 0.03$	4.90	4.43
20	$-0.30 \pm 0.08$	$0.00 \pm 0.07$	6.61	6.18	$0.10 \pm 0.08$	$0.00 \pm 0.07$	6.59	6.17
21	mas/yr	mas/yr	mas/yr	mas/yr	mas/yr	mas/yr	mas/yr	mas/yr



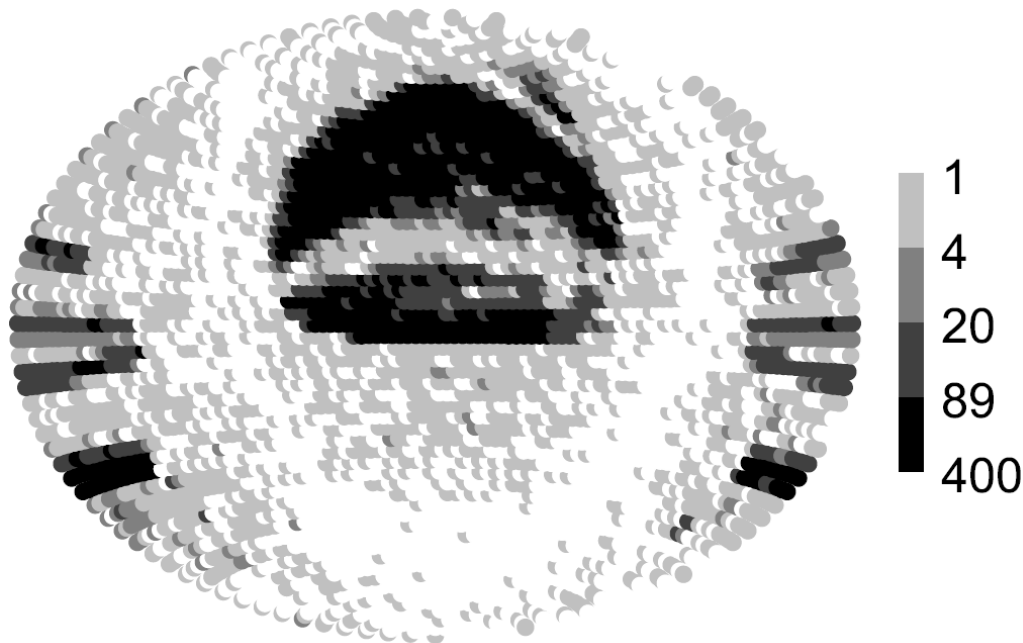
Sky distribution of the quasars found in the GSC2.3 catalog. The highest density region marks the SDSS contribution. The scale represents the number of sources in regions of  $9 \text{ deg}^2$  shown on the plots.

Andrei et al. 2009, A&A, in press

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★ Proper motion accuracy, test based on  $\sim 80\,000$  QSOs:

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21	mas/yr	mas/yr	mas/yr	mas/yr	mas/yr	mas/yr	mas/yr	mas/yr



Sky distribution of the quasars found in the GSC2.3 catalog. The highest density region marks the SDSS contribution. The scale represents the number of sources in regions of  $9 \text{ deg}^2$  shown on the plots.

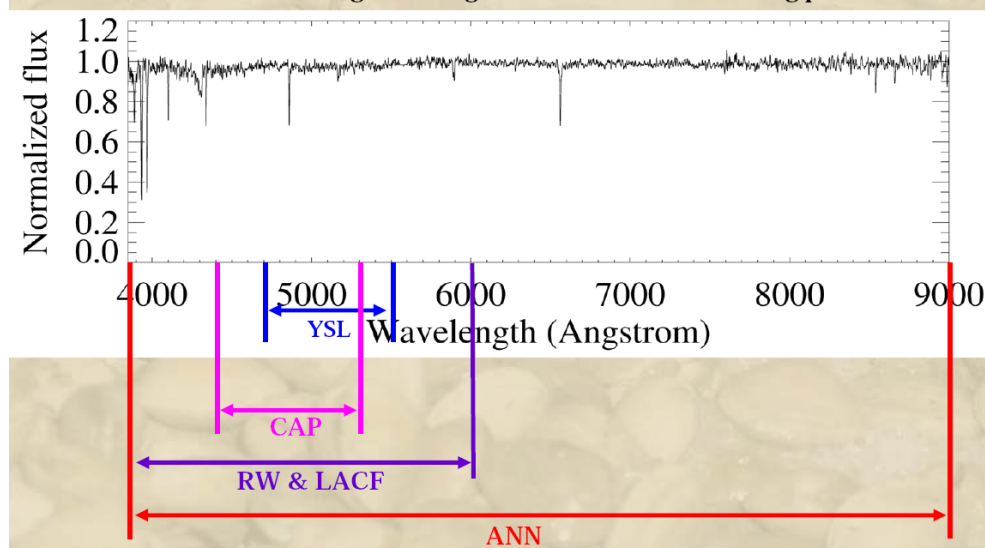
Andrei et al. 2009, A&A, in press



## Stellar astrophysical parameters (e.g. $T_{\text{eff}}$ , $\log g$ , $[\text{Fe}/\text{H}]$ )

### ★ SSPP - Methodology

There are 9 methods for determining  $[\text{Fe}/\text{H}]$ , 7 for  $\log g$ , and 5 for  $T_{\text{eff}}$ . Each approach makes use of different wavelength coverage or line bands for estimating parameters.



- ★ SDSS pipeline (SSPP)  
Lee et al. 2008, AJ 136, 2022
- ★ Supervised feedforward neural network (ANN)  
Re Fiorentin et al. 2007, A&A 467, 1374

### ★ SSPP - Precision

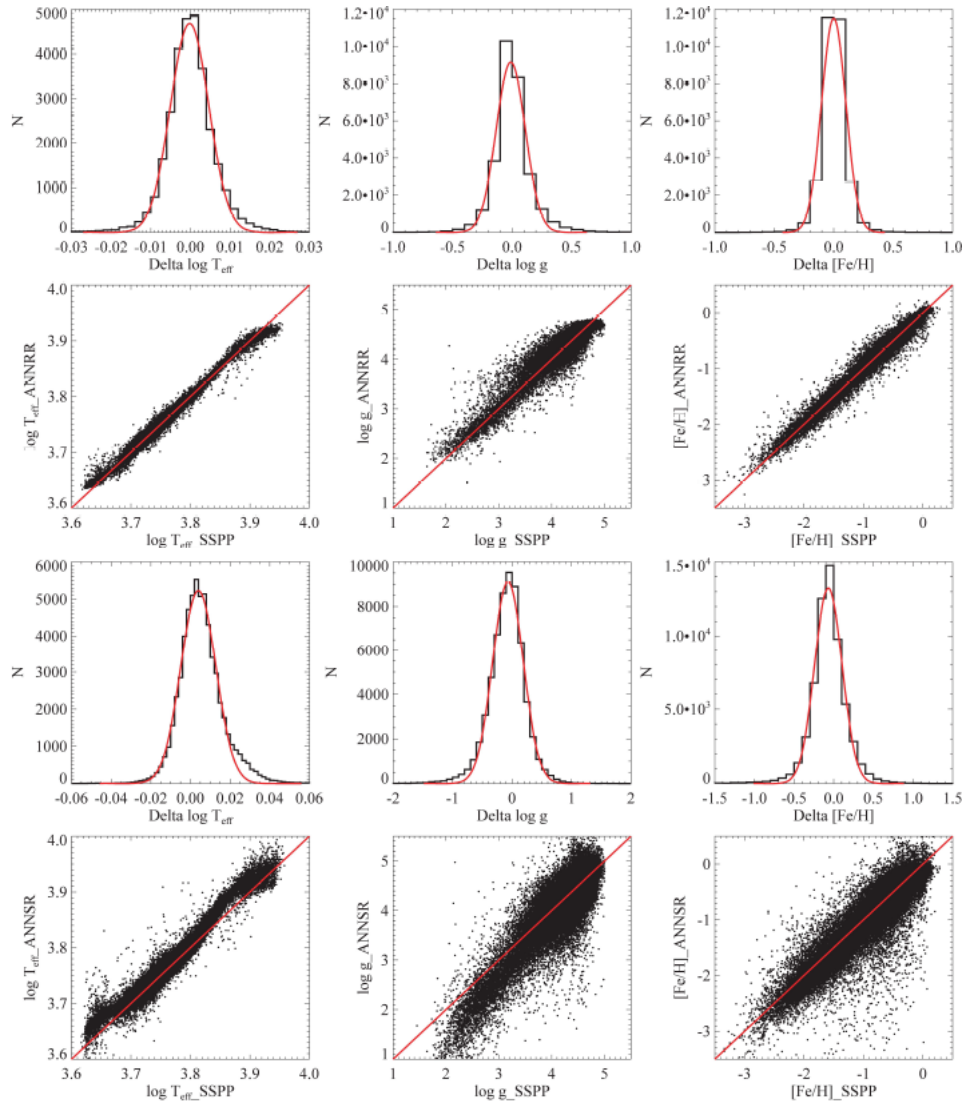
- ★  $4500 \text{ K} < T_{\text{eff}} < 7500 \text{ K}$ ,  $\text{SNR} > 15$ :  
 $\sigma(T_{\text{eff}}) = 150 \text{ K}$ ,  $\sigma(\log g) = 0.25 \text{ dex}$ ,  $\sigma([\text{Fe}/\text{H}]) = 0.20 \text{ dex}$
- ★ over 125 F,G stars (HET spectra, high quality):  
 $\sigma(T_{\text{eff}}) = 130 \text{ K}$ ,  $\sigma(\log g) = 0.21 \text{ dex}$ ,  $\sigma([\text{Fe}/\text{H}]) = 0.11 \text{ dex}$
- ★ over G;OC (M13,M15,M2; NGC2420,M67):  
 $\sigma(T_{\text{eff}}) < 200 \text{ K}$ ,  $\sigma(\log g) \leq 0.40 \text{ dex}$

(e.g. Allende Prieto et al. 2008, AJ 136, 2070; Lee et al. 2008, AJ 136, 2050)

# Stellar astrophysical parameters

Precision/Accuracy improved by further development of ANN, improved stellar models, better data calibration... (e.g. Re Fiorentin et al. 2008, AIPC 1082, 76)

## ★ RR



## ★ SR

Accuracy estimate:

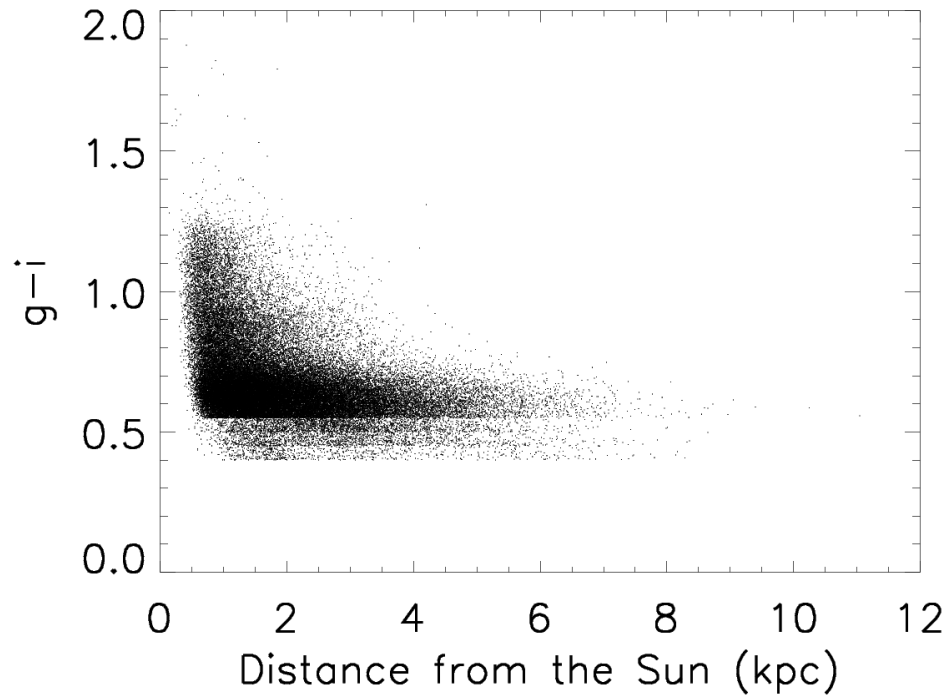
$$E = \frac{1}{P} \sum_{p=1}^P |C(p) - T(p)|$$

Model	$\log T_{\text{eff}}$	$E_{\log g}$	$E_{[\text{Fe}/\text{H}]}$
RR	0.0058	0.11	0.0879
SR	0.0083	0.3105	0.2456

currently SNR > 10; and lower?

SNR	$T_{\text{eff}}$	$E_{\log g}$	$E_{[\text{Fe}/\text{H}]}$
10	0.68%	0.1591	0.1040
5	0.93%	0.1897	0.1312
1	2.04%	0.3280	0.2766

## Photometric distances



### Method:

1. Magnitude correction: **extinction maps** by Schlegel et al. (1998)
2. **Photometric parallax**: absolute magnitude by Ivezić et al. (2008), calibrated for FGK (sub)dwarfs with  $[\text{Fe}/\text{H}] < -0.5$

$$M_r(g-i, [\text{Fe}/\text{H}]) = M_r^0(g-i) + \Delta M_r([\text{Fe}/\text{H}])$$

Schlegel et al. 1998, ApJ 500, 525; Ivezić et al. 2008, AJ 684, 287

## SDSS-GSC-II catalog

★ Area: 9 000 deg<sup>2</sup>

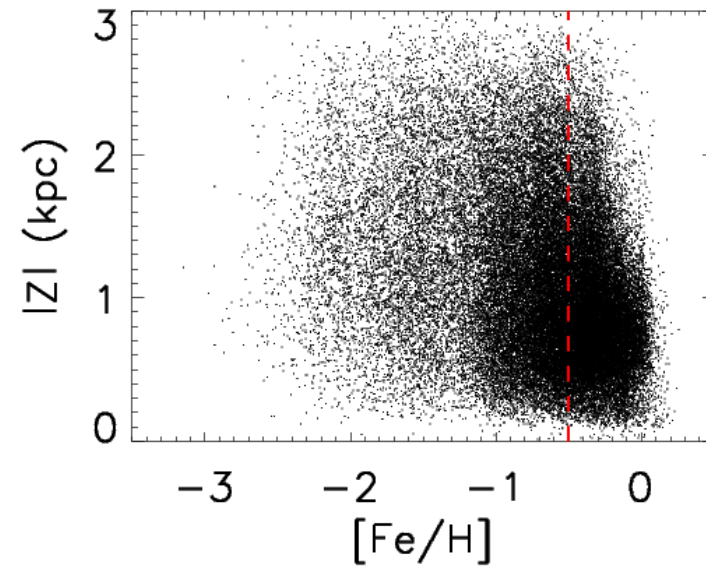
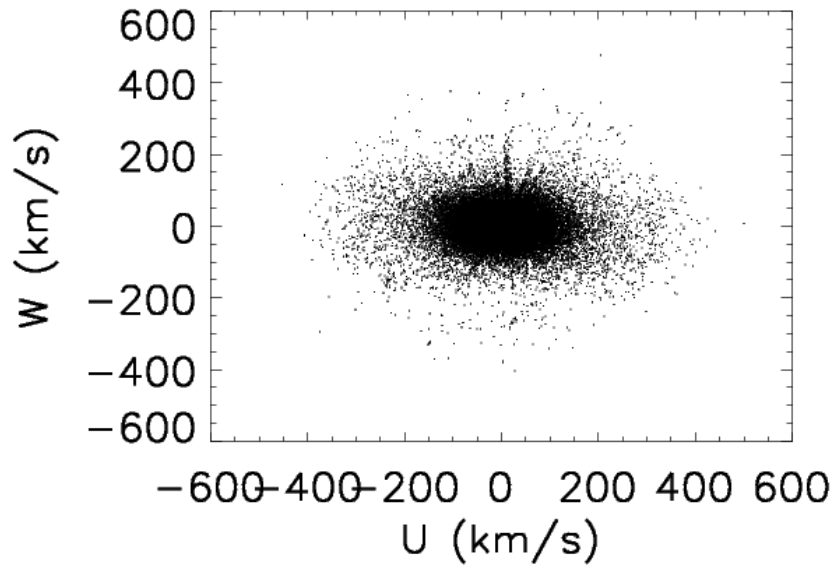
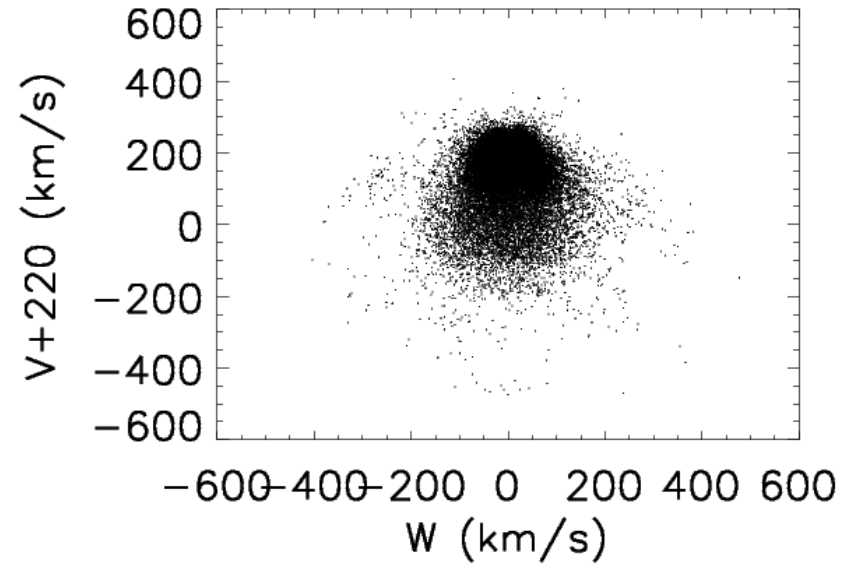
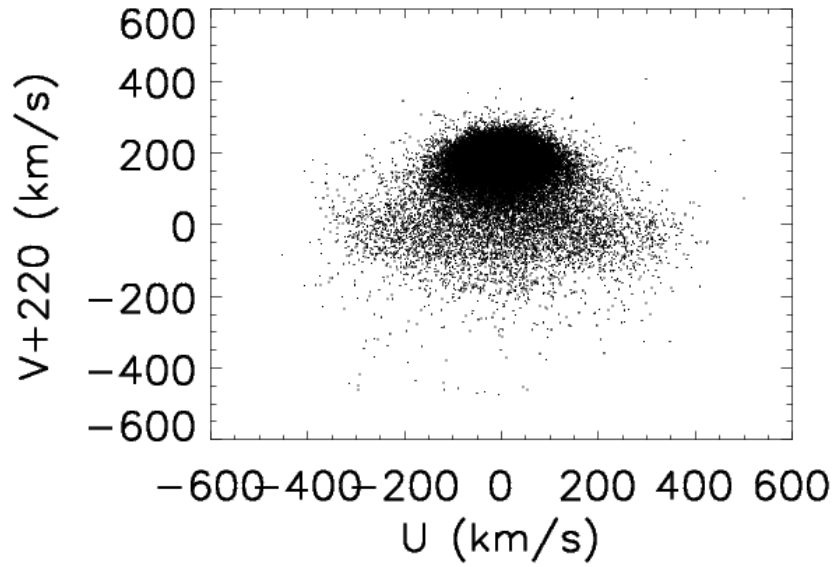
	# Objects	<i>ugriz</i> mag	$(\mu_\alpha, \mu_\delta)$ mas/yr	$T_{\text{eff}}$ K	$\log g$ dex	[Fe/H] dex	<i>RV</i> km/s	<i>d</i> kpc	<i>UVW</i> km/s
	<b>77 000 000</b>	X	X						
★	<b>150 000</b>	X	X	X	X	X	X		
★	<b>27 000★</b>	X	X	X	X	X	X	X	X

★ FGK dwarfs, kinematic sample:

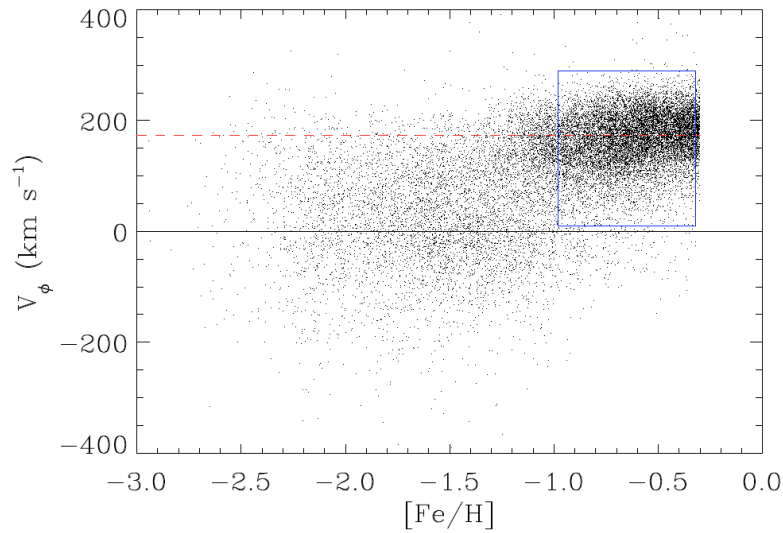
↪ 4500 K <  $T_{\text{eff}}$  < 7500 K,  $\log g > 3.5$  dex,

↪ [Fe/H] < -0.5 dex,  $d < 3$  kpc

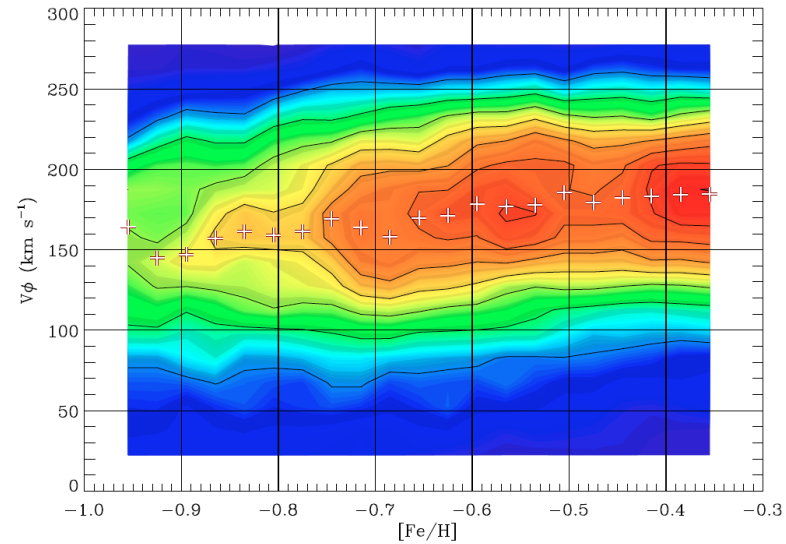
## Kinematics & Chemical properties: overview



Evidence of a thick disk rotation-metallicity correlation:  $dV_\phi/dz \sim 40 - 50$  km/s per dex



$V_\phi$  vs  $[Fe/H]$ . Stars with  $|z| = 1.0 - 3.0$  kpc and  $[Fe/H] < -0.3$ . Dashed line is the thick disk rotation, 173 km/s. The box defines the region in which the thick disk population dominates.



Zooming, iso-density contours. Ridge line of the maximum likelihood marked.

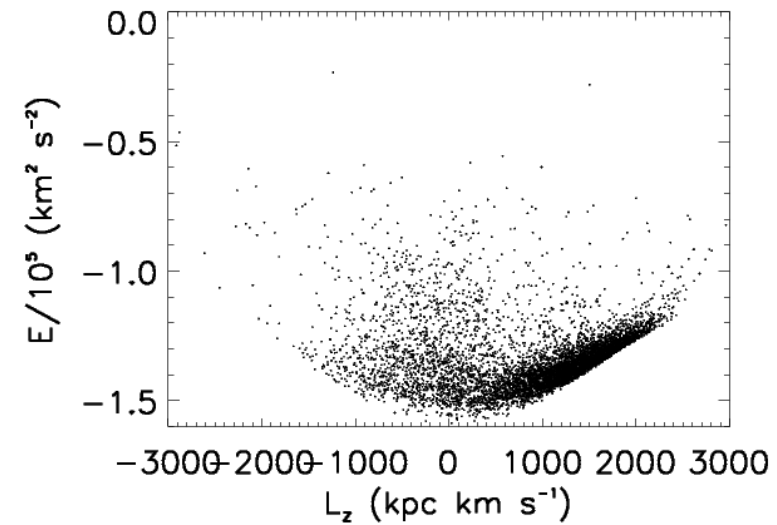
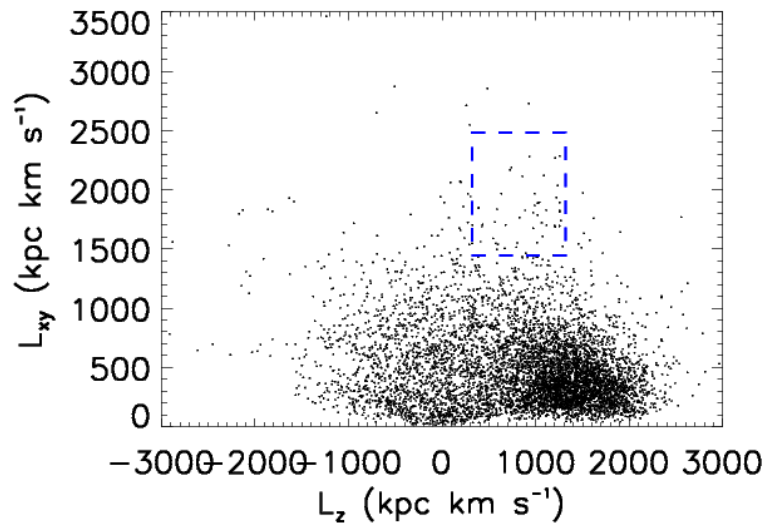
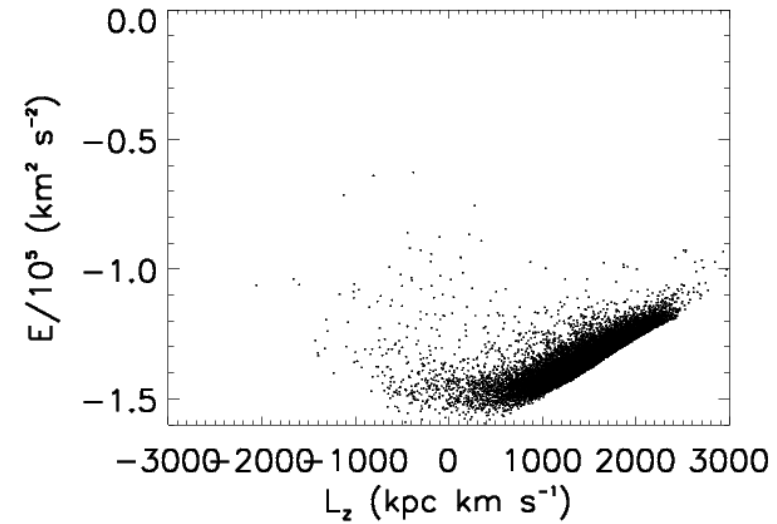
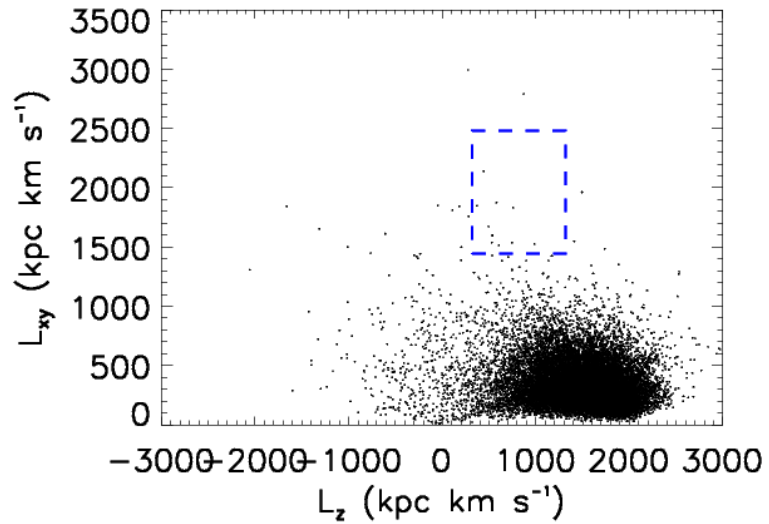
$\langle  z  \rangle$ (kpc)	$N_{\text{tot}}$	$N_{\text{used}}$		$\partial \langle V_\phi \rangle / \partial [Fe/H]$ ( $\text{km s}^{-1} \text{ dex}^{-1}$ )		$\rho_s$ ( $\times 10^{-2}$ )	
		$3\sigma$	$2\sigma$	$3\sigma$	$2\sigma$	$3\sigma$	$2\sigma$
1.23	3994	3672	2915	$50 \pm 5$	$39 \pm 5$	$17 \pm 2$	$15 \pm 2$
1.73	2641	2348	1715	$54 \pm 6$	$35 \pm 5$	$18 \pm 2$	$16 \pm 2$
2.37	2194	1768	1131	$35 \pm 8$	$33 \pm 5$	$10 \pm 2$	$14 \pm 3$

Kinematics-metallicity correlation of thick disk stars with  $-1.0 < [Fe/H] < -0.5$  @ height intervals.

(see poster, Spagna et al. 2010)

# Kinematics & Chemical properties: overview

★  $-1.0 < [\text{Fe}/\text{H}] < -0.5$

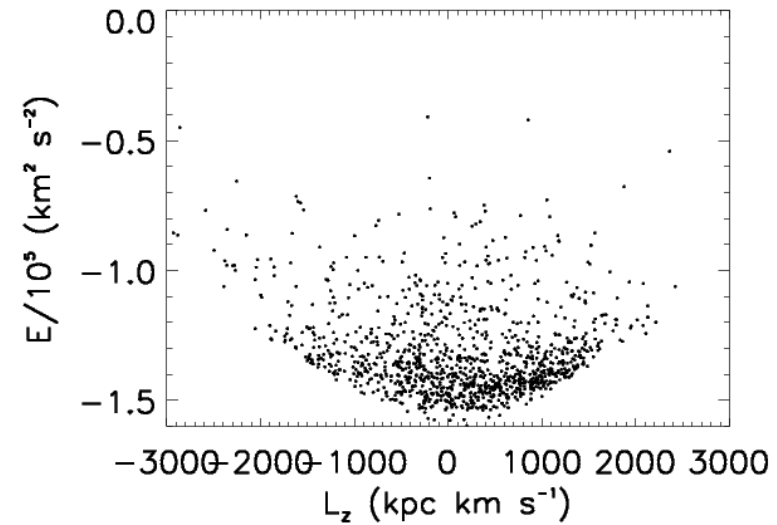
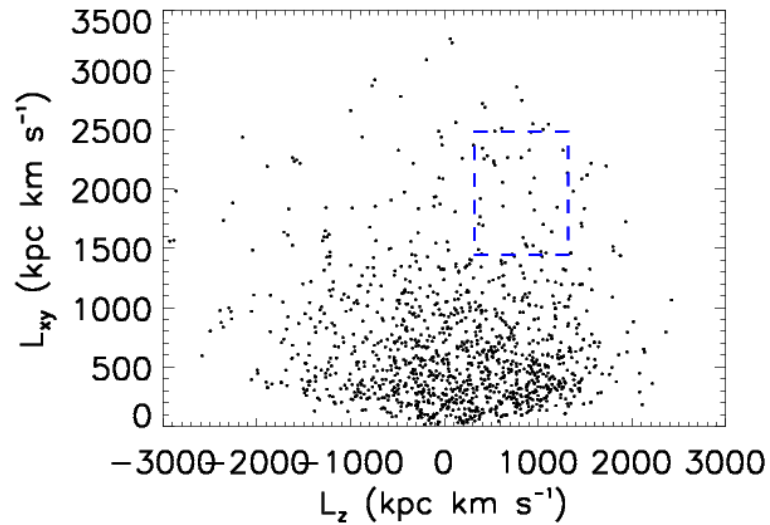
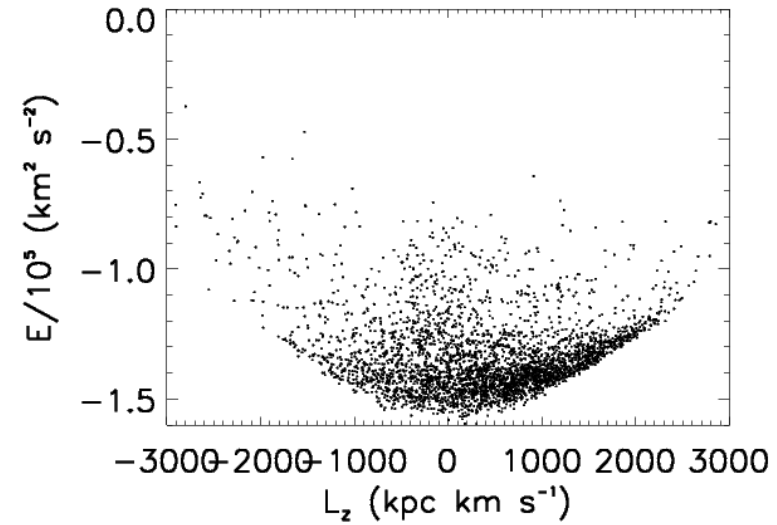
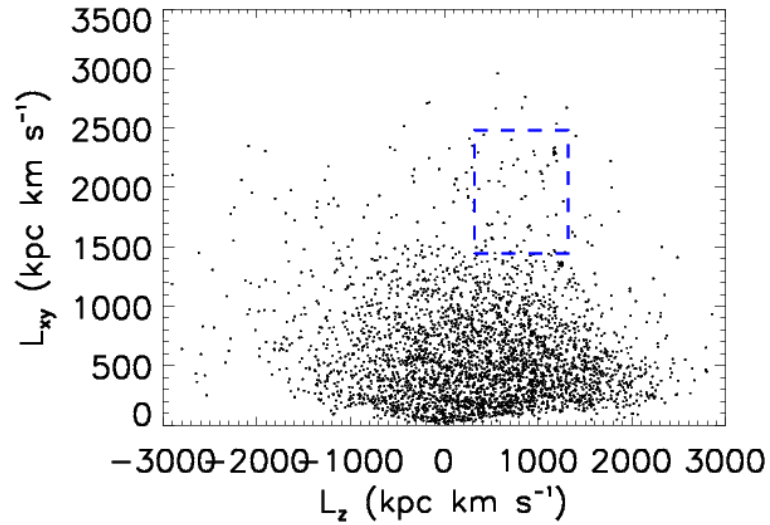


★  $-1.5 < [\text{Fe}/\text{H}] < -1.0$



# Kinematics & Chemical properties: overview

★  $-2.0 < [\text{Fe}/\text{H}] < -1.5$

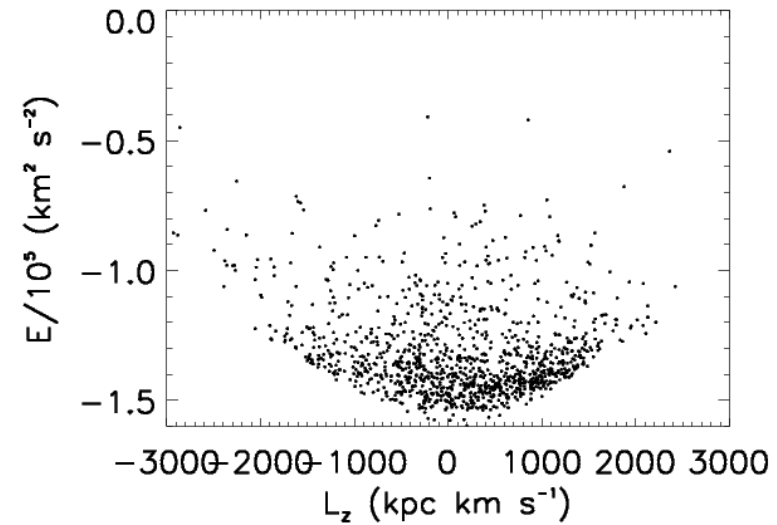
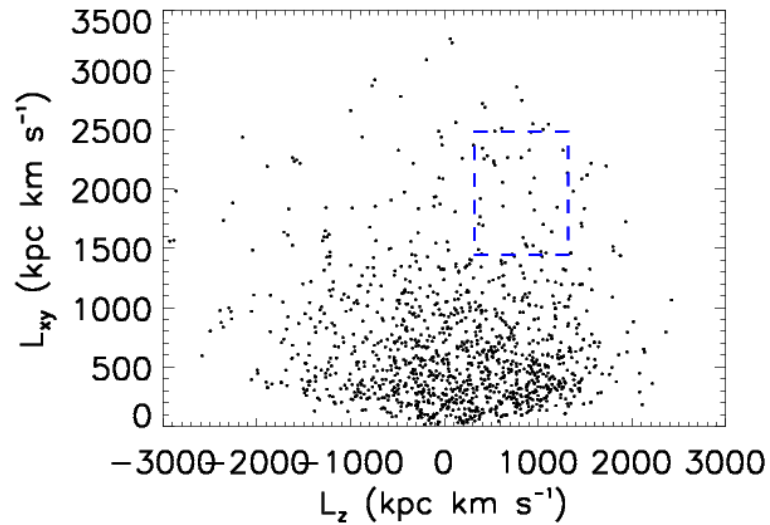
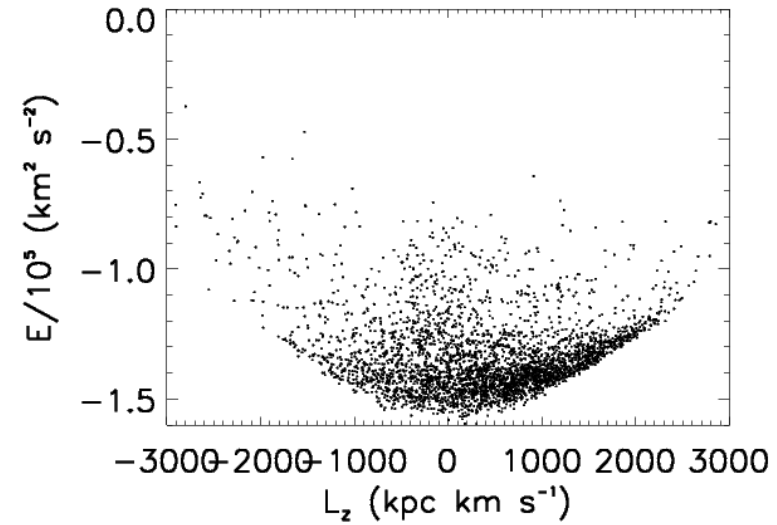
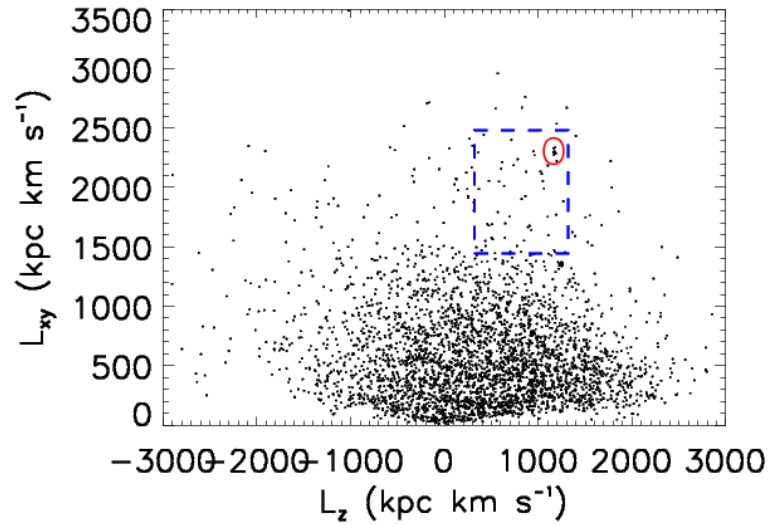


★  $[\text{Fe}/\text{H}] < -2.0$



# Kinematics & Chemical properties: overview

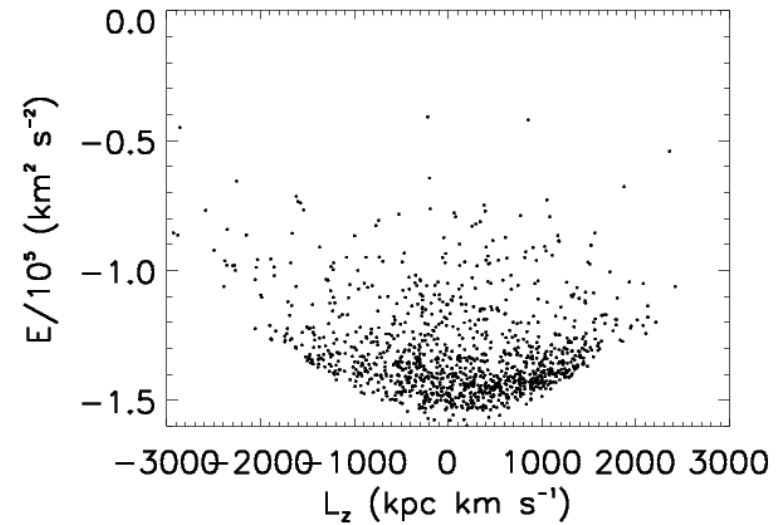
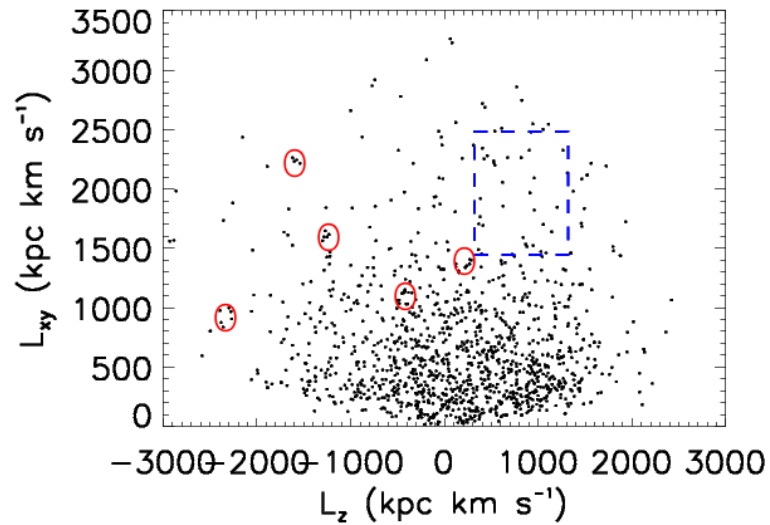
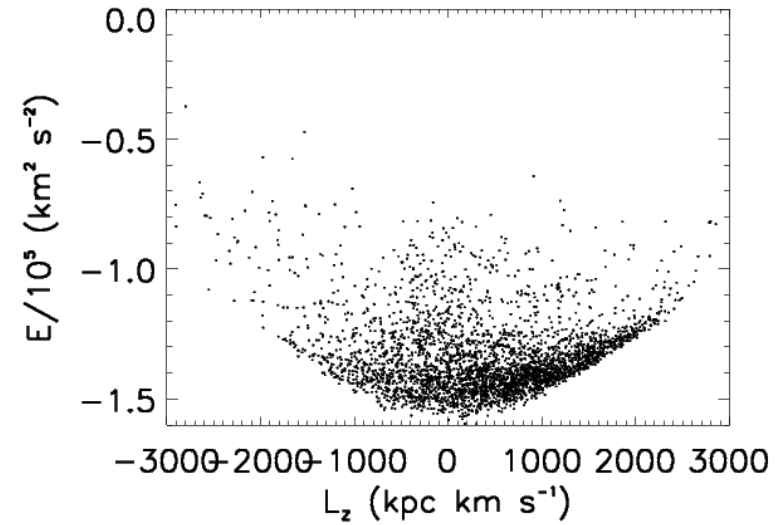
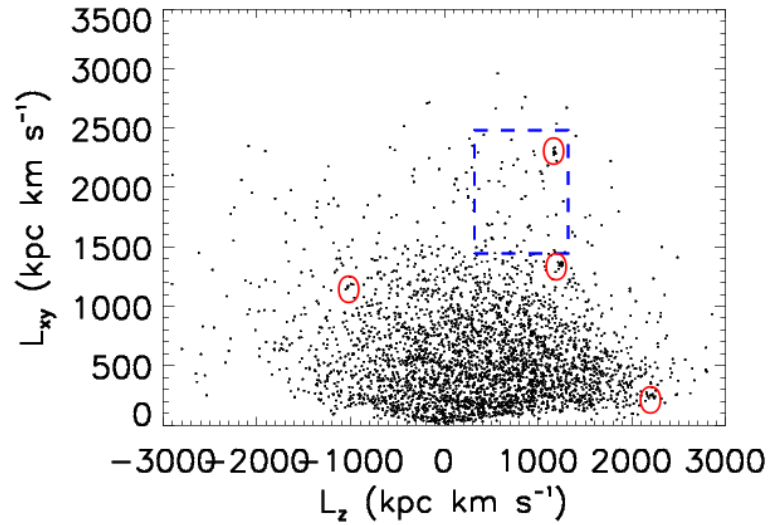
★  $-2.0 < [\text{Fe}/\text{H}] < -1.5$



★  $[\text{Fe}/\text{H}] < -2.0$

# Kinematics & Chemical properties: overview

★  $-2.0 < [\text{Fe}/\text{H}] < -1.5$



★  $[\text{Fe}/\text{H}] < -2.0$

How can we quantify such substructures?

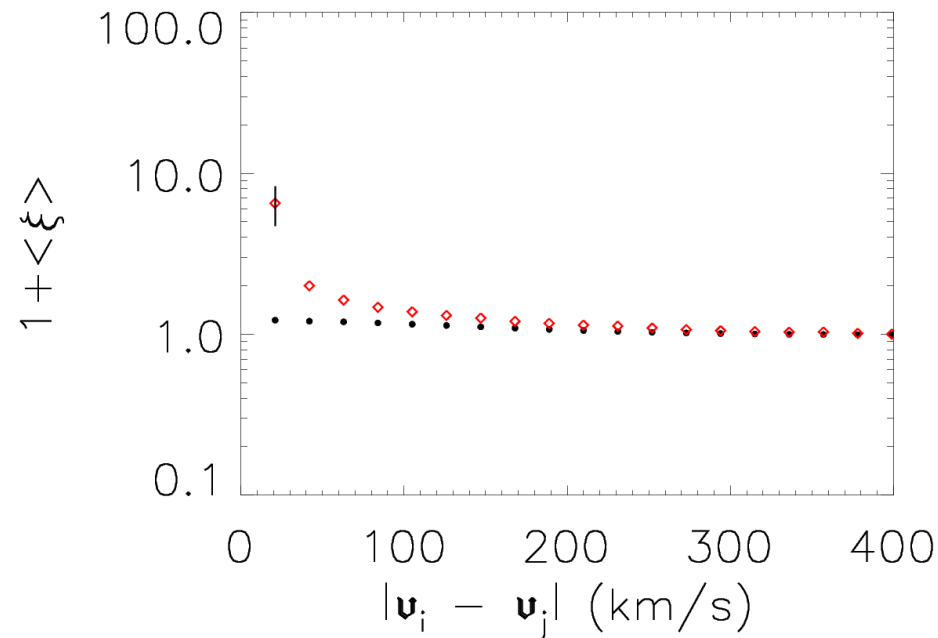
★ Two-Point Correlation function

Clustering method for uncovering (new) structures in data sets

$$\xi = \frac{\langle DD \rangle}{\langle RR \rangle} - 1$$

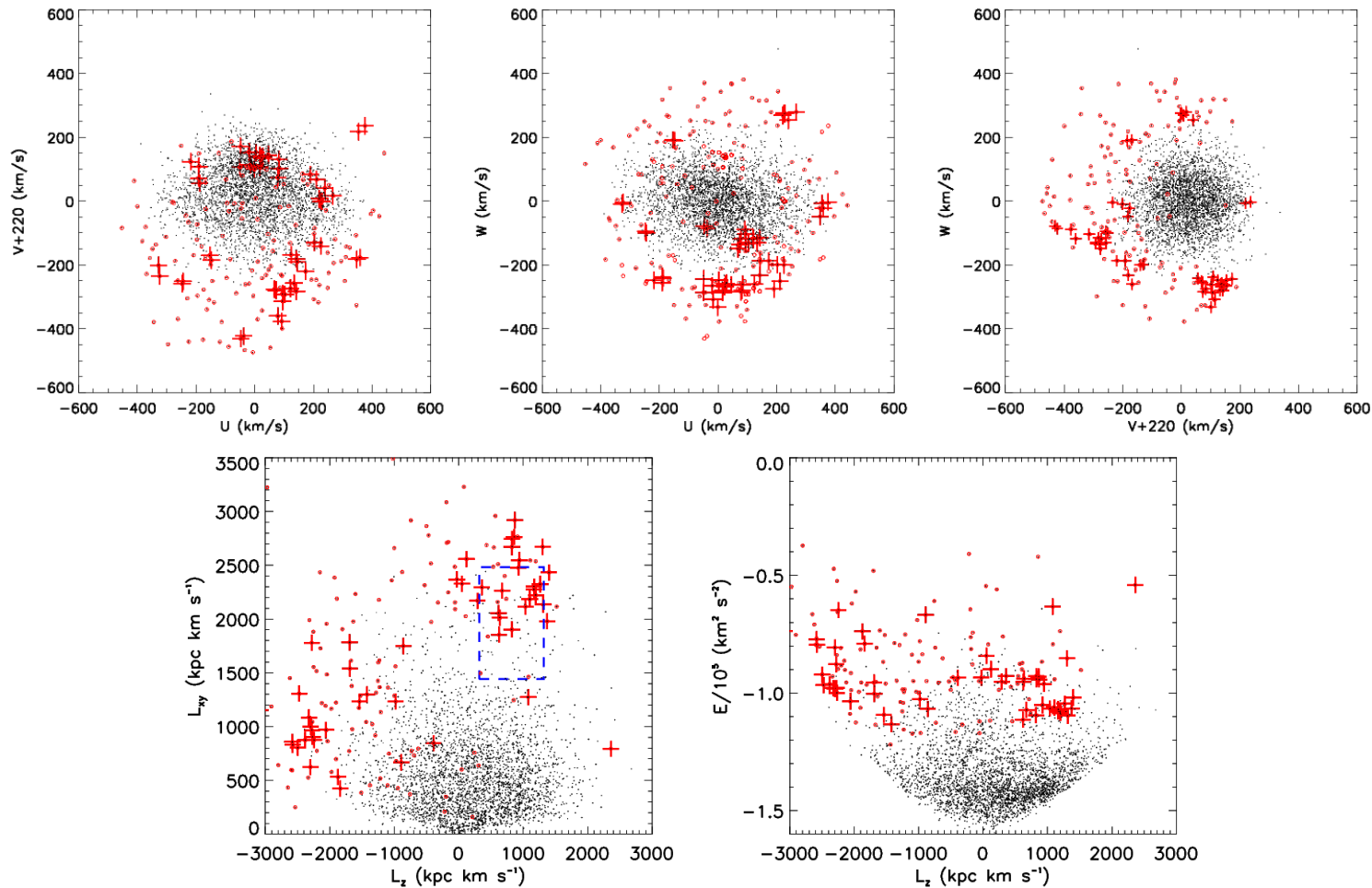
$\langle DD \rangle$  number of pairs of particles in our data with velocity difference less than a given value

$\langle RR \rangle$  number of pairs of random particles with velocity difference less than *that* given value



★  $\xi$  measure the excess of pairs of stars moving with given velocity difference, above that expected from a random sample.

## Kinematic substructures



Distribution of the halo subsample (3337 stars with  $[\text{Fe}/\text{H}] < -1.5$  and  $d < 3$  kpc). The 5% fastest are highlighted (circles). Among them, the crosses identify groups with velocity difference less than 42 km/s. The box shows the locus of the halo stream discovered by Helmi et al. 1999.

## Summary

### Objective: A new kinematic survey from SDSS-DR7 & GSC-II

- ★ We have produced a new **proper motion survey** covering **9 000 deg<sup>2</sup>** based on the multi-epoch positions derived SDSS-DR7 combined with the plate material from the GSC-II database.
- ★ Accurate absolute **proper motions** ( $\mu_\alpha, \mu_\delta$ ) have been computed for **40 million sources** down to magnitude  $g \sim 22$  ( $r \sim 20$ ). Proper motions errors attain **2-3 mas/yr**.
- ★ Stellar astrophysical parameters ( $T_{\text{eff}}, \log g, [\text{Fe}/\text{H}]$ ) have been (re)estimated for the SDSS spectroscopic sample by means of updated ANN models.
- ★ Full *astrometric, photometric, and spectroscopic measurements* are available for **150 000 stars**.
- ★ Photometric **distances** and **3D velocities** (UVW) have been computed for FGK (sub)dwarfs with  $[\text{Fe}/\text{H}] < -0.5$ .
- ★ A kinematic sample of **30 700 tracers** within **3 kpc** from the Sun has been extracted and will be used to
  - ↪ study the kinematic properties of the thick disk and inner halo:
  - ↪ search for members of known/new kinematic substructures produced by past merging events.

↪ to study the kinematic and chemical properties of stellar populations and to search for fossil records in the Milky Way