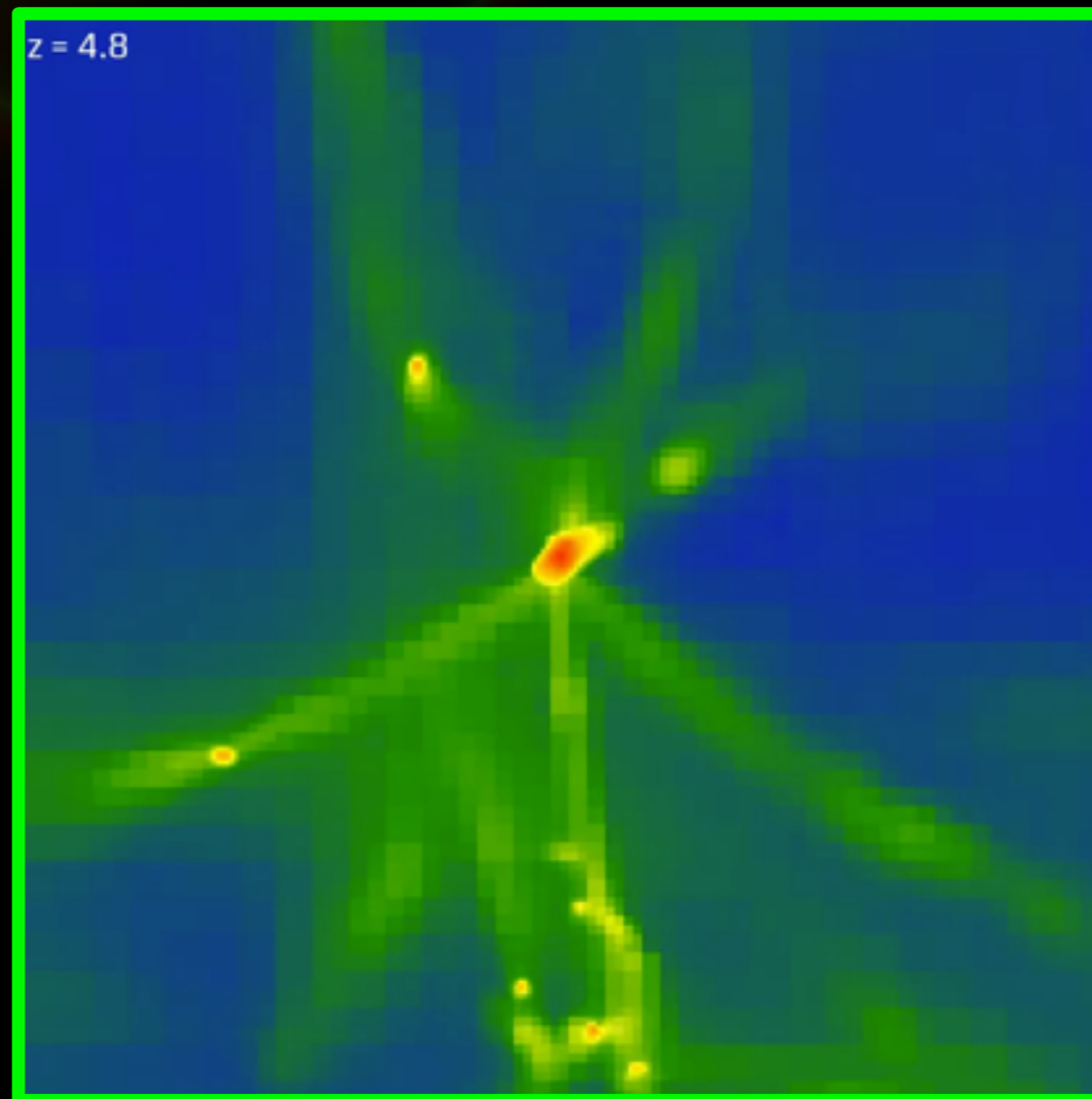


# Confronting Chemodynamical Simulations with Observations

**Brad Gibson**

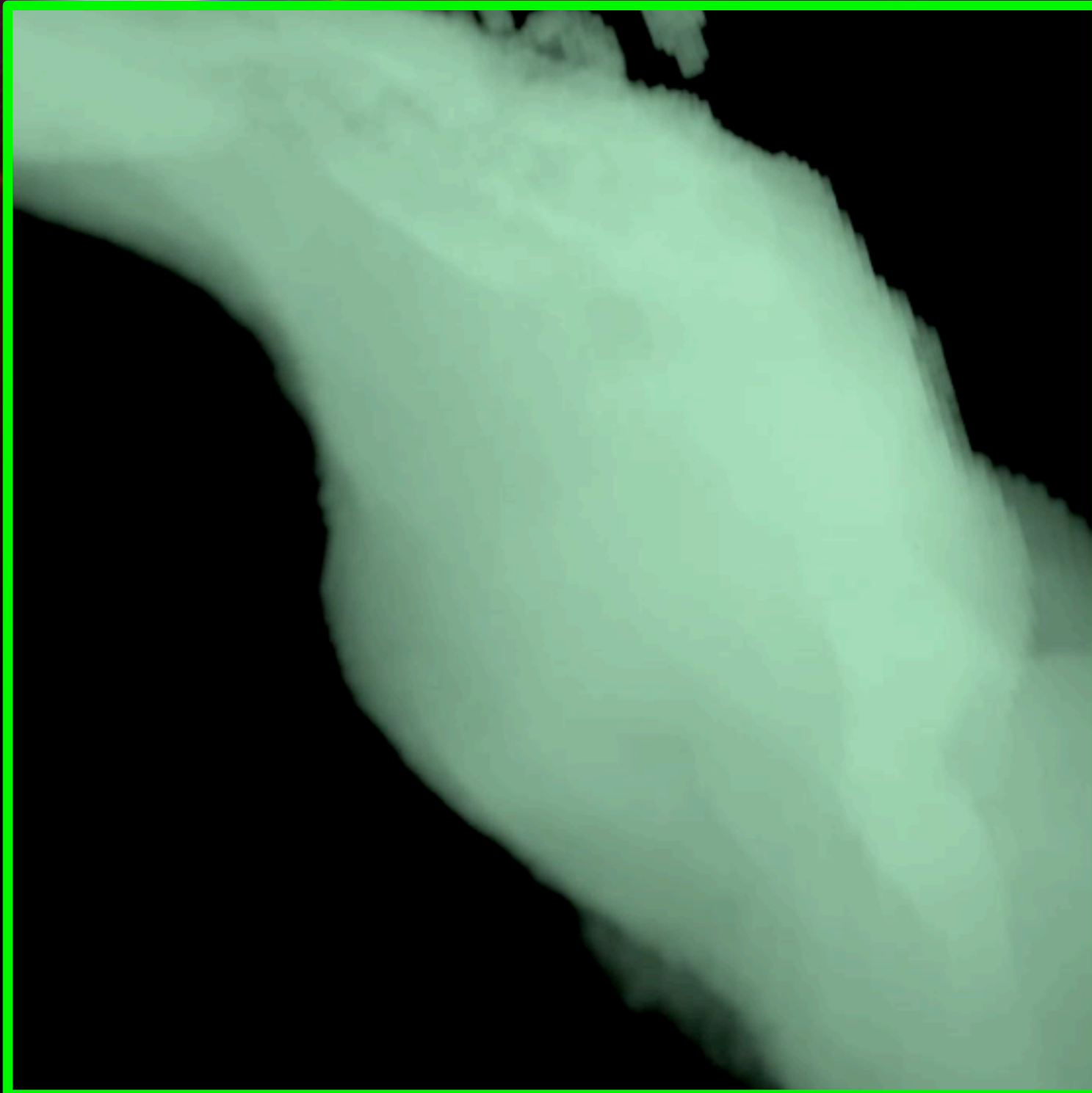
**E.A. Milne Centre for Astrophysics  
University of Hull**



# Shopping List (Internal Properties)

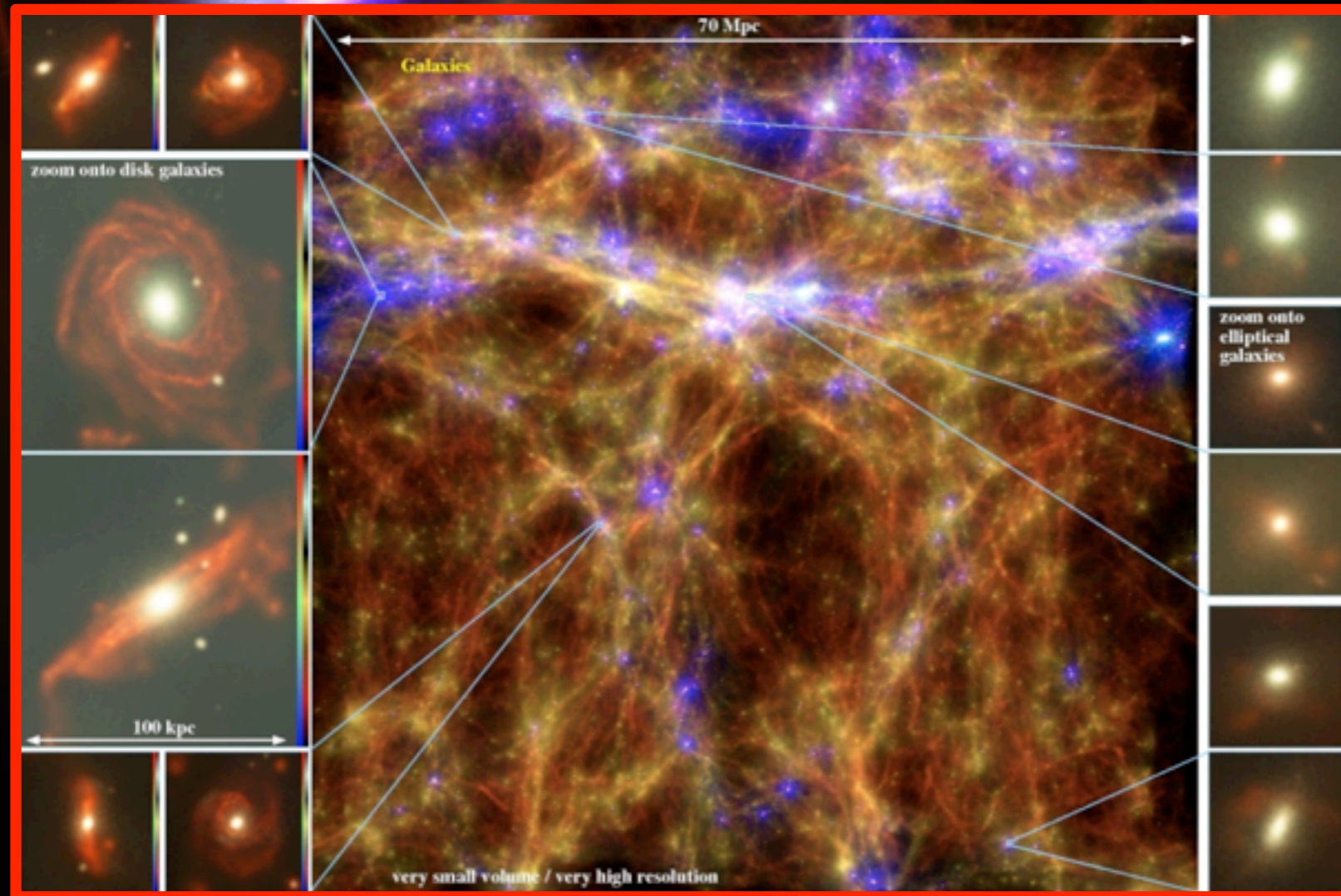
- **Stellar Distributions**
  - ✦ Abundance Gradients
  - ✦ Surface Brightness Profiles
  - ✦ Age Gradients
  - ✦ Metallicity Distribution Functions
  - ✦ Abundance Ratios
  - ✦ Age-Metallicity- $\sigma$  Relations
  - ✦ Azimuthal Surface Brightness Trends
- **Additional Hidden Gremlins**
  - ✦ Diffusion
  - ✦ Timestep Limiters
  - ✦ Star Formation Prescription
  - ✦ Missing Feedback
  - ✦ Supernova Feedback Abuse
  - ✦ **Composite vs Individual Stellar Particles**
- **Gas Distributions**
  - ✦ Surface Density Profiles
  - ✦ Velocity Dispersion Profiles
  - ✦ Velocity Dispersion with Redshift
  - ✦ Superbubble Size Distribution
  - ✦ Structural Power
  - ✦ Galactic Winds & The CGM
  - ✦ How Does Gas Get Into Galaxies?
  - ✦  $V_{rot}$  vs Scaleheight
  - ✦ Radial Gas Flows
  - ✦ GMC Rotation Statistics

# Before that though ... how do we 'set' the physics in order to do 'Galactic Archaeology'?



- the short answer is ... “feedback”
- supernovae (primarily), supplemented with AGN, cosmic rays, and magnetic fields
- boils down to a number of efficiency factors ... e.g., star formation, feedback, AGN feeding, density thresholds, radiation pressure, amongst others...

# Before that though ... how do we 'set' the physics in order to do 'Galactic Archaeology'?

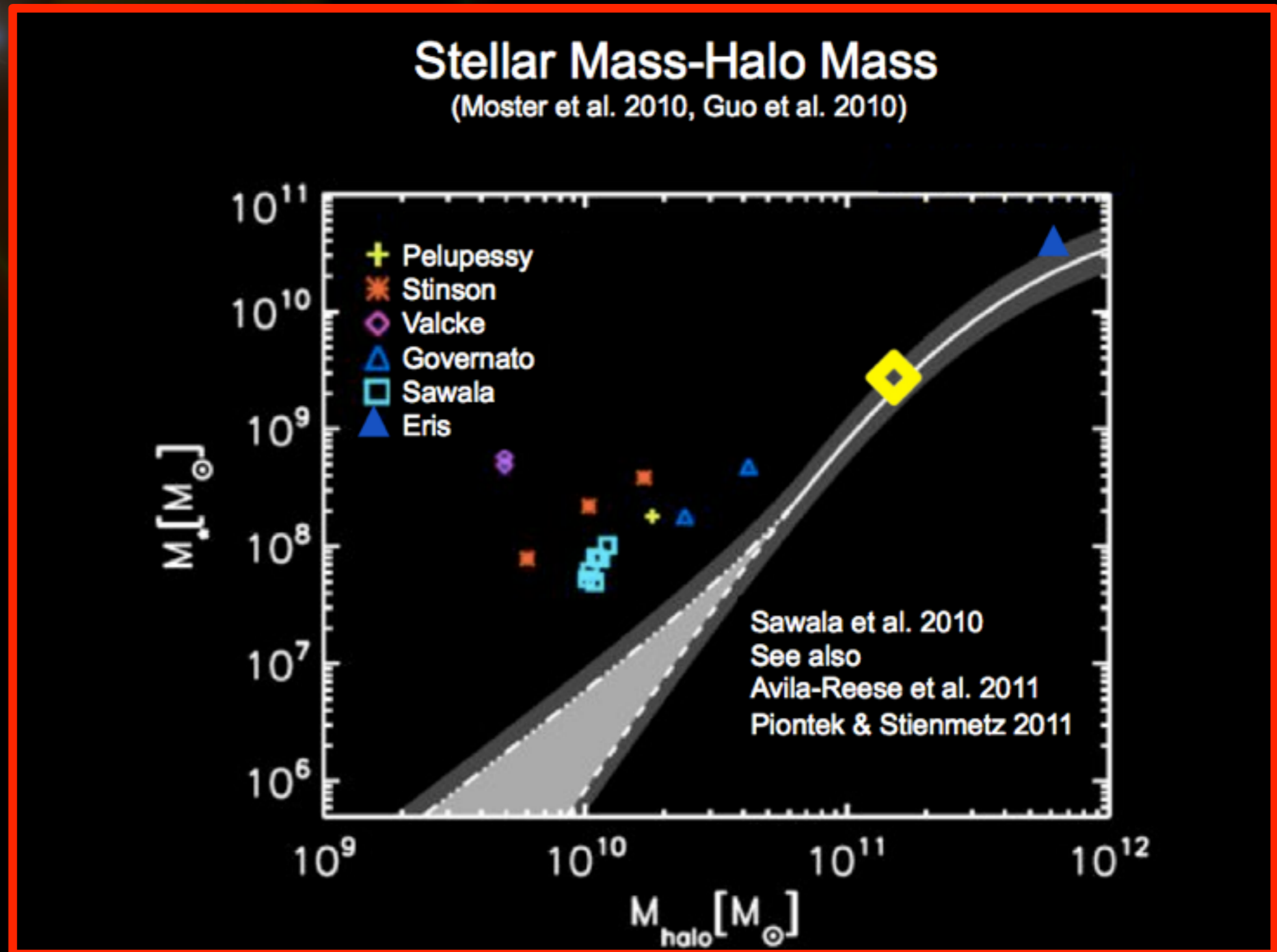


- the one common 'calibrator' for these 'factors' is the  $M^*$ - $M_{\text{halo}}$  relation (Eagle, Illustris, MaGICC)

# MaGICC: Making Galaxies in a Cosmological Context

Brook, Stinson, Gibson, Quinn & Wadsley (2012, MNRAS)

- normalised star formation efficiency to place one galaxy on the stellar mass - halo mass relation (**yellow diamond**)





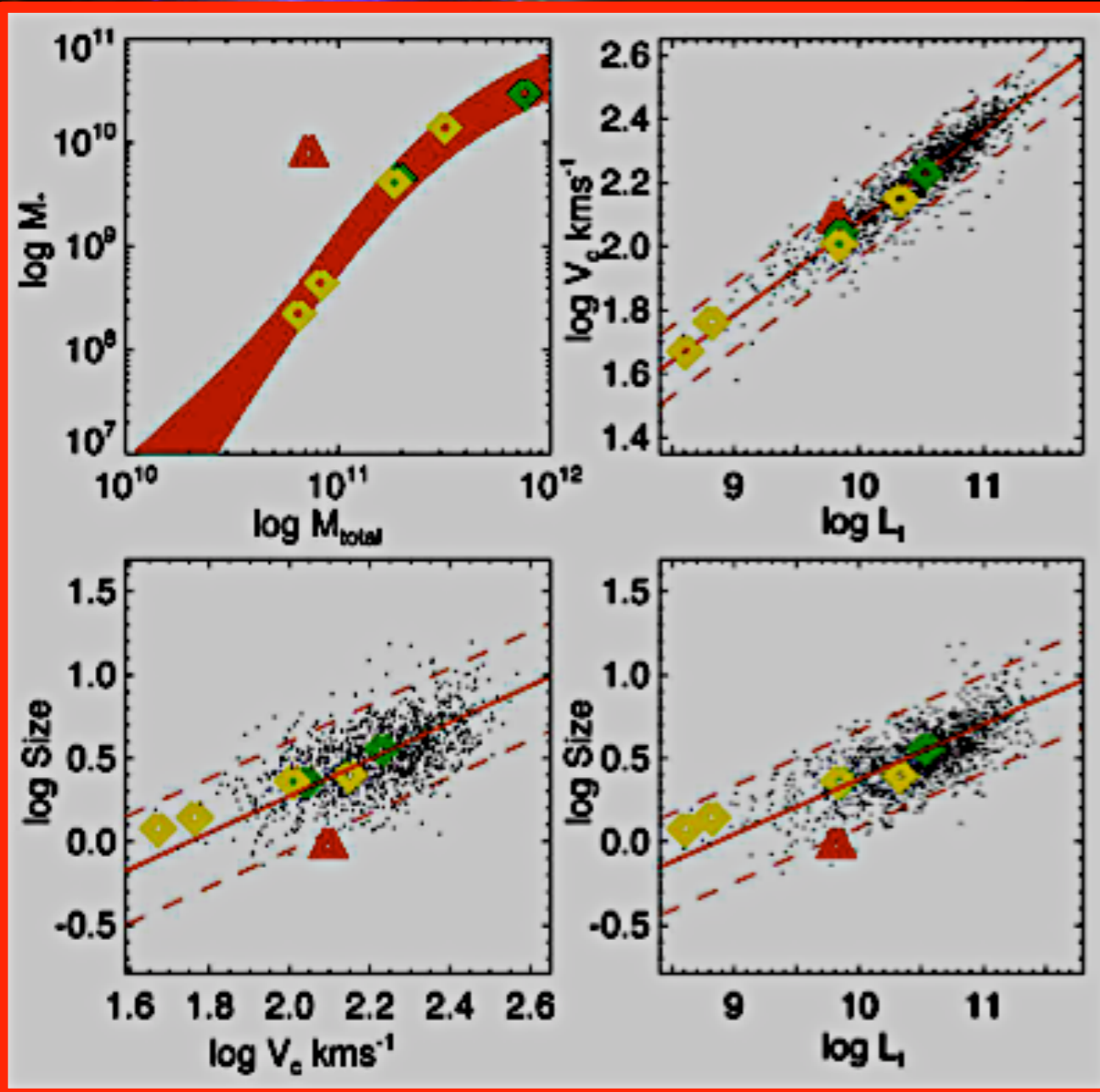
# MaGICC: Making Galaxies in a Cosmological Context

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- having done that ‘trick’ for one galaxy on one scaling relation, this was the result for the others, for all(?) known relations..

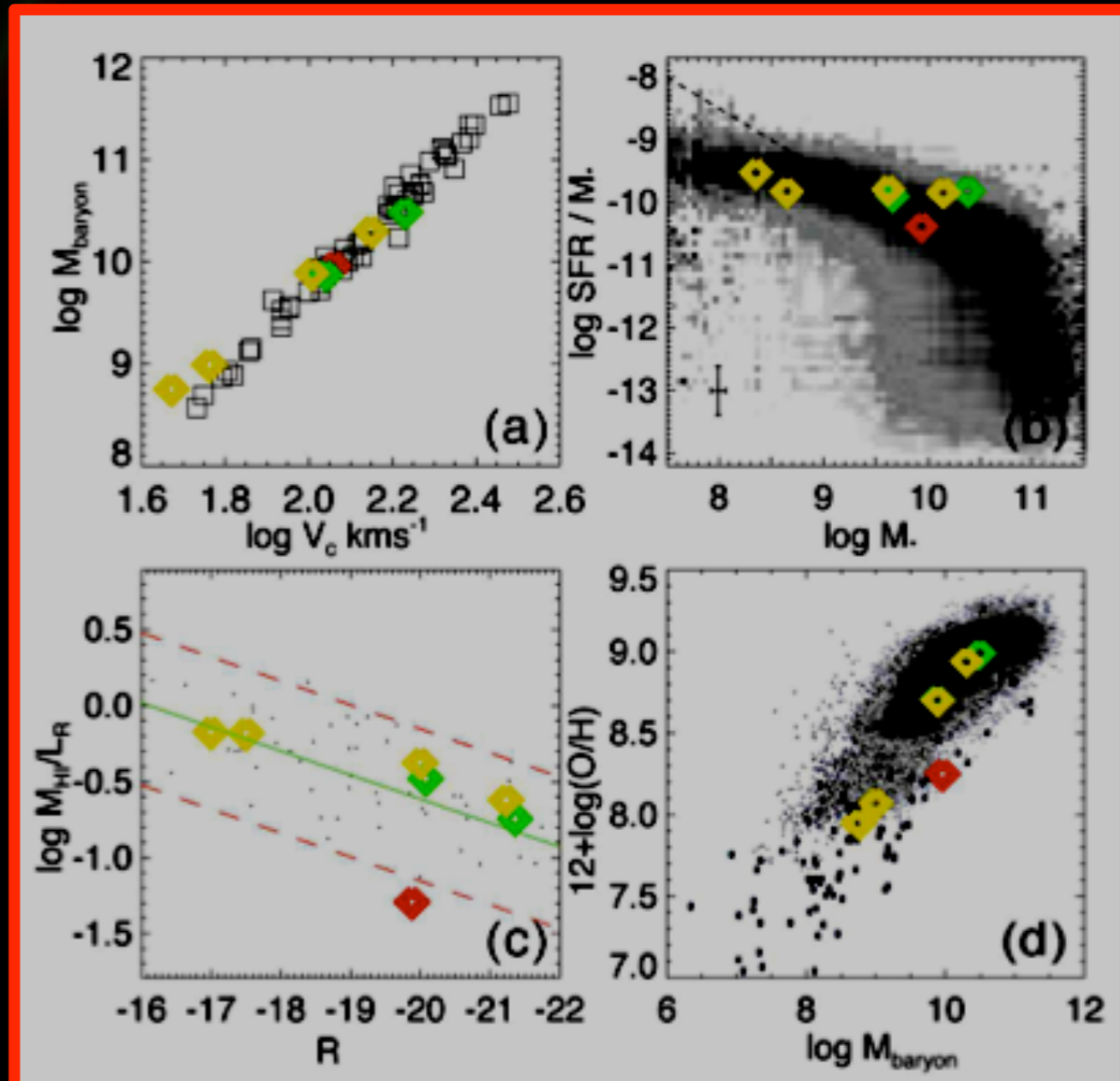
# MaGICC: Making Galaxies in a Cosmological Context

Brook, Stinson, Gibson, Quinn & Wadsley (2012, MNRAS)



- not bad, but limited dynamic range in  $M_*$  recovered .. fails outside that range

- having done that 'trick' for one galaxy on one scaling relation, this was the result for the others, for all(?) known relations..





# MaGICC: Making Galaxies in a Cosmological Context

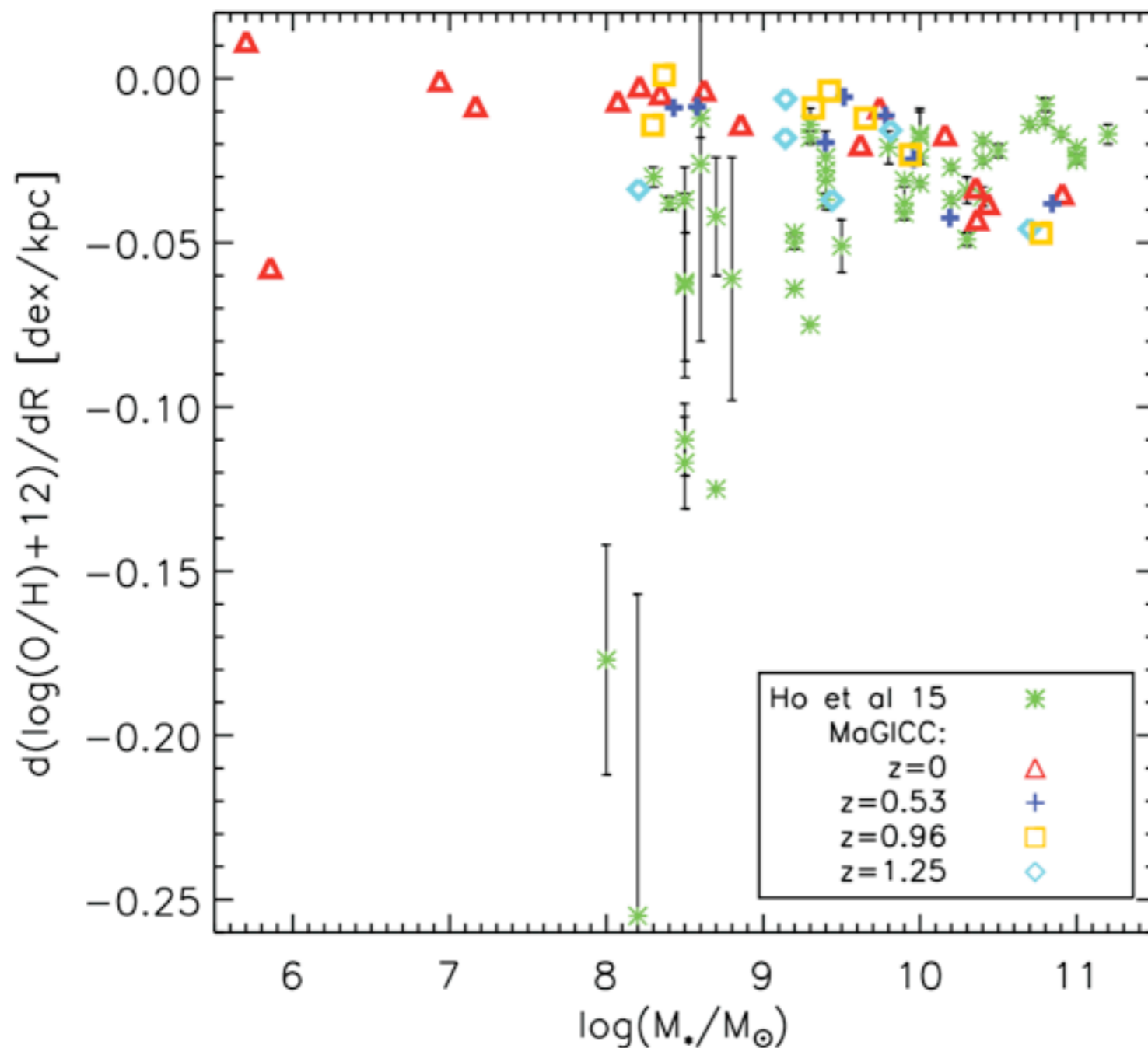
Miranda, Sanchez-Blazquez, Brook & Gibson (2017)

- and as well...  
getting the spatial  
distribution of metals  
correct with singular,  
'locked-in' parameters  
is likely impossible



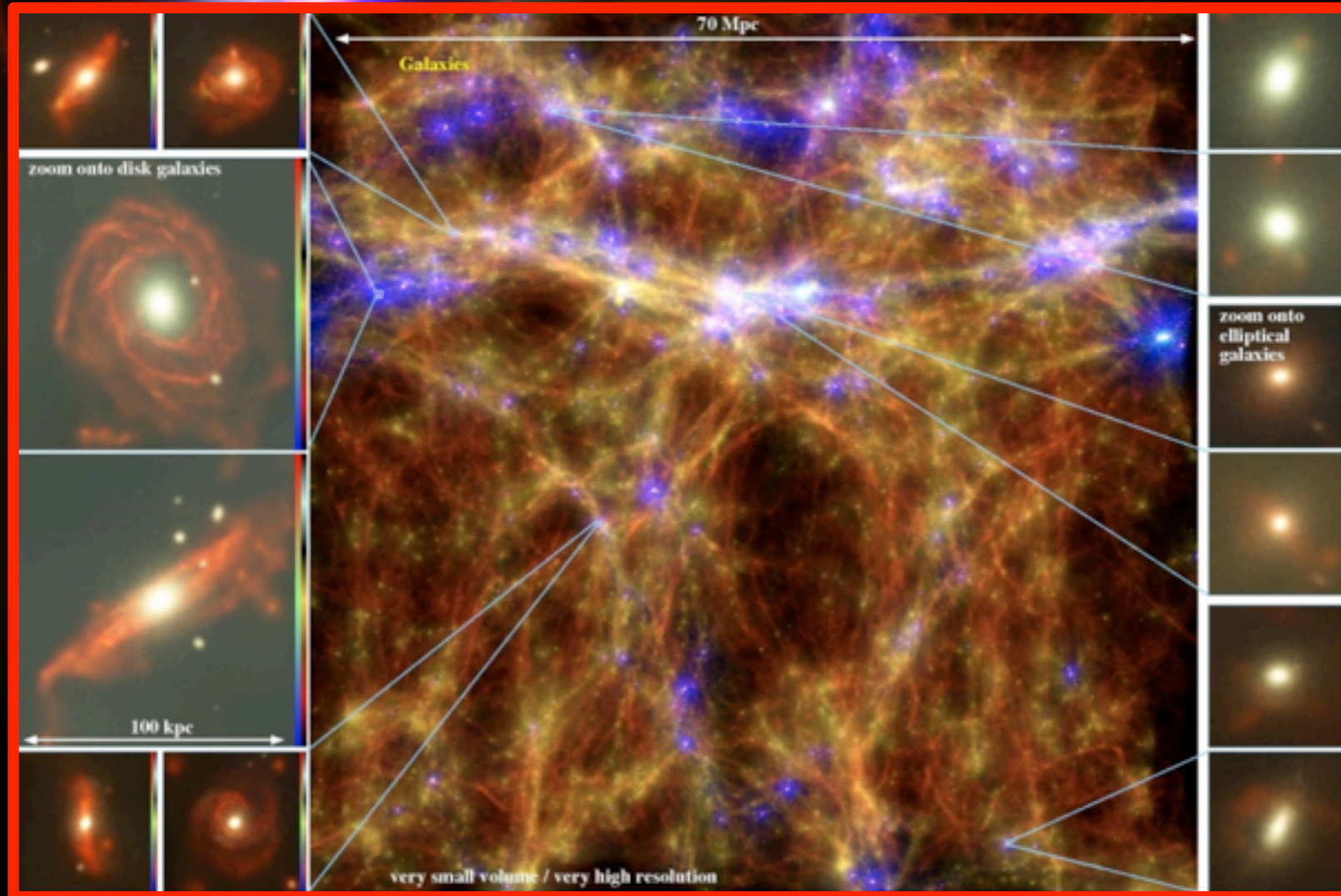
# MaGICC: Making Galaxies in a Cosmological Context

Miranda, Sanchez-Blazquez, Brook & Gibson (2017)



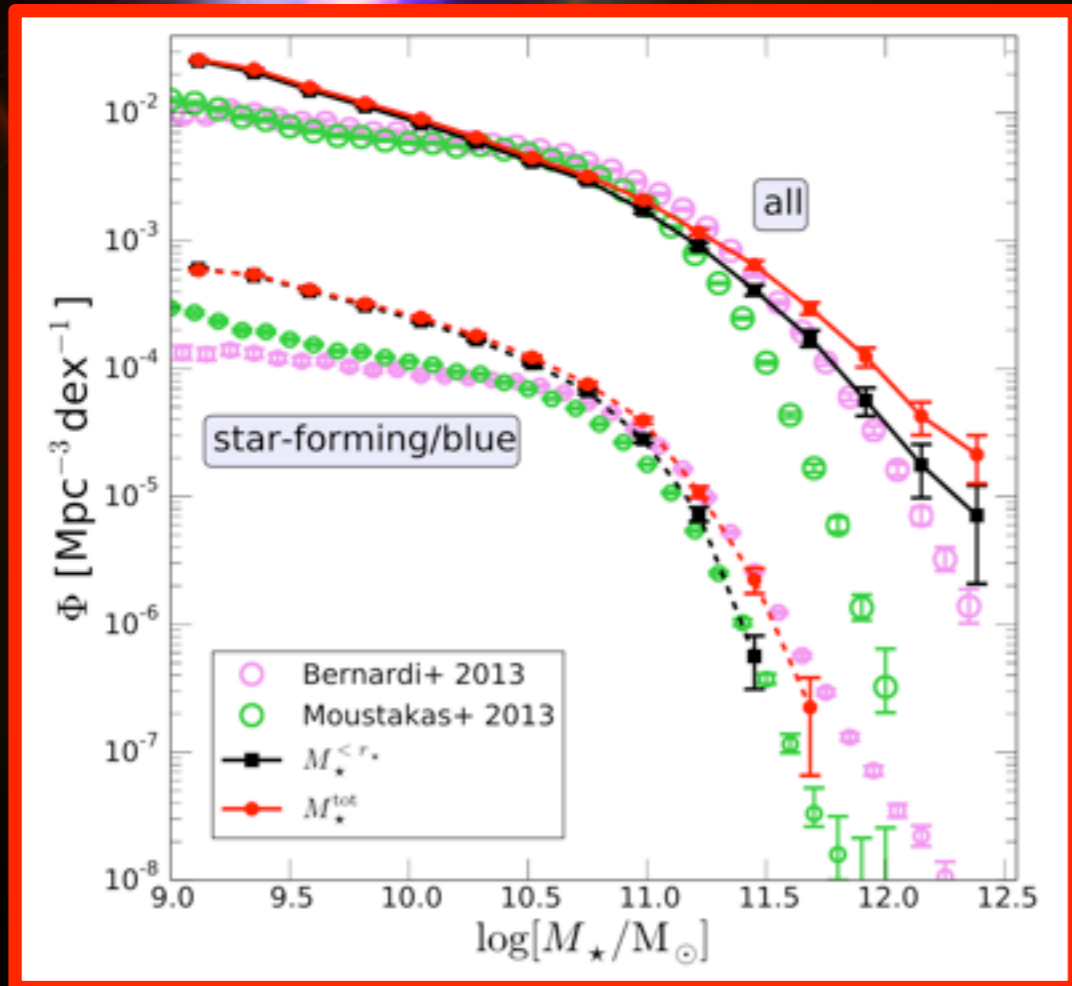
- and as well...  
getting the spatial distribution of metals correct with singular, 'locked-in' parameters is likely impossible

# Before that though ... how do we 'set' the physics in order to do 'Galactic Archaeology'?



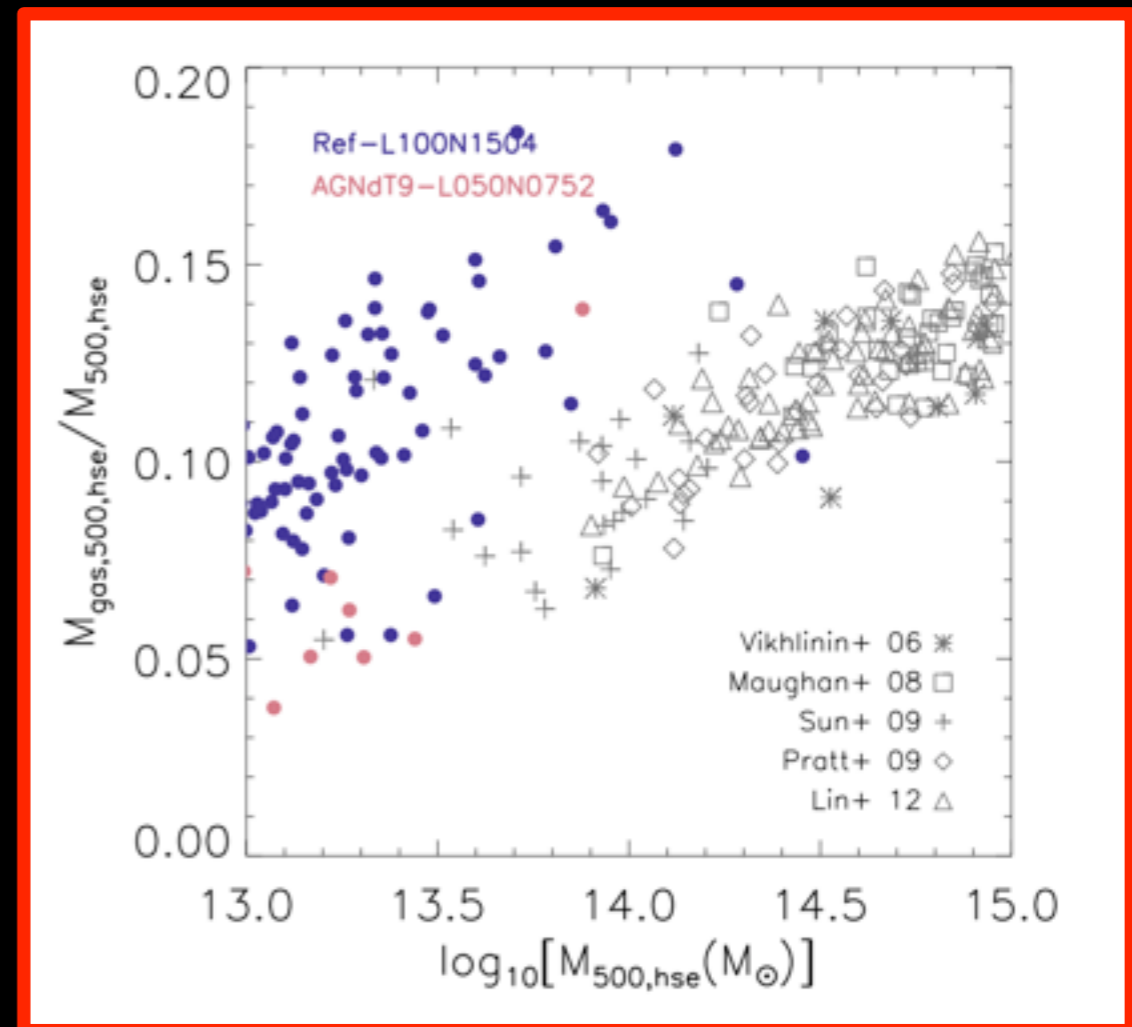
- the one common 'calibrator' for these 'factors' is the  $M^*$ - $M_{\text{halo}}$  relation (Eagle, Illustris, MaGICC)
- MaGICC:  $M^*$ - $M_{\text{h}}$
- Illustris:  $M^*$ - $M_{\text{h}}$  ; SFR-z
- Eagle:  $M^*$ - $M_{\text{h}}$  ;  $M^*$  mass function ; size- $M^*$  ;  $M_{\text{bh}}$  -  $M^*$

# Before that though ... how do we 'set' the physics in order to do 'Galactic Archaeology'?

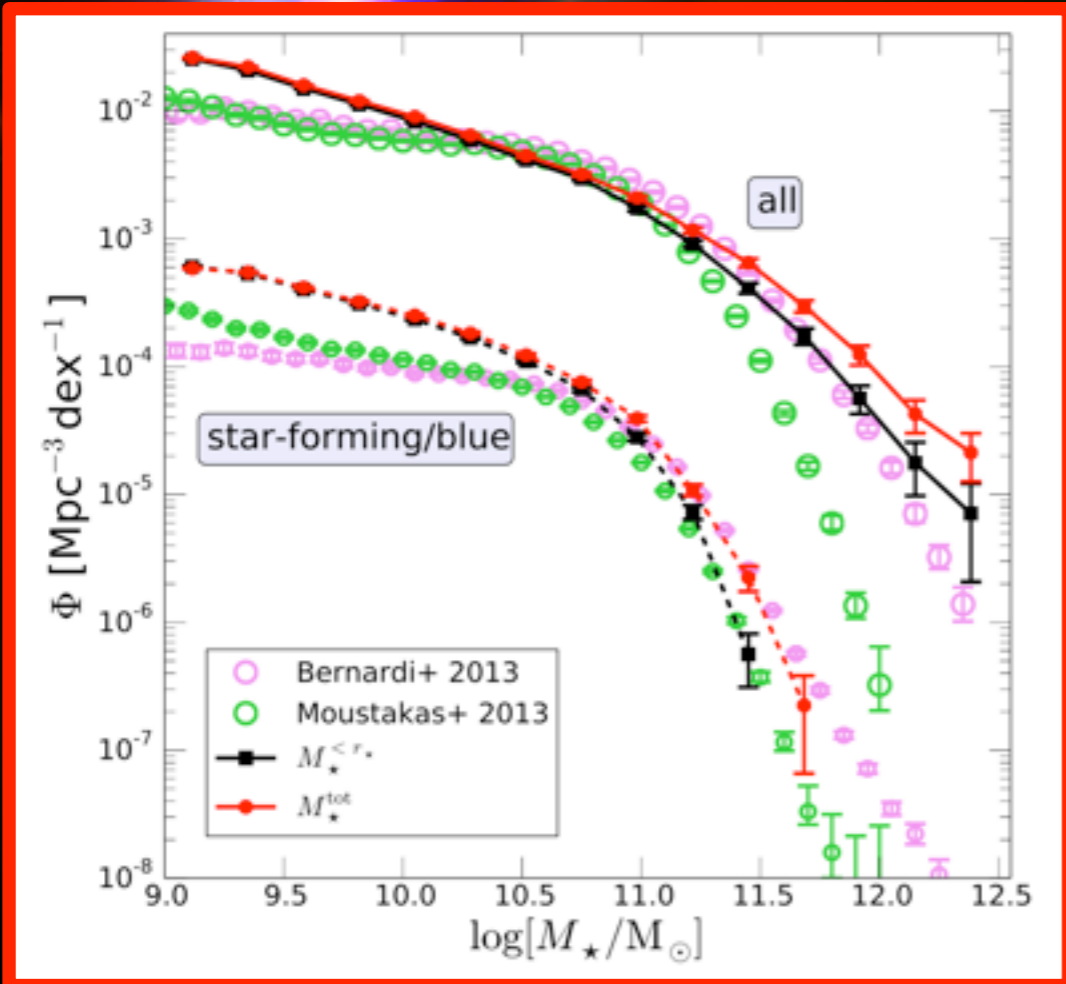


- **MaGICC:  $M^*$ -M<sub>h</sub>**
- **Illustris:  $M^*$ -M<sub>h</sub> ; SFR-z**
- **Eagle:  $M^*$ -M<sub>h</sub> ;  $M^*$  mass function ; size- $M^*$  ; M<sub>bh</sub> -  $M^*$**

- **Vogelsberger et al (2014: Illustris)**  
 **$M^*$  mass function?**
  - **Schaye et al (2015: Eagle)**  
**Gas fractions?**
  - **Furlong et al (2015: Eagle)**  
**SFR-z ?**

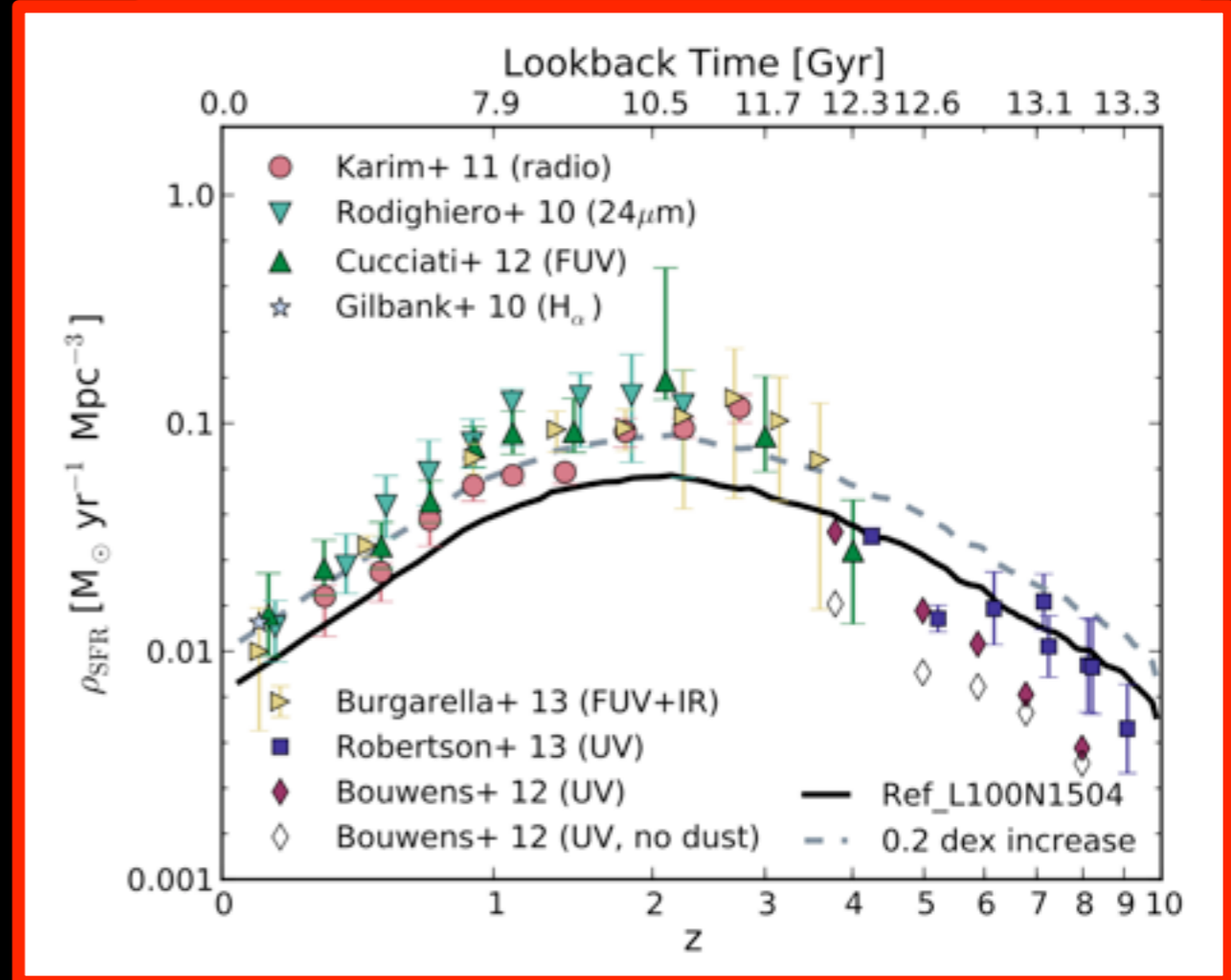


# Before that though ... how do we 'set' the physics in order to do 'Galactic Archaeology'?



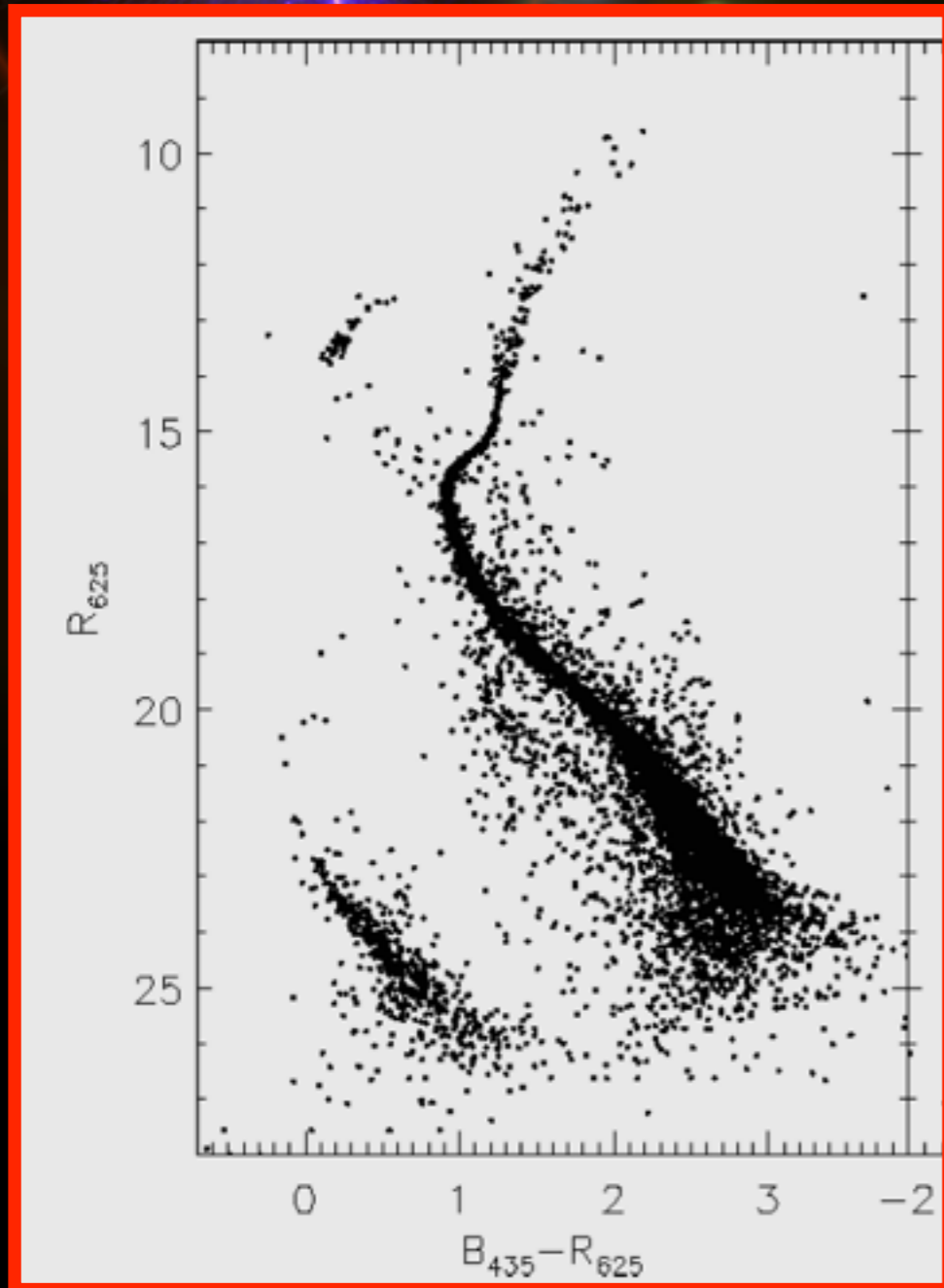
- **MaGICC:  $M^*$ -Mh**
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- **Vogelsberger et al (2014: Illustris)  $M^*$  mass function?**
  - **Schaye et al (2015: Eagle) Gas fractions?**
  - **Furlong et al (2015: Eagle) SFR-z ?**



# Let's say we've done what we can to calibrate "globally"... let's drill down "internally" and ask: Are we analysing simulations correctly?

Miranda, Macfarlane & Gibson (2015); Thompson, Bergemann, Few, Gibson, et al. (2017)

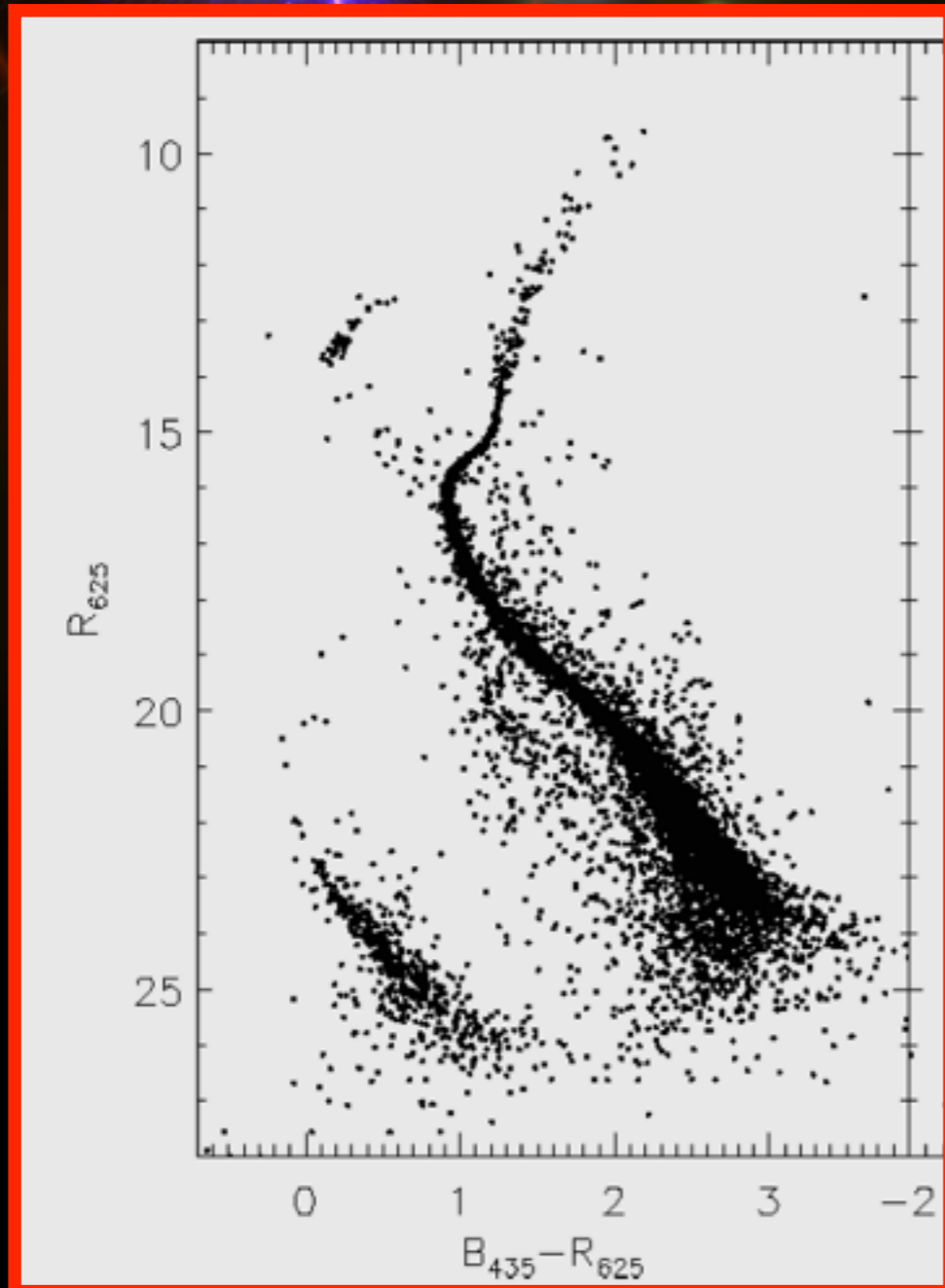


- if you took a few hundred thousand stars from a cluster in nature and plotted them in a colour – magnitude diagram, you would get something like this...

Strickler et al (2009)

# Are we analysing simulations correctly?

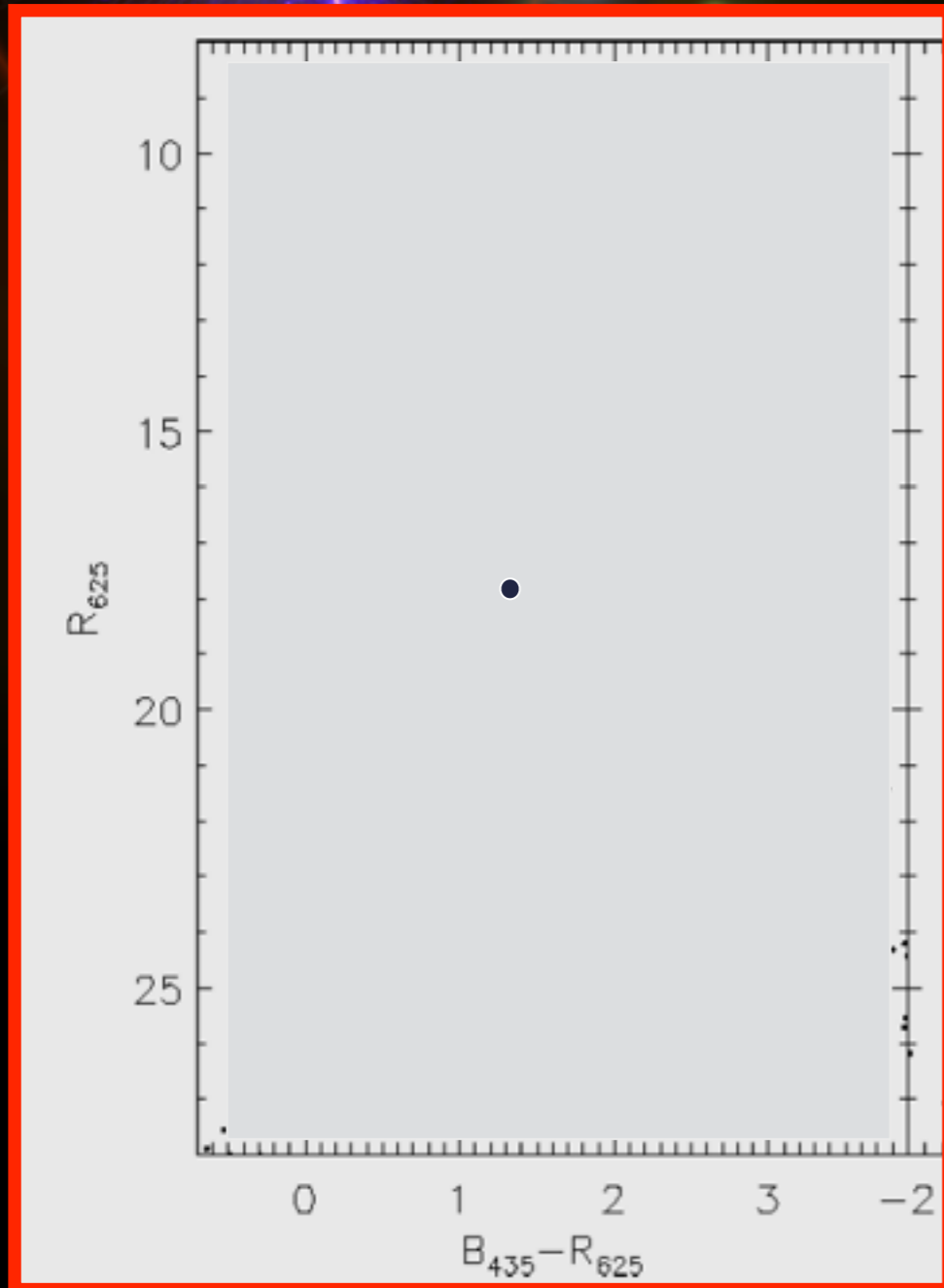
Miranda, Macfarlane & Gibson (2015); Thompson, Bergemann, Few, Gibson, et al. (2017)



- while for simulators, 'star' particles look like this...

# Are we analysing simulations correctly?

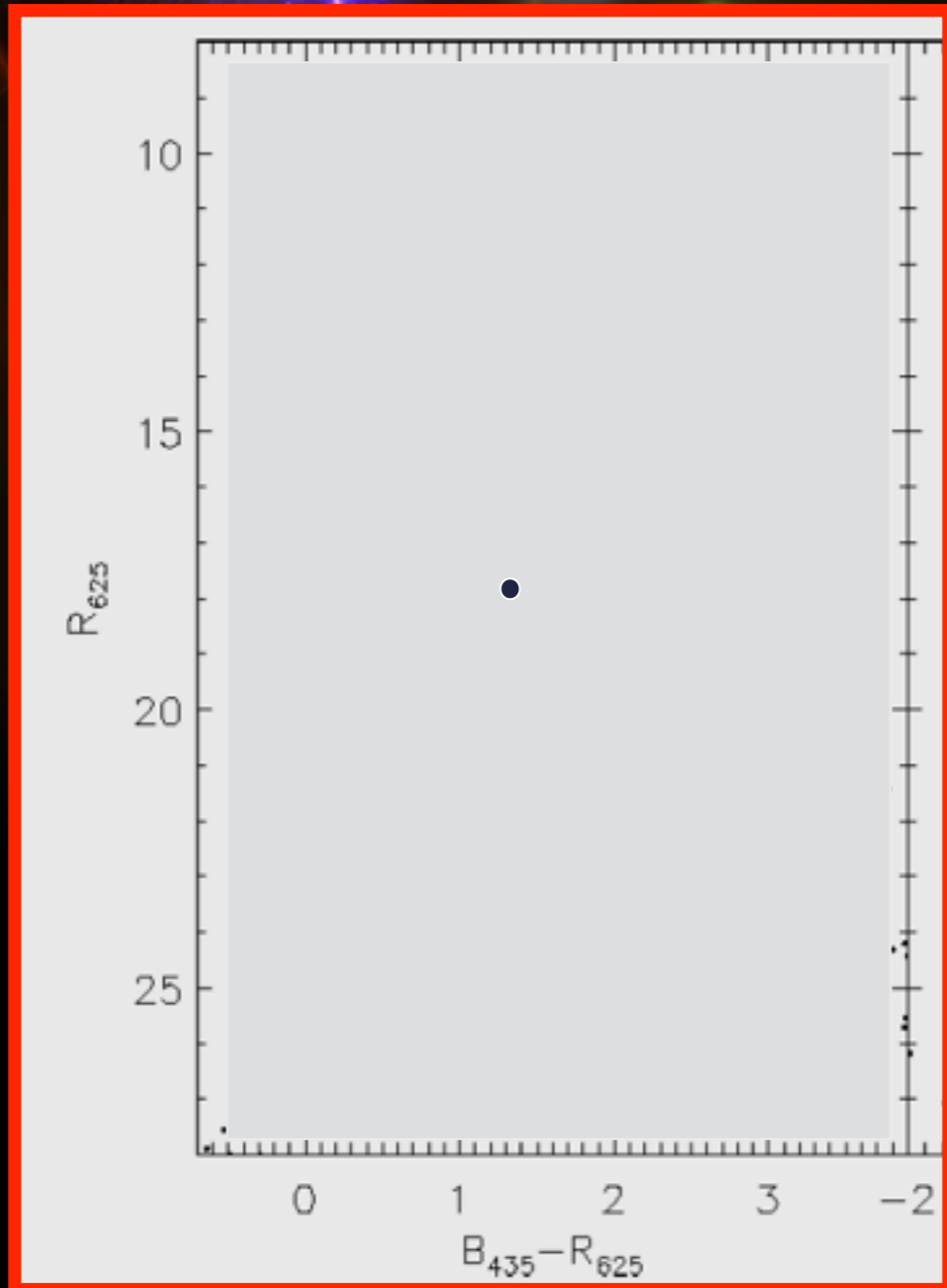
Miranda, Macfarlane & Gibson (2015); Thompson, Bergemann, Few, Gibson, et al. (2017)



- while for simulators, 'star' particles look like this...

# Are we analysing simulations correctly?

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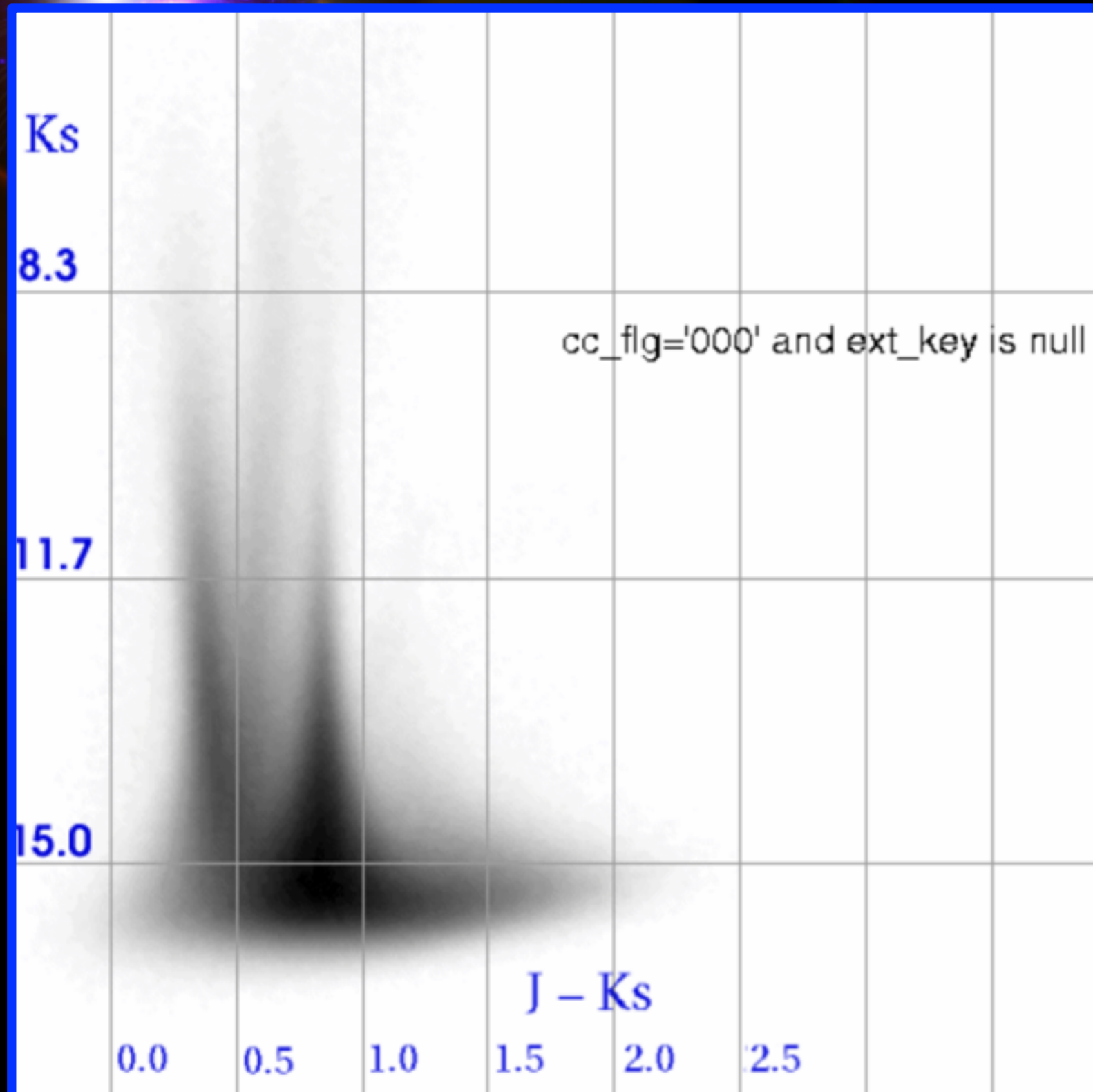


- or put another way ...  
is stacking up a bunch of these...



# Are we analysing simulations correctly?

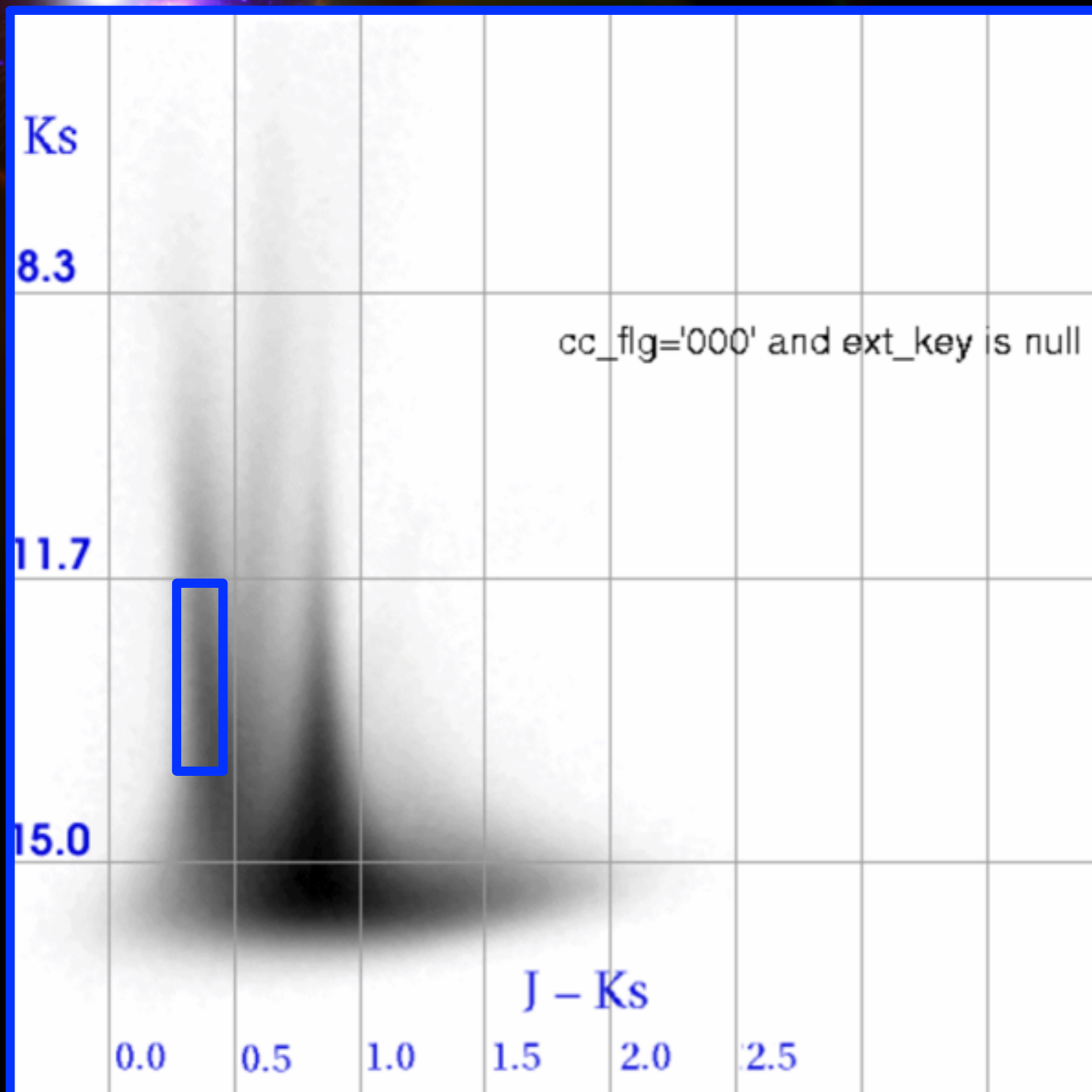
Miranda, Macfarlane & Gibson (2015); Thompson, Bergemann, Few, Gibson, et al. (2017)



- the same thing as selecting a sub-set of these 400 million (real) stars?

# Are we analysing simulations correctly?

Miranda, Macfarlane & Gibson (2015); Thompson, Bergemann, Few, Gibson, et al. (2017)

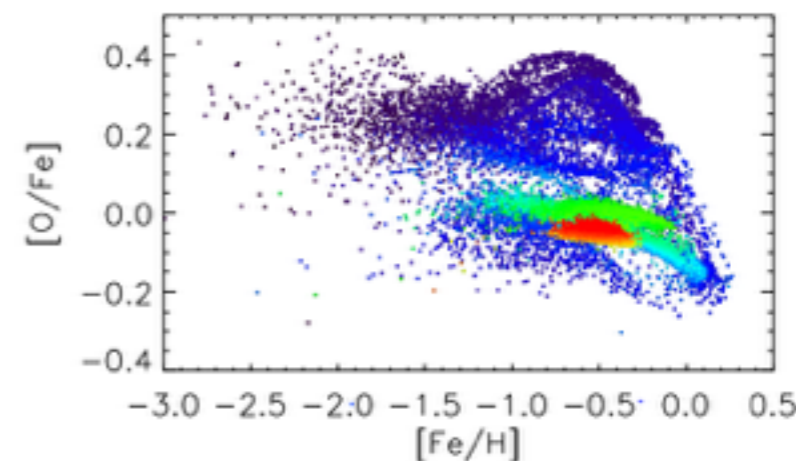
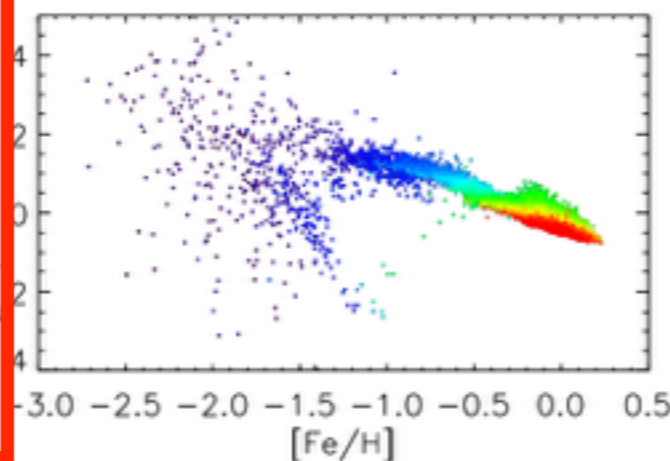
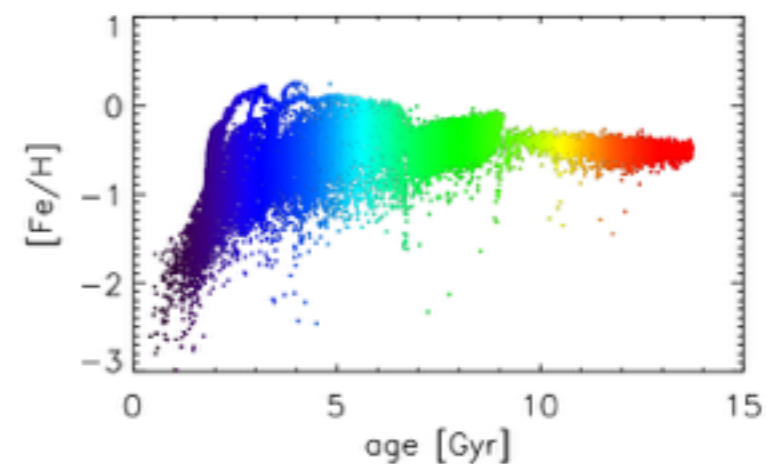
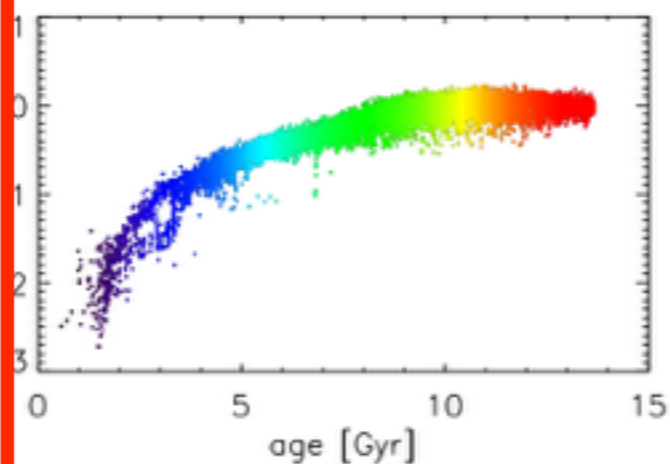
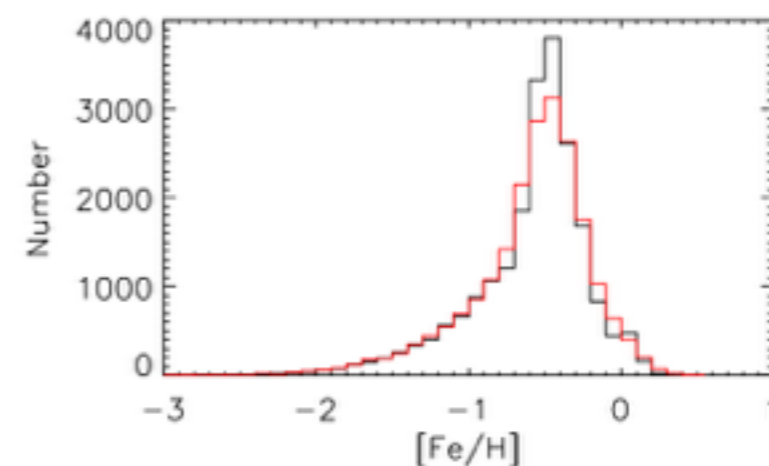
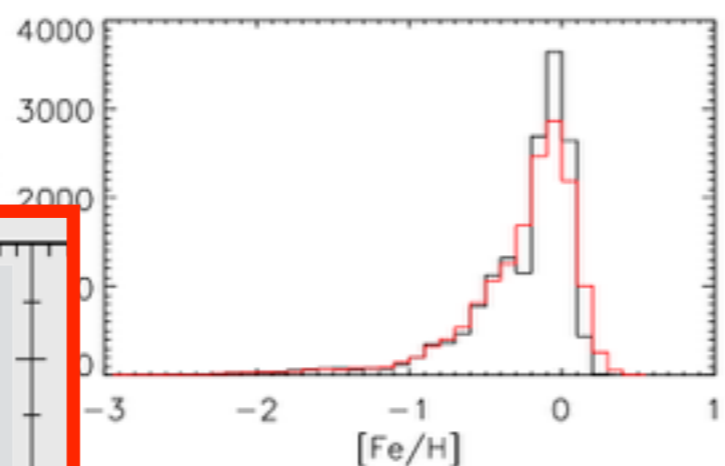
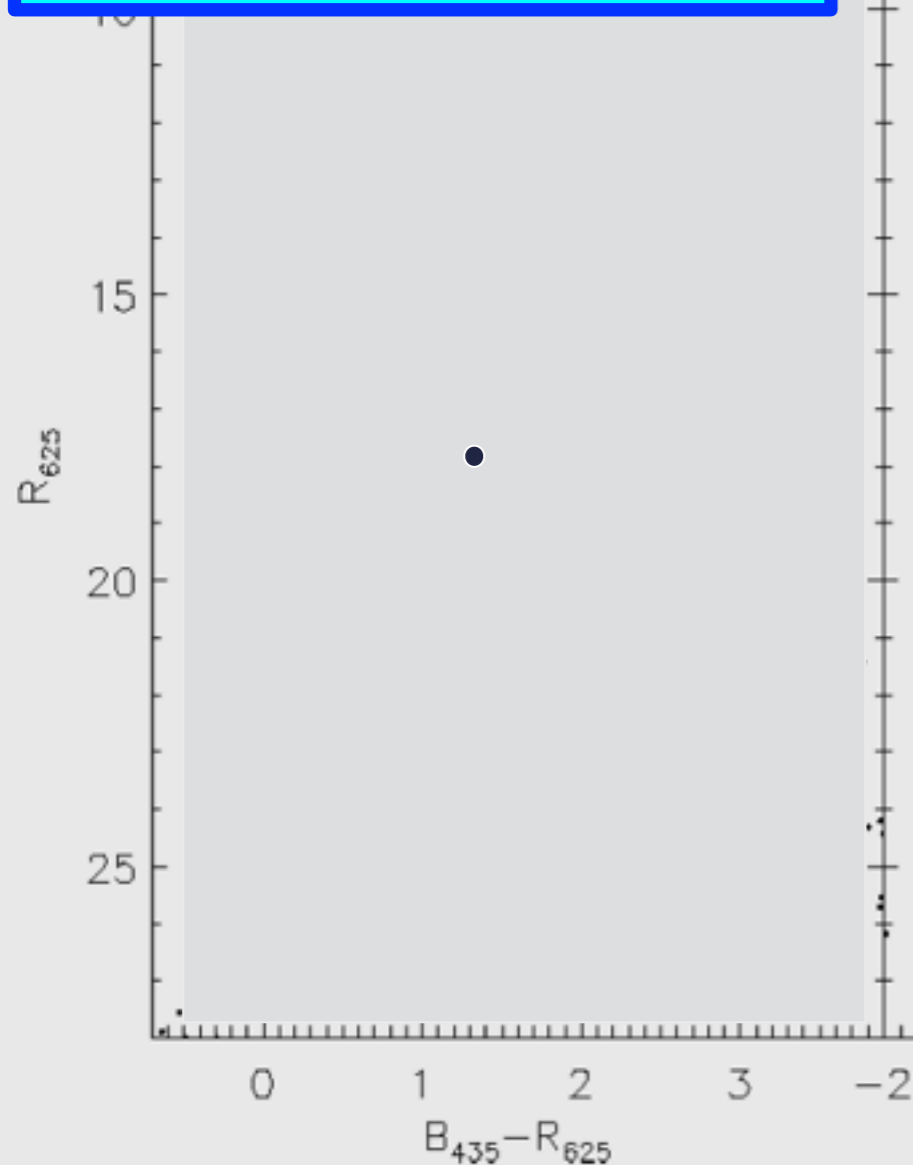


- the same thing as selecting a sub-set of these 400 million (real) stars?
- e.g. preferentially targeting nearby FG stars, as shown by the blue box to the left, as done for the Gaia-ESO Survey (to which I will return, shortly)

# Are we analysing simulations correctly?

Gibson et al. (2013)

- this 'old school' approach applies to essentially 100% of the papers published in the simulation community for the past 20+ years



# Are we analysing simulations correctly?

Pilkington et al. (2012, MNRAS)

- e.g. measuring the local shape of the metallicity distribution function (i.e. 'G-dwarf Problem'), note the predicted range of higher-order moments of the MDF (skewness + kurtosis) and their sensitivity to sub-grid physics ...

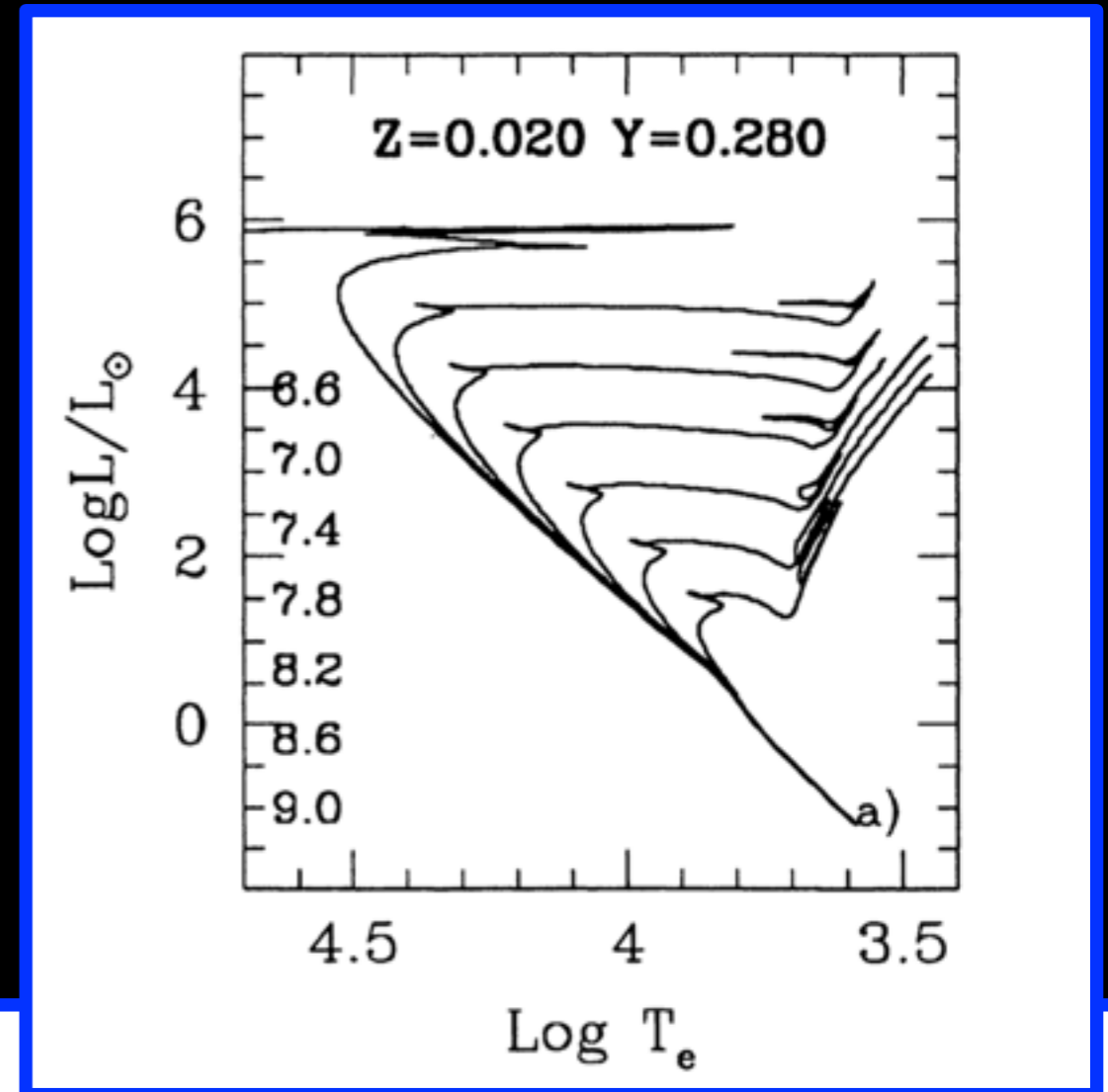
do these metrics depend on how we look at simulations?

Simulation/Dataset	Skewness	Kurtosis	IQR	IDR	ICR	ITPR
11mKroupa	-1.84(-1.21)	3.83(2.59)	0.30(0.54)	0.67(1.13)	1.59(2.72)	2.49(4.34)
11mChab	-1.56(-1.15)	2.43(2.37)	0.41(0.60)	0.85(1.28)	1.71(2.96)	2.38(5.04)
11mNoRad	-1.13(-0.93)	2.45(1.88)	0.26(0.47)	0.52(0.92)	1.44(2.07)	2.39(3.73)
11mNoMinShut	+0.47(-0.29)	0.94(0.57)	0.13(0.48)	0.26(0.93)	0.69(1.79)	1.97(3.26)
11mNoDiff	-0.91(-1.29)	0.91(2.32)	0.96(1.25)	1.85(2.44)	3.49(5.18)	5.06(8.03)
GCS	-0.61	2.04	0.23	0.48	1.26	2.63
GCScut	-0.37	0.78	0.24	0.45	0.94	1.43
Fornax	(-1.33)	(3.58)	(0.38)	(2.25)	(2.75)	(2.85)

# How do we propose to test this?

Miranda, Macfarlane & Gibson (2015); Thompson, Bergemann, Few, Gibson, et al. (2017)

- we know the age, metallicity, and IMF of each simulation 'star' particle
- this allows us to populate each bin of each isochrone for each particle with the correct number of stars at the correct evolutionary stage (gravity, luminosity, temperature)
- and finally, with knowledge of the position of each 'star' particle, we transform to apparent magnitude and colour



♀  
Astrophysics

- we do so with SynCMD



Theory of stellar population synthesis  
with an application to *N*-body simulations

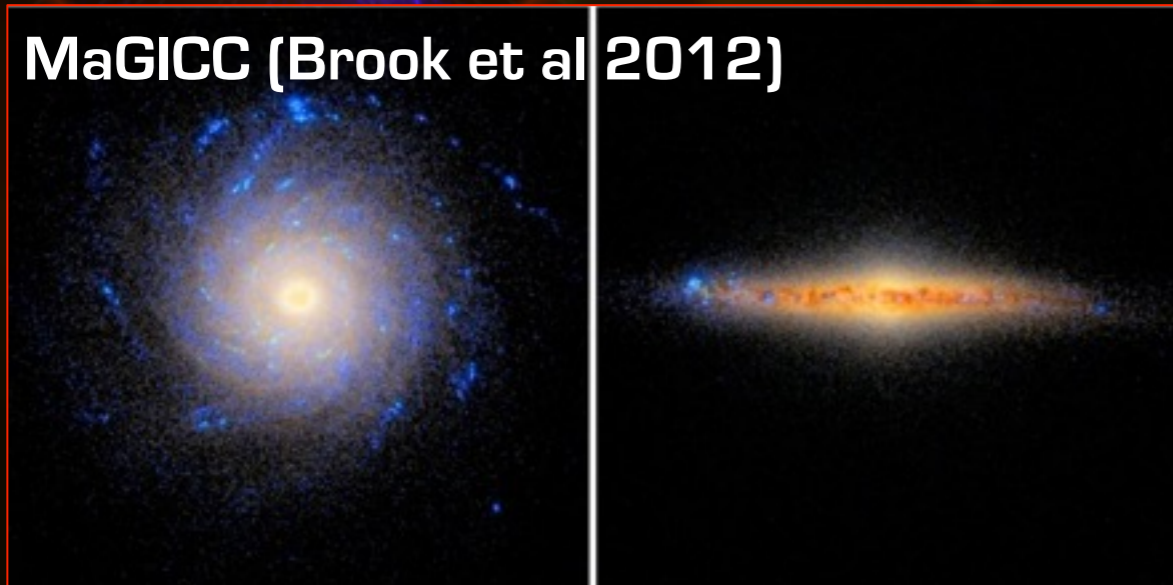
S. Pasetto<sup>1</sup>, C. Chiosi<sup>2</sup>, and D. Kawata<sup>1</sup>

A&A 545, A14 (2012)  
DOI: 10.1051/0004-6361/201219698  
© ESO 2012

# How do we propose to test this?

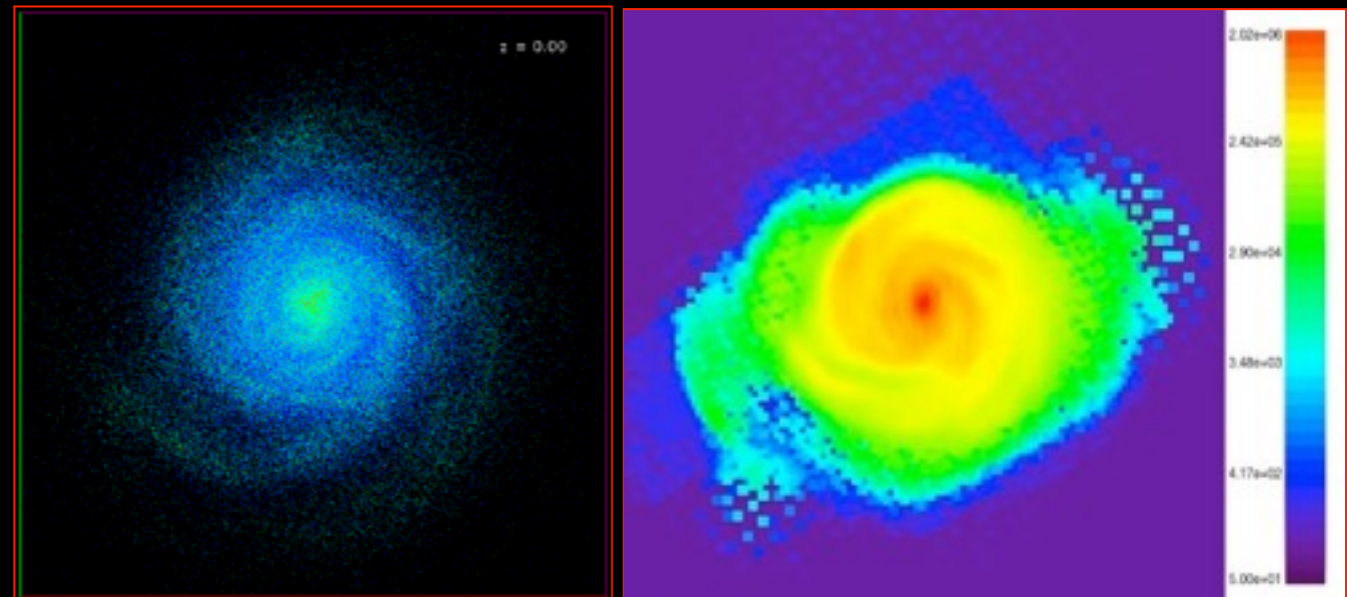
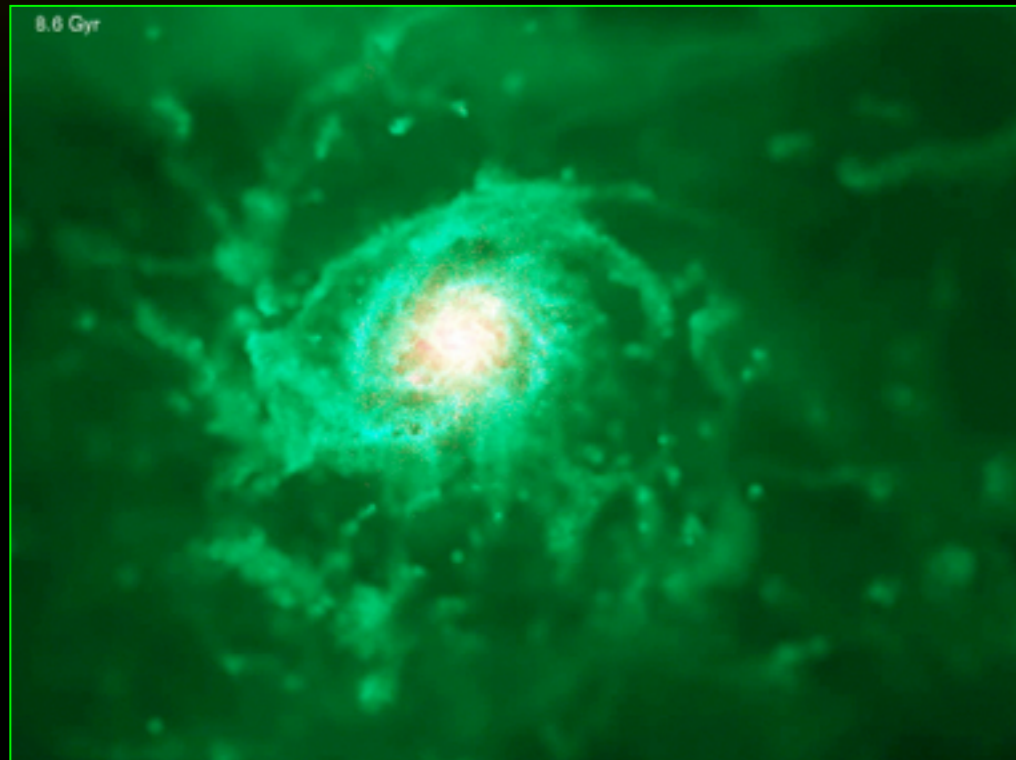
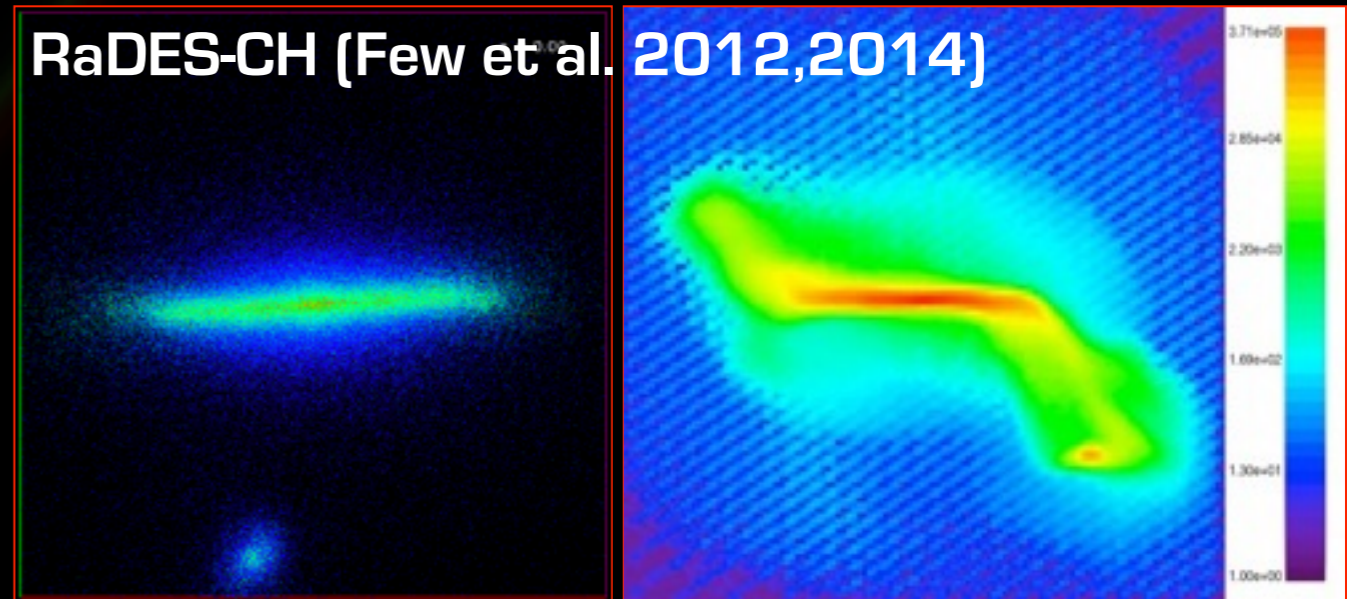
Miranda, Macfarlane & Gibson (2015); Thompson, Bergemann, Few, Gibson, et al. (2017)

MaGICC (Brook et al 2012)



- place ourselves inside simulations at the 'Sun' and select individual stars exactly as observers would do

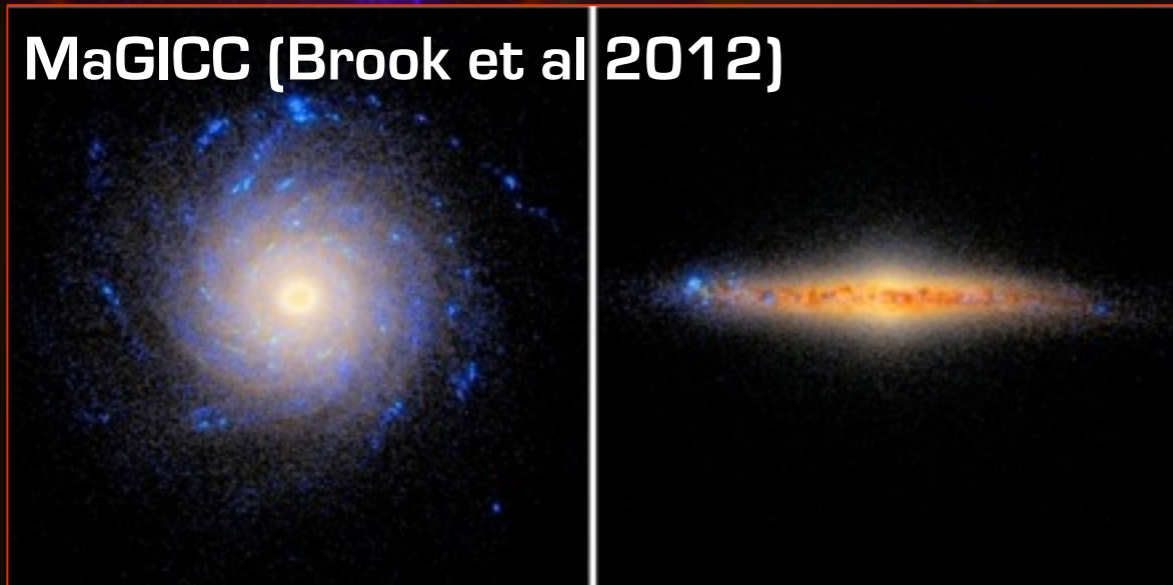
RaDES-CH (Few et al. 2012, 2014)



# How do we propose to test this?

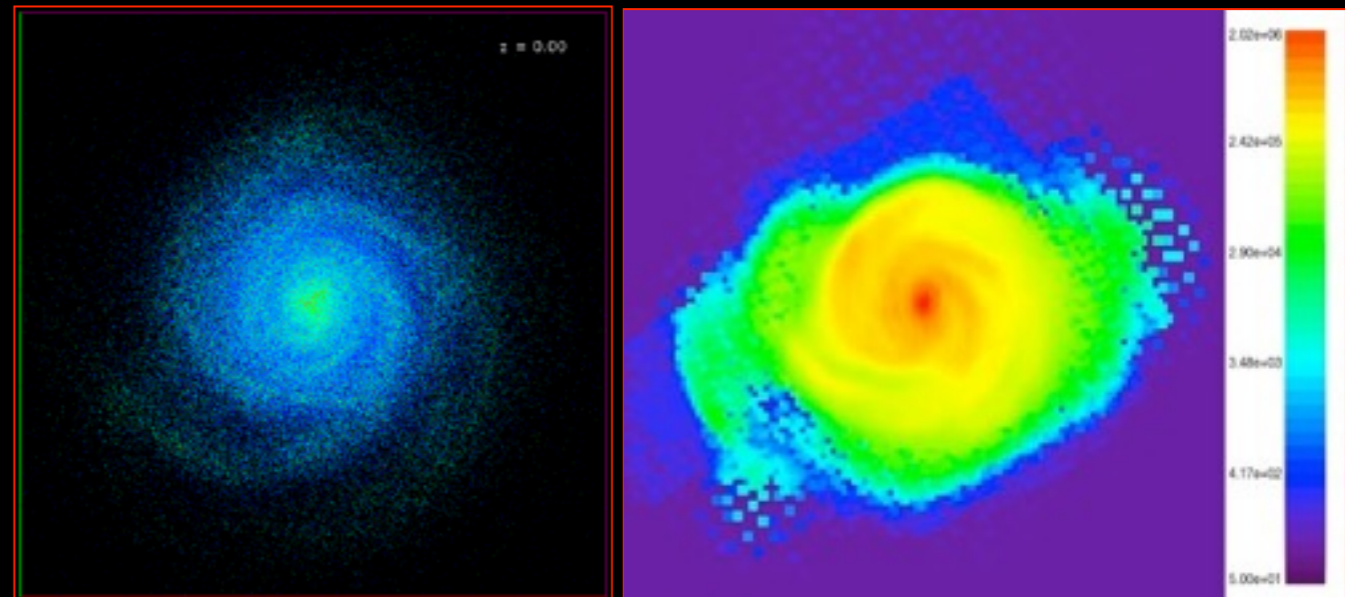
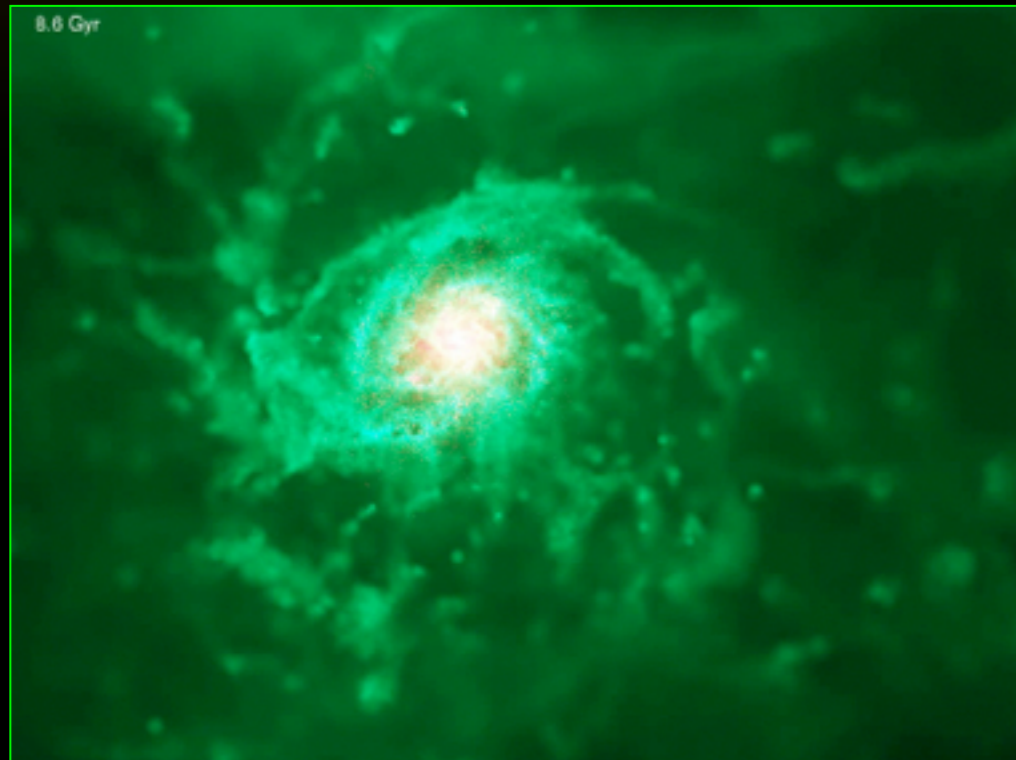
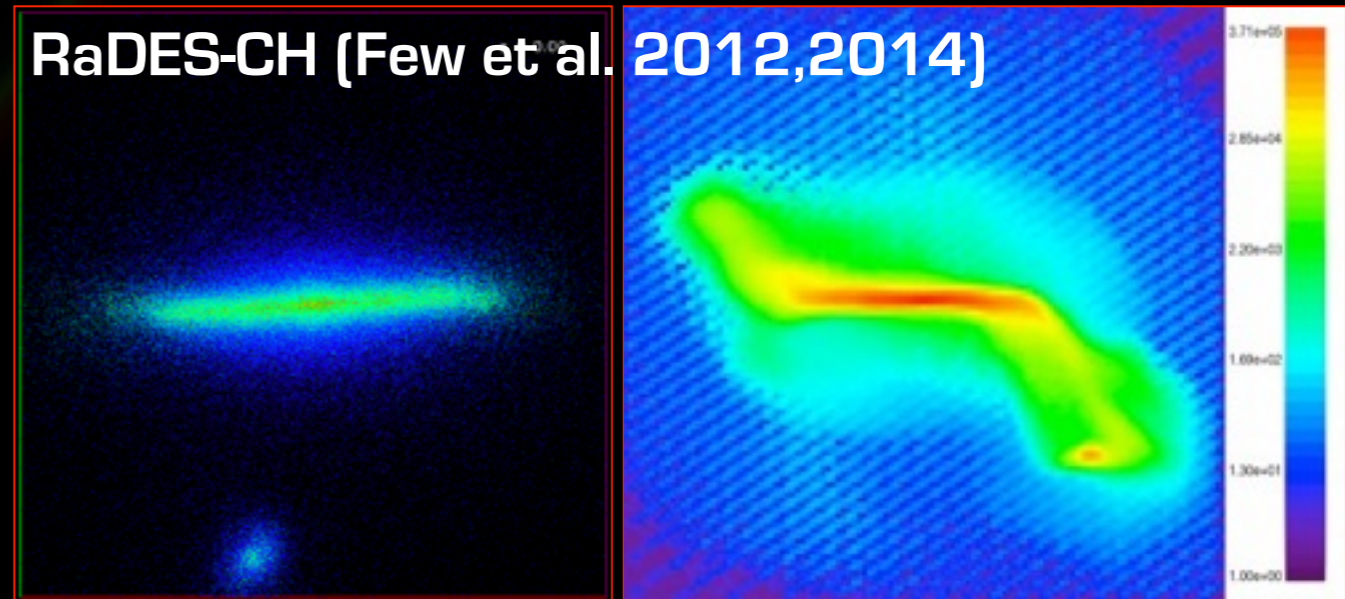
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# Test #1: The RAdial Velocity Experiment (RAVE)

Miranda, Macfarlane & Gibson (2015)

POS

PROCEEDINGS  
OF SCIENCE

## Observationally-Motivated Analysis of Simulated Galaxies

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**Ben A. MacFarlane**

*University of Central Lancashire*

*E-mail: bmacfarlane@uclan.ac.uk*

**Brad K. Gibson**

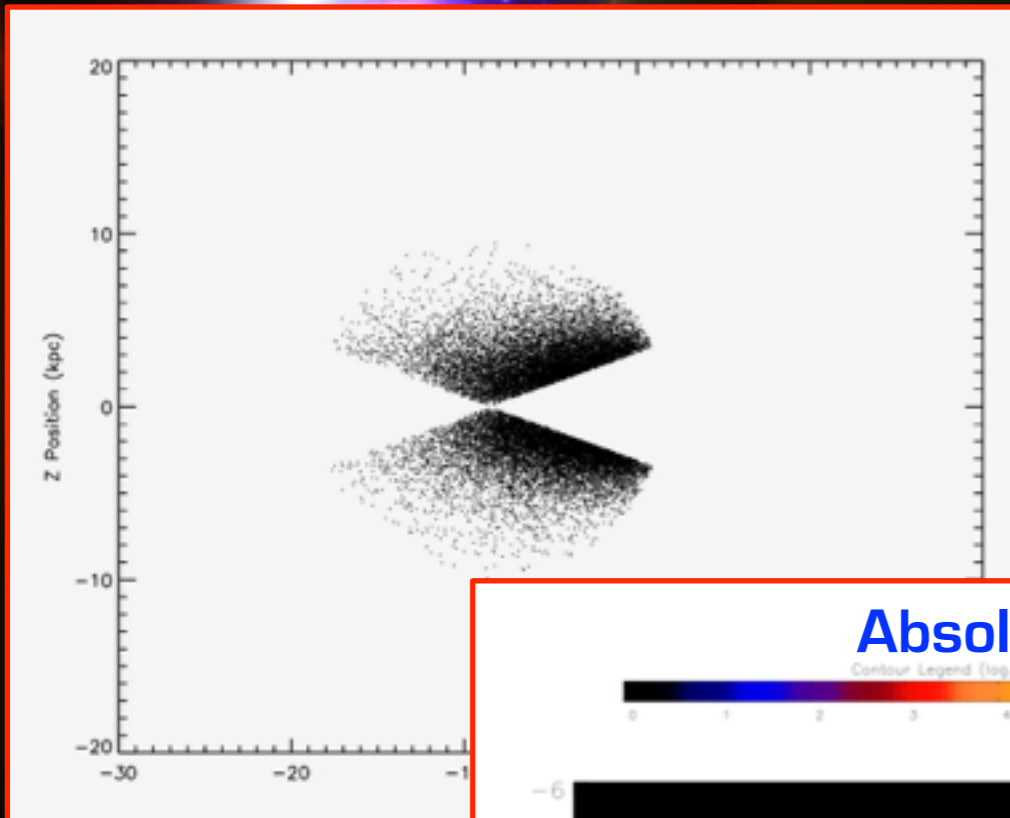
*University of Central Lancashire*

*E-mail: brad.k.gibson@gmail.com*

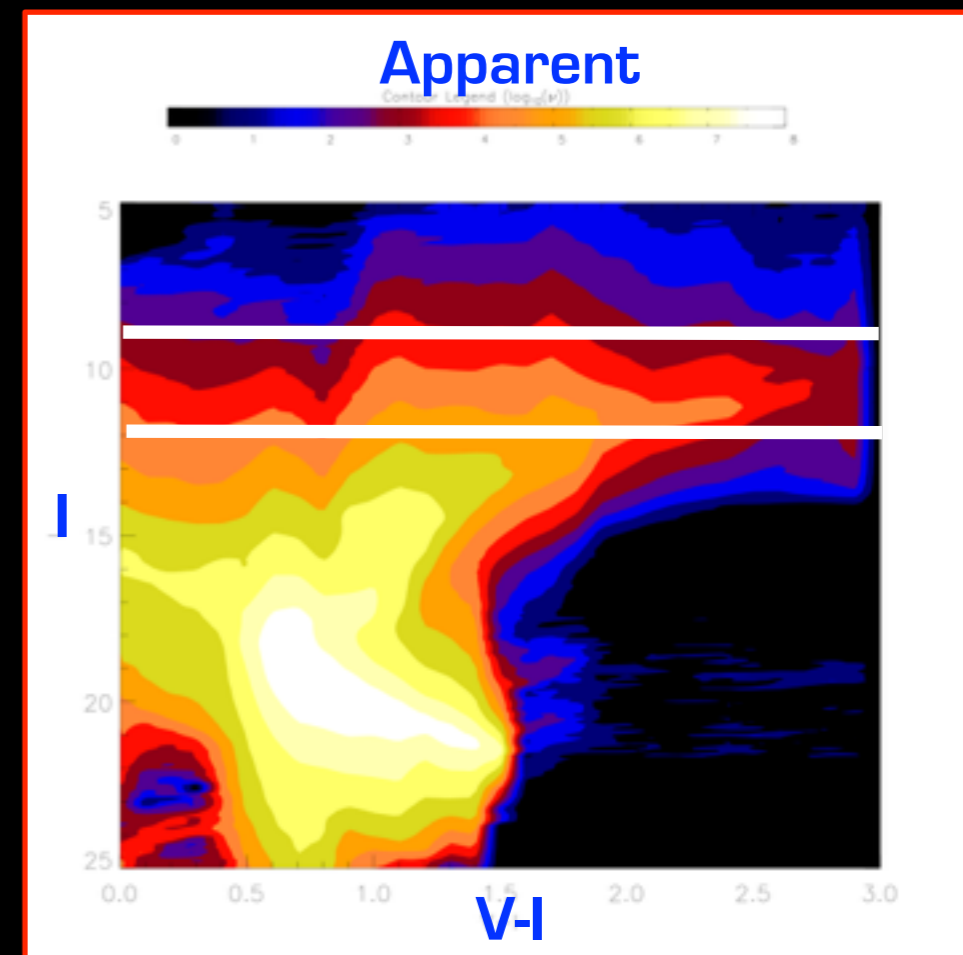
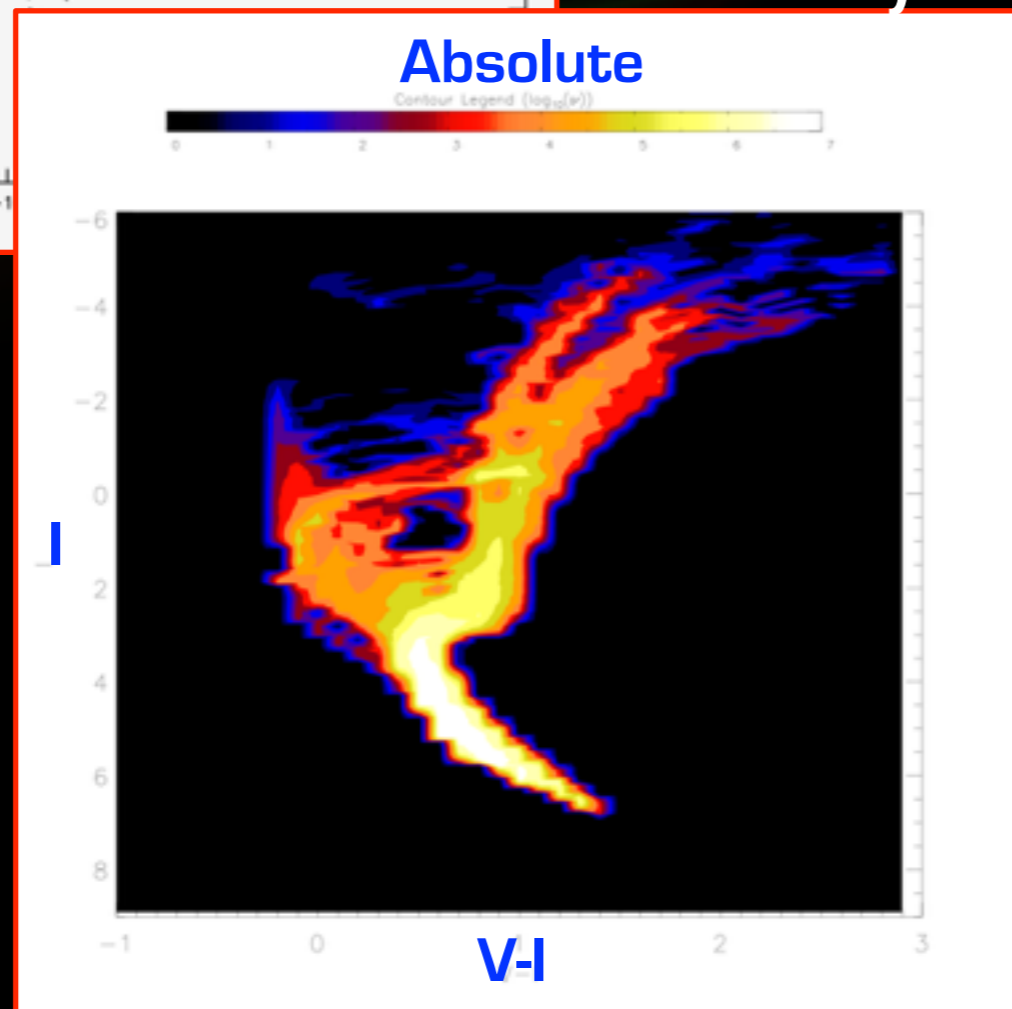


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Miranda, Macfarlane & Gibson (2015)

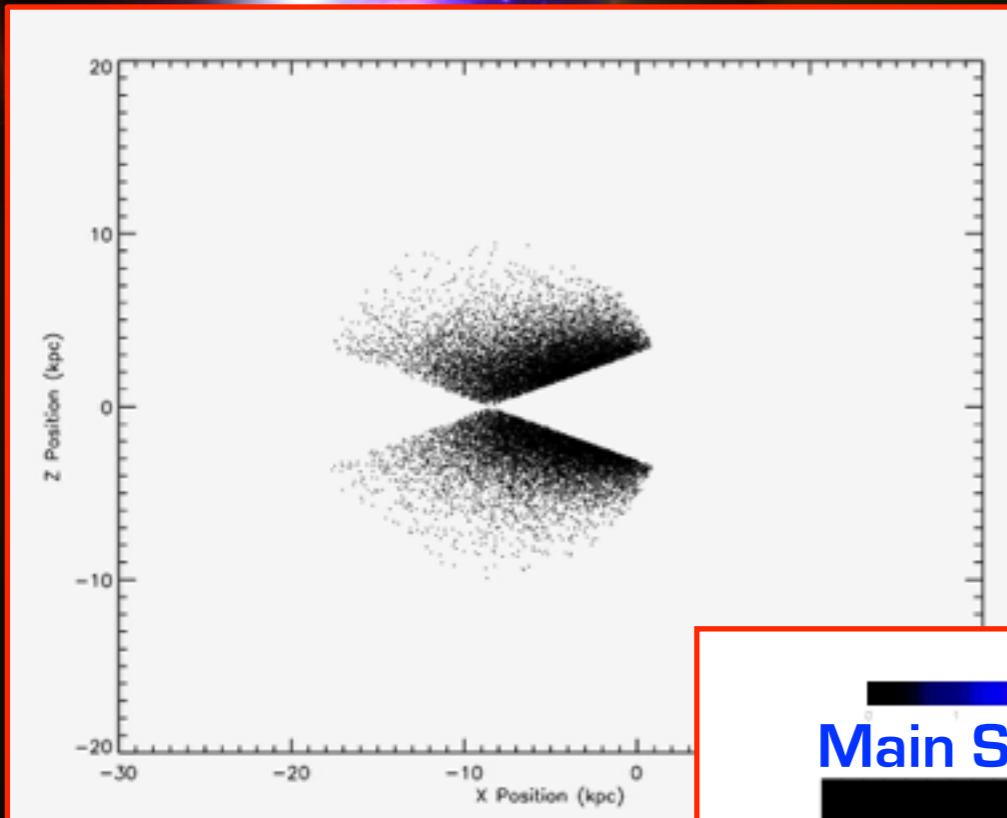


- Apply RAVE selection criteria ( $9 < I < 12$ ) to wedge-like distribution from viewer's vantage point (avoiding the disk + ignoring extinction)
- Compare moments of the MDFs inferred using 'composite' simulation star particles and 'synthetic' individual stars

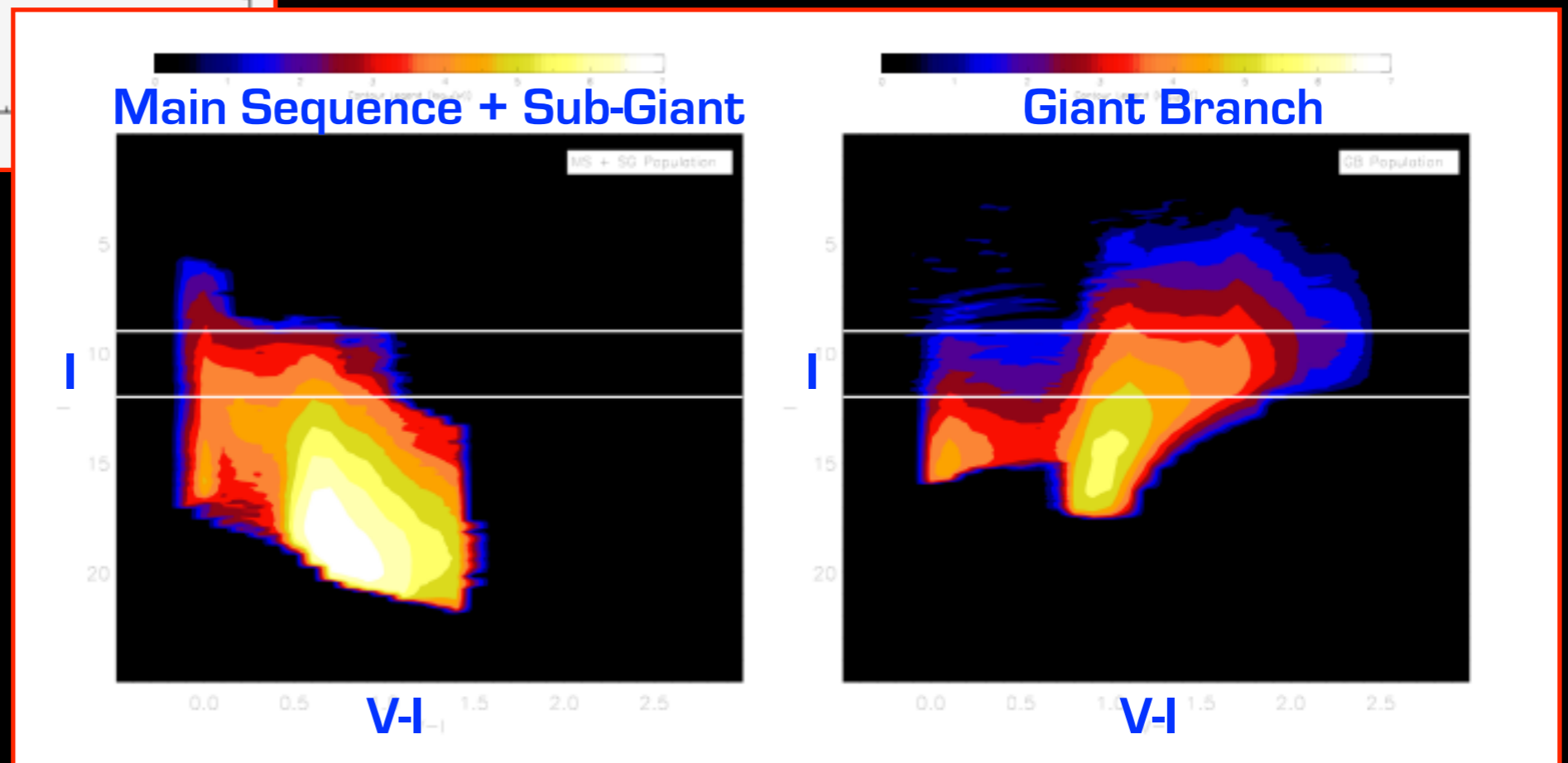


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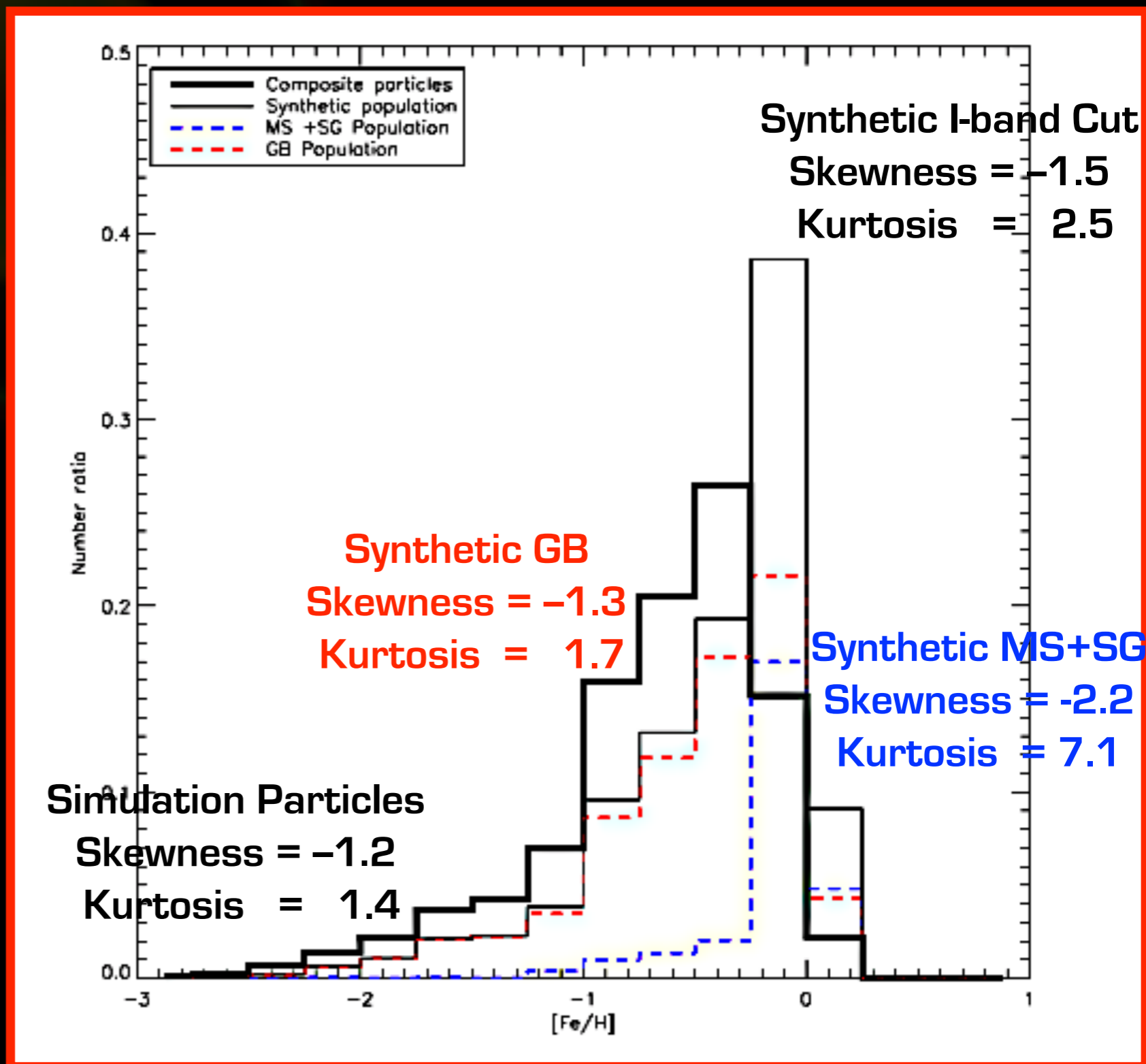


- not only that, we can also apply surface gravity cuts corresponding to dwarfs (MS+SG) and giants (GB)



# Test #1: The RAdial Velocity Experiment (RAVE)

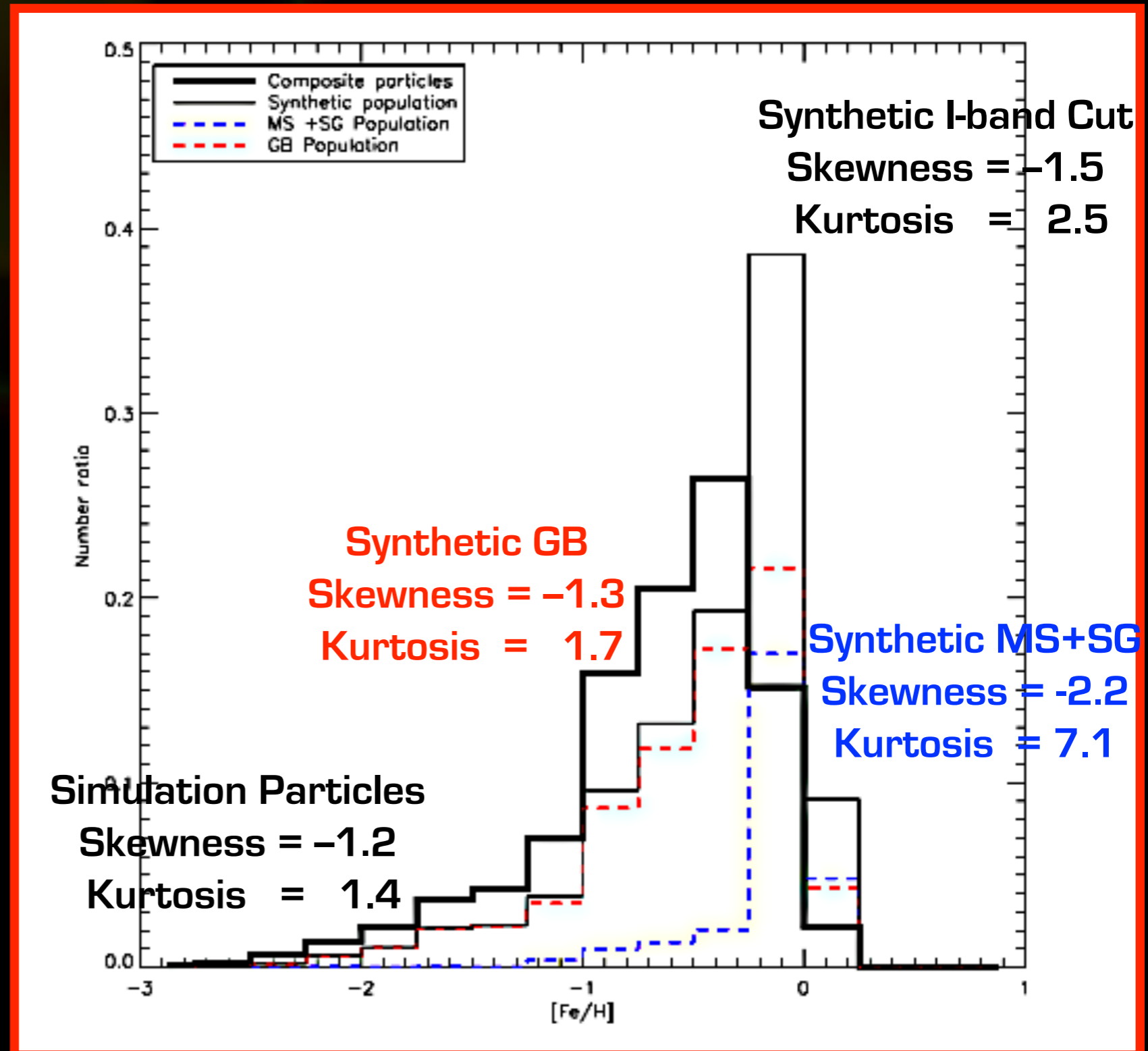
Miranda, Macfarlane & Gibson (2015)



# Test #1: The RAdial Velocity Experiment (RAVE)

Miranda, Macfarlane & Gibson (2015)

- impact on skewness and kurtosis of the MDF comparable to impact of changing IMF, including radiation energy feedback, or metal diffusion treatment (recall, Pilkington et al 2012, MNRAS)



# Test #2: The Gaia-ESO Survey

Thompson, Bergemann, Few, Gibson, et al. (2017)

MNRAS 000, 1–12 (2017)

Preprint 21 June 2017

Compiled using MNRAS L<sup>A</sup>T<sub>E</sub>X style file v3.0

## The Gaia-ESO Survey: Matching Chemo-Dynamical Simulations to Observations of the Milky Way <sup>★</sup>

B. B. Thompson<sup>†,1,2,3</sup> C. G. Few,<sup>2,4</sup> M. Bergemann,<sup>5</sup> B. K. Gibson,<sup>2</sup> B. A. MacFarlane,<sup>1</sup> A. Serenelli,<sup>6</sup> G. Gilmore,<sup>7</sup> S. Randich,<sup>8</sup> A. Vallenari,<sup>9</sup> E. J. Alfaro,<sup>10</sup> T. Bensby,<sup>11</sup> P. Francois,<sup>12</sup>, A. J. Korn,<sup>13</sup> A. Bayo,<sup>14</sup> G. Carraro,<sup>15</sup> A. R. Casey,<sup>7</sup> M. T. Costado,<sup>8</sup> P. Donati,<sup>16</sup> E. Franciosini,<sup>15</sup> A. Frasca,<sup>17</sup> A. Hourihane,<sup>7</sup> P. Jofré,<sup>7</sup> V. Hill,<sup>18</sup> U. Heiter,<sup>13</sup> S. E. Koposov,<sup>7</sup> A. Lanzafame,<sup>17,19</sup> C. Lardo,<sup>20</sup>, P. de Laverny,<sup>21</sup> J. Lewis,<sup>7</sup> L. Magrini,<sup>8</sup> G. Marconi,<sup>15</sup> T. Masseron,<sup>7</sup> L. Monaco,<sup>22</sup> L. Morbidelli,<sup>8</sup> E. Pancino,<sup>8</sup> L. Prisinzano,<sup>23</sup> A. Recio-Blanco,<sup>21</sup> G. Sacco,<sup>8</sup> S. G. Sousa,<sup>24</sup> G. Tautvaišienė,<sup>25</sup> C. C. Worley,<sup>7</sup> S. Zaggia,<sup>9</sup>

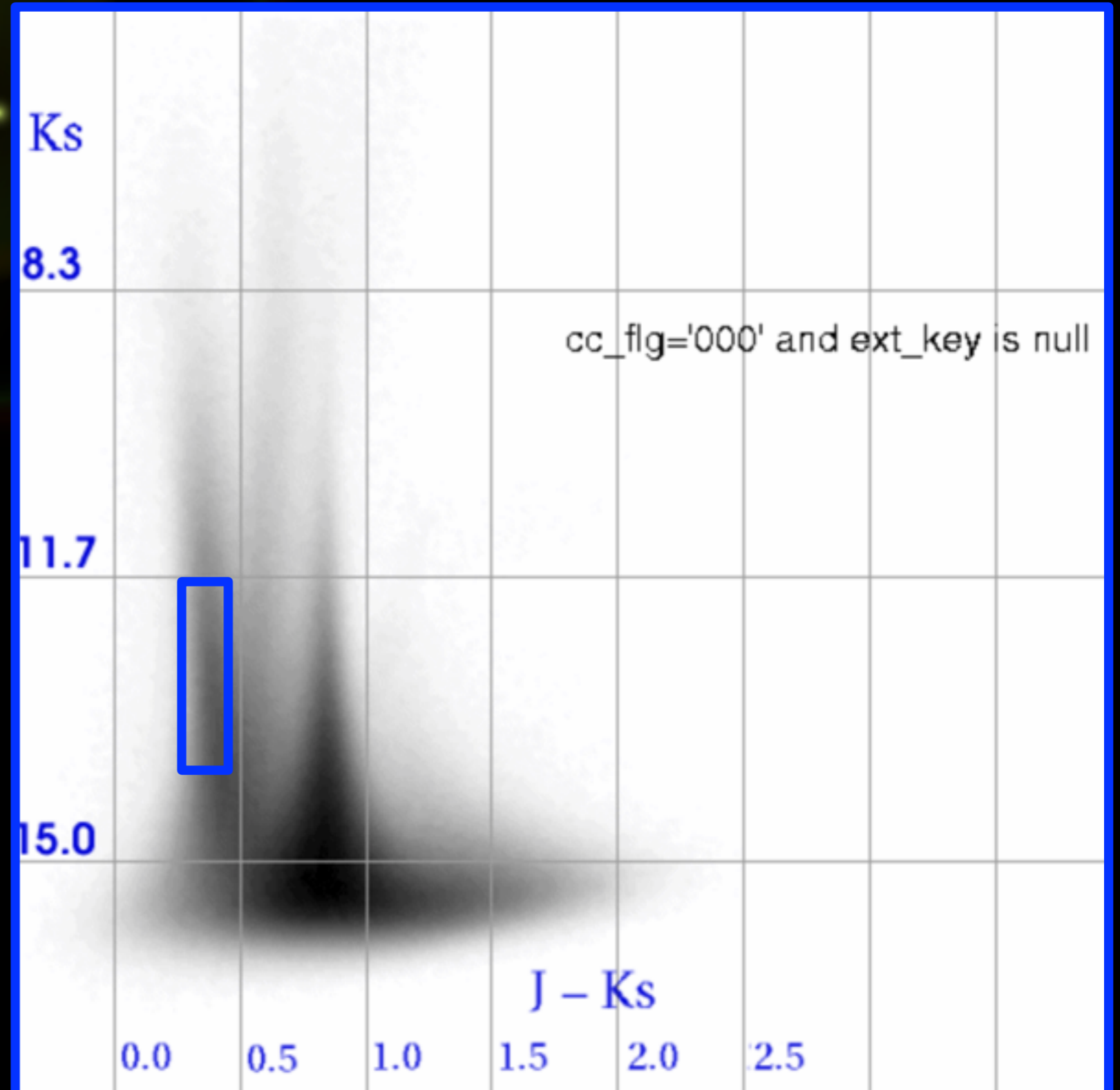
*Affiliations are listed after the references.*

21 June 2017

# Test #2: The Gaia-ESO Survey

Thompson, Bergemann, Few, Gibson, et al. (2017)

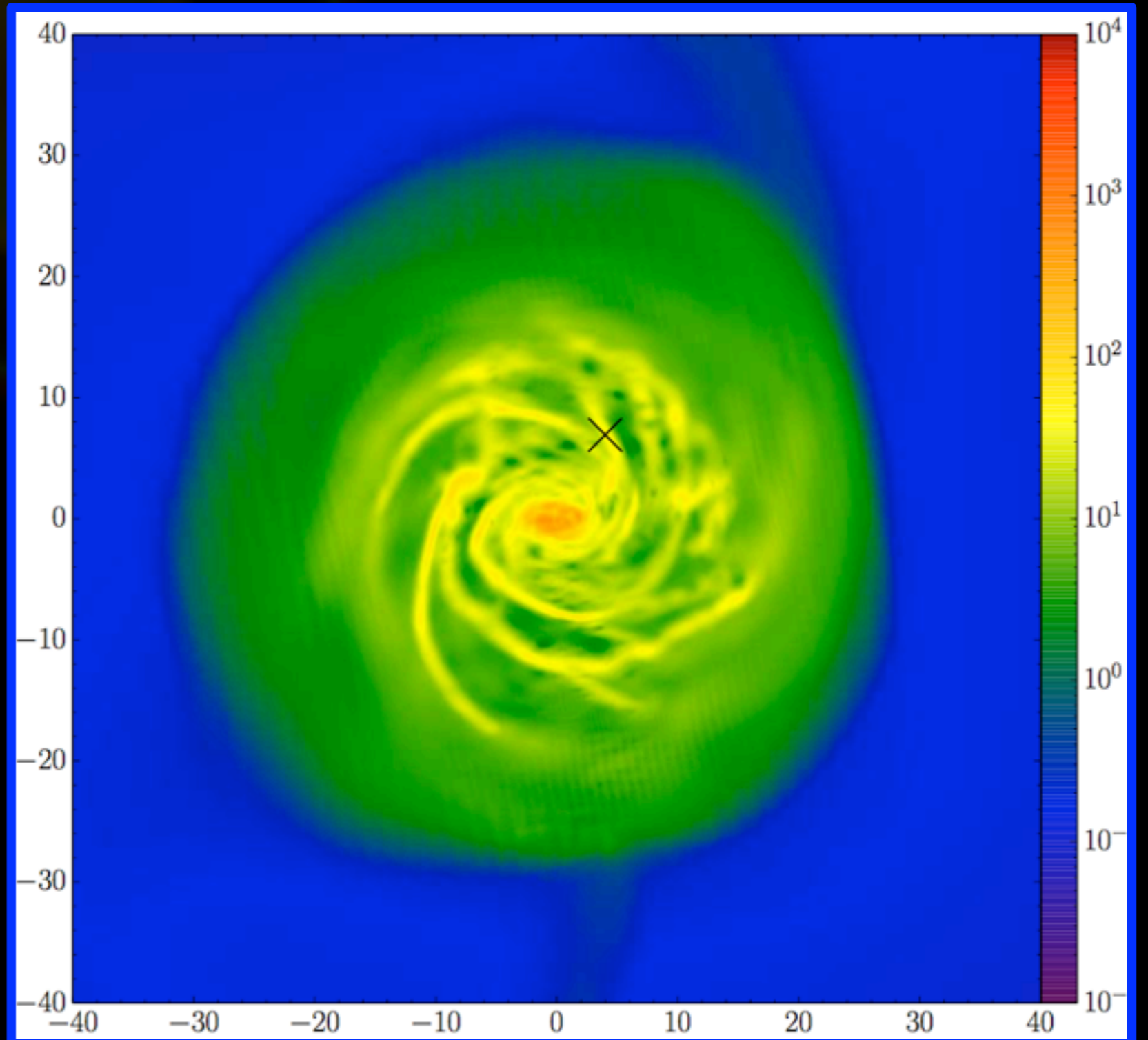
- repeat analysis with a less extreme case
- basic procedure the same, but now employ the Gaia-ESO Survey selection function:
  - $12 < J < 14$
  - $0.23 < J-K < 0.45$
  - $3.5 < \log(g) < 4.5$
- c.f. Gaia-ESO Survey DR4



# Test #2: The Gaia-ESO Survey

Thompson, Bergemann, Few, Gibson, et al. (2017)

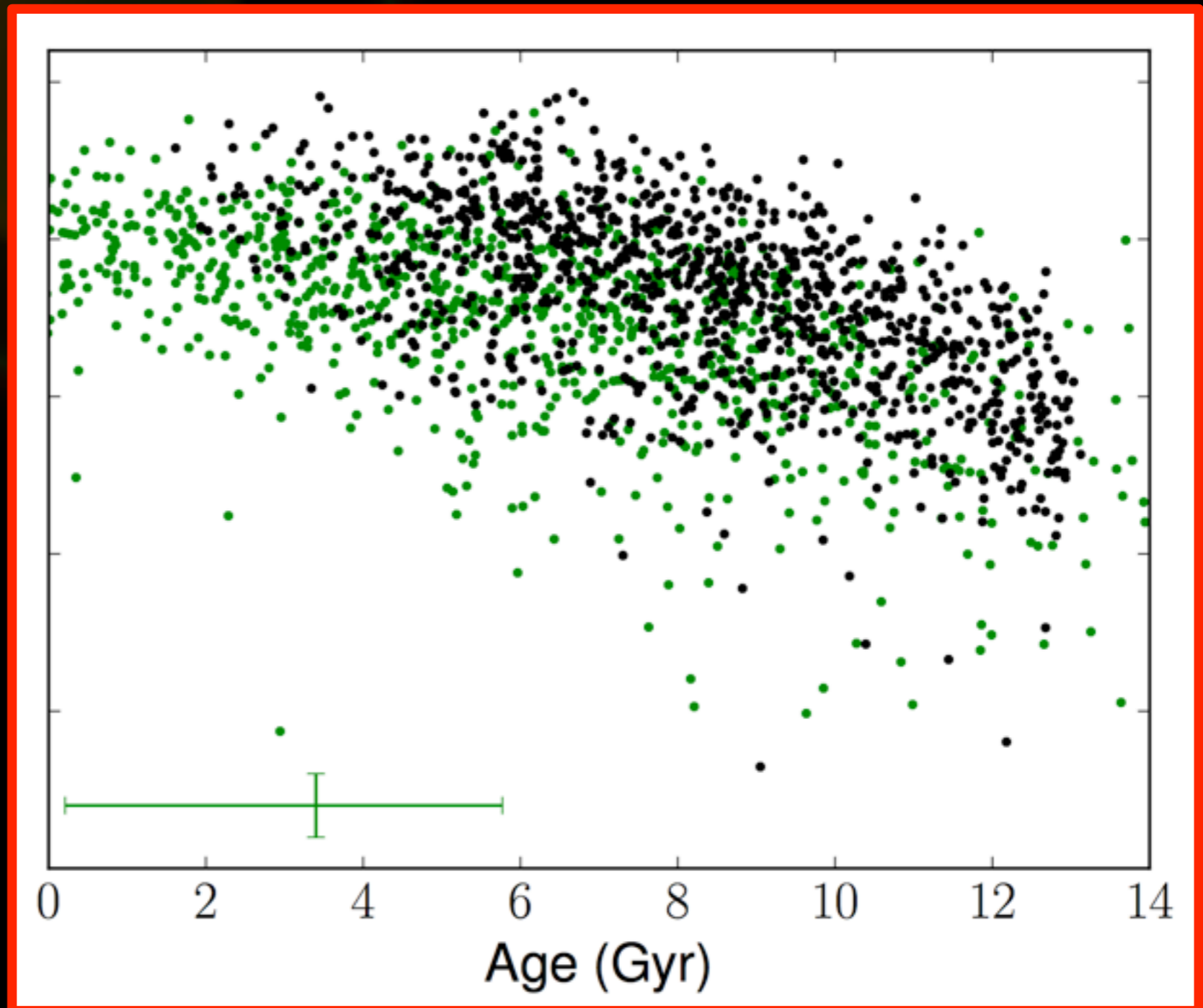
- employ Selene-CH disk, realised with RAMSES-CH (Few et al 2012,14)



# Test #2: The Gaia-ESO Survey (A Work in Progress)

Thompson, Bergemann, Few, Gibson, et al. (2017)

- excellent agreement with Milky Way age-metallicity relation and MDF

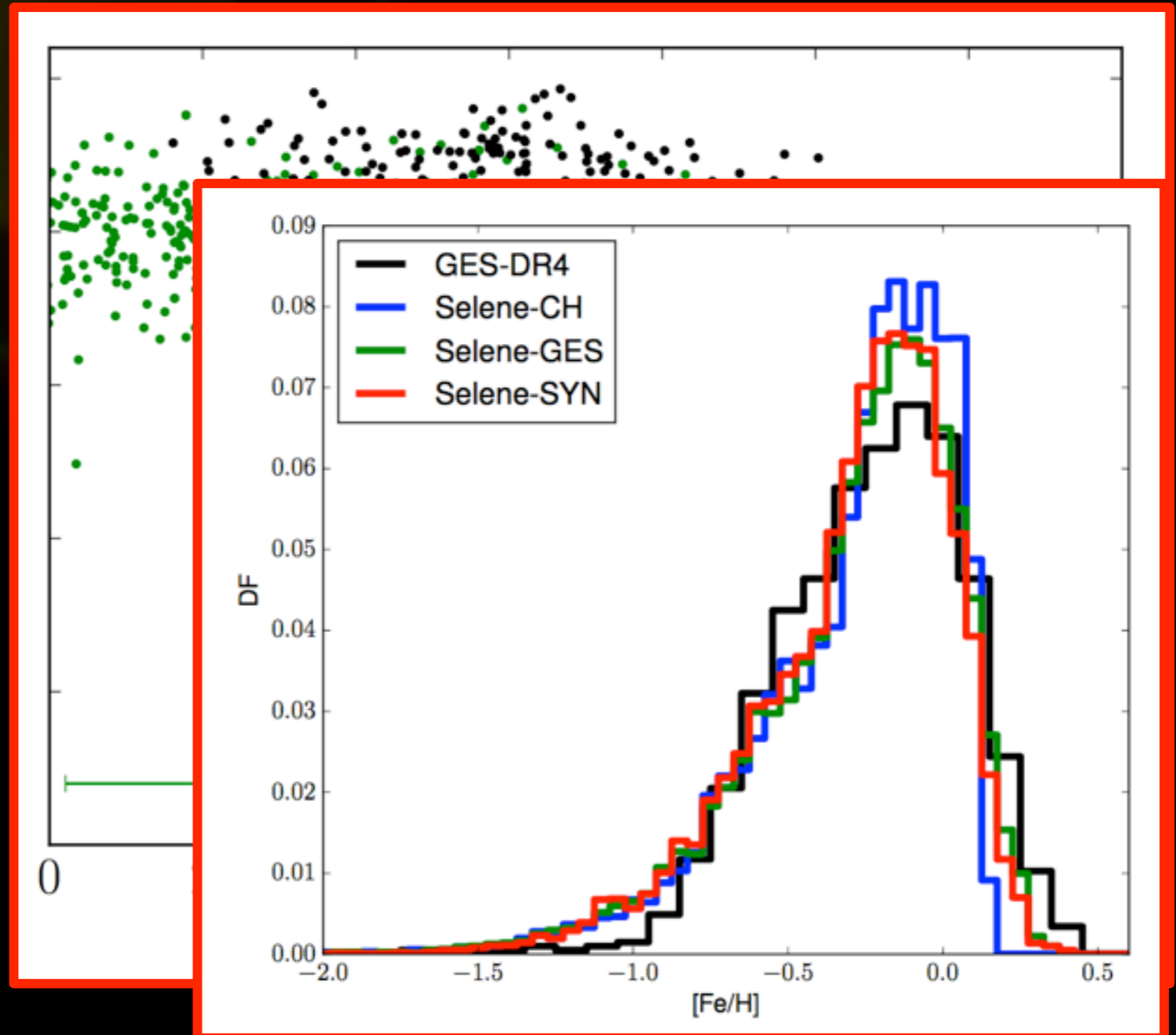




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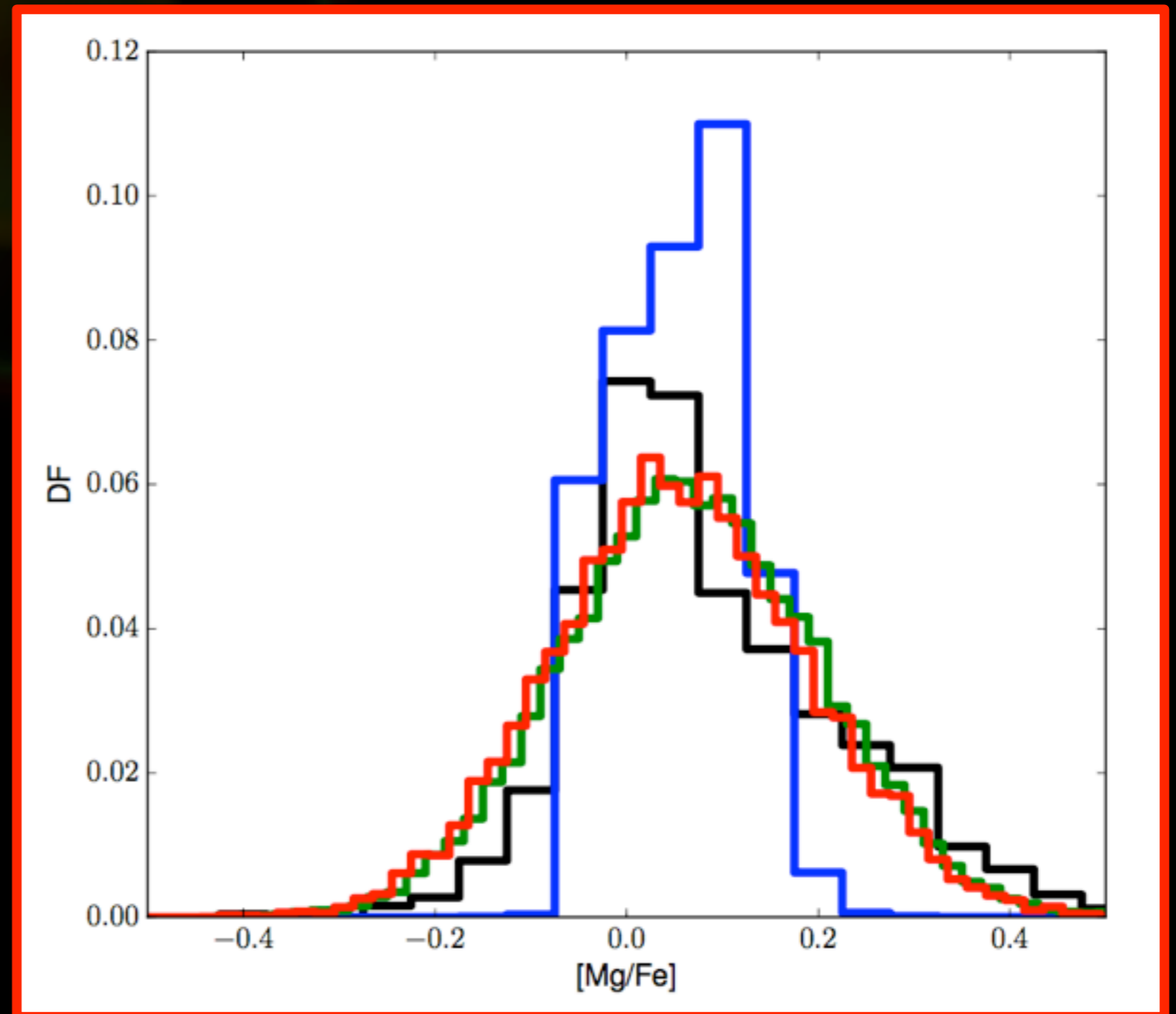
- excellent agreement with Milky Way age-metallicity relation and MDF



# Test #2: The Gaia-ESO Survey (A Work in Progress)

Thompson, Bergemann, Few, Gibson, et al. (2017)

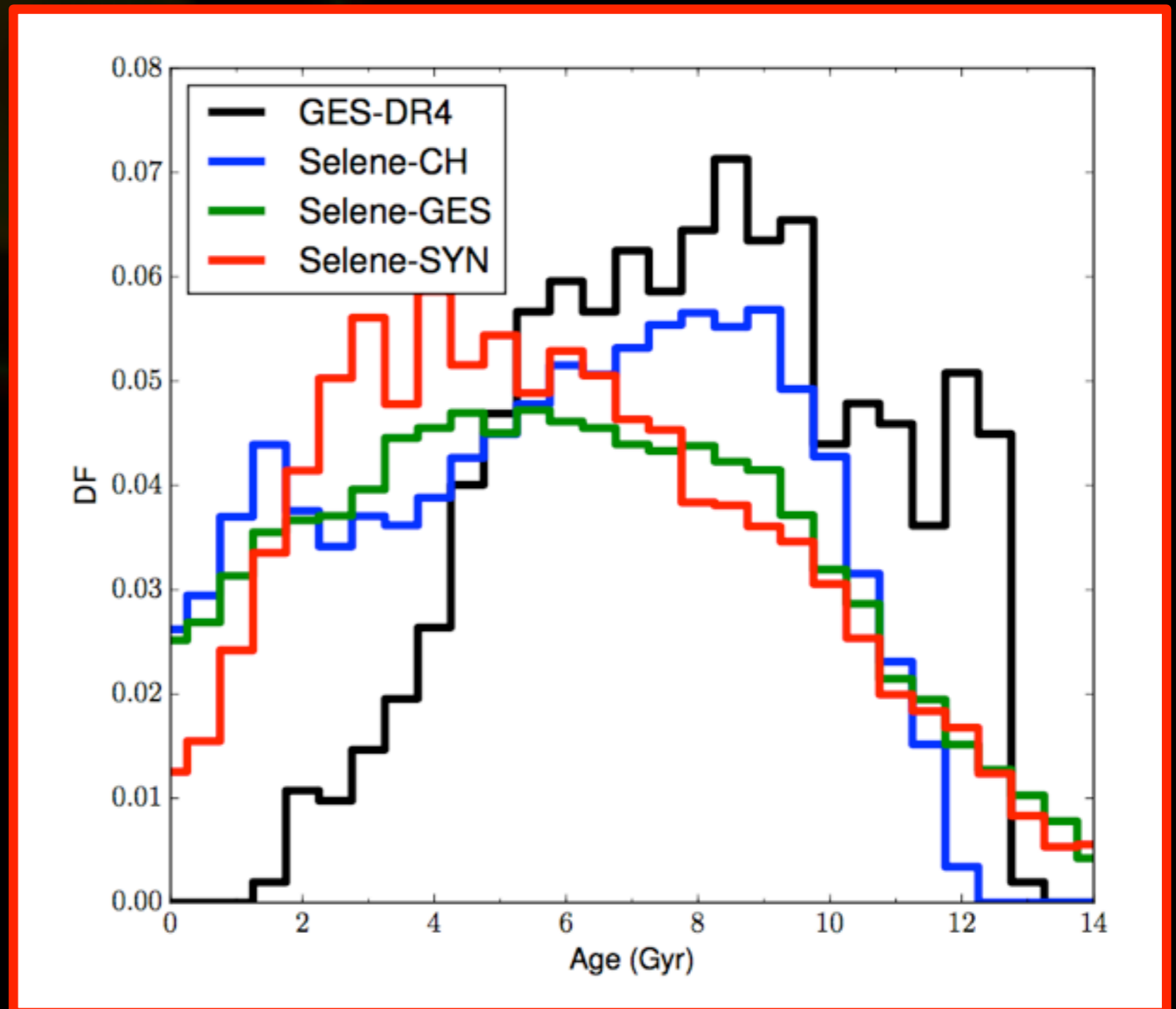
- conventional analysis approach (blue) results in overly narrow  $\alpha$ -element distribution...
- SynCMD approach (red) better match to observed dispersion (black)
- main point? 'doing it properly changes things substantively'



# Test #2: The Gaia-ESO Survey (A Work in Progress)

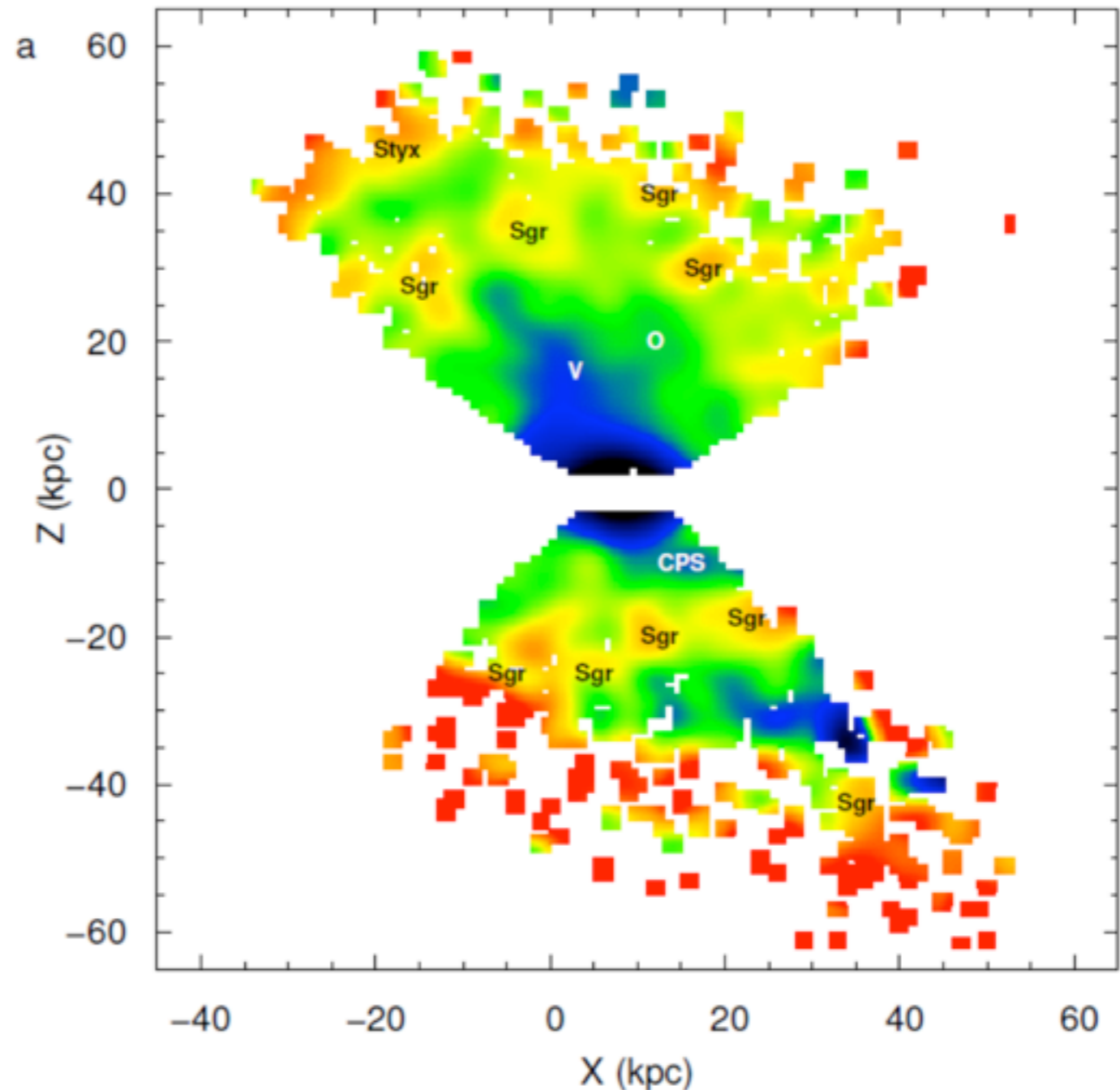
Thompson, Bergemann, Few, Gibson, et al. (2017)

- conventional analysis approach (blue) results in modal age roughly 4 yrs older than estimated from SynCMD approach (red)
- main point? 'doing it properly changes things substantively'



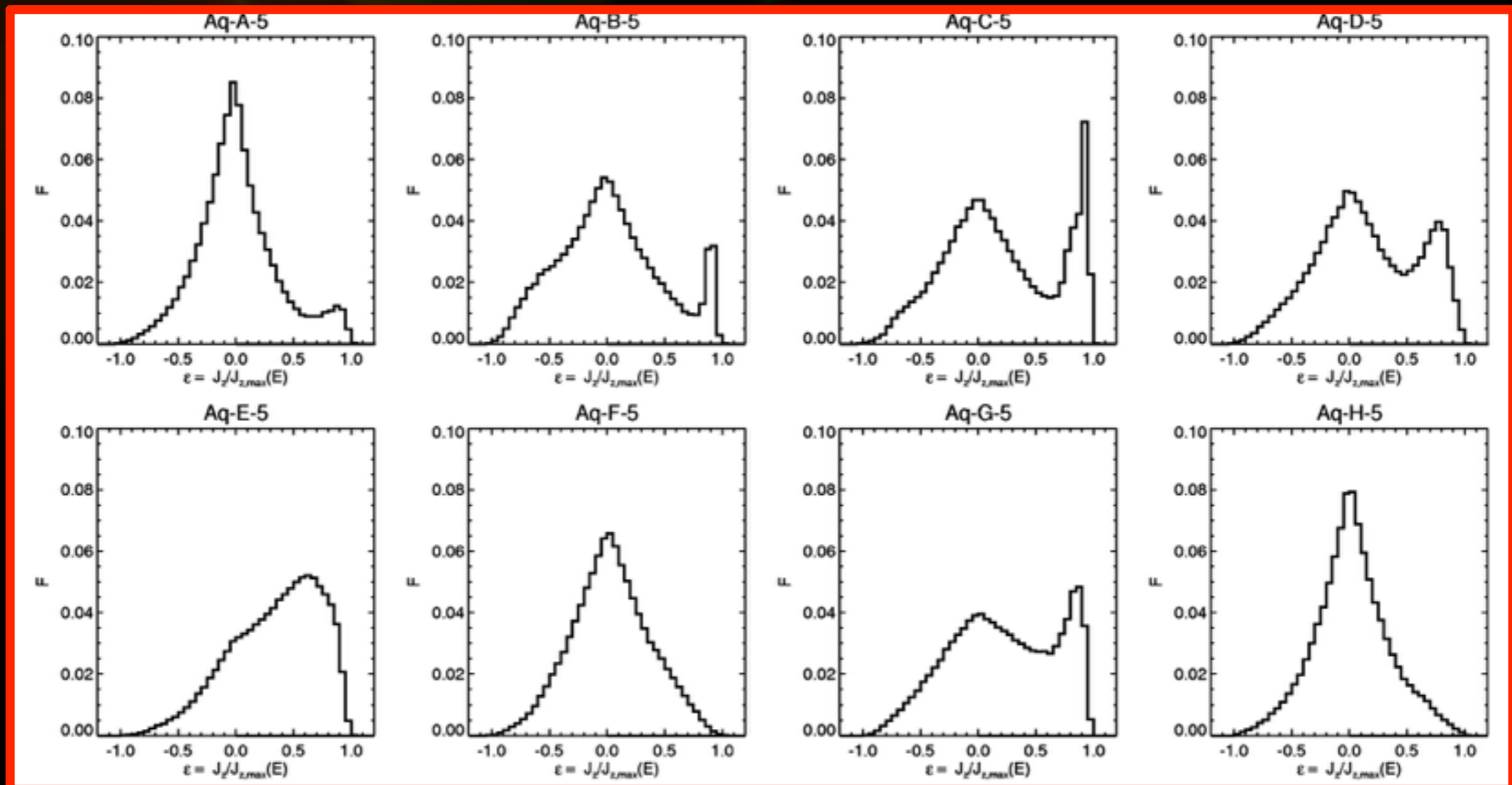
# Proceed with caution...

- could become critical when exploring subtle (e.g.) age trends
- **Carollo et al (2016)** claim outer halo about 1.5 Gyr younger than inner halo, and suggest consistency with **Tissera et al (2012)** simulations (next slide)

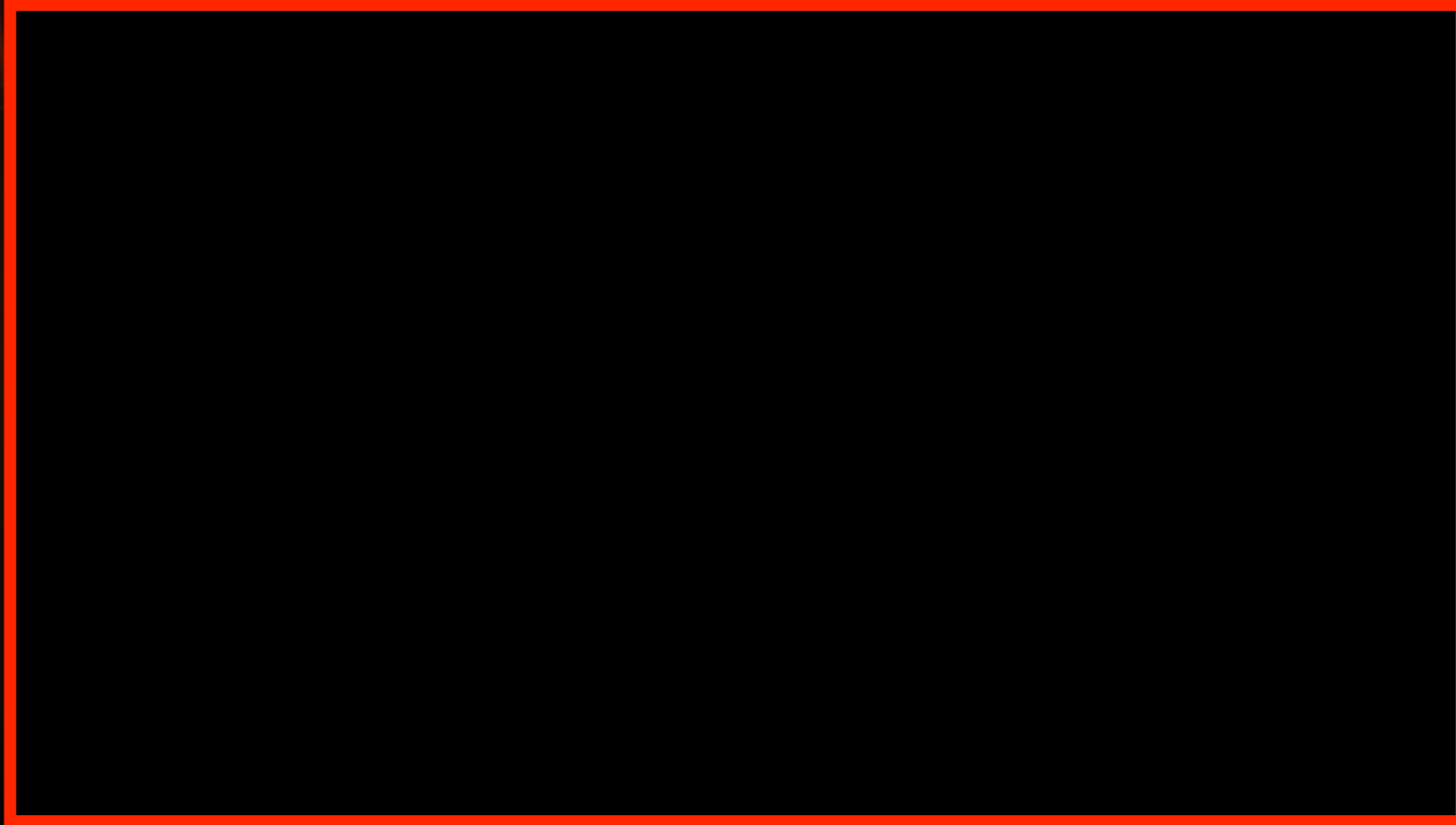


# Proceed with caution...

- need to understand and model the empirical selection function, and remember that many simulations in the literature have kinematic spheroid-to-disk ratios  $>10\times$  that of the Milky Way



# Coda Re: How One 'Observes' a Simulation...



# Coda Re: How One 'Observes' a Simulation...

- viewing the Milky Way from the inside, demands multi-dimensional sub-clustering algorithms to search for groupings in 20+ dimensions of “chemistry-space”
- it also demands access to unprecedented experimental data against which to deploy clustering algorithms - 4MOST, WEAVE, GALAH, etc



# Coda Re: How One 'Observes' a Simulation...

## Galactic Archaeology and Minimum Spanning Trees

Ben A. MacFarlane,<sup>1</sup> Brad K. Gibson,<sup>2</sup> and Chris M. L. Flynn<sup>3</sup>

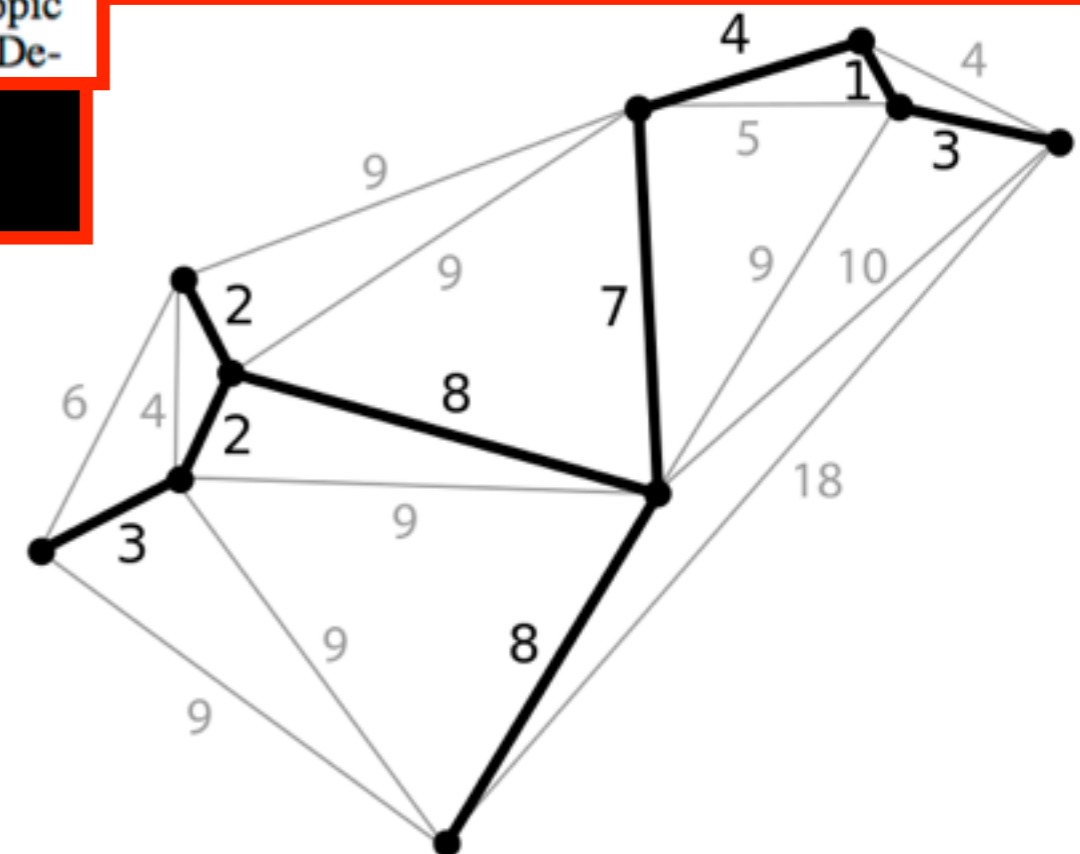
<sup>1</sup>*Jeremiah Horrocks Institute, University of Central Lancashire, Preston, UK*

<sup>2</sup>*E. A. Milne Centre for Astrophysics, University of Hull, Hull, UK*

<sup>3</sup>*Centre for Astrophysics & Supercomputing, Swinburne University, Australia*

**Abstract.** Chemical tagging of stellar debris from disrupted open clusters and associations underpins the science cases for next-generation multi-object spectroscopic surveys. As part of the Galactic Archaeology project TraCD (Tracking Cluster De-

- e.g., minimum spanning trees, k-means algorithm, hierarchical clustering, etc
- underpins genome, financial forecasting, bioinformatics, aspects of linguistics, etc.



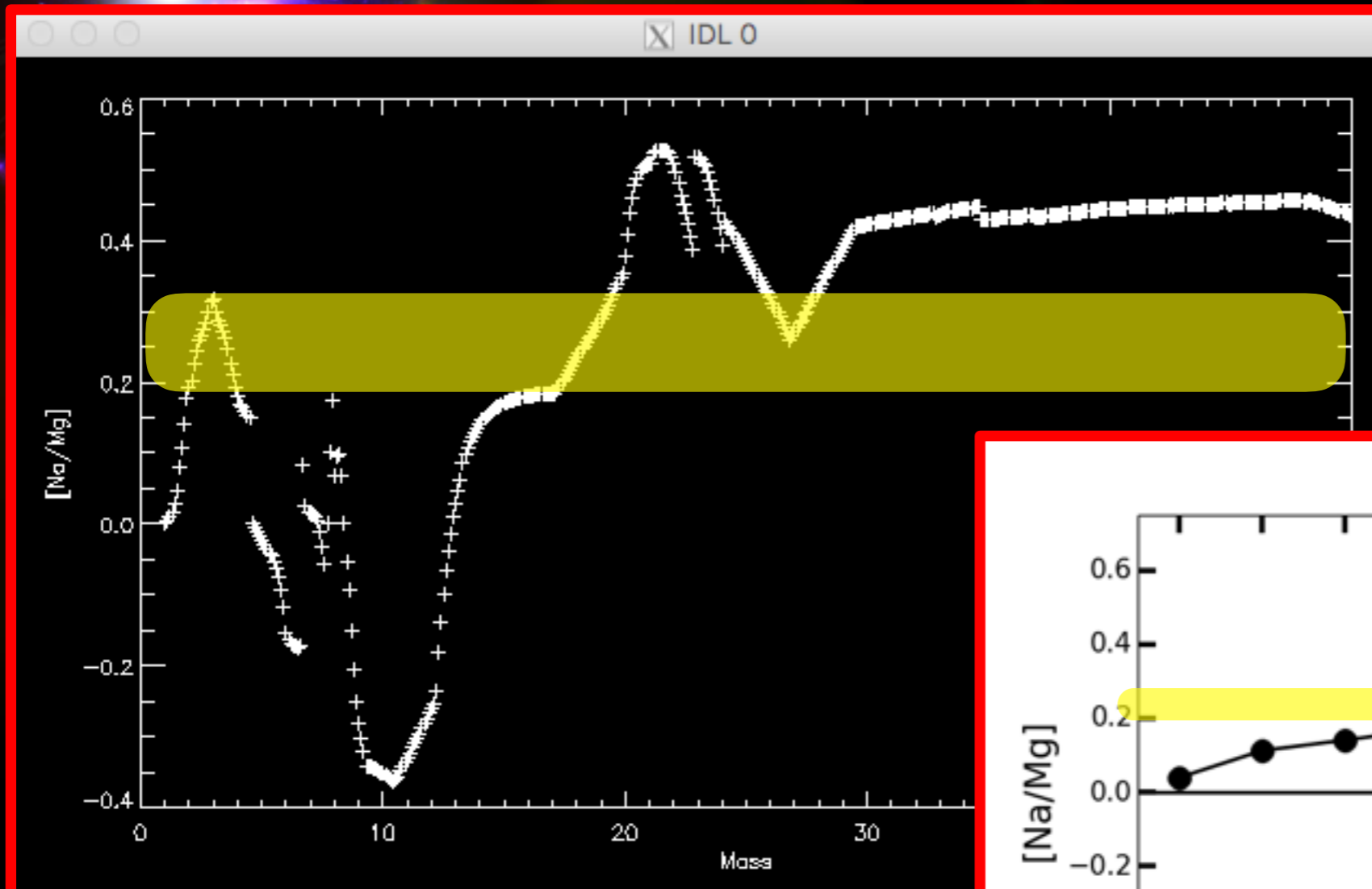


# Outline / Shopping List

- **Stellar Distributions**
  - ✦ Abundance Gradients
  - ✦ Surface Brightness Profiles
  - ✦ Age Gradients
  - ✦ Metallicity Distribution Functions
  - ✦ Abundance Ratios
  - ✦ Age-Metallicity- $\sigma$  Relations
  - ✦ Azimuthal Surface Brightness Trends
- **Additional Hidden Gremlins**
  - ✦ Diffusion
  - ✦ Timestep Limiters
  - ✦ Star Formation Prescription
  - ✦ Missing Feedback
  - ✦ Supernova Feedback Abuse
  - ✦ Composite vs Individual Stellar Particles
- **Gas Distributions**
  - ✦ Surface Density Profiles
  - ✦ Velocity Dispersion Profiles
  - ✦ Velocity Dispersion with Redshift
  - ✦ Superbubble Size Distribution
  - ✦ Structural Power
  - ✦ Galactic Winds & The CGM
  - ✦ How Does Gas Get Into Galaxies?
  - ✦  $V_{rot}$  vs Scaleheight
  - ✦ Radial Gas Flows
  - ✦ GMC Rotation Statistics

# Grand Challenge: Stellar Yields

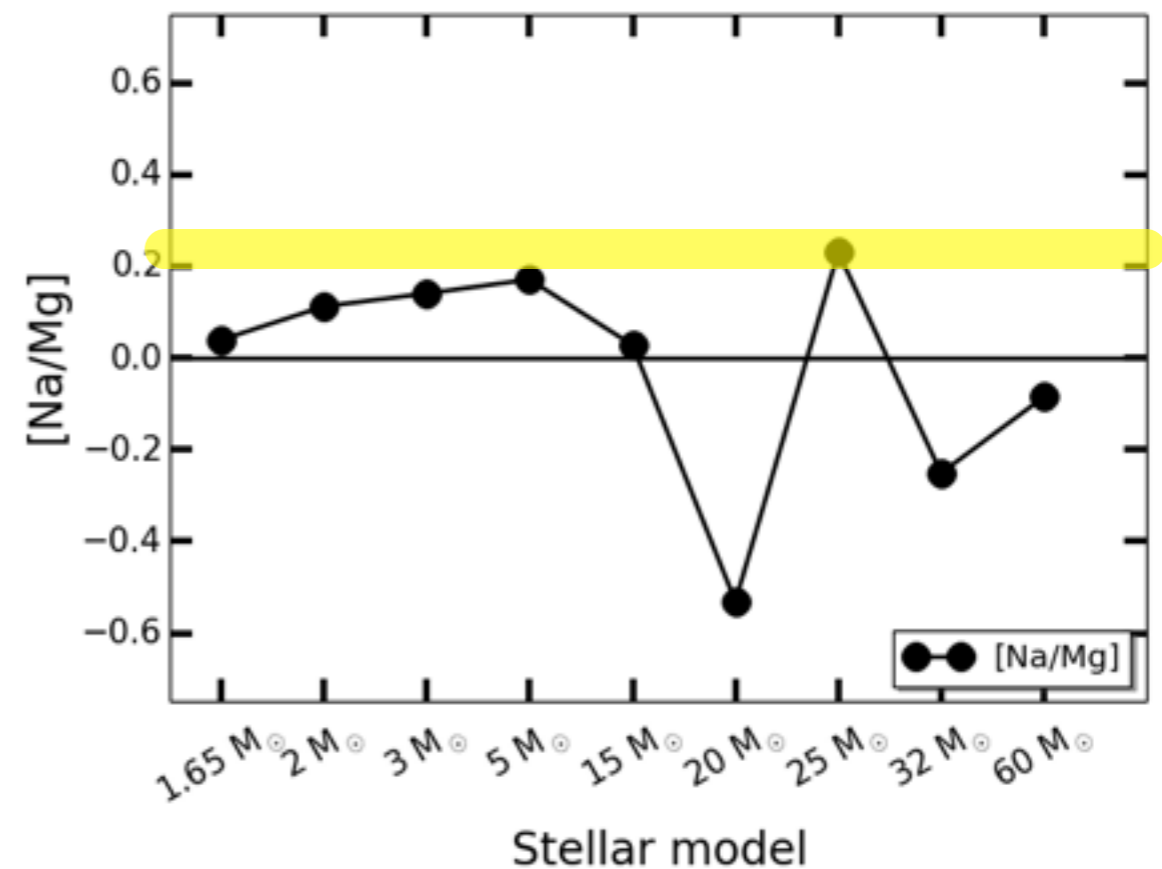
NuGrid (Pignatari et al) is changing the landscape but we are not there yet...



Karakas (2010) +  
Chieffi & Limongi (2004)

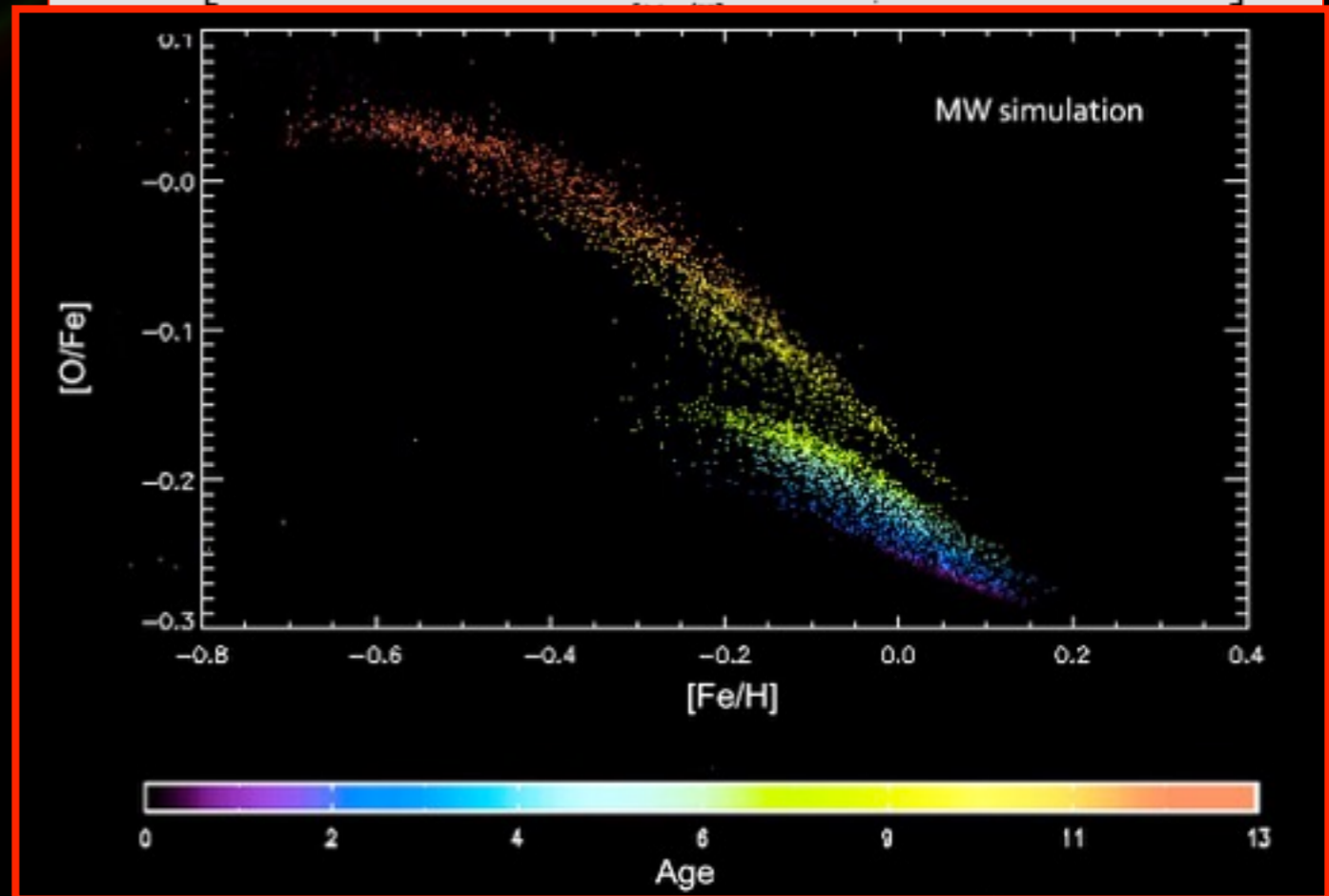
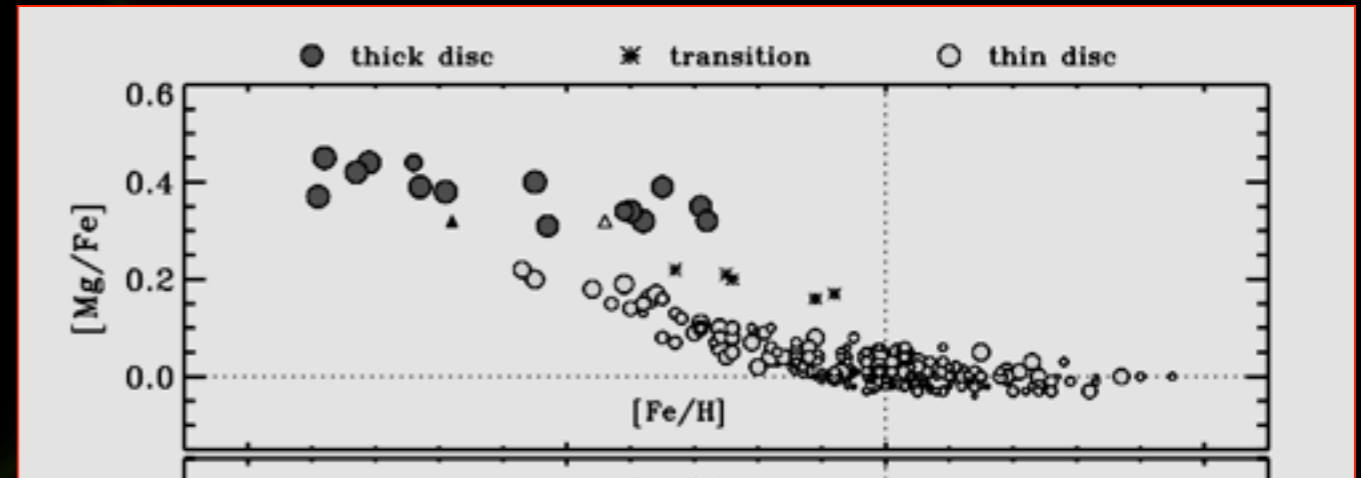
Pignatari et al (2016)

- example of mysteries?  
**M87: [Na/Mg] ~ +0.25**  
(Spiniello et al 2006)
- should we worry about predictive power?



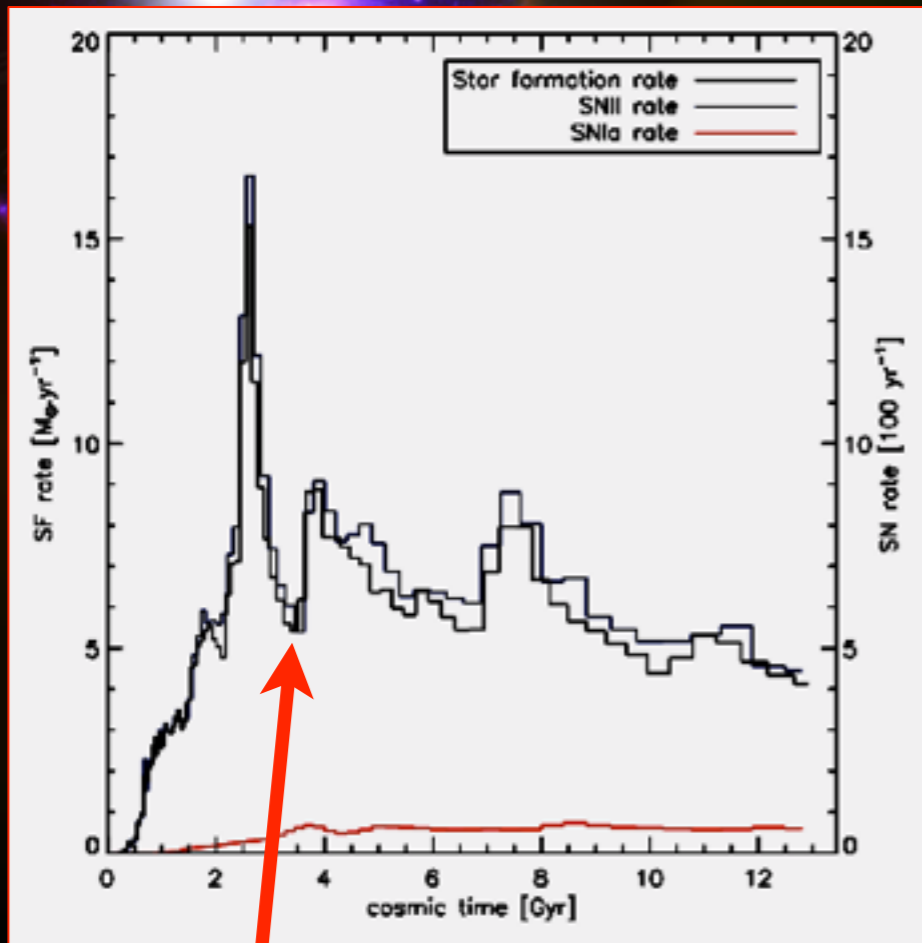
# Grand Challenge: Can you get the local chemistry correct?

Brook, Stinson, Gibson et al (2012); Few, Courty, Gibson et al (2014)

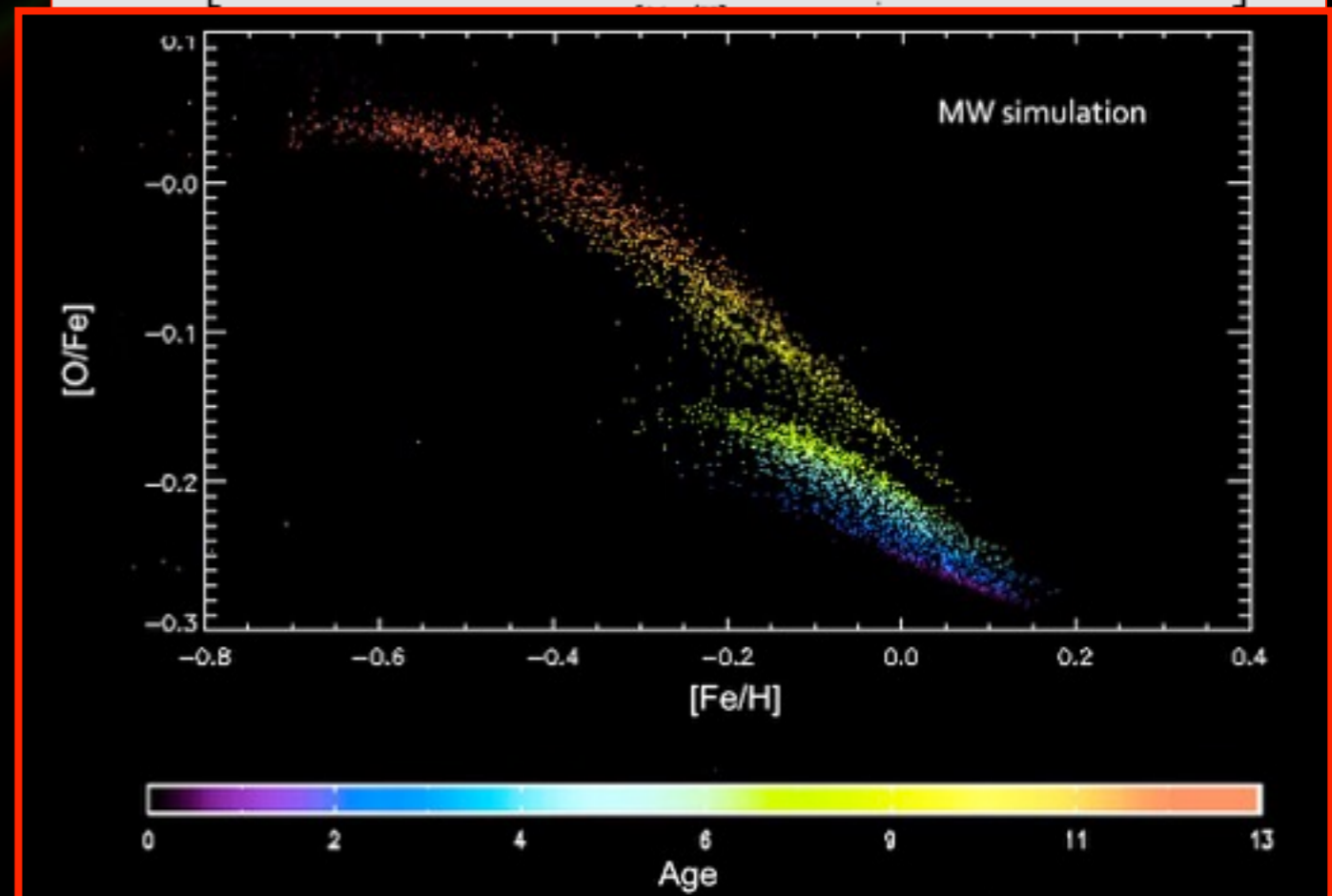
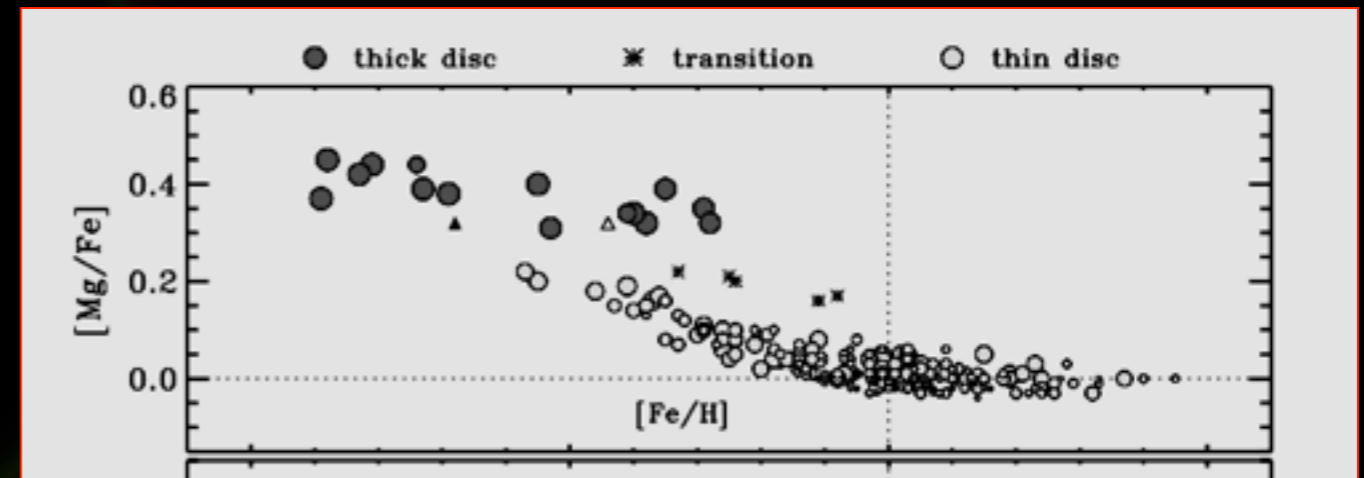


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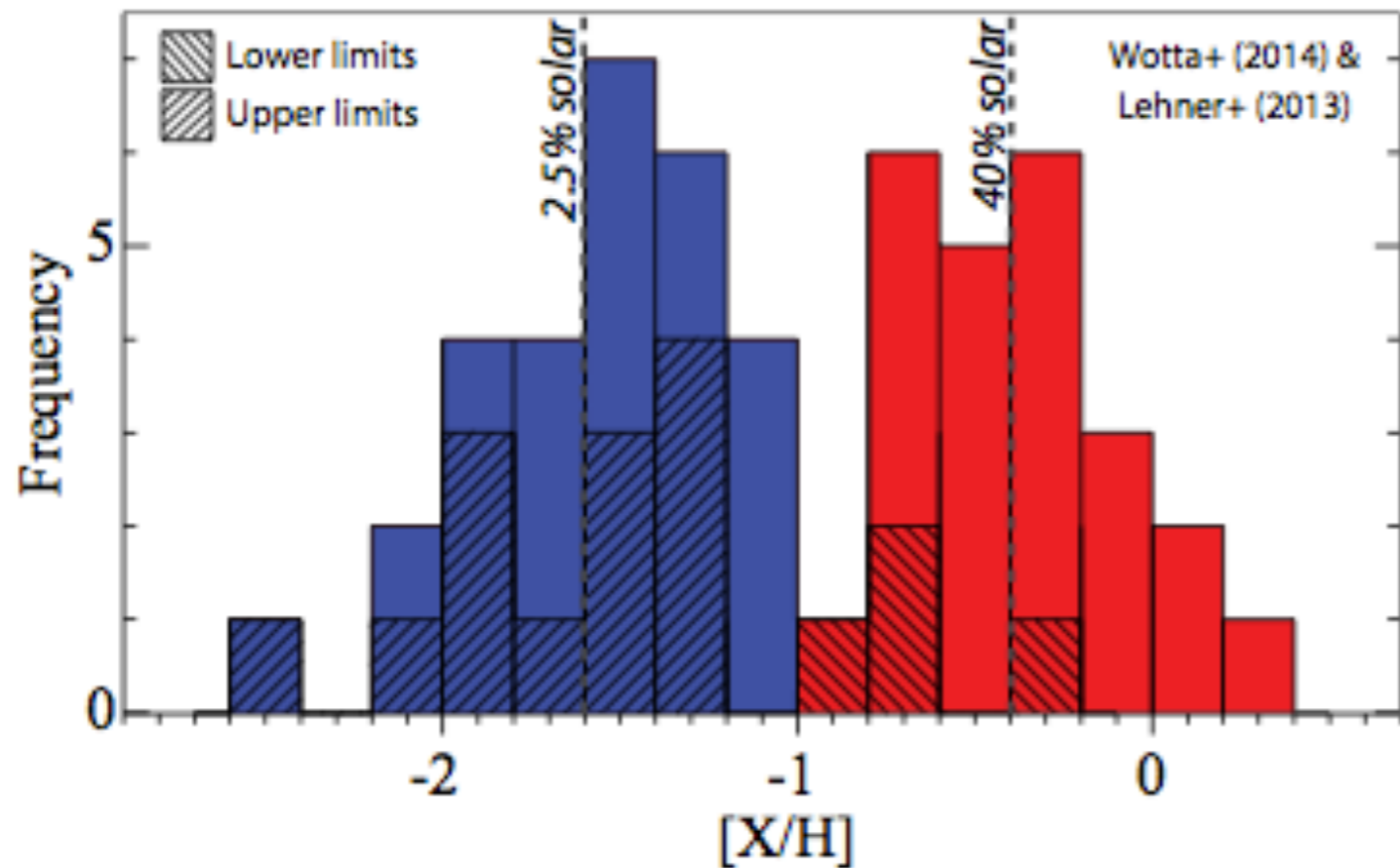
Brook, Stinson, Gibson et al (2012); Few, Courty, Gibson et al (2014)



- 'dip' in the SFH  $\sim 10$  Gyr ago, results in  $\sim 20\%$  offset in  $[\text{Mg}/\text{Fe}]$
- not a 1-to-1 match to the Milky Way, but the physics behind the chemical 'discontinuity' is the same



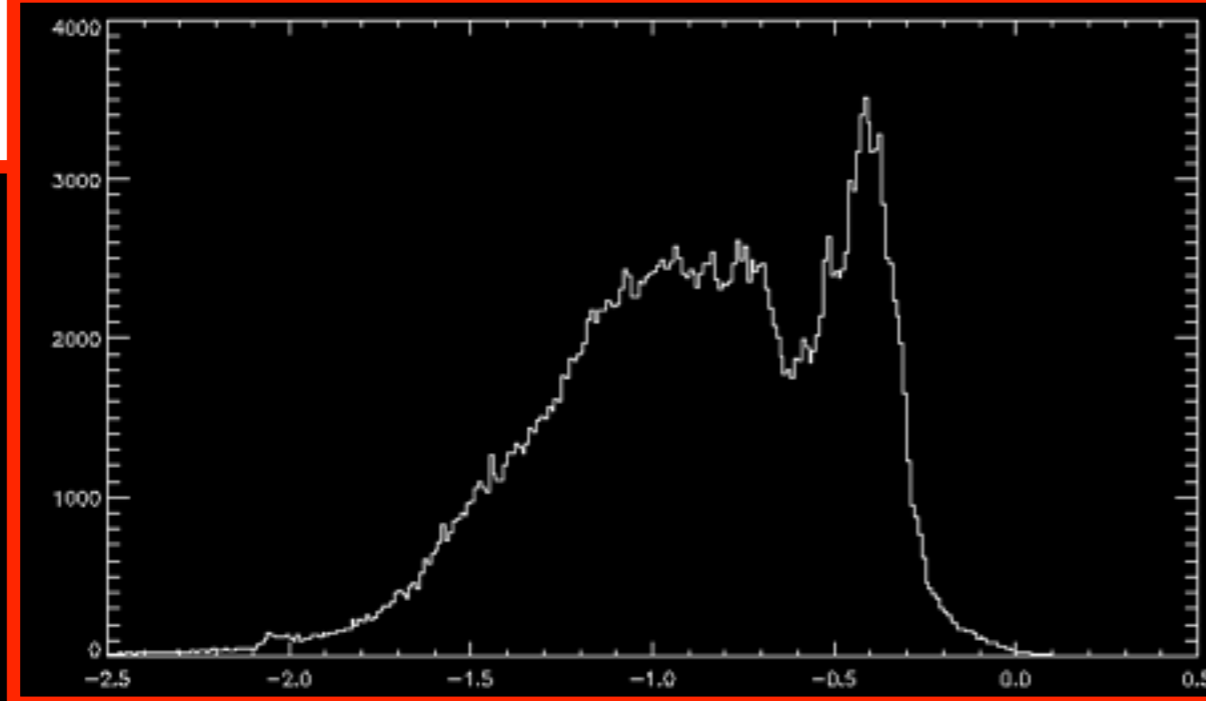
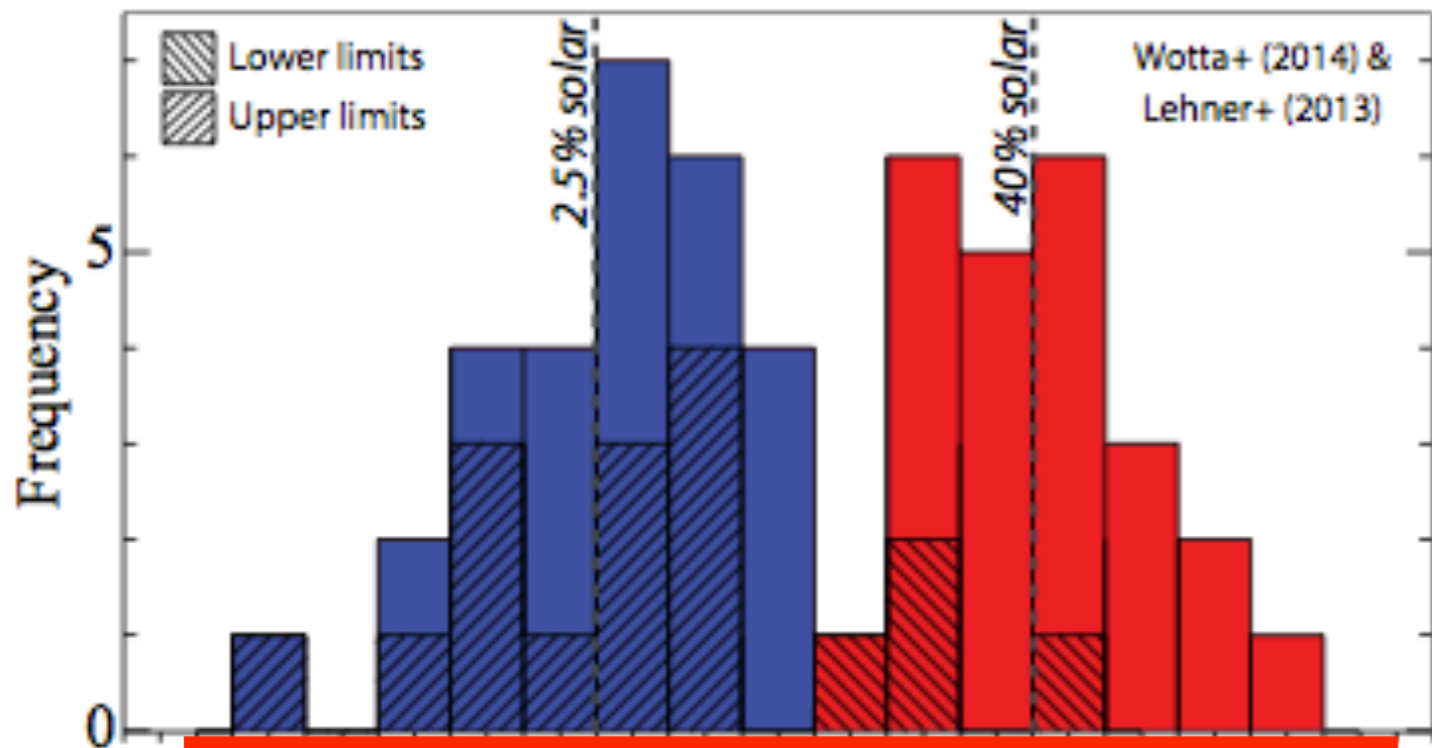
# Grand Challenge: Outflows, Infall, and Condensation All Contribute to Galactic Fuel... Is your CGM as nice as your galaxy?



- coronal gas in external systems appears bimodal in metallicity (Lehner+ 2013; Wotta+ 2016: LLS @ 25-150 kpc impact parm)
- one of our MaGICC disks...
- metal-rich peak clearly associated with lower-halo fountains (none beyond 30kpc though)
- metal-poor peak too metal-rich... mixing too efficient?

# Grand Challenge: Outflows, Infall, and Condensation All Contribute to Galactic Fuel...

## Is your CGM as nice as your galaxy?



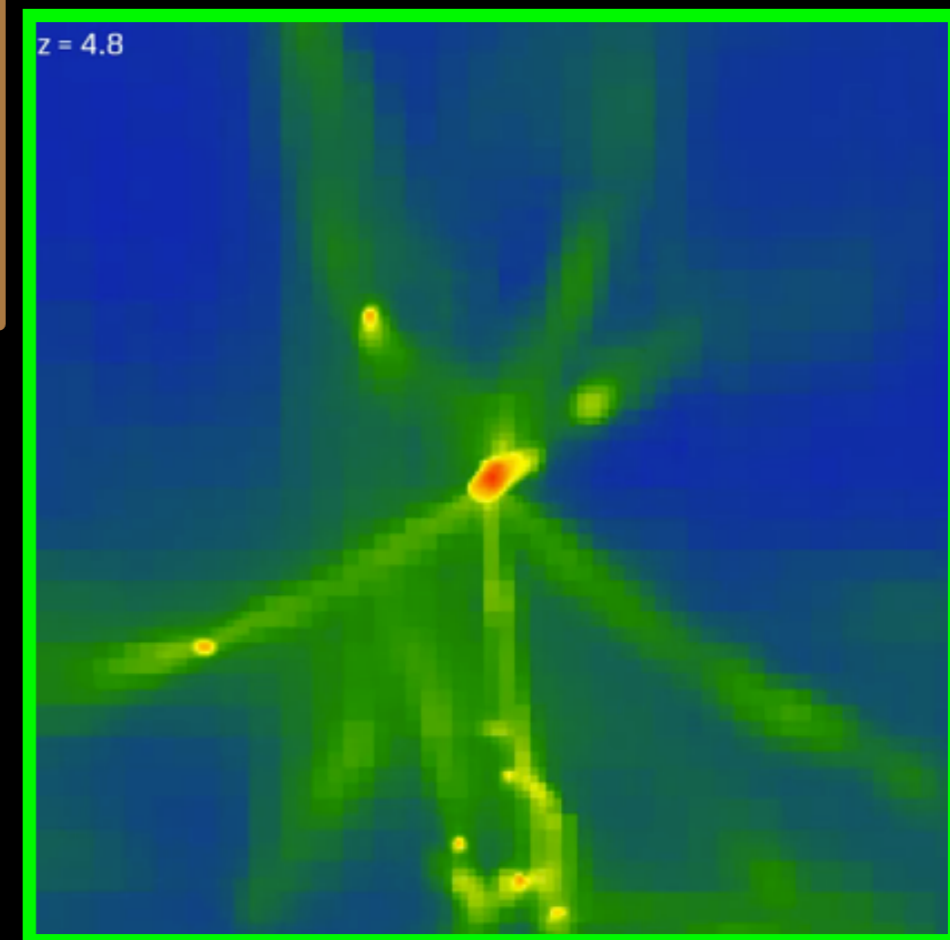
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# Where “We” Are Headed in 2017-2020?...

## Horizon Run 5: KIAS & Hull (w/RAMSES-CH)

### Gpc horizons + 100 pc grids = >100 Mcore-hrs

- Horizon Run 2 density slice



- for context, our simulation to the right would fit inside 1/100th of 1 pixel of HR

# Summary

How you “observe” your simulation can be as important as the sub-grid physics you employ to generate it.

Slight concern about the “predictive power” of GCE+yields in certain situations.

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