

# SED fitting of unresolved stellar populations

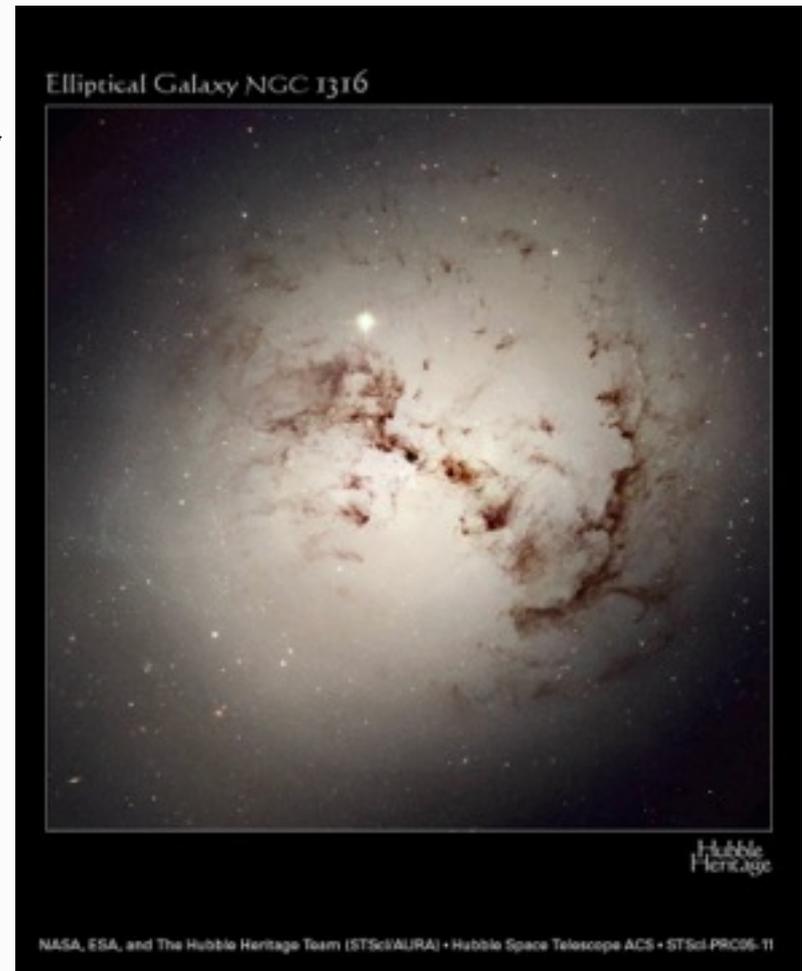
C. Jakob Walcher  
Leibniz Institut für Astrophysik Potsdam (AIP)



# Resolved stellar populations

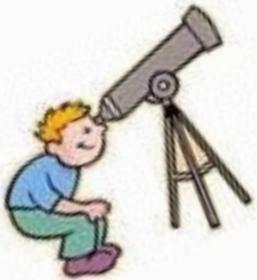


# UNresolved stellar populations



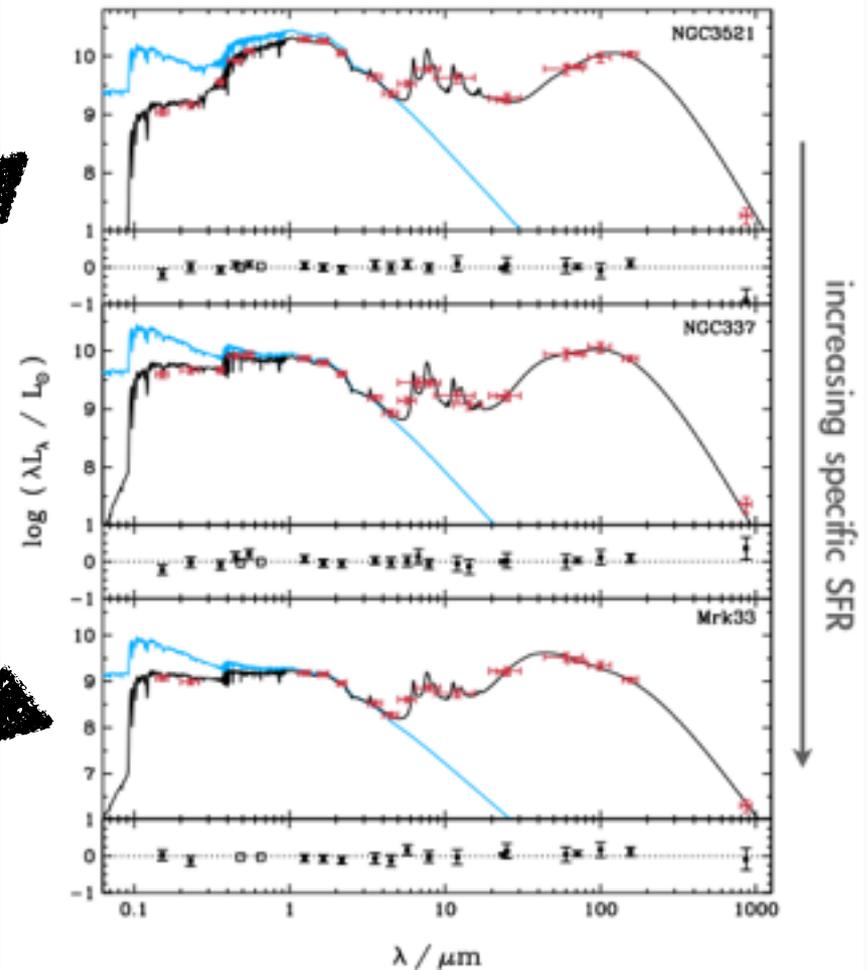
# UNresolved stellar populations

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# Spectral Energy Distributions

- Have to control:
  - sensitivity
  - spectral window
  - spatial window



da Cunha et al., 2008



# Purpose of the exercise

Determine physical properties of a large quantity of “stuff” from its integrated light.

“Stuff” means stars, gas, dust, and more

Walcher et al., 2011; Conroy et al., 2013

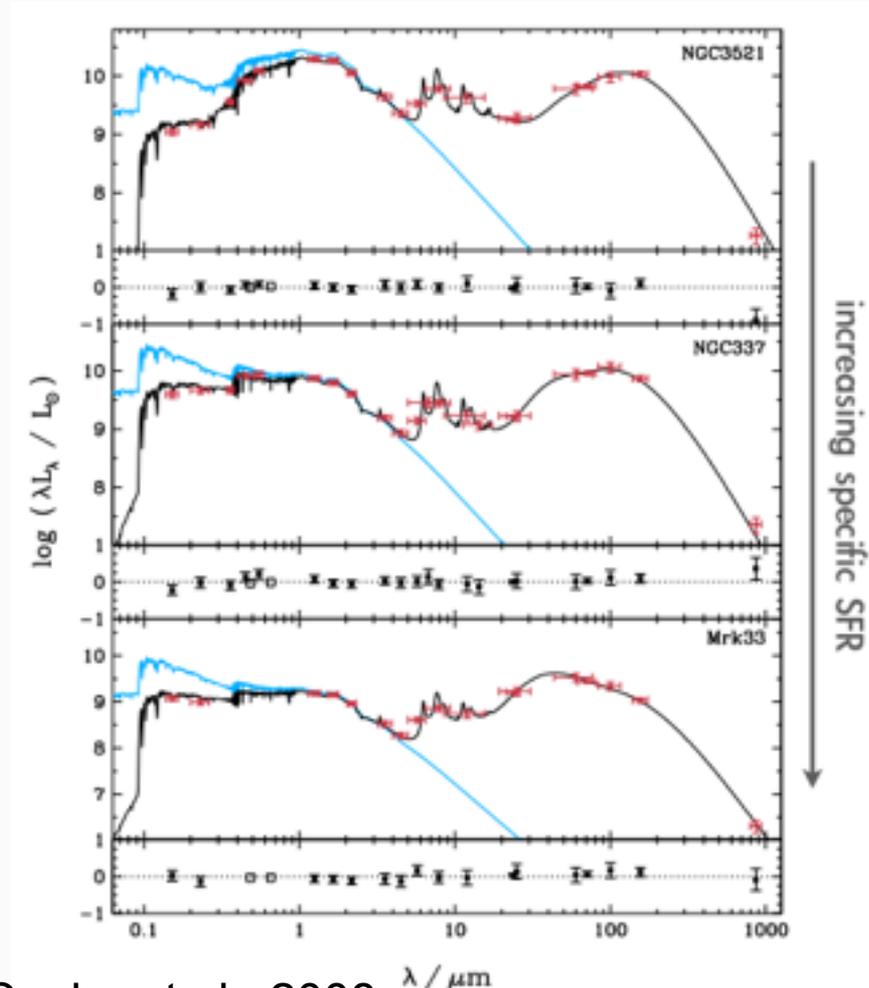


# Physical properties

- Physics 101: A physical property is described by
  - a number
  - a unit
  - an errorbar
- Only well-defined quantities can be measured.
- The “Star Formation History” is not a well-defined quantity.
- The “contribution of stars aged between  $1 \cdot 10^9$  and  $5 \cdot 10^9$  yrs to the total luminosity in the V-band” IS a well-defined quantity.

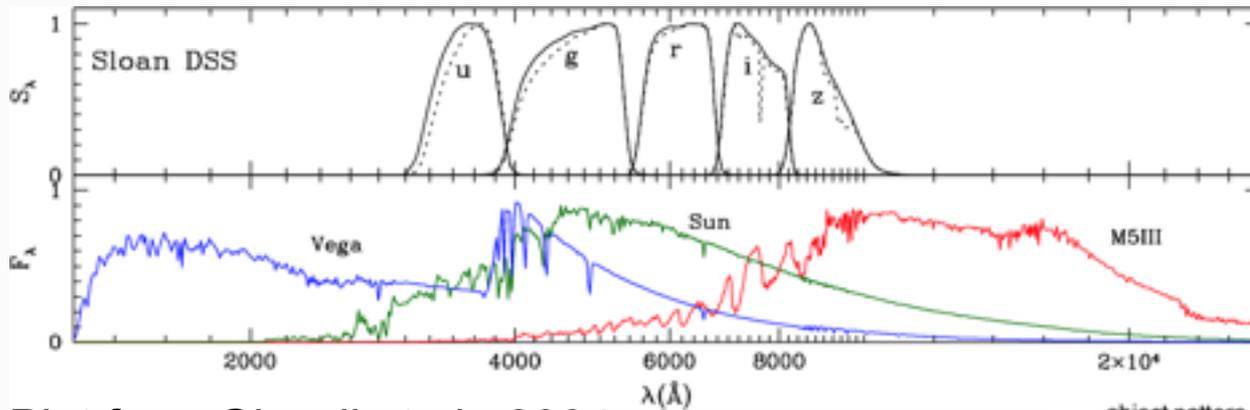
# SEDs: two regimes

- Photometric SEDs ( $R < 100$ ): typically very accurate flux calibration.
- Spectroscopic SEDs ( $R > 200$ ): visibility of lines in absorption and emission.



da Cunha et al., 2008

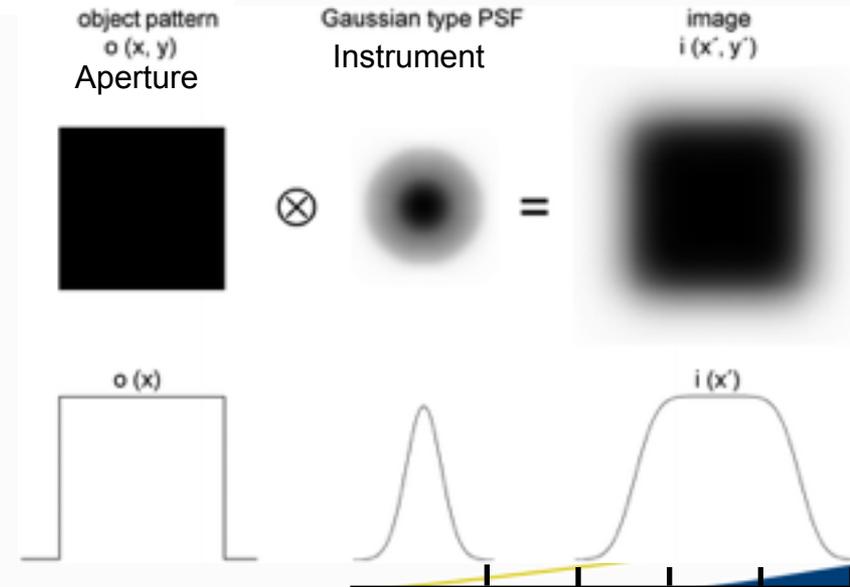
# Spectral Energy Distributions and the spectral response curves



Plot from Girardi et al., 2004

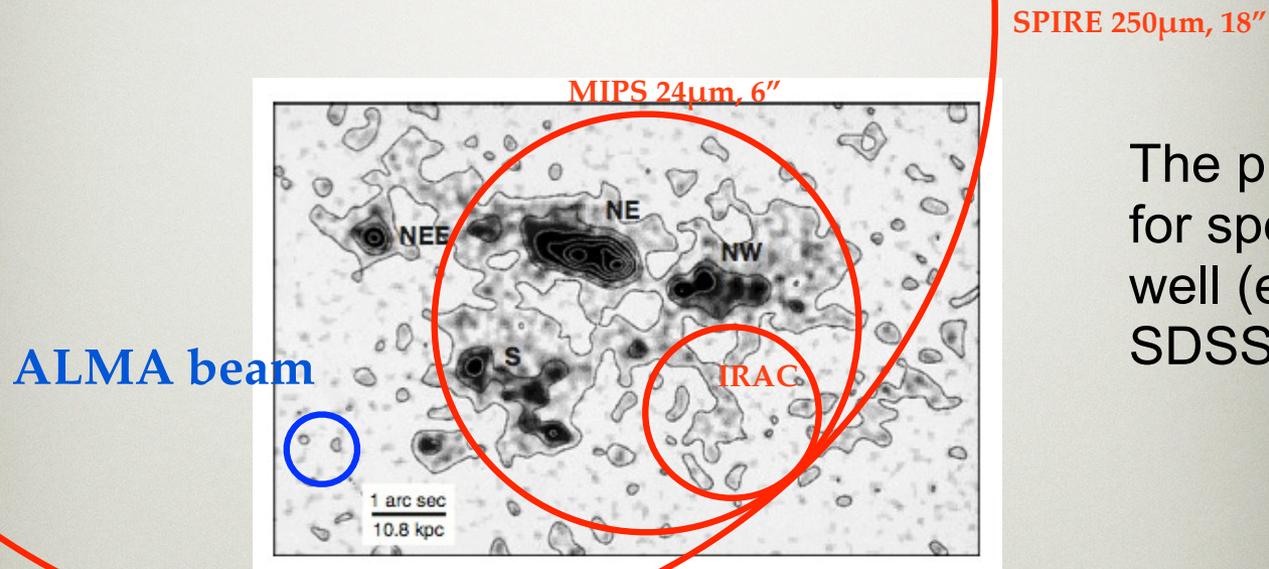
Sidenote: discrepancy between line spread functions may be reason why we never get the Balmer lines right in spectral fitting...

Generation of LSF  
Very sketchy example!



# Spectral Energy Distributions and the spatial window

## PB! RESOLUTION AT LONG WAVELENGTH



The problem exists for spectroscopy as well (e.g. DAR on SDSS spectra)

Slide stolen from Drouard's talk

Cycle 1/2 ALMA program at  $\sim 1''$  resolution (Gullberg et al., in prep)

# Fitting a photometric SED

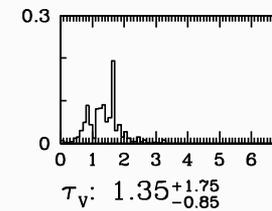
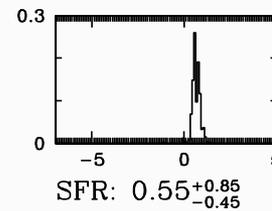
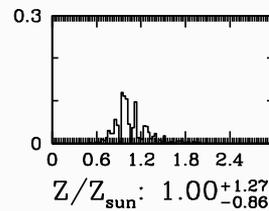
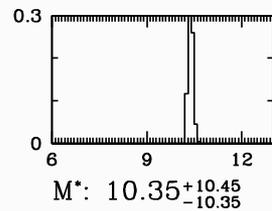
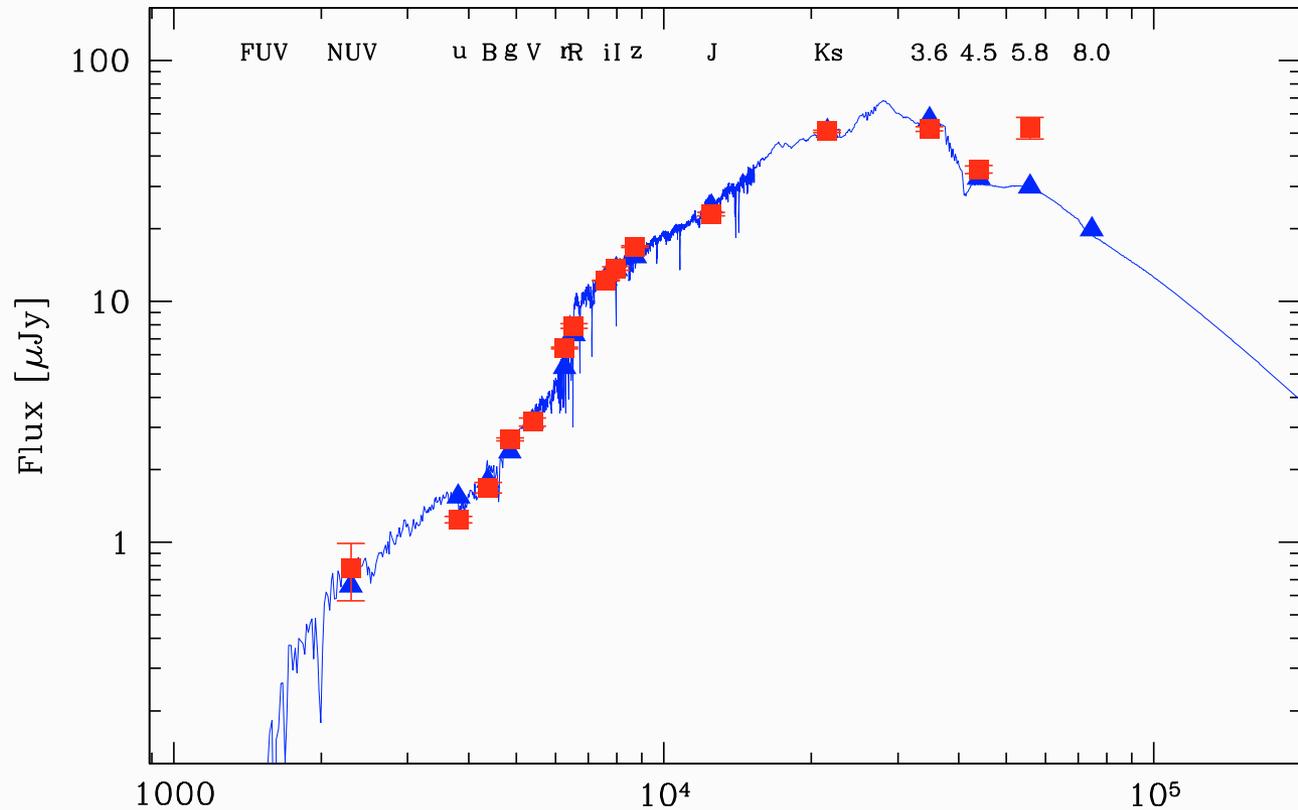
“Minimizing  $\chi^2$  is a maximum likelihood estimation of the fitted parameters if the measurement errors are independent and normally distributed.” Press+, Numerical Recipes

$\chi^2$  is a measure of probability:

$$P(D|M) \propto e^{-\chi^2/2}$$

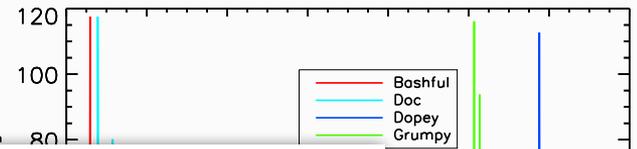
- One difference is in minimum  $\chi^2$  vs. “bayesian”
- Other difference is in the prior:  
SSP vs. pre-computed library vs. step-wise (MCMC)
- For codes check out <http://www.sedfitting.org>

# Example SED fit



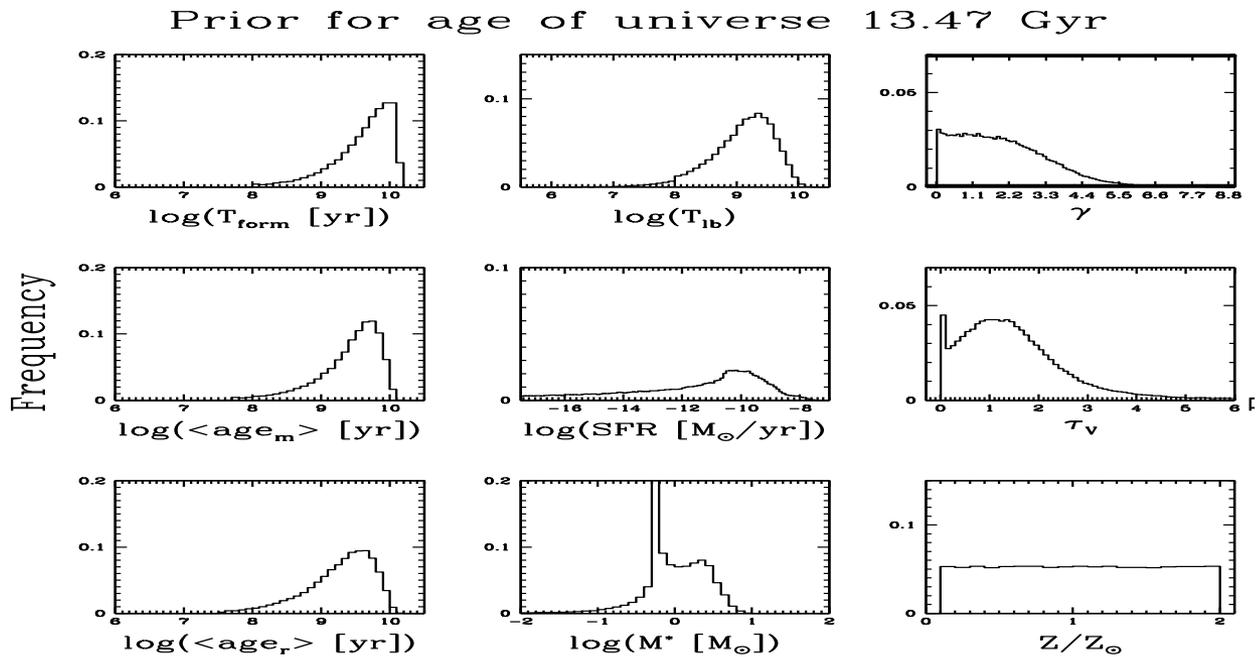
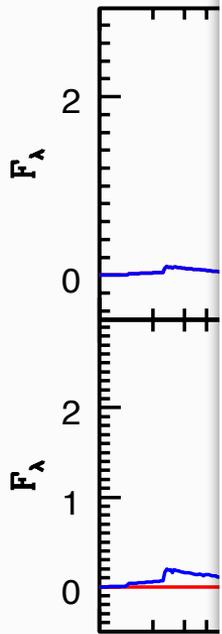
Walcher+08

# Constructing libraries



$$L_\lambda(t) =$$

You always have a prior!  
 Only using SSPs is a prior as well.  
 At low S/N results tend to the prior!



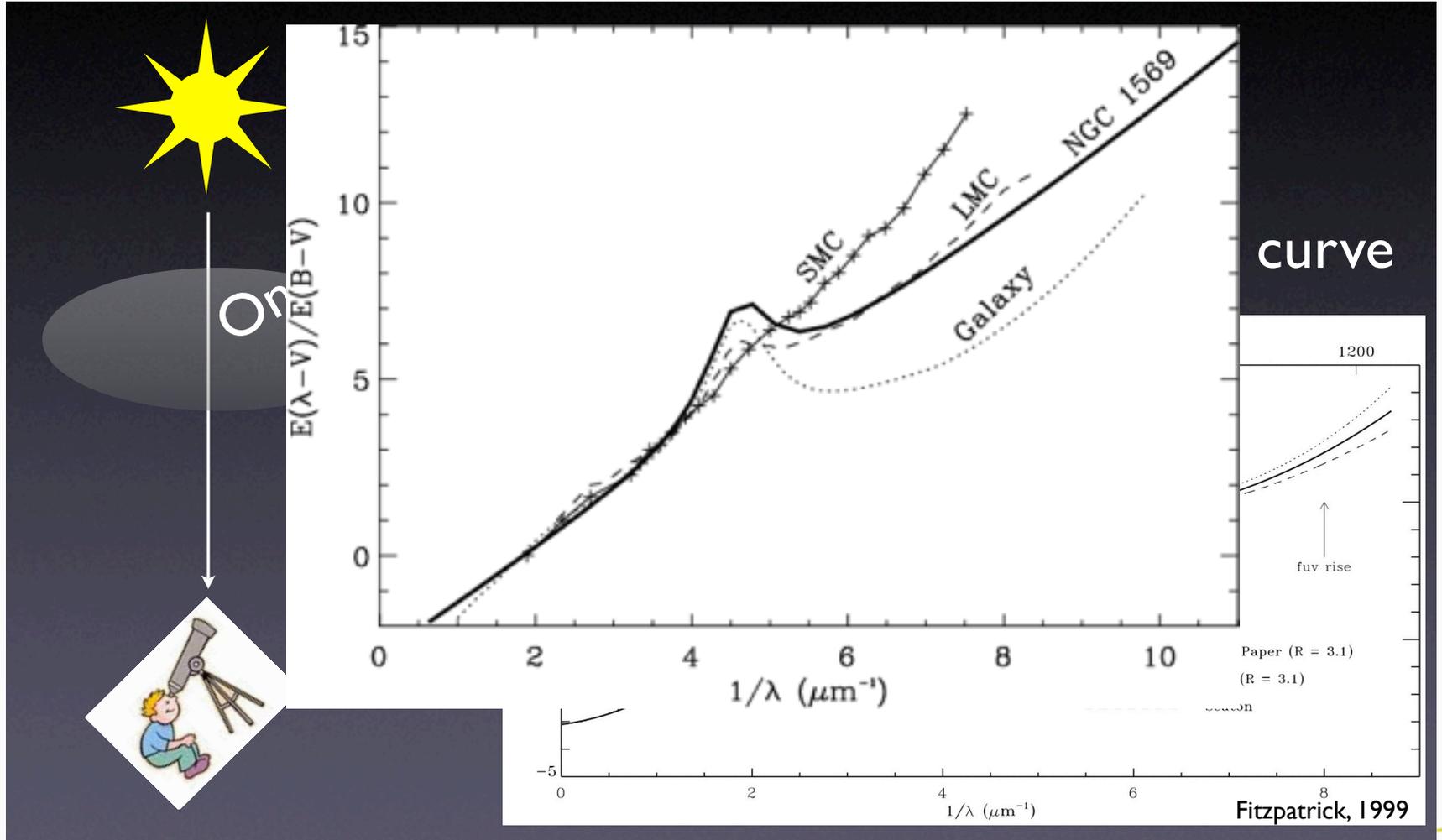
n et al., 2014

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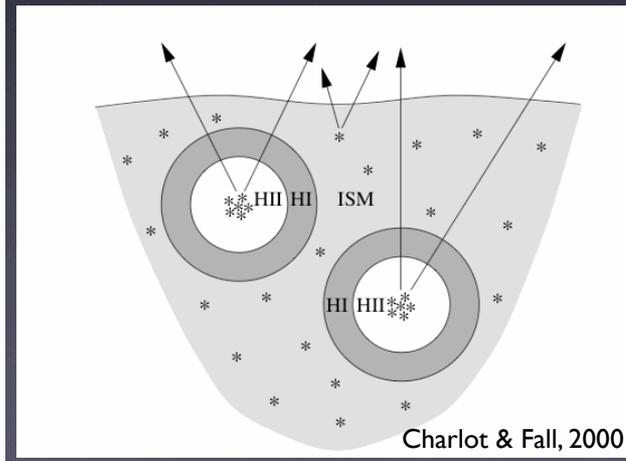
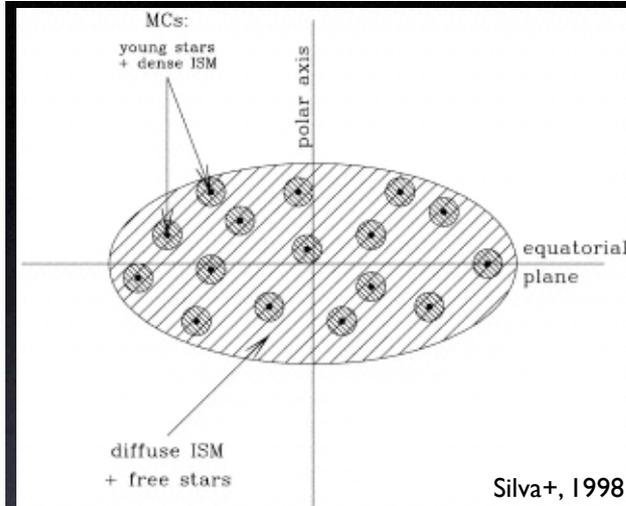
ublished by  
 fffmann+03

ls!

# Dust extinction



# Dust attenuation



The apparent attenuation law is a composite of the attenuation laws for the clumpy younger stars and for the diffuse older stars with a luminosity weight.

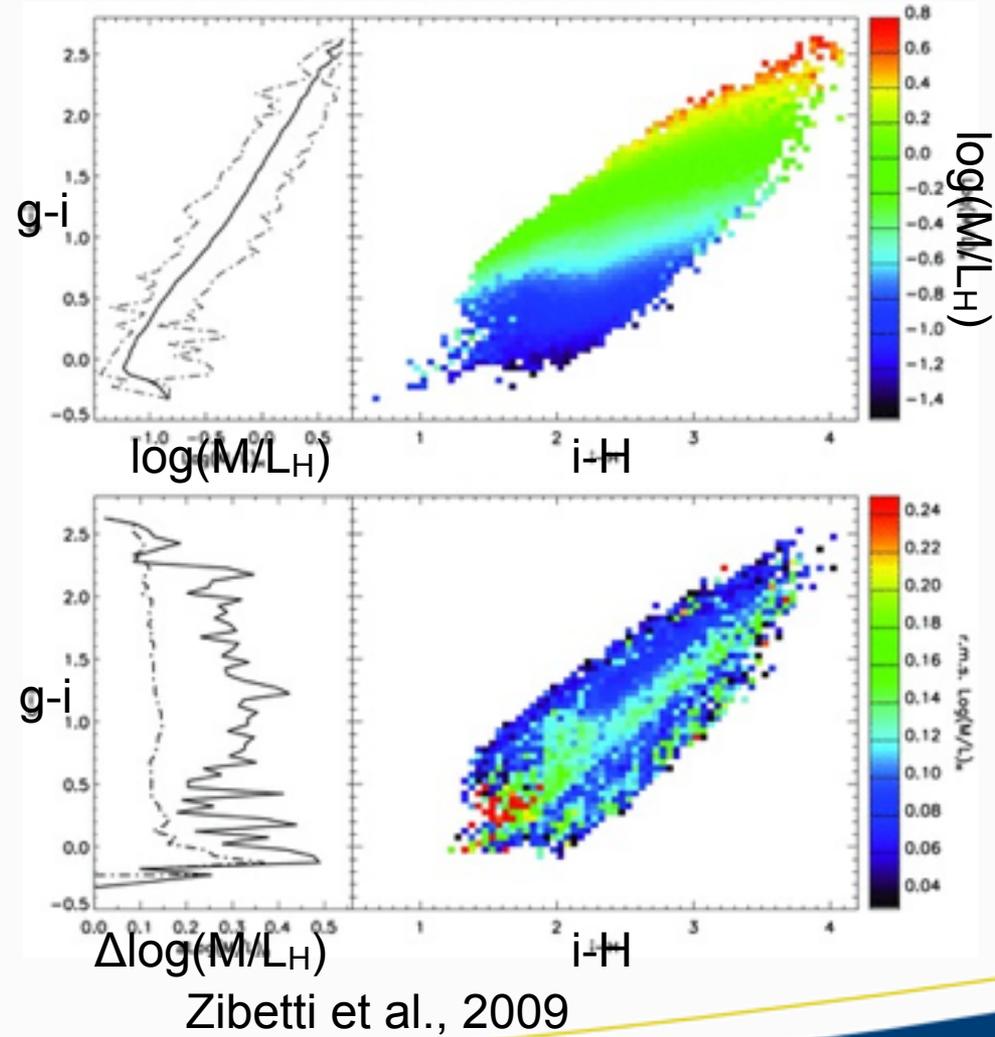
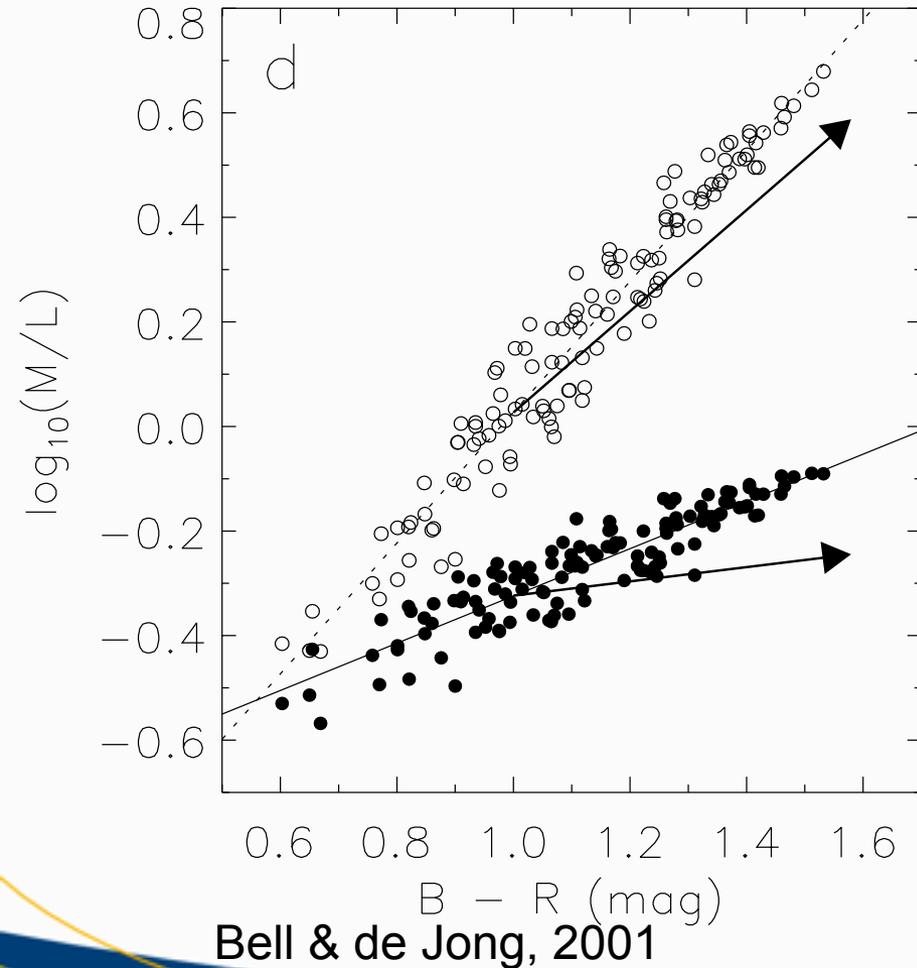
Inoue, 2005

Also: clumpiness

For attenuation slopes see Calzetti+ (1994) and Wild+ (2011)

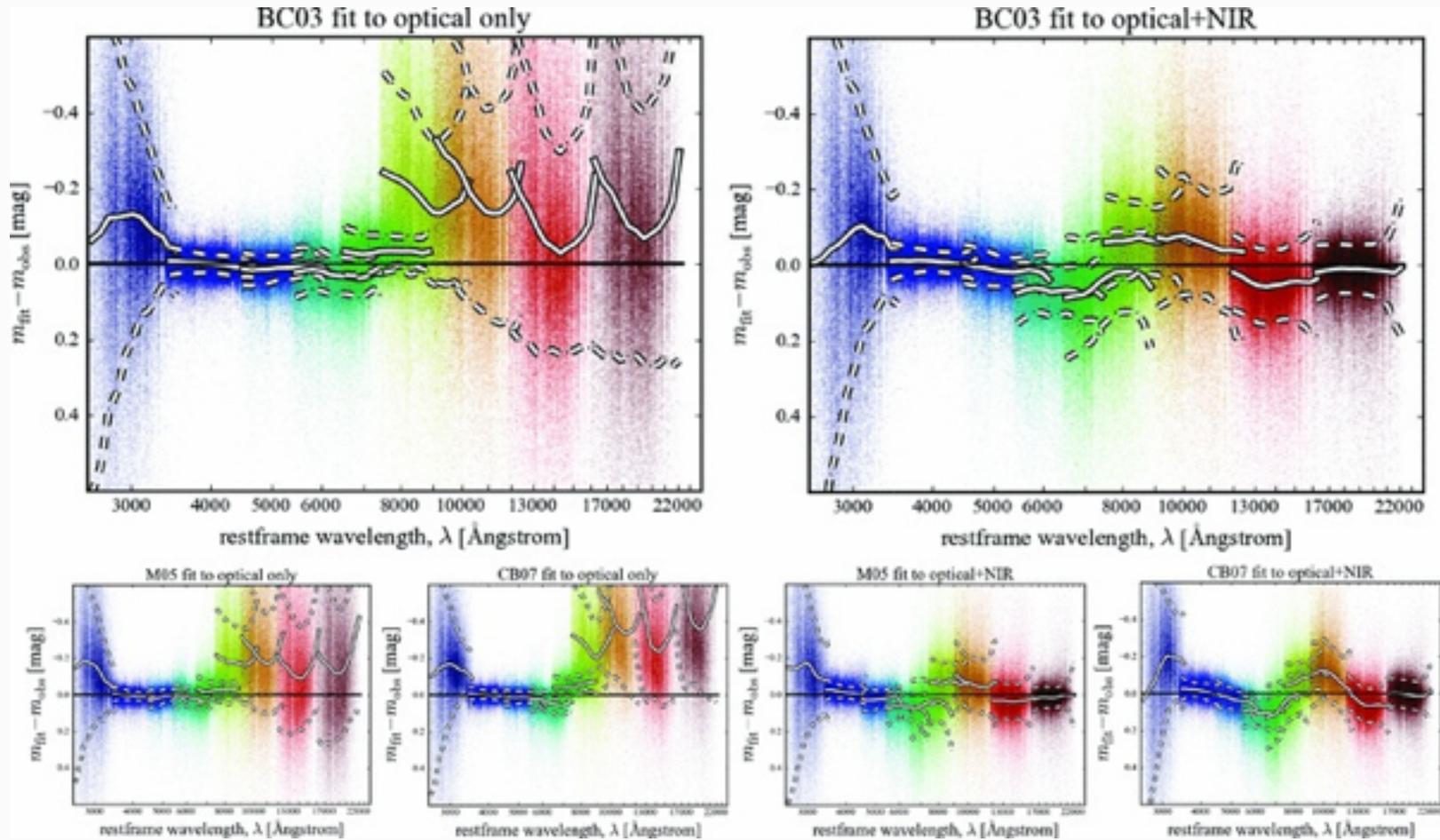
# Stellar masses and the “poor” mans SED fit

$$M = M/L * L$$



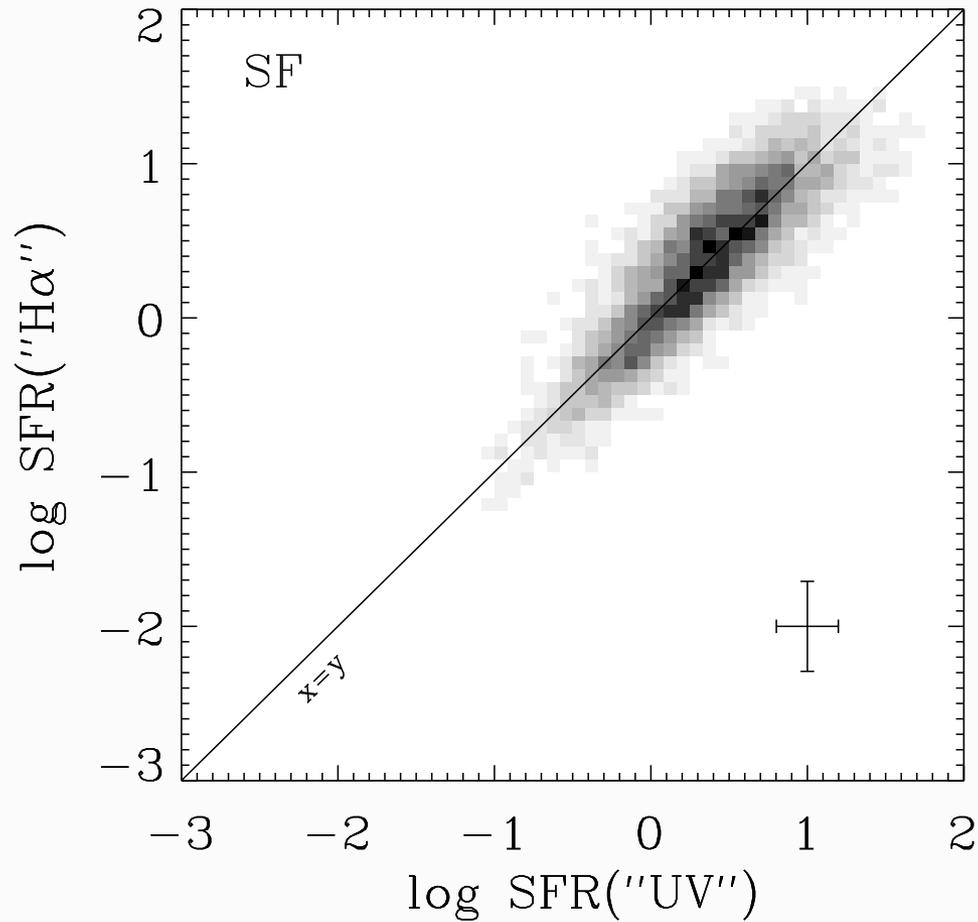
# Residuals

“...these results strongly suggest inconsistencies between the observed optical-minus-NIR colours of real galaxies and those contained within our SPL.”



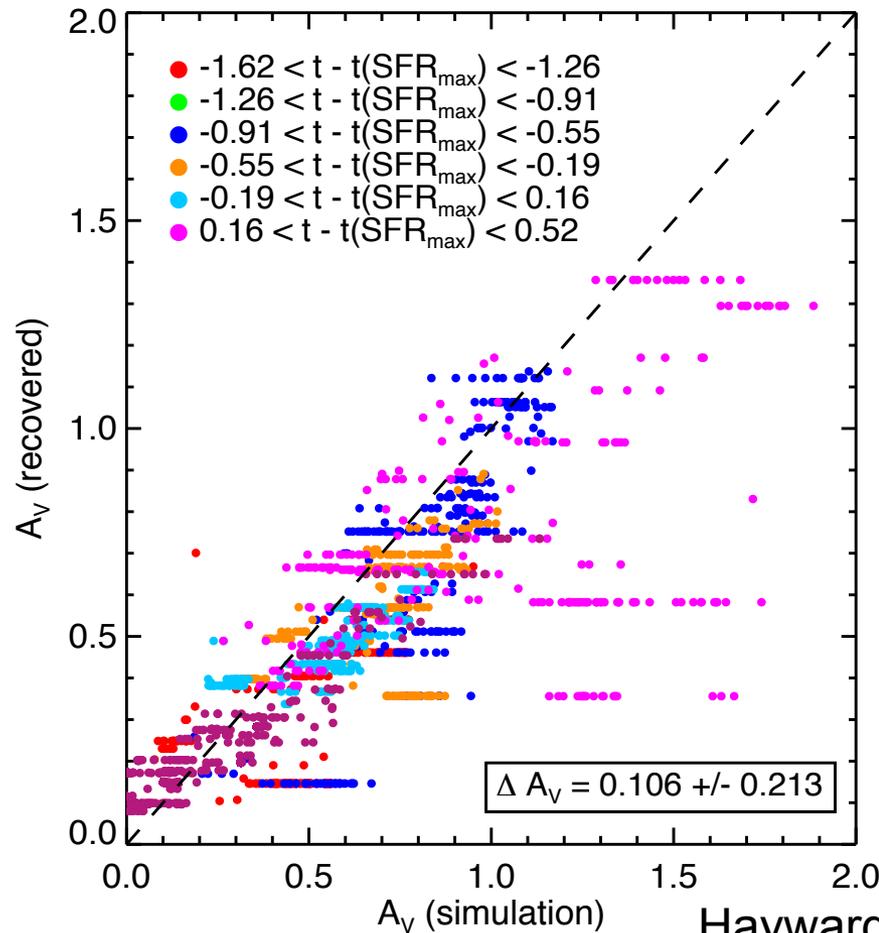
Taylor et al., 2011

# SED fitting works ...



Salim et al., 2007

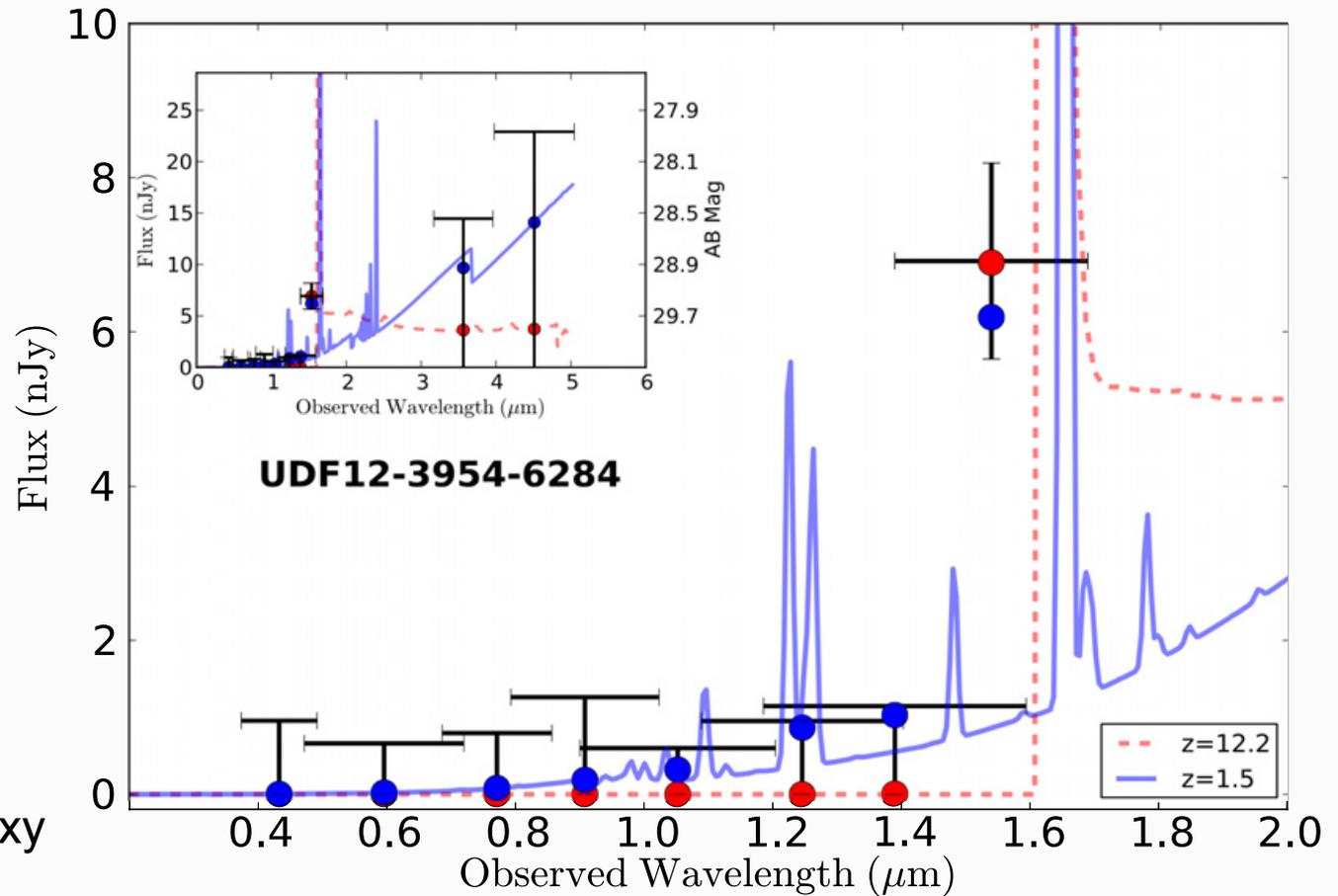
# SED fitting works, but not all parameters are equal!



But IR data help - a lot!

Hayward et al., 2014

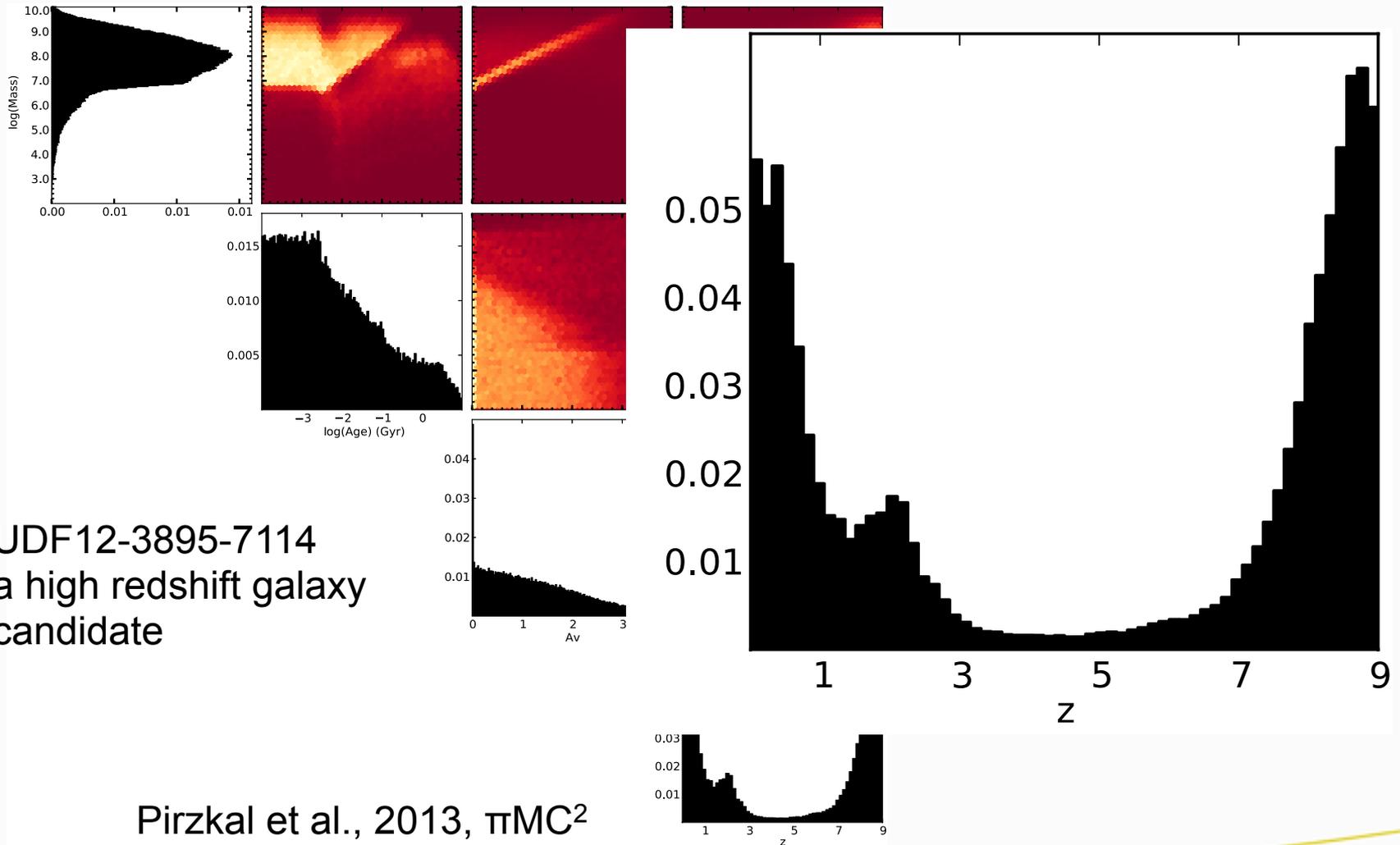
# Example degeneracy problem



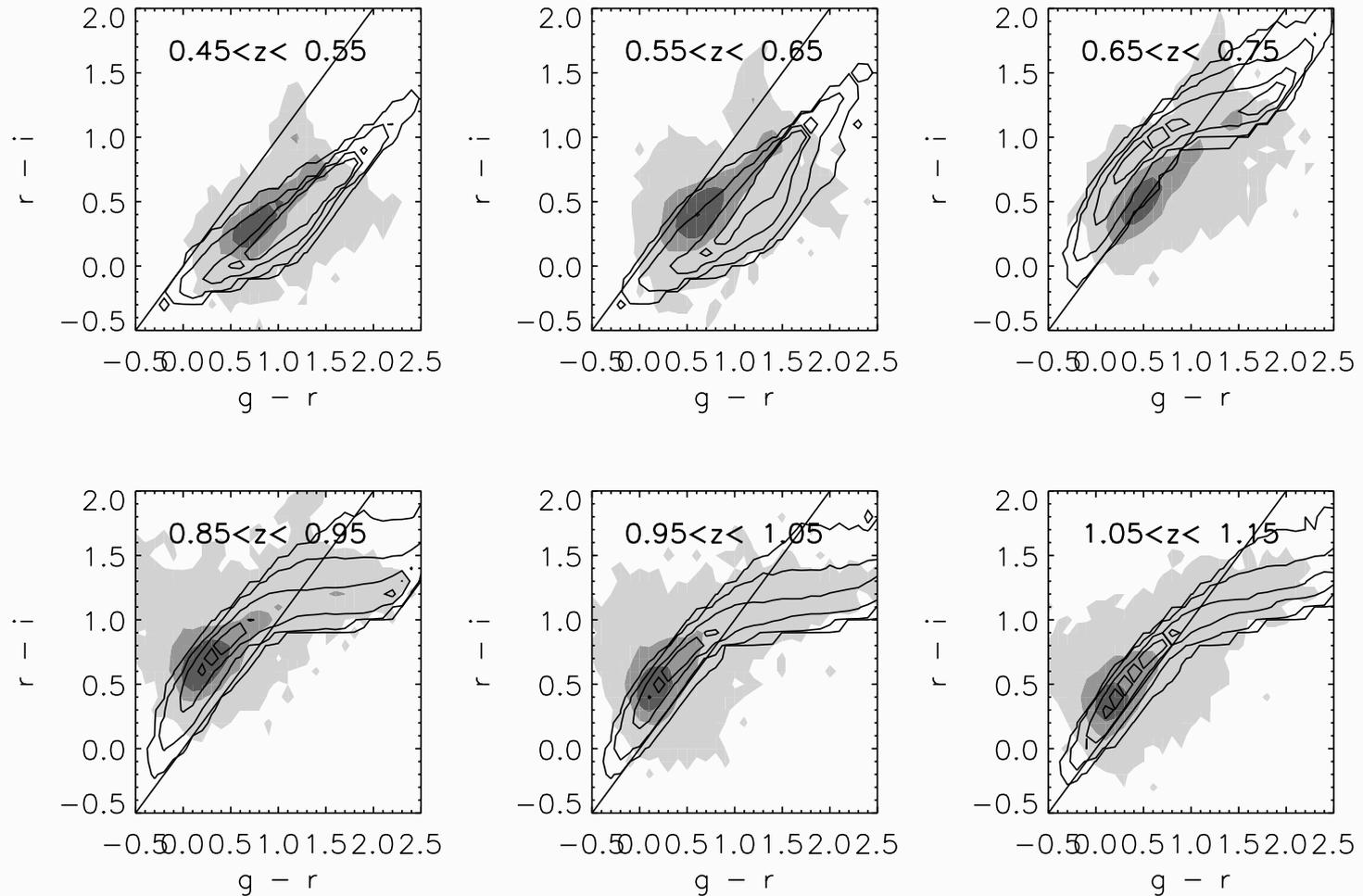
UDF12-3895-7114  
a high redshift galaxy  
candidate

Pirzkal et al., 2013,  $\pi\text{MC}^2$

# Example degeneracy problem



# Example model problem

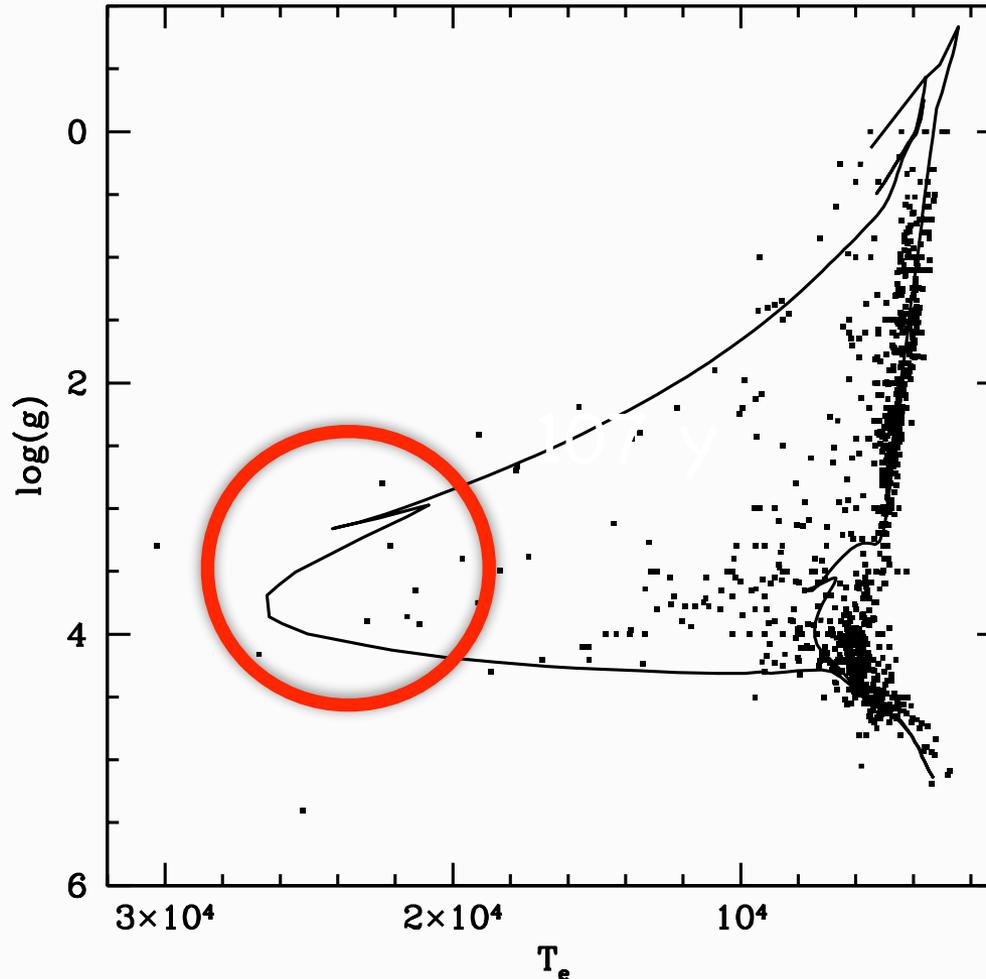


Walcher et al., 2008

# Example model problem

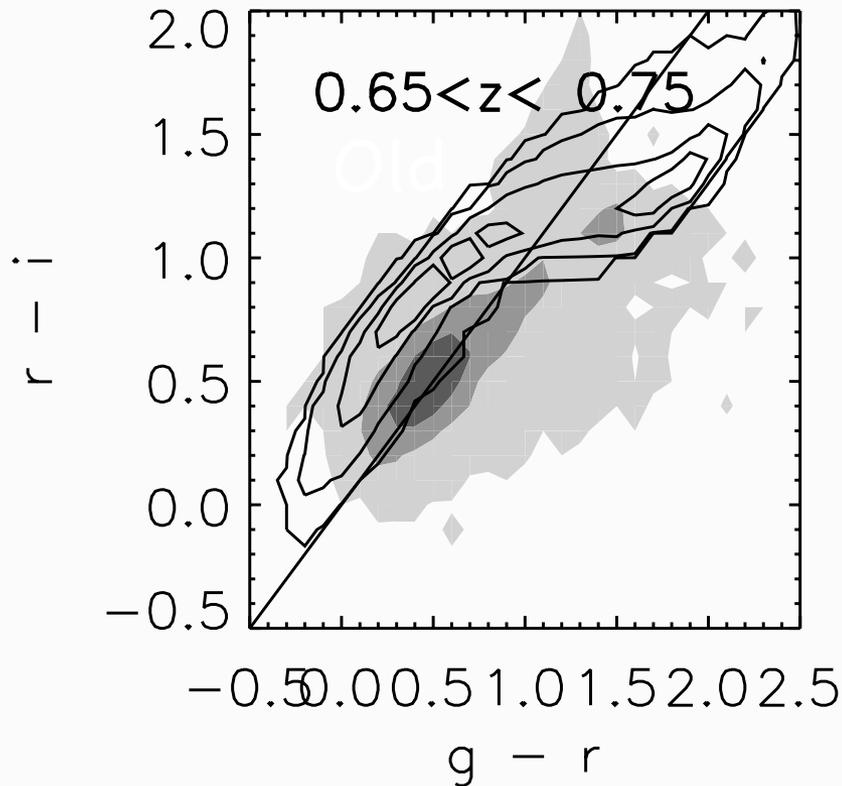
“Few” hot stars  
in the library

library: MILES  
isochrone: Padova

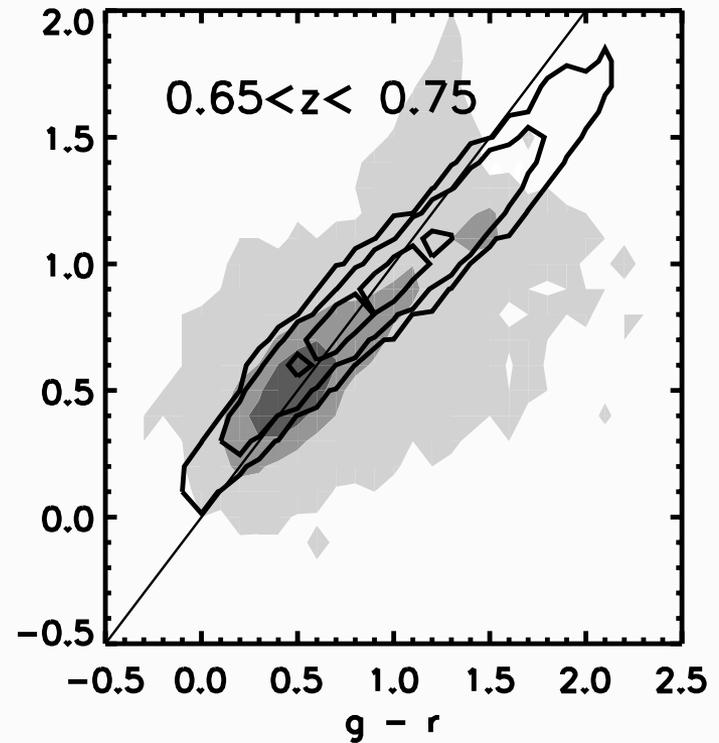


# Example model problem - solved

Old

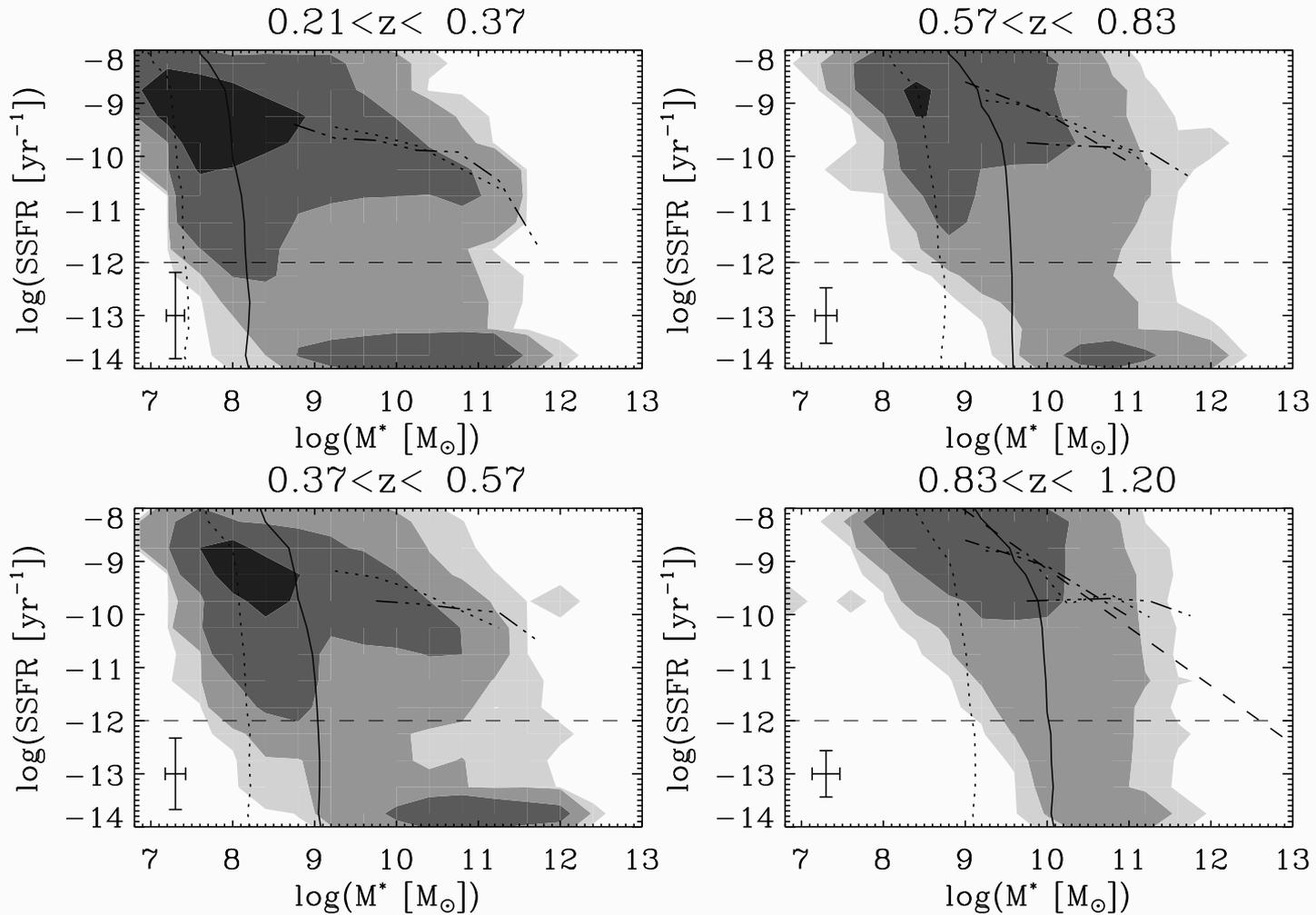


New



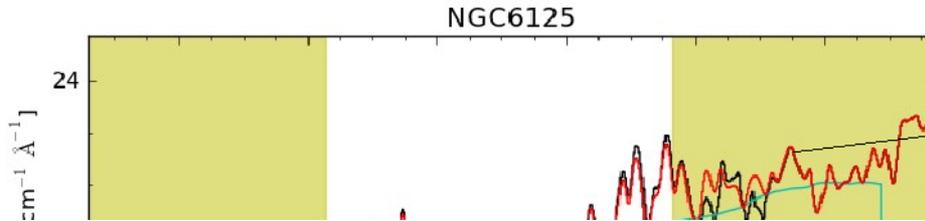
Based on test models by Bruzual & Charlot 2009 including theoretical hot stellar spectra

# Space dens of gals & selection effects



Walcher et al., 2008

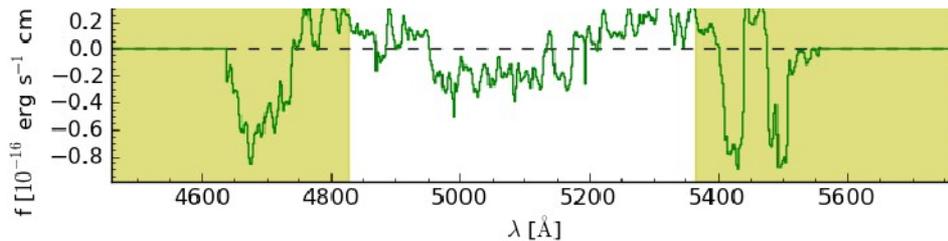
# Fitting a spectroscopic SED



- Age = 11.49 gyr
- $[\text{Fe}/\text{H}] = -0.252$
- $[\alpha/\text{Fe}] = 0.174$

Available codes (complete?):

ppxf, ulyss, starlight, steckmap, fit3D  
 (paradise, moped, platefit, nbursts, vespa) ill-  
m!!

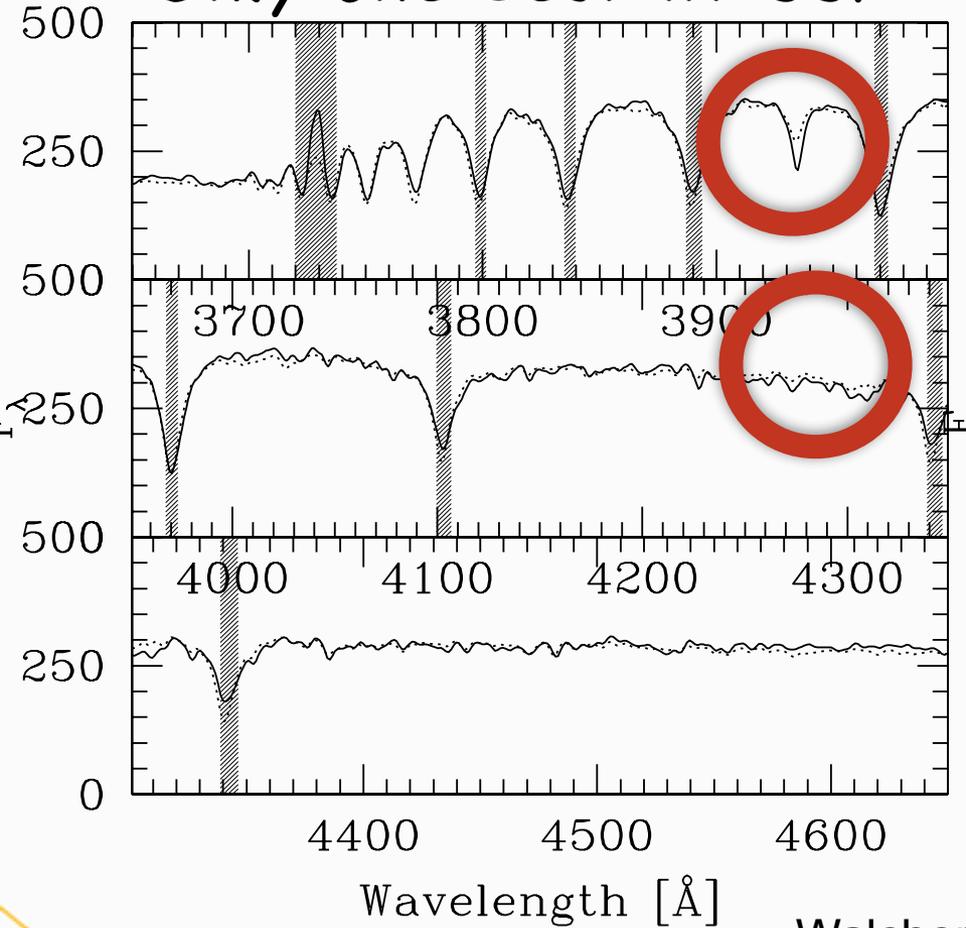


Dust and continuum slope!!

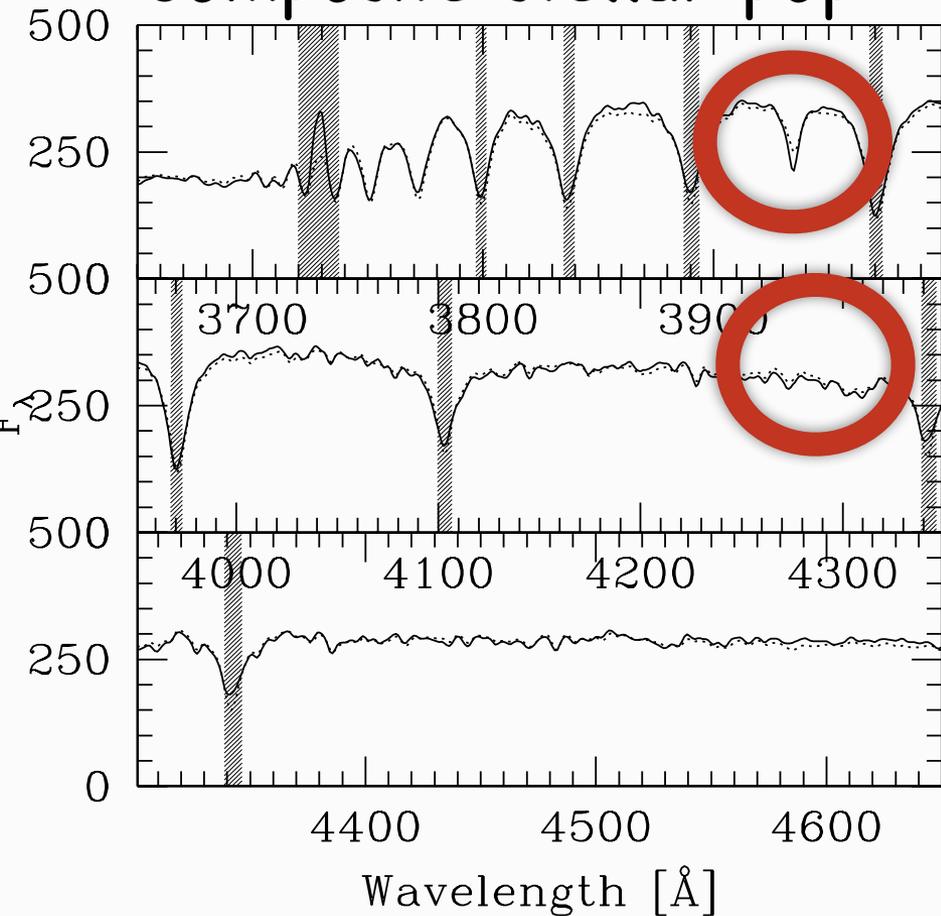
$$\chi^2 = \sum_{i=0}^n \left[ \frac{F_i - \sum_{k=1}^M a_k S_i[t_k, Z^0, T^0]}{\sigma_i} \right]^2,$$

# Why SSPs are not enough

## Only one best-fit SSP

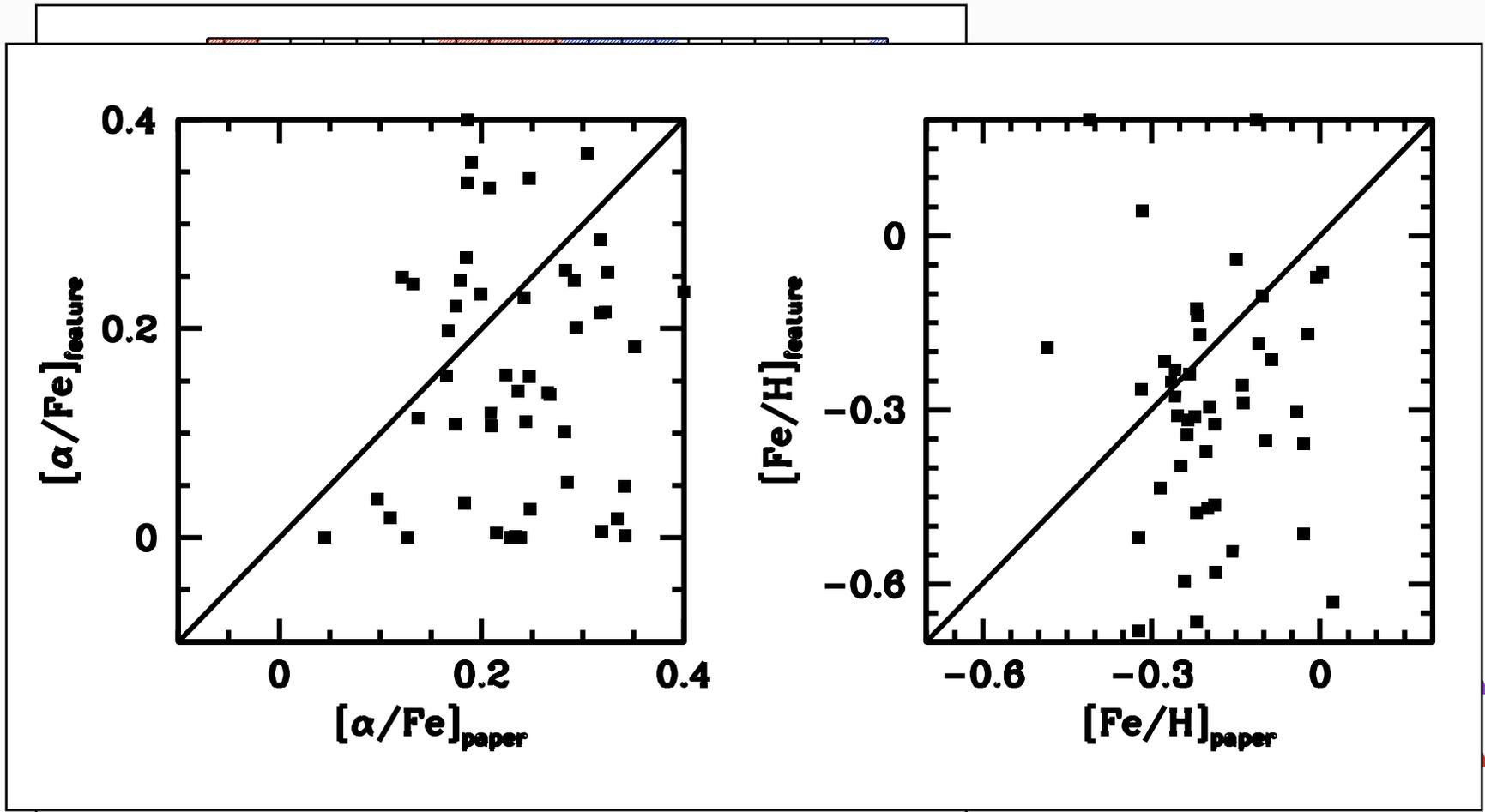


## Composite stellar pop

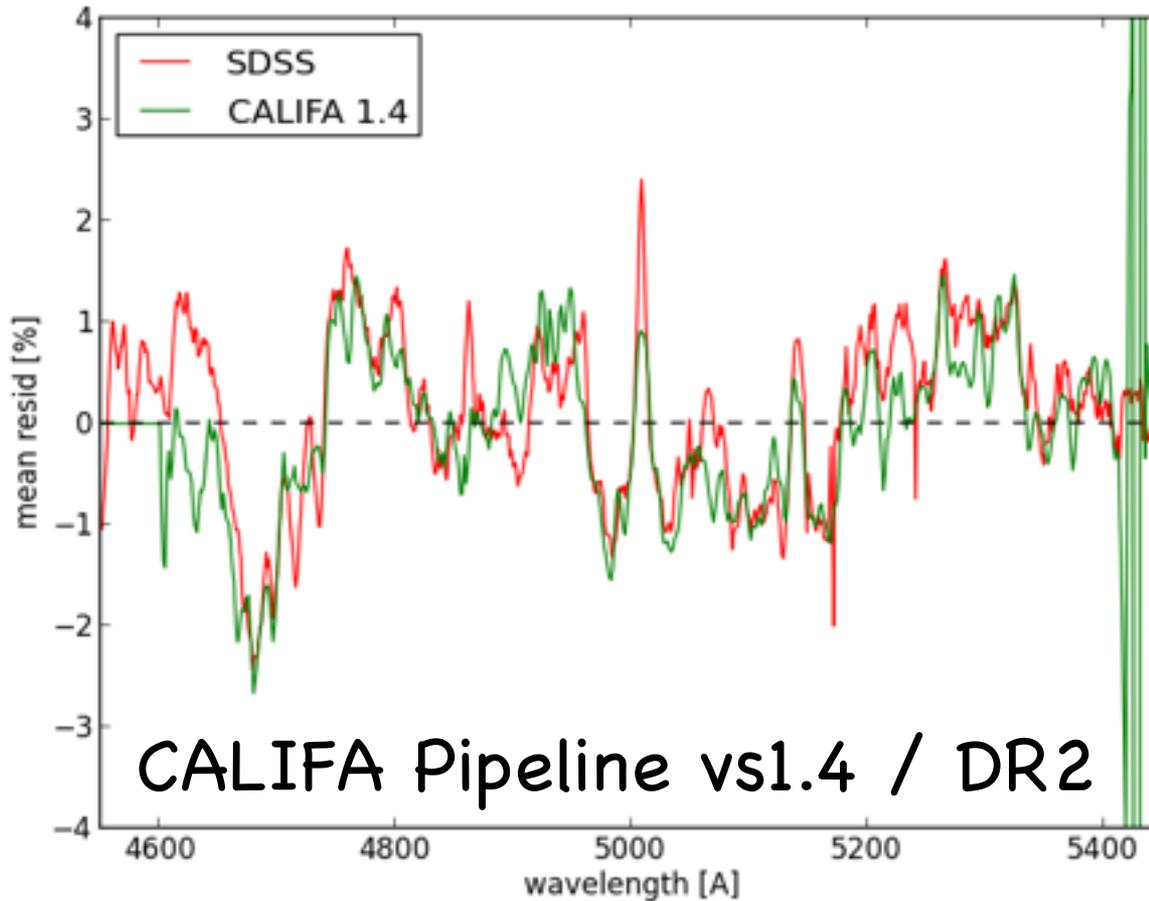


Walcher et al., 2006

# Do not trust *good* fits!

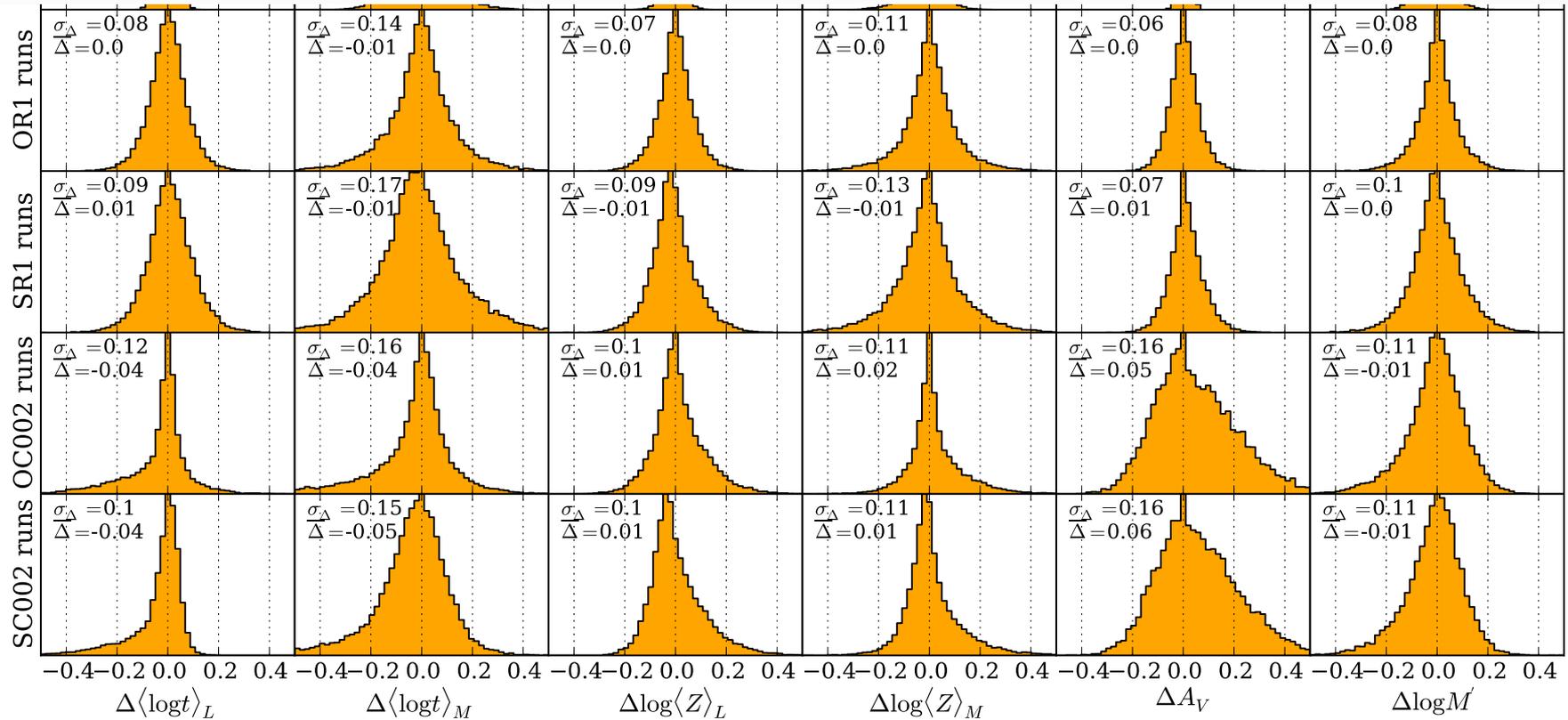


# Residuals



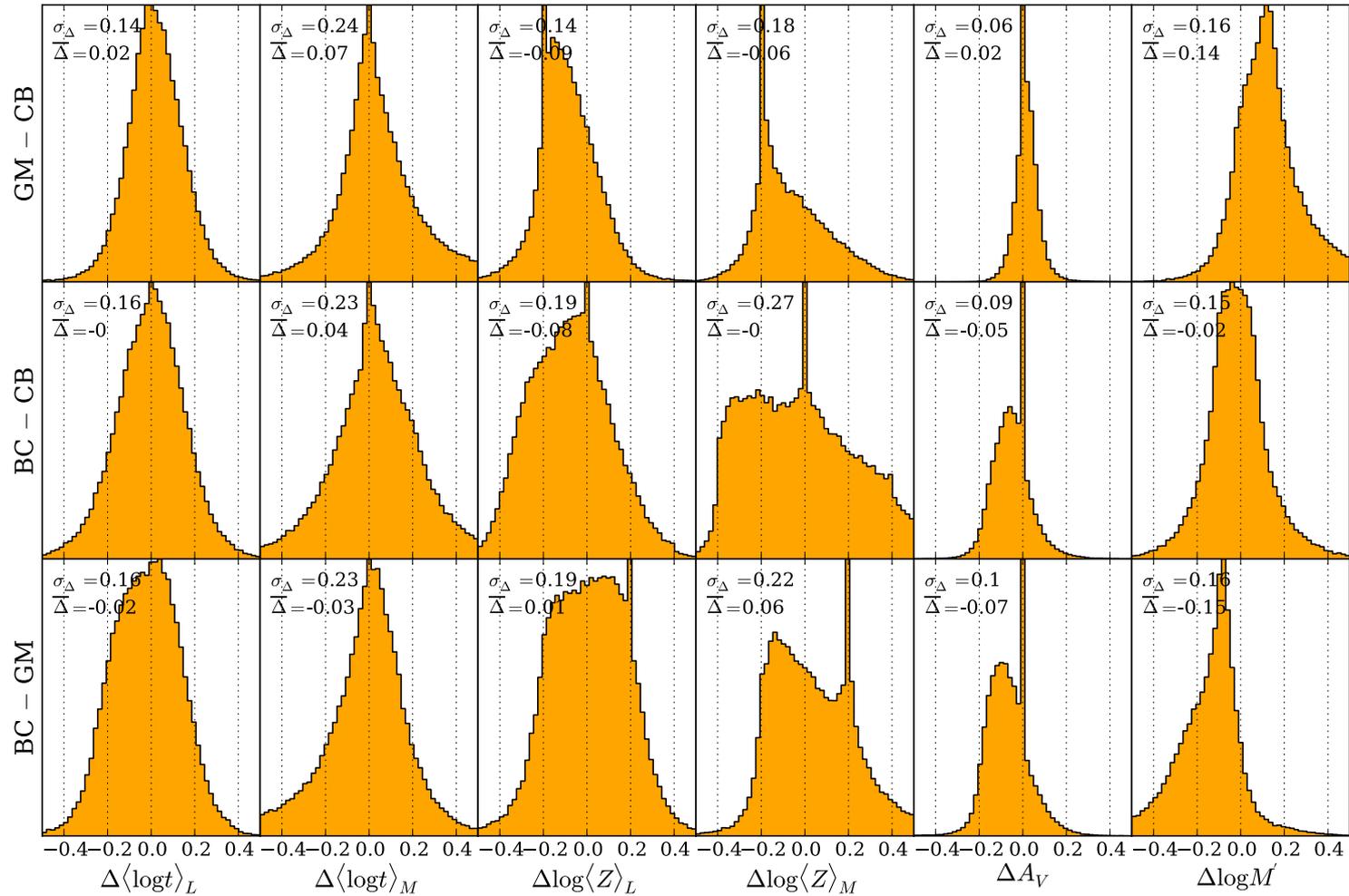
Template mismatch dominates!

# Effect of noise



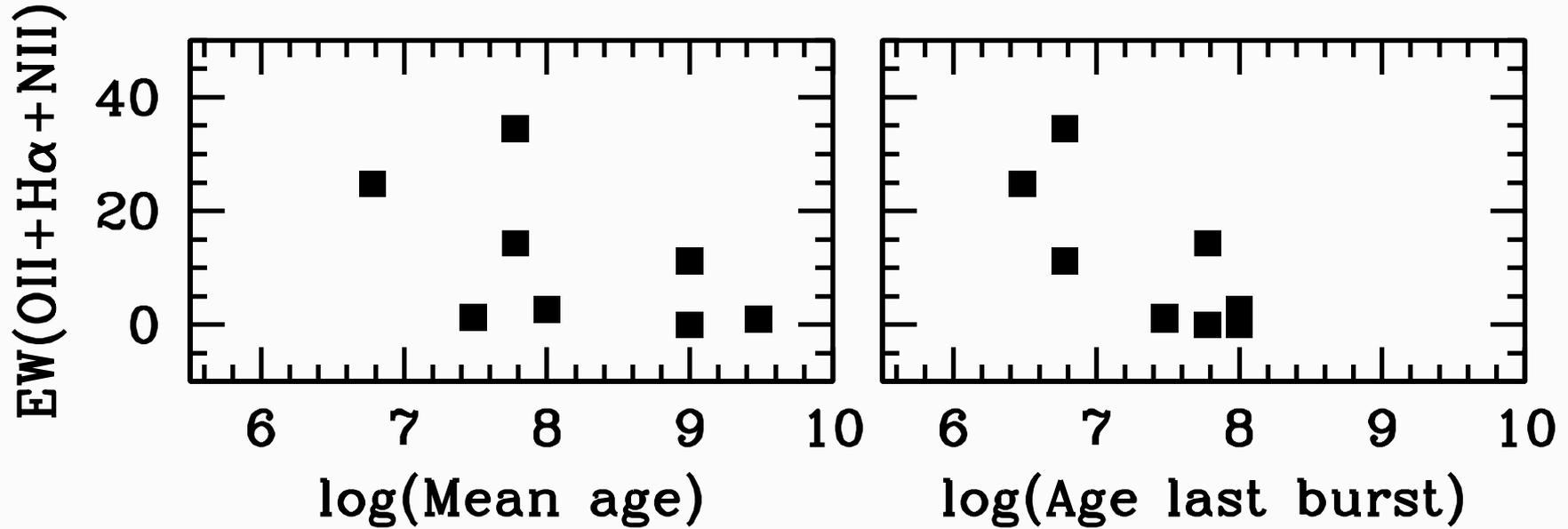
Cid-Fernandes et al. 2013, 2014

# Effect of model



Cid-Fernandes et al. 2013, 2014

# Young stellar populations in particular

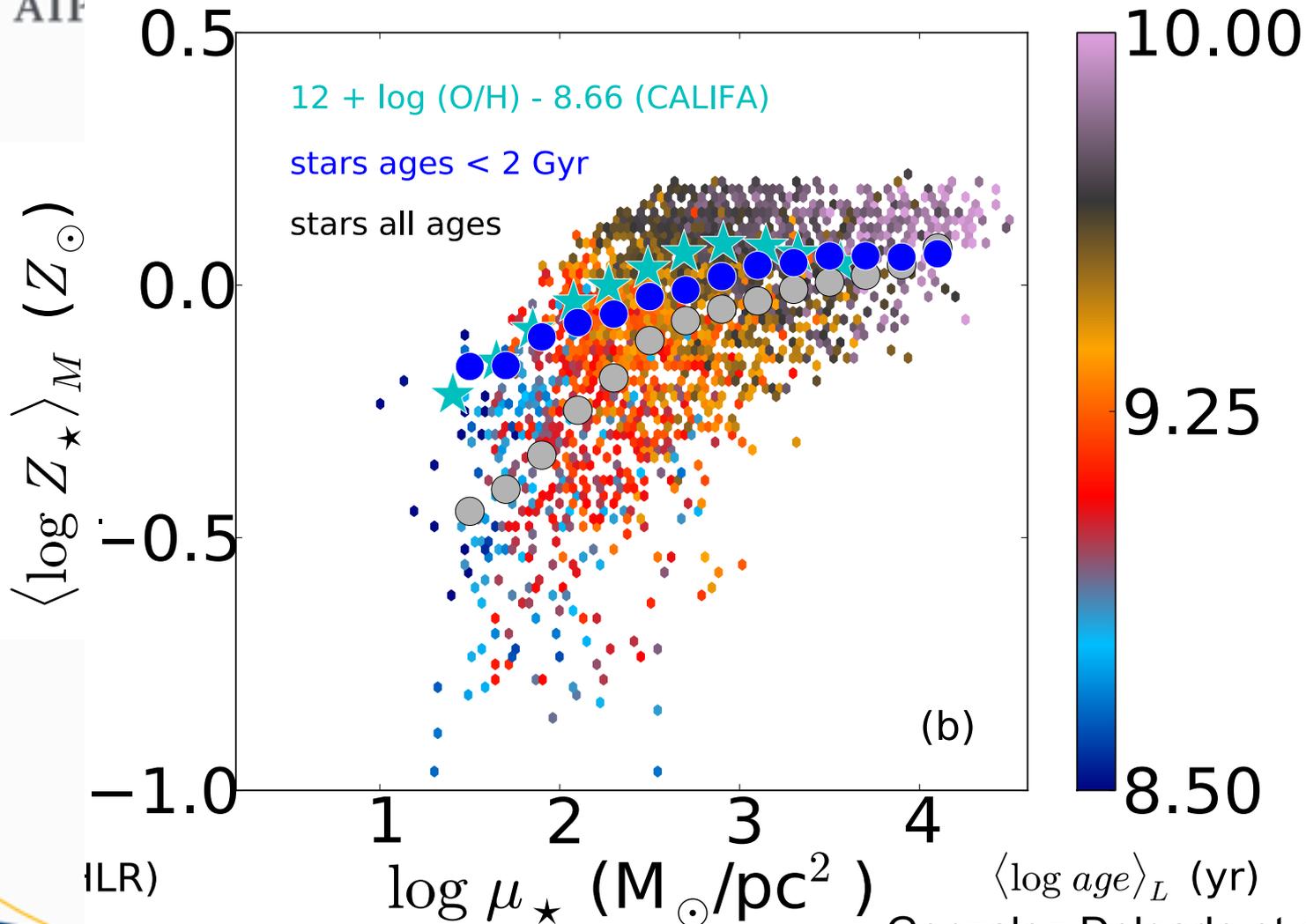


Walcher et al., 2011



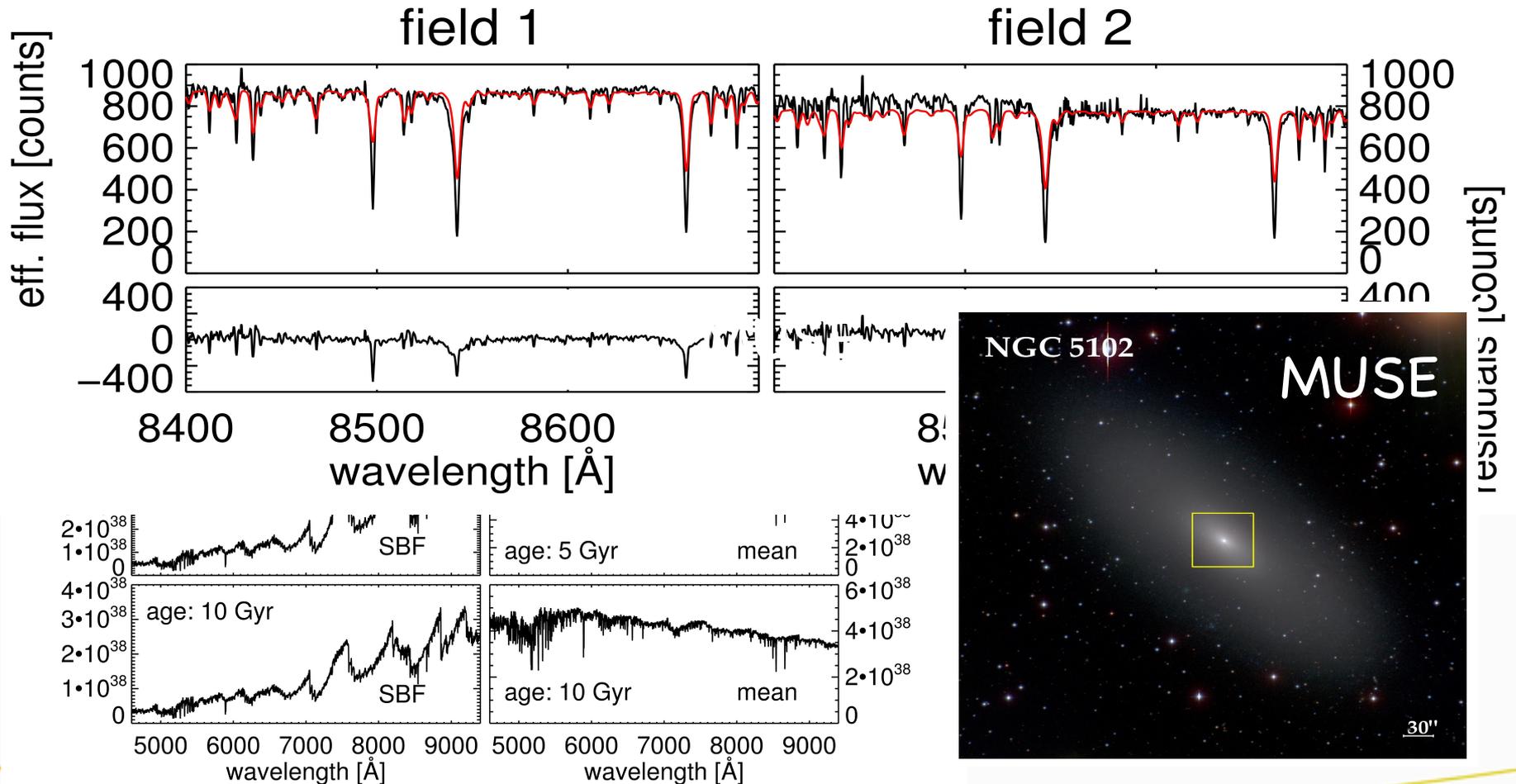
AIF

# $\Sigma$ -Z relation from CALIFA



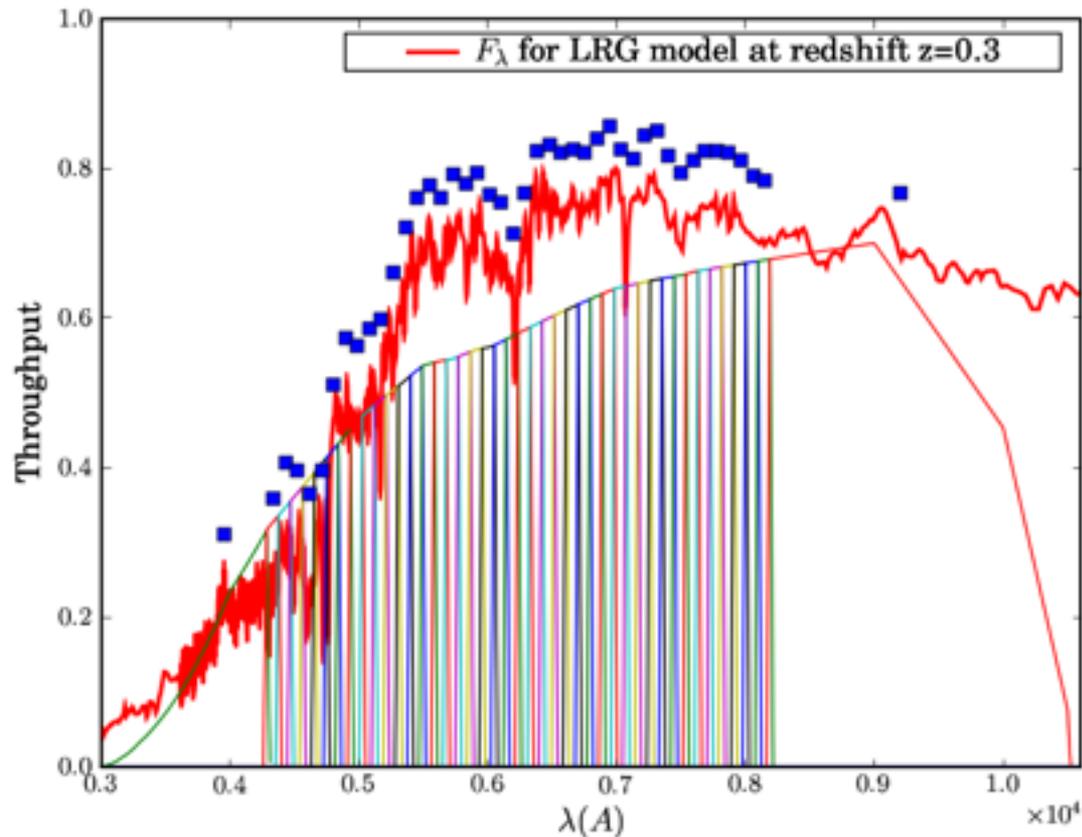
Gonzalez-Delgado et al., 2014

# Blurring the boundaries: spectroscopic surface brightness fluct.



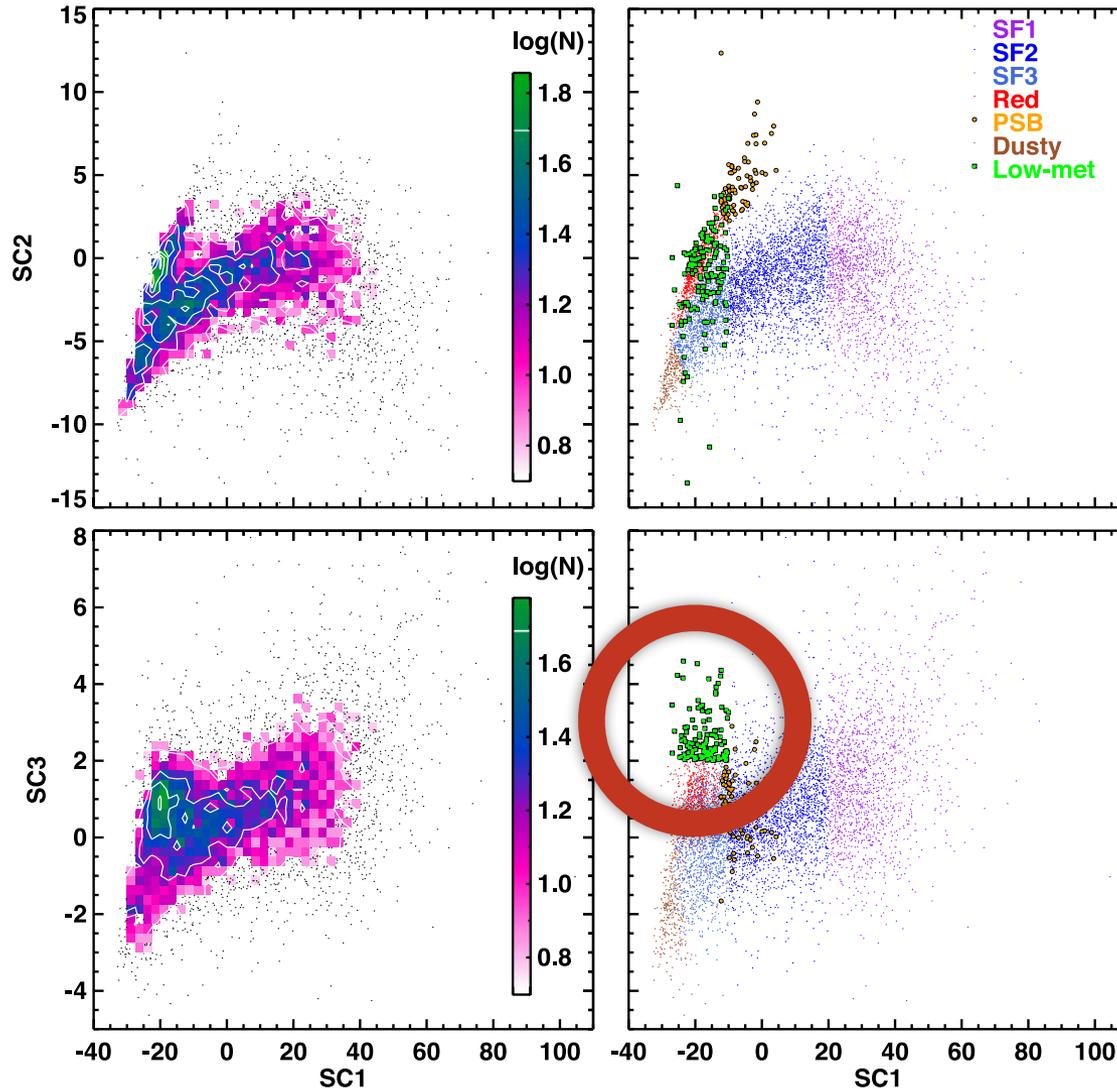
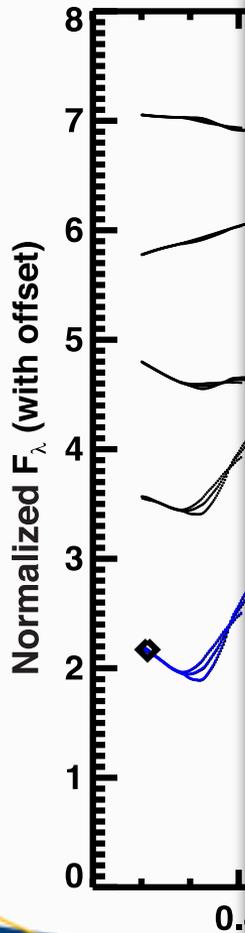
Martin Mitzkus et al., 2014

# Blurring the boundaries: high R photometry



Javalambre observatory (Benitez et al.)  
See also COMBO-17 and others

# Blurring the boundaries: “spectroscopic” info from photoSEDs



2014



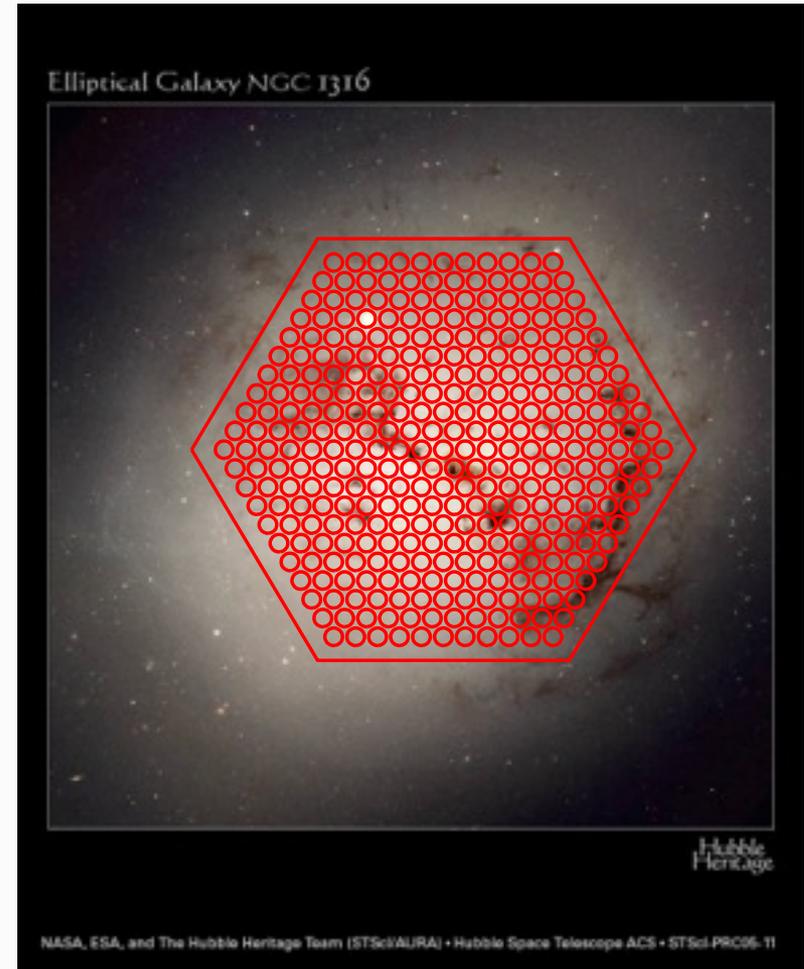
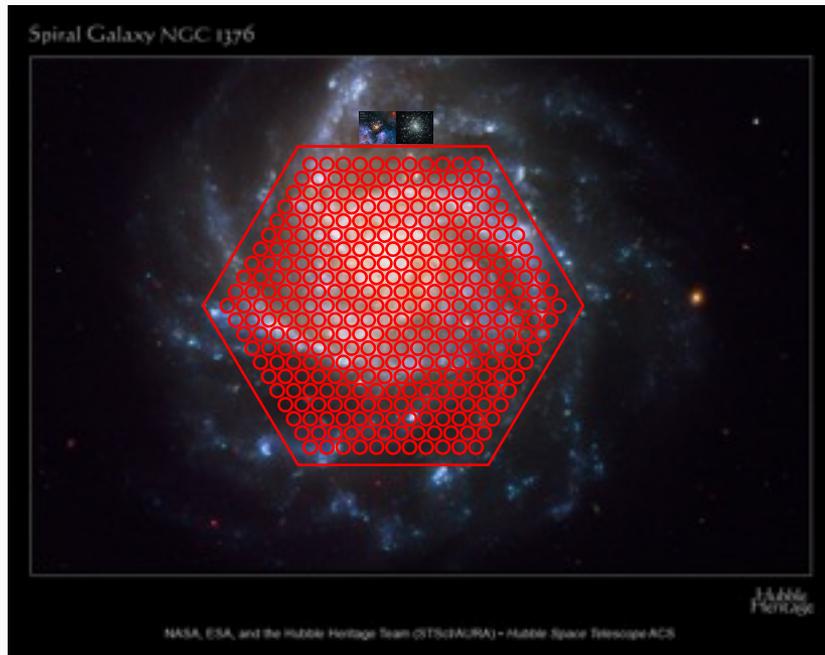
# UNresolved stellar populations

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The (ongoing) future

# UNresolved stellar populations, but resolved galaxies

Imaging spectroscopy: SAURON/A3D,  
CALIFA, VENGA, PINGS, SAMI, MANGA,  
MUSE, many more



# Resolved stellar populations

and resolved dust structures out to Virgo

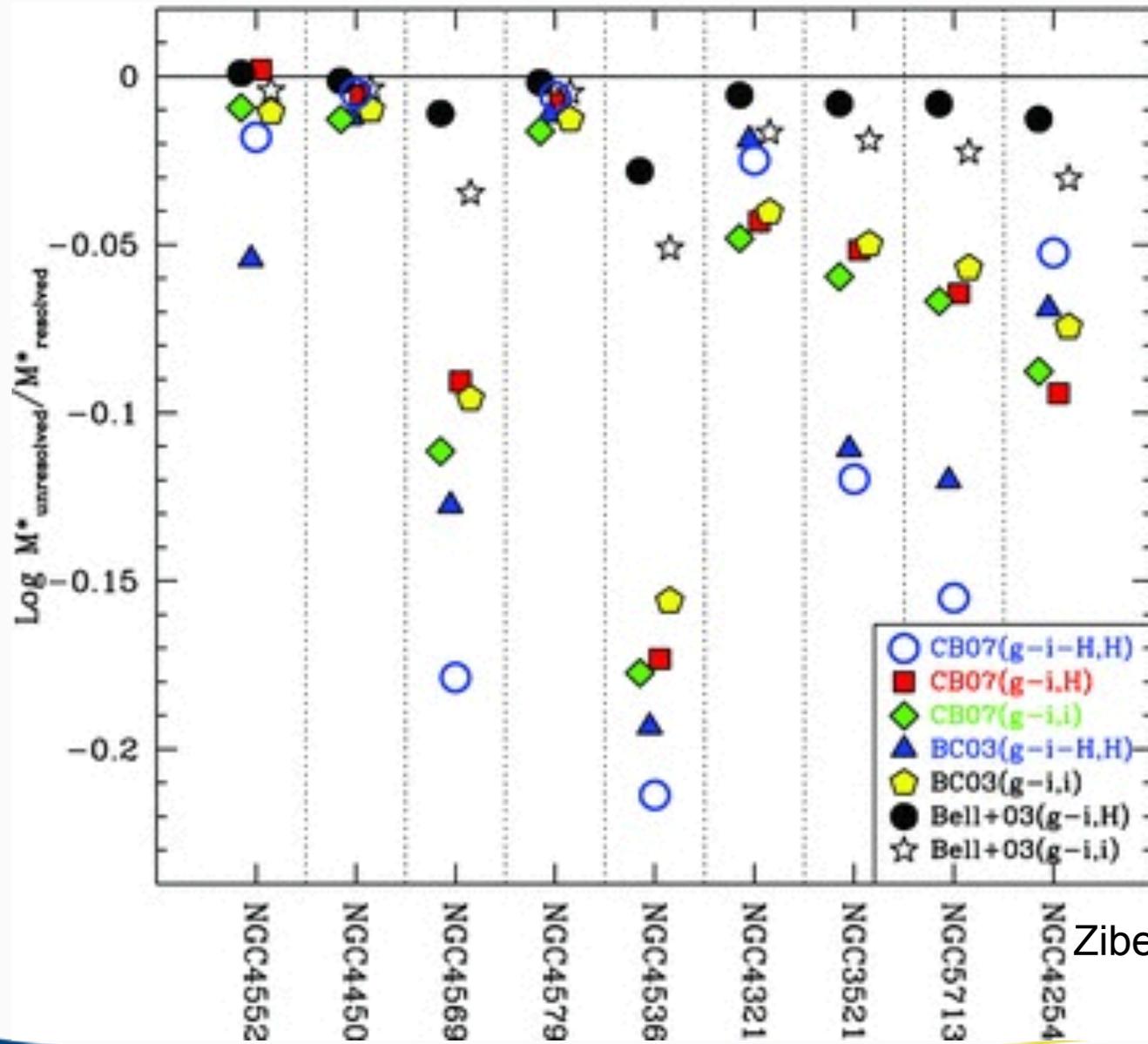


Better, deeper, higher redshift ...

# Conclusions

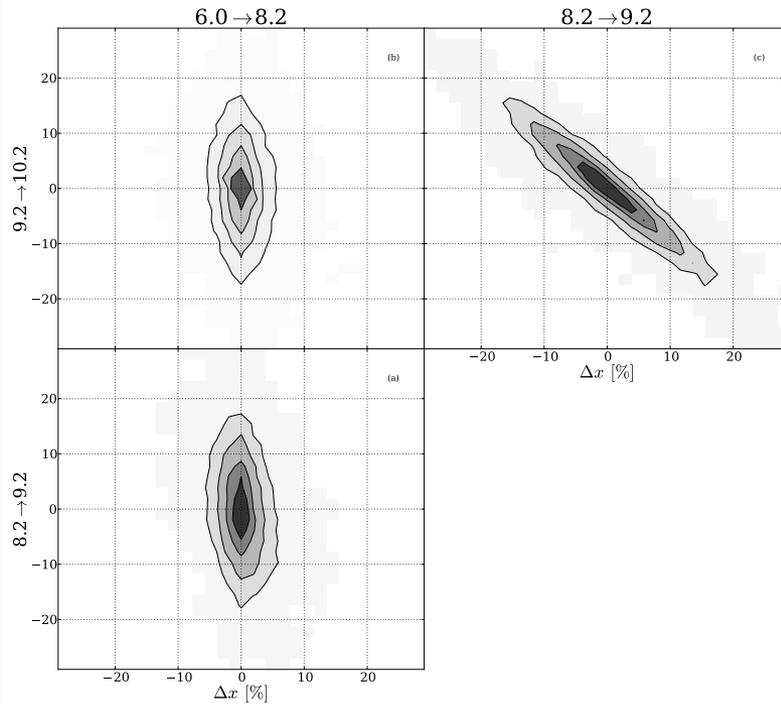
- Without analyzing the integrated SEDs of galaxies we would know far less about the universe.
- Our dependance on the way we model the input physics clashes with the need for progress.
- Good practices exist that allow robust statements about galaxy physical properties *given the model*.
- To make best use of present and future instrumentation potential we need to emphasize:
  - Model development and verification
  - Rigorous sample selection
  - Discard old habits (e.g. fitting SSPs, calibrating to Lick system)



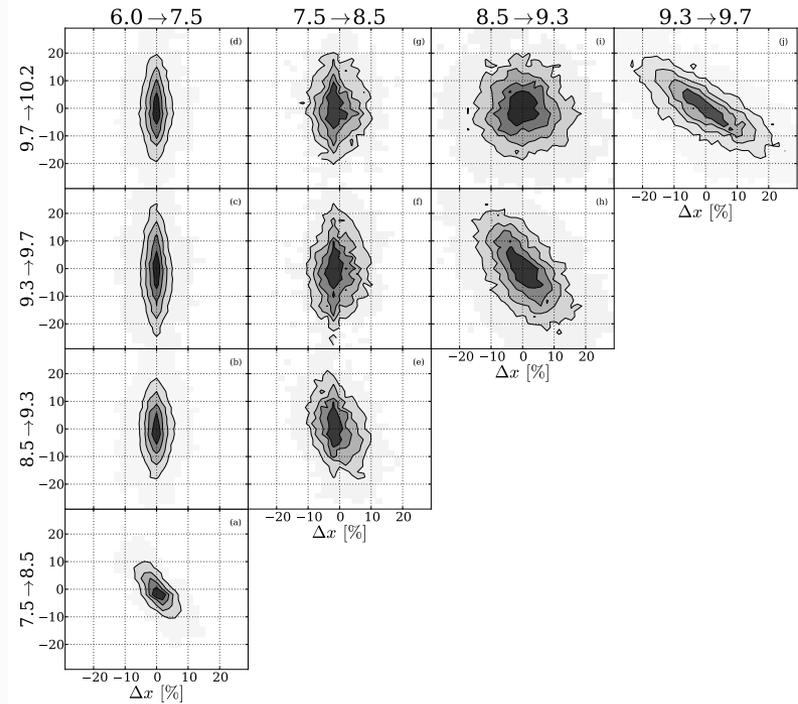


Zibetti et al., 2009

# Extensive verification of spectral fitting

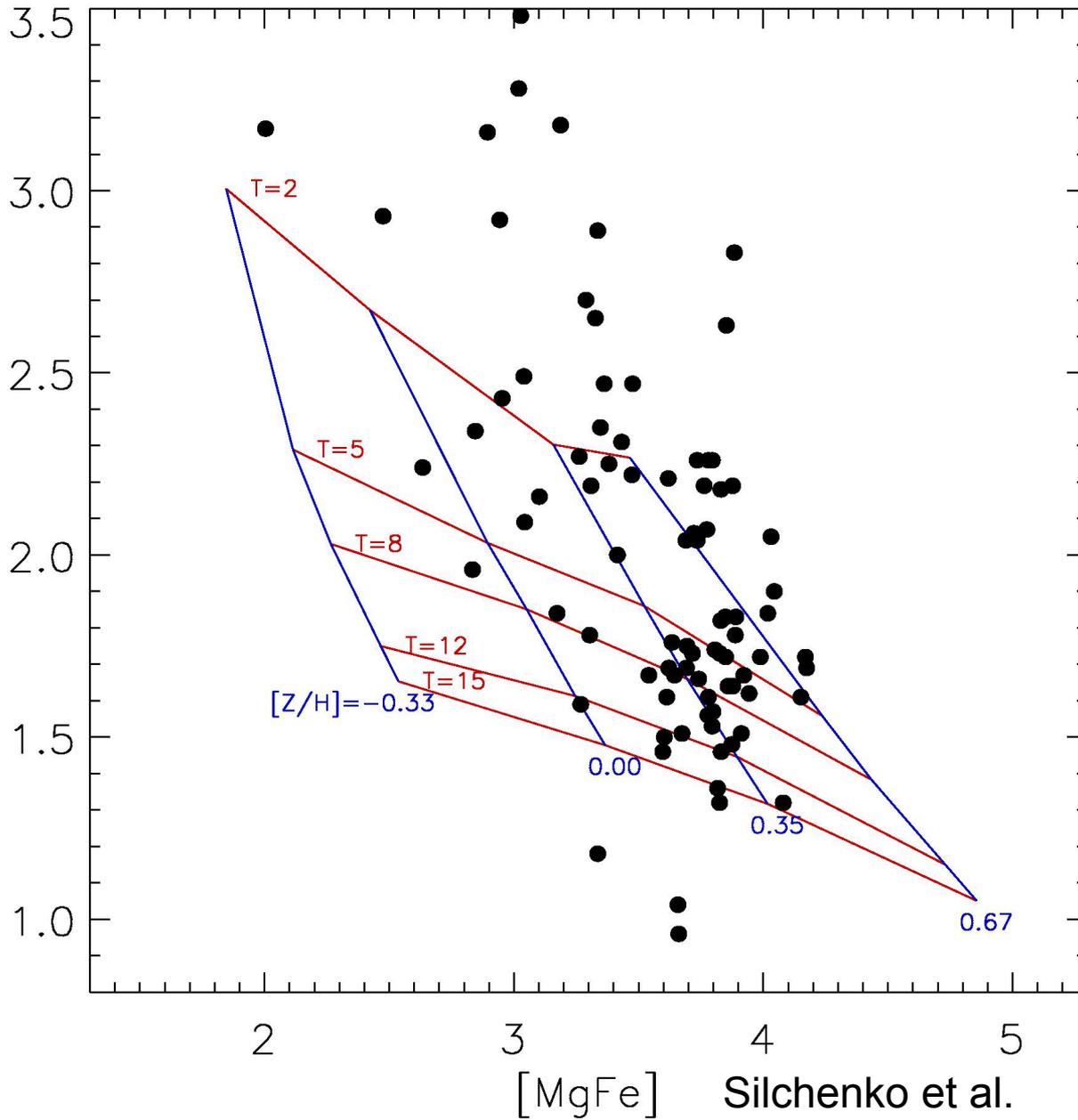
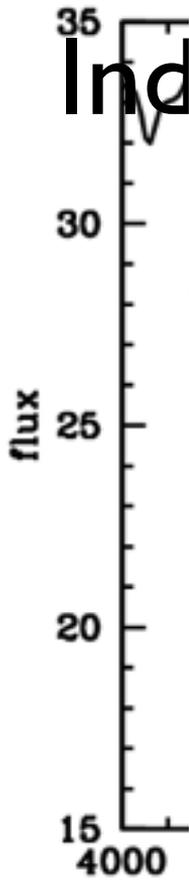


**Fig. 5.** Variations in the light fractions in Young, Intermediate and Old age groups (spanning  $\log t = 6-8.2$ ,  $8.2-9.2$  and  $9.2-10.2$ , respectively) for OR1 simulations. Contours are drawn at 20, 40, 60 and 80% of enclosed points.

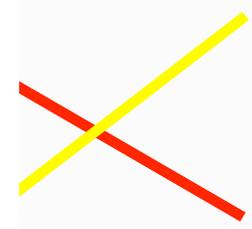


**Fig. 6.** As Fig.5, but for a finer graded description of the SFH in terms of 5 age groups.

Cid-Fernandes et al. 2013, 2014



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