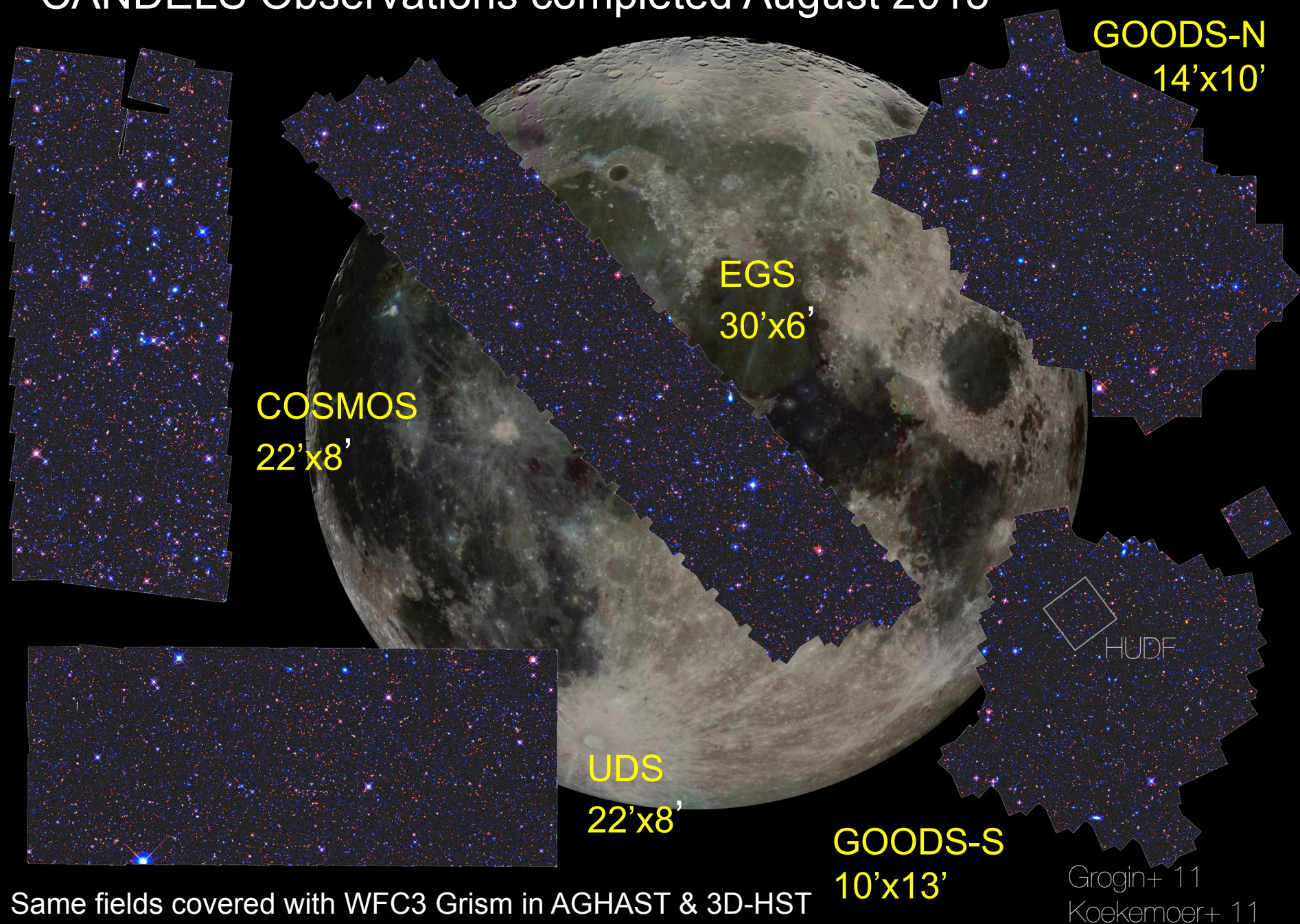


# Making optimal use of the CANDELS data

Henry Ferguson  
26 January 2015



# CANDELS Observations completed August 2013





# CANDELS data products

- HST images
  - CANDELS ACS + WFC3 mosaics
  - UV GOODS-N mosaic now available
- PSFs and PSF kernels
- Photometry:
  - SExtractor dual-mode matched-PSF photometry
  - TFIT template-fitting photometry for non-HST, based on HST priors

# CANDELS data products

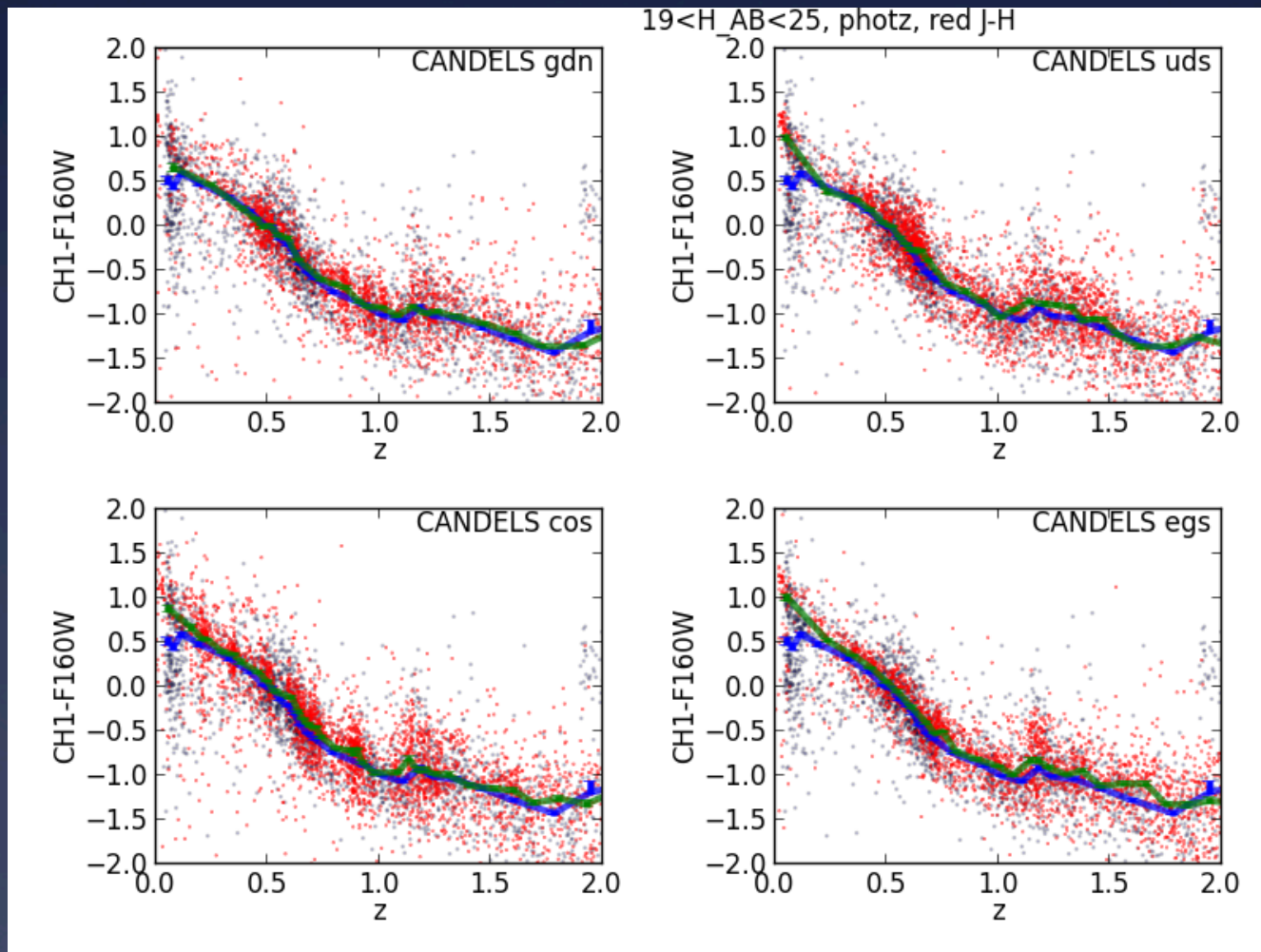
- Morphology
  - Visual morphology classifications
  - Galaxy Zoo classifications
  - Galfit single-band single-Sersic fits
  - Galfit multiple-band Sersic fits (underway)
  - CAS/Gini/M20 (underway)



# CANDELS data products

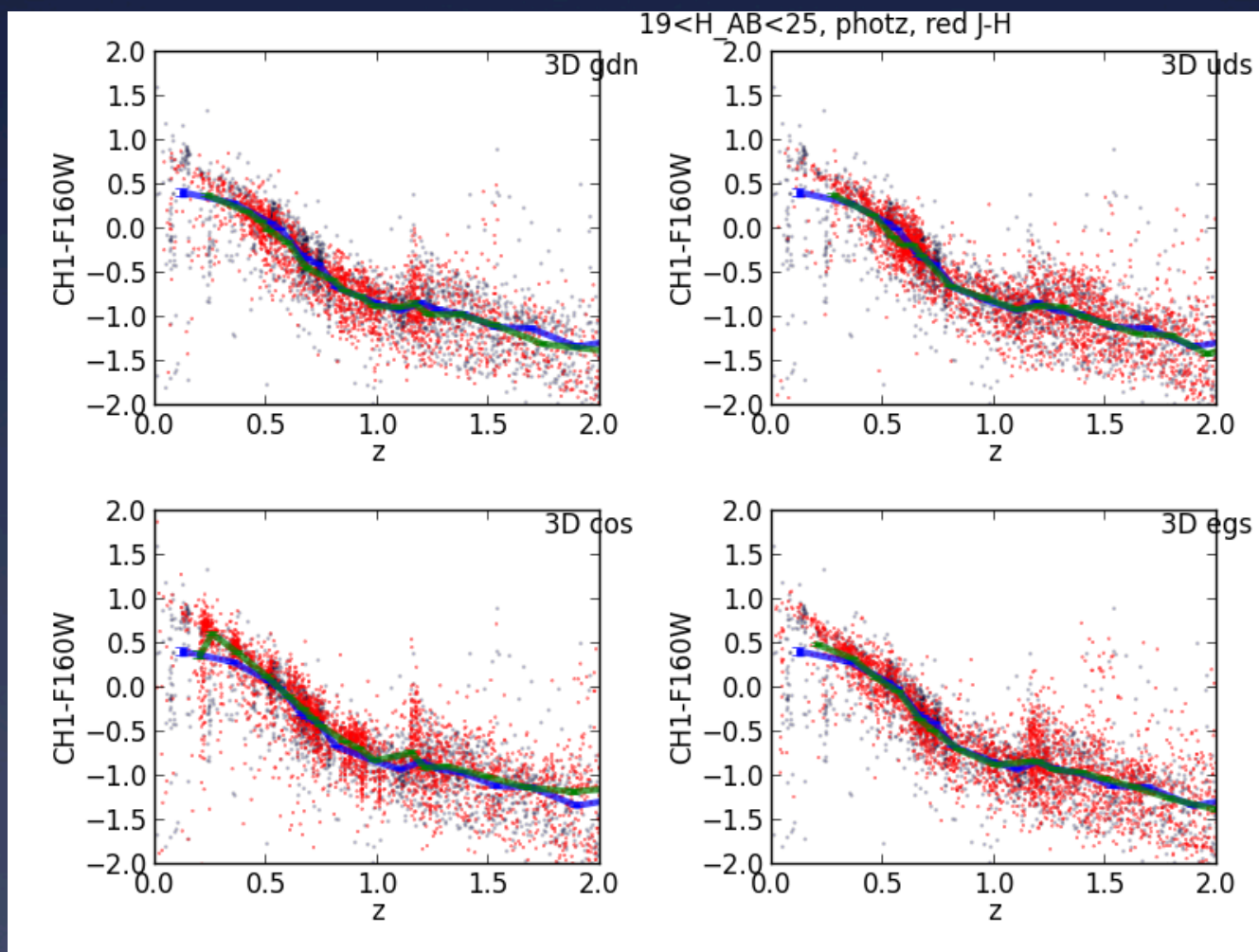
- Photometric redshifts
  - Consensus photometric redshifts
    - Bayesian consensus PDFs in progress
  - Hsu et al. GOODS-S
- SED-fitted parameters
  - Consensus Stellar Masses
    - Still in progress for GOODS-N
  - Individual fitted parameters:
    - Age, timescales, sfr, dust, metallicity...

# Consistency Checks...



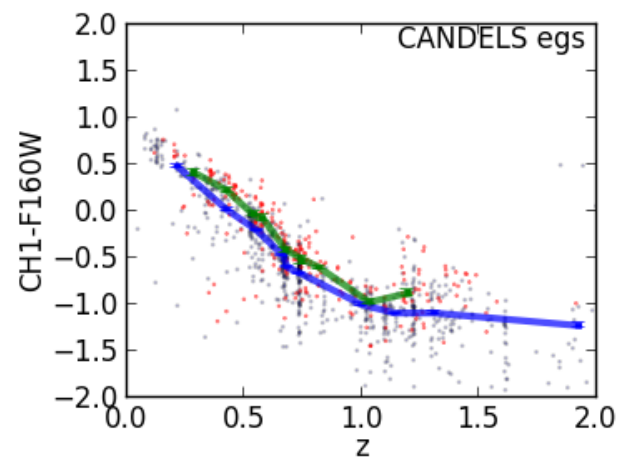
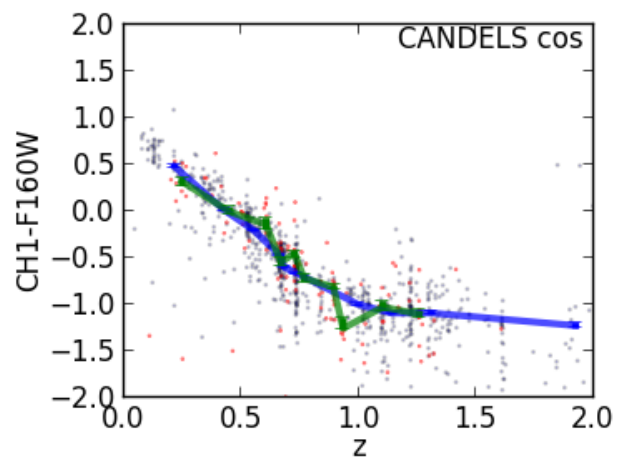
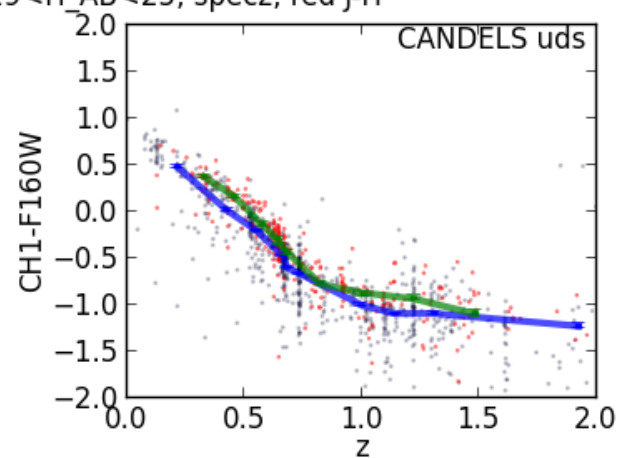
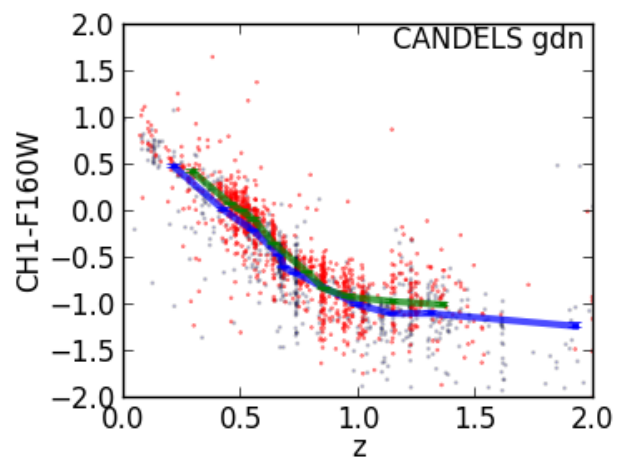
Select roughly the reddest half of the galaxies in J-H,  
S/N > 10 in IRAC 19 < H<sub>AB</sub> < 25

# Consistency checks...

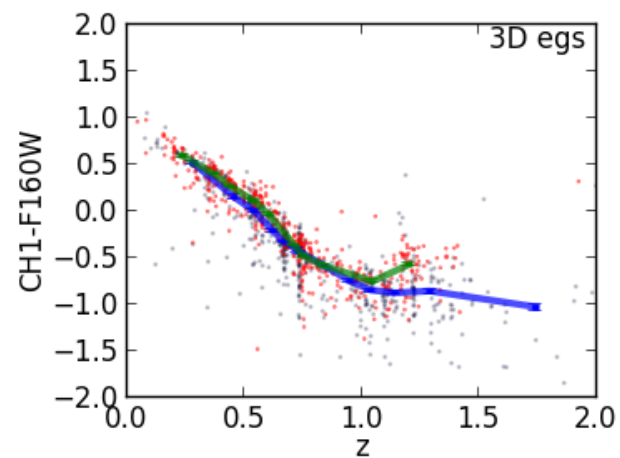
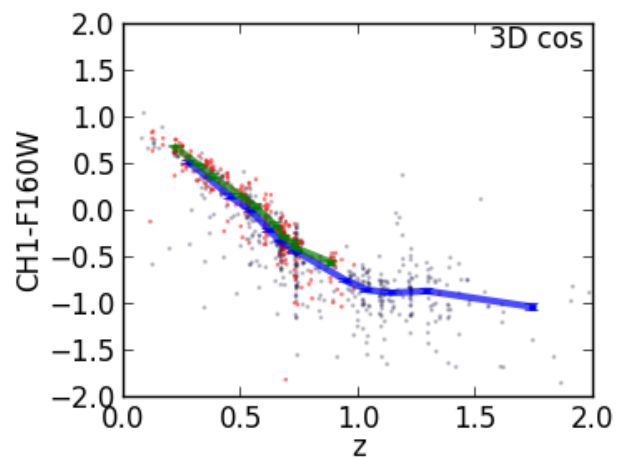
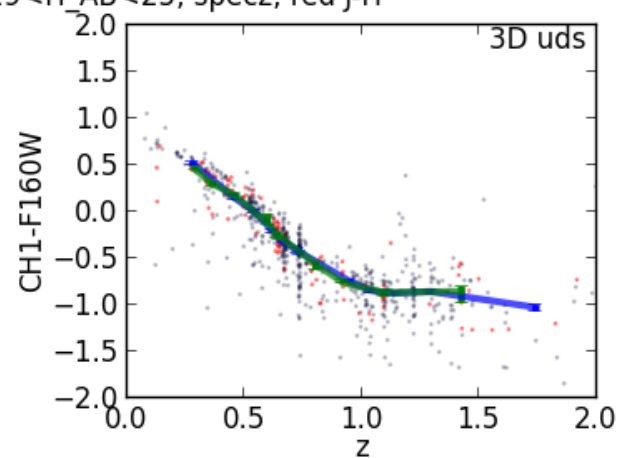
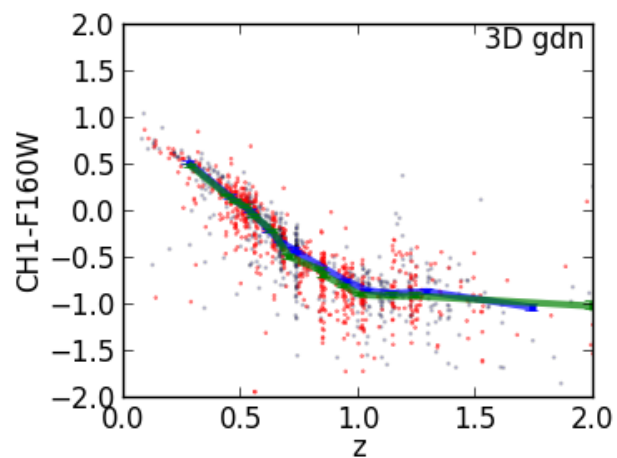




$19 < H_{AB} < 25$ , specz, red J-H



$19 < H_{AB} < 25$ , specz, red J-H



# Stages of Optimization

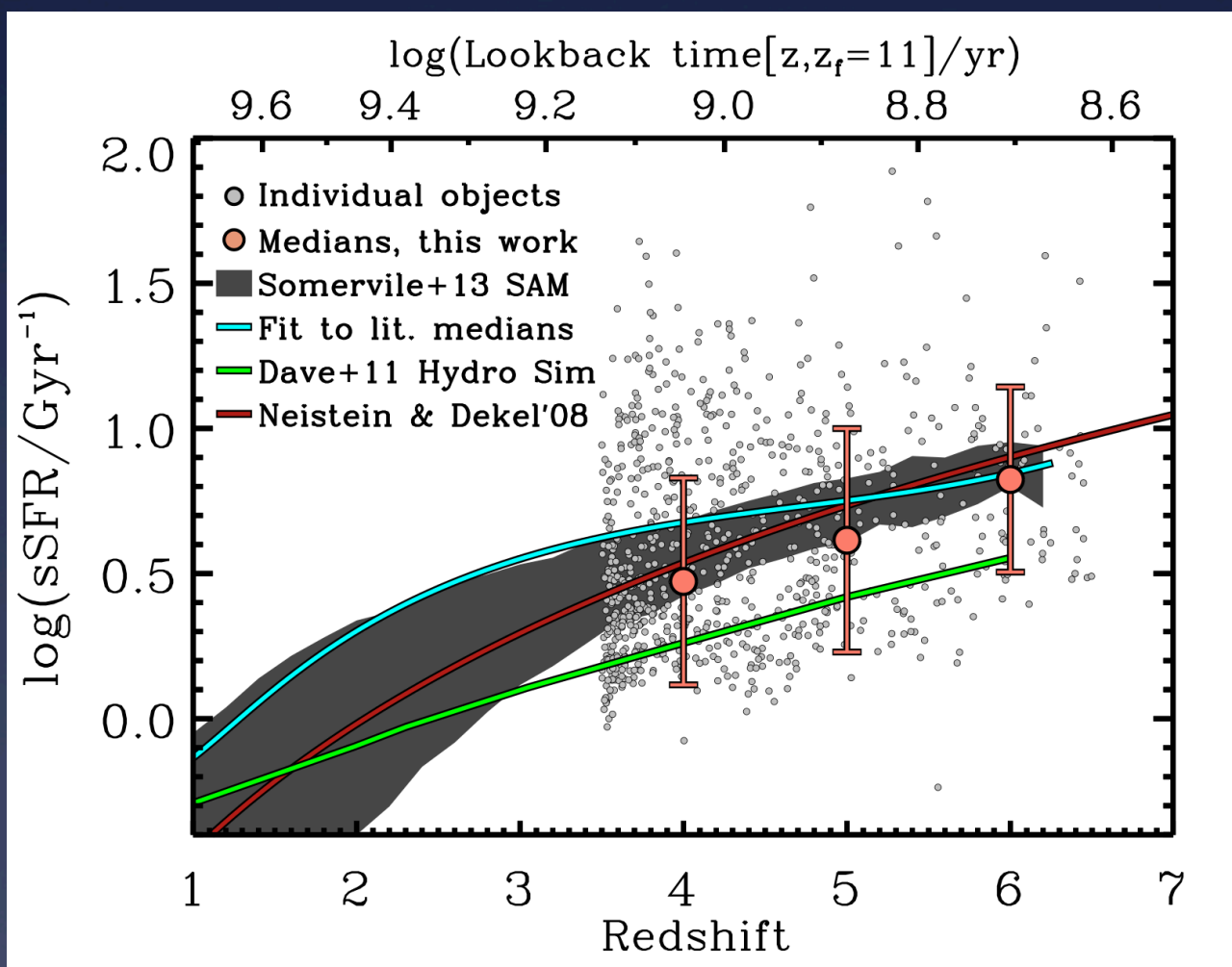
- PSF-matched, matched aperture
  - SExtractor
- Template-fitting with positional priors
  - TFIT, TPHOT
- Deblending using positional and flux priors
  - Challenging!
- Hierarchical parameter estimation
  - Costly!



# A few open science questions

- How stochastic is star-formation?
  - Relative importance of mergers vs. smooth accretion vs. clumpy flows
- How permanent is quenching
  - Are quenched galaxies continually rejuvenated?
- What is the connection between the dusty starburst phase, mergers, and quenching?

# SSFR vs redshift

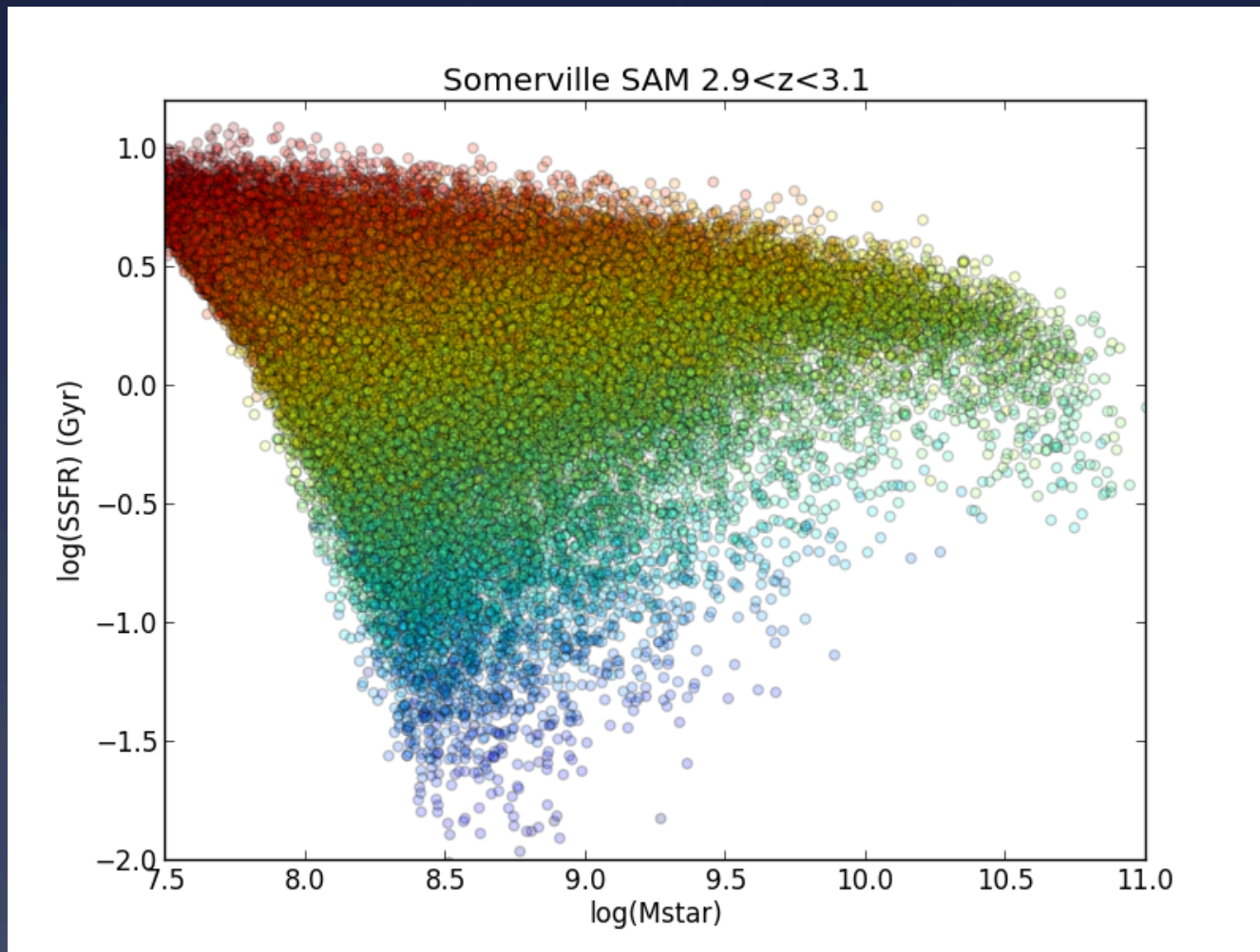


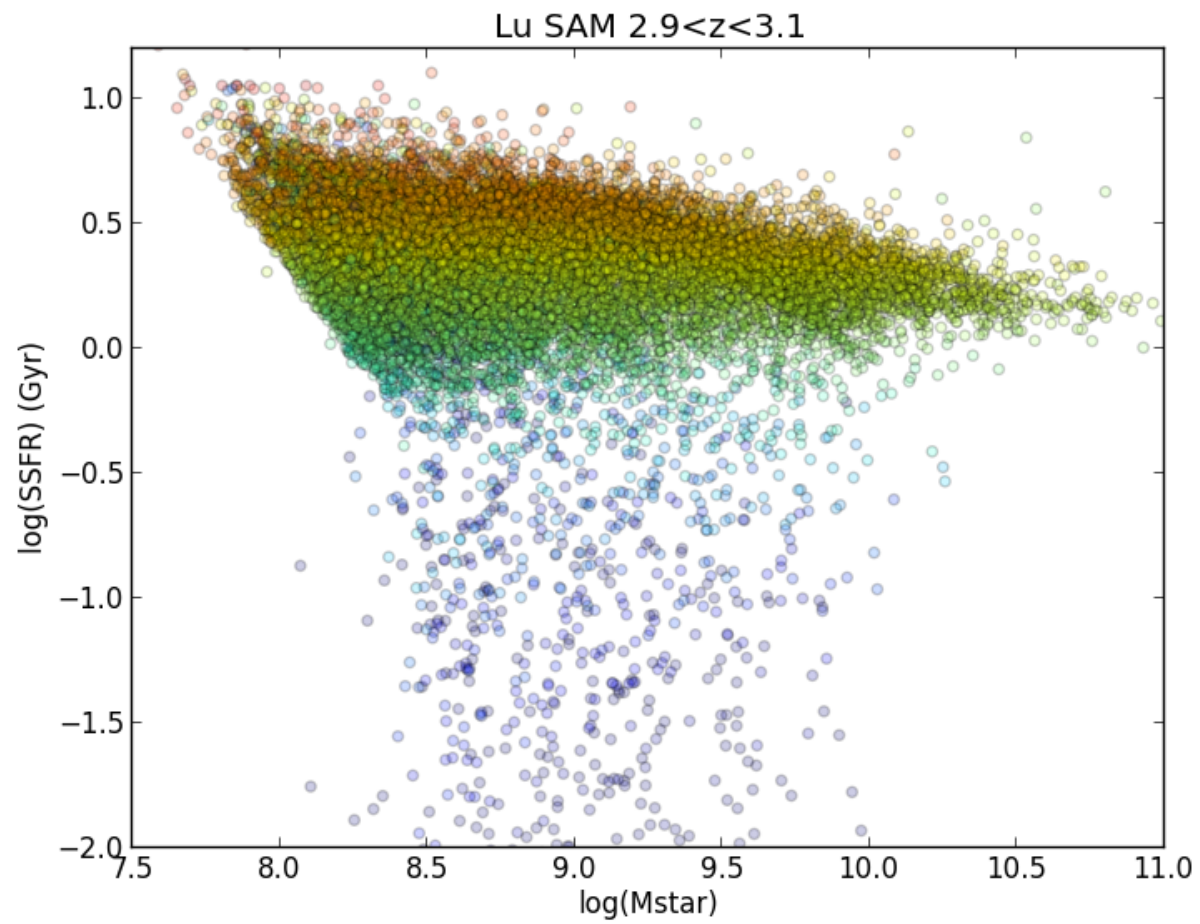
# CANDELS Semi-analytical models & mock catalogs

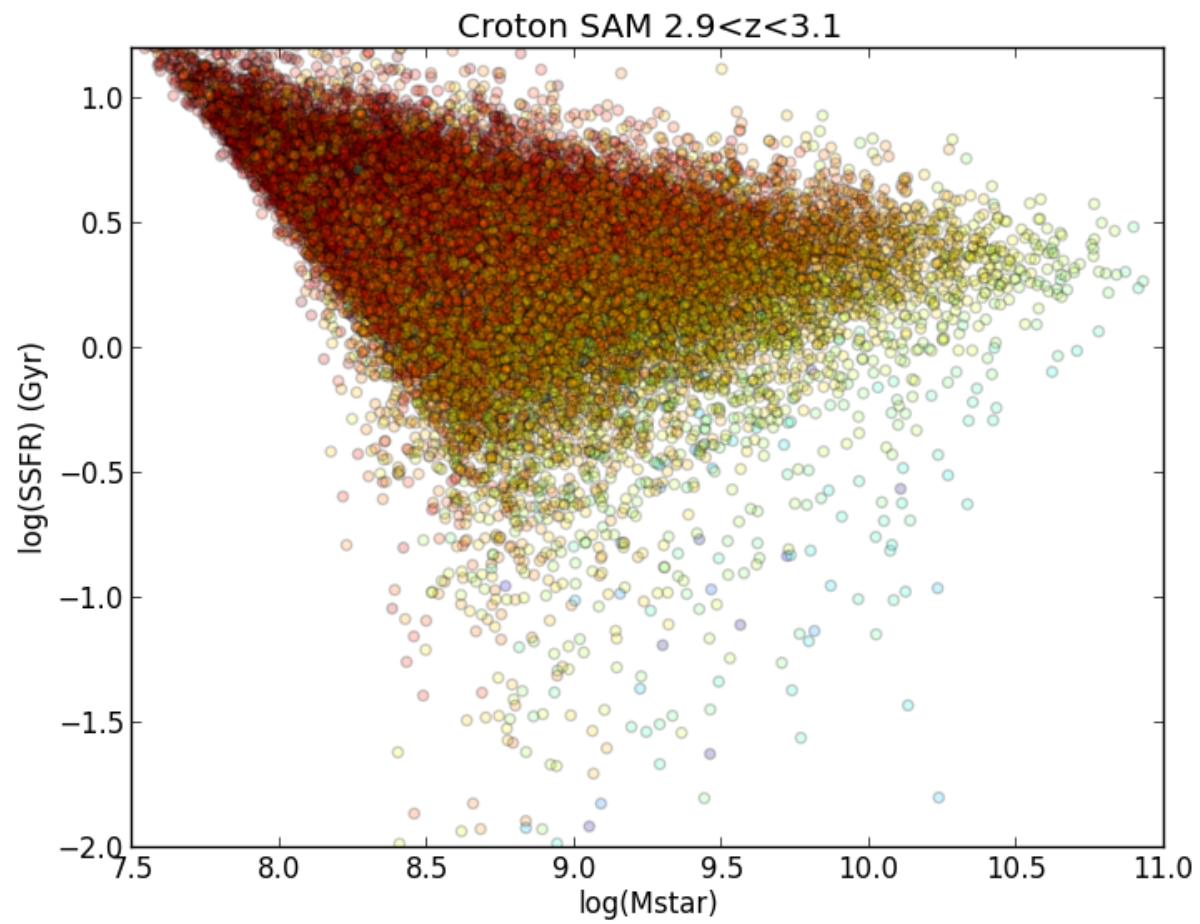
- Three independent SAMs
- Using the same halos from the Bolshoi simulation
- Tuning to match the same  $z=0$  mass function
- Different choices for many of the key parameters



# CANDELS SAM predictions



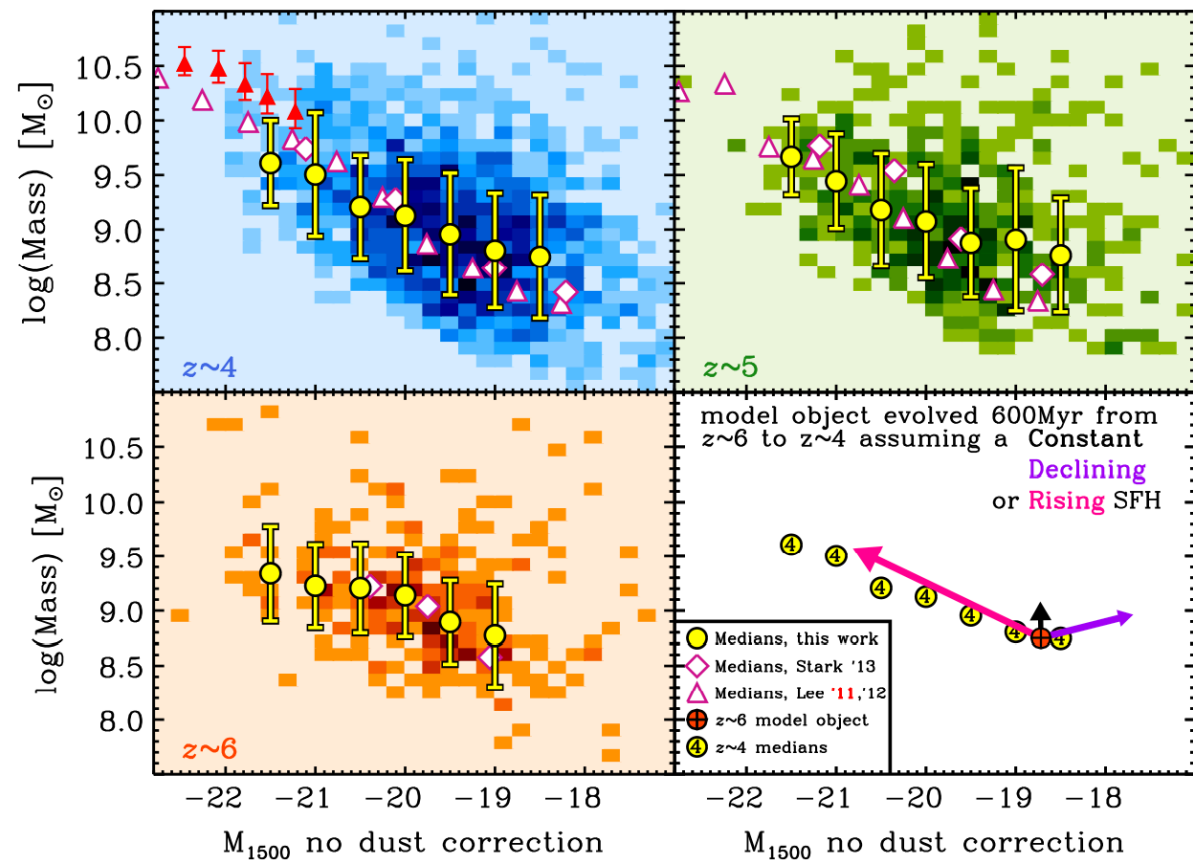




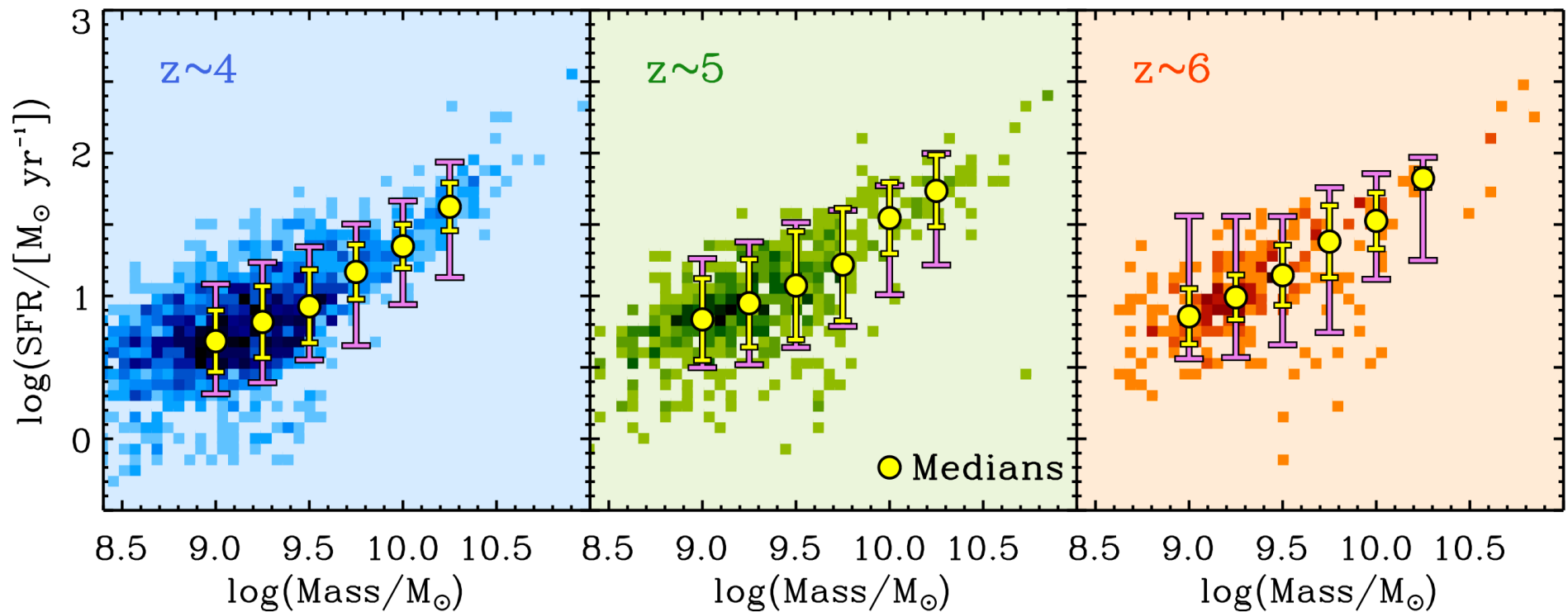


# Derived quantities from observations

Lots of scatter  
in UV  
luminosity at  
fixed mass



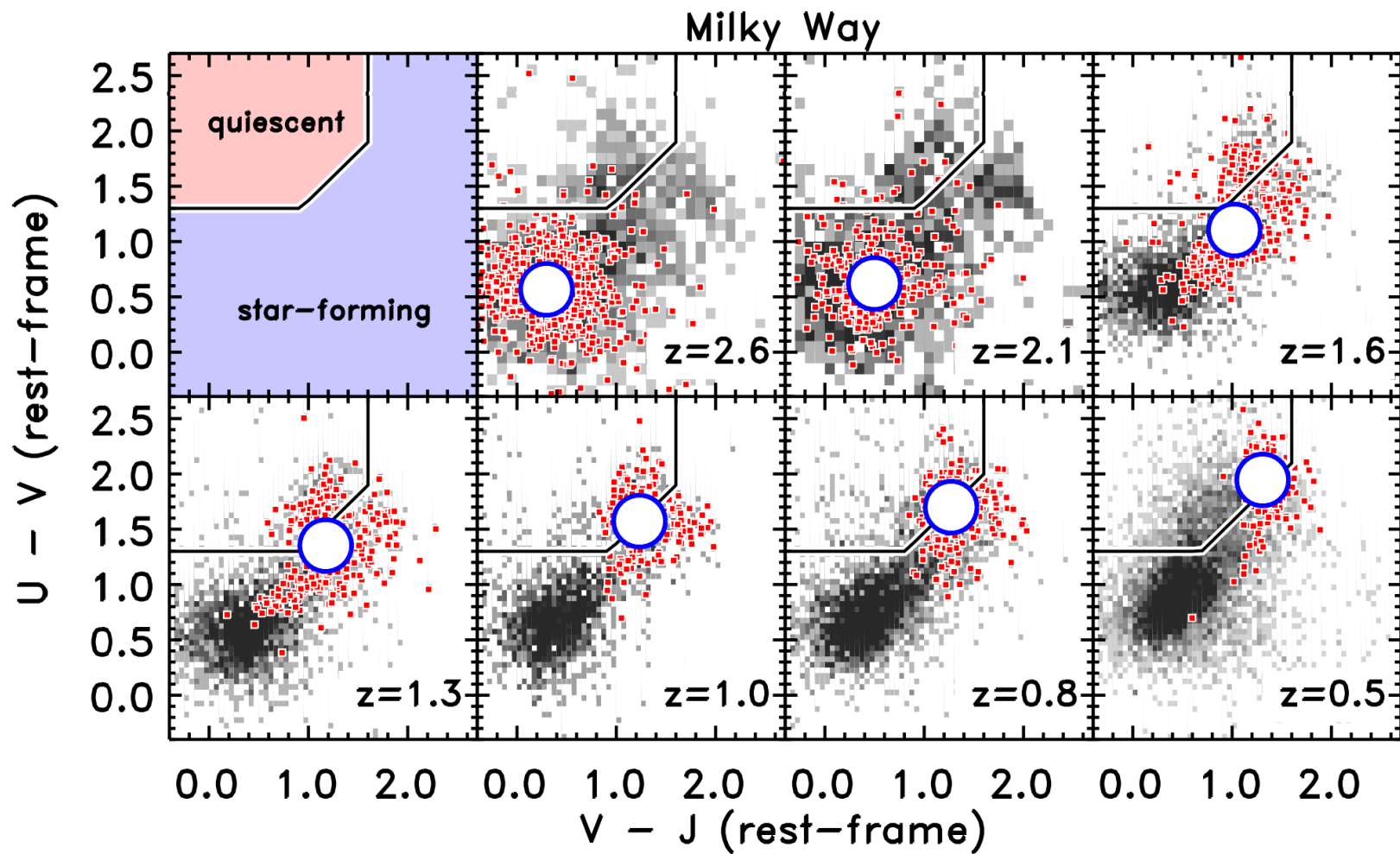
Salmon+15



Scatter in SFR at fixed  $M$  appears very small after correcting for extinction. Is this real, or due to correlated errors?

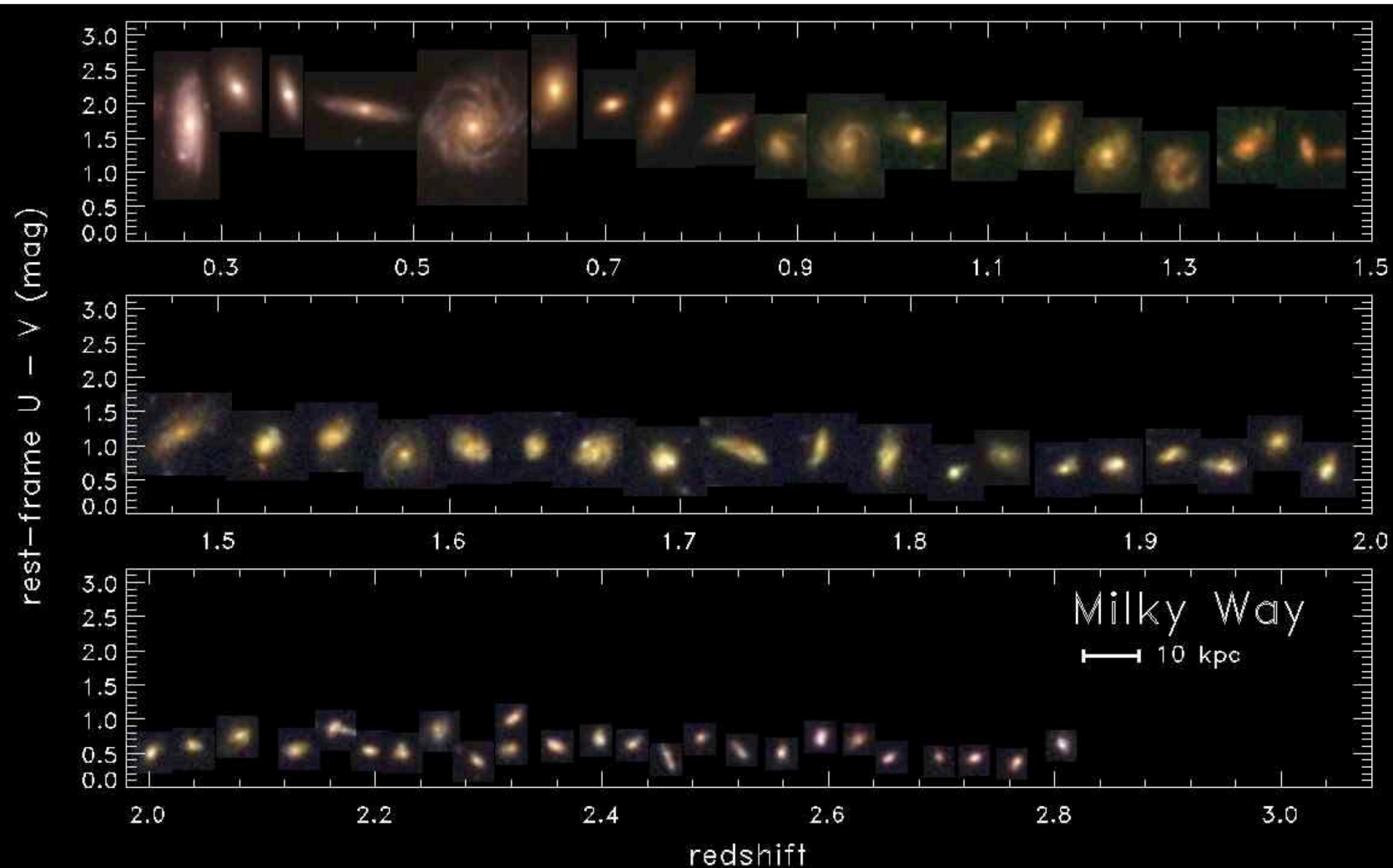
Salmon+15

# What did the Milky Way look like 11 billion years ago?



Papovich+14 (CANDELS + ZFOURGE)  
Also Van Dokkum+ 13 3D-HST

# What did the Milky Way look like 11 billion years ago?

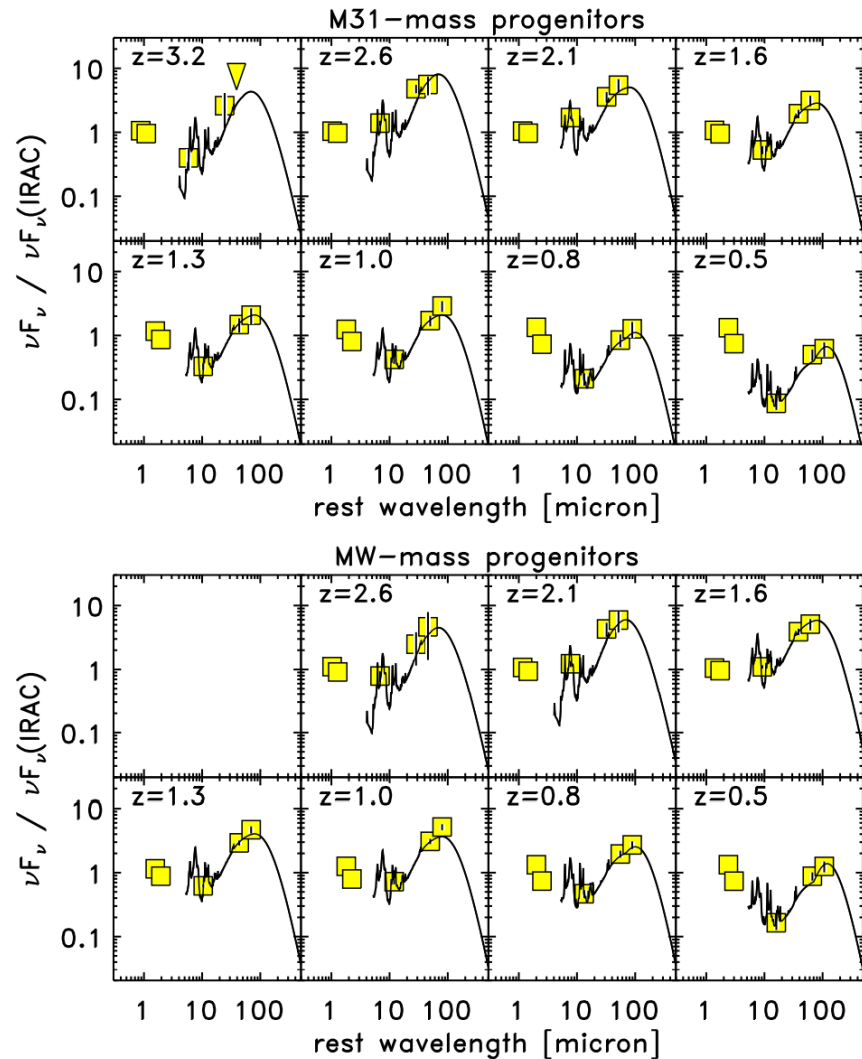




# Stacked SEDs

Stacked SEDs of M31  
and Milky-Way-mass  
progenitors

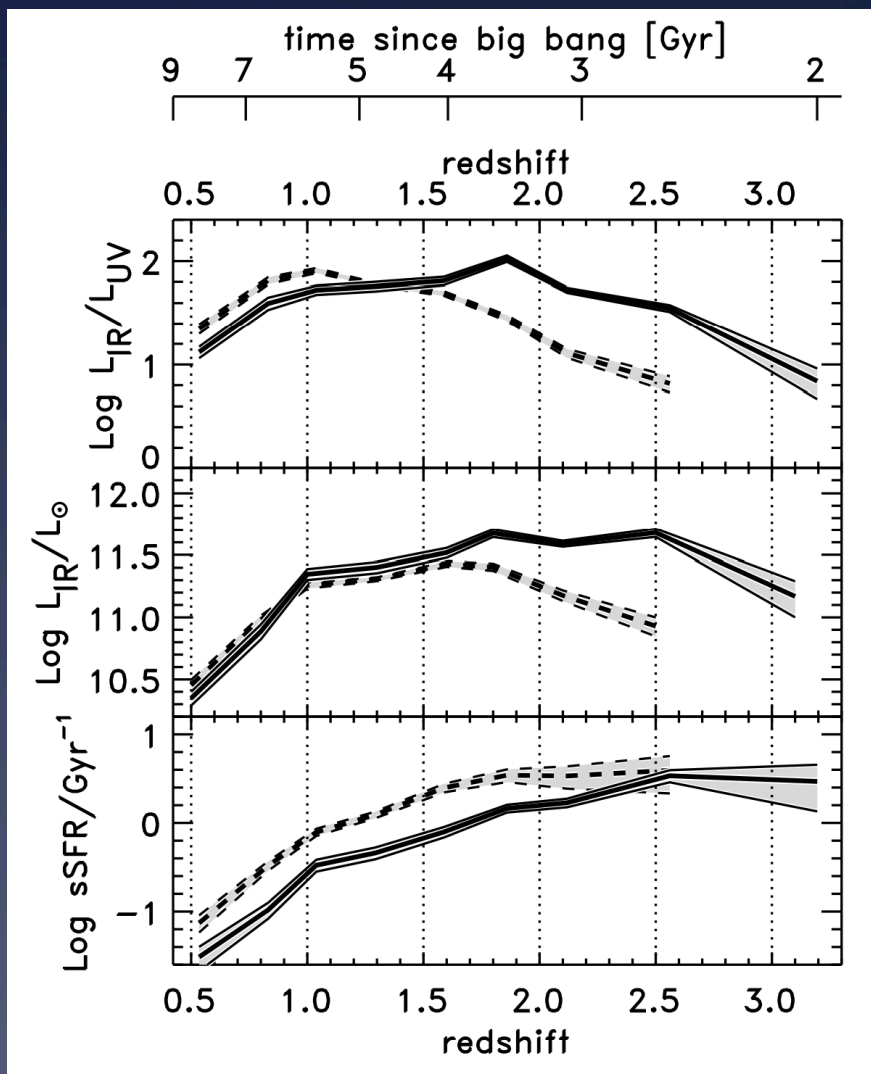
Next step: constrain  
the dispersion



# Evolution $L_{UV}$ , $L_{IR}$ , SSFR

Stacked SEDs of M31  
and Milky-Way-mass  
progenitors

Next step: constrain  
the dispersion



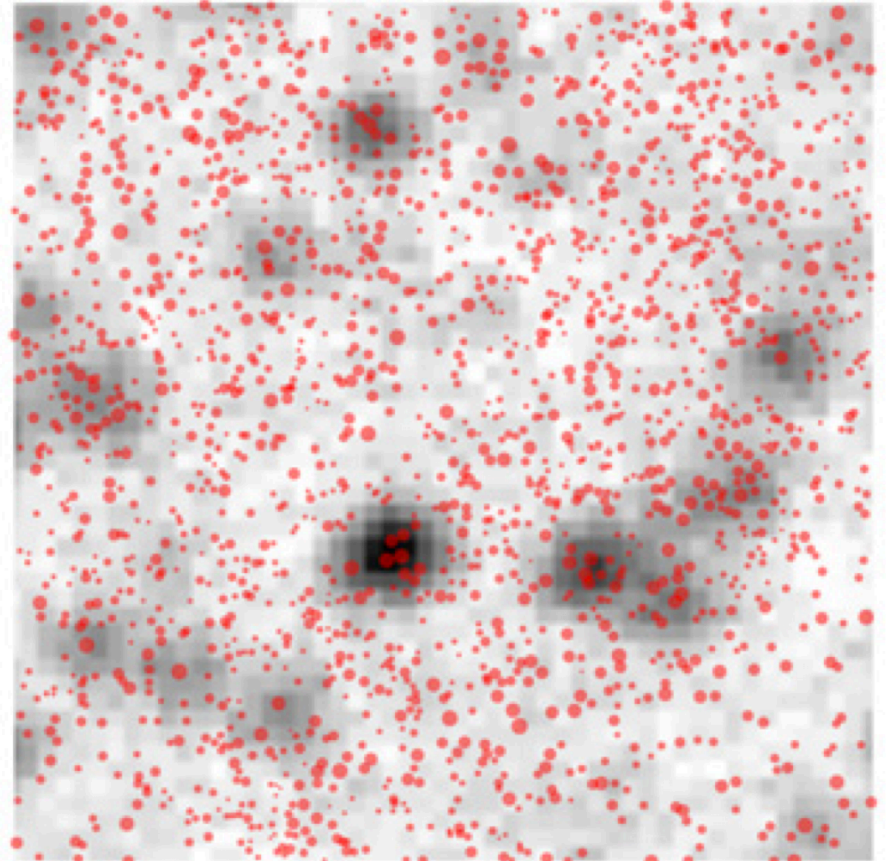
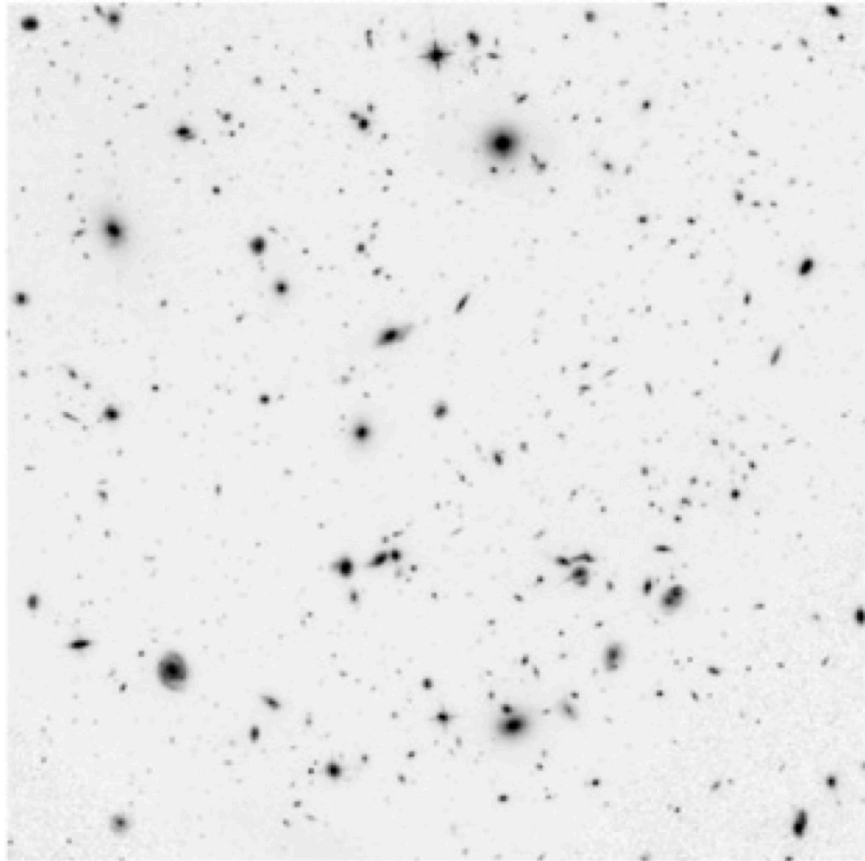
# Important next step: constraining the scatter in far- IR fluxes

## Approaches:

- Variance of stacks (Schreiber+ 15)

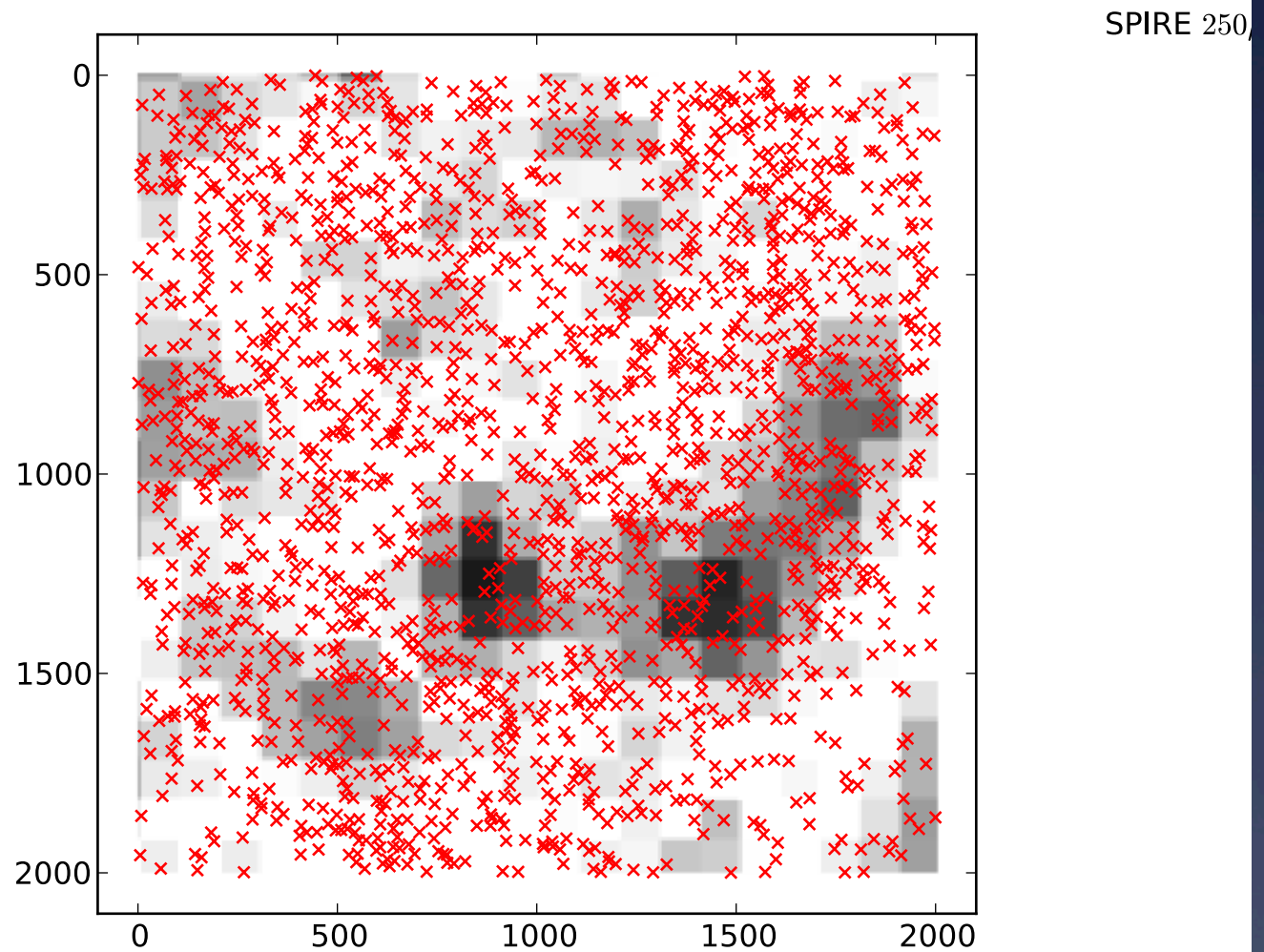
- Bayesian deconfusion (Safarzadeh+ in prep)

# Herschel Deconfusion

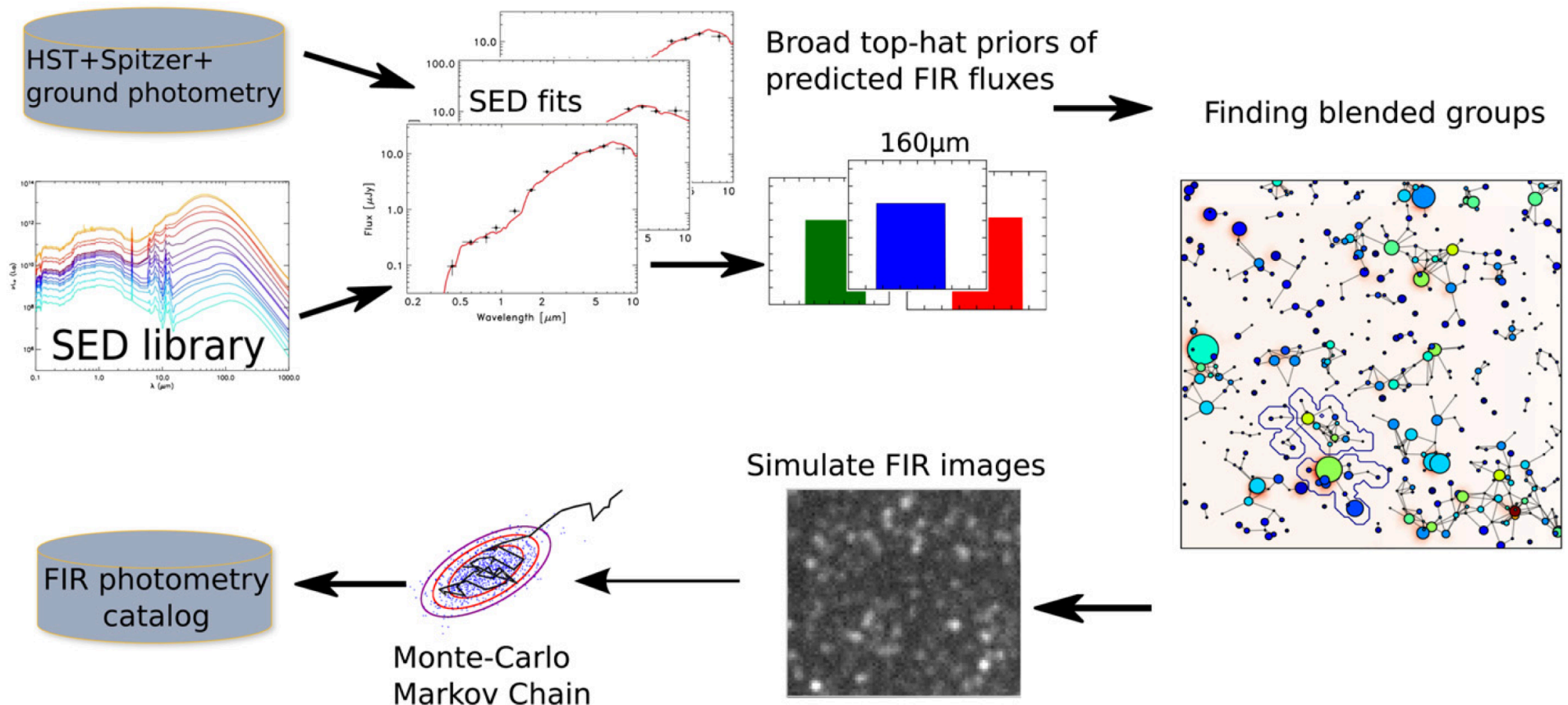


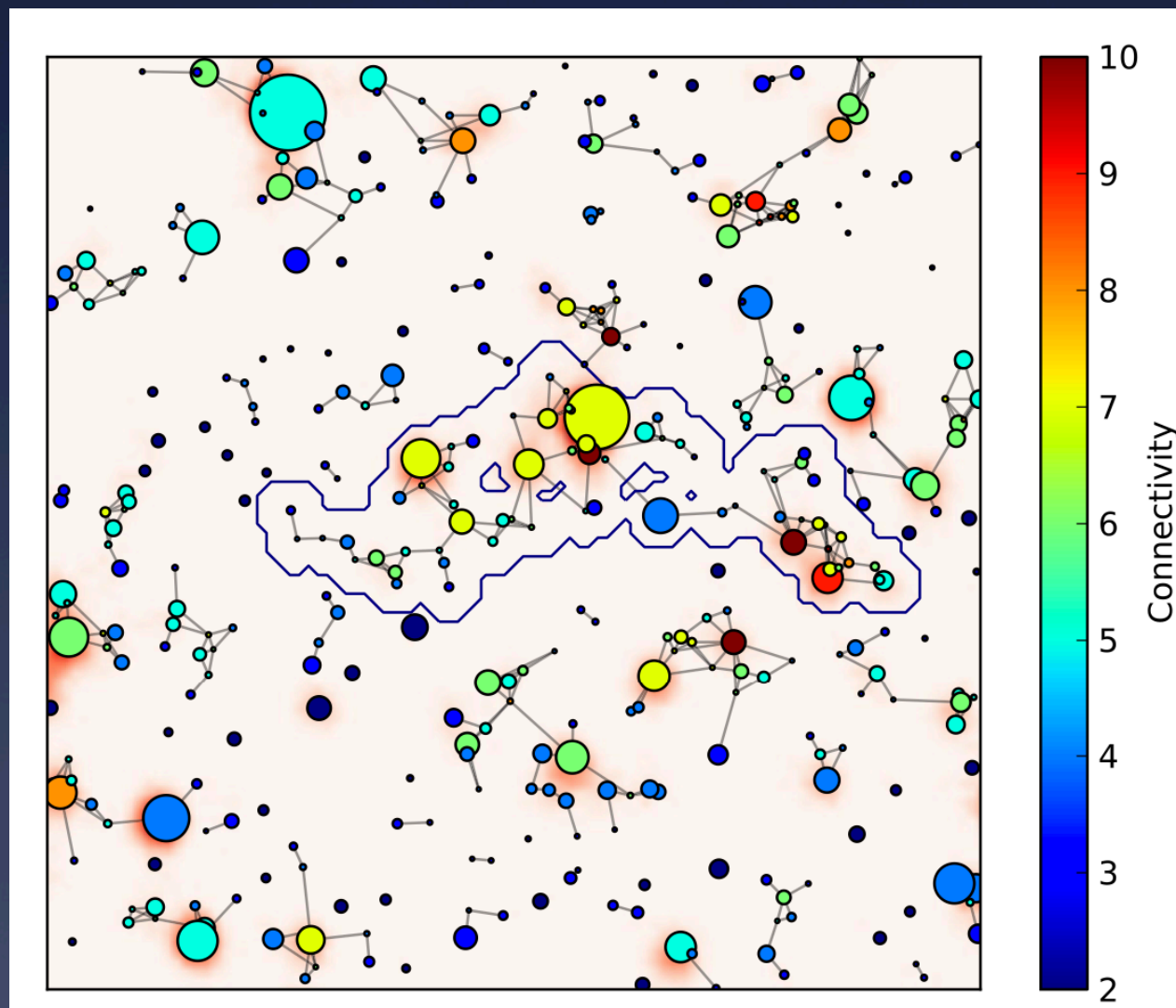


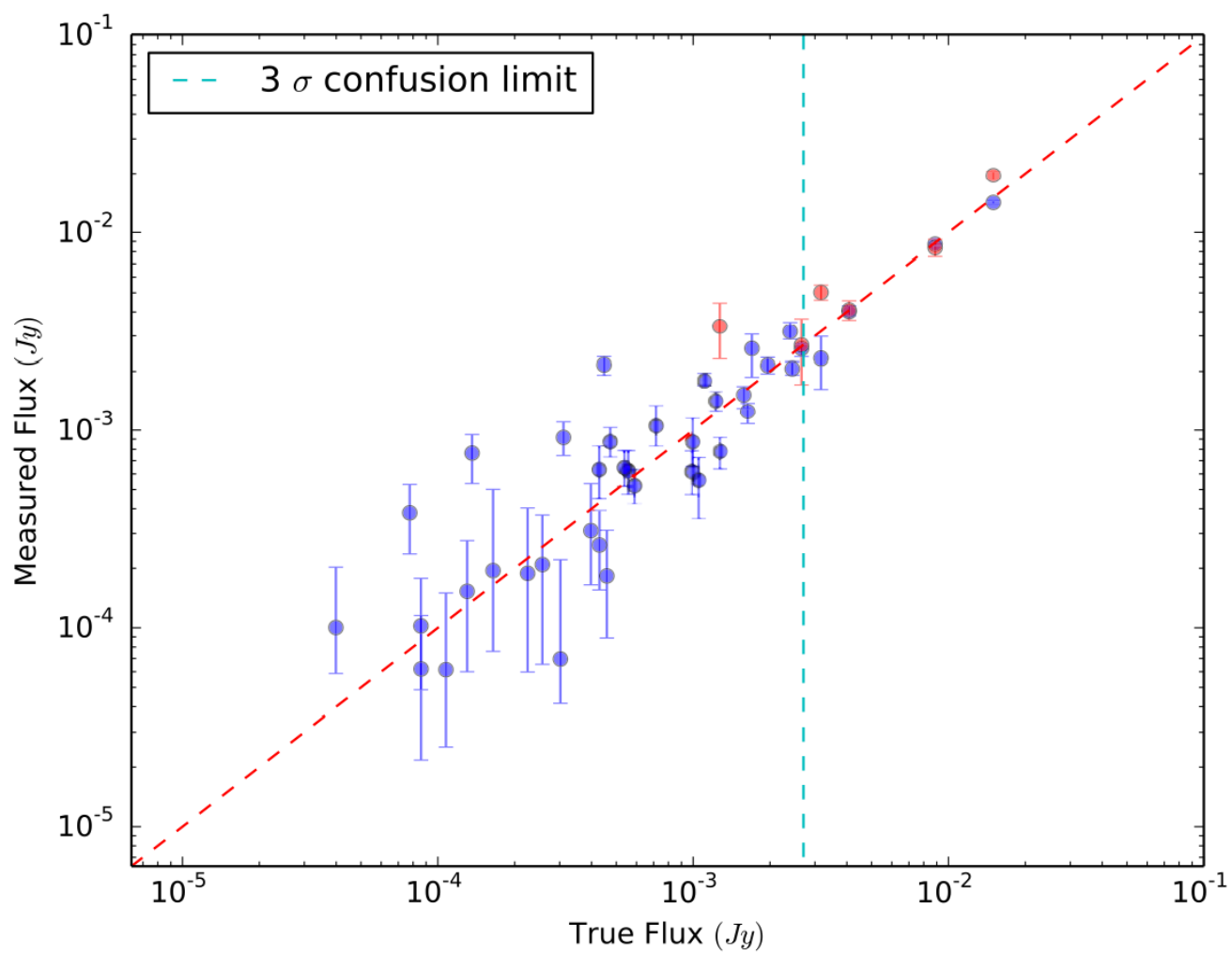
# Herschel Deconfusion



# Flux priors and graphical segmentation

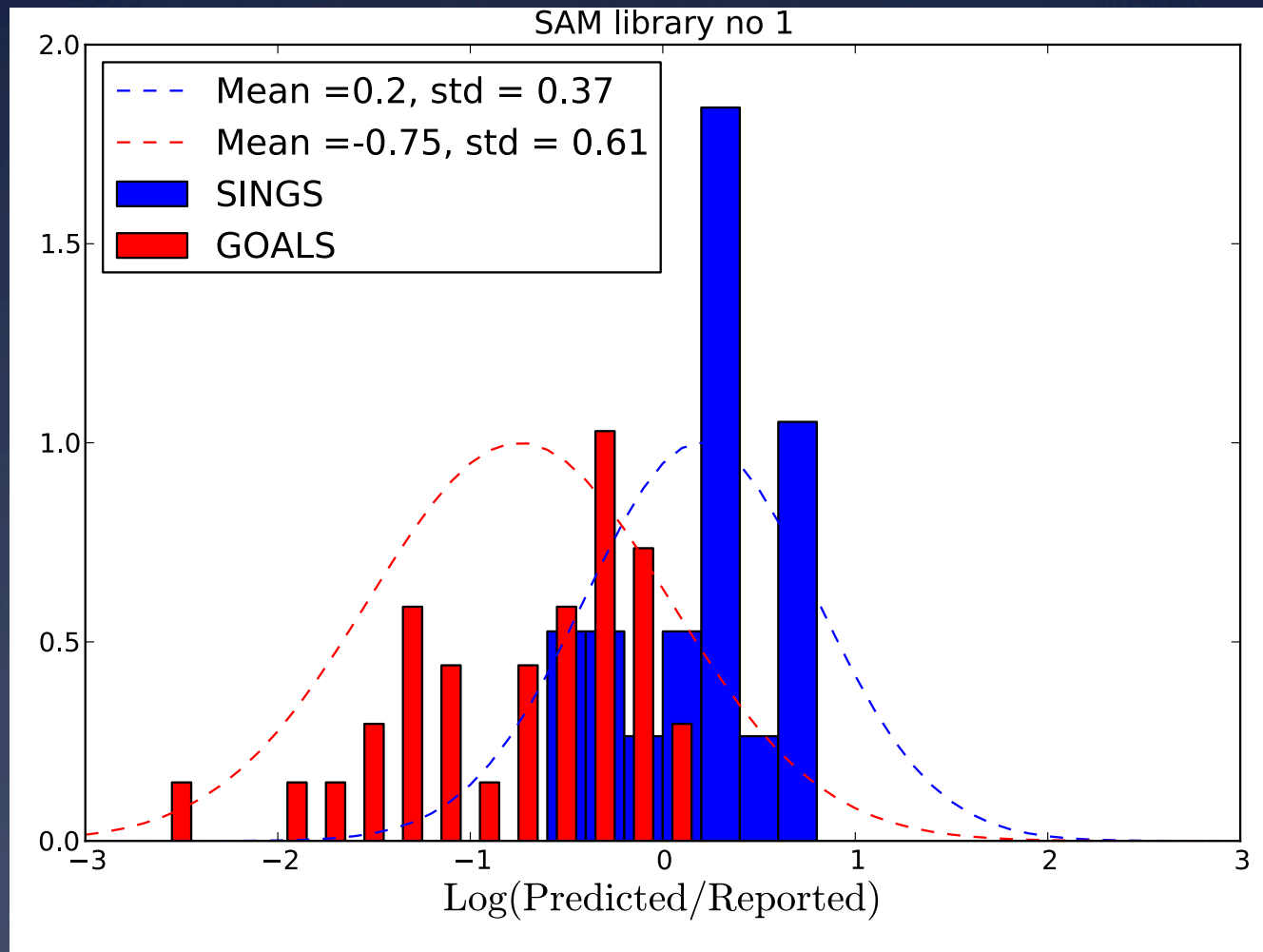




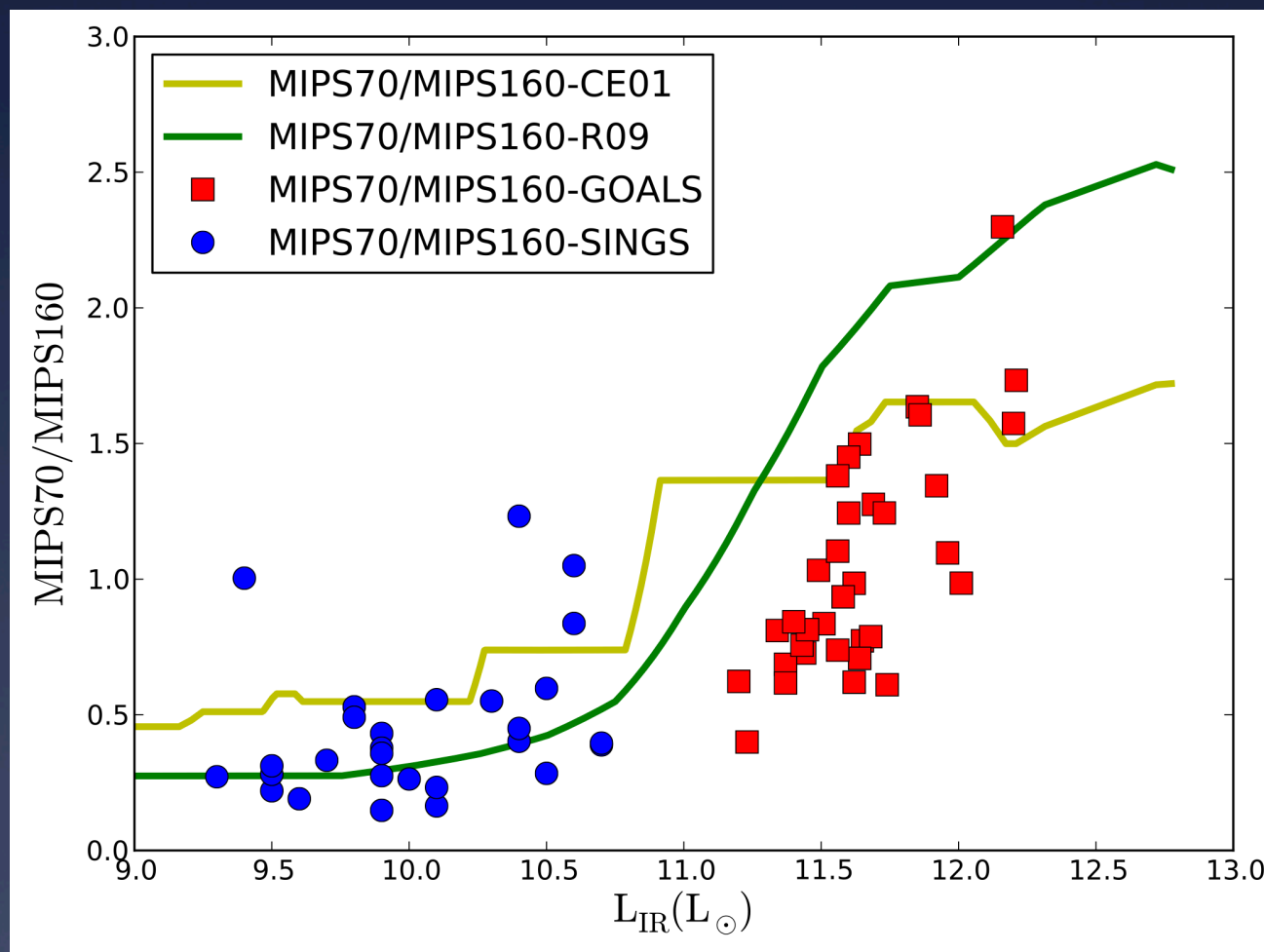




# How well can we predict the FIR from just the UV-optical SED?



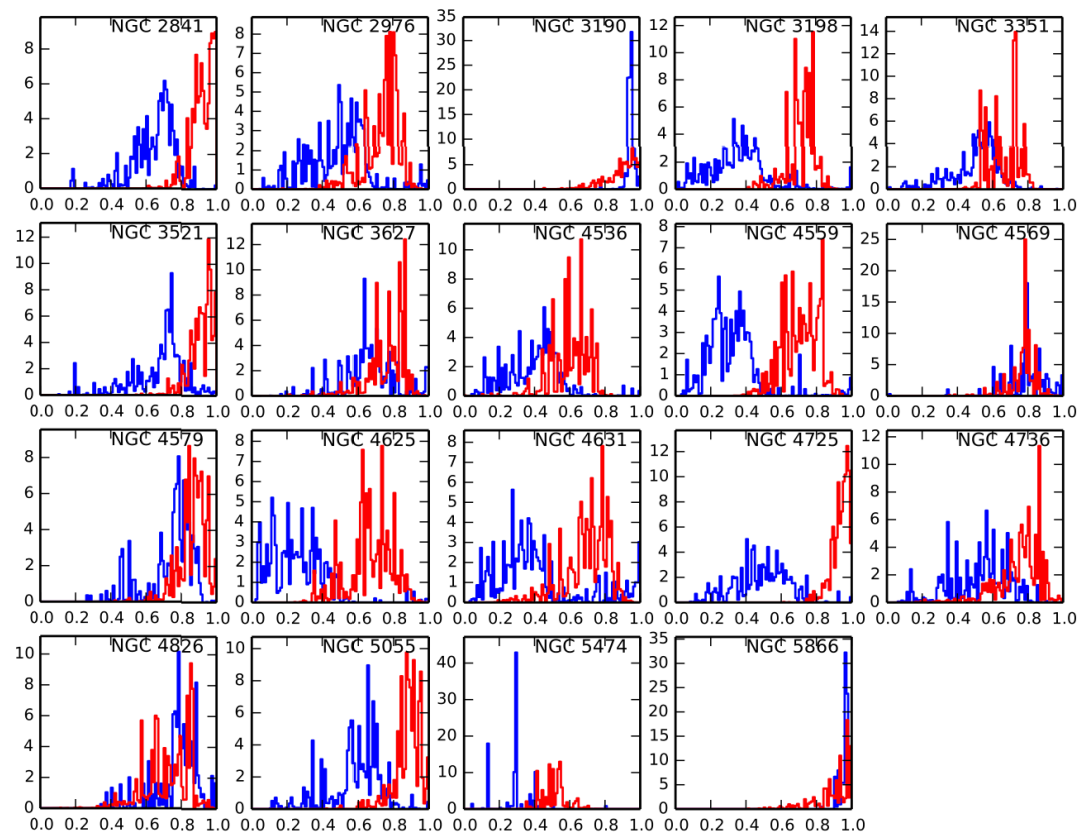
# How about the Far-IR colors?



GOALS photometry: Galaxies are redder in the FIR than standard templates predict

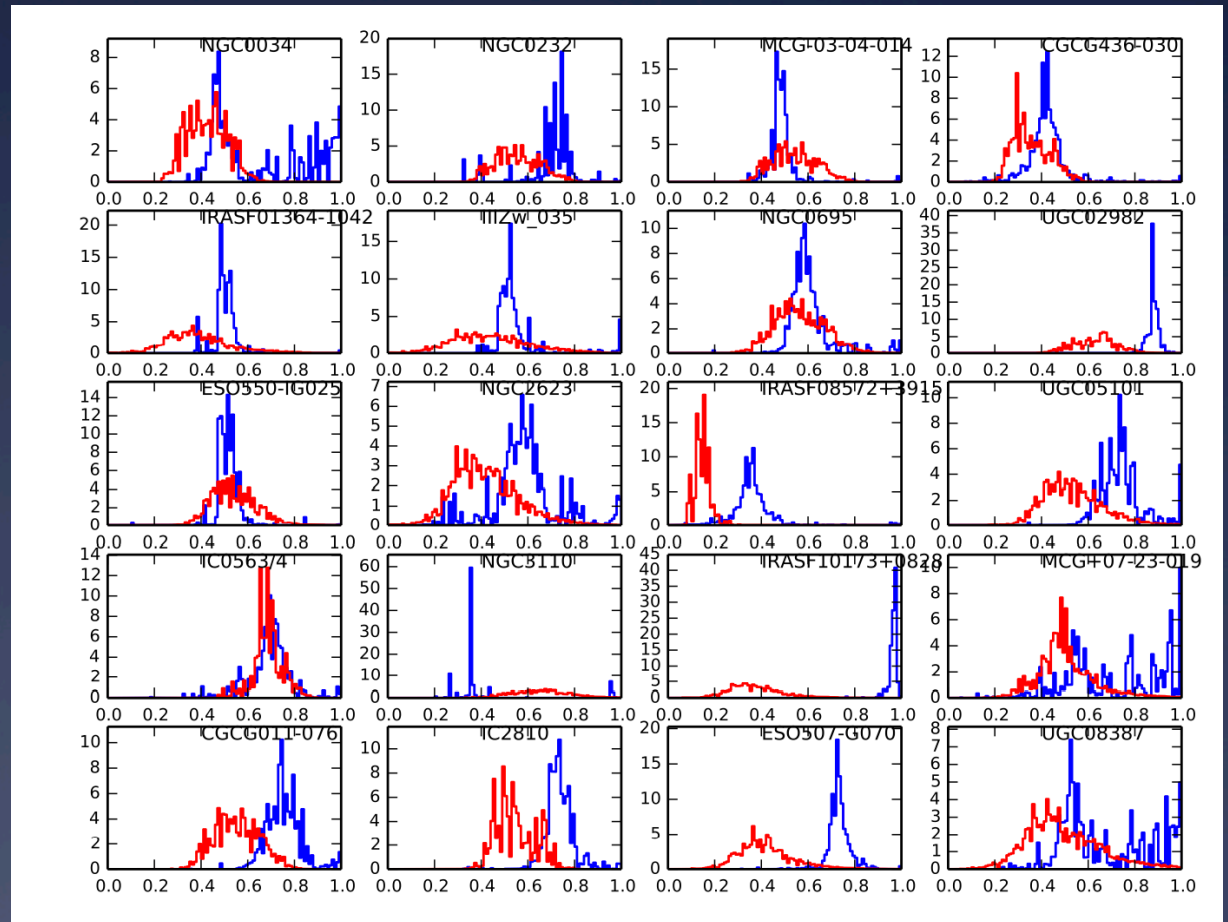
# Magphys: matching the optical and FIR libraries based on $f_{\mu}$

SINGS:  $f_{\mu}$  from the optical is typically lower than  $f_{\mu}$  from the FIR  
=> Larger contribution from diffuse ISM than inferred from optical SED



# Magphys: matching the optical and FIR libraries based on $f_{\mu}$

GOALS:  $f_{\mu}$  from the optical is typically higher than  $f_{\mu}$  from the FIR  
=> Smaller contribution from diffuse ISM than inferred from optical SED

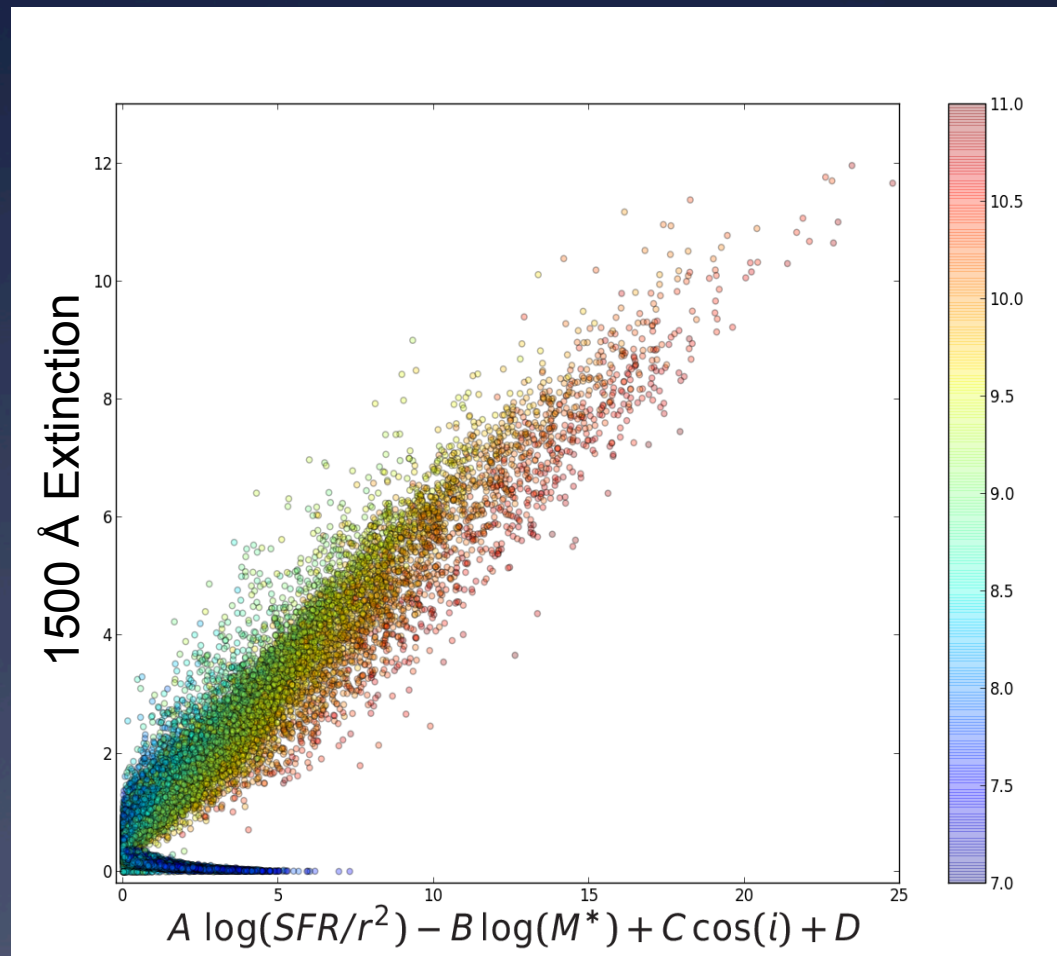




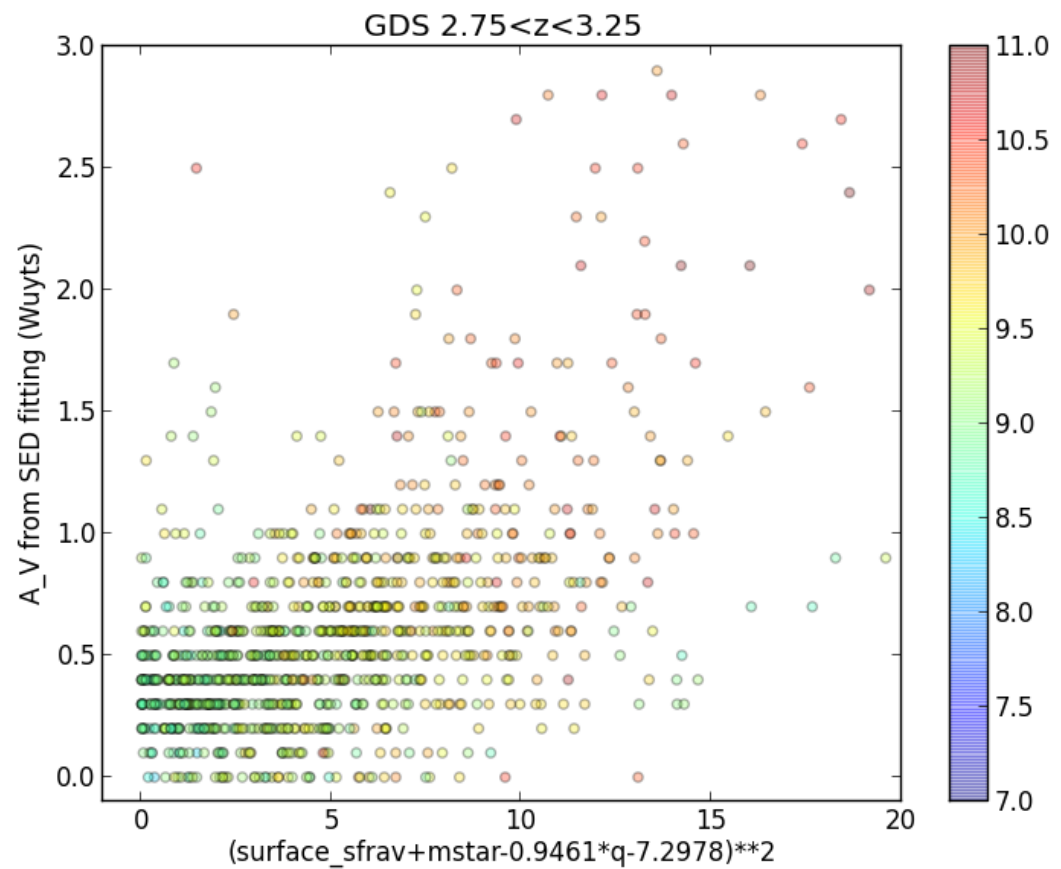
# Extinction: Expected behavior

In the models,  
extinction scales  
with the column-  
density of metals

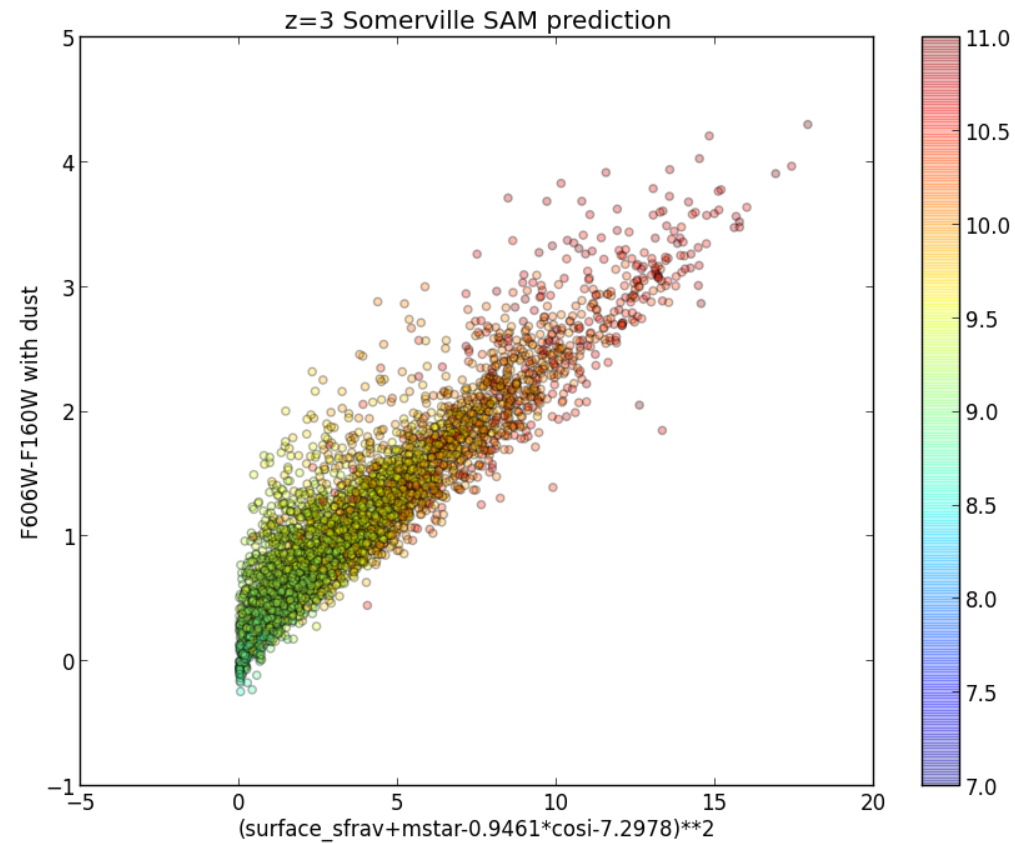
Observable proxies:  
star-formation-rate  
surface density,  
stellar mass, and  
inclination



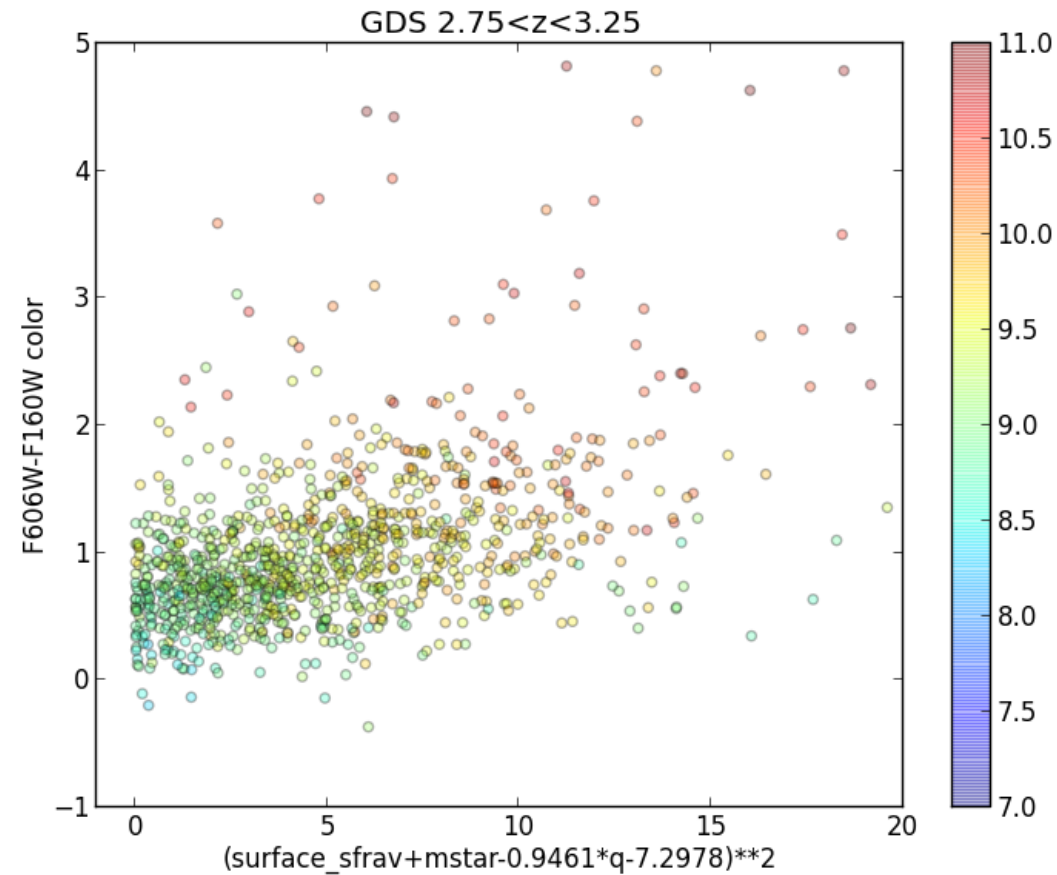
# Extinction: Observed trend



# Extinction: Expected behavior



# Extinction: Observed trend



# The plan

- Use the observations to constrain the parameters of:
  - Dust model (simple physically-motivated parametrization)
  - Star-formation histories
  - Scatter

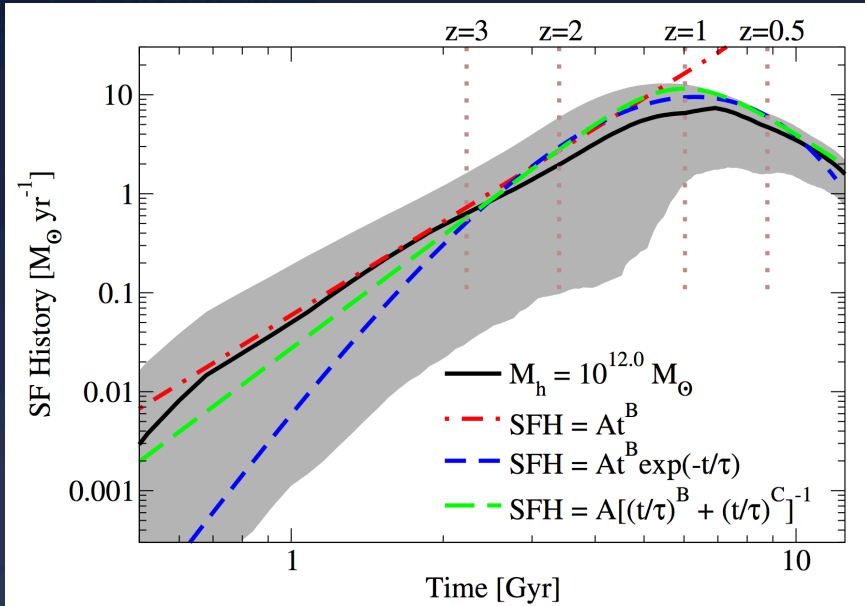
- Bayesian hierarchical model:

$$P(\phi, \theta_j \mid y) \propto P(y_j \mid \theta_j) P(\theta_j, \phi)$$

- Progress report...



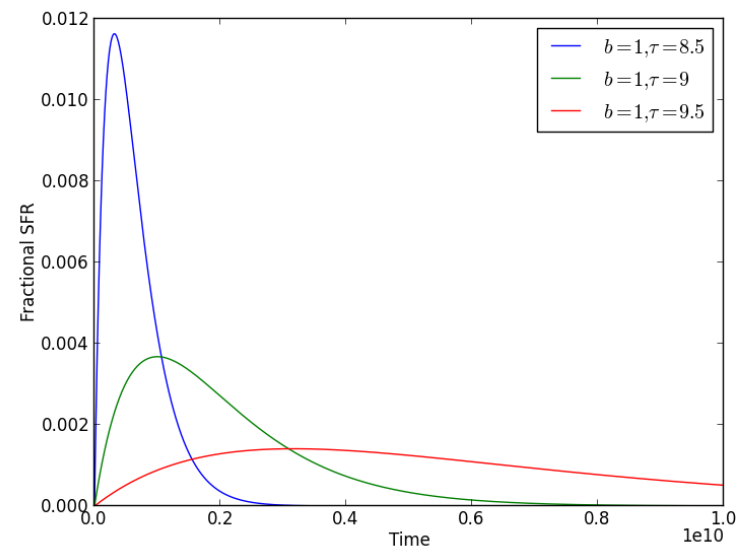
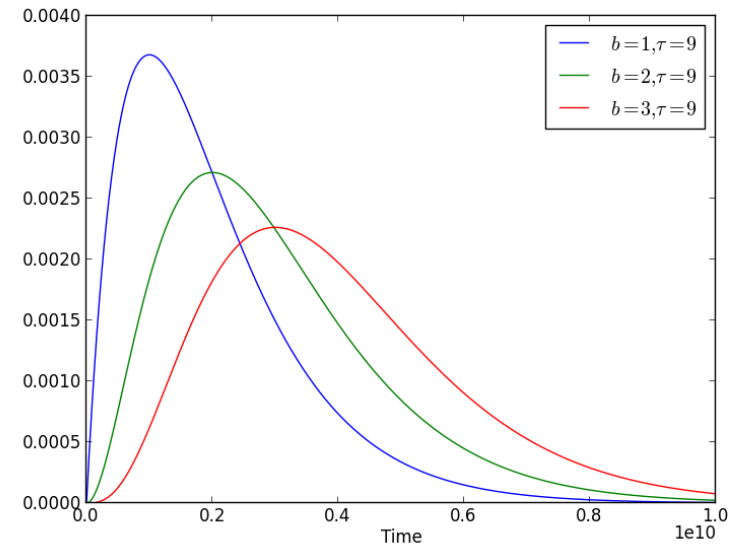
# Parametrized SFR



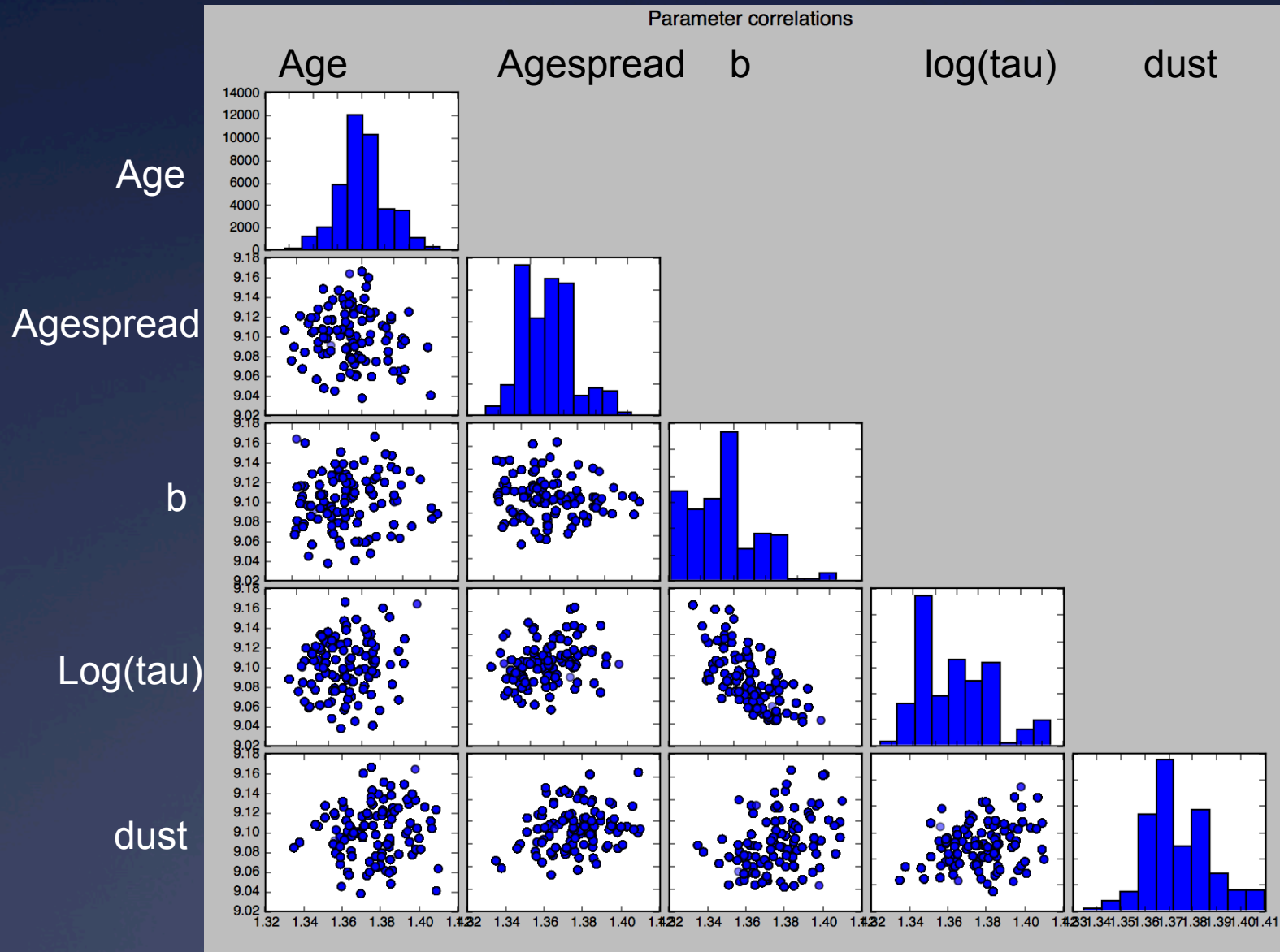
Behroozi+ 13

Simple two-parameter model:  
 $\text{SFR} = t^b \exp(-t/\tau)$

Additional parameters:  
 Age, age spread  
 Dust --- scale tau of Charlot &  
 Fall model



# Test with fake SEDs (5% errors)



# Summary

- Need to take advantage of reasonable priors to push the data to the limits.
- Essential for constraining intrinsic scatter in physical parameters
- Scatter can be part of the hierarchical model