

# Models of the CO background via Measurements of the Cosmic Infrared Background

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w/  
w/

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Dongwoo Chung (KIPAC/Stanford)  
and the COMAP and TIME Collaborations

# Motivation: Typical CO Model Design

et al. 2000; Rowan-

mass function, which  
Magnelli et al. 2012;  
Behroozi et al. (2013a).  
a recent comprehen-  
MF for high-redshift  
cone of this paper. In

Not all halos the  
same (*assembly*  
bias): *Add scatter.*

Not all galaxies  
star-forming: *Add  
scatter.*

be absorbed into  $\sigma_{\text{SFR}}$

Luminosity  
minosity, we assume

$L_{\text{CO}}$  (units of  $L_{\odot}$ ) is

$$L_{\text{CO}} = 4.9 \times 10^{-5} L_{\odot} \left( \frac{\nu_{\text{CO,rest}}}{115.27 \text{ GHz}} \right)^3 \left( \frac{L'_{\text{CO}}}{\text{K km s}^{-1} \text{ pc}^2} \right) \quad (4)$$

Tony Li et al. 2016

where  $\nu_{\text{CO,rest}} = 115.27 \text{ GHz}$  is the rest-frame frequency of the CO transition.

To resummarize the model:

1. Halos  $\rightarrow$  SFR: Get  $\overline{\text{SFR}}(M, z)$  from the results of Behroozi et al. (2013a)
2. Add log-scatter,  $\sigma_{\text{SFR}}$
3. SFR  $\rightarrow L_{\text{IR}}$ : Get  $L_{\text{IR}}$  from  $\text{SFR} = \delta_{\text{MF}} \times 10^{-10} L_{\text{IR}}$
4.  $L_{\text{IR}} \rightarrow L'_{\text{CO}}$ : Get  $L'_{\text{CO}}$  from  $\log L_{\text{IR}} = \alpha \log L'_{\text{CO}} + \beta$
5. Add log-scatter,  $\sigma_{L_{\text{CO}}}$

with fiducial parameter values:

$$\sigma_{\text{SFR}} = 0.3, \sigma_{L_{\text{CO}}} = 0.3,$$
$$\delta_{\text{MF}} = 1.0, \alpha = 1.37, \beta = -1.74.$$

Figure 2 shows the combined result of these steps, plotting the mean  $L_{\text{CO}}(M_h)$  relation from our fiducial model, as well as the equivalent relation from previous studies. Notably,  $L_{\text{CO}}$  in this model is not linear in  $M$ , a simplifying assumption that has

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mass function, which Magnelli et al. 2012; Behroozi et al. (2013a). a recent comprehensive model for high-redshift scope of this paper. In these quoted above, we find  $\delta_{\text{MF}} = 0.0 \pm 0.3$  in the prior's  $\pm 3\sigma$  interval

be written as explicitly accounts as opposed to active simplicity, we have out Equation (1) due be absorbed into  $\sigma_{\text{SFR}}$

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**Stellar Mass –  $M^*$**

**Use empirically derived**

**$L_{\text{IR}}(z, M^*)$**

with fiducial parameter values:

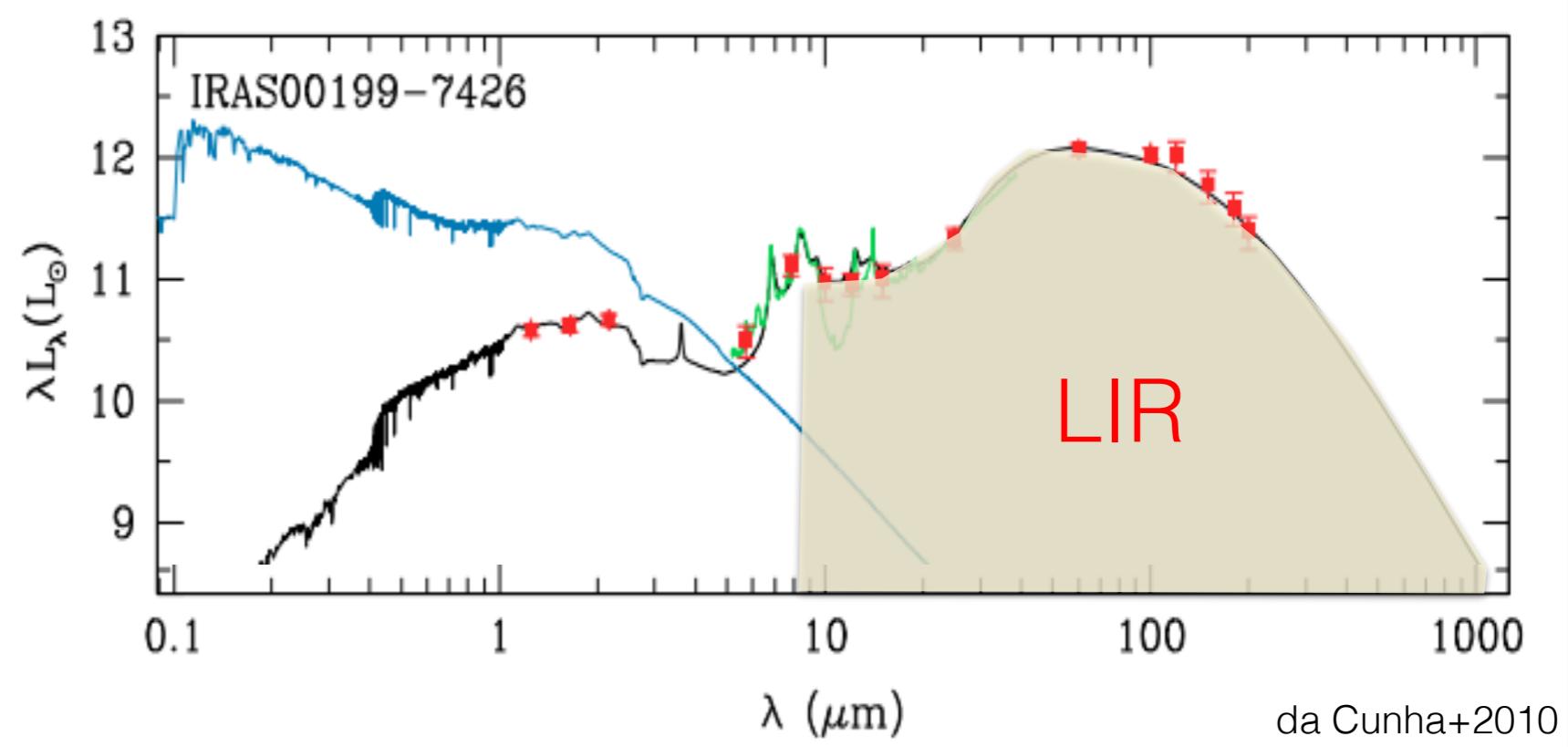
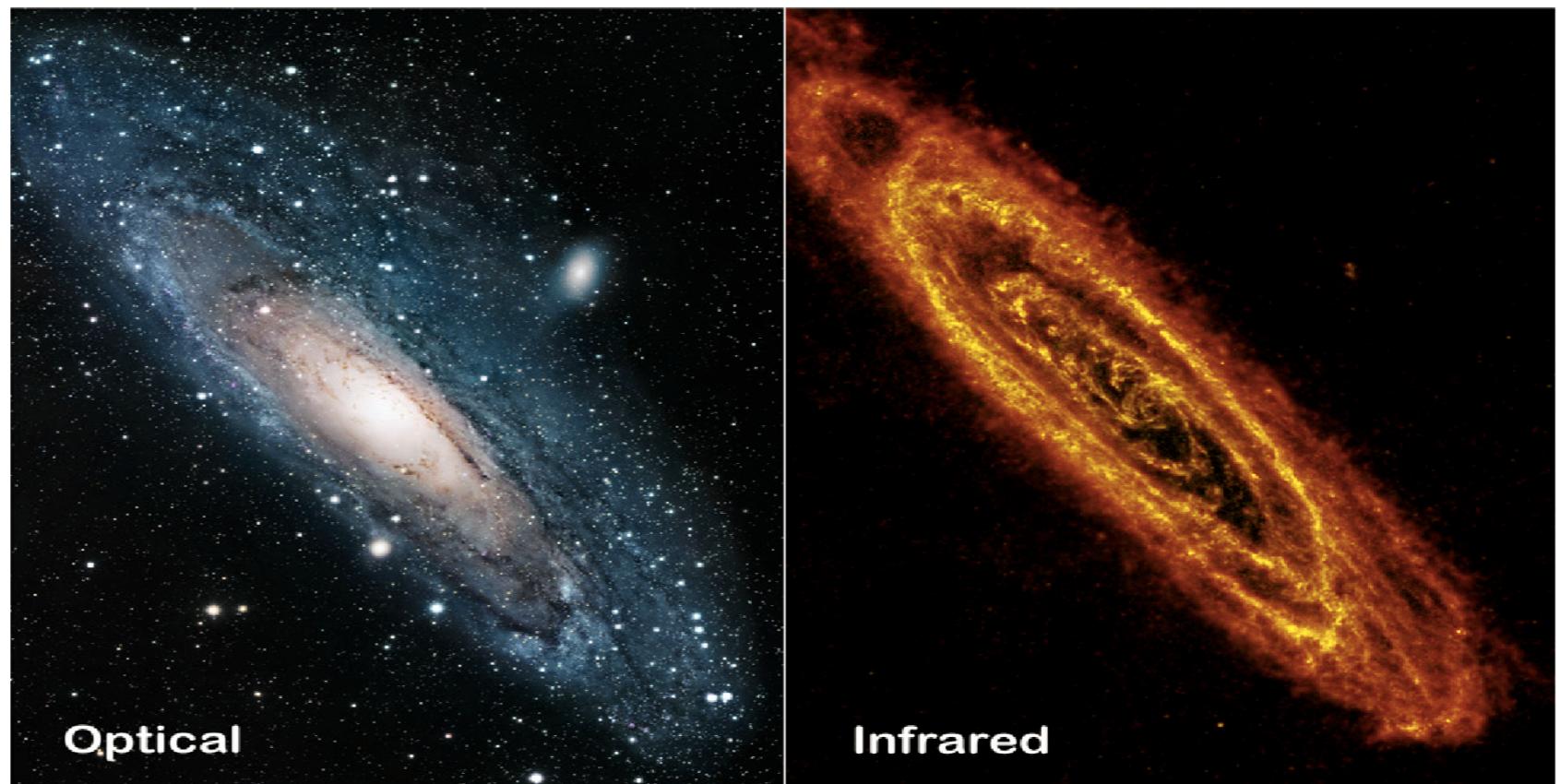
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# Challenge

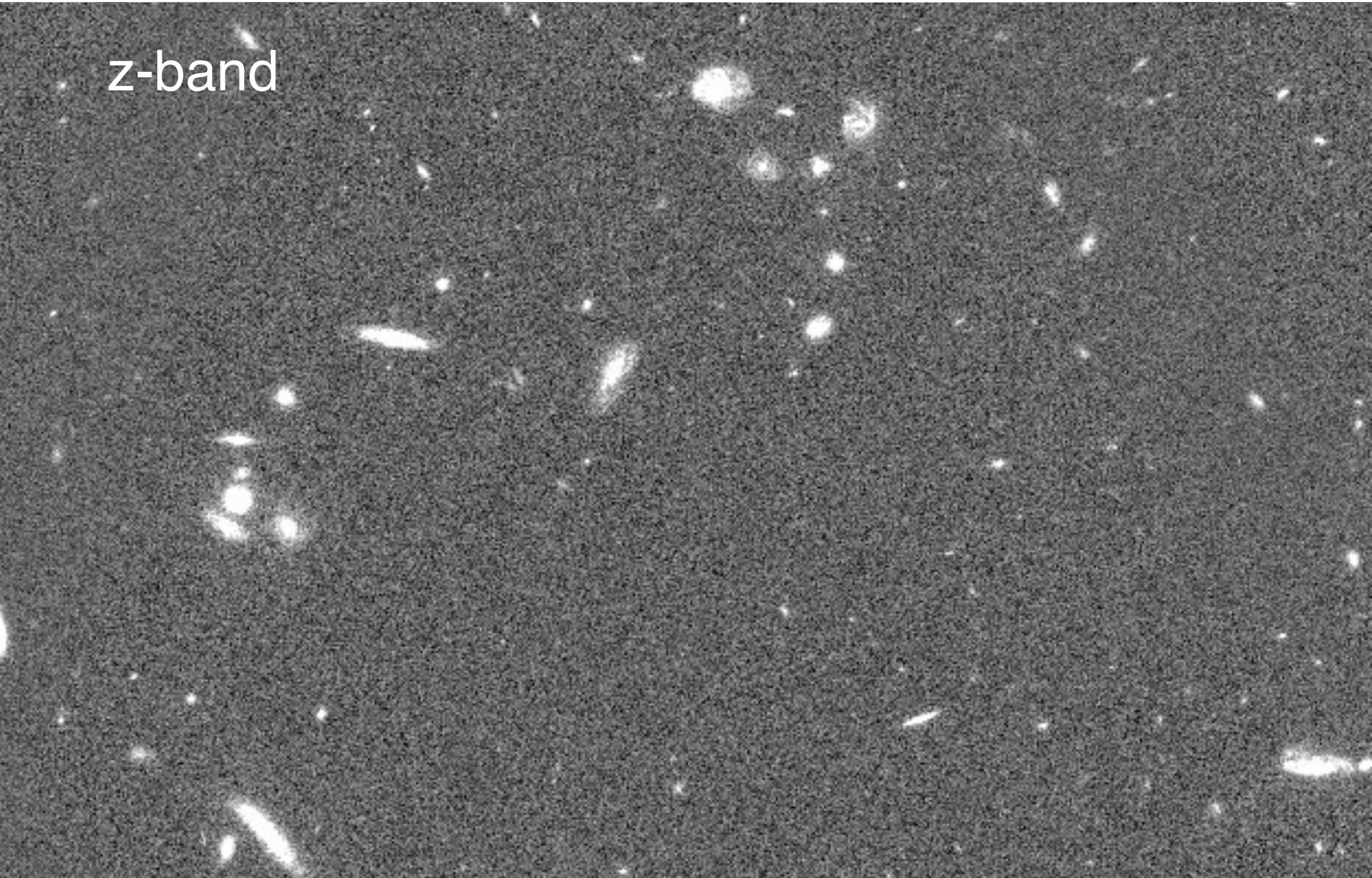
- Infrared/Submillimeter emission reprocessed starlight by dust
- IR/Submm traces star formation
- Half the emission is tied up in dust
- Want to know:
  - what about the Optical SED predicts the Thermal Infrared



# Challenge: Source Confusion

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z-band



# Solution

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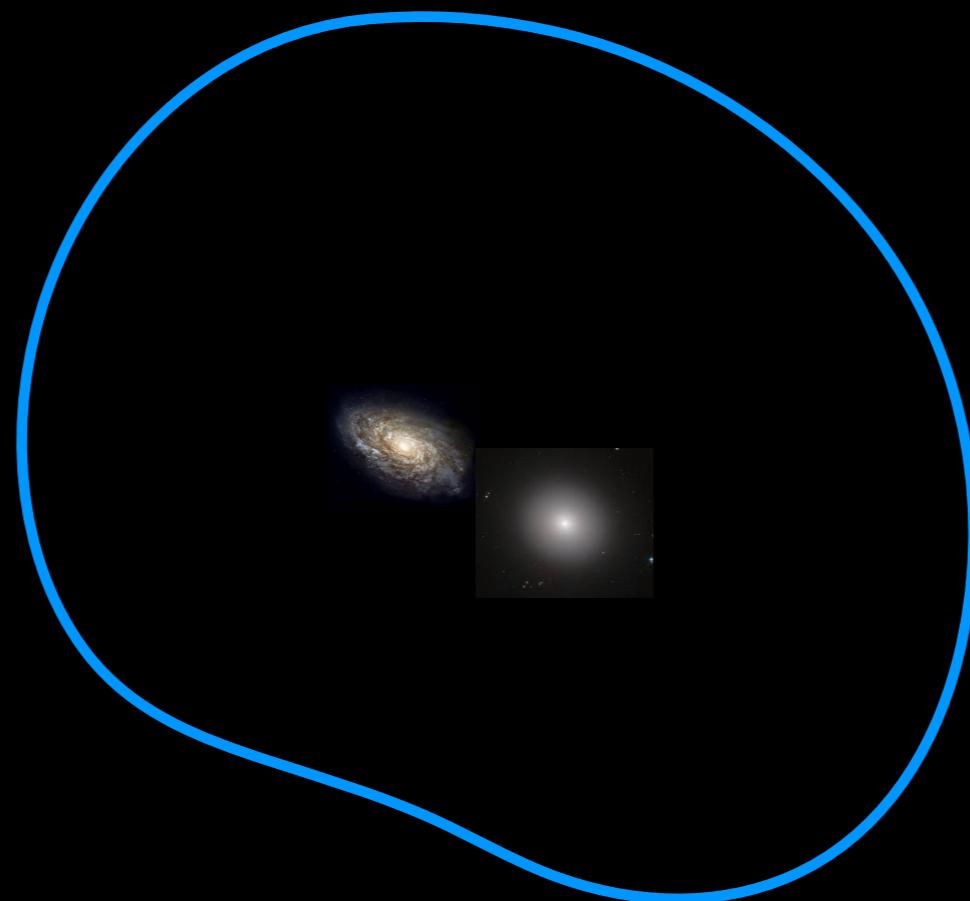
Use:

- The fact that intensity fluctuations contain signal
- *Ancillary* Data
- Creativity + Statistics

GOODS-S  
Half 1

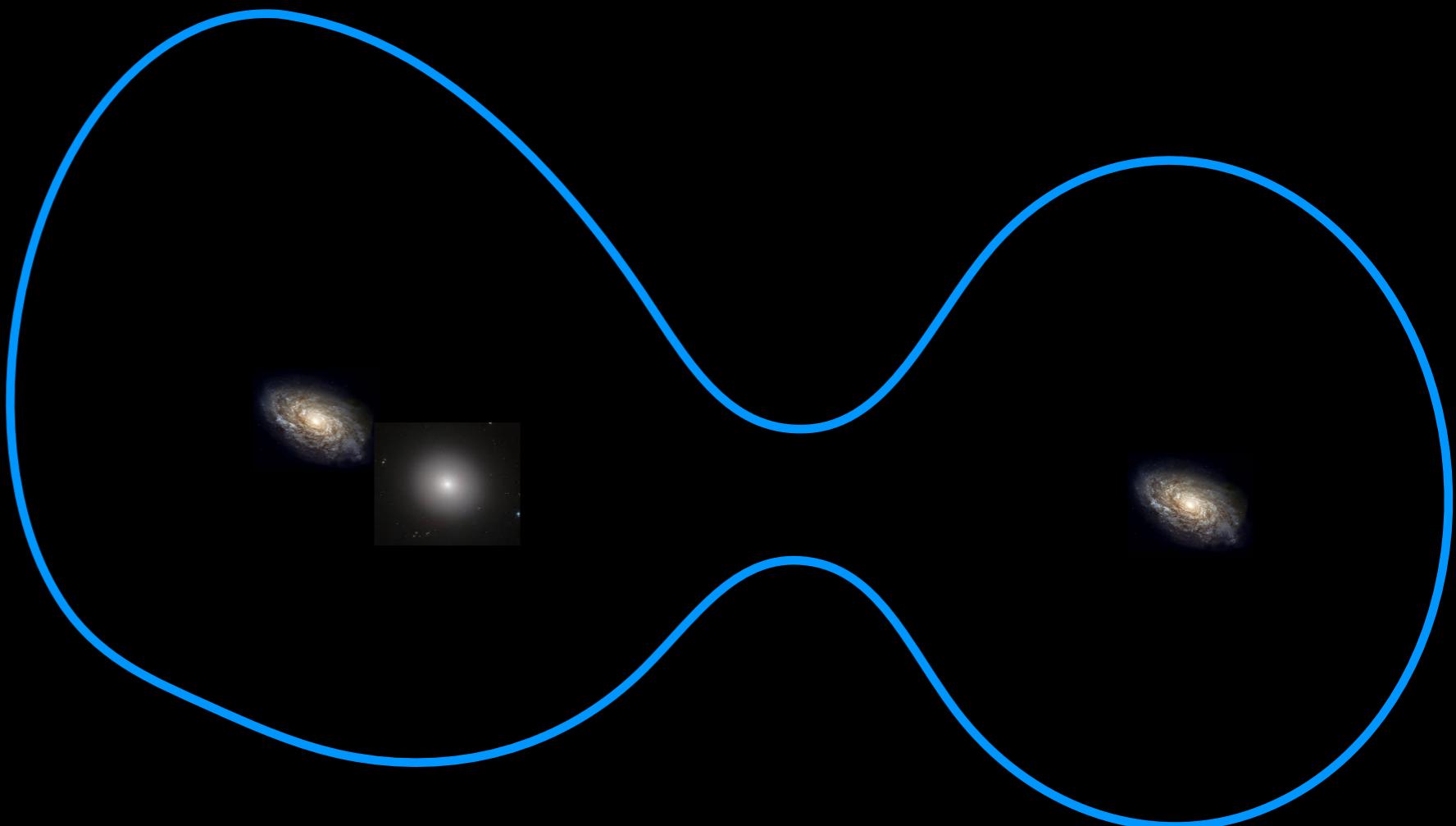
GOODS-S  
Half 2

SPIRE Contour



- Difficult to attribute an individual submillimeter “source” to any single galaxy

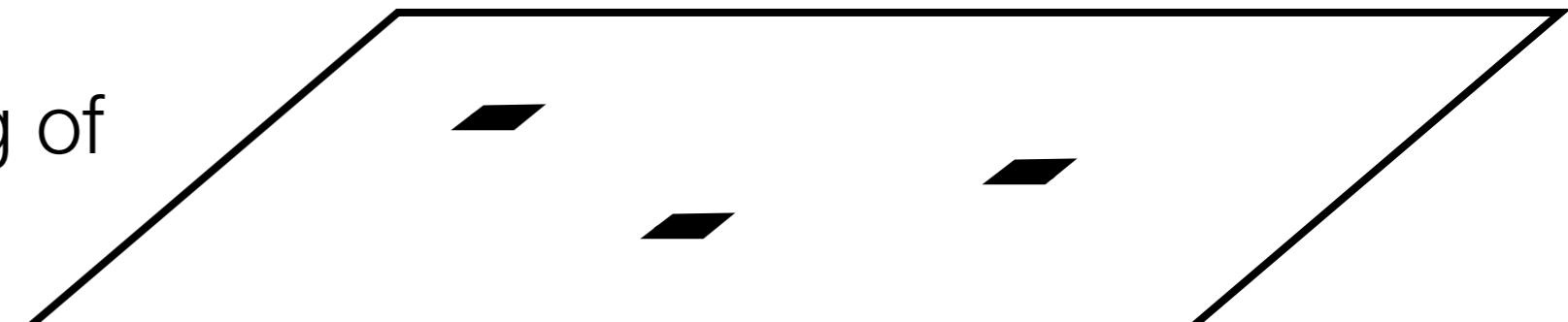
SPIRE Contour



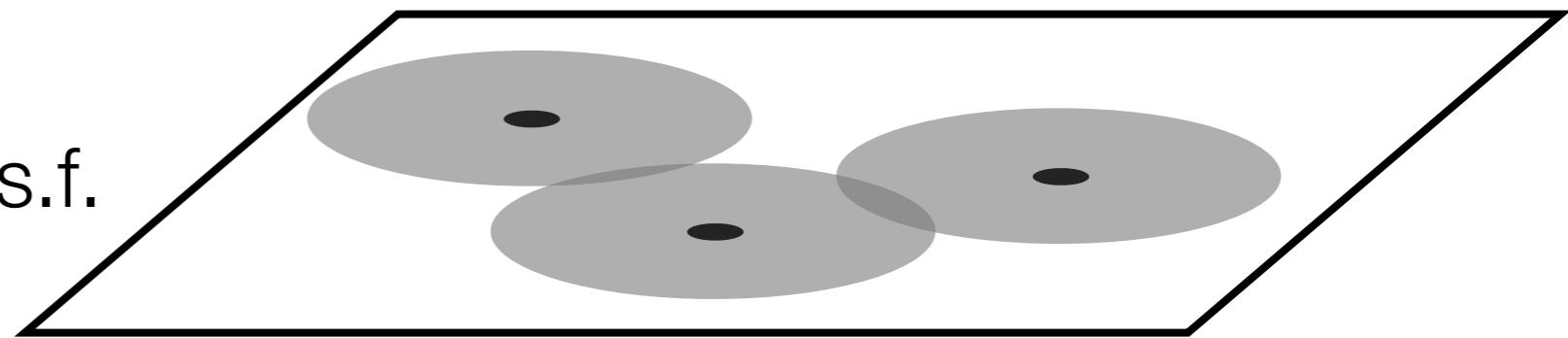
- Key is to identify galaxies with similar *physical* properties, and then rely on ***statistics to fit fluctuations***

# SIMSTACK: Simultaneous Stacking Algorithm

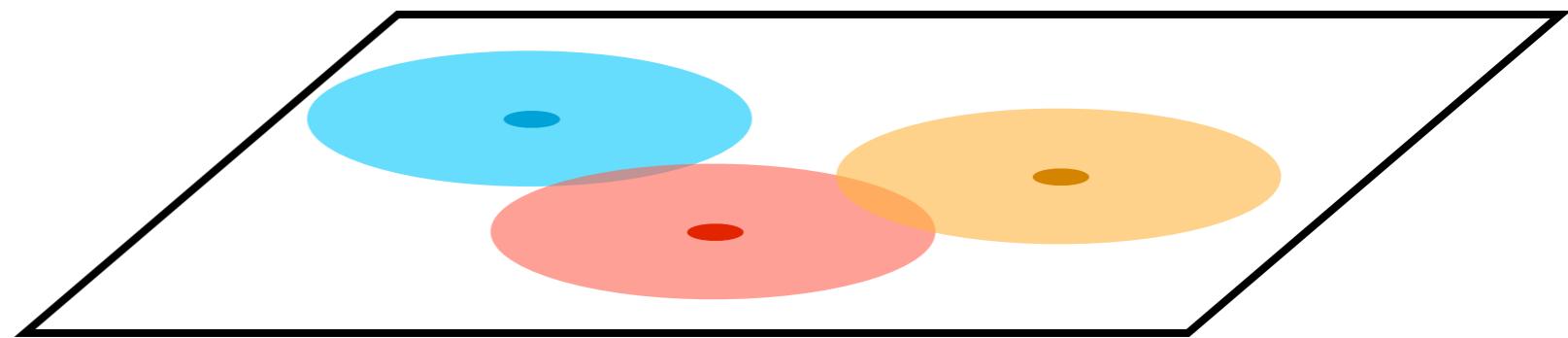
make hits map from catalog of similar objects



convolve with instrument p.s.f.



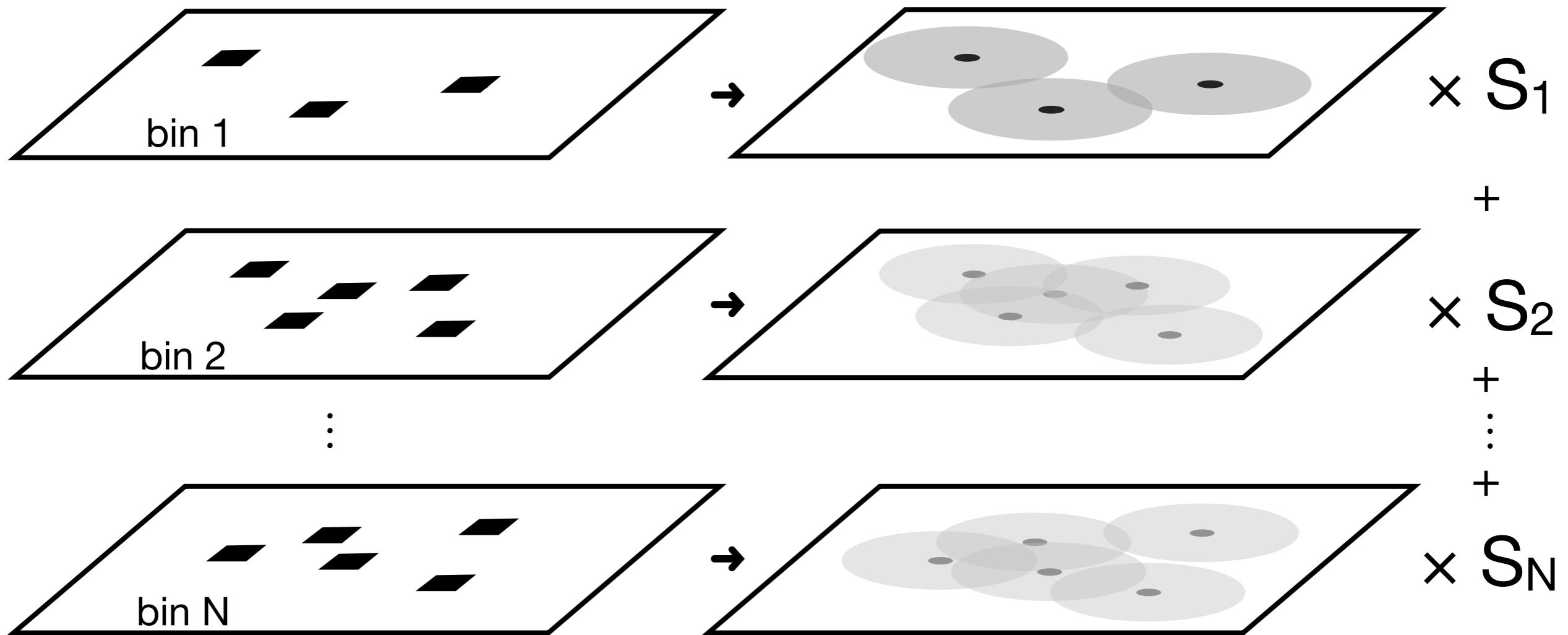
regress to find *mean* flux density, S



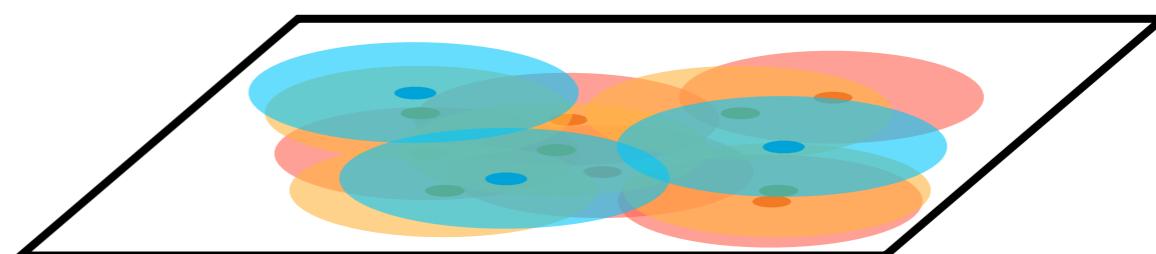
Formalism developed w/ Lorenzo Moncelsi (Caltech);  
also see Kurczynski & Gawiser (2010), Roseboom et al. (2010)

**SIMSTACK code publicly available (see arXiv:1304.0446):**  
**IDL (old) – <https://web.stanford.edu/~viero/downloads.html>**  
**Python – <https://github.com/marcoviero/simstack>**

# SIMSTACK: Simultaneous Stacking Algorithm



Formalism  
developed w/  
Lorenzo Moncelsi  
(Caltech)



sky  
map

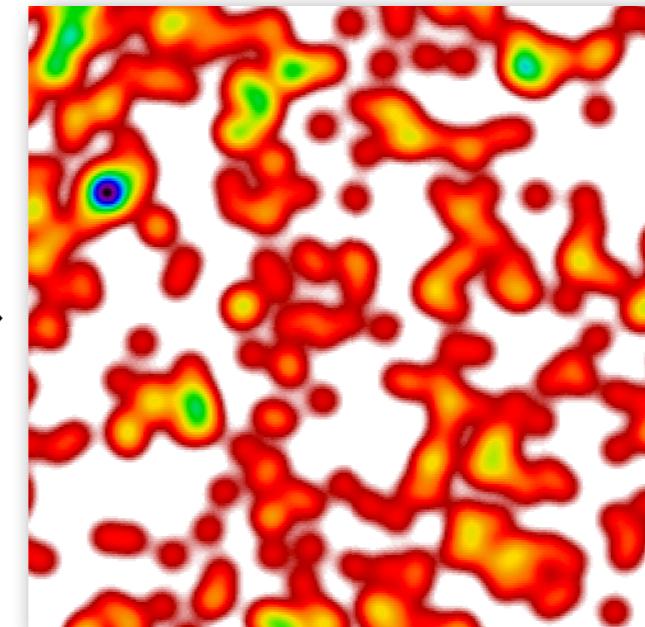
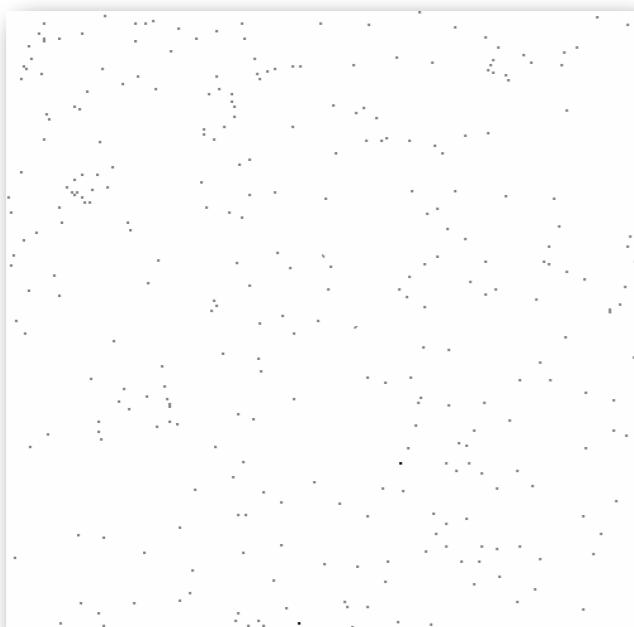
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**Python – <https://github.com/marcoviero/simstack>**

$M = 9.5-10$

X	Y
996	1009
55	1011
187	1010
501	1011
336	1012
127	1011

⋮



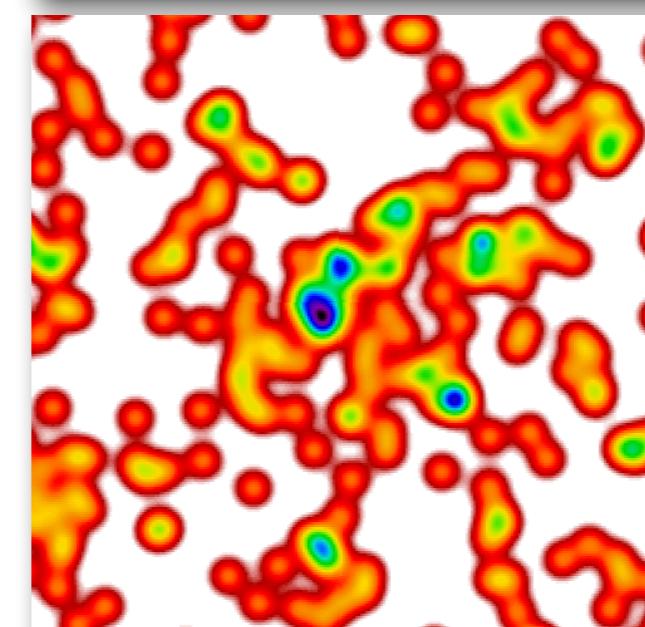
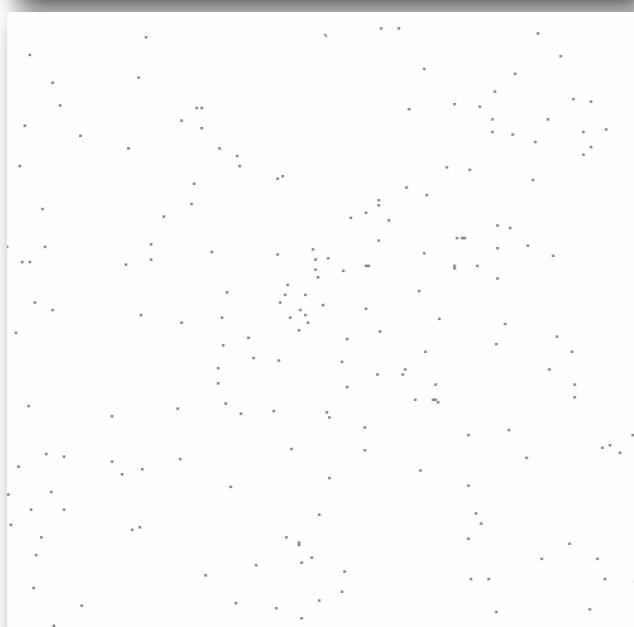
$\times S_1$

$z = 1.0 \text{ to } 1.5$

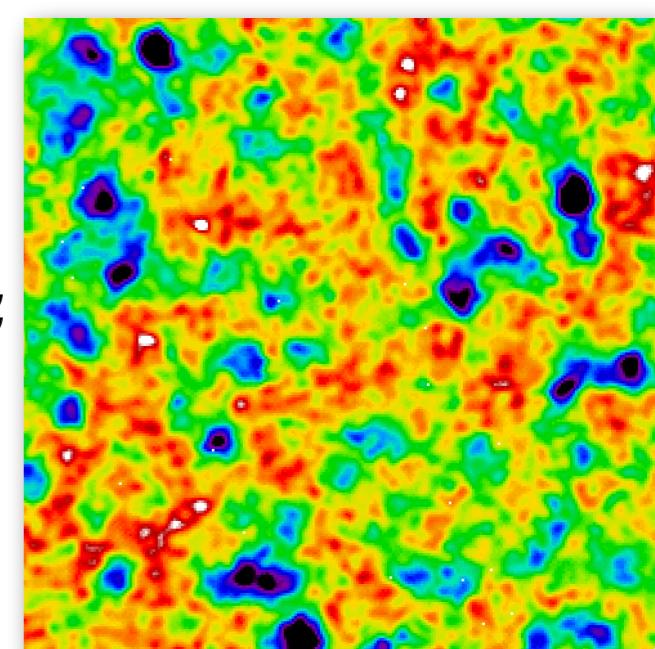
$M = 10-10.5$

X	Y
535	1026
345	1029
340	1029
517	1027
805	1031
805	1031

⋮



$\times S_2 \approx$



+

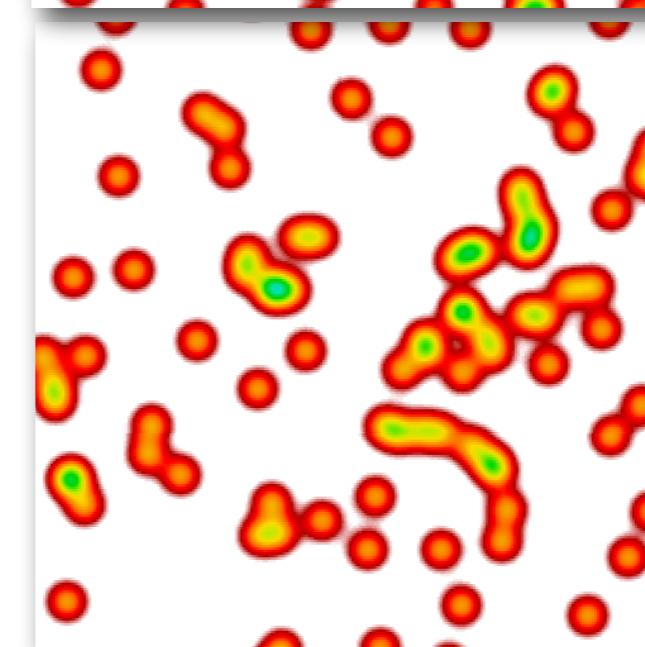
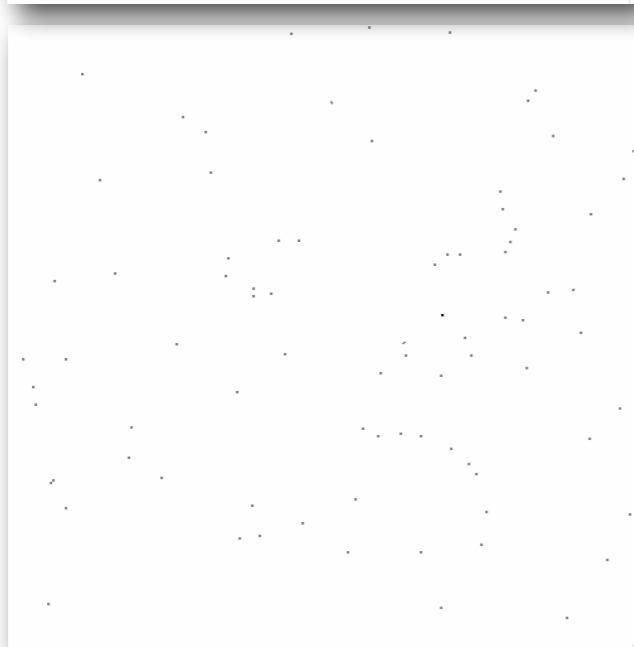
⋮

+

$M = 10.5-11$

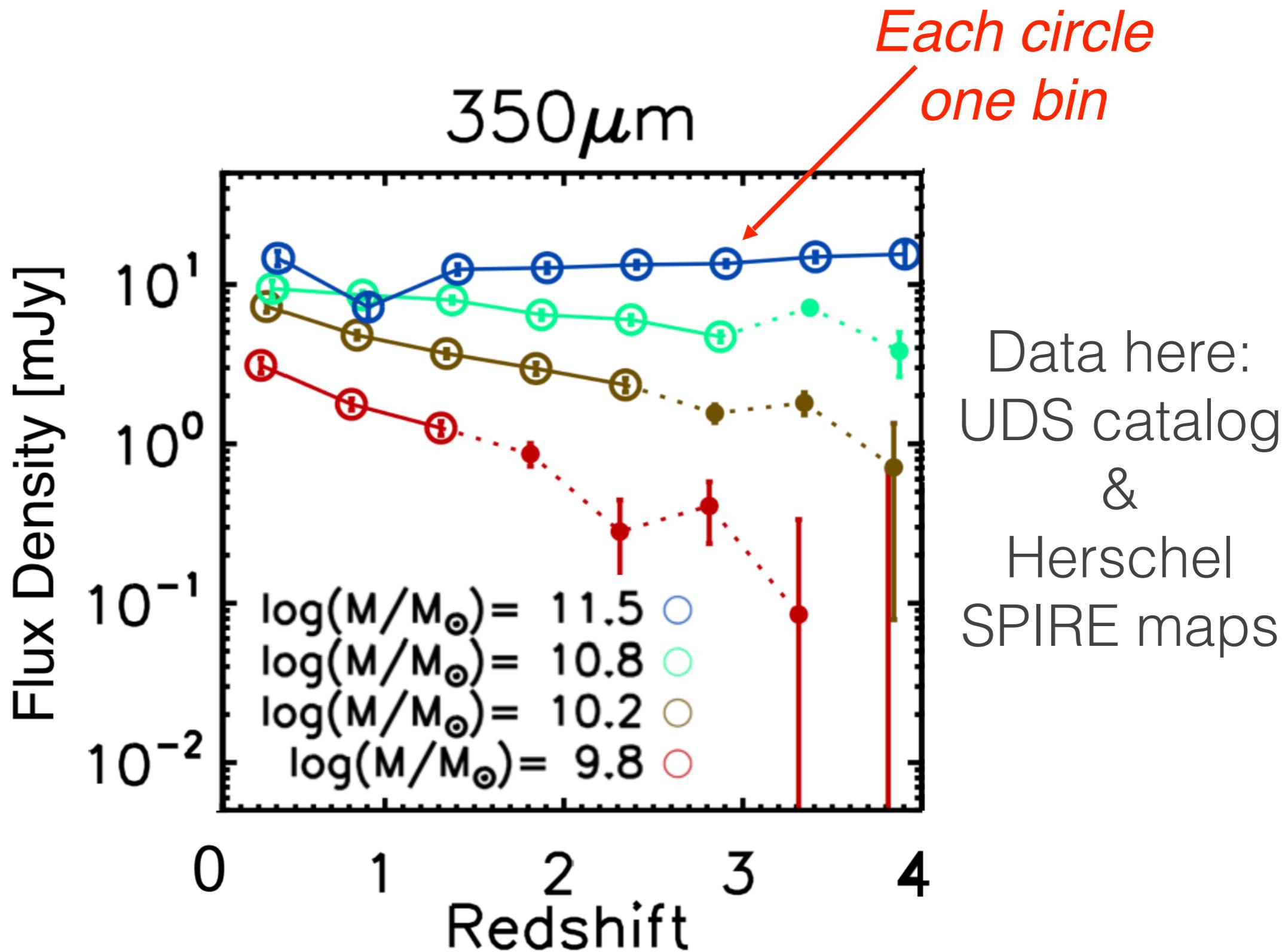
X	Y
345	1029
340	1029
517	1027
805	1031
805	1031
238	1032
359	1033
841	1034

⋮

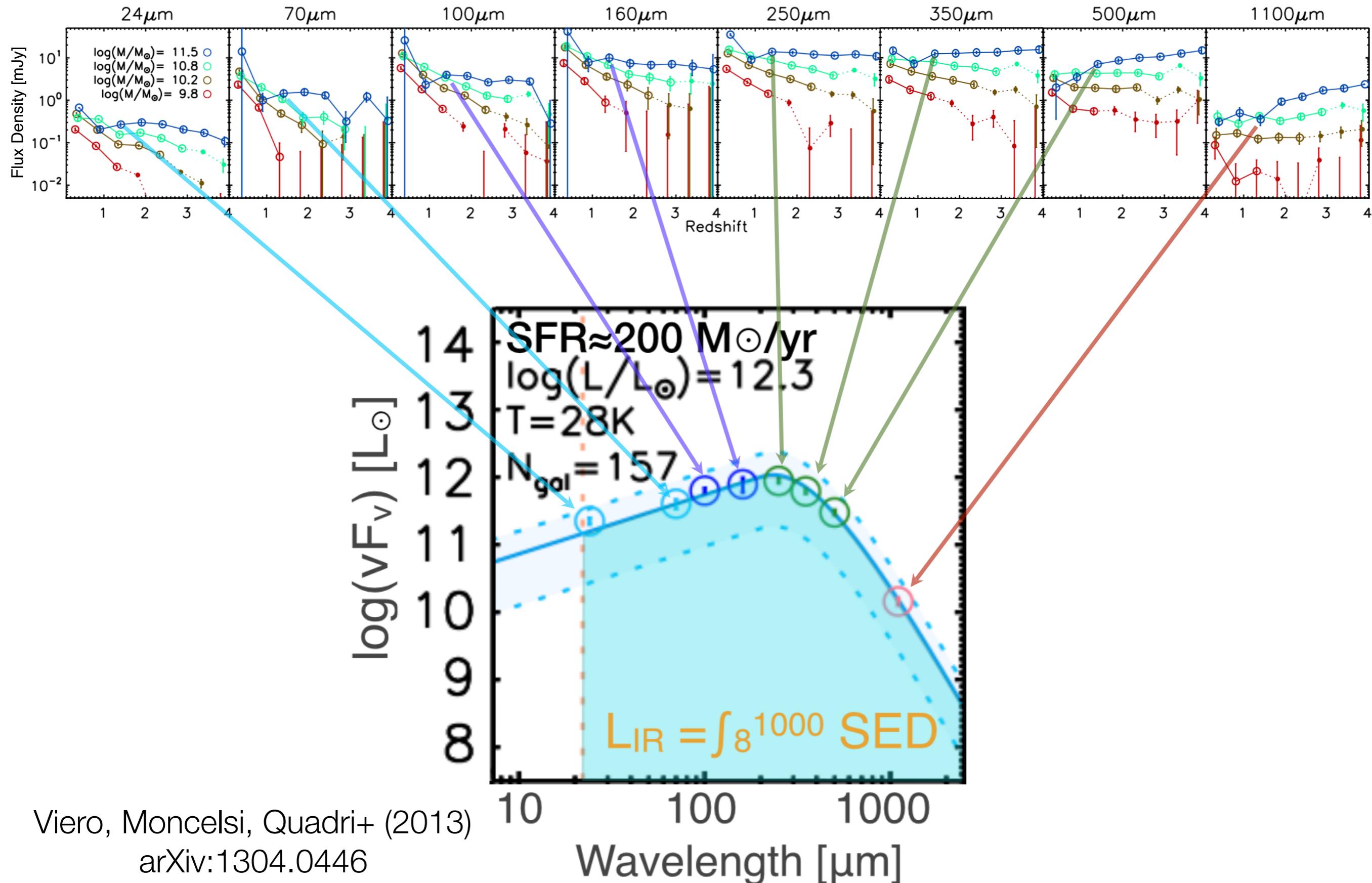


$\times S_N$

# SIMSTACK: Flux Densities (M,z)



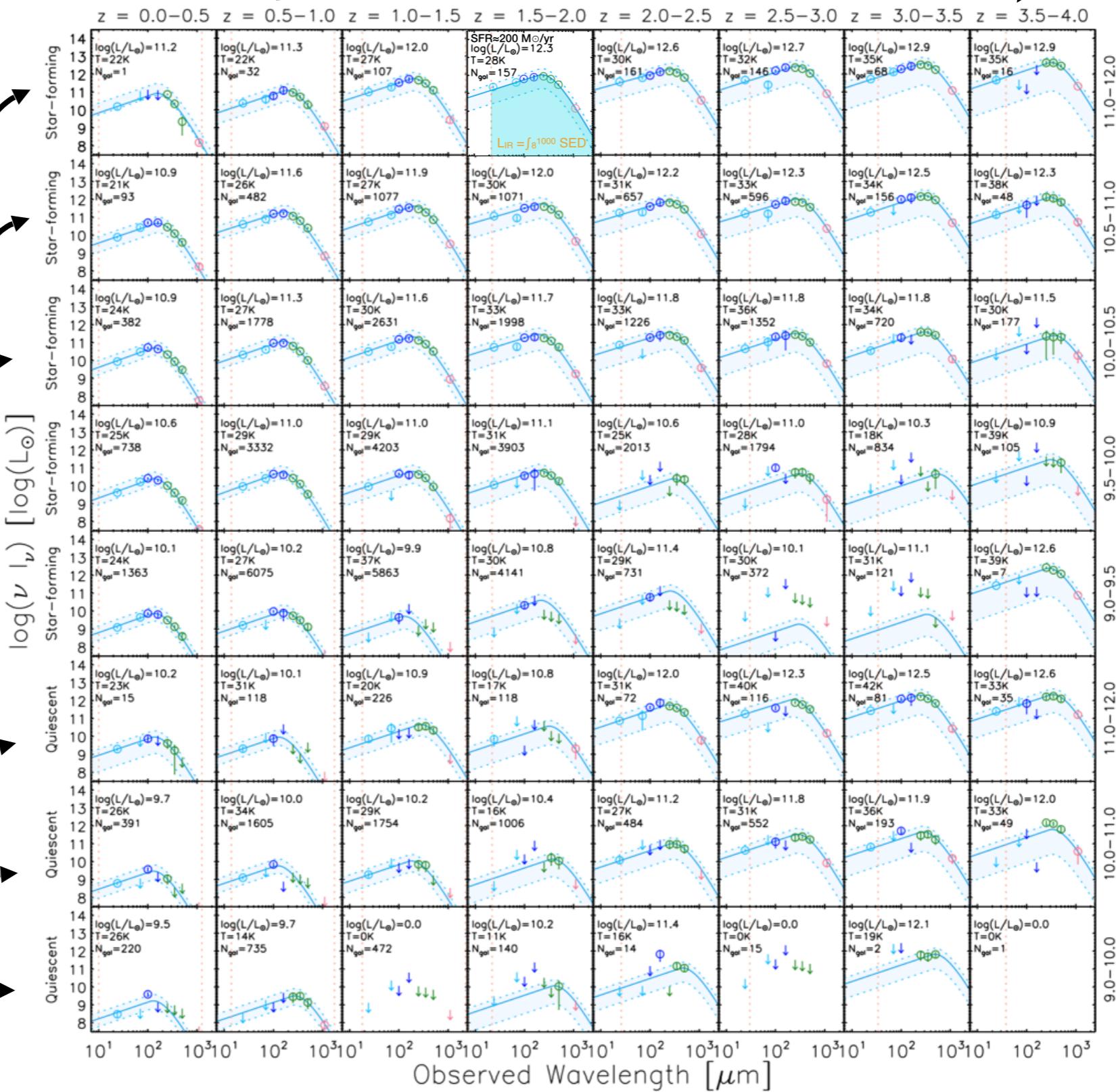
# SIMSTACK: SEDs



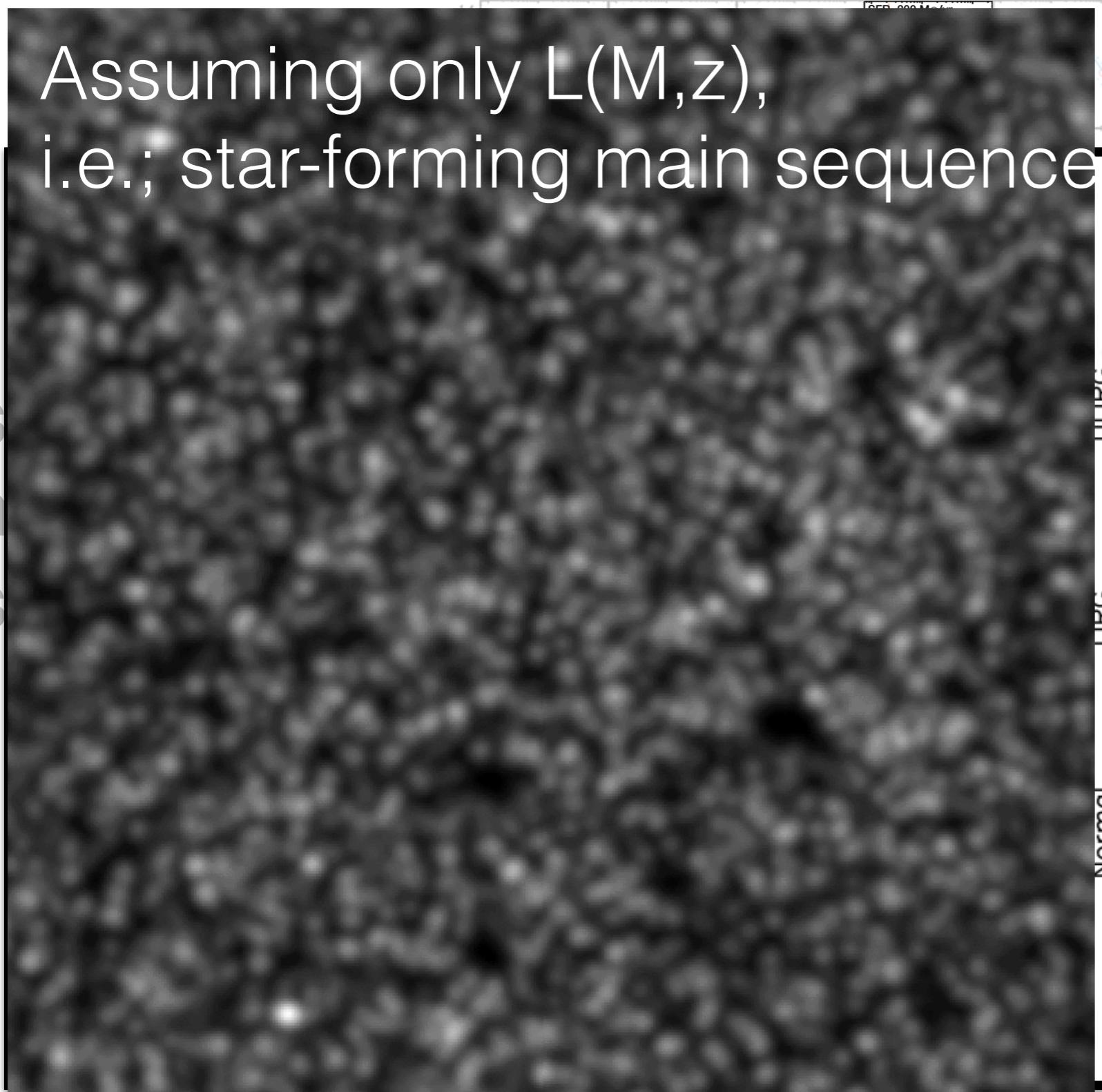
# SIMSTACK: SEDs

stellar  
mass  
slices

redshift  
slices



# SIMSTACK: $L_{\text{IR}}(M, z, \dots)$



Assuming only  $L(M, z)$ ,  
i.e.; star-forming main sequence

redshift  
slices

- Deep ancillary data can be fit with SED models, providing:

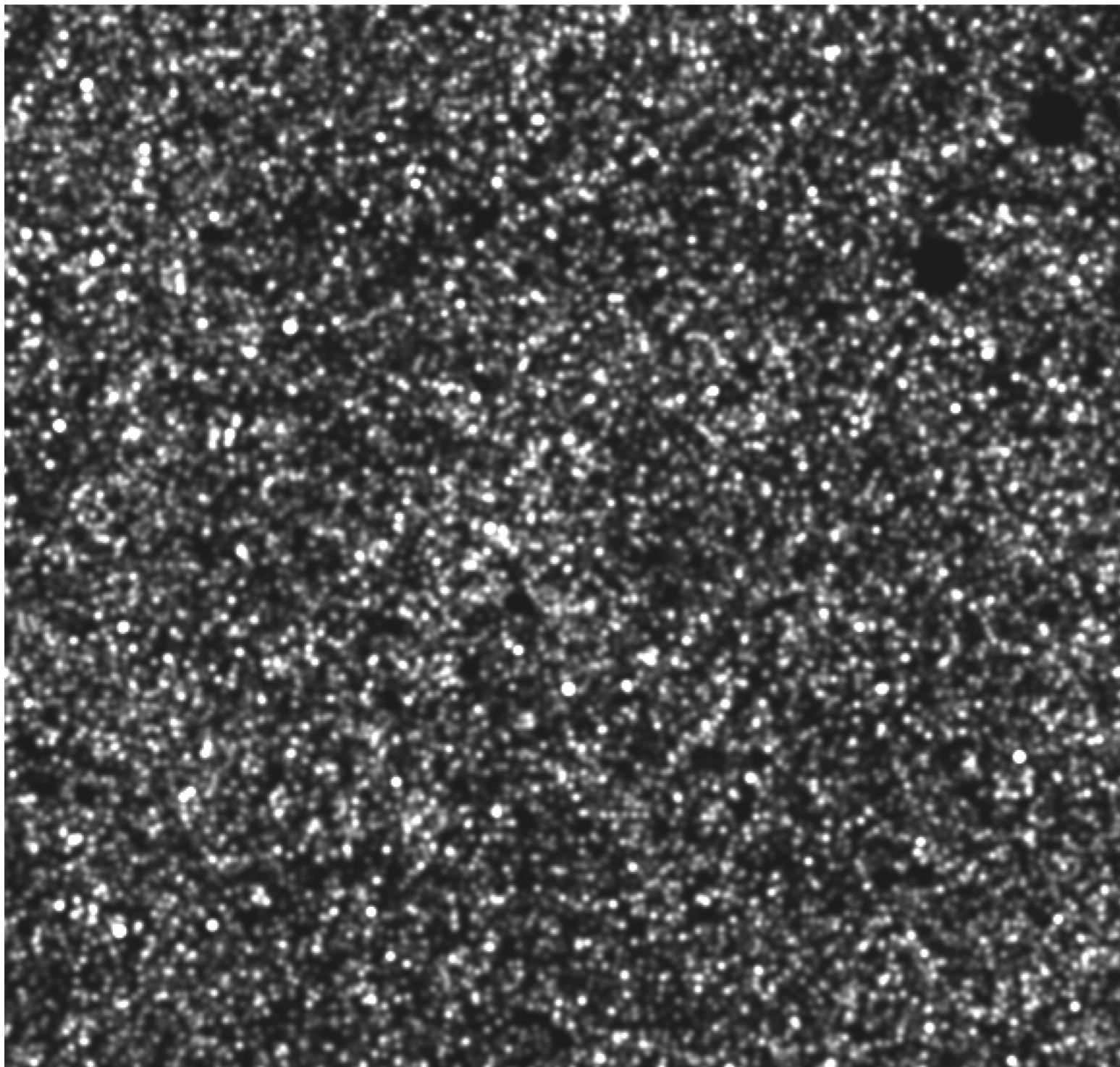
- Stellar Mass
- Redshift
- Extinction/UV slope
- AGN fraction
- Age/Tau...

Each bin therefore has  $\langle M \rangle, \langle z \rangle, \langle Av \rangle, \langle F_{agn} \rangle$ , etc., which can be fit with function of form:

$$\bullet \text{LIR} = P(z)^\alpha P(M)^\beta P(Av)^\gamma \dots$$

# SIMSTACK: $L_{\text{IR}}(M, z, Av, Fagn)$

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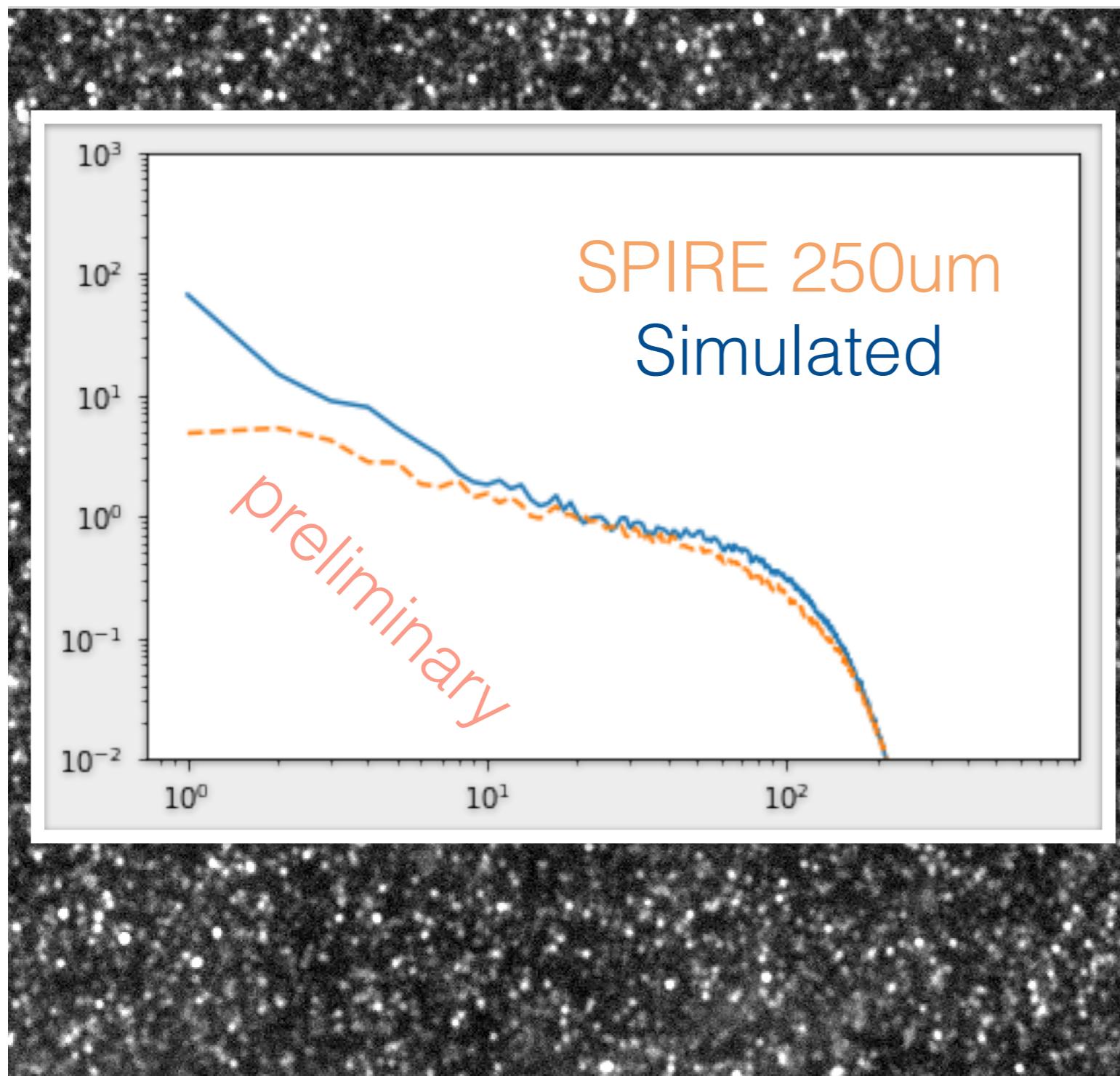
Fit can be improved by splitting the sample into finer subsamples, isolating e.g.;

- Star-forming/Quiescent
- AGN
- Starbursts

We find features most influential are, for 4 subsamples:

$$\begin{aligned} \bullet \log(L_{\text{IR}}) = & C + \\ & \alpha(z) \times \log(1+z) + \\ & \beta(z) \times \log(M) + \\ & \gamma(z) \times \log(Av) + \\ & \delta(z) \times \log(F_{agn}) \end{aligned}$$

# SIMSTACK: $L_{\text{IR}}(M, z, Av, Fagn)$



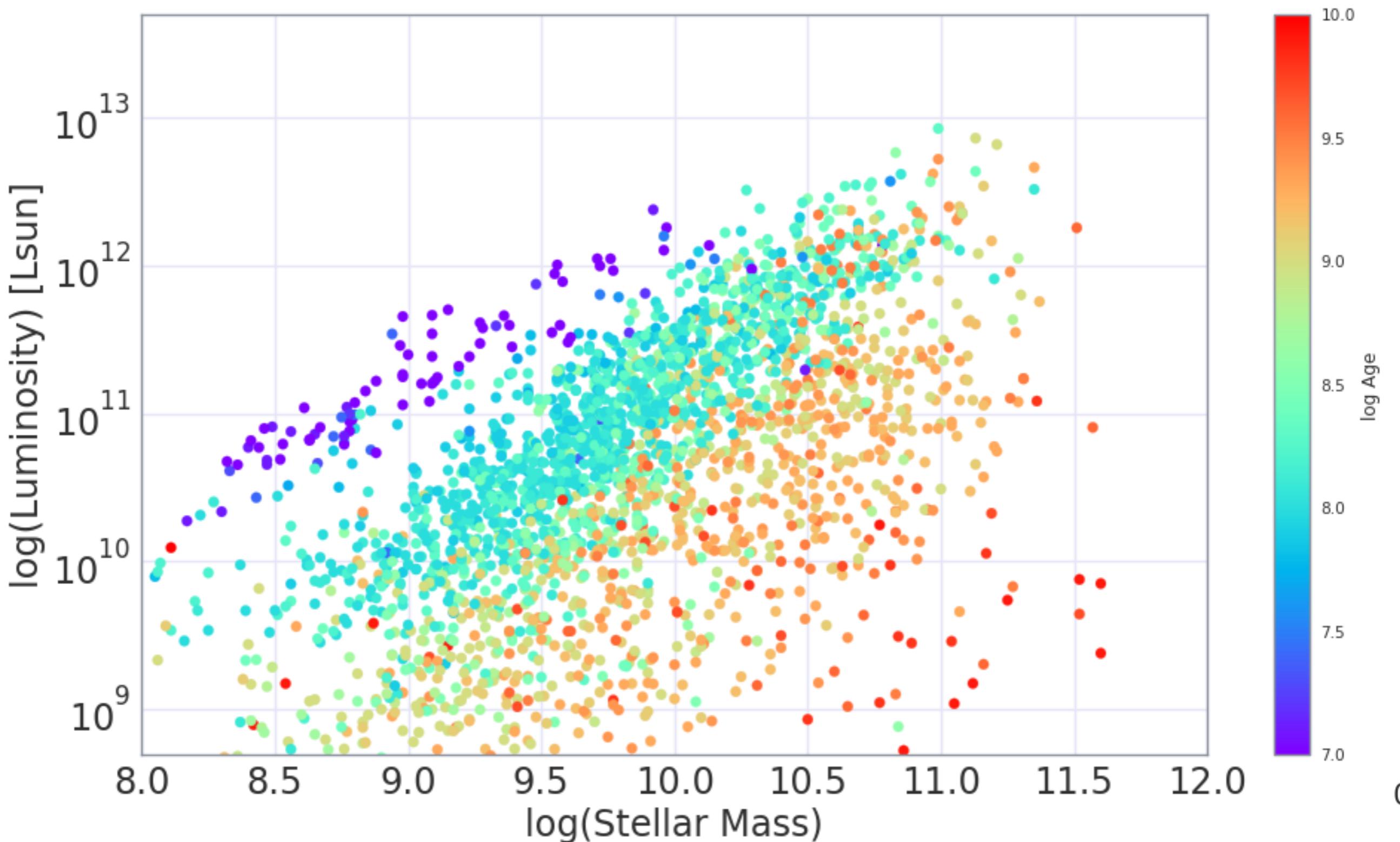
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- $\log(L_{\text{IR}}) = C + \alpha(z) \times \log(1+z) + \beta(z) \times \log(M) + \gamma(z) \times \log(Av) + \delta(z) \times \log(F_{agn})$

# SIMSTACK: $L_{\text{IR}}(M, z, \text{Av}, \text{Fagn})$



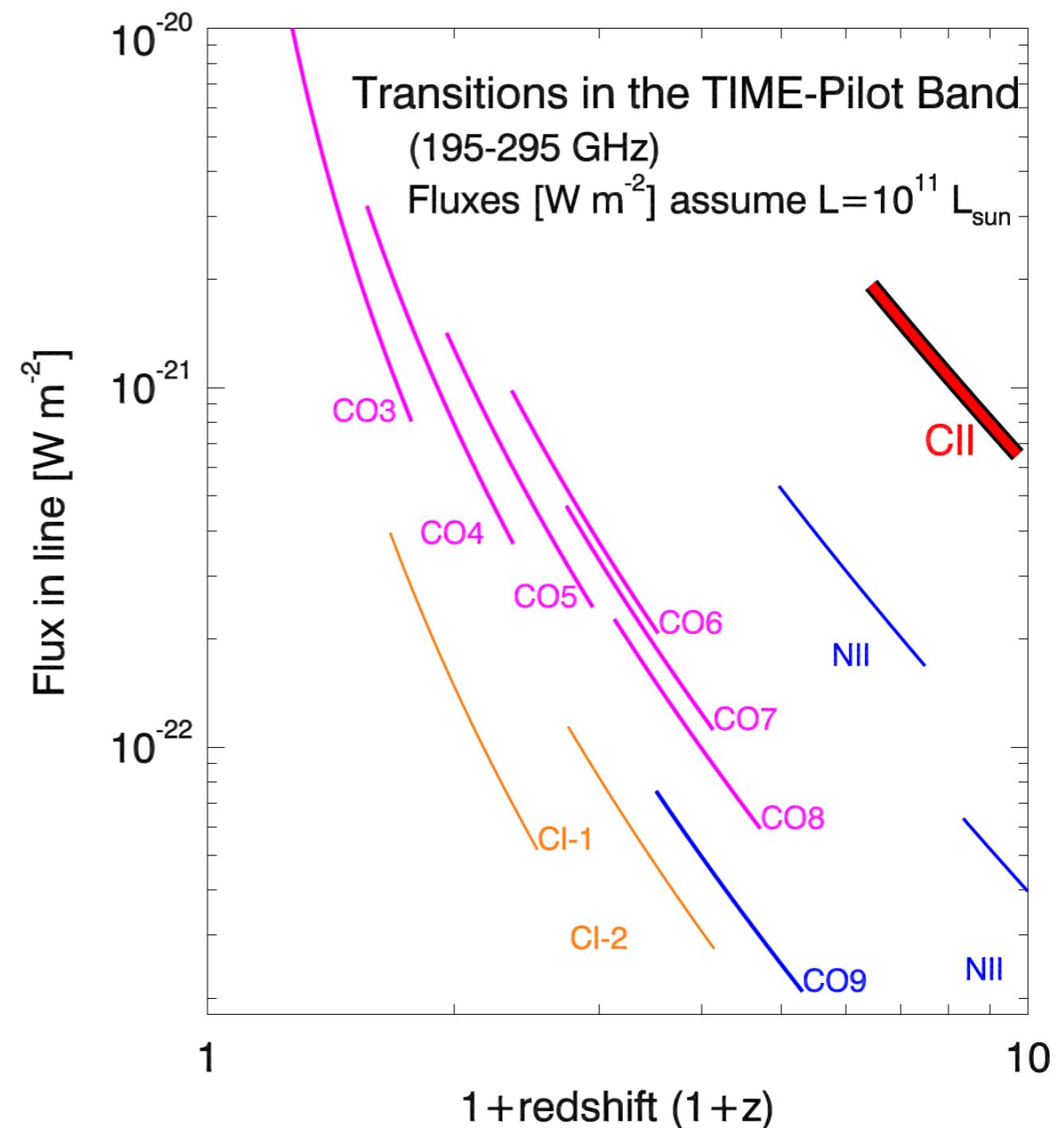
# Applications

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- Signal
  - Connect to Halo properties (including assembly bias) to:
    - ▶ estimate CO levels,
    - ▶ construct covariances,
    - ▶ test different estimators (i.e., beyond power spectrum),
    - ▶ Details being discussed during this meeting!
  - Extend to other lines that correlate with thermal dust SED
    - ▶ CII, OII, OIII, NII
    - ▶ r.f. 850um as tracer of ISM Mass.
- Foregrounds
  - Predict CO contamination in CII data cubes (e.g, Sun and the TIME collaboration, 2017)

# Masking CO in CII line-intensity maps

- Targeting CII at  $z = 6-10$  means separating signal from lower-z CO.
- In deep fields (e.g., COSMOS, UDS, GOODS), all potentially significant CO emitters ( $z=1-3$ ) will be cataloged in the UV, optical, and NIR with great detail.
  - In these cases, we can construct an estimator for CO from optical predictors of the mean LIR.
  - How much variance is there from the mean, and how aggressively does masking need to be to play it safe?



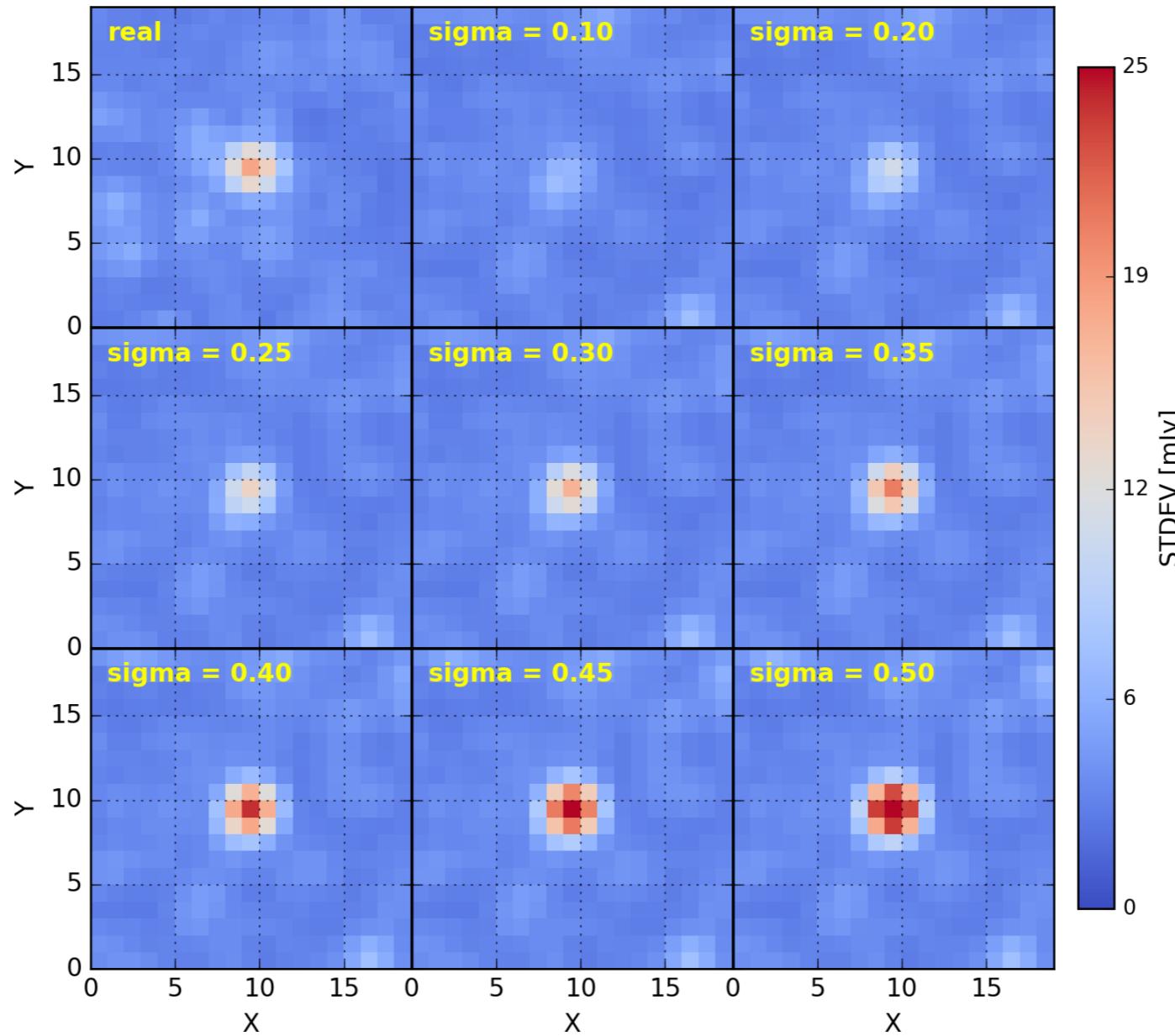
# Masking CO in CII data: Sun et al. 2017

Variance in the LIR estimator determined by comparing scatter in the difference map with simulations.

- Find  $\sigma = 0.33$



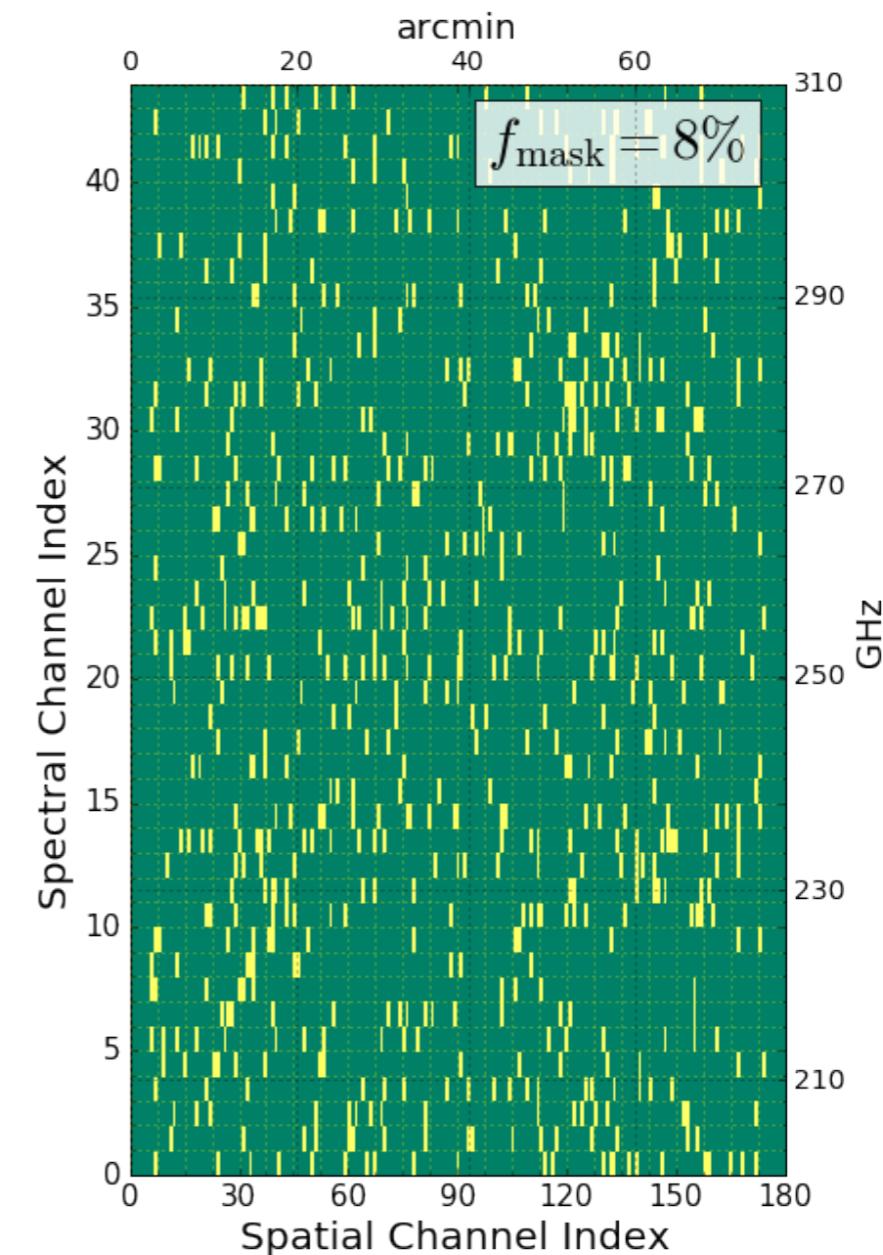
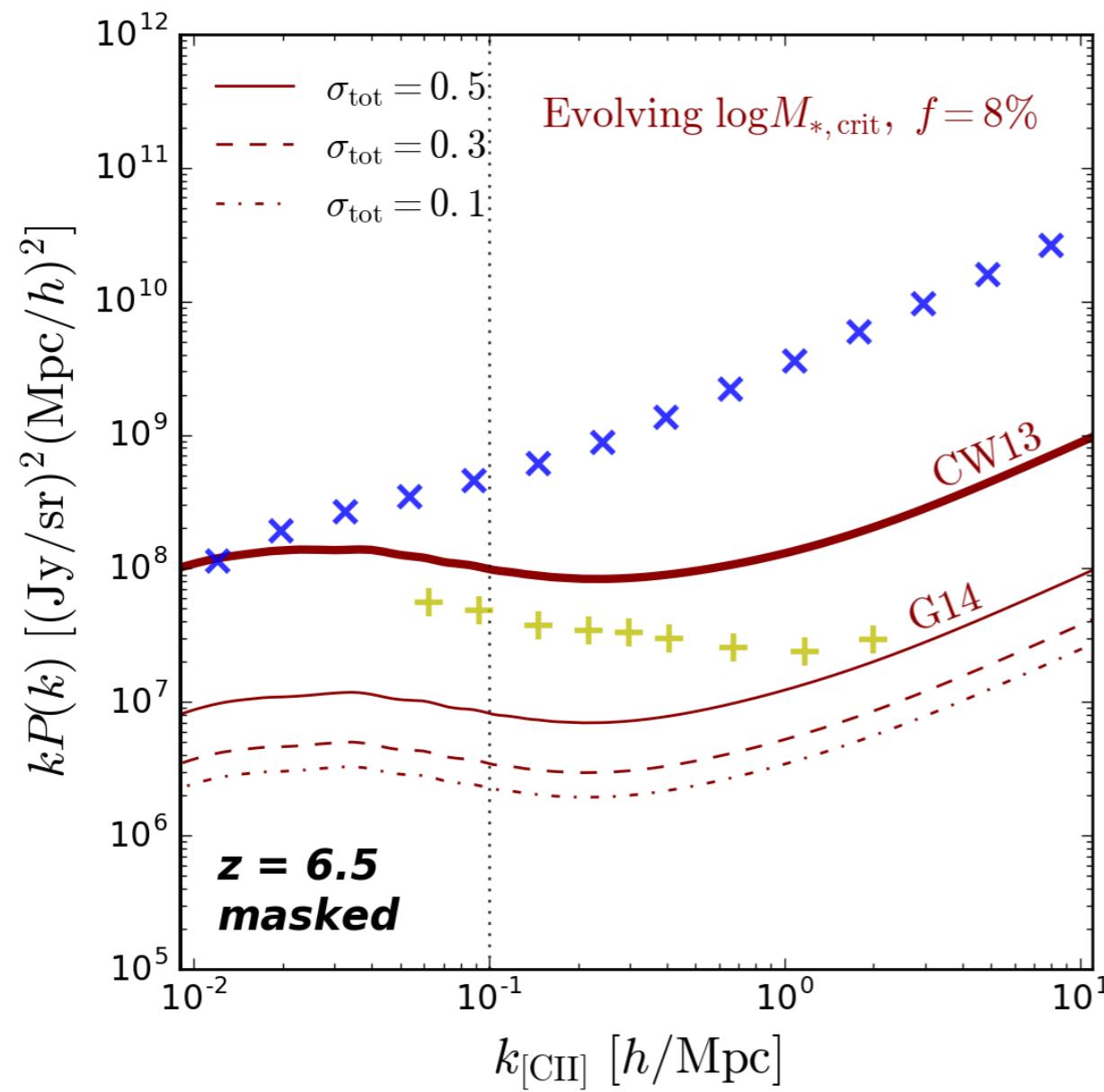
Guaocho (Jason)  
Sun



Lorenzo Moncelsi

Sun, Moncelsi, Viero & TIME collaboration 2017, arXiv:1610.10095

# Masking CO in CII data: Sun et al. 2017



Sun, Moncelsi, Viero & TIME collaboration 2017, arXiv:1610.10095

# Summary

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- CIB continuum intensities are key to empirically connecting optical features of typical galaxies to their FIR/submm components
- Applications for this model include:
  - Forecasting CO power for:
    - ▶ Survey design
    - ▶ Covariance construction
    - ▶ Testing Estimators
    - ▶ Measurement Interpretation
- For this workshop, would like to...
  - Determine how best to populate halos
  - Explore Estimators
- SIMSTACK is easy to use, and available at:
  - <https://github.com/marcoviero/simstack>