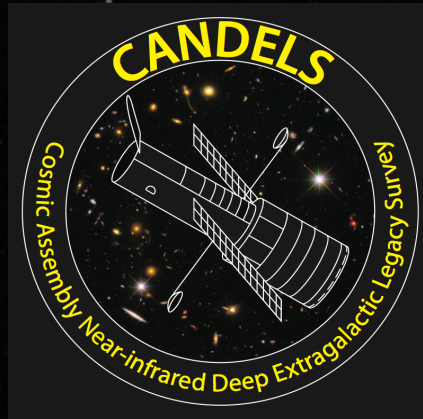


# Star-Forming Galaxies in the $z > 4$ Universe



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Tomas Dahlen, Romeel Davé, Avishai Dekel, Mark Dickinson,  
Henry C. Ferguson, Mauro Giavalisco, James Long, Yu Lu,  
Naveen Reddy, Rachel S. Somerville, Risa H. Wechsler

<sup>1</sup>Texas A&M University

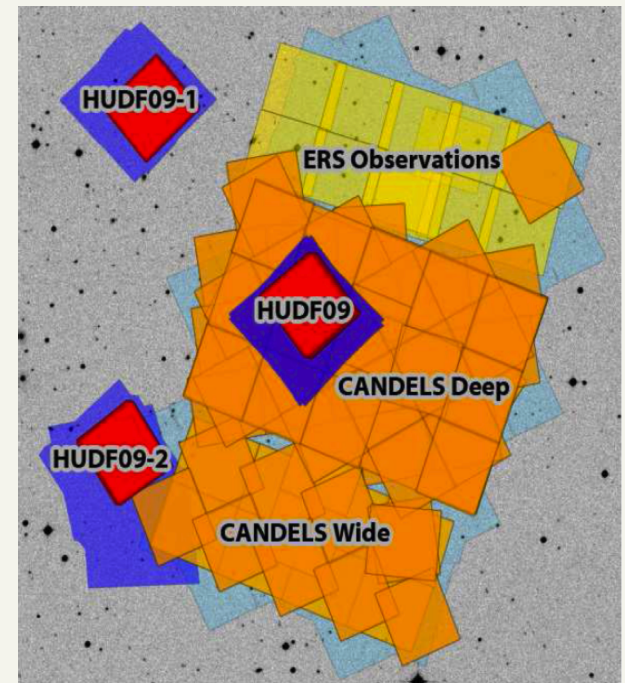
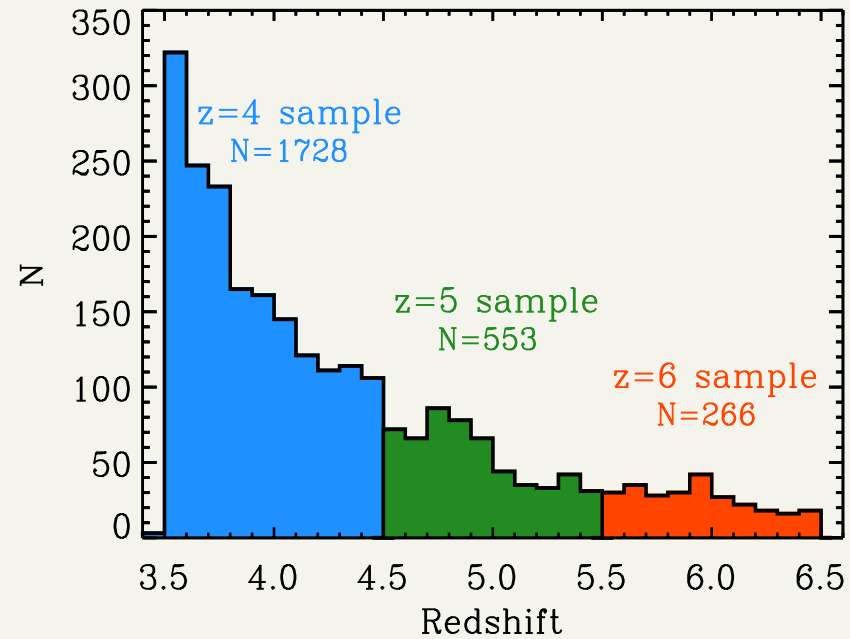
# Outline



- Lessons learned at high  $z$ 
  - A Bayesian approach to SED fitting
  - UV SFR improvements
  - Dust attenuation
  - The star-formation and stellar mass relation
- Star Formation Histories
- Summary

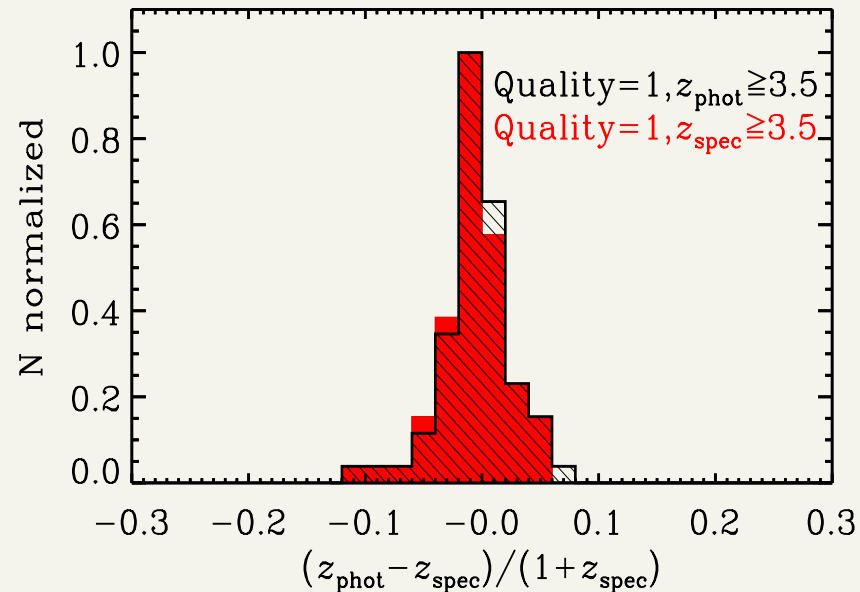
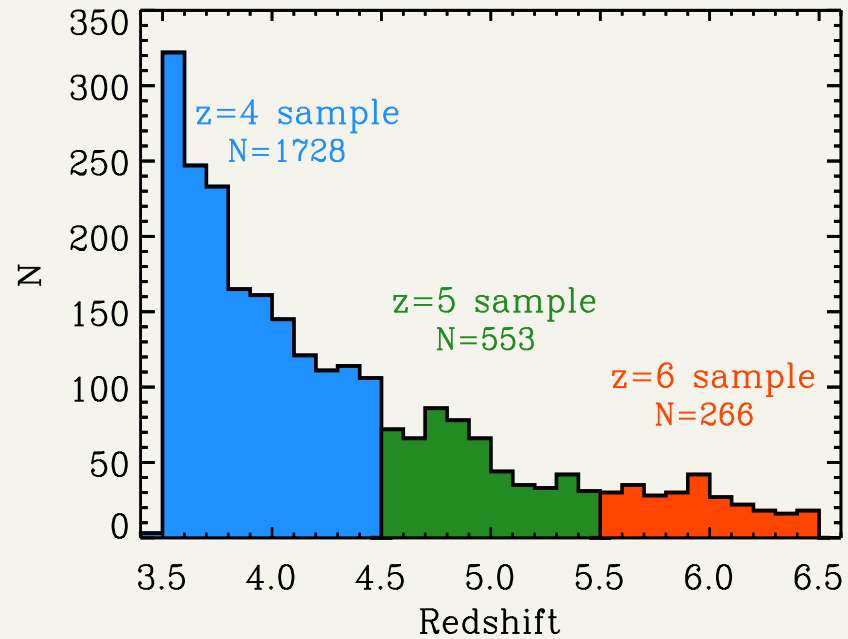
# CANDELS Data

- Benefits: DEEP, large volume, and rest-frame optical
- Fields: GOODS-S DEEP & WIDE + ERS + HUDF
- $H_{160}$ -band selected catalog (Guo et al. 2013)
- 18 Bands
  - ACS:  $B_{435}$ ,  $V_{606}$ ,  $i_{775}$ ,  $I_{814}$ , and  $z_{850}$
  - WFC3:  $Y_{098}$ ,  $Y_{105}$ ,  $J_{125}$ ,  $JH_{140}$ , and  $H_{160}$
  - IRAC (3.6, 4.5, 5.8, and 8.0  $\mu\text{m}$ )
  - CTIO/MOSAIC and VLT/VIMOS  $U$ -bands
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- Photometric redshift selection  $3.5 < z < 6.5$

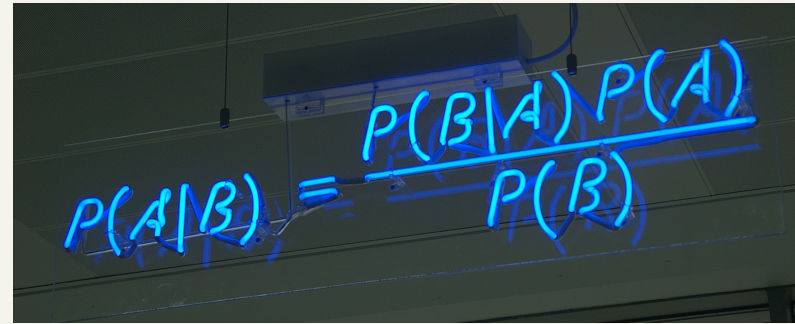




# Bayesian Approach SED Fitting

- Bayesian techniques quickly find the best model, given prior knowledge and all available information
- Already used in astronomy to determine the patchiness of the IGM during reionization (Tilvi+14, Pentericci+14)
- We use a Bayesian SED fitting procedure that calculates the posterior on each galaxy and marginalizes over nuisance parameters

Reads “Posterior of A given B = ”



A photograph of a whiteboard with the equation  $P(A|B) = \frac{P(B|A)P(A)}{P(B)}$  written in blue marker. The equation is written in a slightly messy, handwritten style.

A = fitted parameters

B = Data

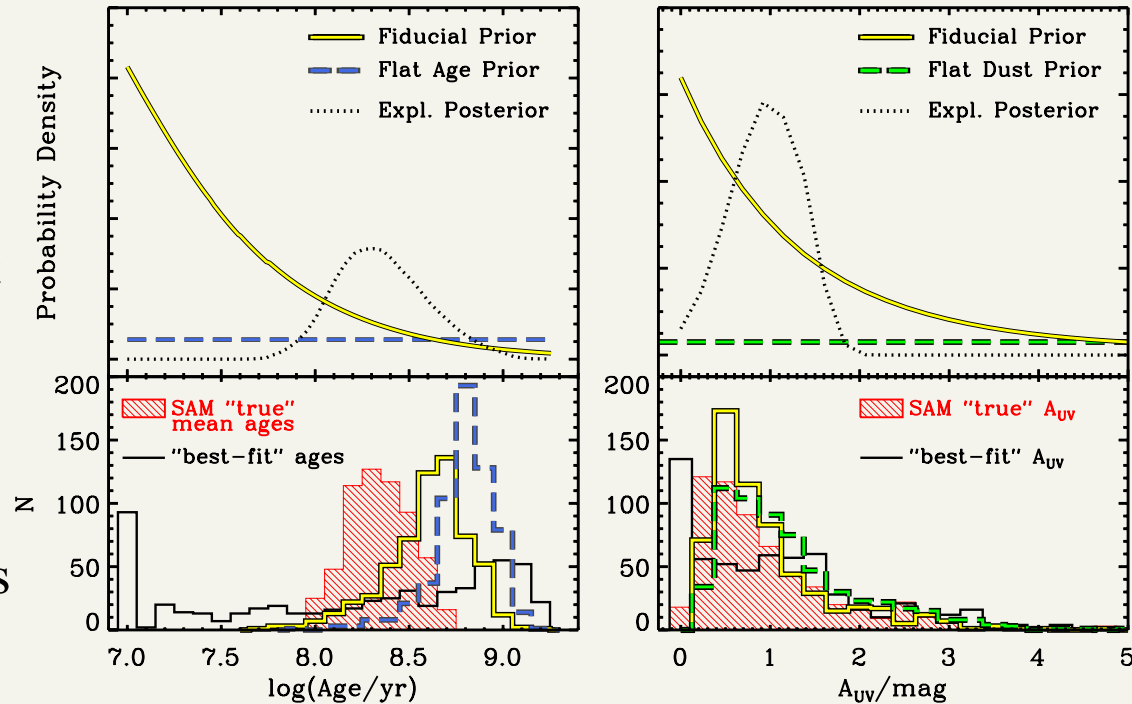
$P(A)$  = prior, the knowledge you already have. ie., that galaxies cannot be older than the age of the Universe

# Bayesian Approach SED Fitting

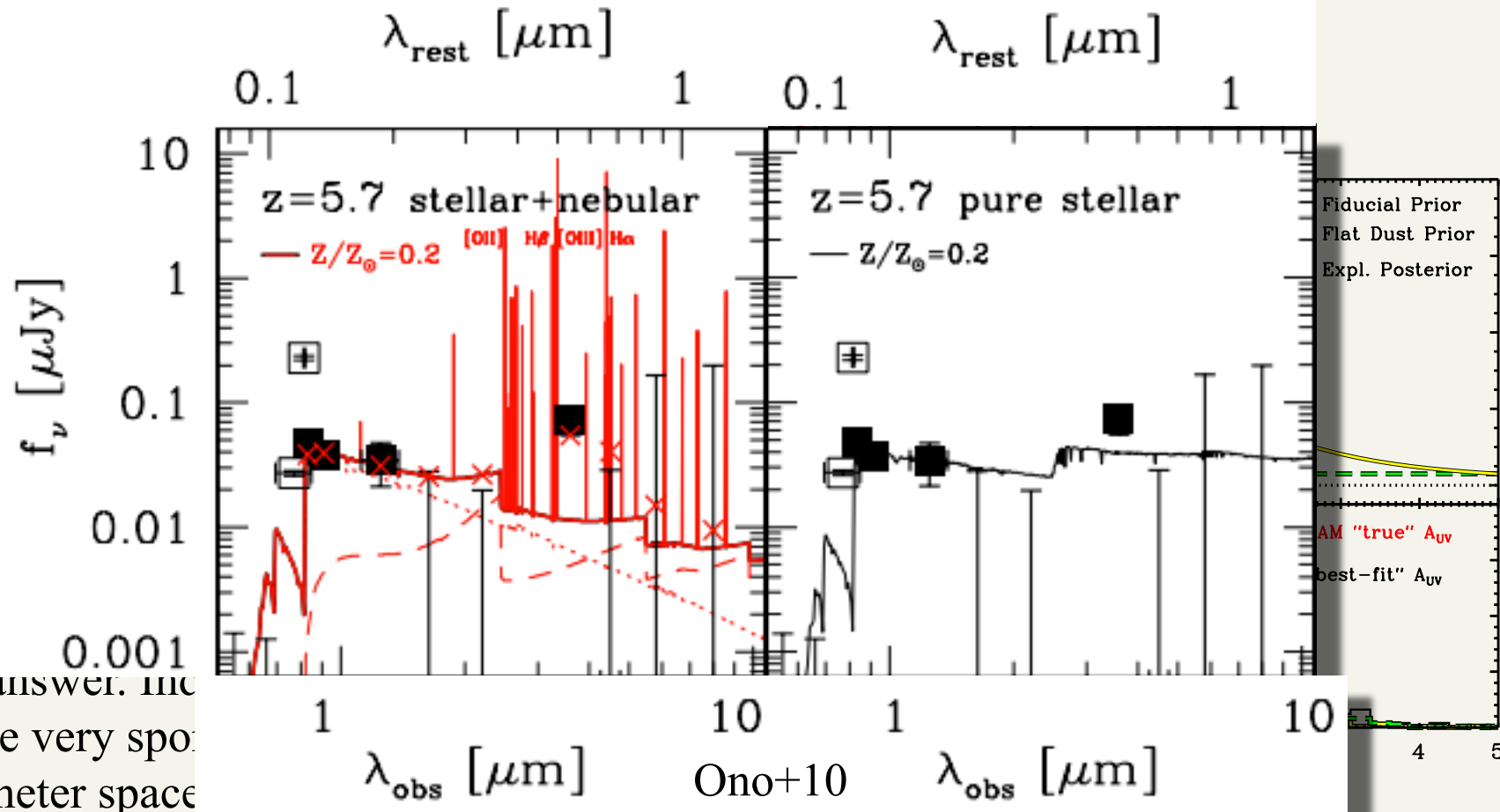
$$p(D|\Theta') = \prod_{i=1}^n \frac{1}{\sqrt{2\pi}\sigma_i} e^{-(f_i - M f_{\Theta}(\lambda_i))^2 / (2\sigma_i^2)}$$

$$p(\Theta') = \left( \sum_{i=1}^n f_{\Theta}^2(\lambda_i) / \sigma_i^2 \right)^{1/2}$$

- The process of marginalization requires the above prior, which is effectively dependent on the template fluxes,  $f_{\theta}$
- Tests on SAM objects show that inducing other priors shift the distributions as expected
- The best fit is not always the best answer. Individual solutions can be very sporadic across the parameter space



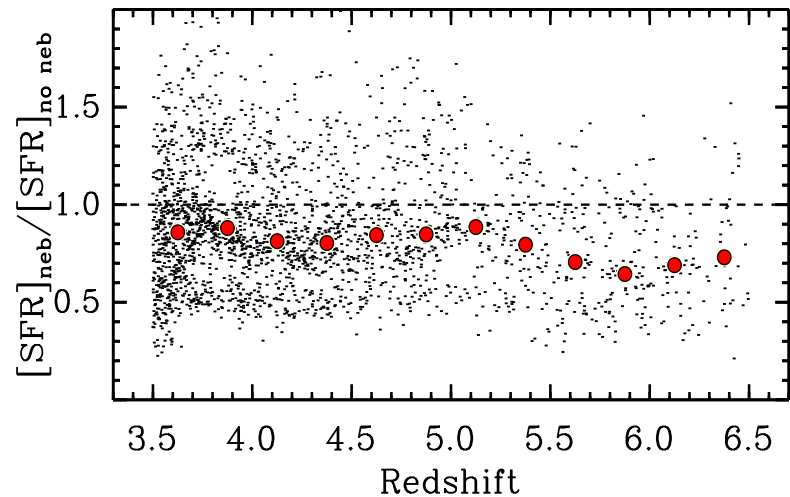
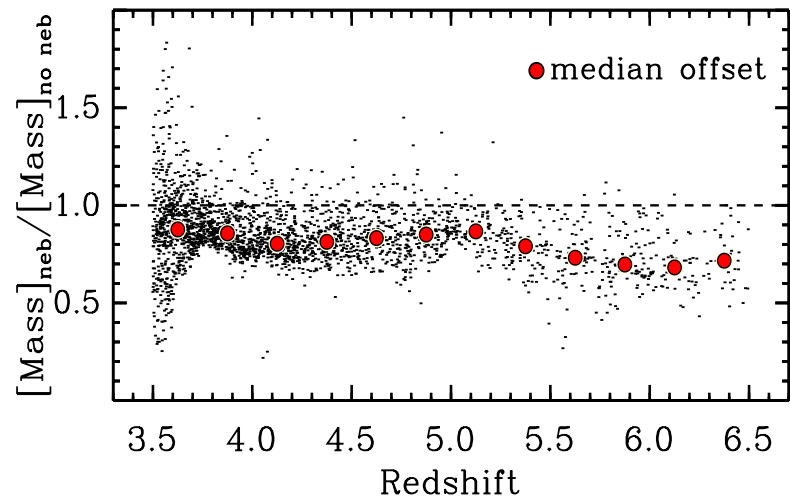
# Bayesian Approach SED Fitting



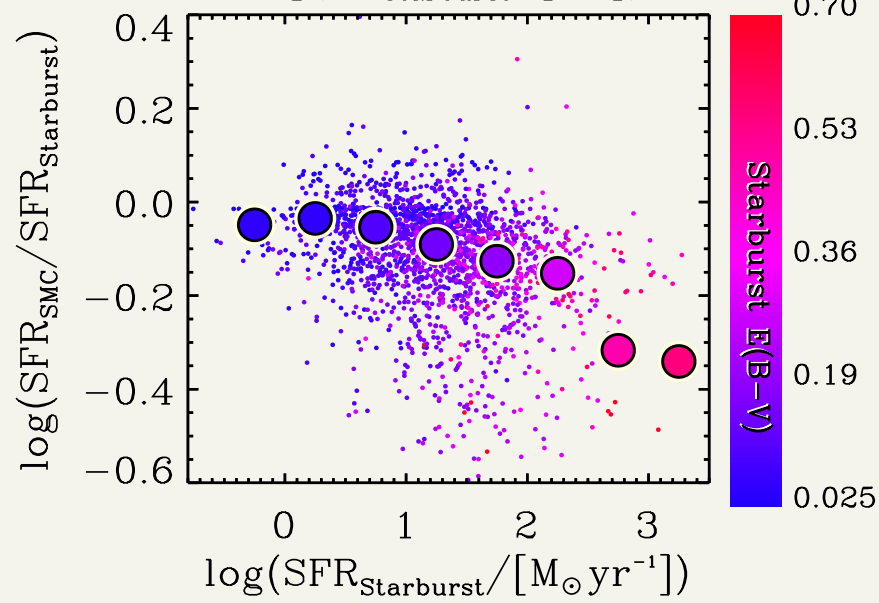
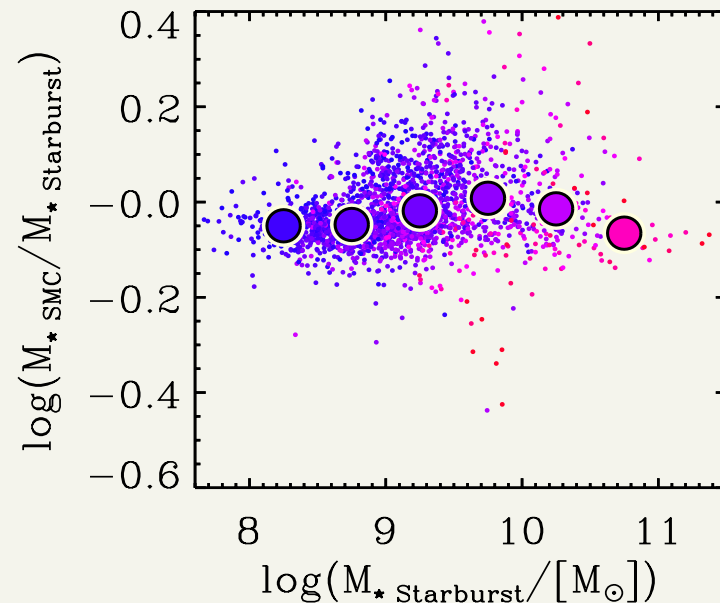
- The 1  
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# Sensitivity of Best Fits to Template Assumptions

## Nebular Emission



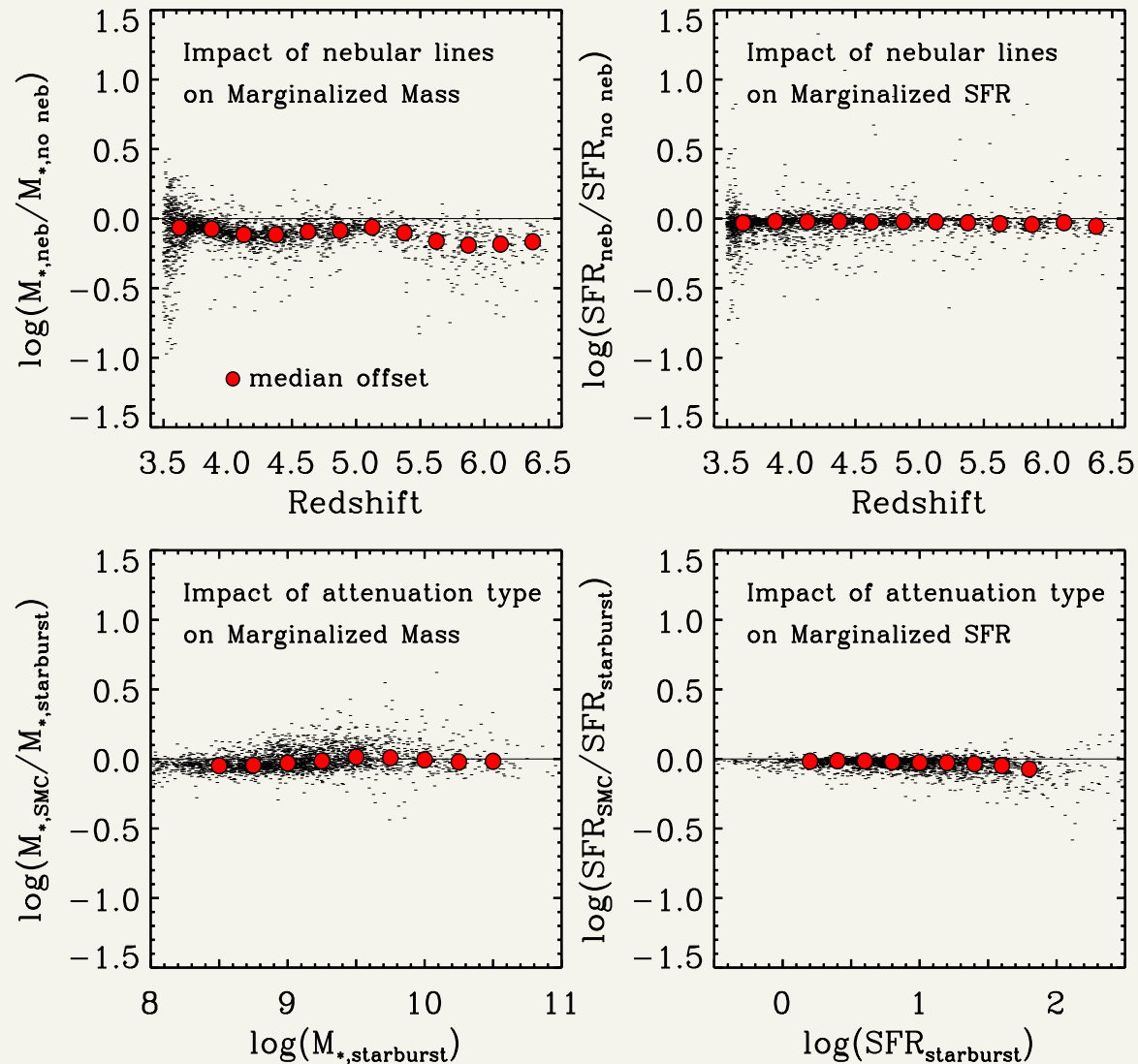
## Attenuation slope





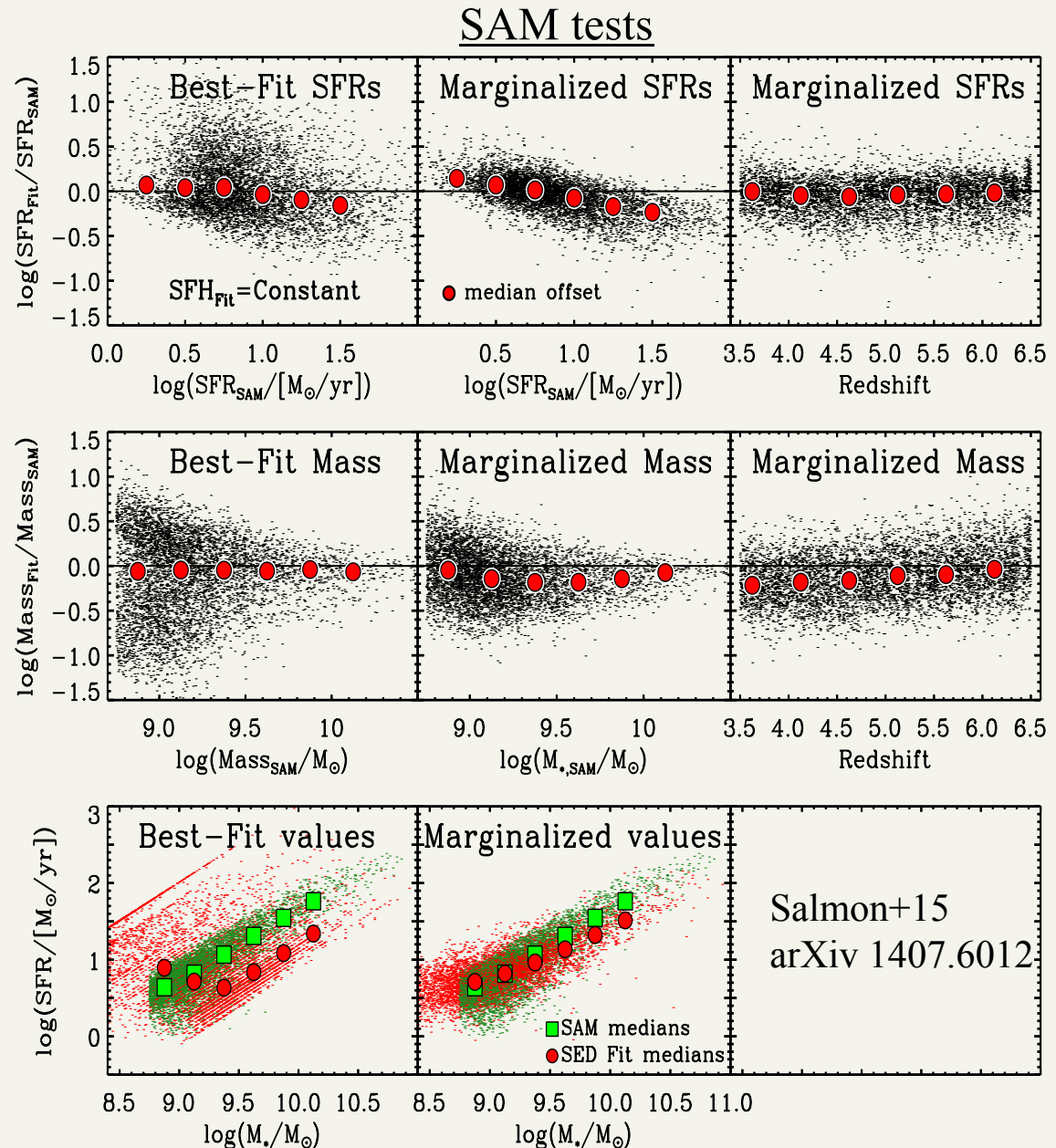
# Sensitivity of Marginalized Values to Template Assumptions

- When marginalizing over posterior, some template assumptions become less pronounced
- Inclusion of nebular emission still displays a (small) decrement to stellar mass
- Effects of nebular emission or attenuation type on the SFR are now negligible



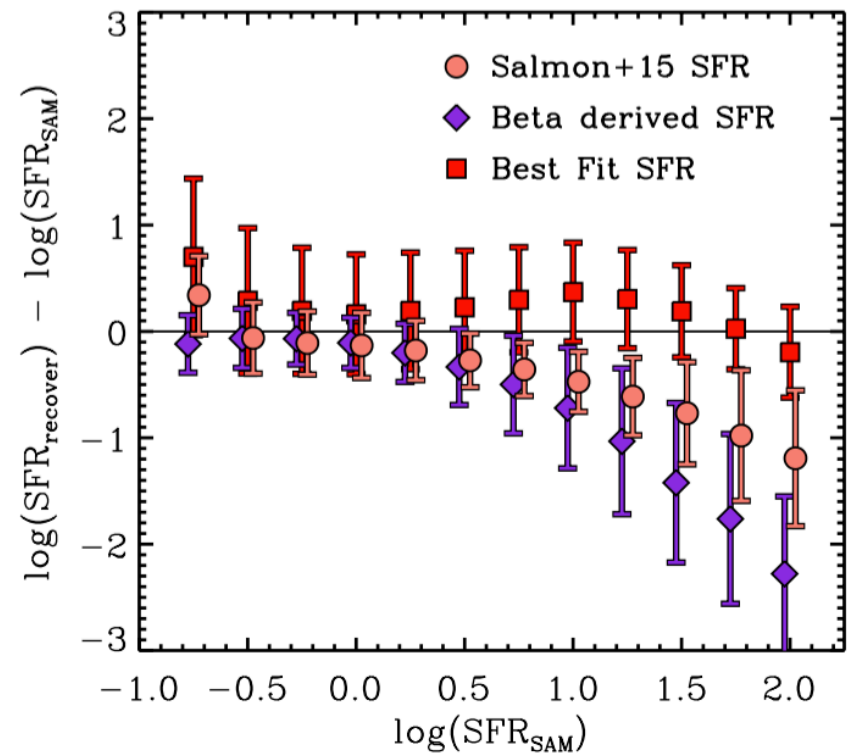
# Sensitivity of Marginalized Values to Template Assumptions

- We quantify our ability to derive SFR and  $M_\star$  by comparing to the Somerville et al. SAMs.
- SAM fluxes are perturbed by CANDELS-like uncertainties, and used as inputs
- The “best-fit” SED is less reliable at recovering SFR and  $M_\star$  than using the median of the marginalized likelihood.



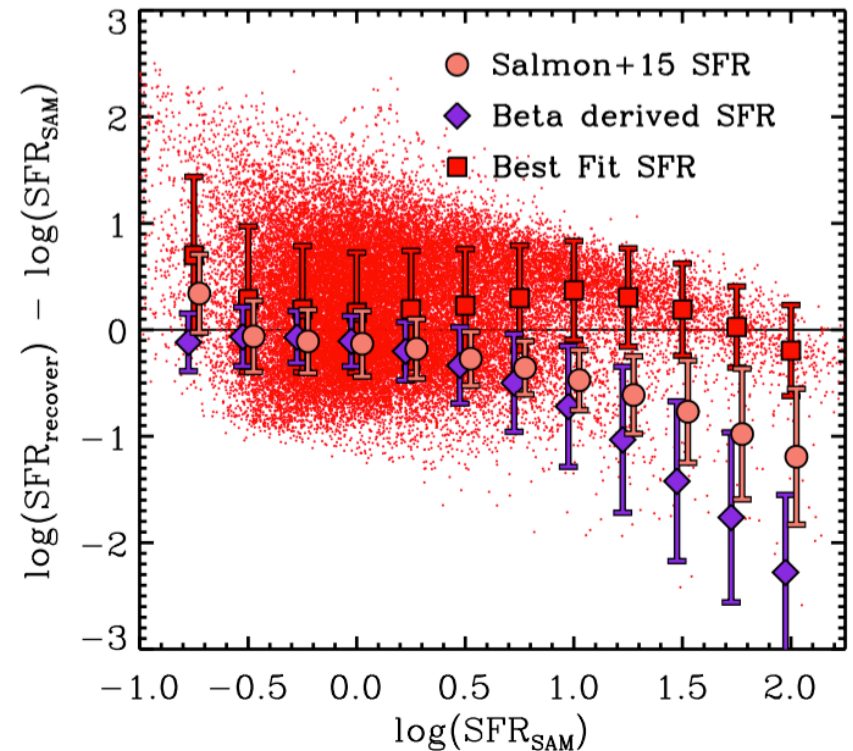
# Improvements to UV SFR

- The  $L_{UV}$  is corrected for dust according to the marginalized  $A_{UV}$  posterior. Then,  $L_{UV}$  is converted to SFR according to an age-dependent Kennicutt relation.
- The right shows recovery of SFR from SAM objects after CANDELS-like flux perturbations
- Beta-derived  $A_{UV}$  is severely underestimated at high SFRs
- A deeper investigation with the SAM dust law is needed



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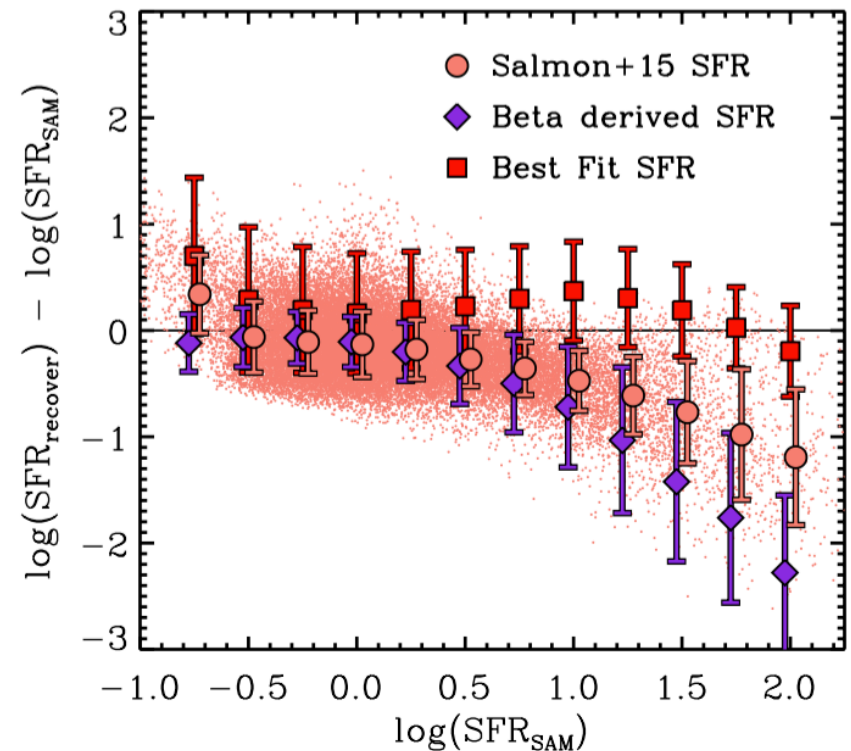
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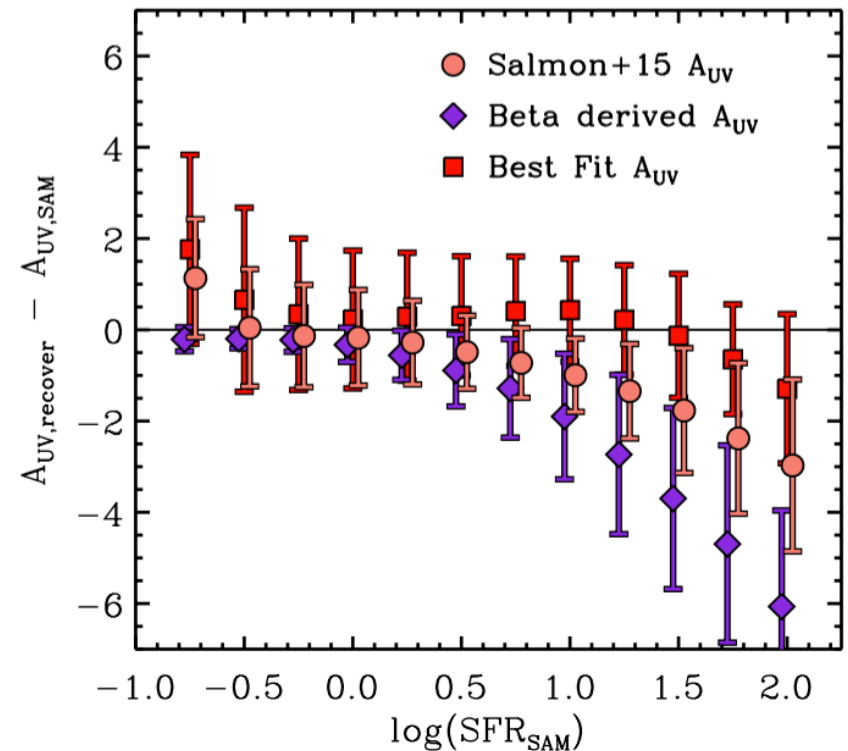
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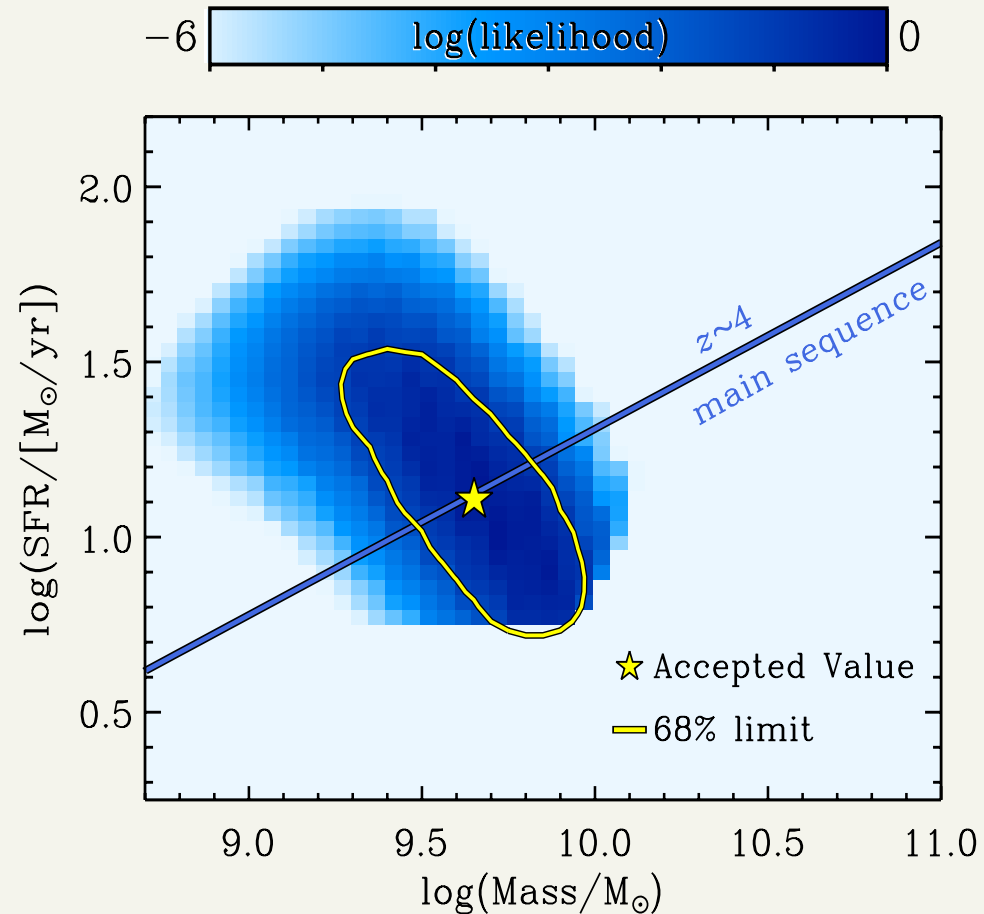


# SFR- $M_{\star}$ in CANDELS



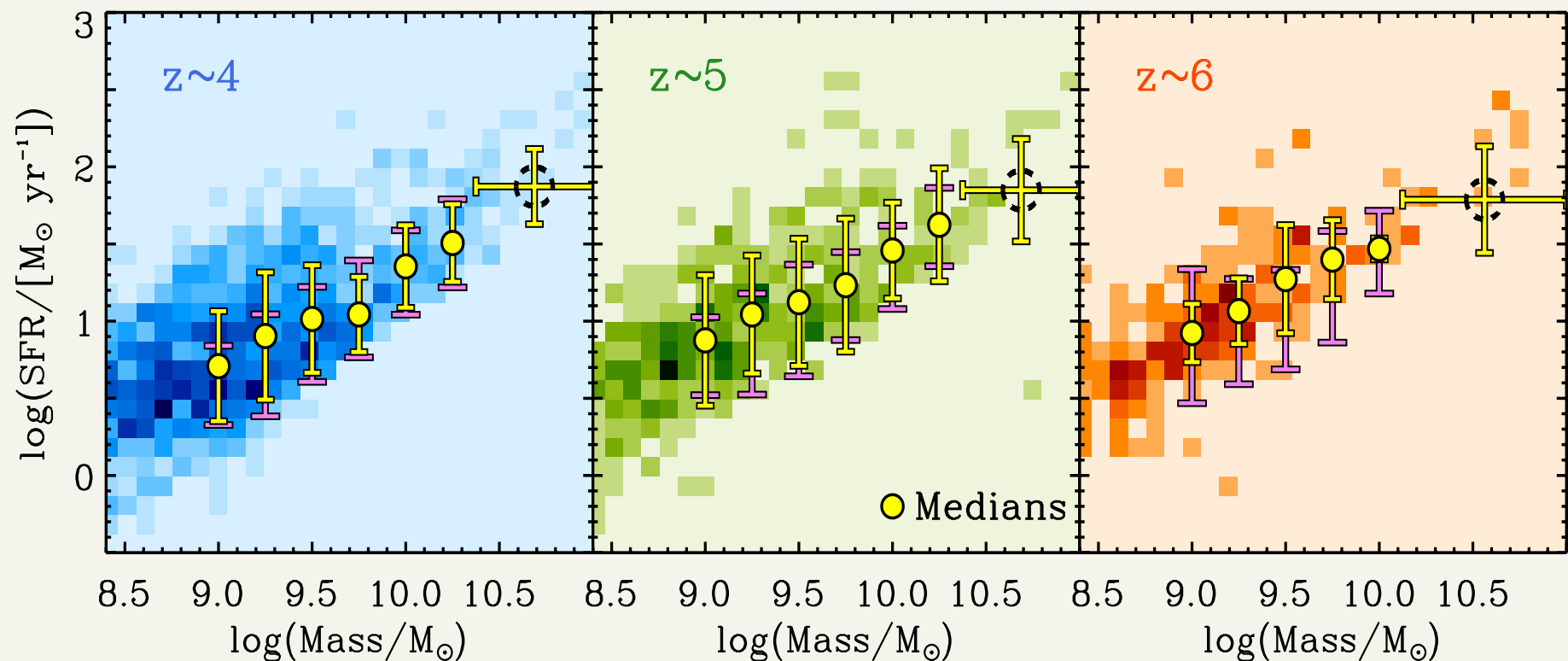
# Single Object Scatter in SFR- $M_{\star}$ Plane

- Right: an individual object's 2D likelihood in the plane of SFR- $M_{\star}$
- The scatter in determining a single object's SFR or  $M_{\star}$  is orthogonal to the main relation (from age-dust degeneracies)
- These observational uncertainties contribute scatter to the SFR- $M_{\star}$  plane, and must be accounted for with Monte Carlo simulations



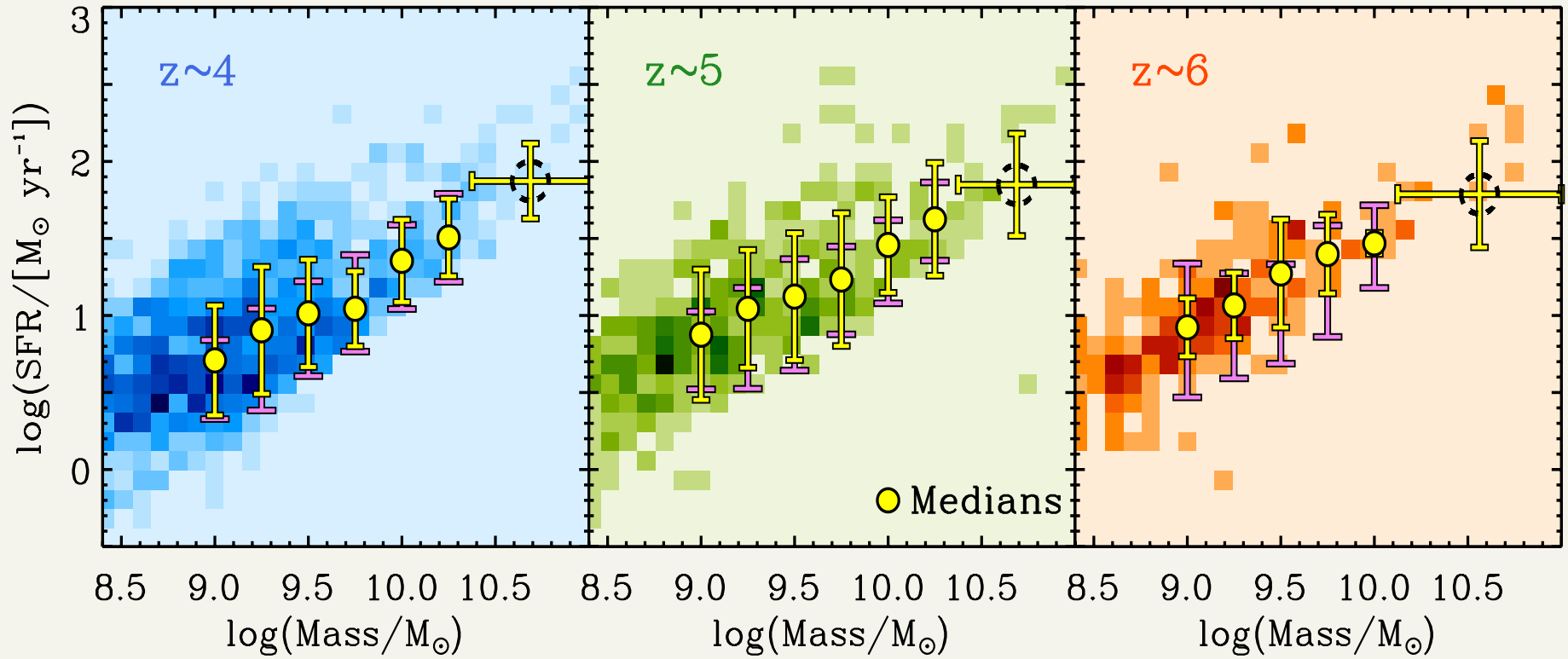


Result: Slope of SFR- $M_{\star}$  remains un-evolving up to  $z\sim 6$



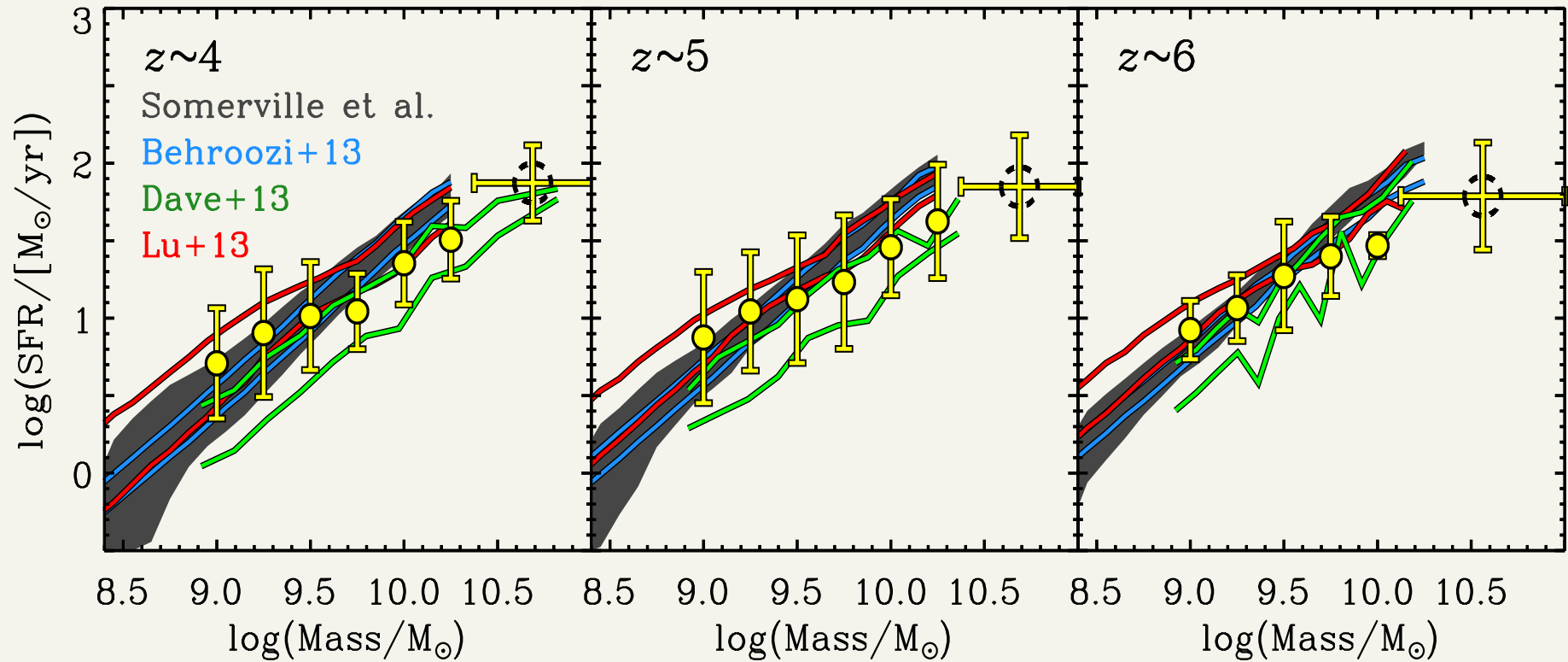
- $\log(\text{SFR}) \approx \alpha \log(M_{\star})$ ,  $\alpha$  remains  $< 1$  (about  $\alpha=0.6$  across all redshift)

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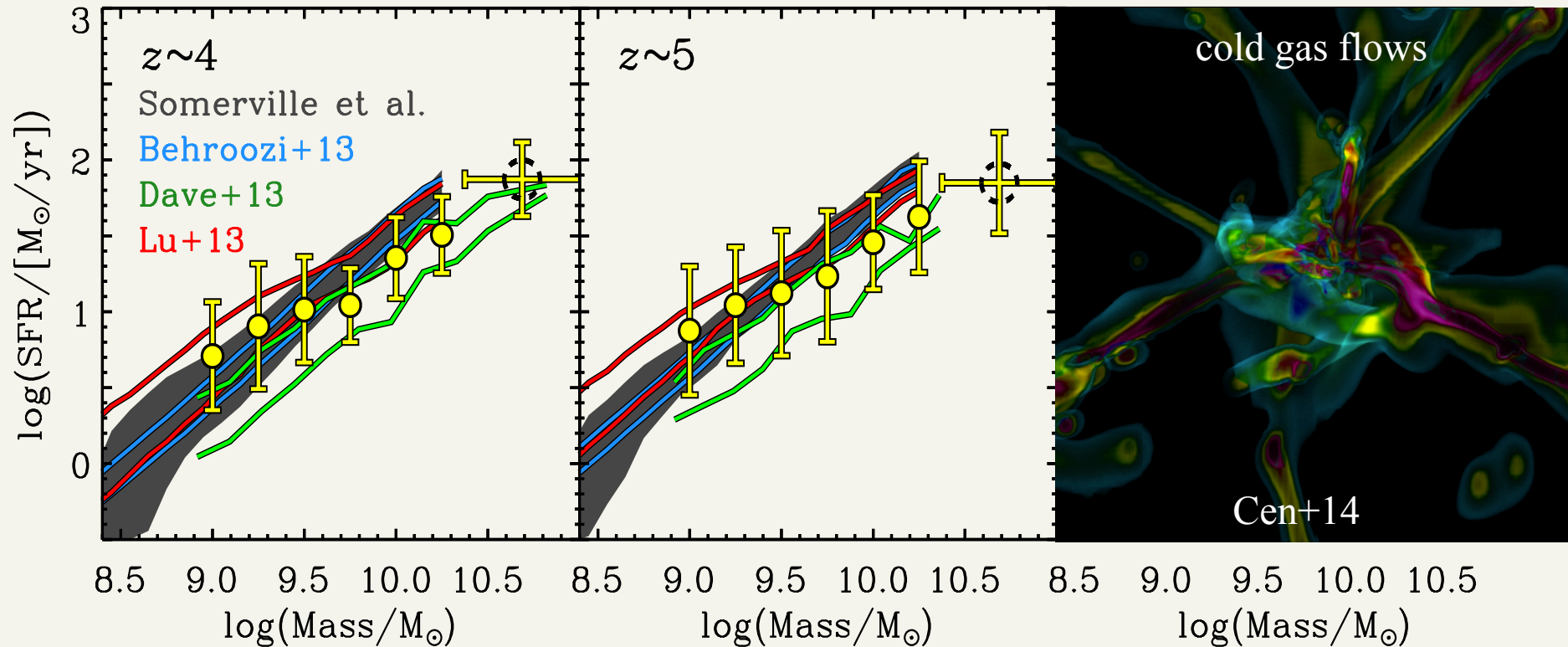
- $\log(\text{SFR}) \approx \alpha \log(M_{\star})$ ,  $\alpha$  remains  $< 1$  (about  $\alpha=0.6$  across all redshift)
- Considering most observational uncertainties (purple), the “true” intrinsic scatter in SFR- $M_{\star}$  is as much as 0.2-0.3 dex

Result:  $\text{SFR}-M_{\star}$  is consistent with many theoretical models



- If SFR traces the net gas inflow, then the “true” scatter in the inflow rate is 0.2-0.3 dex.
- Does this imply that, on average, early galaxy growth history is not stochastic?

Result:  $\text{SFR}-M_{\star}$  is consistent with many theoretical models

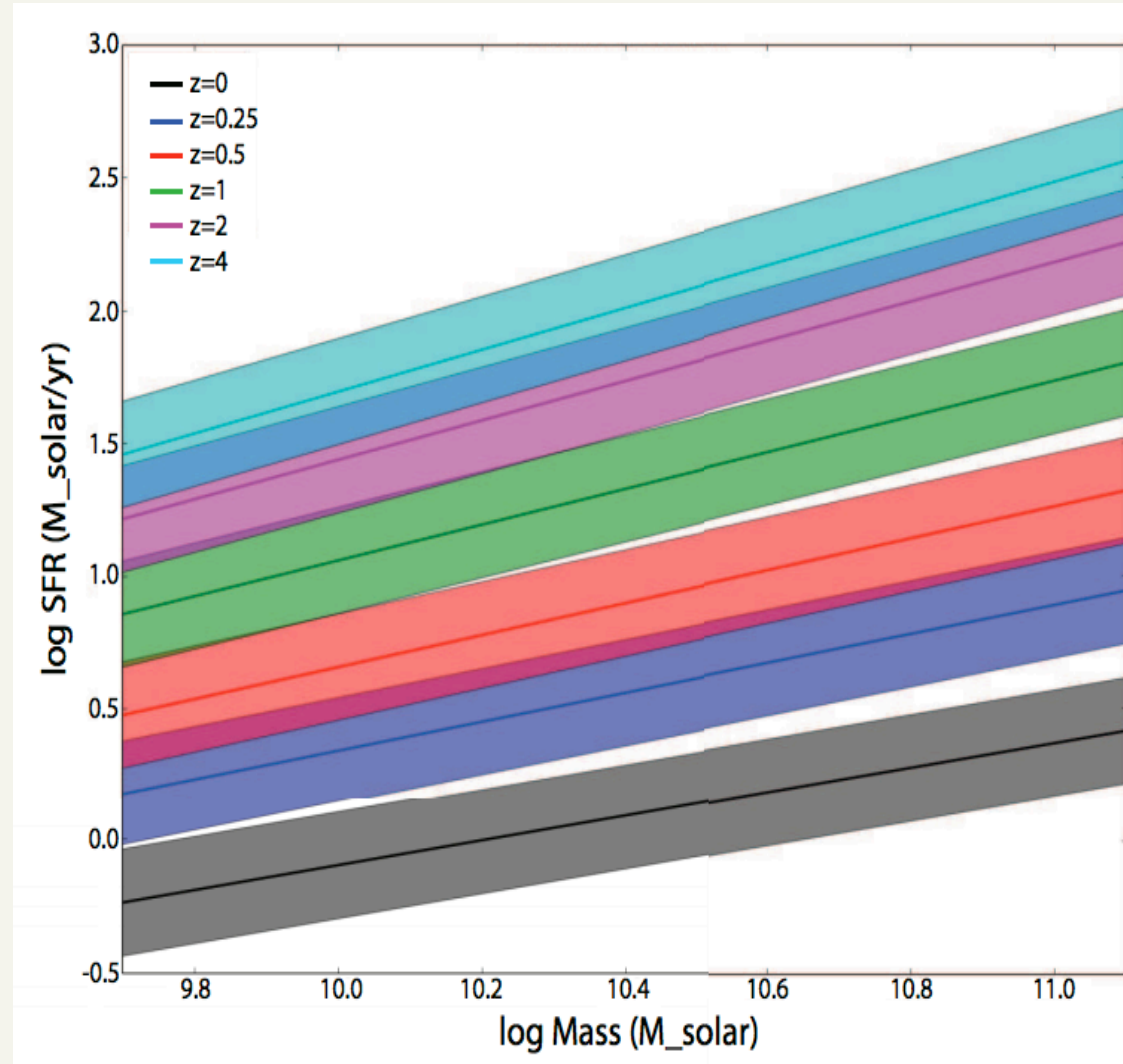


- If SFR traces the net gas inflow, then the “true” scatter in the inflow rate is 0.2-0.3 dex.
- Does this imply that, on average, early galaxy growth history is not stochastic?
- These observations favor smooth gas accretion over these redshifts and stellar masses



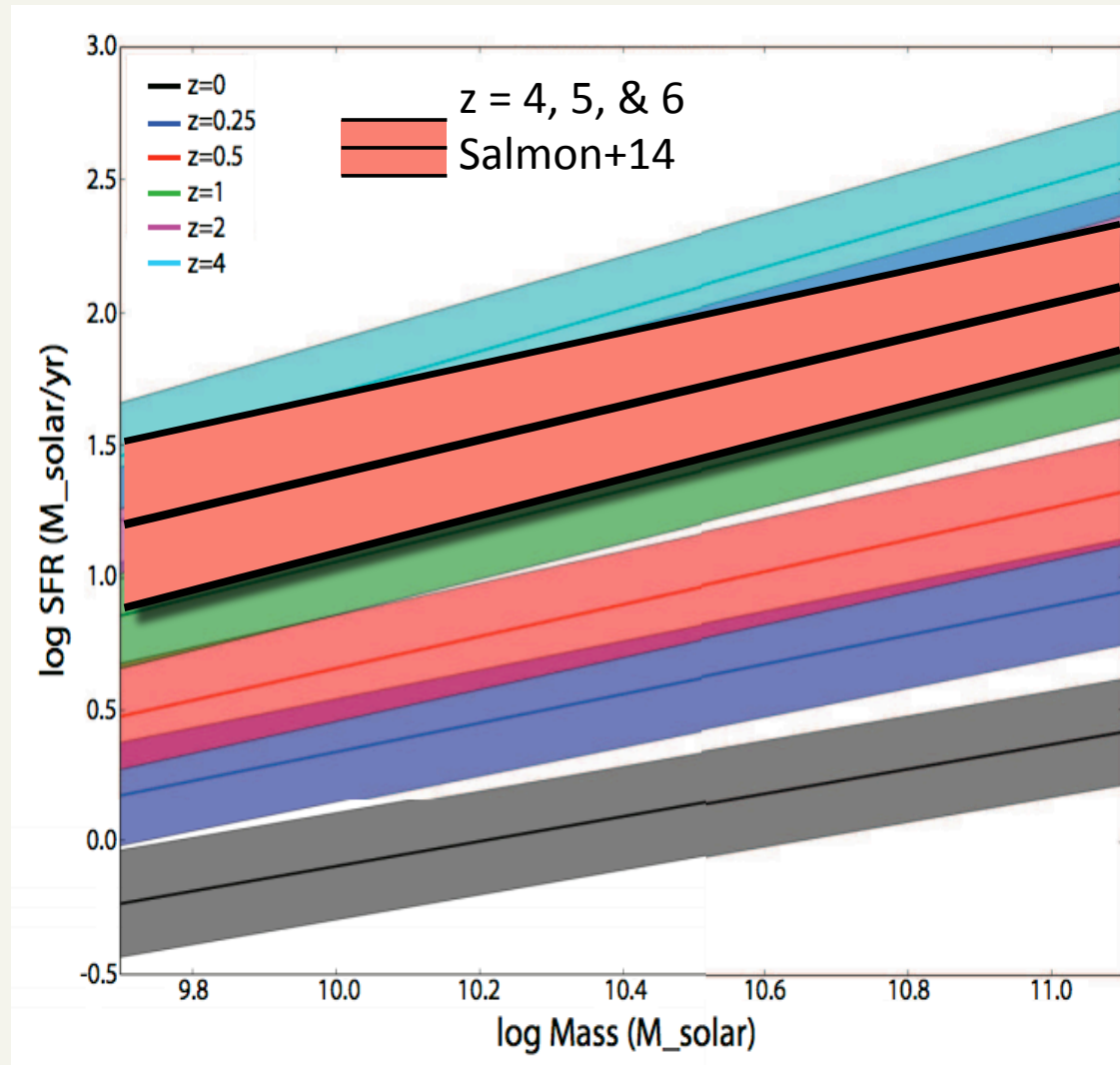
# How Does this SFR- $M_{\star}$ relation evolve over time? and in the literature?

- At least since the first 800 Myr of the Universe, the scatter in SFR at a given mass is small ( $\sim 0.2$ - $0.3$  dex after taking into account observational uncertainties).
- The SFH can be best described as a power law  $\text{SFR} = (t/\tau)^{\gamma}$ , where  $\gamma=1.4$  at high redshift ( $z>4$ ).



# SFR- $M_{\star}$ evolves little in slope, and decreases in scale over cosmic time

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- The SFH can be best described as a power law  $\text{SFR} = (t/\tau)^{\gamma}$ , where  $\gamma=1.4$  at high redshift ( $z>4$ ).
- The slope and scatter at high redshift is consistent with low- $z$  results in the literature.

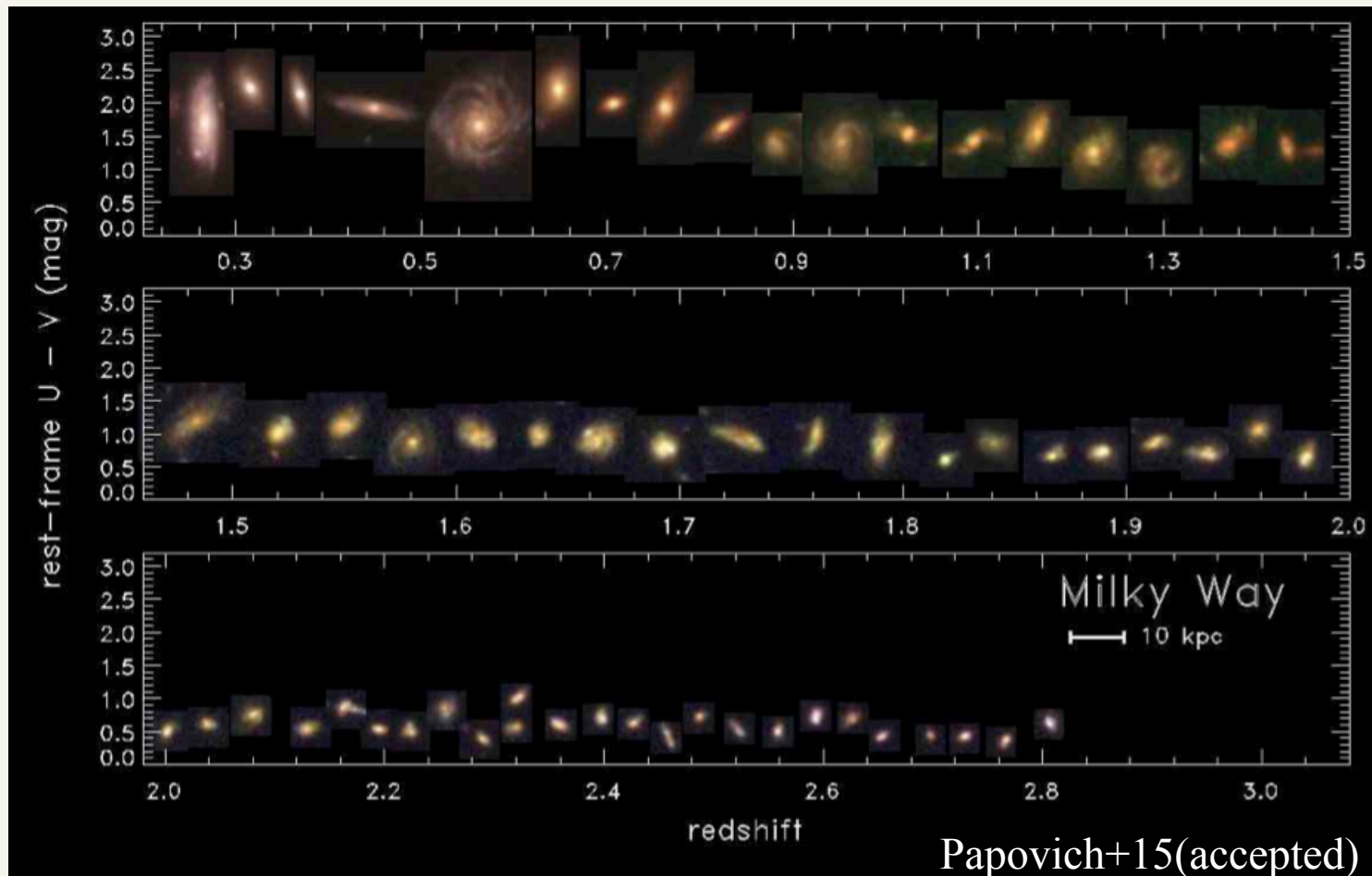


# Star-Formation Histories

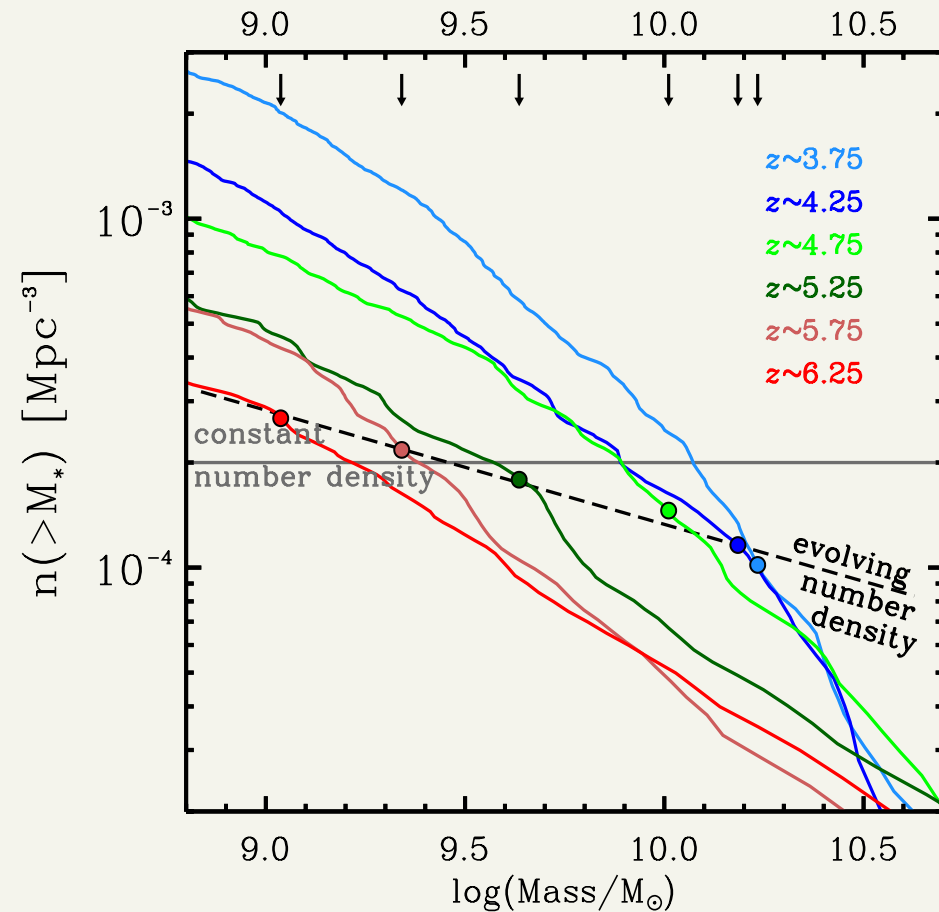


# A Test: What Does the History of These Galaxies Look Like?

- A number-density selection can track the progenitor-to-descendant evolution across redshift.
- The most massive galaxies in a comoving volume, will be the progenitors of the most massive galaxies at a later time



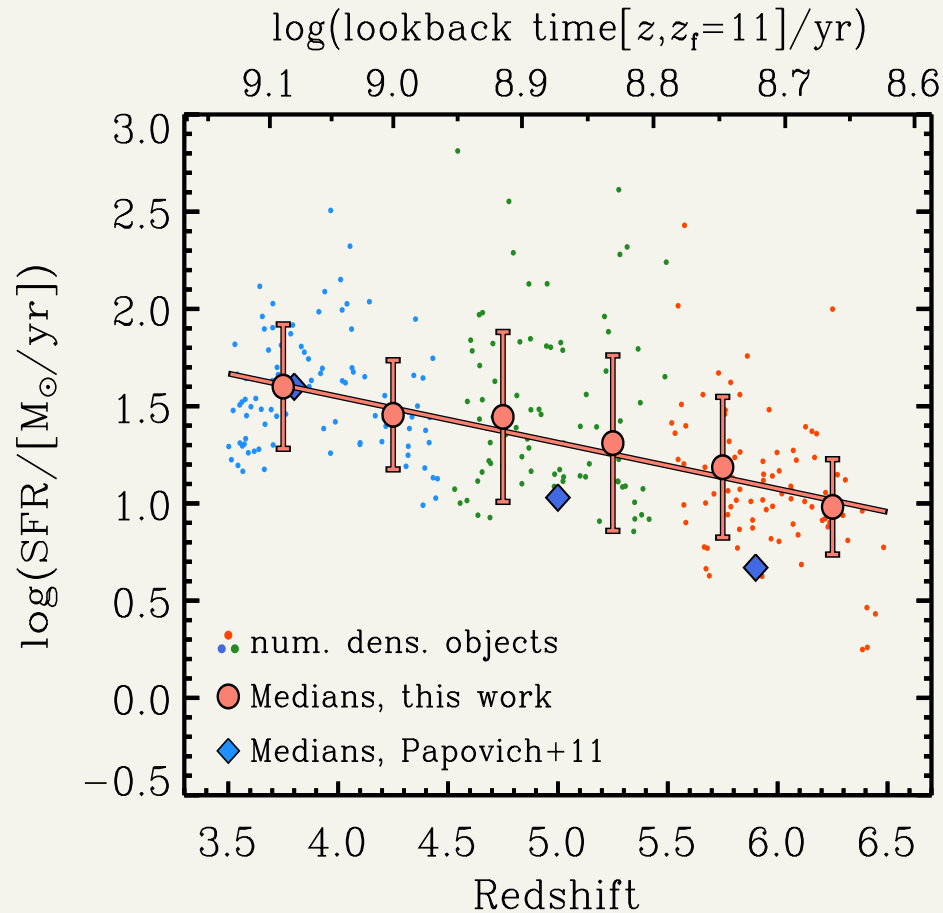
# A Test: What Does the History of These Galaxies Look Like?



- Objects were selected according to an evolving number density in stellar mass, as predicted by dark matter abundance matching (Behroozi+13b)

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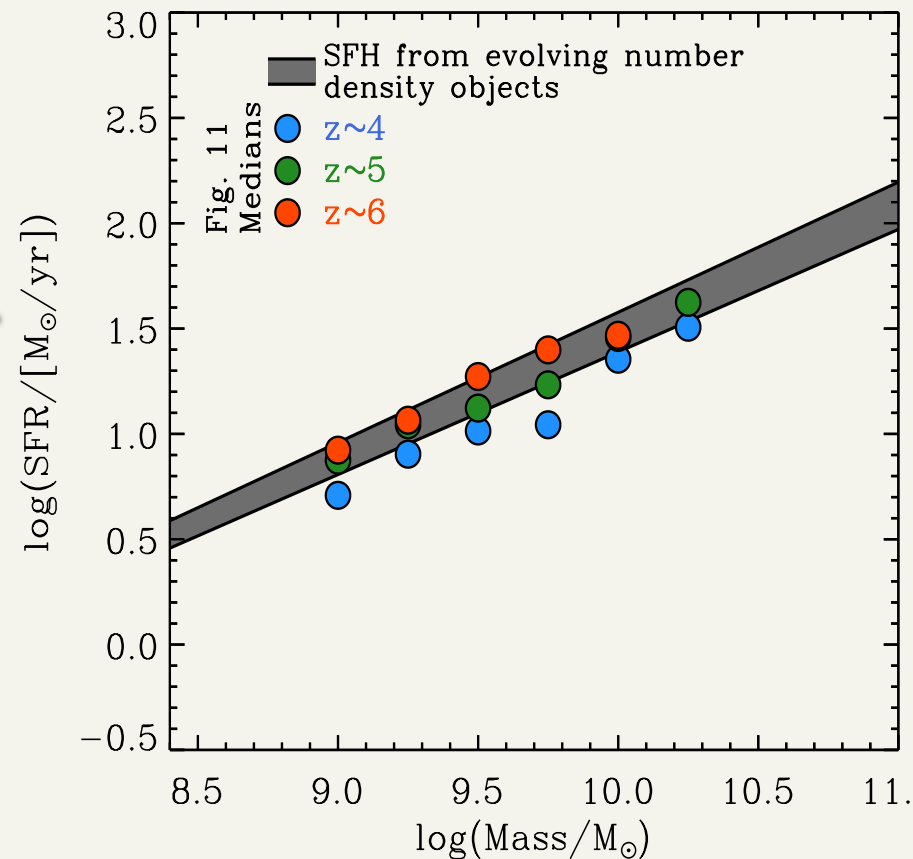
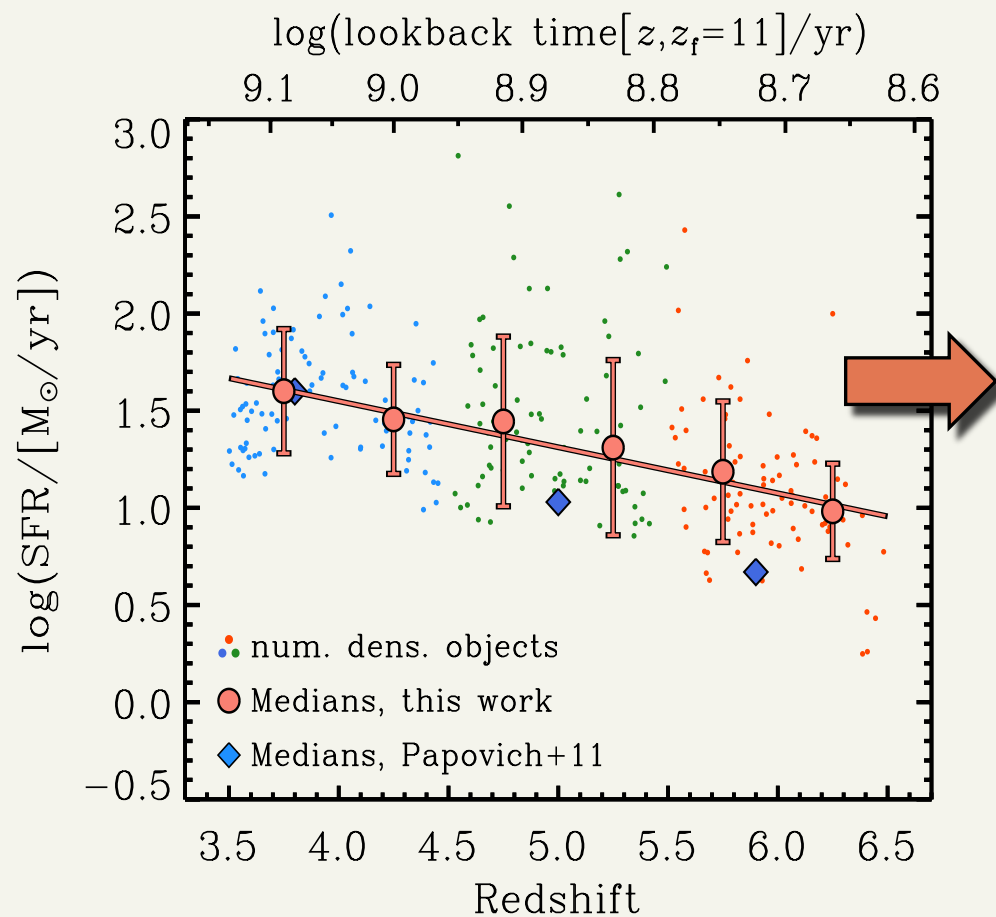
Does it match the observed SFR- $M_*$  relation?



- Objects were selected according to an evolving number density in stellar mass, as predicted by dark matter abundance matching (Behroozi+13b)
- We find a rising SF history at high redshift, as expected, with  $\text{SFR} = (t/\tau)^\gamma$  and  $\gamma=1.4$
- Now, let's feed this history into a stellar population synthesis model

# A Test: What Does the History of These Galaxies Look Like?

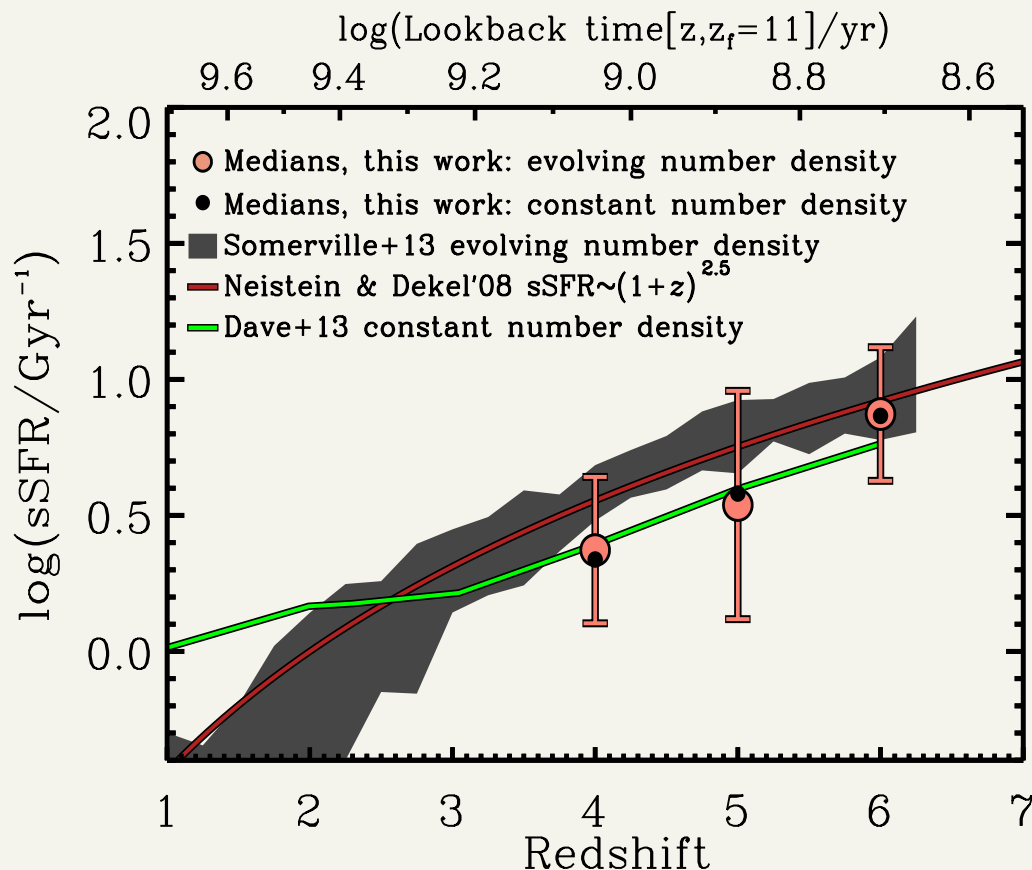
Does it match the observed SFR- $M_\star$  relation?





# We need dust measurements of high- $z$ galaxies to constrain the SFR efficiency

- Theory predicts a rapidly evolving gas-mass fraction with redshift.
- Data is broadly consistent with trend, but scatter in sSFR is still depending on SED modeling
- Must turn to [CII] from ALMA to determine the dusty IR SFR, constraining the total UV+IR SFR
- We also need gas masses to find the cause of the SFR- $M_{\star}$  scatter (is it SF efficiency or scatter in galaxy formation time?)



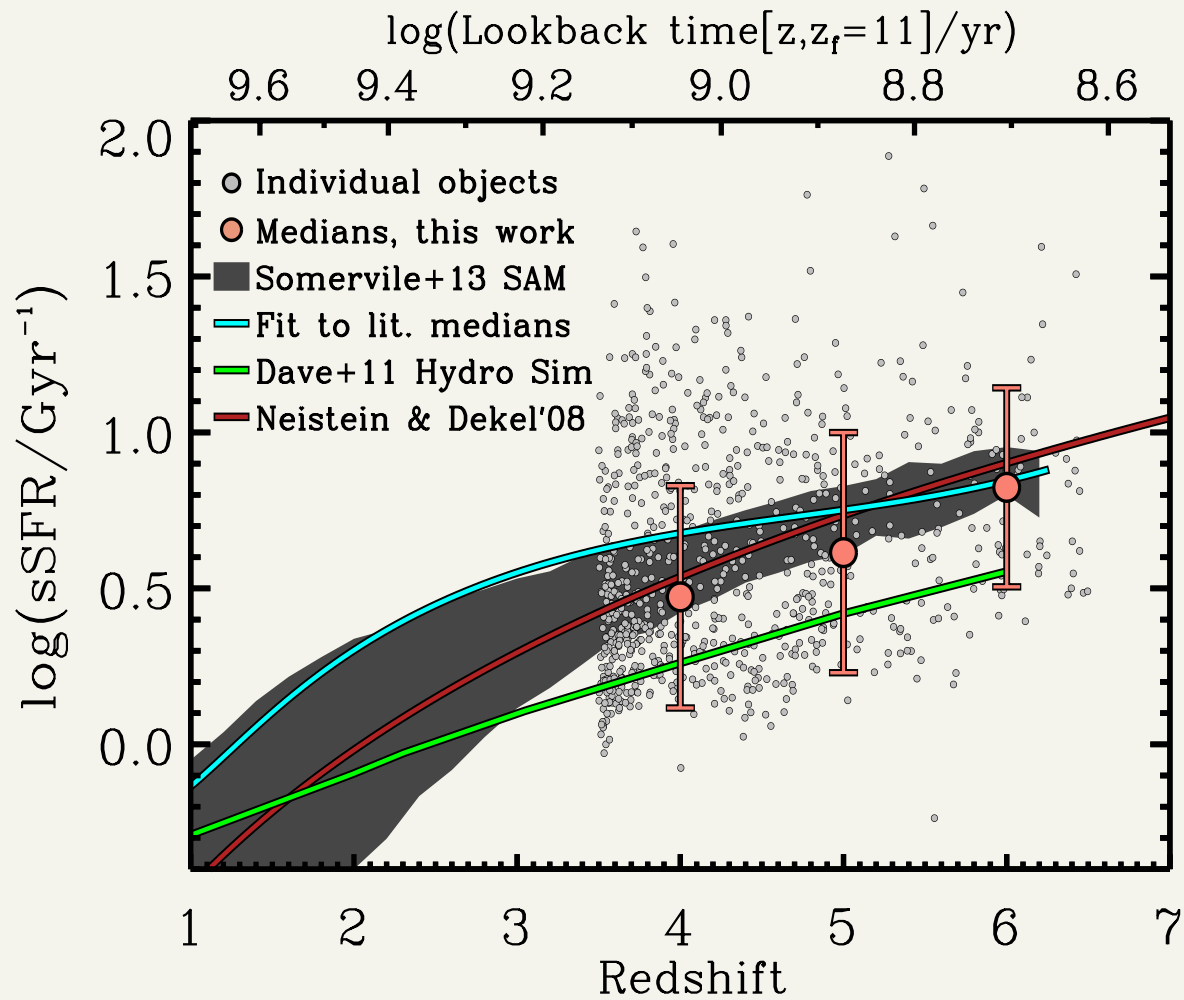
Observational uncertainties are still too high to make model constraints

Salmon+15 (accepted)

# Summary

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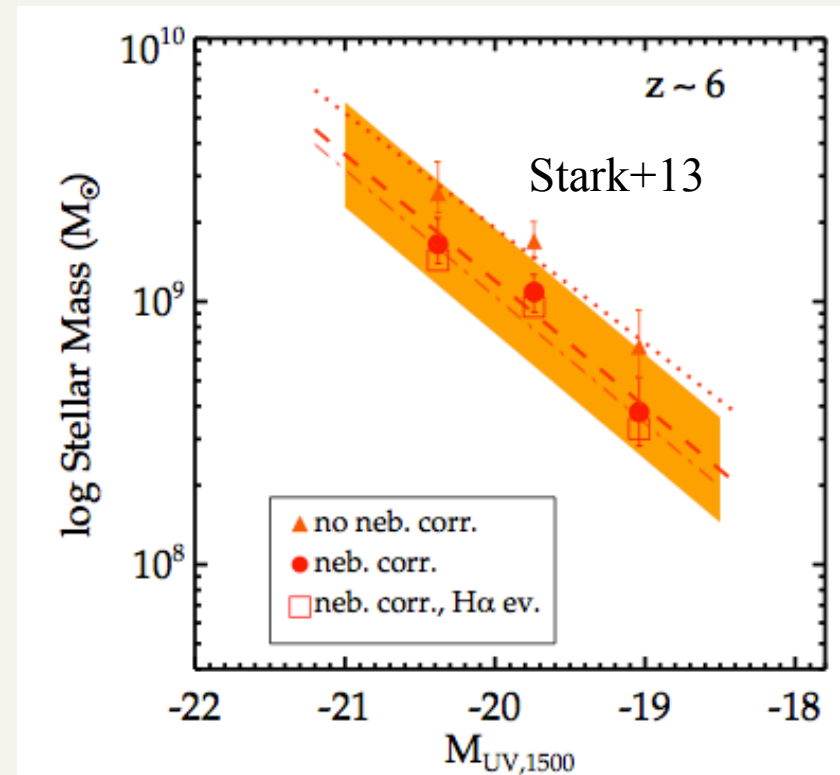
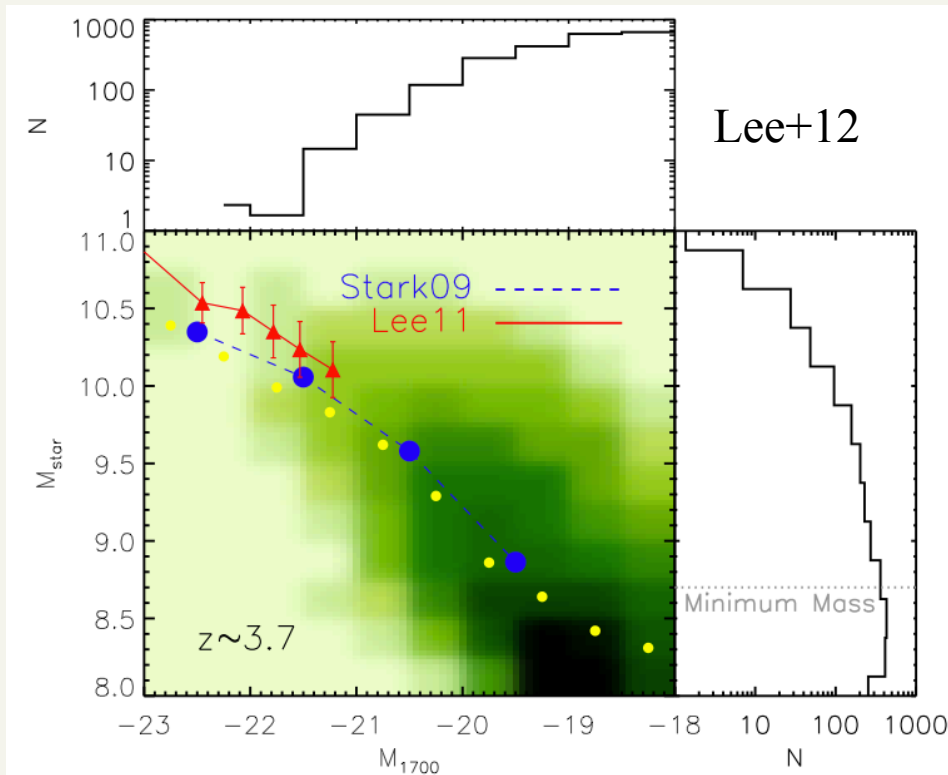
- Whenever possible, use marginalized information instead of best-fit results. However, this will introduce a prior that is dependent on the assumed templates
- The marginalized approach to the UV SFR seems favorable, though further tests to SAMs are needed
- The relation between SFR and  $M_{\star}$  for star-forming galaxies evolves little in slope, and declines in scale since the 1<sup>st</sup> Gyr of the Universe (Wuyts+11, Panella+14).
- The scatter in SFR at a given mass is small at all redshifts ( $\sim 0.2$ - $0.3$  dex after taking into account observational uncertainties). If SFR traces the net gas inflow rate, then this result favors smooth, cosmological gas accretion onto galaxies.
- The SFH can be best described as a power law  $\text{SFR} = (t/\tau)^{\gamma}$  at high redshift ( $z > 4$ ,  $\gamma = 1.4$ ), or a delayed-tau model across the age of the Universe (Salmon+15).



# What do we know?

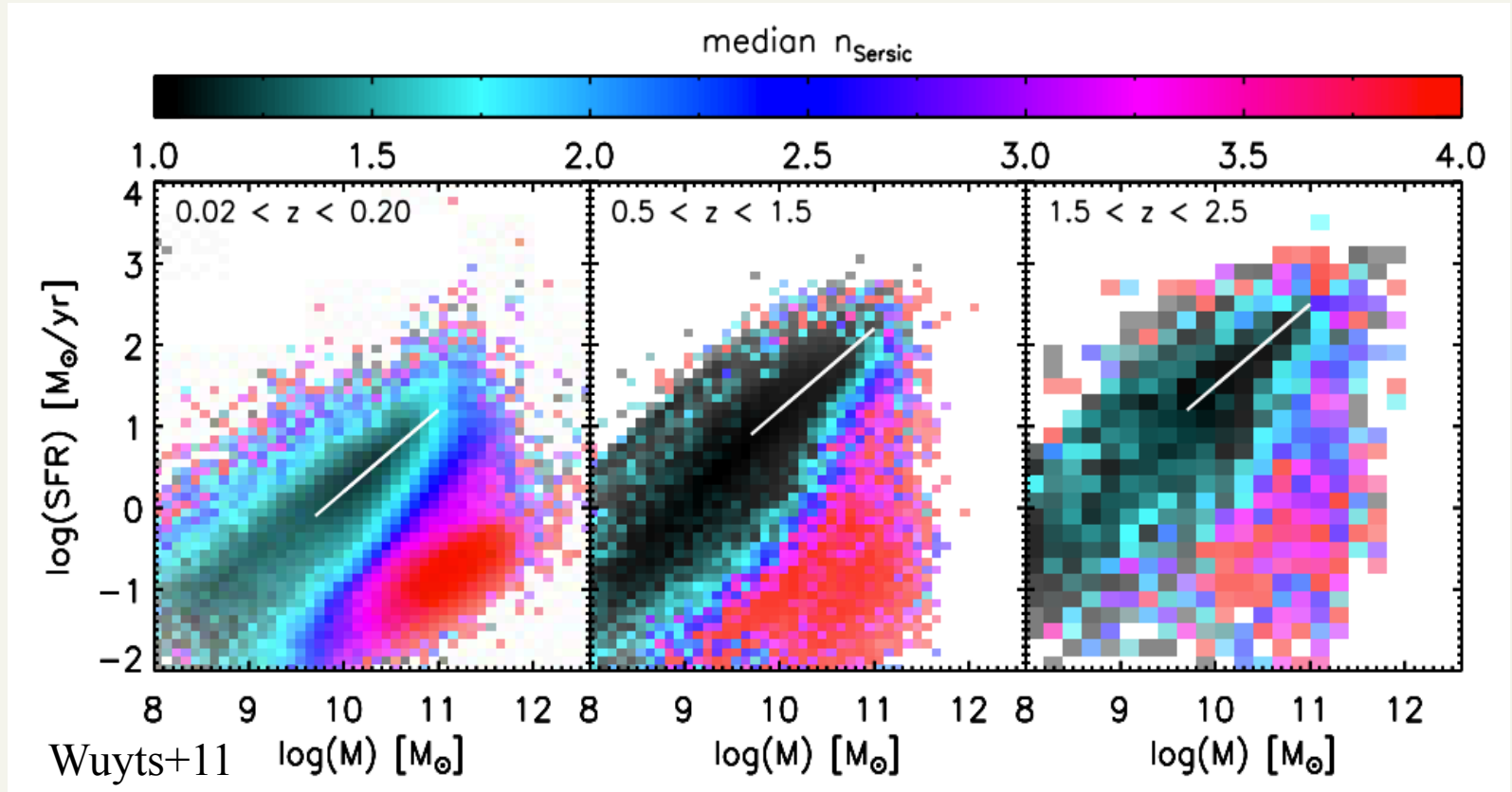
Dust is important, lending to scatter in  $M_{UV}-M_{\star}$

- There is an observed correlation between MUV and stellar mass, but with significant scatter
- The scatter may be physical, or due to a range of dust attenuations at a given stellar mass. The answer lies in the scatter about the main sequence of SFR- $M_{\star}$



# What do we know?

The relation between SFR and  $M_{\star}$  reveals interesting galaxy physics



- SFR- $M_{\star}$  can distinguish between star-forming, elliptical, and starburst galaxies
- A relation means the current SFR is proportional to the integral of SFR over time
- The scatter about SFR- $M_{\star}$  can be due to
  - scatter in the net inflow rate of gas to fuel star formation
  - scatter in the galaxy formation time

# What drives galaxies off the SFR- $M_{\star}$ relation?

and with what uncertainties?

- Physical causes:
  - Starbursts, AGN
  - Stochastic SF histories
  - Star-formation quenching (mainly at low redshift)
- $M_{\star}$  correlates strongly with UV dust attenuation (Panella+14).

If the scale of SFR- $M_{\star}$  decreases with time, then galaxies with the same amount of SF are *less* attenuated at higher redshift (it is hosted by a less massive, less metal rich galaxy).

