

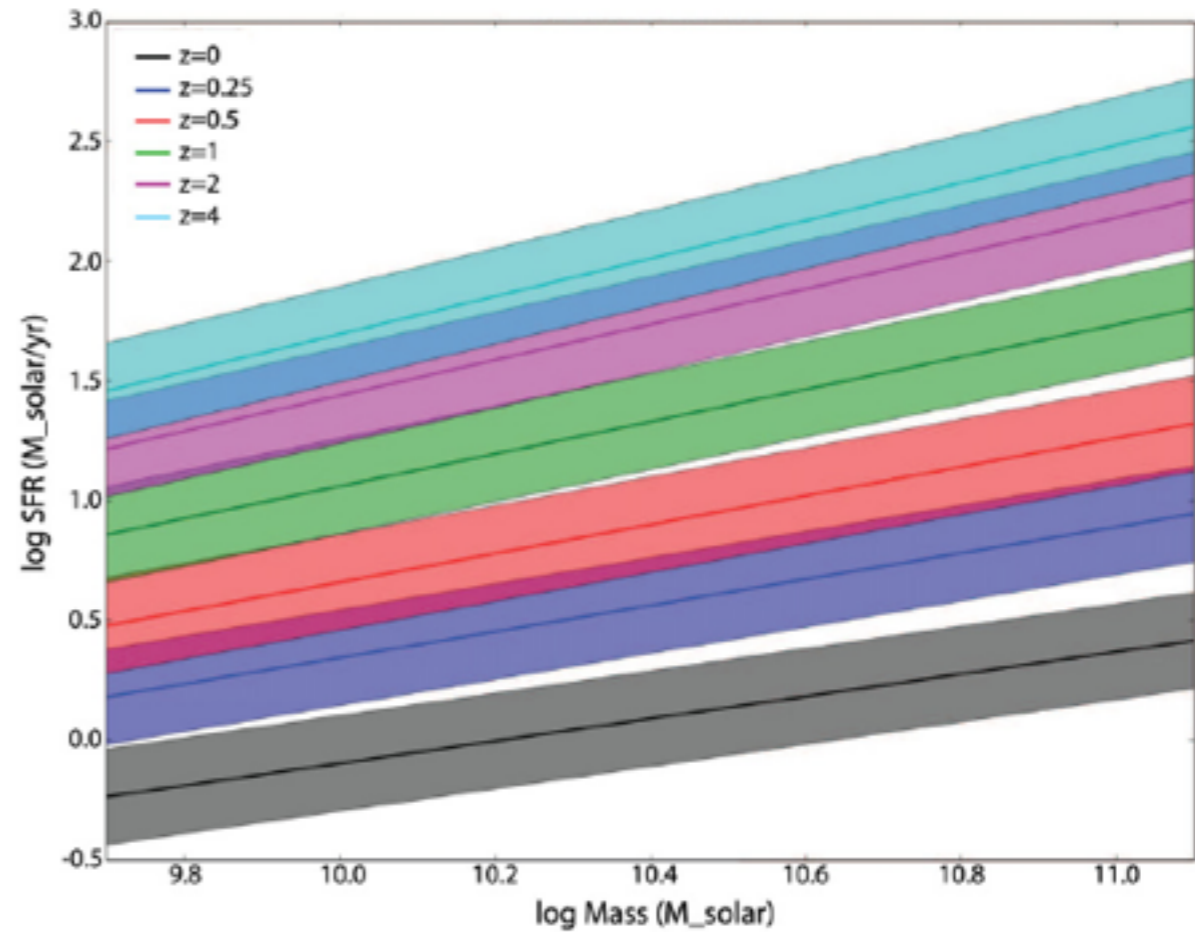
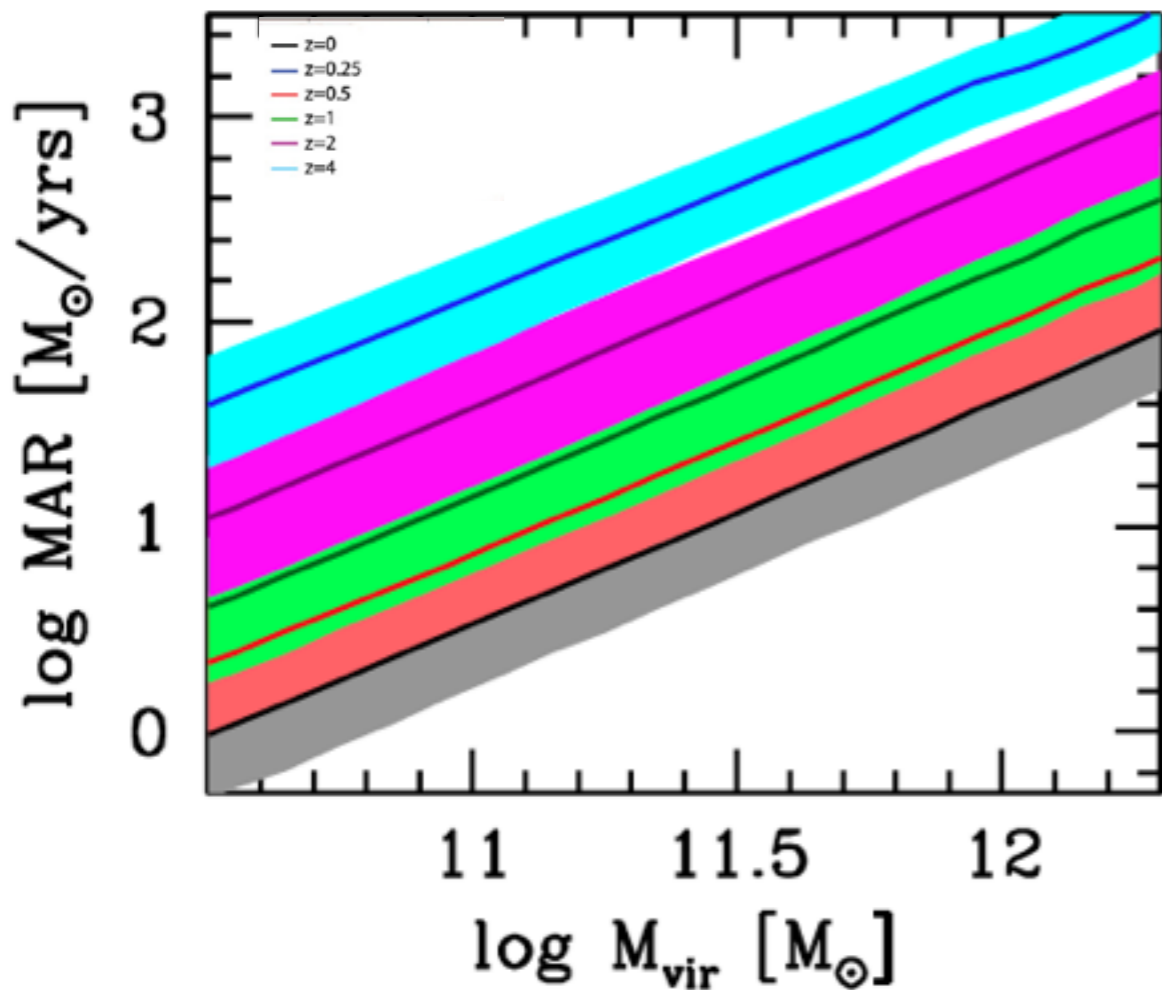
# The Galaxy-Halo Connection: Applications to high redshifts



Aldo Rodriguez-Puebla, UCSC

# Halo & Galaxy assembly

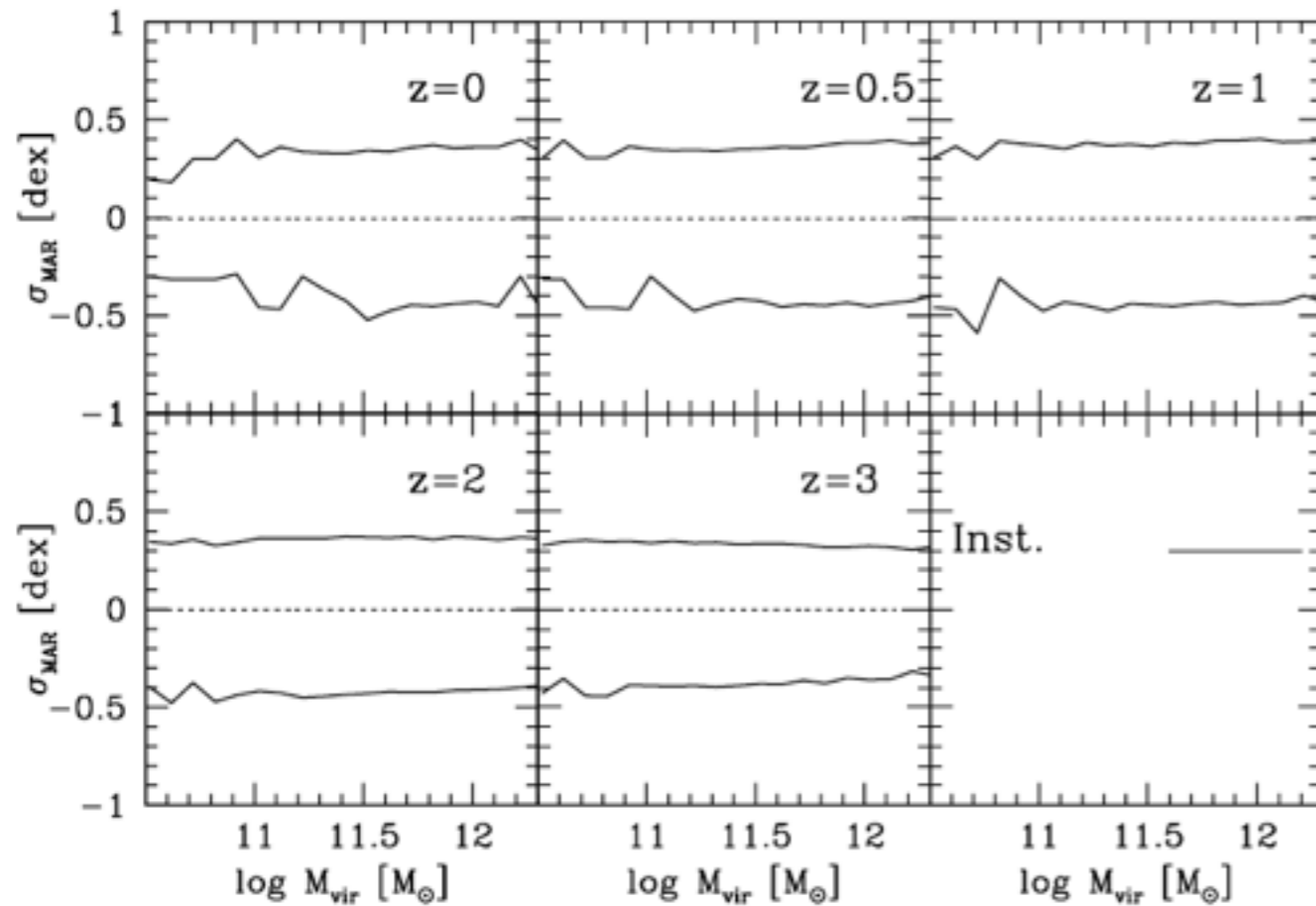
$$\beta \approx 1.1$$



Speagle+2014, and reference therein.

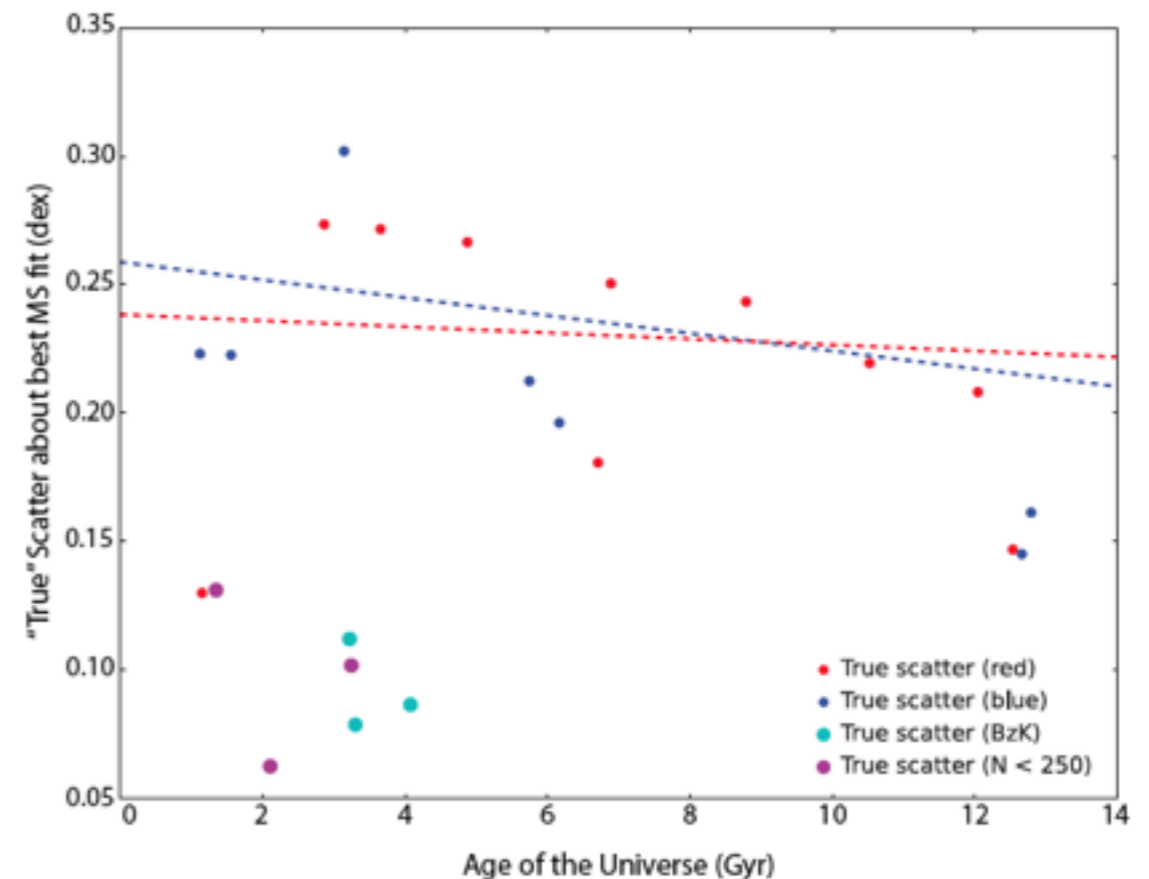
$$\beta \approx 1 - 0.6$$

# Scatter of the Halo Mass Accretion Rate and the SF-MS

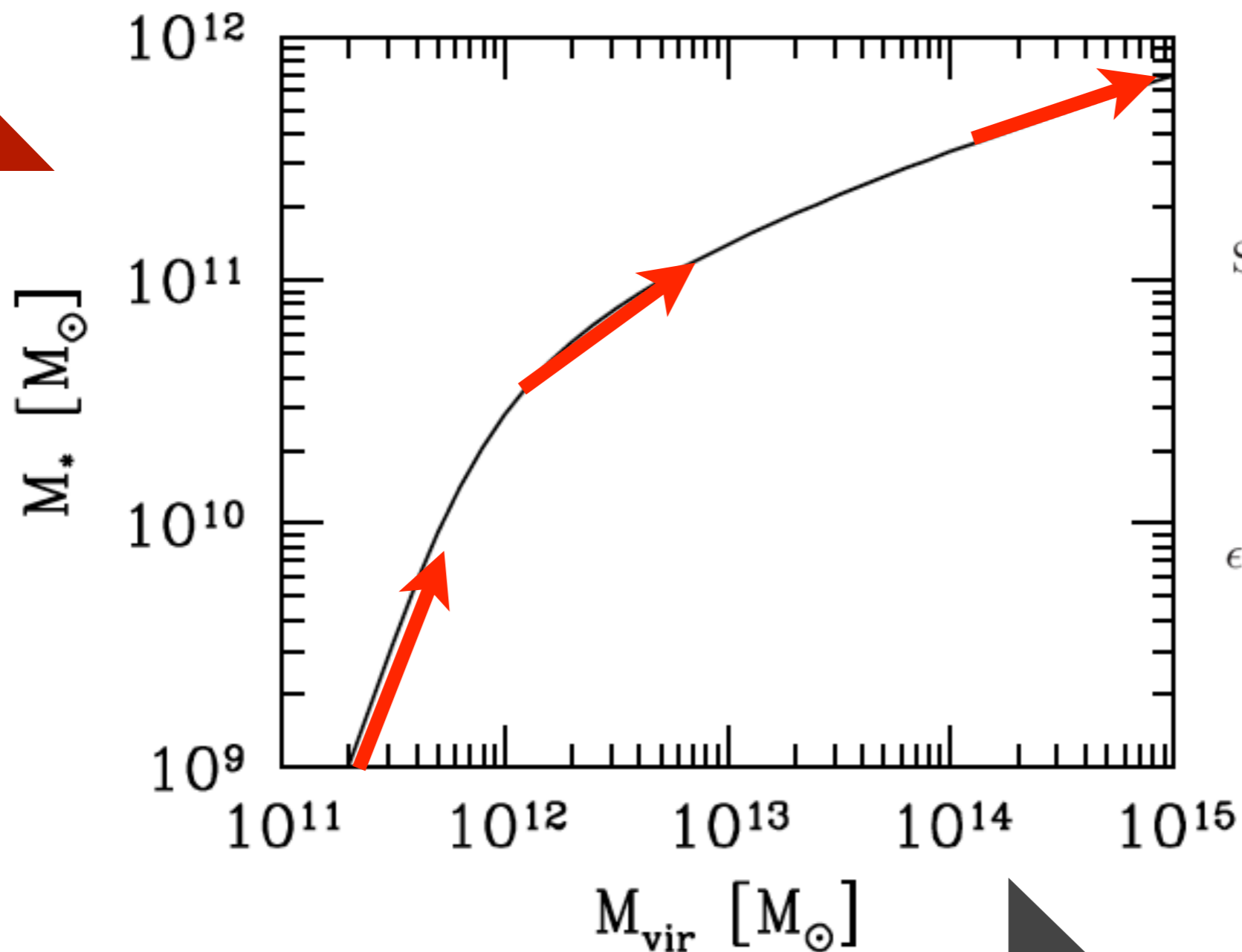


$\sigma \approx 0.3-0.4$

$\sigma \approx 0.3$



# SHMR for Central galaxies from Bolshoi-Planck sim.



$$M_* = M_*(M_{\text{vir}}(t))$$

$$\text{SFR} = f_* \times \epsilon \times \dot{M}_{\text{vir}} / (1 - R)$$

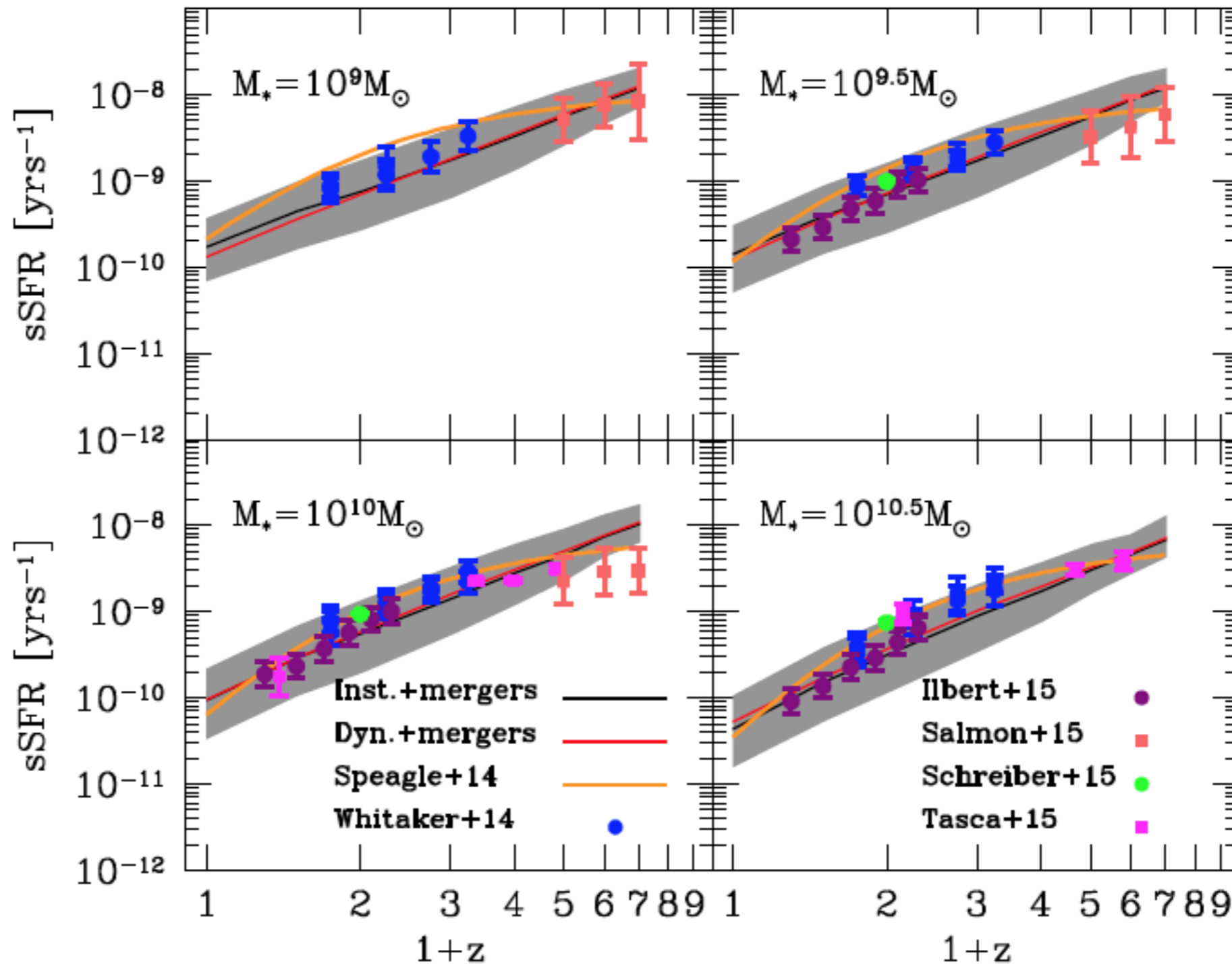
$$f_* = M_* / M_{\text{vir}}$$

$$\epsilon = \frac{\dot{M}_* / M_*}{\dot{M}_{\text{vir}} / M_{\text{vir}}} = \frac{\partial \log M_*}{\partial \log M_{\text{vir}}}$$

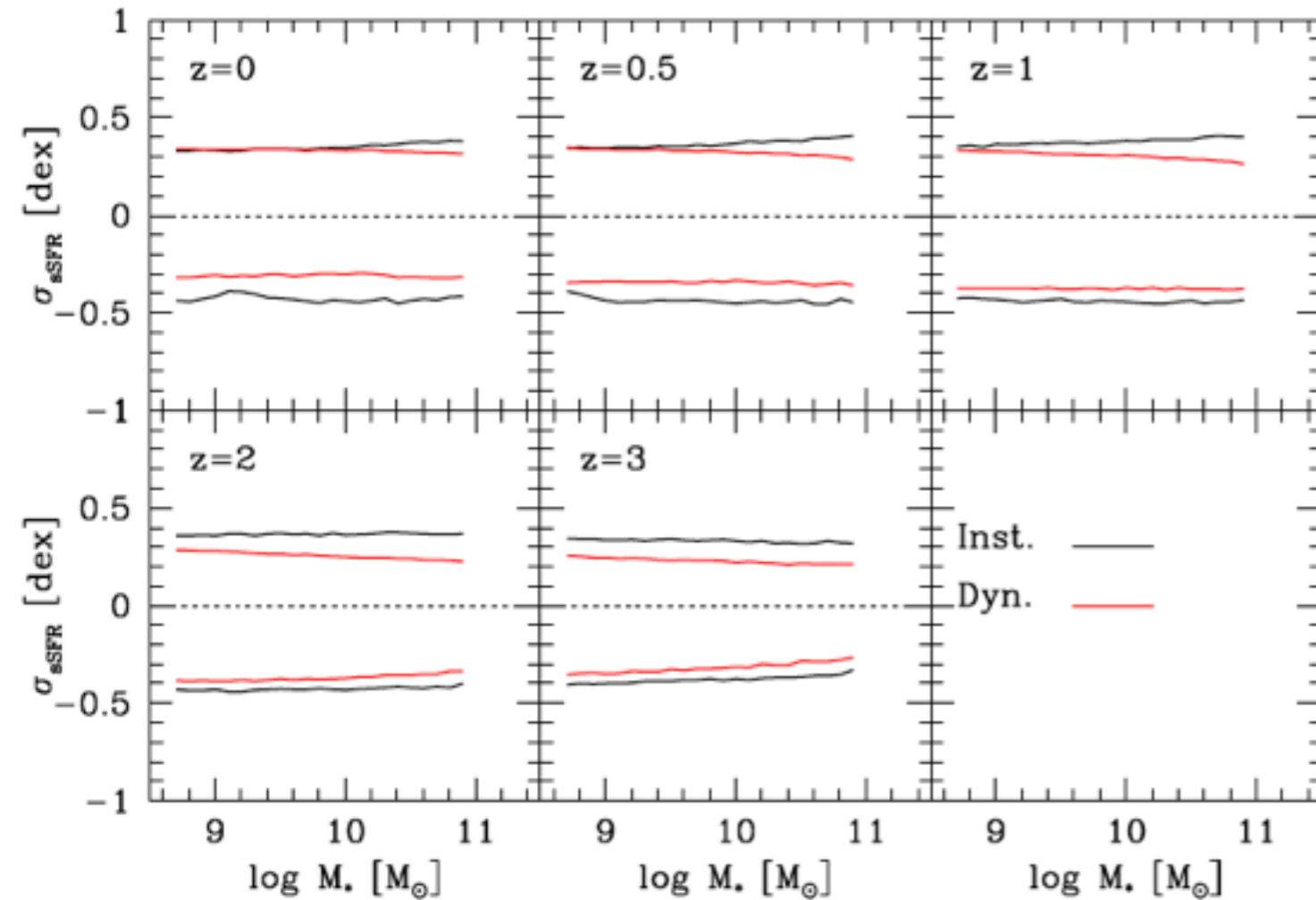
MAR

Rodriguez-Puebla+2016

# sSFR Main Sequence as a Function of Redshift derived from the SHARC assumption



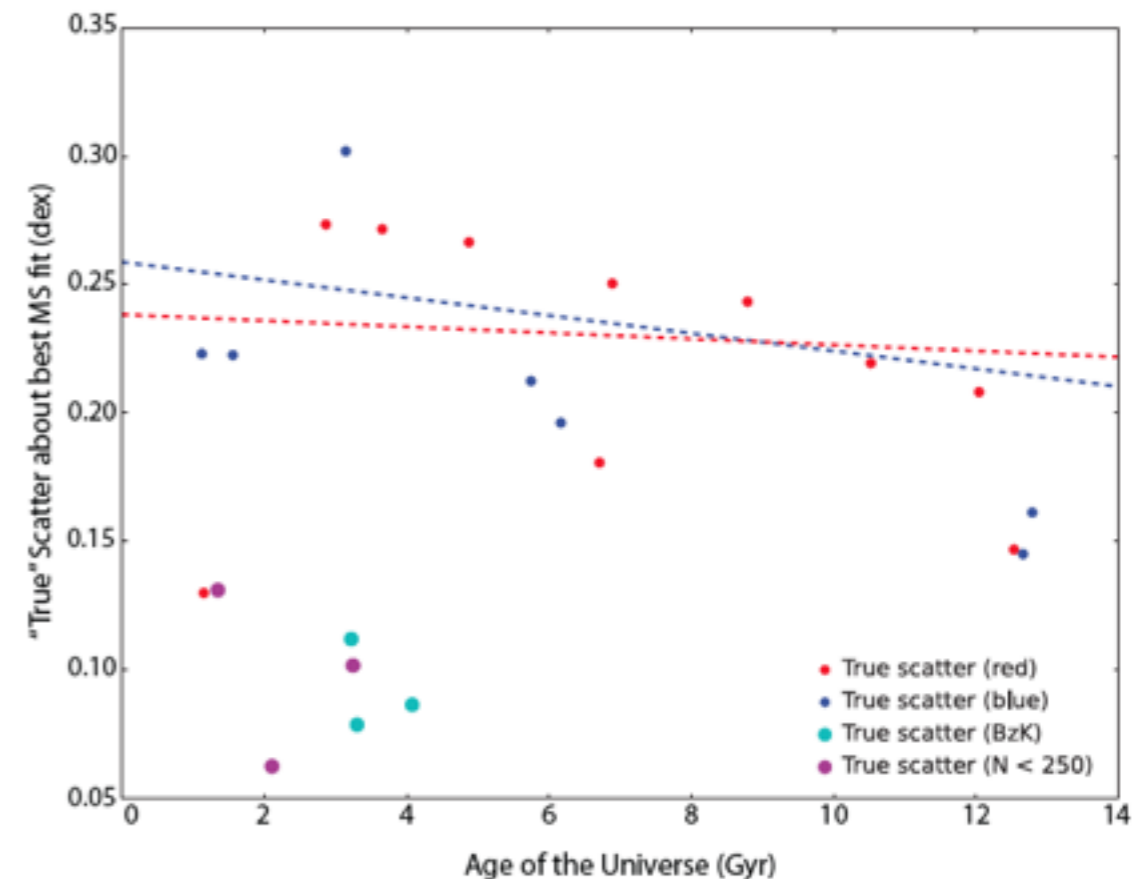
# Scatter of the sSFR MS derived from the SHARC assumption



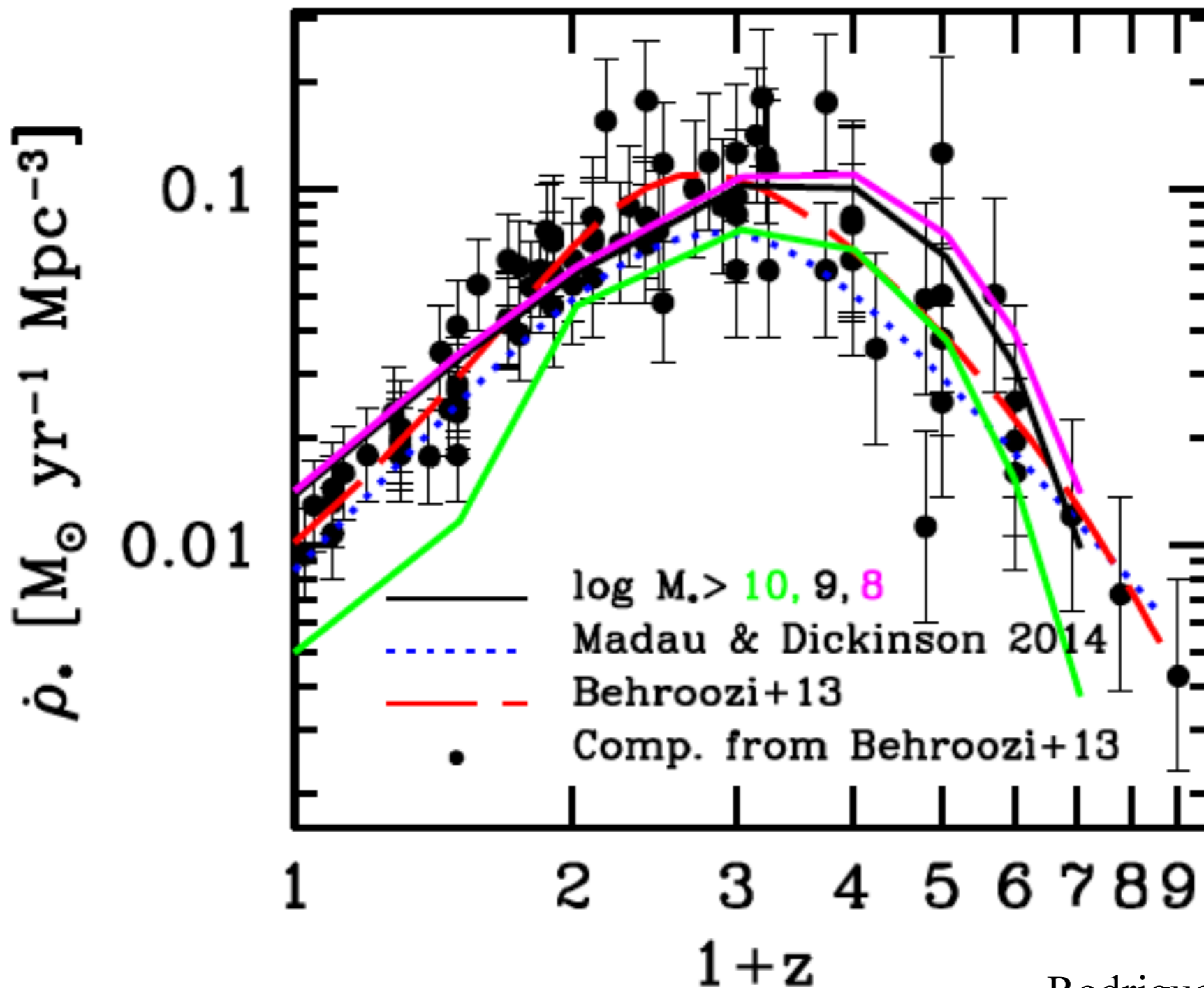
$\sigma \approx 0.3$

$\sigma \approx 0.35 - 0.45$

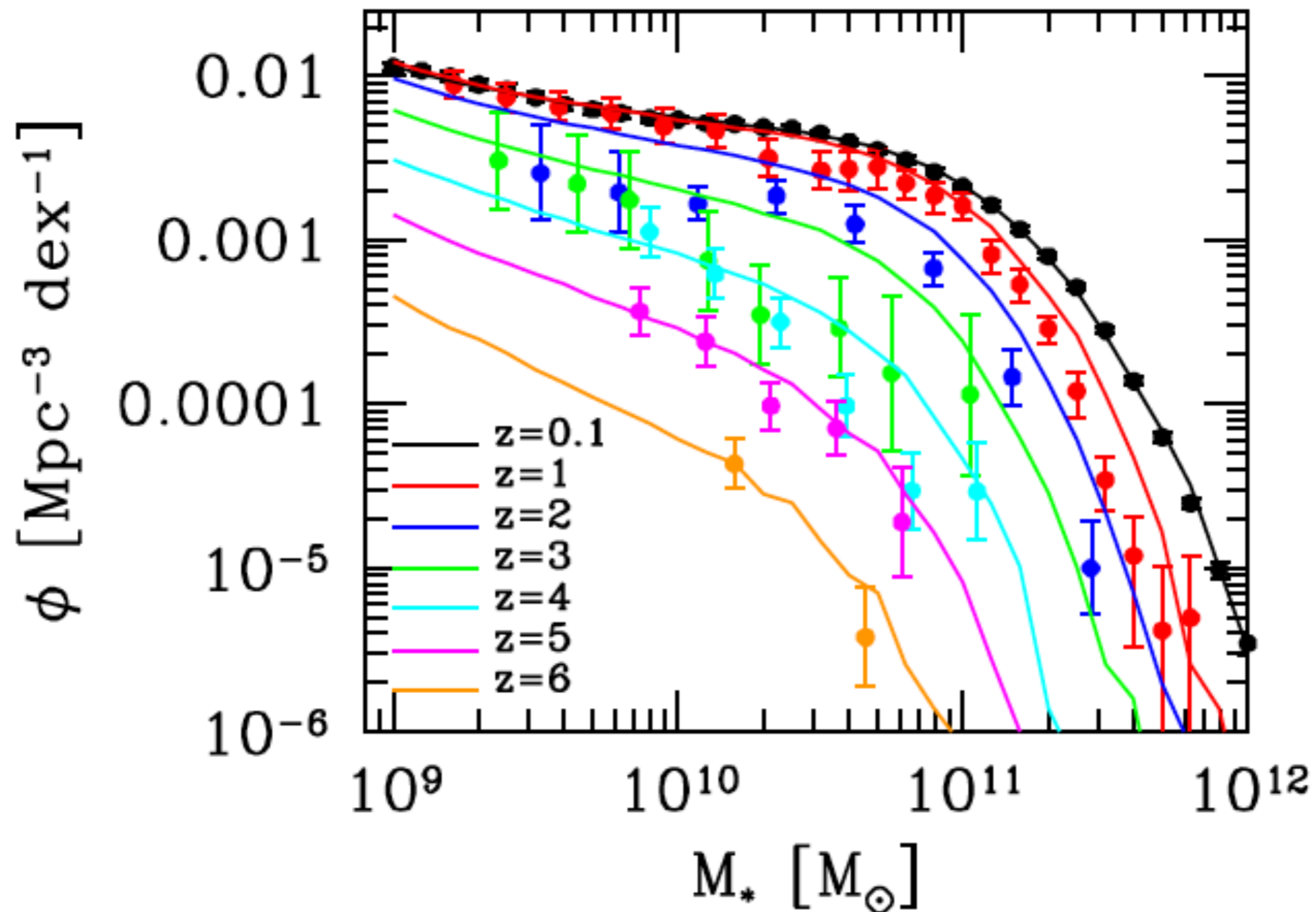
Rodriguez-Puebla+2016



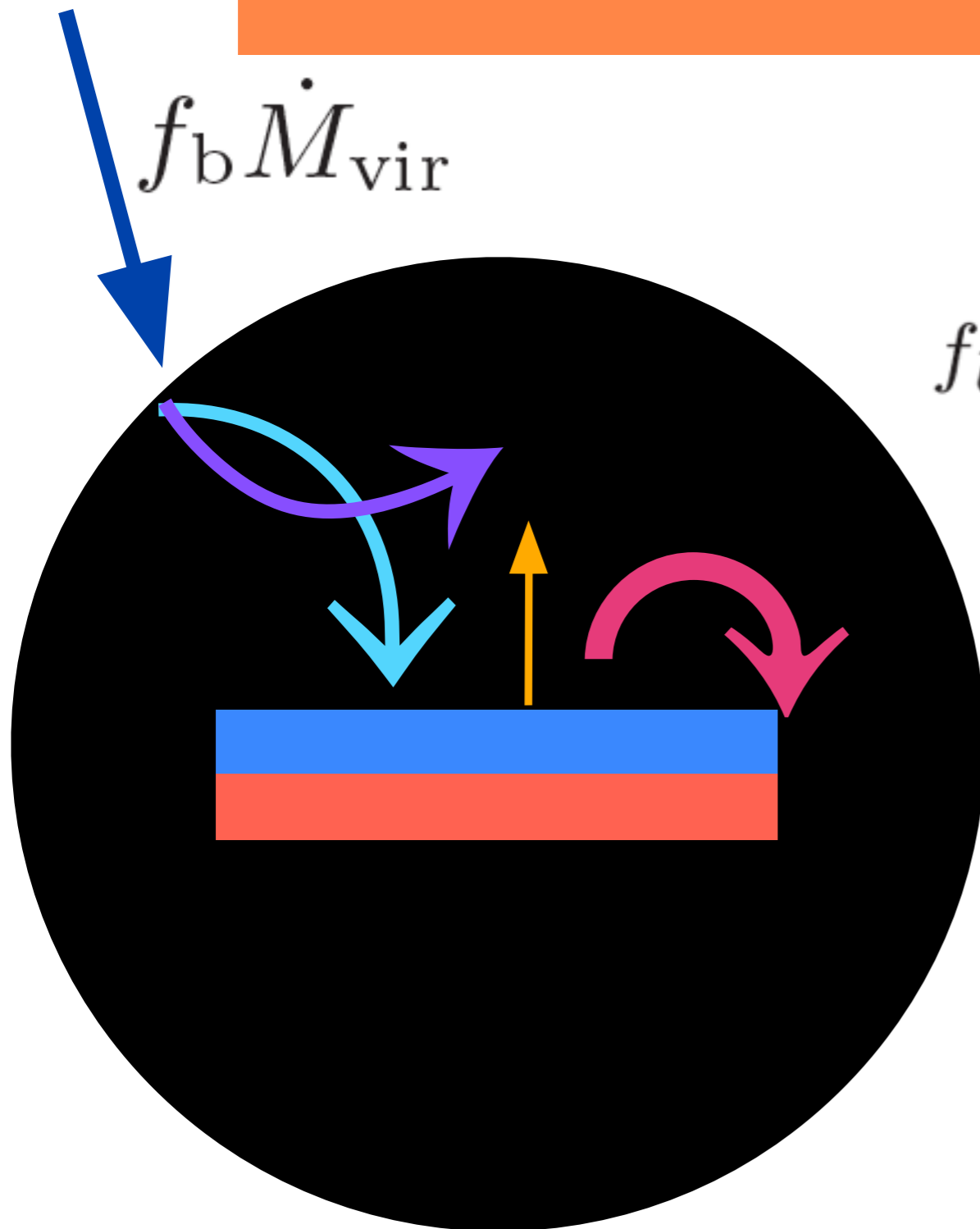
# Cosmic Star Formation Rate derived from the SHARC assumption



# Evolution of the GSMF derived from the SHARC assumption



# Gas Regulator (Bathtub) Model



The rate at which:

$$f_b (1 - \mathcal{E}_{\text{eff}}) \dot{M}_{\text{vir}}$$

the fraction of the baryonic inflowing material that won't reach the ISM

$$f_b \mathcal{E}_{\text{eff}} \dot{M}_{\text{vir}}$$

some fraction of the baryonic inflowing material will reach the ISM

$$\dot{M}_{\text{gas,ISM}}$$

gas mass change in the ISM

$$- \eta_{\text{w,ISM}} \text{SFR}$$

outflowing gas from the ISM

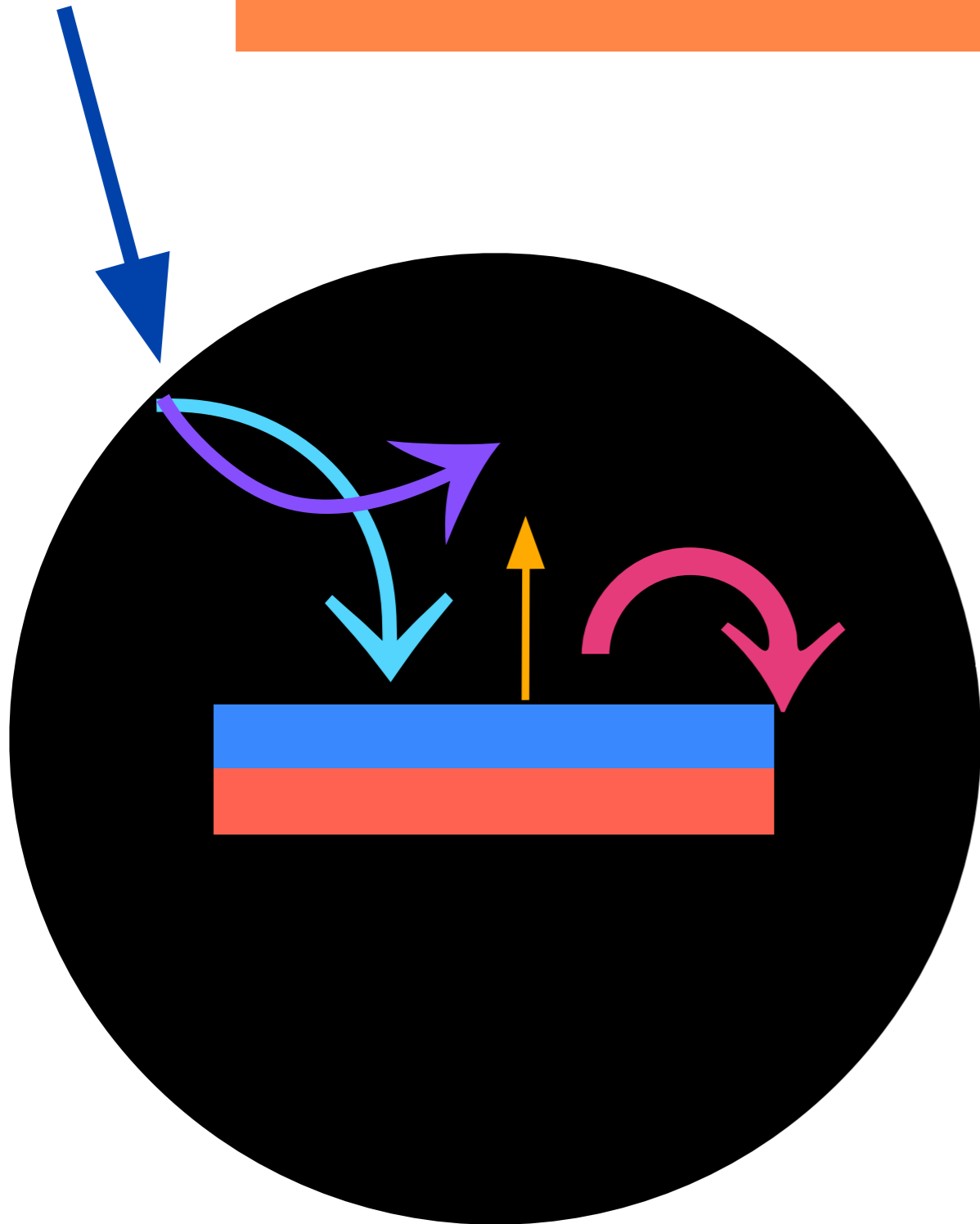
$$\eta_{\text{r,ISM}} \text{SFR}$$

previously ejected gas is re-infalling to the ISM

$$- (1 - R) \text{SFR}$$

gas mass loss due to SF

# Gas Equation for the ISM



$$\dot{M}_{\text{gas,ISM}} = f_{\text{b}} \mathcal{E}_{\text{eff}} \dot{M}_{\text{vir}} - (\eta_{\text{w,ISM}} - \eta_{\text{r,ISM}} + 1 - R) \text{SFR}$$

Bouché+11, Davé+11, Krumholz & Dekel 12, Dekel +13, Lilly+13, Dekel & Mandelker 14, Forbes+14, Feldmann+15.

# Equilibrium Model: E+SHARC

$$\dot{M}_{\text{gas,ISM}} = f_b \mathcal{E}_{\text{eff}} \dot{M}_{\text{vir}} - (\eta_{\text{w,ISM}} - \eta_{\text{r,ISM}} + 1 - R) \text{SFR}$$

Equilibrium Condition:  $\dot{M}_{\text{gas,ISM}} = 0$

~~$\dot{M}_{\text{gas,ISM}} = f_b \mathcal{E}_{\text{eff}} \dot{M}_{\text{vir}} - (\eta_{\text{w,ISM}} - \eta_{\text{r,ISM}} + 1 - R) \text{SFR}$~~

We define the net mass loading factor:

$$\eta = \eta_{\text{w,ISM}} - \eta_{\text{r,ISM}}$$

$$\text{SFR} = \frac{f_b \mathcal{E}_{\text{eff}}}{\eta + 1 - R} \dot{M}_{\text{vir}}$$

# Equilibrium Model: E+SHARC

$$\dot{M}_{\text{gas,ISM}} = f_b \mathcal{E}_{\text{eff}} \dot{M}_{\text{vir}} - (\eta_{\text{w,ISM}} - \eta_{\text{r,ISM}} + 1 - R) \text{SFR}$$

Equilibrium Condition:  $\dot{M}_{\text{gas,ISM}} = 0$

~~$\dot{M}_{\text{gas,ISM}} = f_b \mathcal{E}_{\text{eff}} \dot{M}_{\text{vir}} - (\eta_{\text{w,ISM}} - \eta_{\text{r,ISM}} + 1 - R) \text{SFR}$~~

We define the net mass loading factor:

$$\eta = \eta_{\text{w,ISM}} - \eta_{\text{r,ISM}}$$

$$\text{SFR} = \frac{f_b \mathcal{E}_{\text{eff}}}{\eta + 1 - R} \dot{M}_{\text{vir}}$$

**SHARC**

$$\text{SFR} = f_* \times \epsilon \times \dot{M}_{\text{vir}} / (1 - R)$$

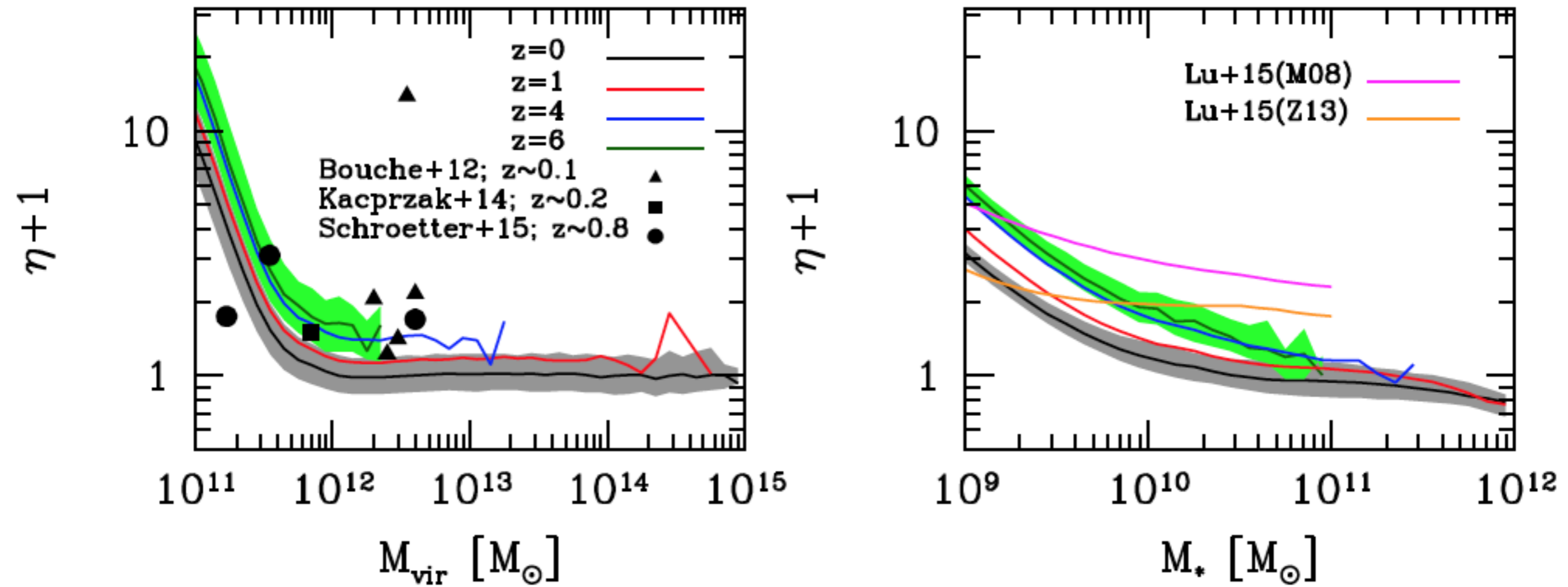
**E+SHARC**

**Physics**

$$\frac{f_b \mathcal{E}_{\text{eff}}}{\eta + 1 - R} = \frac{f_* \epsilon}{1 - R}$$

**Empirical**

# Net Mass loading Factor

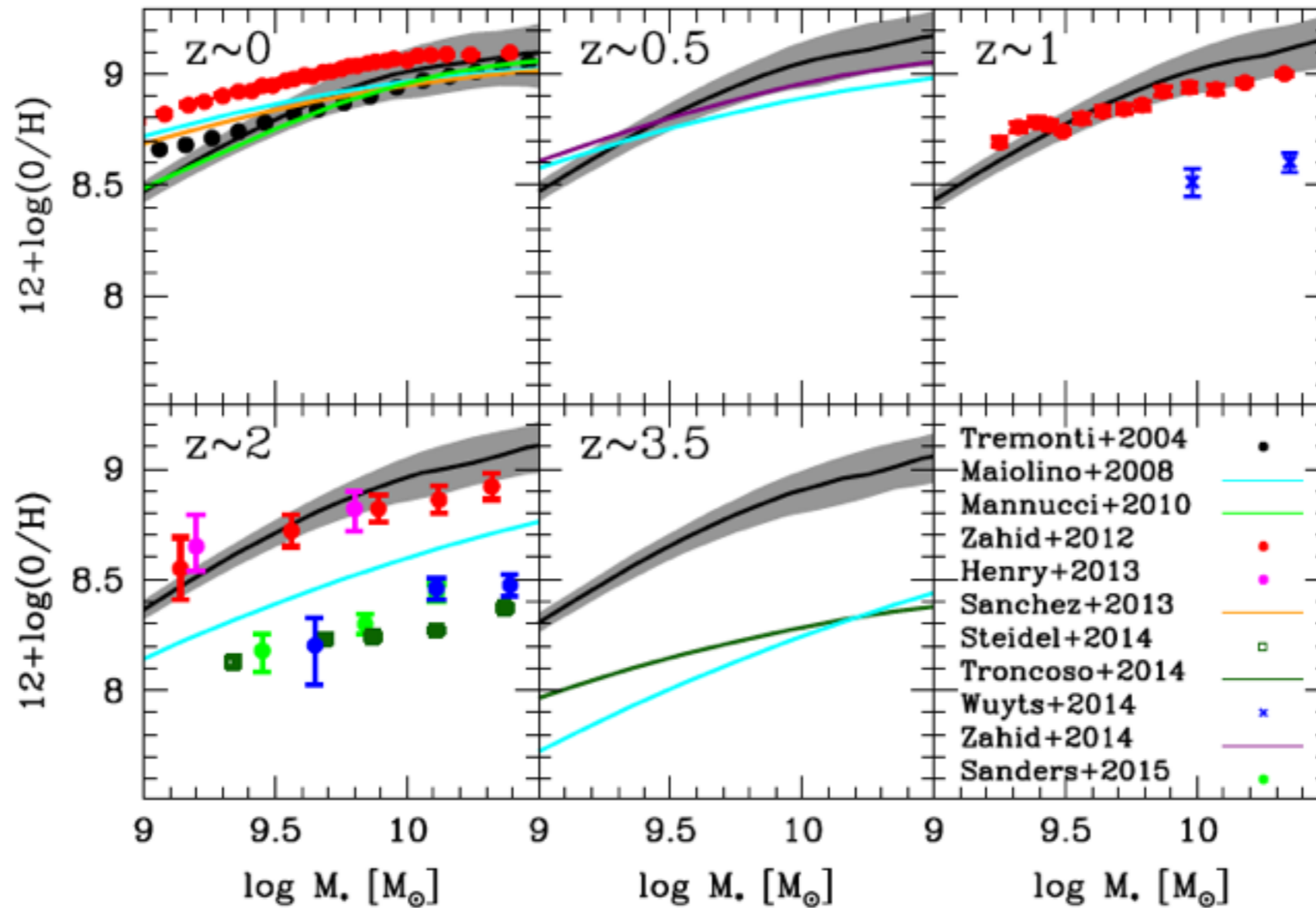


outflowing gas from the  
ISM

— previously ejected gas  
is re-infalling to the ISM

$$= \eta = \left[ \frac{f_b}{f_*(M_{\text{vir}})} \frac{\mathcal{E}_{\text{eff}}(M_{\text{vir}}, z)}{\epsilon(M_{\text{vir}})} - 1 \right] (1 - R)$$

# Metallicities



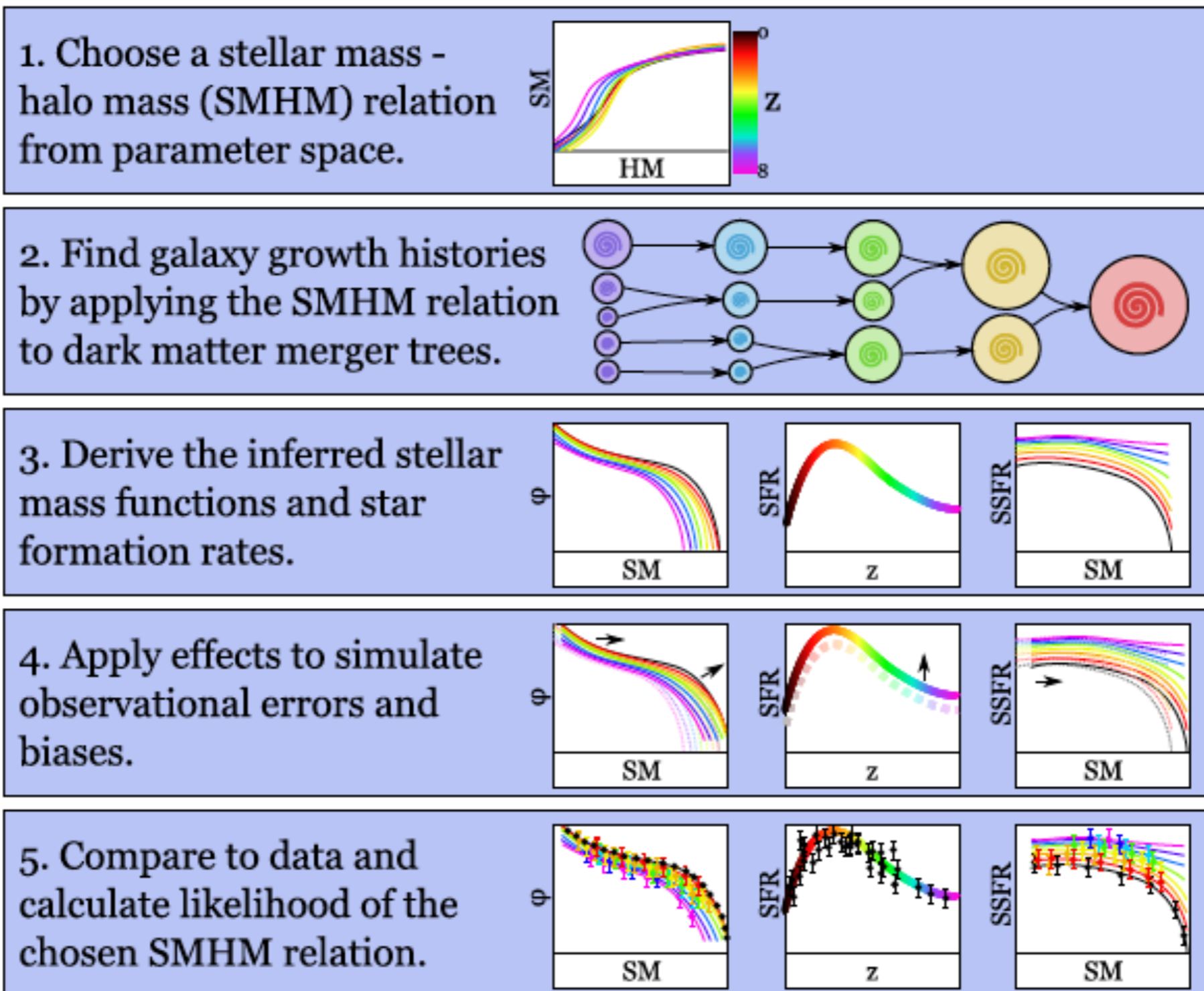
$$Z_{\text{ISM}} = \frac{y}{\eta + 1 - R}$$

Using information from high redshifts

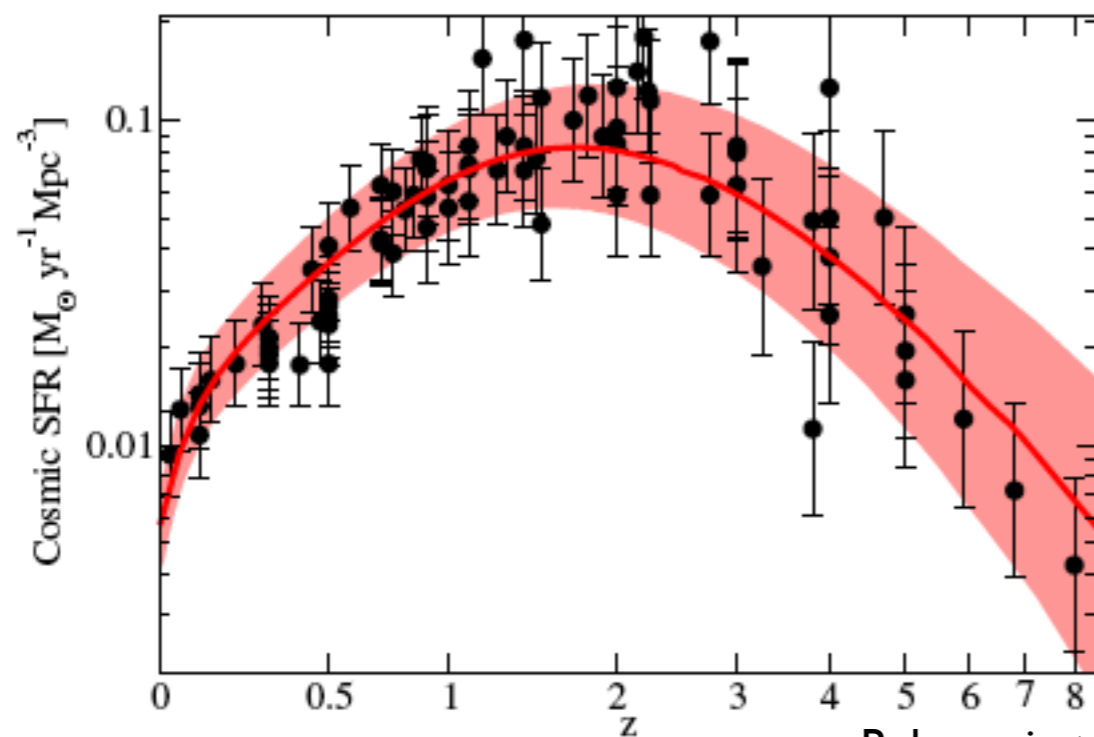
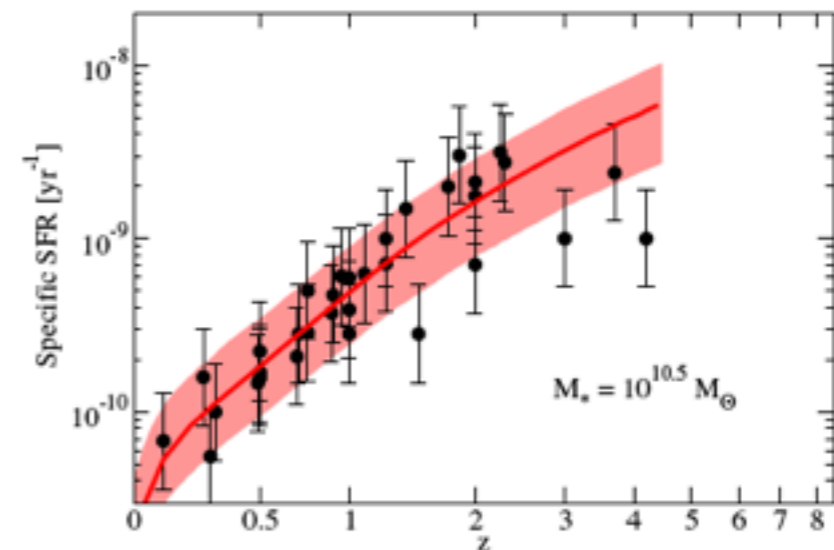
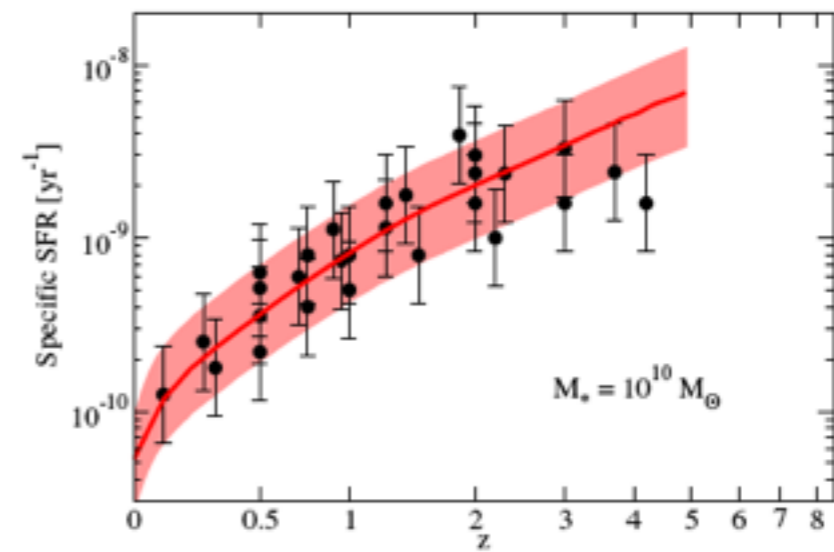
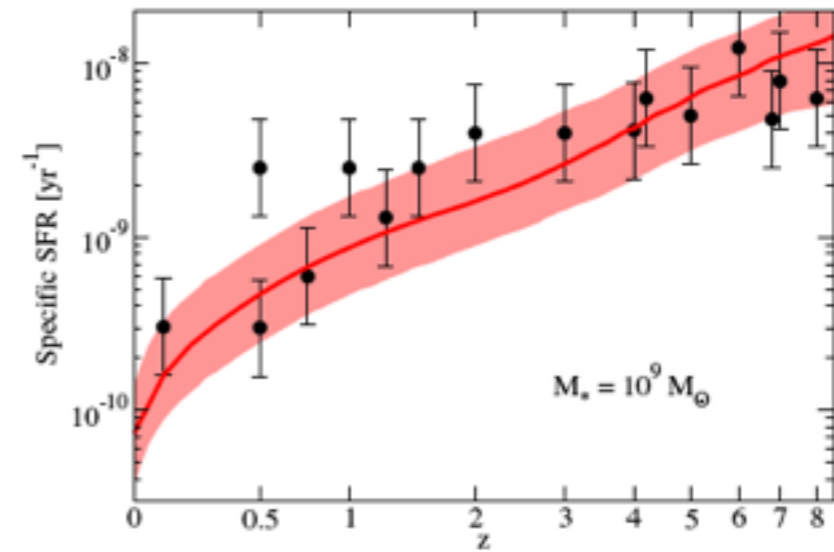
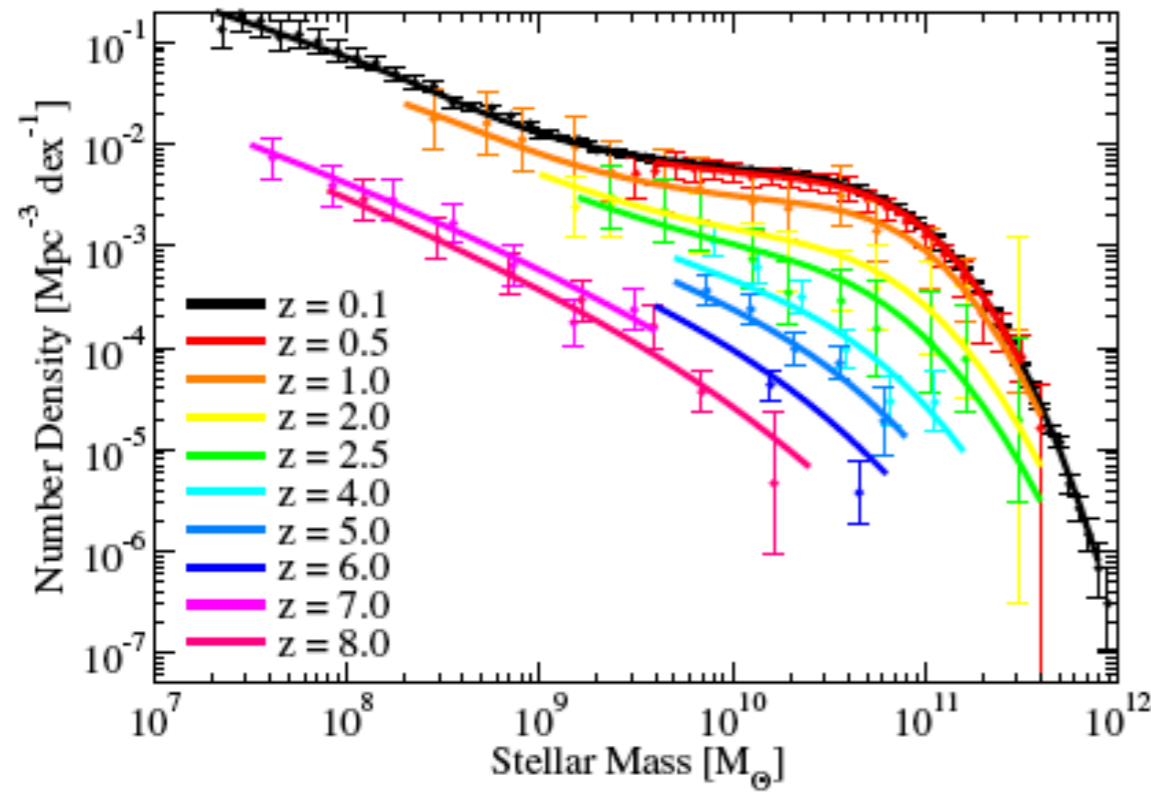
# Using information from high redshifts

Behroozi et al. 2013

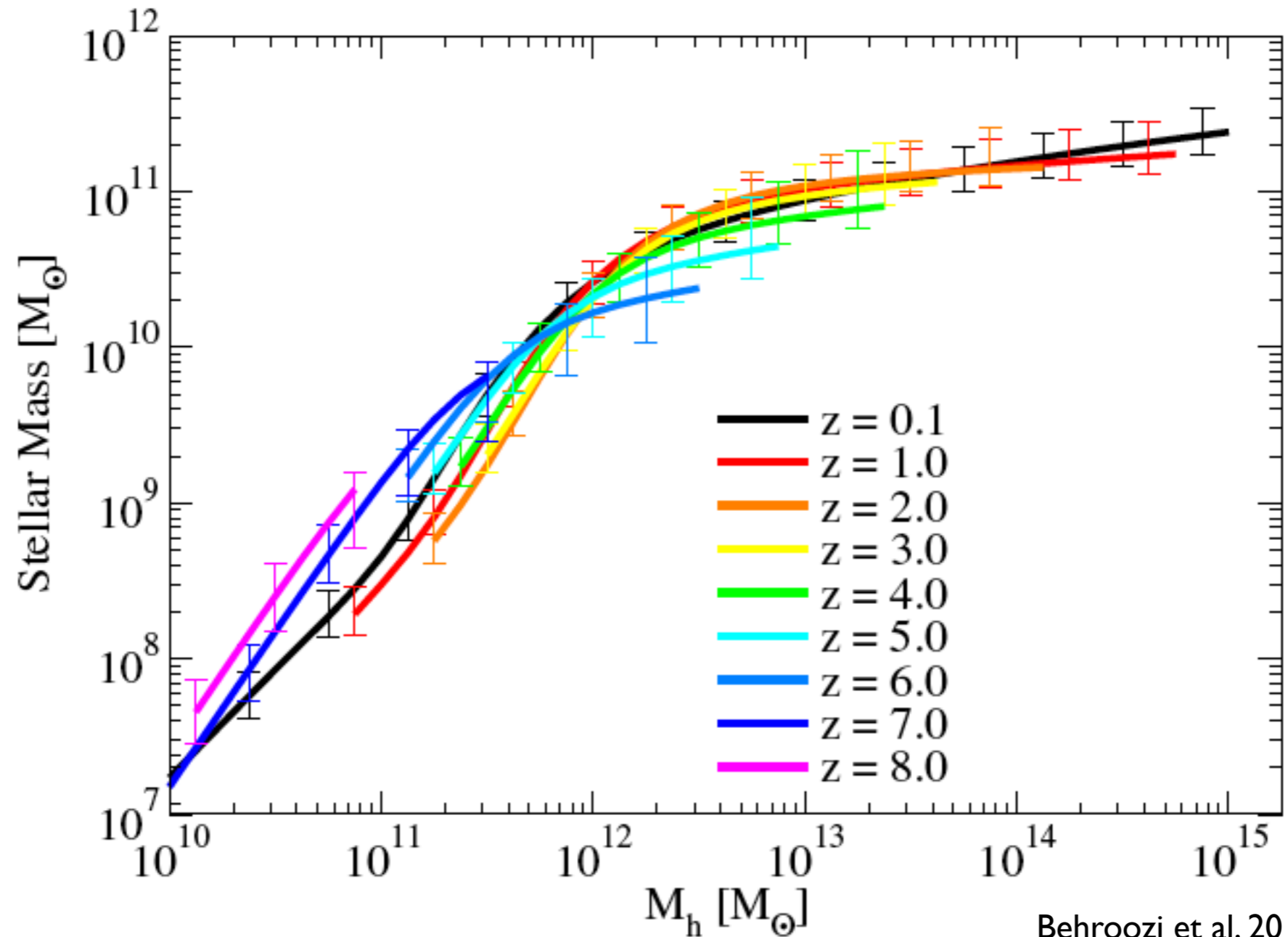
Markov Chain Monte Carlo



# Using information from high redshifts

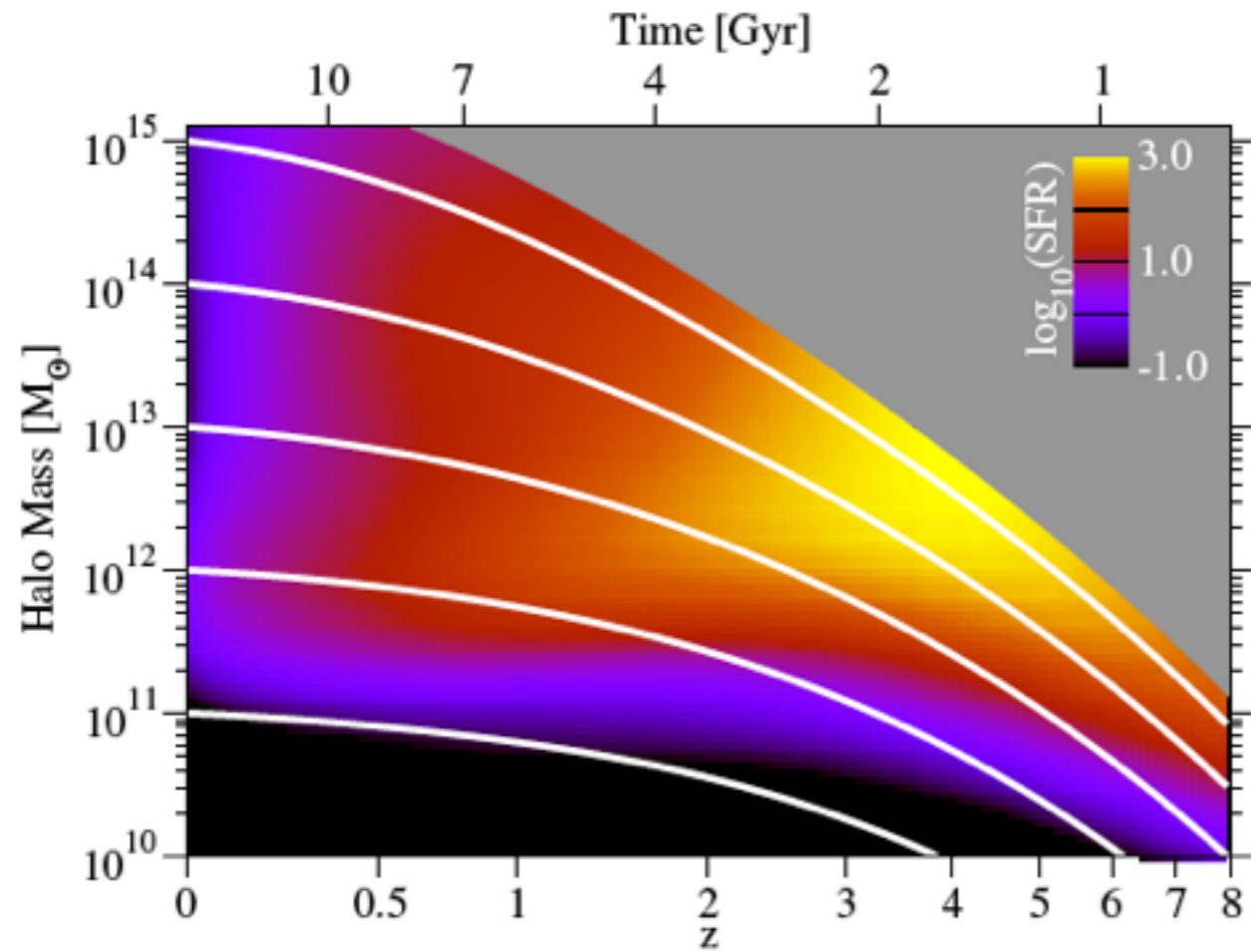


# Using information from high redshifts

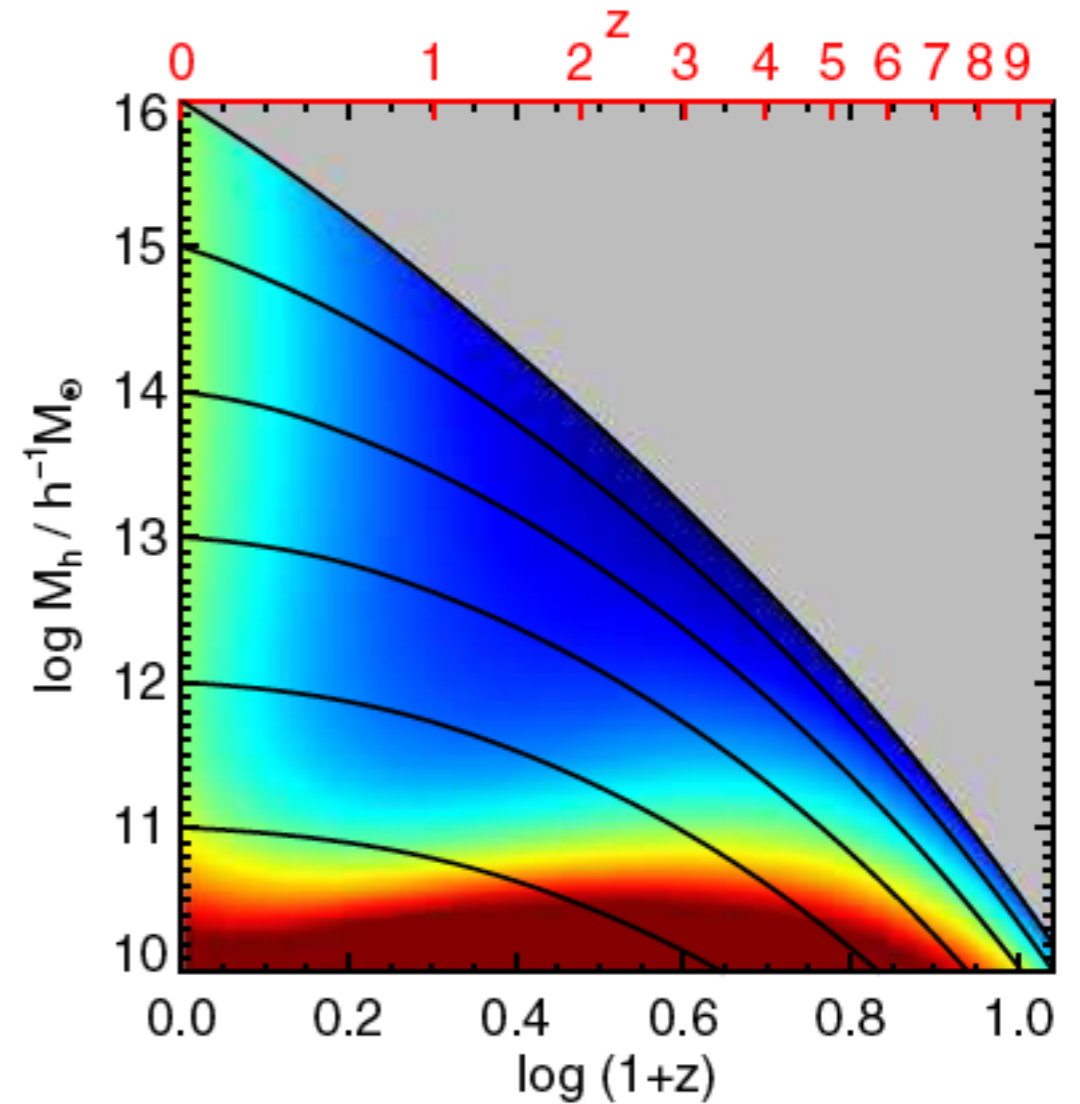


Behroozi et al. 2013

# Using information from high redshifts

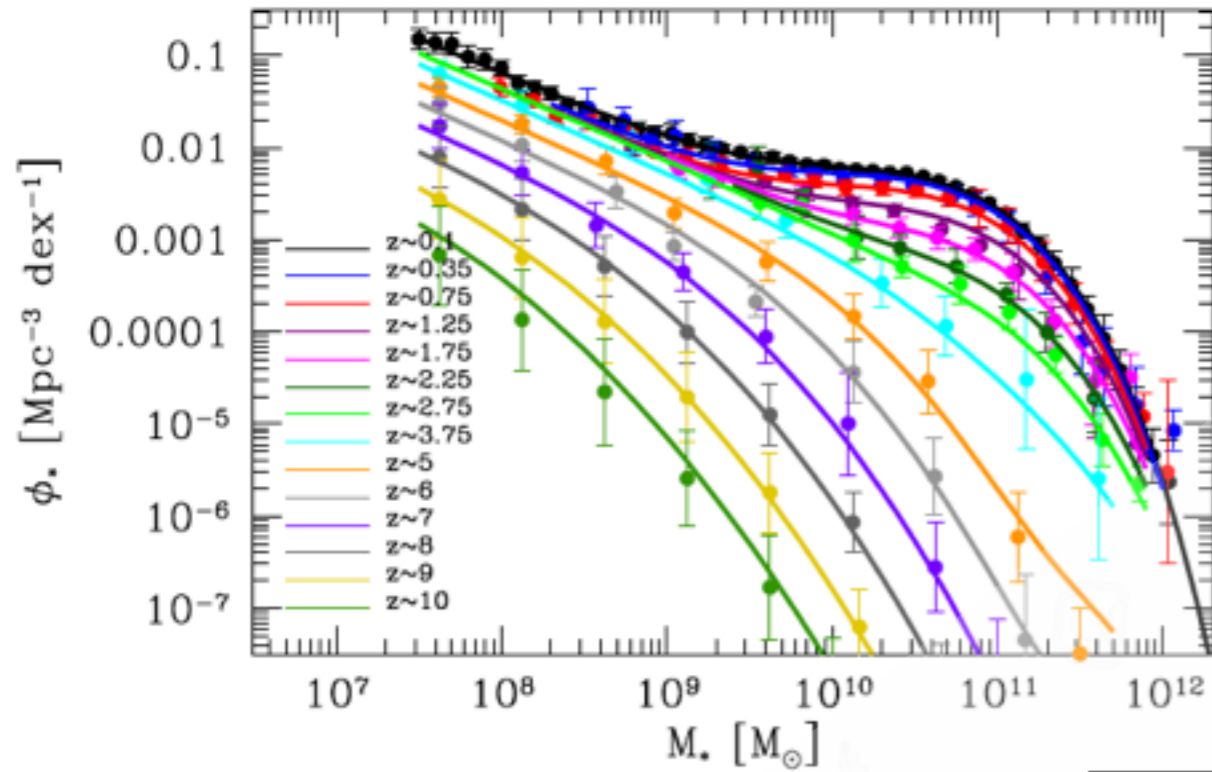


Behroozi et al. 2013

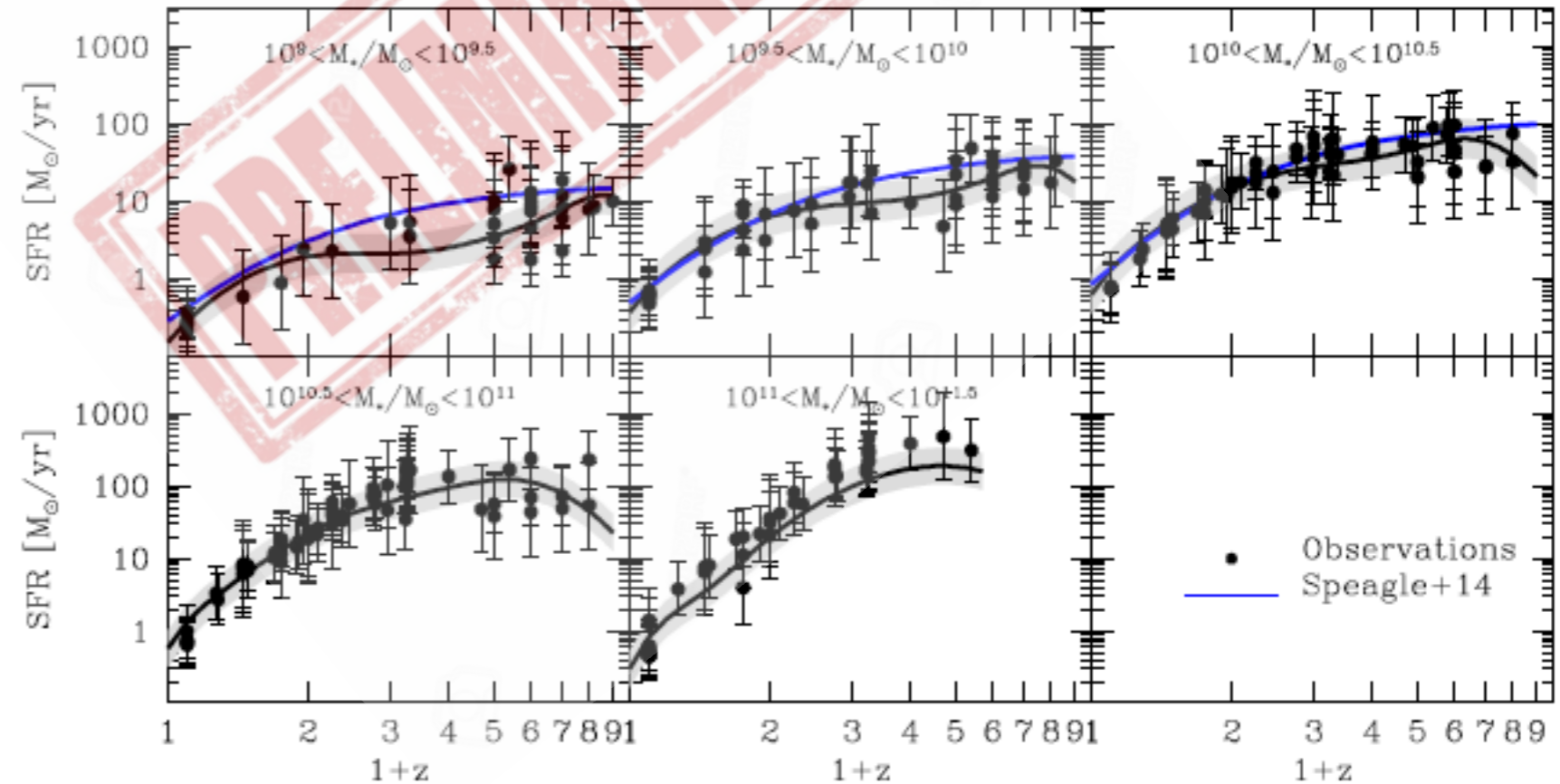


Yang et al. 2013

# Using information from high redshifts

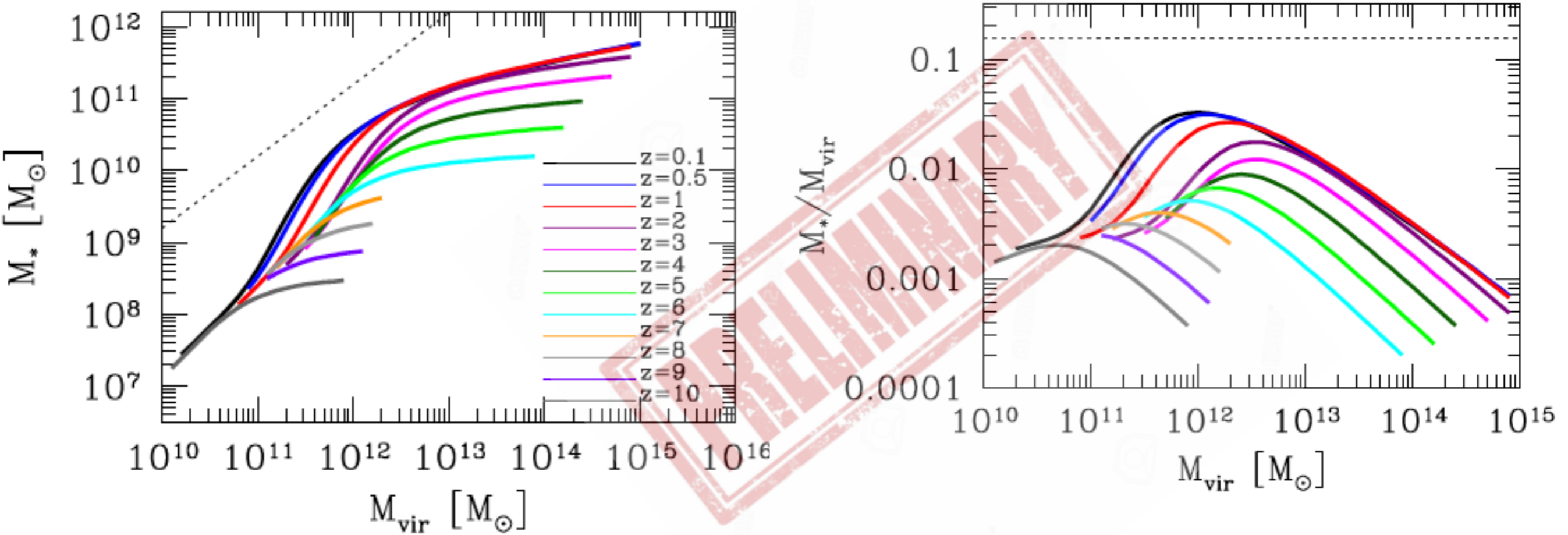


Rodriguez-Puebla et al. in prep.



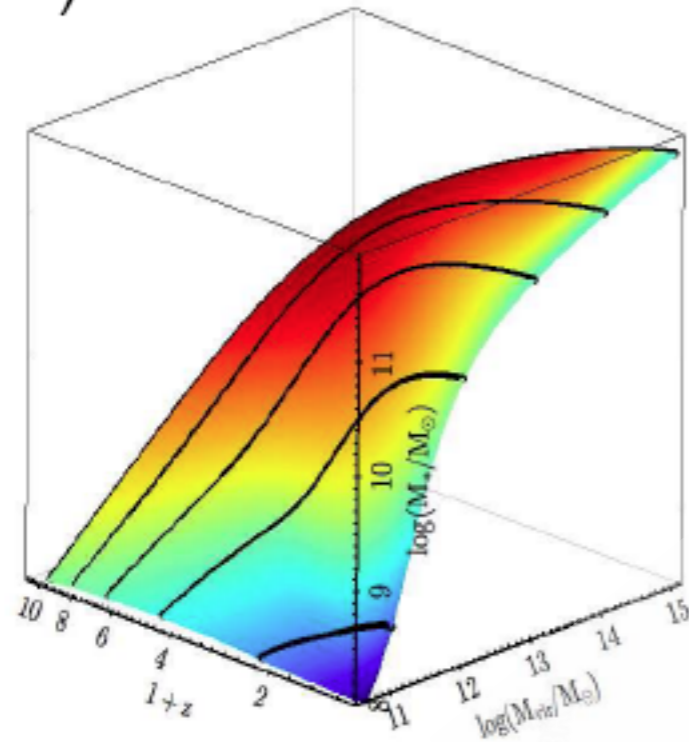
# Using information from high redshifts

Rodriguez-Puebla et al. in prep.



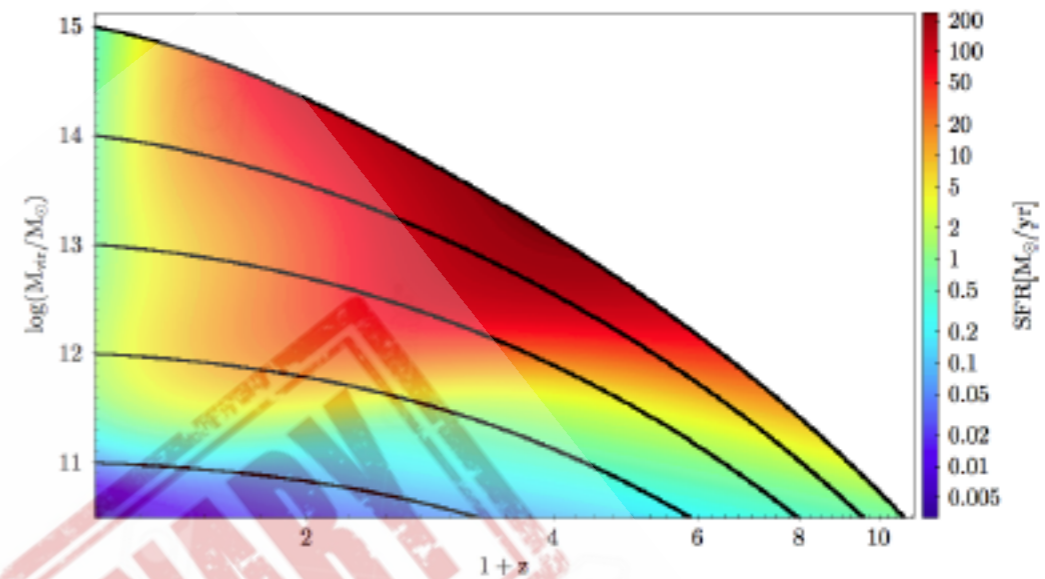
# Using information from high redshifts

a)

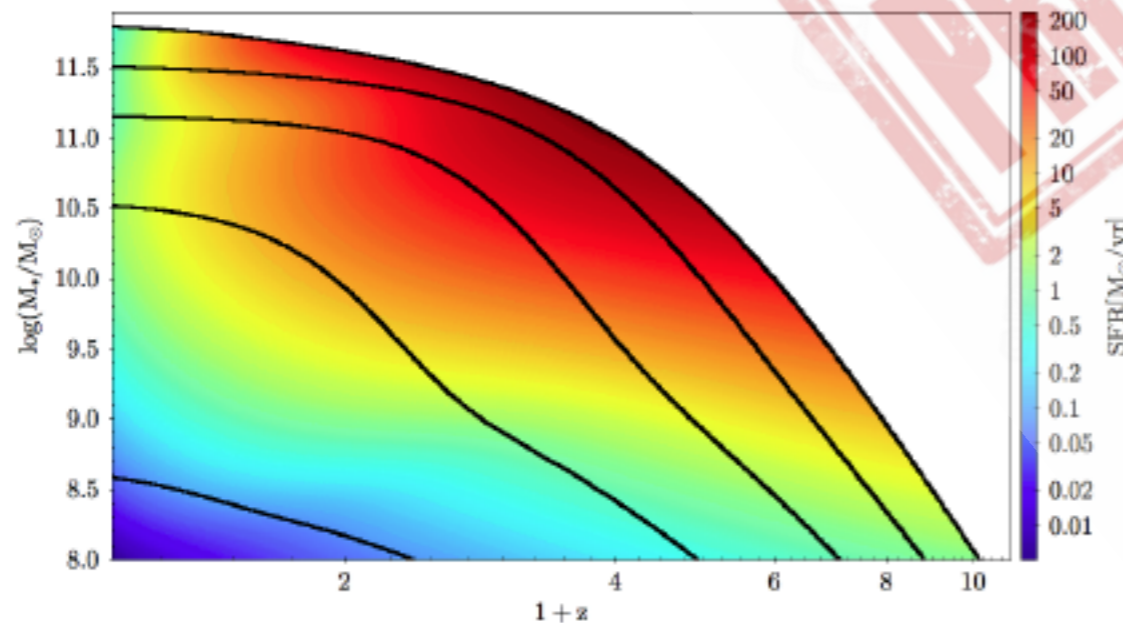


b)

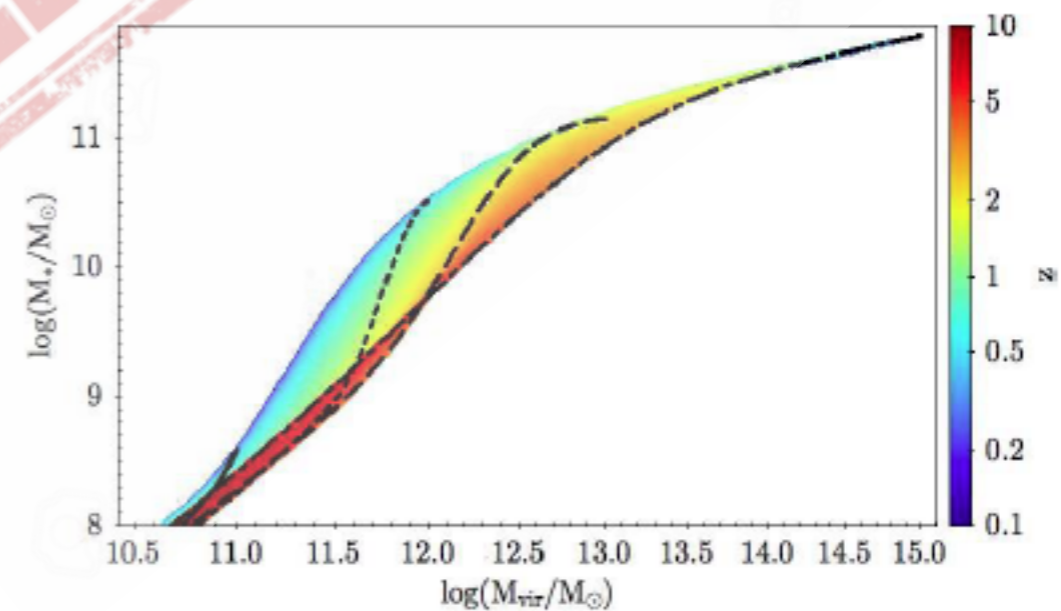
Rodriguez-Puebla et al. in prep.



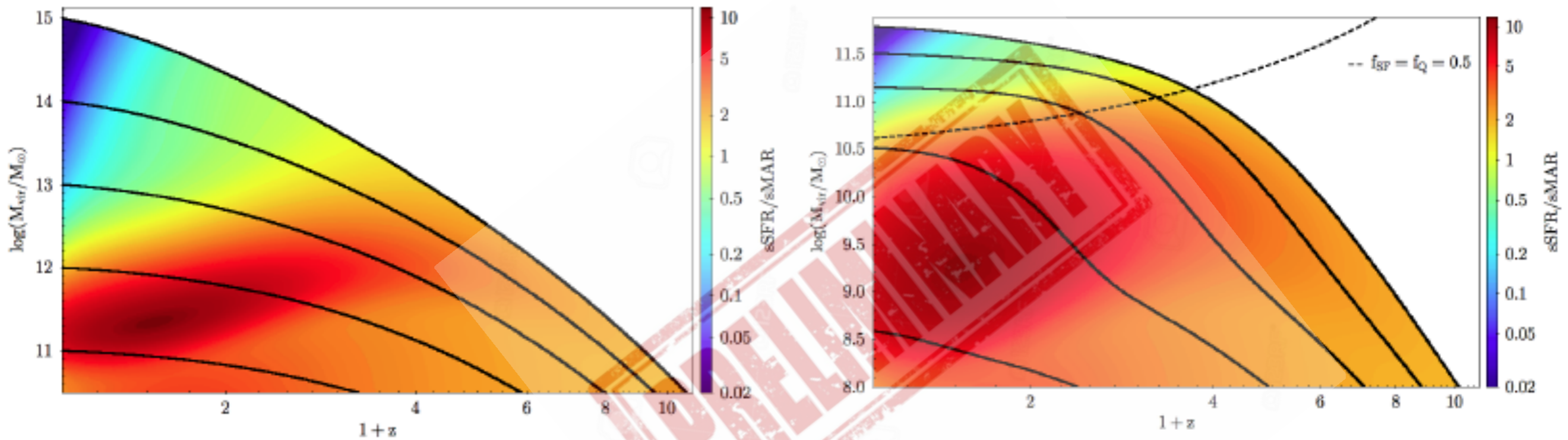
c)



d)

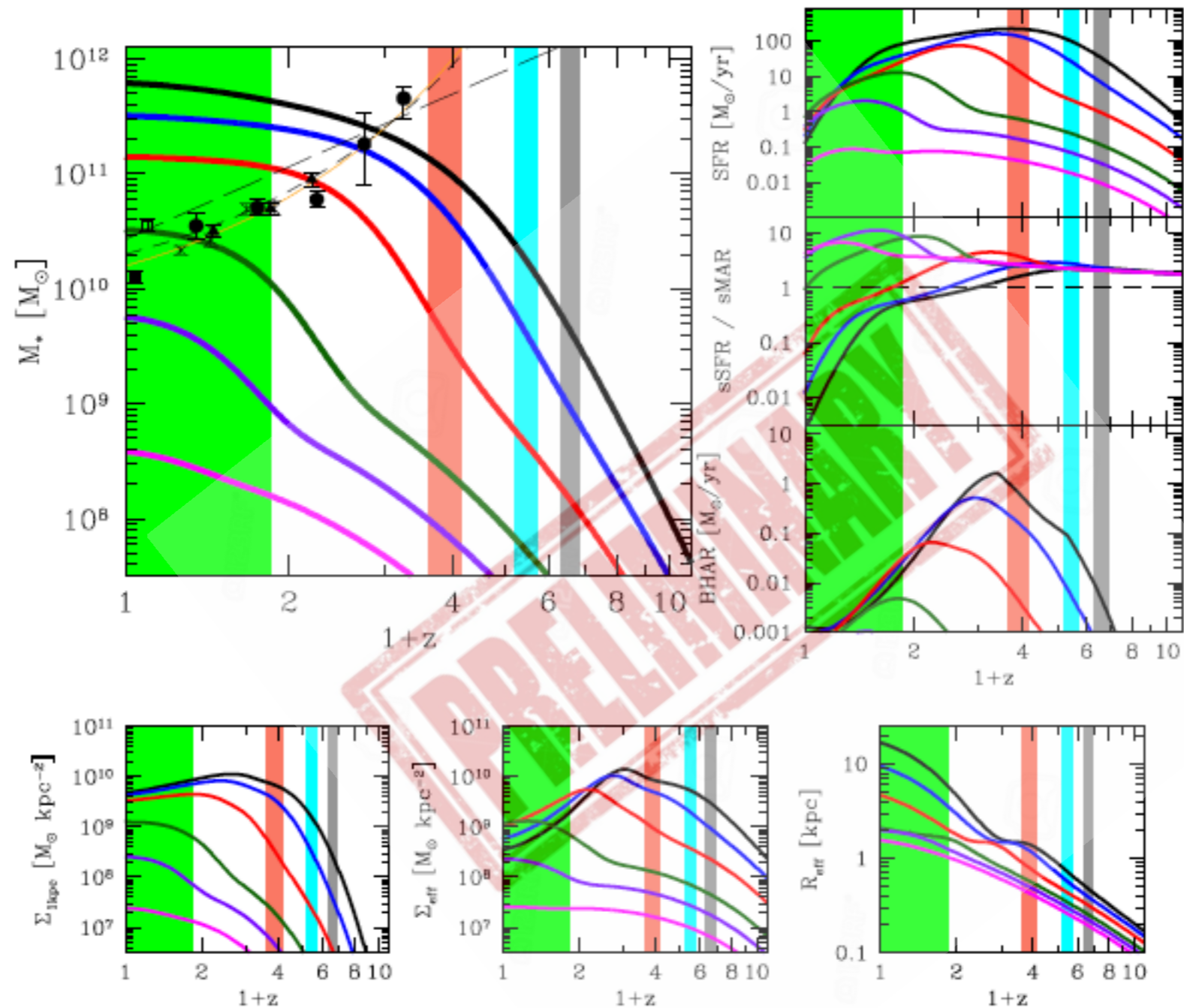


# Using information from high redshifts



Rodríguez-Puebla et al. in prep.

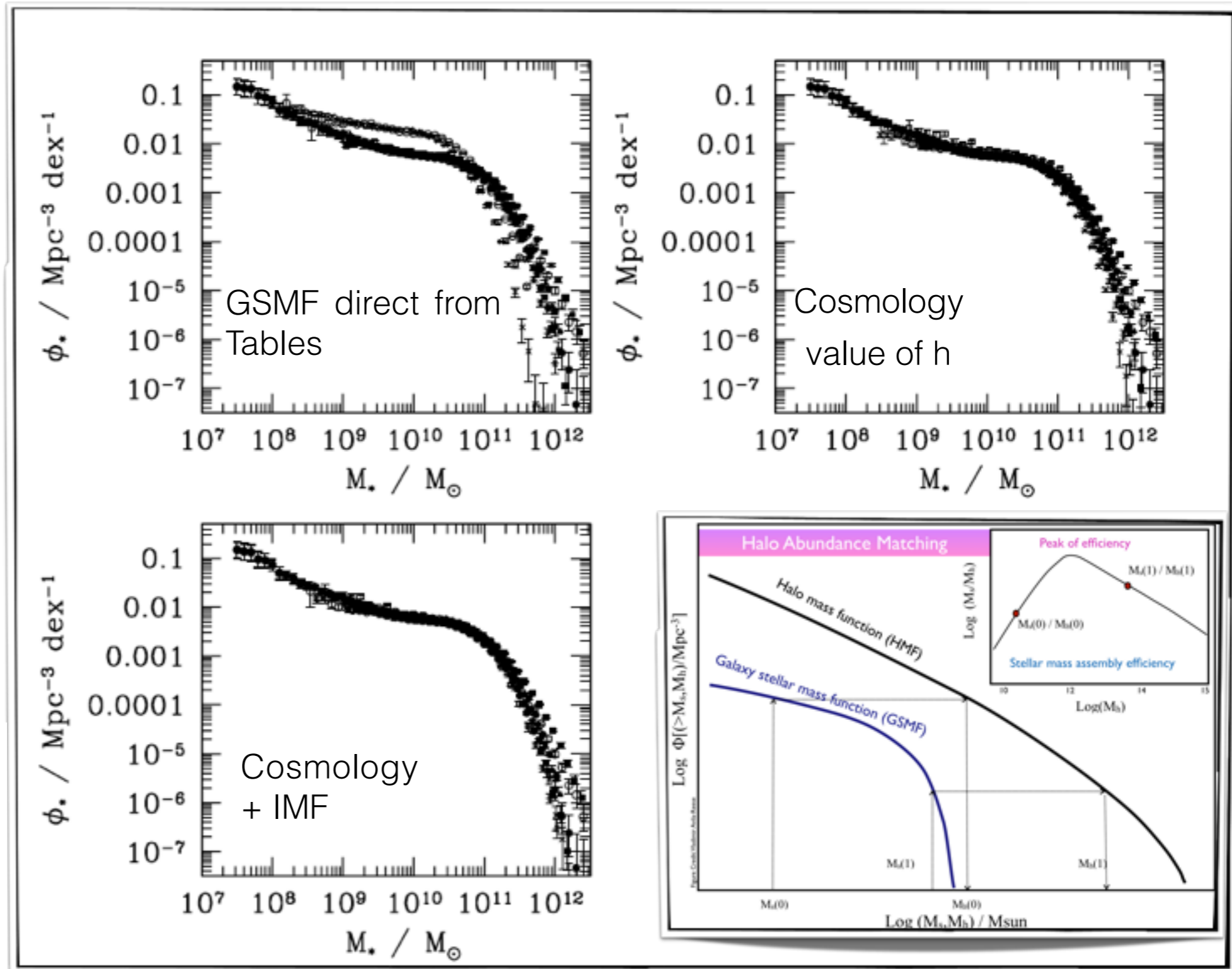
# Using information from high redshifts



Rodriguez-Puebla et al. in prep.

# Uncertainties affecting the Galaxy-Halo Connection

# Uncertainties affecting the Galaxy-Halo Connection

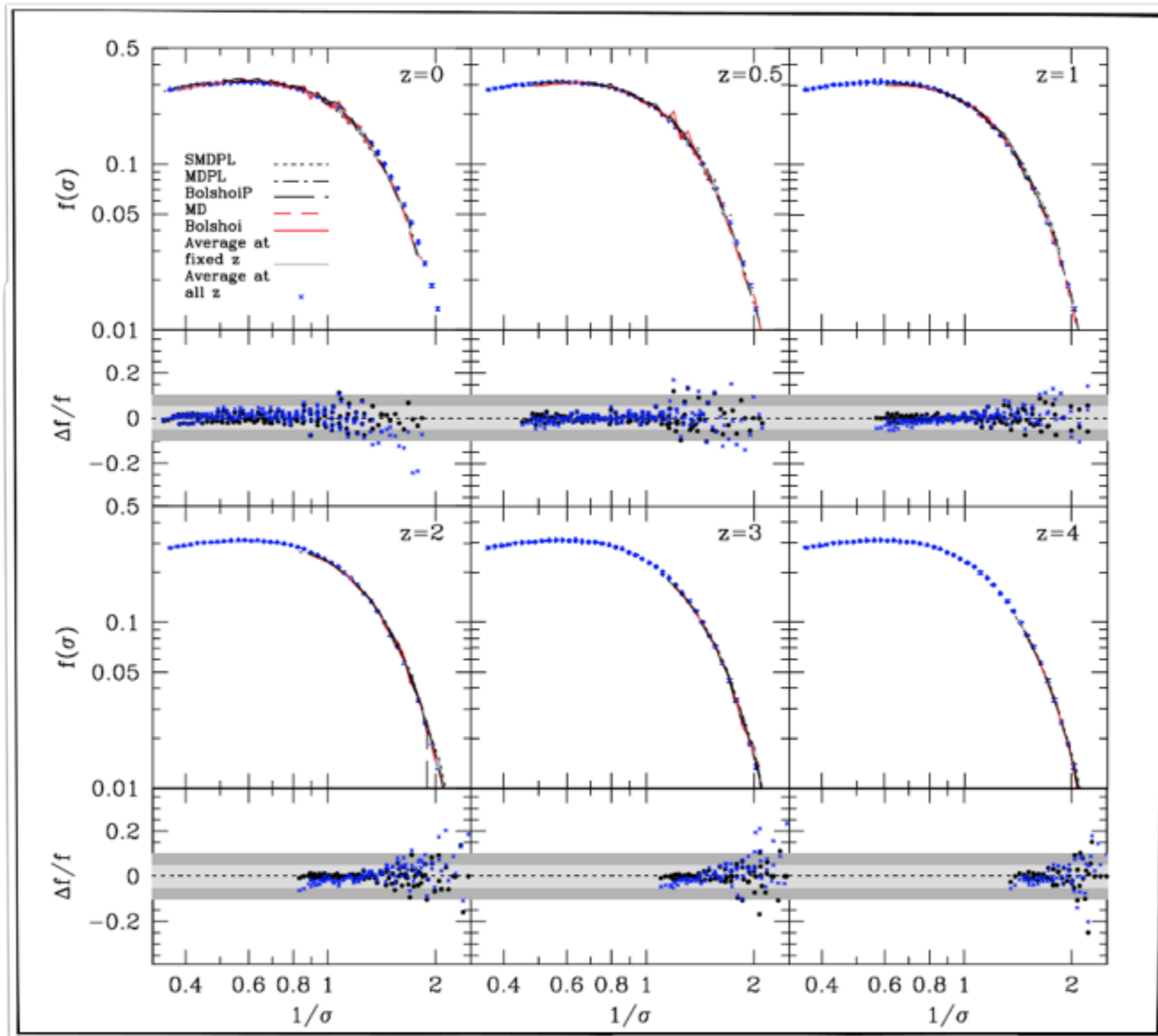


Bernardi et al. 2010

**Table 2.**  $M_*/L$  IMF offsets used in this work. Offset is with respect to the Salpeter (1955) IMF:  $\log_{10} M_*/L$  (IMF Salpeter) =  $\log_{10} M_*/L$  (IMF reference) + offset.

IMF	Offset (dex)	Reference
Kennicutt	0.30	Kennicutt (1983)
Scalo	0.25	Scalo (1986)
Diet-Salpeter	0.15	Bell & de Jong (2001)
Pseudo-Kroupa	0.20	Kroupa (2001)
Kroupa	0.30	Kroupa (2002)
Chabrier	0.25	Chabrier (2003)
Baldry & Glazebrook	0.305	Baldry & Glazebrook (2003)

# Uncertainties affecting the Galaxy-Halo Connection



$$\frac{dn_h}{dM_{\text{vir}}} = f(\sigma) \frac{\rho_m}{M_{\text{vir}}^2} \left| \frac{d \ln \sigma^{-1}}{d \ln M_{\text{vir}}} \right|$$

# Uncertainties affecting the Galaxy-Halo Connection: Summary

- Choice of IMF: Introduces a systematic of  $\sim 0.3$  dex.
- Choice of SPS model: Different models treat stellar evolution differently.
- Parametrization of SHFs:  $\sim 0.18$  dex.
- Dust attenuation models:  $\sim 0.1$  dex.
- Statistical errors from individual stellar masses:  $\sim 0.1$  dex at  $z \sim 0.1$  and  $\sim 0.15$  at  $z \sim 1$
- Sample variance. Finite regions of the observed universe are susceptible to large scale fluctuations in the number of density galaxies.
- Photometric redshifts.
- Uncertainties on the halo mass function.
- Uncertainties on the cosmology.

# Uncertainties affecting the Galaxy-Halo Connection: Formalism

Abundance matching:

$$\phi_{\text{direct}}(M_*) \equiv \phi_h(M_h(M_*)) \frac{d \log M_h}{d \log M_*},$$

Including scatter on the  $M^*$ - $M_{\text{vir}}$  relation

$$\phi_{\text{true}}(M_*) = \int_{-\infty}^{\infty} \phi_{\text{direct}}(10^y) P_s(y - \log_{10} M_*) dy$$

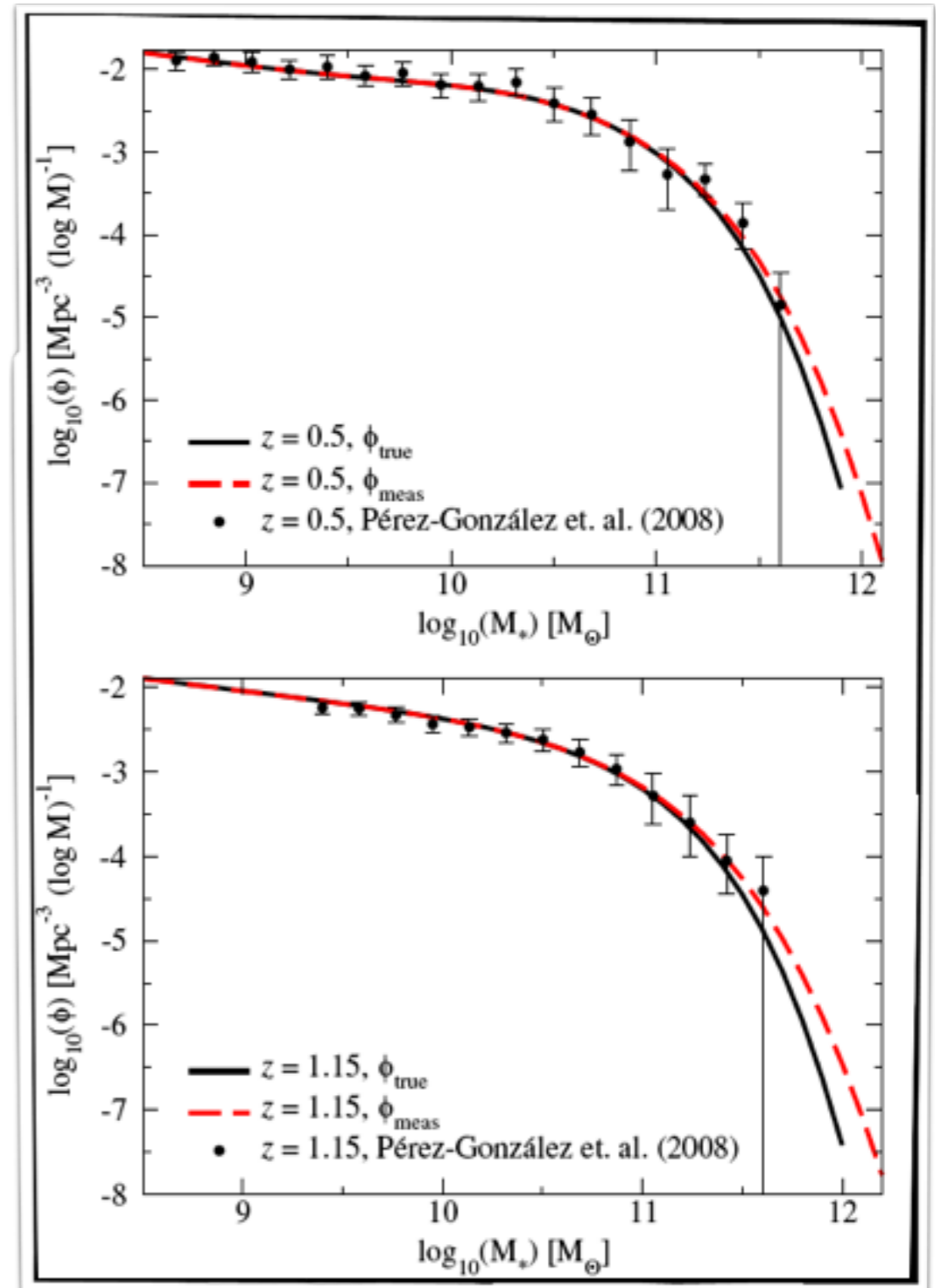
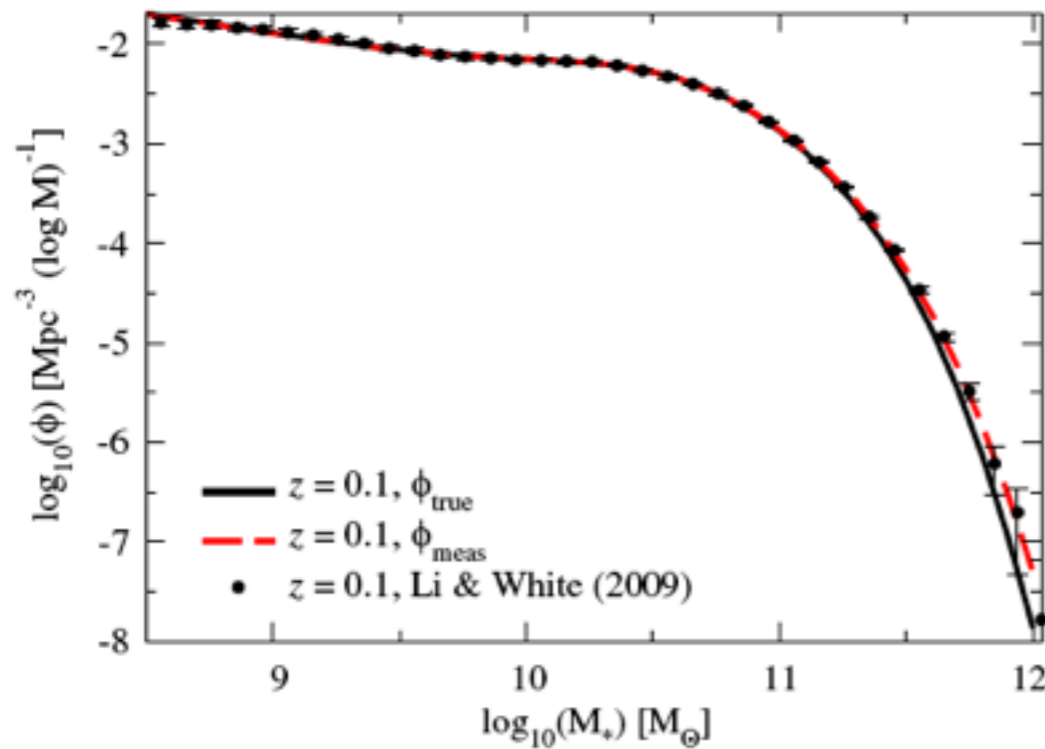
Modelling the observed GSMF

$$\phi_{\text{meas}}(M) = \int_{-\infty}^{\infty} \phi_{\text{true}}(10^y) P(y - \log_{10}(M)) dy,$$

$$\phi_{\text{meas}}(M_*) = \phi_{\text{direct}}(M_*) \circ P_s(\Delta \log_{10} M_*) \circ P(\Delta \log_{10} M_*)$$

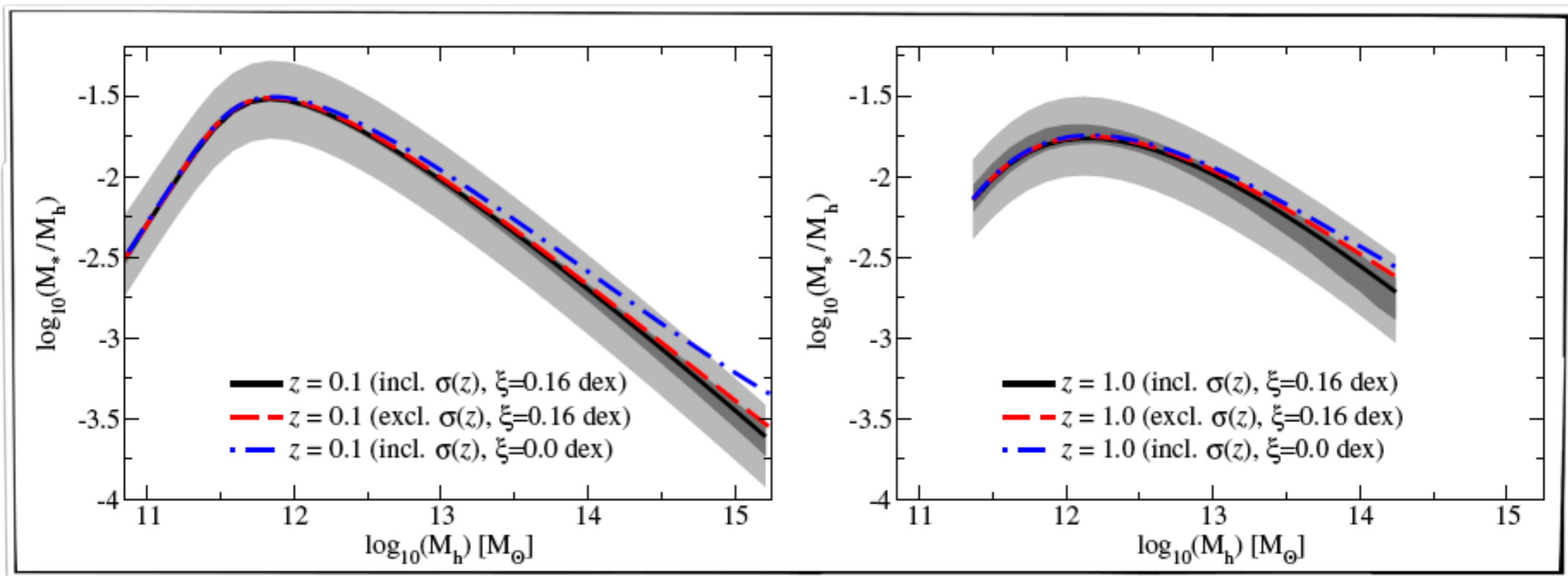
# Uncertainties affecting the Galaxy-Halo Connection: Impact on the GSMF

Behroozi et al. 2010



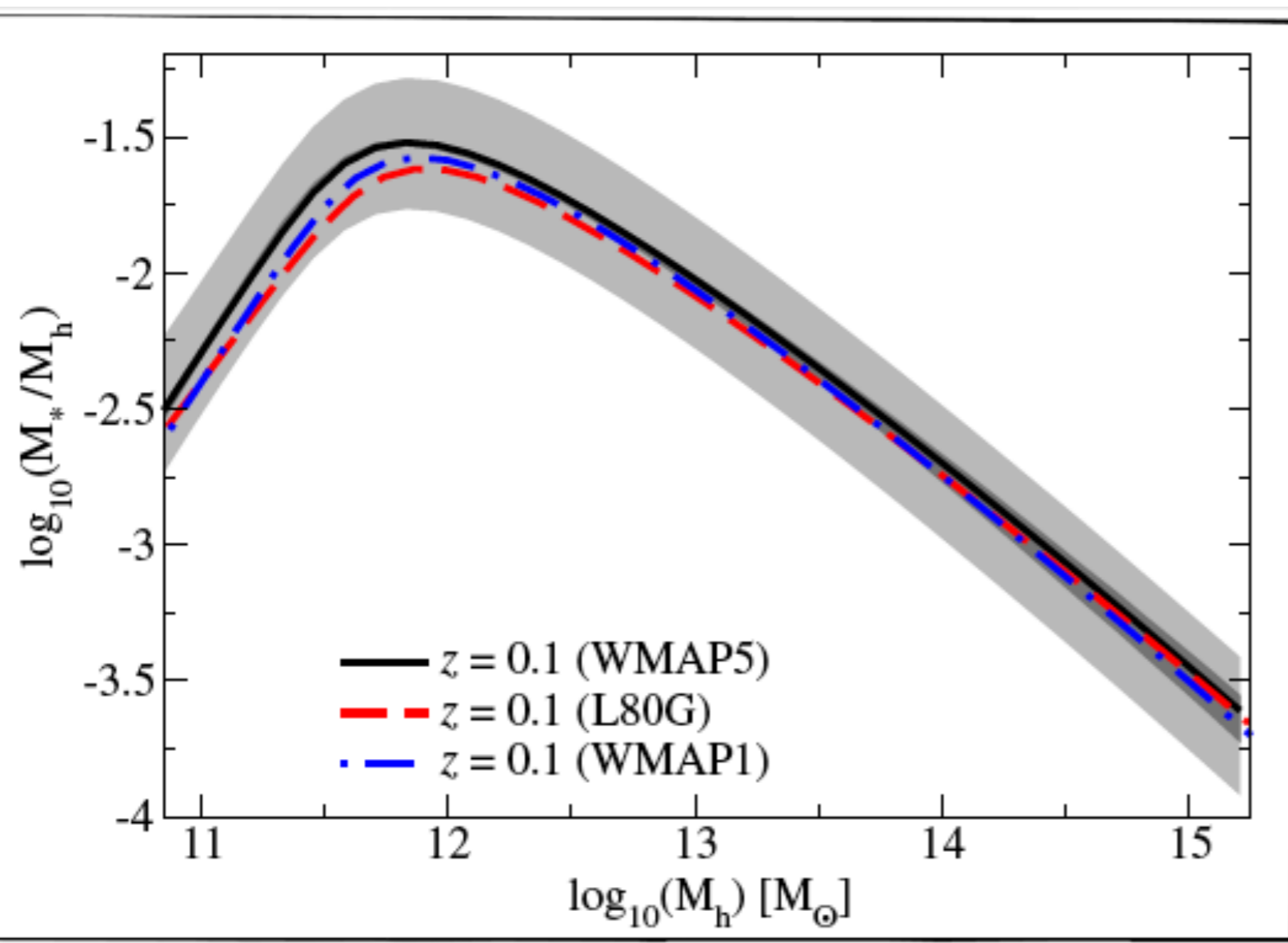
# Uncertainties affecting the Galaxy-Halo Connection: $M^*$ - $M_{\text{vir}}$ relation

Behroozi et al. 2010

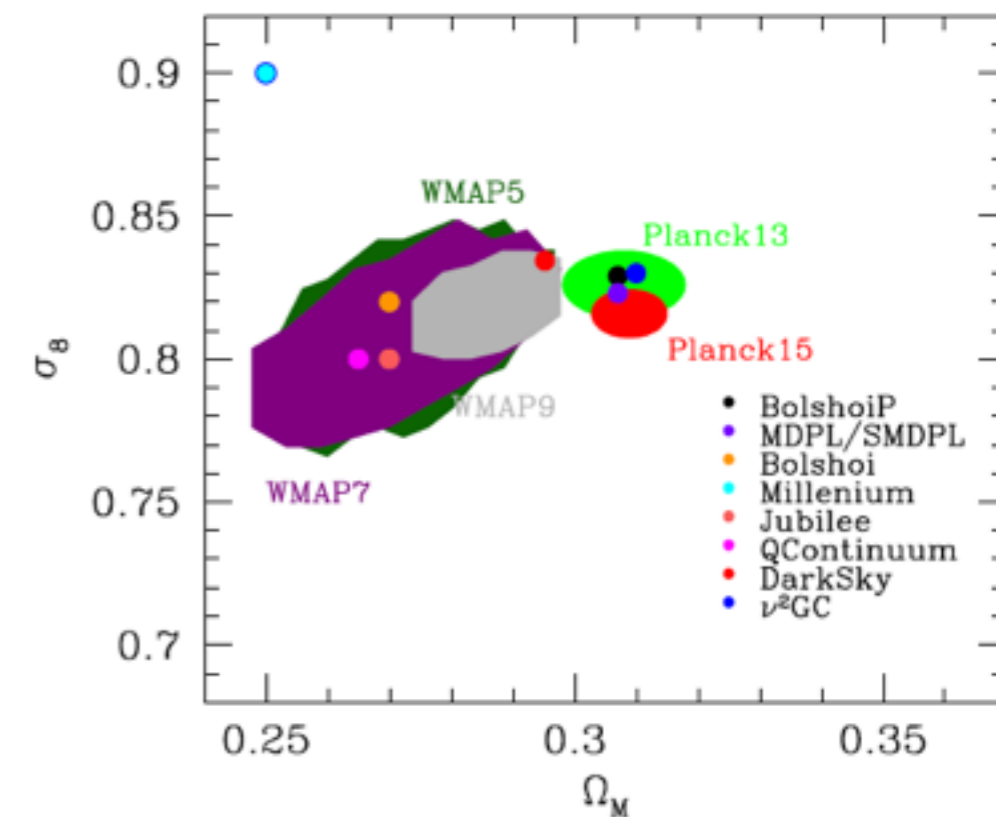


# Uncertainties affecting the Galaxy-Halo Connection: $M^*$ - $M_{\text{vir}}$ relation

Behroozi et al. 2010

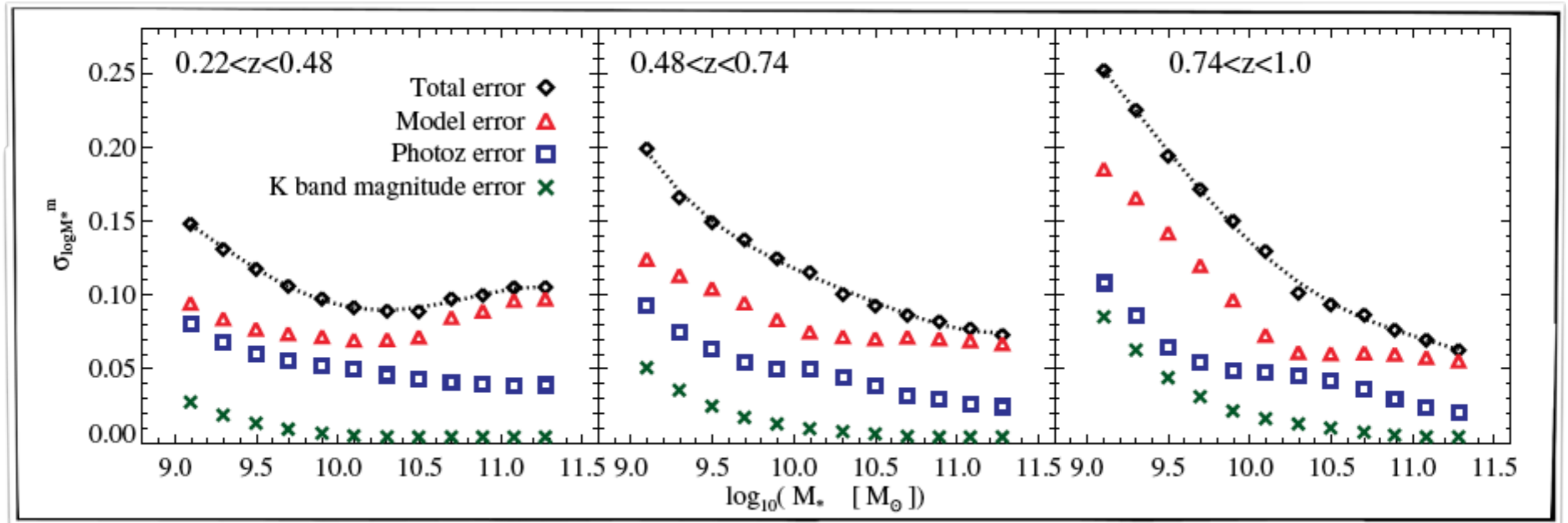


Rodriguez-Puebal et al. 2016b



# Uncertainties affecting the Galaxy-Halo Connection: $M^*$ - $M_{\text{vir}}$ relation

Leauthaud et al. 2012

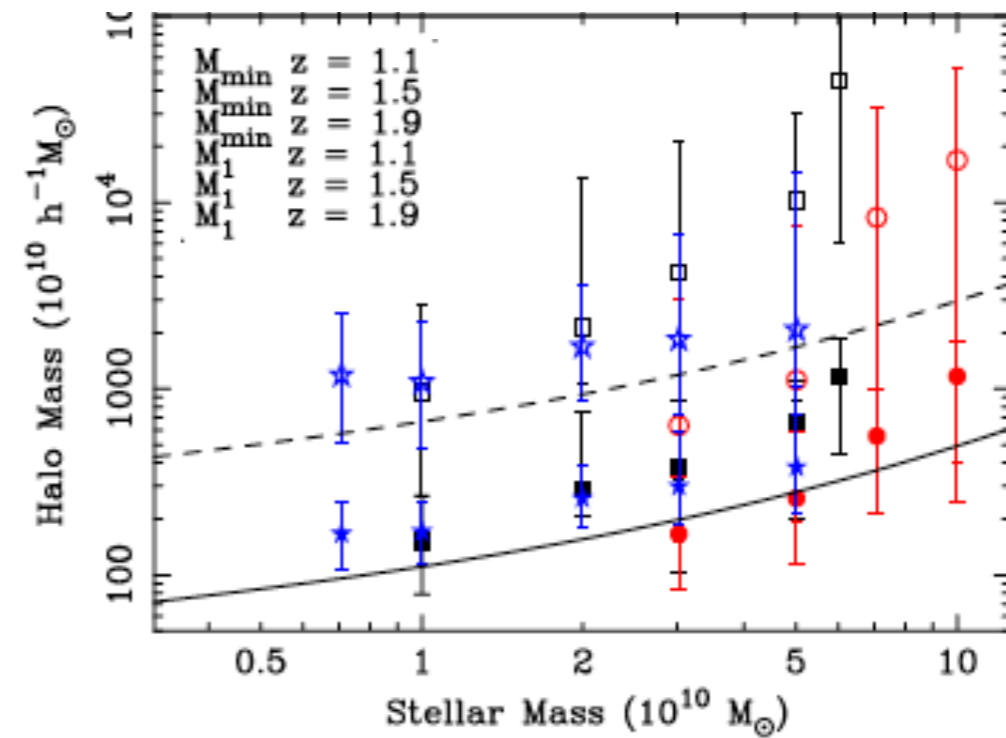
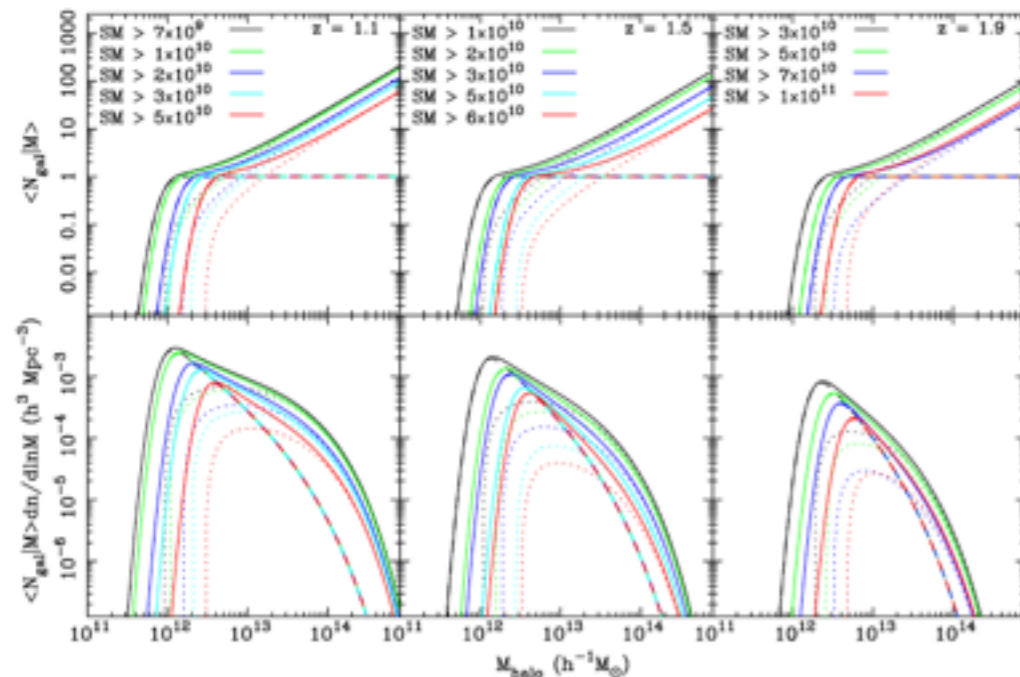
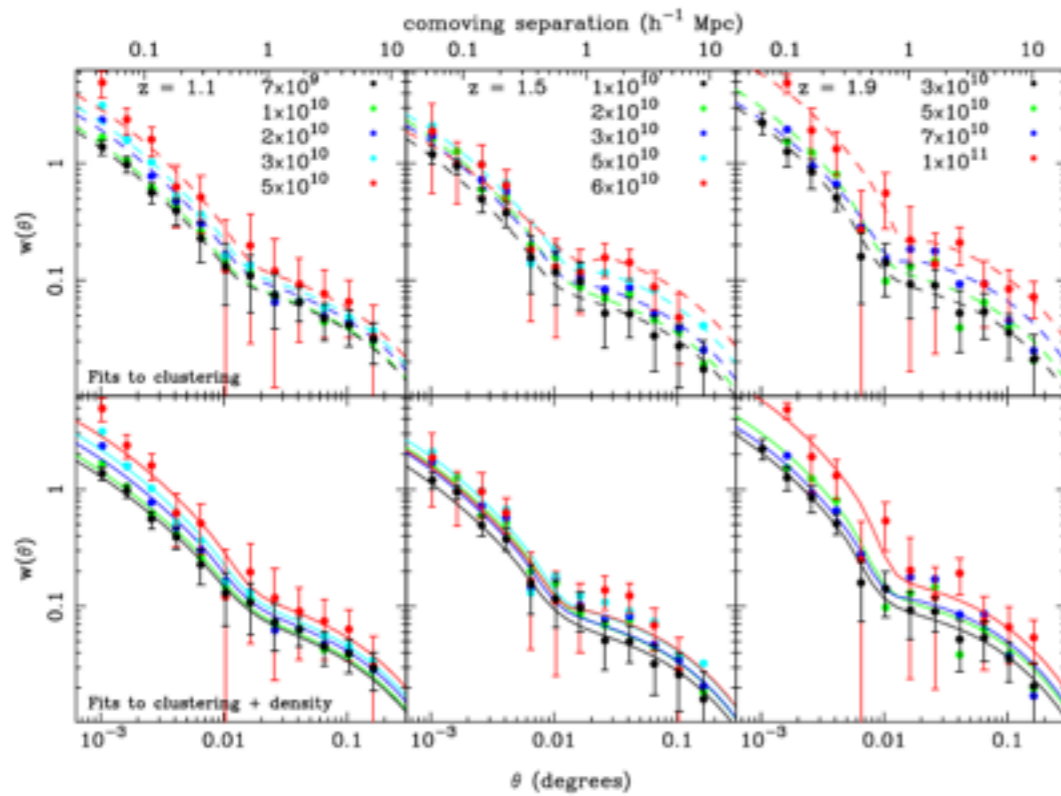


Three contributions to the stellar mass error budget. i) Model error is given by the 68% confidence interval of the mass probability distribution determined for each stellar mass galaxy. ii) Photoz error with derives from the uncertainty in the luminosity distance owing to the error on a given photometric redshift. iii) Photometric uncertainty on the observed K-band magnitude.

# Constraints at high redshift

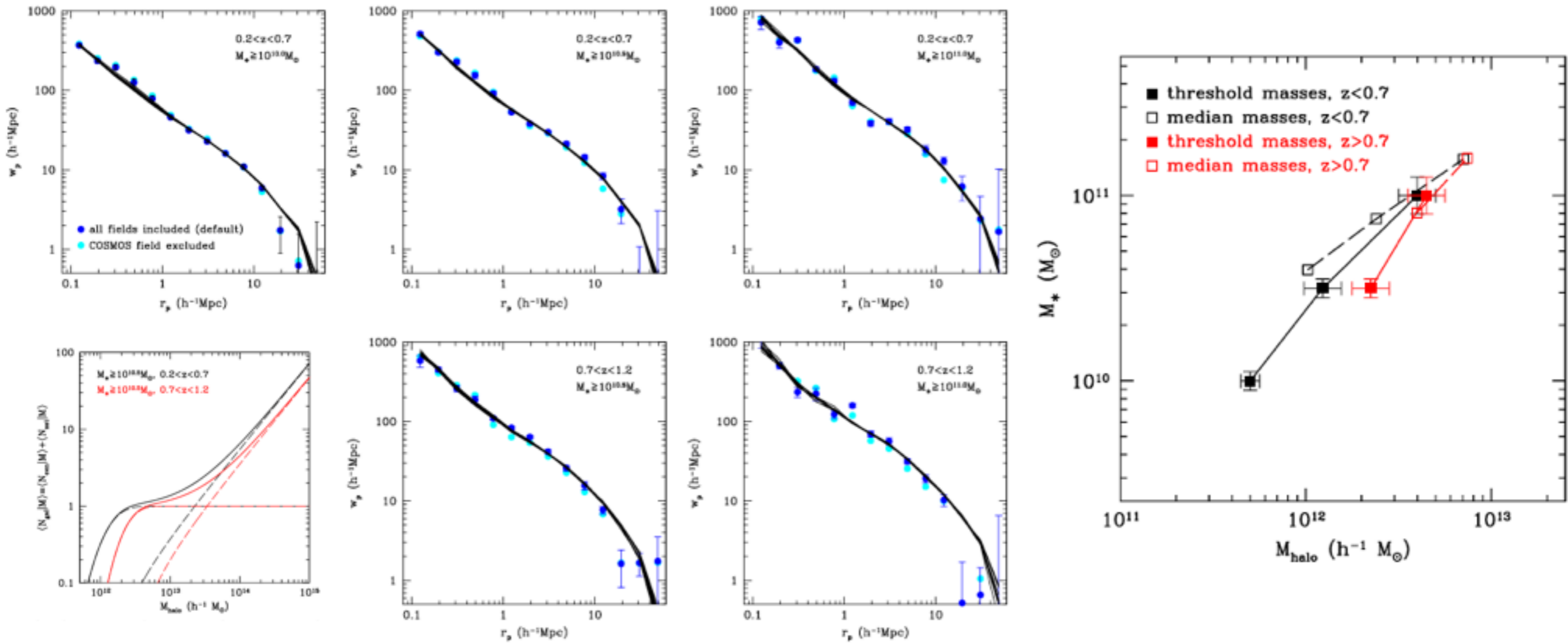
# Constraints at high redshift

Wake et al. 2012



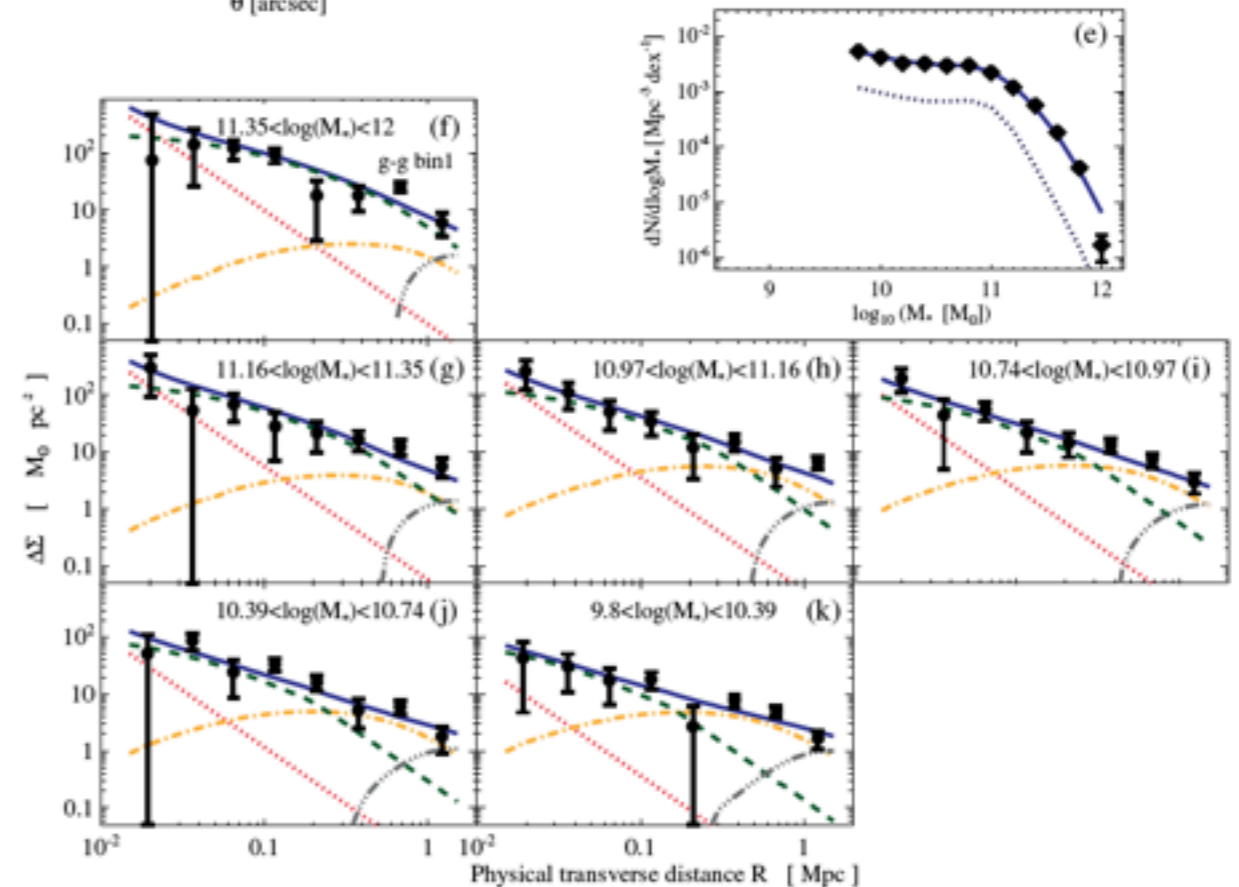
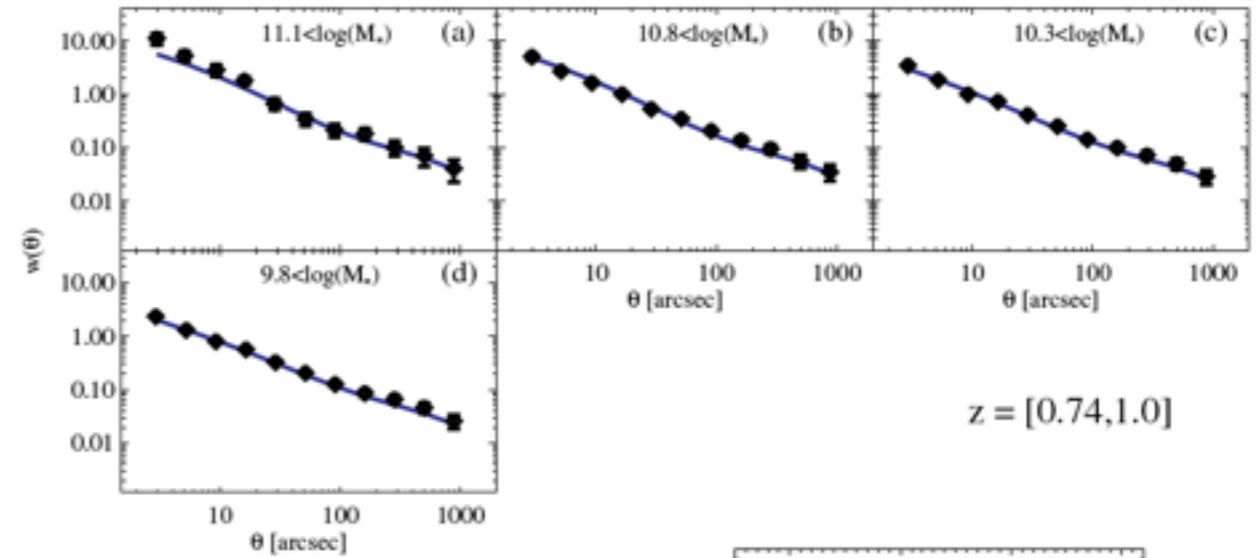
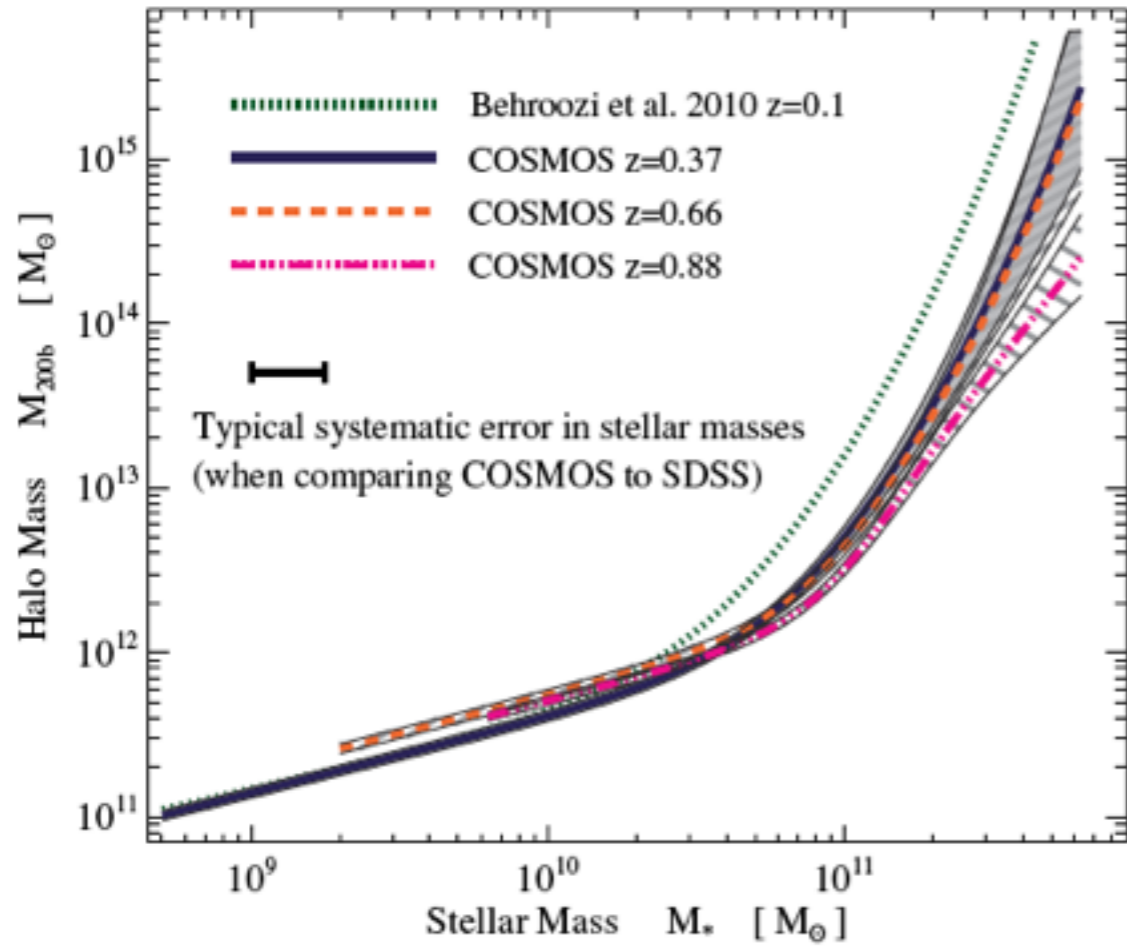
# Constraints at high redshift

Skibba et al. 2015



# Constraints at high redshift

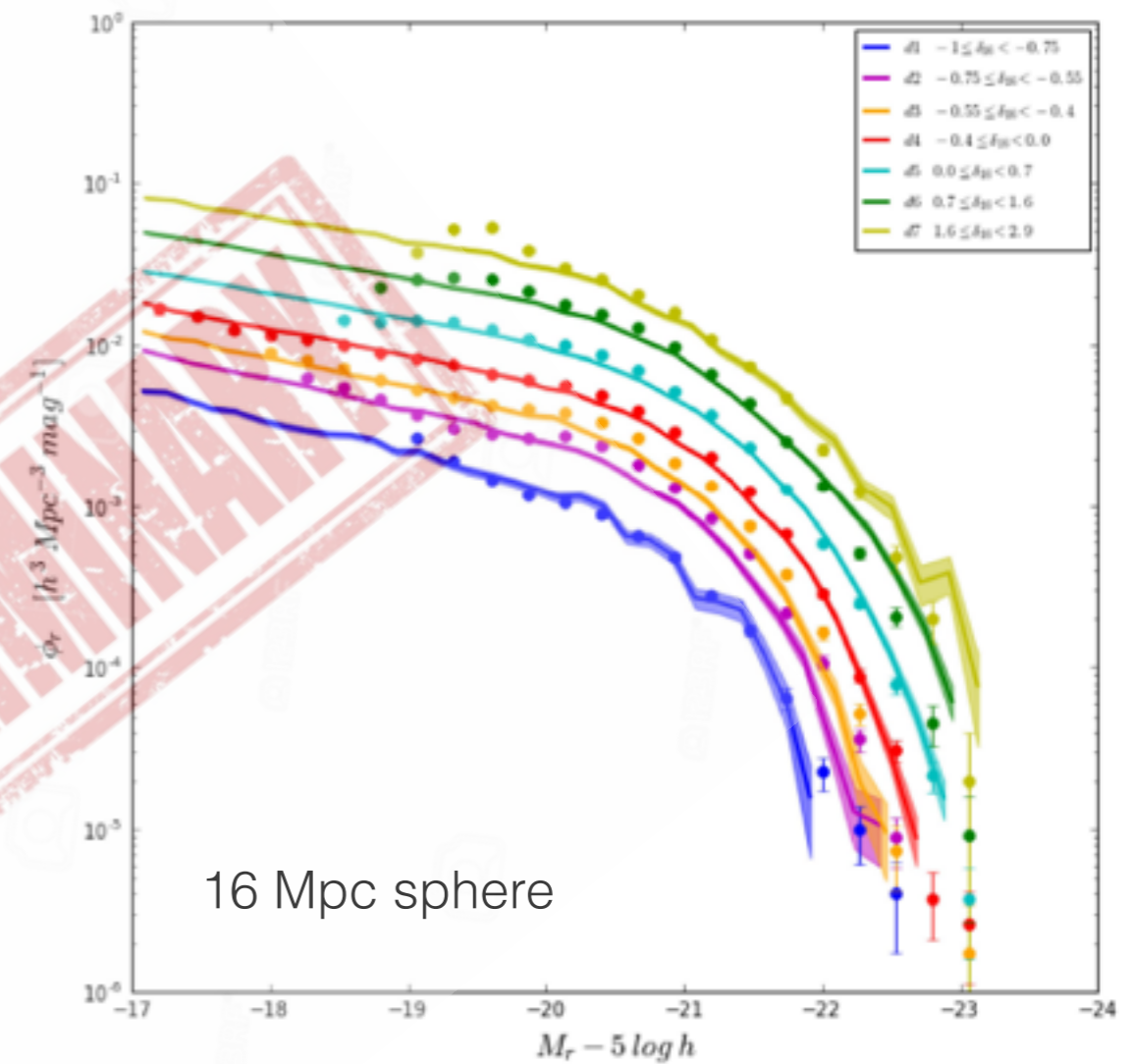
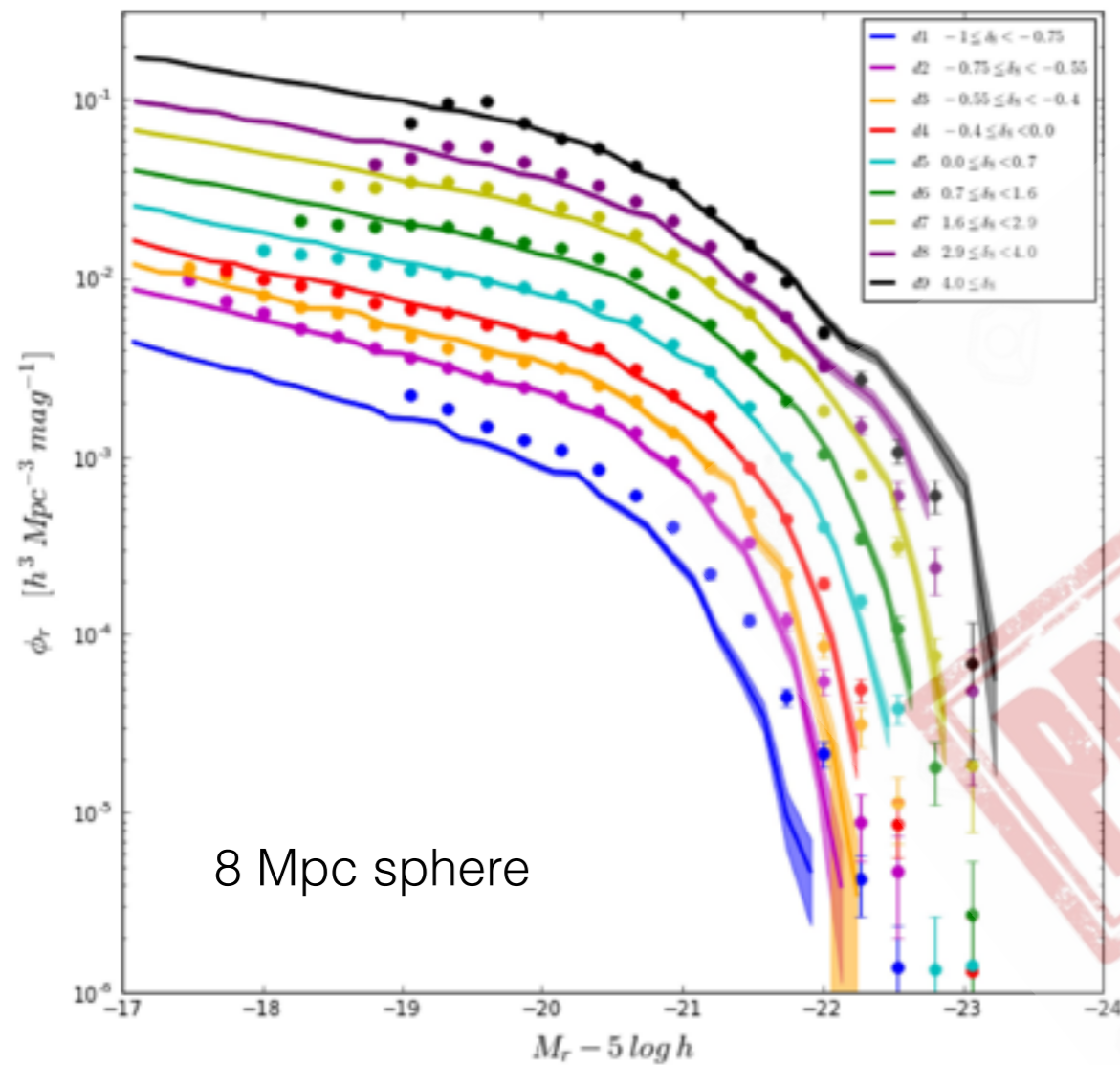
Leauthaud et al. 2012



# Environment dependence on the Galaxy- Halo connection

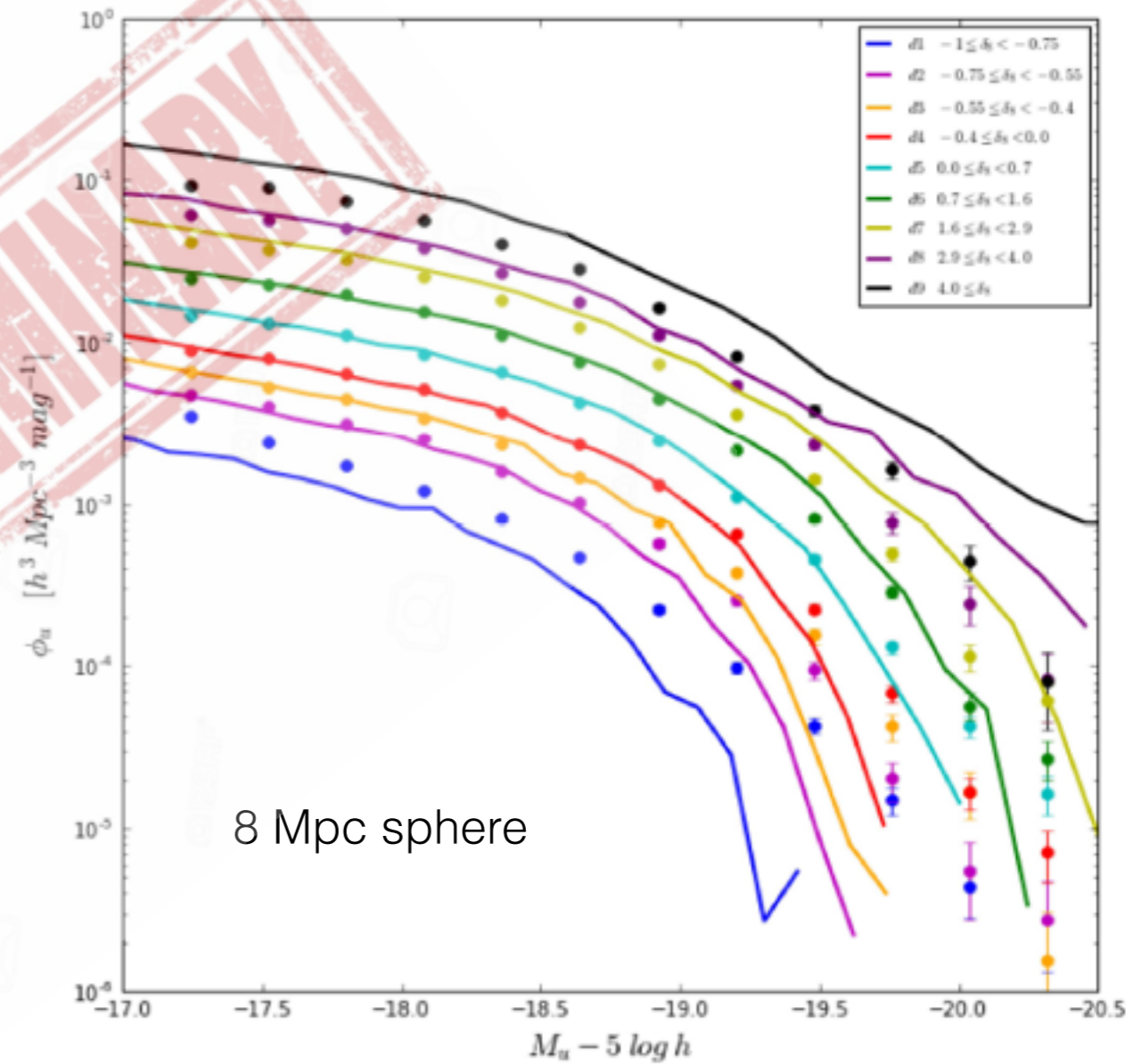
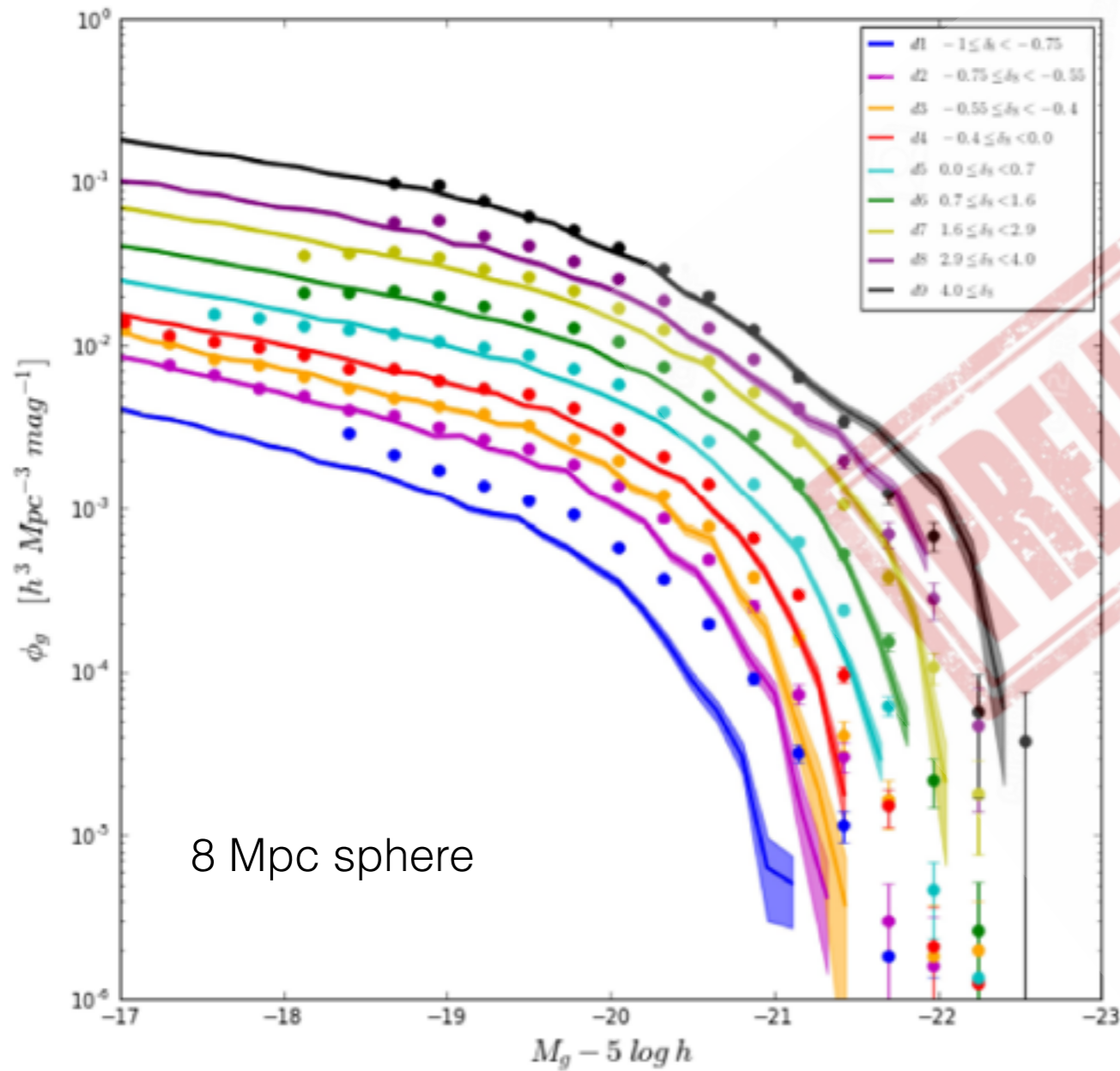
# Environment dependence on the Galaxy-Halo connection

Dragomir, Rodriguez-Puebla et al. in prep.

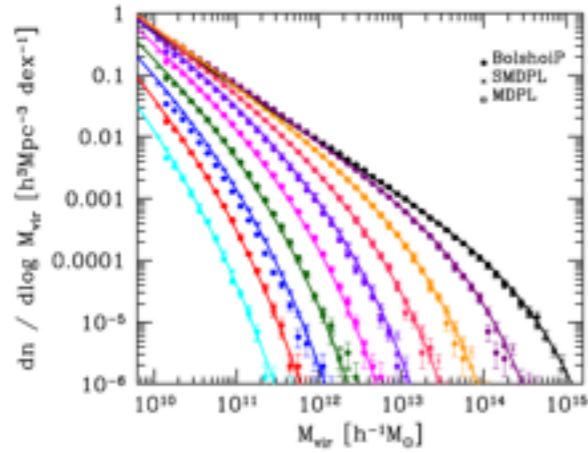


# Environment dependence on the Galaxy-Halo connection

Dragormir, Rodriguez-Puebla et al. in prep.

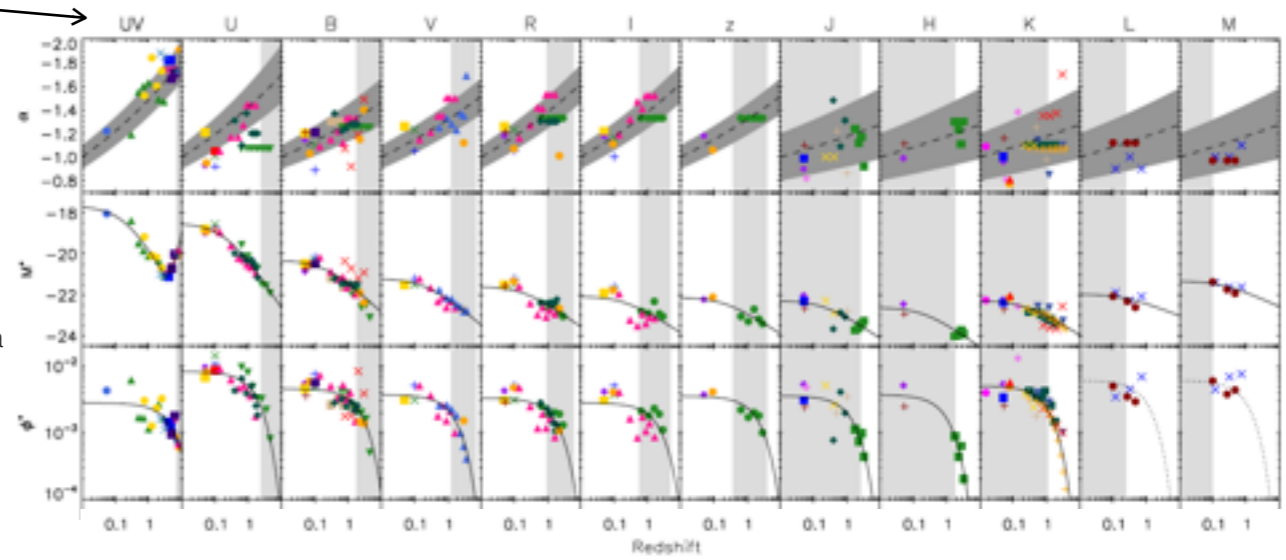


Redshift evolution of the halo mass function:



rest frame bands

Schechter Parameters for the luminosity function for different bands:



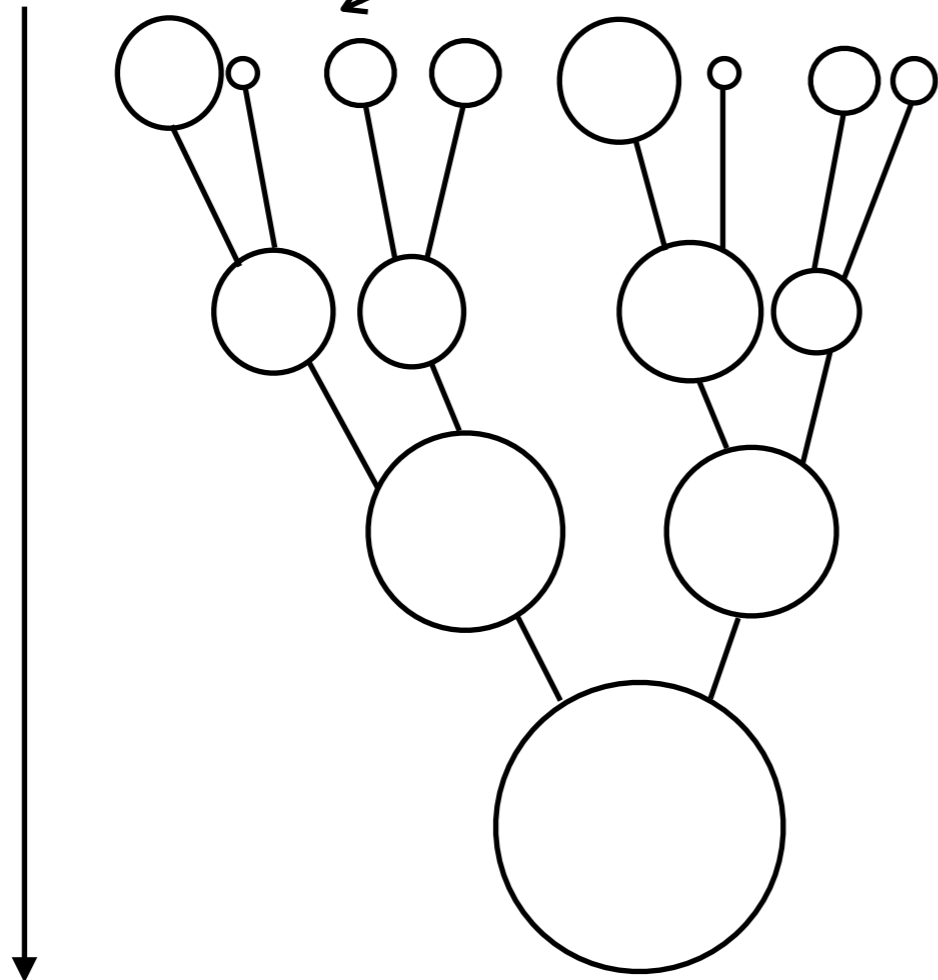
Abundance Matching using Halo mass function and all luminosity bands (UV, V, ..., M).

Every halo is assigned a luminosity in every band (UV, V, ..., M) at all redshifts, i.e., every halo has a SED.

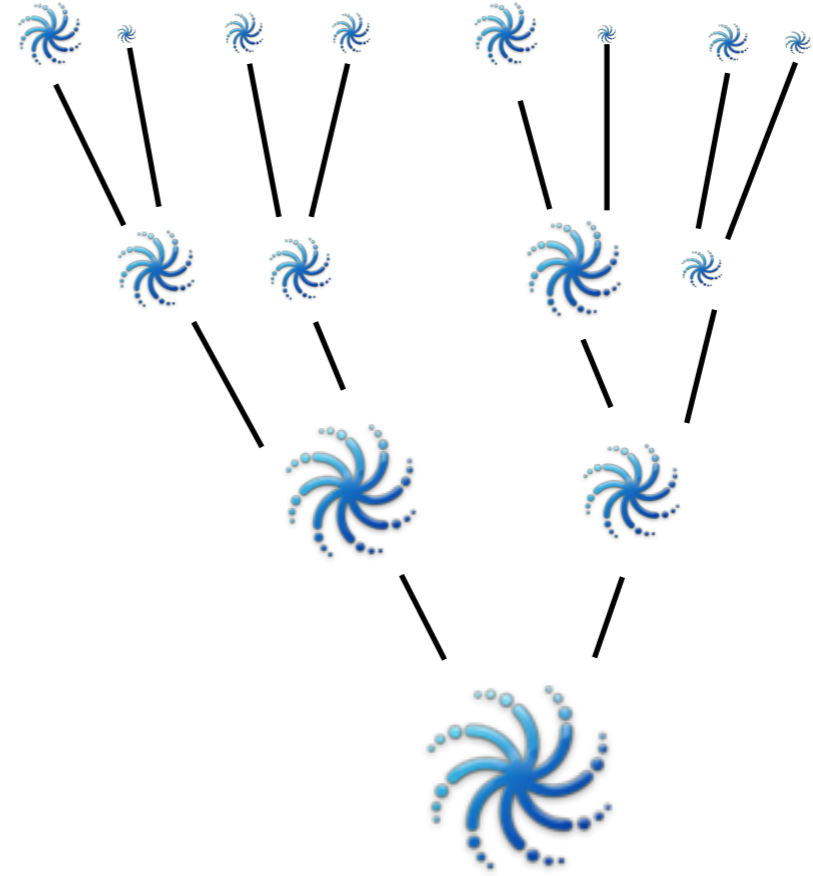
SED.

Photometric mock catalogue

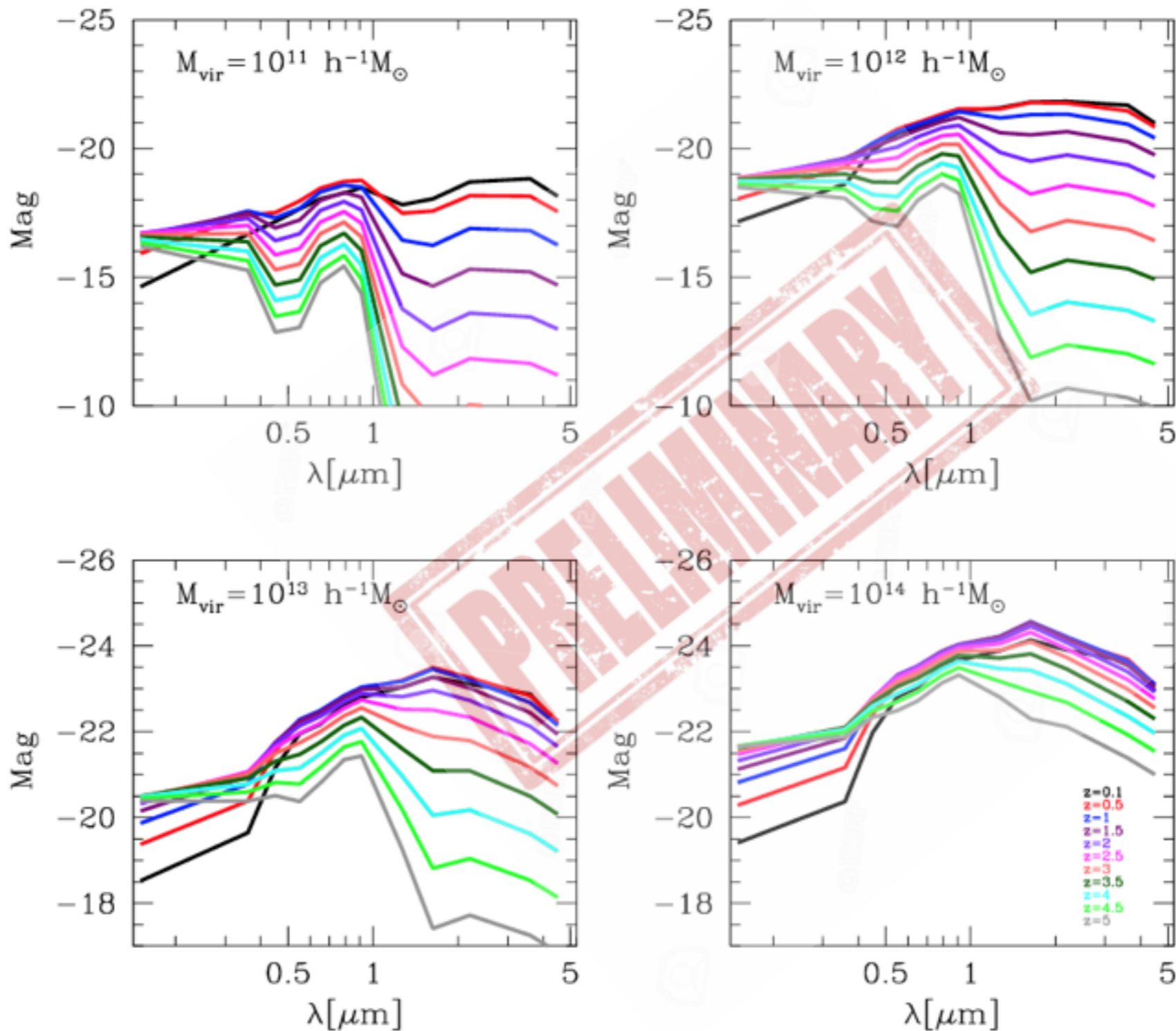
Growth in halo mass



Growth in Luminosity in all bands (UV, V, ..., M)

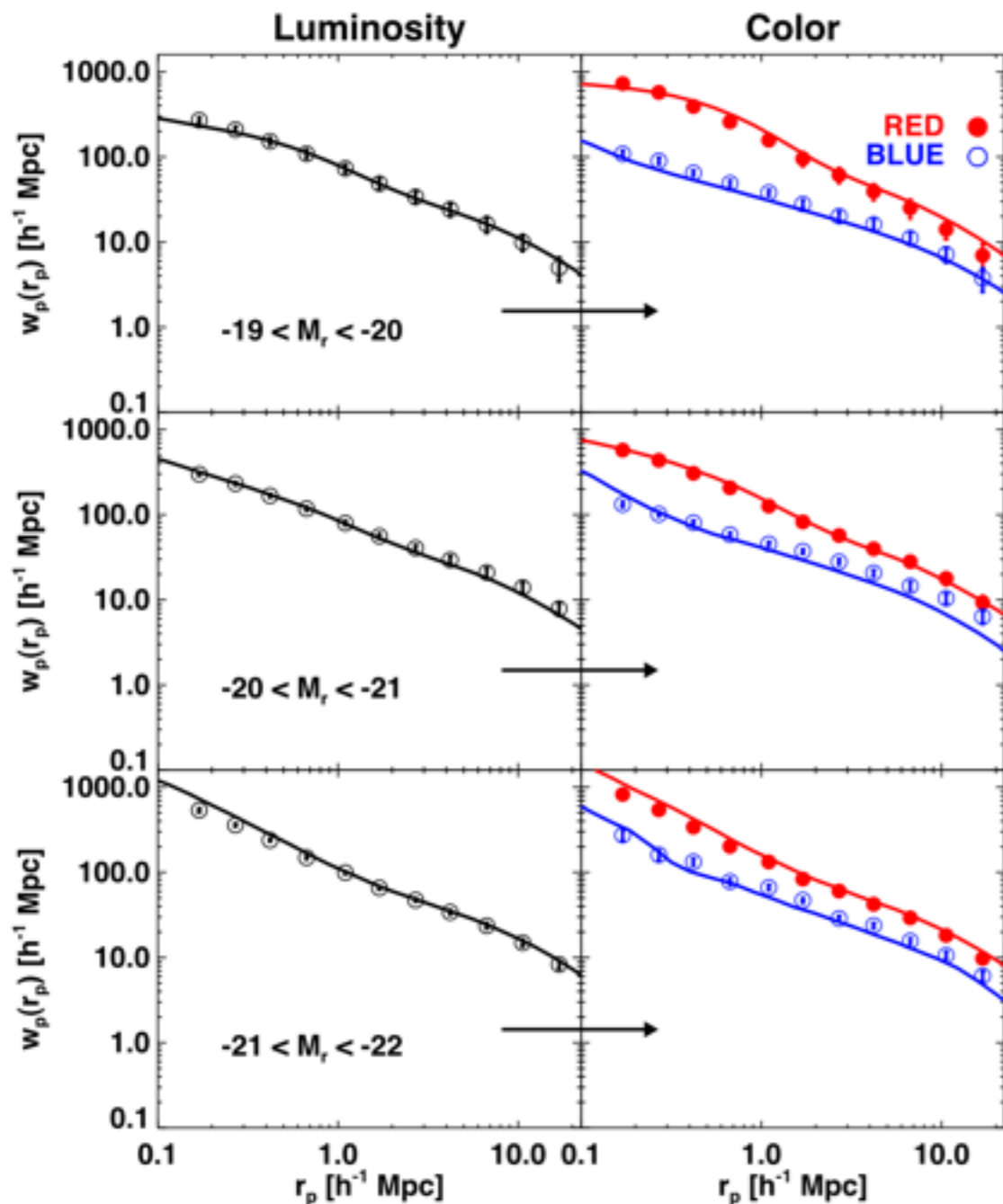


# Environment dependence on the Galaxy-Halo connection



# Beyond Halo Mass

# Comparison to Age Matching

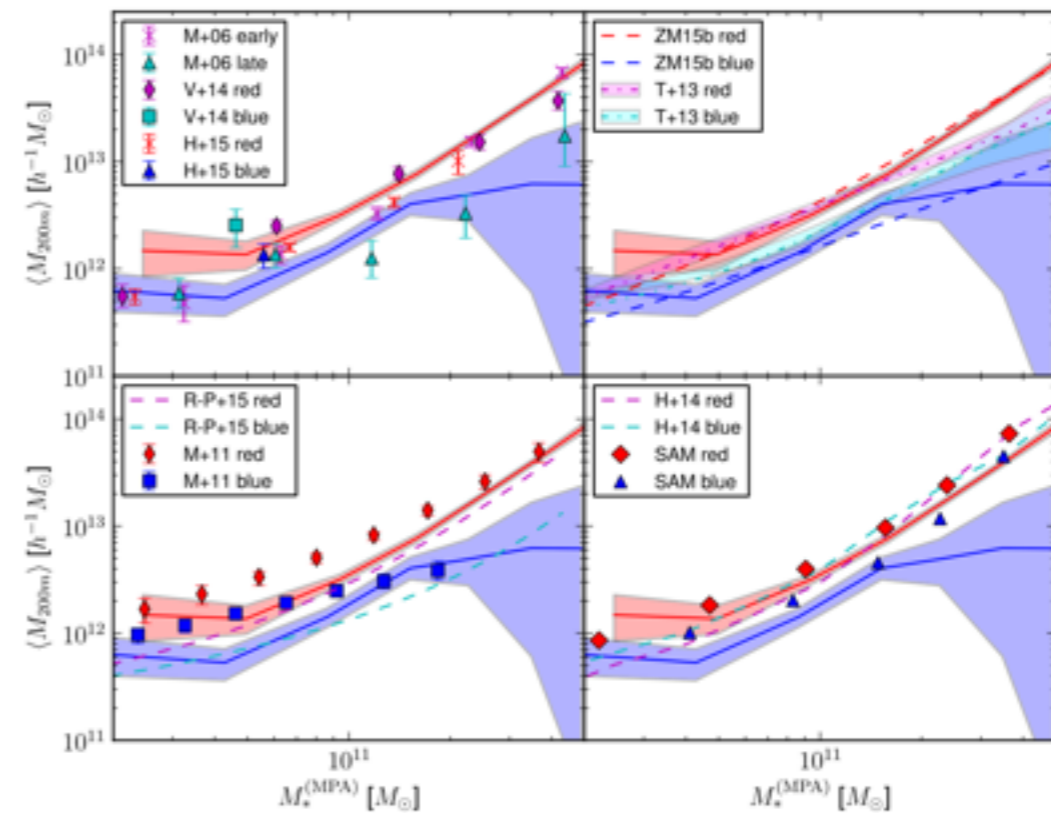


Hearin & Watson et al. 2013

1) AMT

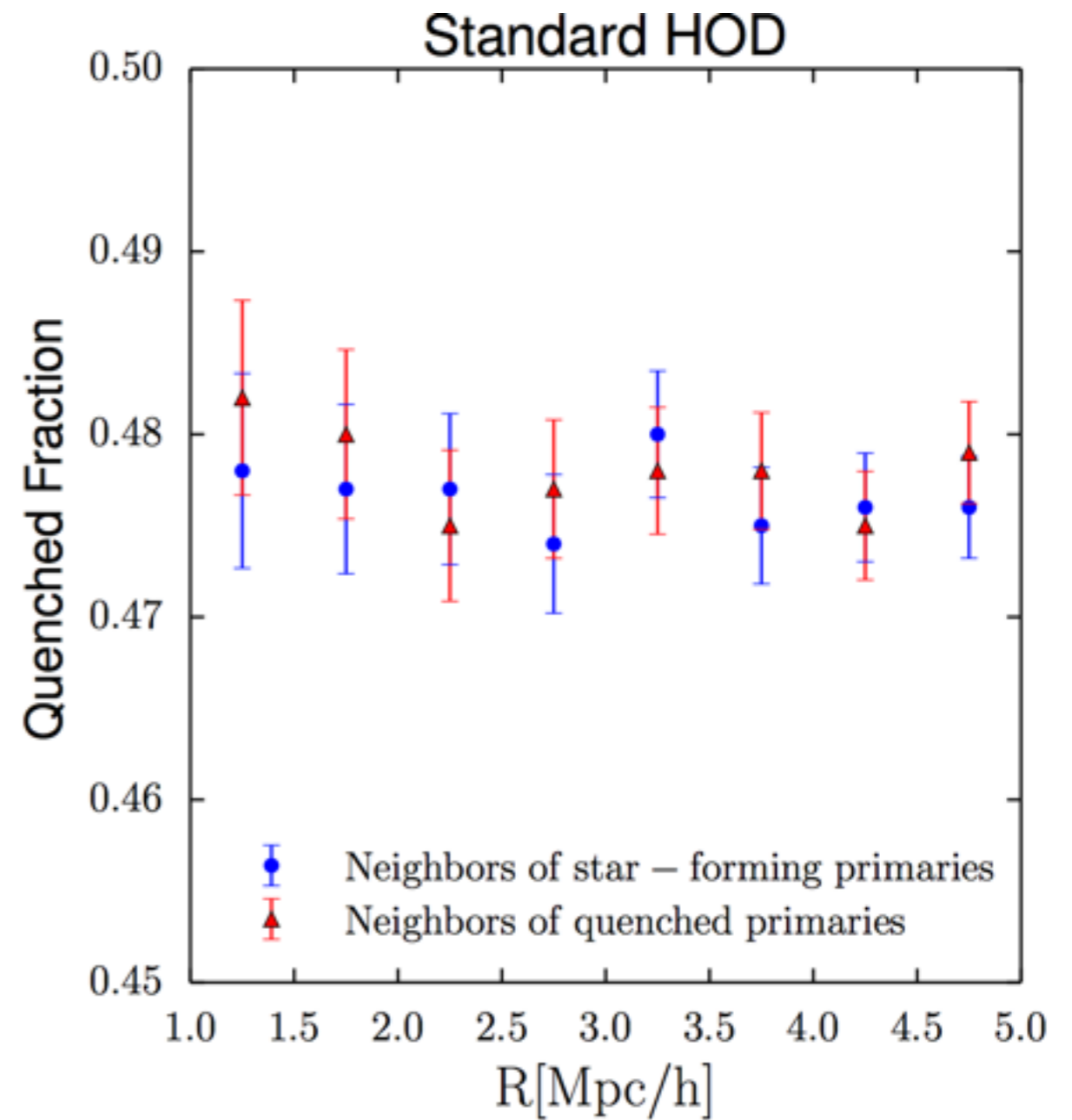
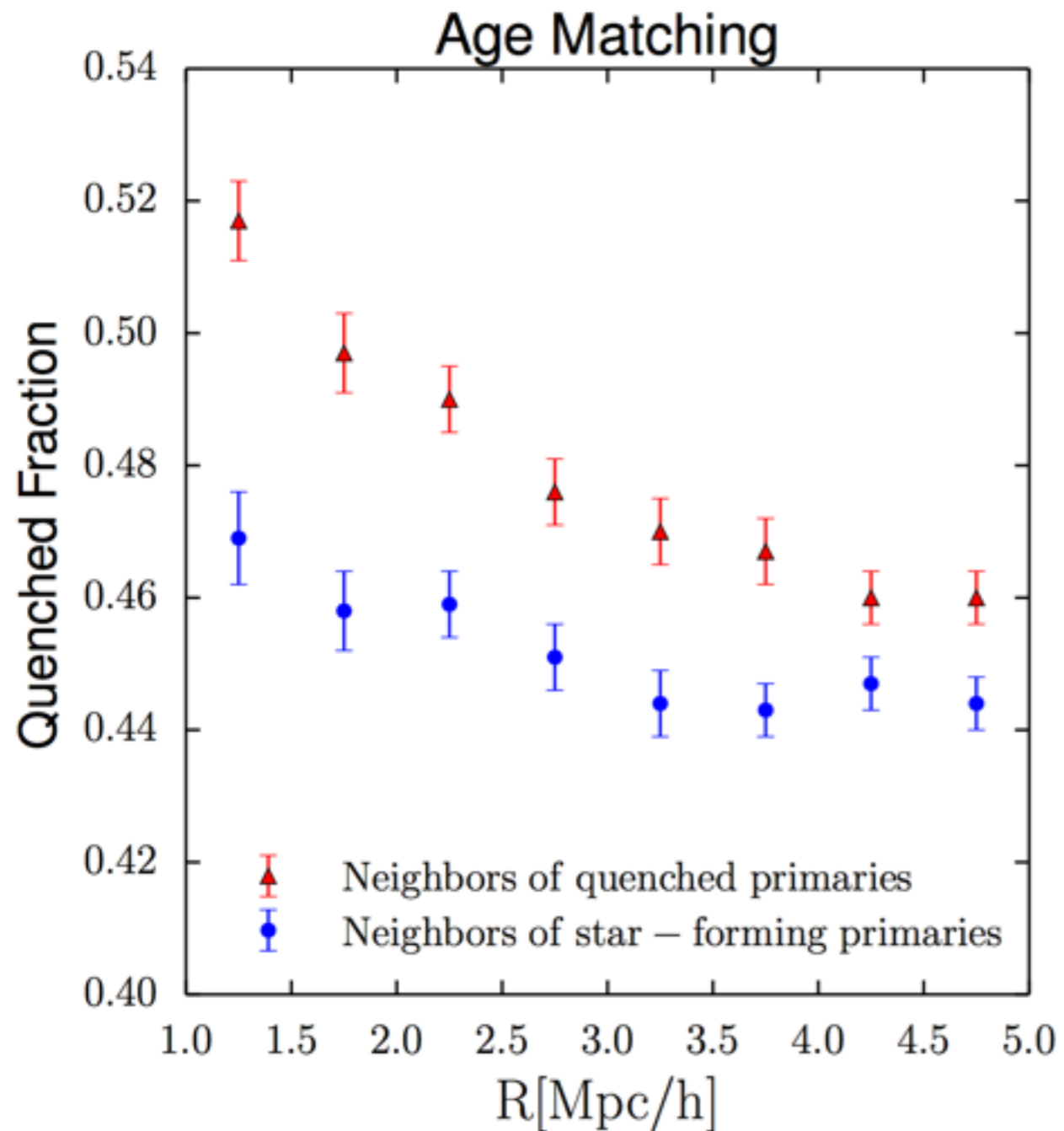
2)  $z_{\text{starve}} =$

$\text{Max}\{z_{\text{acc}}, z_{12}, z_{\text{form}}\}$

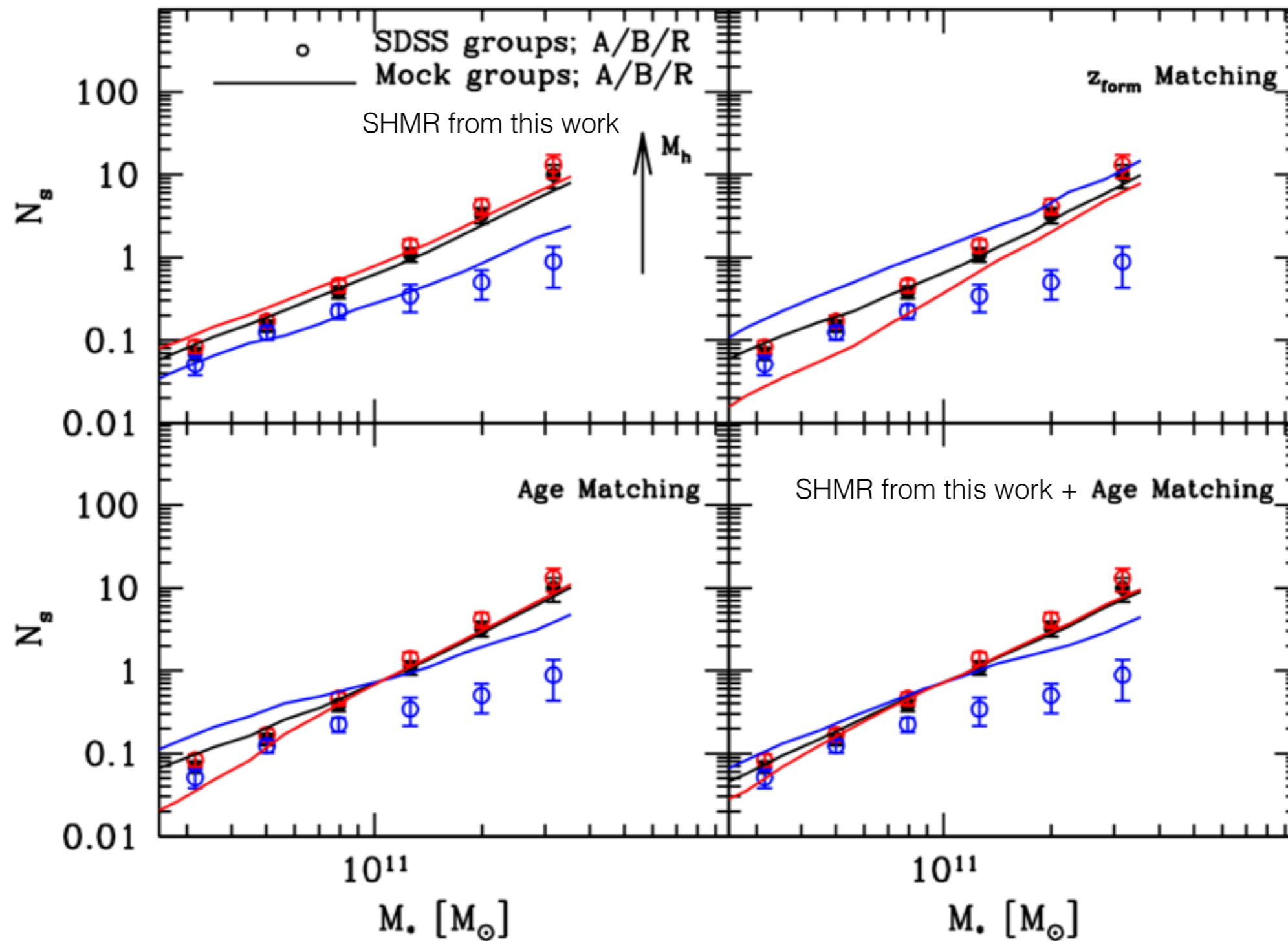


Mandelbaum et al. 2016

# Comparison to Age Matching



# Comparison to Age Matching



# Summary

The Empirical modelling allow us to construct self-consistent models with the data and our standard structure formation model without invoking any physics of galaxy formation.

Empirical modelling constraints indirectly the galaxy-halo connection.

Understanding systematics and errors in observations is vital in order to interpret correctly results from the empirical models.

*The Rock says* that you can gain insights on the physics of galaxy formation using empirical modelling.

Don't replace empirical modelling with galaxy formation models.