

# **From Classic to Realistic: Connecting SFH, Color Evolutions and SED-fitting Behaviors of $0.5 < z < 2.5$ Galaxies in CANDELS**

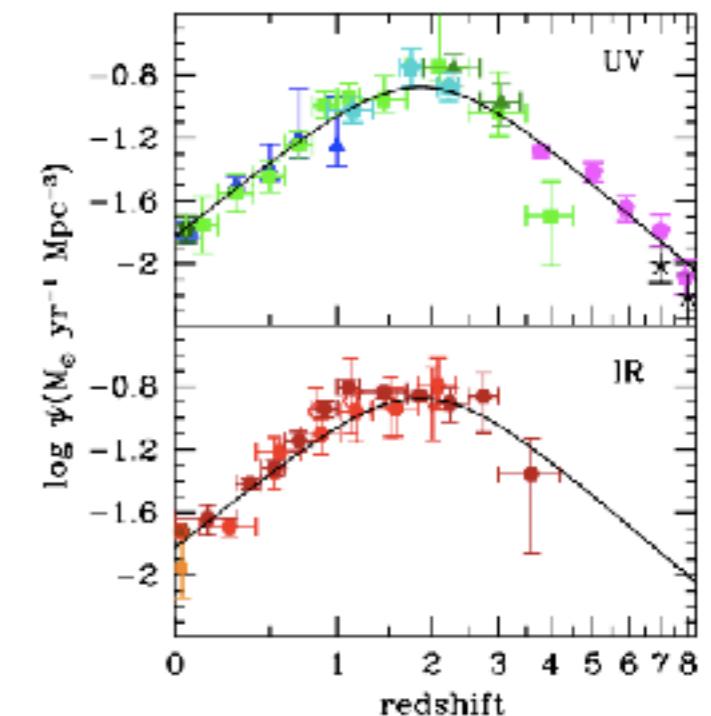
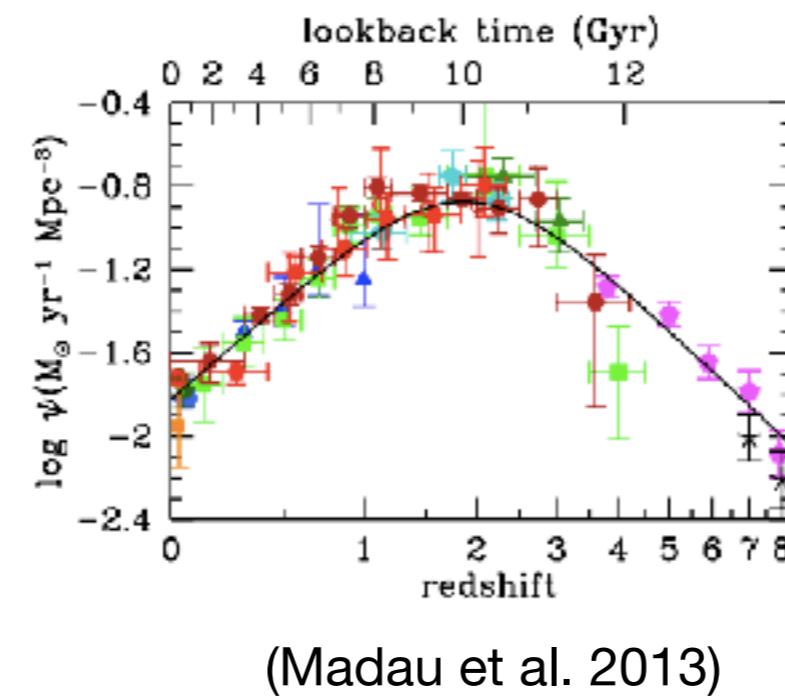
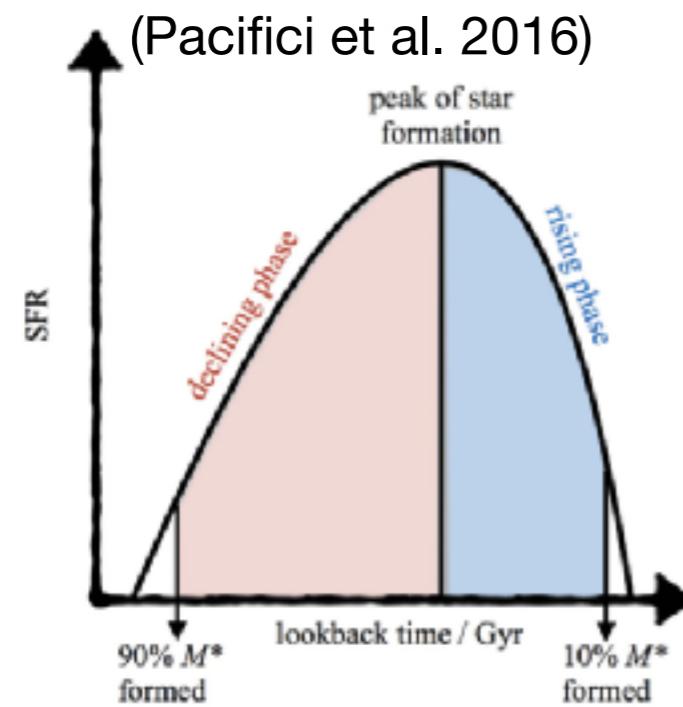
**Qing Liu (USTC) & Xinyi Tong (THU)**

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**Collaborator:** Aldo Rodriguez-Puébla (UNAM), Yicheng Guo (UCO Lick->Missouri), Viraj Pandya (UCSC), Jerome Fang (Orange), Dale Koceivski (Colby), Kenneth Duncan (Leiden)

# 1. Introduction

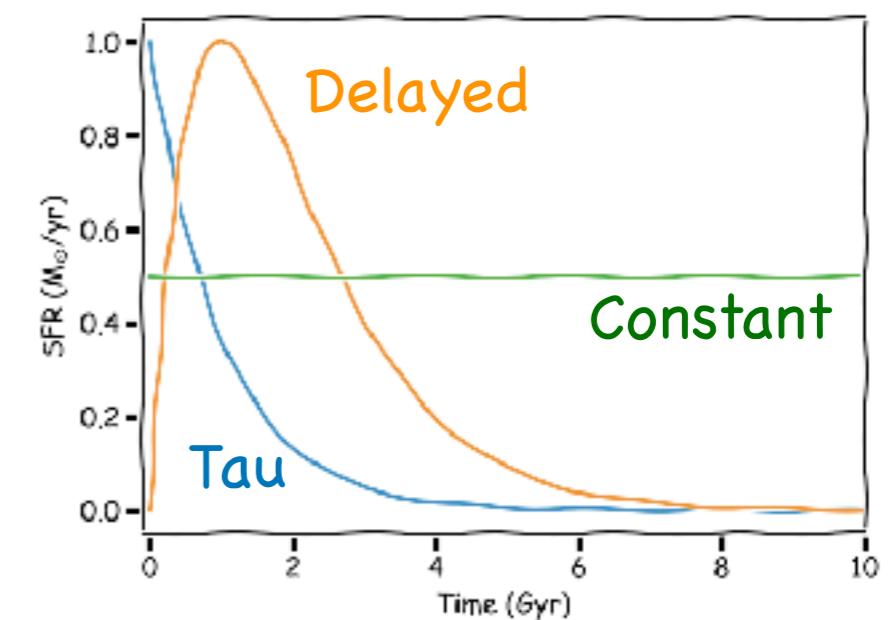
- Star Formation History (SFH) : the way how galaxies *grow their mass*



In simple and most popular cases, people use assumption of simple SFH models:

- Exponential tau Model  $\text{SFH}(t) \propto e^{-\frac{t}{\tau}}$
- Delayed tau Model  $\text{SFH}(t) \propto t e^{-\frac{t}{\tau}}$
- Constant Model  $\text{SFH}(t) = \text{const.}$

Prior, Analytic, Hypothetical — ‘**Classical**’



Many studies are based on results from **SED-fitting** with simple assumptions:

~95% Tau

~5% Delayed

However, some previous work have shown that:

## Tau models are not PANACEA

E.g. Maraston et al. (2010): SED results for such models do not account well for the observed colors of z~2 galaxies for 96 GOODS-S sample.

Now we have recent CANDELS data —

full GOODS-S: 34,930 objects + UDS: 35,932 objects

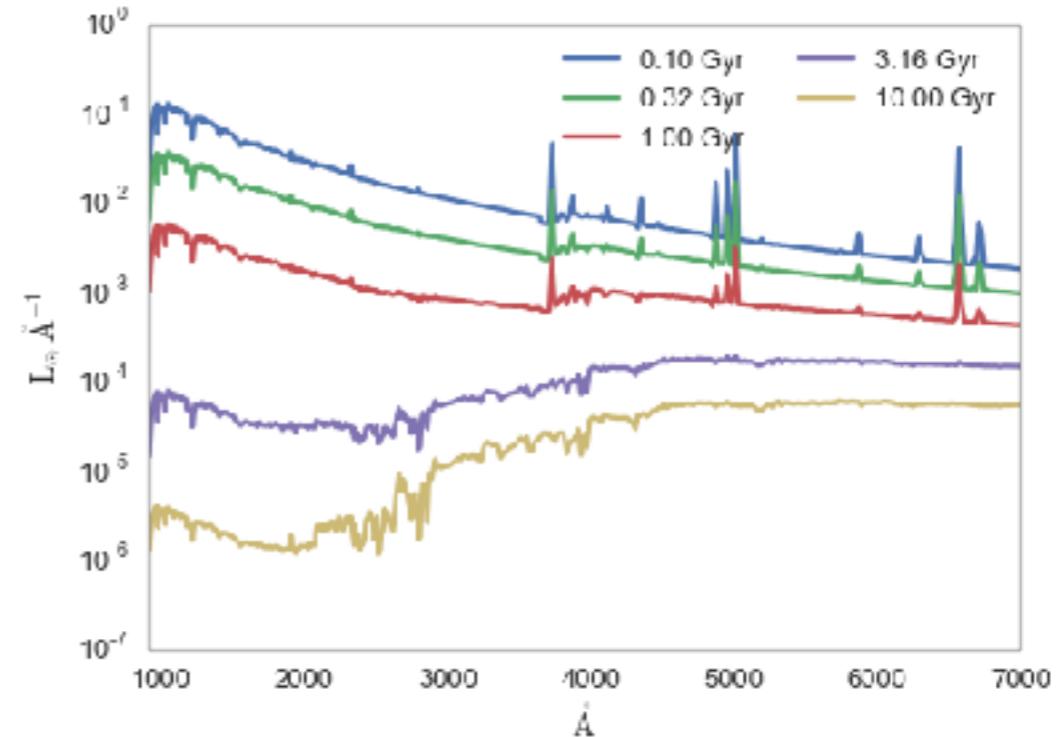
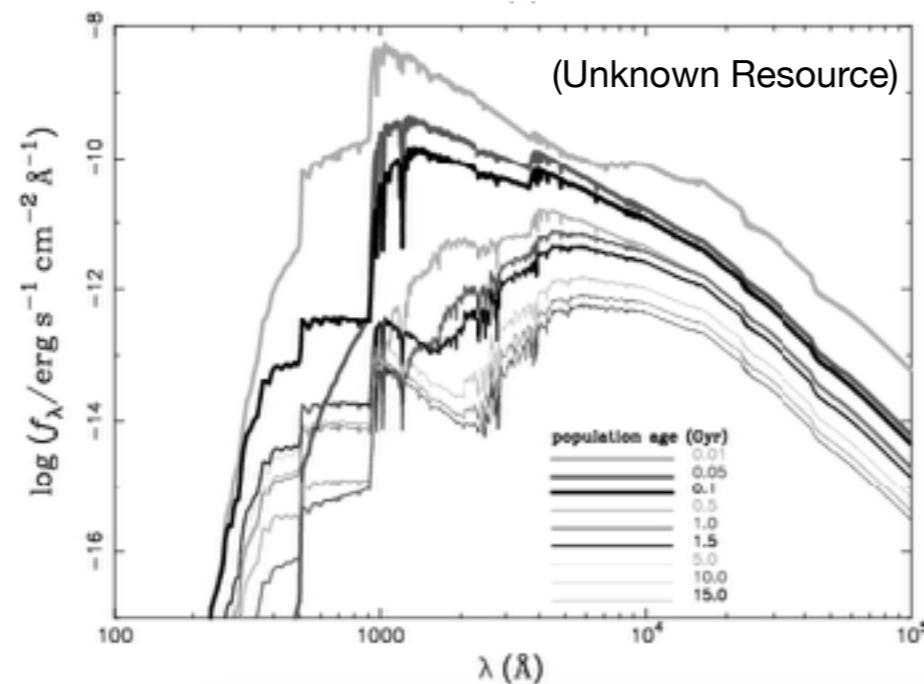
To check models on our own:

*Q1: Can models explain real data?*

*Q2: Can SED-fitting return correct estimation?*

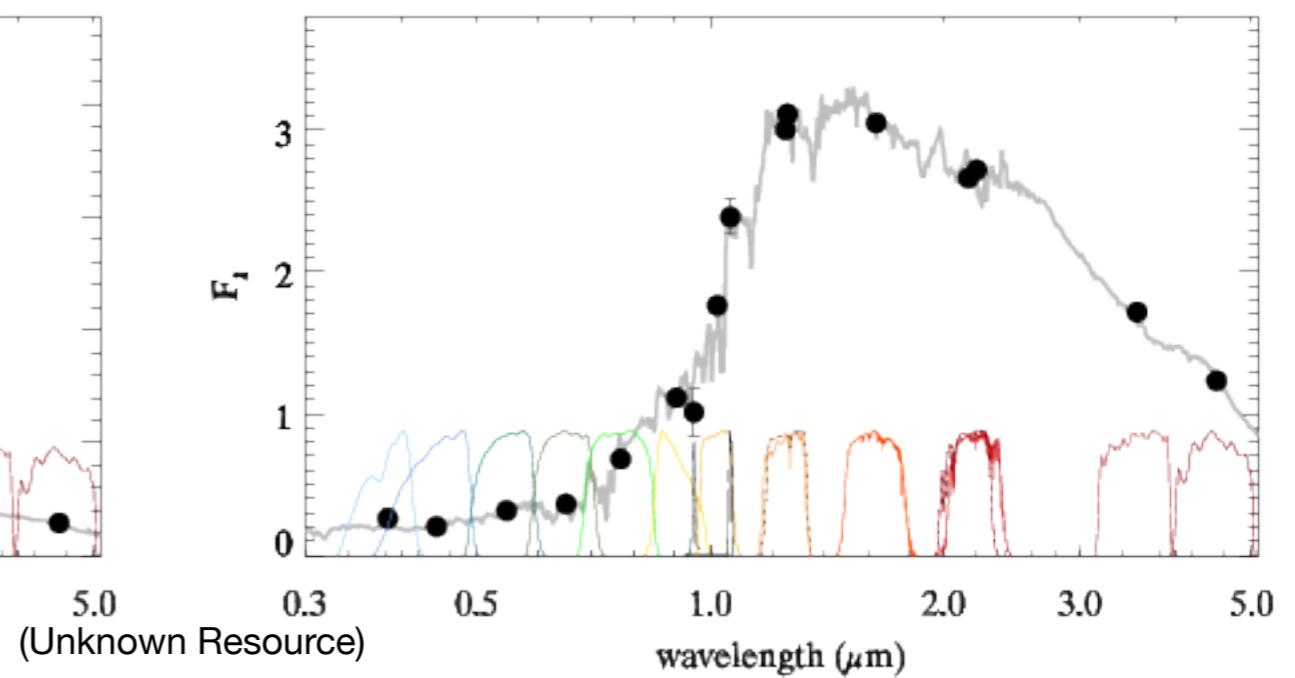
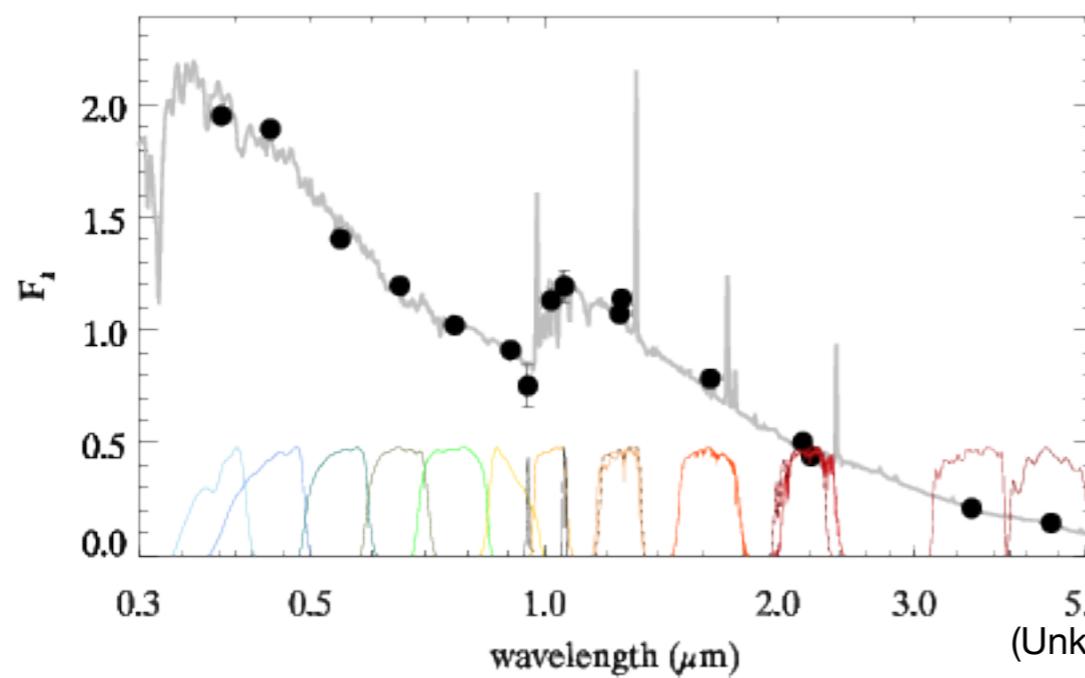
Use **BC03** (Bruzual & Charlot, 2003) + **astro-smpy** (K. Duncan) to get synthetic SED from the models and then put them into **FAST**.

## ◆ Synthetic SED : galaxy spectra following evolution models



## ◆ FAST (Fitting and Assessment of Synthetic Templates) : Standard SED-fitting Tool

Kriek et al. 2007



# 2. Data & Methods

## 2.1 CANDELS data



*Cosmic Assembly Near-infrared and Deep Extragalactic Legacy Survey*

Table 1. Sample Selection Cuts

Cut	GOODS-S	UDS	Combined
Full catalog	34,930 (100%)	35,932 (100%)	70,862 (100%)
F160W < 24.5	9,904 (28.4%)	12,223 (34.0%)	22,137 (31.2%)
SE flag = 0	9,607 (27.5%)	11,392 (31.7%)	20,999 (29.6%)
CLASS STAR < 0.9	9,376 (26.8%)	11,090 (30.9%)	20,466 (28.9%)
0.2 < z < 2.5	7,656 (21.9%)	9,534 (26.5%)	17,190 (24.3%)
log M* < 11.0	7,585 (21.7%)	9,445 (26.3%)	17,030 (24.0%)
9.0 < log M* < 11.0	4,683 (13.4%)	5,810 (16.2%)	10,493 (14.2%)
GALFIT Flag = 0	4,028 (11.5%)	5,107 (14.2%)	9,135 (12.9%)
Star-forming	3,581 (10.3%)	4,479 (12.5%)	8,060 (11.4%)
Quiescent	447 (1.3%)	628 (1.7%)	1,075 (1.5%)

## 2.2 Stellar population Synthesis

- SSP Library: BC03
- Chabrier IMF
- Calzetti Attenuation:  $A_V = 1$
- No Emission Lines
- Solar Metallicity

High-quality data to help us understand the formation and evolution of galaxies

We use the same sample and catalog  
in Fang+ 2017 (UVJ paper)

## 2.3 SED-fitting: FAST

- Tau / Delayed Model Templates
- Chabrier IMF
- Calzetti Law
- Solar Metallicity
- 1% hypothetical error
- FUV, NUV, U, B, V, R, I, J, H, K

The parameters we are concerning about are:

**M\*, SSFR and Av**

M\*: Stellar Mass

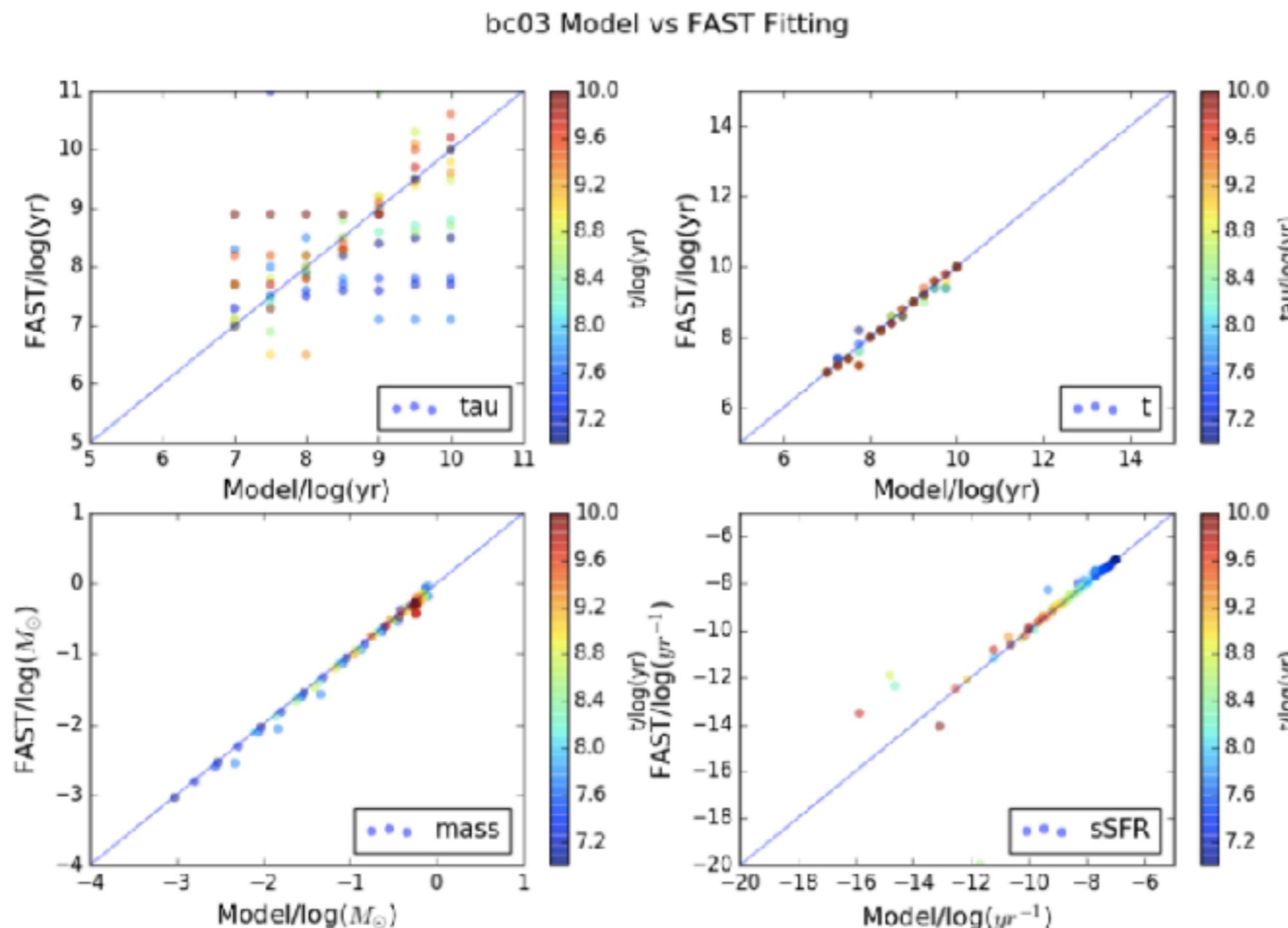
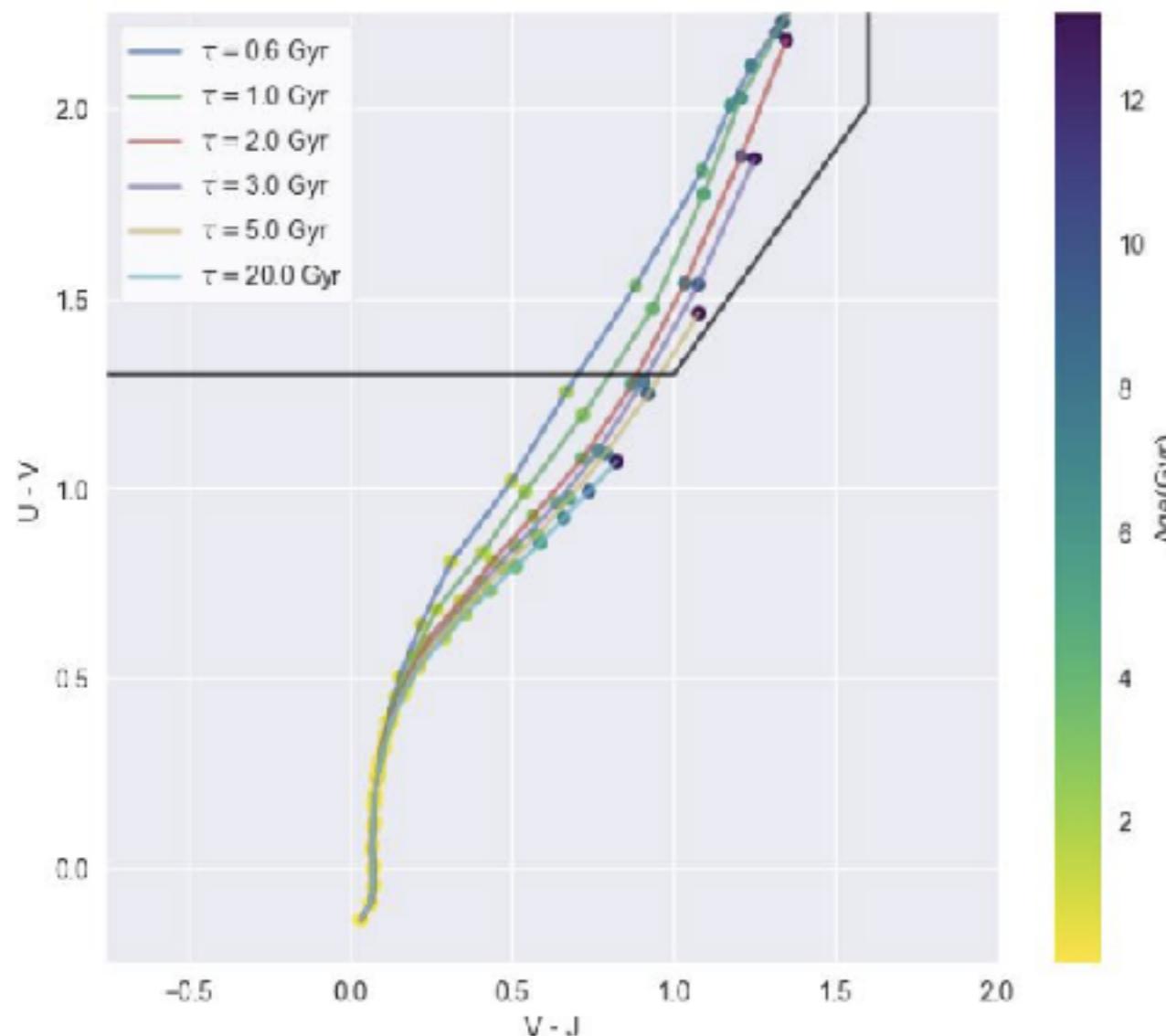


Fig 1: Comparisons of parameters which are input and FAST returns

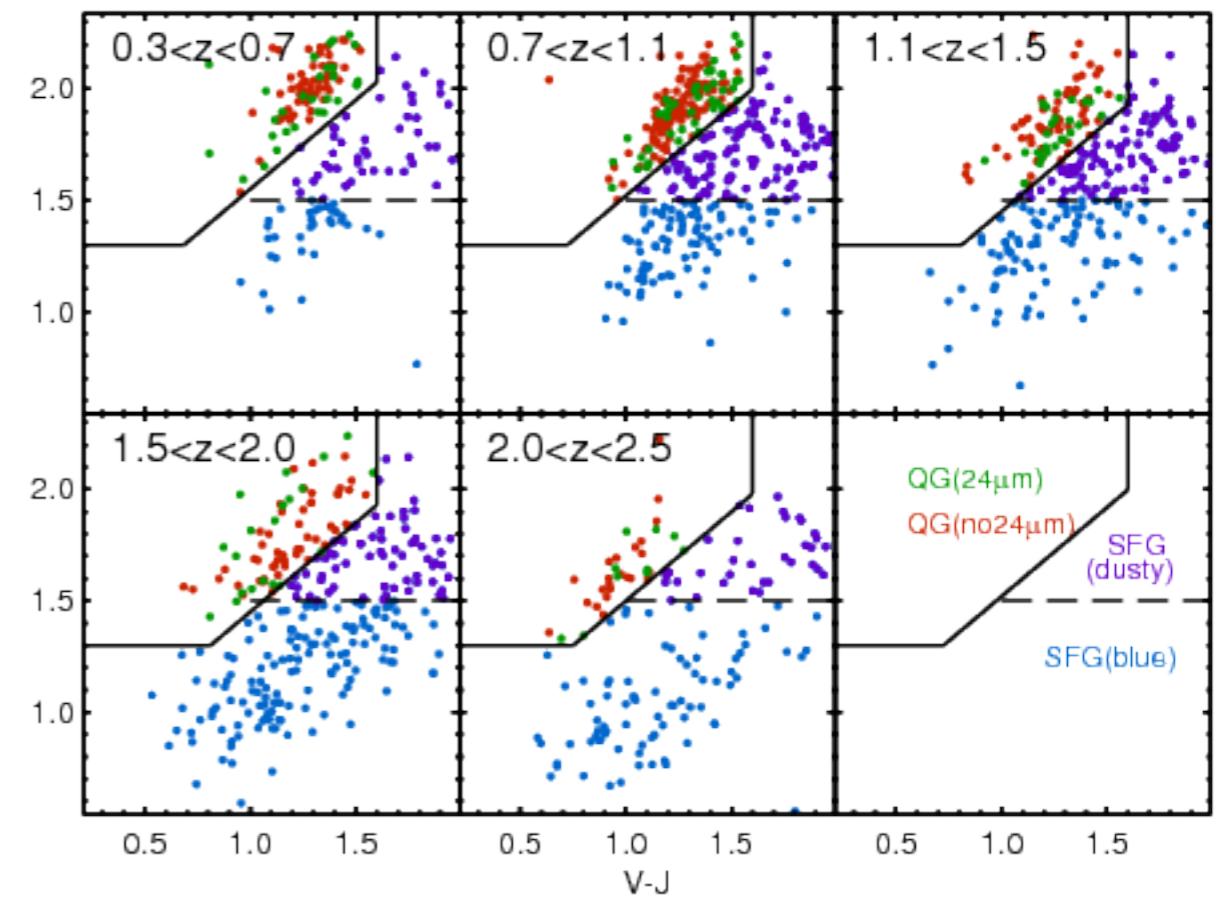
- **Inputs (exponential tau model)**
  - Fit with tau templates
  - SEDs with different taus and ages
  - No dust
  - Solar metallicity
  - 1% photometric error
- **Outputs**
  - Age, stellar mass, sSFR are relatively good
  - Tau with large scatter

$$C_{\text{sed}} = 0.82(U-V) - 0.57(V-J)$$

↓ UVJ tracks of different exponential models



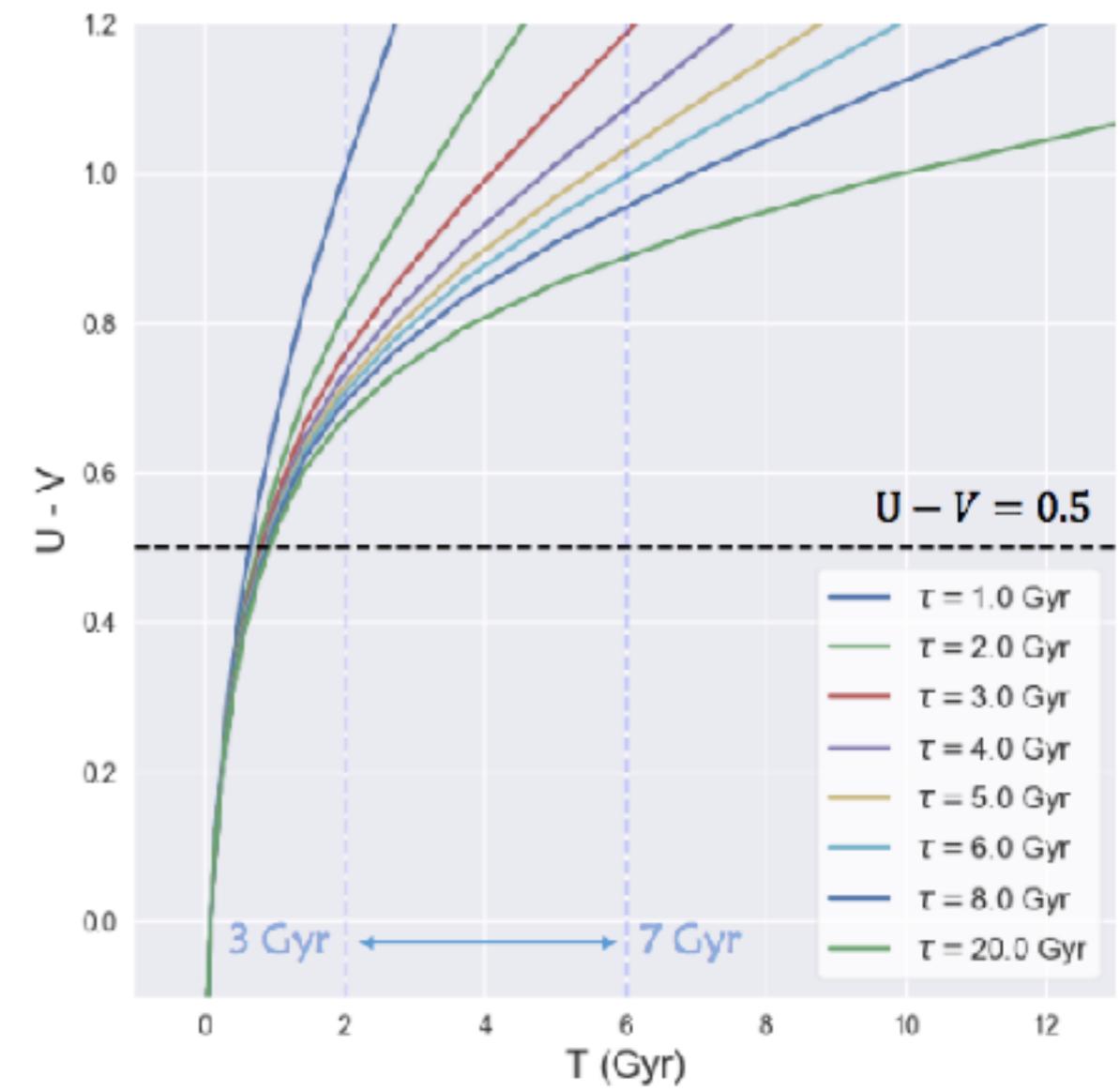
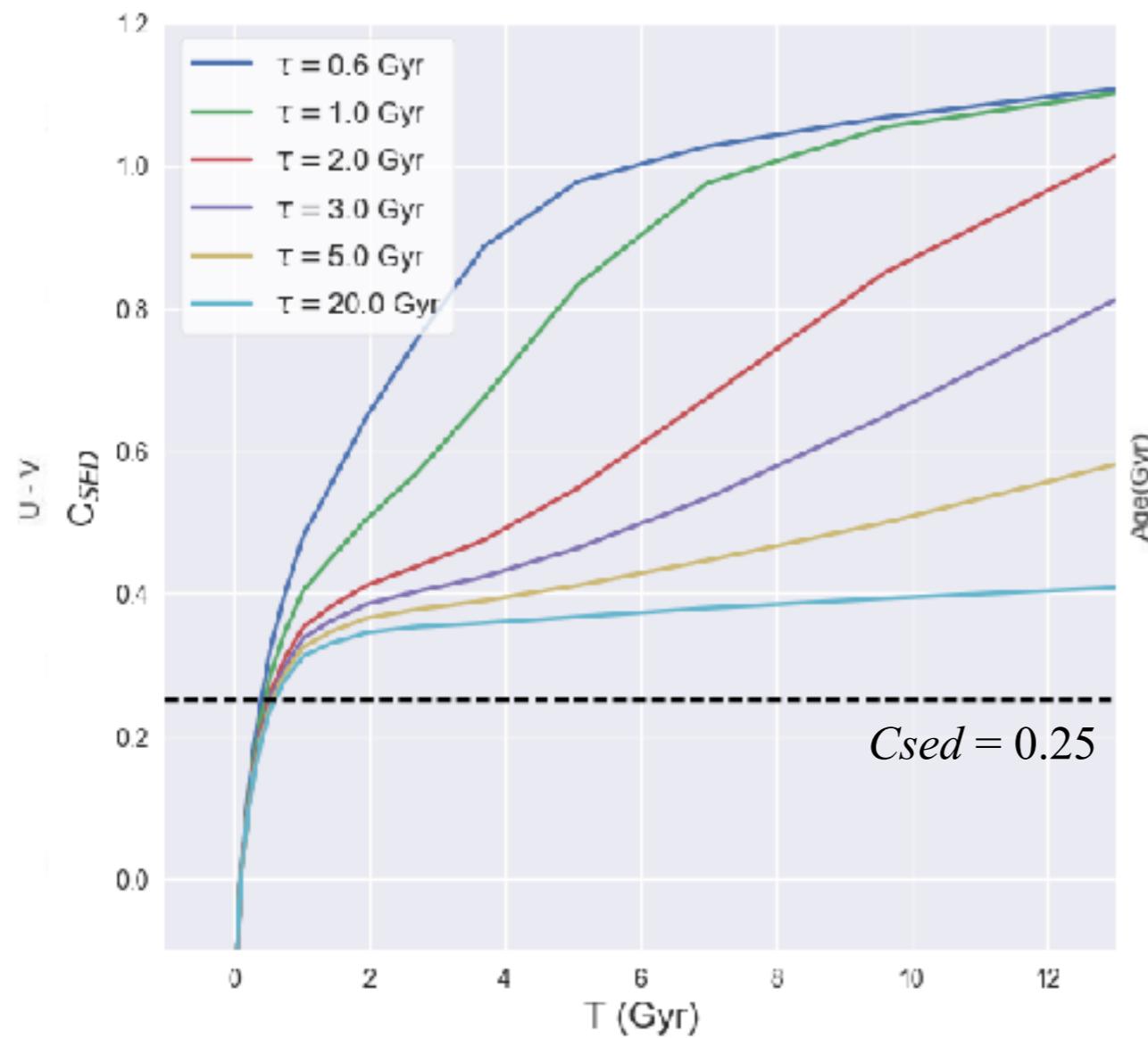
(Fumagalli+ 2014)



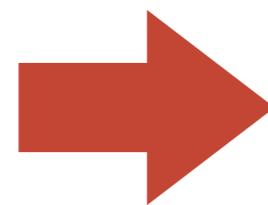
↑ U-V evolution of different exponential models

$$C_{\text{sed}} = 0.82(U-V) - 0.57(V-J)$$

↓  $C_{\text{sed}}$  evolution of different exponential models

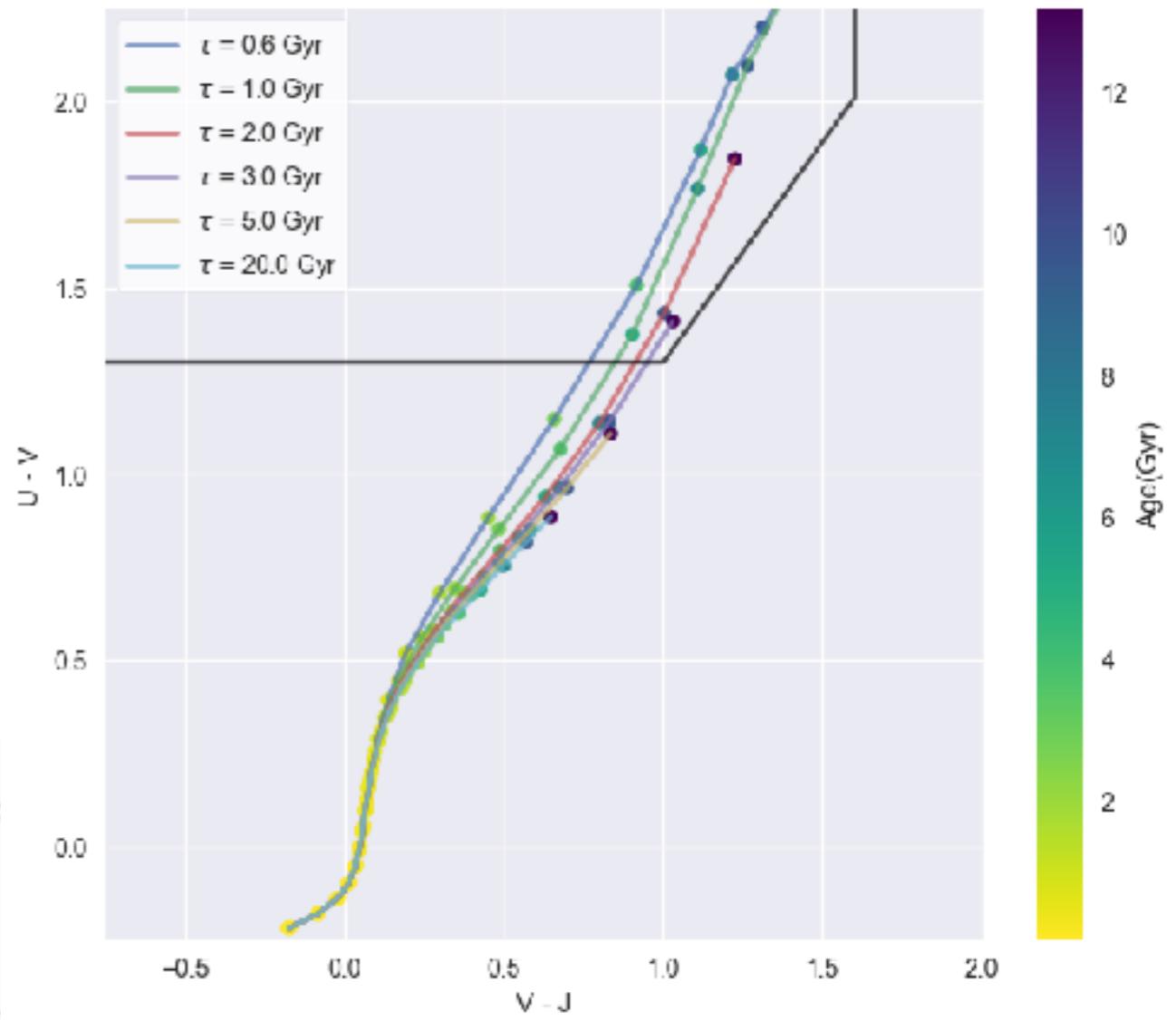
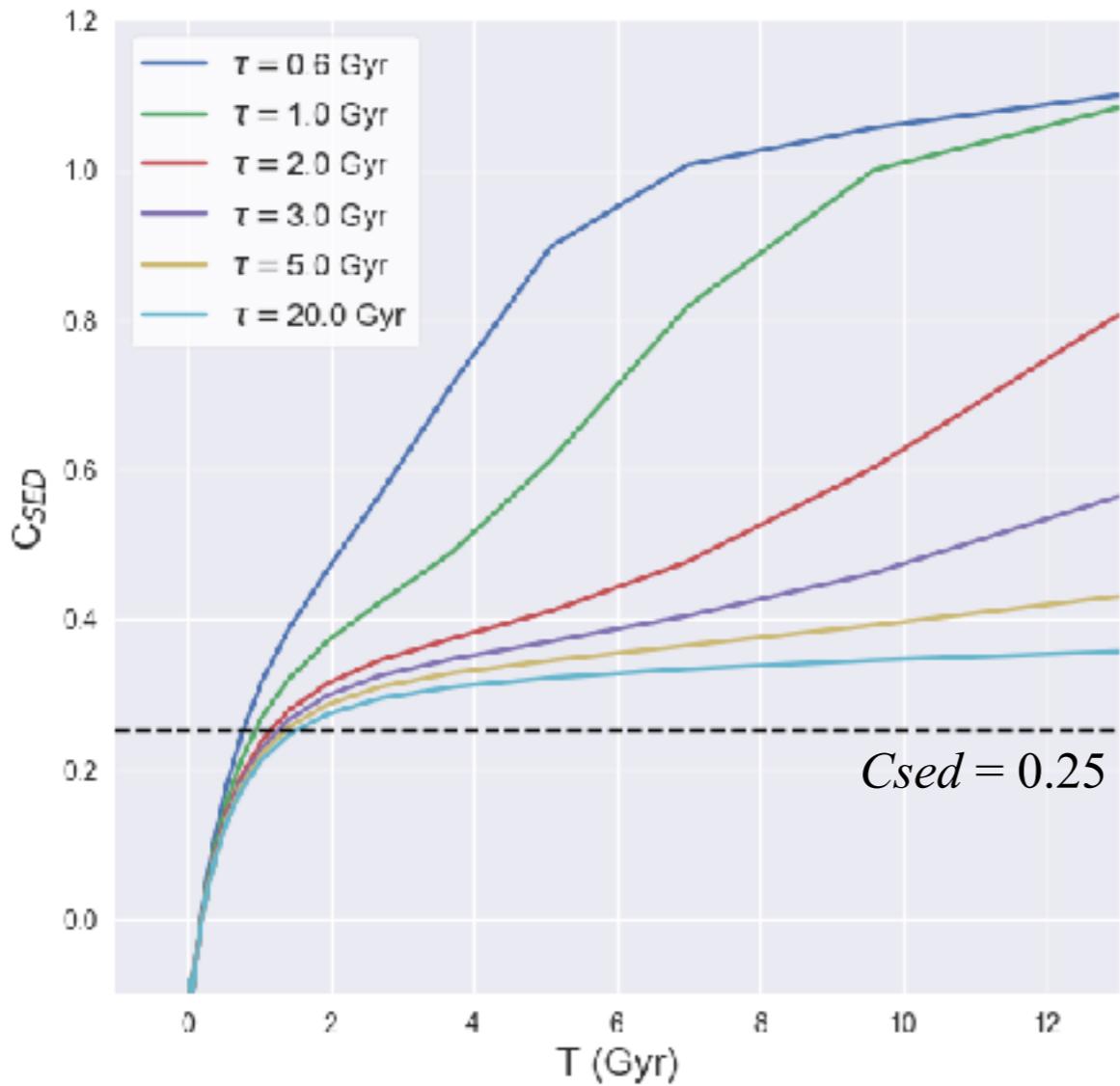


↑  $U-V$  evolution of different exponential models

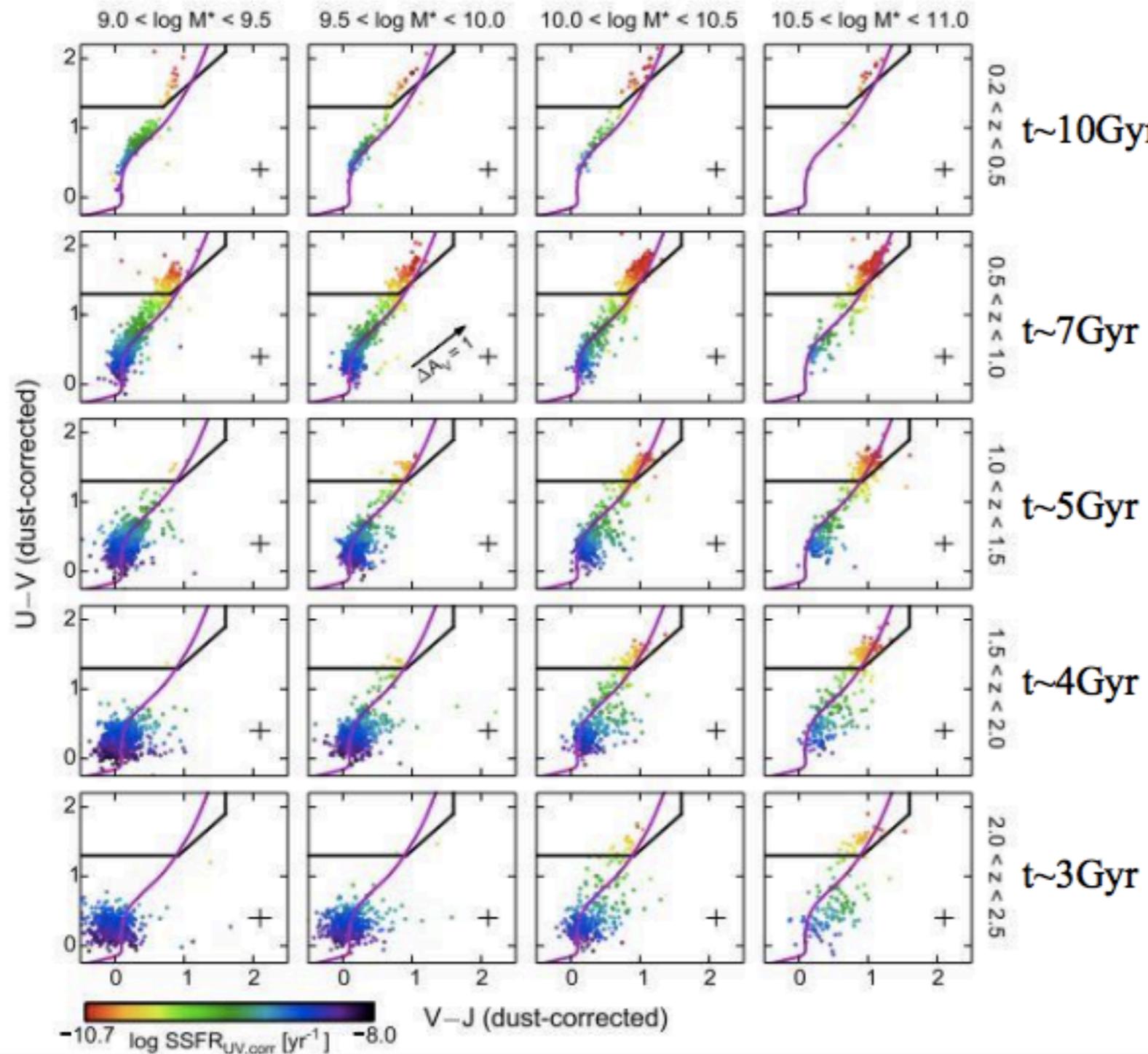


Galaxies following Tau models  
faded rapidly within 1 Gyr

What if  
Delayed models?

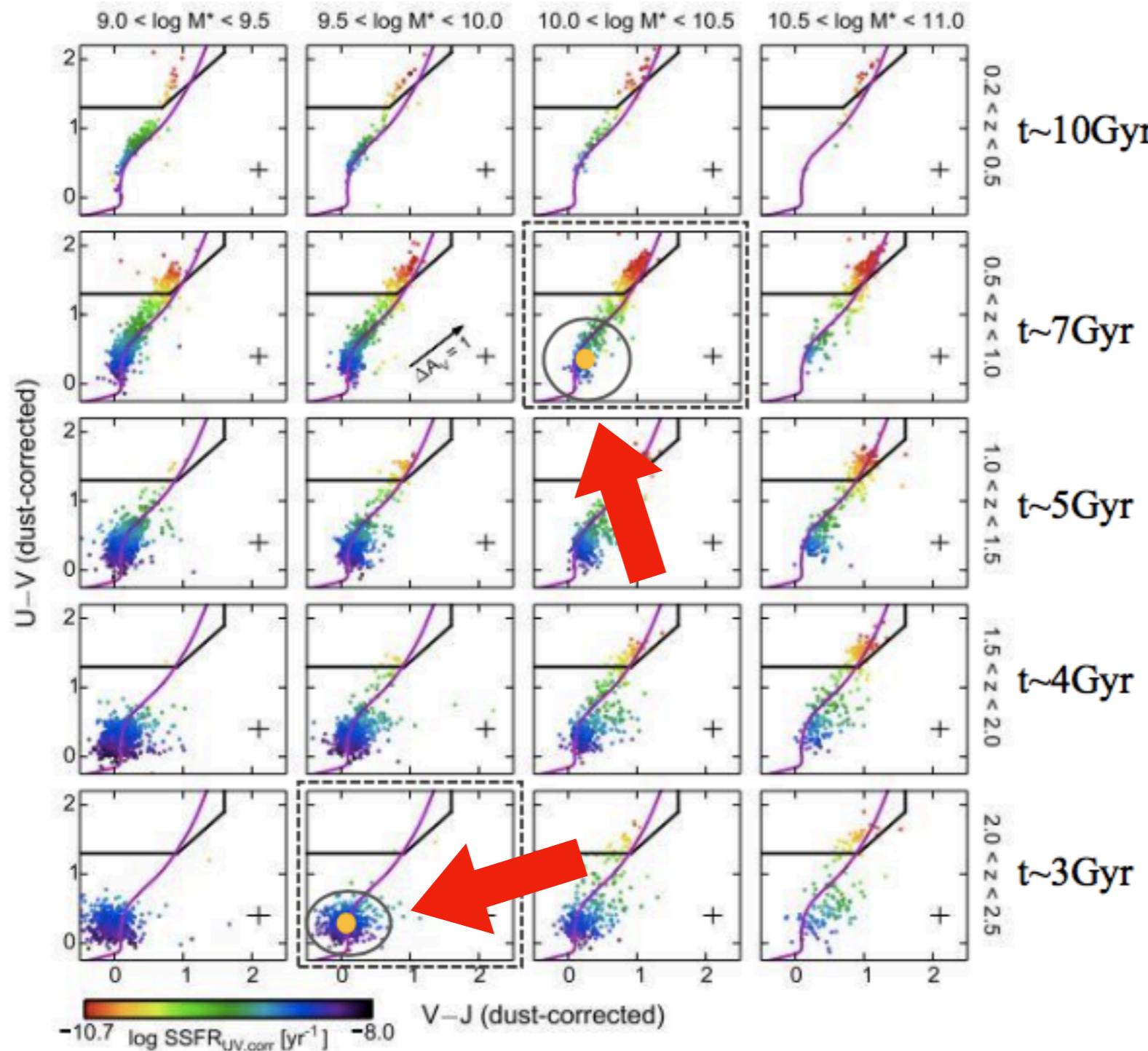


Delayed models  
faded within  
2 Gyrs as well



- It seems that CANDELS data do follow the tau model UVJ track.
- **BUT** a large group of strong SFGs survive until 7 Gyrs.

(Fang+2017) CANDELS data with different  $M^*$  and  $z$  bins

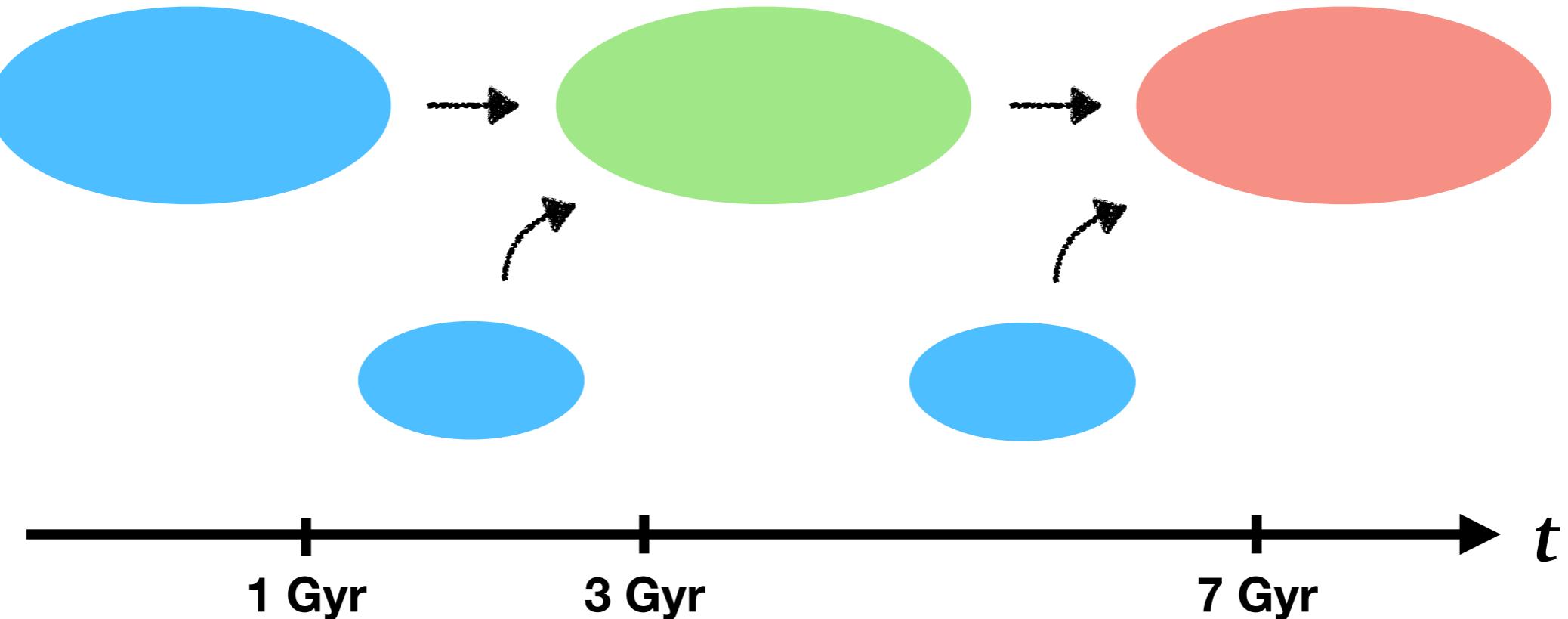


(Fang+2017) CANDELS data with different  $M^*$  and  $z$  bins

- It seems that CANDELS data do follow the tau model UVJ track.
- **BUT** a large group of strong SFGs survive until 7 Gyrs.

*Real Galaxies stay blue longer than what classic models predict.*

*Classical SFHs cannot well match the color evolution of galaxies.*



Up-till-now it cannot reject such (although unrealistic) explanation:

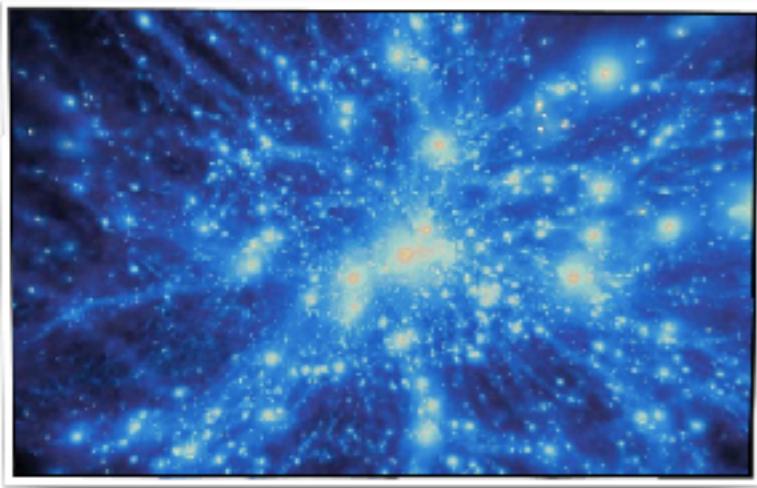
**Galaxies continuously born over a time span  $> 4$  Gyr**

However we are now helped by having actual evolution tracks based on **Abundance Matching**.

Abundance Matching would tell us: most galaxies seen at  $z \sim 2$  are going to become their descendants at later times.

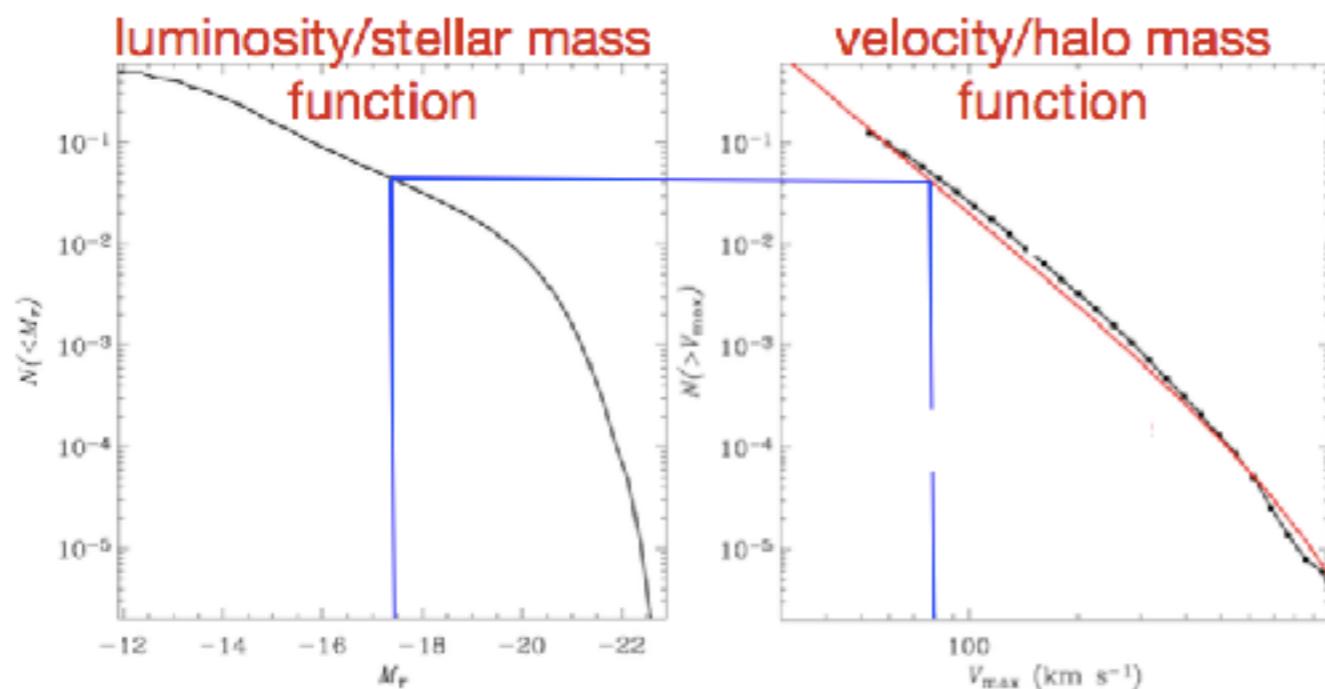
# Galaxy-Halo Connection

Fundamental to Understand Galaxy Evolution

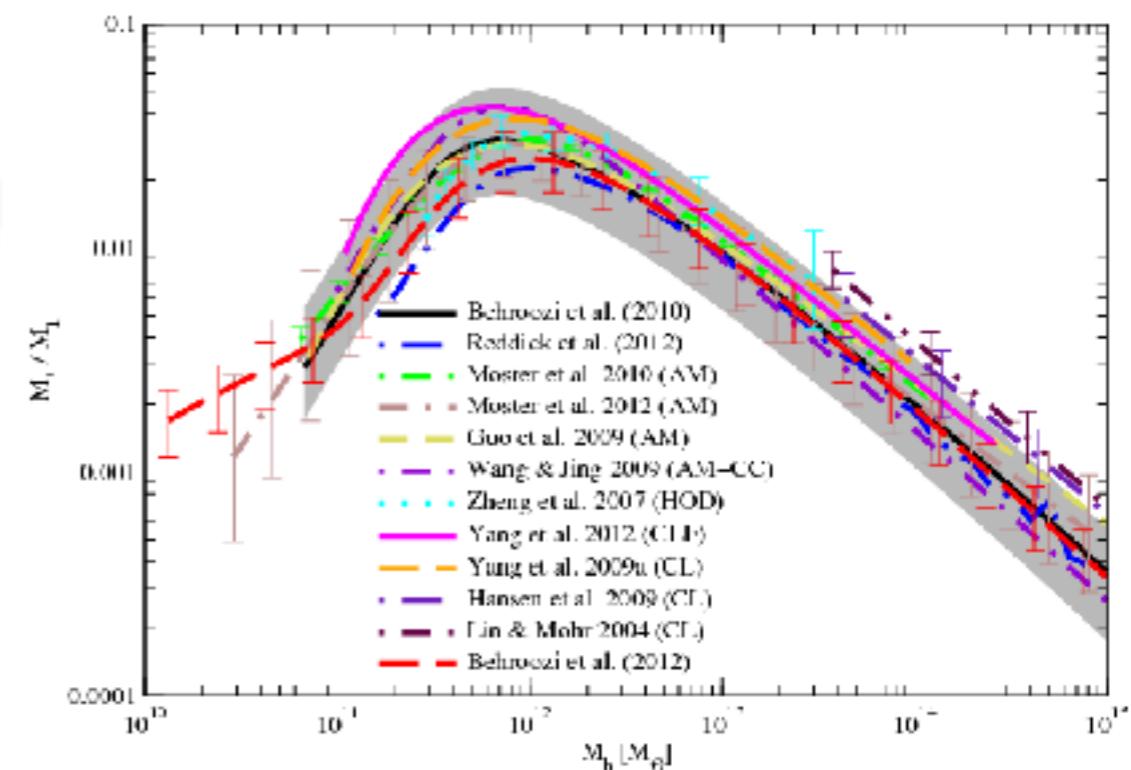


Bolshoi Simulation:  
Klypin, Trujillo-Gomez & Primack 2011

(from Aldo Rodriguez-Puebla's talk)

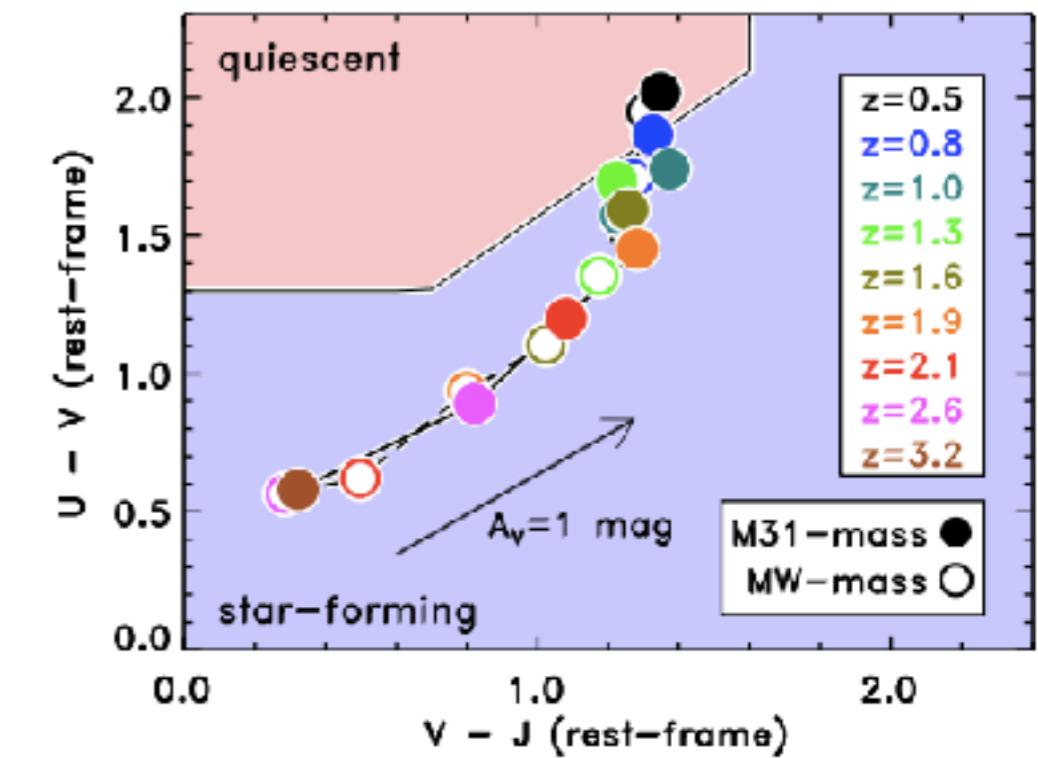
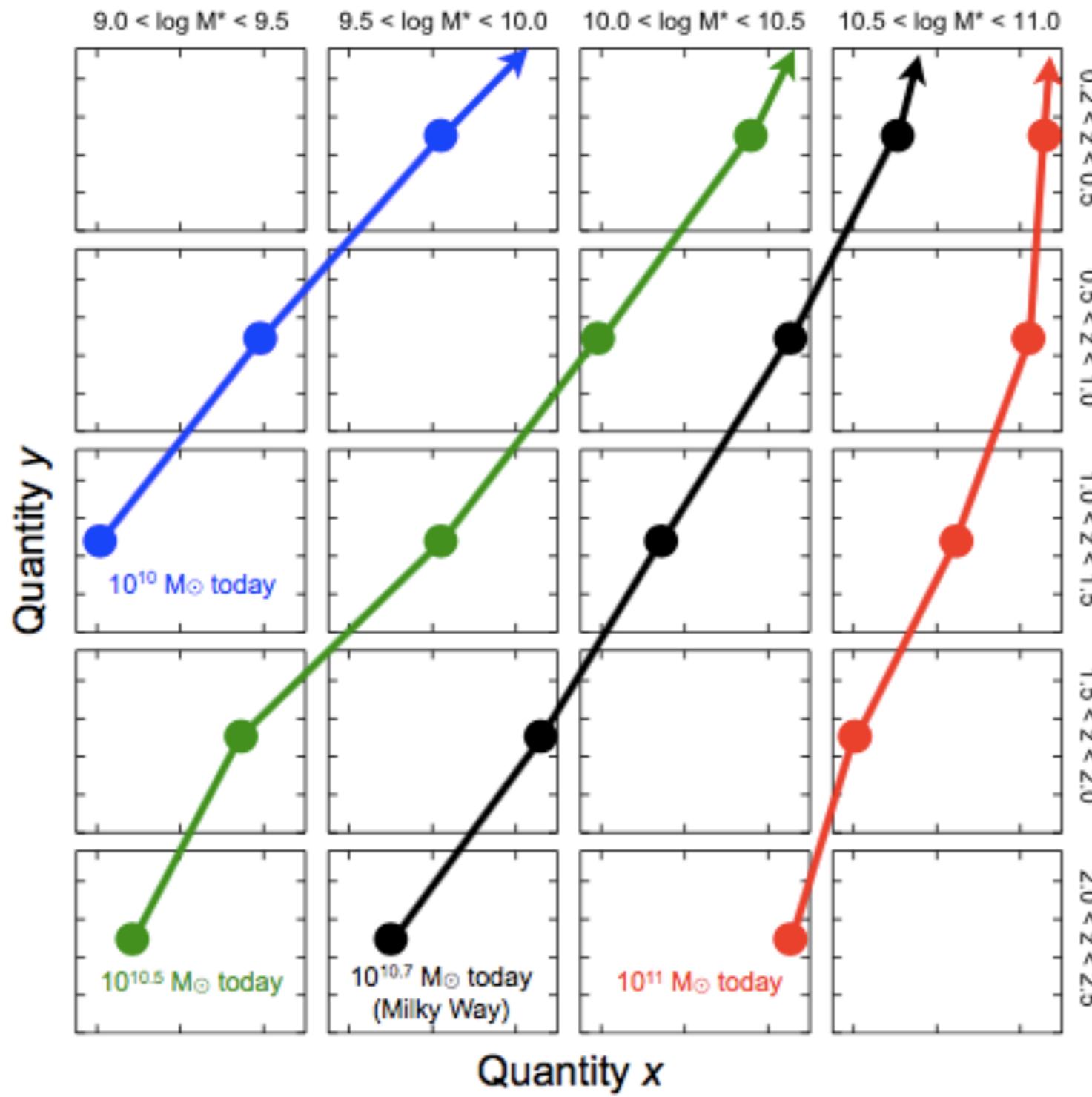


■ Abundance Matching: connecting galaxy property to halo property



Stellar-to-Halo Mass Relation  
(Behroozi+2013)

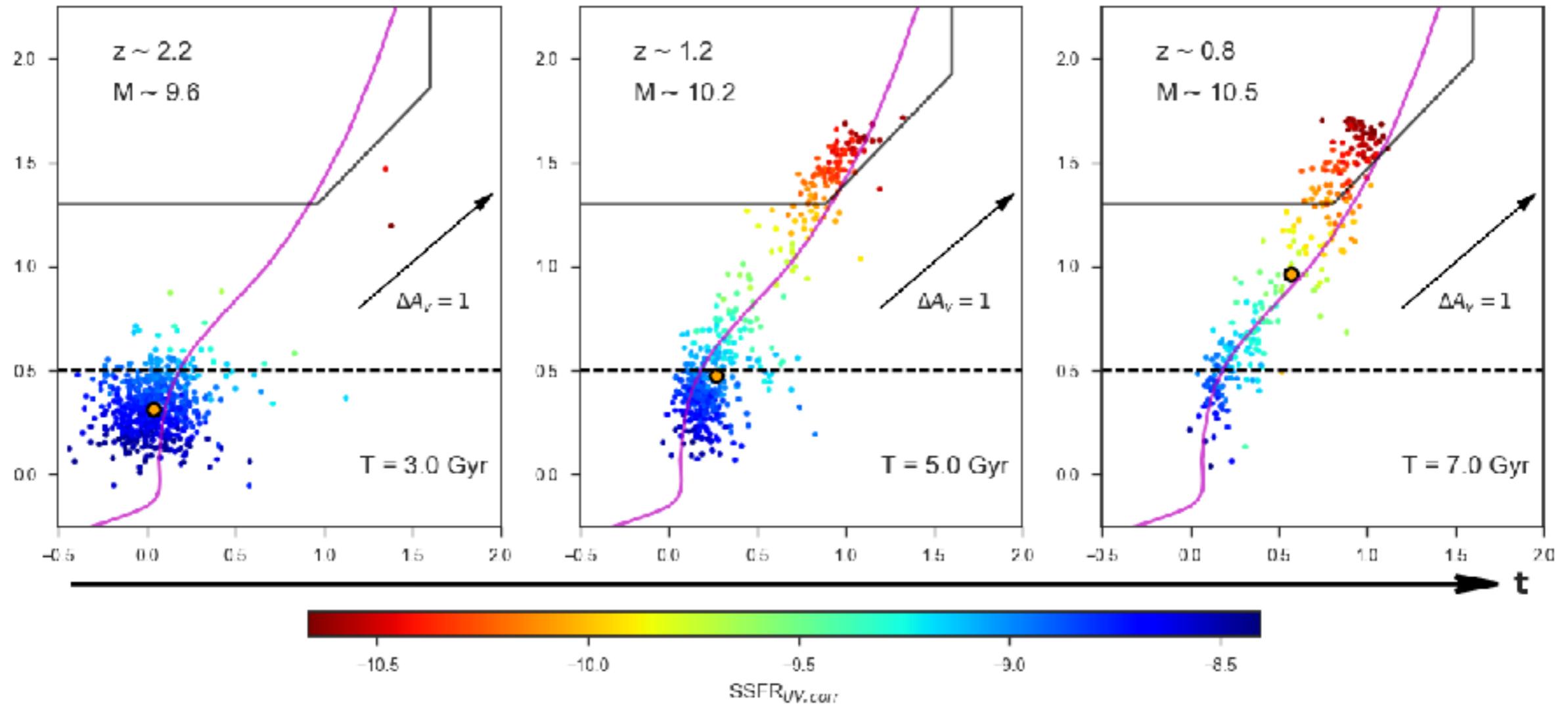
Abundance Matching Techniques  
(from Welcher's talk)



(Papovich+2015) UVJ evolution of MW  
& M31 Mass progenitors

(Fang+2017) Growth tracks for galaxy progenitors today

### Evolution of UVJ for MW-mass progenitors



1. Galaxies were evolving along the evolutionary tracks, turning from **blue star-forming**, up through the **green valley (GV)**, into **red quiescent** galaxies.
2. It takes **>4 Gyr** for **MW progenitors** to evolve from the bluest end of the star-forming population into the **GV**, crossing a characteristic **critical color, 0.5**

**'Age-color' Problem: invalidity of classical SFH models to explain color evolution**

### 3. Solutions to the 'Age-color' Problem based on SED-fitting Tests

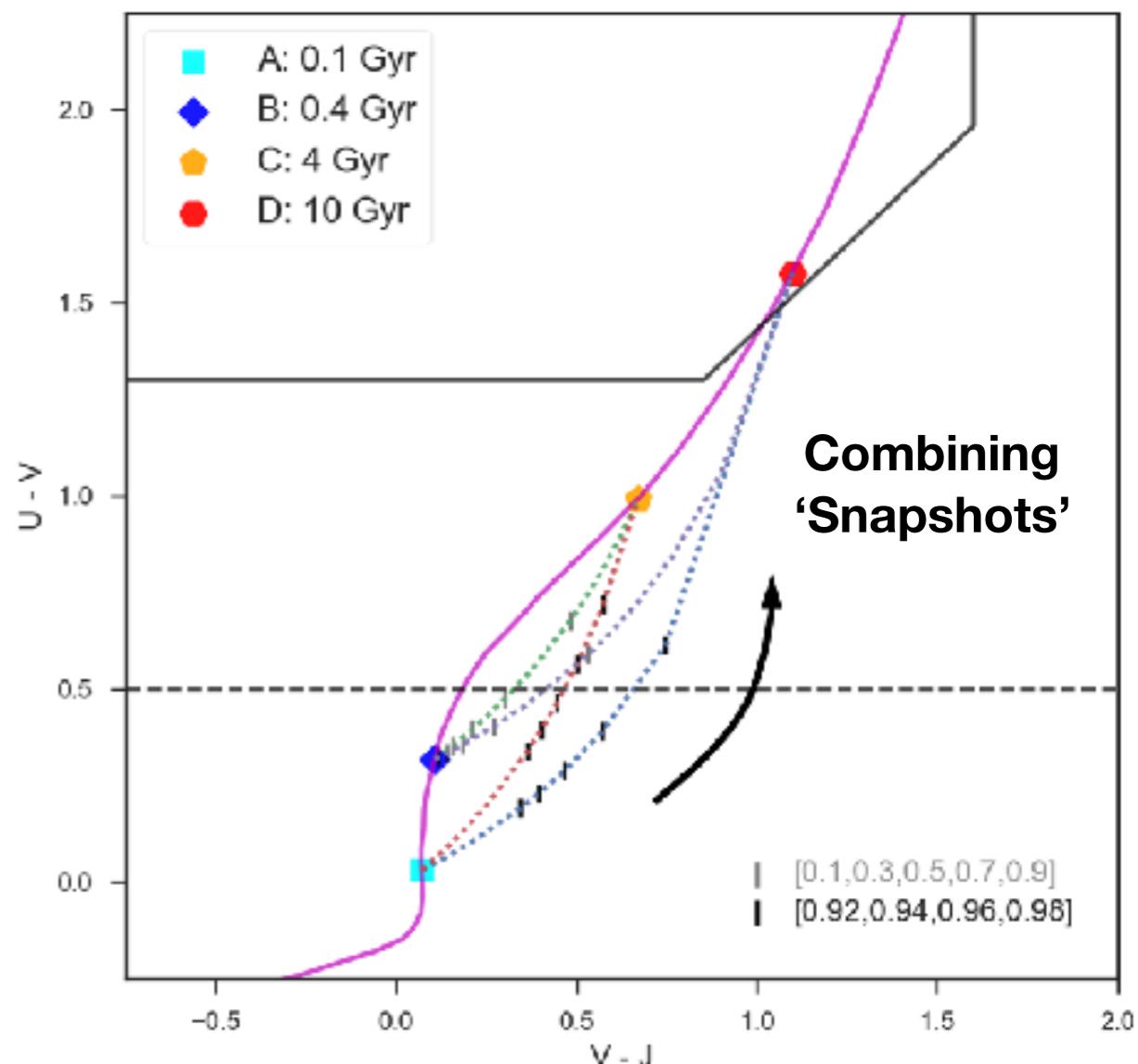
#### 3.1 Approach I : A Frosting of Young Stars

A small fraction of newly born very young stars is likely to keep galaxies blue.

We will construct such populations, which are mixes of old and young populations— we call them "**composite (tau) models**"

To simplify, consider a combination of two SSP:

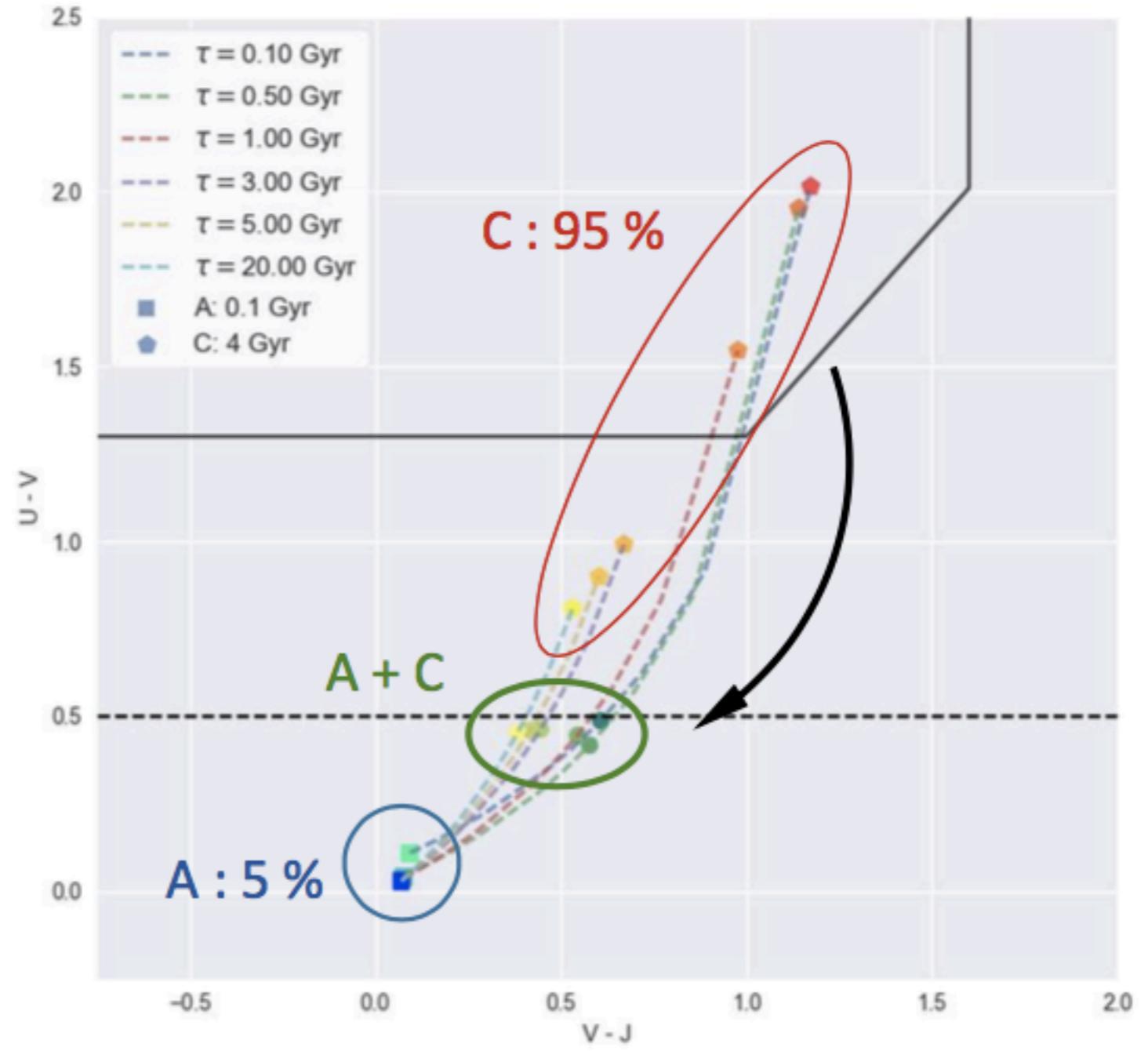
- an **old evolved population** across the GV
- a **newly- born group** of very blue stars
  - Old pop: 4/10 Gyr (above critical color)
  - Young pop: 0.1/0.4 Gyr (below critical color)
  - Mass weighted fraction from 0 to 1
  - Both following exponential SFHs



-What fraction of the blue population do we need to keep galaxies blue?

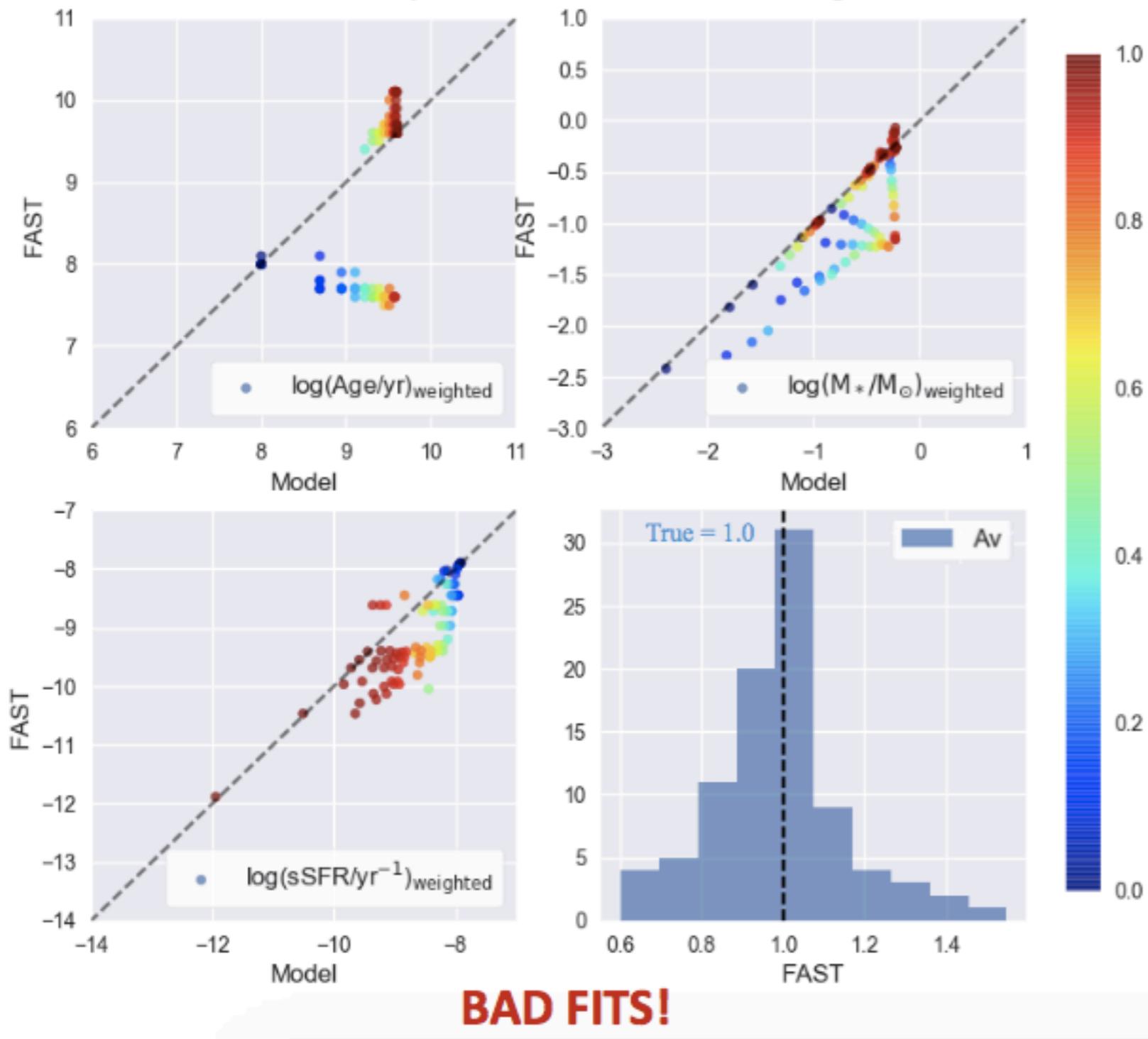
-Does FAST (when assuming classic templates) return correct values when applied to these models?

(A physical interpretation could be another burst happened *just before* we observe, e.g. *minor major*)



**Given a certain fraction  
of young stars, galaxies  
could be blue again.**

Composite Tau A+C vs FAST Fitting



**Q :** Can FAST figure out these composite models and return reasonable results?

- **No.** FAST returns bad values for these composite stellar populations assuming tau / delayed templates.

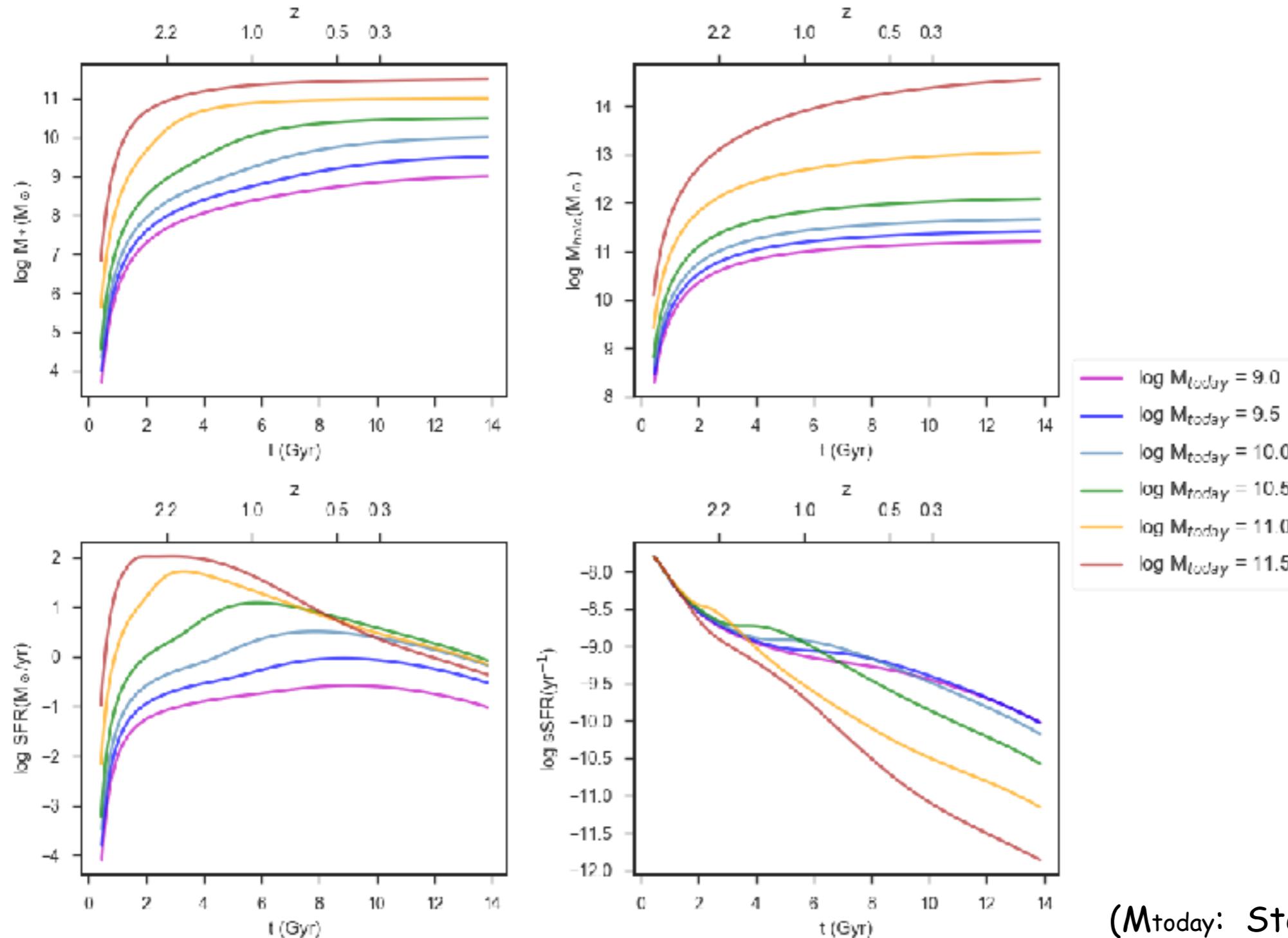


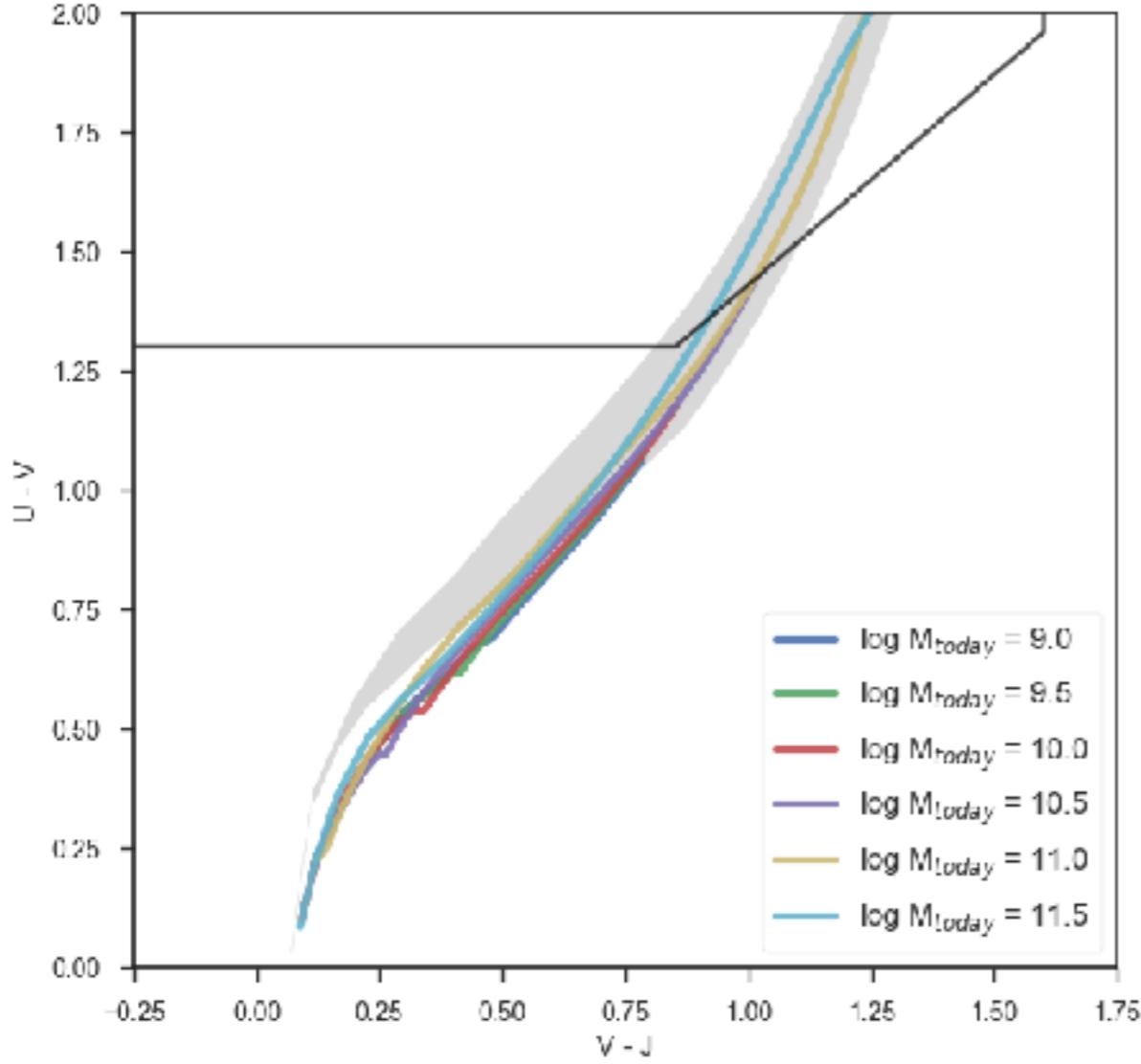
**Need more realistic SFHs!**

**Furthermore, It is not plausible that *most* galaxies at late epochs have stayed blue via this mechanism.**

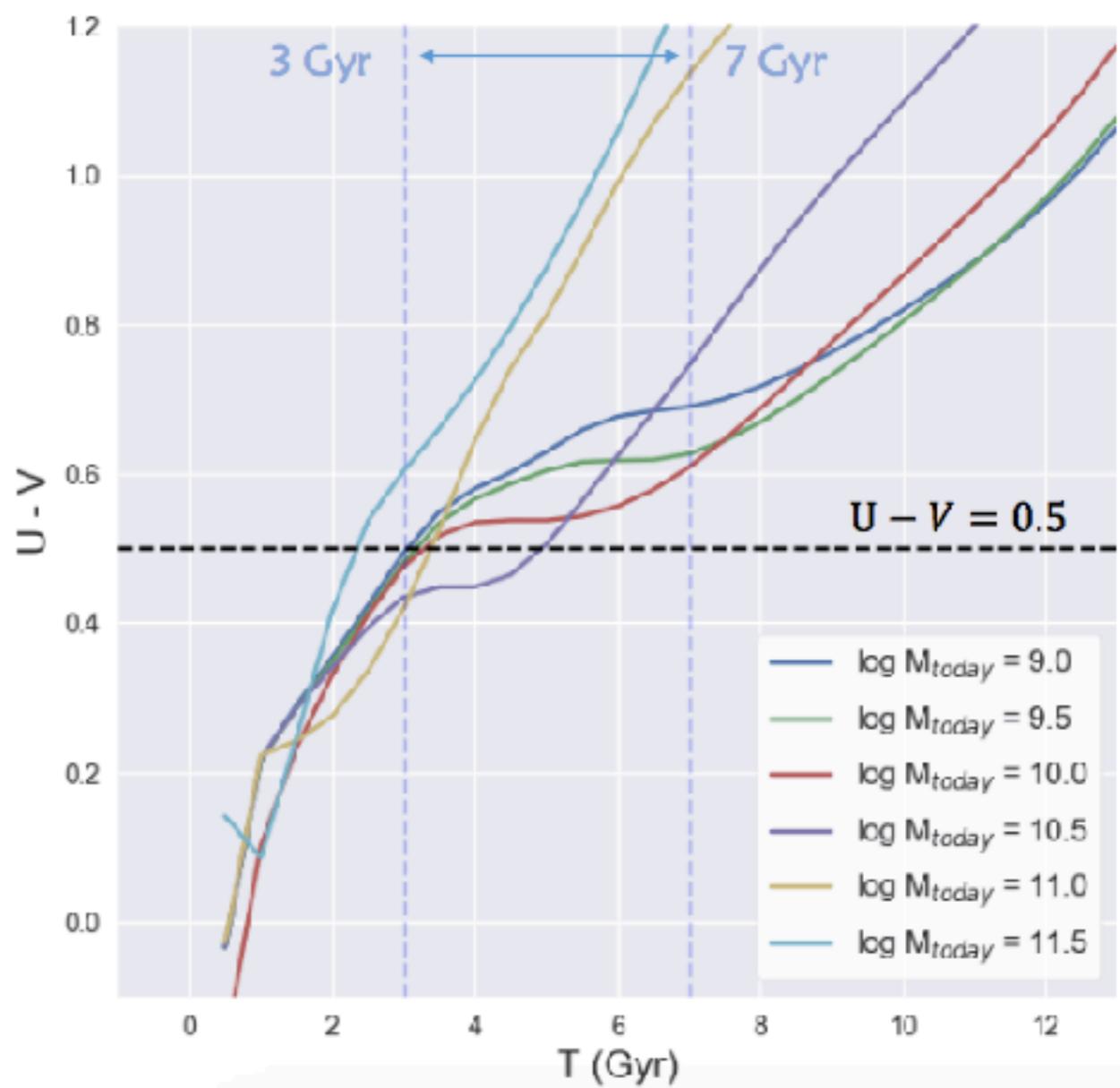
### 3.2 Approach II : Abundance Matching Derived SFH (AM-SFH)

- Use more realistic SFH derived from abundance matching (Rodriguez-Puebla et al. 2017)
- Put them into BC03 and compute their UVJ tracks;
- Compare with tracks of tau / delayed models.





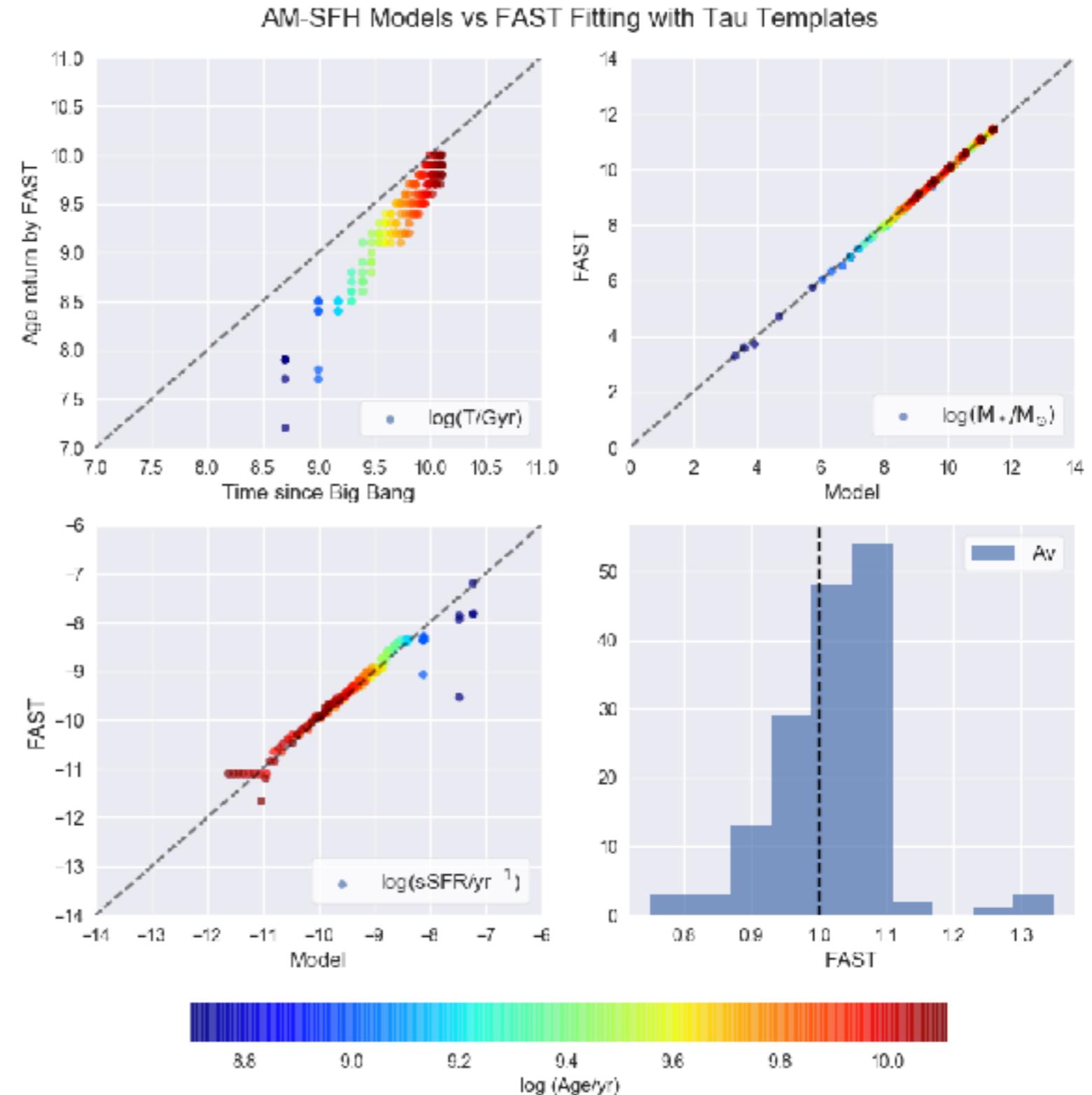
Residence Time at the blue stage for AM-SFH models are much longer than Tau models



Q: Can FAST return the correct values of physical parameters for these AM-SFHs?

- Yes. FAST gives rather good estimates assuming Tau (Delayed) templates!

All Previous Results are not **GARBAGE**  
— We are **SAFE**!



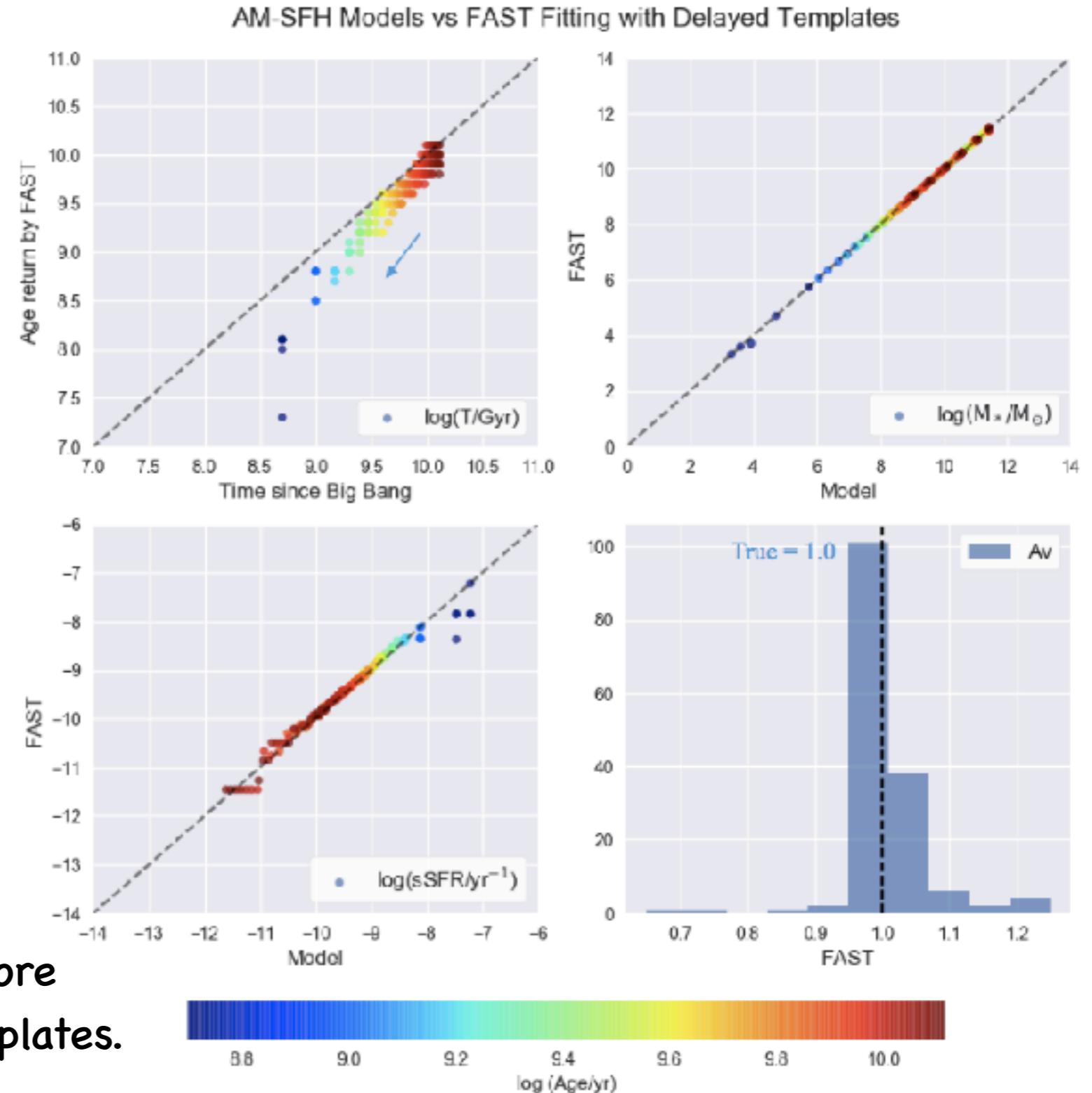
Even with oversimplified assumptions of unrealistic Tau / Delayed models, we can still retrieve the values of  $M^*$ , SSFR and Av of galaxies following realistic SFHs.

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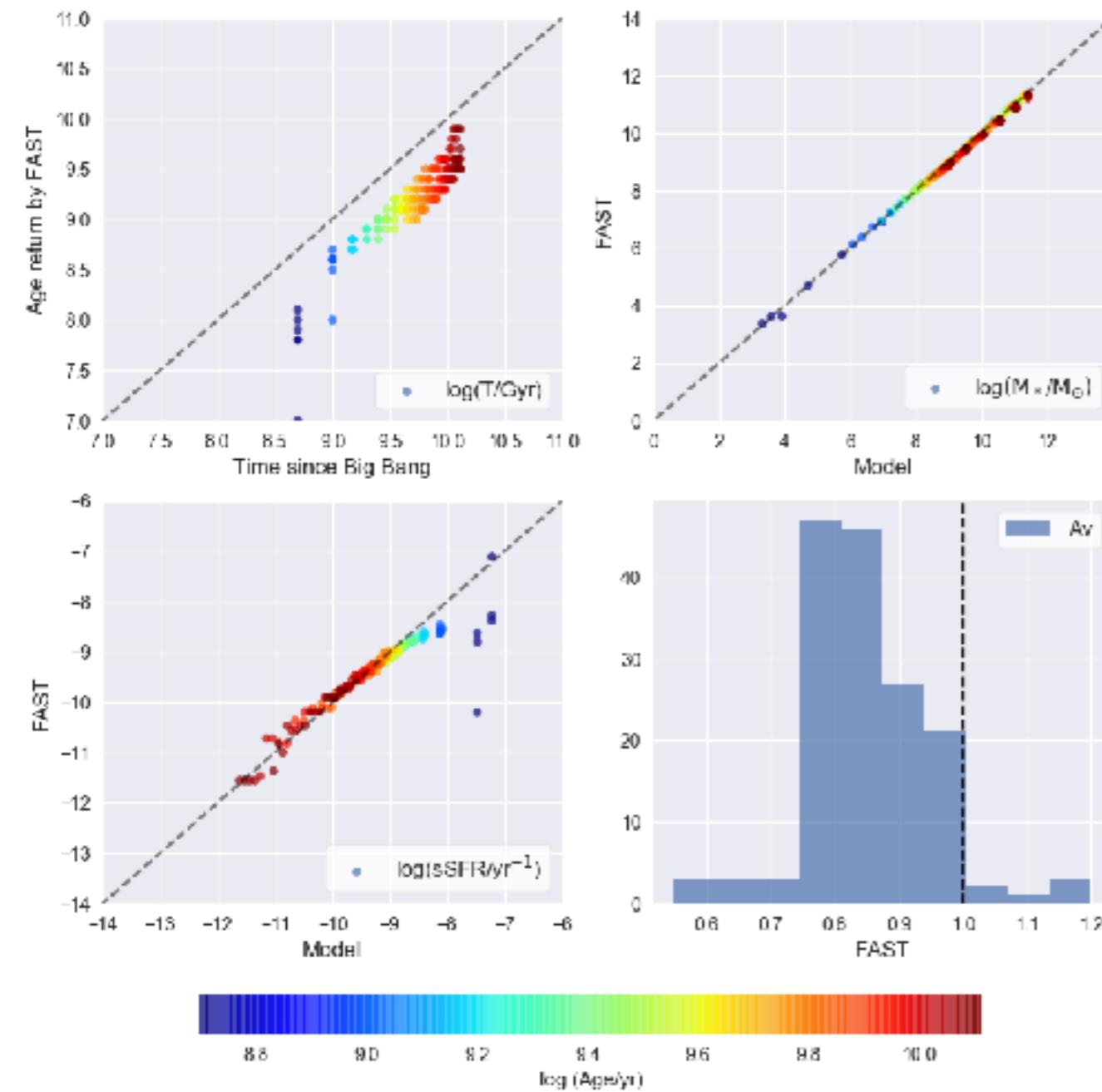
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- Derivation of parameters is more precise when using delayed templates.



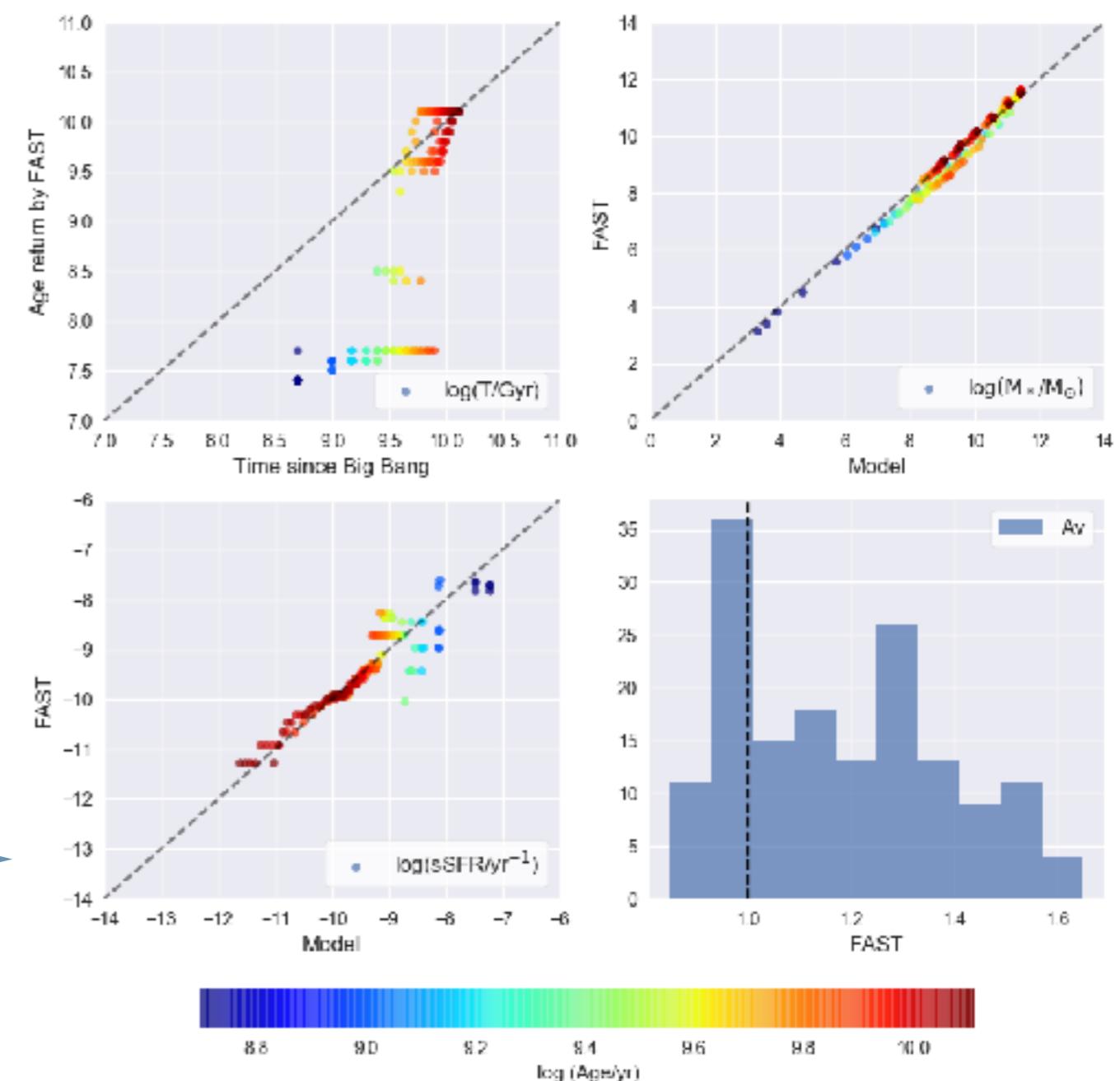
Even with oversimplified assumptions of unrealistic Tau / Delayed models, we can still retrieve the values of  $M^*$ , SSFR and  $Av$  of galaxies following realistic SFHs.

AM-SFH Models vs FAST Fitting with Tau Templates



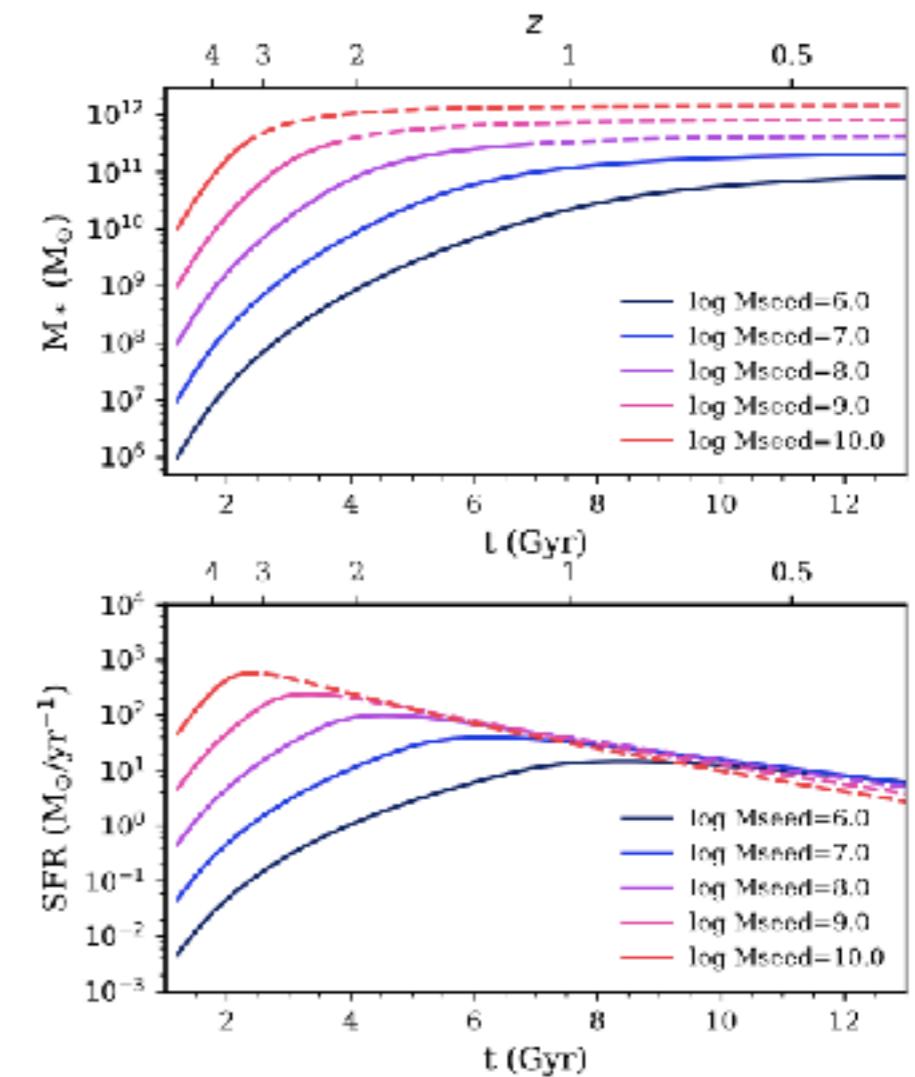
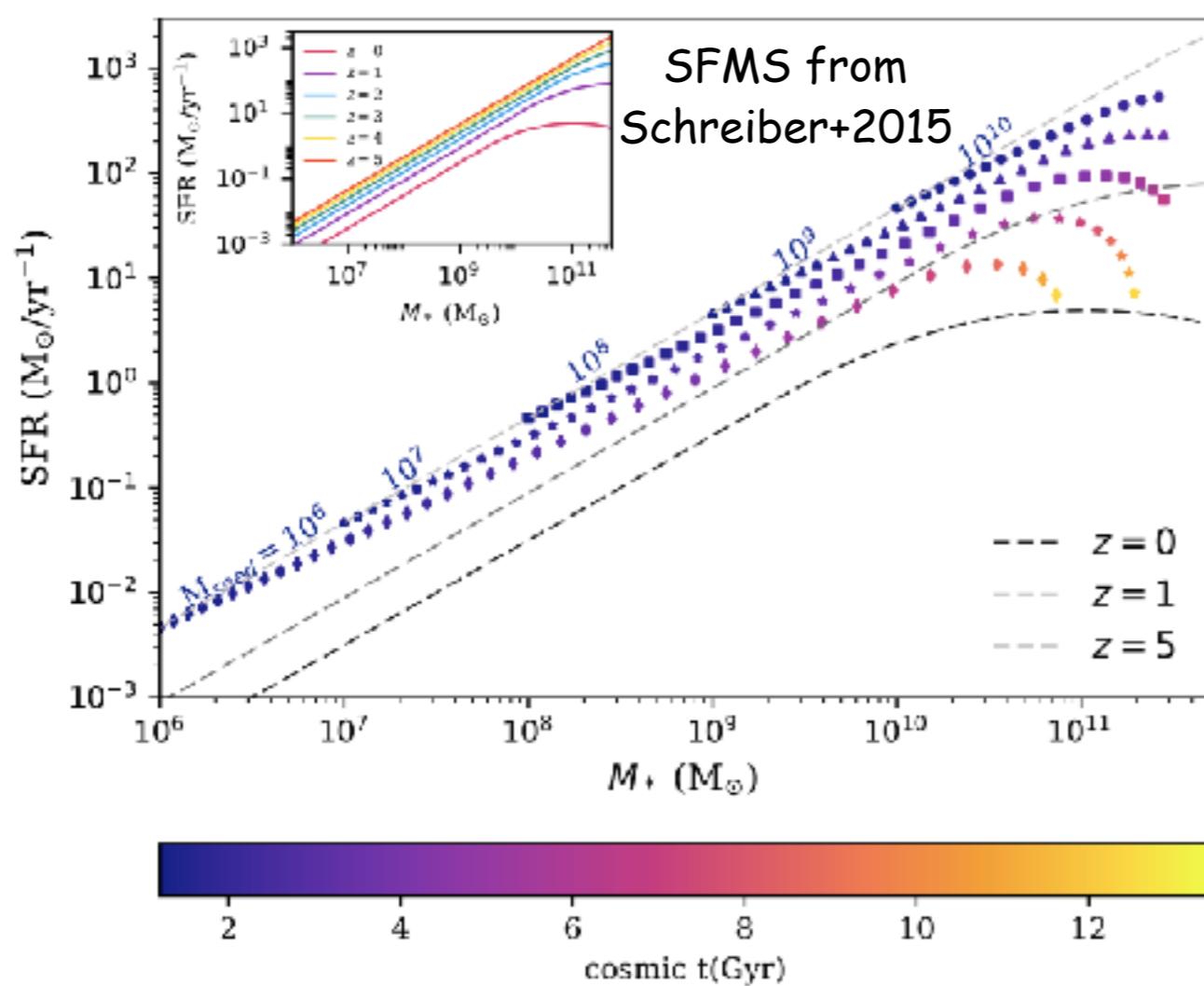
# Sub-solar Metallicity ( $0.5 Z_{\odot}$ ): Under-estimate Av Accurate Stellar Mass

AM-SFH Models vs FAST Fitting with Tau Templates



Super-solar Metallicity ( $2 Z_{\odot}$ ):  
Over-estimate Av  
Larger Scatter in Stellar Mass

### 3.3 Approach III : Main Sequence Derived SFH (MS-SFH)

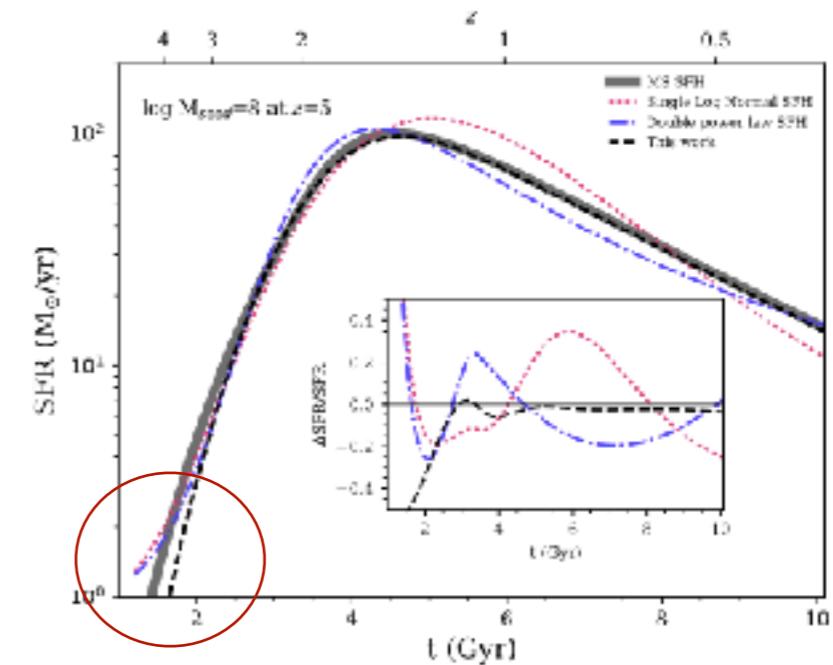


(Ciesla+2017) Evolution of Galaxies Recovered from SFMS

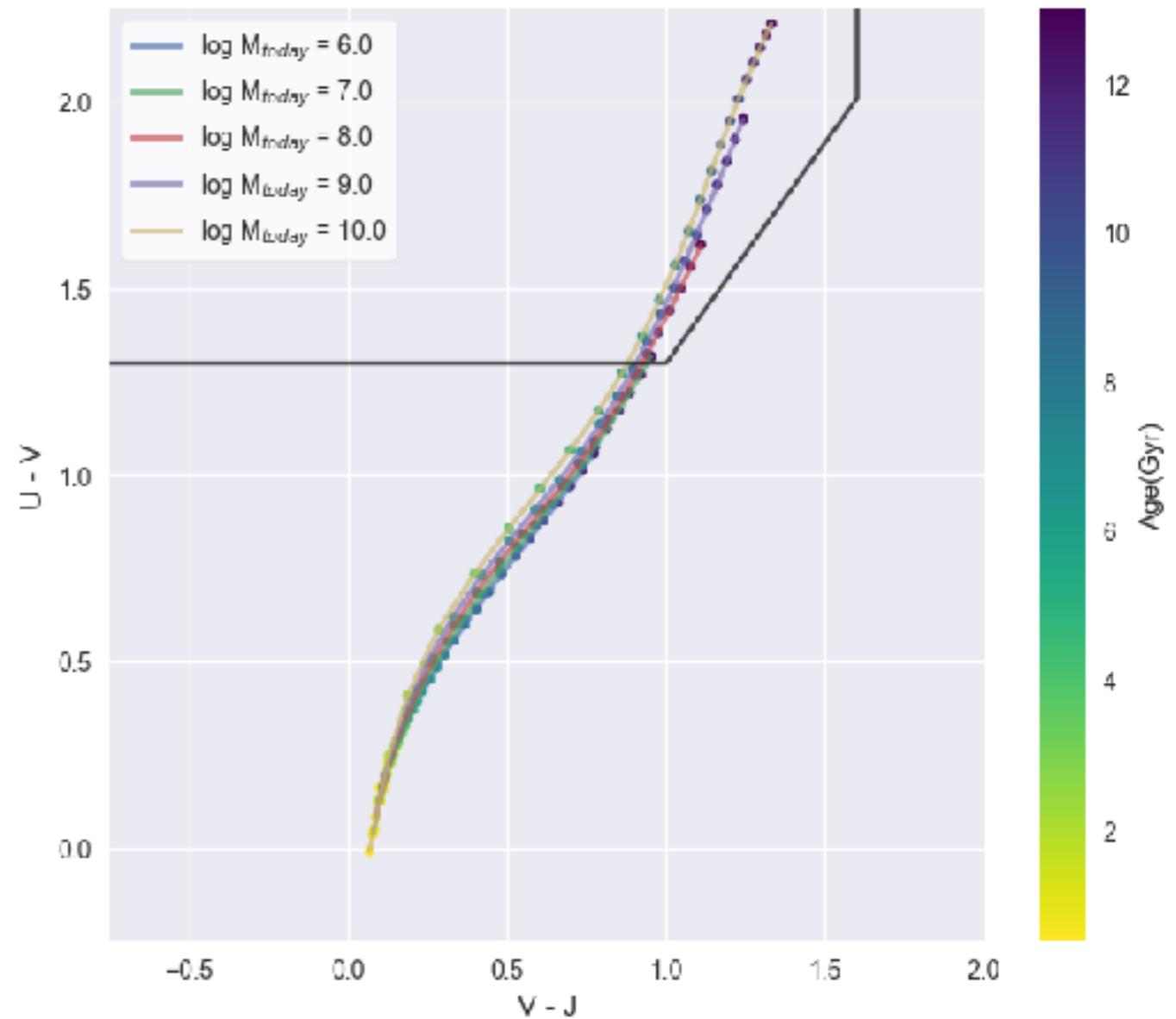
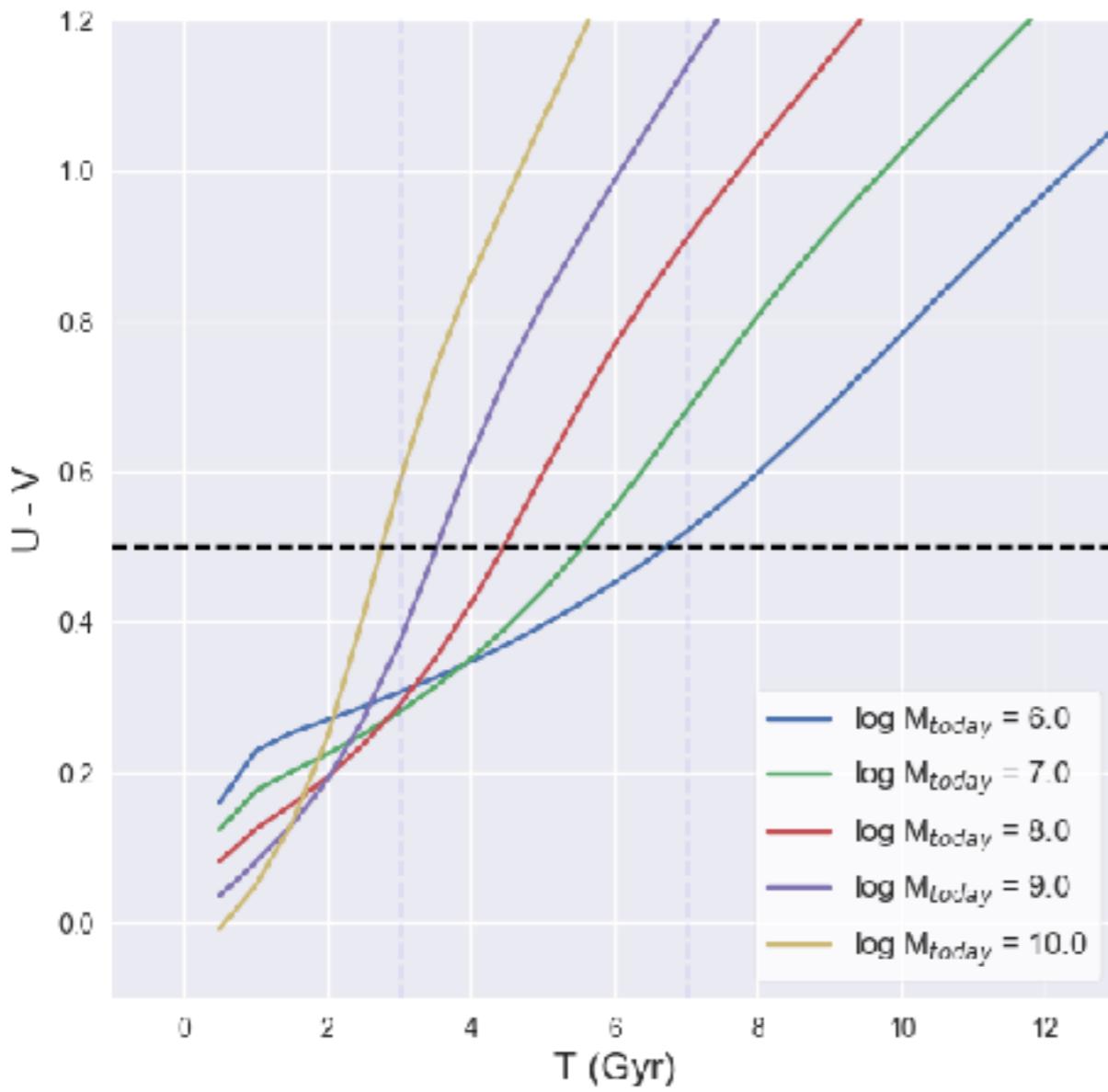
### Right Skew Peak Skewed Gaussian (RSPSG):

$$\text{SFR}(t, M_{\text{seed}}) = A \frac{\sqrt{\pi}}{2} \sigma e^{((\frac{\sigma}{2r_S})^2 - \frac{t-\mu}{r_S})} \text{erfc}\left(\frac{\sigma}{2r_S} - \frac{t-\mu}{\sigma}\right),$$

( $M_{\text{seed}}$ : Seed Mass at  $z = 5$ )



UVJ tracks of MS-SFH models  
also look like Tau/Delayed/  
AM-SFH models and converge

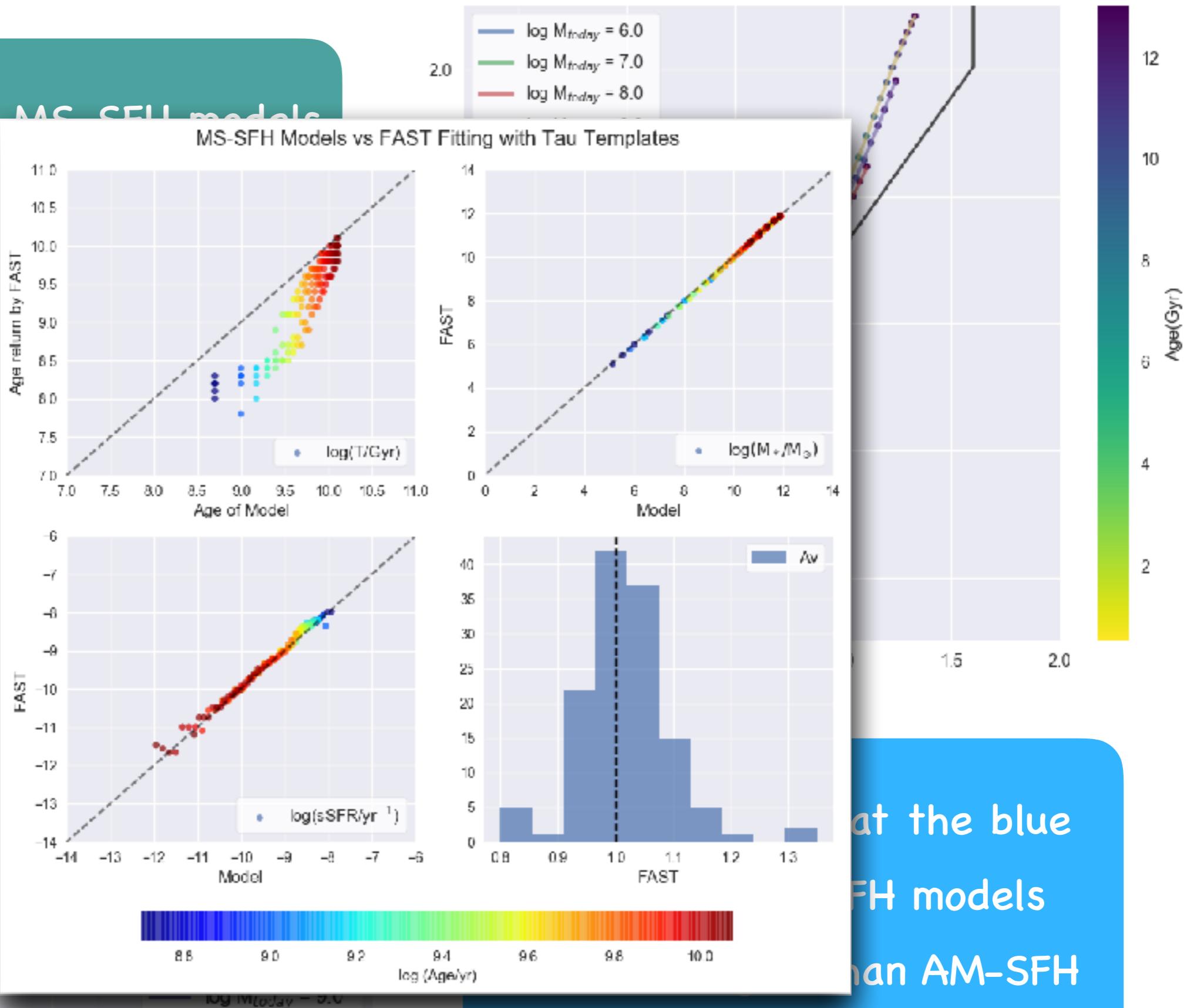
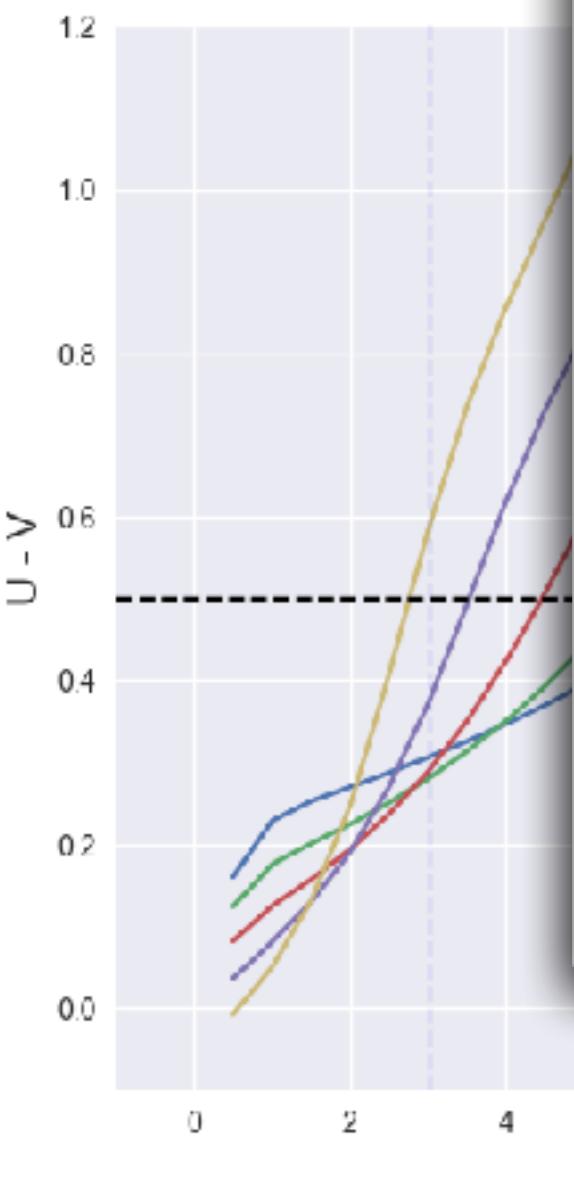


Residence Time at the blue  
stage for MS-SFH models  
extends longer than AM-SFH

UVJ tracks of MS-SFH models

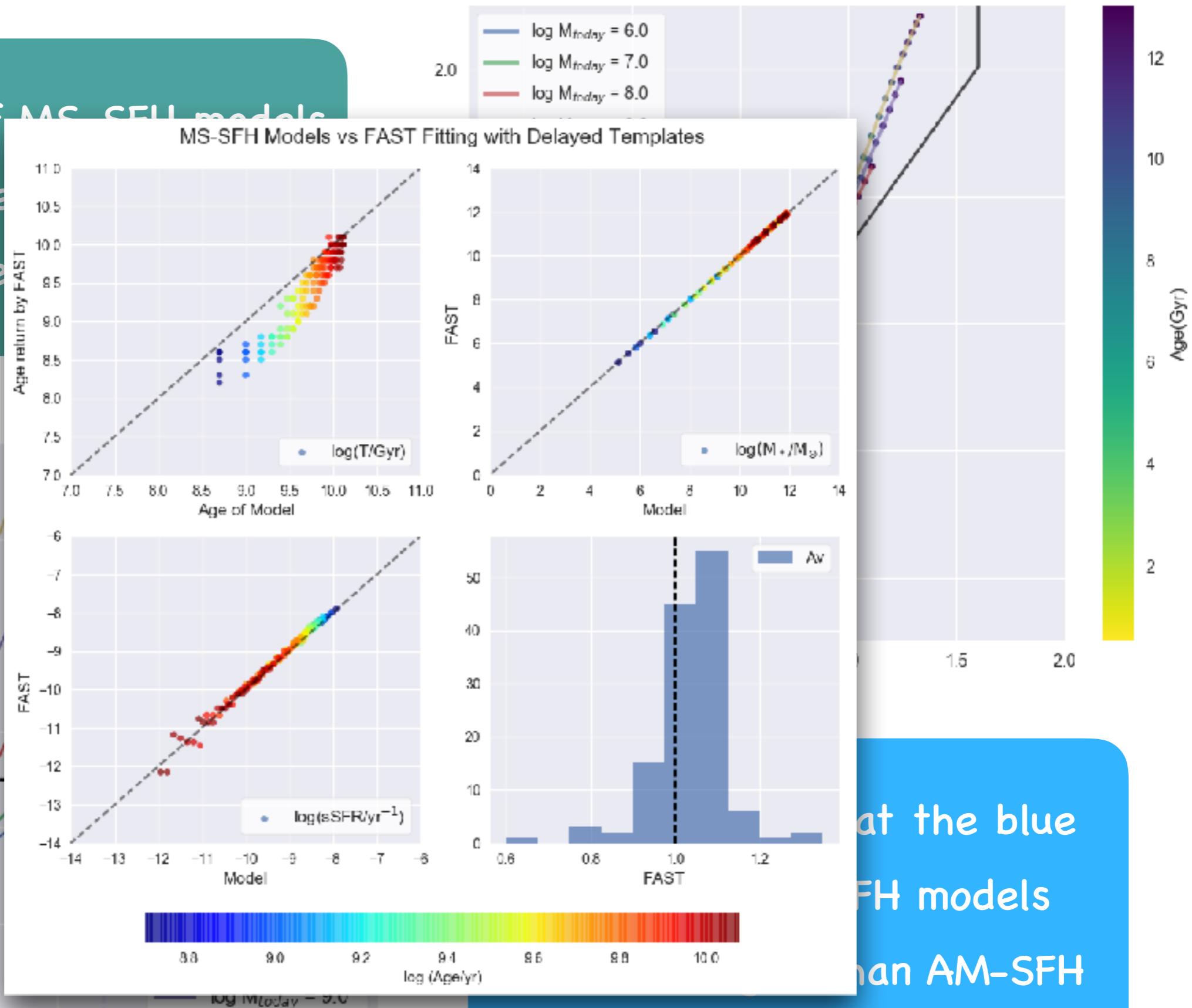
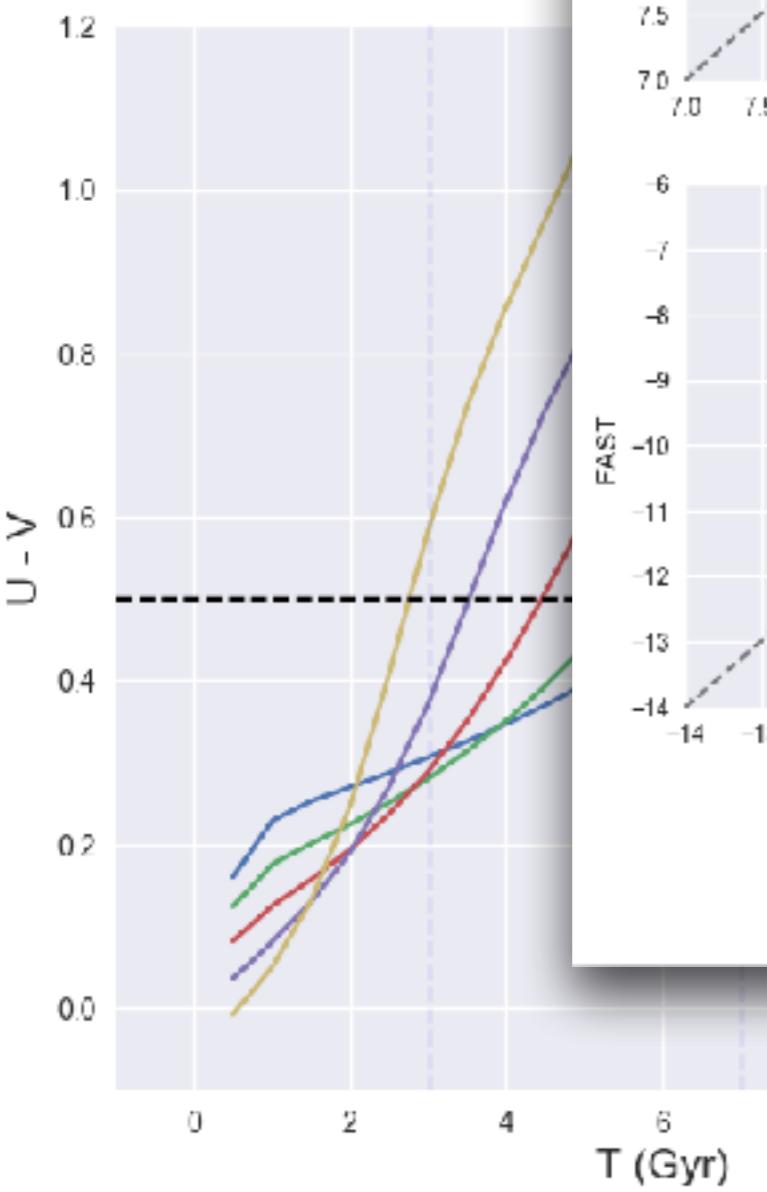
also look like

AM-SFH models

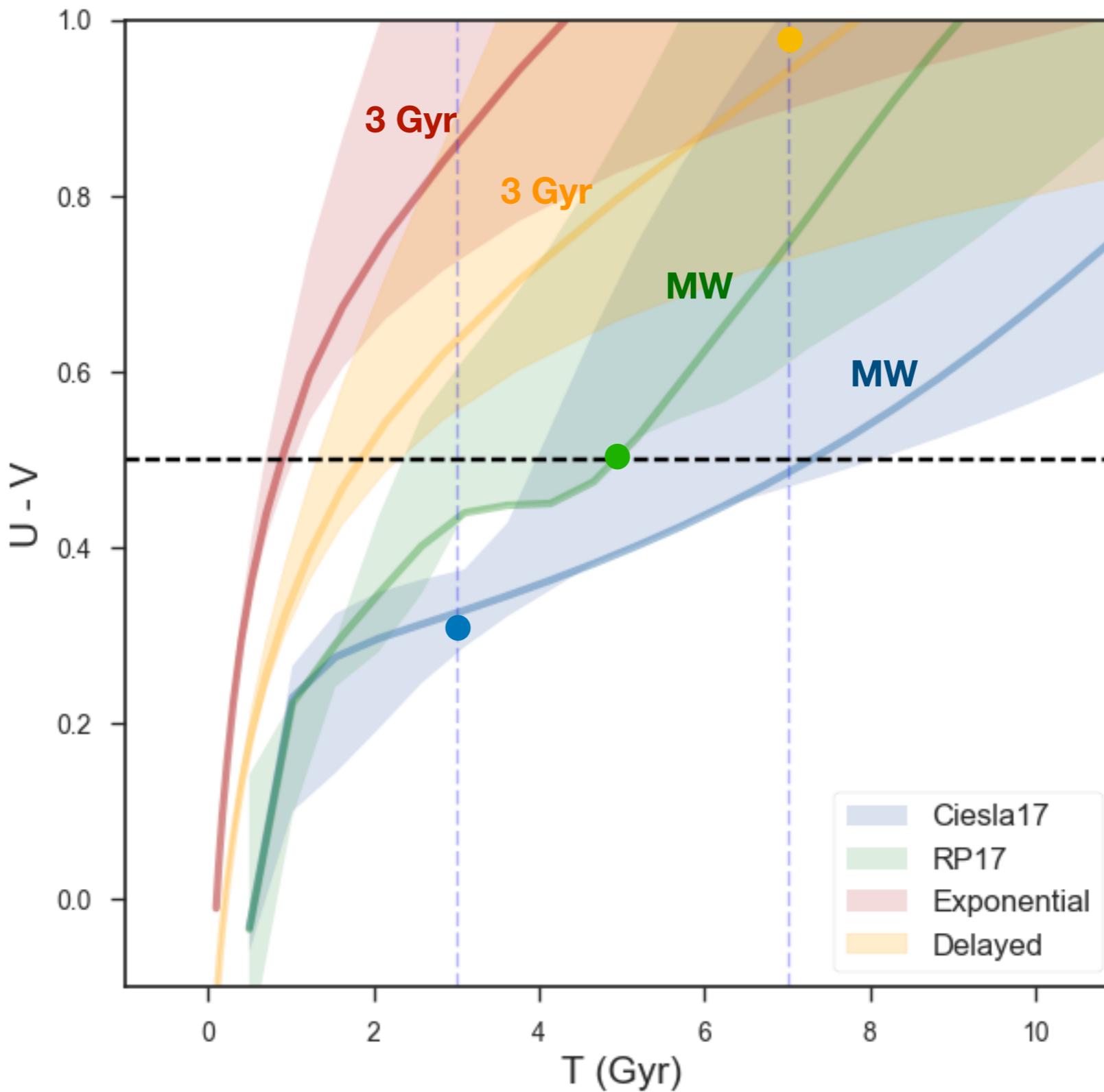


UVJ tracks of MS-SFH models

also look like  
AM-SFH models

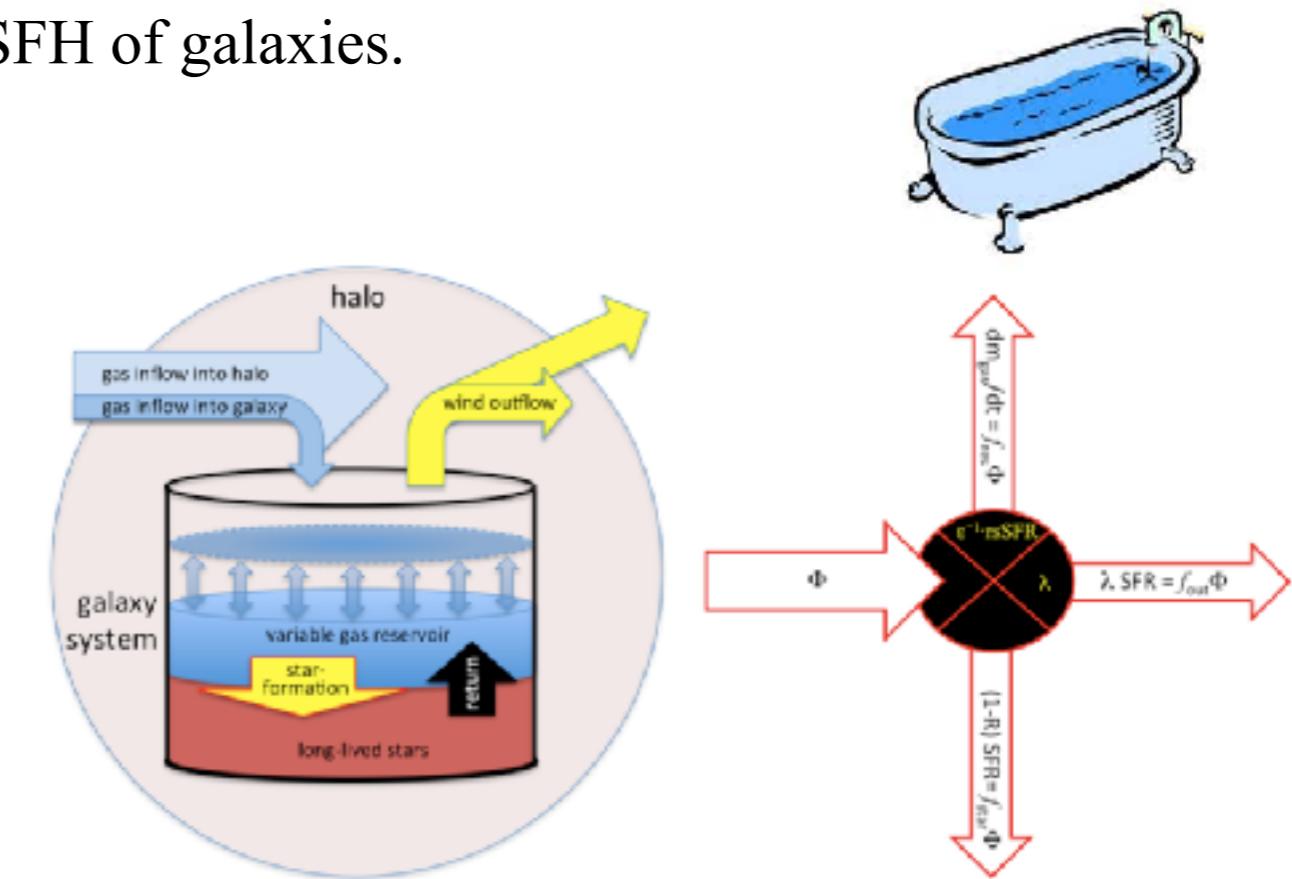
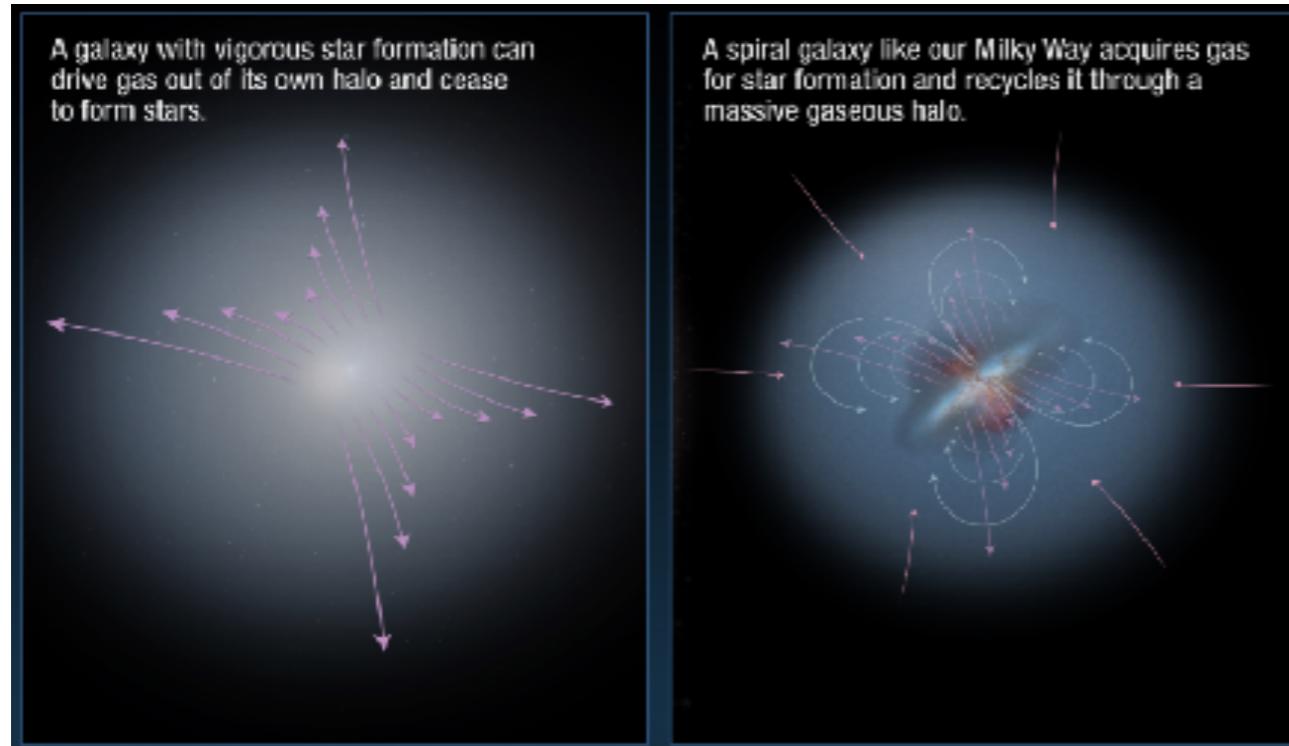


# Color Evolution for Different SFH Models



## 4. Fine-tuning on Realistic SFH Models: Fluctuations

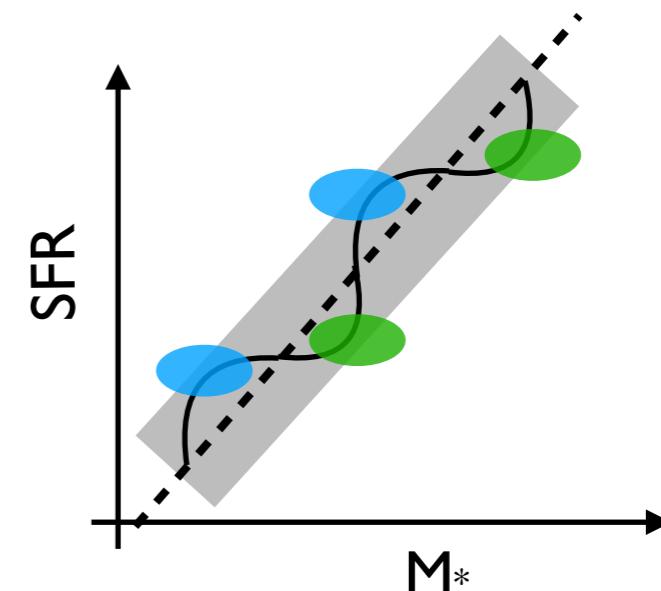
- Real galaxies will not exactly follow *smooth* SFH. In the case of the sub-halo accretion (bathtub model), there should be fluctuations in SFH of galaxies.



'Galaxy-Halo' Coevolution (Credit: NASA; ESA)

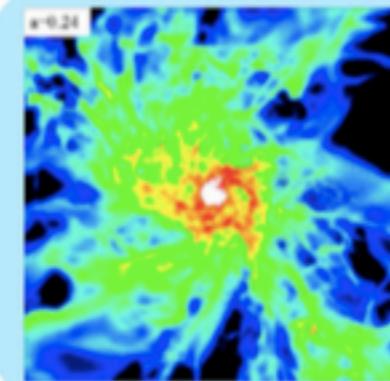
Galaxy Self-regulation (Lilly et al. 2013)

This means galaxies might **go up and down** on the SFMS during its mass assembled history, partially causing the scatter of MS.



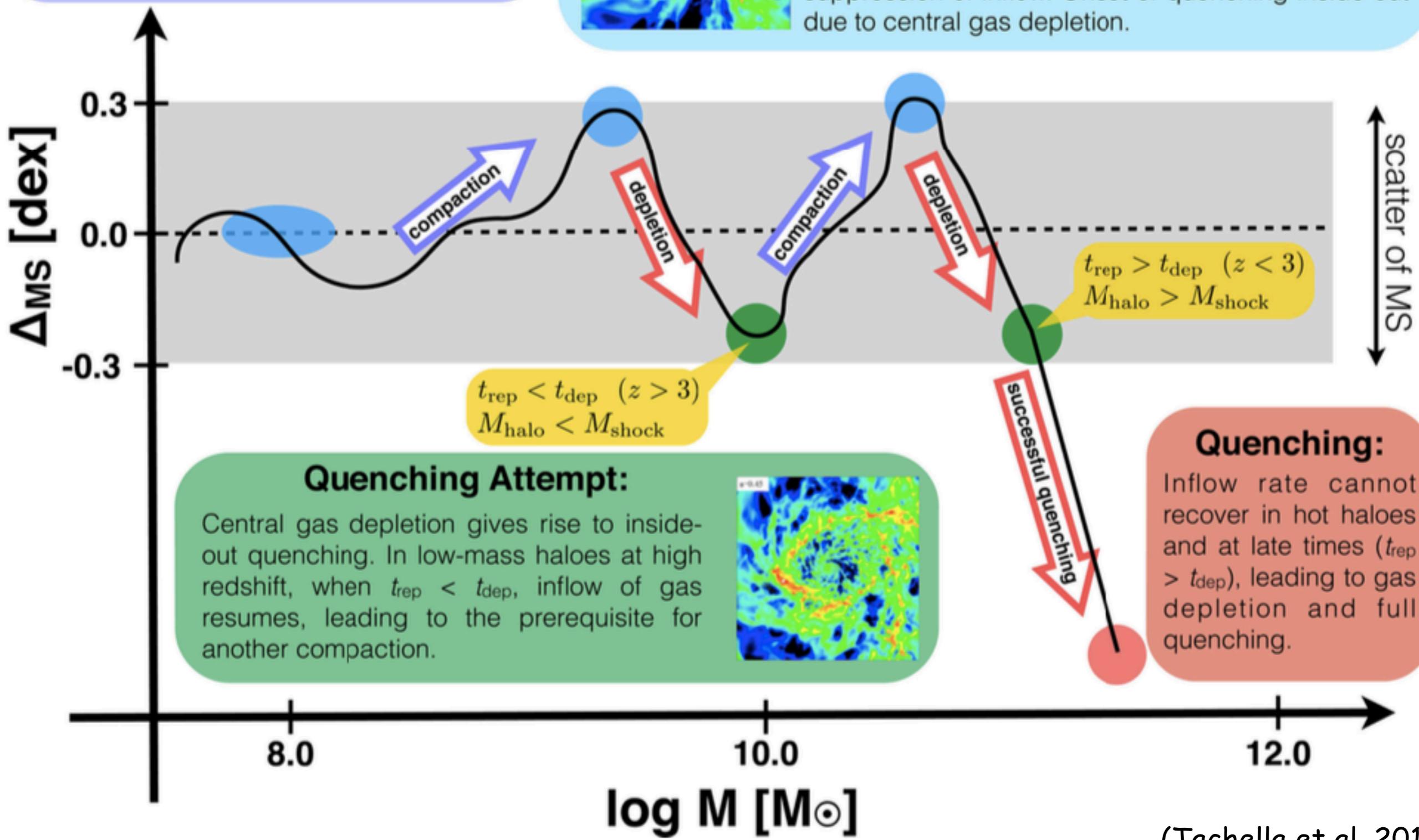
## Compaction:

Triggered by an intense gas inflow event, involving minor mergers or counter-rotating streams, and is commonly associated with violent disc instability. The inflow rate is more efficient than the SFR.



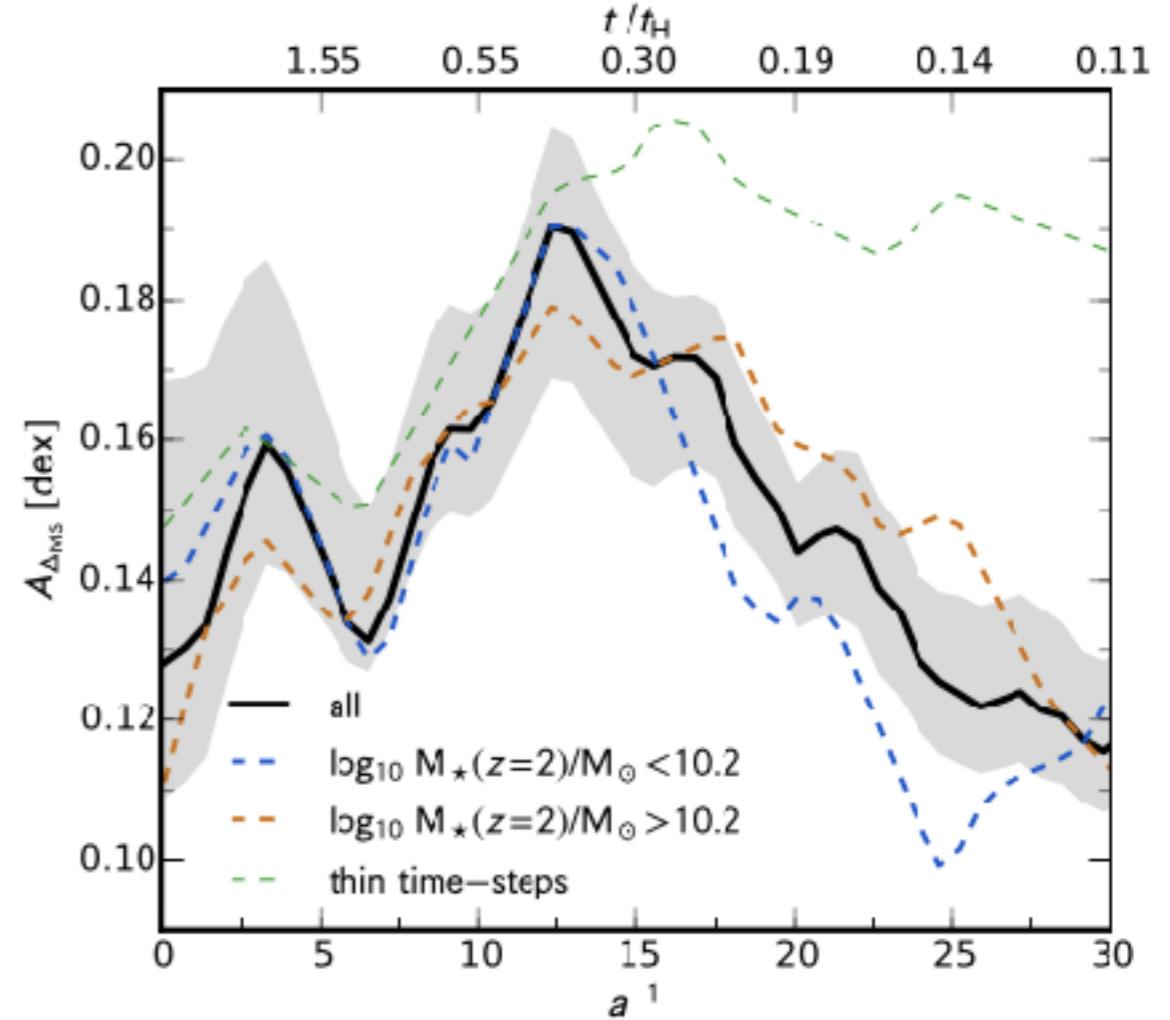
## Blue Nugget Phase:

Associated with a compact, massive core of gas and star-formation rate, short depletion time and high gas fraction. The downturn at the upper bound is due to the peak in SFR and outflow and the suppression of inflow. Onset of quenching inside-out due to central gas depletion.



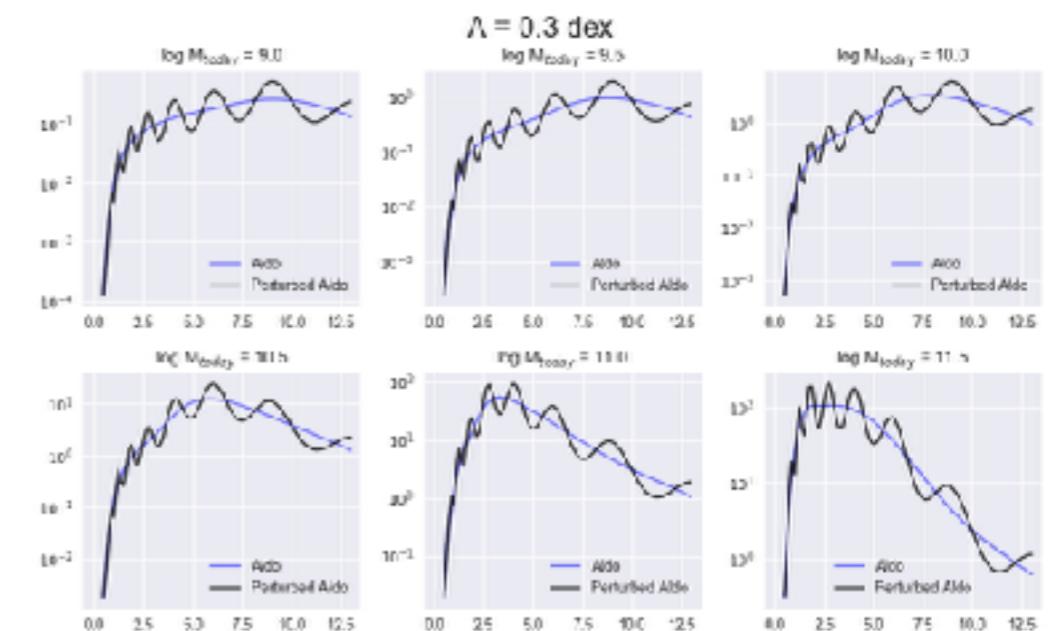
Several questions can be asked:

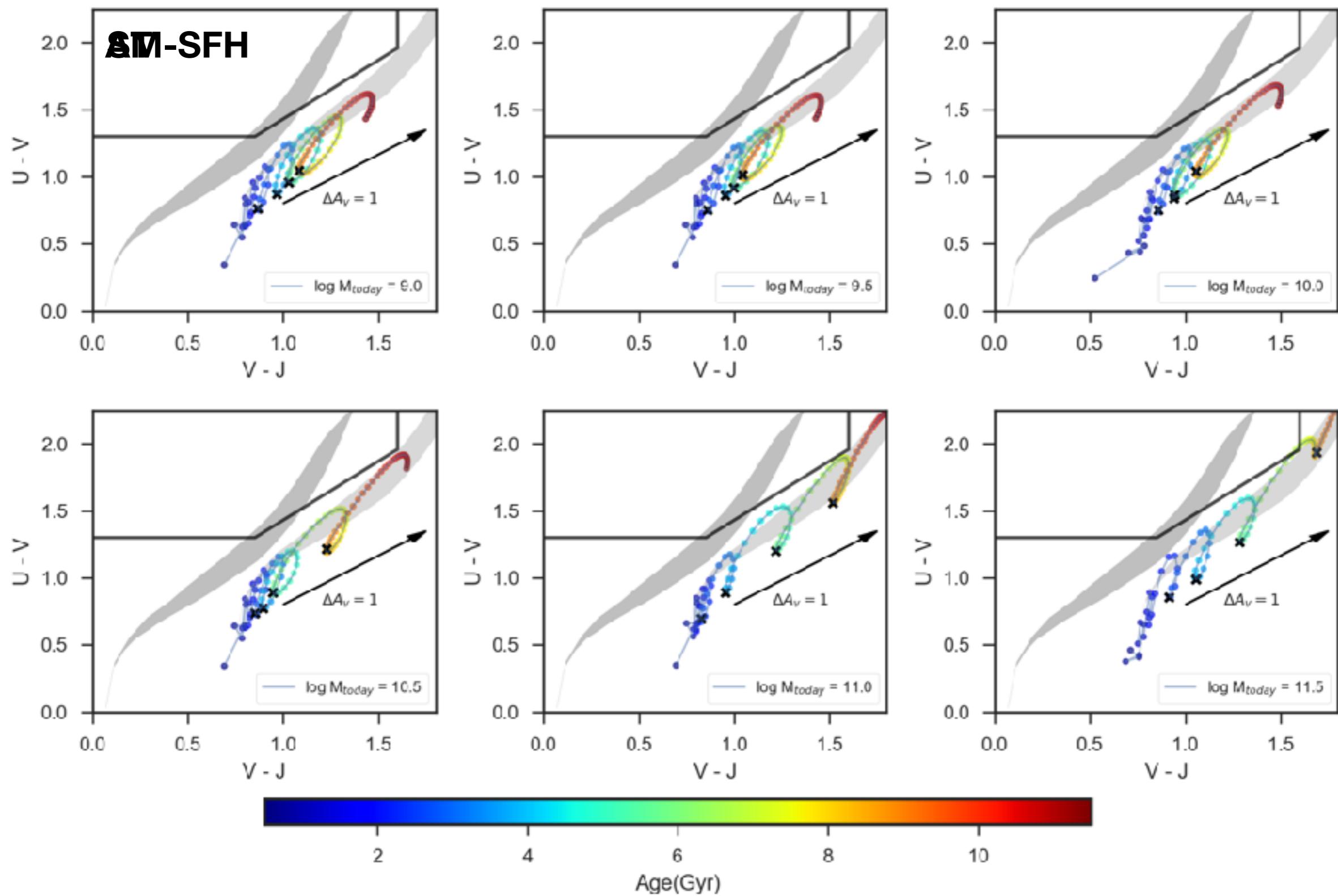
- What's the largest *amplitude* we need to keep the variation of the galaxy within the MS scatter? (this test could help us restrain simulations)
  - How fluctuations influence the color evolution of the galaxy?
  - To what degree can FAST return correct parameter values, in existence of fluctuations?
- Are there any perceptible effects in observations?

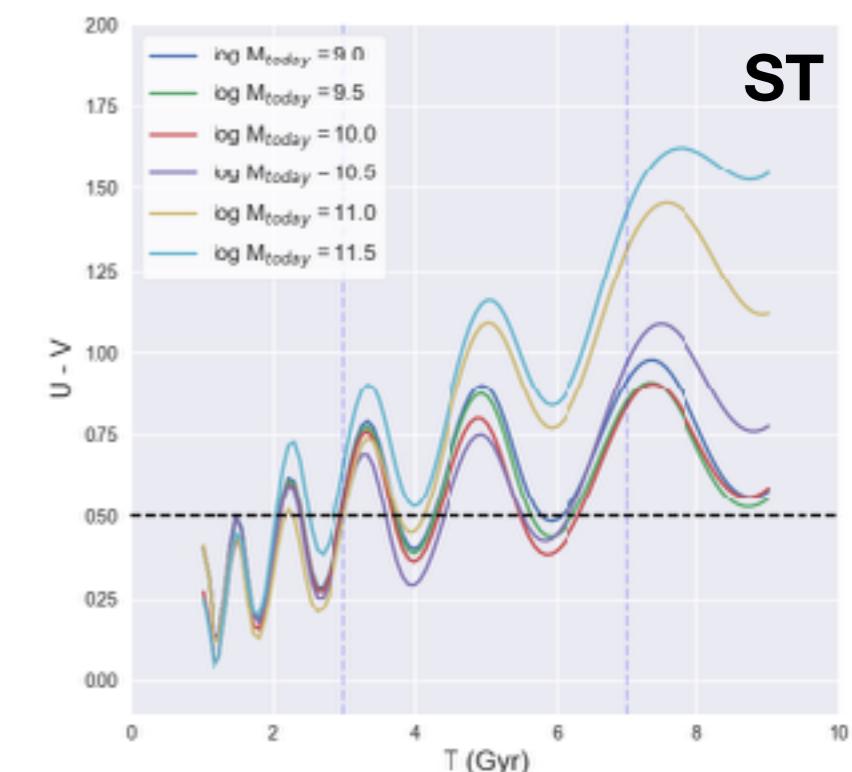
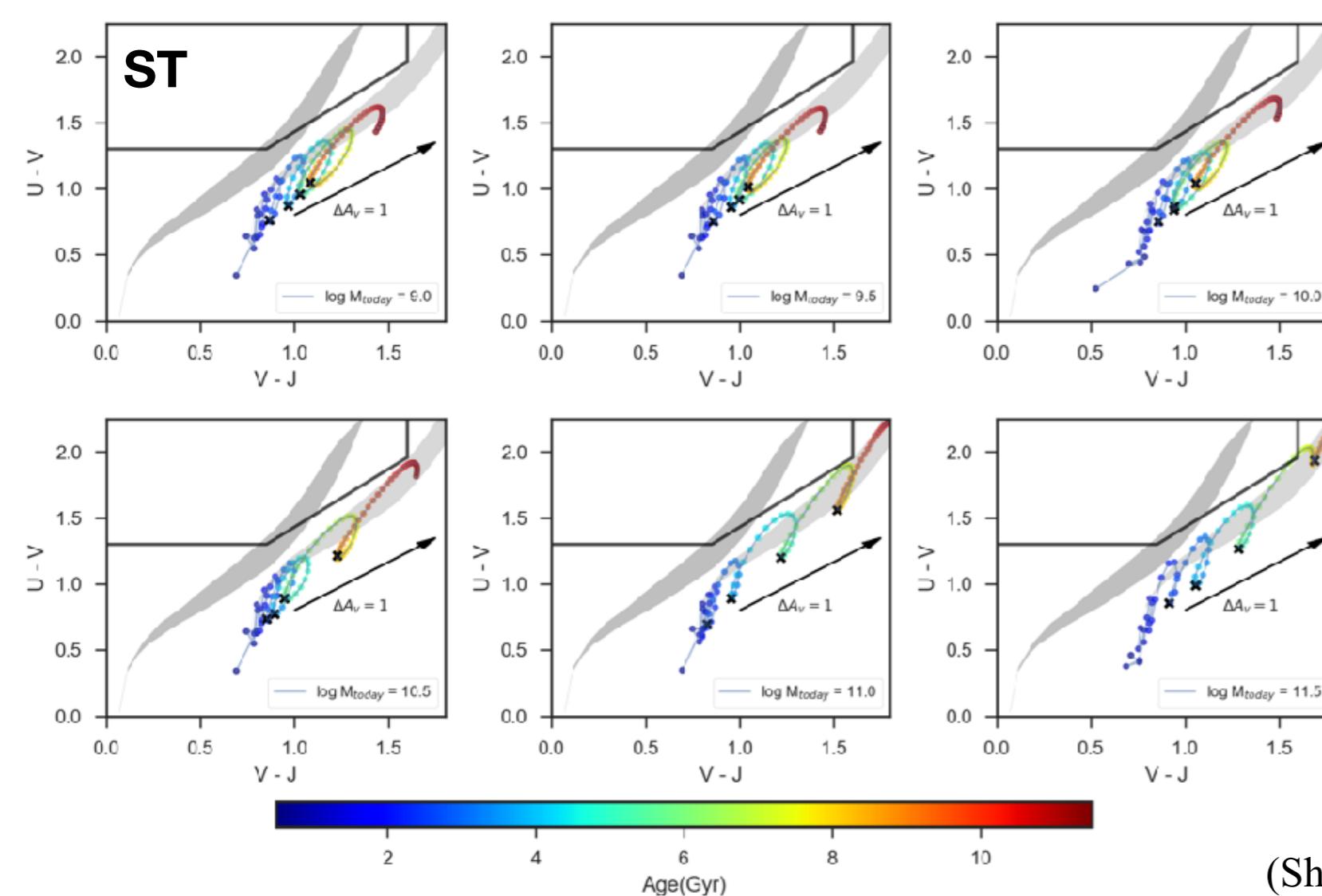


In Tachella et al. 2016, galaxies oscillate around the SFMS at a timescale  $\sim 0.4 t_H$

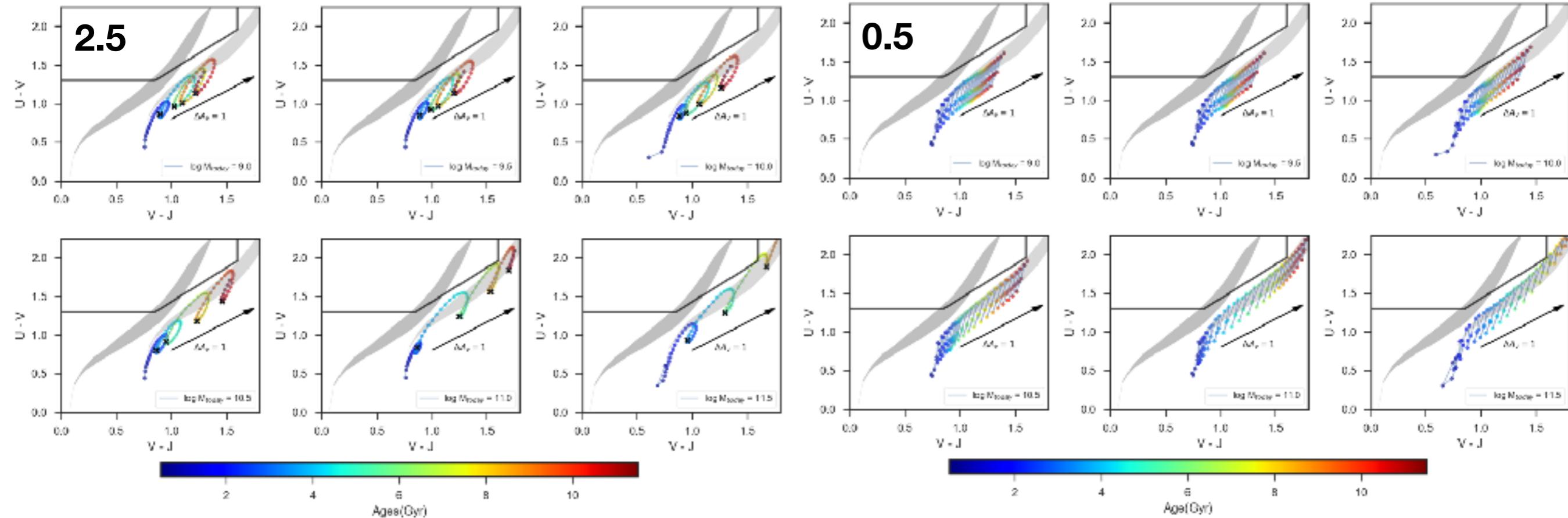
We put 0.3dex sinusoidal fluctuation on our realistic SFH models on a time scale of Tachella et al. 2016 (**ST**) and a constant period of 2.5 (long) / 0.5 (short) Gyr.



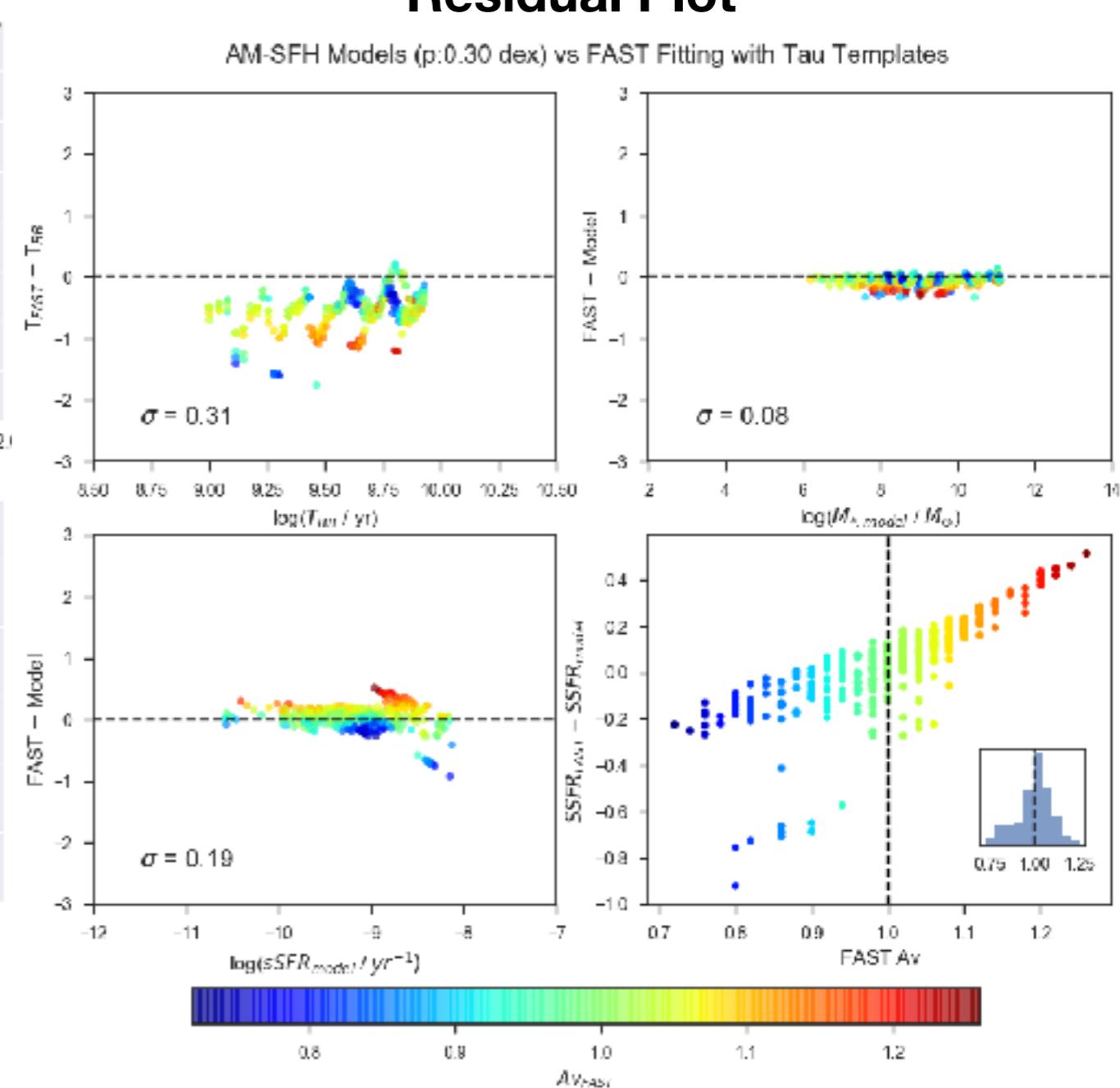
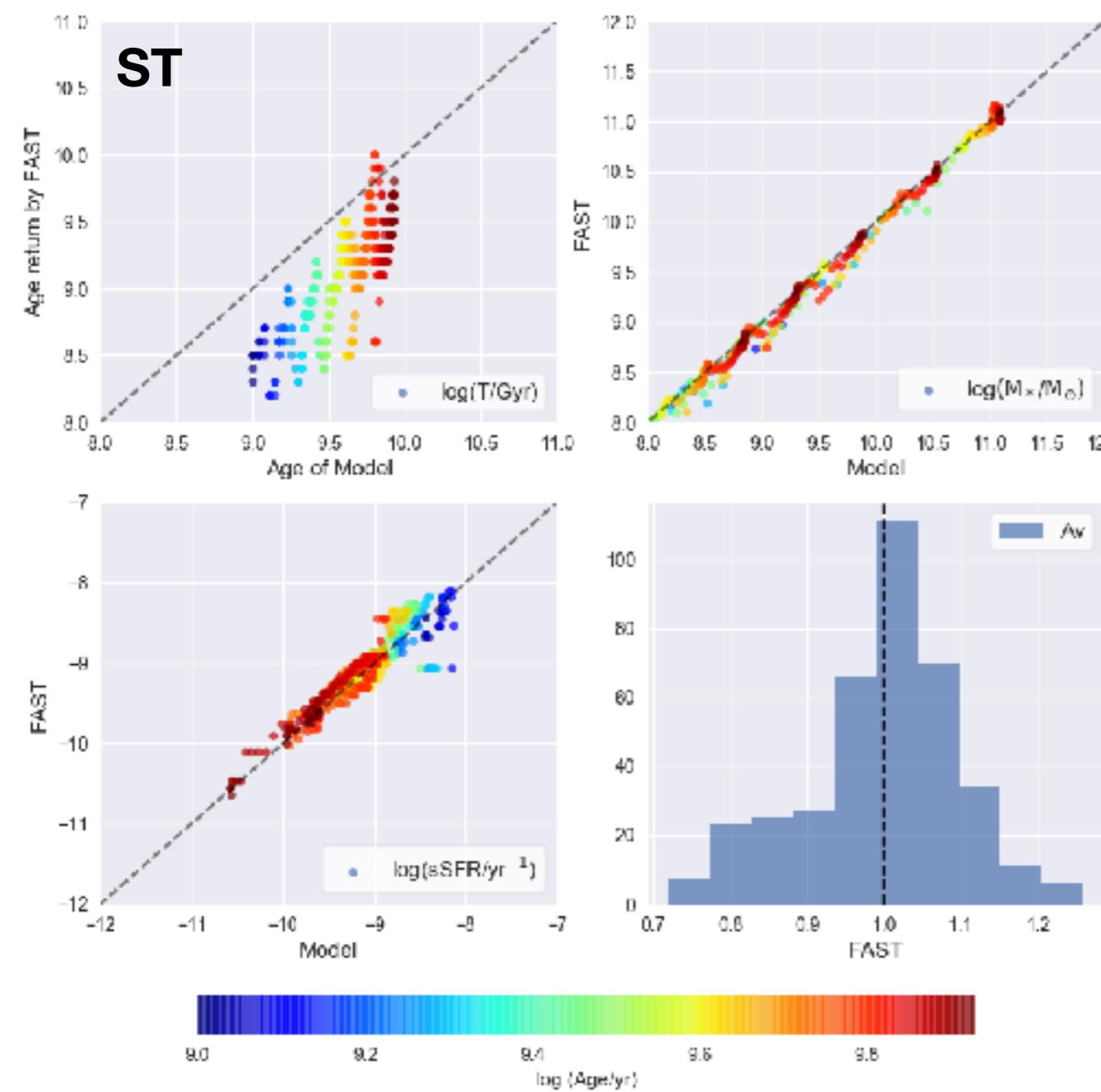




(Short Period suffer from Under-sampling)

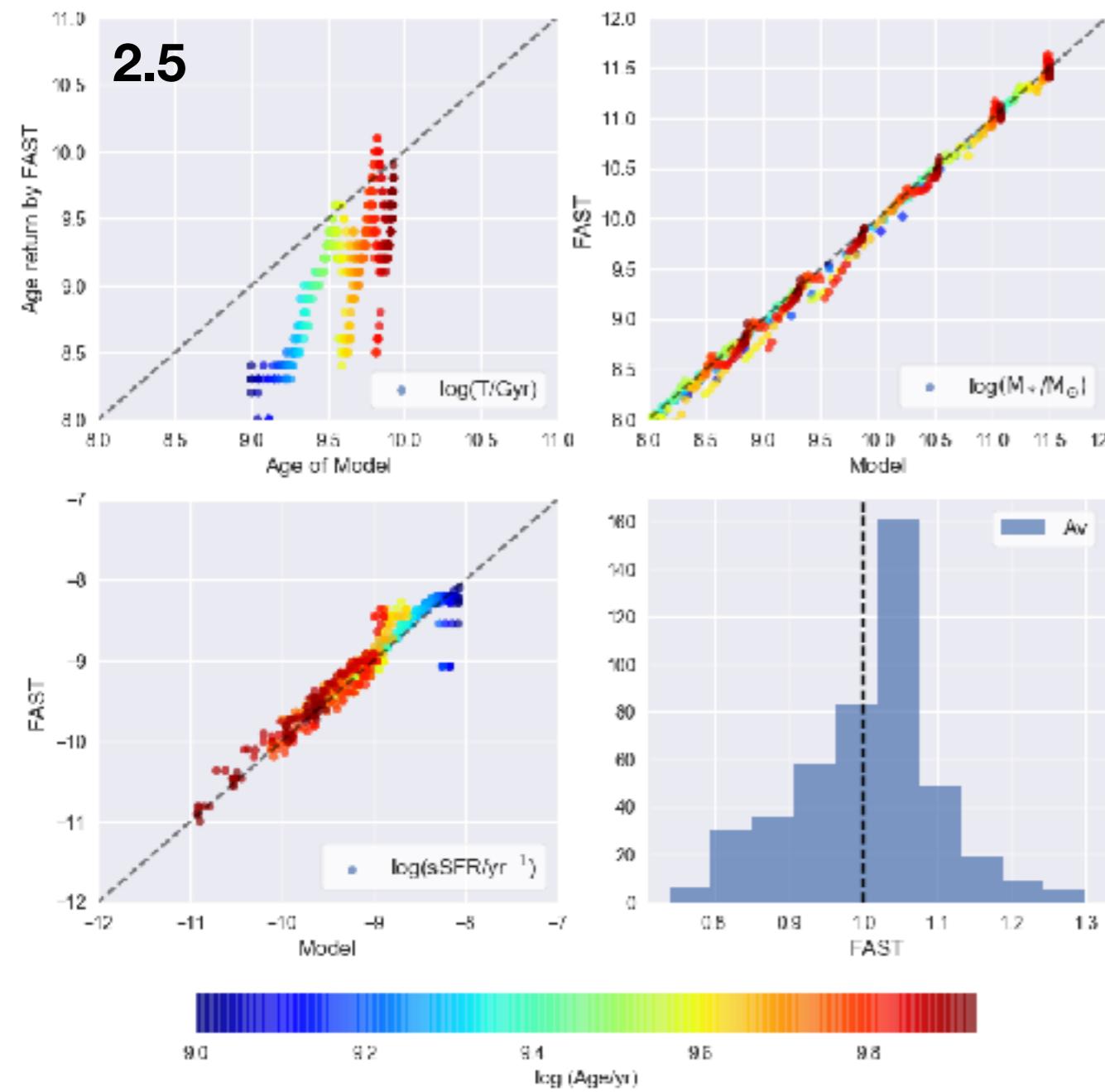


# Residual Plot

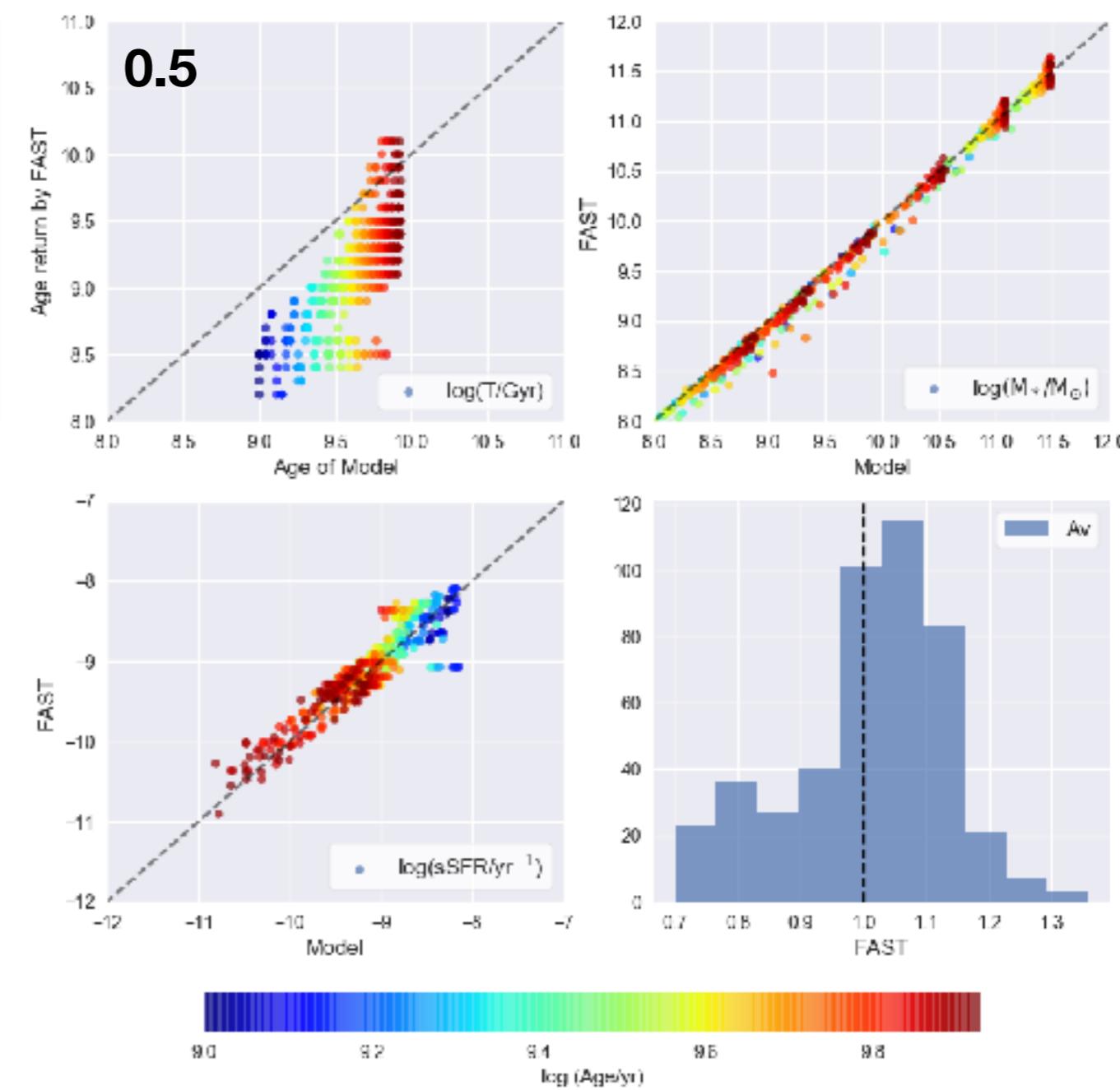


1.  $M^*$  has smaller scatter (rather accurate) but under-estimated.
2. Fluctuations make galaxies stay blue longer.
3. Av-SSFR estimation correlate with *Phase*.
4. Little systematic scatter in SSFR.

AM-SFH Models (Period:2.5 Gyr) vs FAST Fitting with Tau Templates



AM-SFH Models (Period:0.5 Gyr) vs FAST Fitting with Tau Templates



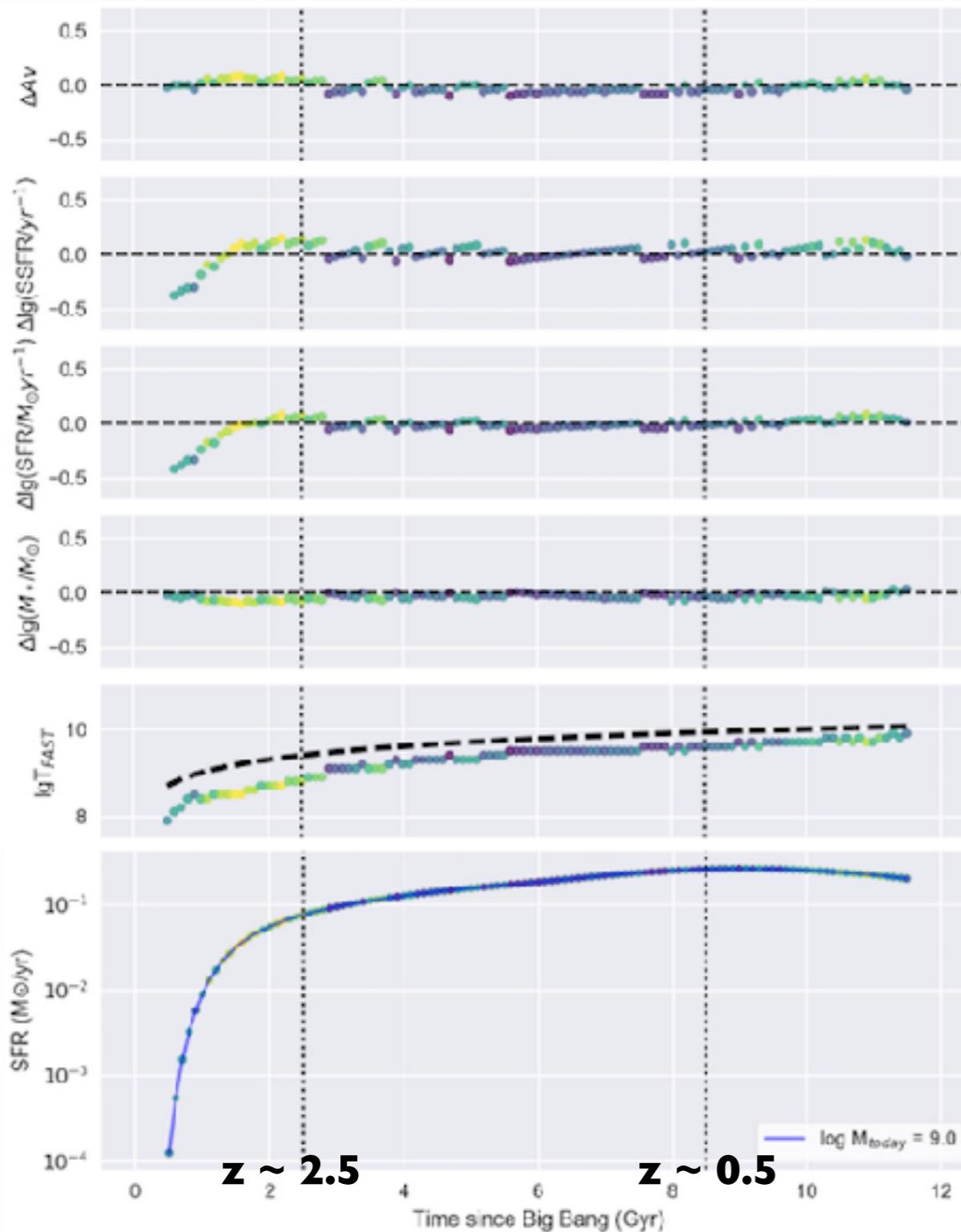
# If unravel FAST estimation along time...

$\Delta = \text{FAST} - \text{Model}$

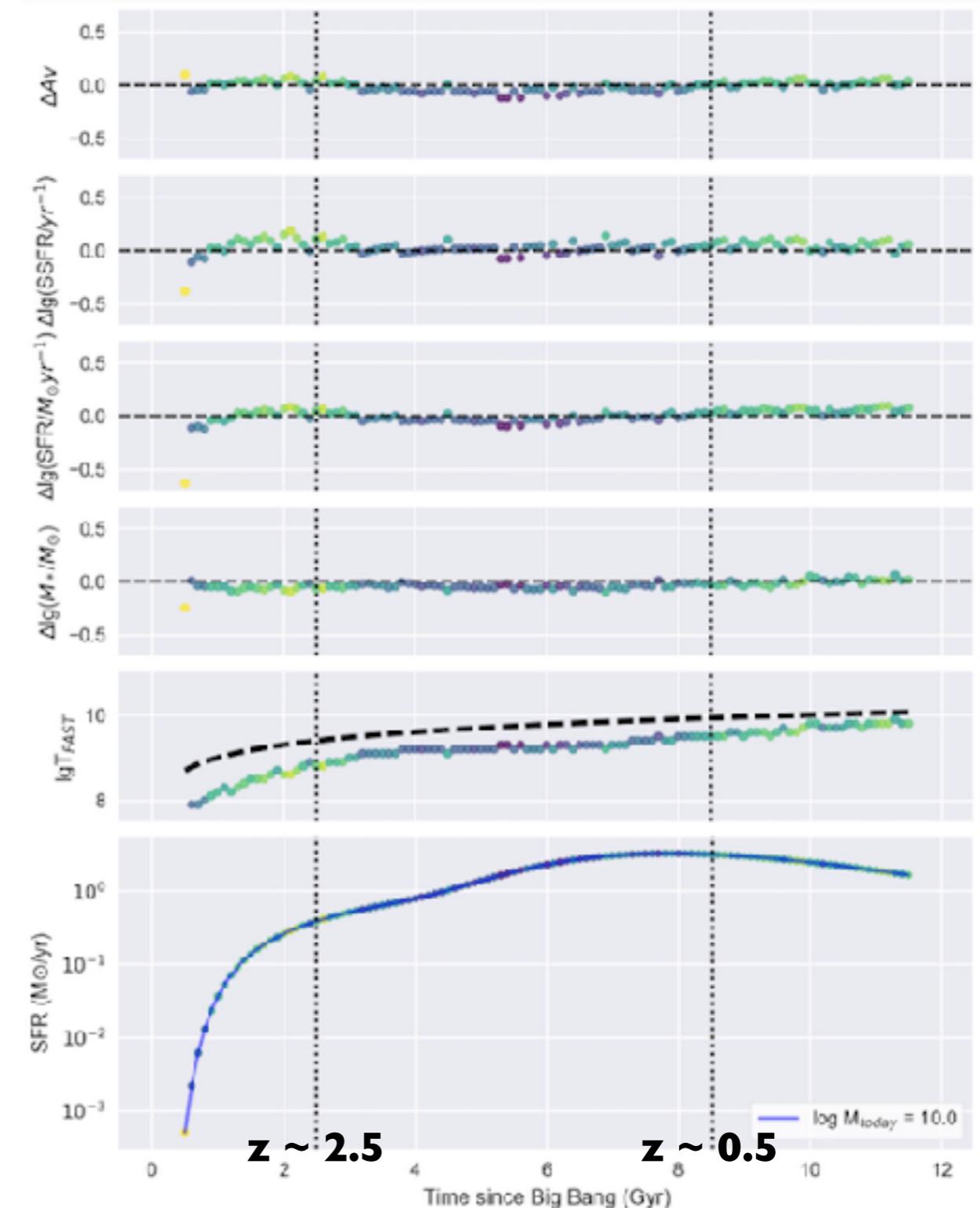
— See how response of FAST change with growth of galaxies

AM-SFH (w/o Fluctuation)

$\log M_{\text{Today}} = 9$



$\log M_{\text{Today}} = 10$



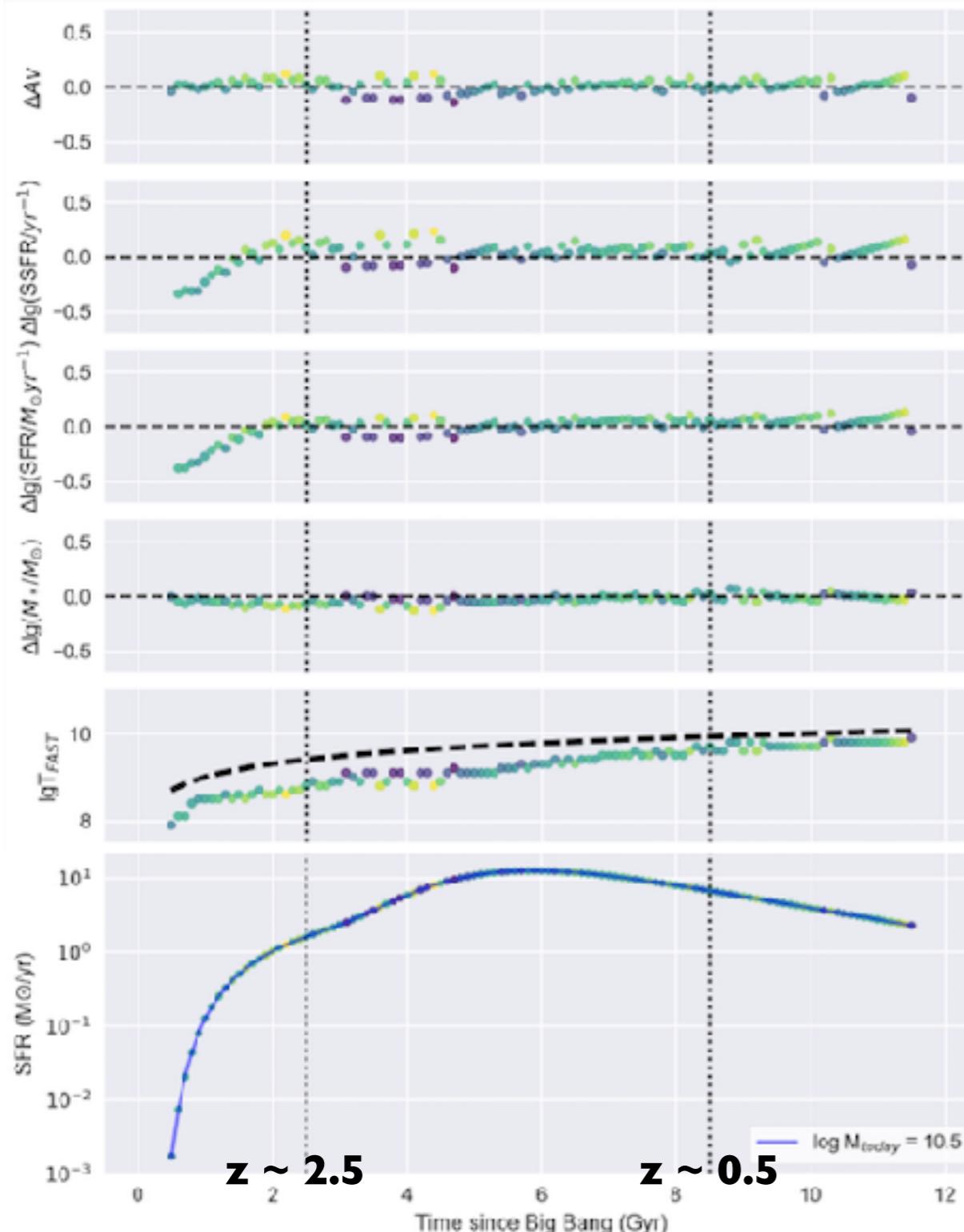
# If unravel FAST estimation along time...

$\Delta = \text{FAST} - \text{Model}$

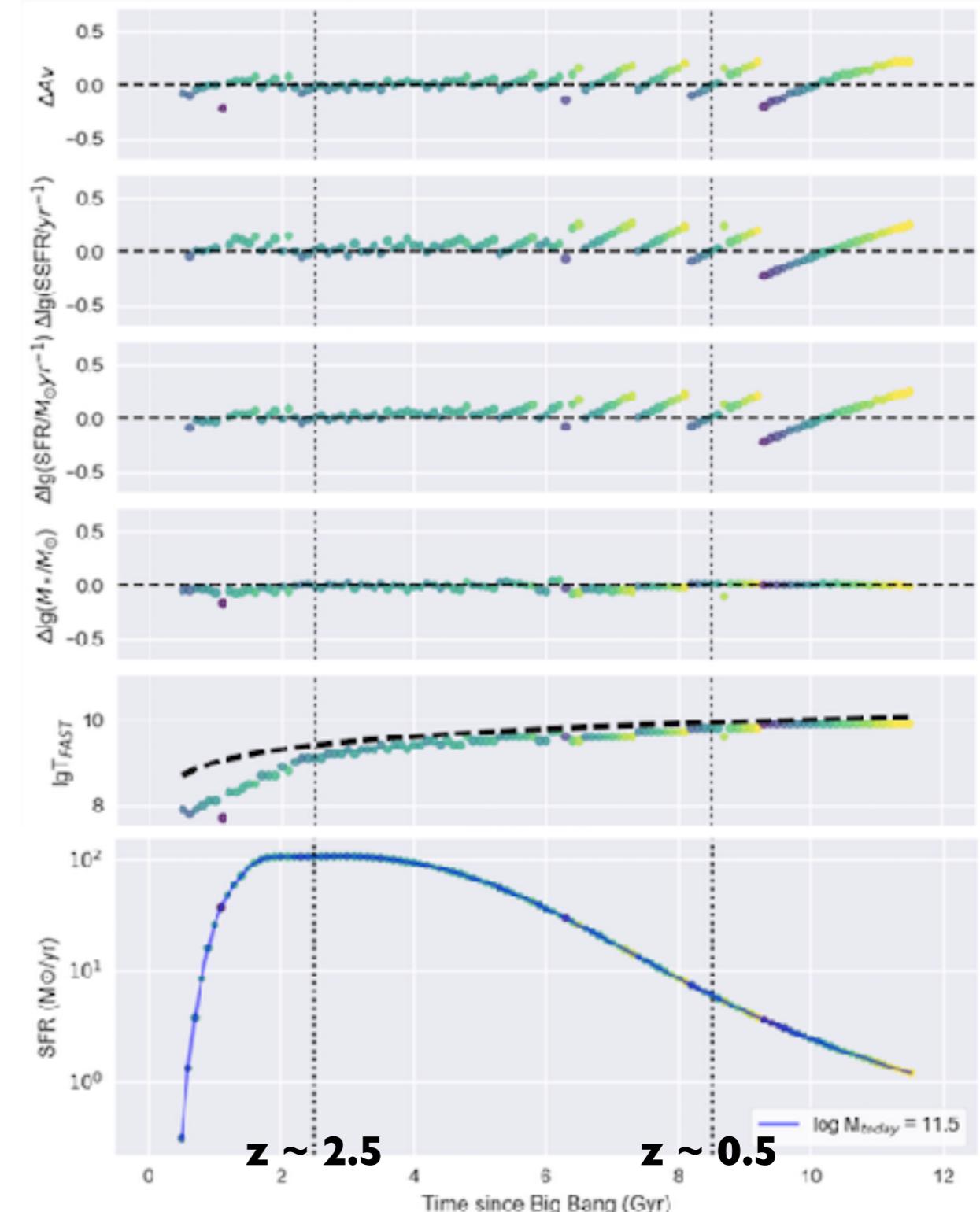
— See how response of FAST change with growth of galaxies

AM-SFH (w/o Fluctuation)

$\log M_{\text{Today}} = 10.5$

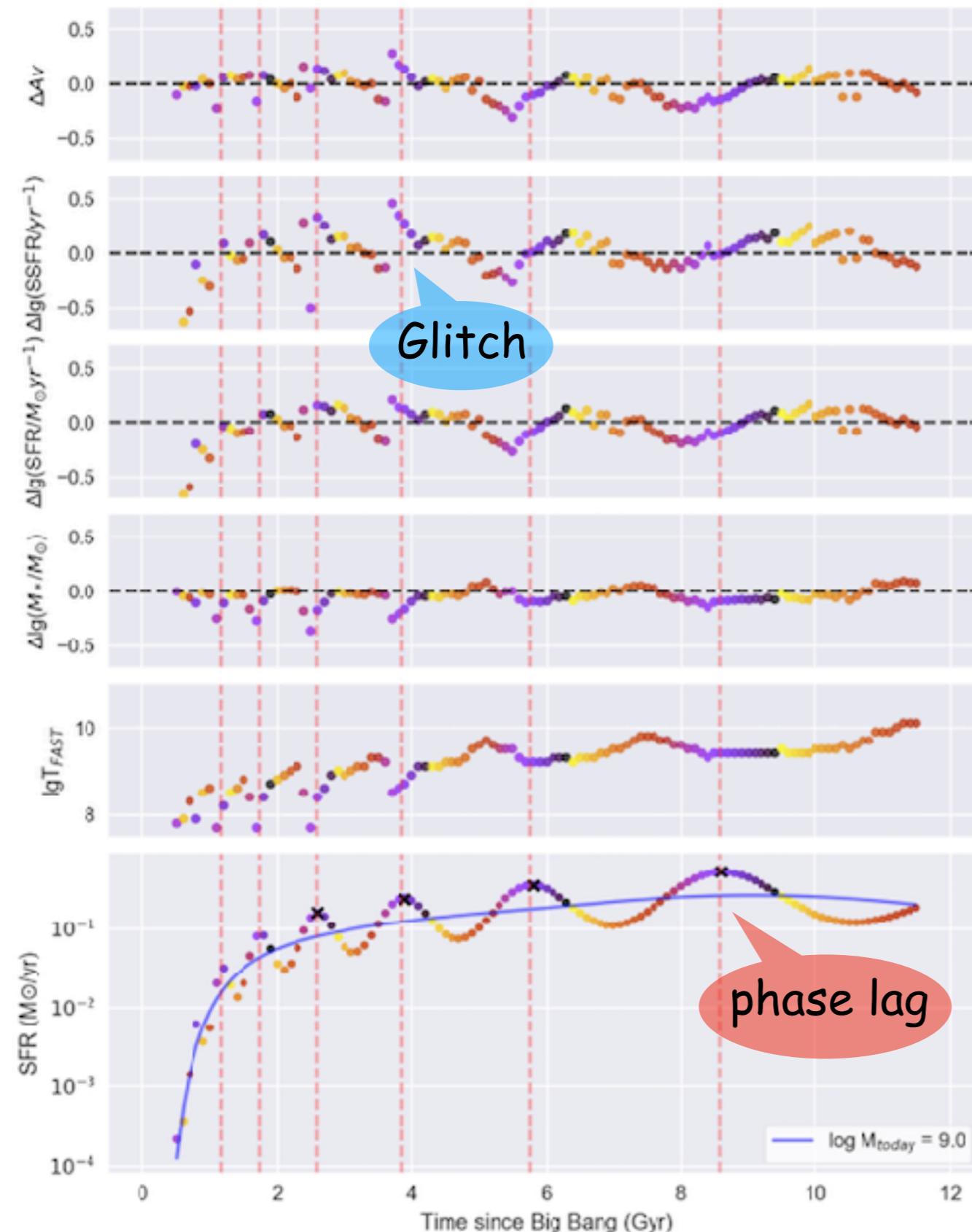


$\log M_{\text{Today}} = 11.5$

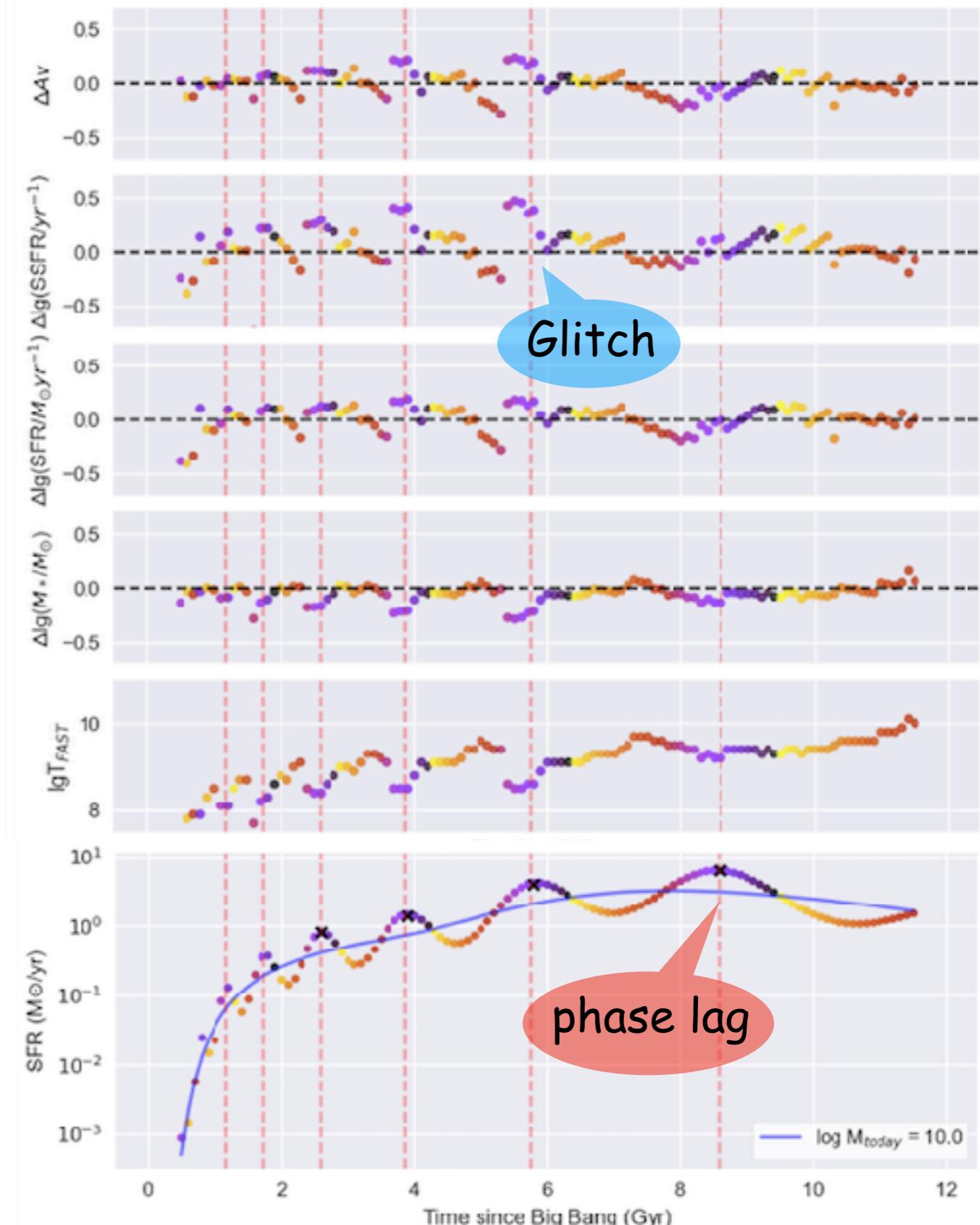


# AM-SFH + ST Fluctuation

$\log M_{\text{Today}} = 9$

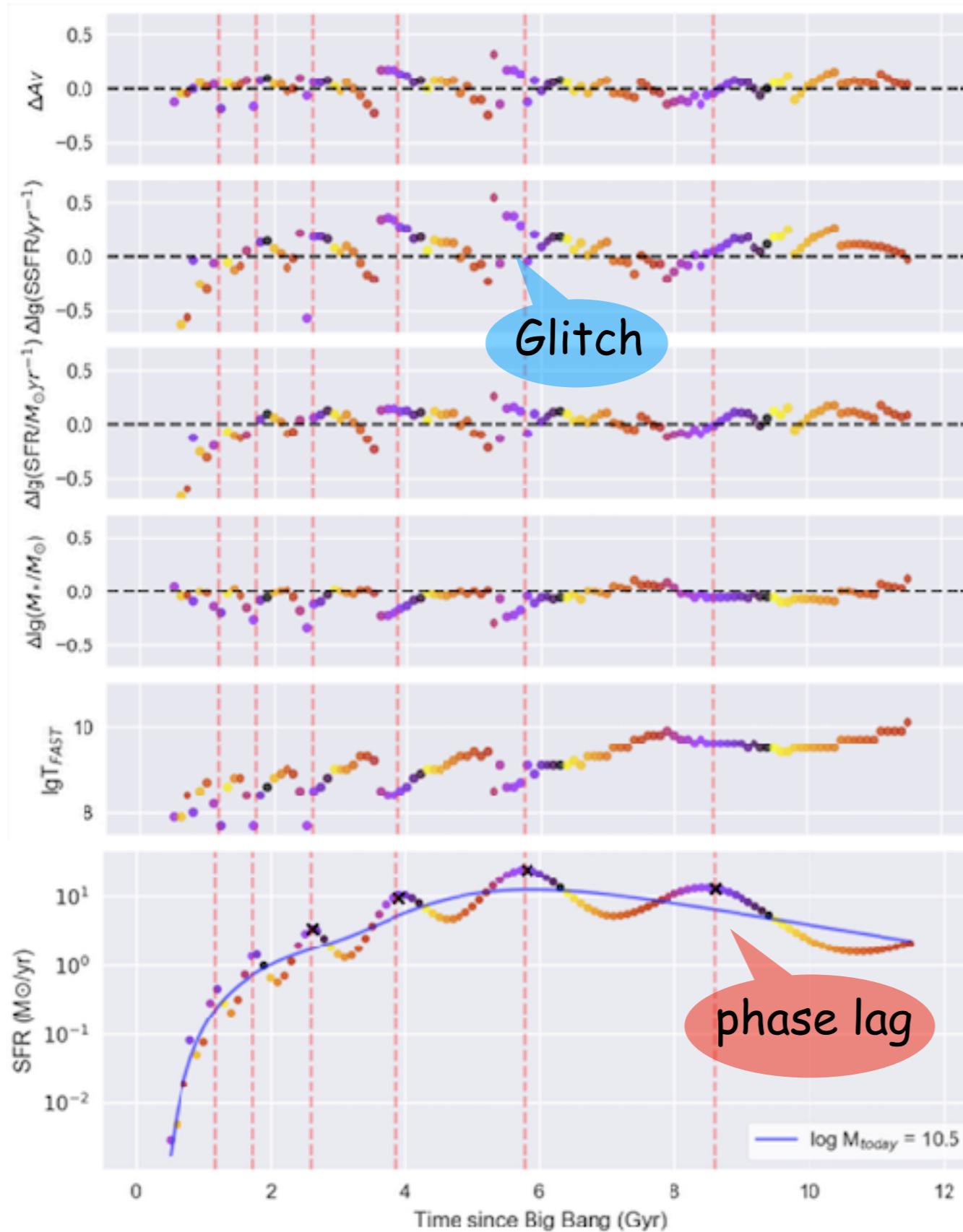


$\log M_{\text{Today}} = 10$

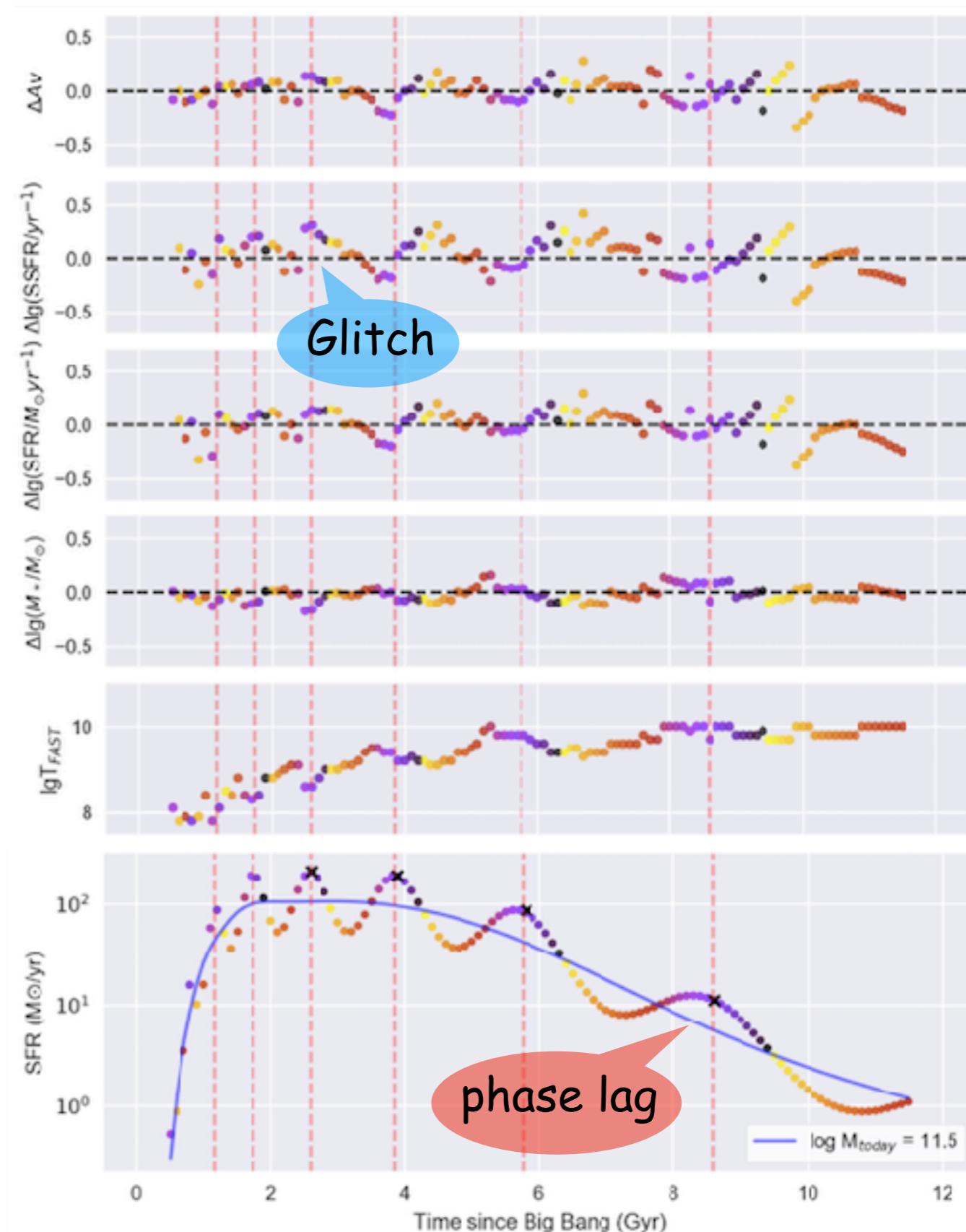


# AM-SFH + ST Fluctuation

$\log M_{\text{Today}} = 10.5$

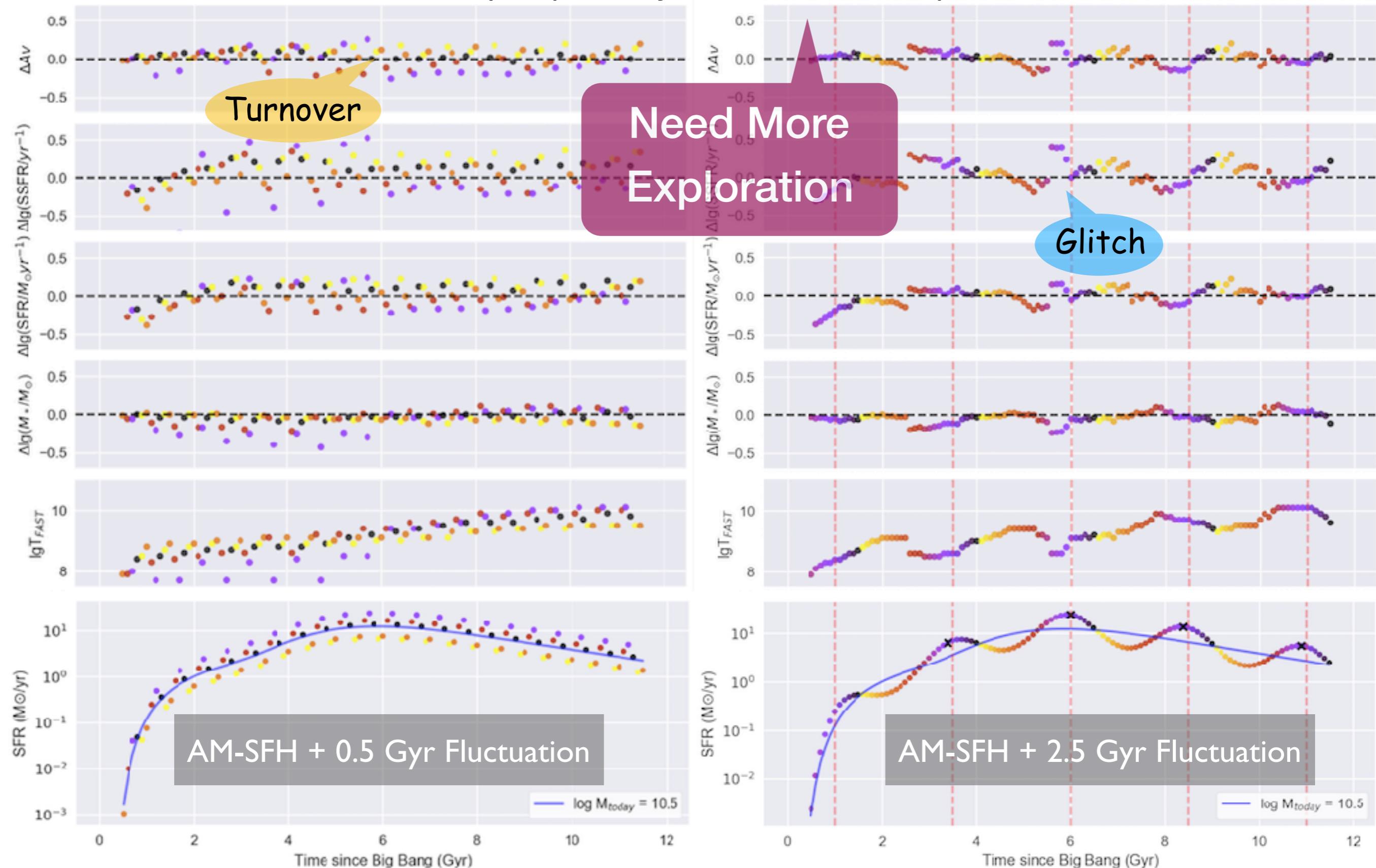


$\log M_{\text{Today}} = 11.5$



1. After a certain point  $\Delta V$  turn over, no glitch any more,  $M^*$  become accurate;
2. Glitches come with very young age  $\Rightarrow$  Does FAST 'compromise' in these points?

*Decided by shape of UVJ tracks relative to templates!*



## Take-away Message:

1. Classical SFH models (Tau, Constant, Delayed) become too red too fast to represent real galaxy populations.
2. Realistic SFH models derived from Abundance Matching and Main Sequence would help solve the ‘age-color’ problem.
3. Their UVJ tracks are similar and multi-band SED-fitting return relatively accurate estimation for their  $M^*$ , SFR and Av.
4. Periodical fluctuations in SFH have influences in color evolution and SED-fitting behaviors.

## Future Exploration:

1. Quantitative matching between models and CANDELS data;
2. Adding photometric errors in observations in SED-fitting;
3. Use less bands (e.g. remove FUV) to do SED-fitting;
4. Further exploring SED-fitting behaviors with fluctuation.