

# The Cosmic Dawn (CoDa) Project: Simulating Reionization and Galaxy Formation

Paul Shapiro  
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Collaborators in this work include:

Pierre Ocvirk<sup>7</sup>, Dominique Aubert<sup>7</sup>, Taha Dawoodbhoy<sup>1</sup>, Ilian Iliev<sup>2</sup>, Hyunbae Park<sup>1</sup>, Anson D'Aloisio<sup>1,15</sup>, Romain Teyssier<sup>8</sup>, Gustavo Yepes<sup>9</sup>, Stefan Gottloeber<sup>10</sup>, Nicolas Gillet<sup>7</sup>, Junhwan Choi<sup>1</sup>, David Sullivan<sup>2</sup>, Yehuda Hoffman<sup>14</sup>, Jenny Sorce<sup>16</sup>, Nicolas Deparis<sup>7</sup>, Joseph Lewis<sup>7</sup> + Other CLUEs Members  
(1)U Texas at Austin (2)U Sussex (7)U Strasbourg (8) U Zurich (9) U Madrid  
(10) AIP Potsdam (13) Hebrew U (15)U Washington (16) U Lyons

*"CoSyne: Cosmological Synergies in the Upcoming Decade"*

Institut d'Astrophysique, Paris, December 11, 2019

# The Cosmic Dawn (CoDa) Project: Simulating Reionization and Galaxy Formation

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**Cosmic Dawn: Fully-Coupled Radiation-Hydro  
Simulations of Reionization and Galaxy Formation**

work include:

Pierre Ocvirk<sup>7</sup>, Park<sup>1</sup>, Taha Dawoodbhoy<sup>1</sup>, Ilian Iliev<sup>2</sup>, Hyunbae  
Gottloeber<sup>1</sup>, Romain Teyssier<sup>8</sup>, Gustavo Yepes<sup>9</sup>, Stefan  
Junhwan Choi<sup>1</sup>, David Sullivan<sup>2</sup>, Yehuda Hoffman<sup>14</sup>,  
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# Introducing the **CoDa** (**COSMIC DAWN**) Simulations

- Largest fully-coupled rad-hydro reionization simulations to-date, *global* and *local*
- *Volume large enough* to simulate global reionization; *resolution high enough* to follow all atomic-cooling halos ( $>10^8 M_{\text{solar}}$ ), including MW/M31 dwarf satellites.
- 3 EOR Simulations of  $L > 90$  Mpc boxes, from **CLUES** Constrained Realization I.C.'s  
-- **CoDa I** and **CoDa II** :

**RAMSES-CUDATON** simulations (uniform grid): hybrid CPU-GPU code

- Grid size =  $(4096)^3$  cells,  $\Delta x \sim 20$  cKpc  $< 3$  Kpc's ; N-body particles =  $(4096)^3 \sim 69$  billion
- Minimum halo mass  $\sim 10^8 M_{\text{solar}} \sim 300$  particles

Ocvirk, Gillet, **Shapiro**, Aubert, Iliev, Teyssier, Yepes, Choi, Park, D'Aloisio, Sullivan, Gottloeber, Hoffman, Stranex, Knebe 2016, MNRAS, 463,1462 ([arXiv:1511.00011](https://arxiv.org/abs/1511.00011)) (**CoDa I**)

Ocvirk, Aubert, Sorce, **Shapiro**, Deparis, Dawoodbhoy, Lewis, Teyssier, Yepes, Gottloeber, Ahn, Iliev, Hoffman, 2019, MNRAS, submitted ([arXiv:1811.11192](https://arxiv.org/abs/1811.11192)) (**CoDa II**)

-- **CoDa I – AMR** :

**EMMA** simulation (Adaptive Mesh Refined): hybrid CPU-GPU code

- AMR resolution =  $(16,384)^3$  cells (fully-refined)  $\rightarrow \Delta x \sim 5$  cKpc  $\rightarrow \sim 500$  pc
- N-body particles =  $(2048)^3 \sim 8.6$  billion
- Minimum halo mass  $\sim 10^8 M_{\text{solar}} \sim 36$  particles

Aubert, Deparis, Ocvirk, **Shapiro**, Iliev, Yepes, Gottloeber, Hoffman, Teyssier 2018, ApJL, 856, L22 ([arXiv:1802.01613](https://arxiv.org/abs/1802.01613)) (**CoDa I - AMR**)

# Simulating Galaxy Formation and Reionization of the Local Universe with Fully-Coupled Radiation-Hydro: CoDa II

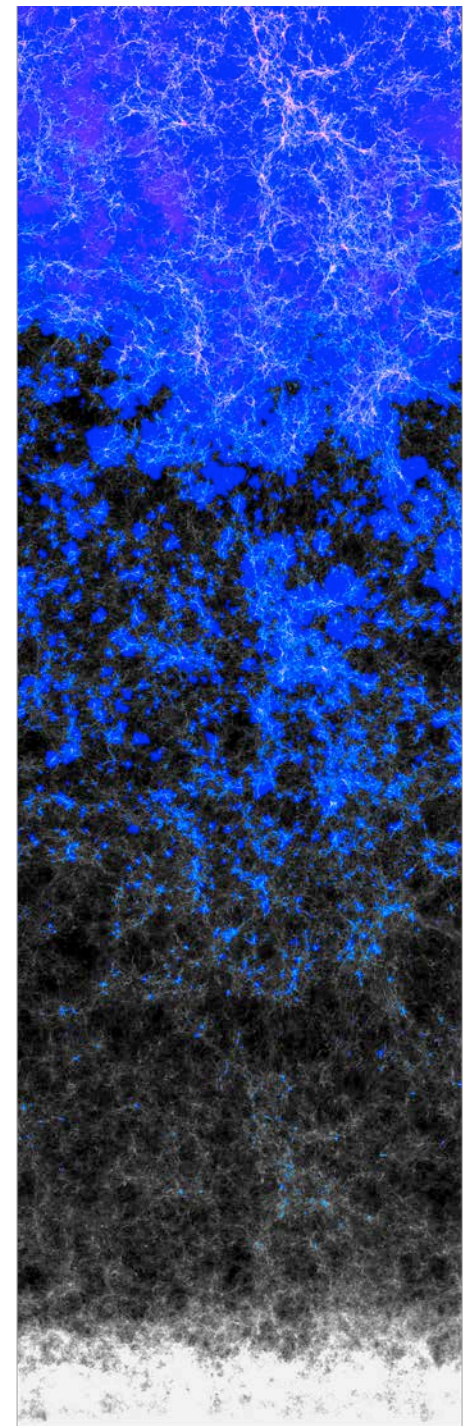
Ocvirk, Aubert, Sorce, Shapiro, Deparis, Dawoodbhoy, Lewis, Teyssier, Yepes, Gottloeber, Ahn, Iliev, Hoffman 2019, MNRAS submitted (arXiv: 1811.11192)

## RAMSES-CUDATON simulation

- Box size = 94 cMpc
- Grid size =  $(4096)^3$  cells,  $\Delta x \sim 20$  cKpc  $< 3$  Kpc
- N-body particles =  $(4096)^3 \sim 69$  billion
- Minimum halo mass  $\sim 10^8 M_{\text{solar}} \sim 300$  particles
- Newer CLUEs initial conditions

## TITAN Supercomputer requirements

- # CPU cores (+ # GPUs) = 65536 (+ 16384)
- runtime  $\sim 6$  days



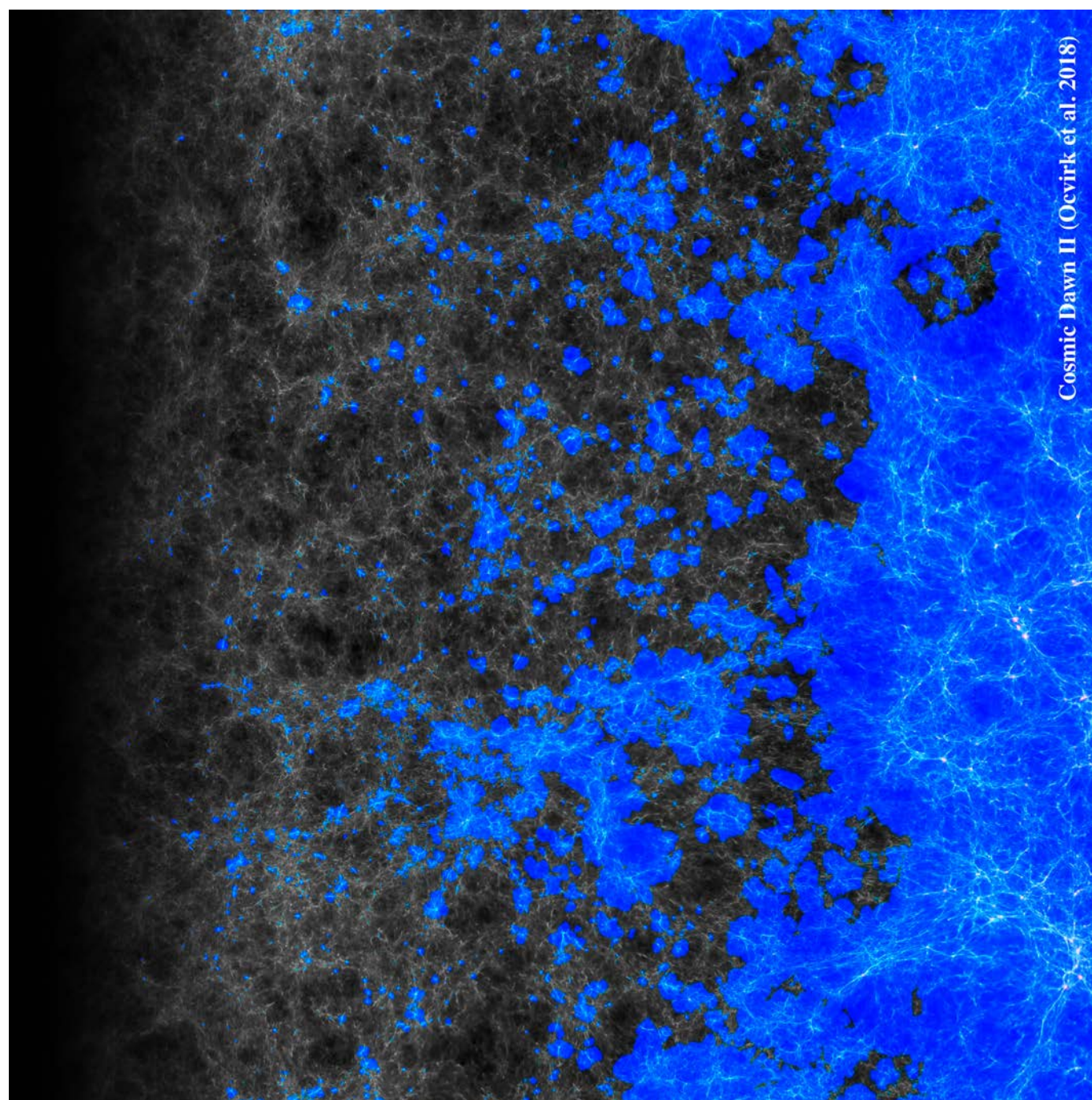
z





# CoDa II

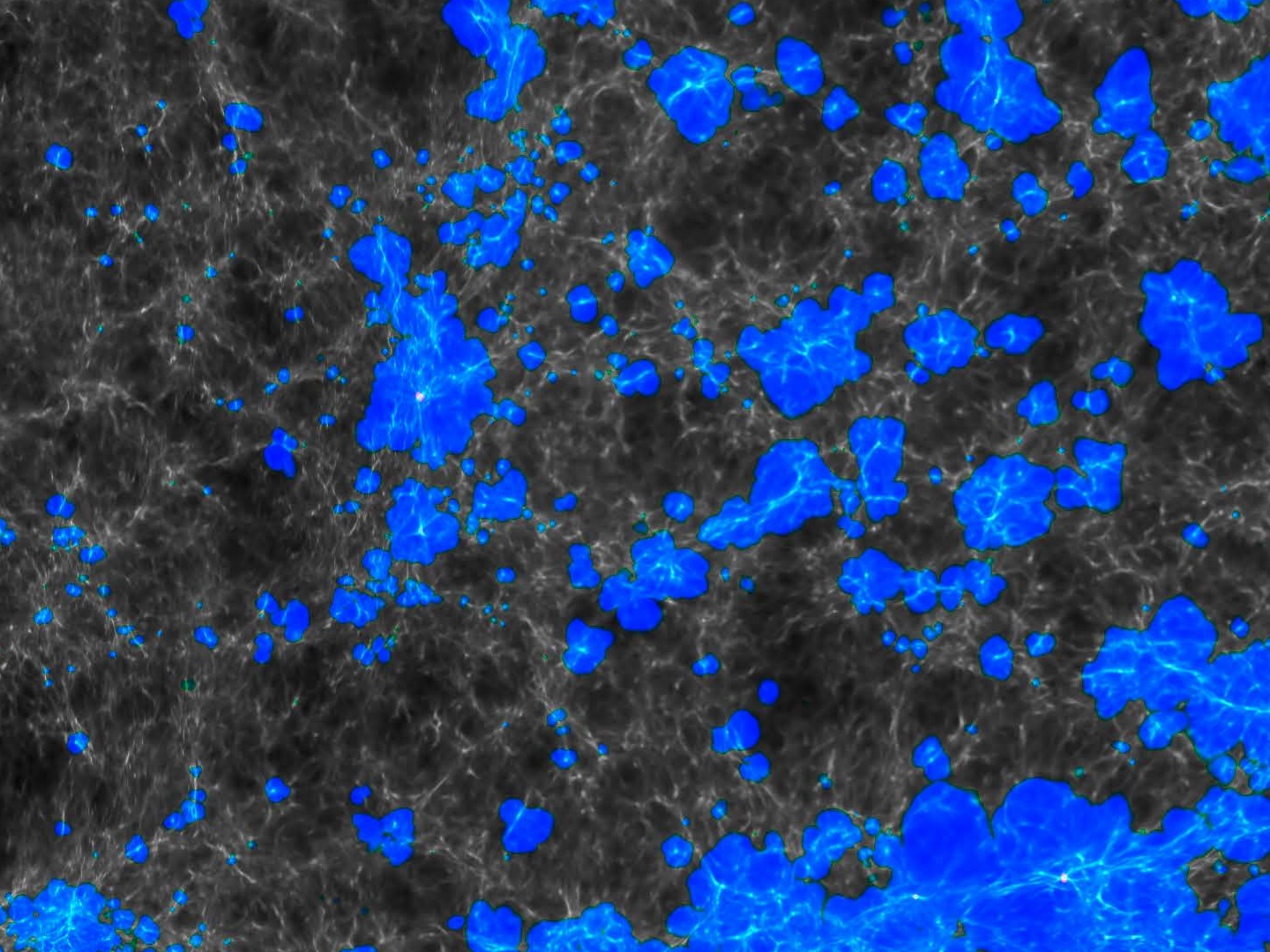
Ocvirk, Aubert, Sorce,  
**Shapiro**, Deparis,  
Dawoodbhoy, Lewis,  
Teyssier, Yepes,  
Gottloeber, Ahn, Iliev,  
Hoffman 2019, MNRAS  
submitted  
([arXiv:1811.11192](https://arxiv.org/abs/1811.11192))

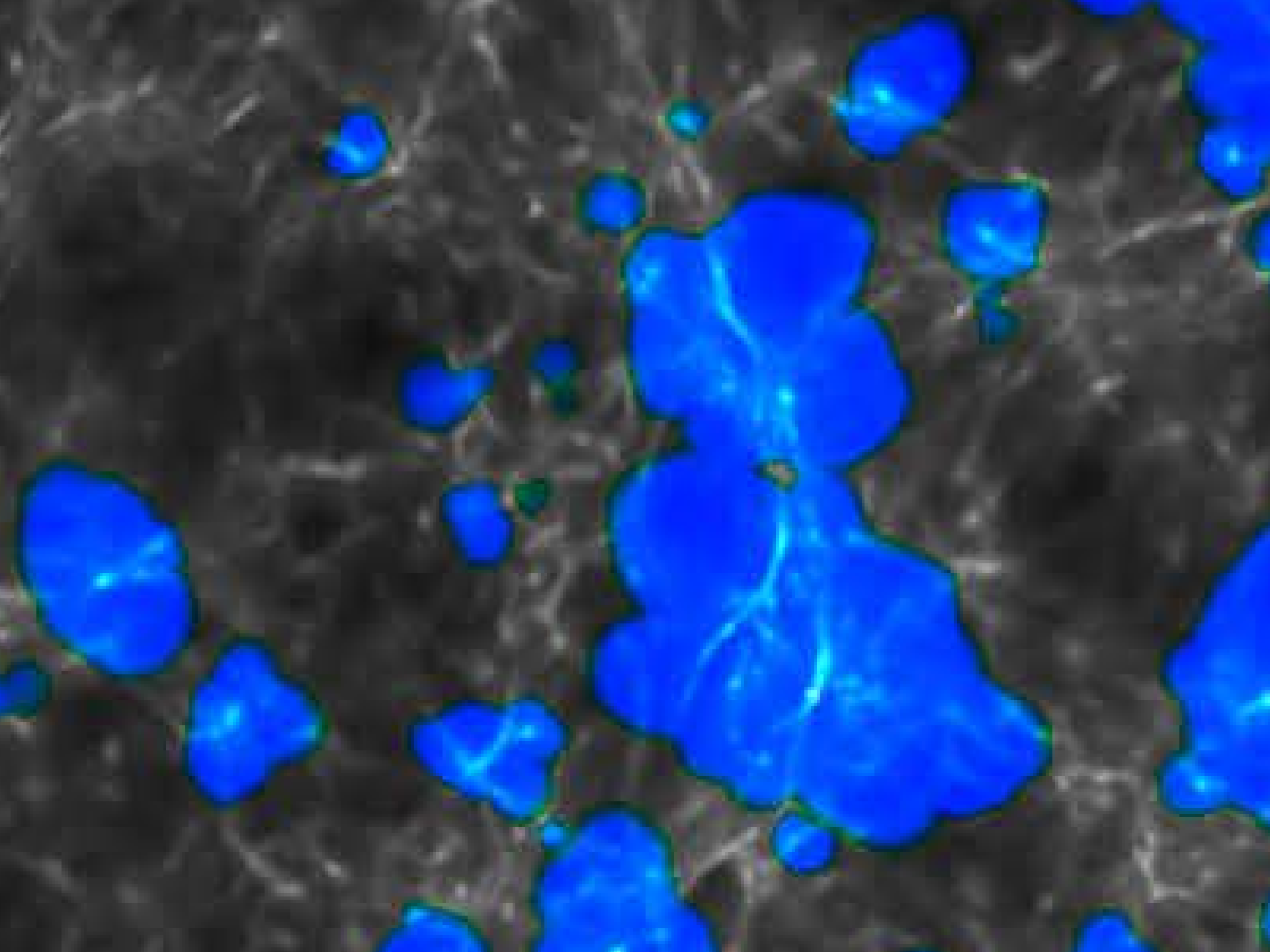


Cosmic Dawn II (Ocvirk et al. 2018)

← z







# CODA II

- Star formation efficiencies calibrated so reionization ends early enough:

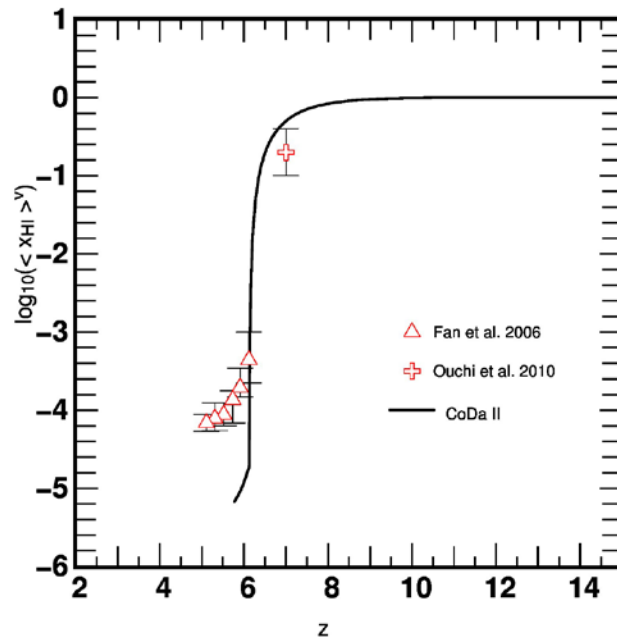
$$z_{\text{rei}} > 6$$

- Good agreement with observable constraints

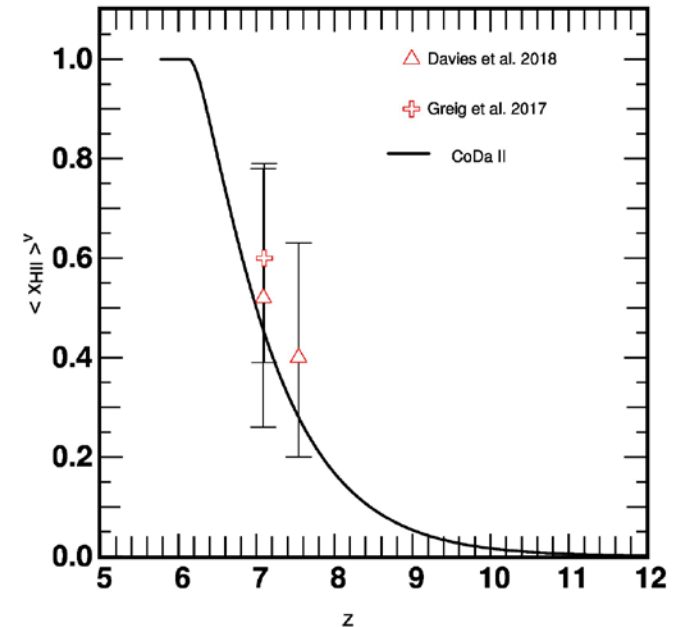
- Post-reionization neutral fraction (UV background) a bit low (high), respectively

→ gas clumping missing at small scales?

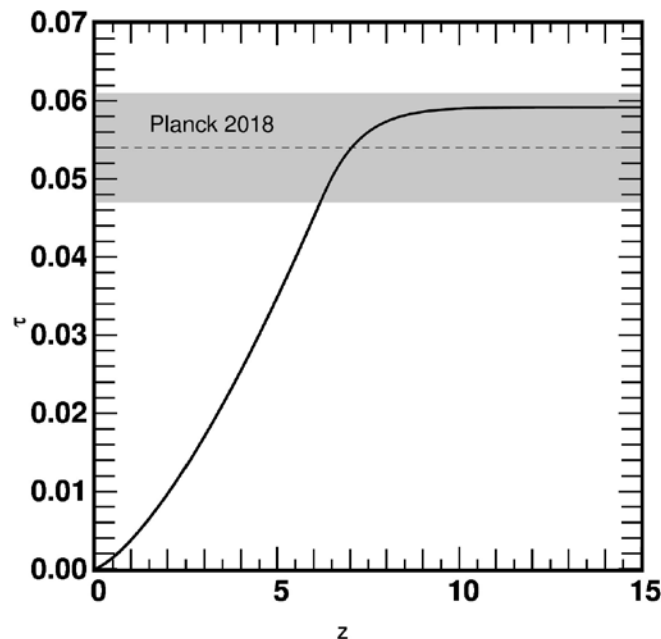
Neutral fraction  $x_{\text{HI}}$  (volume-weighted)



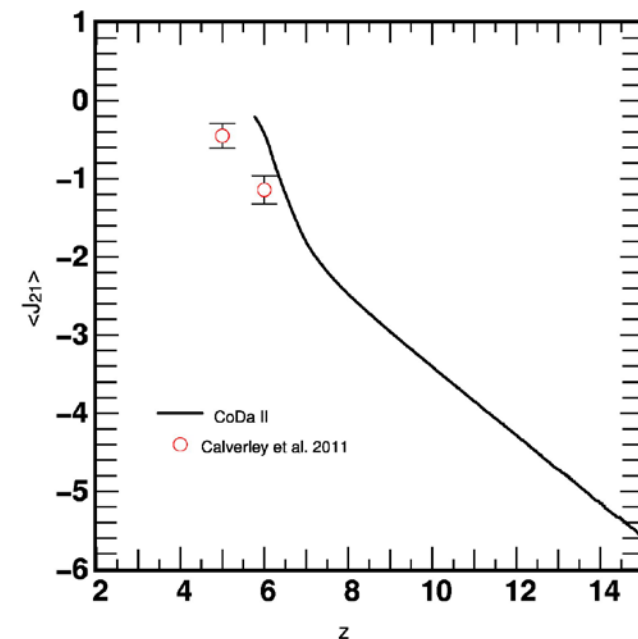
Ionized fraction  $x_{\text{HII}}$  (volume-weighted)



Thomson optical depth



UV flux





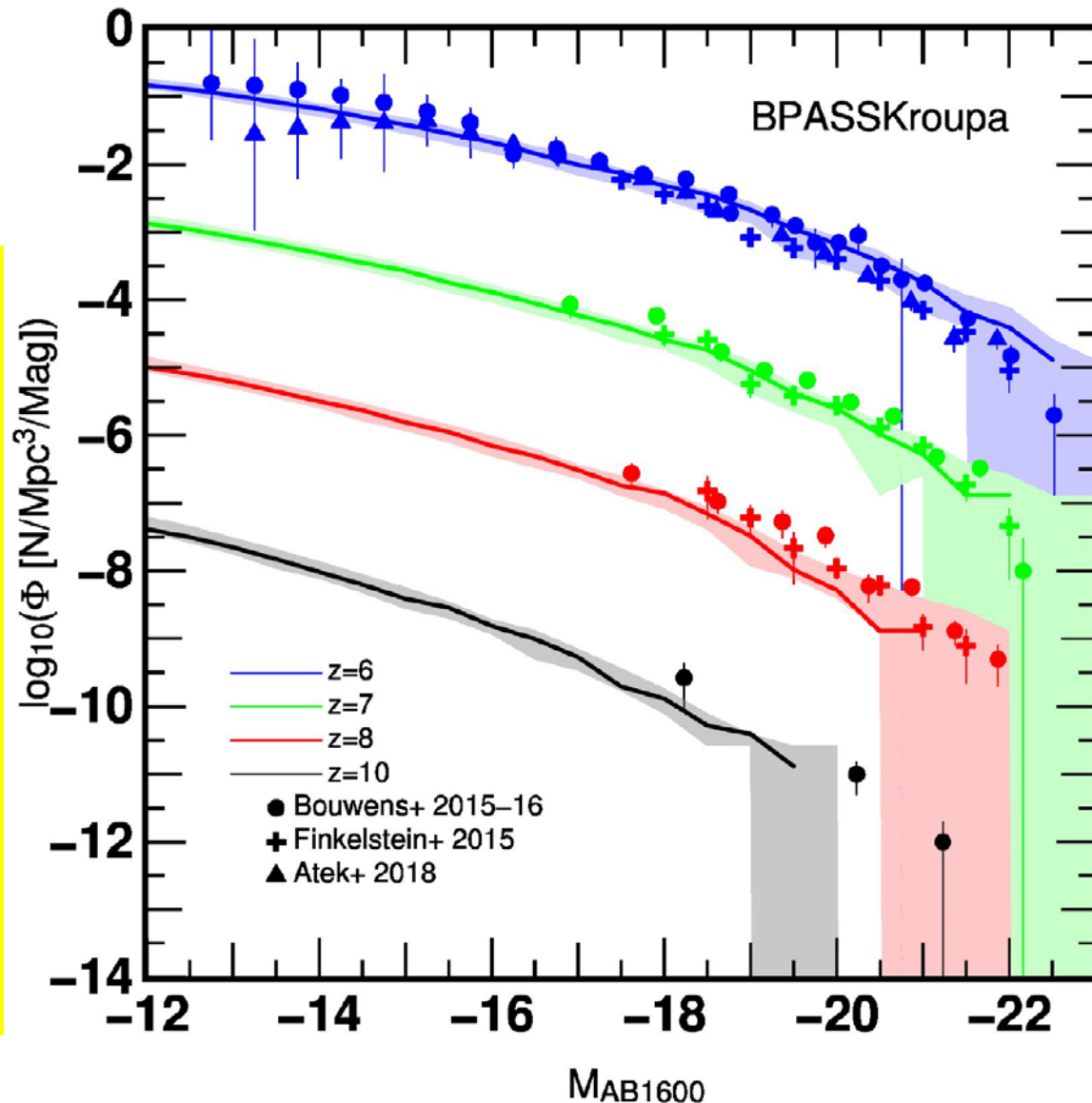
# UV Luminosity Function vs. Galaxy Observations from

Bouwens + (2015), (2016),  
Finkelstein + (2015),  
Atek + (2018)

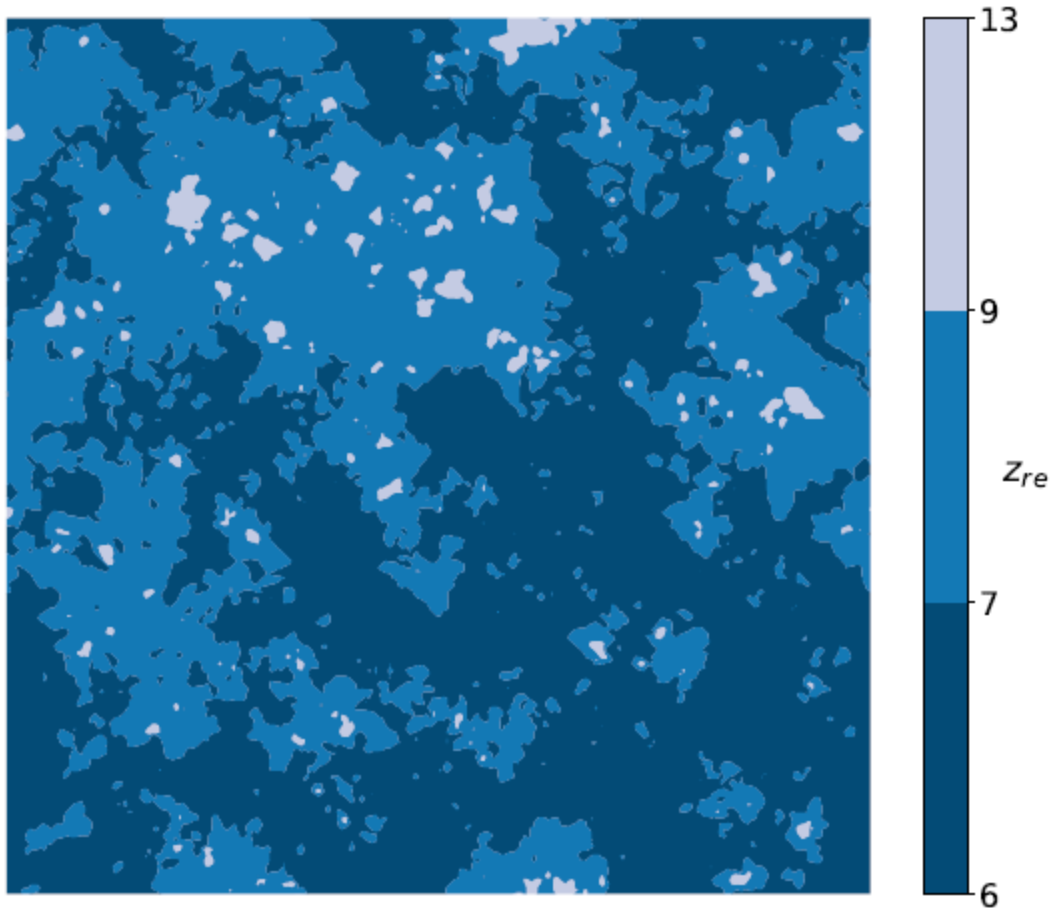
- Shaded areas and thick lines show the envelope and median of the LFs of 5 independent, rectangular subvolumes, each 1/5 full box volume, similar to CANDELS-DEEP volume at  $z = 6$
- $M_{AB1600}$  magnitudes computed using BPASS  $Z = 0.001$  binary population model (no dust) for each halo star particle, evolved since its birth-time, scaled to deliver the same ionizing photons released per 10 Myr

## CODA II

### CoDa II UV Luminosity Function



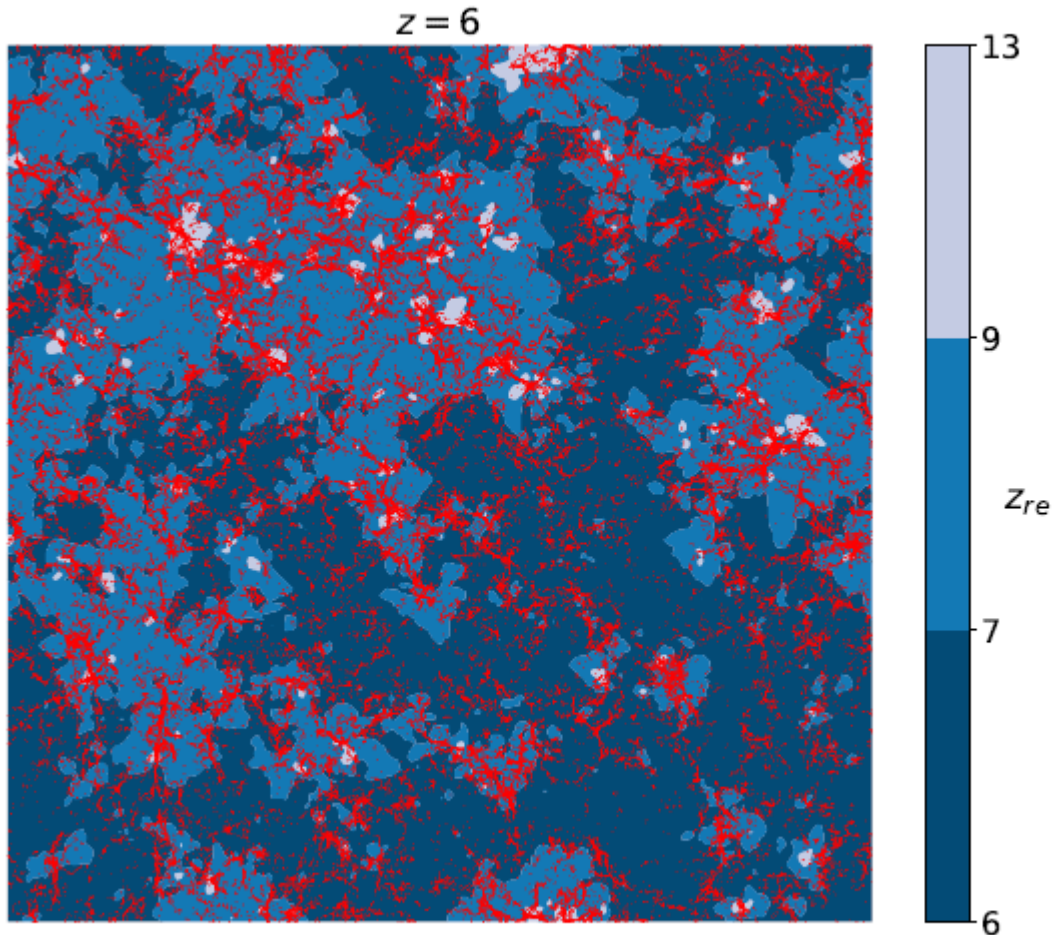
# The Inhomogeneous UV Luminosity Function of High-Redshift Galaxies



Reionization was inhomogeneous in time and space

# The Inhomogeneous UV Luminosity Function of High-Redshift Galaxies

Galaxies at  $z = 6$  superposed on reionization redshift map

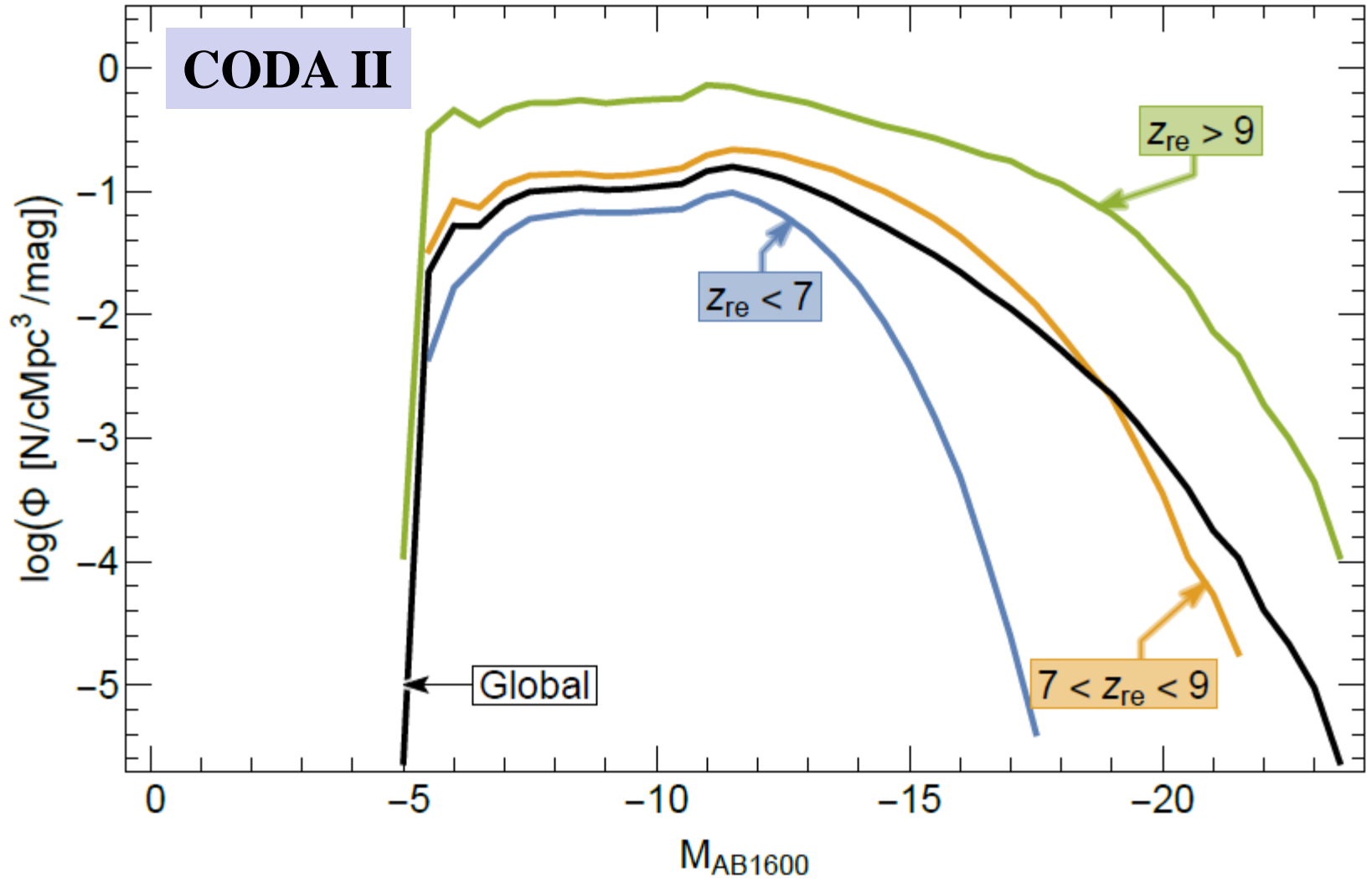


- Halo clustering correlates with reionization redshift → So must the high-redshift galaxy UV Luminosity Function!



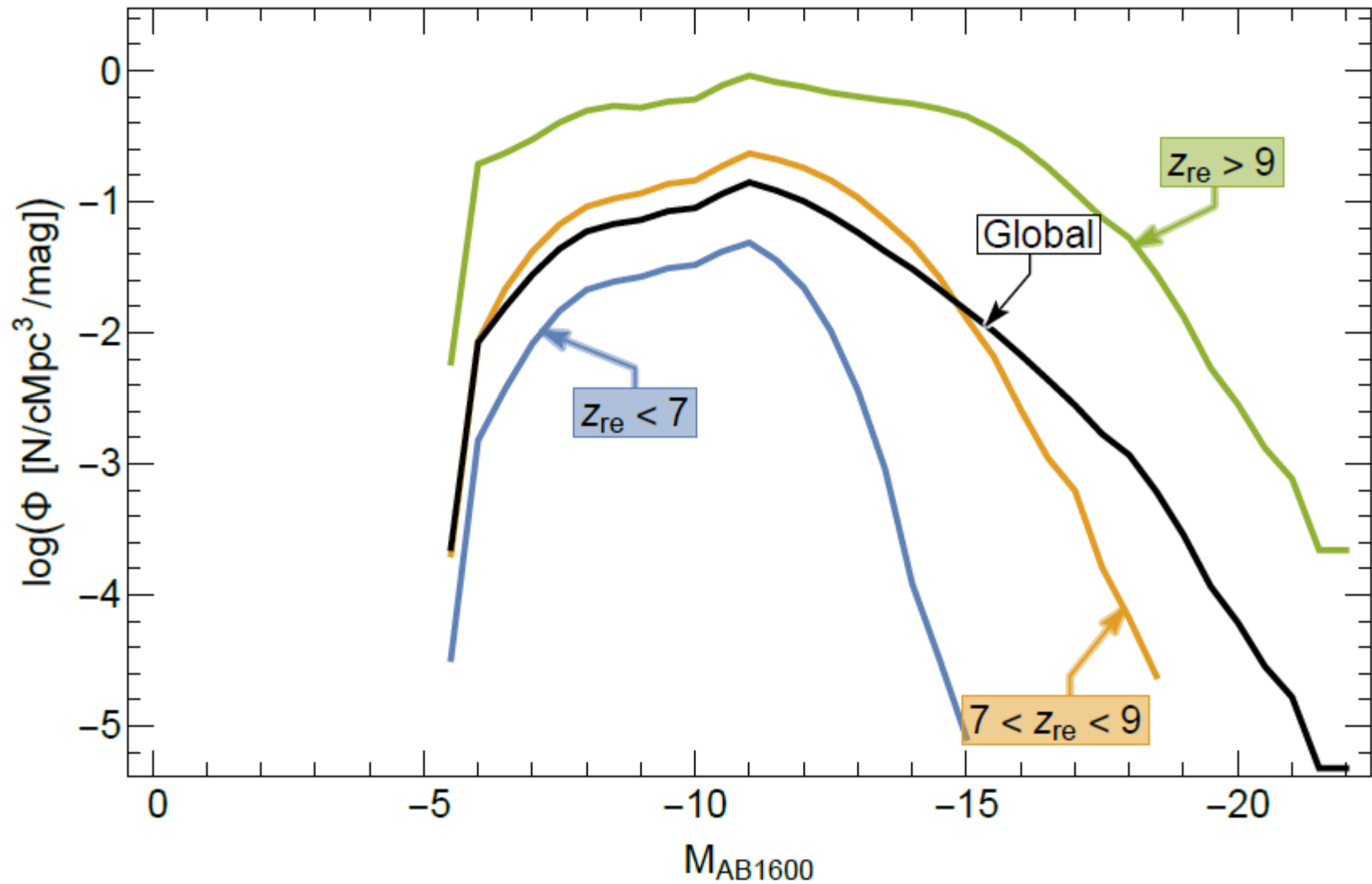
# The UV Luminosity Function of High-Redshift Galaxies is Inhomogeneous!

$z = 6$



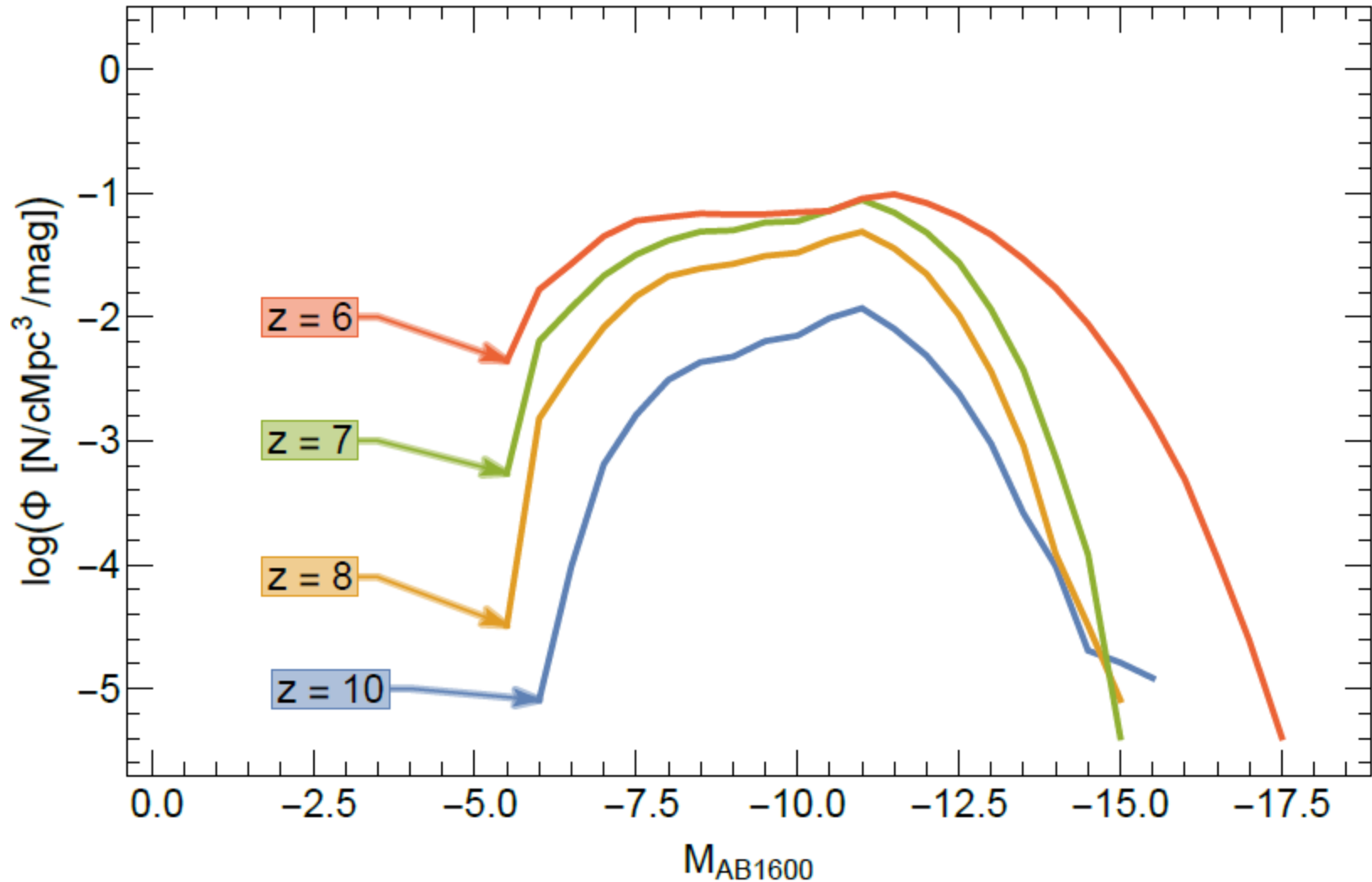
# The UV Luminosity Function of High-Redshift Galaxies is Inhomogeneous!

$z = 8$



# The UV Luminosity Function of High-Redshift Galaxies is Inhomogeneous!

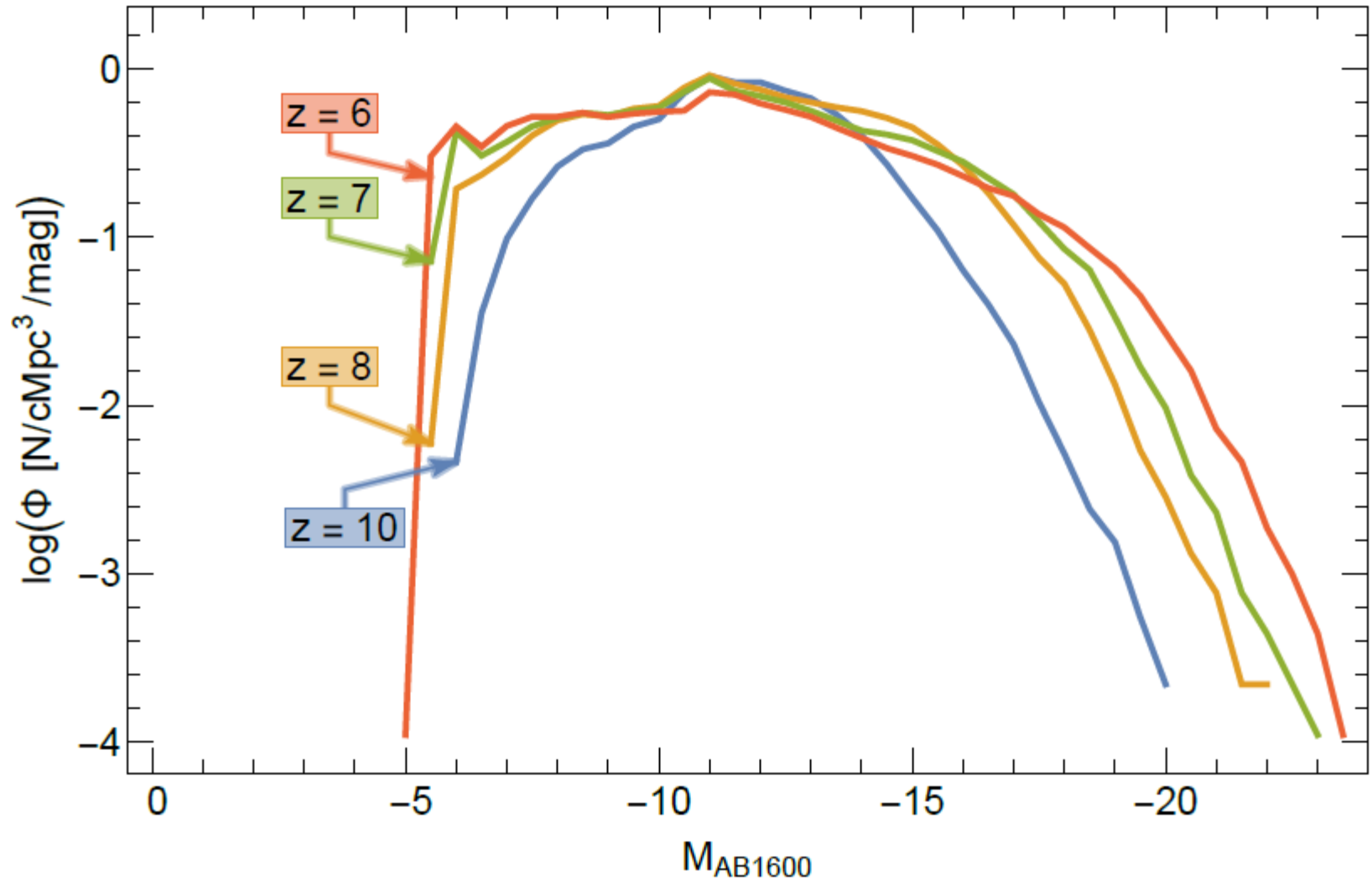
$$z_{\text{re}} < 7$$





# The UV Luminosity Function of High-Redshift Galaxies is Inhomogeneous!

$z_{re} > 9$



## Q: Why is the UV LF of galaxies inhomogeneous during the EOR?

**A:**

1. (SFR depends upon halo mass)  
+  
(halo mass function is inhomogeneous)
  
2. (SFR depends upon halo mass)  
+  
(reionization suppresses SFR in low-mass halos)  
+  
(reionization is inhomogeneous)
  
3. (SFR in ALL halos depends upon local reionization redshift)  
+  
(reionization is inhomogeneous)

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3. (SFR in ALL halos depends upon local reionization redshift)

**+**

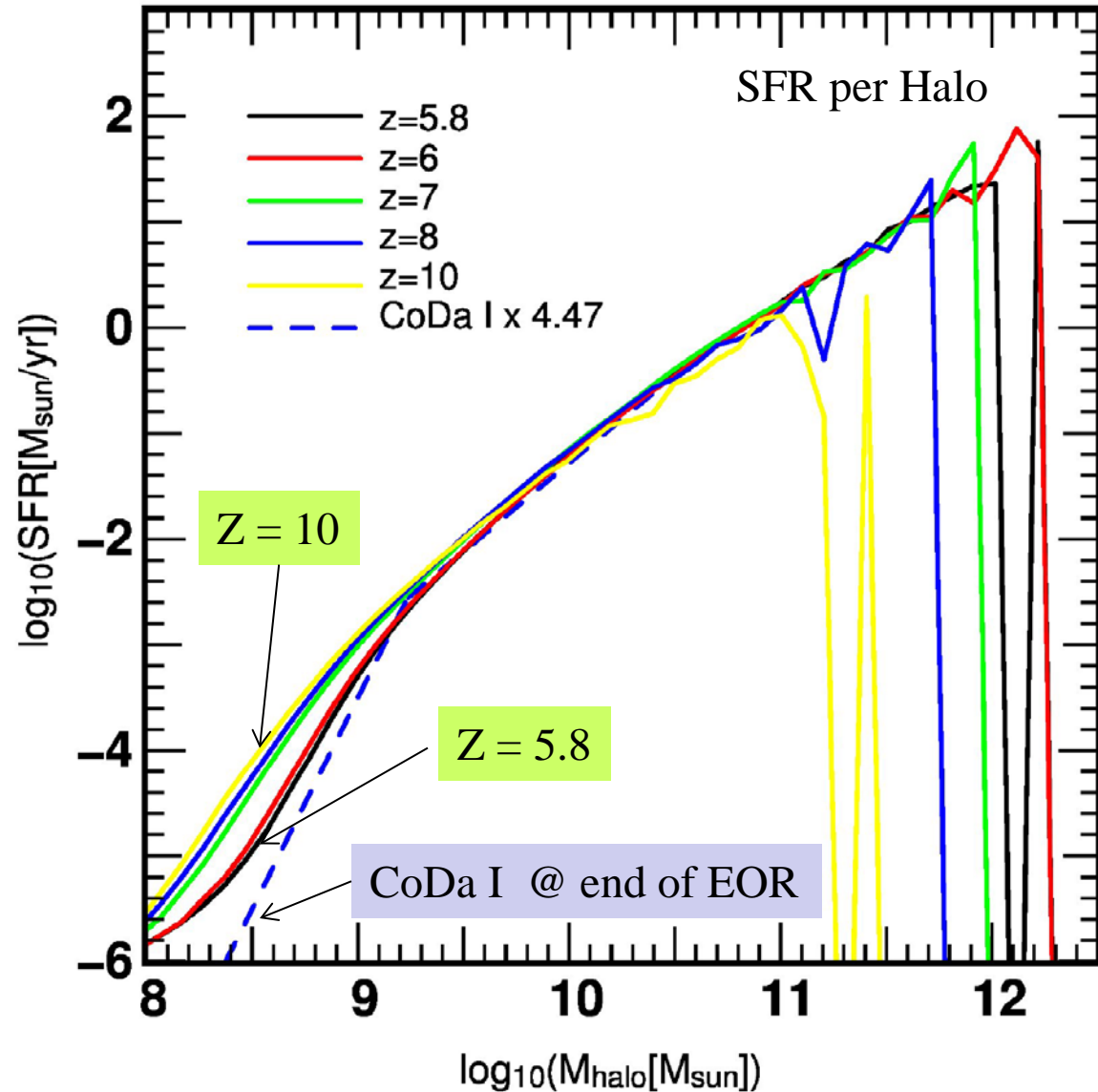
(reionization is inhomogeneous)



# CODA II

➤ Star formation rate (SFR) was higher in higher-mass haloes even **before** the low-mass haloes were suppressed by reionization

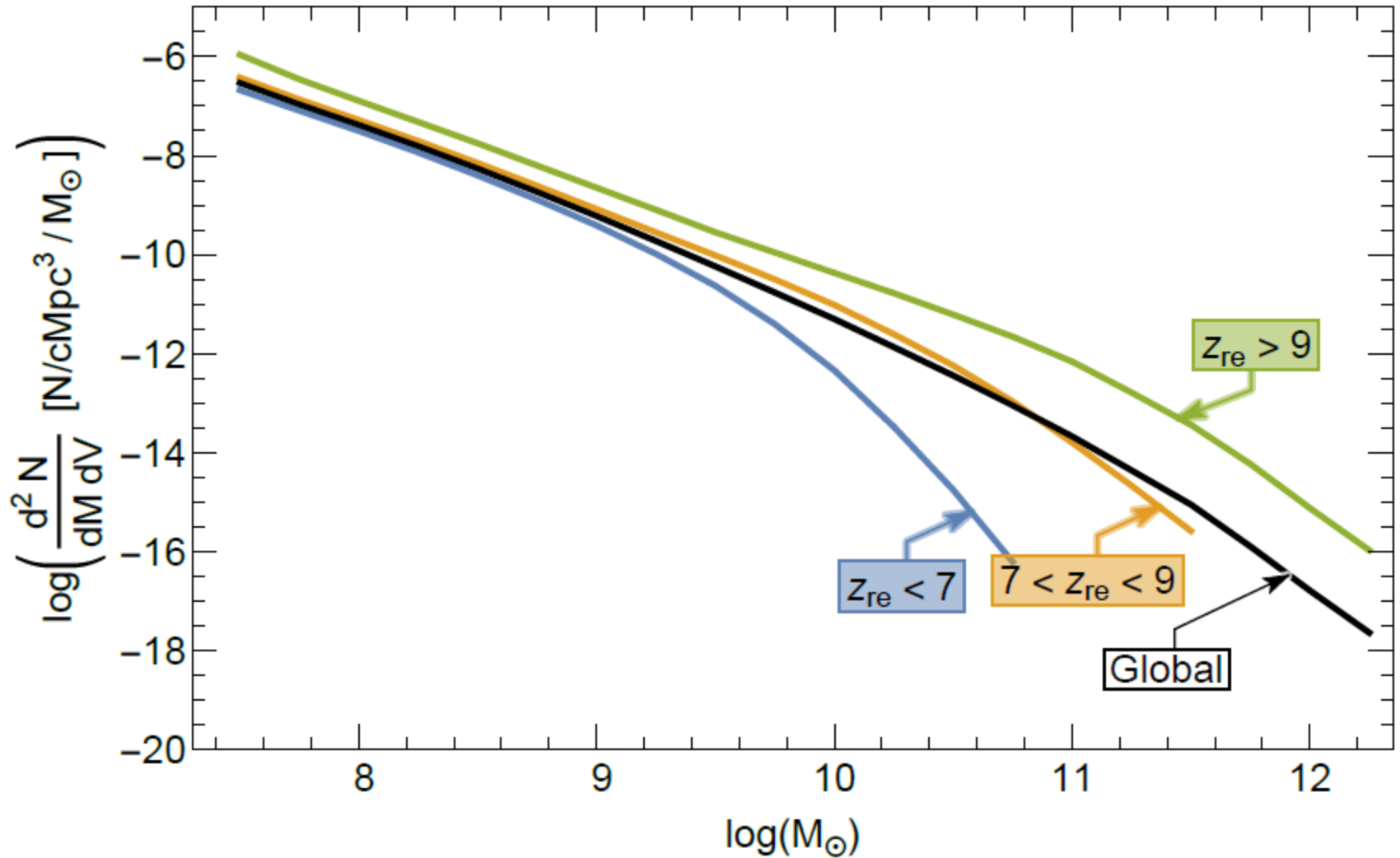
## Star formation rate CoDa II



- $\text{SFR} \propto M^\alpha$ ,  $\alpha \sim 1.4$  for  $M > 10^{10}$  solar masses, steepening below  $M \sim 10^9$ , but then drops sharply below  $M \sim 3 \times 10^9$  toward EOR end

# The Inhomogeneous Halo Mass Function of High-Redshift Galaxies

$z = 6$



**Q: Why is the UV LF of galaxies inhomogeneous during the EOR?**

**A:**

1. (SFR depends upon halo mass)

+

(halo mass function is inhomogeneous)

2. (SFR depends upon halo mass)

+

**(reionization suppresses SFR in low-mass halos)**

+

**(reionization is inhomogeneous)**

3. (SFR in ALL halos depends upon local reionization redshift)

+

(reionization is inhomogeneous)

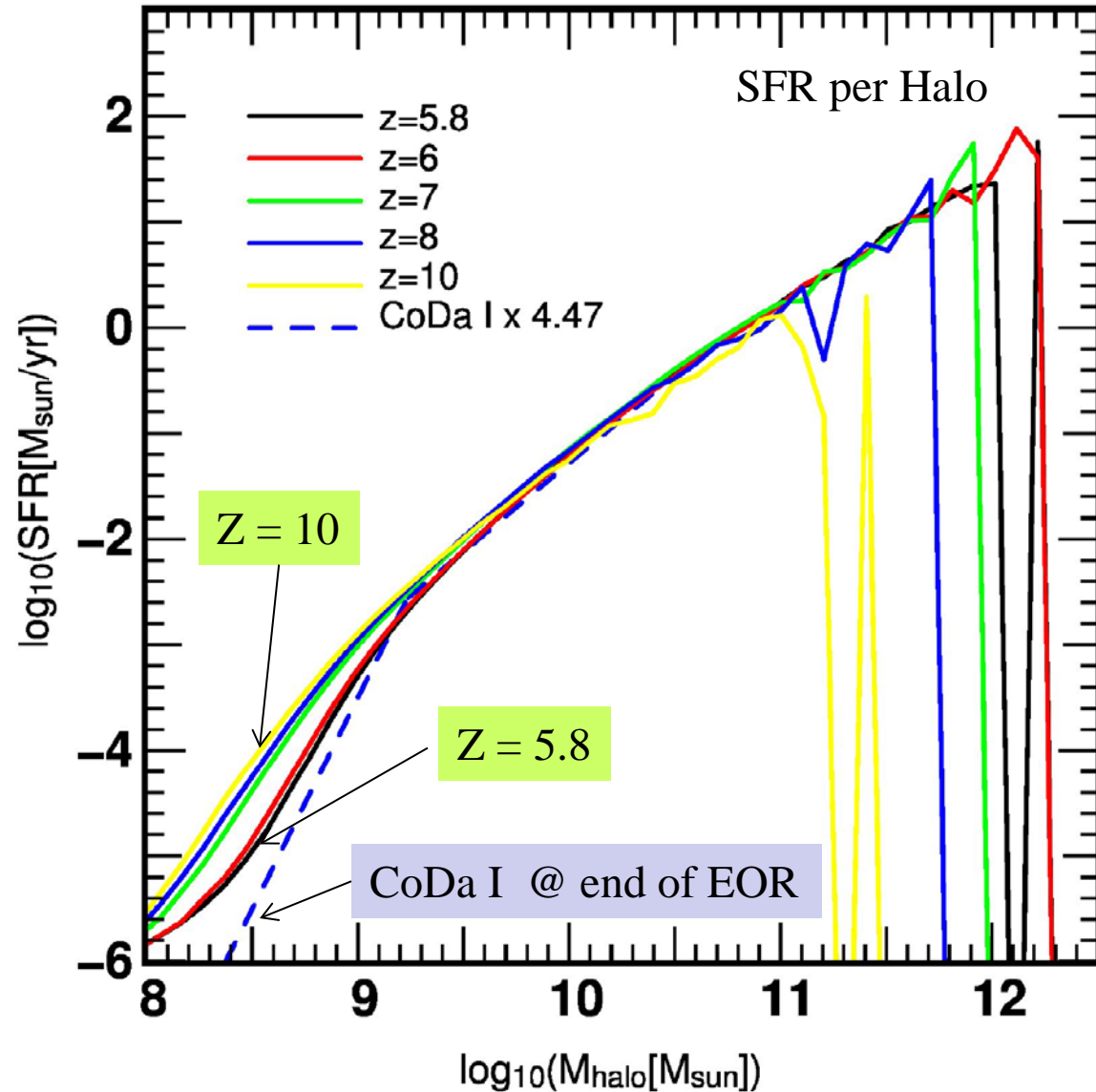


## CODA II

➤ Star formation rate (SFR) was higher in higher-mass haloes even **before** the low-mass haloes were suppressed by reionization

➤ Reionization suppresses star formation rate in dwarf galaxies, for  $M < 10^9$  solar masses

## Star formation rate CoDa II



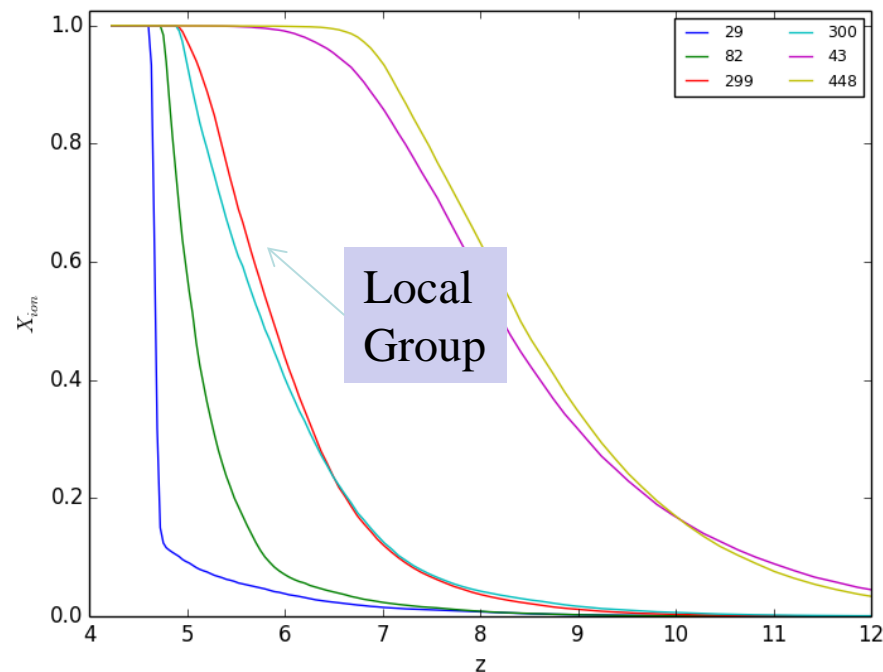
- $\text{SFR} \propto M^\alpha$ ,  $\alpha \sim 1.4$  for  $M > 10^{10}$  solar masses, steepening below  $M \sim 10^9$ , but then drops sharply below  $M \sim 3 \times 10^9$  toward EOR end

# Suppression of Star Formation in Low-Mass Galaxies Caused by the Reionization of their Local Patch

Dawoodbhoy, **Shapiro**, Ocvirk, Aubert, Gillet, Choi, Iliev, Teysier, Yepes, Knebe, Gottloeber, D'Aloisio, Park, Hoffman 2018, MNRAS, 480, 1740 (arXiv:1805.05358)

## Local Reionization: There Goes the Neighborhood!

- **Reionization history was different in different locations** → each point in space had its own redshift of local reionization,  $z_{\text{re}}(\mathbf{x})$
- From CoDa I, we computed local reionization redshift field  $z_{\text{re}}(\mathbf{x})$ , by smoothing underlying  $4096^3$  cells to  $256^3$  cells,  $0.357 \text{ cMpc}$  on a side. Each halo was assigned the value of  $z_{\text{re}}$  for its location.



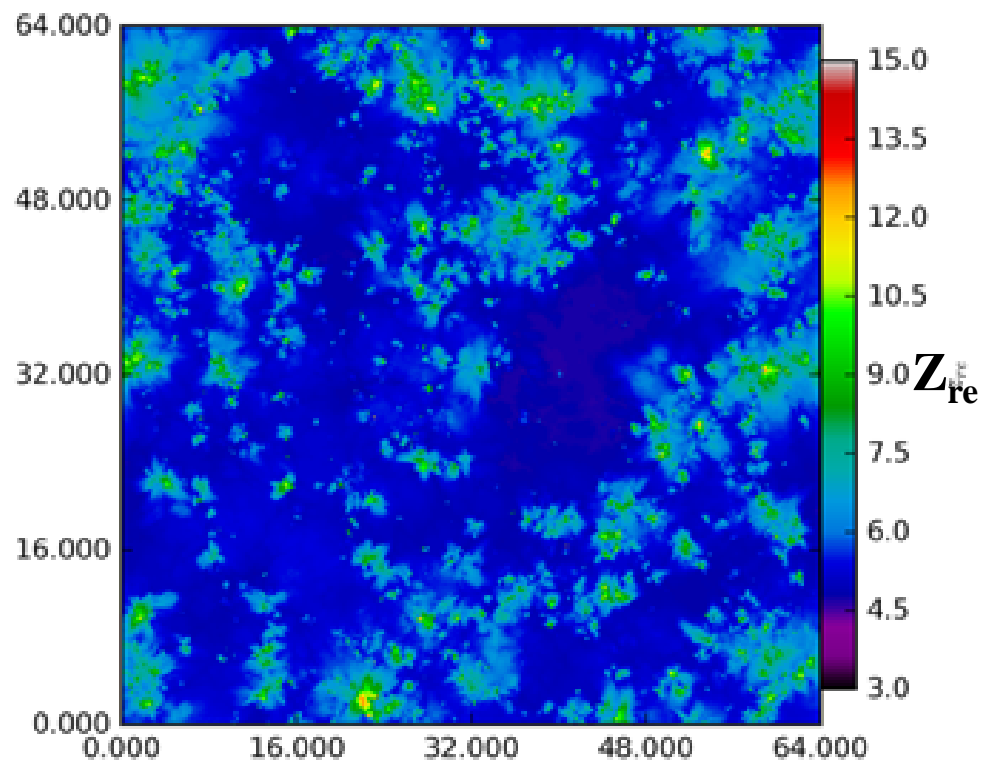
Zoom-In  $(4 h^{-1} \text{ cMpc})^3$  Subvolumes =  
(full simulation volume/4096)

# Suppression of Star Formation in Low-Mass Galaxies Caused by the Reionization of their Local Patch

Dawoodbhoy, **Shapiro**, Ocvirk, Aubert, Gillet, Choi, Iliev, Teyssier, Yepes, Knebe, Gottloeber, D'Aloisio, Park, Hoffman 2018, MNRAS, 480, 1740 ([arXiv:1805.05358](https://arxiv.org/abs/1805.05358))

- Local reionization redshift field resembles underlying cosmic web of dark matter, galaxies and IGM: density peaks reionized first, while voids and underdense regions reionized last and occupy the most volume.

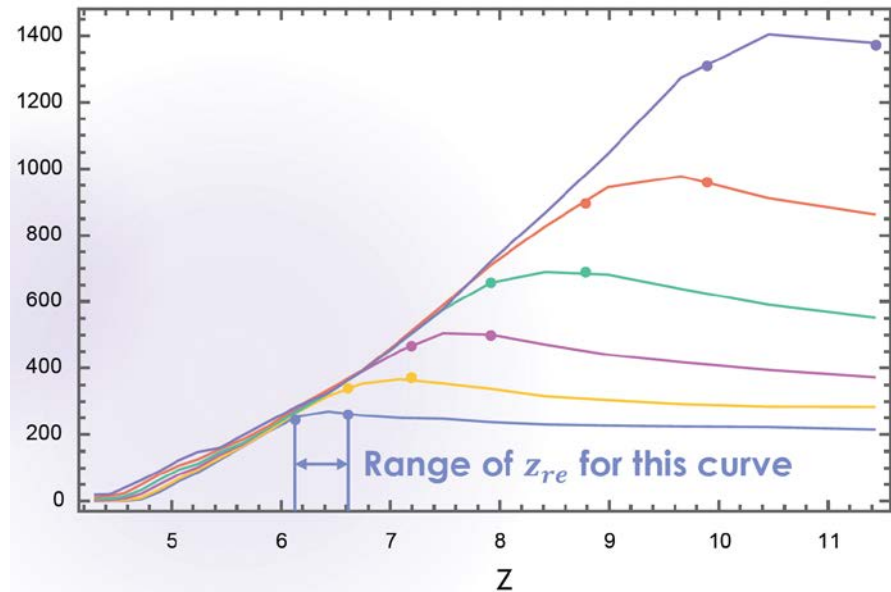
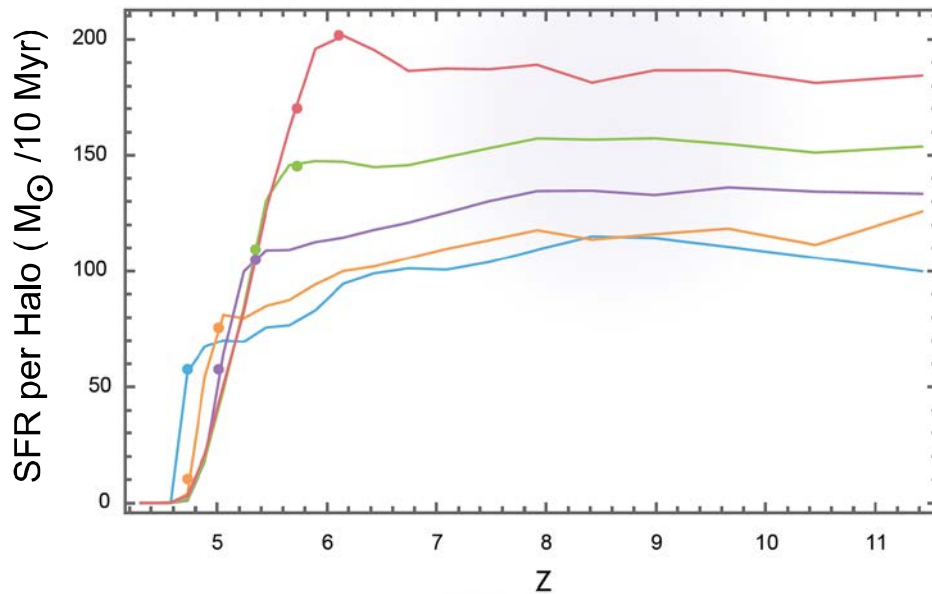
Local Reionization Redshift Field



# Local Reionization and Suppression of the SFR

- The globally-averaged suppression of SFR per halo in low-mass halos is actually the superposition of different *local* reionization and suppression histories.
- Grouping halos of different mass in bins of local reionization redshift  $z_{\text{re}}$  shows: **suppression of low-mass halos follows their *local* reionization!**

Low-Mass Halos:  $10^8 M_{\odot} < M < 10^9 M_{\odot}$

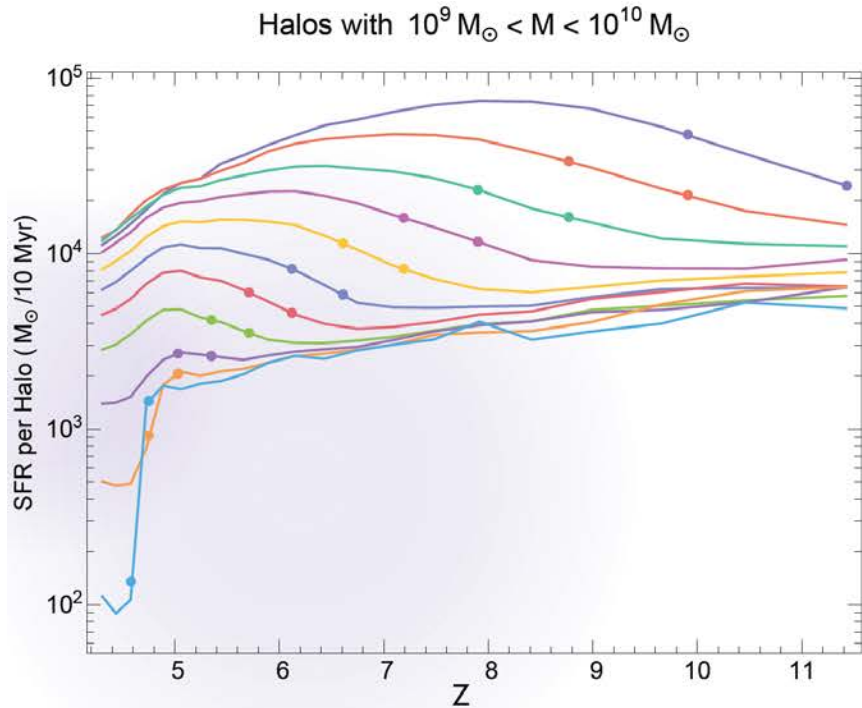


**SFR per halo vs. redshift for low-mass haloes,  $10^8\text{-}9 M_{\odot}$ , for different  $z_{\text{re}}$ : 2 dots on each curve indicate range of  $z_{\text{re}}$  for each bin.**

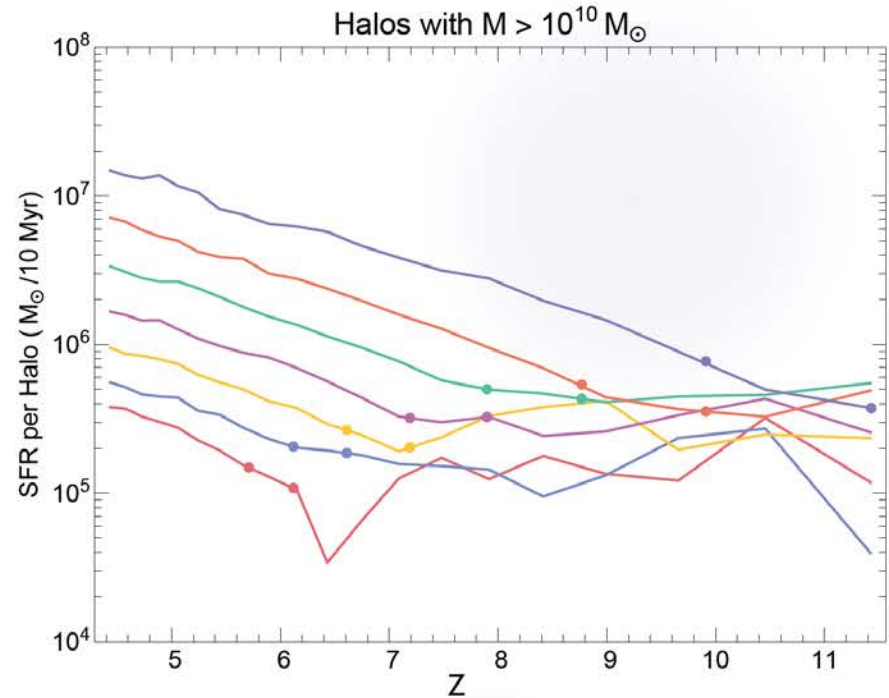


# Local Reionization and Suppression of the SFR

- Haloes of intermediate mass,  $10^9 - 10^{10} M_{\odot}$ , show suppression, too, but weaker and with a delayed turn-over.
- High-mass haloes, above  $10^{10} M_{\odot}$ , show increasing mass-bin-averaged SFRs per halo, with no suppression turn-over.



Weaker and delayed suppression



No suppression

**SFR per halo vs. redshift for haloes of intermediate-mass ( $10^9-10^{10} M_{\odot}$ ) and high-mass ( $> 10^{10} M_{\odot}$ ), for different  $z_{\text{re}}$ : 2 dots on each curve indicate range of  $z_{\text{re}}$  for each bin (left = intermediate-mass, right = high-mass).**

**Q: Why is the UV LF of galaxies inhomogeneous during the EOR?**

**A:**

1. (SFR depends upon halo mass)

+

(halo mass function is inhomogeneous)

2. (SFR depends upon halo mass)

+

(reionization suppresses SFR in low-mass halos)

+

(reionization is inhomogeneous)

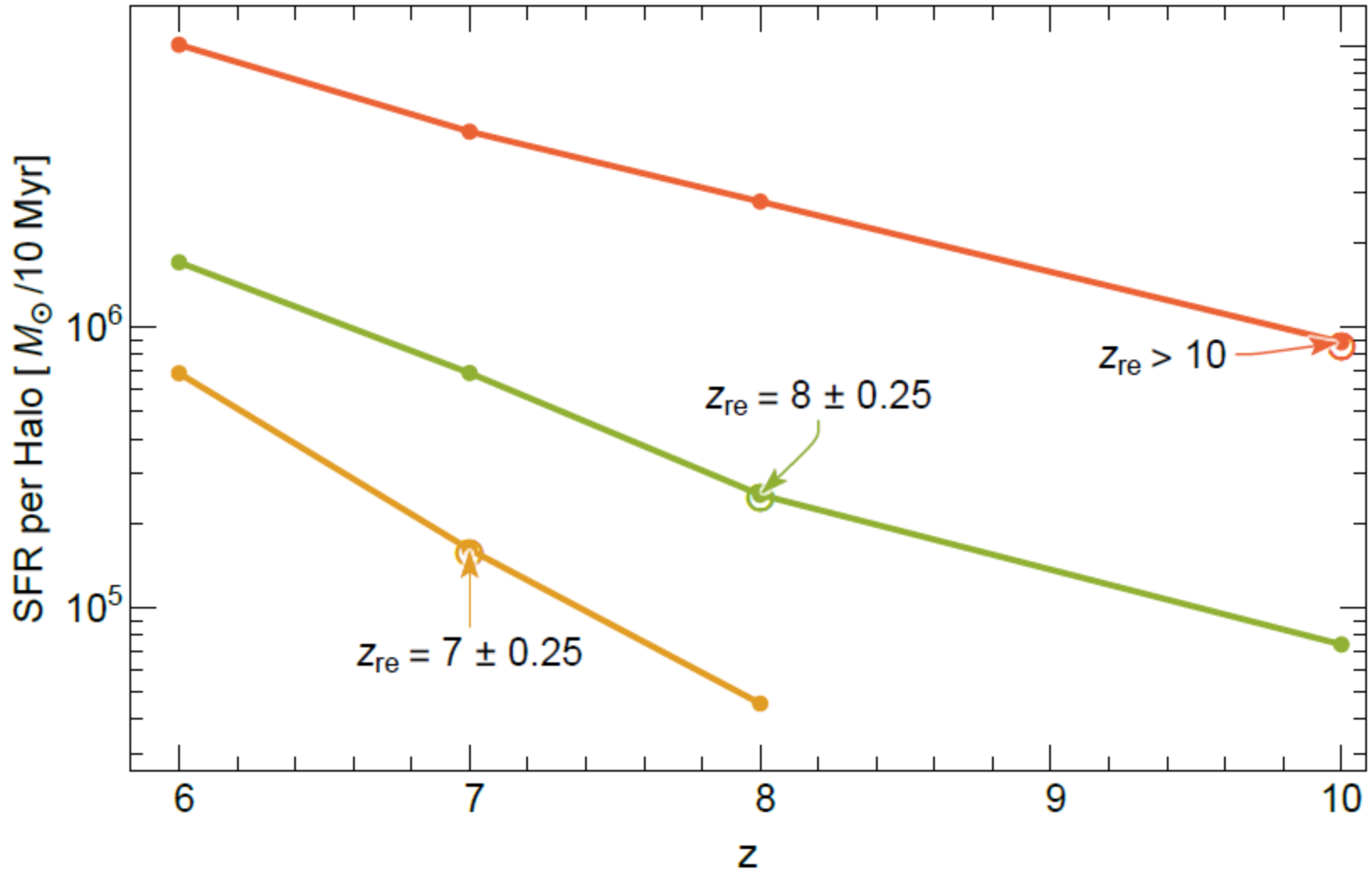
3. (SFR in ALL halos depends upon local reionization redshift)

+

(reionization is inhomogeneous)

CoDa II SFR in high-mass halos unsuppressed following local reionization → it just keeps rising

$$M / M_{\odot} > 10^{10}$$

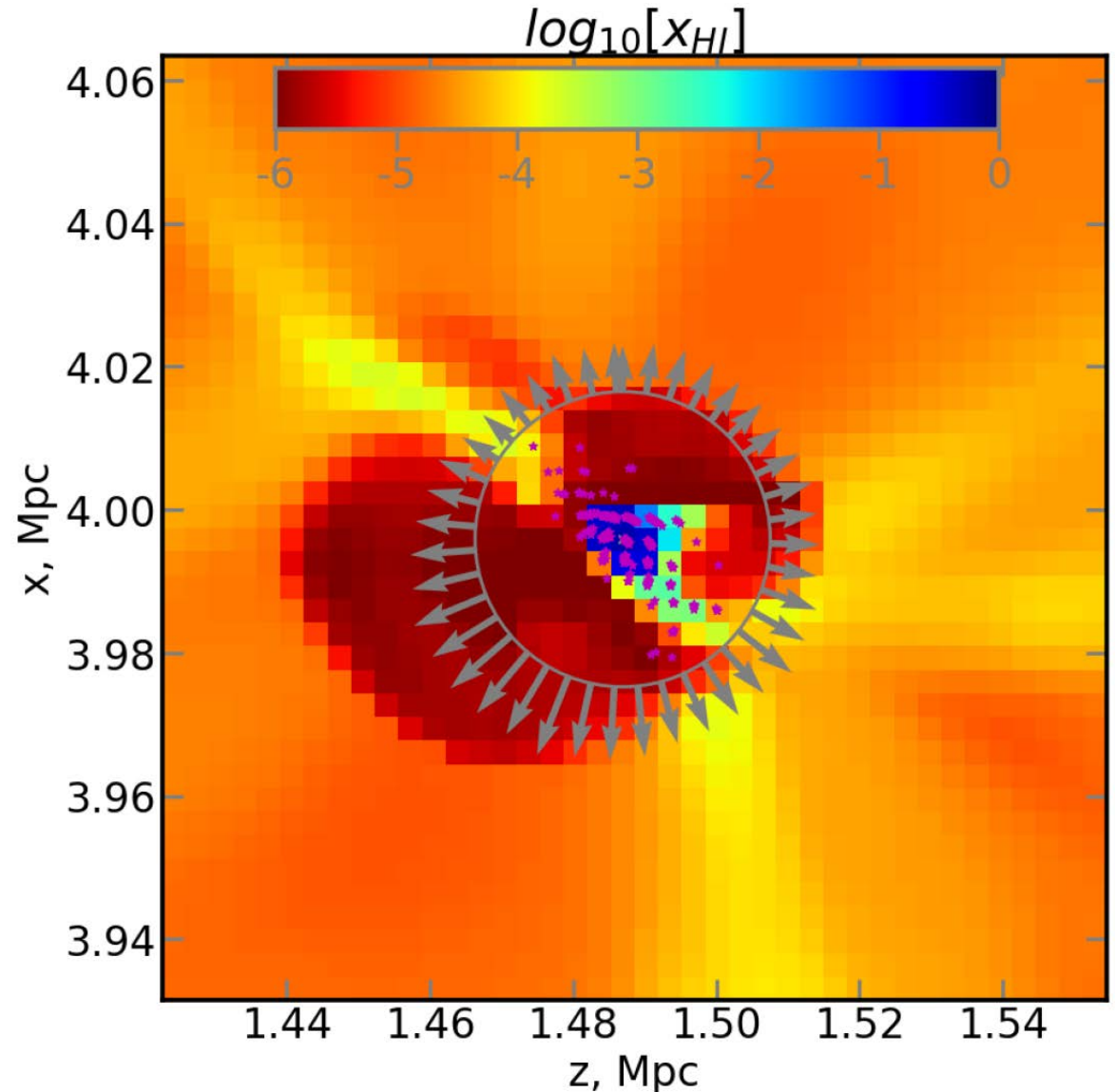


# CoDa II: Galaxy Escape Fractions and the Ionizing Photon Budget

Lewis, Ocvirk, Shapiro, Aubert, et al 2019, to be submitted

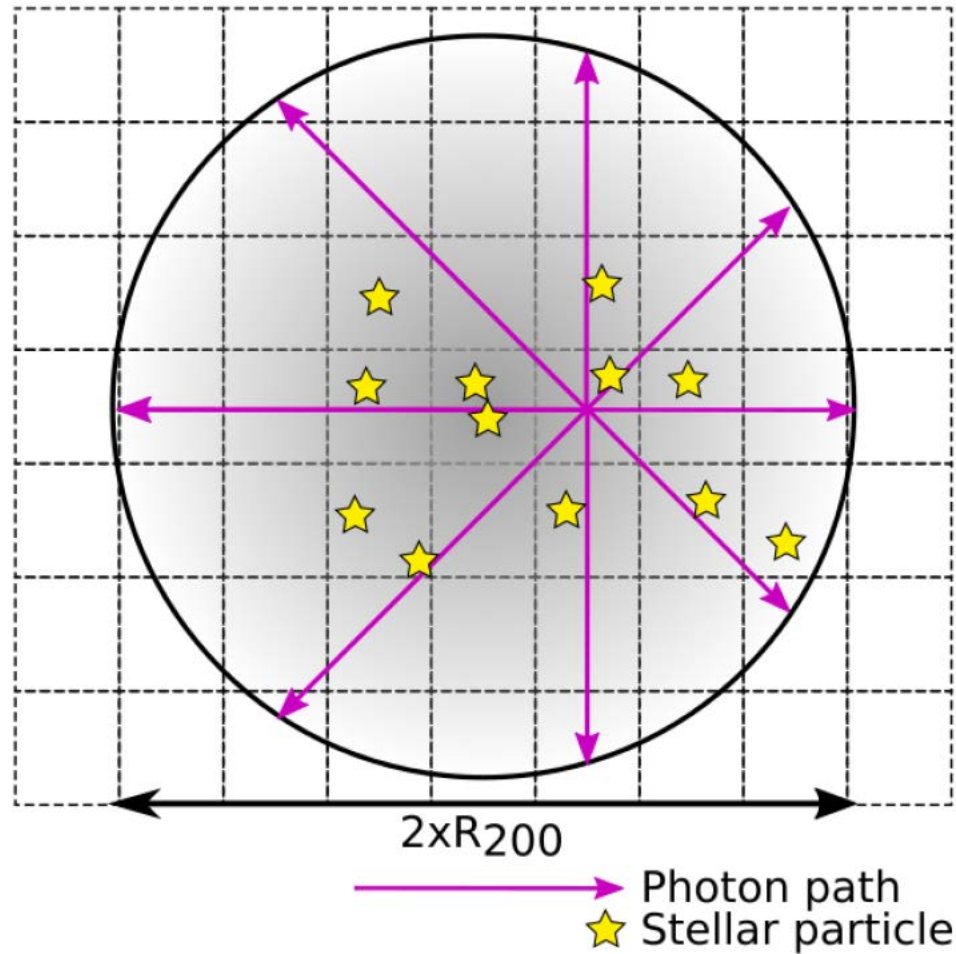
Zoom-in on a single halo at  $z = 6$  with  $M \sim 10^{10} M_{\text{solar}}$

- Pink symbols are young star particles
- Circle is virial radius  $r_{200}$
- Circle is region from which we compute  $f_{\text{esc}}$  by ray-tracing
- Arrows show the escaping ionizing radiation flux



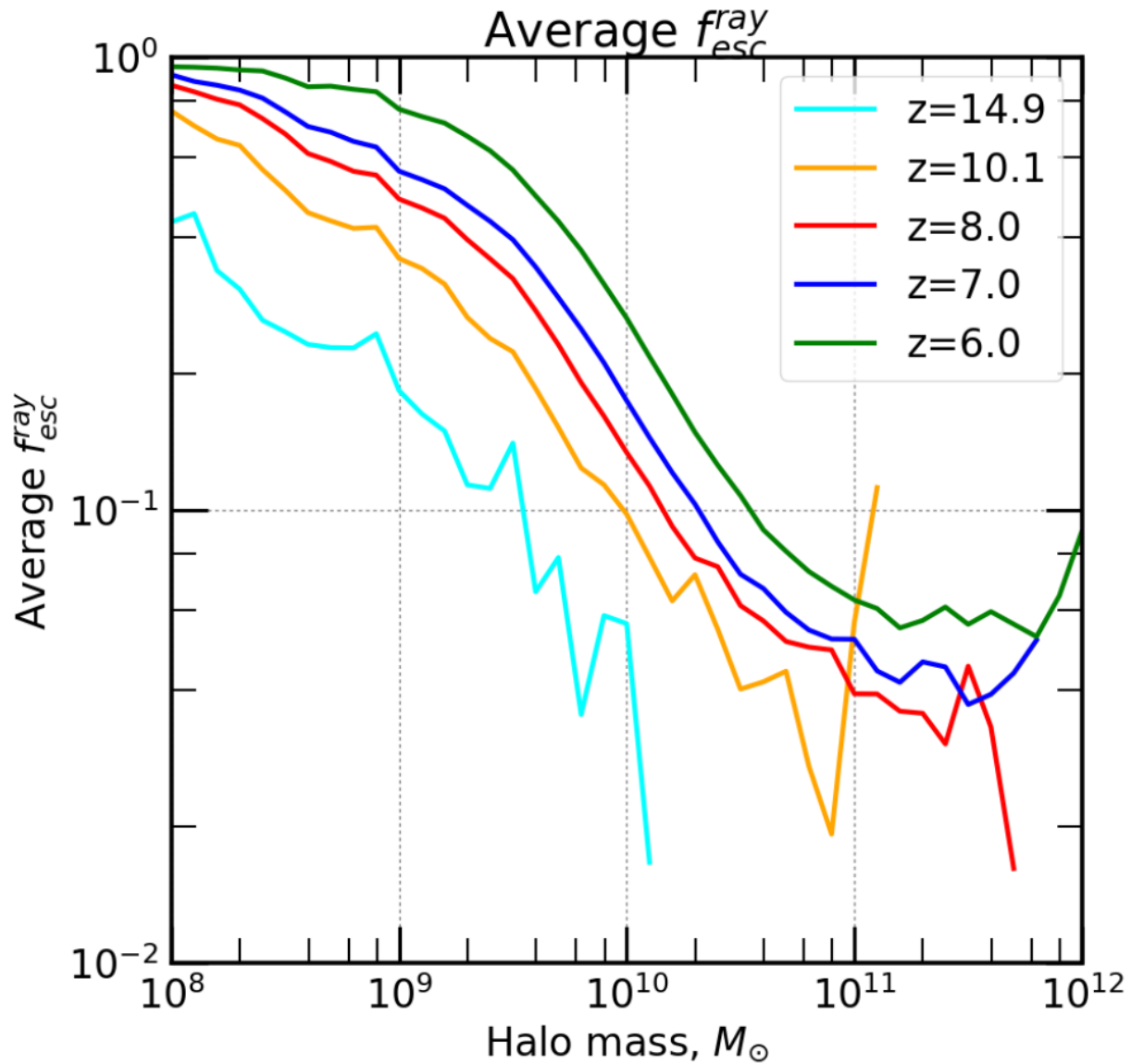
# f\_esc: ray-tracing starlight from each halo cell

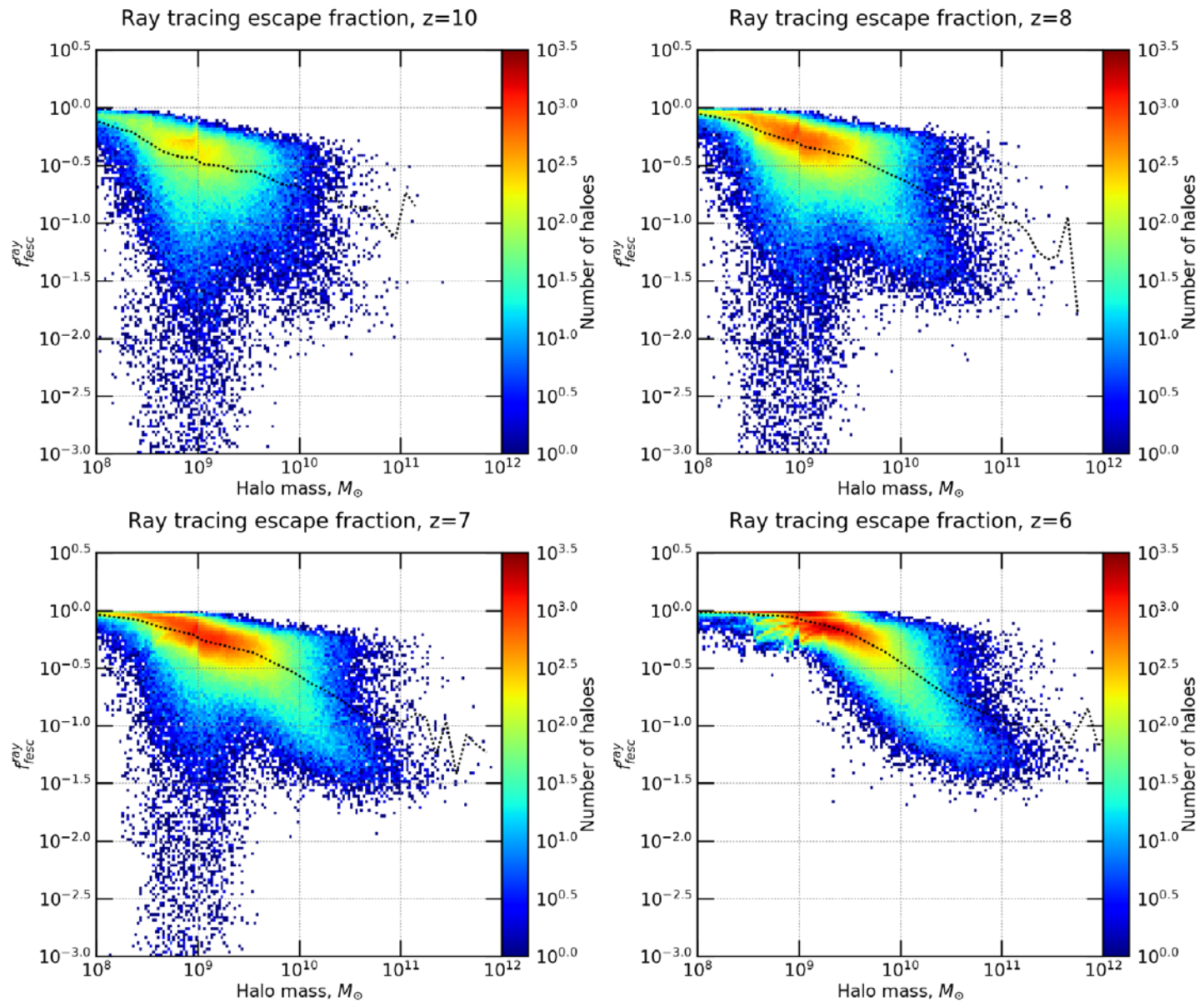
Example paths from a source cell





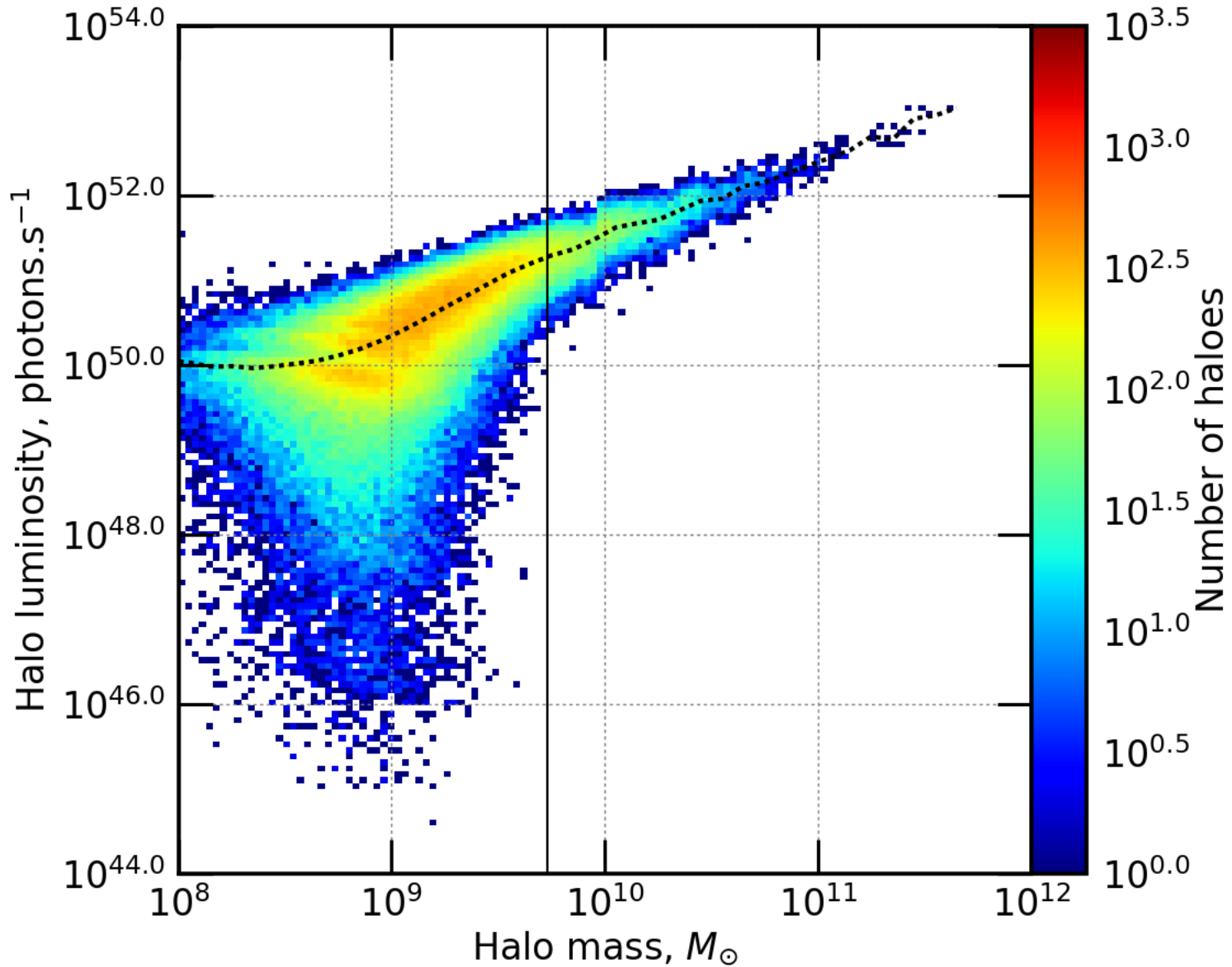
- $f_{\text{esc}}$  is higher for low-mass halos, decreasing with halo mass
- $f_{\text{esc}}$  for a given  $M_{\text{halo}}$  increases over time during the EOR





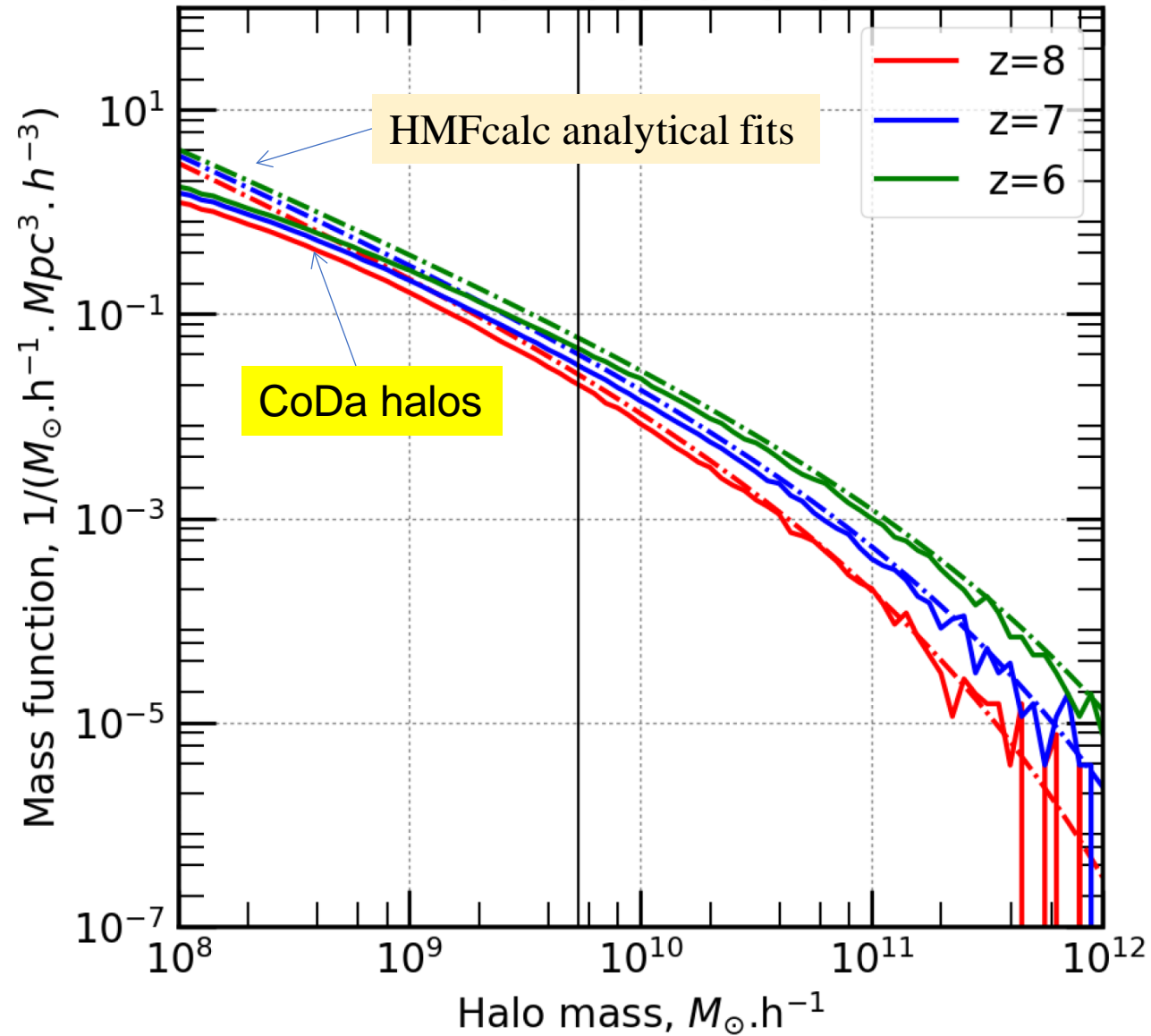
- There is a significant scatter in  $f_{\text{esc}}$  about the mean relationship vs. halo mass at the same redshift, greater at low mass

# Halo Mass-Luminosity distribution, $z=8$



- Ionizing photon luminosity per halo depends on  
 $f_{\text{esc}} \times \text{SFR}$
- Higher  $f_{\text{esc}}$ 's at low mass offset higher SFR's at higher mass

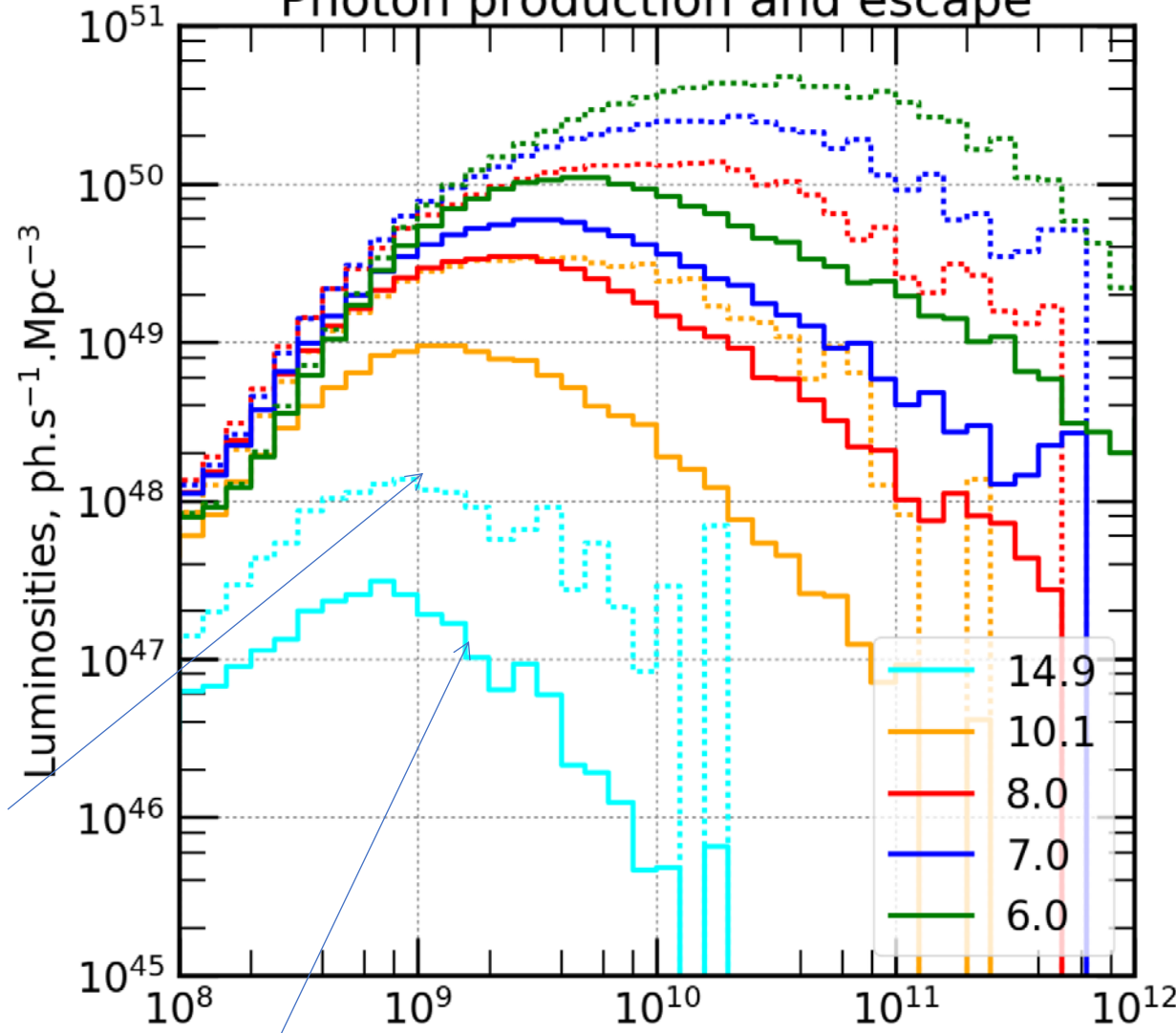
## Halo mass function



- The contribution of halos of different mass to the total ionizing photon emissivity of galaxies during the EOR also depends on the halo mass function.

# Photon production and escape

- The halo mass range that dominates the total rate of photon release is *lower* than the mass range that dominates the total SFR density, since  $f_{\text{esc}}$  is lower for higher-mass halos.

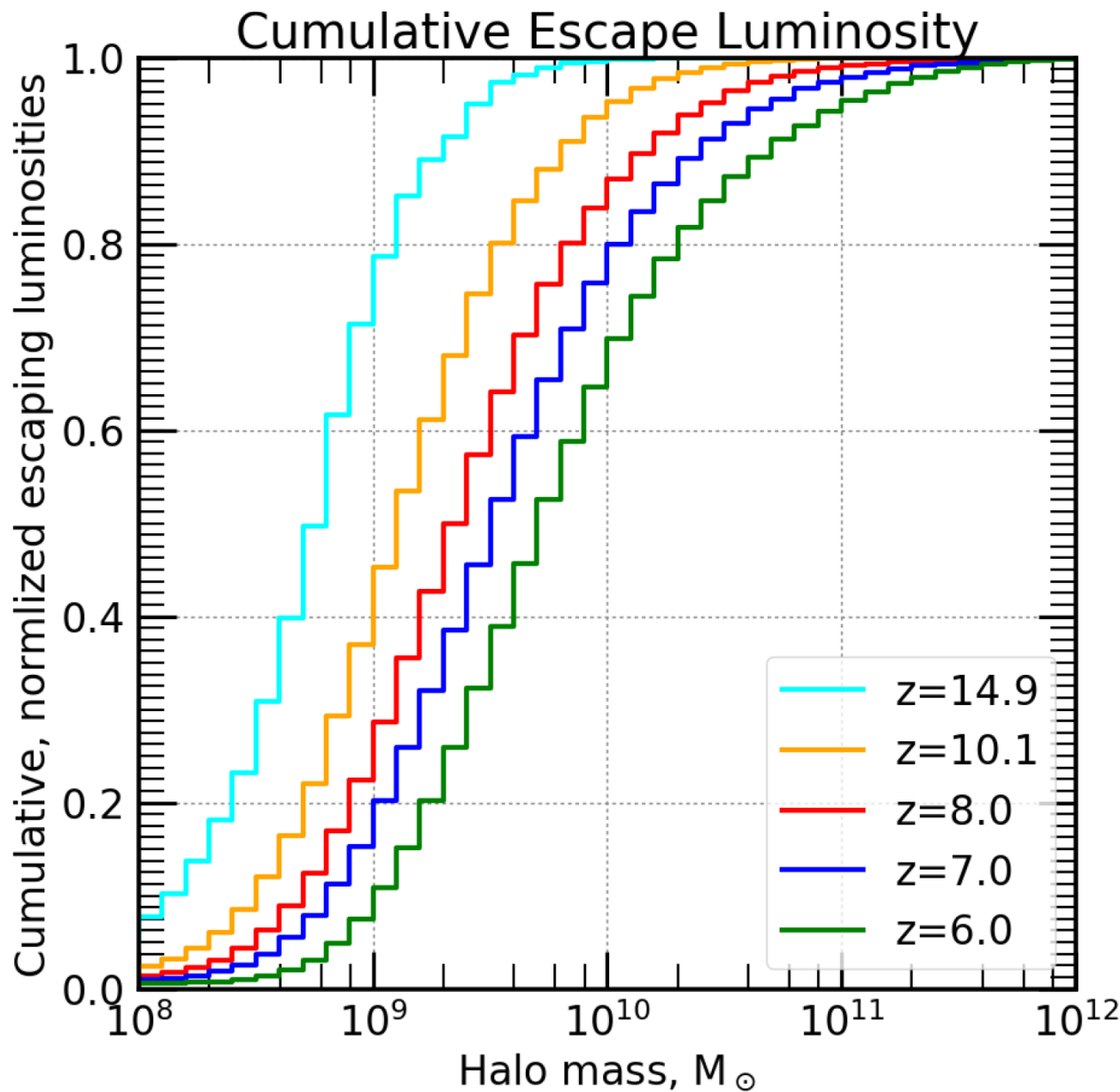


Unattenuated luminosity

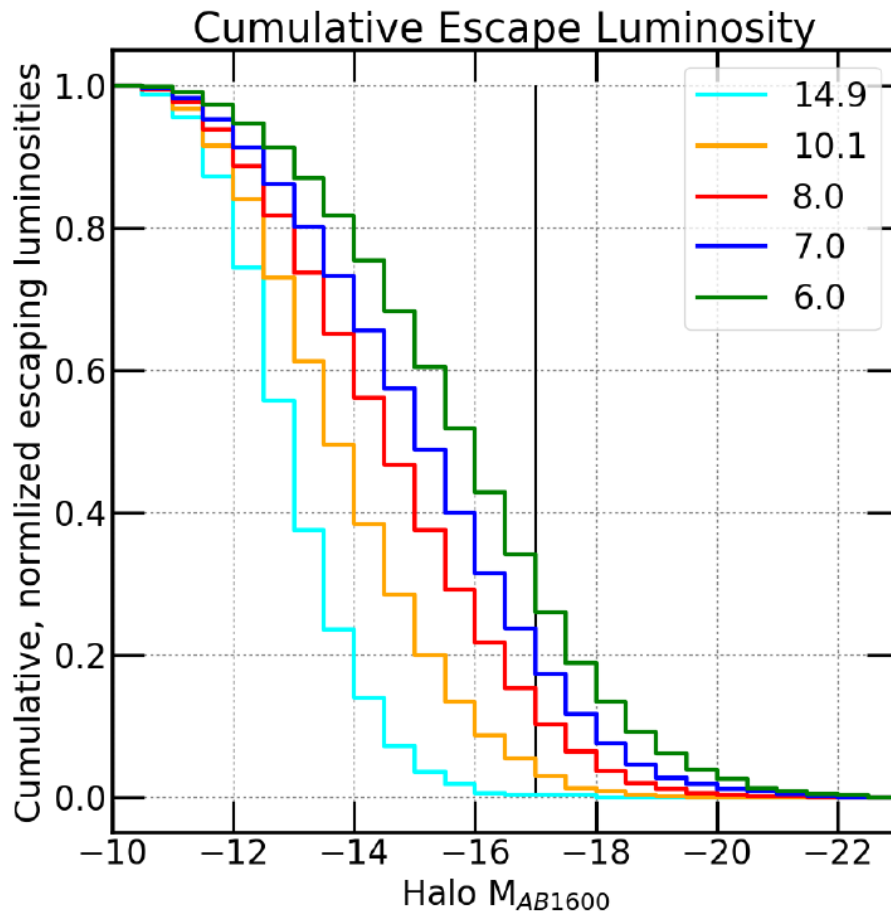
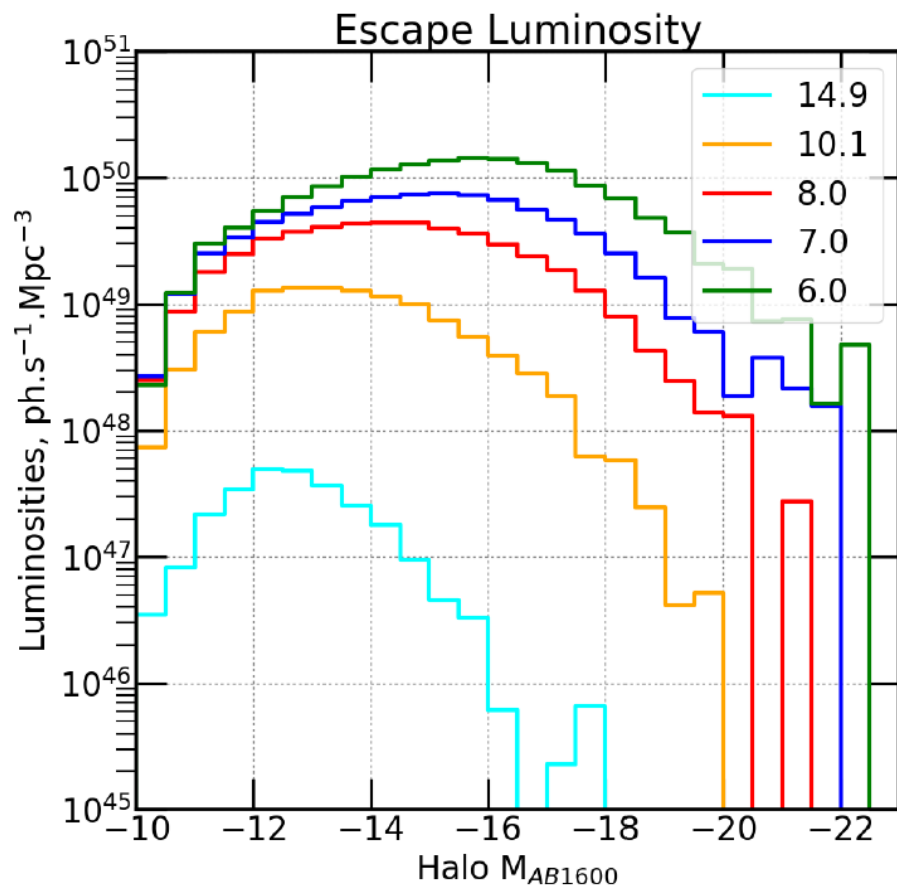
Escaping luminosity



- When  $\langle x_{\text{H II}} \rangle = 0.5$   
at  $z \sim 7$ ,  $\sim 80\%$  of ionizing photons released come from halos between  $10^9$  and  $4 \times 10^{10} M_{\text{solar}}$
- When  $\langle x_{\text{H II}} \rangle = 0.1$   
at  $z \sim 8.5$ ,  $\sim 80\%$  come from  $M < \sim 5 \times 10^9 M_{\text{solar}}$



# Which galaxies in the UV luminosity function dominate reionization?



➤ Galaxies with  $M_{AB1600}$  between -13 and -18 dominate reionization at  $z = 6 - 8$

➤ Deep surveys in cluster fields (e.g. Bouwens + 2017; Atek + 2018) may soon detect galaxies responsible for  $> 80\%$  of reionization photons at  $z = 6 - 8$