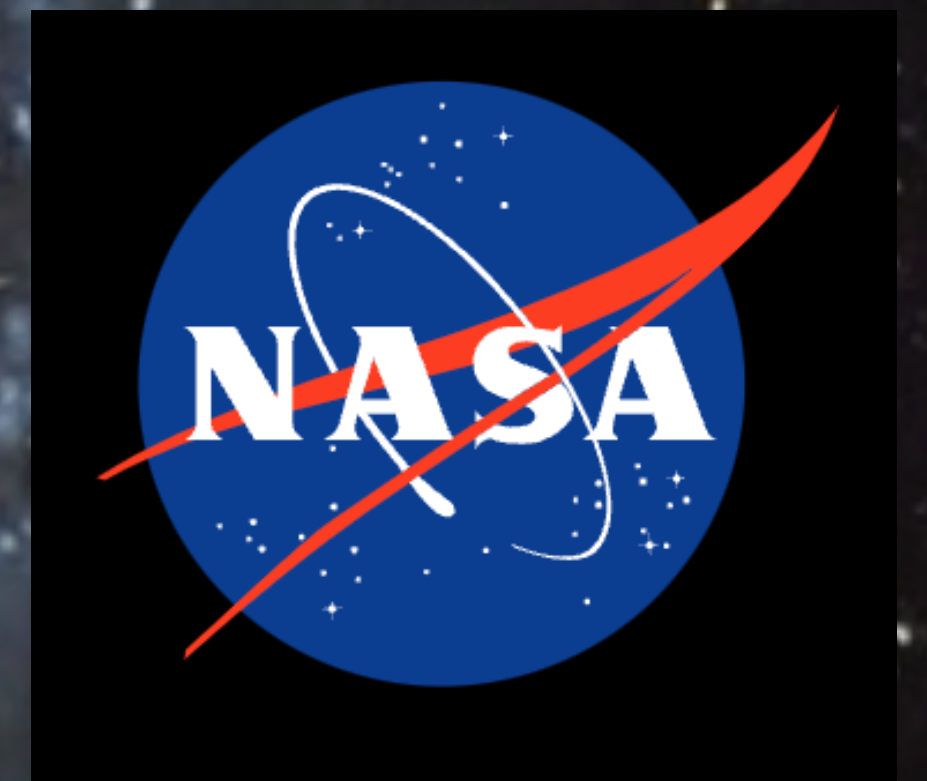


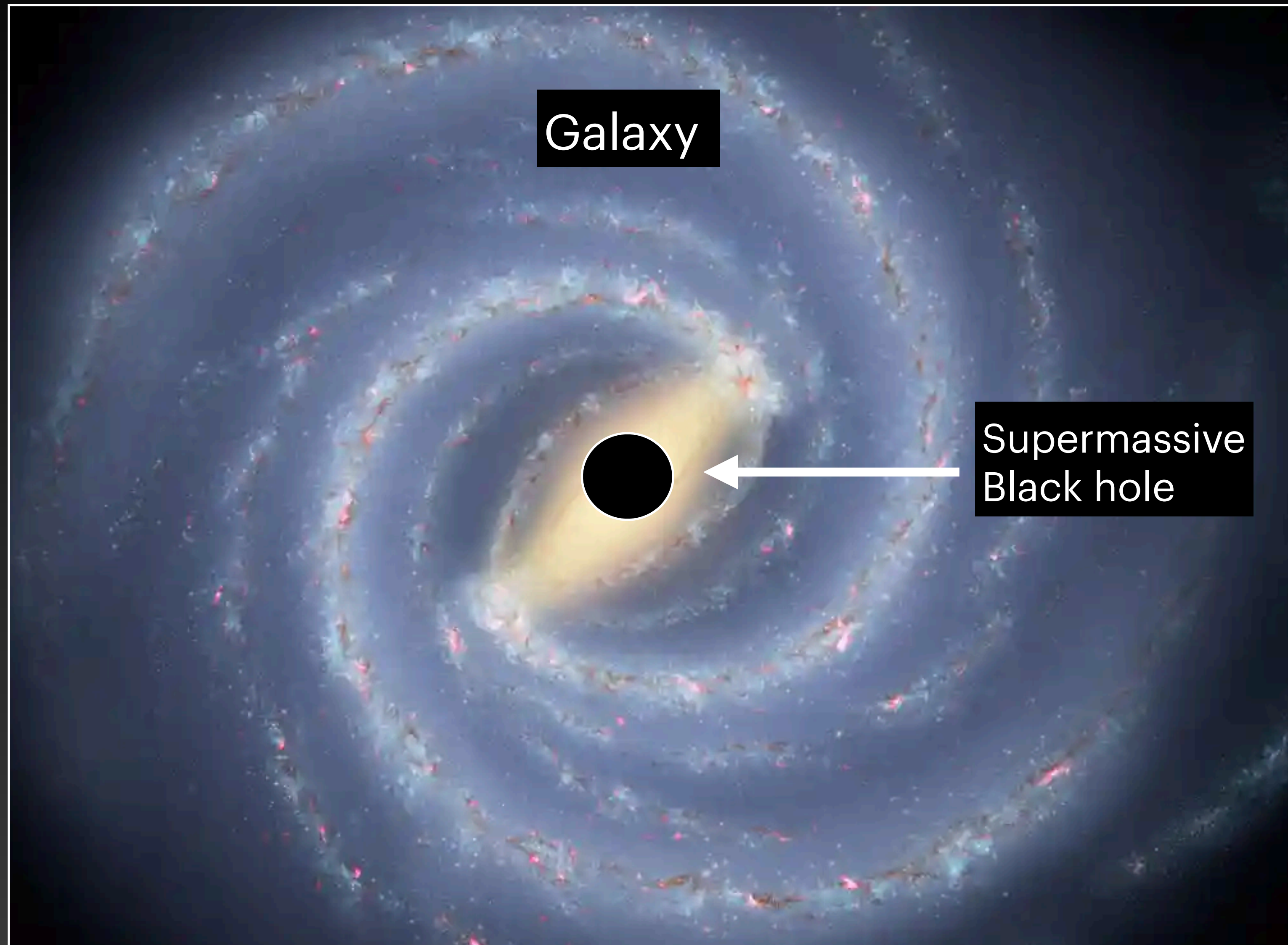
# BRAHMA cosmological simulations: Unveiling the origins of supermassive black holes using LISA



Aklant Kumar Bhowmick  
Galaxy Evolution and Cosmology Fellow  
University of Virginia



# Origin of supermassive black holes: A big cosmic mystery!



# Three most popular candidates for seeds of supermassive black holes

Pop III remnants

$\sim 10^2 M_{\odot}$

Light



Pop III seeds

**Daxal's talk!**

Runaway collisions  
of stars in dense  
nuclear star clusters

$\sim 10^3 - 10^4 M_{\odot}$   
Medium weight

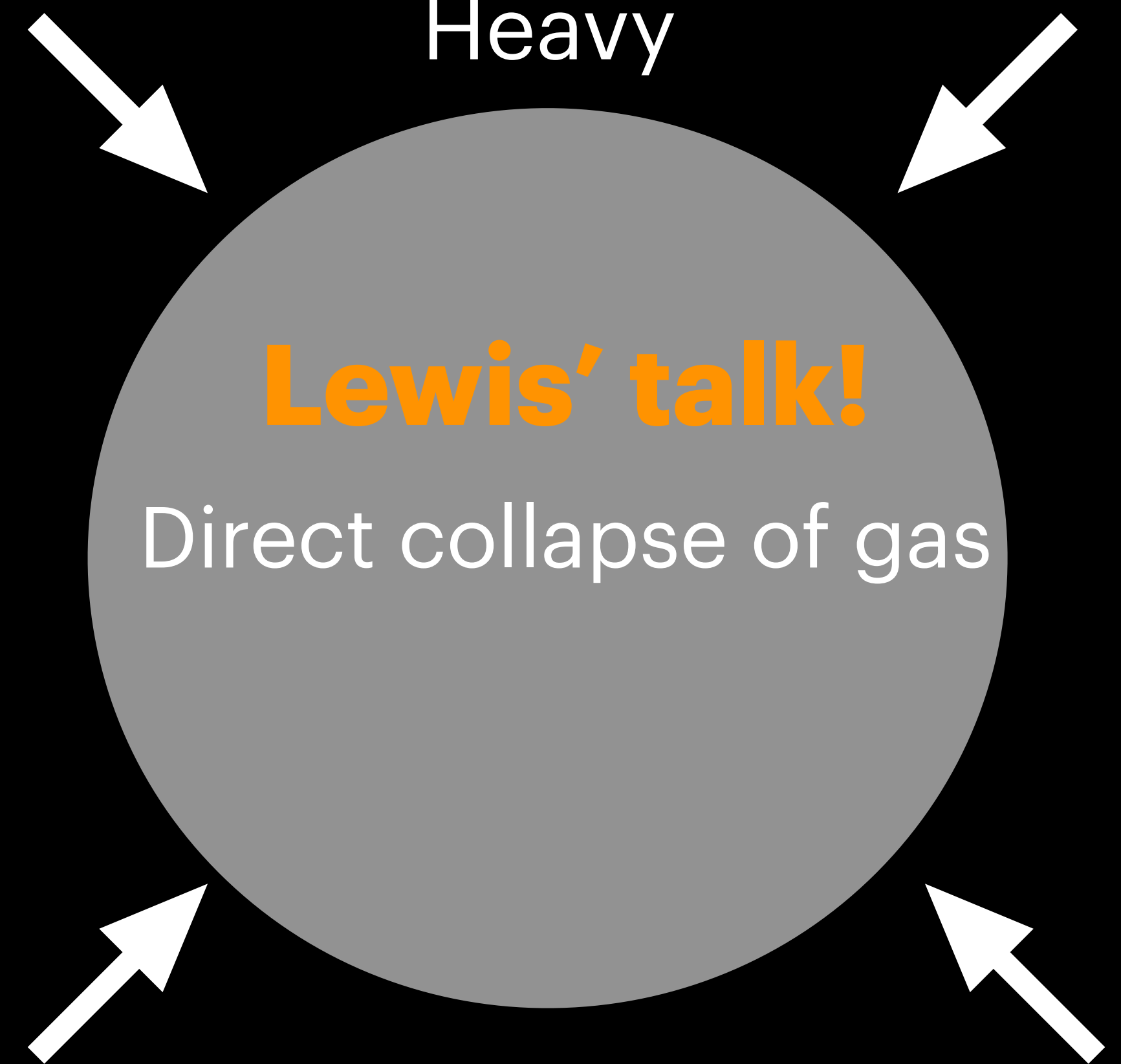


NSC seeds

**Manuel's talk!**  
**Bastian's talk!**

Direct Collapse Black Holes

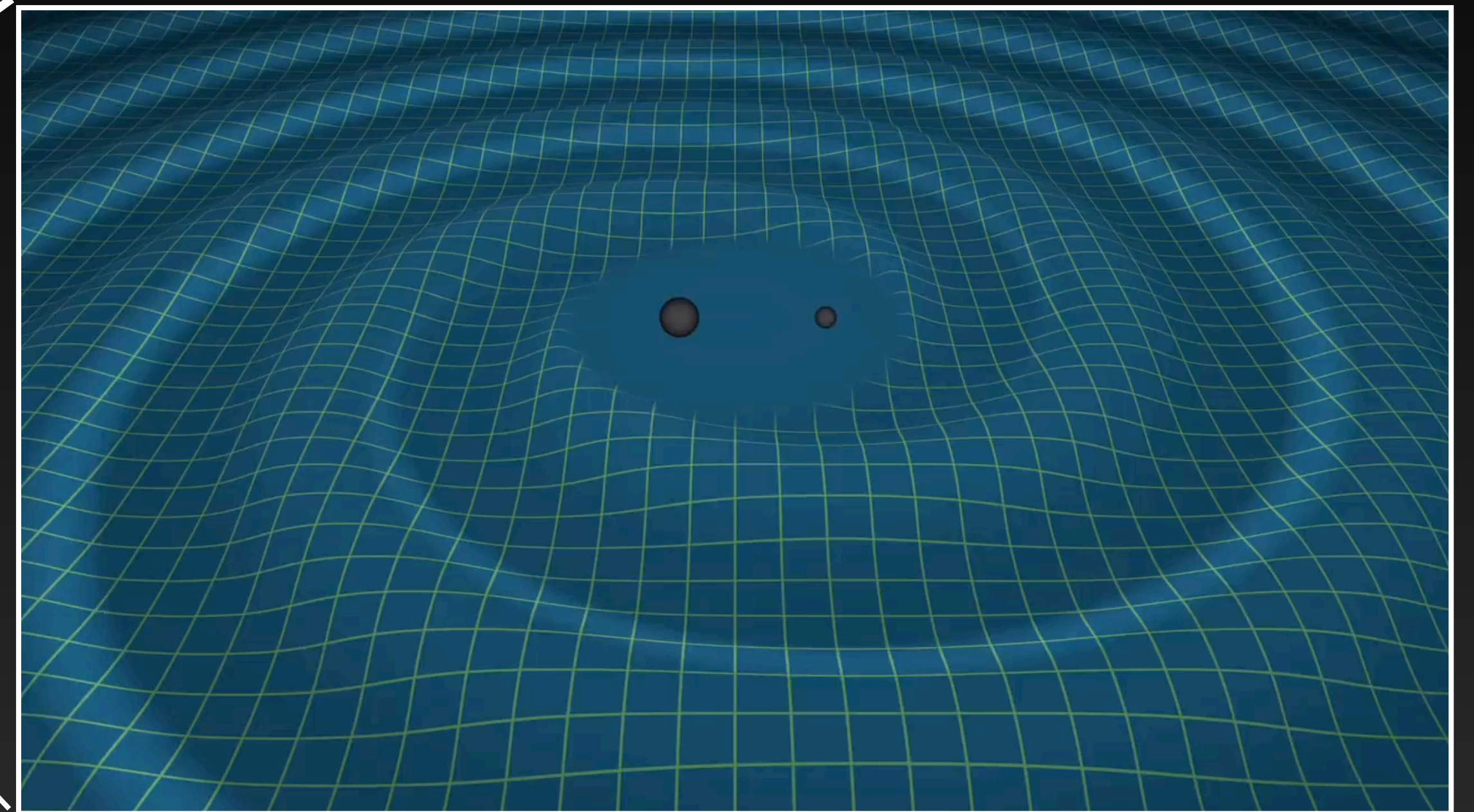
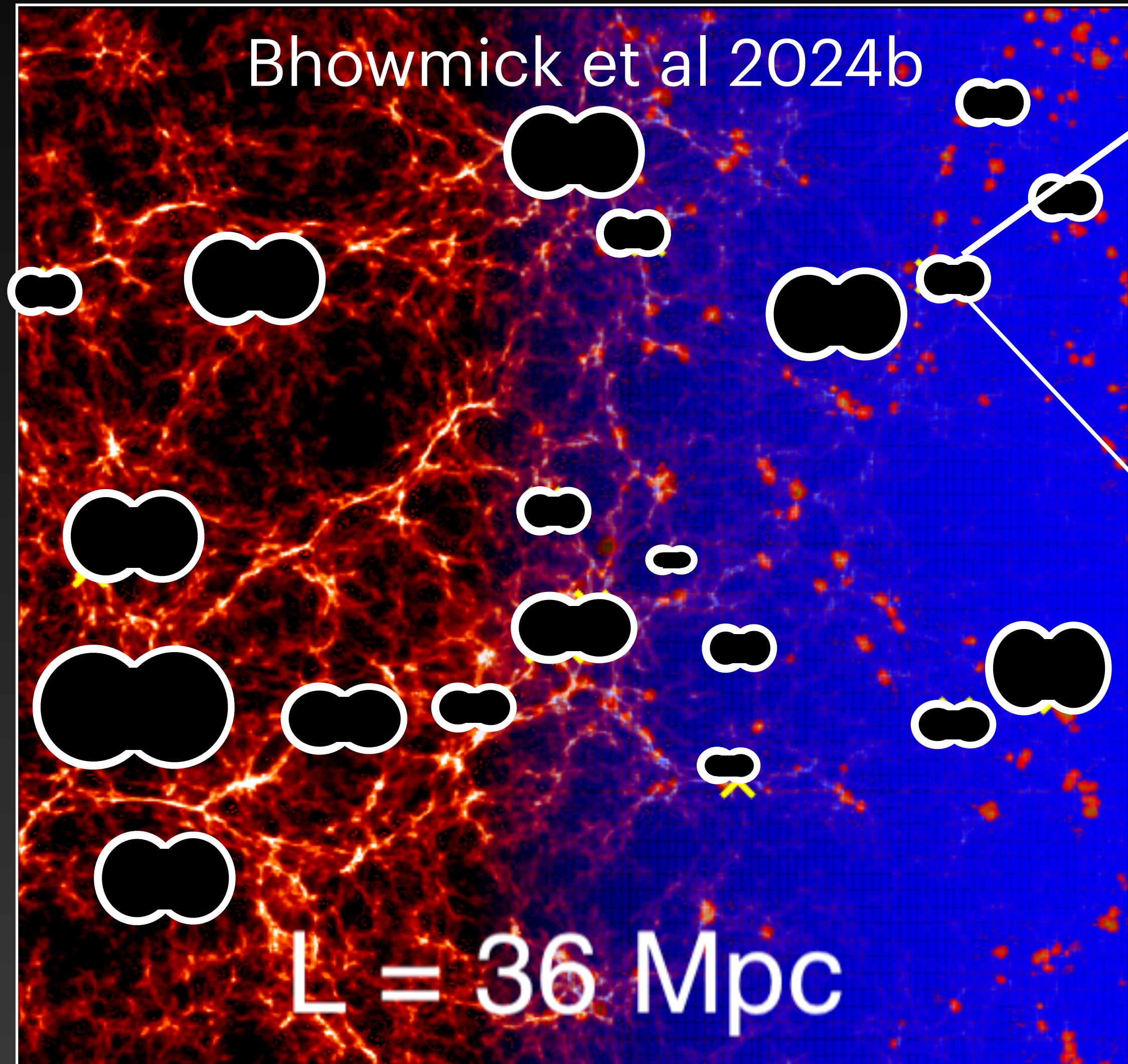
$\sim 10^4 - 10^5 M_{\odot}$   
Heavy



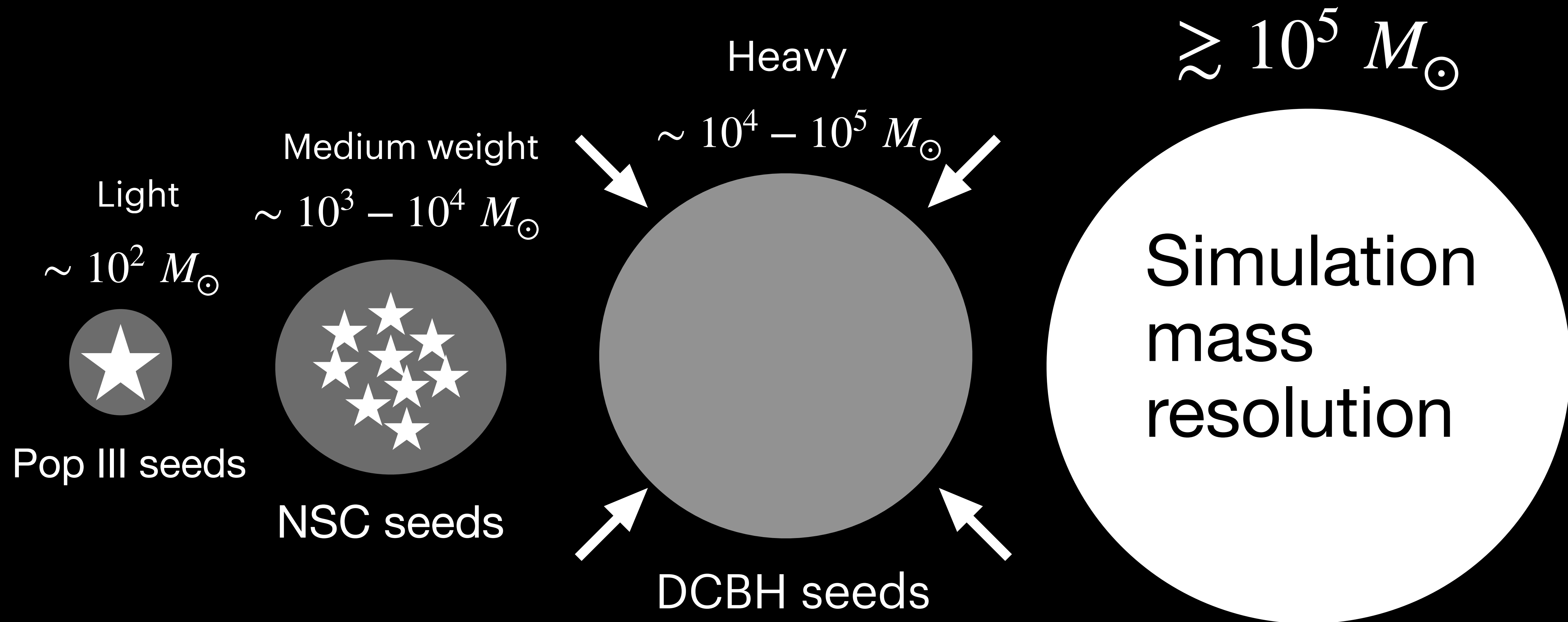
DCBH seeds

# Cosmological simulations can produce statistically large samples of merging BH binaries to compare with LISA

Bhowmick et al 2024b

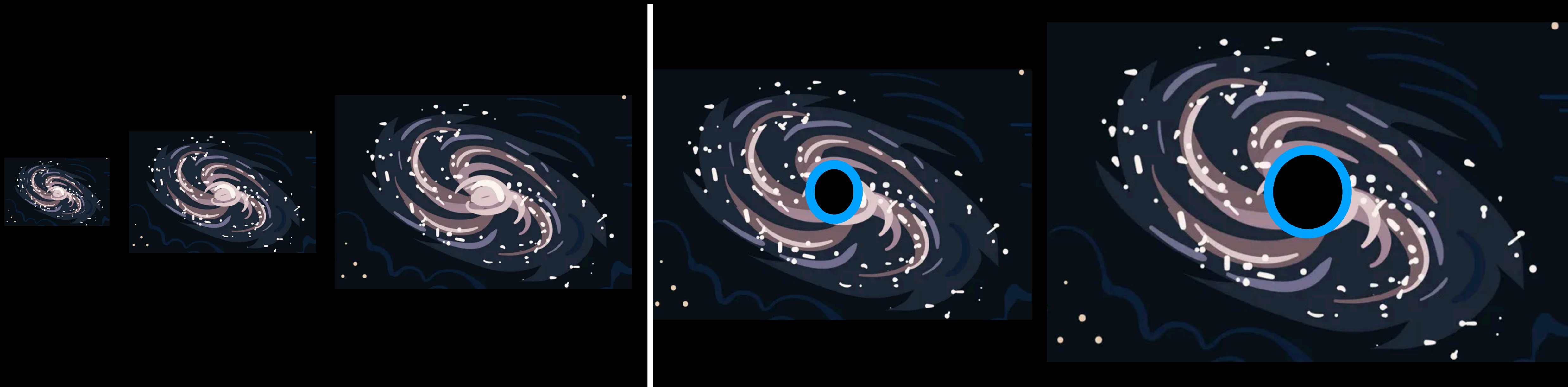


# A long standing challenge: Cosmological simulations often cannot resolve the seed masses



# The vast majority of simulations use very simplistic sub-grid black hole seed models

Minimum halo mass threshold

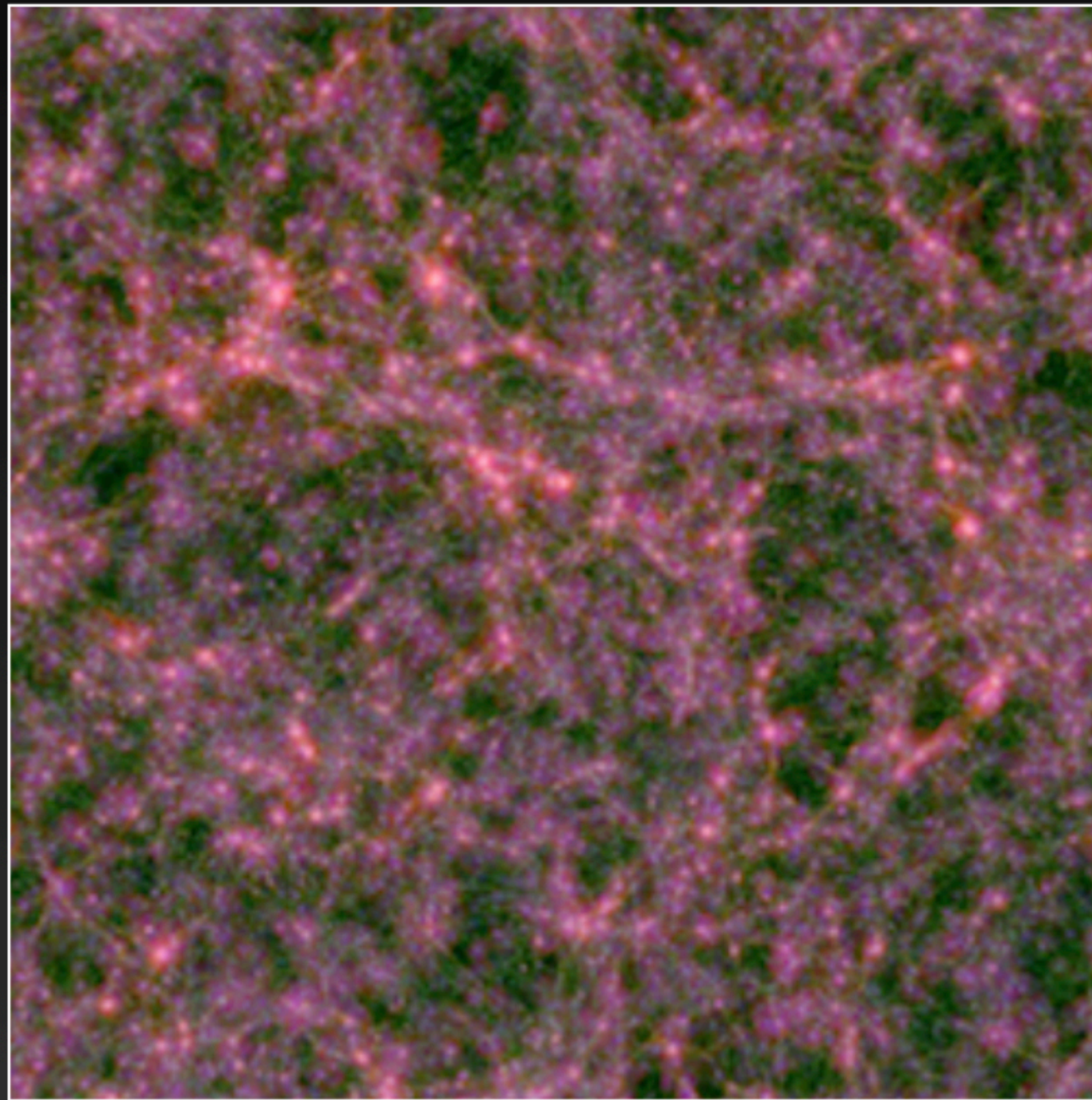


Cosmic time

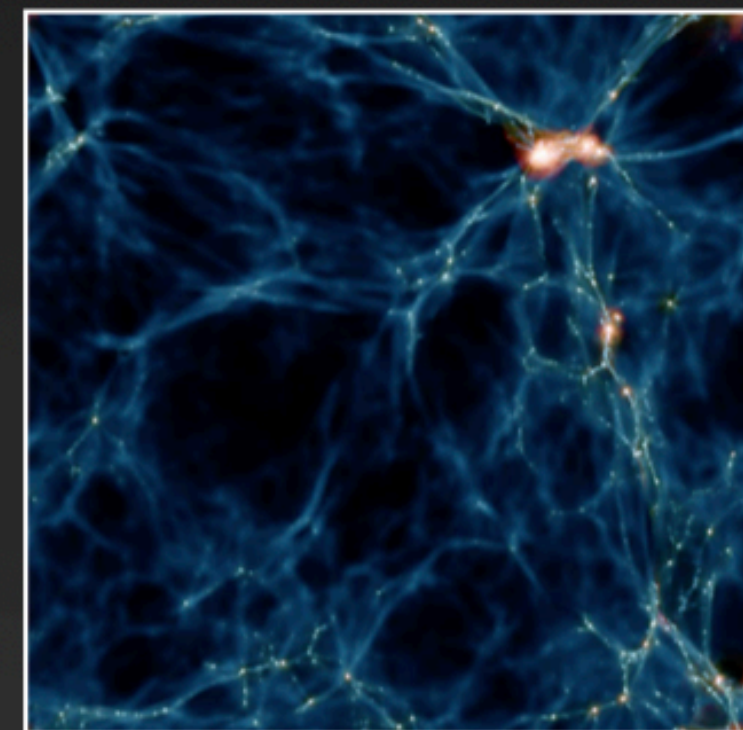
# Many recent simulations use more physically motivated seed models

Seed based on local gas properties!

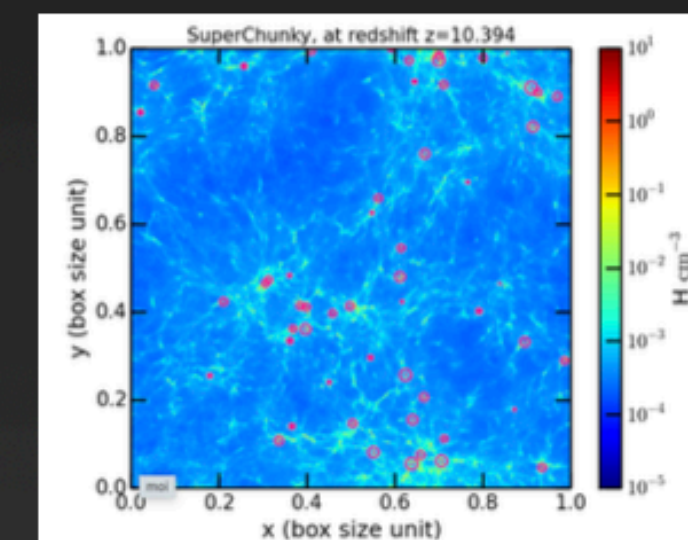
Horizon-AGN Kaviraj et al 2016



ROMULUS Tremmel+2017



SuperChunky Habouzit+2016



**Due to uncertain seeding mechanisms, we need to  
\*systematic exploration of seed model variations!**

## Semi-Analytic models

Barausse 2012

Ricarte and Natarajan 2018

Dayal et al 2018

Banik et al 2019

Degraf et al 2020

Sassano et al 2021

Spinoso et al 2022

Trinca et al 2022, 23, 24

Evans et al 2023

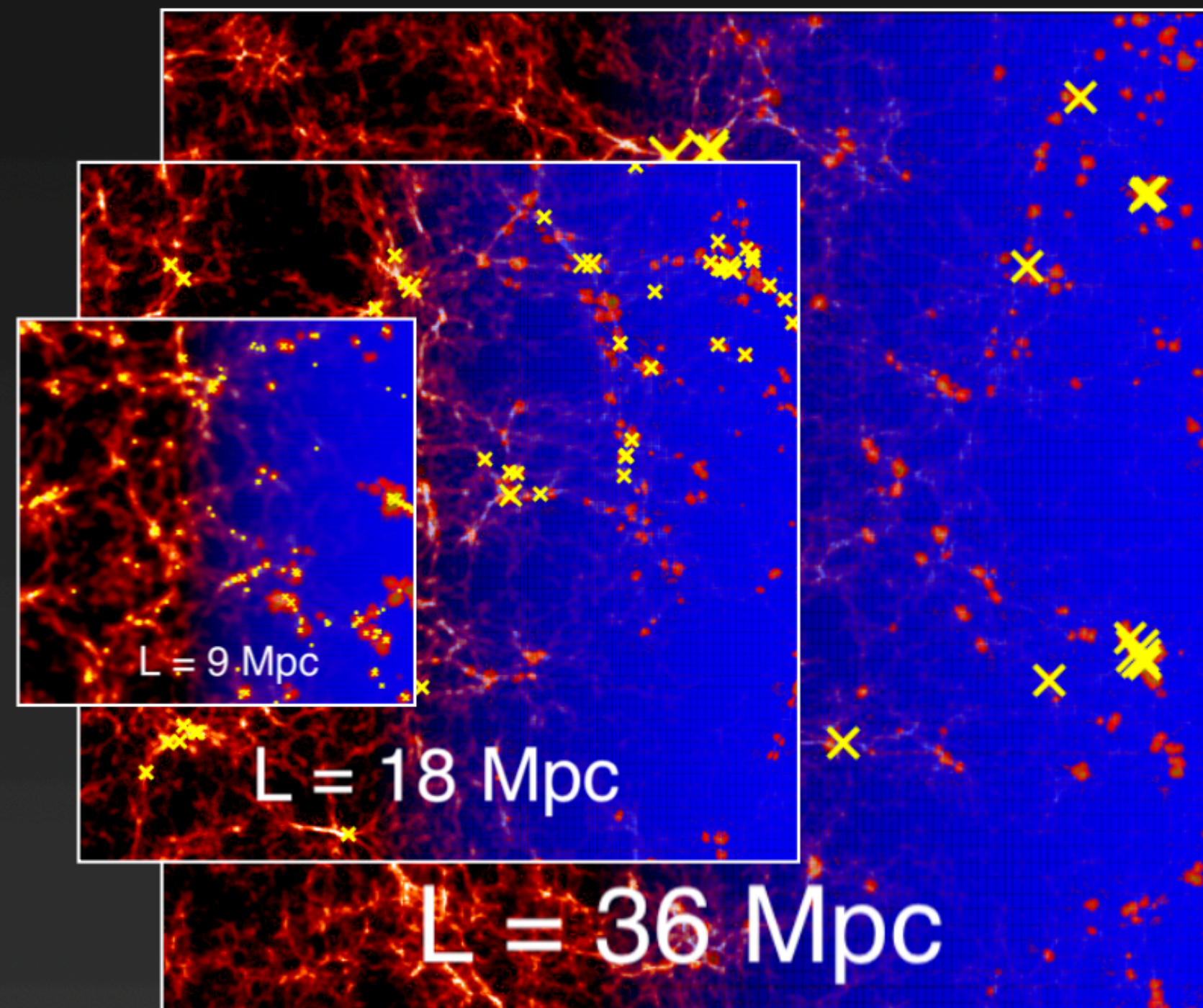


# BRAHMA simulations

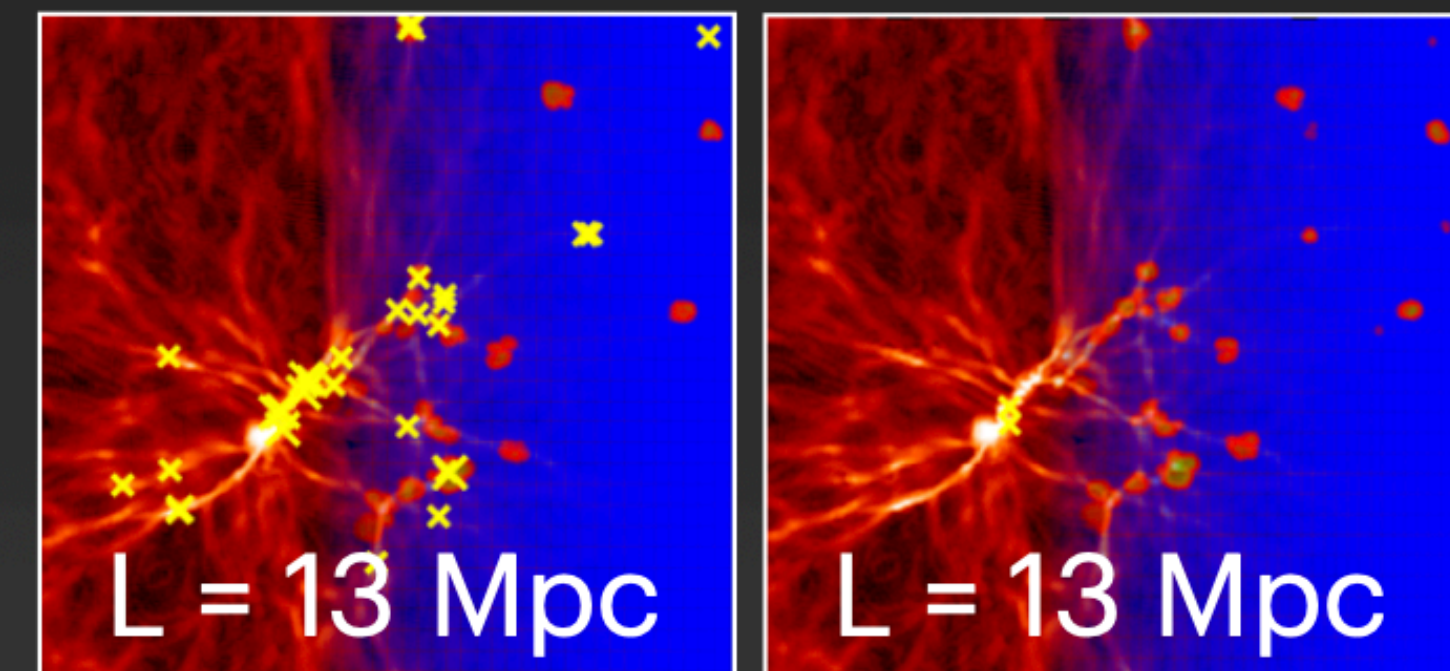
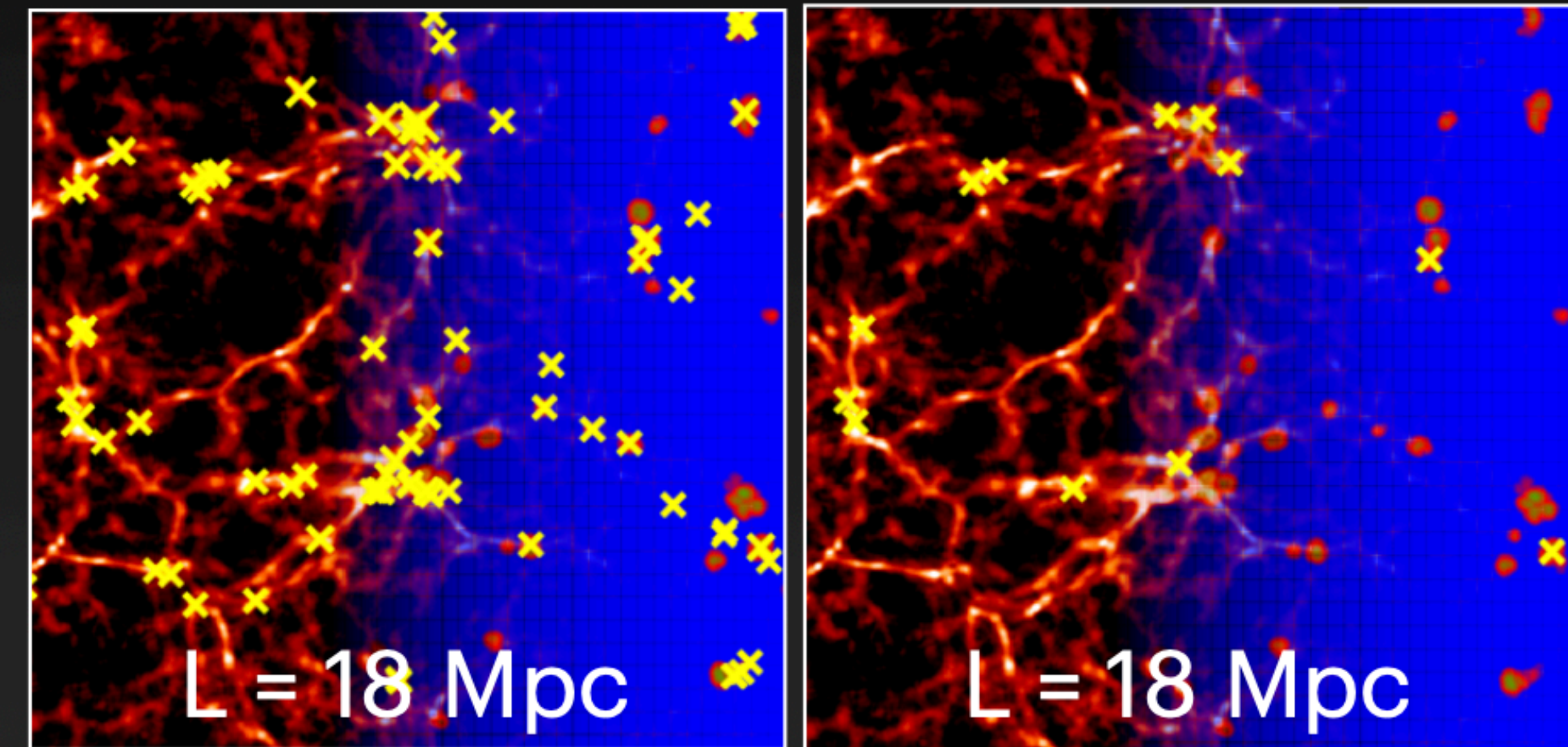
A large systematic exploration of seed model variations

IllustrisTNG + Seed model variations

Low mass seeds  
(Pop III and NSC)

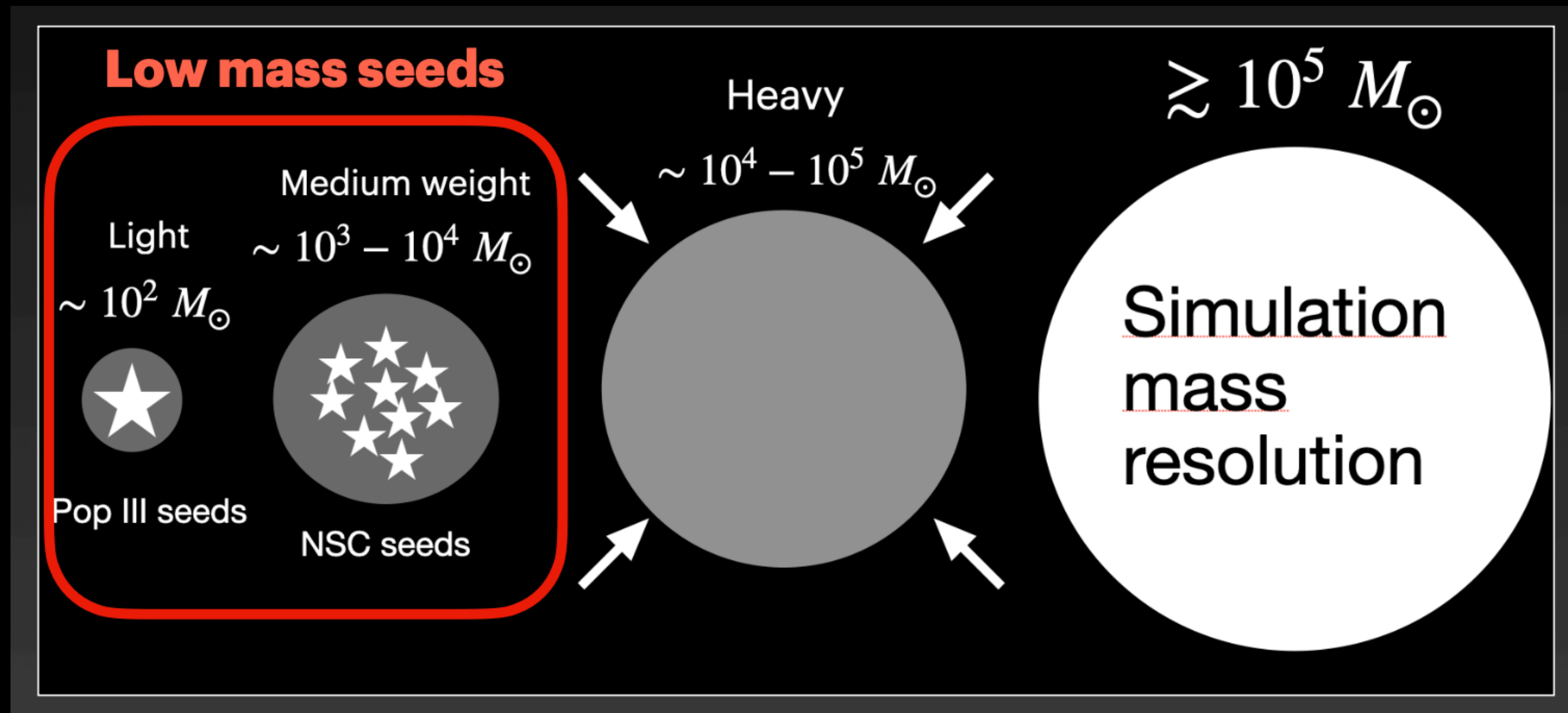


Heavy seeds  
(DCBH)



# How do we model low mass seeds in BRAHMA?

Surpassing the resolution limitation

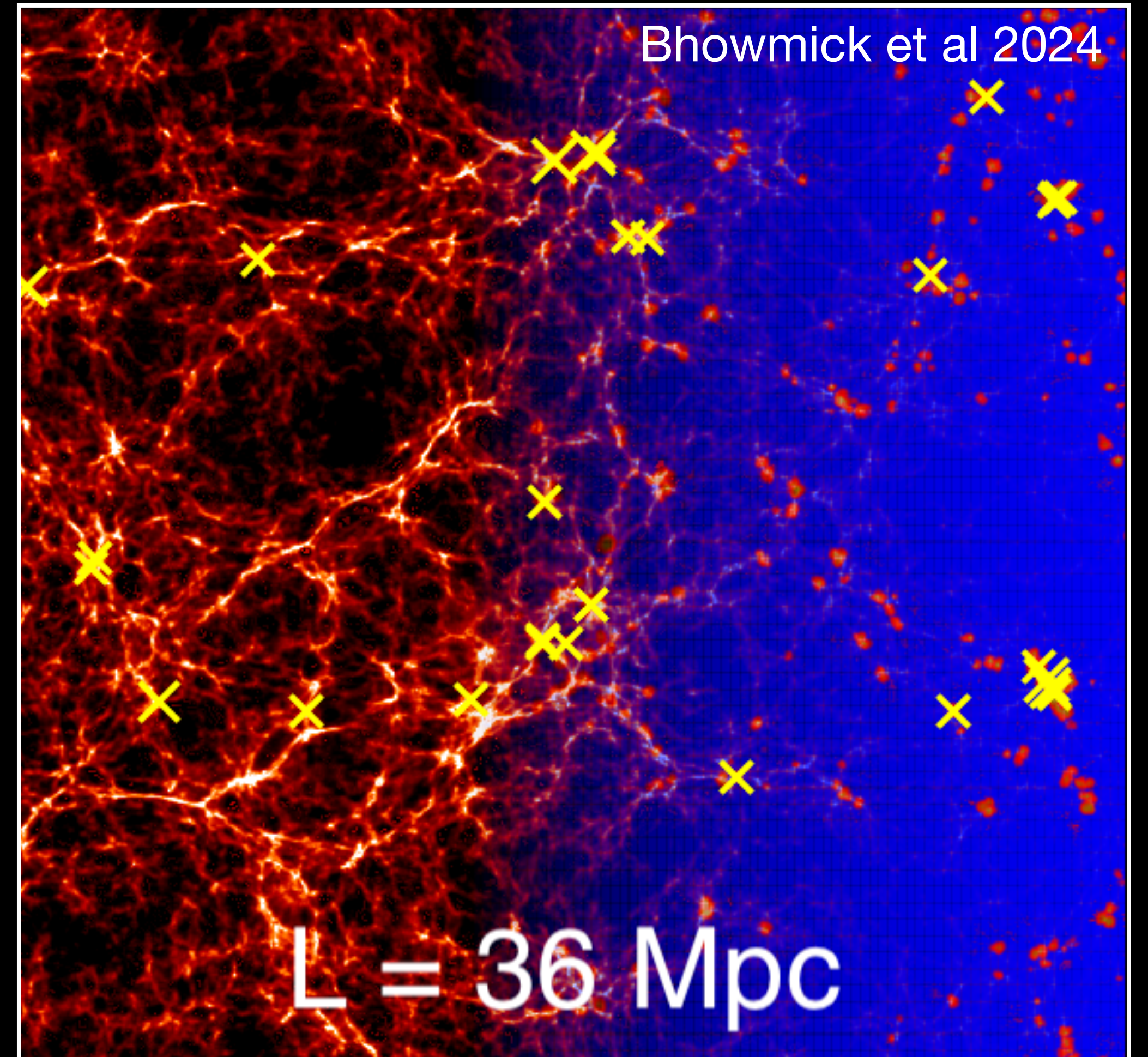
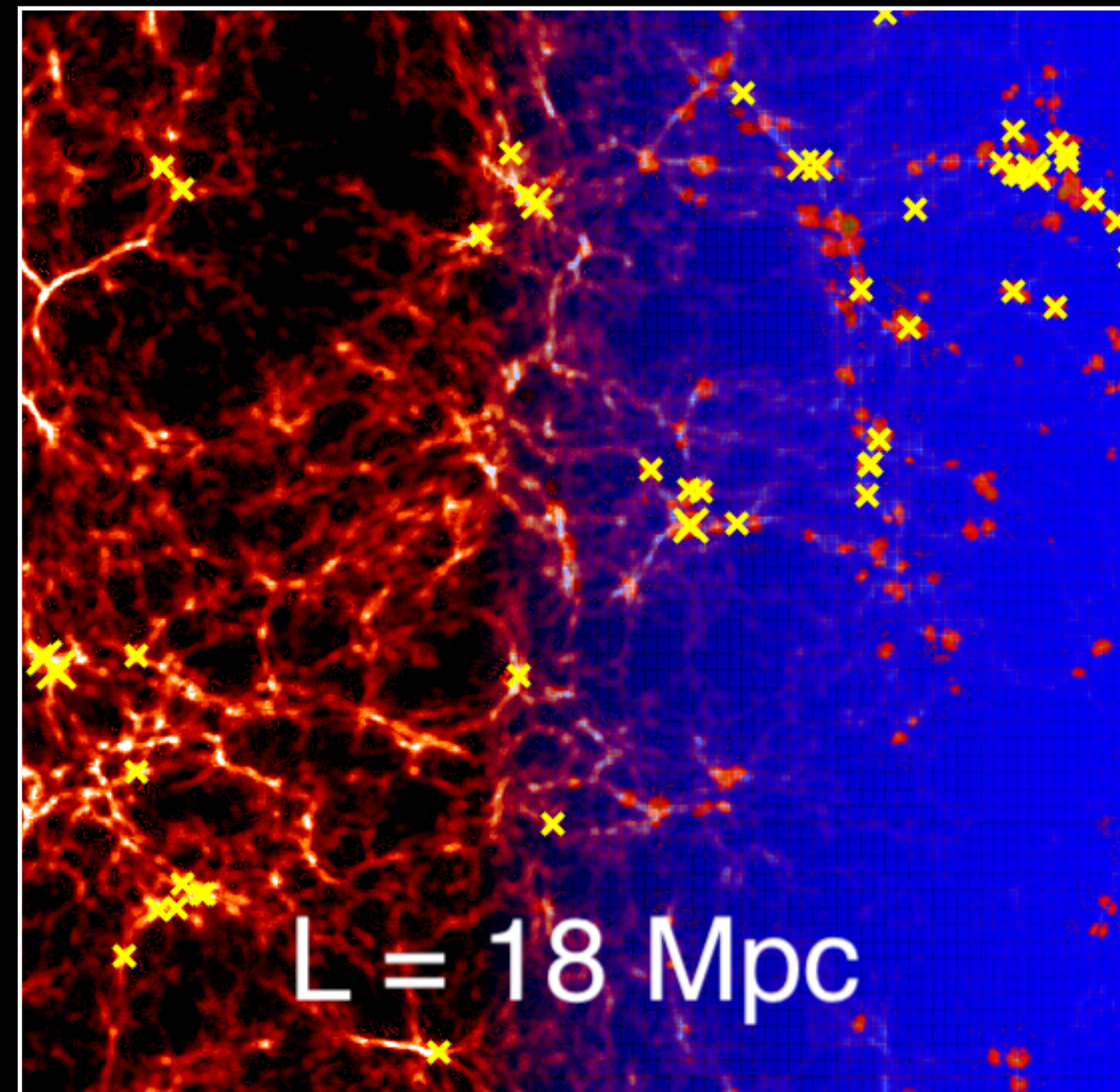
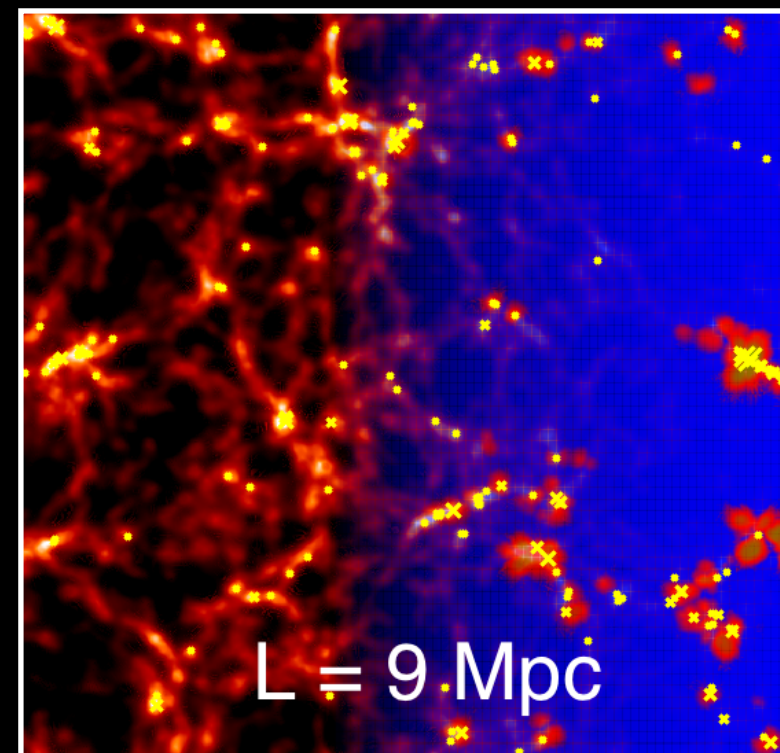


# Surpassing the resolution limit in BRAHMA

Multiple simulation boxes with increasing volumes and decreasing resolution

Largest volume, lowest resolution

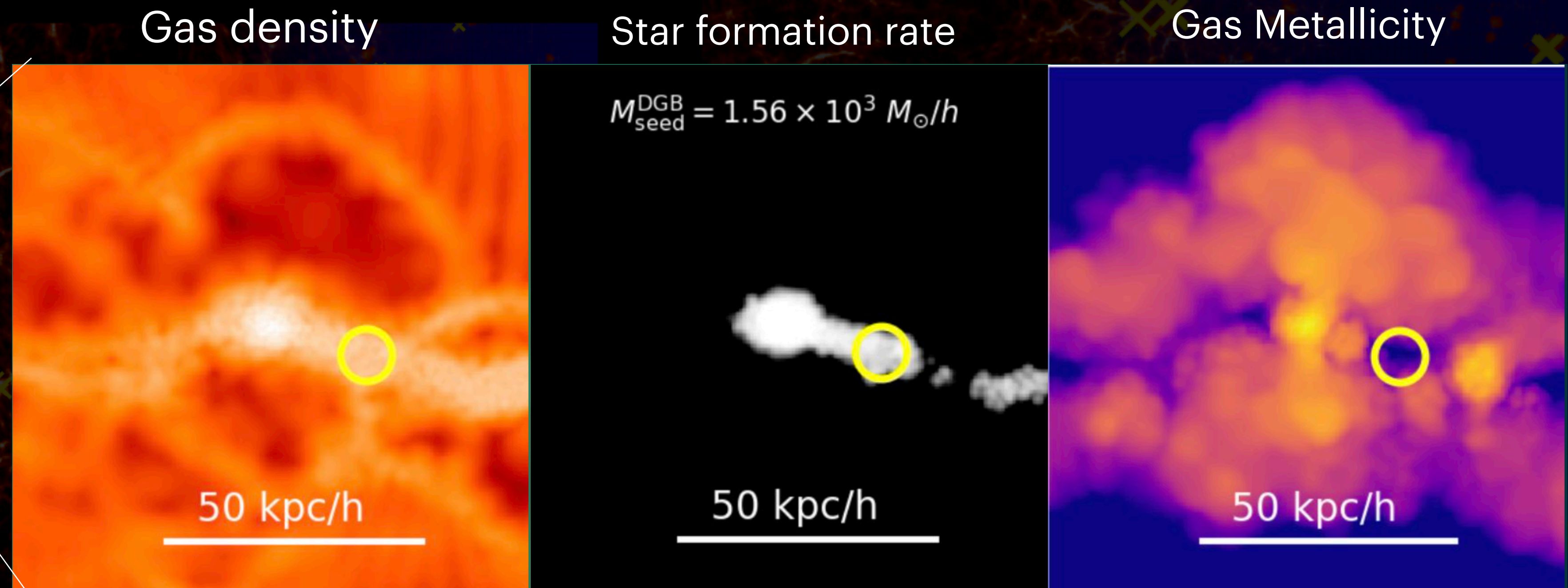
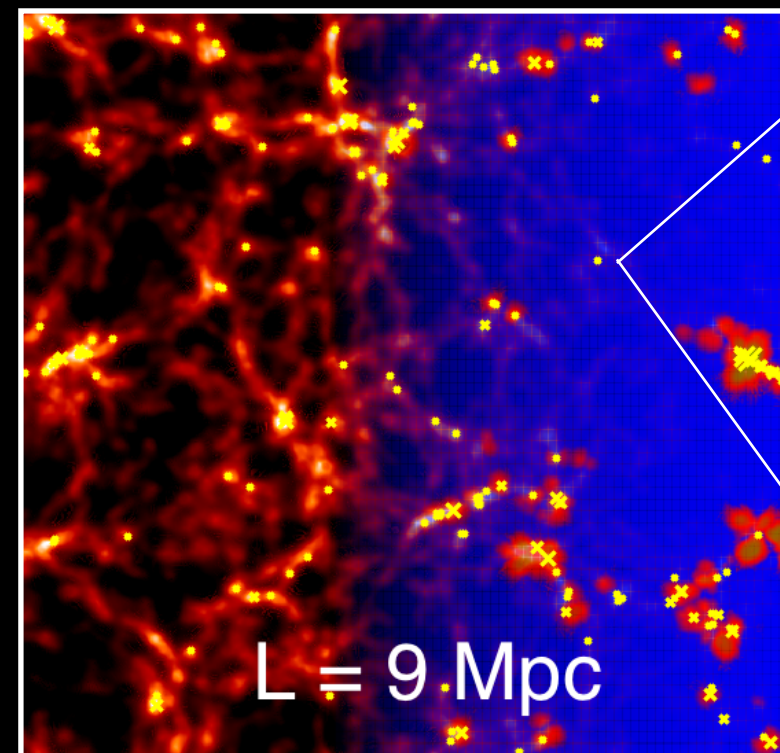
Smallest volume,  
highest resolution



# Explicitly resolve low mass ( $\sim 10^3 M_{\odot}$ ) seeds only in the smallest volume box

Seeding in halos with sufficient dense and metal poor gas

Smallest volume,  
highest resolution

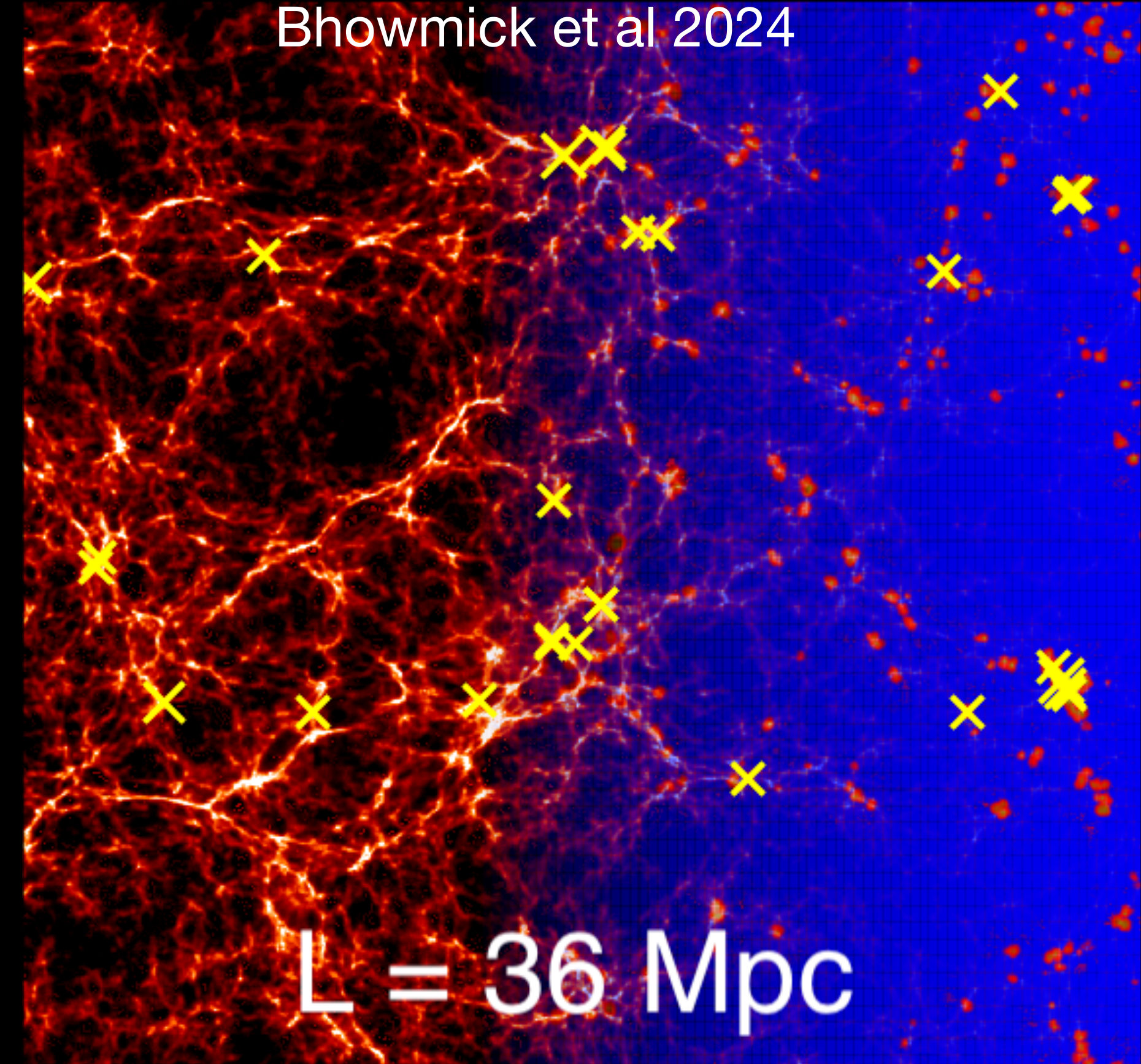
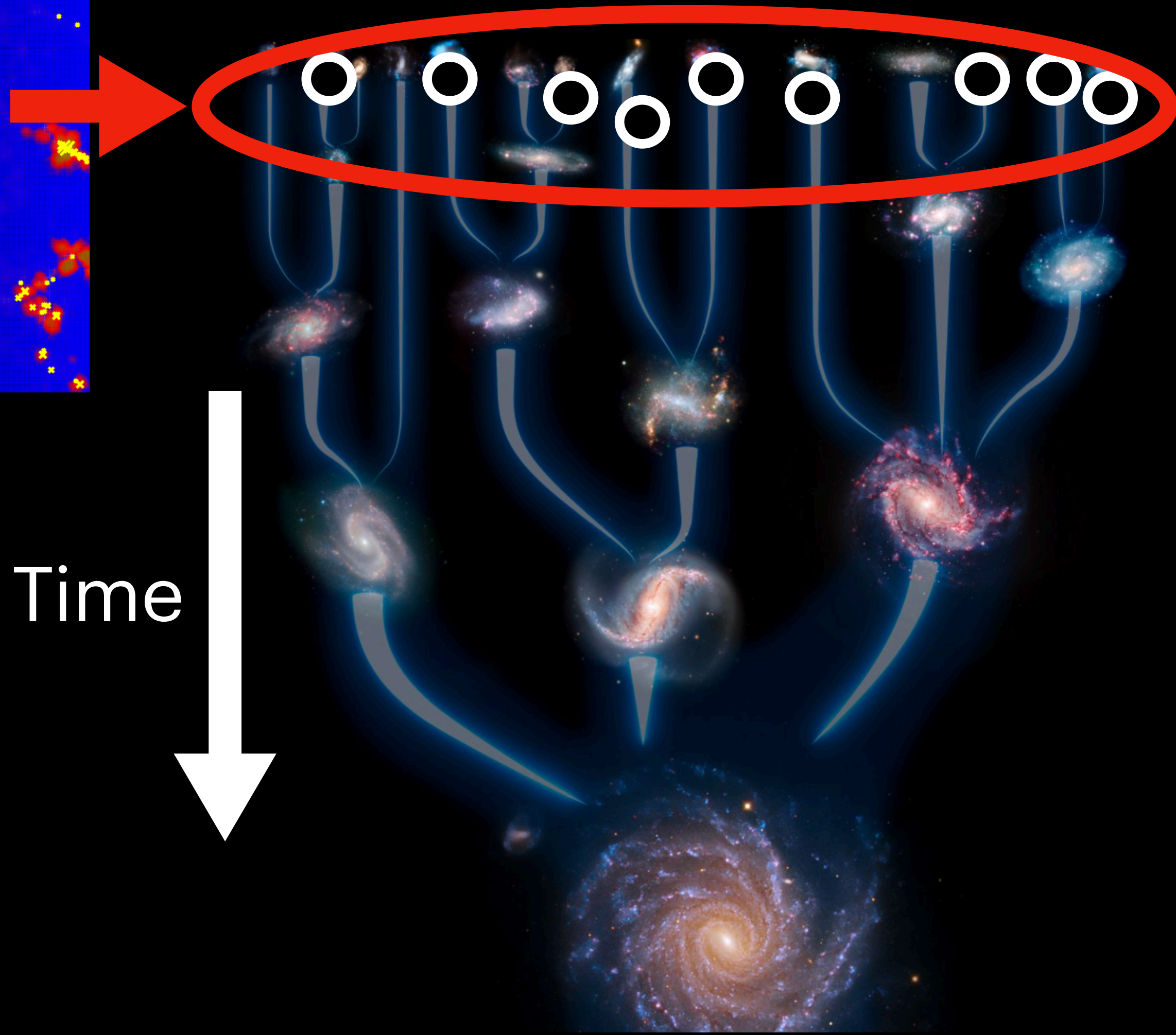
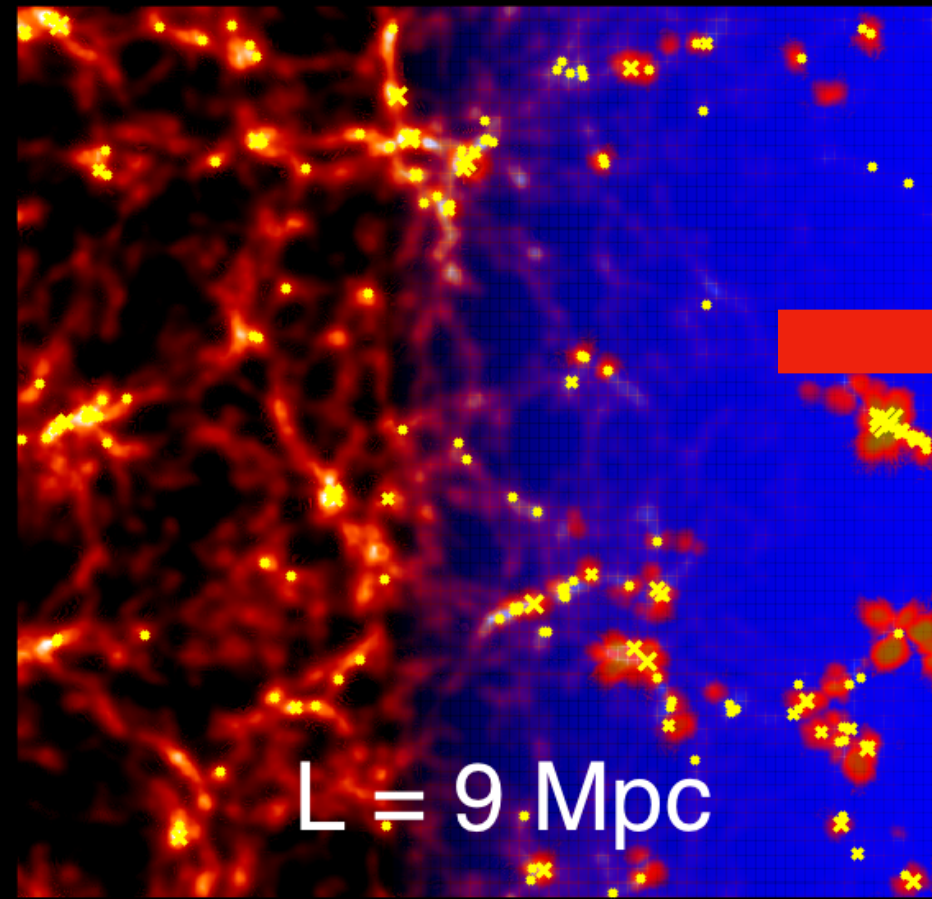


Bhowmick et al 2021

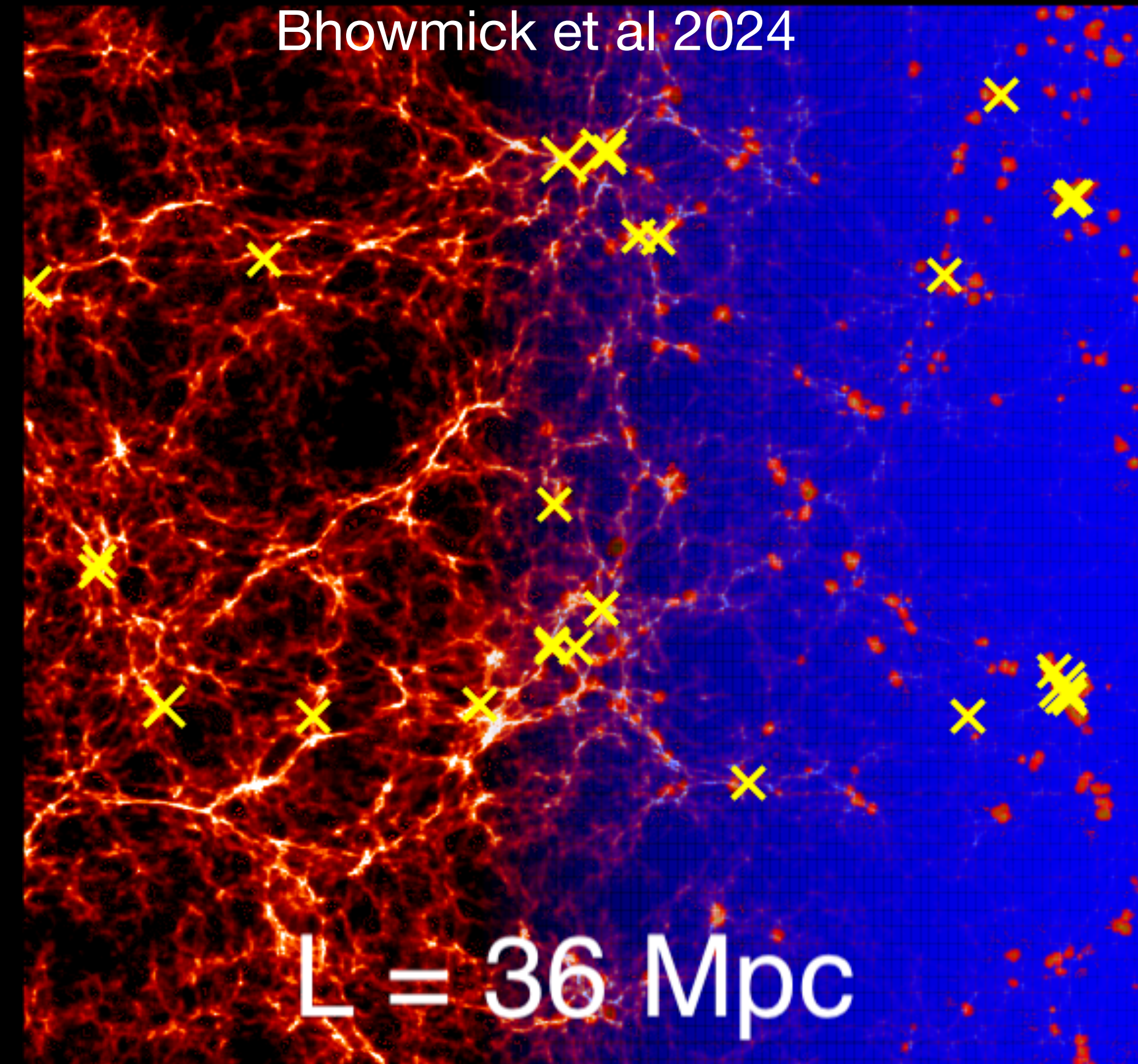
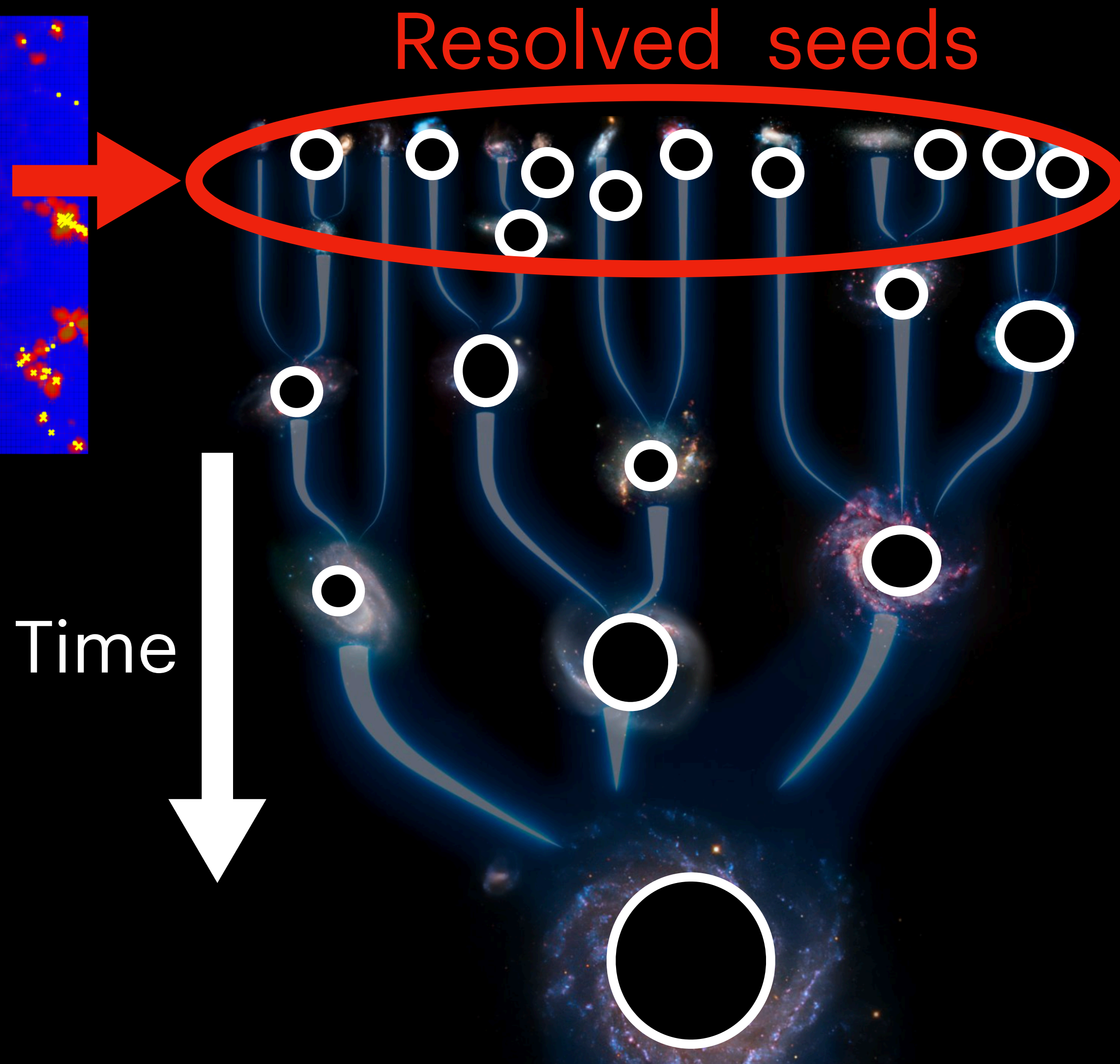
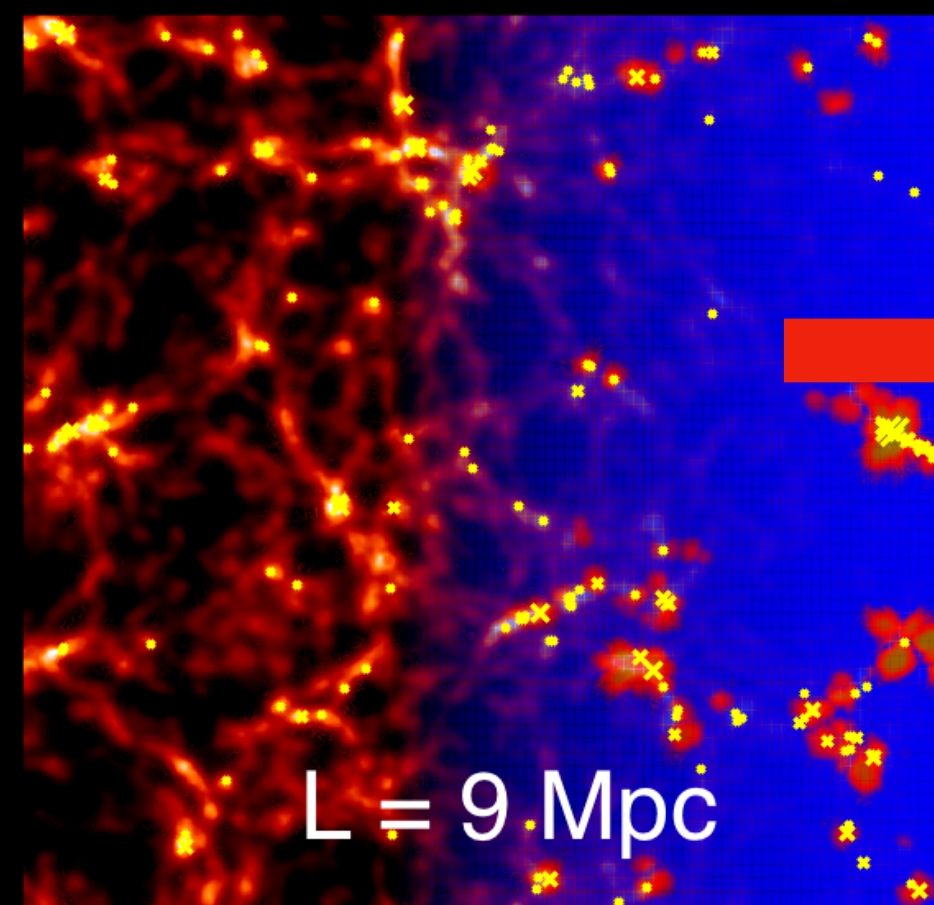
$L = 36 \text{ Mpc}$

# Following the growth of these low mass ( $\sim 10^3 M_{\odot}$ ) seeds along the galaxy merger tree

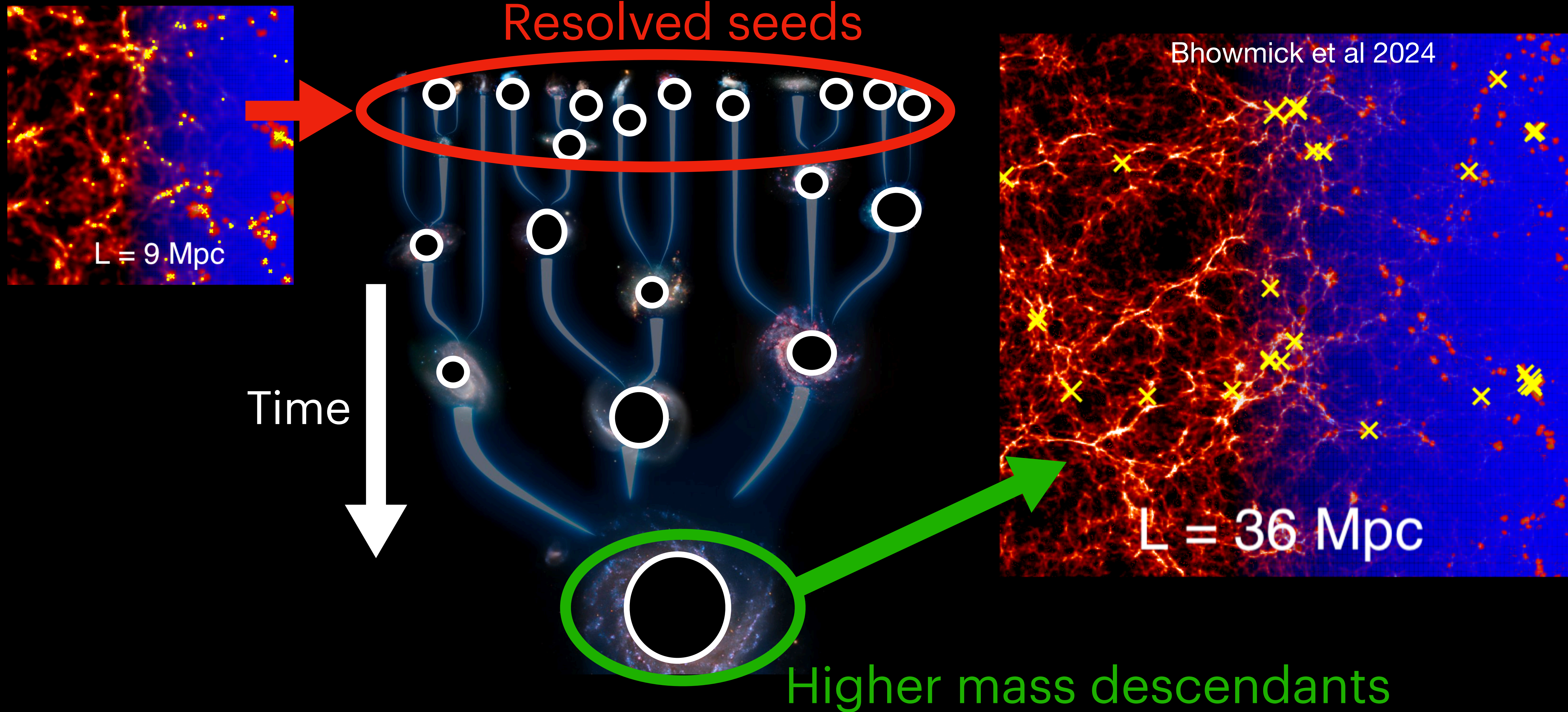
Resolved seeds



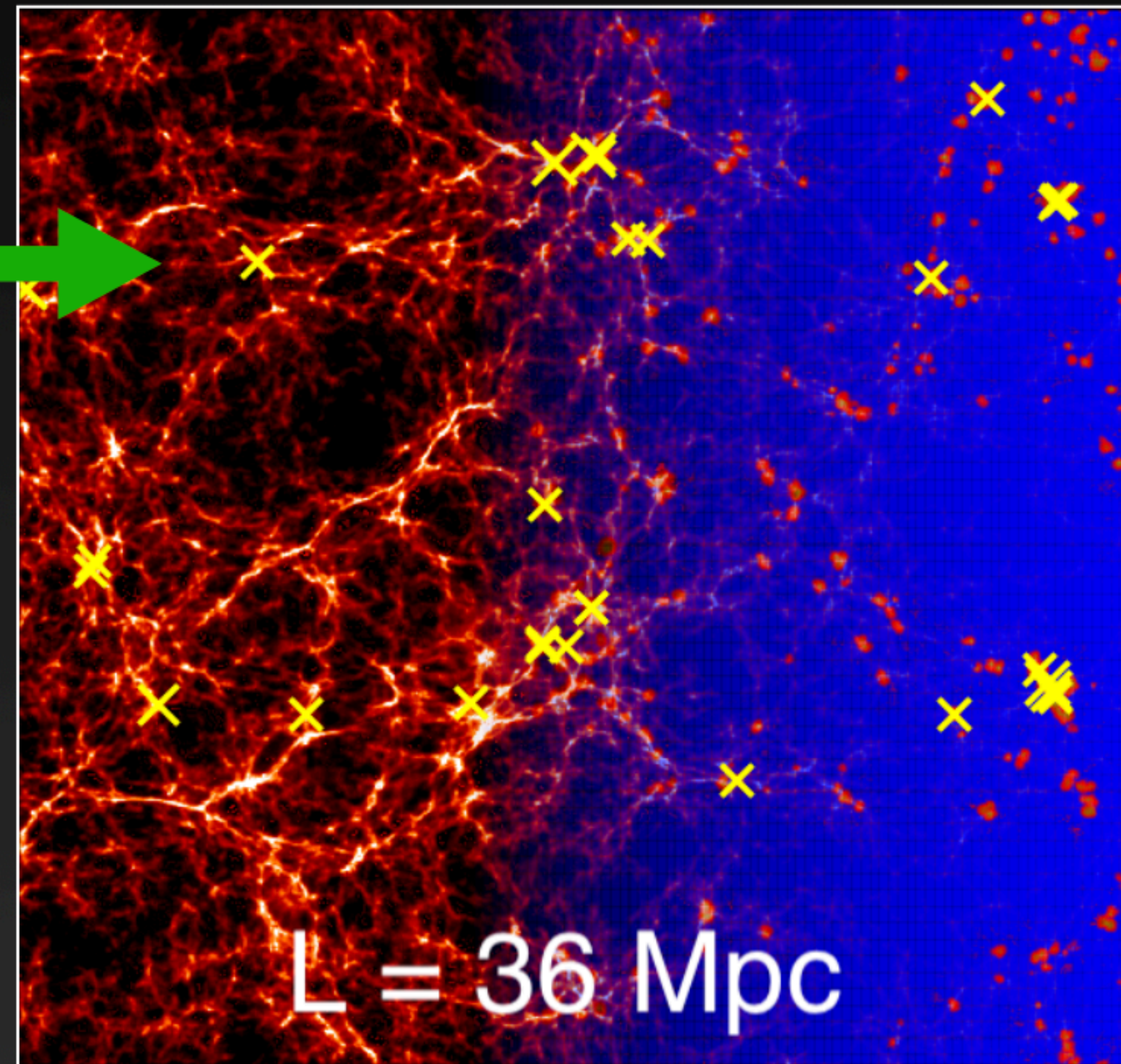
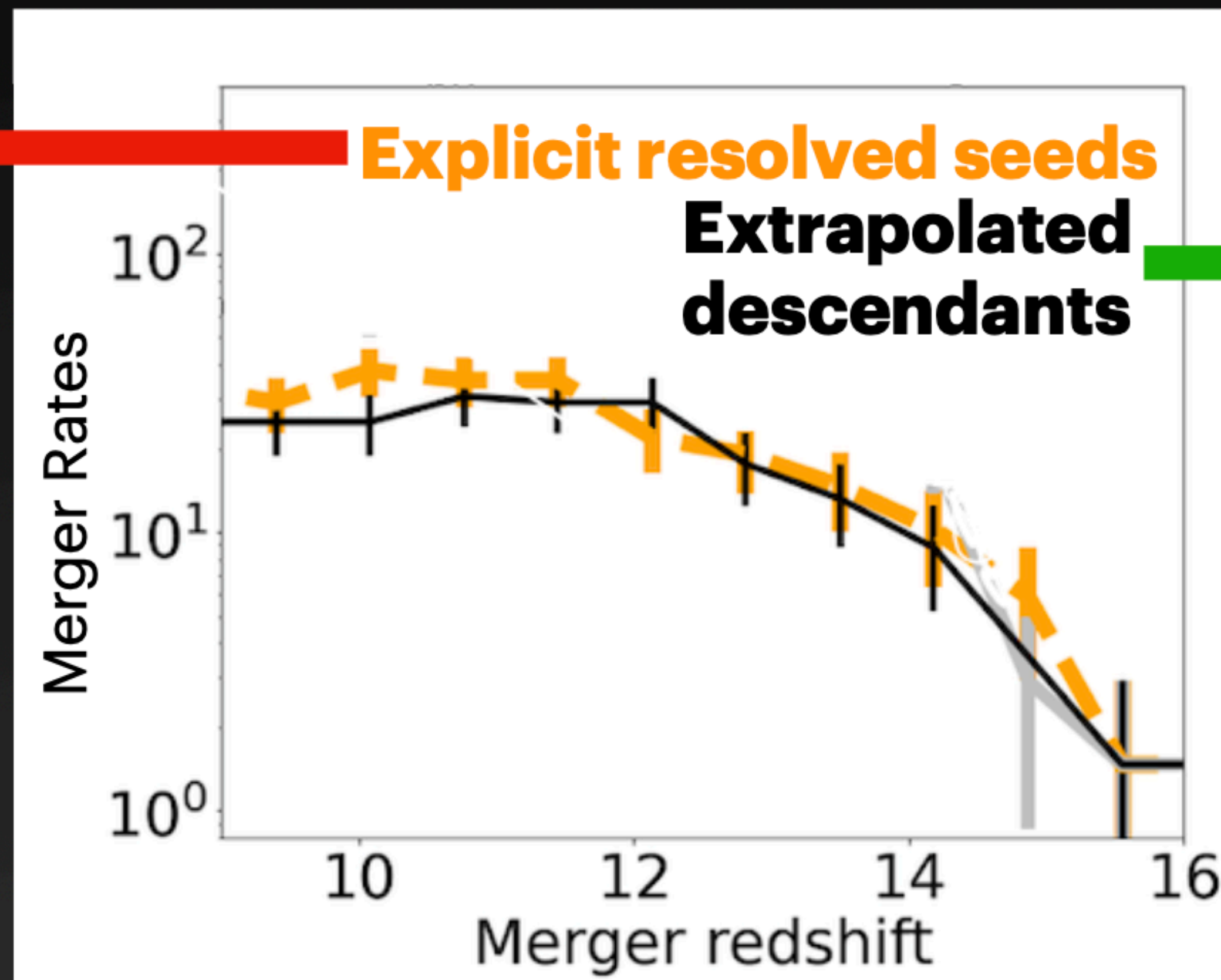
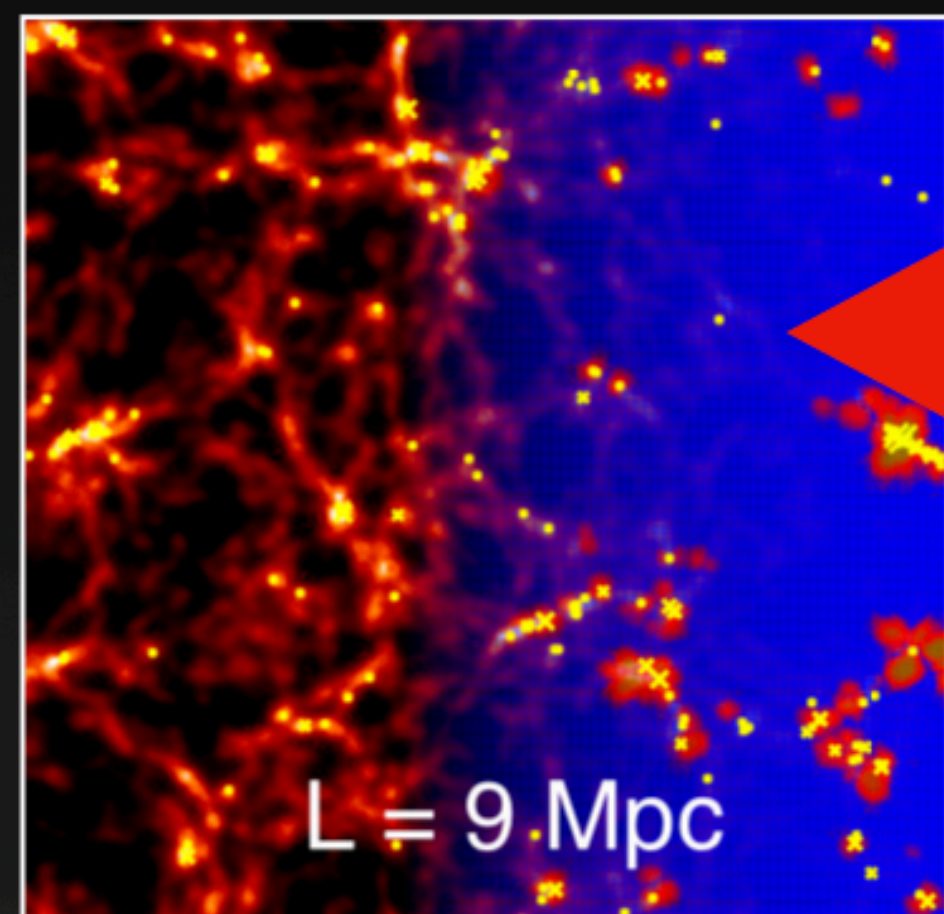
# Tracing the galaxies wherein these seeds assembled higher mass descendants



# Seeding these descendants in the larger volume simulations



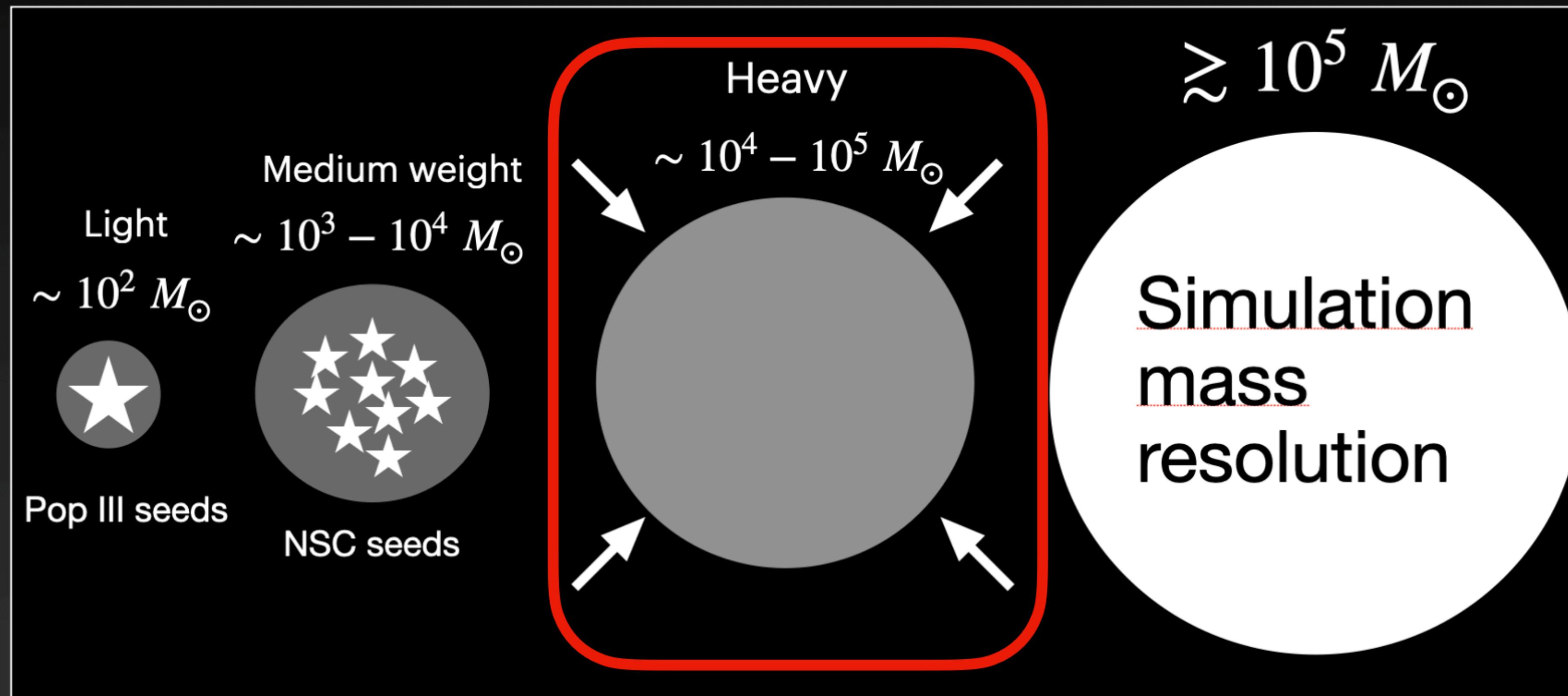
# A new subgrid “stochastic seed model” to represent low mass seeds in larger cosmological volumes without the need to resolve them



Bhowmick et al 2024a



# How do we model heavy seeds in BRAHMA?

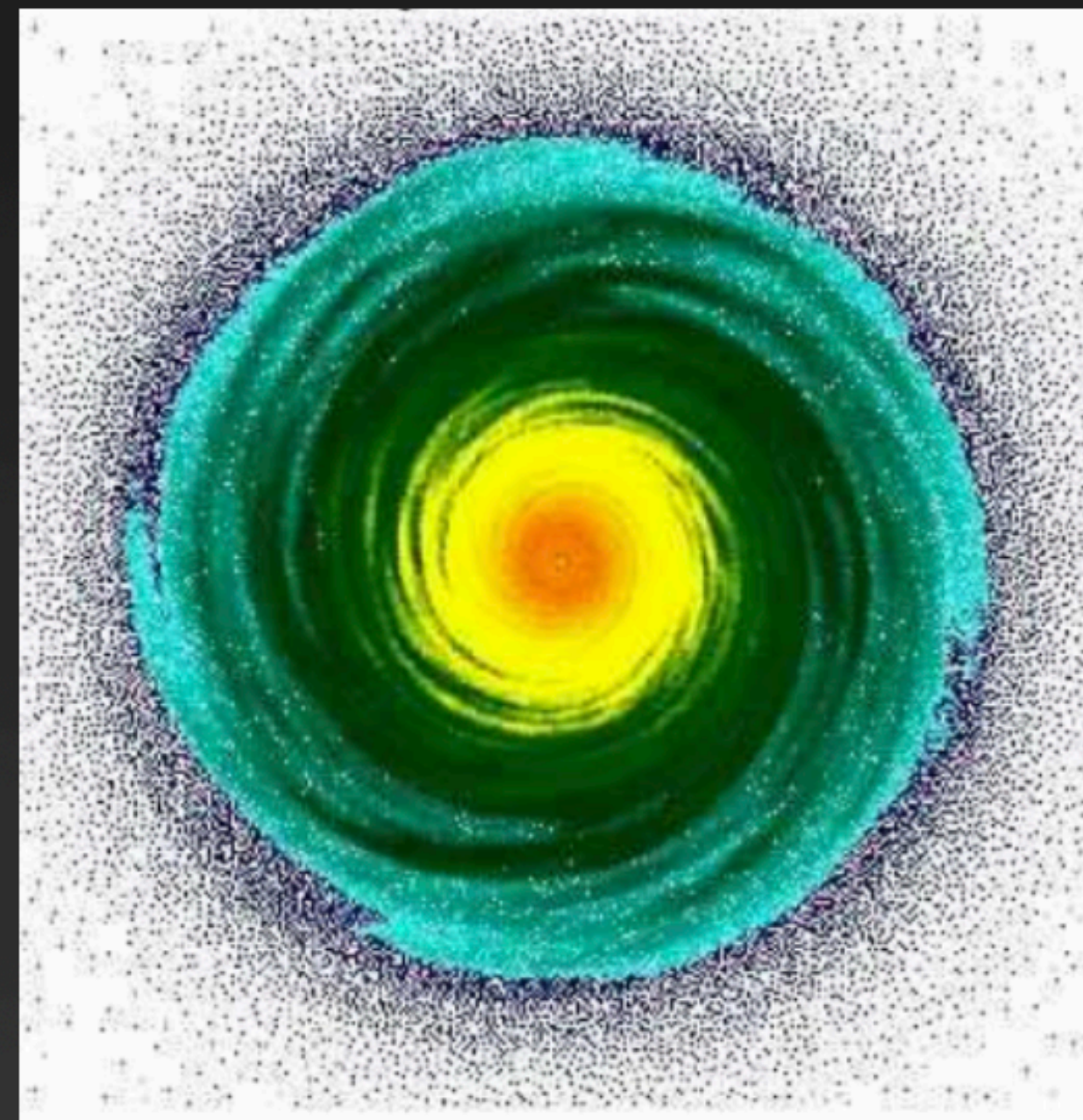


# Additional criteria beyond high density and low metallicity gas

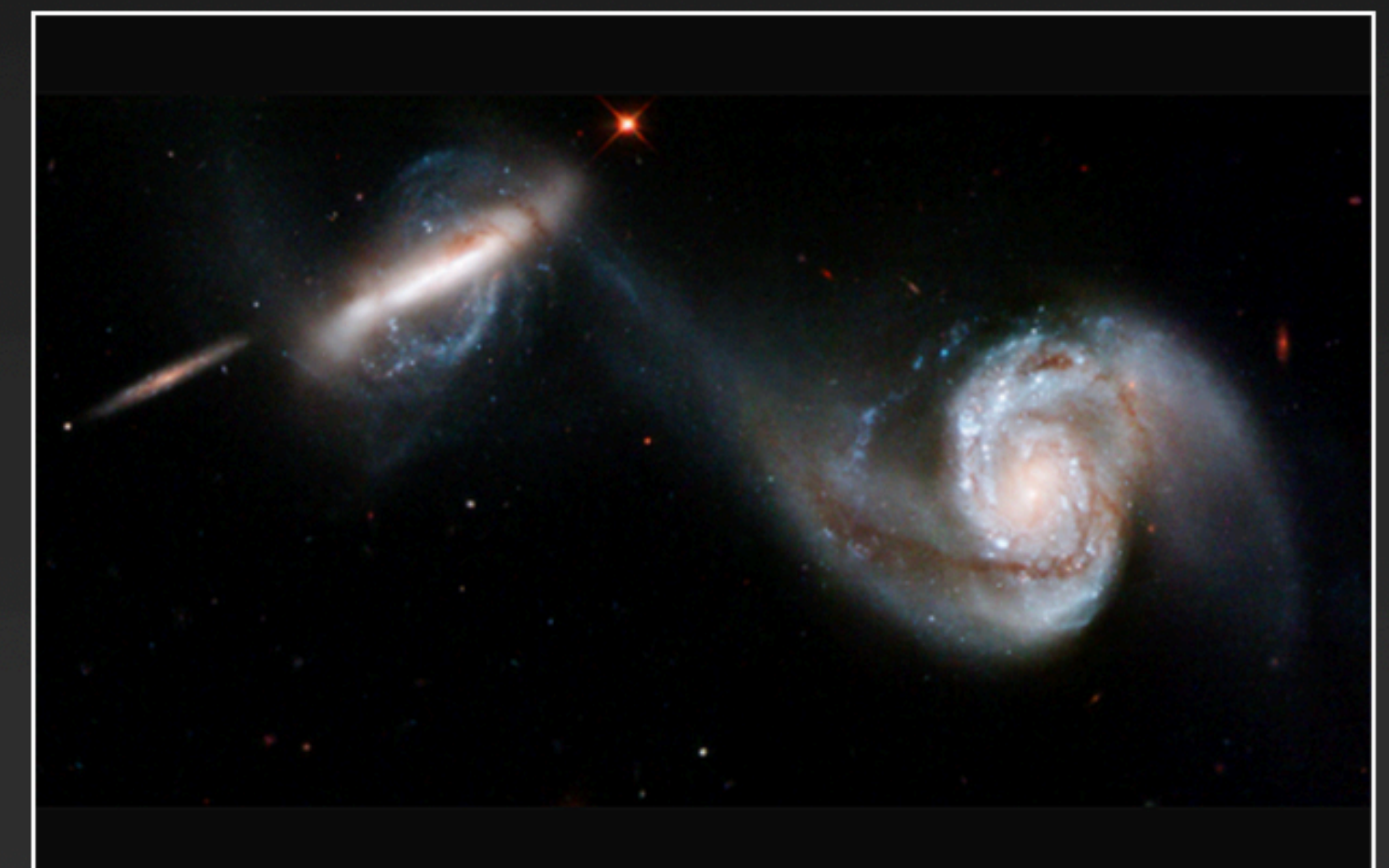
Minimum Lyman  
Werner flux



Maximum gas spin  
Toomre instability  
threshold



Rich environment  
At least one  
neighboring galaxy



**Lewis' talk**

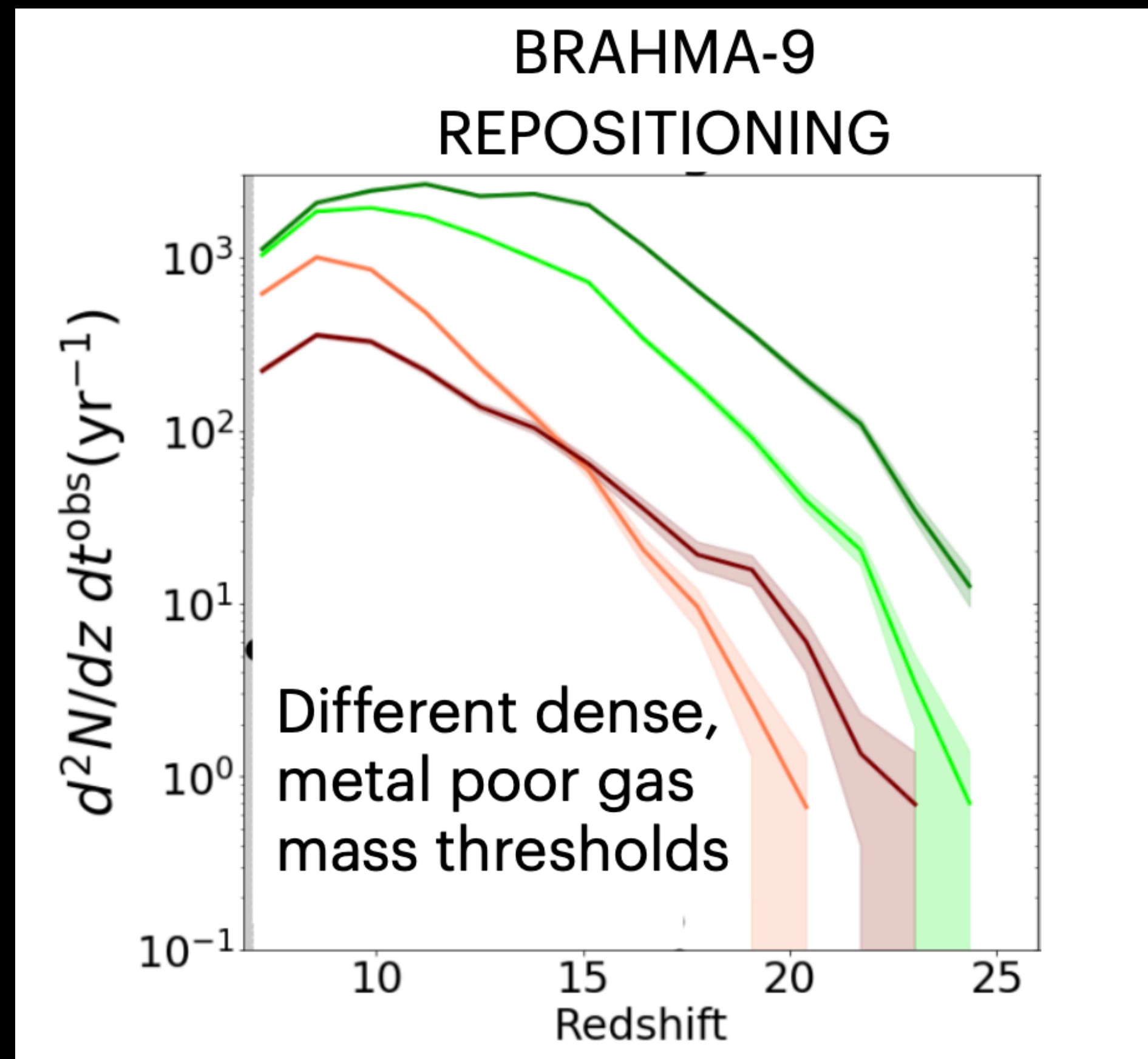
# Implications for LISA!



LISA

Laser Interferometer Space Antenna

# Merger rates (upper limits) of $\geq 10^3 M_{\odot}$ BHs

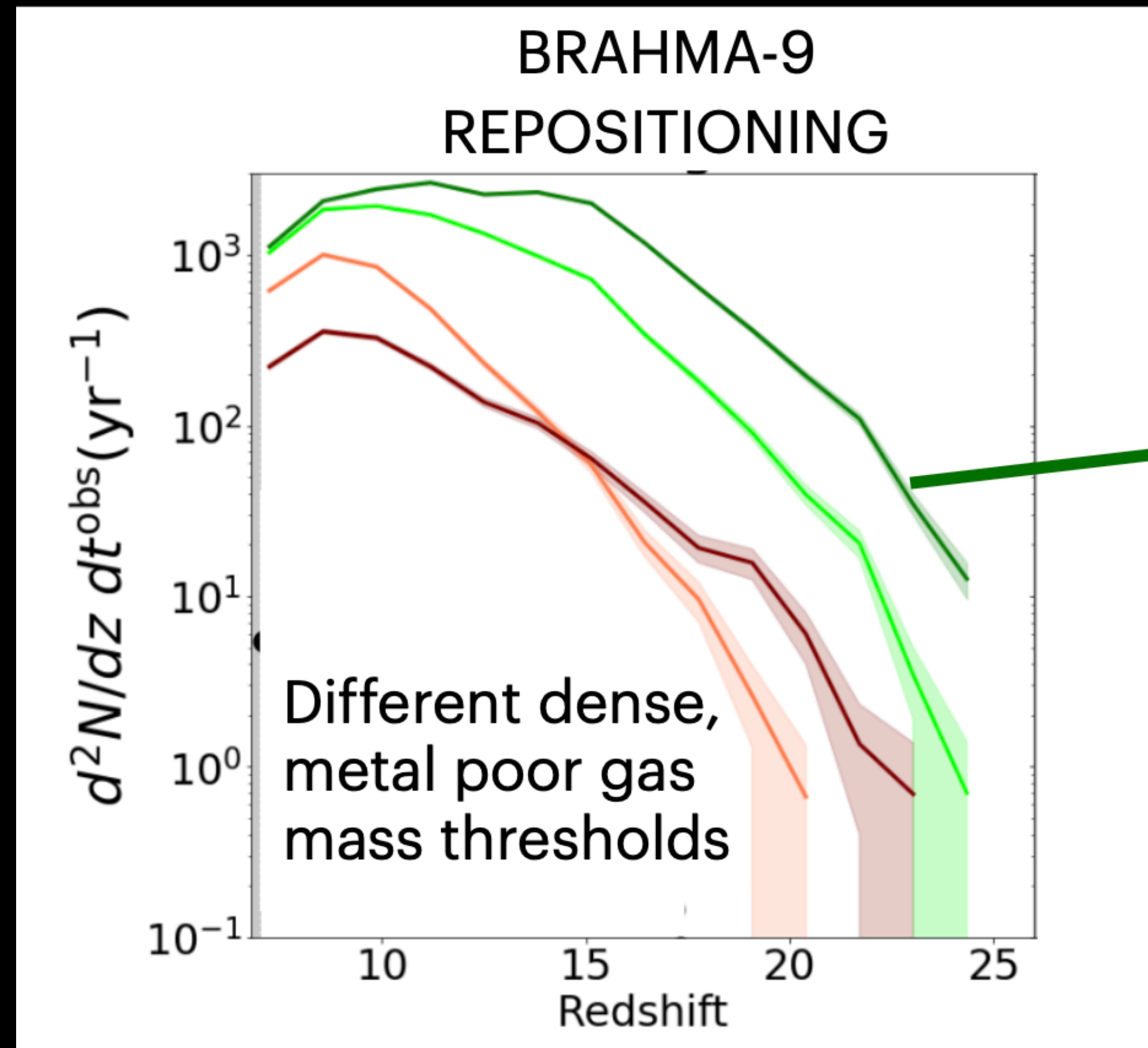


Bhowmick et al 2024b

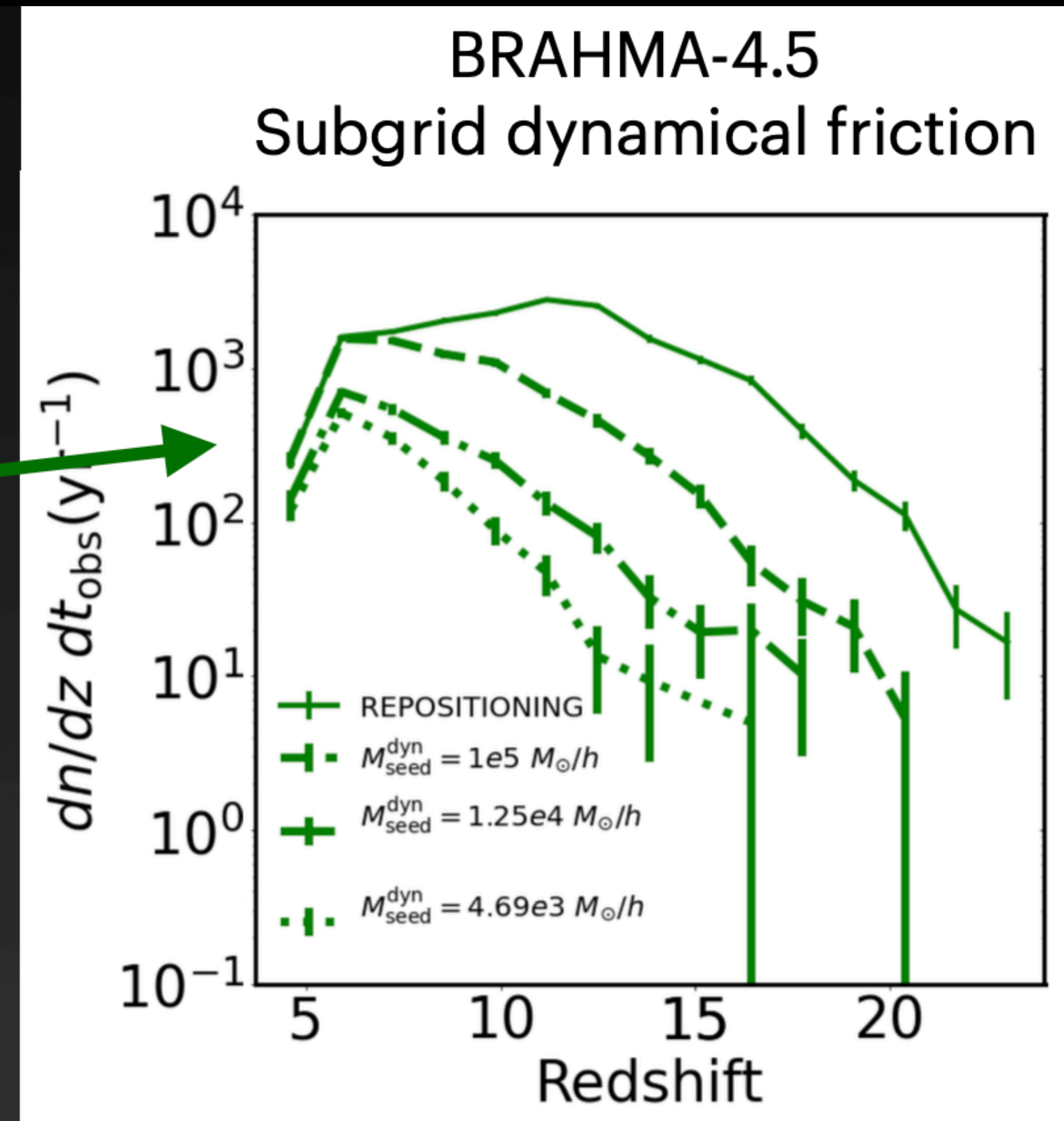
Strong sensitivity  
to the seeding  
environment!

Up to  $\sim 200$ - $2000$   
potential mergers  
per year

# Merger rates (upper limits) of $\geq 10^3 M_{\odot}$ Bus

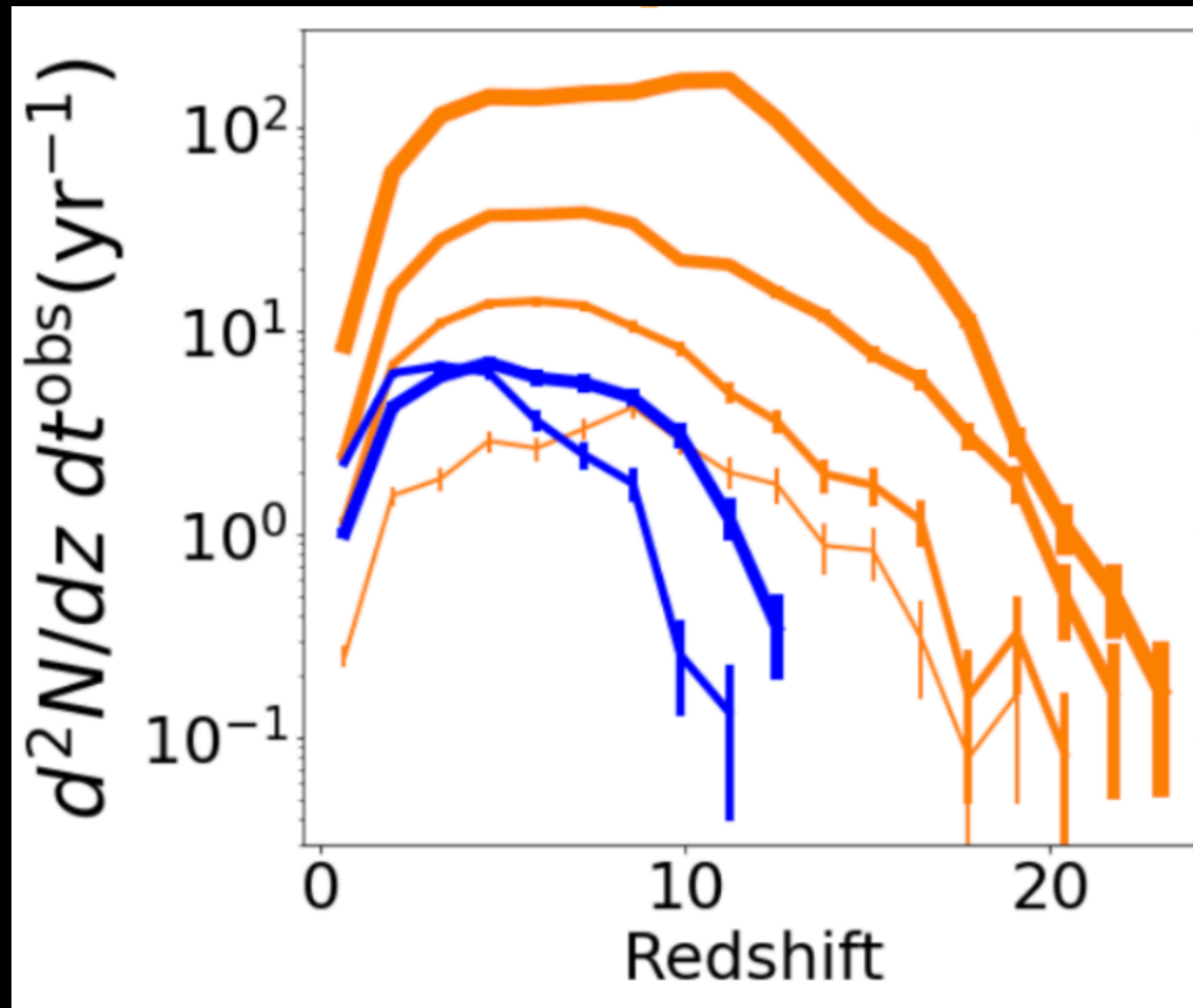


Bhowmick et al 2024b



Bhowmick et al in prep

# Merger rates (upper limits) of $\geq 10^5 M_{\odot}$ BHs



**Formed as heavy seeds**

**vs**

**Descendants of low mass seeds**

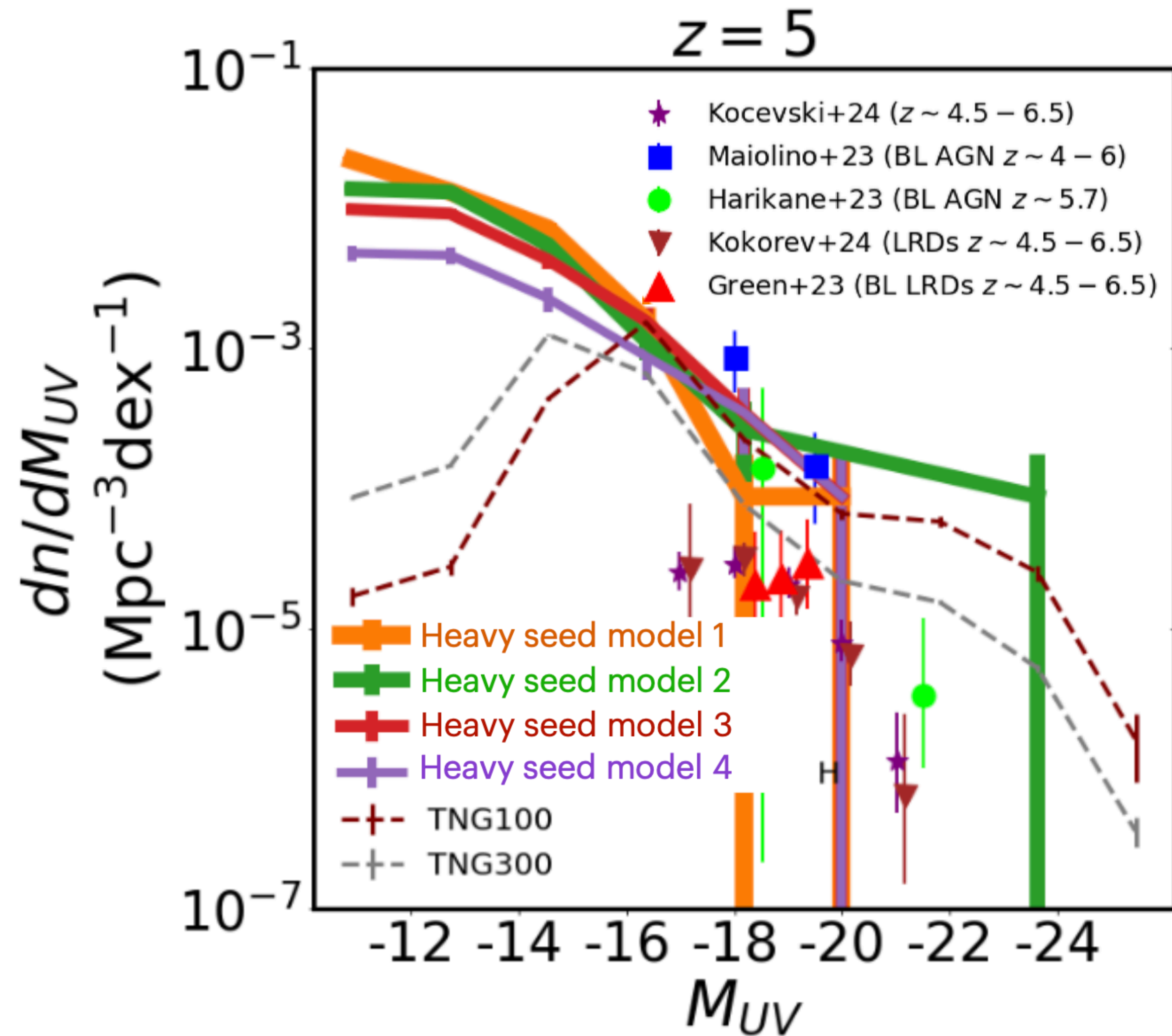
# Conclusions

- 1) We present BRAHMA, a new cosmological simulation suite that systematically explores the impact of black hole seeding on high-z supermassive BH populations.
- 2) BRAHMA implements novel seed models, including an approach to model seeds  $\sim 10$ -100 times below the simulation resolution.
- 3) Simulations provide upper limits of 200-2000 mergers per year for LISA. The merger rates are strongly sensitive to the seeding environment and seed mass.

LISA will revolutionize our understanding of  
supermassive black hole origins

Cosmological simulations like BRAHMA will play a key role in making this happen!

# AGN luminosity functions: Seed models have no consequence at the bright (observable) end

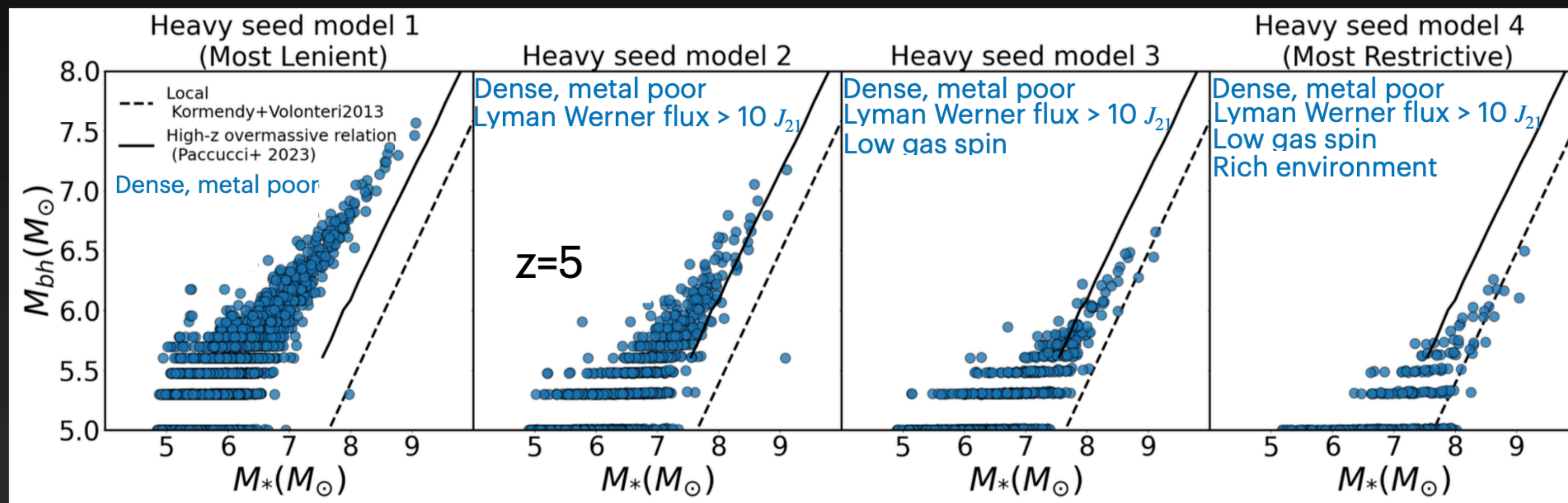


Broad agreement with JWST



# But the BH mass - stellar mass relations have substantial seed model variations

Bhowmick et al 2024c



If heavy seed formation is efficient enough, one could produce overmassive BHs via BH-BH mergers

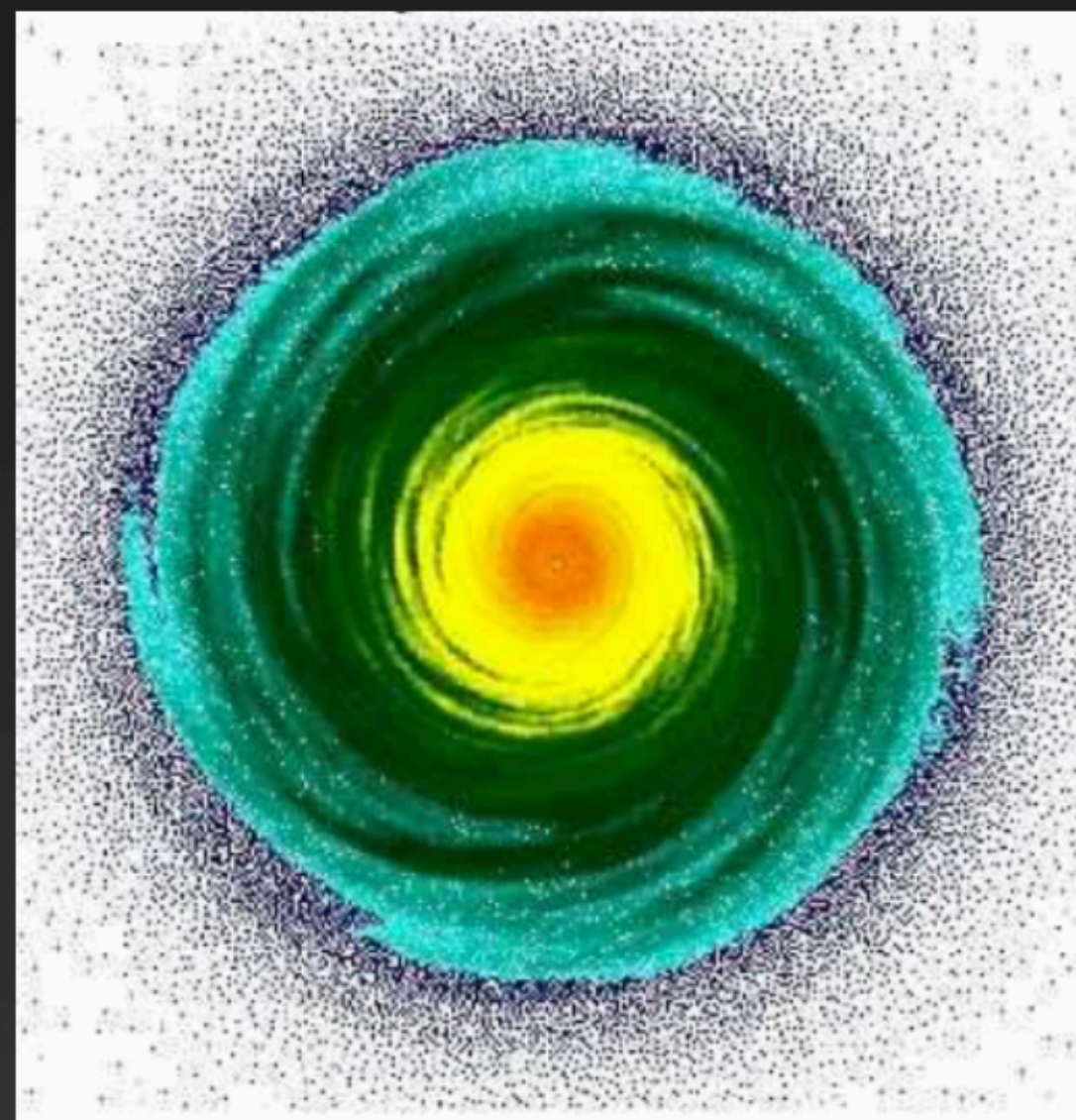
# Modeling heavy seeds in large cosmological simulations?

Additional criteria beyond high density and low metallicity gas

Minimum Lyman  
Werner flux



Maximum gas spin  
Toomre instability  
threshold

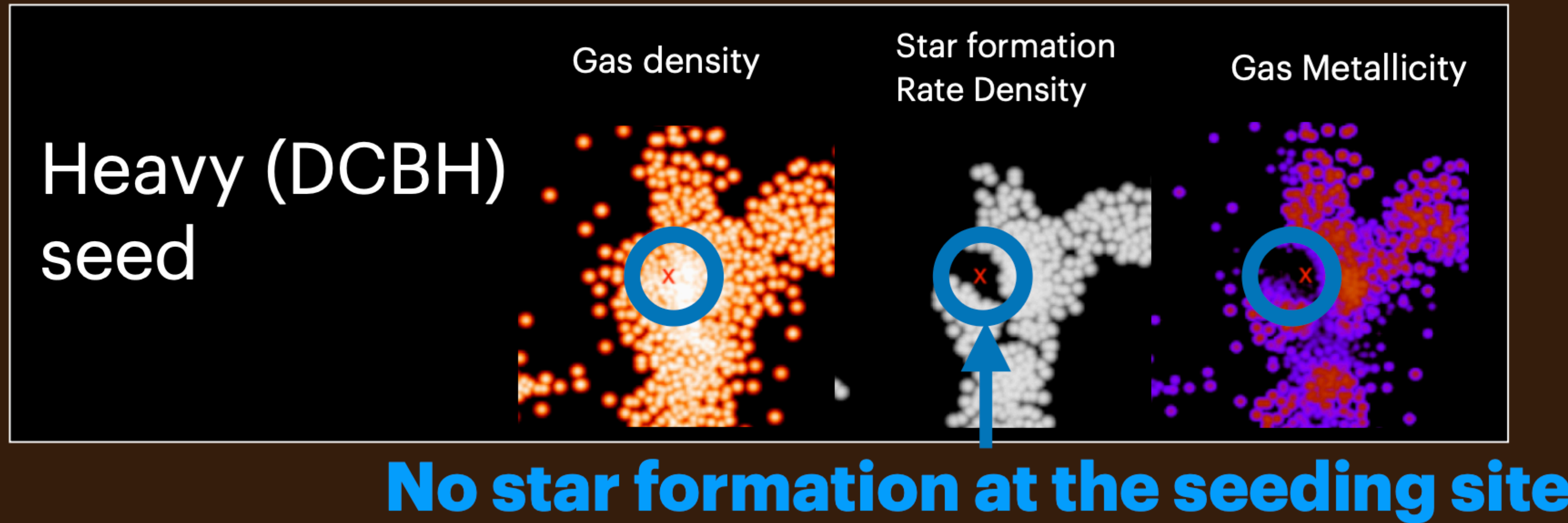


Rich environment  
At least one  
neighboring galaxy

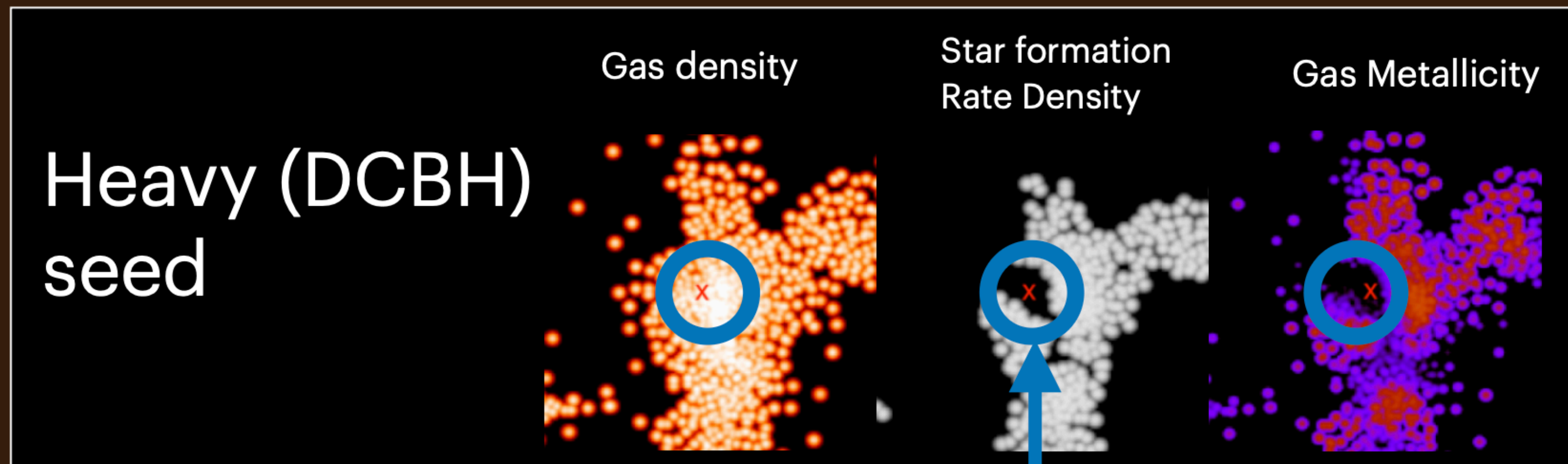


See Lewis Prole's talk

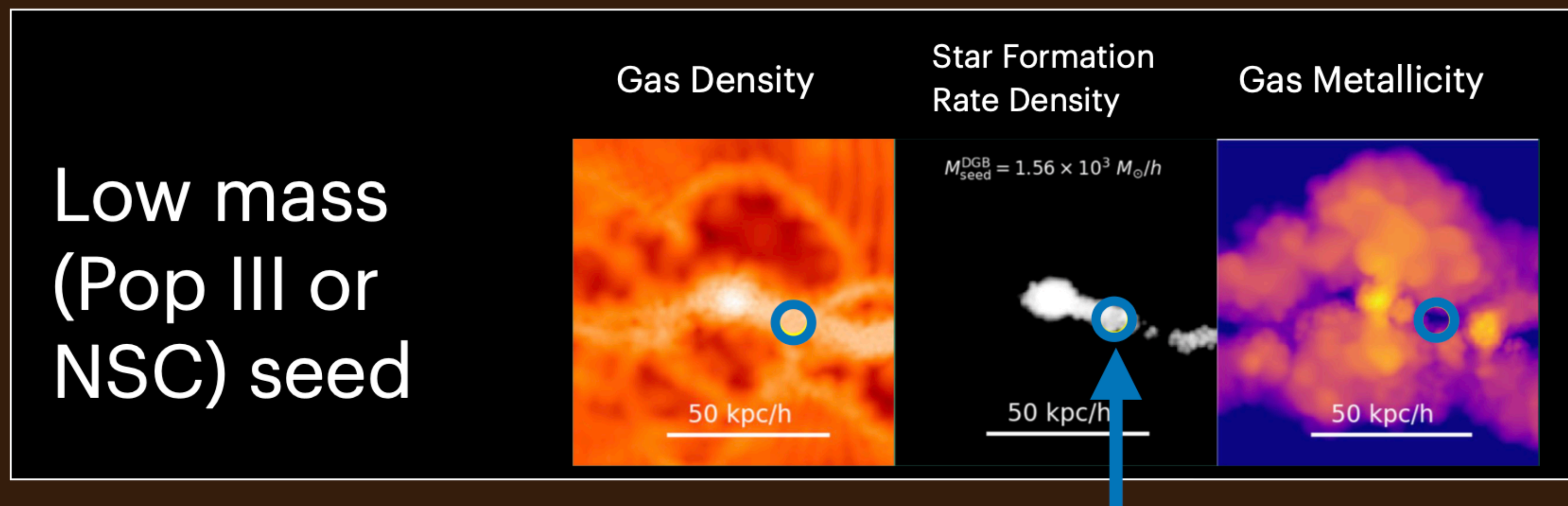
# Typical sites for DCBH formation



# Typical sites for DCBH formation

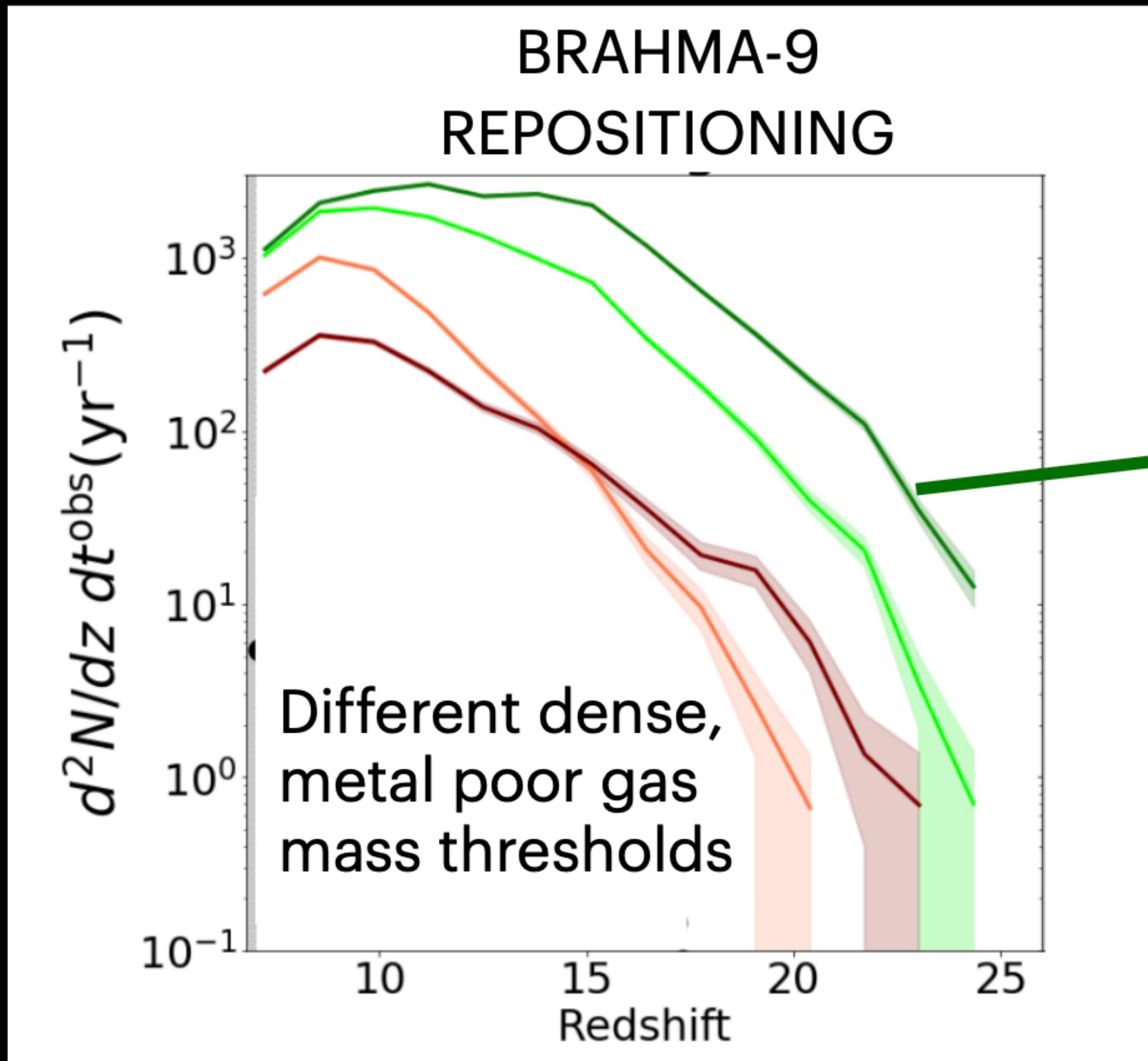


**No star formation at the seeding site**

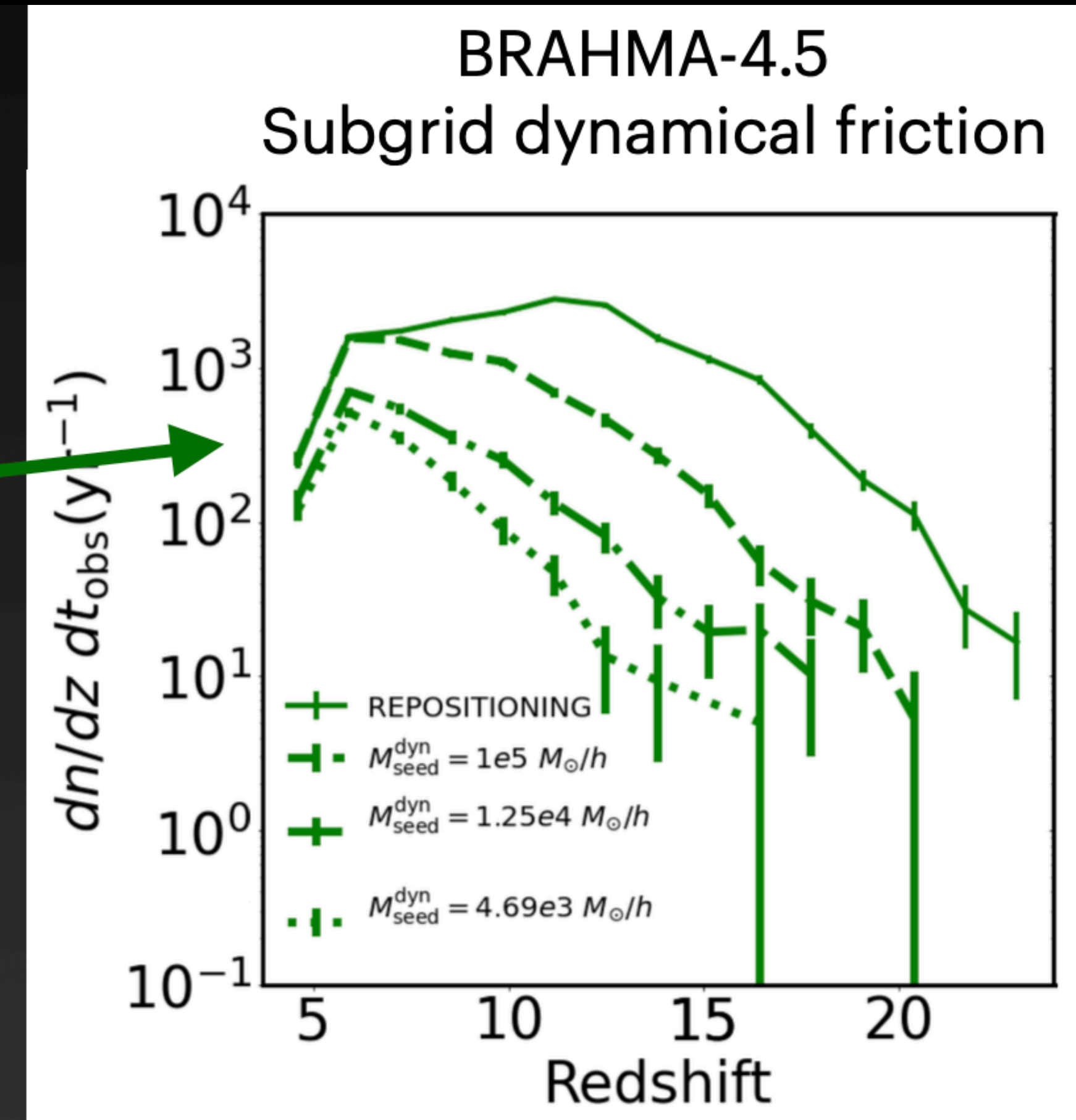


**Active star formation at the seeding site**

# Merger rates (upper limits) of $\geq 10^3 M_{\odot}$ Bus



Bhowmick et al 2024b

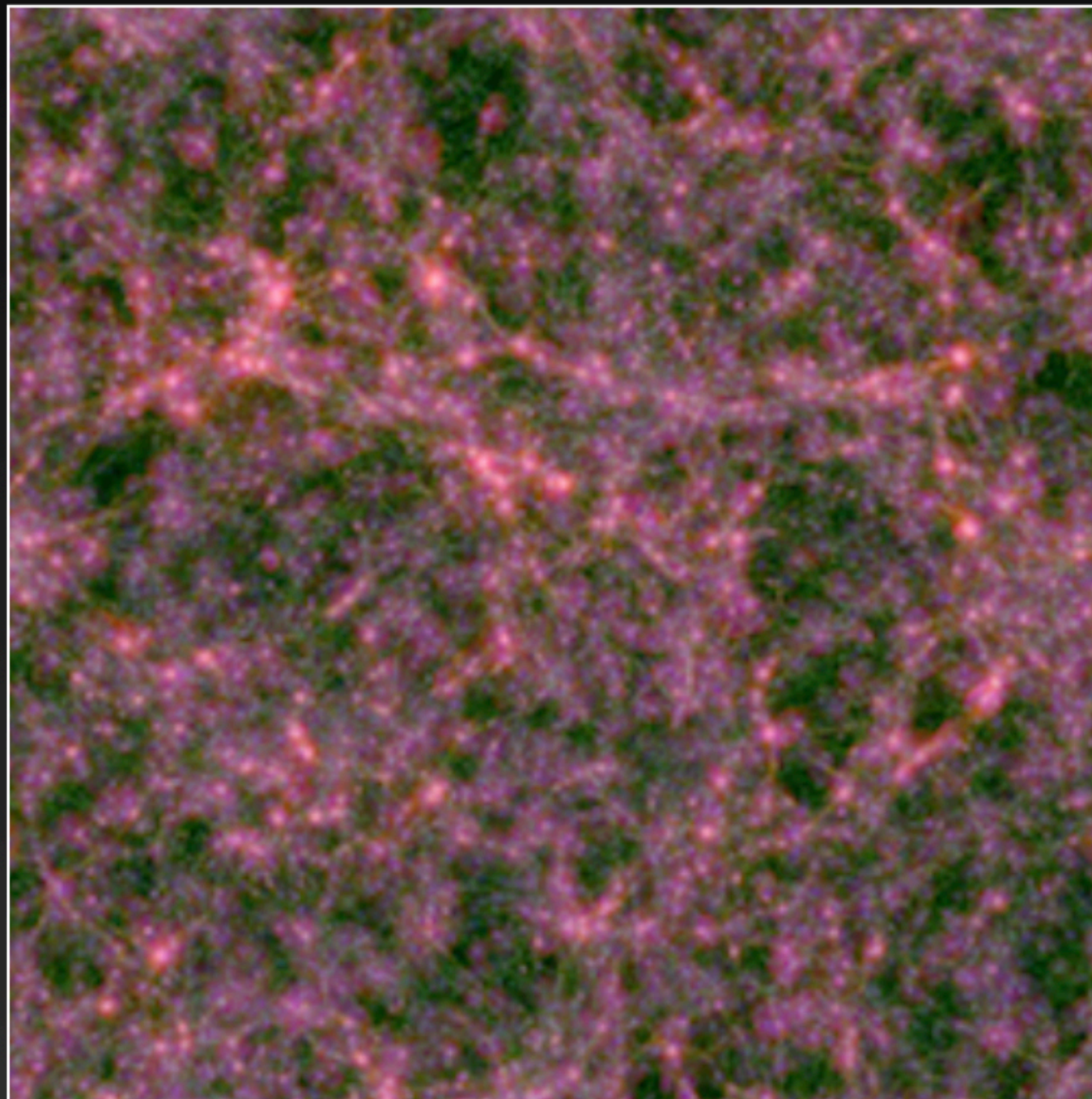


Bhowmick et al in pr

# Simulations have started adopting more physically motivated seeding prescriptions

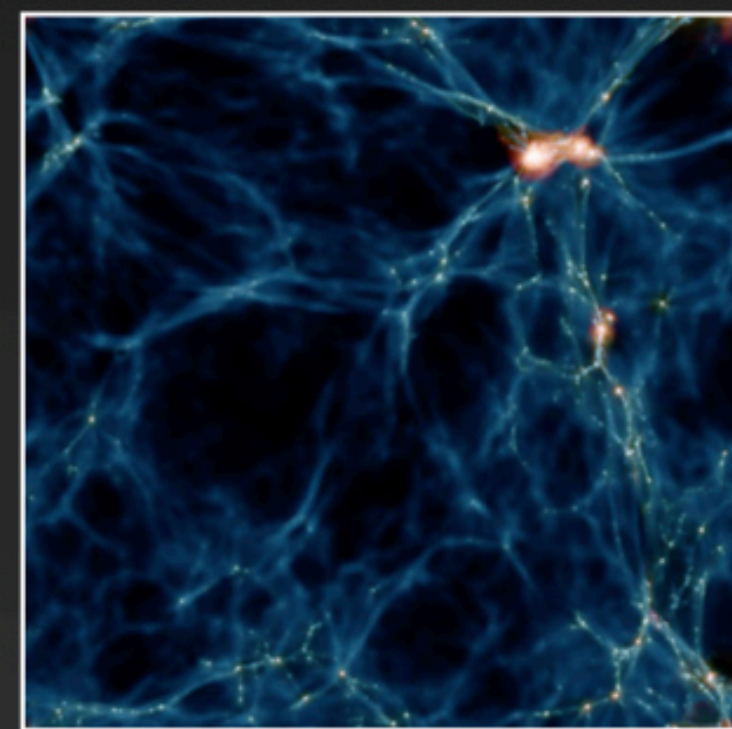
Seeding based on local gas properties

Horizon-AGN Kaviraj et al 2016

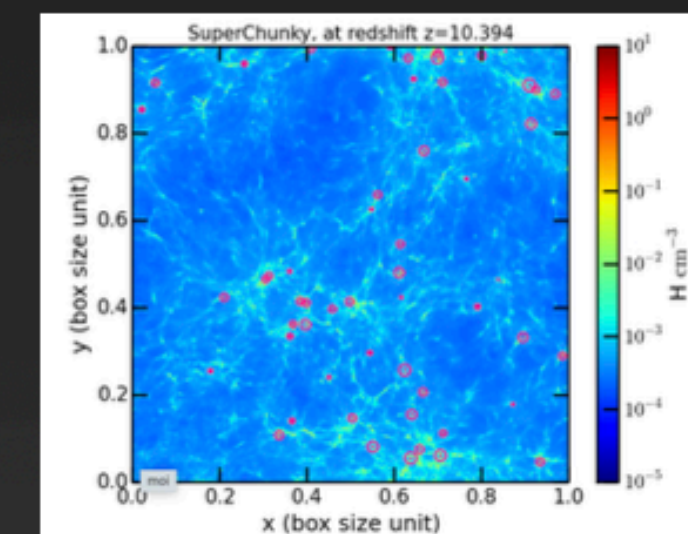


Taylor and Kobayashi+ 2014  
Wang+ 2019  
Bellovary+ 2019

ROMULUS Tremmel+2017



SuperChunky Habouzit+2016



# Due to uncertain seeding mechanisms, we need systematic exploration of seed model variations

## Semi-Analytic models

Barausse 2012

Ricarte and Natarajan 2018

Dayal et al 2018

Banik et al 2019

Degraf et al 2020

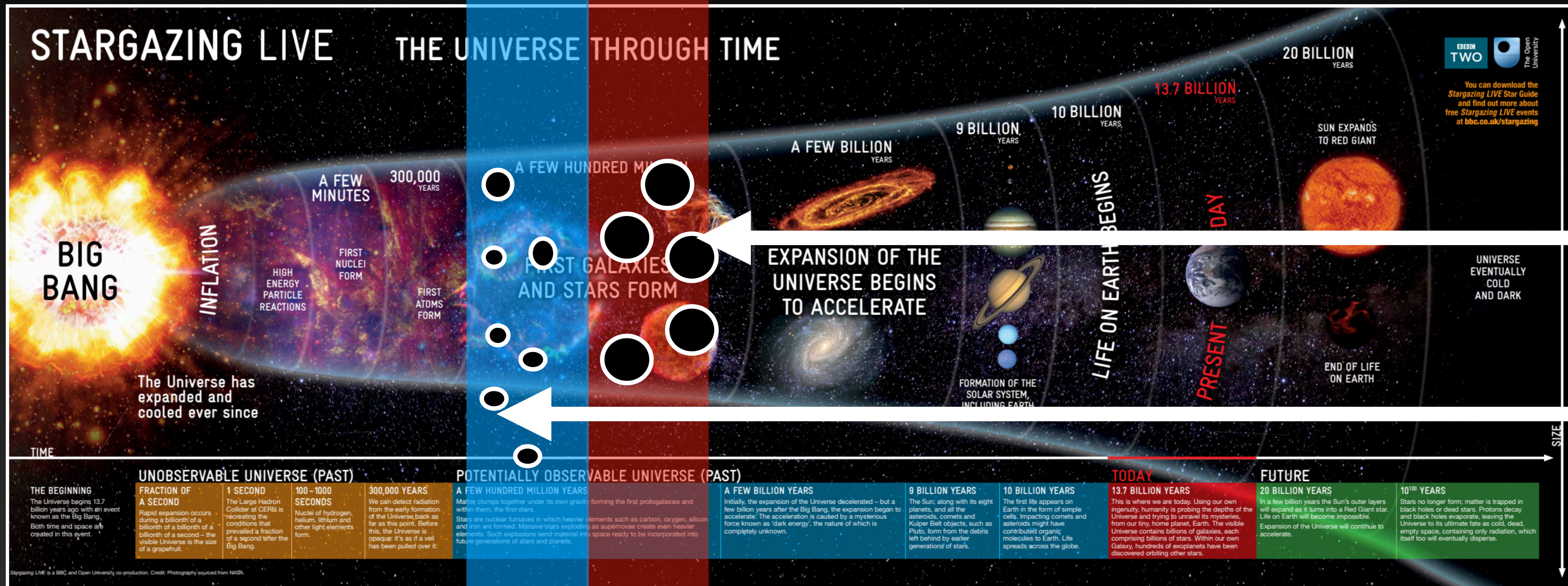
Sassano et al 2021

Spinoso et al 2022

Trinca et al 2022, 23, 24

Evans et al 2023

# We are pushing new observational frontiers for high-z black holes, and will continue to do so!



**WEBB**  
SPACE TELESCOPE

**LISA**  
Laser Interferometer Space Antenna

Current JWST observations  $\sim 10^6 - 10^8 M_{\odot}$  BHs at  $z \sim 4 - 11$

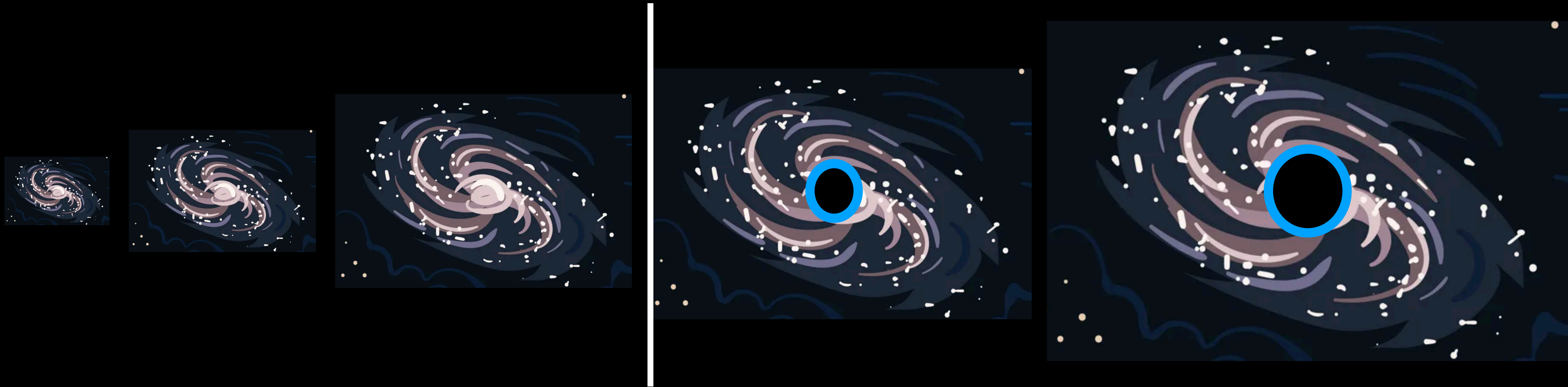
Future LISA observations  $\sim 10^3 - 10^7 M_{\odot}$  up to  $z \sim 15$

Crucial time to make theoretical predictions!!



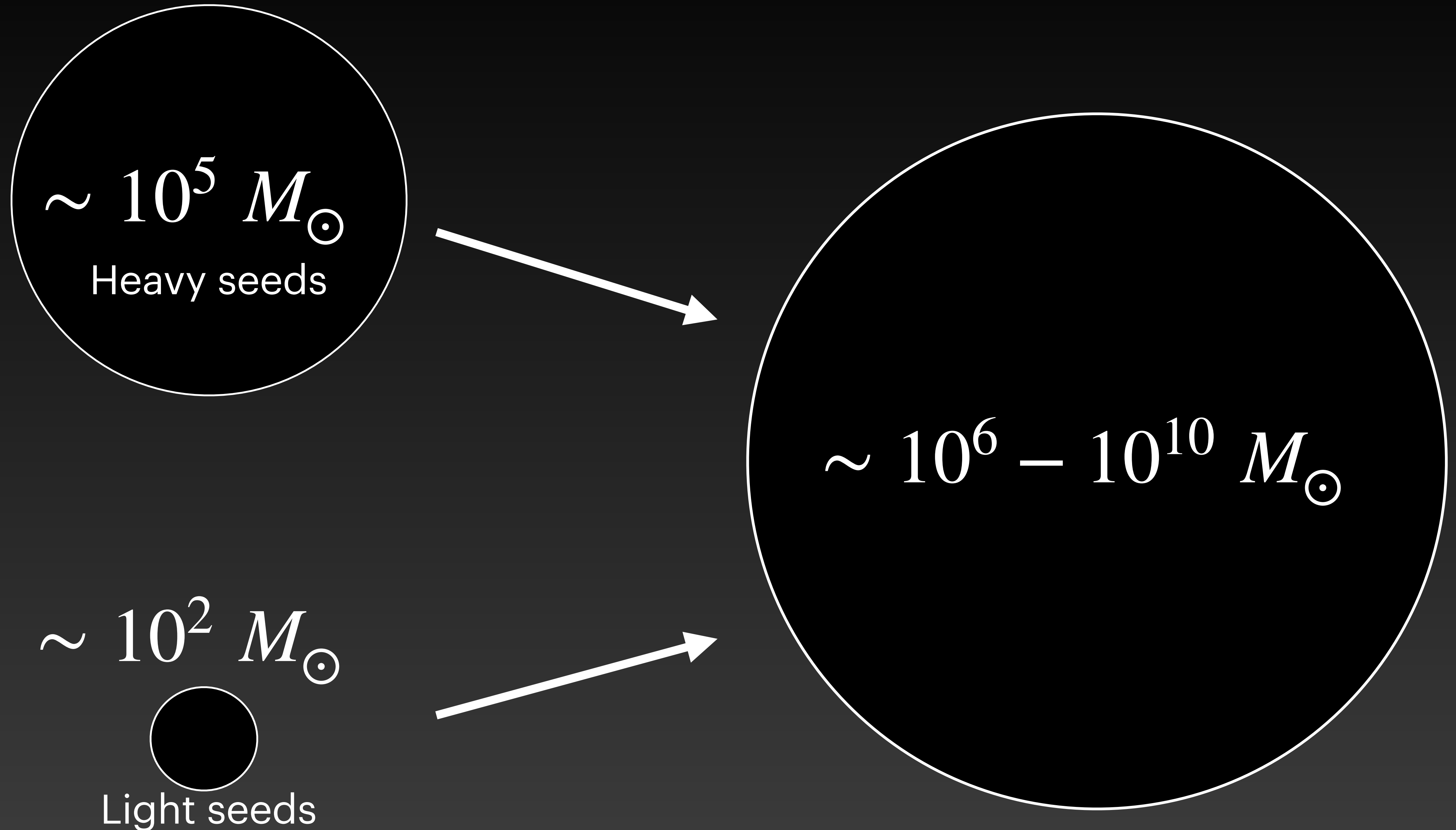
# The vast majority of simulations use very simplistic black hole seed models

**Minimum halo mass threshold**



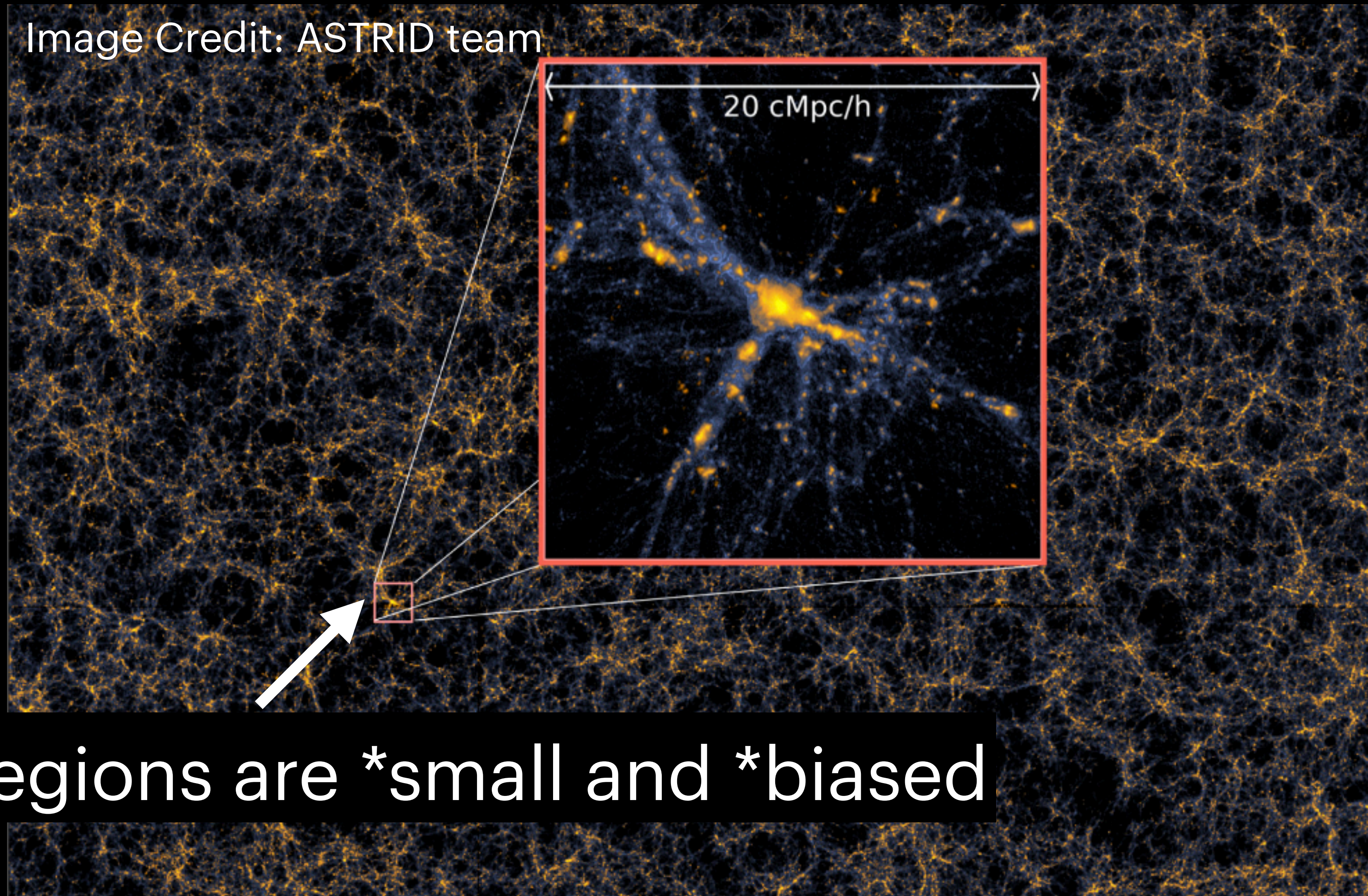
Cosmic time

# What were the first “seed” black holes that grew into supermassive black holes?

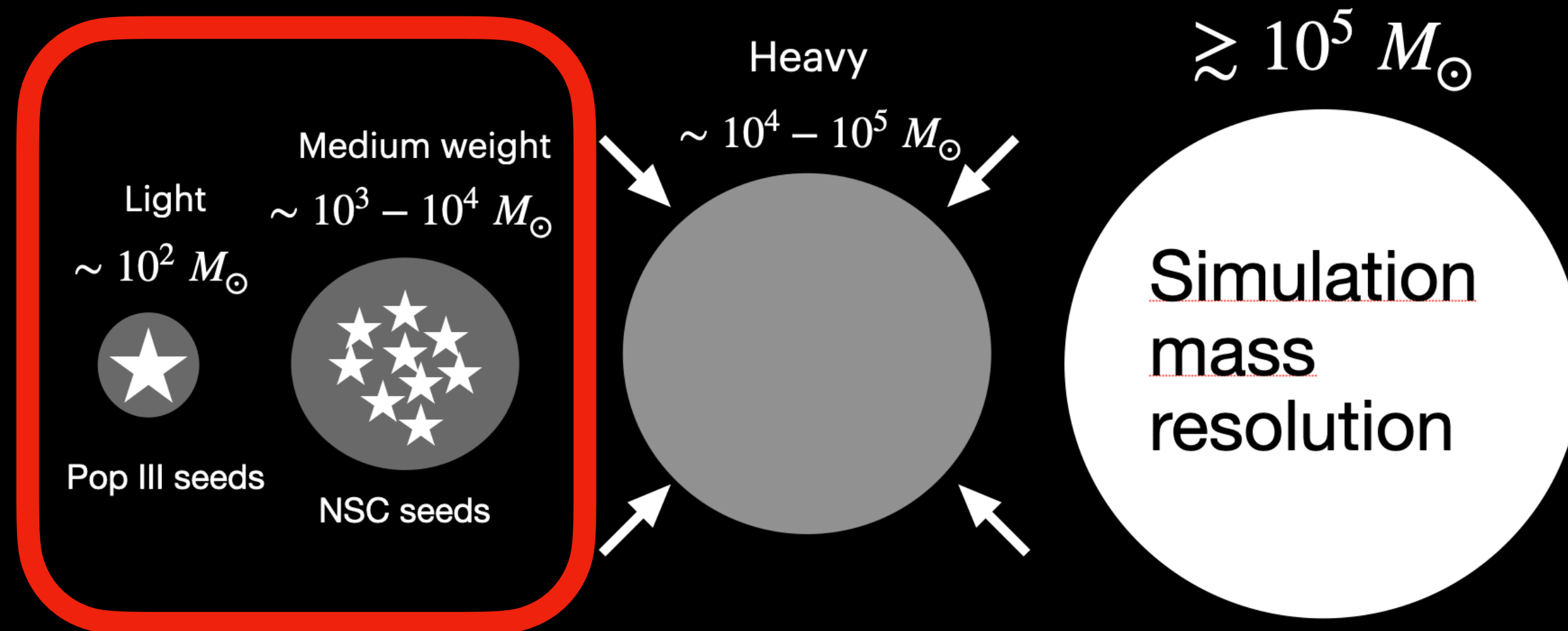
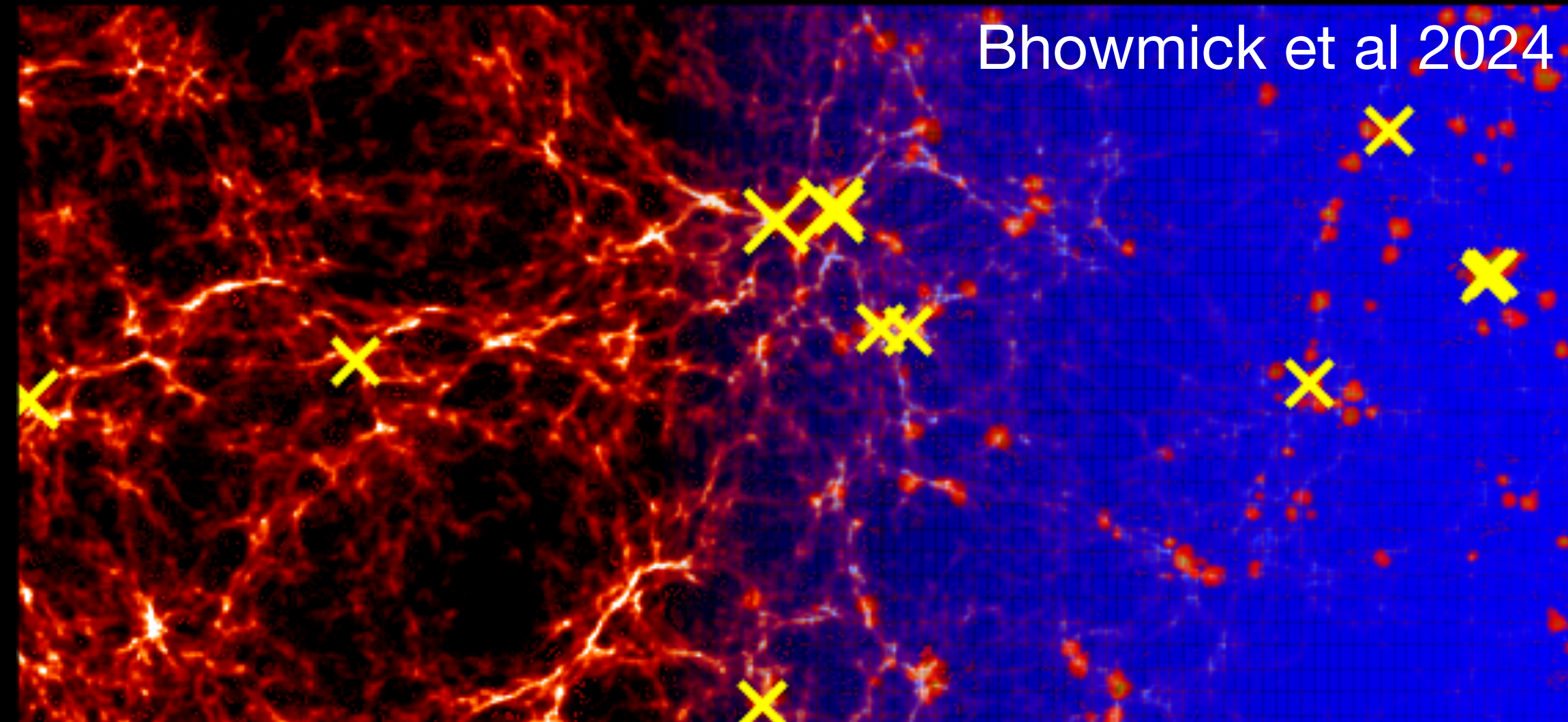


# Zoom simulations predictions are difficult to compare with observations

Bhowmick et al 2021, 2022, 2023



# How do we model these low mass seeds in large cosmological simulations? Surpassing the resolution limitation

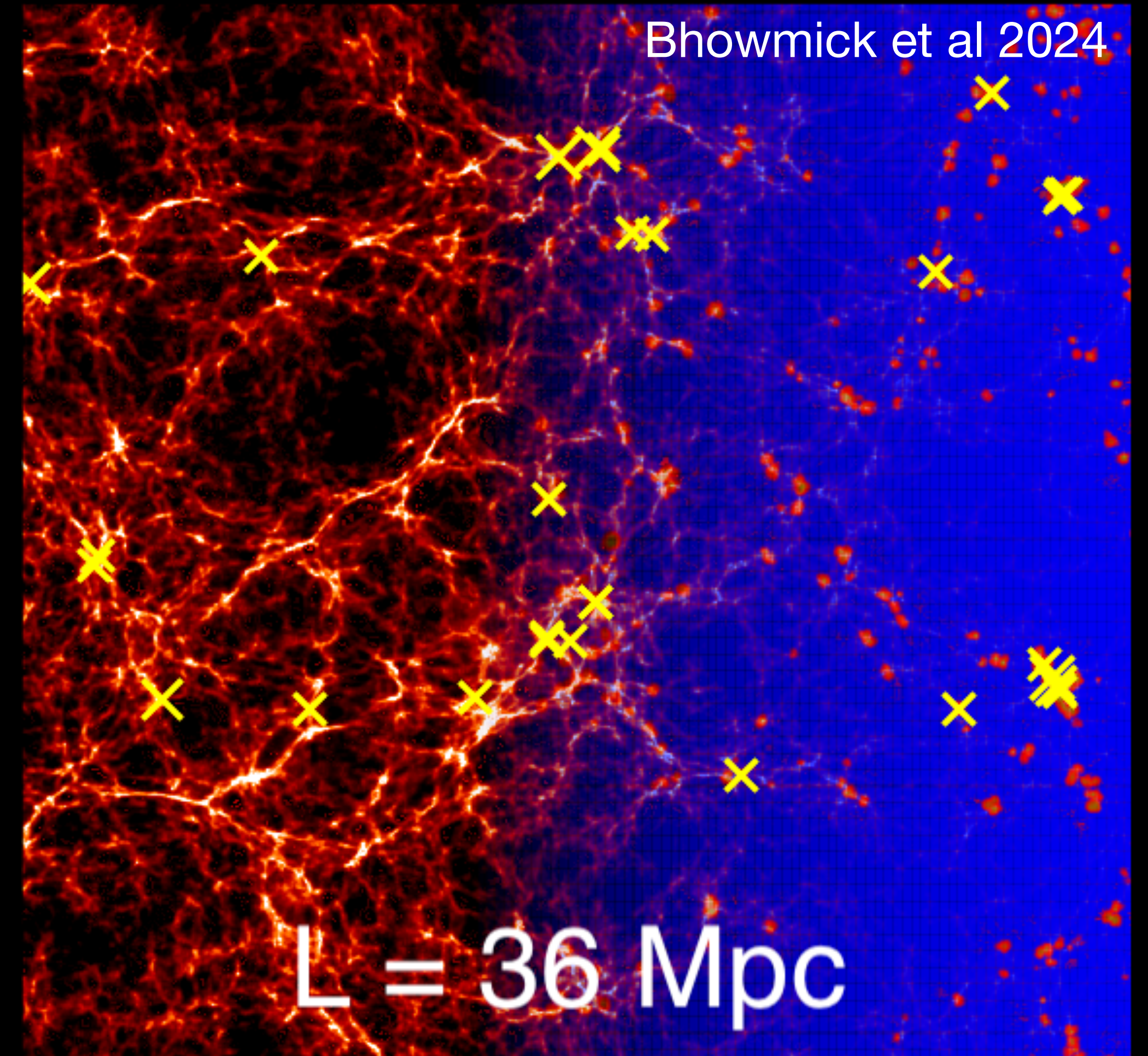
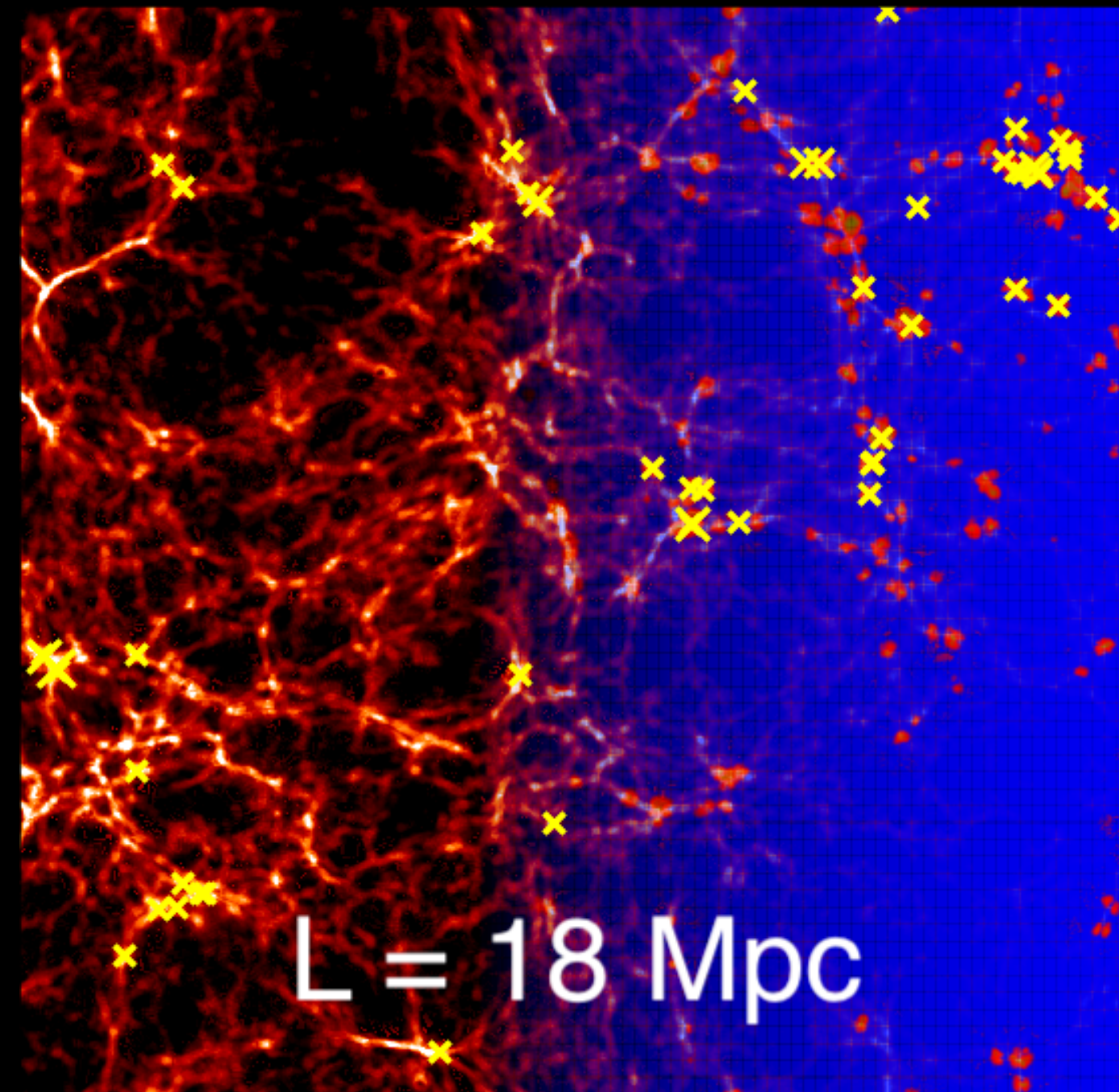
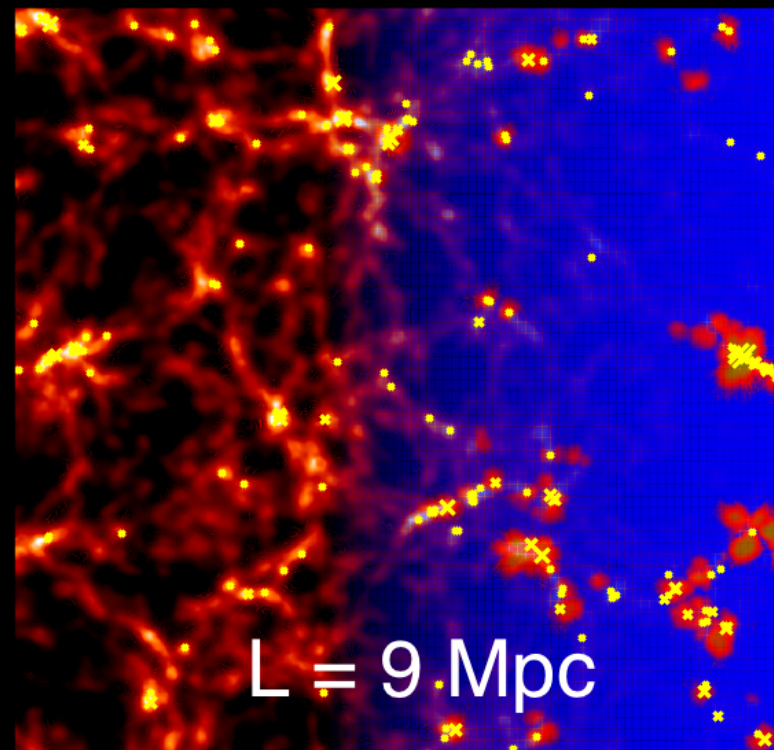


1pc

# Having multiple simulation boxes with increasing volumes and decreasing resolution

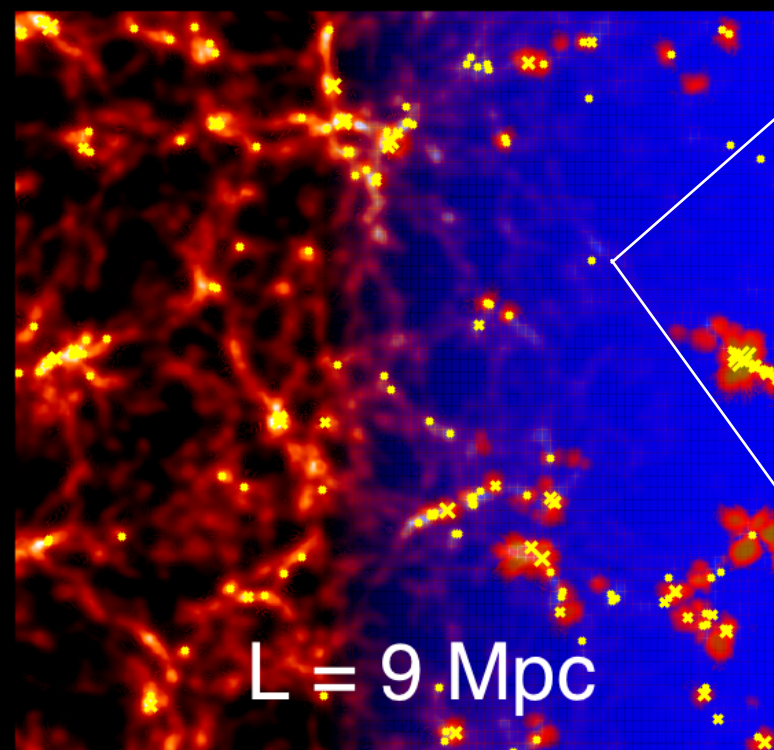
Largest volume, lowest resolution

Smallest volume,  
highest resolution

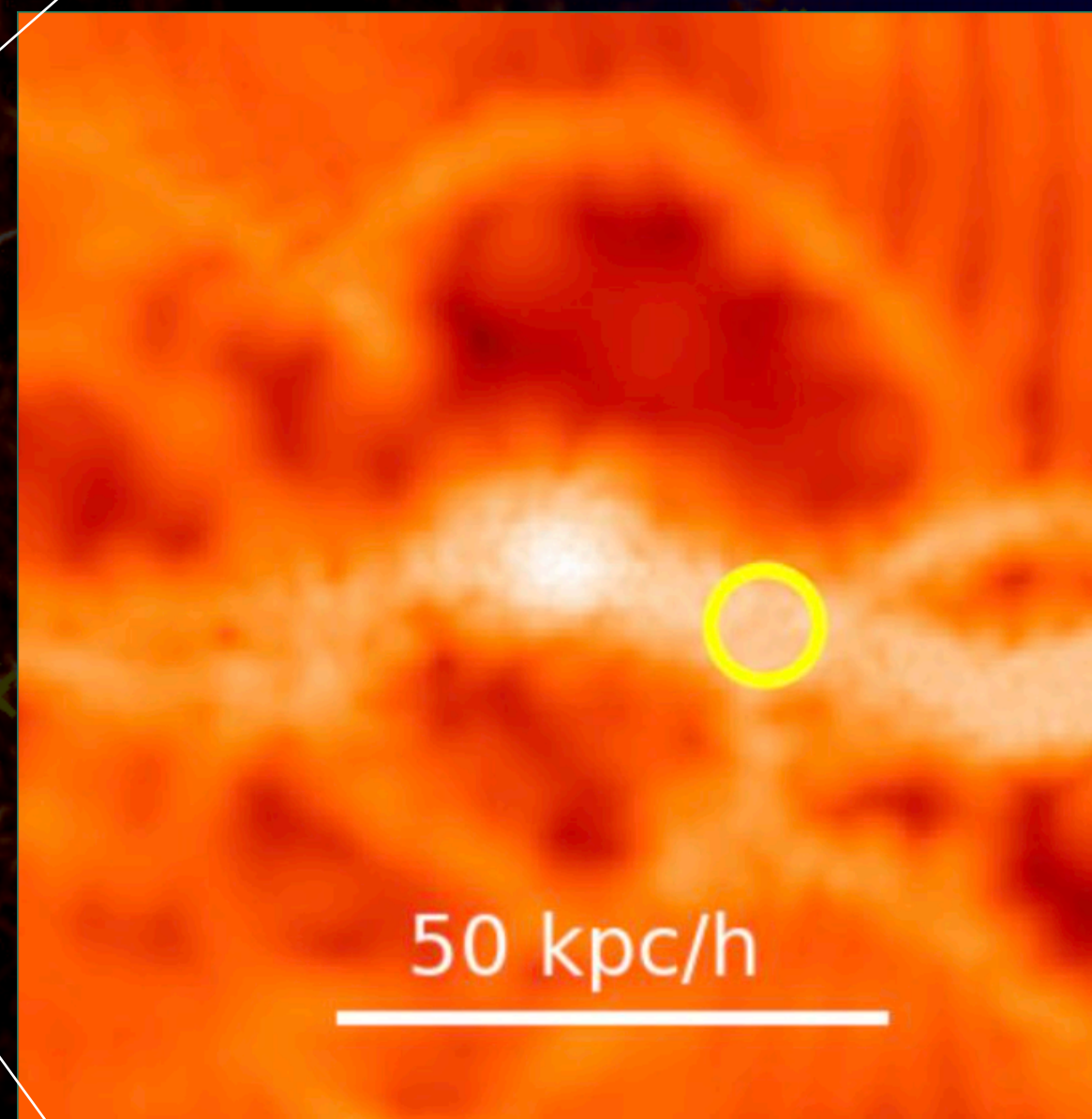


# Placing seeds in the smallest volume box

Smallest volume,  
highest resolution

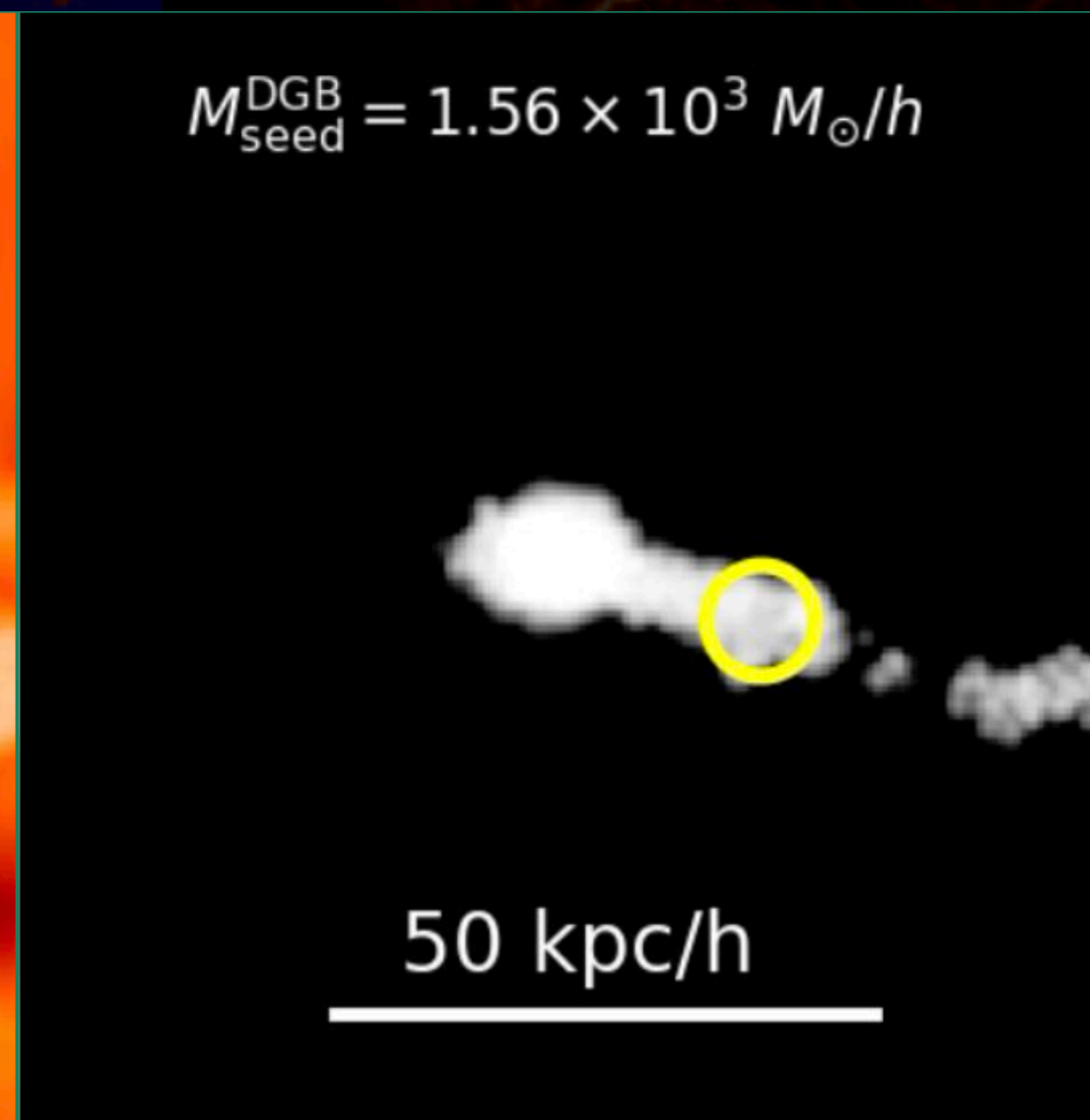


Gas density

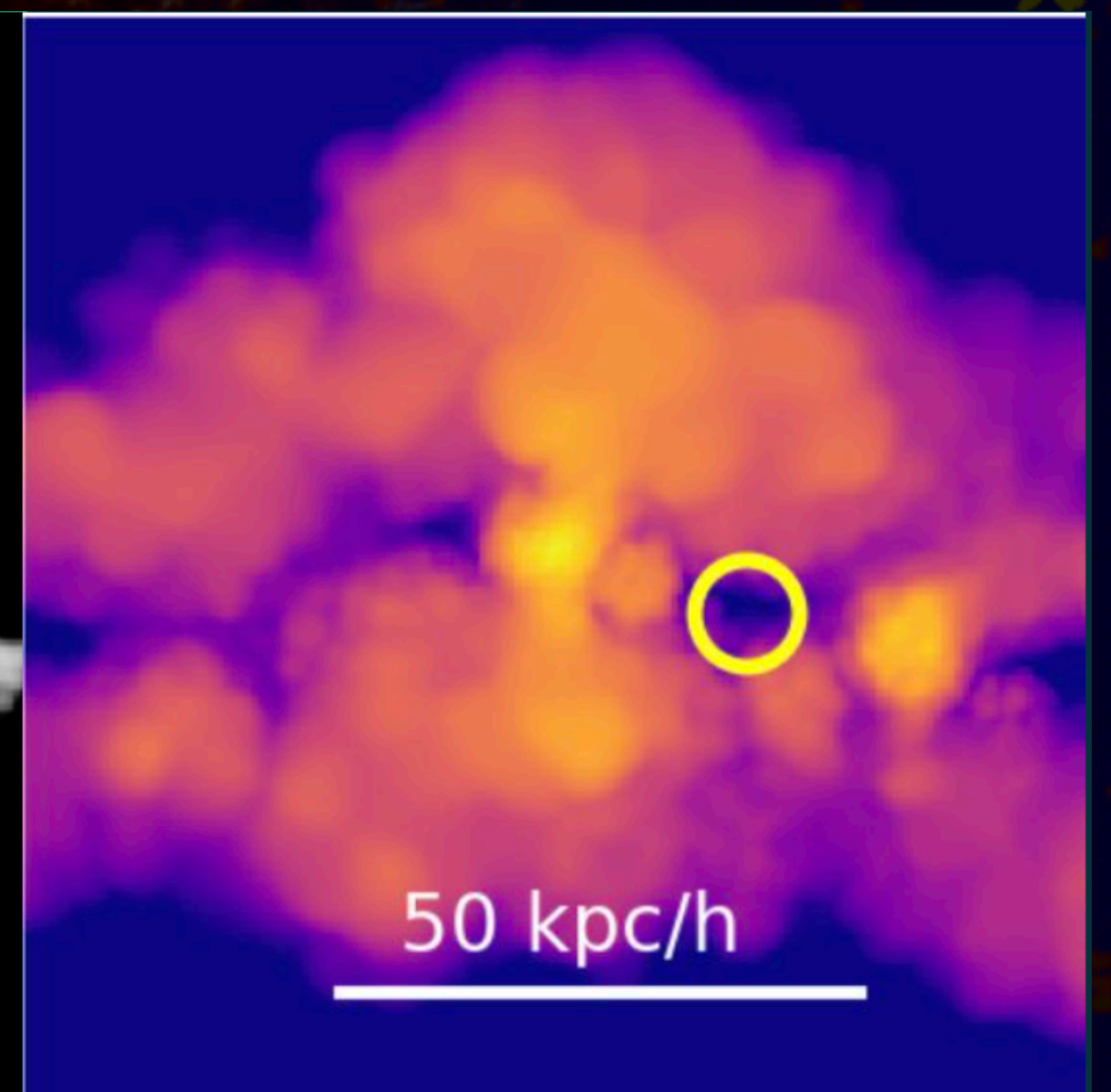


Star formation rate

$$M_{\text{seed}}^{\text{DGB}} = 1.56 \times 10^3 M_{\odot}/h$$



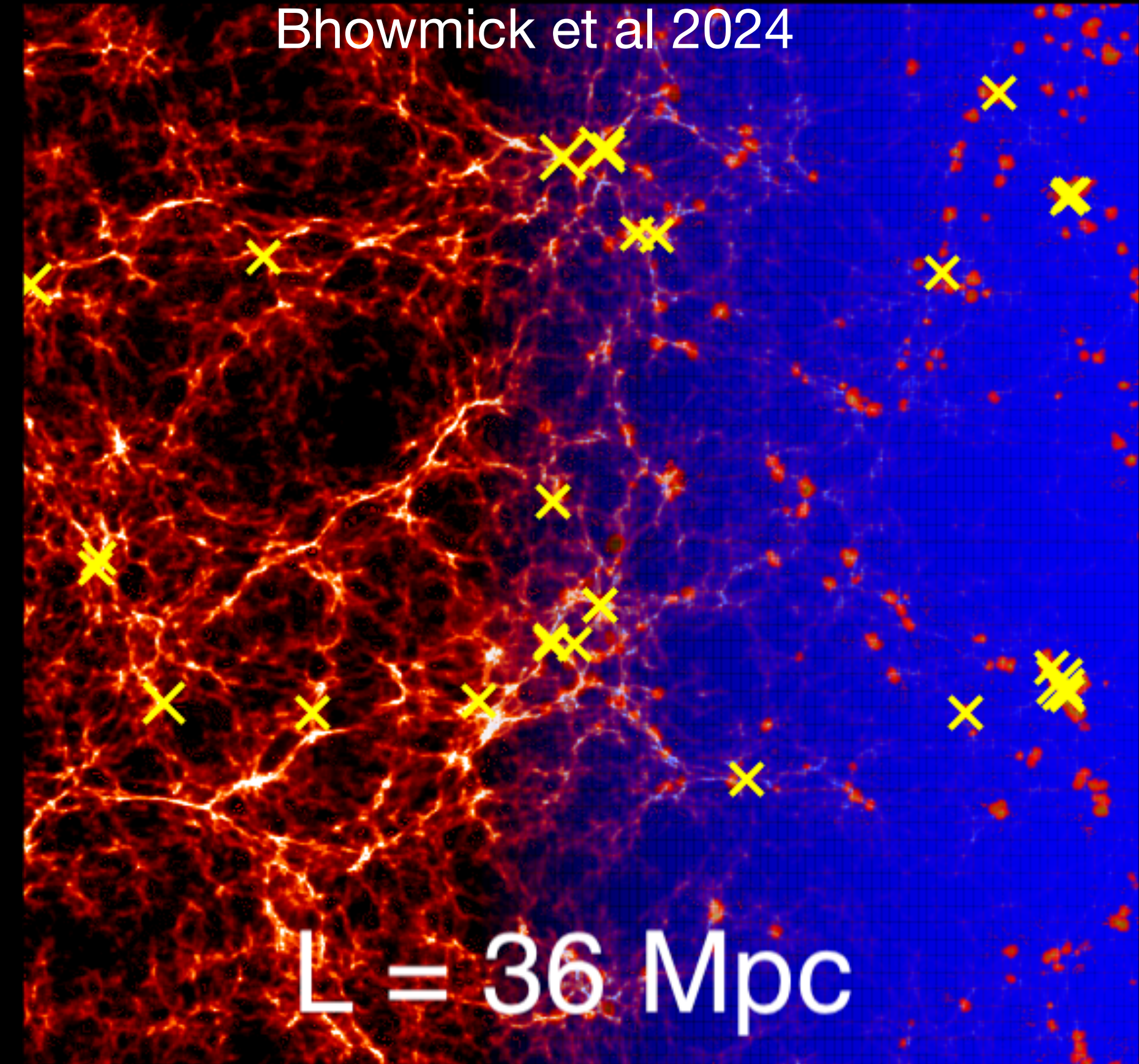
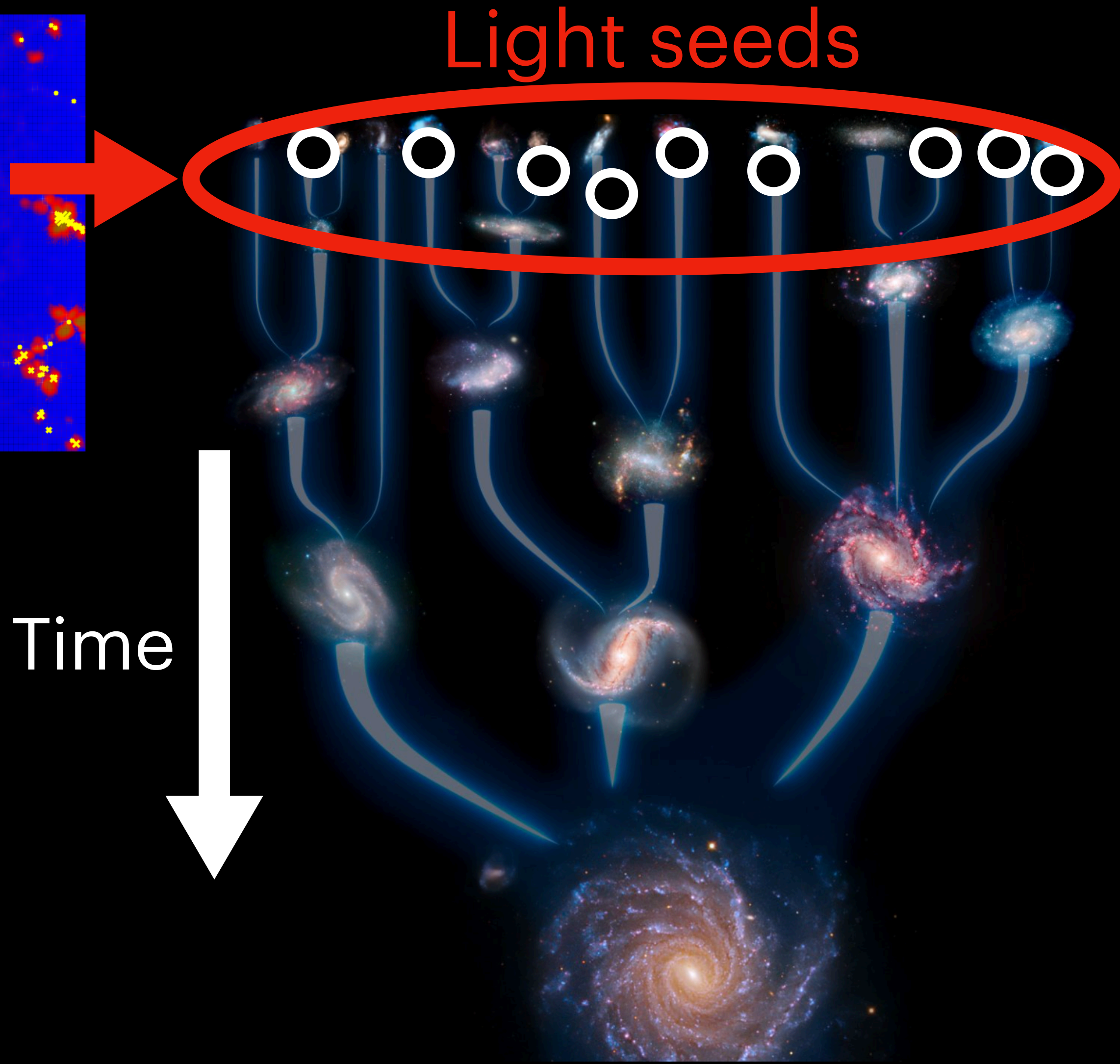
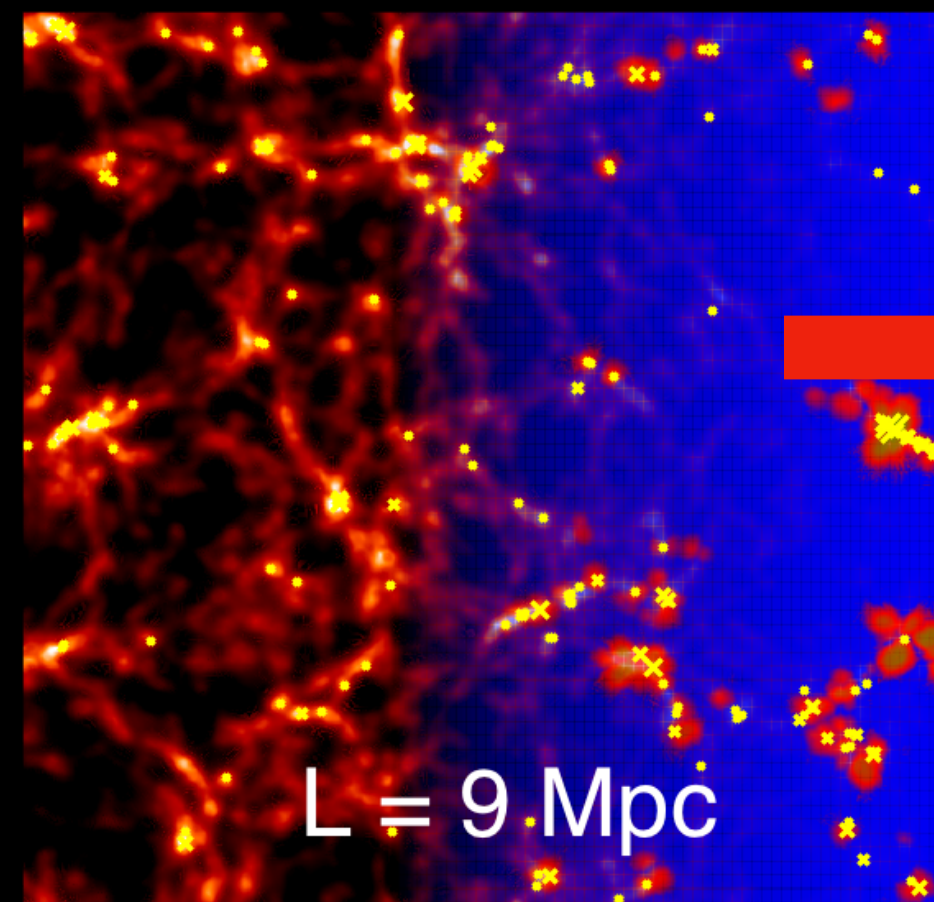
Gas Metallicity



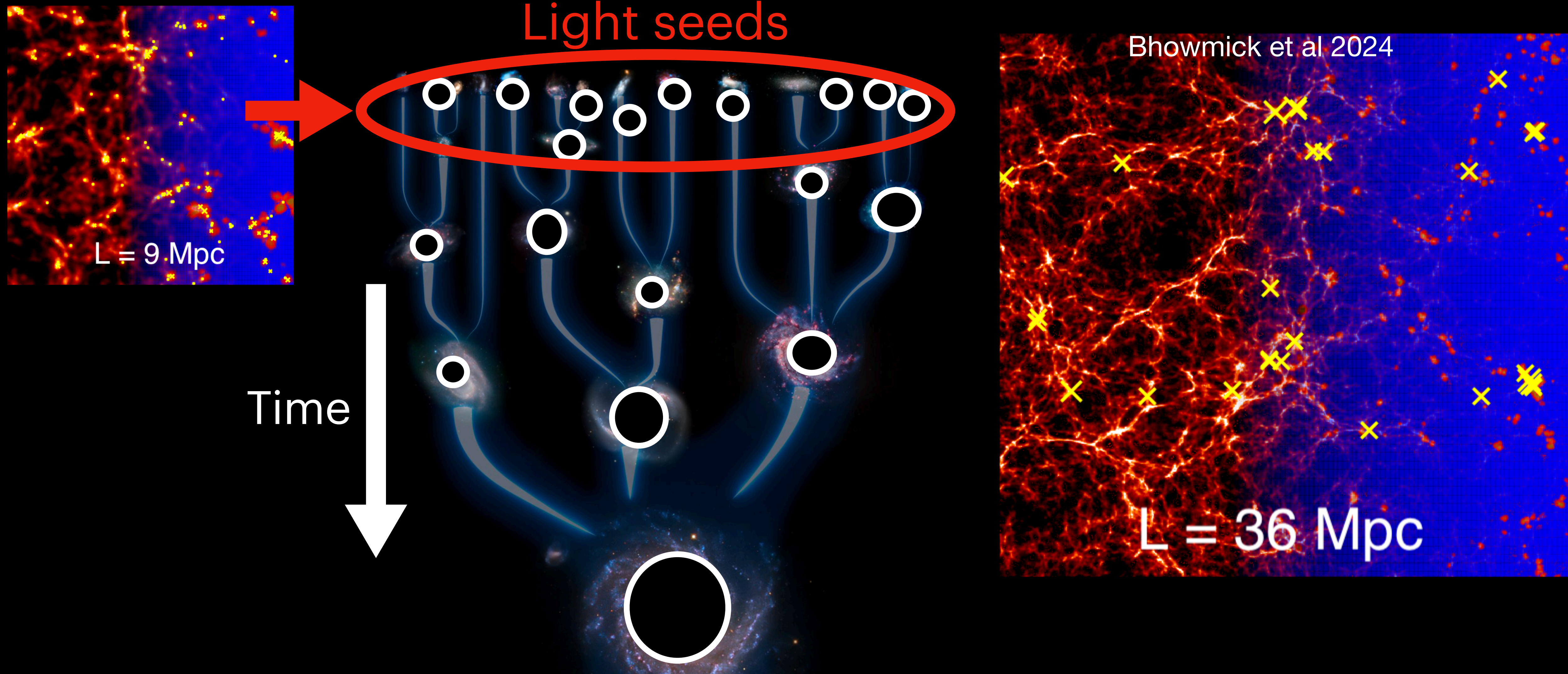
Bhowmick et al 2023

$L = 36 \text{ Mpc}$

# Following the growth of these low mass seeds along the 'evolution tree' of their host galaxies

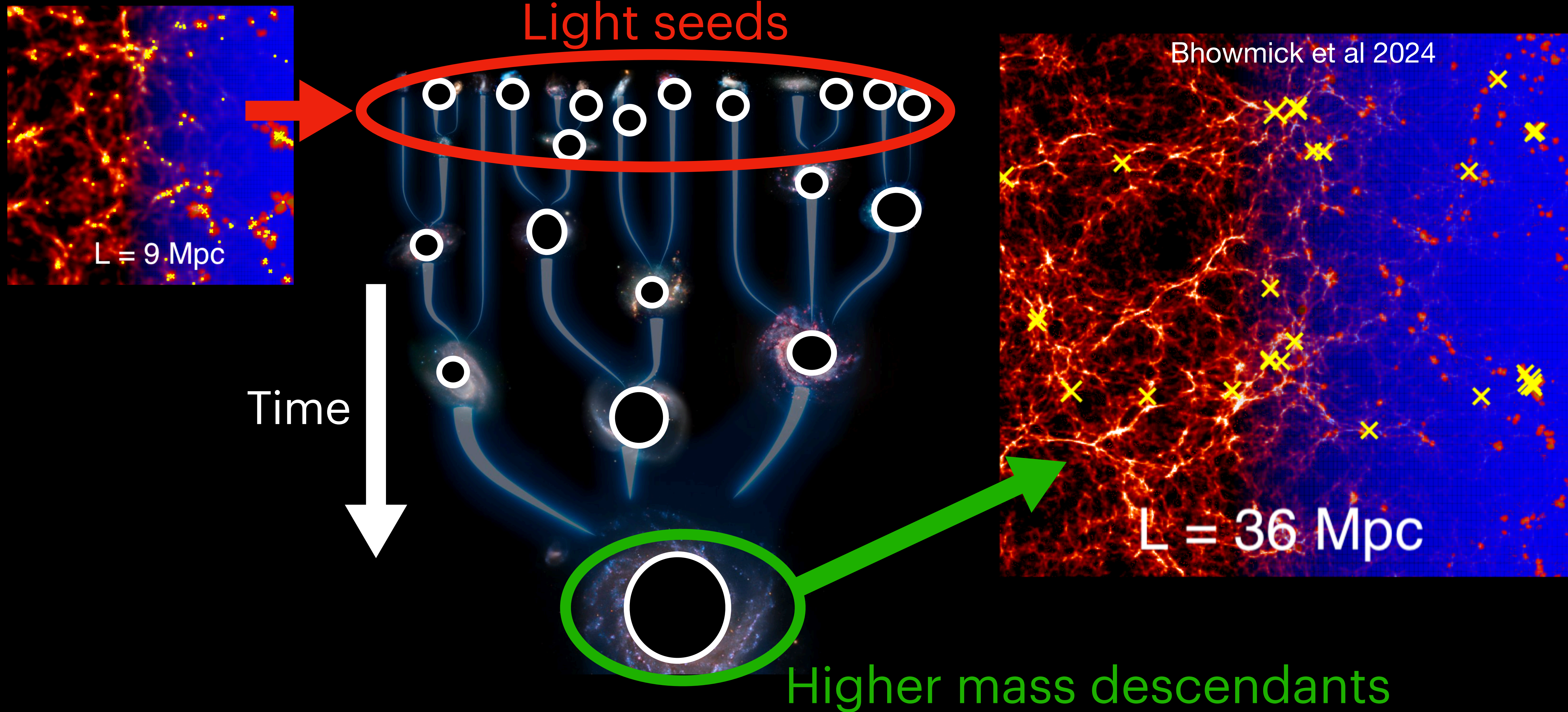


# Tracing the galaxies wherein these low mass seeds assembled higher mass descendants

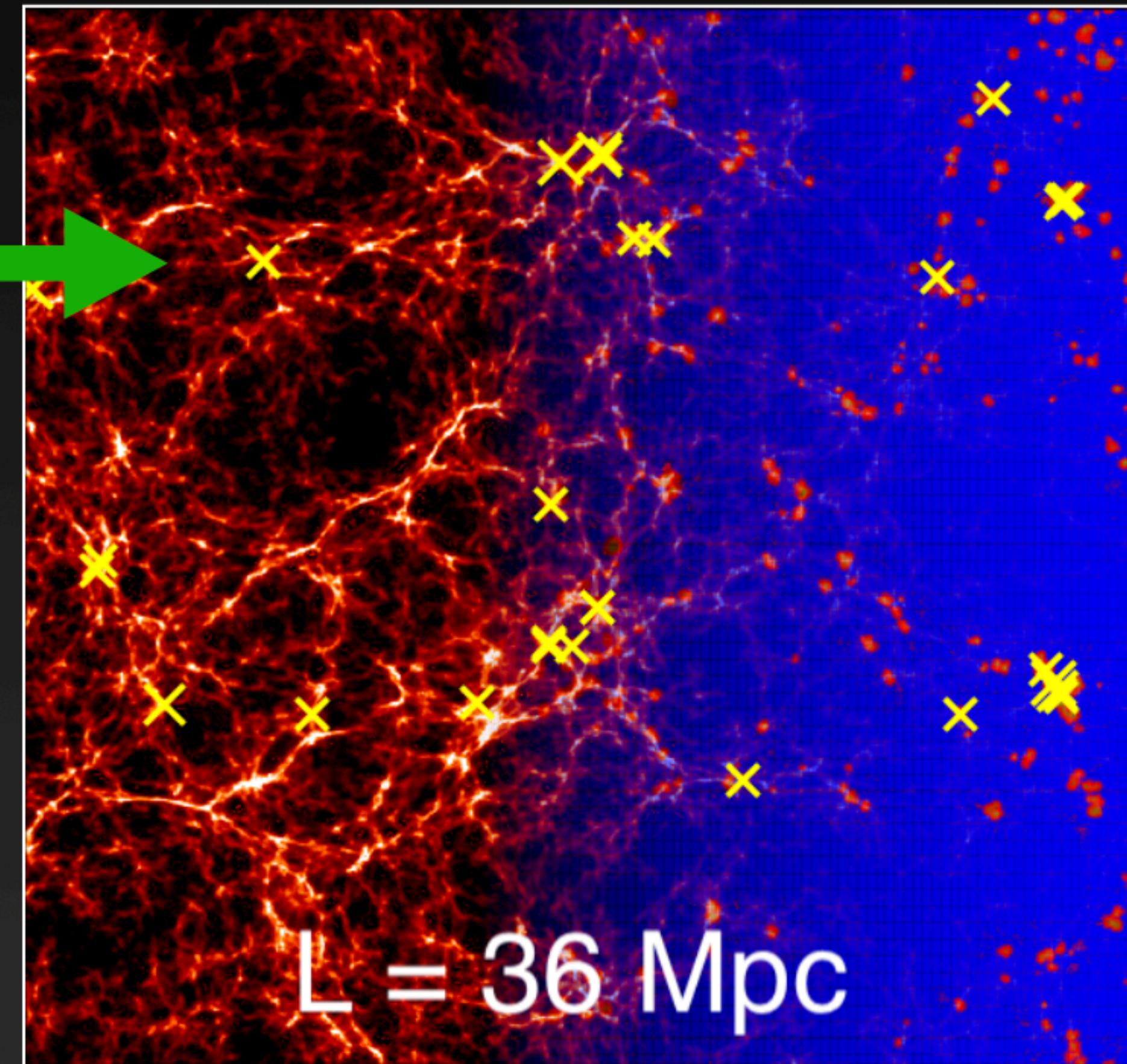
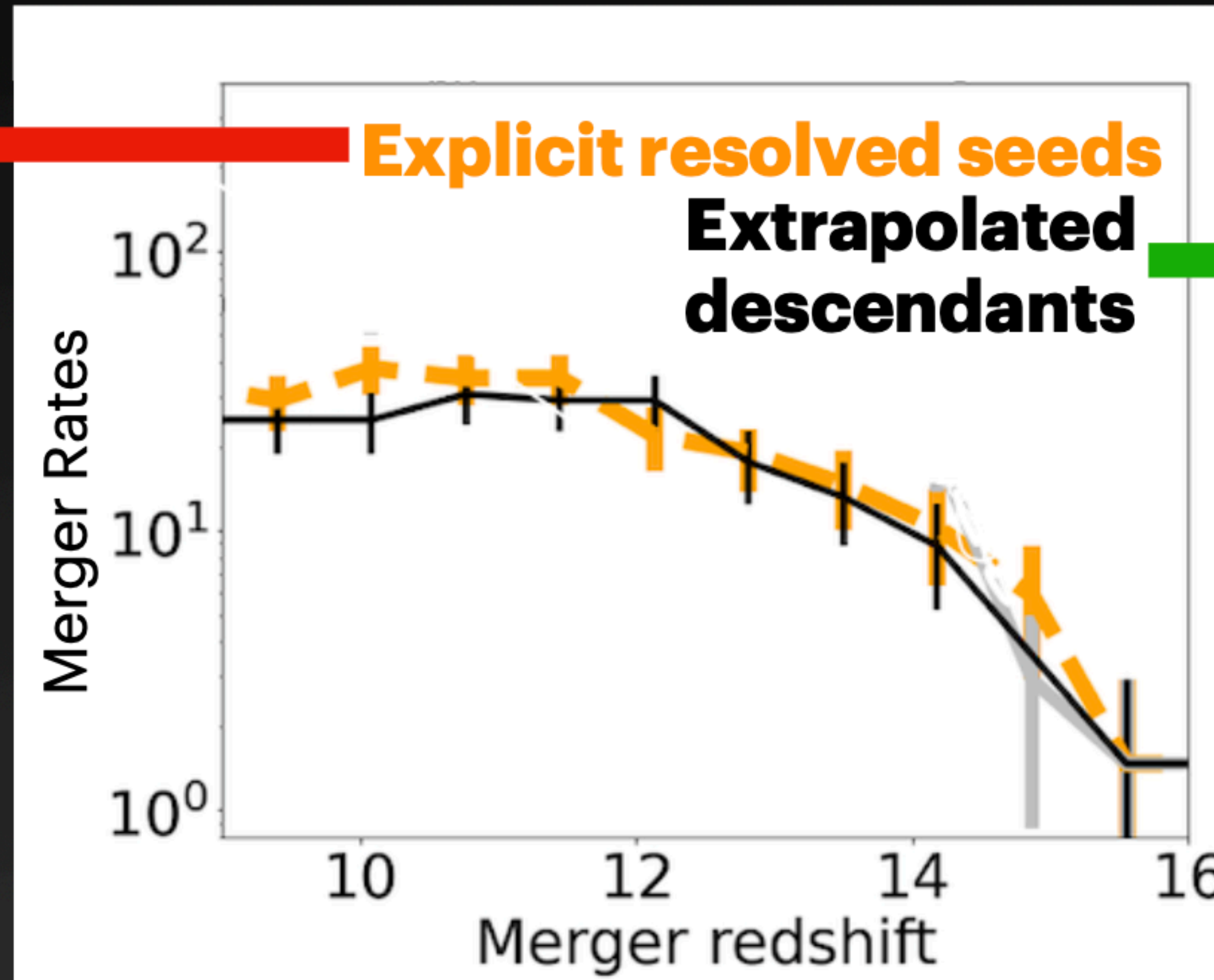
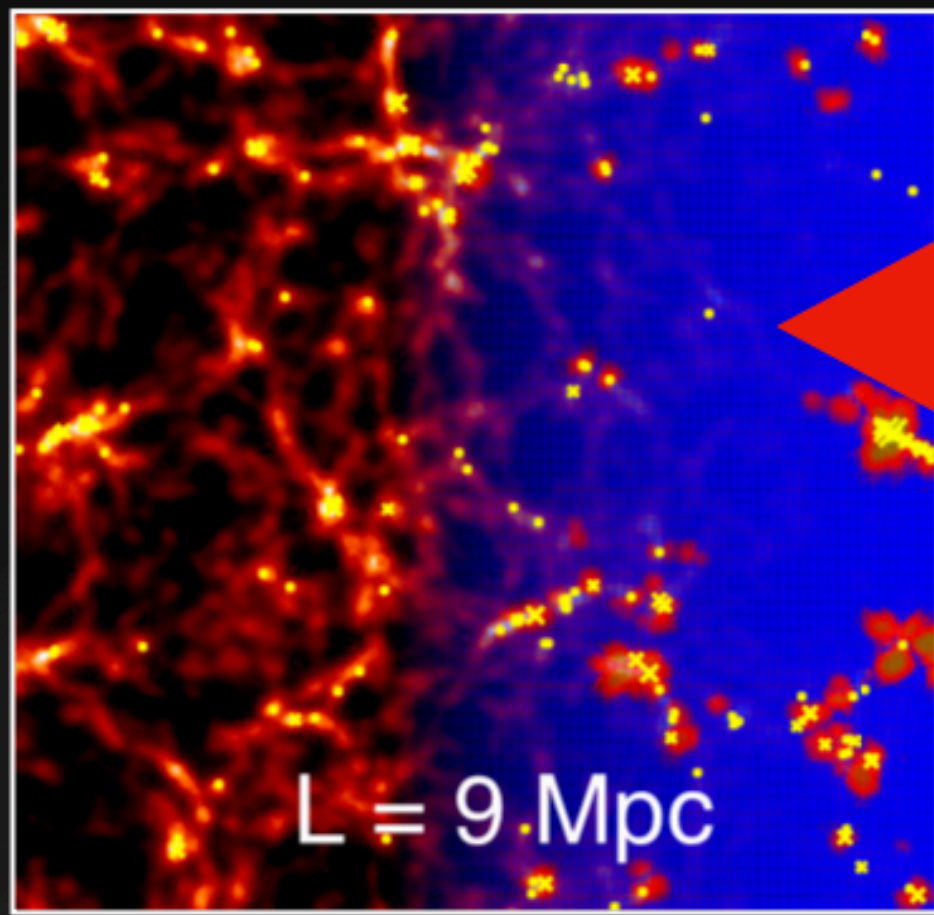




# Seeding these descendants in the larger volume simulations

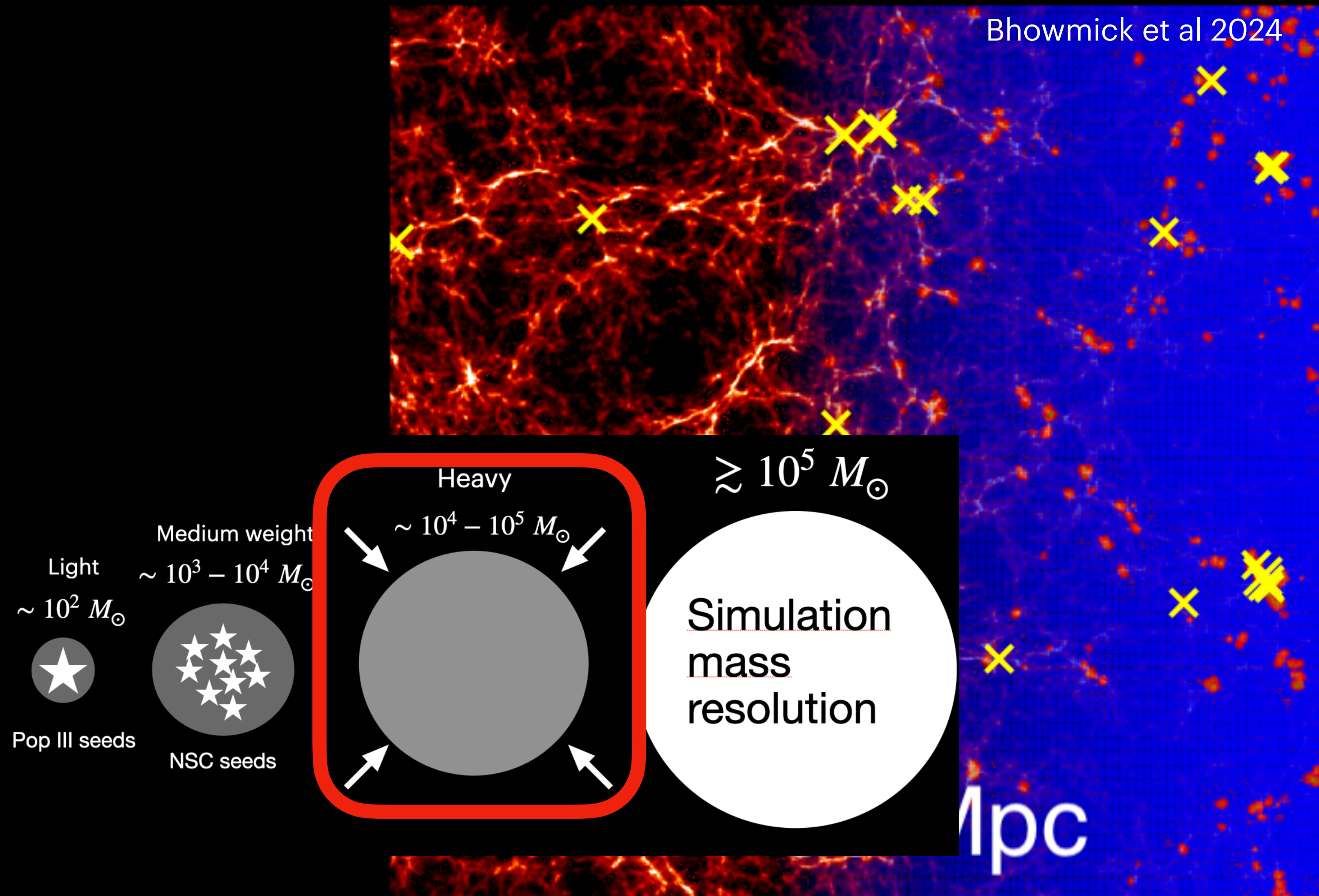


# A new “stochastic seed model” to represent low mass seeds in larger cosmological volumes without the need to resolve them



Bhowmick et al 2024a

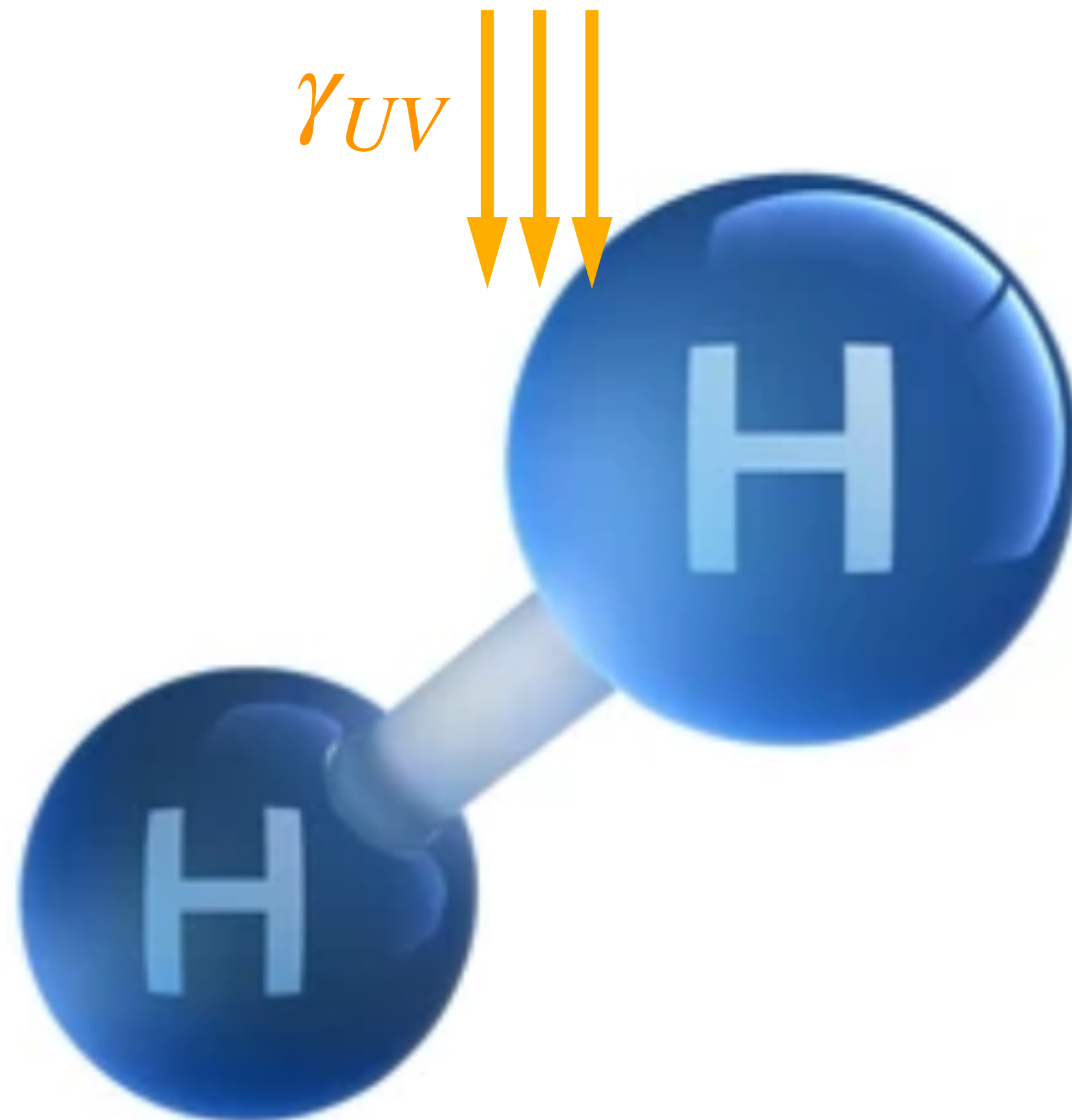
# How do we model heavy DCBH seeds in large cosmological simulations?



# To model direct collapse black hole formation conditions

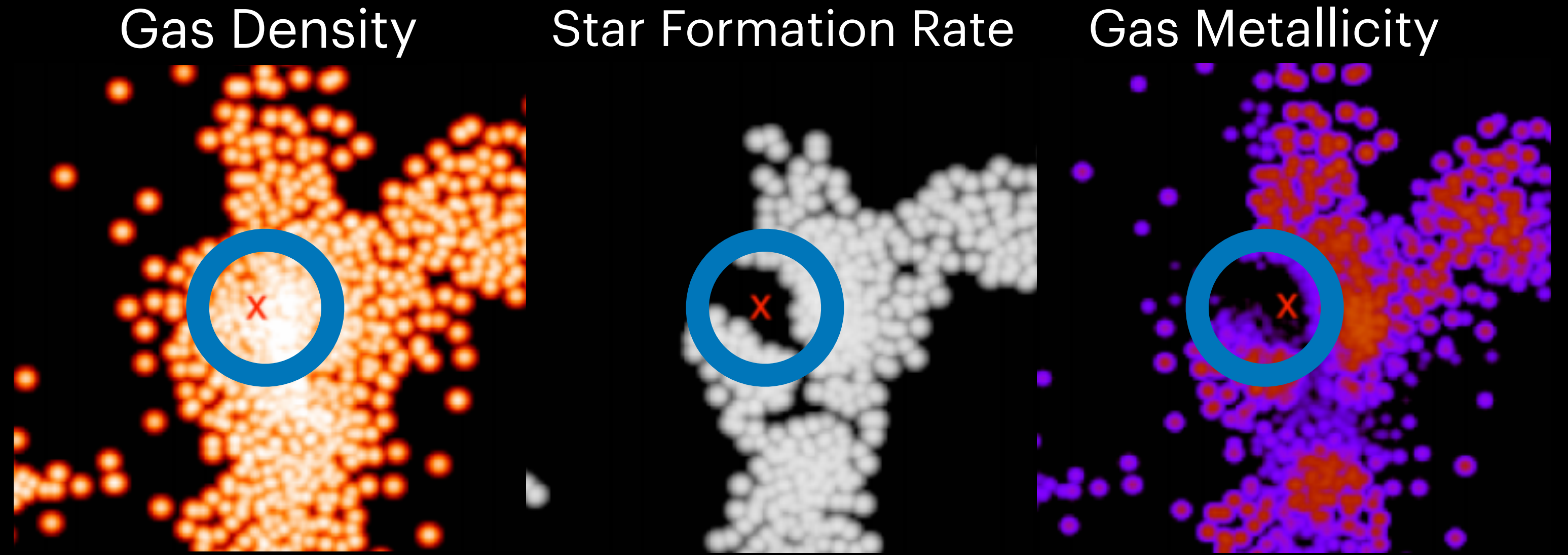
How to suppress molecular hydrogen cooling in pristine dense gas

Destroy H<sub>2</sub> with  
ultraviolet radiation



# I ensure that seeds are only forming in dense and metal poor gas pockets with sufficient UV radiation

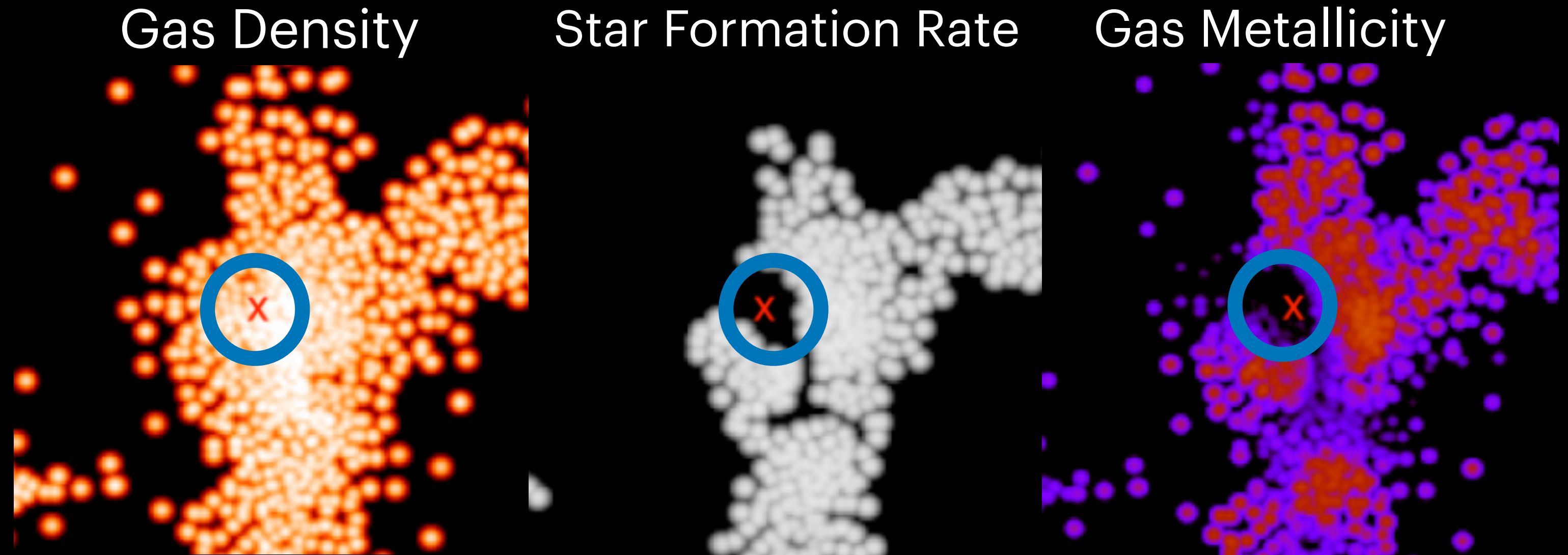
DCBH heavy  
seed formation  
site



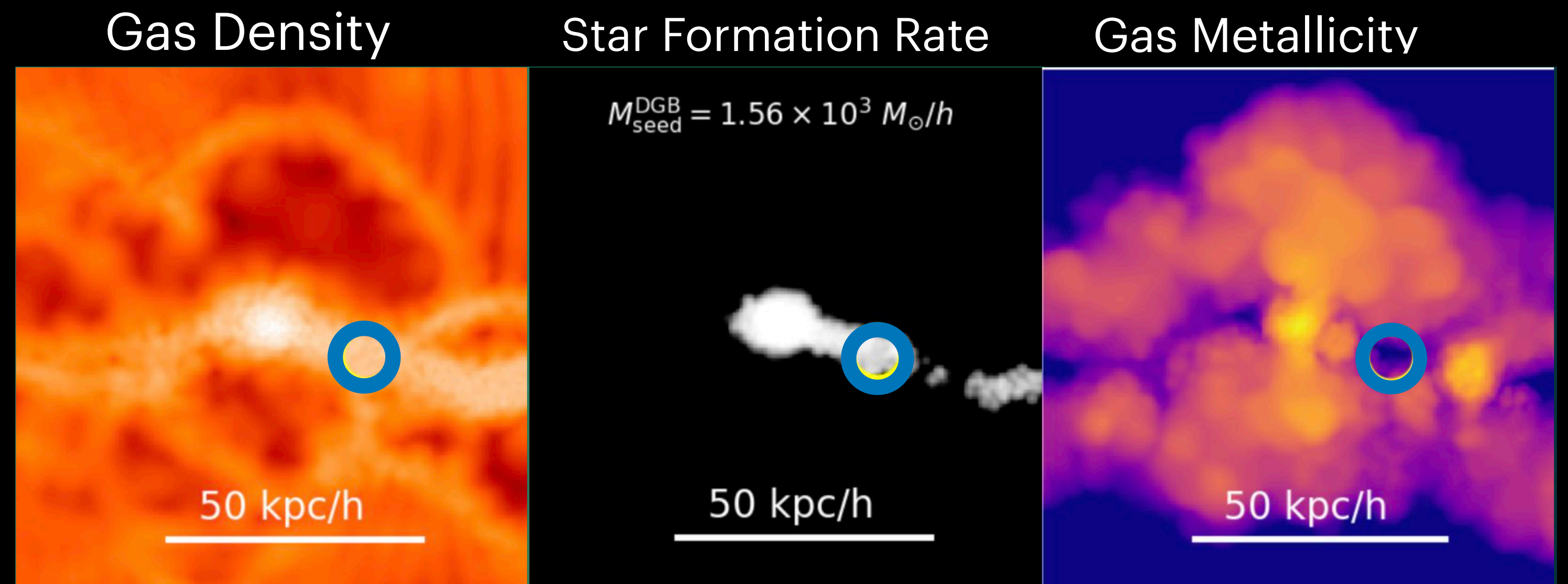
Bhowmick et al 2022a

# I ensure that seeds are only forming in dense and metal poor gas pockets with sufficient UV radiation

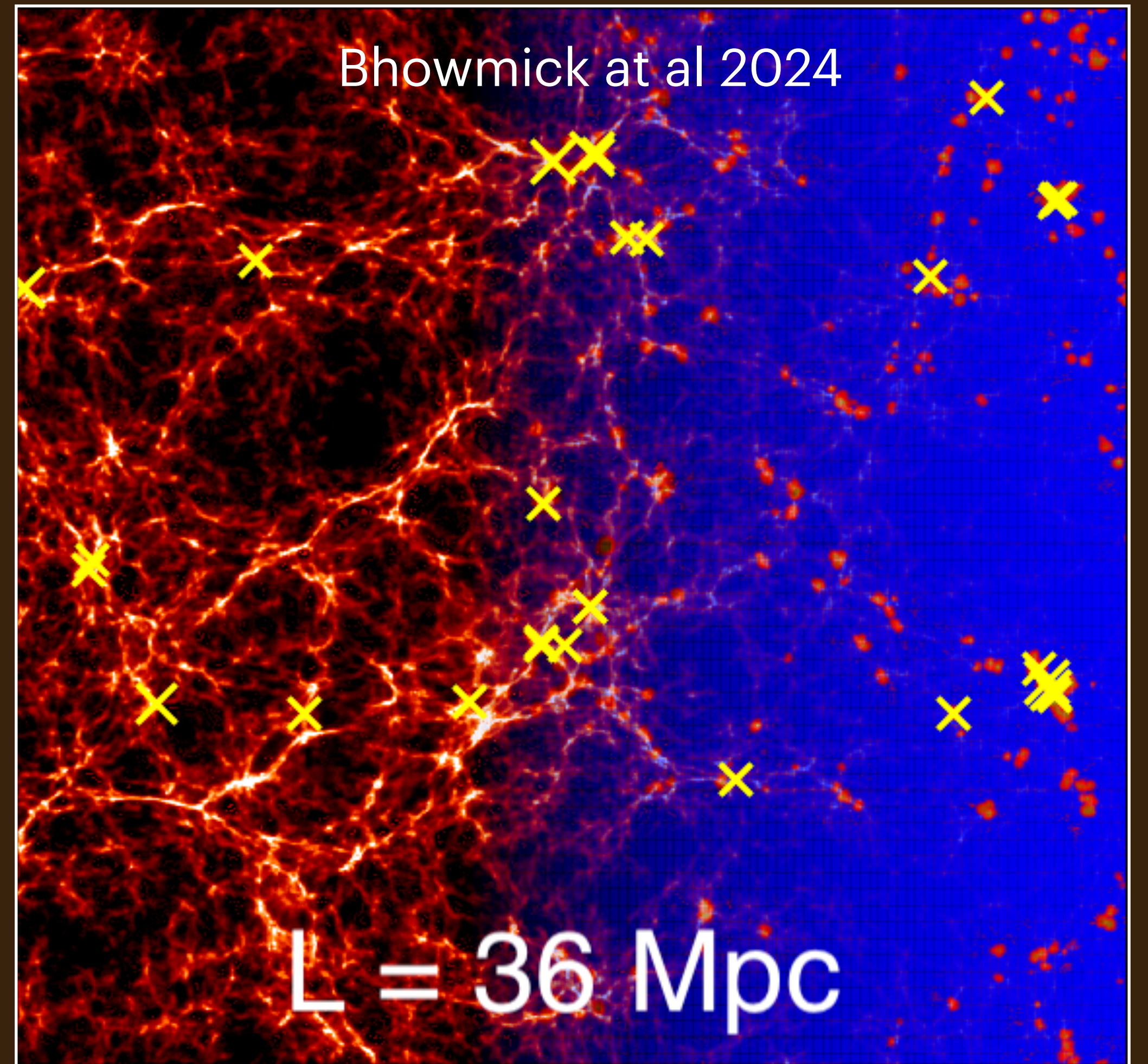
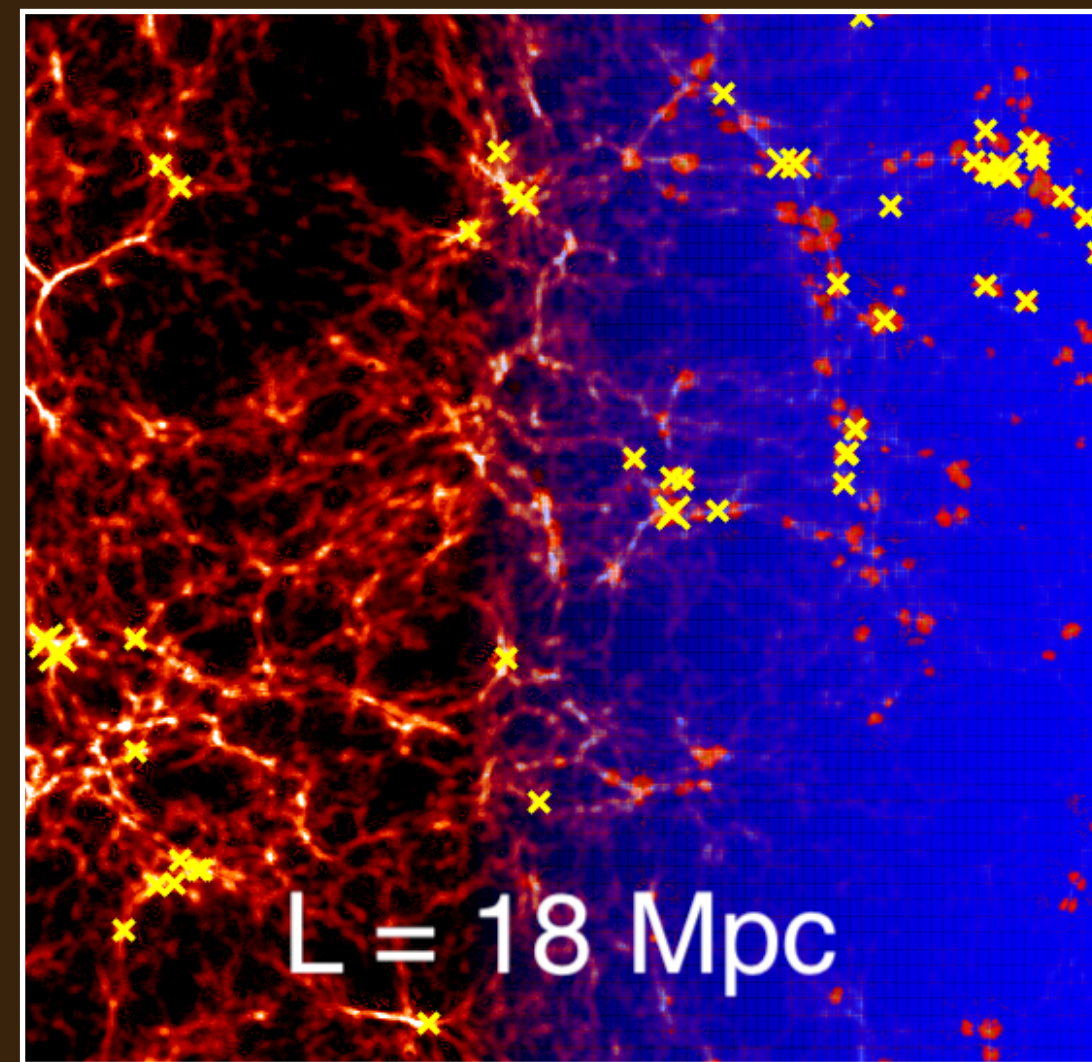
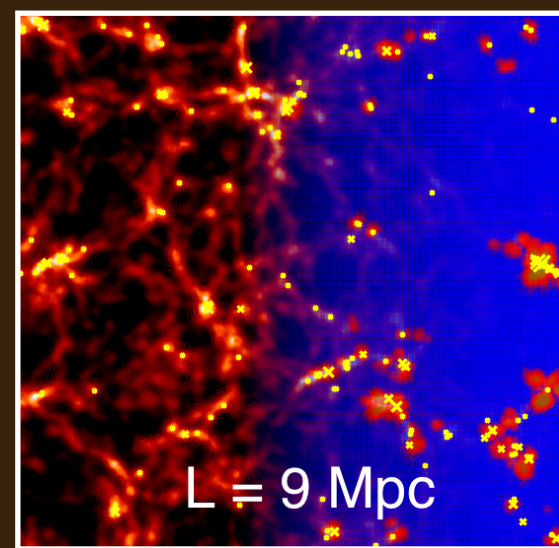
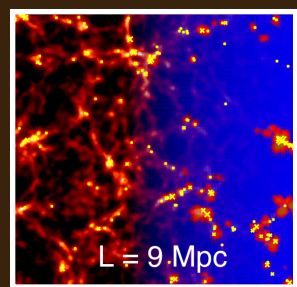
DCBH heavy  
seed formation  
site



Pop III or NSC  
seed  
formation site



# BRAHMA simulations: Exploring the impact of black hole seeding in earliest supermassive black hole populations



Data to be made public soon!

# Predictions from BRAHMA simulations

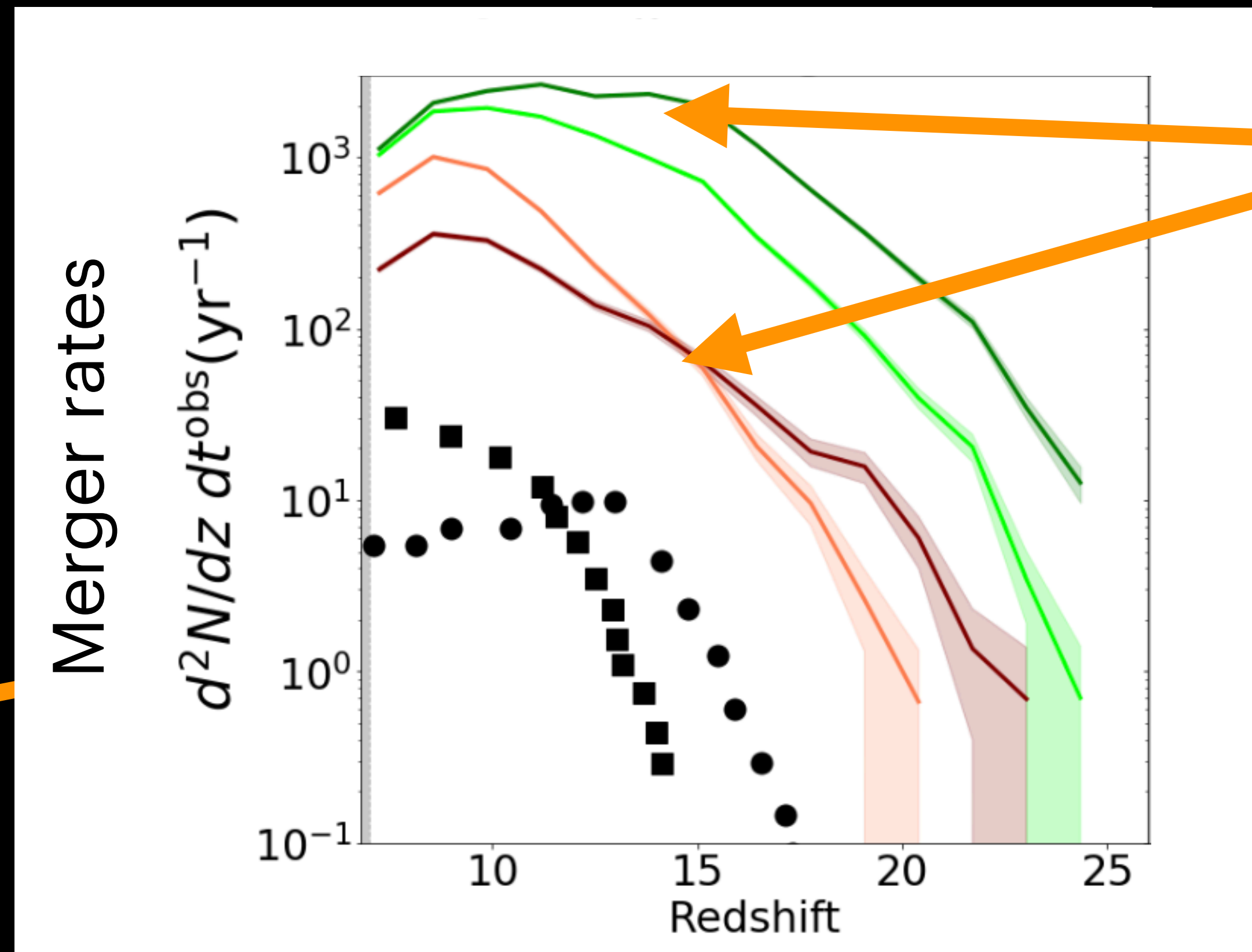




# Intermediate-mass black hole populations with LISA

$\sim 10^3 M_{\odot}$  BHs mergers rates: Light seed model predictions

Caveat assumption: For every galaxy merger, there is a black hole merger



Previous literature

**My predictions**

**$\sim 200 - 2000$   
events per year**

**Upper limits for  
LISA event rates**

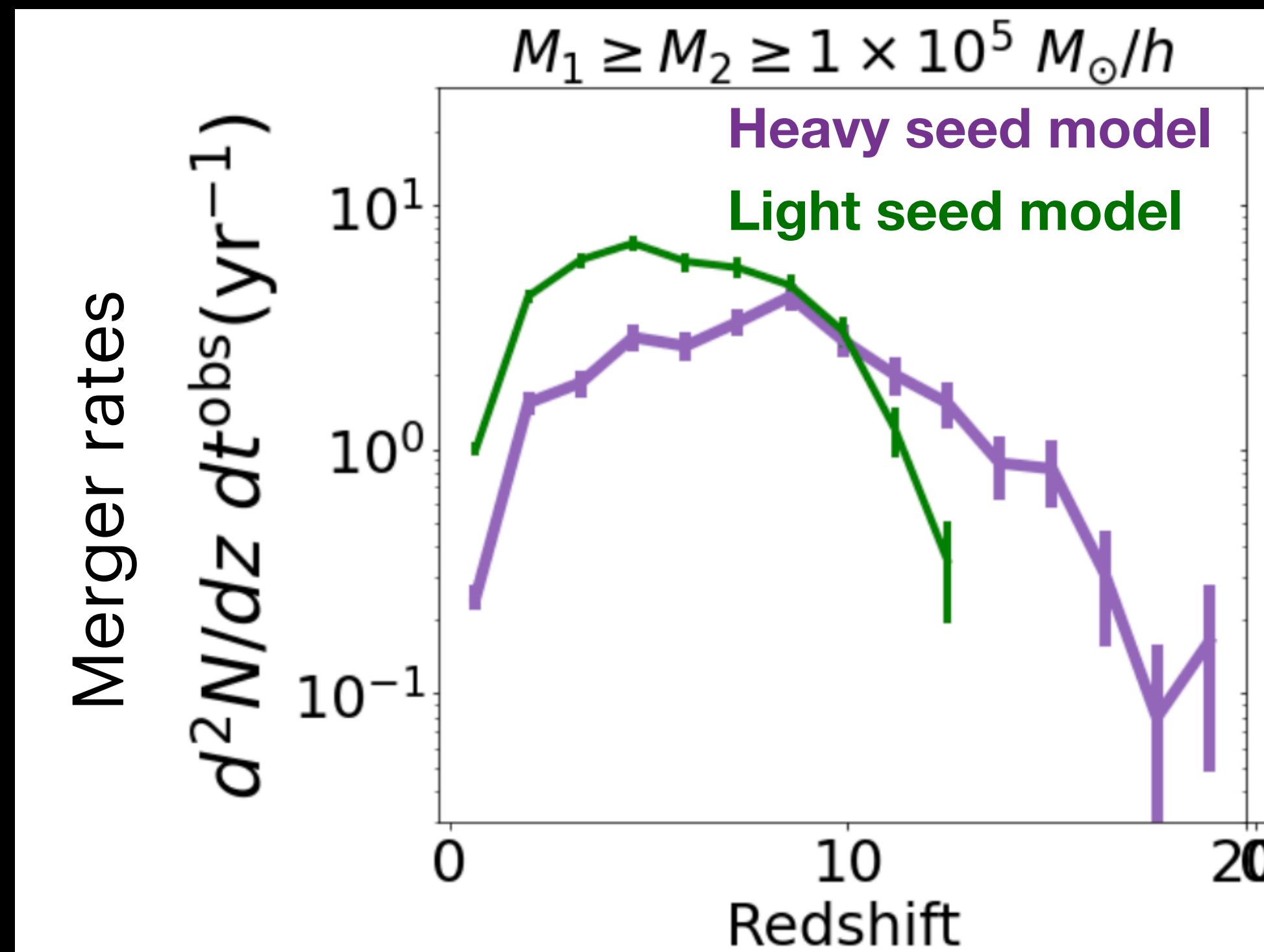
# Intermediate-mass black hole populations with LISA

$\sim 10^5 M_{\odot}$  BH mergers rates : Light vs heavy seed model predictions

**Descendant of a  
low mass seed**

**VS**

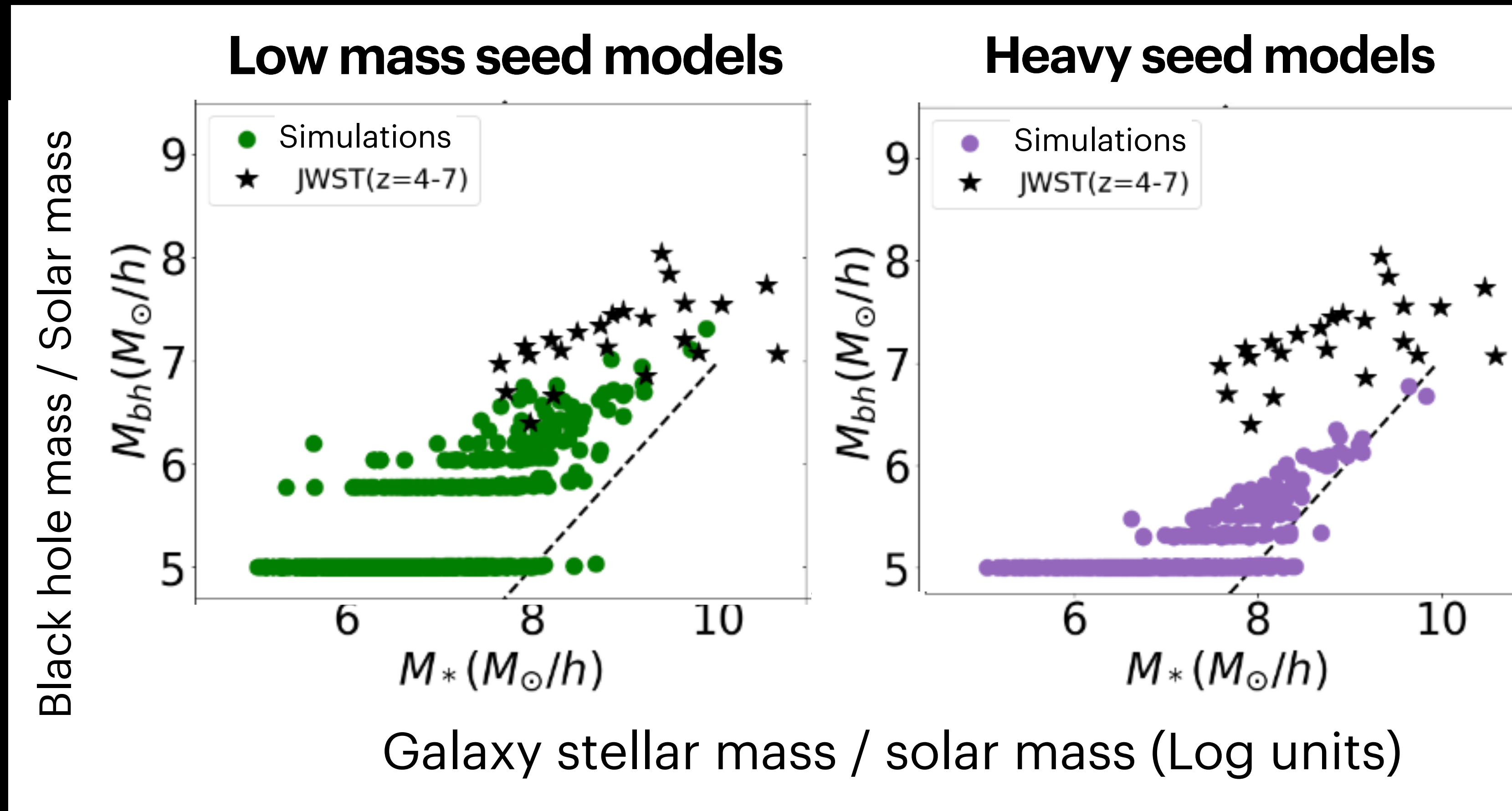
**Formed as a  
heavy seed**



Bhowmick et al 2024

Distinct imprints of light vs heavy seeds in the LISA event rates

# Supermassive black hole populations with JWST



**Low mass seed models can reproduce the JWST observations**

**Heavy seed models cannot reproduce the JWST observations**

# Main takeaways from past research

- 1) Transforms our ability to model the formation of black holes in cosmological simulations.
- 2) Predicts unique observable signatures of different black hole formation theories within gravitational-wave and electromagnetic observations from LISA and JWST
- 3) Lays the foundation for my future research on early black hole evolution

# **Future Research (5 yr horizon): Confront every aspect of the earliest black hole evolution**

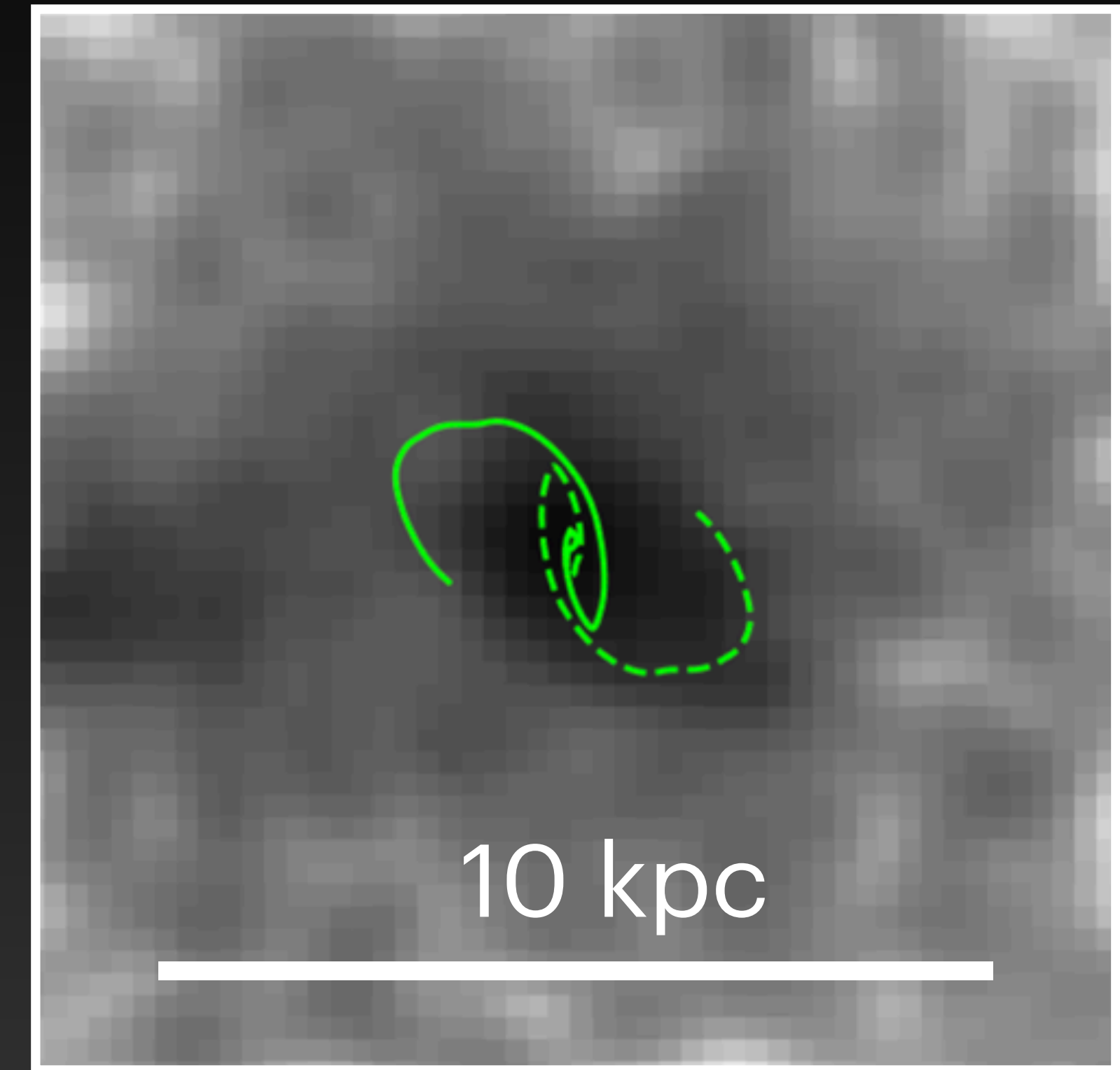
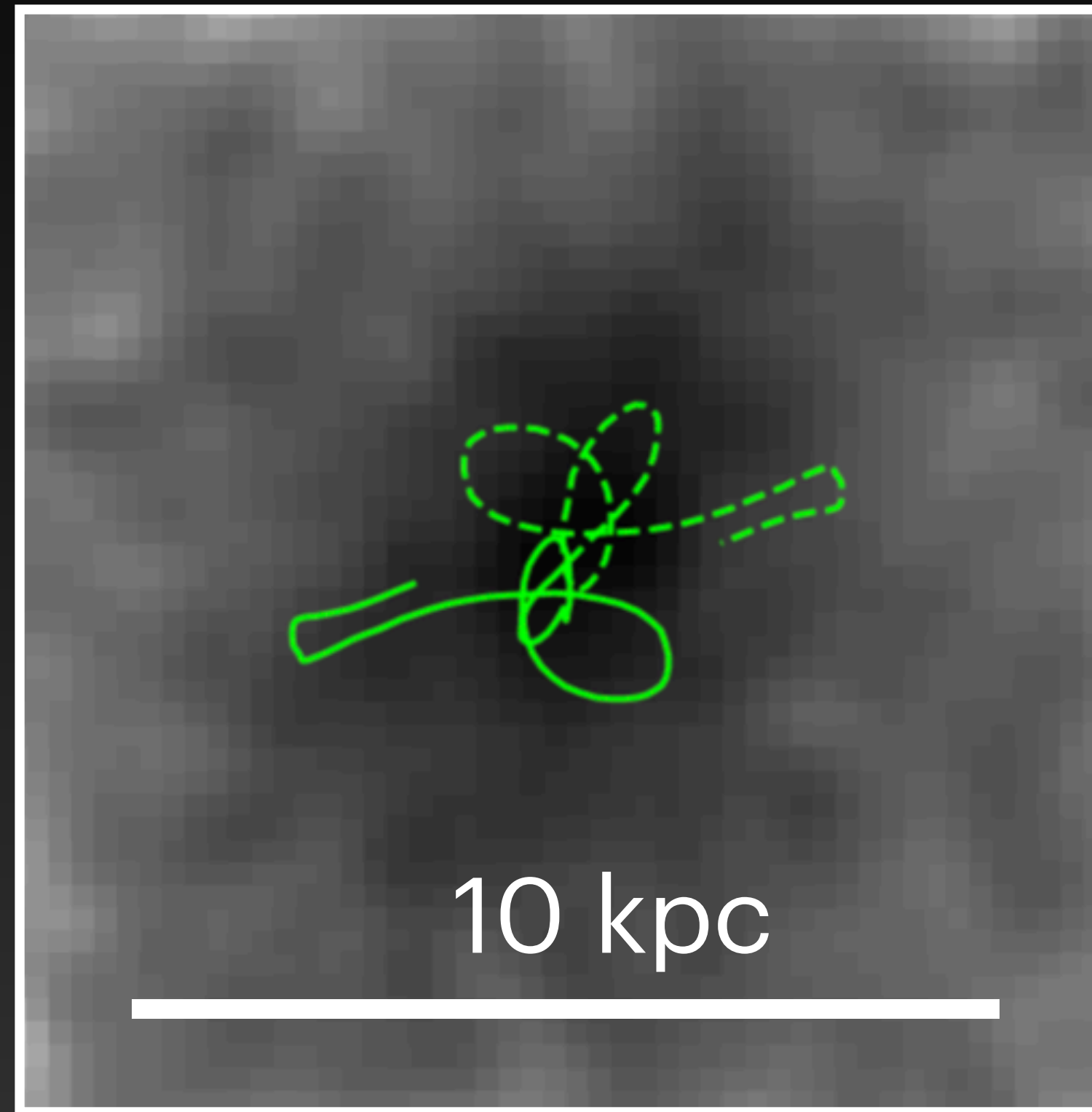
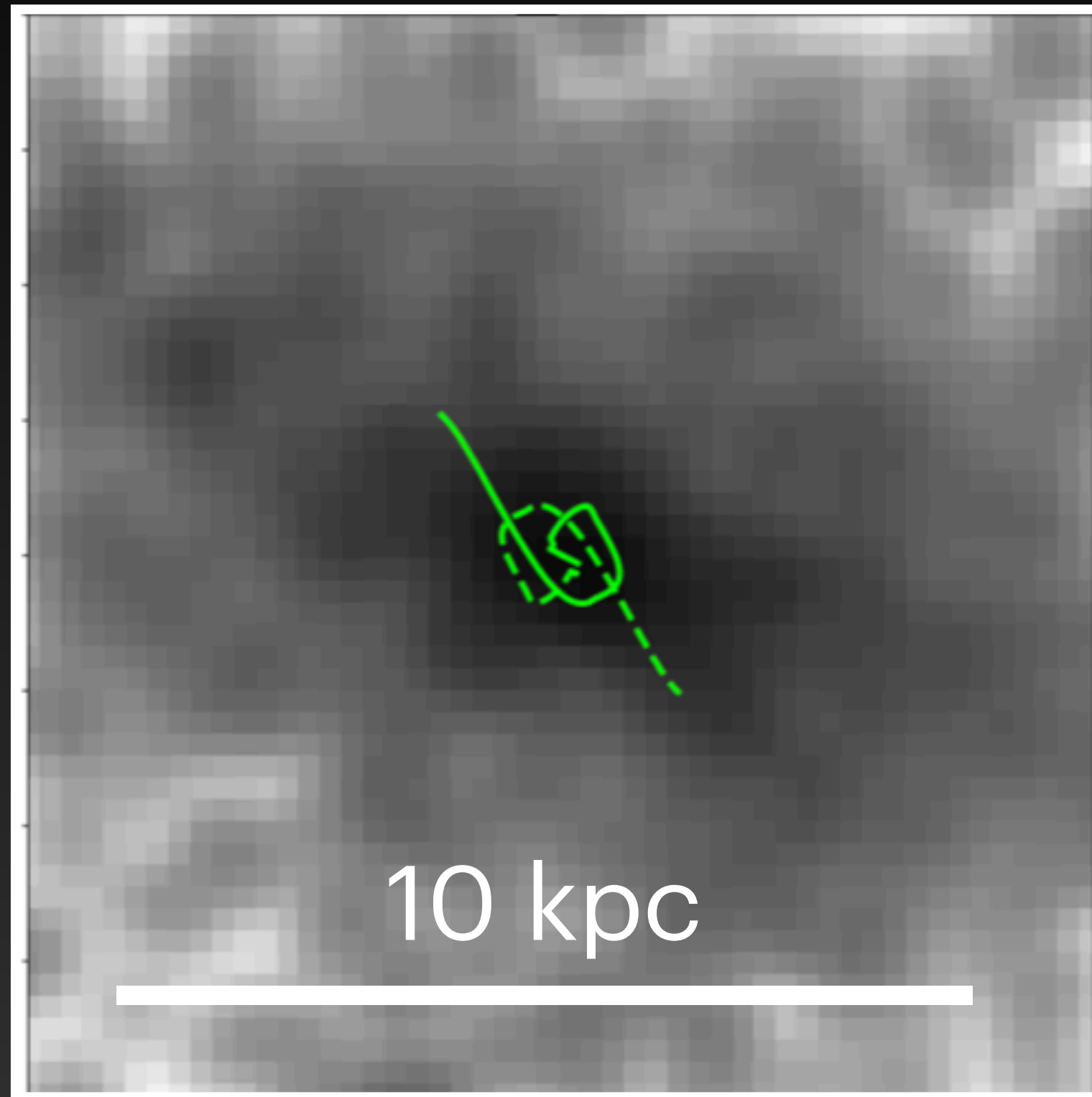
Black hole seeding

Black hole dynamics

Black hole accretion

Black hole feedback

# Step 1: Dynamics of merging black hole seeds



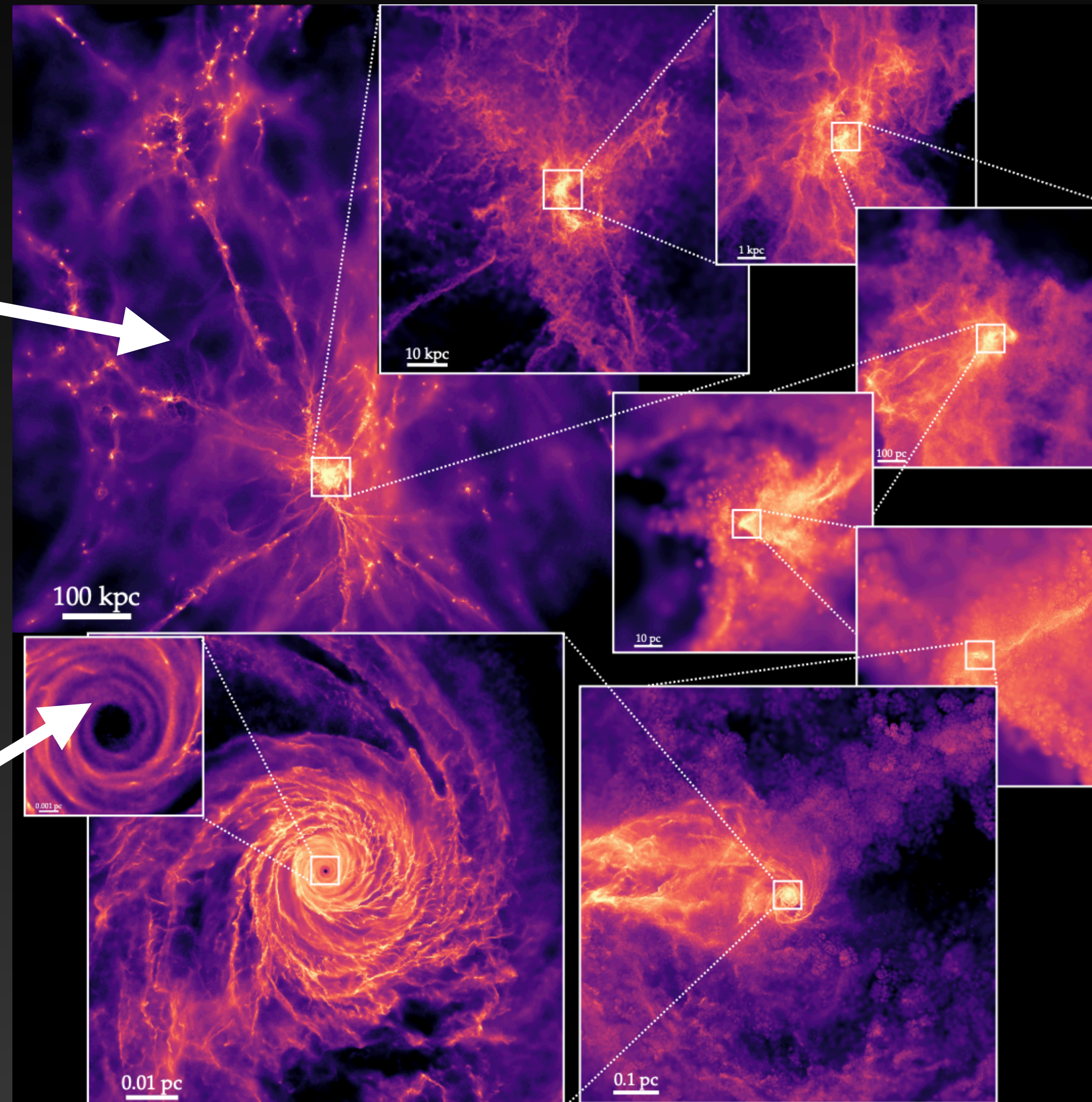
Bhowmick et al (ongoing)

What fraction of seeds can effectively merge and contribute to LISA events?

# Step 2: Gas accretion onto black hole seeds

~1000 kpc scales  
Galaxy cluster

~0.01 pc scales  
Accretion disk of a  
supermassive black hole

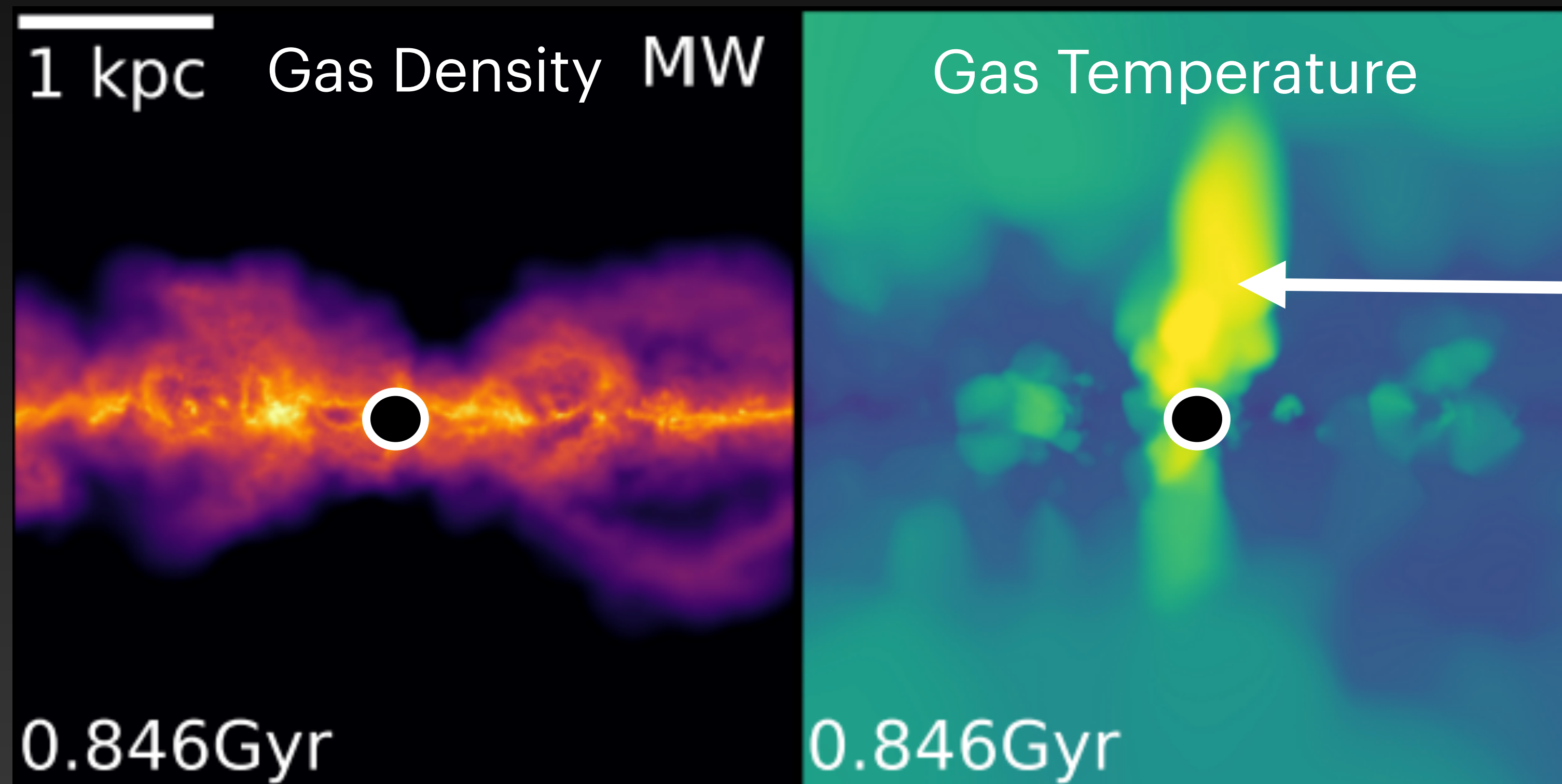


Hopkins et al 2023

# Step 3: Black hole feedback

How do black hole seeds interact with earliest galaxies?

Milky-way galaxy simulation



Black hole injecting energy and heating the gas

Sivasankaran et al 2024



# Future Outlook (5 yr horizon): Confront every aspect of supermassive black hole physics

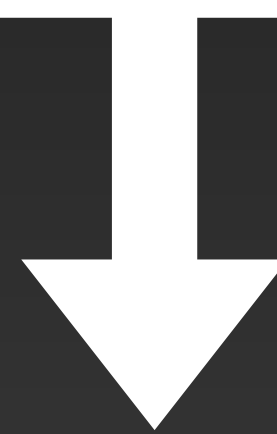
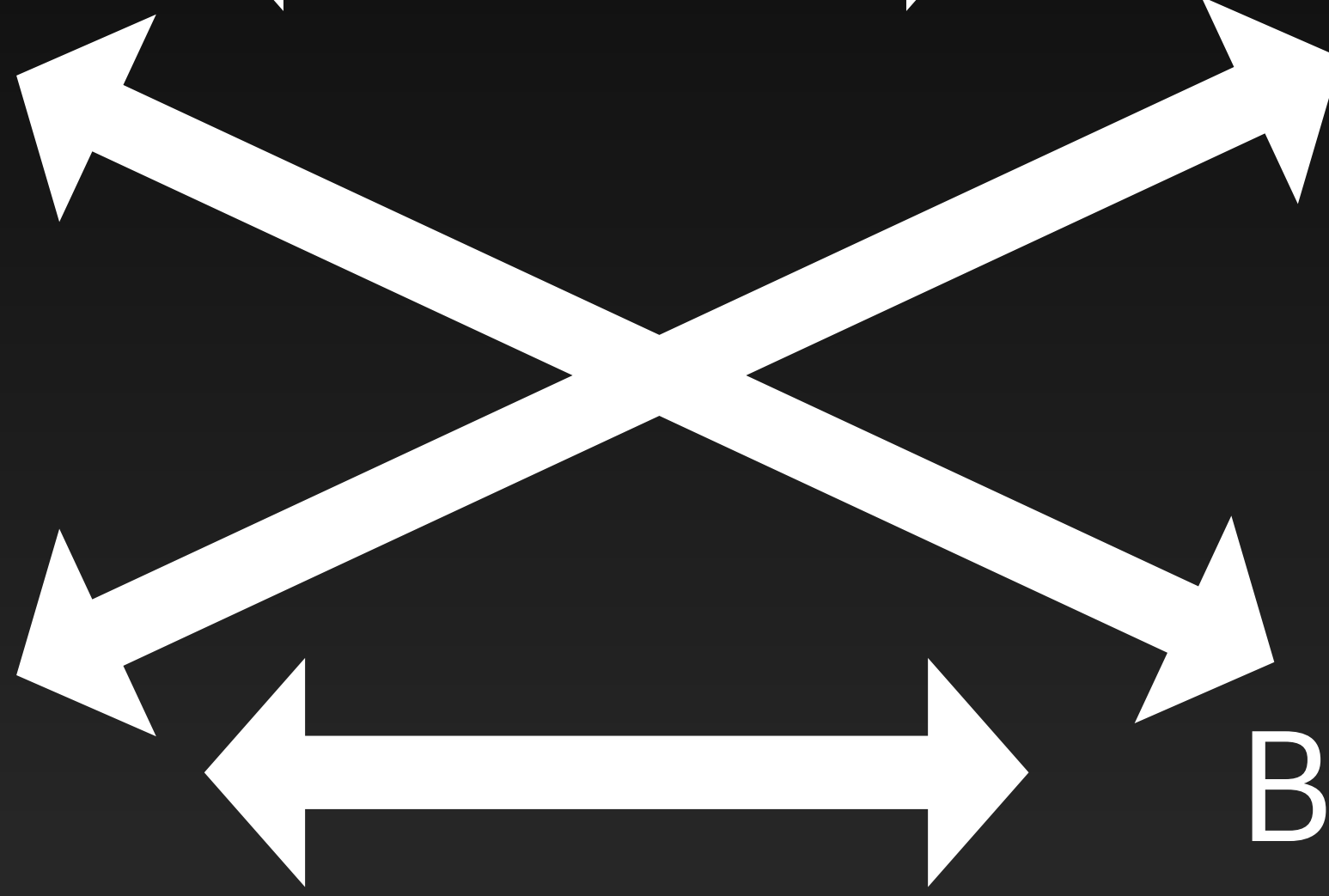
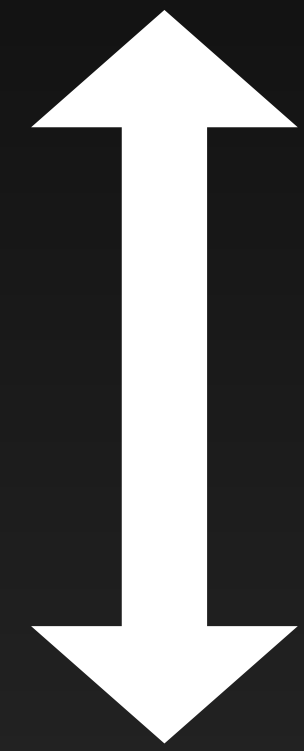
Black hole seeding

Black hole dynamics

Black hole accretion

Black hole feedback

Supermassive and Intermediate mass black hole populations



# Future Outlook (10 yr horizon)

Physics of dark energy and dark matter

Physics of the baryons

Physics of the black holes

Observed black hole and galaxy populations

# Conclusions

- The missing origins of supermassive black holes is a crucial component for understanding our Universe?
- Using cosmological simulations, I have built the necessary foundation to reveal the missing supermassive blackhole origins from current and future observations?
- My research propels me towards future initiatives and broader questions about black hole evolution, and about the fundamental components of Universe in the longer run.

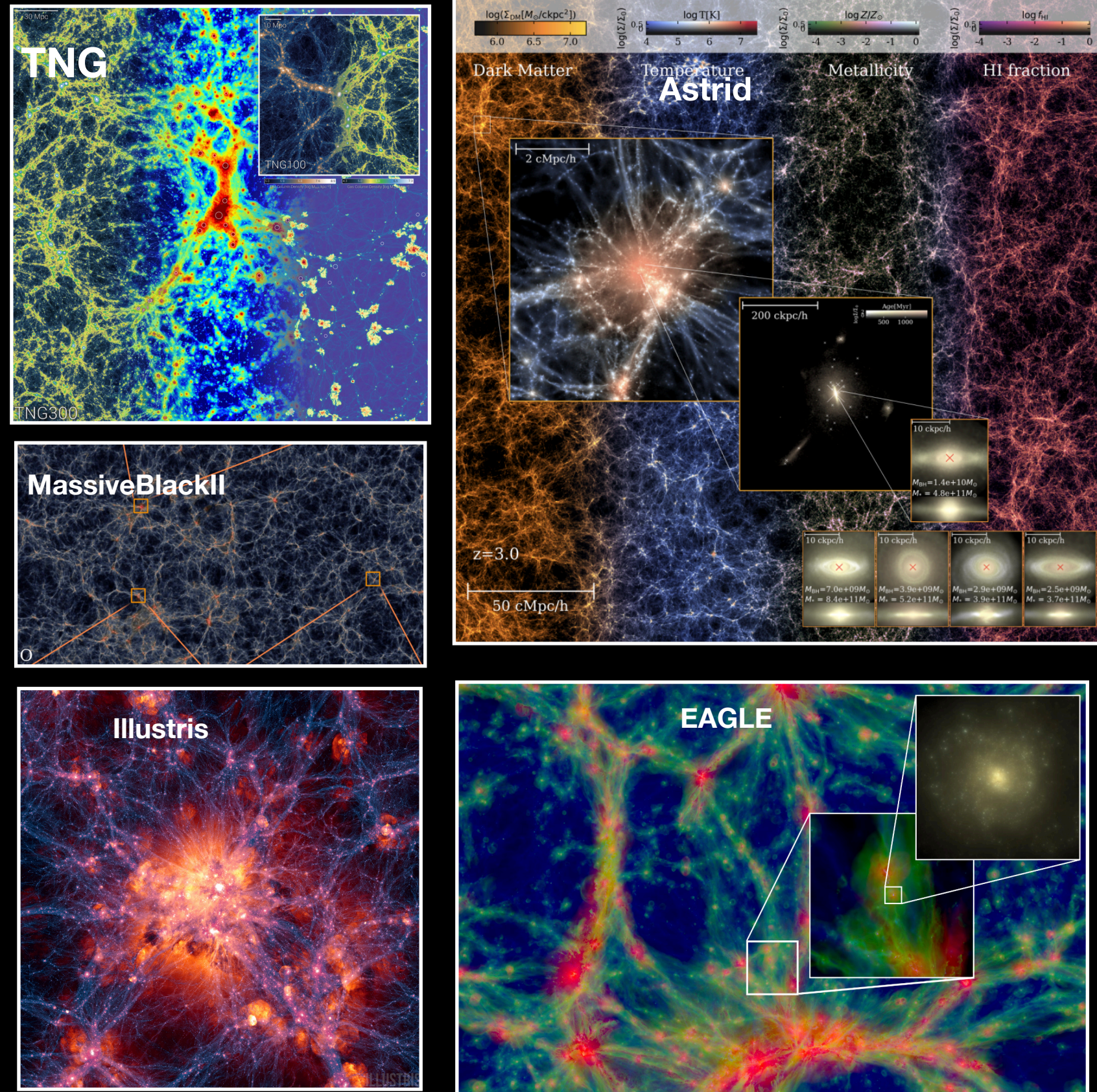
**BACK UP SLIDES**

# Leveraging the golden age of AI and machine learning

I will confront our entire structure formation paradigm with all available observations

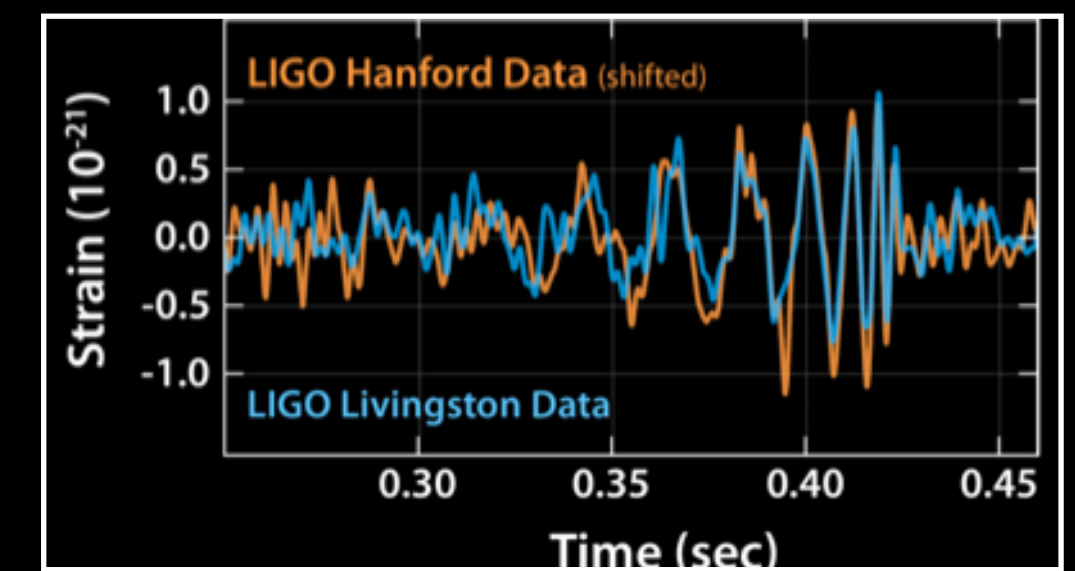
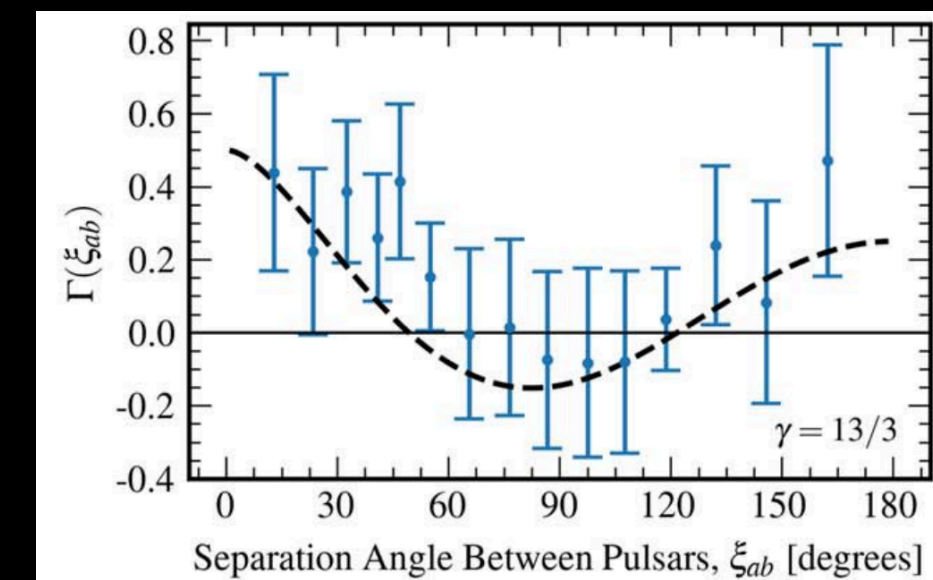
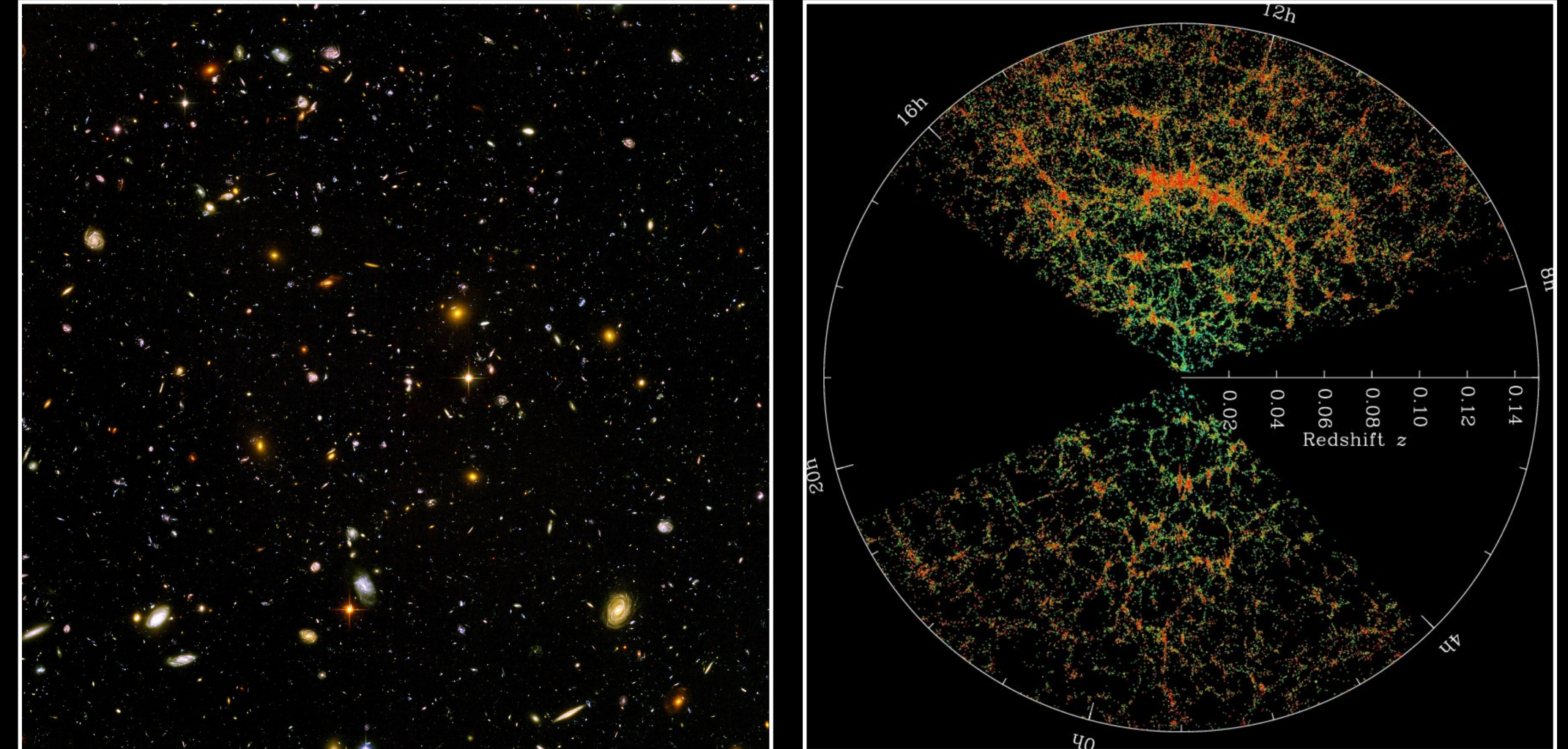
## Training and testing data

Large suite of cosmological simulations with systematic variations in unknown physics parameters



## Deployment data

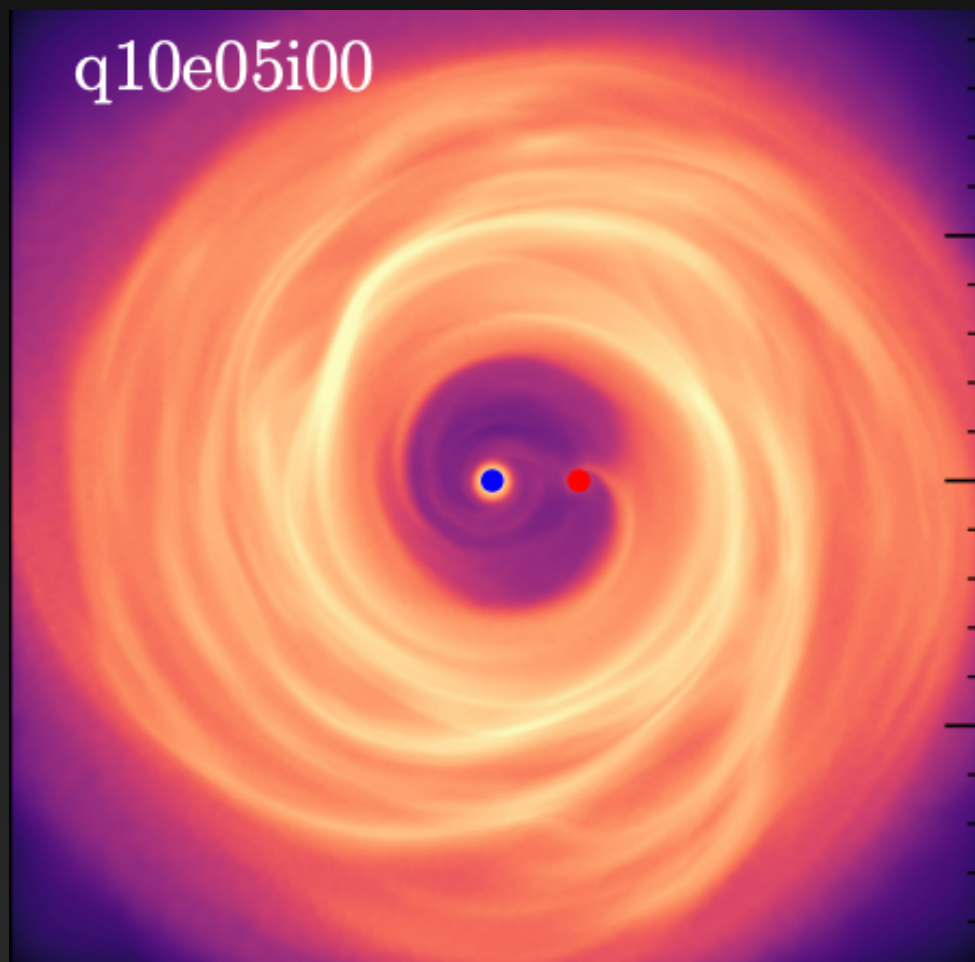
Multi-messenger, multi-epoch and multi-wavelength observations of galaxy and black hole populations



# Future Outlook (5 yr horizon): Confront every aspect of supermassive black hole physics

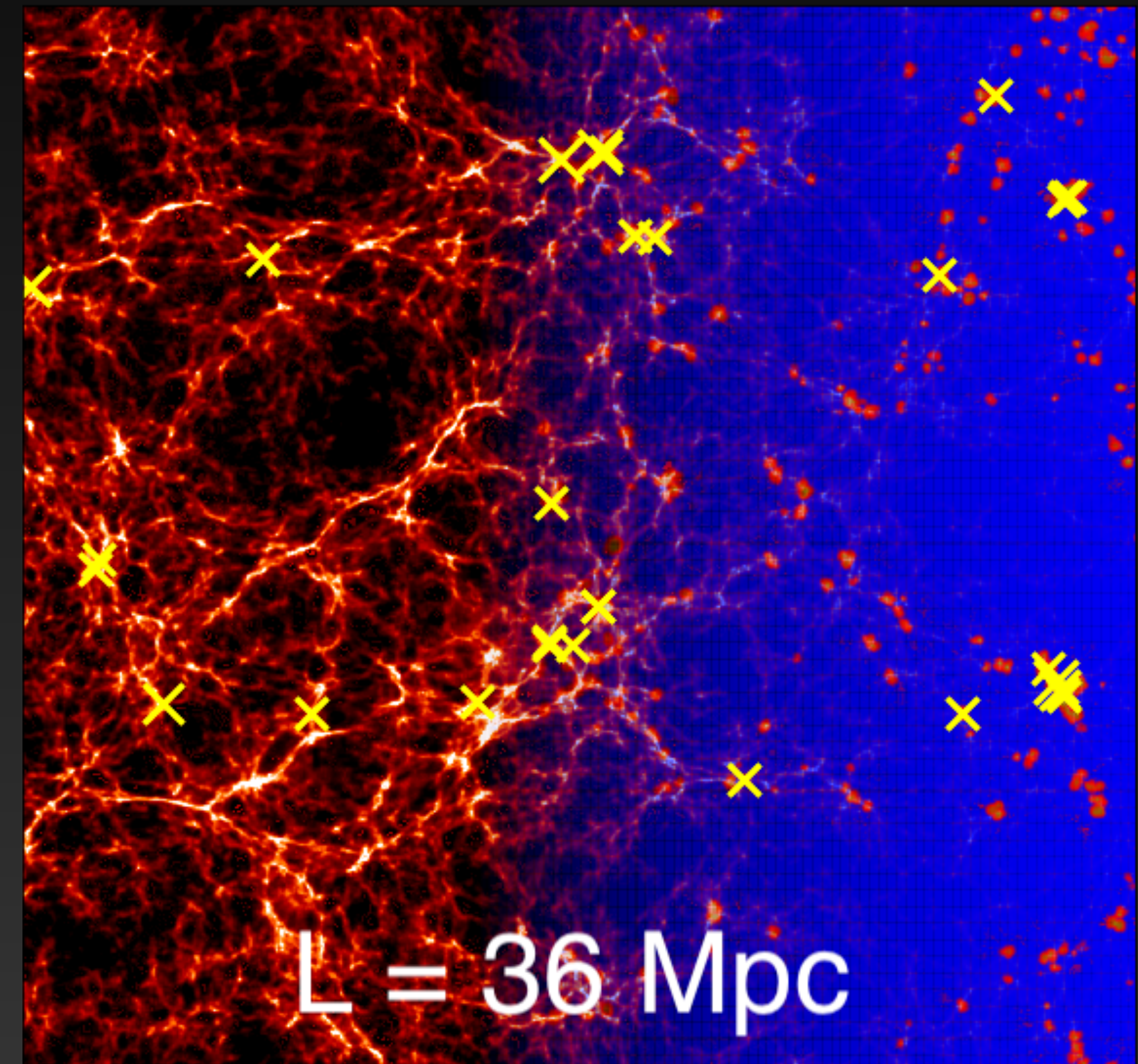
Bhowmick et al 2024

Bourne et. al. 2023



20 Pc

Imprint the impact of small scale physics in the modeling of large scale simulations

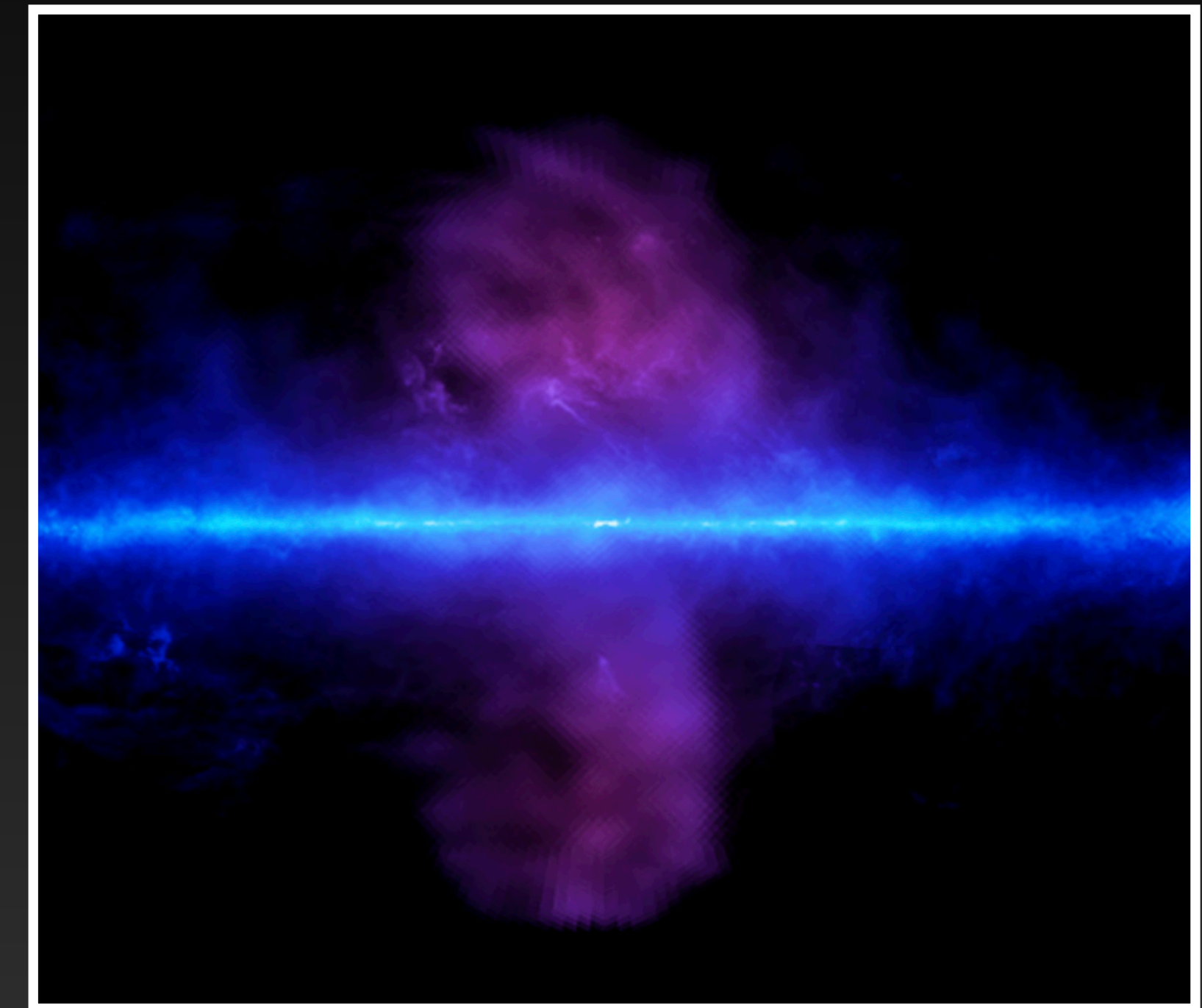
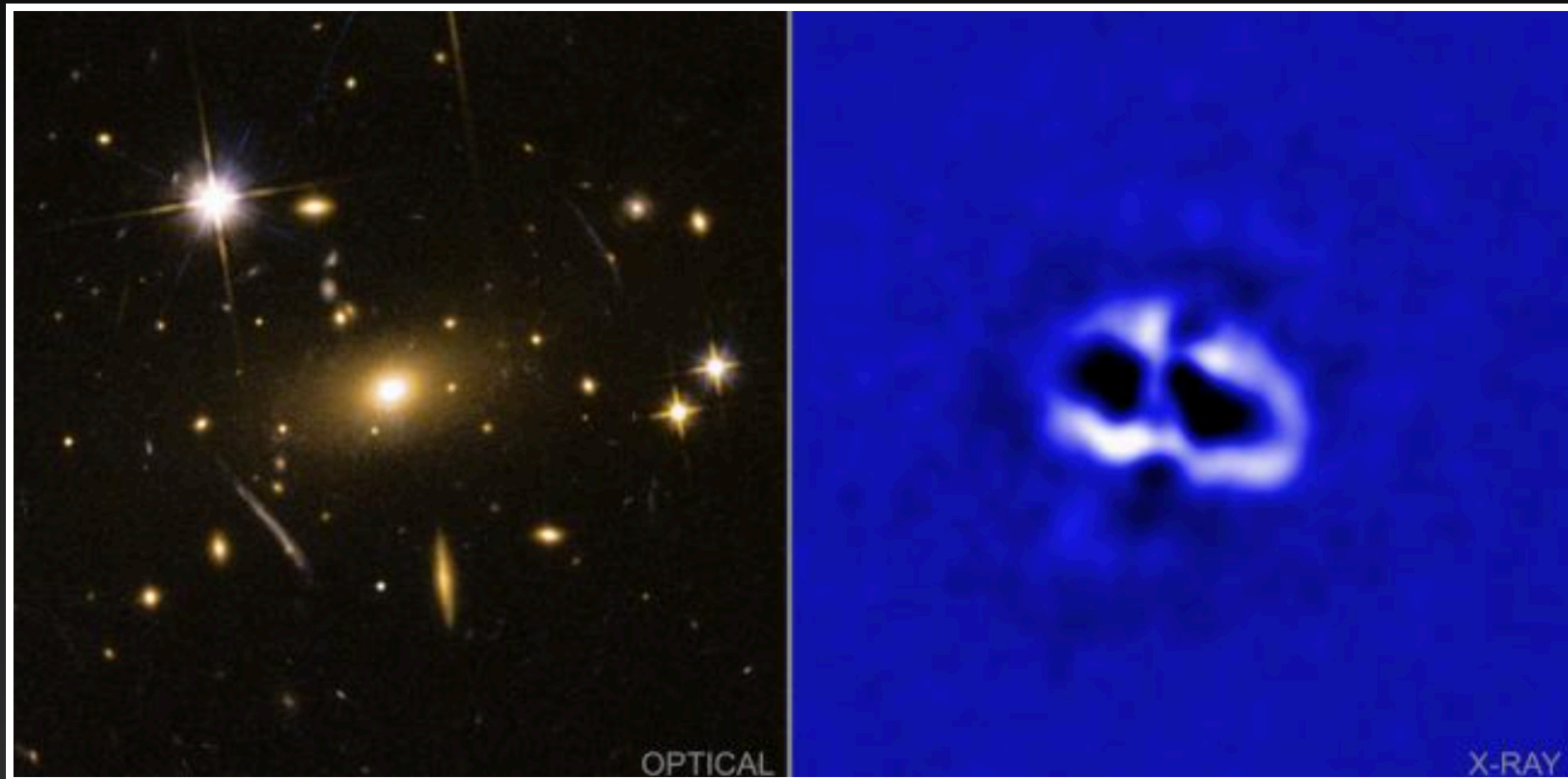


L = 36 Mpc

# Observational support for the impact of supermassive black holes in their surrounding larger scale environment

X ray cavities in clusters

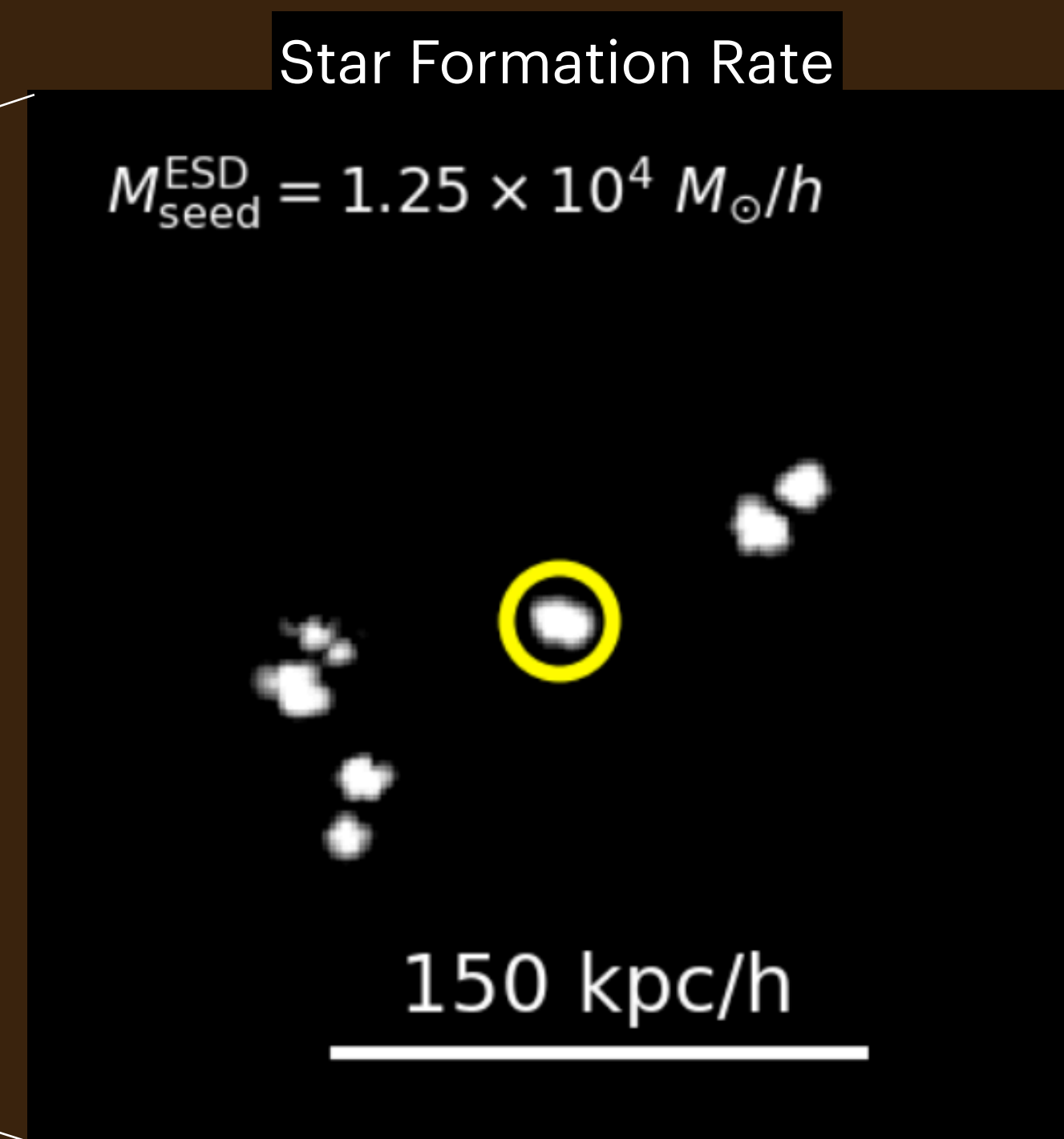
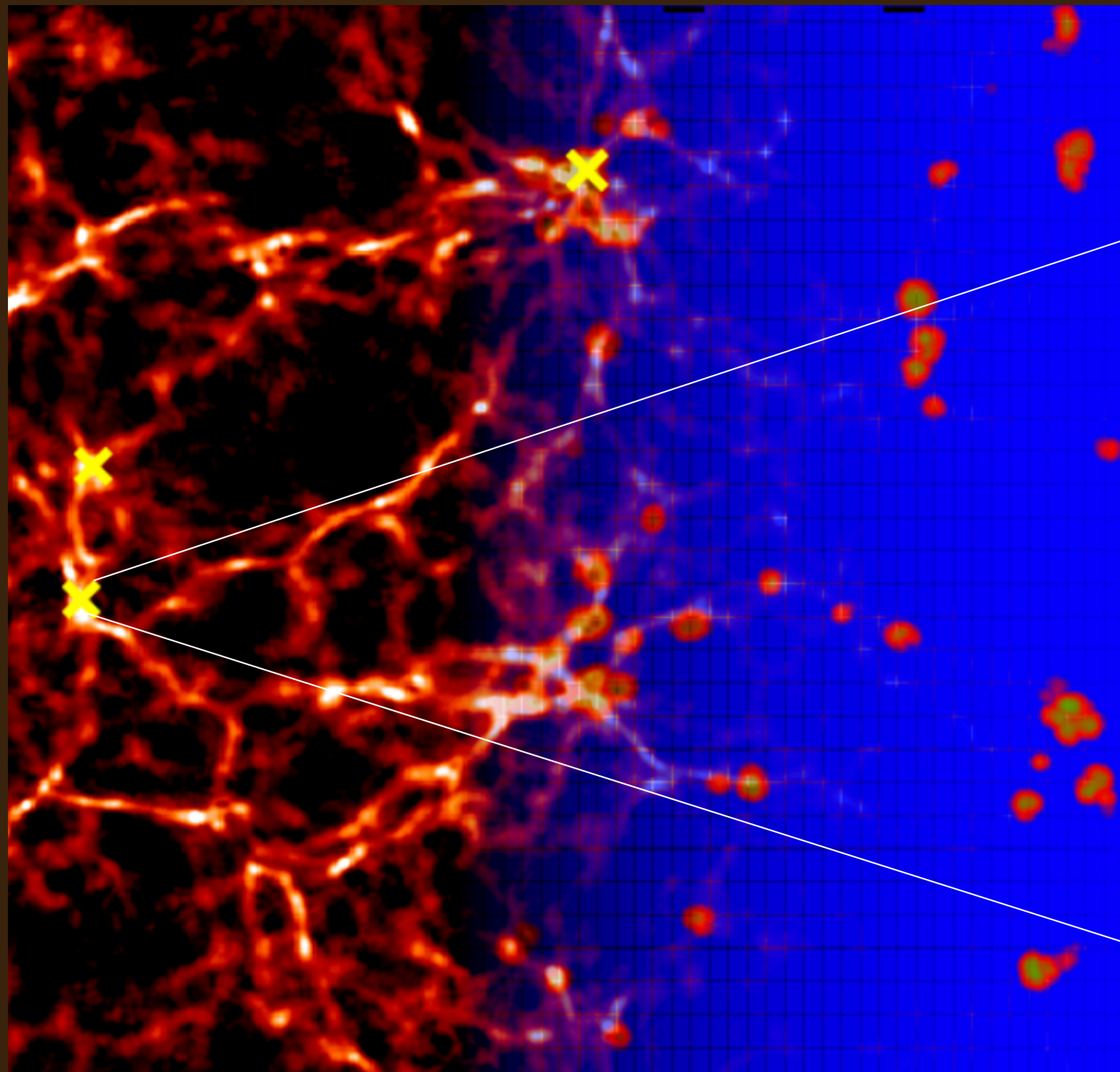
Fermi bubbles in the Milky Way



NASA / CXC / University of Bologna / F. Ubertosi / STScI / M. Calzadilla / NSF / NRAO / ALMA

**Supermassive black holes may be major players in the evolution of the Universe**

To model the impact of dynamical heating, DCBHs are seeded in rich environments with multiple neighboring galaxies





# Theories of seed black hole formation



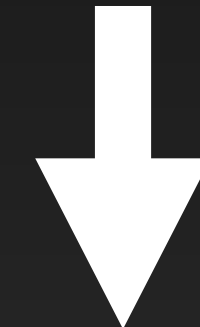
# Theories of seed black hole formation

Jeans' instability: Gravity vs Thermal pressure

Segments of the cloud will collapse if it exceeds the Jeans' Mass  $M_J \propto T^{3/2}$



Higher gas temperatures



Higher Jeans' masses



Higher mass seeds

# How do the seed black holes form?

Jeans' instability criterion of a segment of gas cloud of mass  $M$  and temperature  $T$ .

The cloud will collapse if it exceeds the Jeans' Mass  $M_J \propto T^{3/2}$

Typical gas cloud

Low Temperature, 10-30 K



Ordinary star formation,  
stellar mass black holes

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Ordinary star formation  
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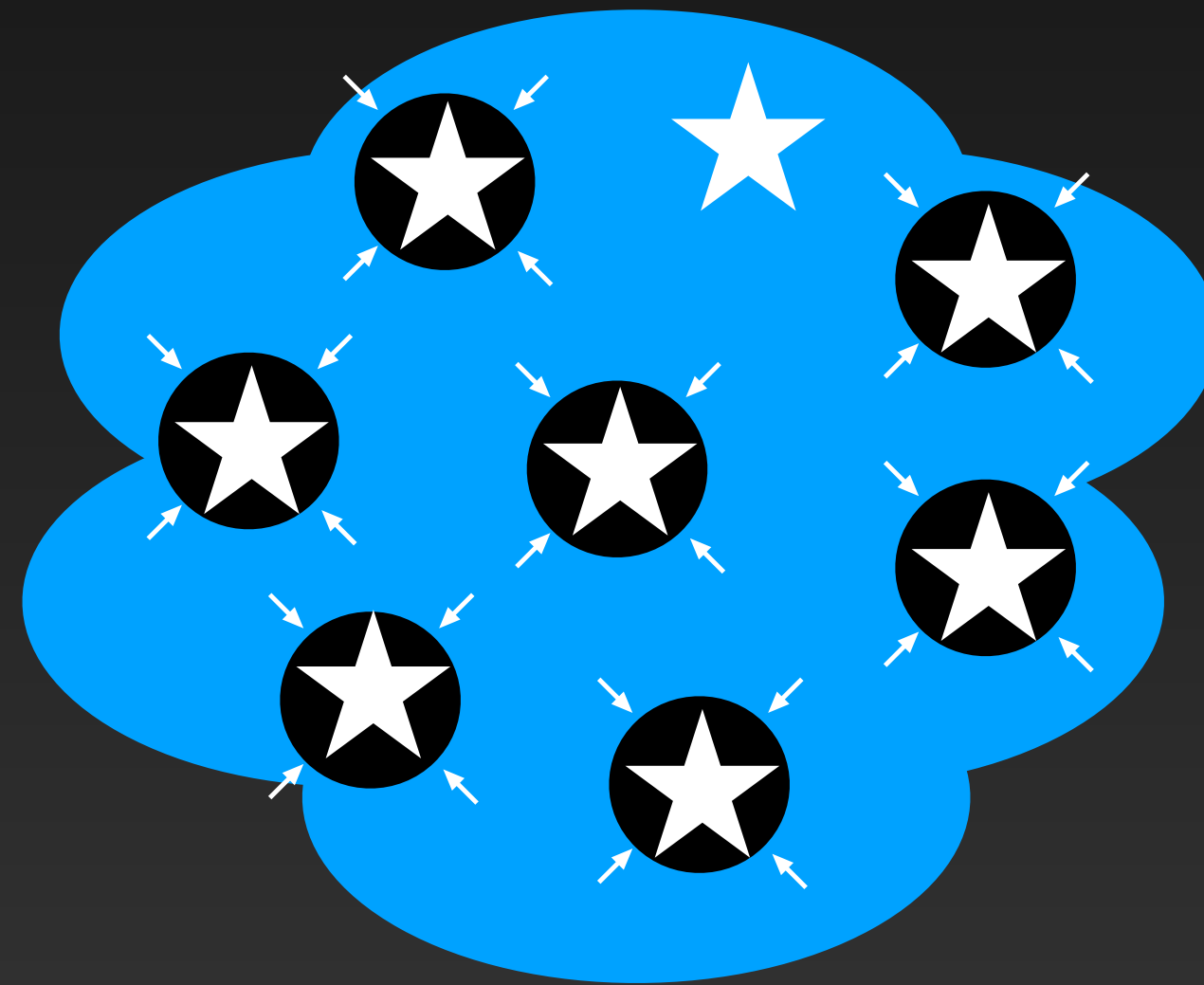
Low Temperature, 10-30 K



Ordinary star formation  
leading to Stellar mass  
black holes

Pristine gas cloud (no metals)

Higher temperatures ~100-1000K



Pop III star formation,  
producing more  
massive remnants

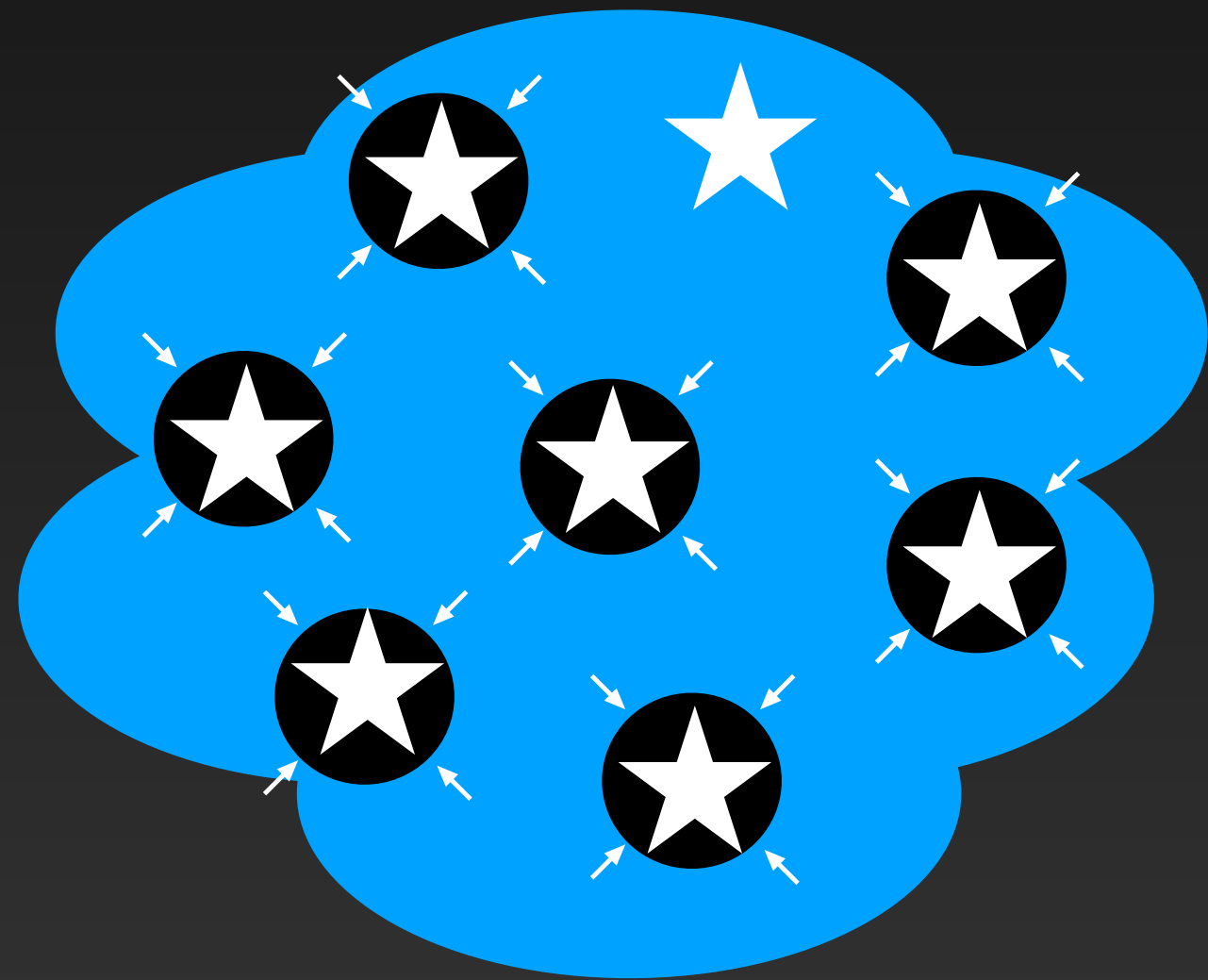
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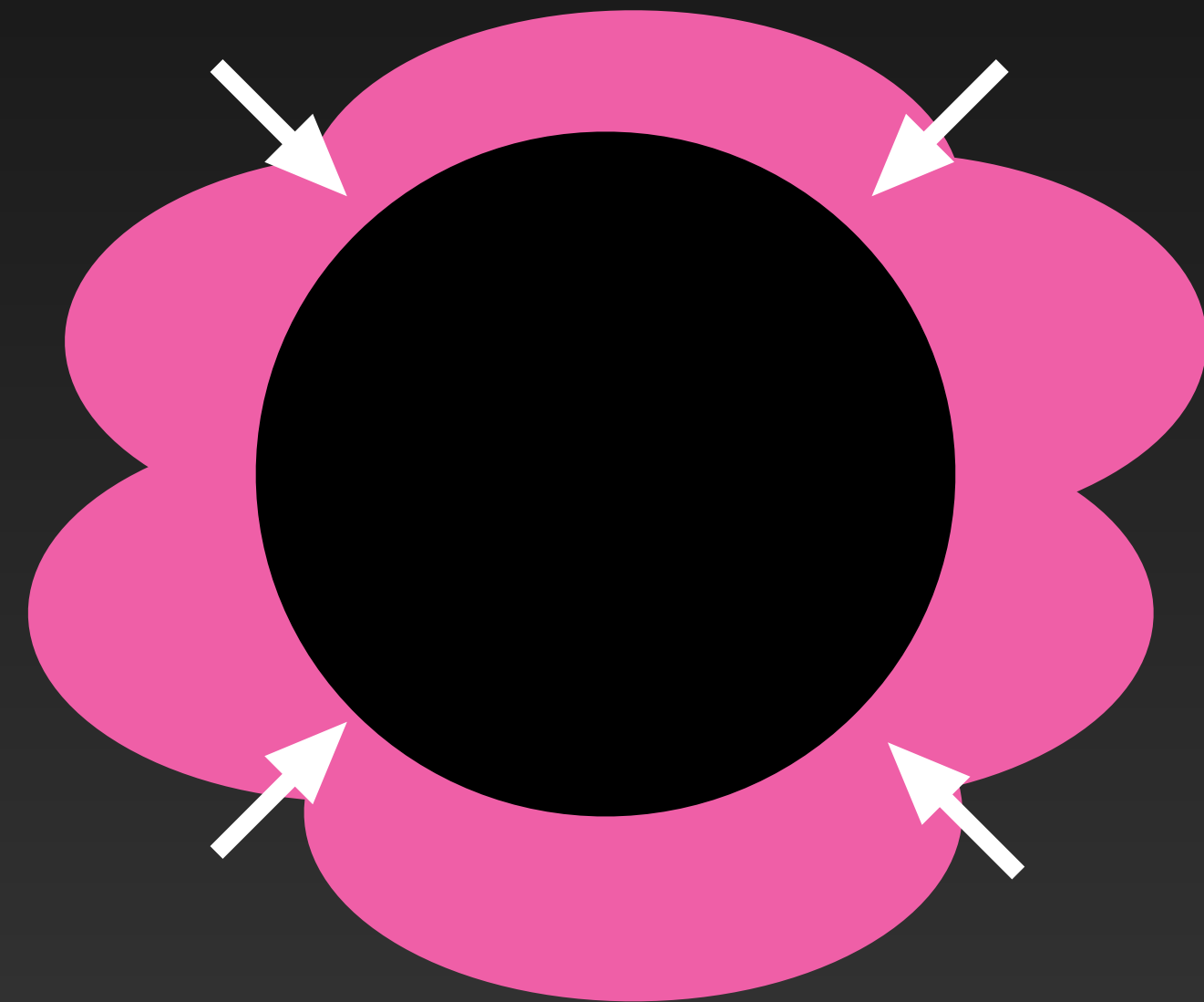


Pop III star formation,  
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massive remnants

Pristine gas cloud (no metals)

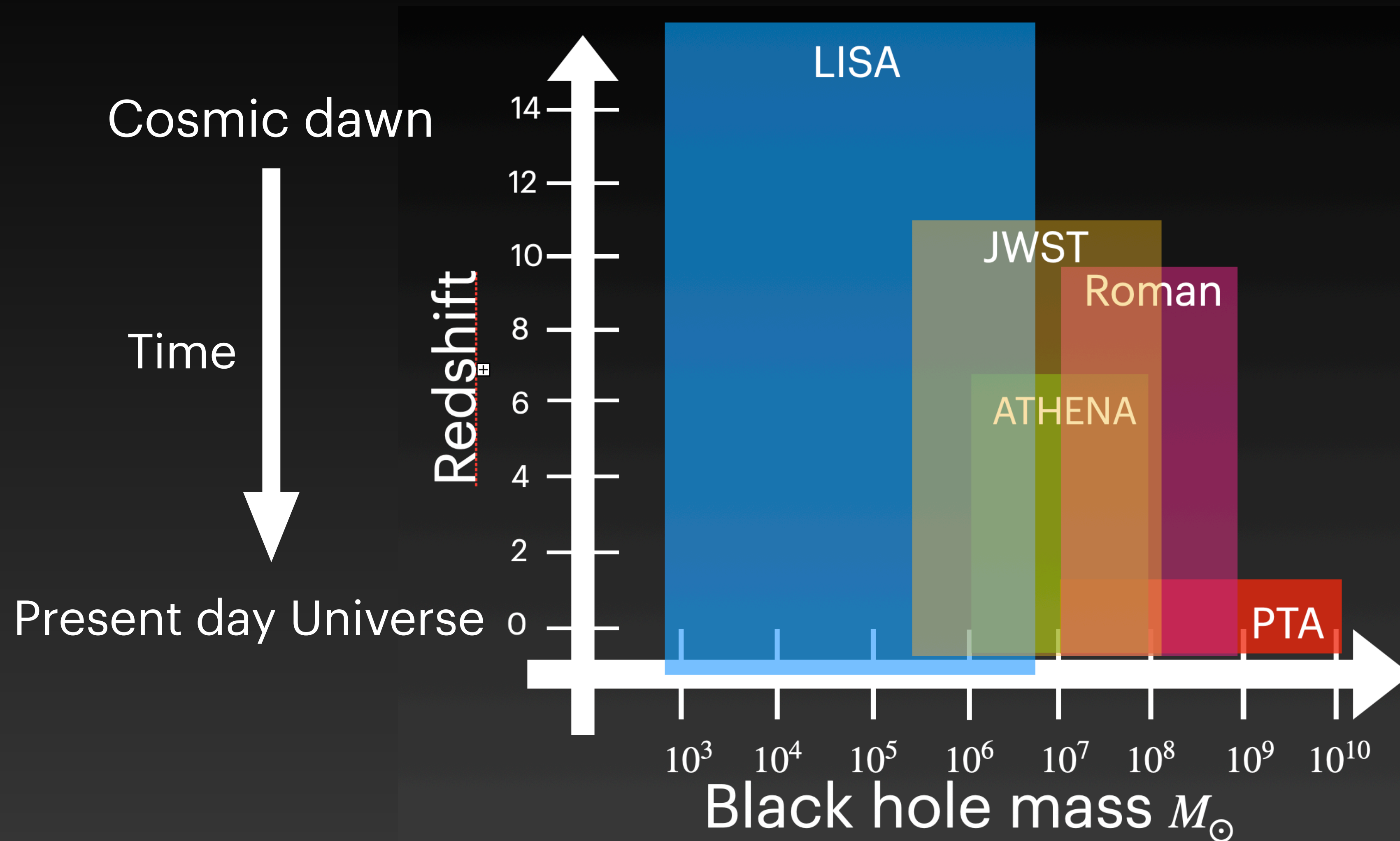
No molecular hydrogen

Highest temperatures > 10000 K



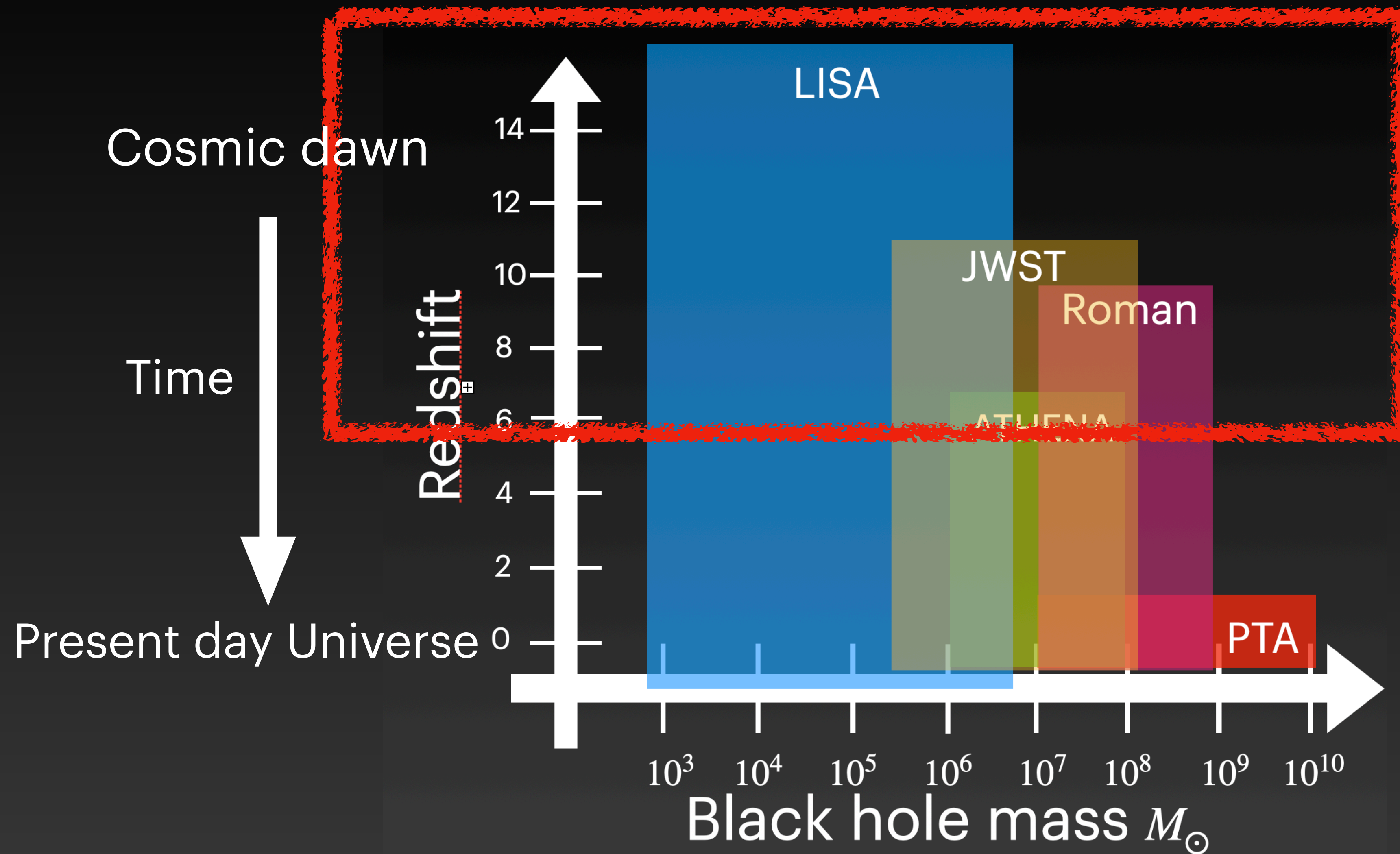
No Pop III star formation  
Gas directly collapses to most  
massive remnants

# Huge amount of investment to reveal black hole populations across the entire cosmic timeline by the ~2040s



Need for a robust theoretical framework to make predictions!

# Huge amount of investment to reveal black hole populations across the entire cosmic timeline by the ~2040s

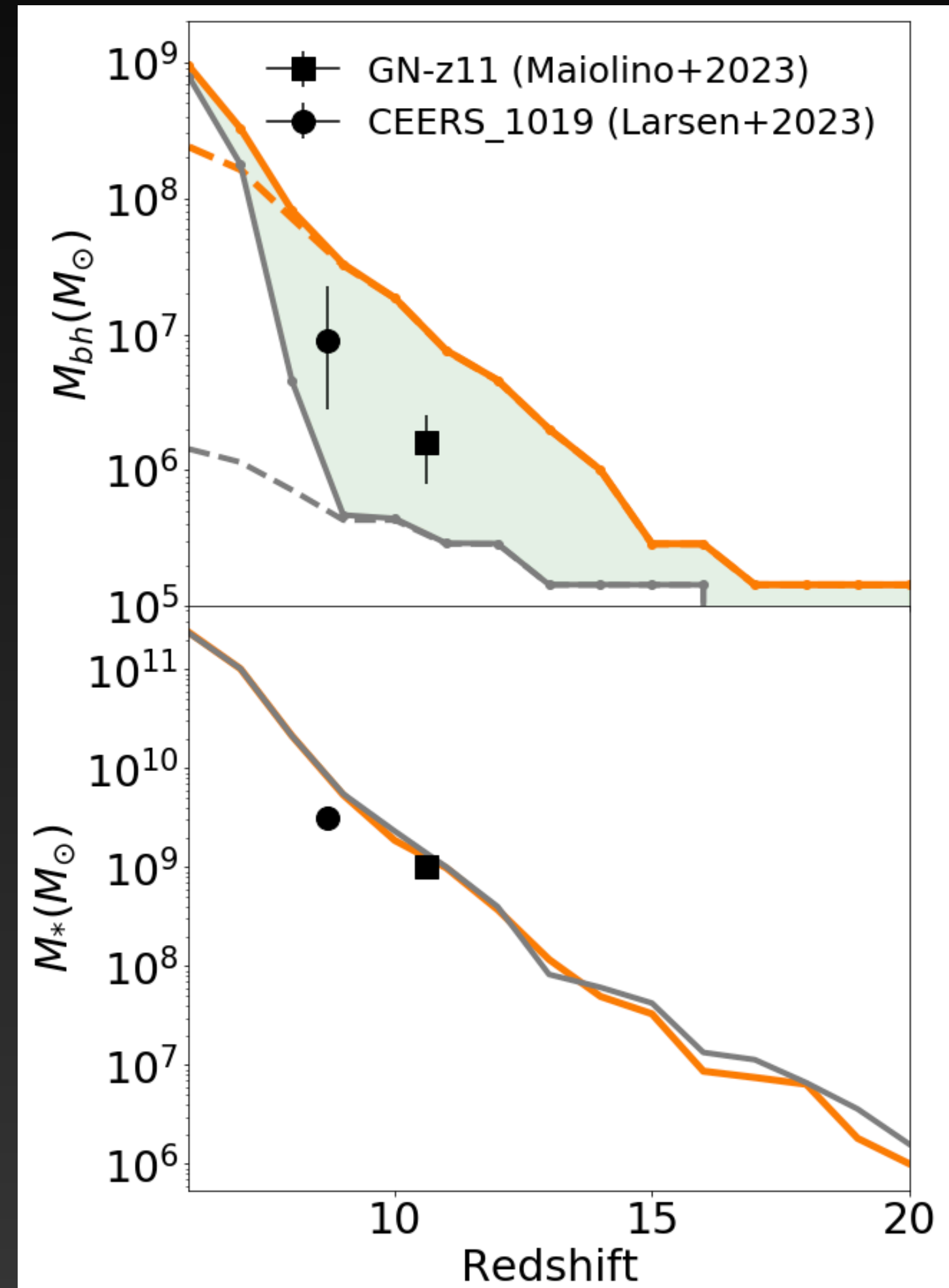


Earliest  
black hole  
populations





# Two possible avenues for assembling the $z \sim 6$ quasars:



Avenue 1: If we form higher number of seeds, early growth can be boosted by BH-BH mergers

Avenue 2: Allowing for Super-Eddington accretion