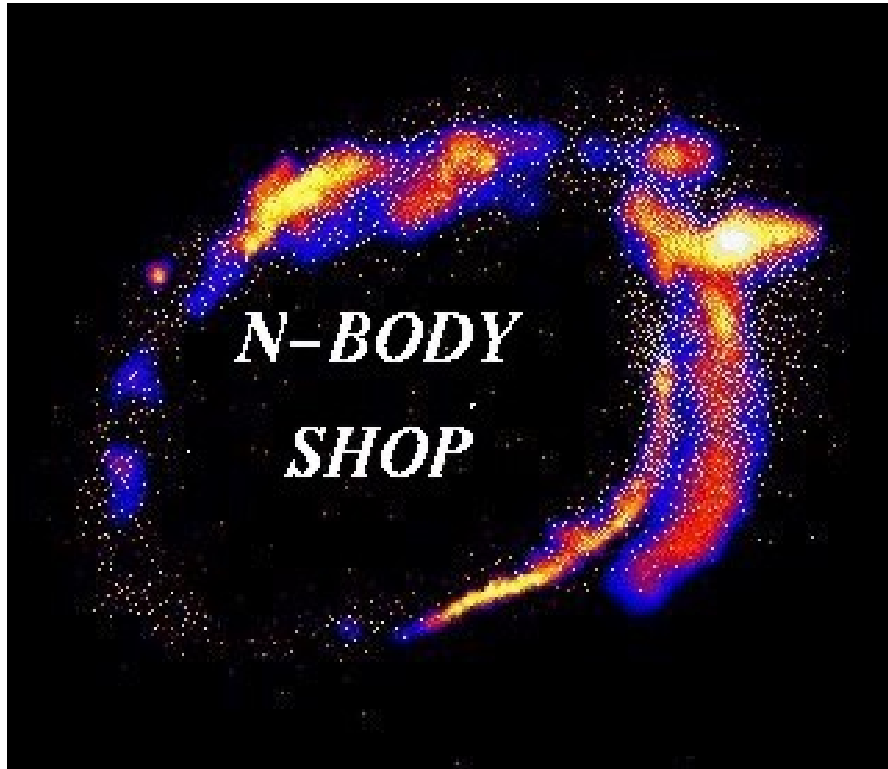


# Unified Modeling of Galaxy Populations in Clusters

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NSF PRAC Award 1613674



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# Outline

- Scientific background (Why it matters)
- Need for high resolution (Why Blue Waters)
- Previous Results (Accomplishments)
- The Cluster Clustering Problem (Key Challenges)
- Charm++ and ChaNGa (Key Challenges)
- Recent results (Accomplishments)

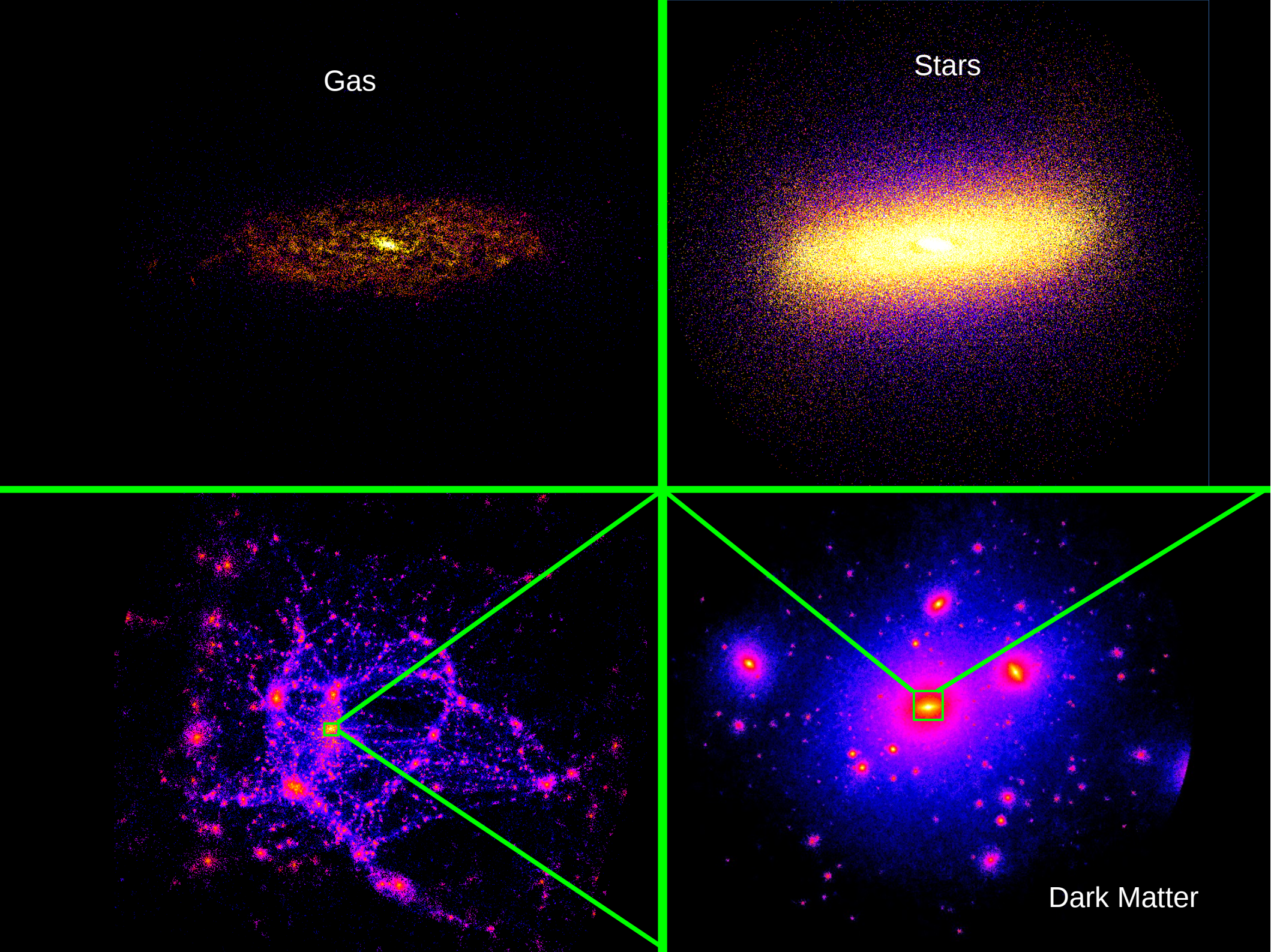
Galaxies: can we form one of these?



Gas

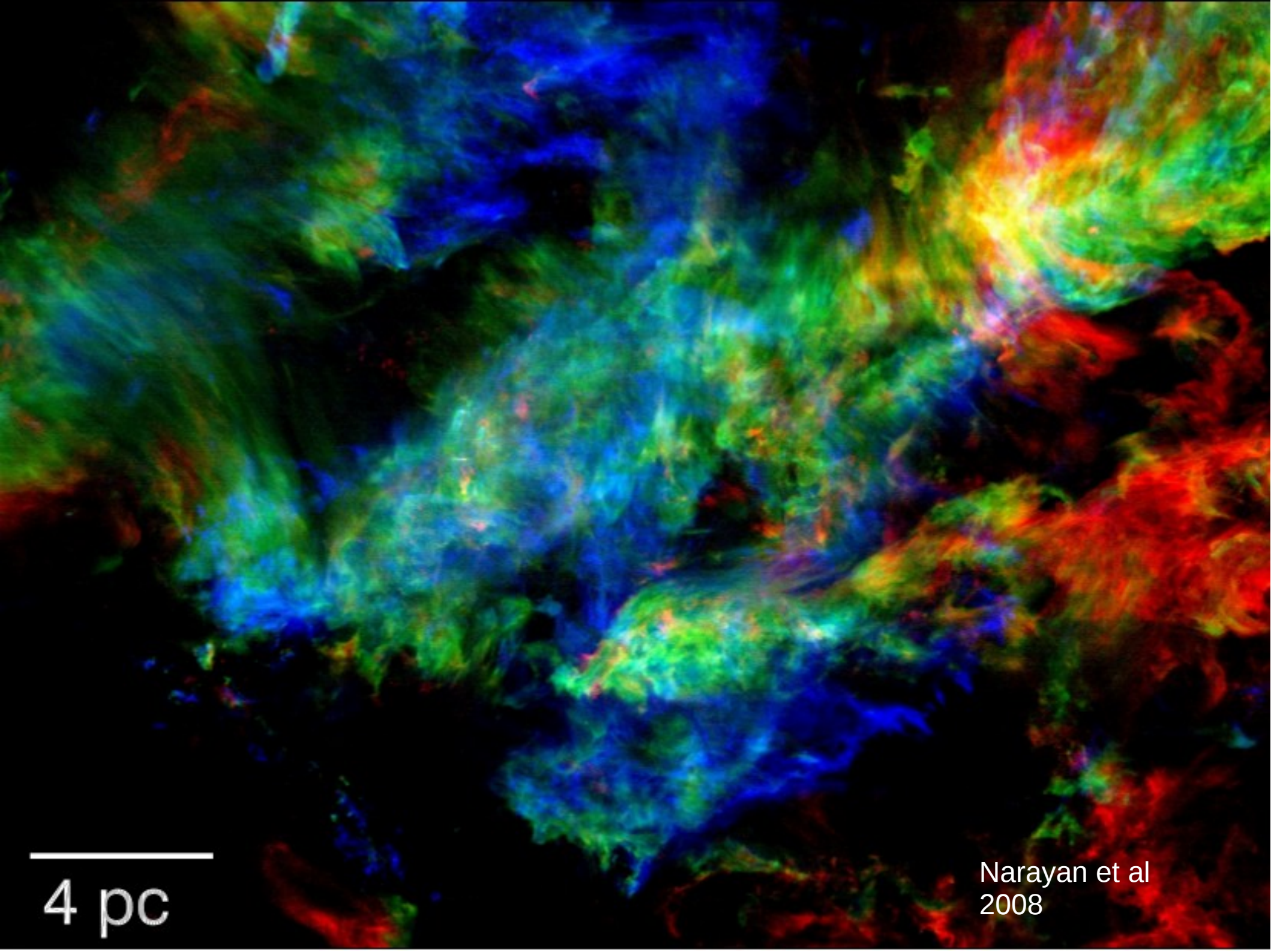
Stars

Dark Matter



# Modeling Star Formation: it's hard

- Gravitational Instabilities
- Magnetic Fields
- Radiative Transfer
- Molecular/Dust Chemistry
- Driven at large scales: differential rotation
- Driven at small scales: Supernovae and Stellar Winds
- Scales unresolvable in cosmological simulations



4 pc

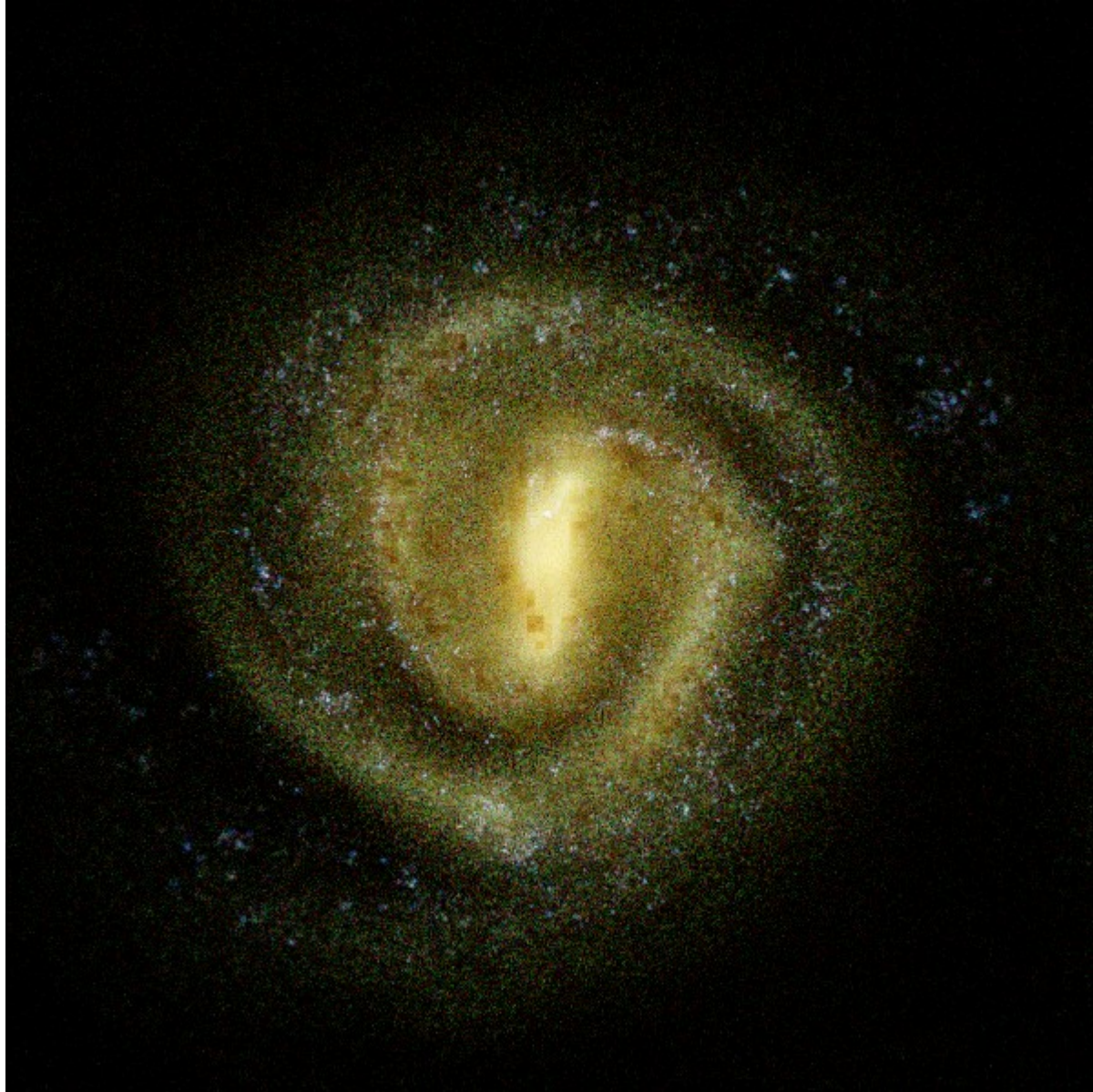
Narayan et al  
2008

# Resolution and Subgrid Models

- Maximize Simulation Resolution
  - Capture tidal torques/accretion history (20+ Mpc)
  - Adapt resolution to galaxy (sub-Kpc,  $10^5$  Msun)
- Capture Star Formation in a sub-grid model
  - Stars form in high density environments
  - Supernovae/stellar winds/radiation regulate star formation
  - Mitigate issues with poor resolution (overcooling)
  - Tune to match present day stellar populations



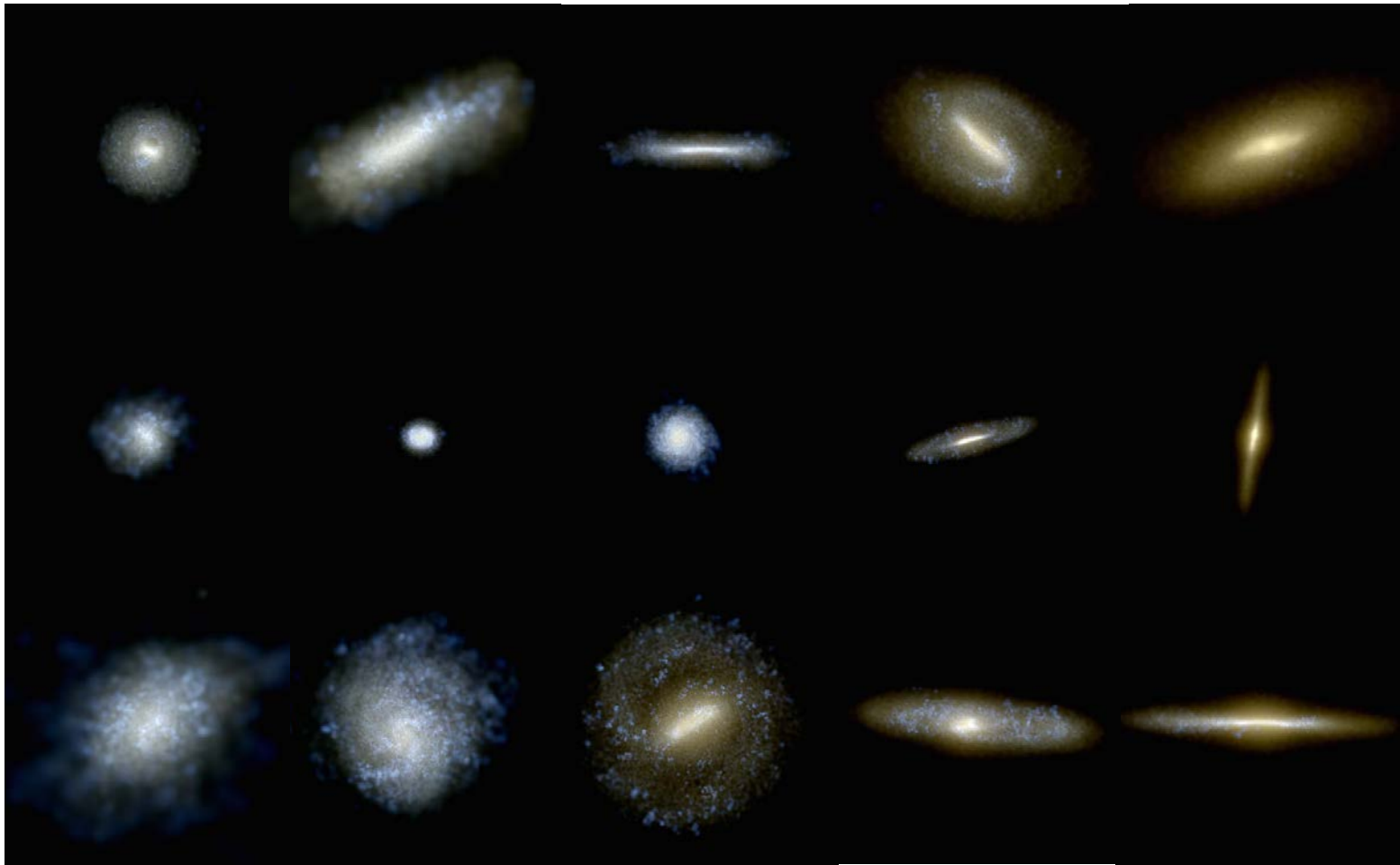
# Previous PRAC: good morphologies



Danielle  
Skinner

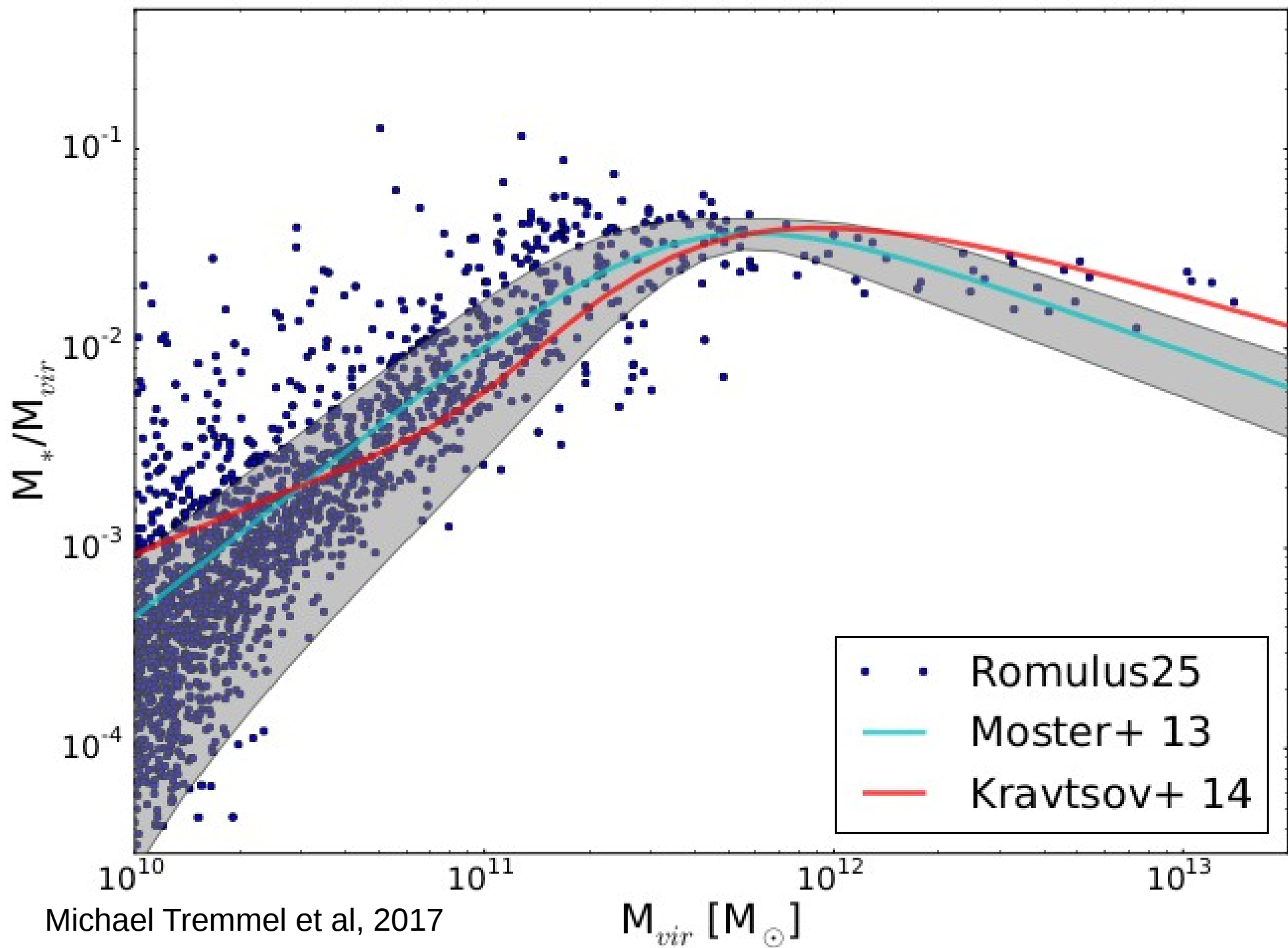
# Good morphologies across a population

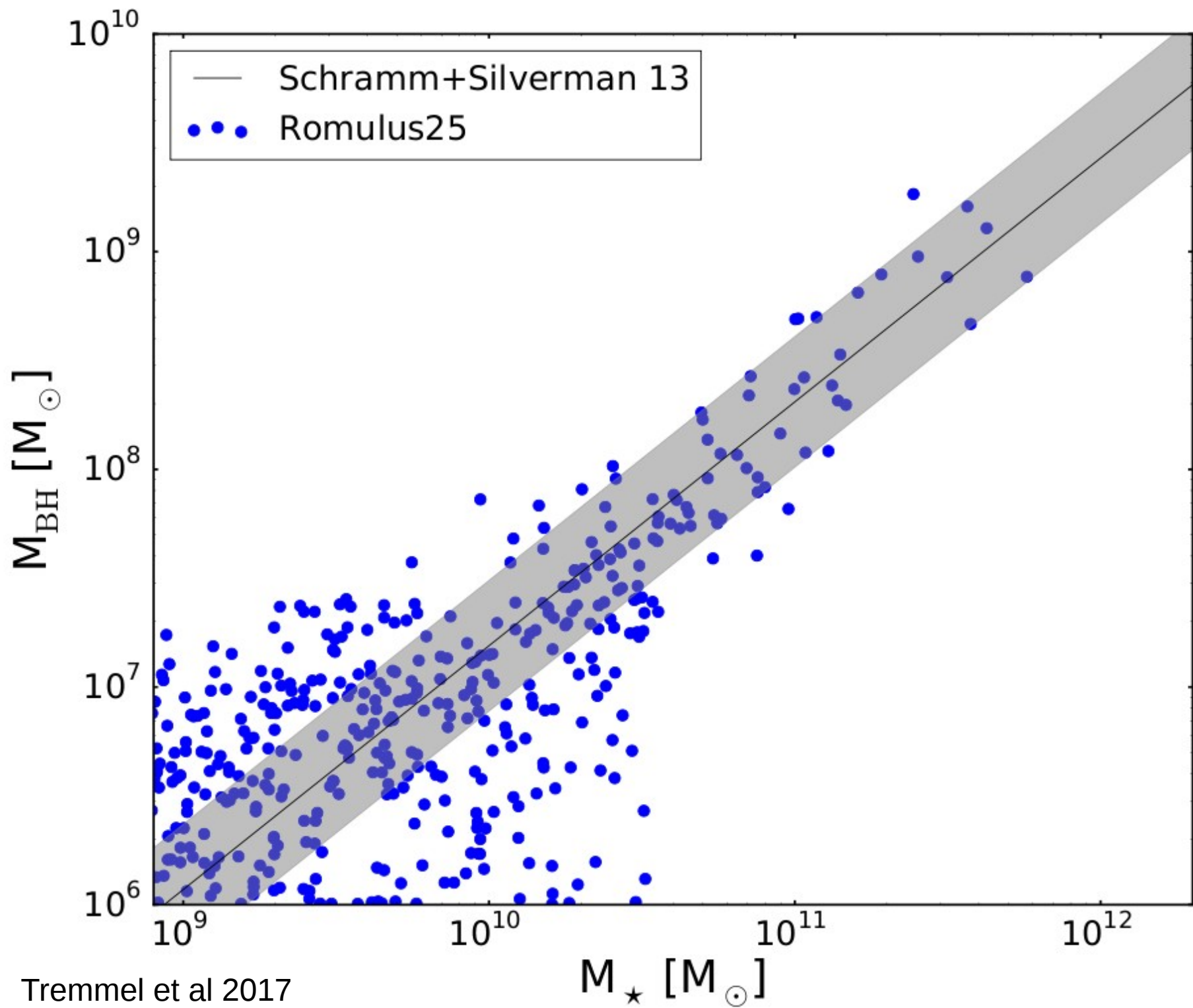
$z = 3$     $z = 2$     $z = 1.2$     $z = 0.75$     $z = 0.5$



# Black hole/AGN feedback

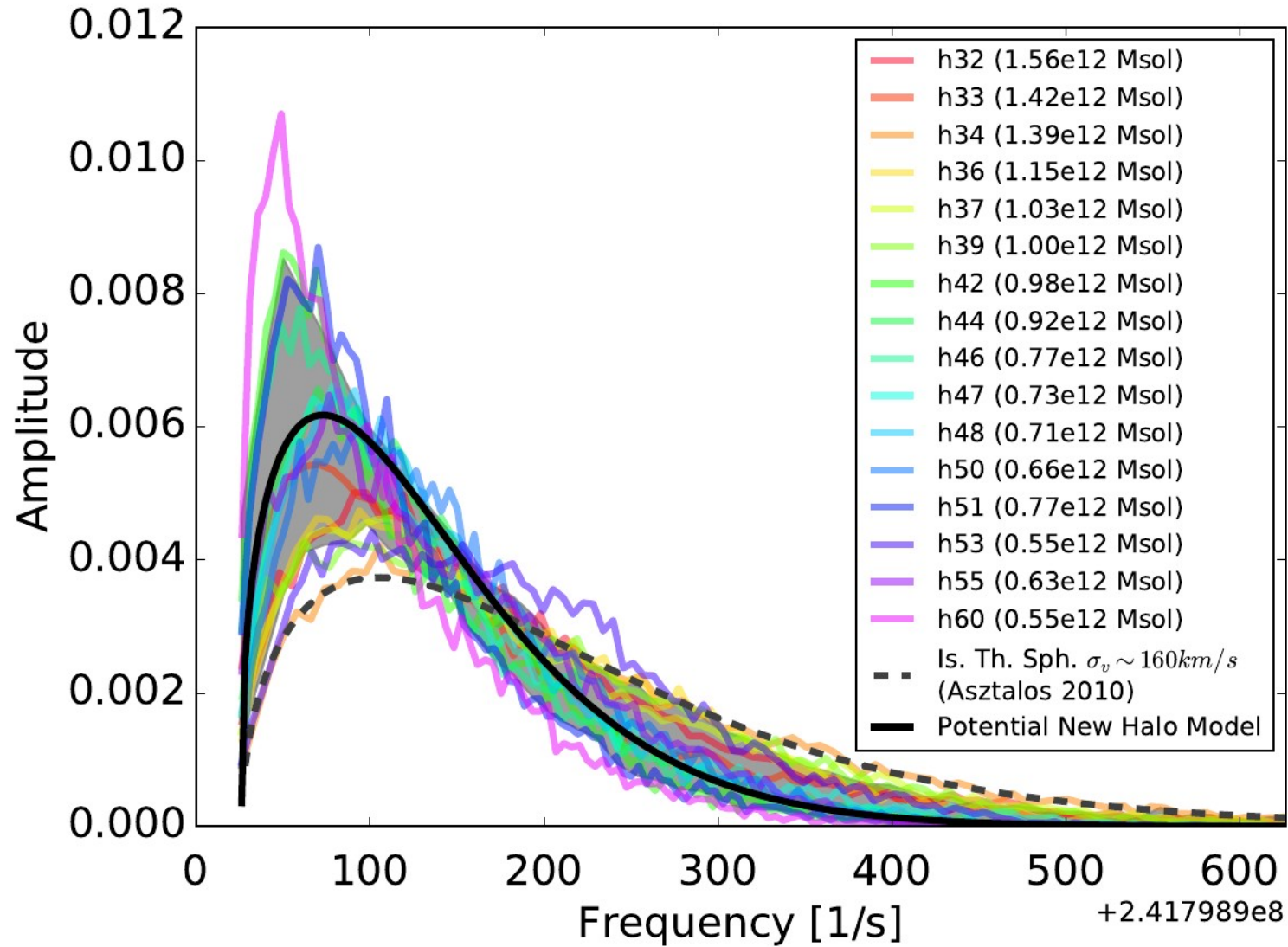
- Supernova feedback doesn't suppress star formation in massive galaxies
  - Modeling of more energetic feedback required
- Components of AGN modeling:
  - Seed ( $10^6 M_{\text{sun}}$ ) BH form in dense, low metallicity gas
  - BH grow from accreting gas, and release energy into the surrounding gas (Active Galactic Nuclei)
  - BH in merging galaxies sink to the center and merge (LIGO, eLISA)



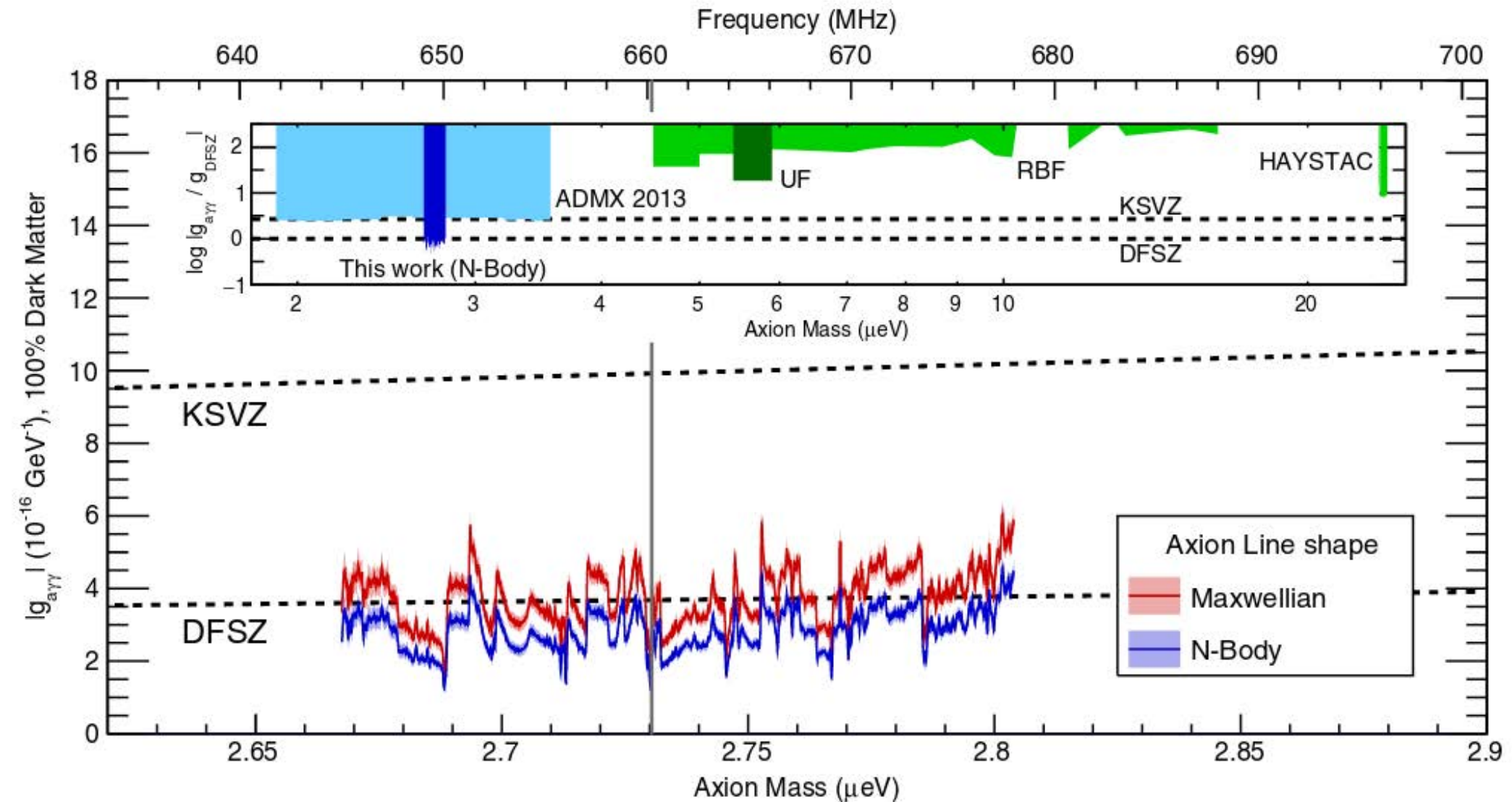


Tremmel et al 2017

# Milky Way DM Distribution Function

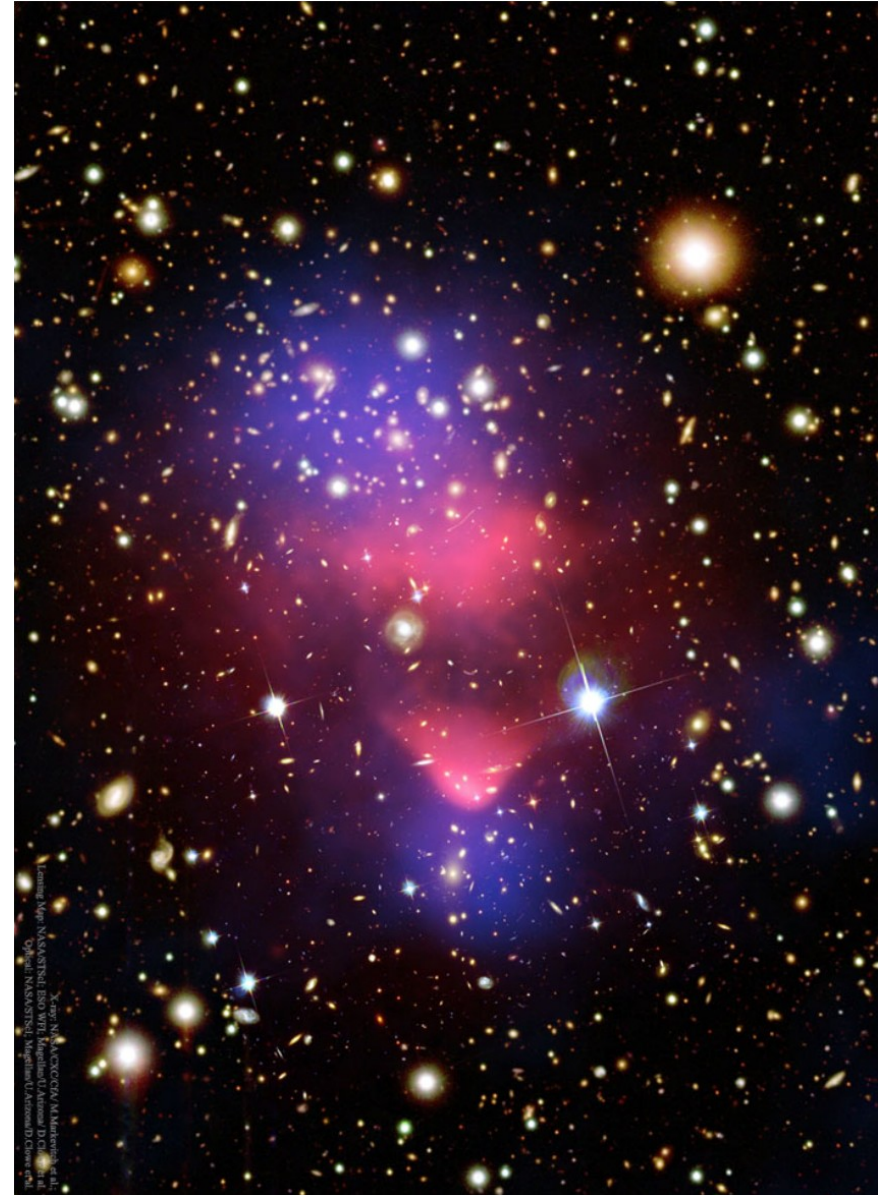


# Consequences for DM Searches



# Clusters: the science

- Largest bound objects in the Universe
- Visible across the entire Universe
- Baryonic content is observable
- “Closed box” for galactic evolution





# Clusters: the challenge

- Good models of stellar feedback
- Good models of AGN (black hole) feedback
- Hydrodynamic instabilities require good algorithms
- Resolution:  $10^5$  Msun particles in  $10^{15}$  Msun object
- Highly “clustered” computation

# CHANGA



# UNLEASHED

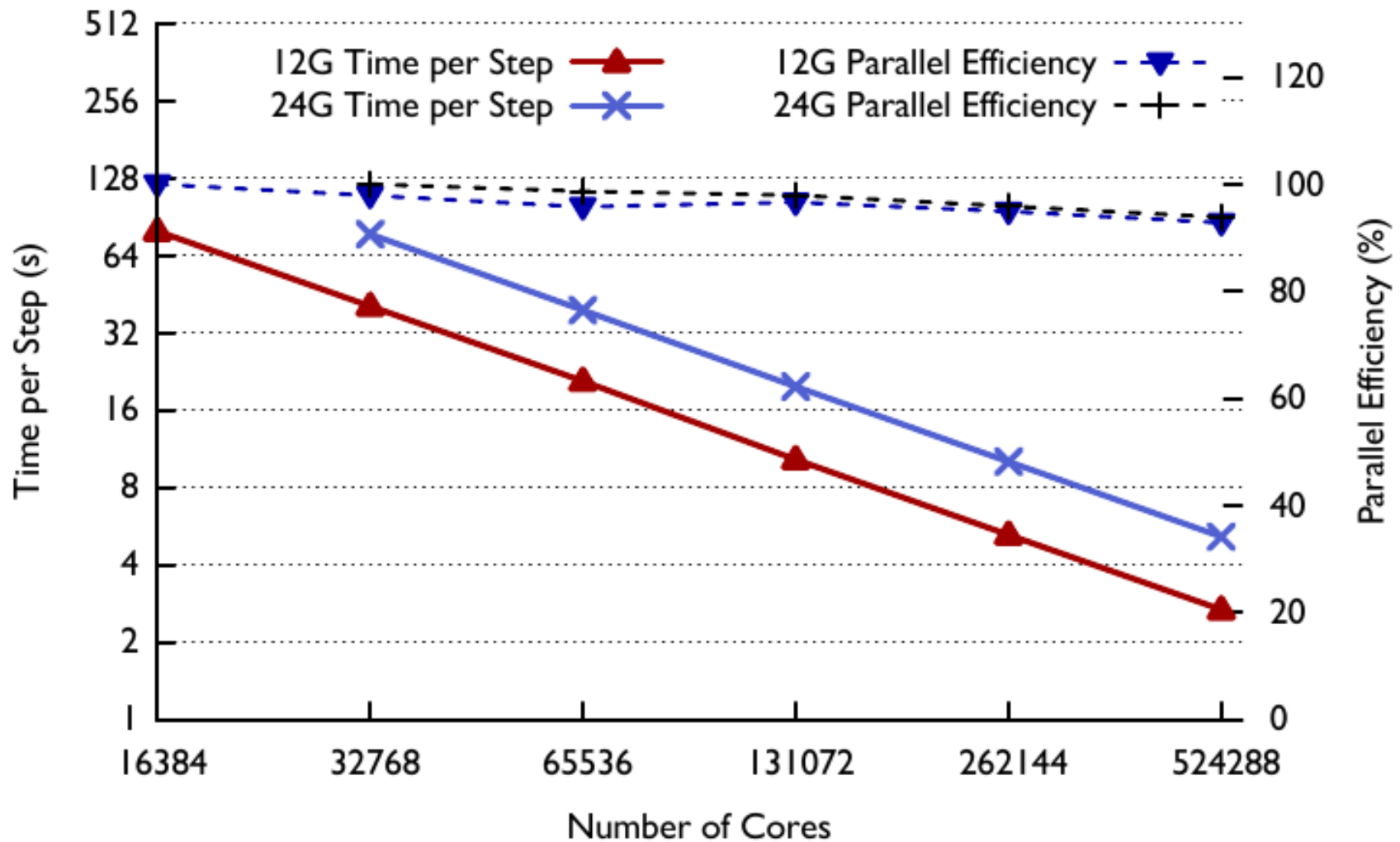
## Charm Nbody GrAavity solver

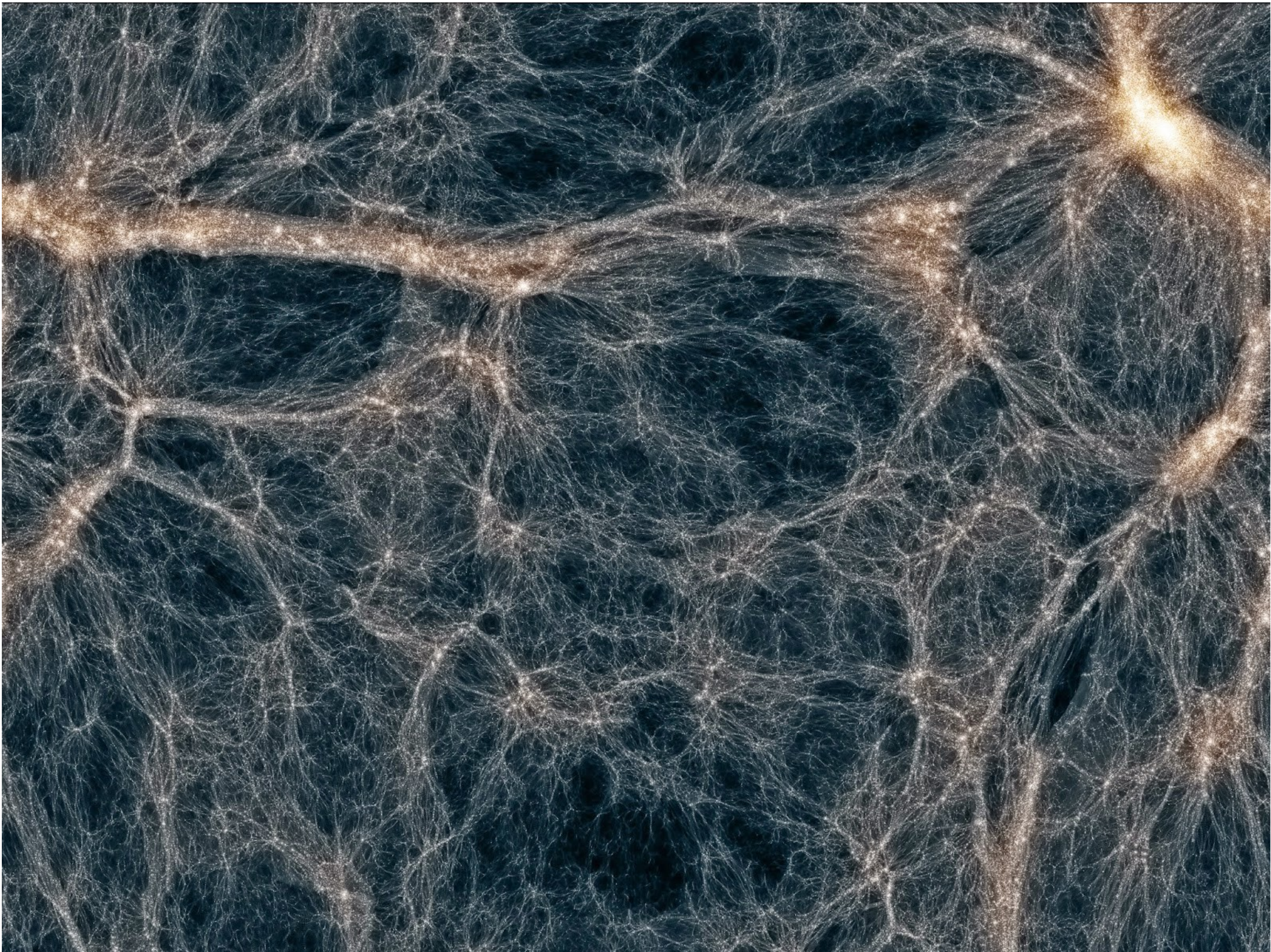
- Massively parallel SPH
- SNe feedback creating realistic outflows
- SF linked to shielded gas
- SMBHs
- Optimized SF parameters

# Charm++

- C++-based parallel runtime system
  - Composed of a set of globally-visible parallel objects that interact
  - The objects interact by asynchronously invoking methods on each other
- Charm++ runtime
  - Manages the parallel objects and (re)maps them to processes
  - Provides scheduling, load balancing, and a host of other features, requiring little user intervention

# Scaling to .5M cores

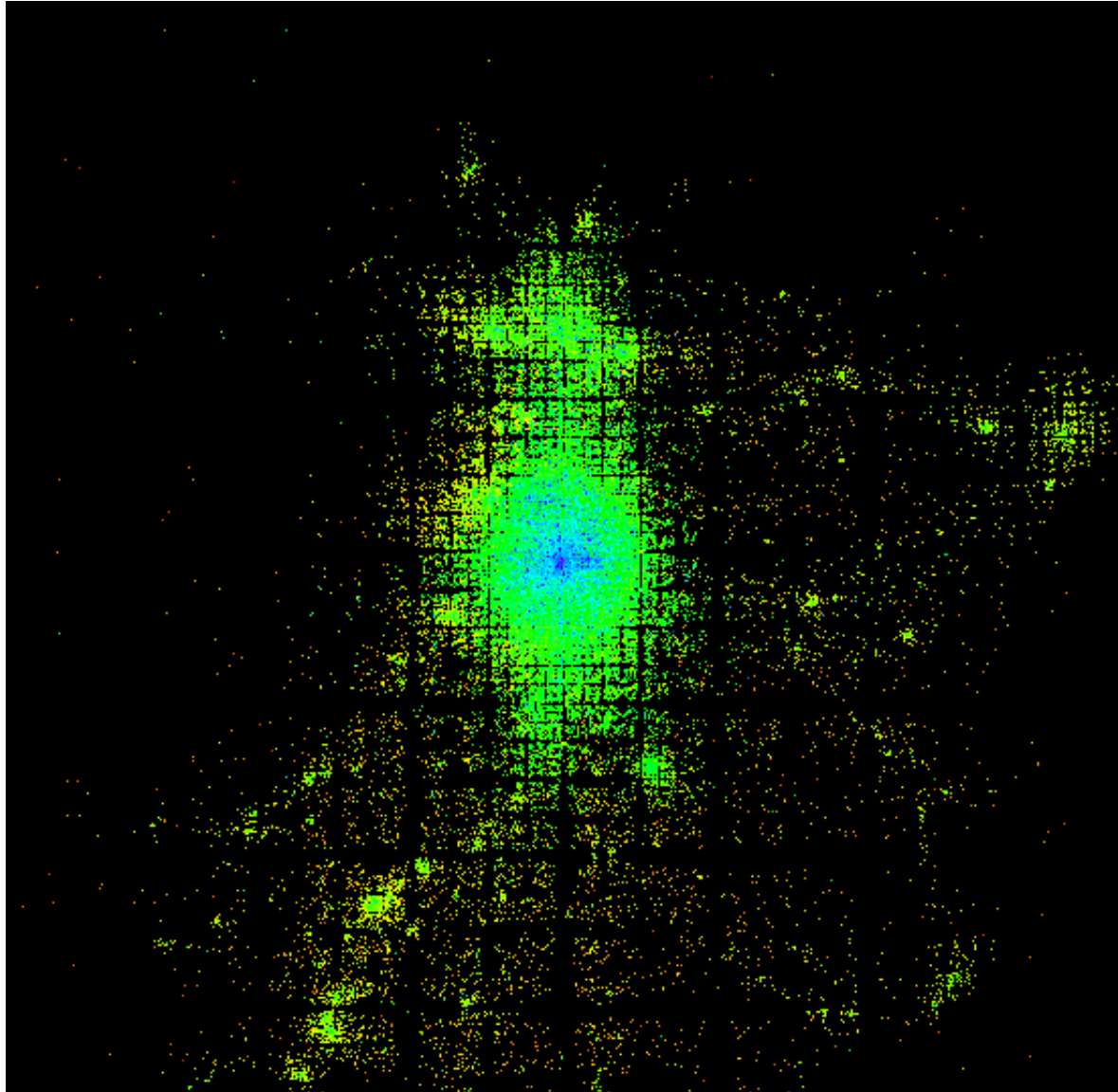




# Clustered/Multisteping Challenges

- Computation is concentrated in a small fraction of the domain
- Load/particle imbalance
- Communication imbalance
- Fixed costs:
  - Domain Decomposition
  - Load balancing
  - Tree build

# Load distribution



# Results: A cluster at unprecedented resolution

- Structure of the brightest cluster galaxy
- Other galaxies in the cluster environment
- The state of the intracluster medium



# Introducing RomulusC

The highest resolution cosmological hydro simulation of a cluster to date

Zoom-In Simulation

$M_{200}(z=0) = 1.5e14 M_{\text{sun}}$

**Resolution:**

**250 pc,  $2e5 M_{\text{sun}}$**

Name	Spatial Res. <sup>a</sup> kpc	$M_{DM}$ $M_{\odot}$	$M_{gas}$ $M_{\odot}$
<b>RomulusC</b>	0.25	$3.39 \times 10^5$	$2.12 \times 10^5$
TNG300 <sup>b</sup>	1.5	$7.88 \times 10^7$	$7.44 \times 10^6$
TNG100 <sup>b</sup>	0.75	$5.06 \times 10^6$	$9.44 \times 10^5$
TNG50 (in progress <sup>c</sup> )	0.3	$4.43 \times 10^5$	$8.48 \times 10^4$
Horizon-AGN <sup>d</sup>	1	$8.0 \times 10^7$	$1.0 \times 10^7$
Magneticum <sup>e</sup>	10	$1.3 \times 10^{10}$	$2.9 \times 10^9$
Magneticum <sup>e</sup> high res	3.75	$6.9 \times 10^8$	$1.4 \times 10^8$
Magneticum <sup>e</sup> ultra high res	1.4	$3.6 \times 10^7$	$7.3 \times 10^6$
C-EAGLE <sup>f,g</sup>	0.7	$9.6 \times 10^6$	$1.8 \times 10^6$
EAGLE <sup>g</sup> (50, 100 Mpc)	0.7	$9.6 \times 10^6$	$1.8 \times 10^6$
Omega500 <sup>h</sup>	5.4	$1.56 \times 10^9$	$2.7 \times 10^8$

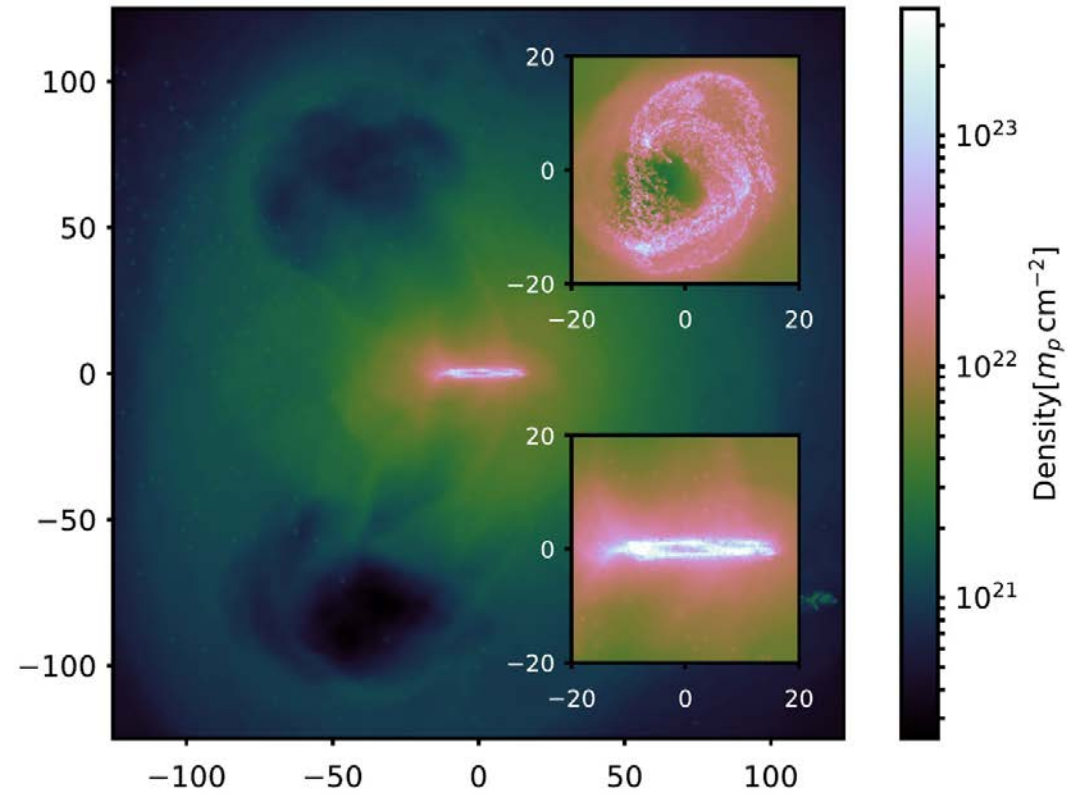
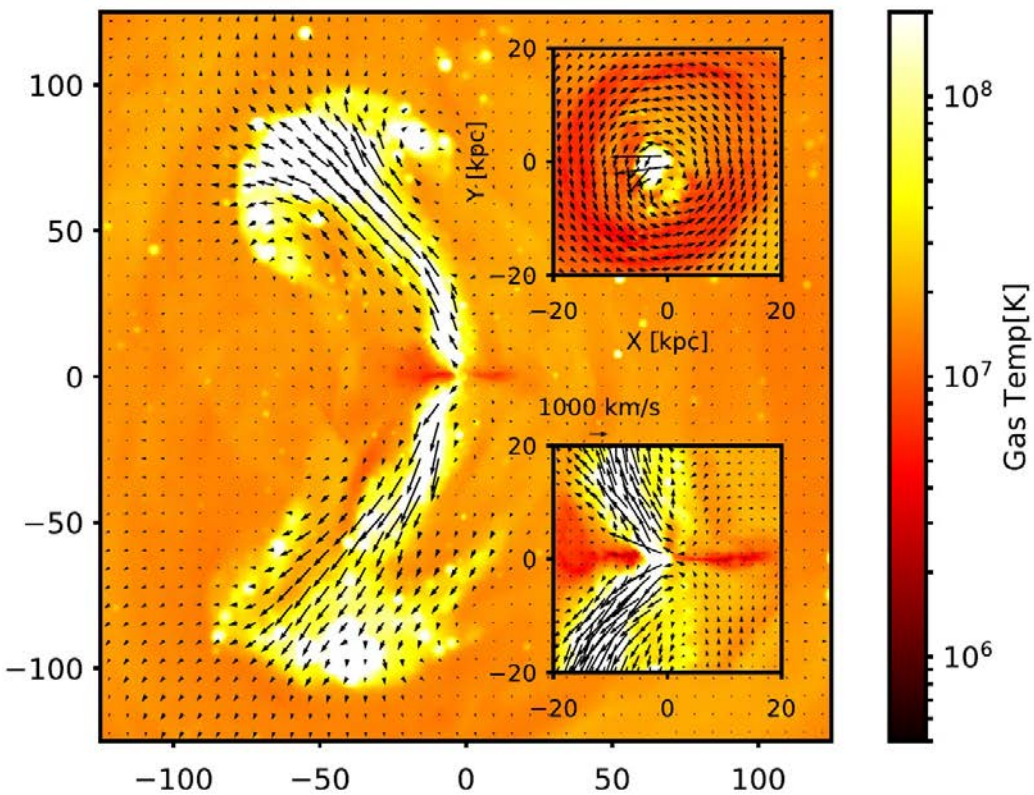
Murphy+ 17, Dubois+ 14,  
Bocquet+ 16, Armitage+ 18,  
Schaye+ 14, Shirasaki+ 18  
wcluster March 22, 2018

MIT OpenCourseWare  
Massachusetts Institute of Technology

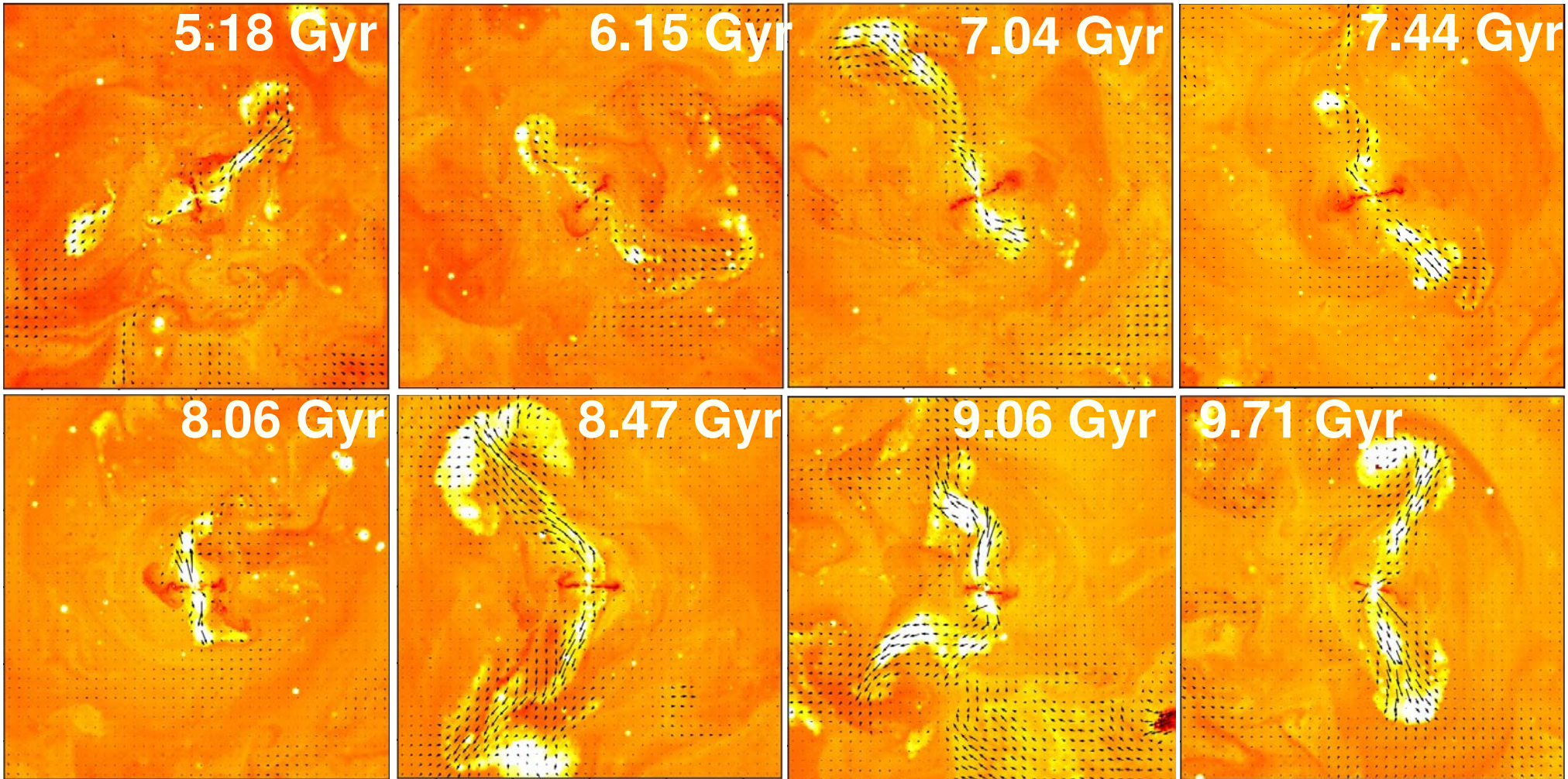


# Outflows in the BCG

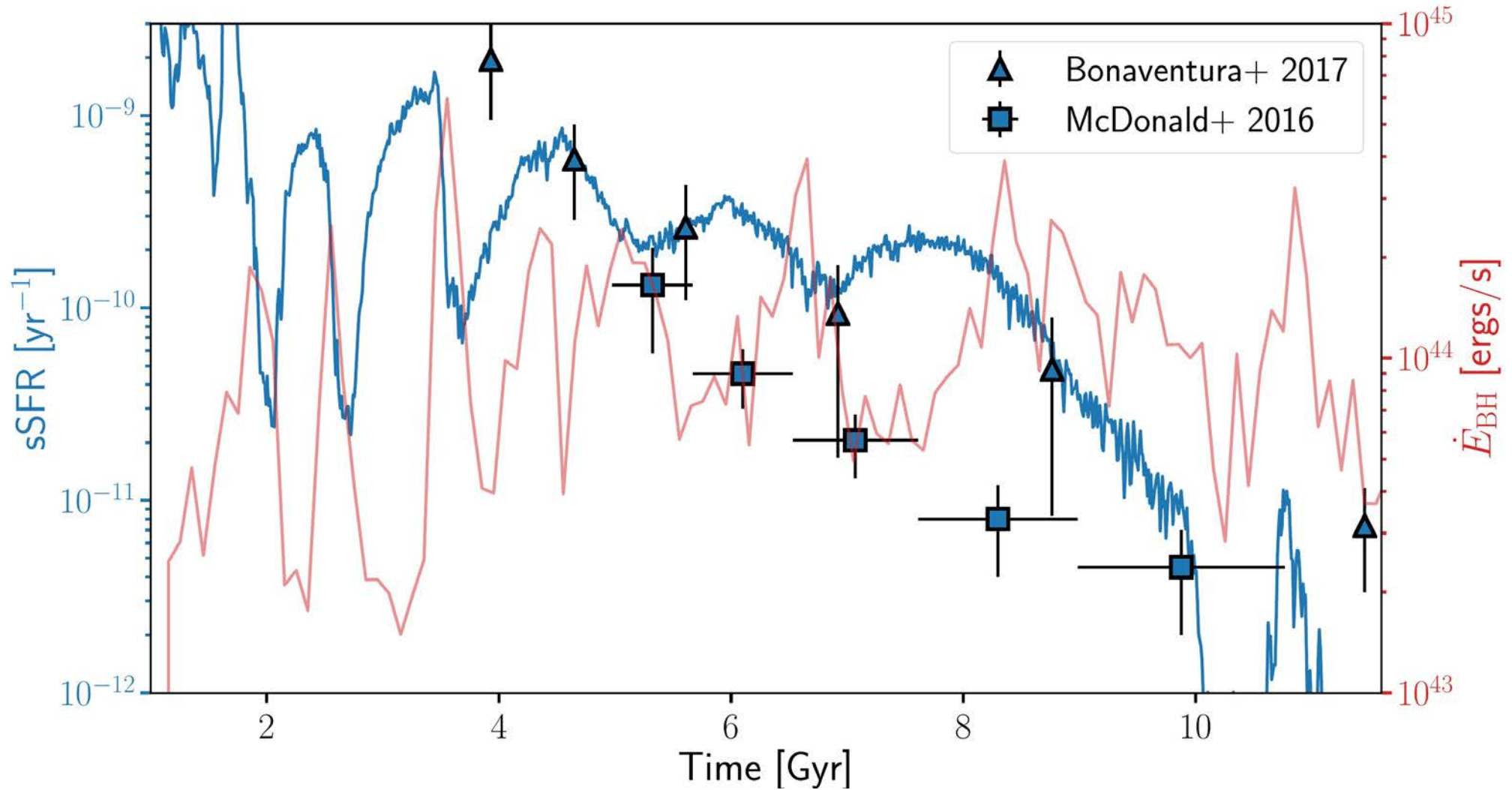
1000 km/s



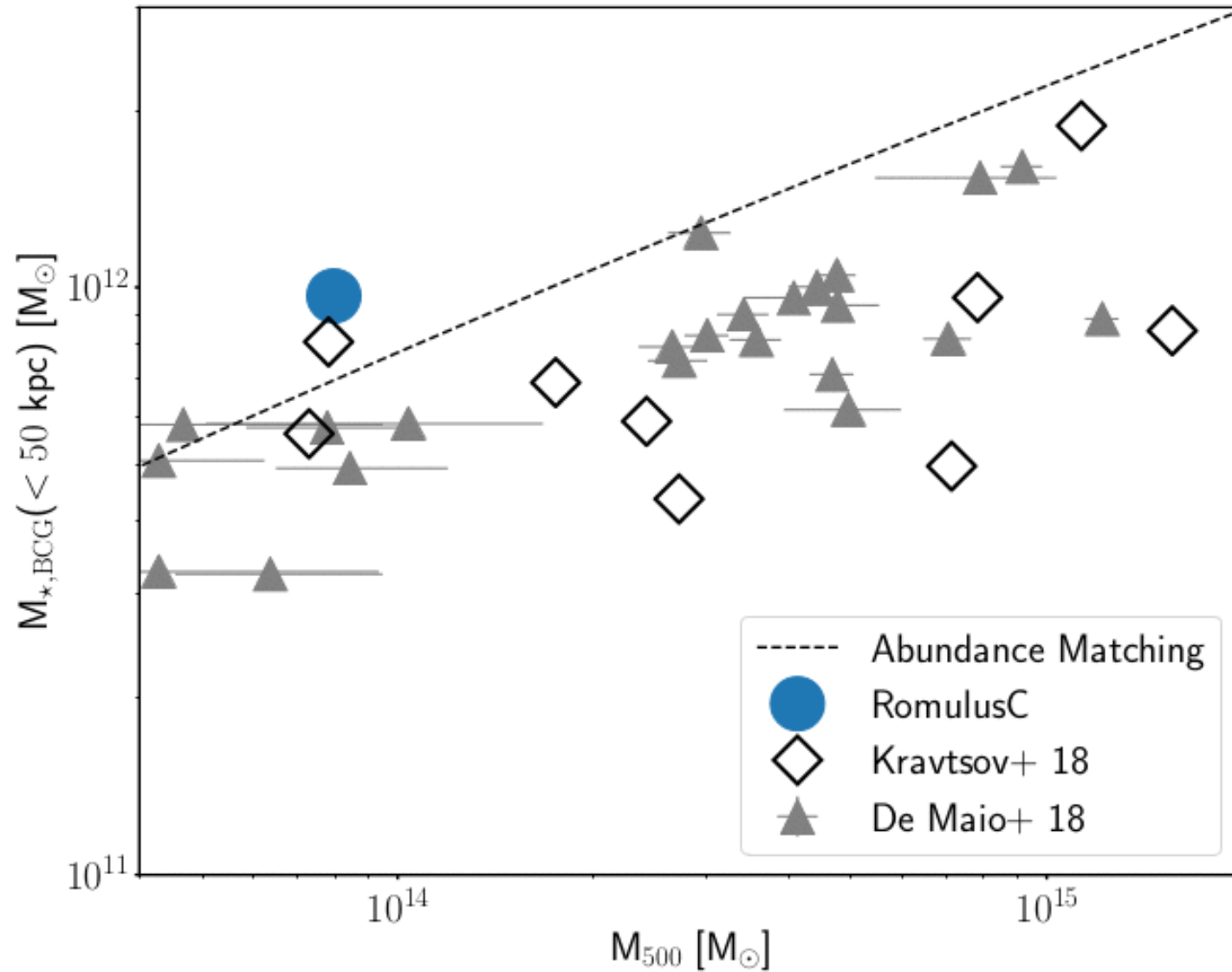
# Winds are ubiquitous through time



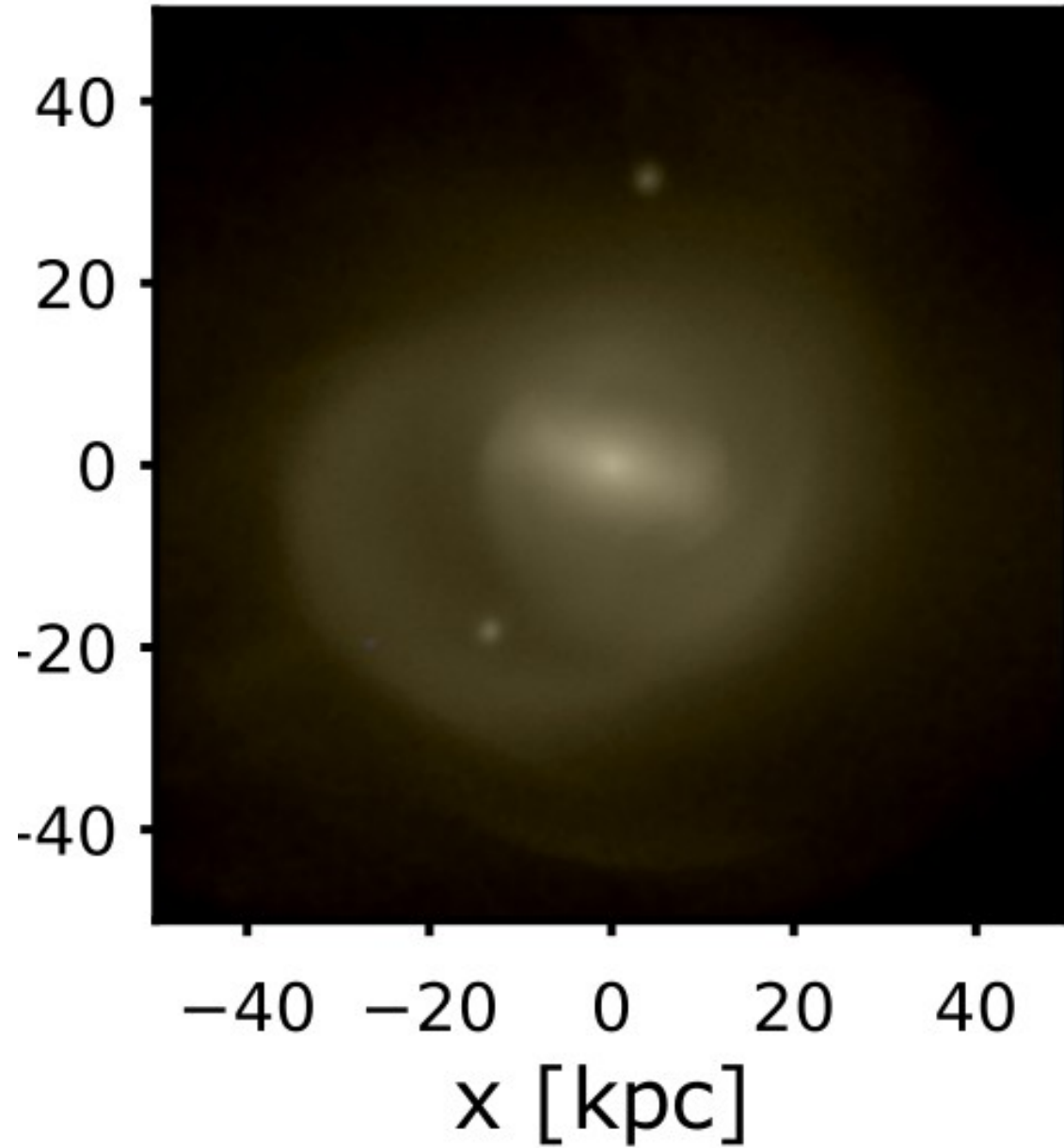
# Outflows and Quenching



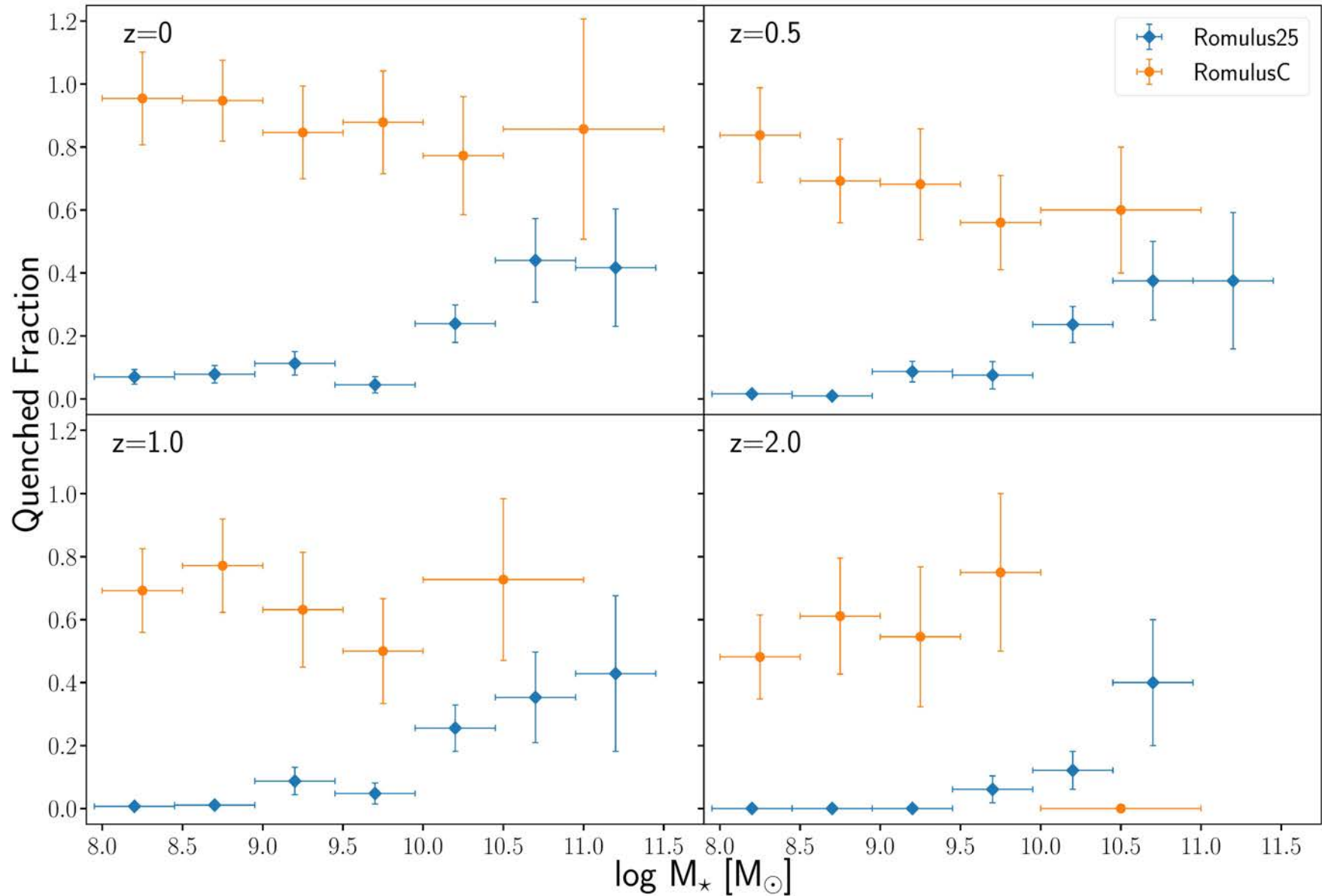
# Stellar Mass



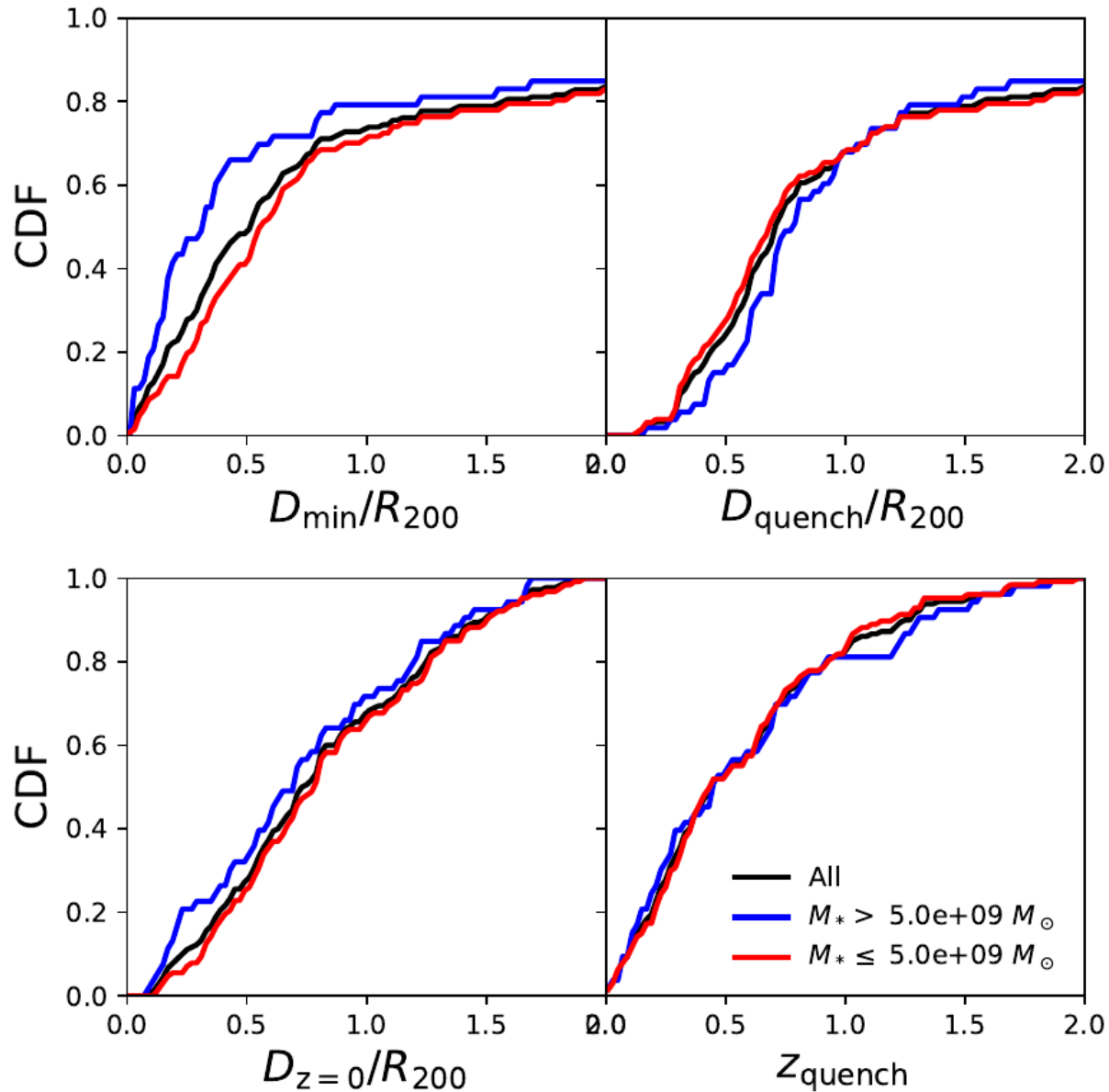
# Morphology of BCG



# Quenching in the cluster

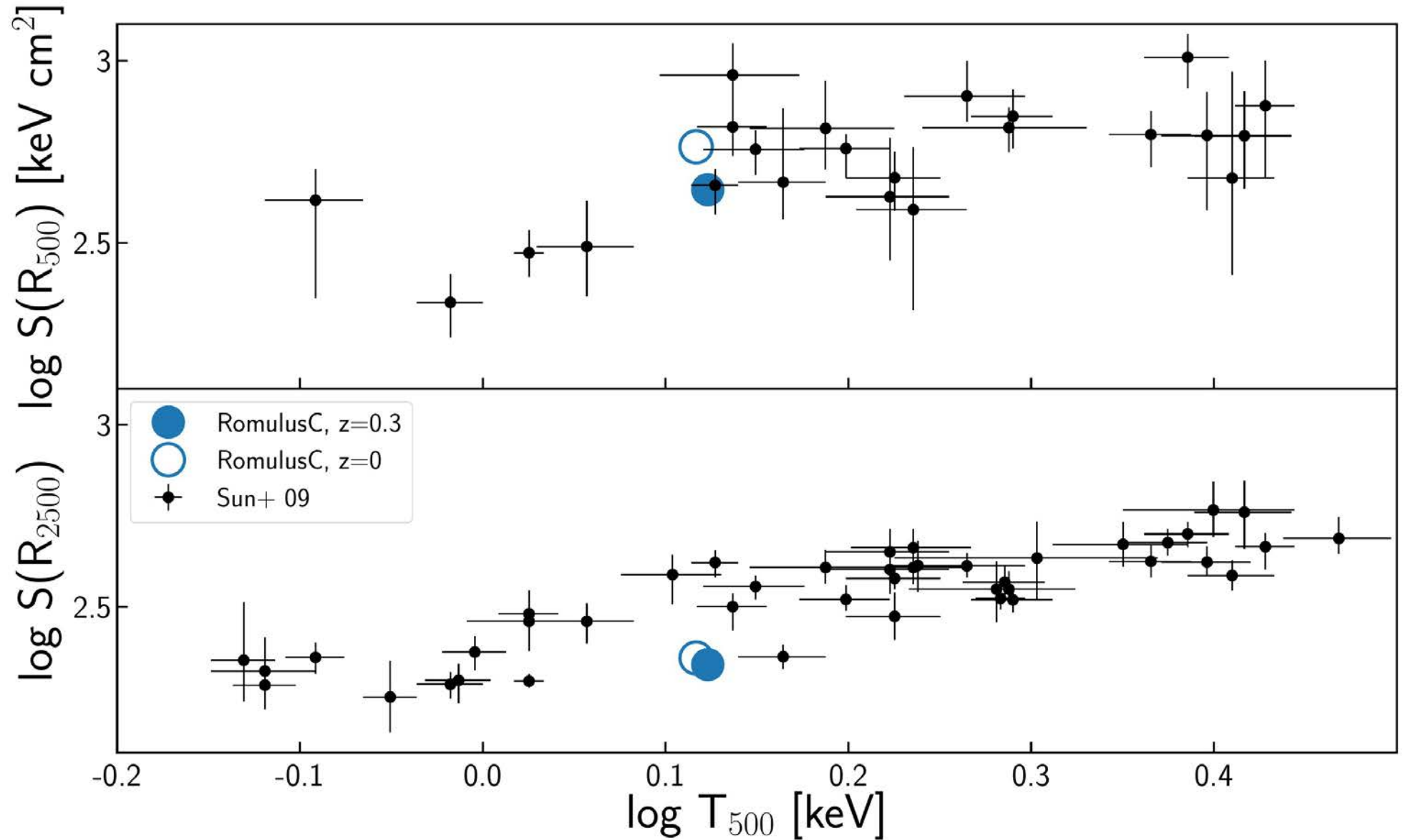


# Quenching with radius





# IntraCluster Medium



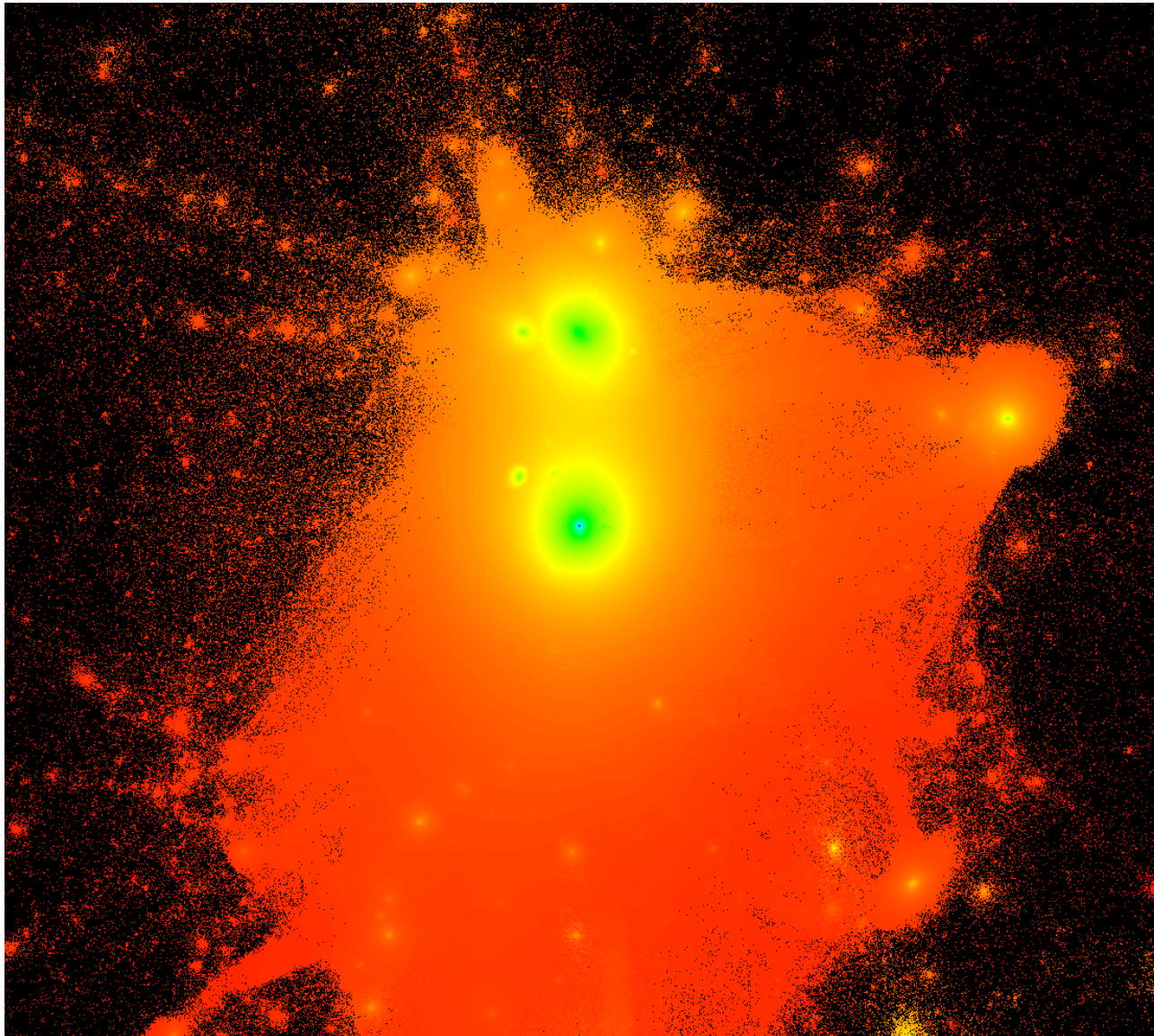
# Take Aways

- Galaxy Clusters are hard:
  - Scale is set by galactic (i.e. star formation) physics
  - Orders of magnitude larger than galaxies
  - Computational effort is spatially concentrated.
  - (Probably should include MHD/cosmic rays: see **Iryna Butsky's** talk)
- But now clusters are doable
  - Capability machines
  - Advanced load balancing techniques
  - First “holistic” simulations of galaxy clusters

# Acknowledgments

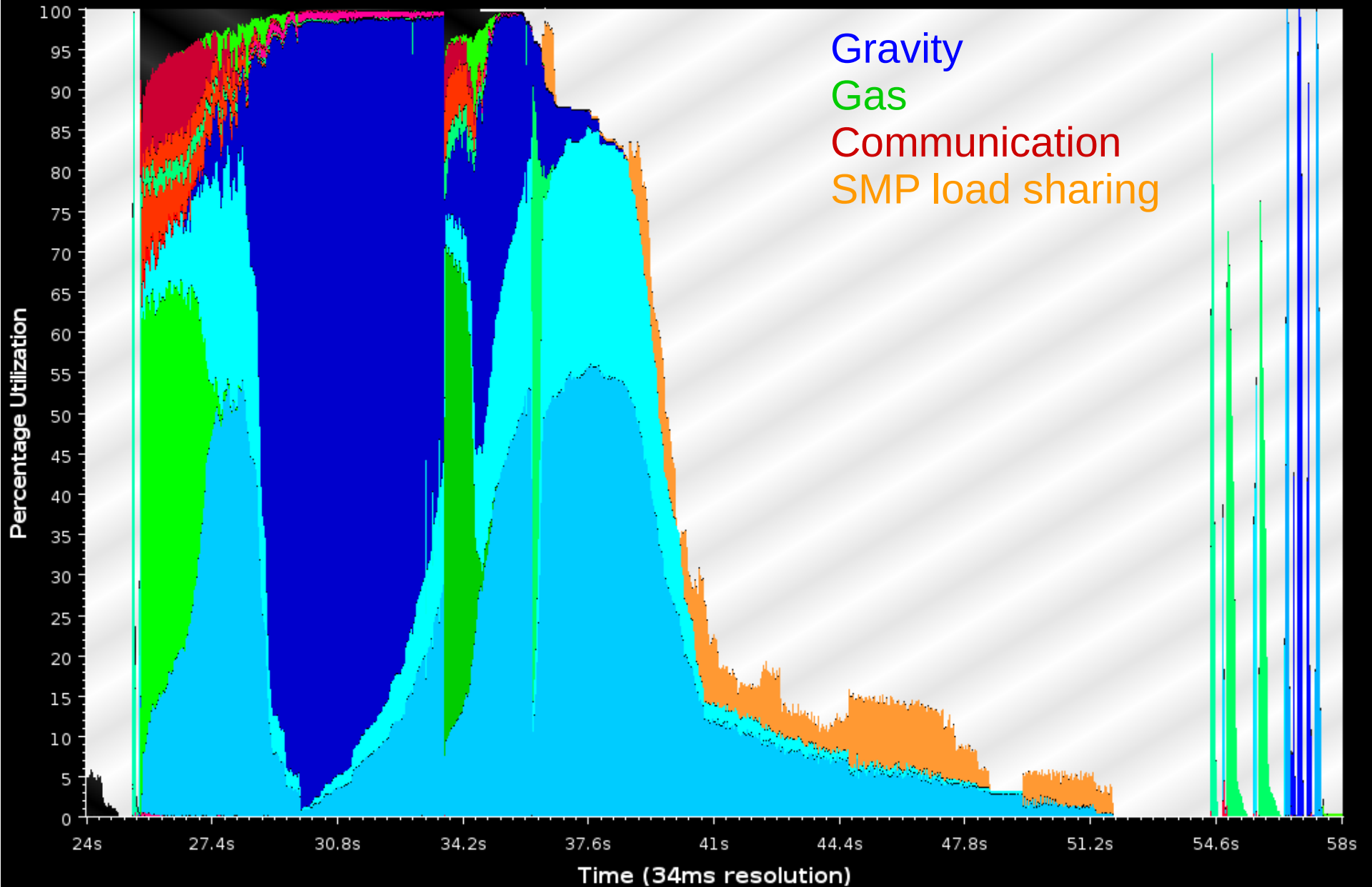
- NSF ITR
- NSF Astronomy
- NSF SSI
- NSF XSEDE program for computing
- BlueWaters Petascale Computing
- Blue Waters PAID Program
- NASA HST
- NASA Advanced Supercomputing

# Zoomed Cluster simulation



# LB by particle count

## Time Profile

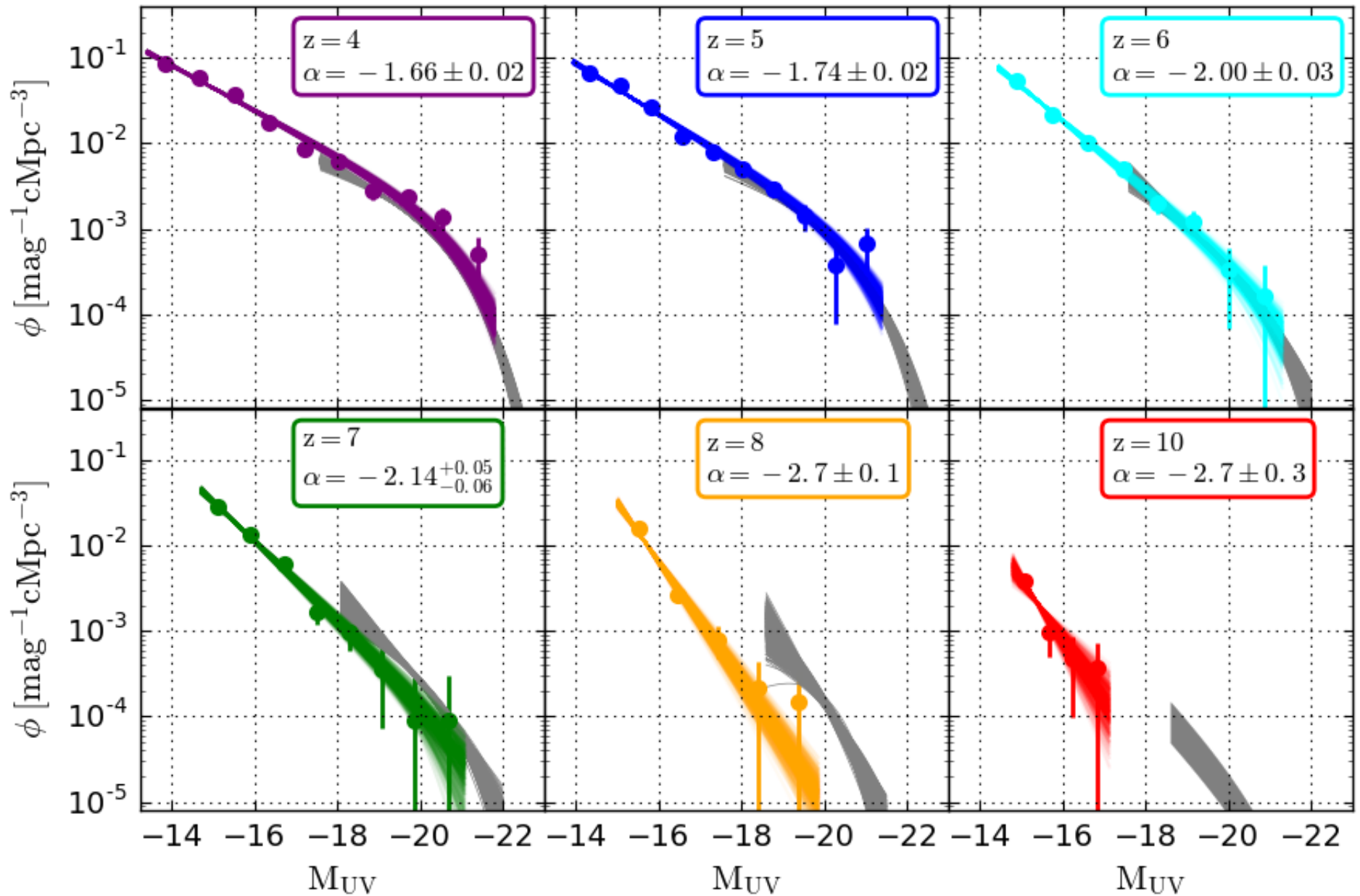


29.4 seconds

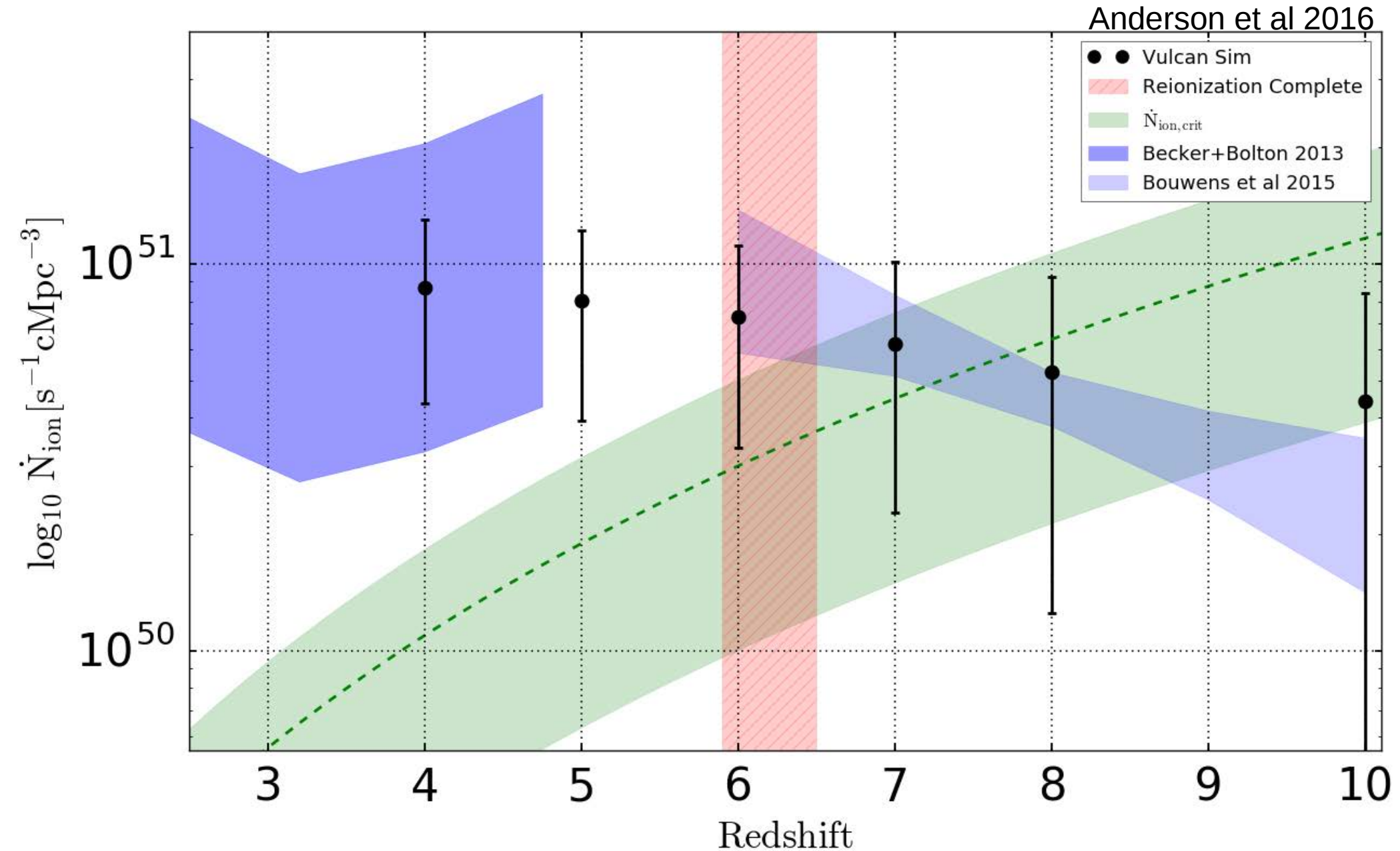


# Luminosity Function

Anderson, et al 2016



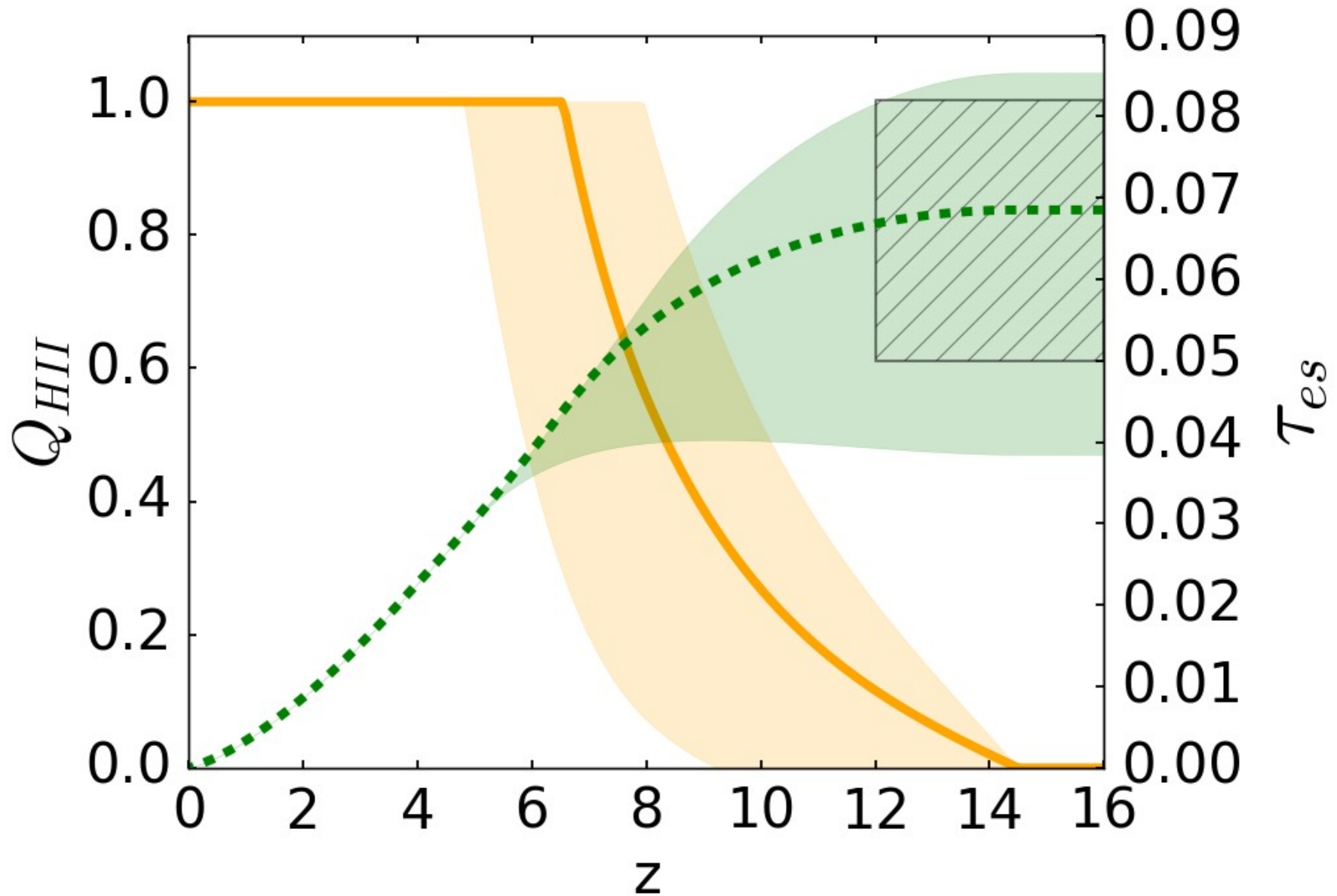
# Faint galaxies reionize the Universe





# Faint galaxies reionize the Universe

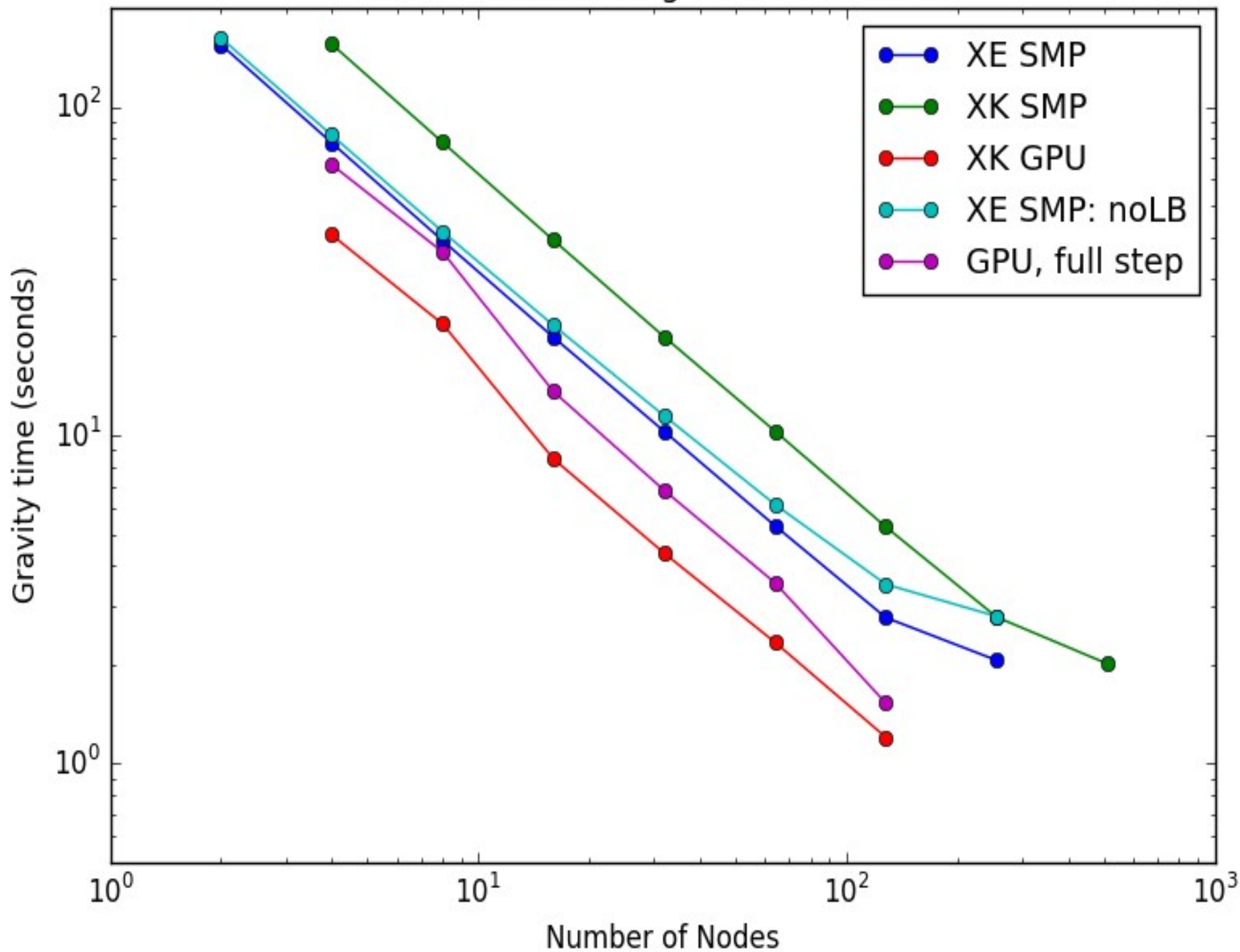
Anderson et al 2016



# PAID: ChaNGa GPU Scaling

- ChaNGa has a preliminary GPU implementation
- Goals of PAID:
  - Tesla → Kepler optimization
  - SMP optimization
  - Multistep Optimization
  - Load balancing
- Personnel:
  - Simon Garcia de Gonzalo, NCSA
  - Michael Robson, Harshitha Menon, PPL UIUC
  - Peng Wang, Tom Gibbs (NVIDIA)

Blue Waters timing for 50M zoom-in



# PAID GPU Progress

- 2X speed up of main gravity kernel; 1.4X speedup of 2<sup>nd</sup> gravity kernel
  - Interwarp communication
  - Caching of multipole data
  - Higher GPU occupancy
  - Overall speedup of 60%
- SMP queuing of GPU requests
  - Reduced memory use, allowing more host threads
  - GPU memory management still an issue

# Broader Impacts: Pre-Majors and Supercomputing

- UW Pre-Major in Astronomy Program:
  - Engage underrepresented populations in research early
  - Establish a cohort
  - Plug major leak in the STEM education pipeline
- Simulation data analysis is ideal for this research
  - Science and images are compelling
  - Similarity to Astronomical data reduction

# Simulated Galaxy Catalogs

Zoe Deford  
Joshua Smith  
(UW Freshman)

