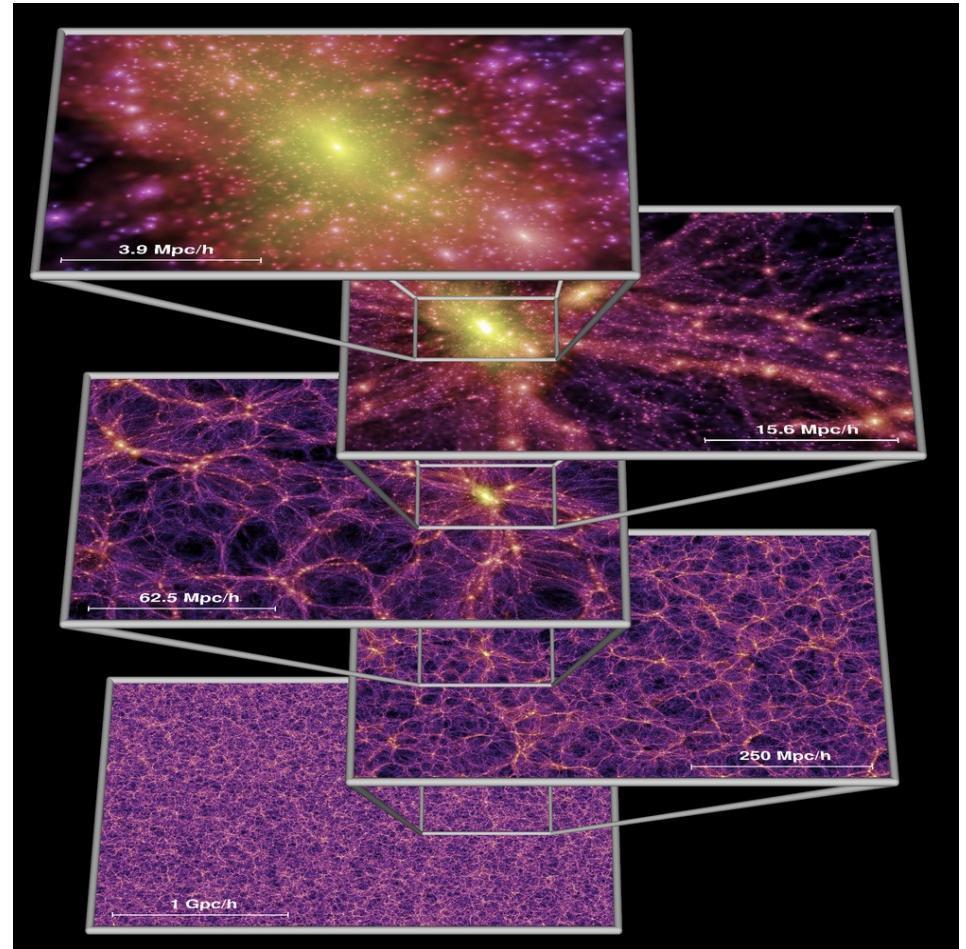


# Supercomputer Simulations of the Emergence of Cosmic Structure

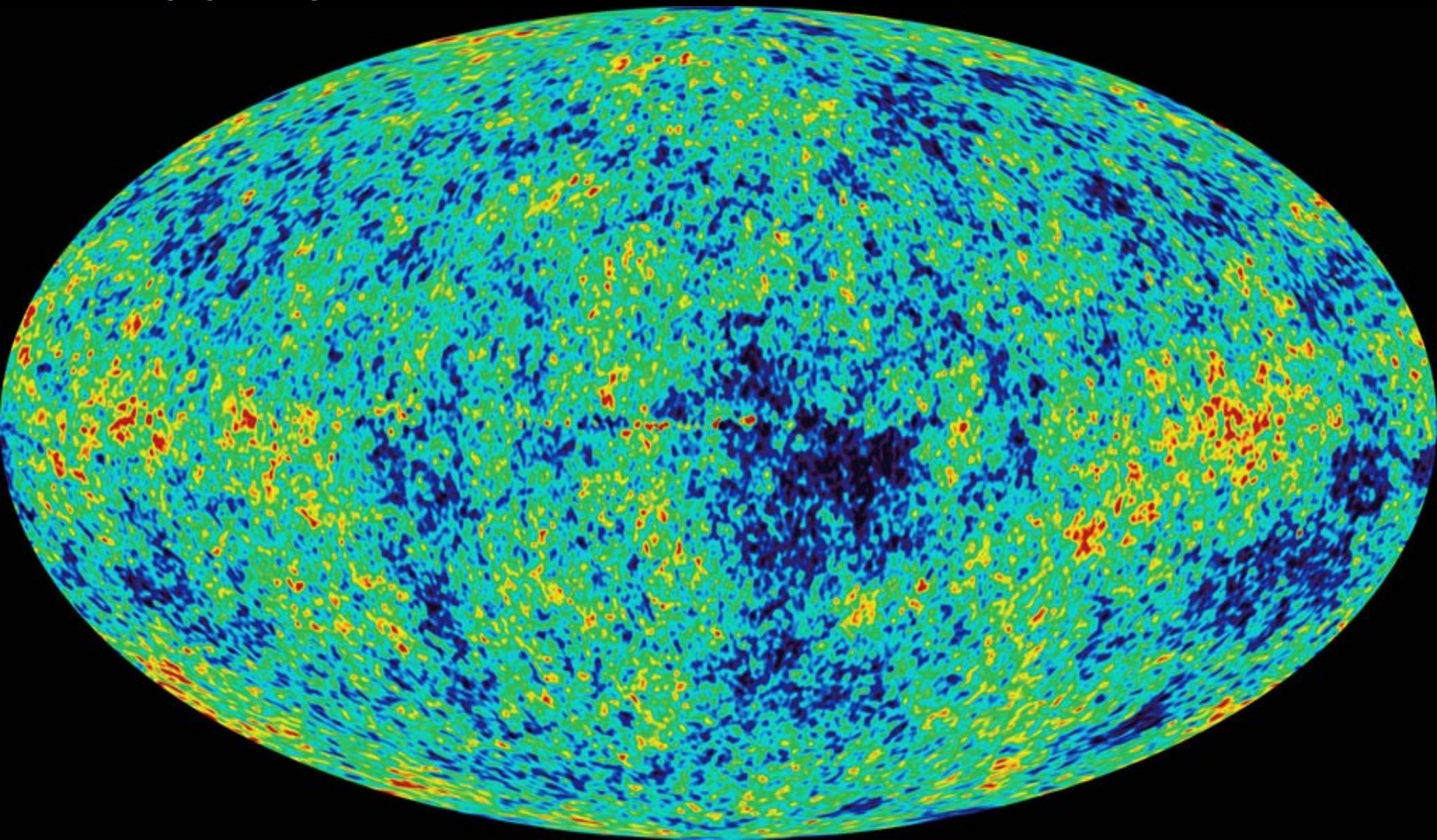
Volker Springel

- ▶ Introduction: The  $\Lambda$ CDM universe, and what we know about it through simulations
- ▶ Towards small scales: High-resolution dark matter simulations of individual halos
- ▶ Towards large volumes: One way to falsify  $\Lambda$ CDM, and a handle on dark energy



The initial conditions for cosmic structure formation are directly observable

### THE MICROWAVE SKY



WMAP Science Team (2003, 2006, 2008, 2010)

The most important cosmological parameters are well constrained

## WMAP-5 CONSTRAINTS, INLCUDING TYPE-IA AND BAO DATA

Minimal, 6-parameter  $\Lambda$ CDM model is a great fit

$$\Omega_c = 0.233 \pm 0.013$$

$$\Omega_b = 0.0462 \pm 0.0015$$

$$\sigma_8 = 0.817 \pm 0.026$$

$$n_s = 0.960^{+0.014}_{-0.013}$$

$$H_0 = 70.1 \pm 1.3 \text{ km s}^{-1} \text{ Mpc}^{-1}$$

$$\tau = 0.084 \pm 0.016$$

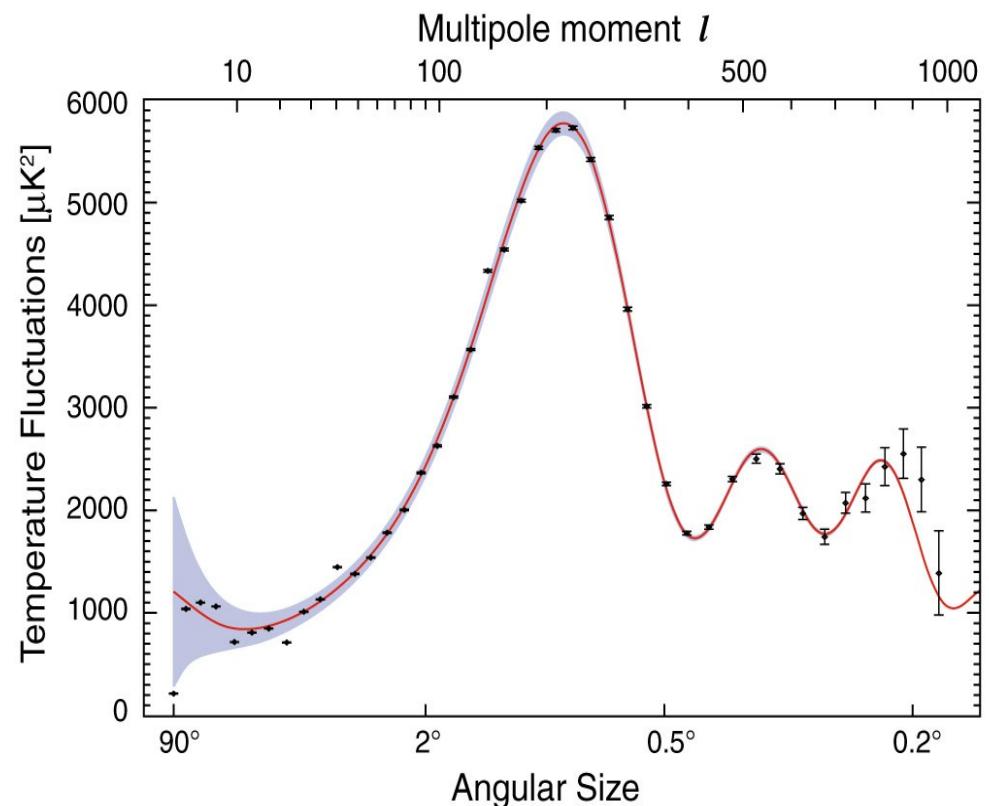
---

$$\Omega_\Lambda = 0.721 \pm 0.015$$

$$t_0 = 13.73 \pm 0.12 \text{ Gyr}$$

$$z_{\text{reion}} = 10.8 \pm 1.4$$

Komatsu et al. (2008)

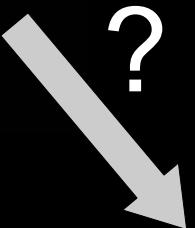
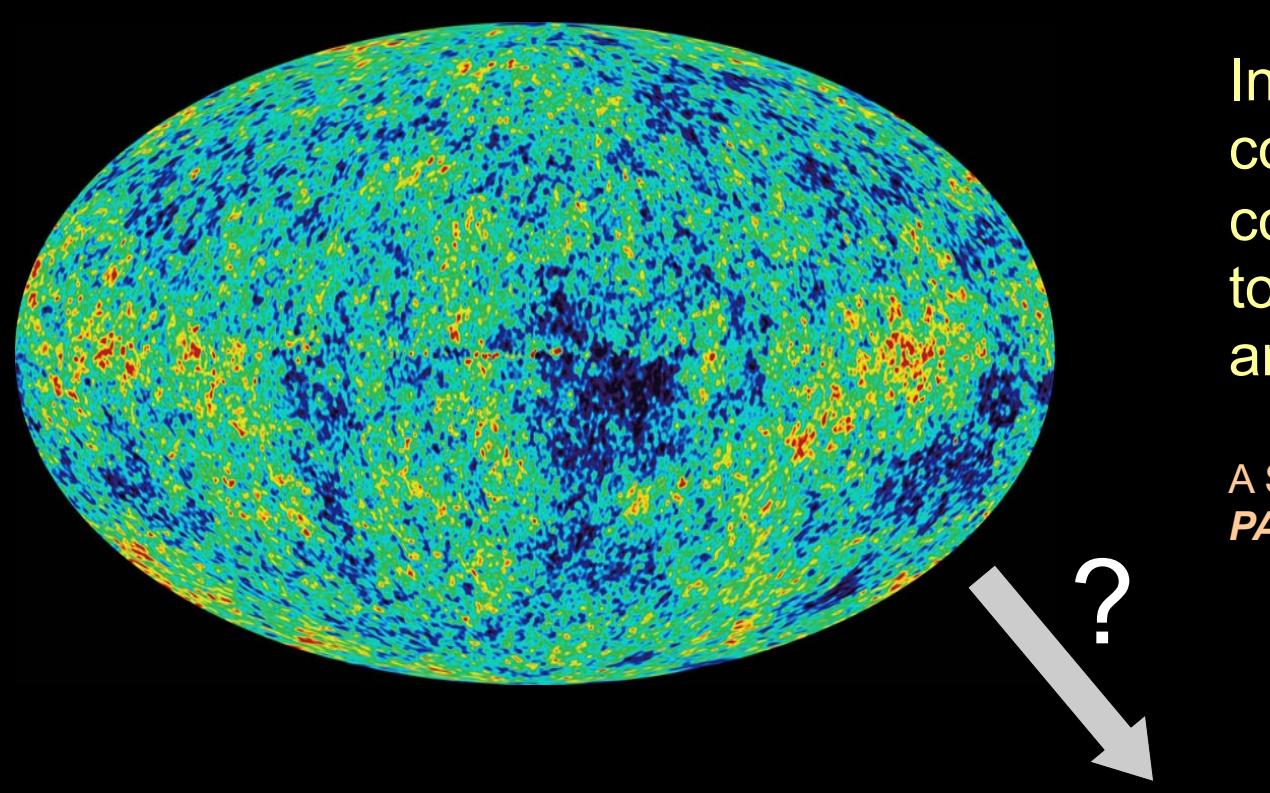


Constraints on dark energy equation of state:

$$-0.11 < 1 + w < 0.14$$

(95% CF,  
assuming a  
constant  $w$ )

$$-0.0175 < \Omega_k < 0.0085$$



In principle, based on the initial conditions of the  $\Lambda$ CDM cosmology one should be able to *predict* the variety in shapes and sizes of observed galaxies

A SIMULATION PROBLEM  
**PAR EXCELLENCE**



M87 – Anglo-Australian Observatory



NGC1332 – ESO, VLT



Currently the fastest supercomputers carry out about ~1 Petaflop, which are one thousand billion floating point operations per second

# The basic dynamics of structure formation in the dark matter

## BASIC EQUATIONS AND THEIR DISCRETIZATION

### Gravitation

General theory of relativity  
(Newtonian approximation in  
an expanding space-time )



Dark matter is collisionless



Monte-Carlo integration as  
**N-body System**



3N **coupled**, non-linear differential  
equations of second order

### Friedmann-Lemaitre model

$$H(a) = H_0 \sqrt{a^{-3}\Omega_0 + a^{-2}(1 - \Omega_0 - \Omega_\Lambda) + \Omega_\Lambda}$$

### Collisionless Boltzmann equation with self-gravity

$$\frac{df}{dt} \equiv \frac{\partial f}{\partial t} + \mathbf{v} \frac{\partial f}{\partial \mathbf{x}} - \frac{\partial \Phi}{\partial \mathbf{r}} \frac{\partial f}{\partial \mathbf{v}} = 0$$

$$\nabla^2 \Phi(\mathbf{r}, t) = 4\pi G \int f(\mathbf{r}, \mathbf{v}, t) d\mathbf{v}$$

### Hamiltonian dynamics in expanding space-time

$$H = \sum_i \frac{\mathbf{p}_i^2}{2 m_i a(t)^2} + \frac{1}{2} \sum_{ij} \frac{m_i m_j \varphi(\mathbf{x}_i - \mathbf{x}_j)}{a(t)}$$
$$\nabla^2 \varphi(\mathbf{x}) = 4\pi G \left[ -\frac{1}{L^3} + \sum_n \tilde{\delta}(\mathbf{x} - \mathbf{n}L) \right]$$



### Problems:

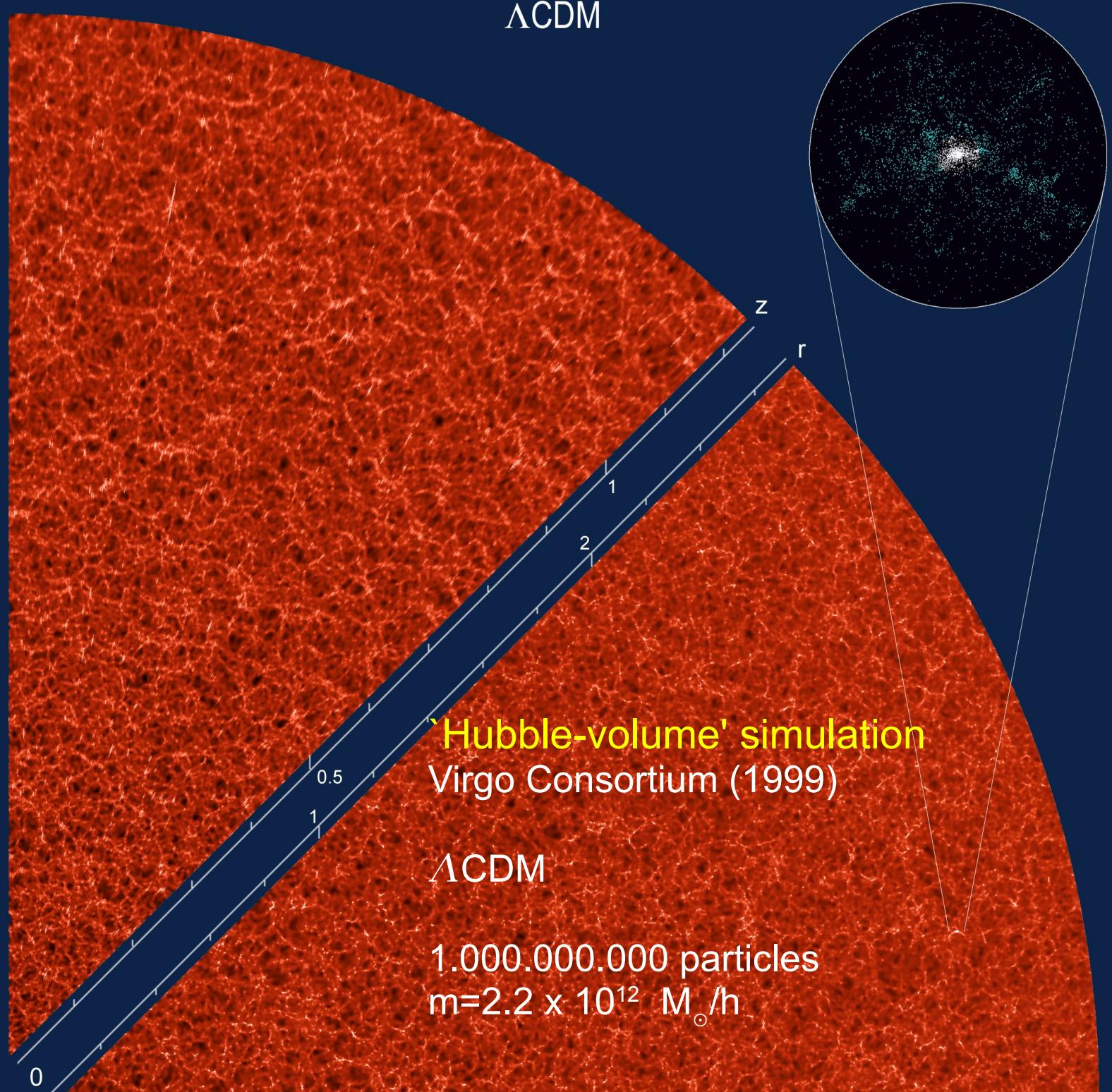
N ist very large  
All equations are coupled  
with each other

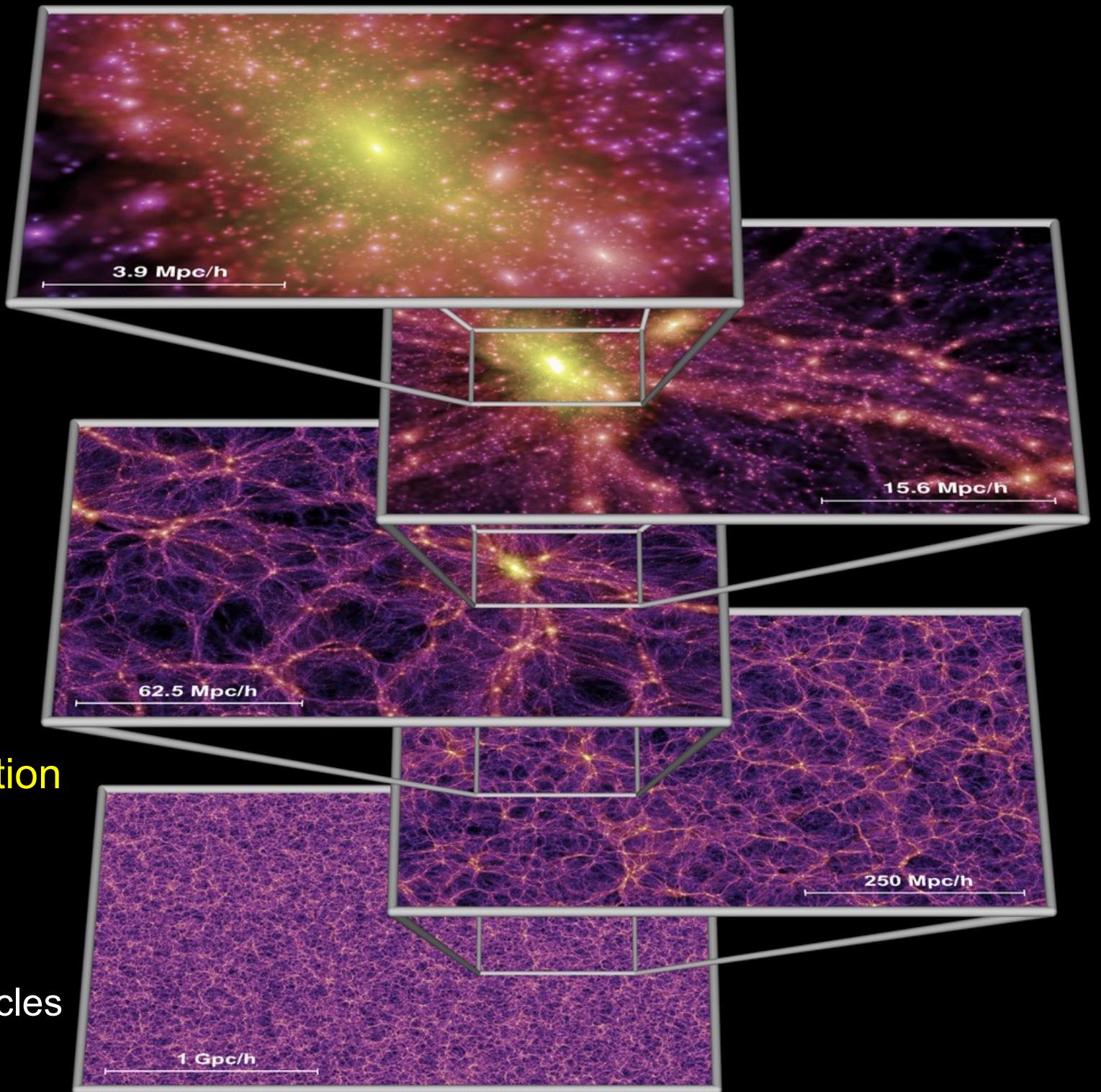
# Large-scale structure

The largest N-body simulations cover a sizable fraction of the observable universe

# DARK MATTER CLUSTERING ALONG THE PAST LIGHT-CONE OF THE HUBBLE SIMULATION

$\Lambda$ CDM





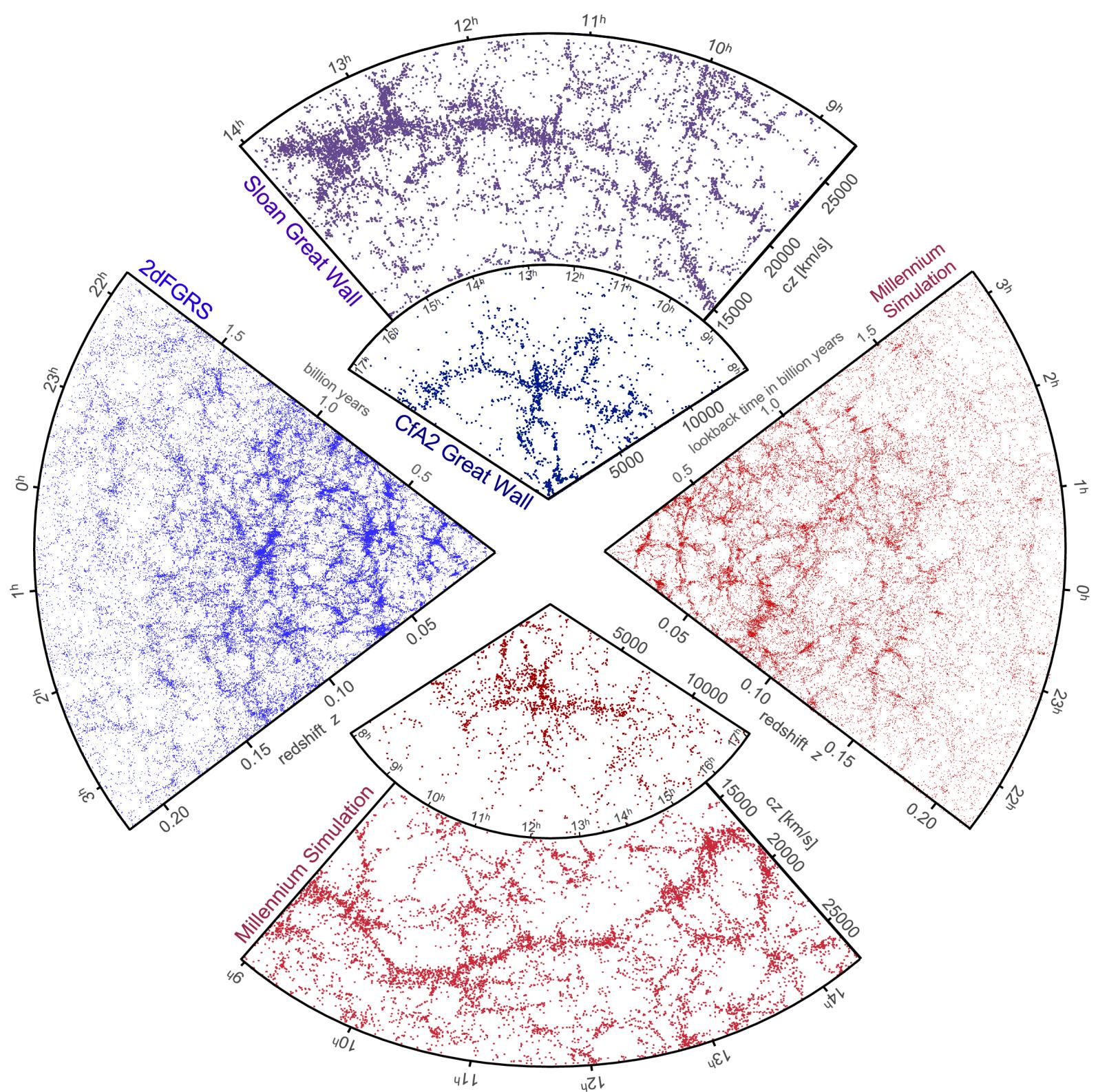
'Millennium' simulation  
Springel et al. (2005)

$\Lambda$ CDM

10.077.696.000 particles  
 $m=8.6 \times 10^8 M_{\odot}/h$

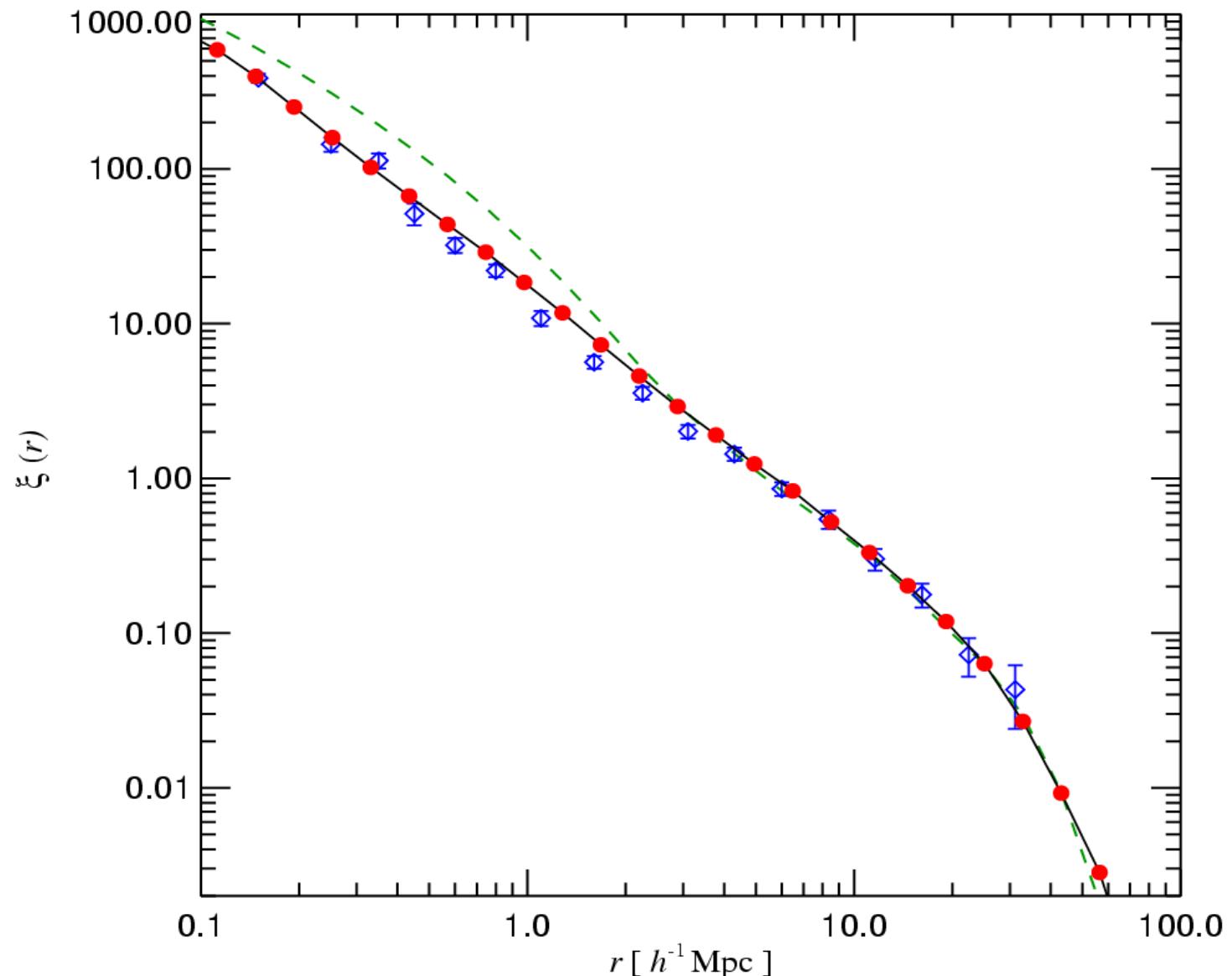
# Simulated and observed large-scale structure in the galaxy distribution

MOCK PIE  
DIAGRAMS  
COMPARED TO  
SDSS, 2DFGRS,  
AND CfA-2



The two-point correlation function of galaxies in the Millennium run is a very good power law

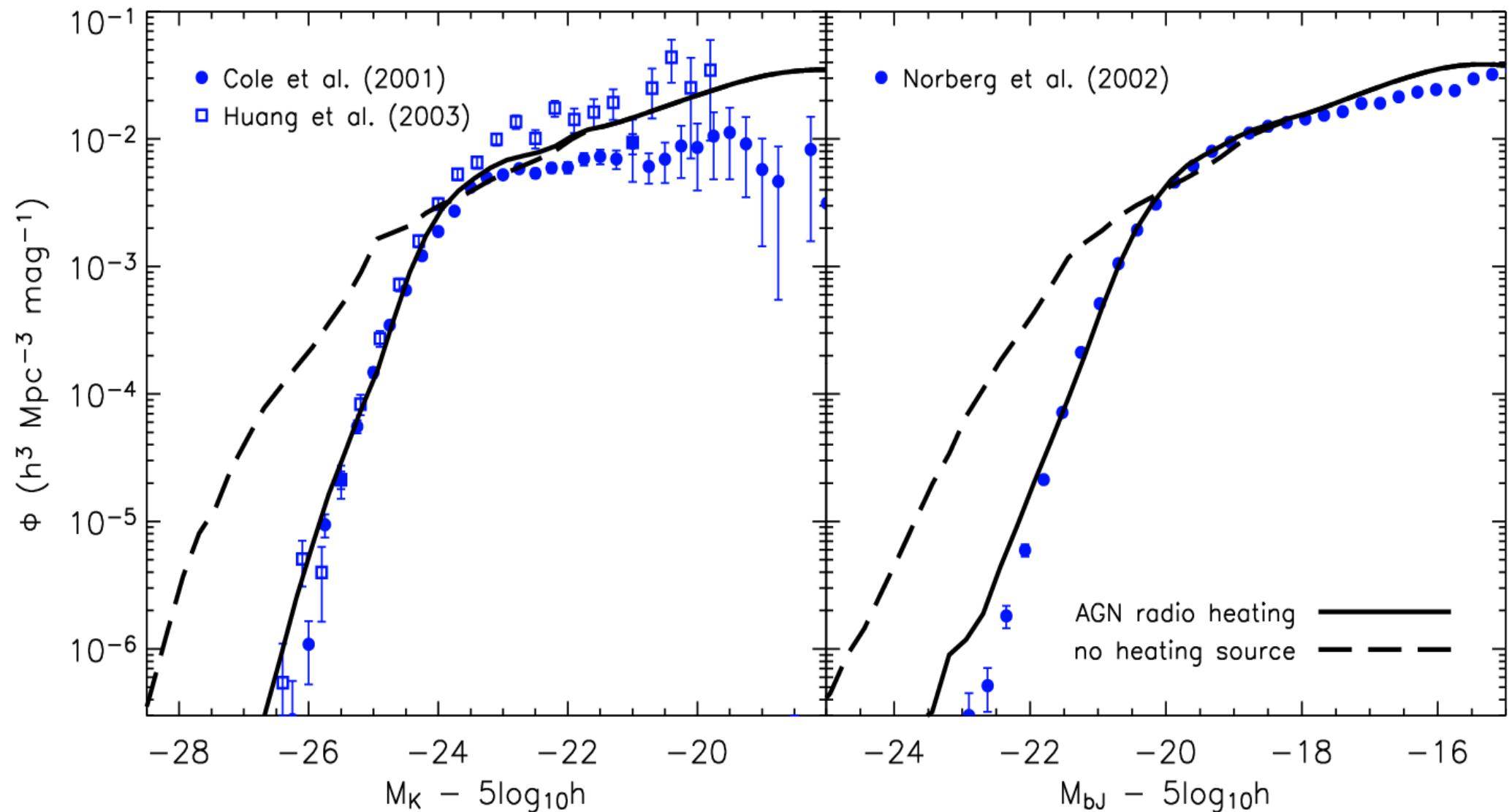
### GALAXY TWO-POINT FUNCTION COMPARED WITH 2dFGRS

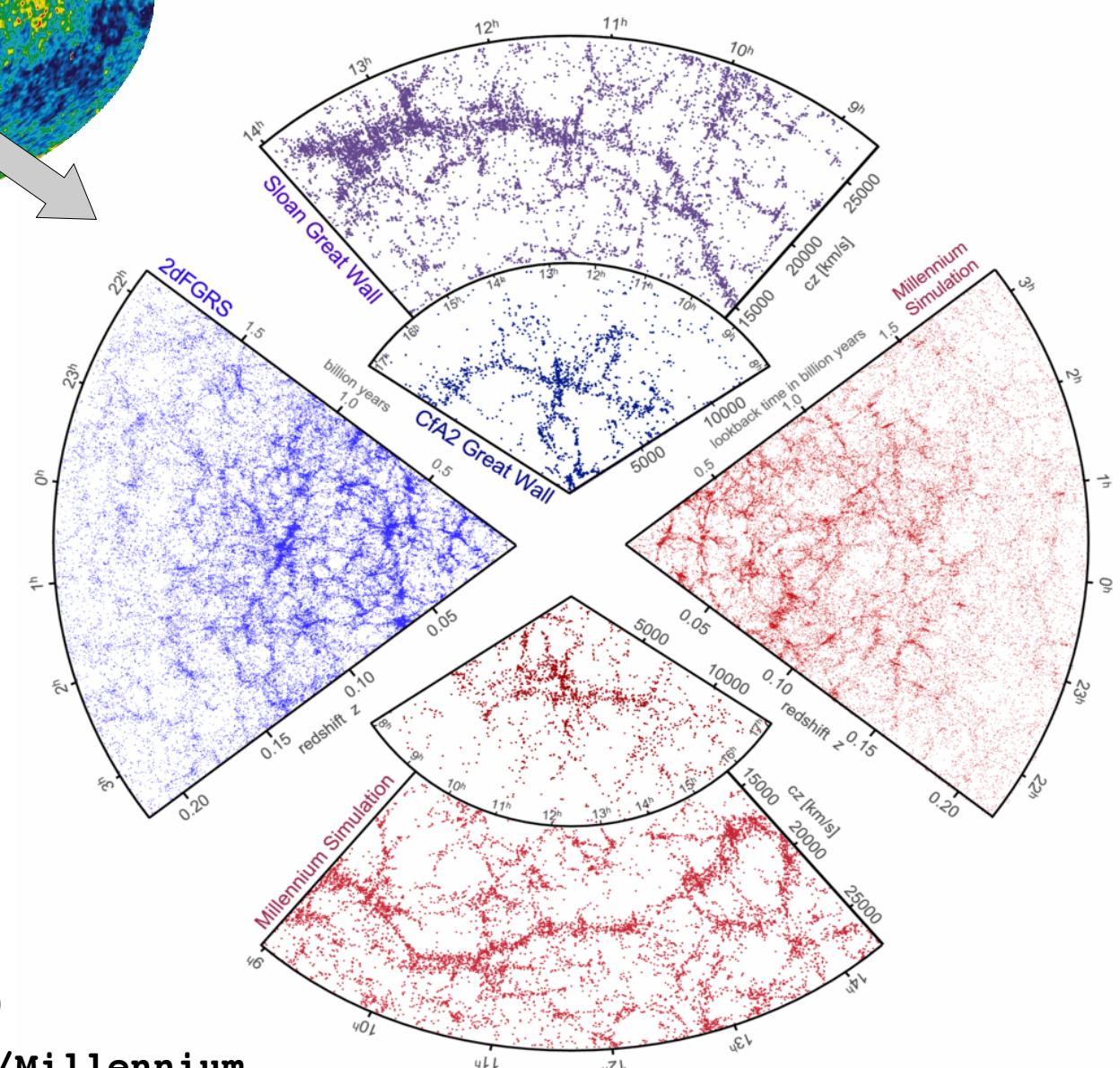
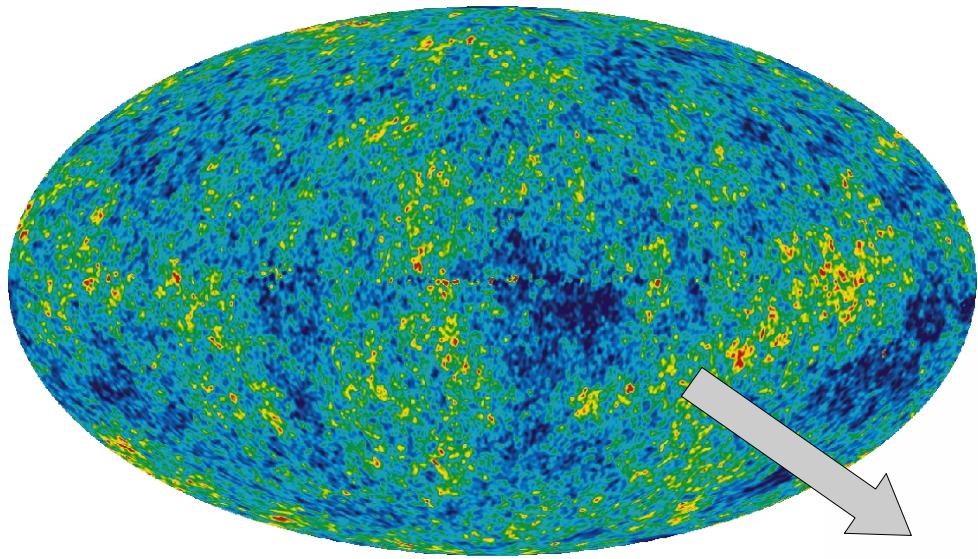


The inclusion of AGN feedback allows the semi-analytic model to reproduce a multitude of observational data

### K-BAND AND Bj-BAND LUMINOSITY FUNCTIONS

Croton et al. (2006)





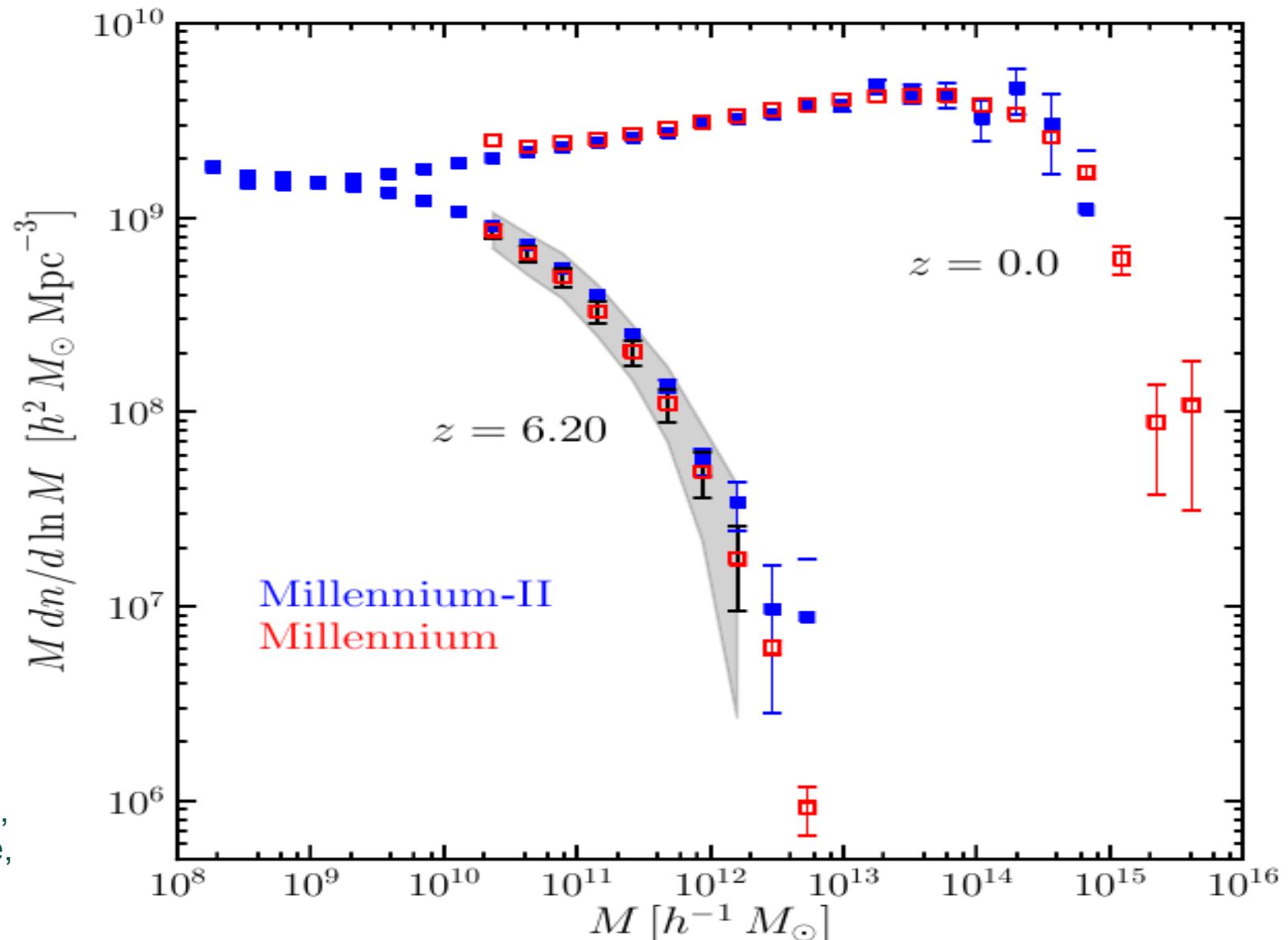
public data release of  
the Millennium galaxies  
on Aug 1<sup>st</sup> 2006

(~380 papers that used the data thus far)

<http://www.mpa-garching.mpg.de/Millennium>

Simulations provide accurate measurements for halo abundance as a function of time

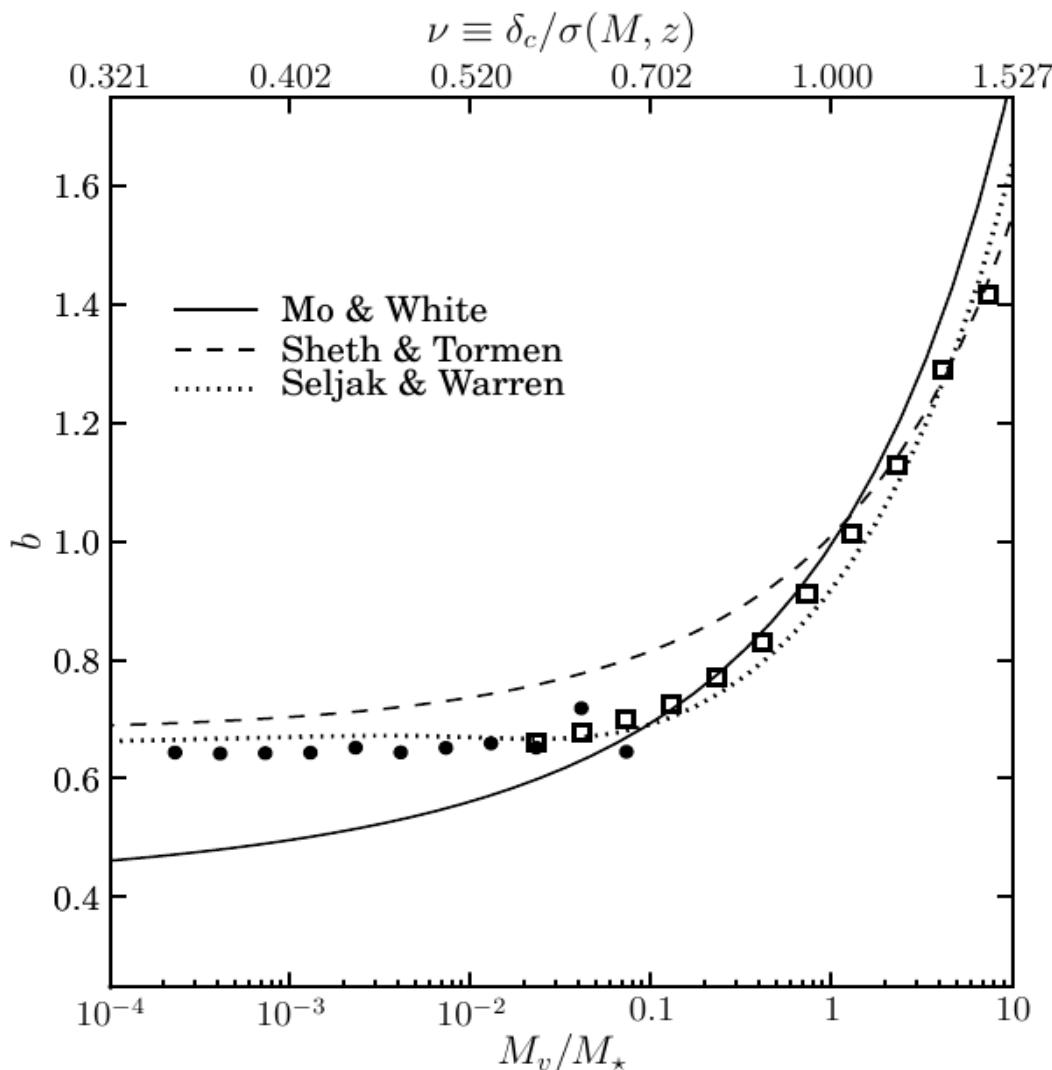
## CONVERGENCE RESULTS FOR HALO ABUNDANCE



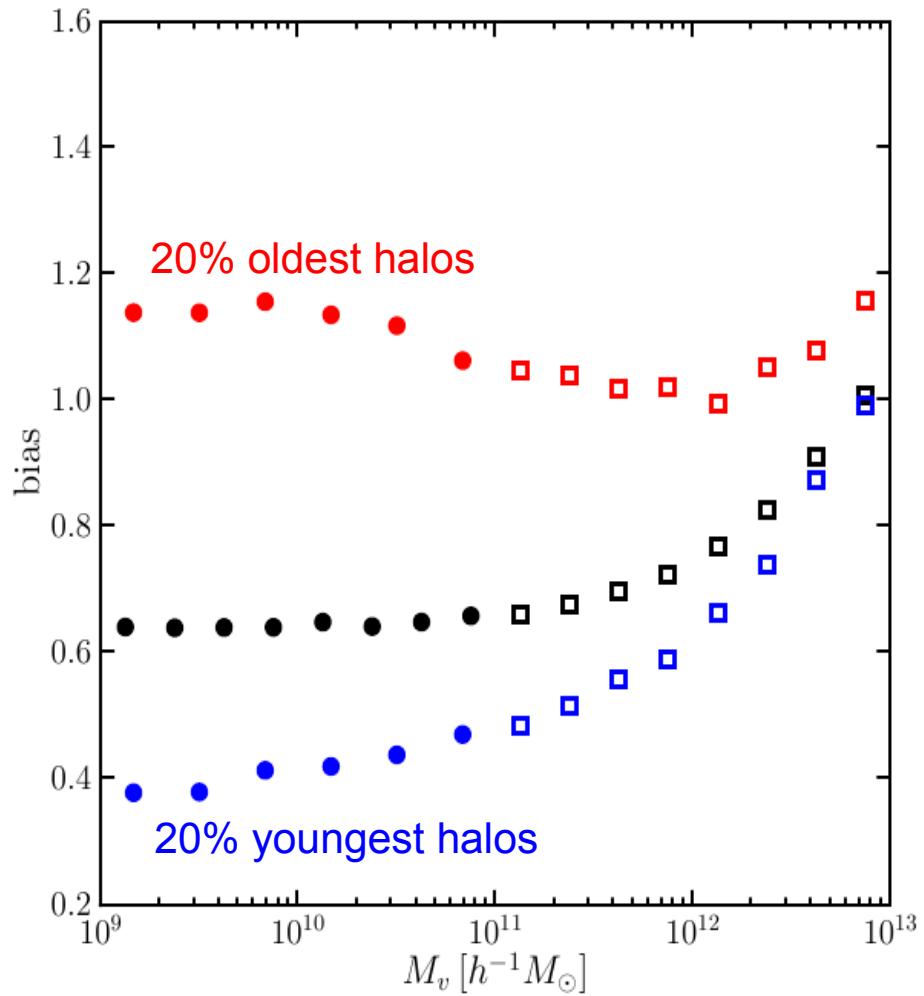
Boylan-Kolchin,  
Springel, White,  
et al. (2009)

# Simulations provide accurate measurements for halo bias

## BIAS AS A FUNCTION OF MASS AND FORMATION TIME



Gao et al. (2005)



→ “**Assembly bias**”: This dependence is inconsistent both with excursion set theory and HOD

# Small-scale structure

# Millennium-II Simulation

BETTER MASS  
RESOLUTION BY A  
FACTOR OF 125  
COMPARED TO THE  
MILLENNIUM  
SIMULATION

$10^{10}$  particles

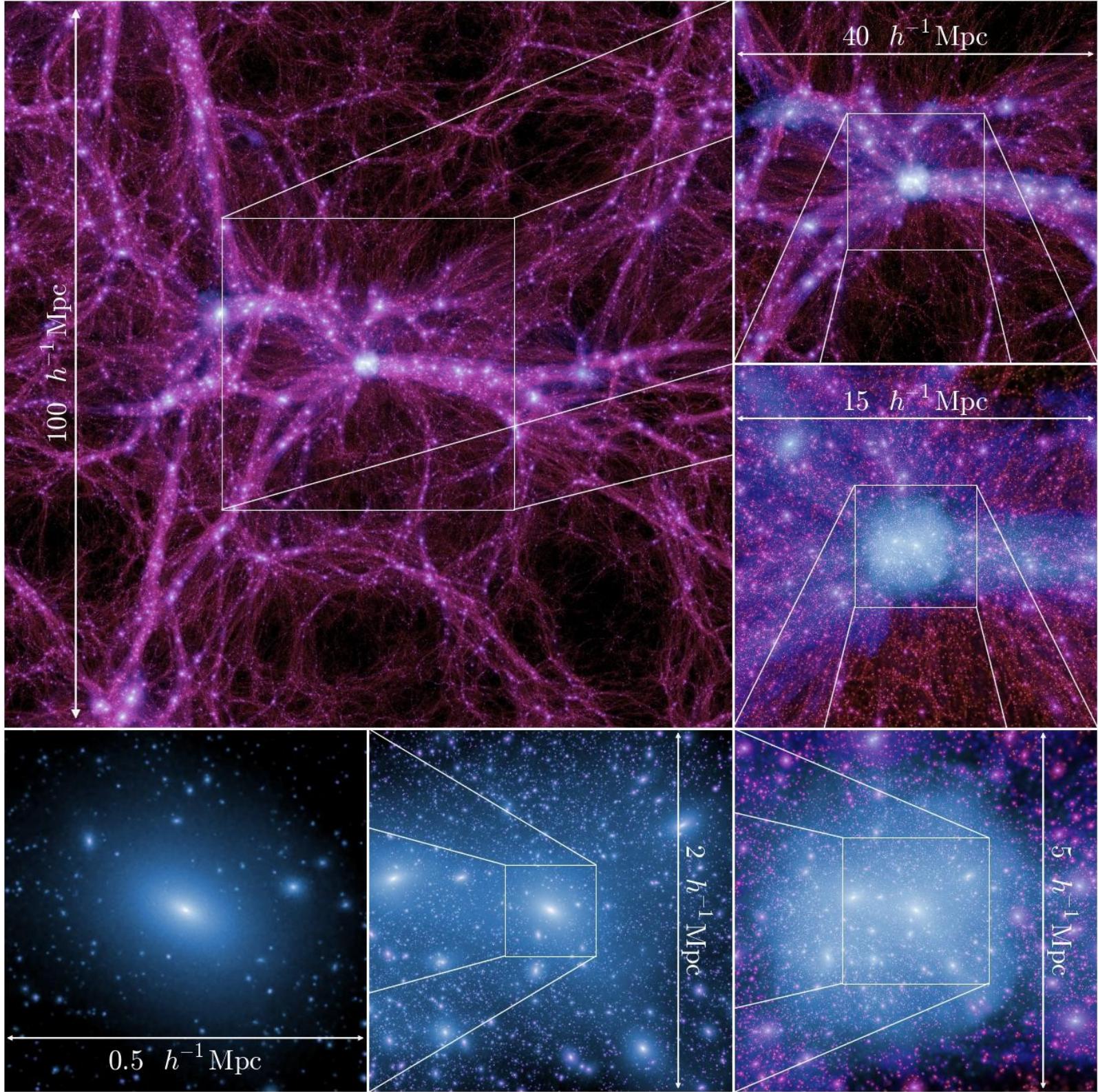
100 Mpc/h box

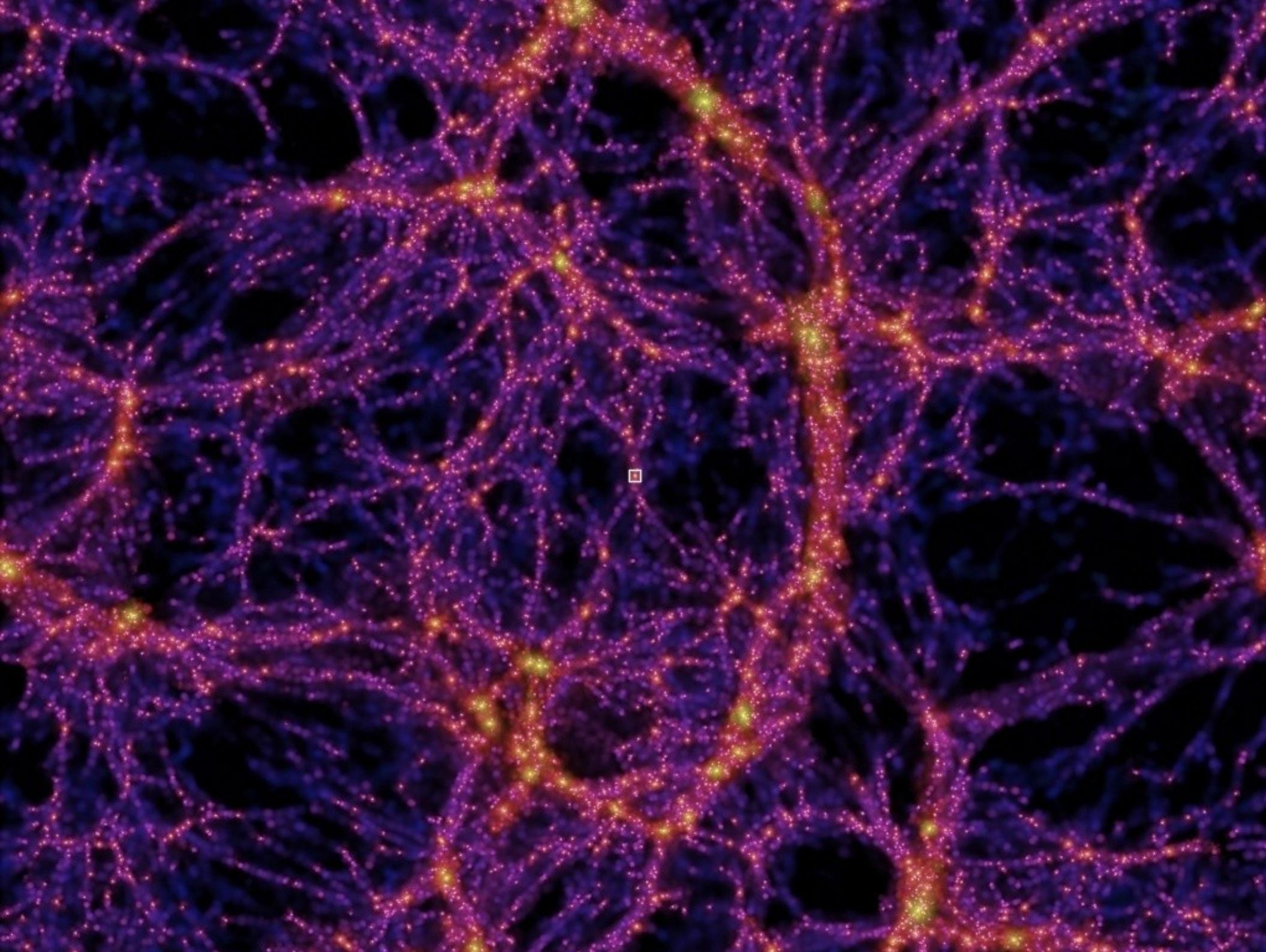
$m_p = 8.6 \times 10^6 \text{ Msun}/h$

$\epsilon = 1 \text{ kpc}/h$

> 60% of particles in  
groups at  $z=0$

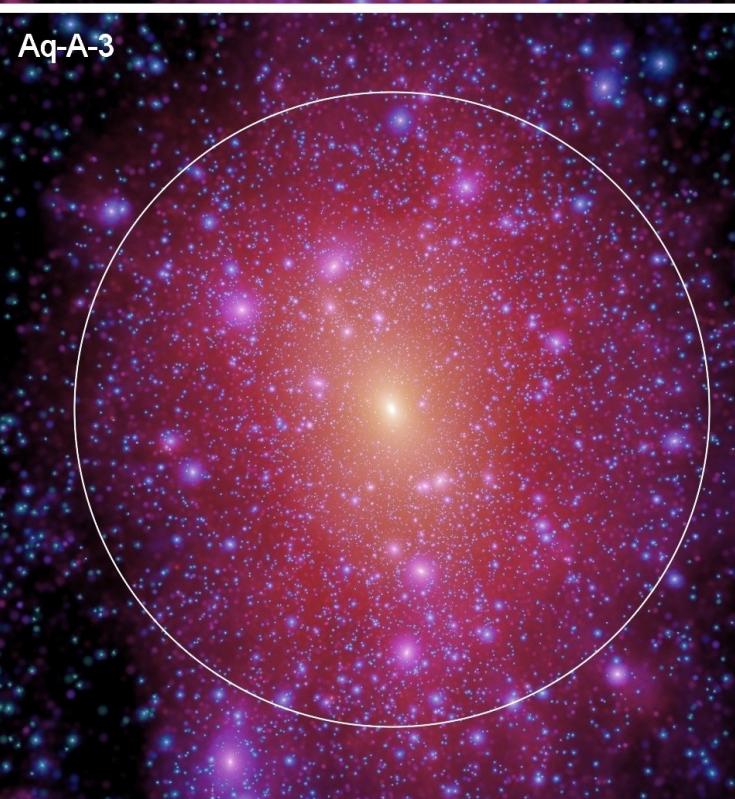
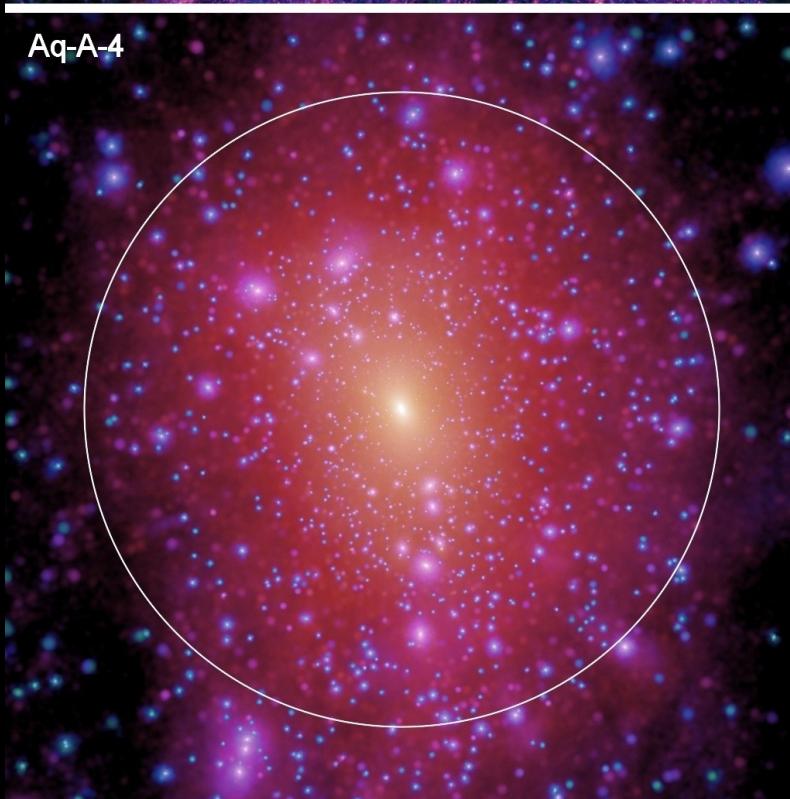
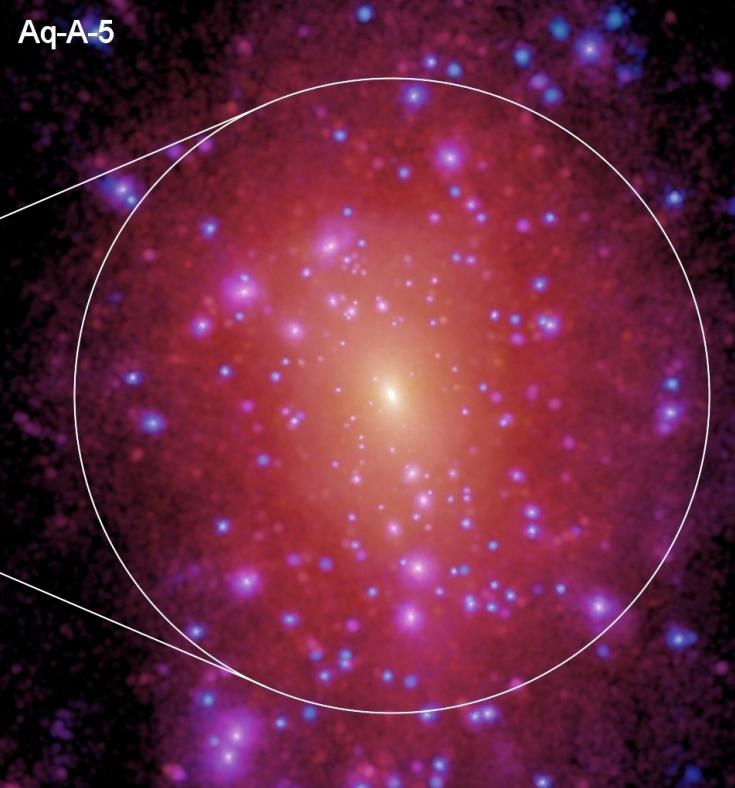
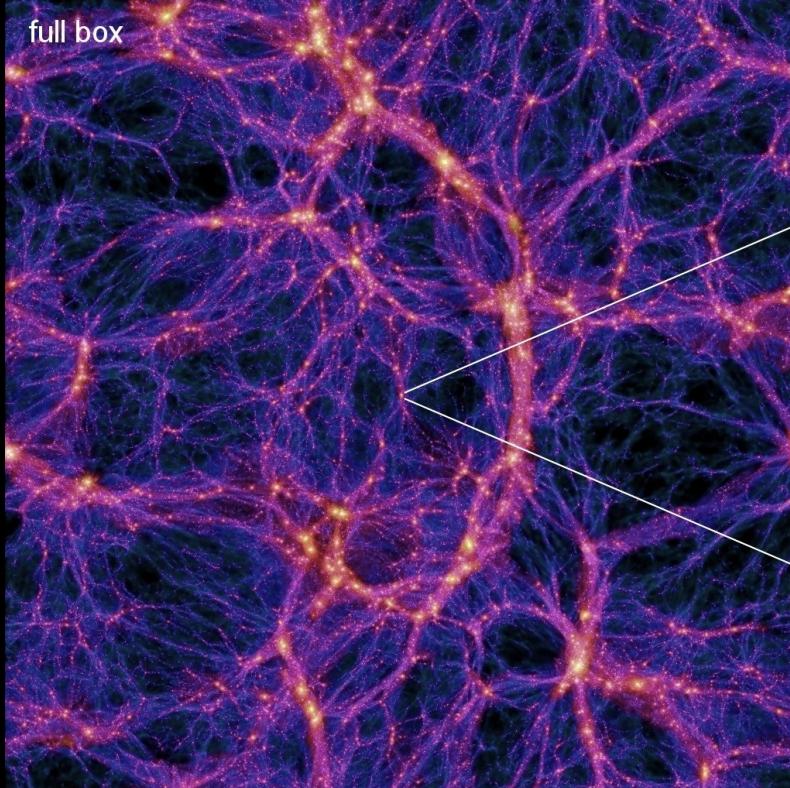
Boylan-Kolchin,  
Springel, White,  
et al. (2009)





Zooming in on  
dark matter halos  
reveals a huge  
abundance of  
dark matter  
substructure

DARK MATTER  
DISTRIBUTION IN A  
MILKY WAY SIZED  
HALO AT DIFFERENT  
RESOLUTION



*The movie...*

The Aquarius project varies the resolution systematically and studies different halos in order to assess **convergence** and **cosmic variance**

## NUMERICAL PARAMETERS OF AQUARIUS HALO A

Springel et al. (2008)

Numerical resolution	Particle number in halo ( $N_{50}$ )	# of substructures	mass resolution
Aq-A-5	808,479	299	$3.14 \times 10^6 M_{\odot}$
Aq-A-4	6,424,399	1,960	$3.92 \times 10^5 M_{\odot}$
Aq-A-3	51,391,468	13,854	$4.91 \times 10^4 M_{\odot}$
Aq-A-2	184,243,536	45,024	$1.37 \times 10^4 M_{\odot}$
Aq-A-1	1,473,568,512	297,791	$1.71 \times 10^3 M_{\odot}$ (20 pc softening)

$N_{\text{tot}} = 4,400,000,000$

Diemand et al. (2007, 2008)

Via Lactea I simulation	84,700,000	$\sim 10,000$	$2.18 \times 10^4 M_{\odot}$
Via Lactea II simulation	470,000,000	$\sim 50,000$	$4.10 \times 10^3 M_{\odot}$

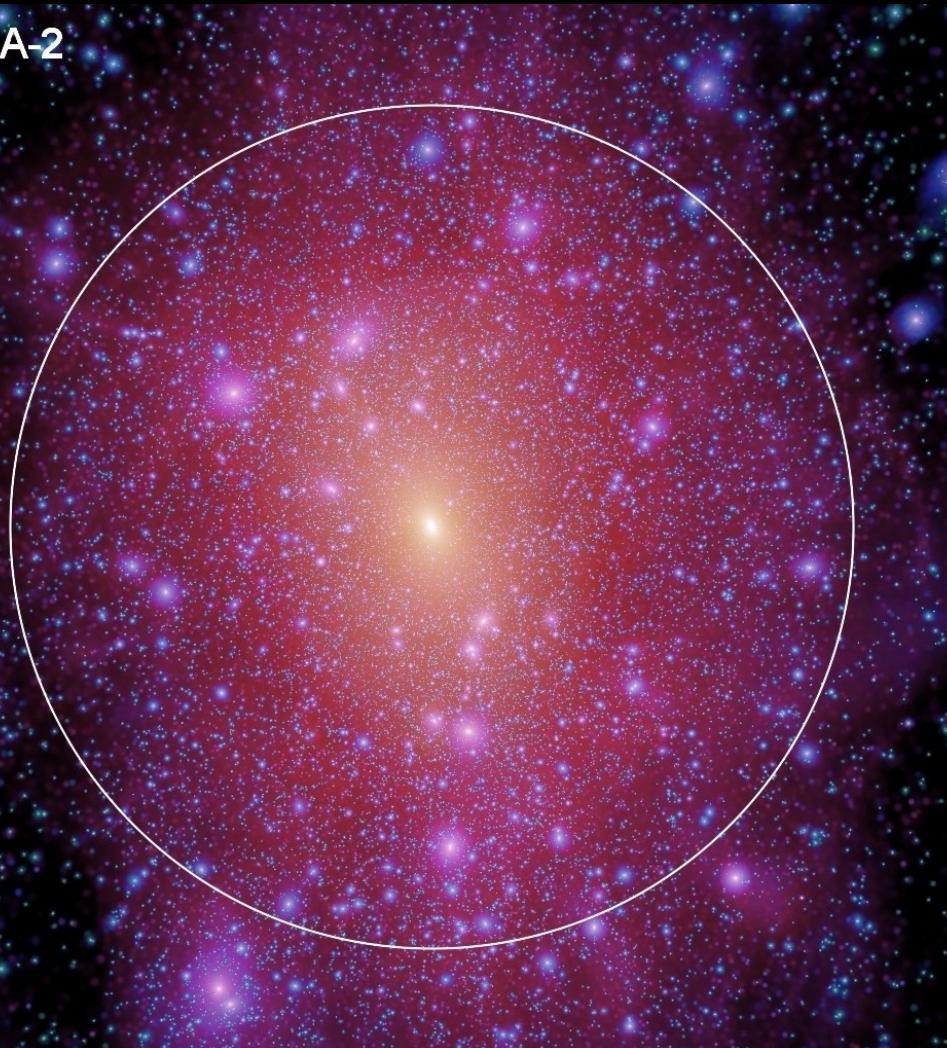
Stadel et al. (2009)

GHALO simulation	1,243,000,000	$1.00 \times 10^3 M_{\odot}$
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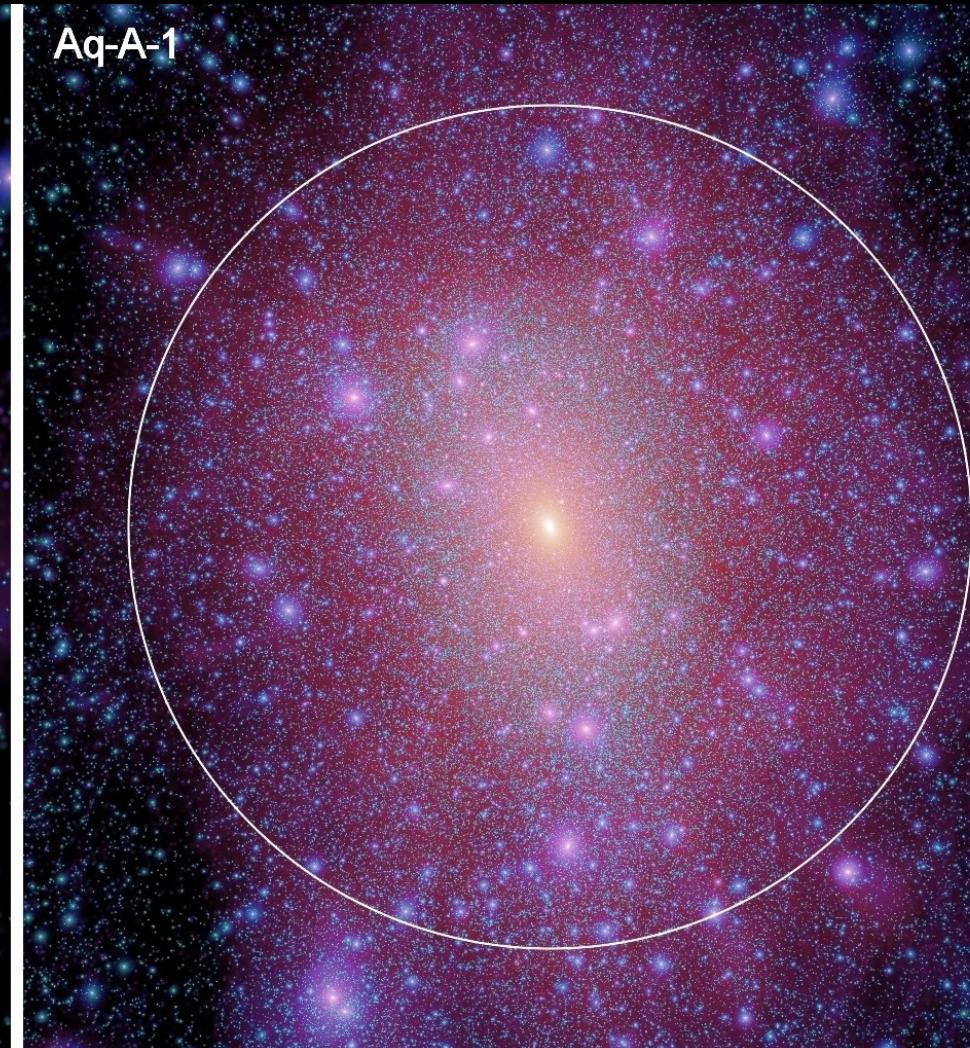
Zooming in on dark matter halos reveals a huge abundance of dark matter substructure

DARK MATTER IN A MILKY WAY SIZED HALO AT ULTRA-HIGH RESOLUTION

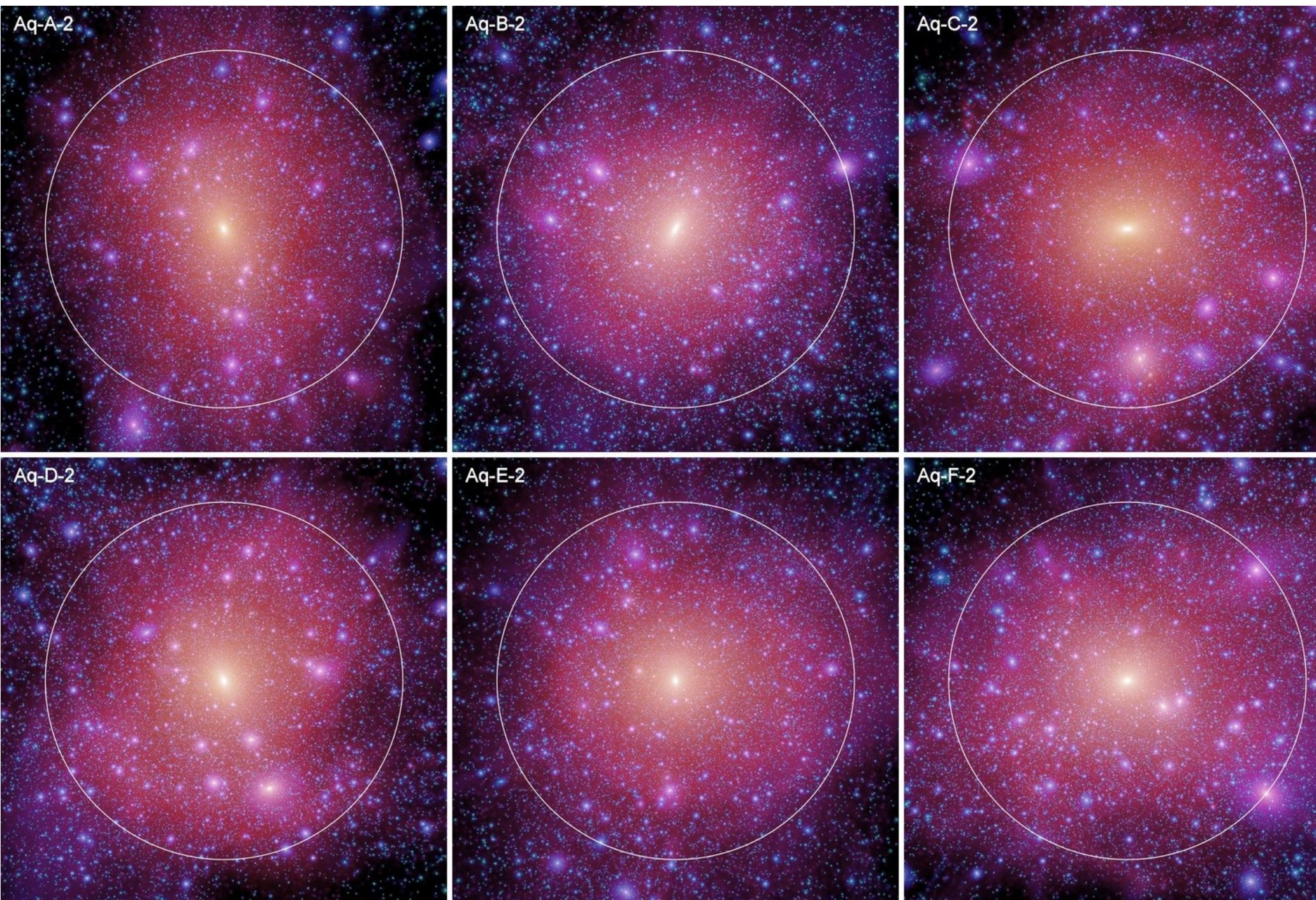
Aq-A-2



Aq-A-1



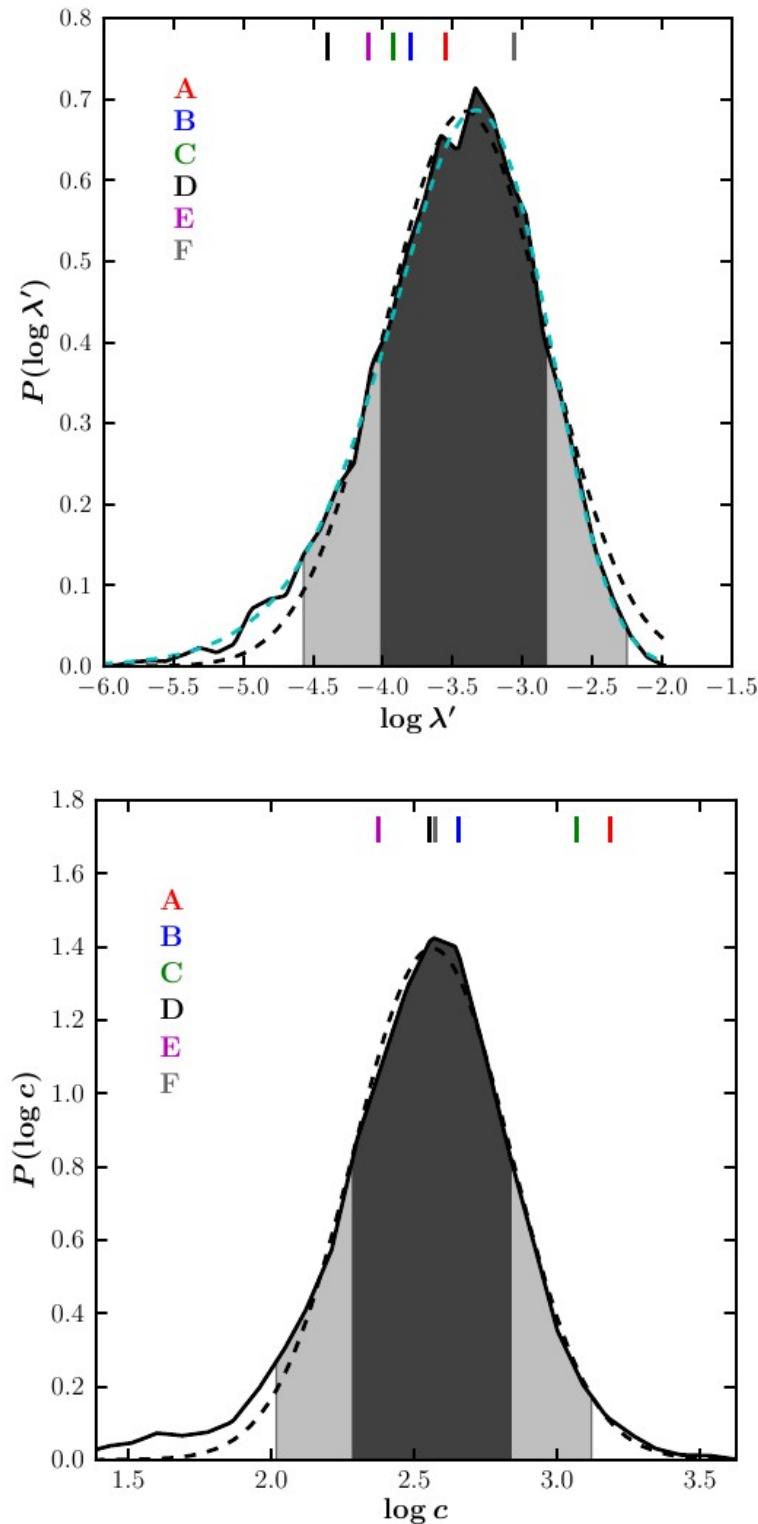
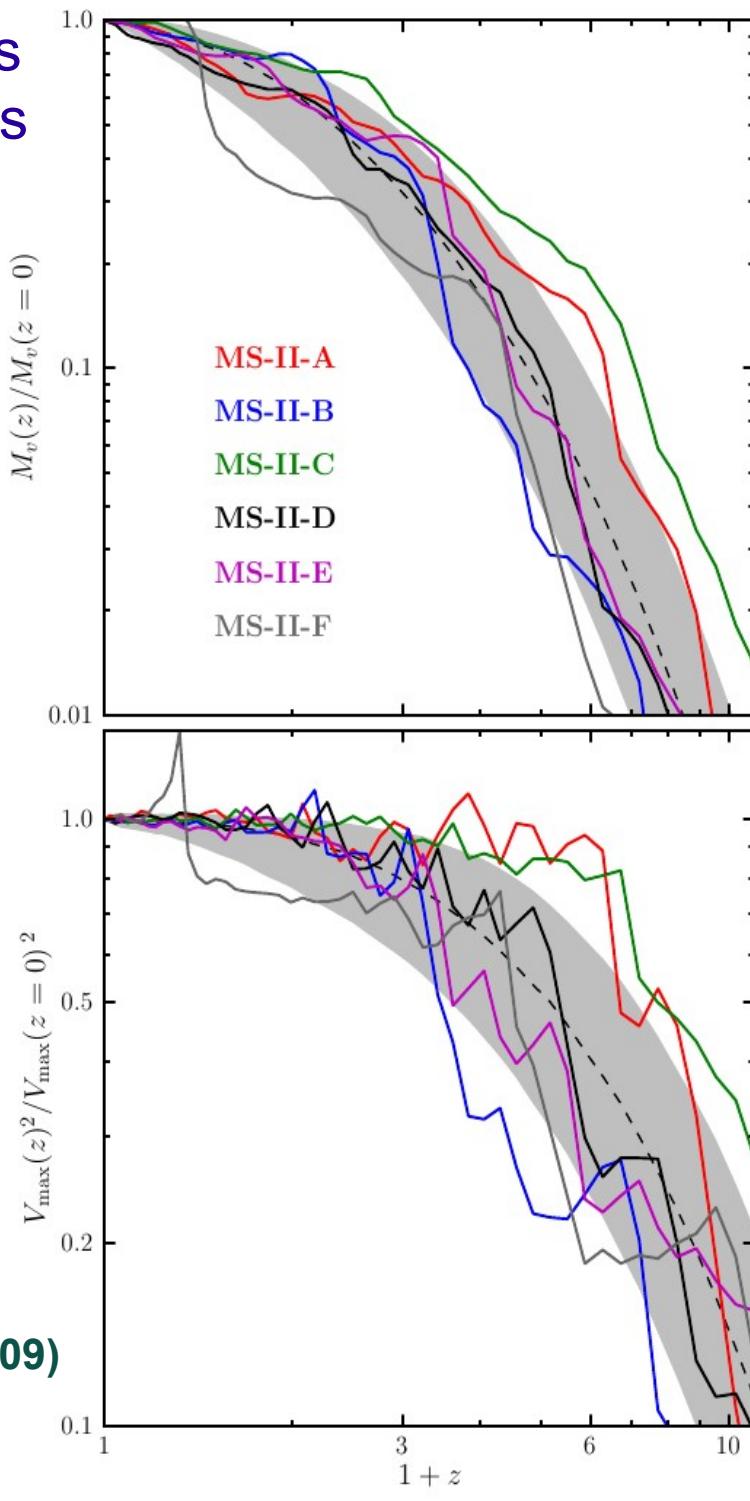
A sample of 6 simulated halos allows study of halo-to-halo scatter



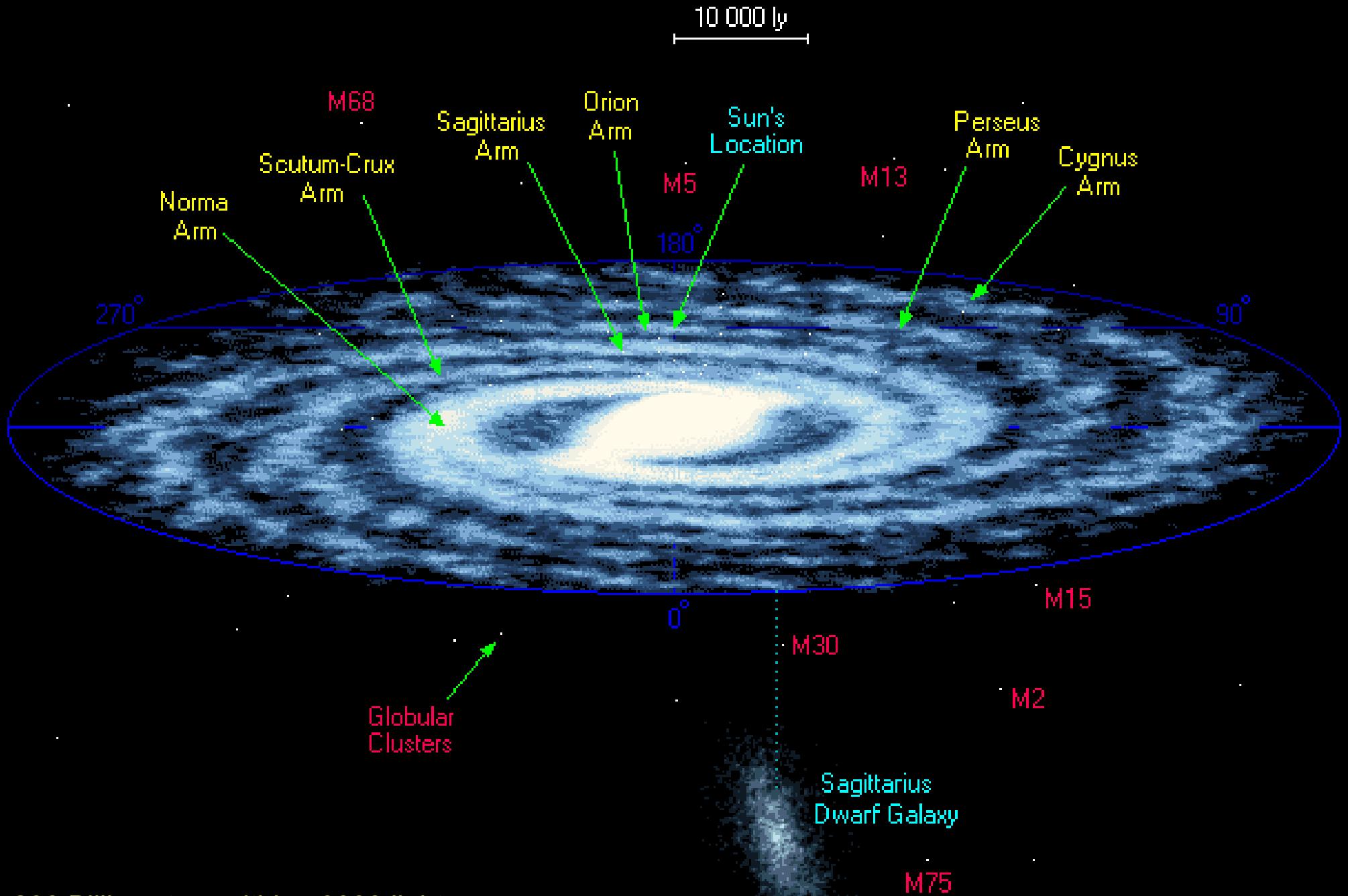
The set of Aquarius halos fairly samples the properties of Milky Way sized halos

**MASS ACCRETION HISTORIES, SPIN AND CONCENTRATION DISTRIBUTION FROM THE MILLENNIUM-II SIMULATION**

Boylan-Kolchin et al. (2009)



# We need predictions for the dark matter structure at the position of the Sun in the Milky Way



# What is the Cold Dark Matter made of?

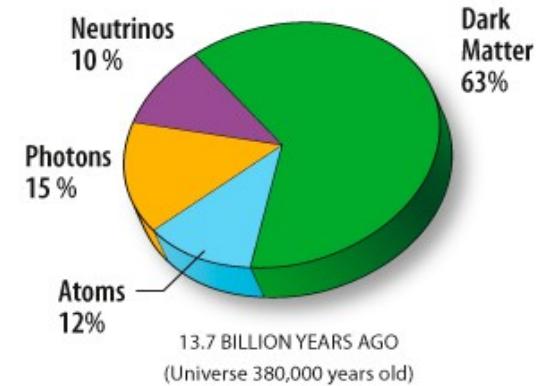
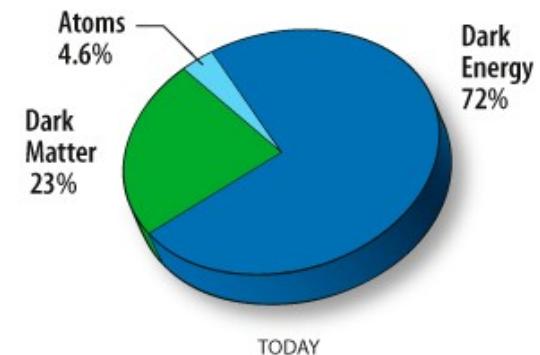
THERE ARE PROMISING CANDIDATES WITH MOTIVATION IN PARTICLE PHYSICS

## Neutralino?

lightest supersymmetric particle  
expected mass  $\sim 100$  GeV  
annihilation possibly observable  
detectable through elastic scattering with nucleus

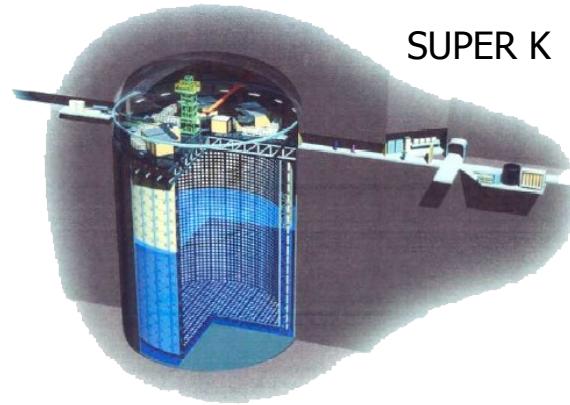
## Axion?

mass  $\sim 10^{-5}$  eV  
detectable through photon-conversion in strong magnetic fields

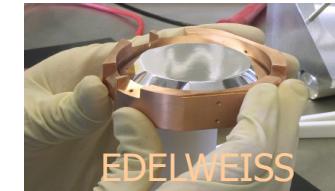


Large efforts have been started to experimentally detect dark matter

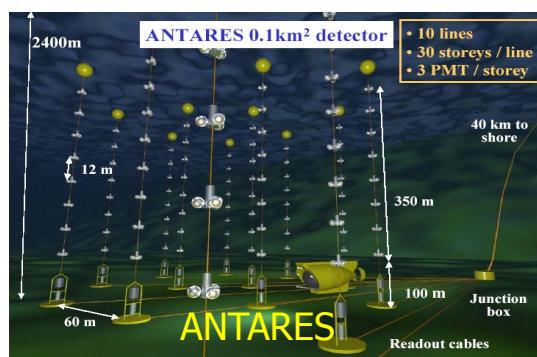
### A FEW OF THE CURRENT EXPERIMENTS THAT SEARCH FOR DARK MATTER



**Indirect searches:**  
search for annihilation  
products



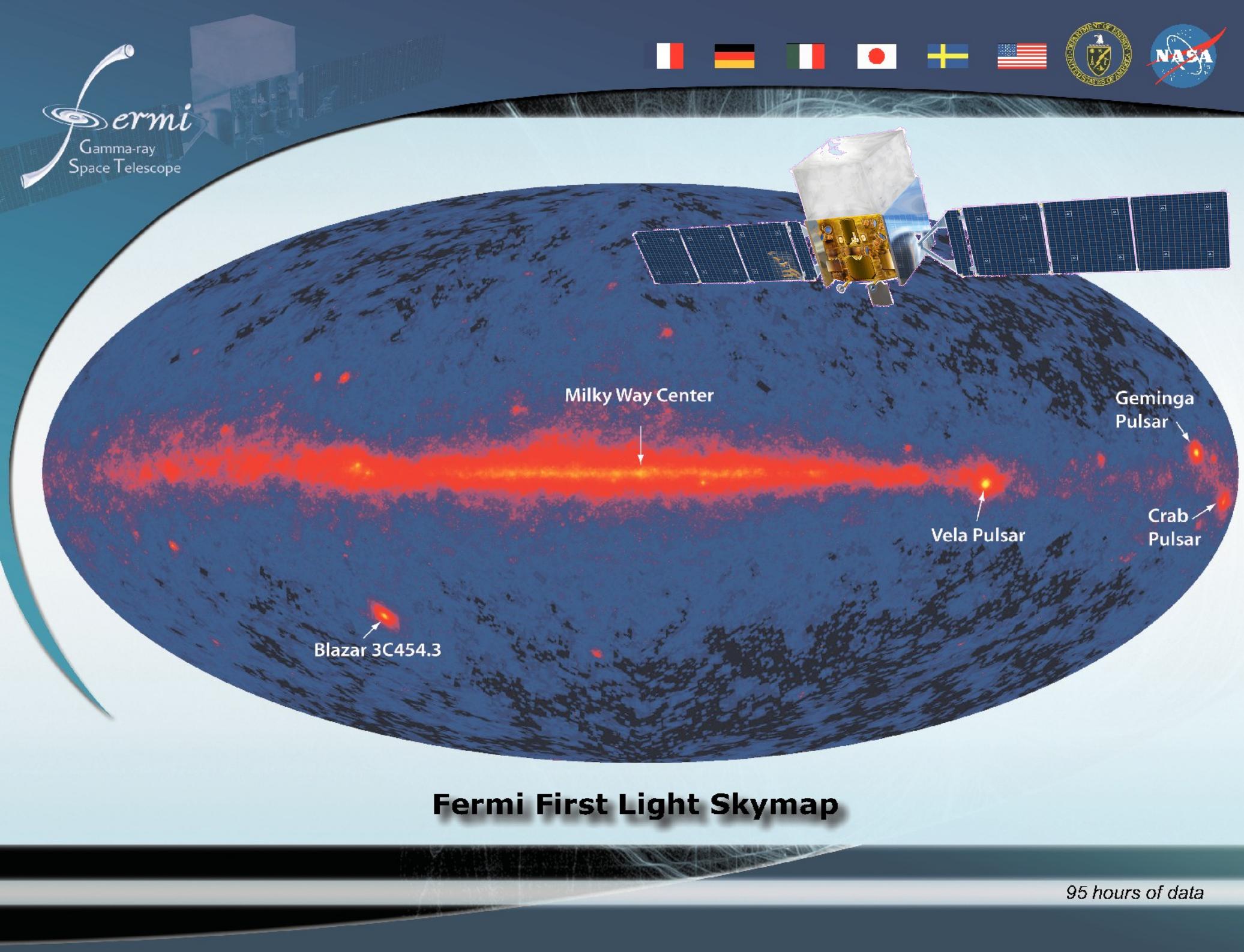
**Direct searches:**  
measure nuclear  
recoil due to elastic  
scattering with nucleus



ADMX



Typical cross sections of WIMPS:  $\sim 10^{-42} \text{ cm}^2$  ( $10^{-6} \text{ pb}$ )



Dark matter could be self-annihilating, in which case the presence of subhalos should **boost** the expected flux

### THE ANNIHILATION SIGNAL DUE TO SUBSTRUCTURES

#### Annihilation flux:

$$F = \frac{N_\gamma \langle \sigma v \rangle}{2 m_{\text{DM}}^2} \int_V \frac{\rho_{\text{DM}}^2(\mathbf{x})}{4\pi d^2(\mathbf{x})} d^3x$$

Particle physics
Astrophysics

Luminosity of a halo with maximum circular velocity  $V_c(r_{\text{max}}) = V_{\text{max}}$ :  $L = \int \rho_{\text{DM}}^2(\mathbf{x}) d^3x$

**NFW-Profile:**  $L = 1.23 \frac{V_{\text{max}}^4}{G^2 r_{\text{max}}}$

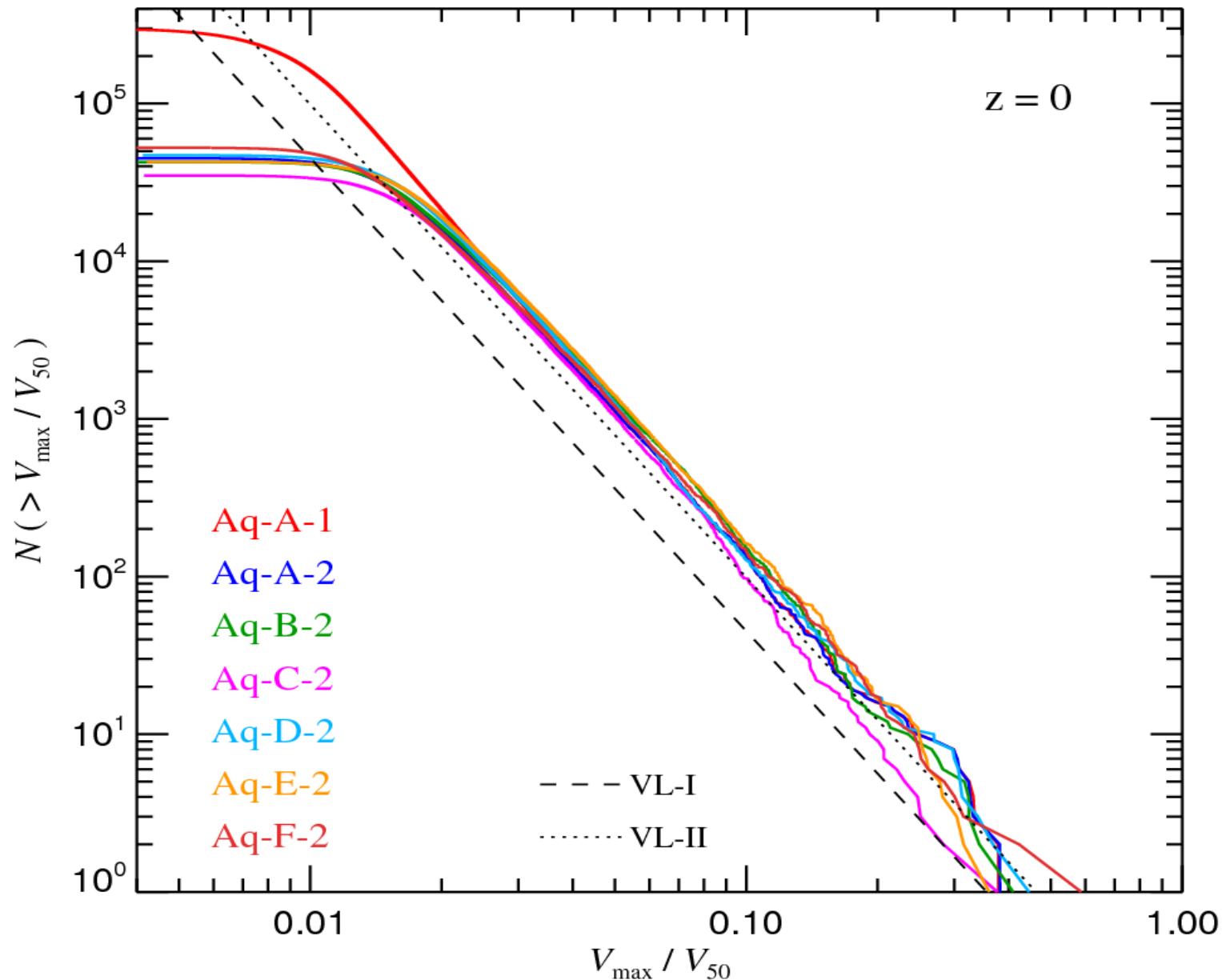
**Einasto-Profile:**  $L = 1.87 \frac{V_{\text{max}}^4}{G^2 r_{\text{max}}}$

**$\alpha = -1.4$  Profile:**  $L = 3.97 \frac{V_{\text{max}}^4}{G^2 r_{\text{max}}}$

**Moore-Profile:**  $L = \infty$

The subhalo abundance per unit halo mass is surprisingly uniform

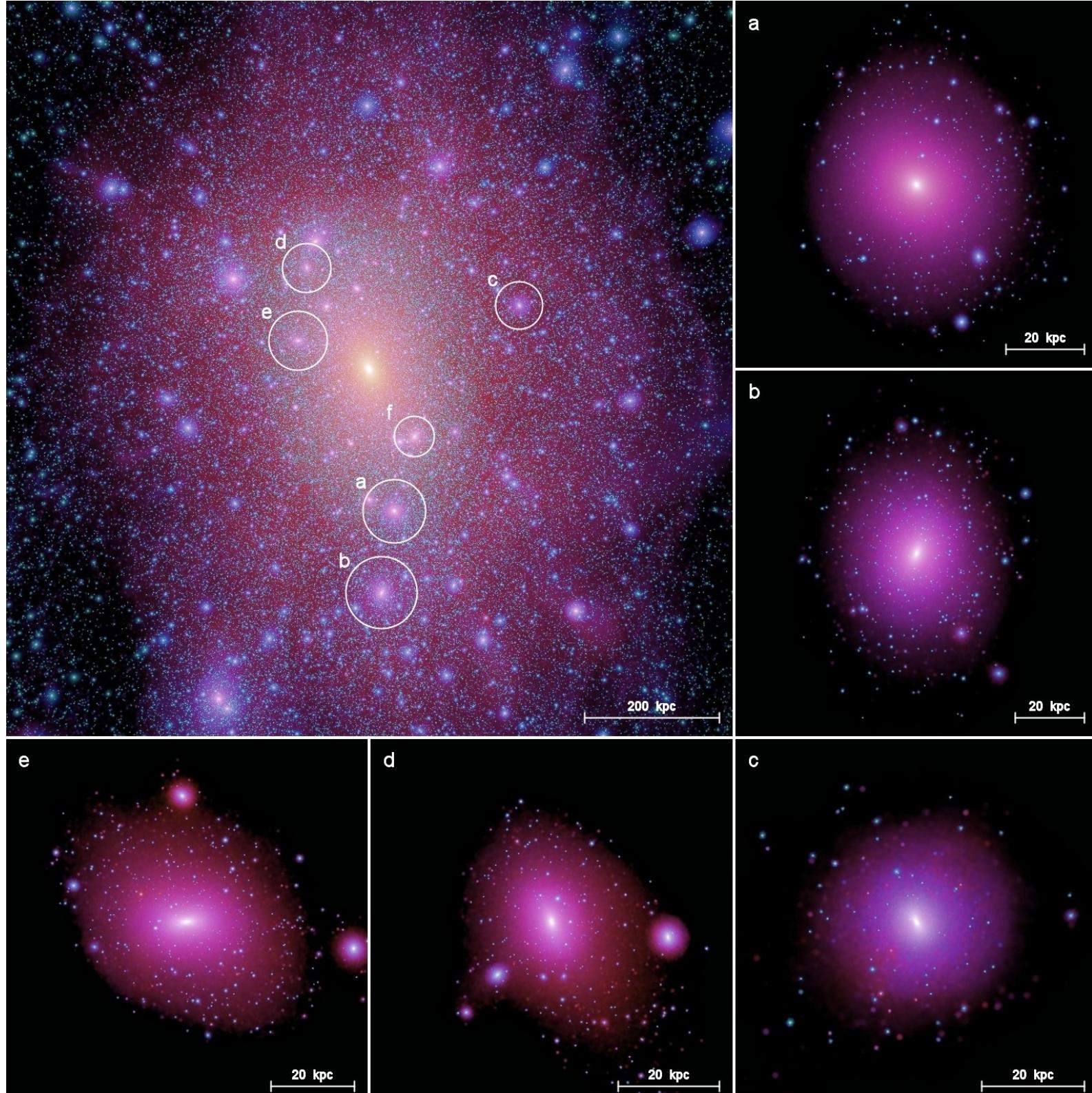
### VELOCITY FUNCTION IN OUR DIFFERENT HALOS



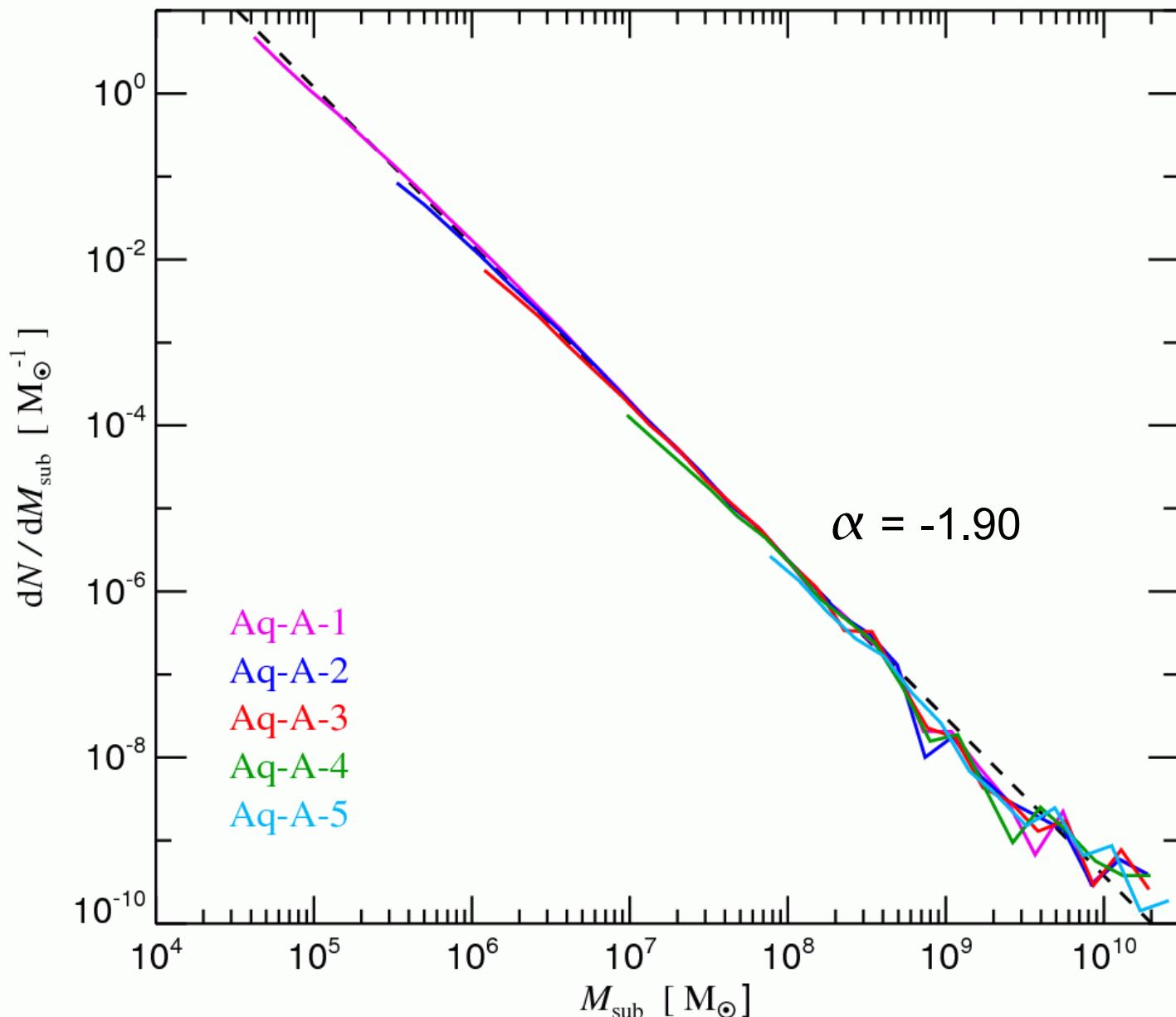
We detect up to four generations of substructures within substructures

**HALO IN HALOS IN HALOS IN THE AQUARIUS SIMULATIONS**

The hierarchy does not appear to be strictly self-similar – we find somewhat fewer substructures in subhalos than in field halos within the same overdensity.

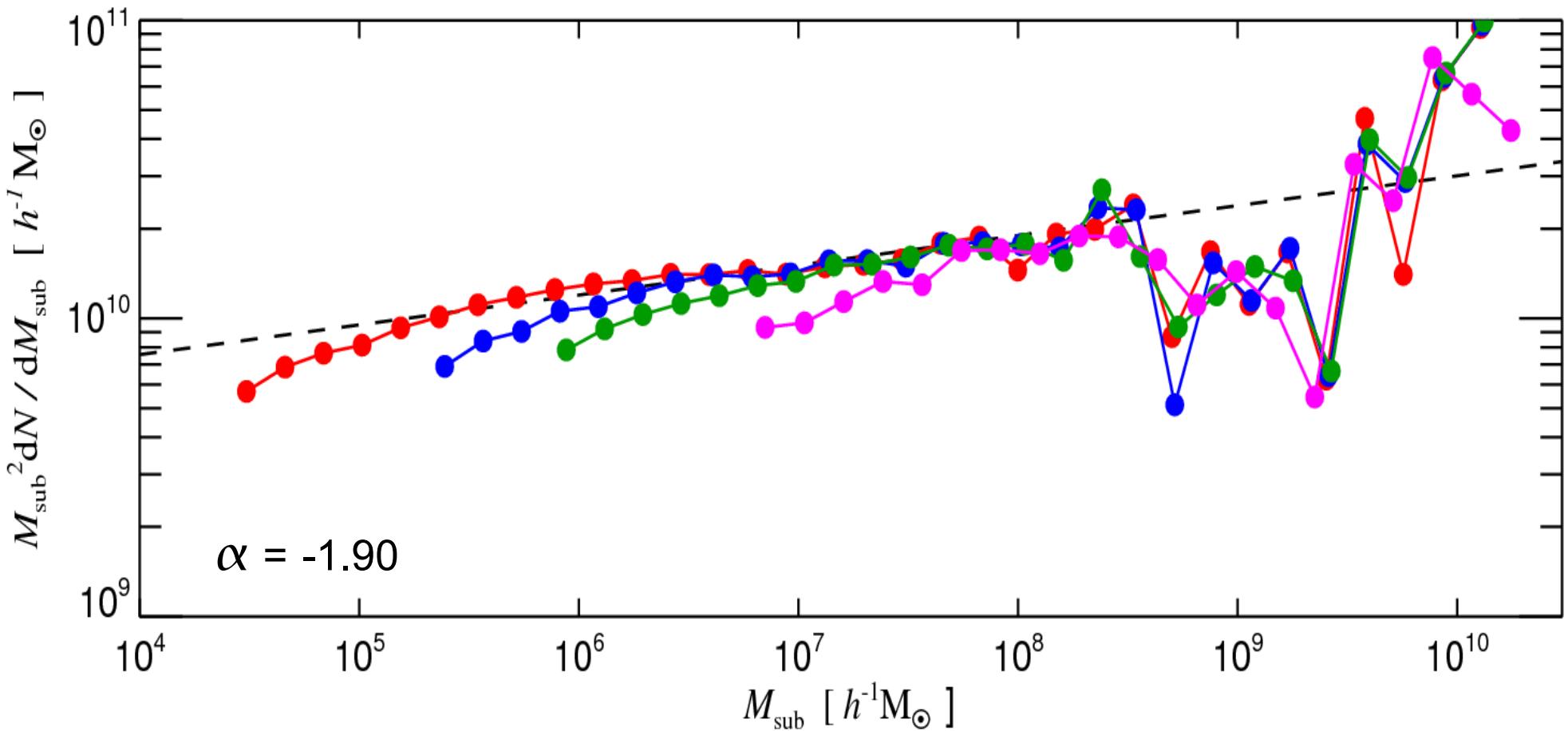


The differential subhalo mass function converges quite well to a power-law  
**RESULTS FROM A RESOLUTION STUDY OF AQUARIUS HALO AQ-A**



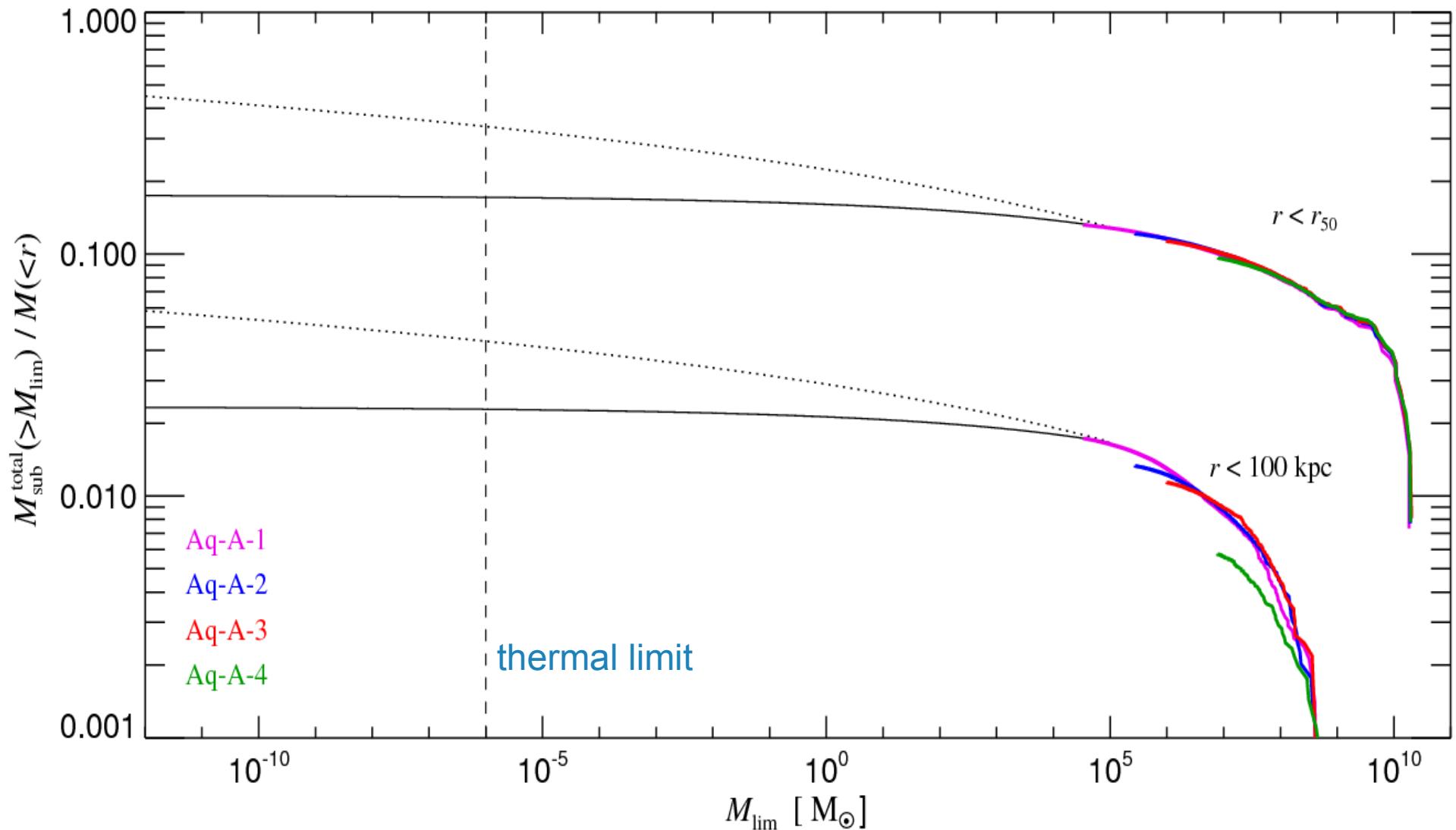
The subcritical slope of the differential subhalo mass function implies that the total mass in substructures converges at the faint end

### THE DIFFERENTIAL SUBHALO MASS FUNCTION



The cumulative mass fraction in **resolved substructures** reaches about 12-13%, we expect up to  $\sim 18\%$  down to the thermal limit

### FRACTION OF MASS IN SUBSTRUCTURES AS A FUNCTION OF MASS LIMIT



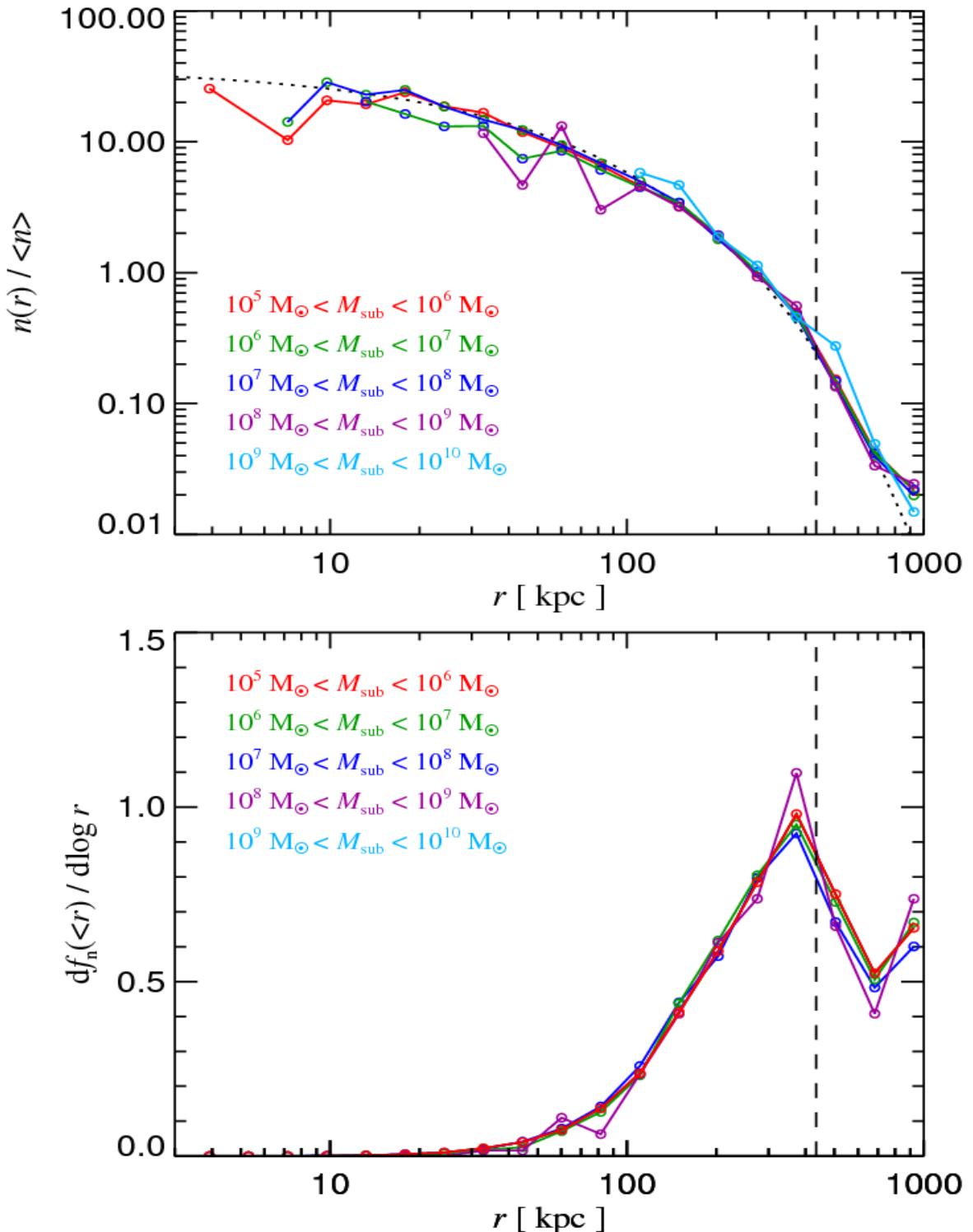
The radial distribution of substructures is strongly antibiased relative to all dark matter, and independent of subhalo mass

### RADIAL SUBSTRUCTURE DISTRIBUTION IN Aq-A-1

Most subhalos are at large radii, subhalos are more effectively destroyed near the centre

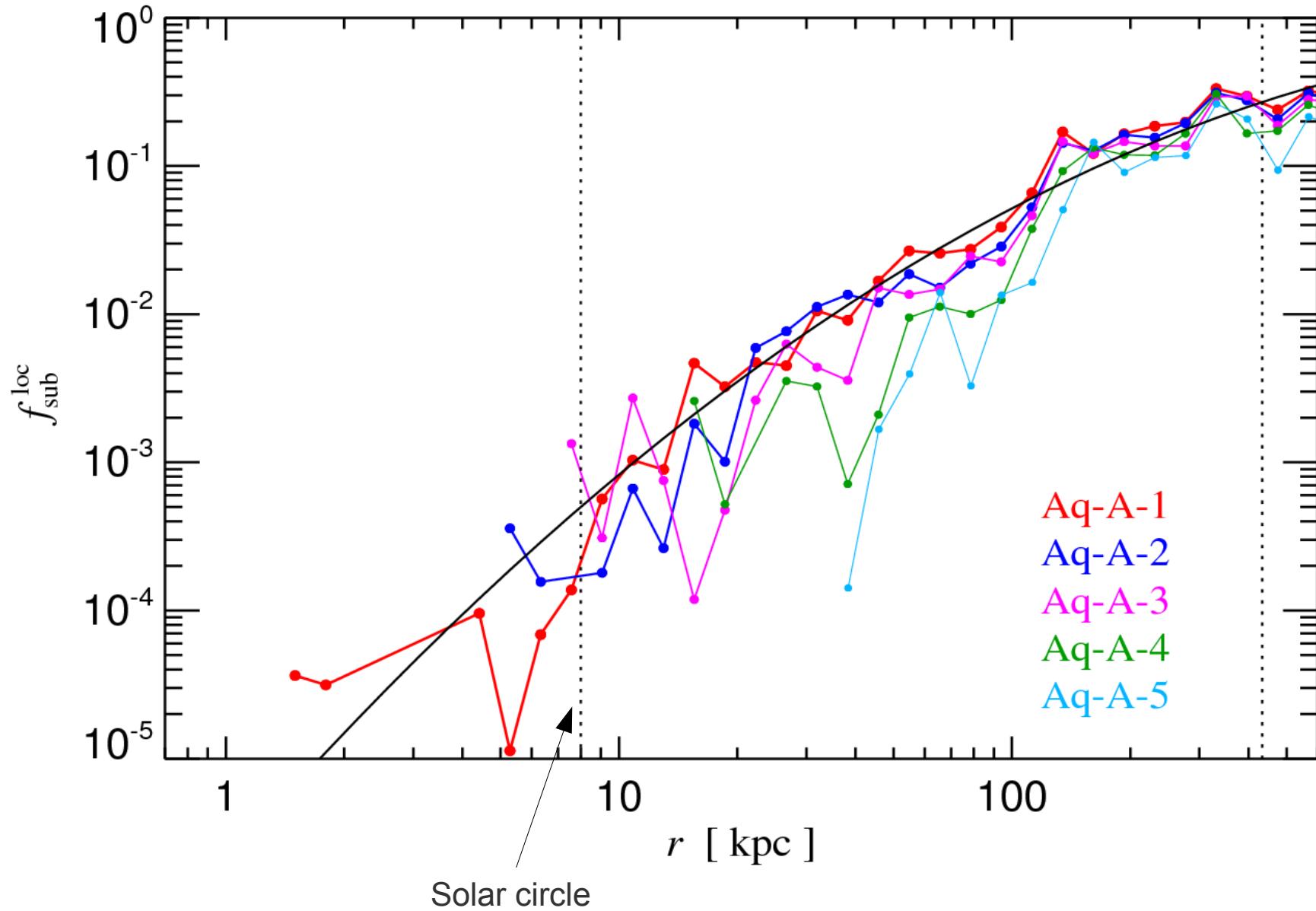
Subhalos are far from the Sun

see also Diemand et al. (2007, 2008)



The local mass fraction in substructures is a strong function of radius

### MASS FRACTION IN SUBSTRUCTURES AS A FUNCTION OF RADIUS IN HALO AQ-A

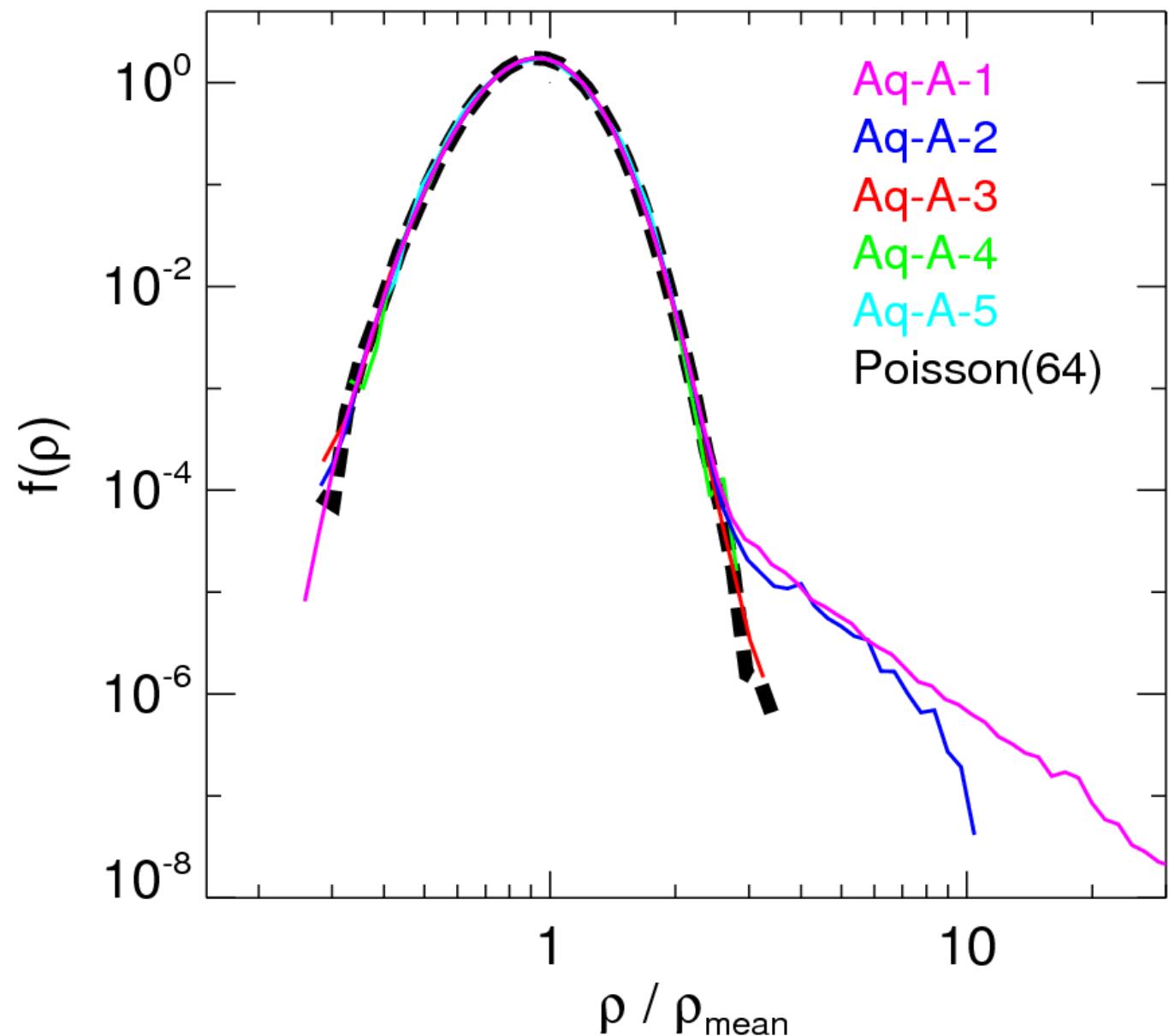


The dark matter distribution at the Solar circle is surprisingly smooth

### THE DENSITY PDF AT THE POSITION OF THE SUN

Essentially all of the scatter is due to particle sampling noise.

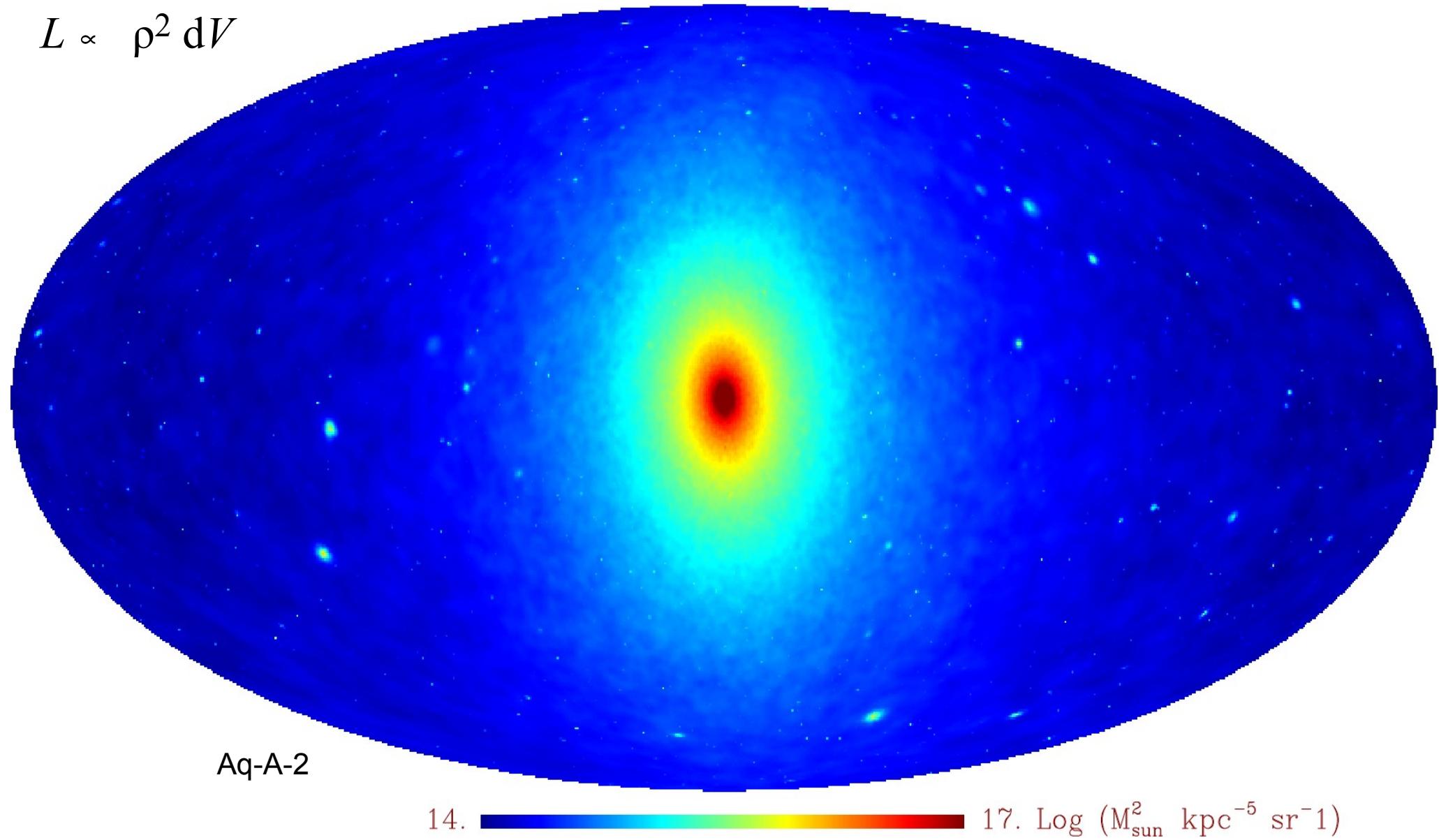
In fact, the **residual intrinsic rms scatter is only 4%** around the smooth model



Is the dark matter annihilation flux boosted significantly by dark matter substructures?

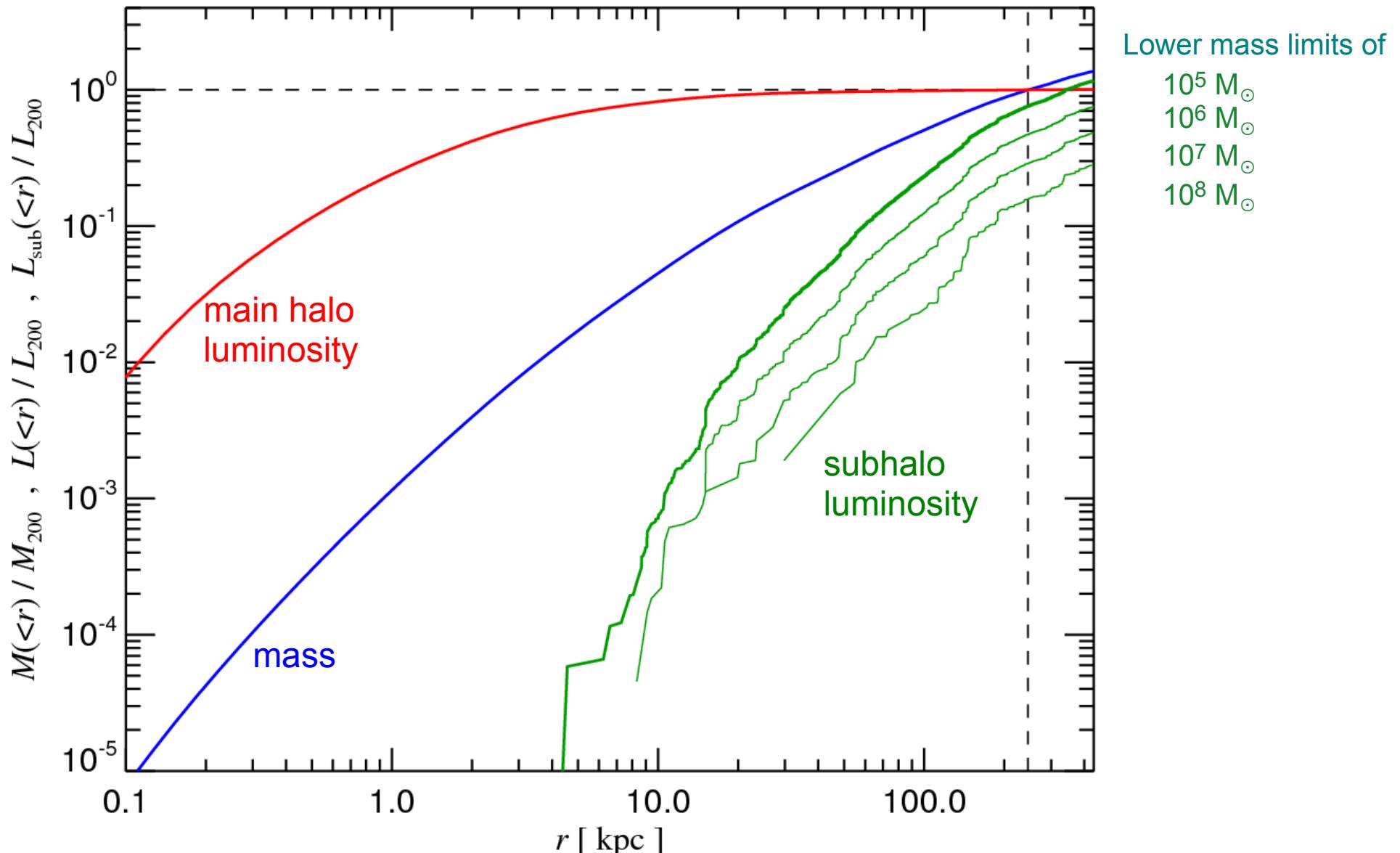
SIMULATED ALL-SKY MAP OF THE DM ANNIHILATION FLUX AROUND THE SUN IN THE MILKY WAY

$$L \propto \rho^2 dV$$



The annihilation luminosity from main halo and subhalos has a very different radial distribution

### THE RELATIVE DISTRIBUTION OF MASS, MAIN HALO, AND SUBHALO LUMINOSITY

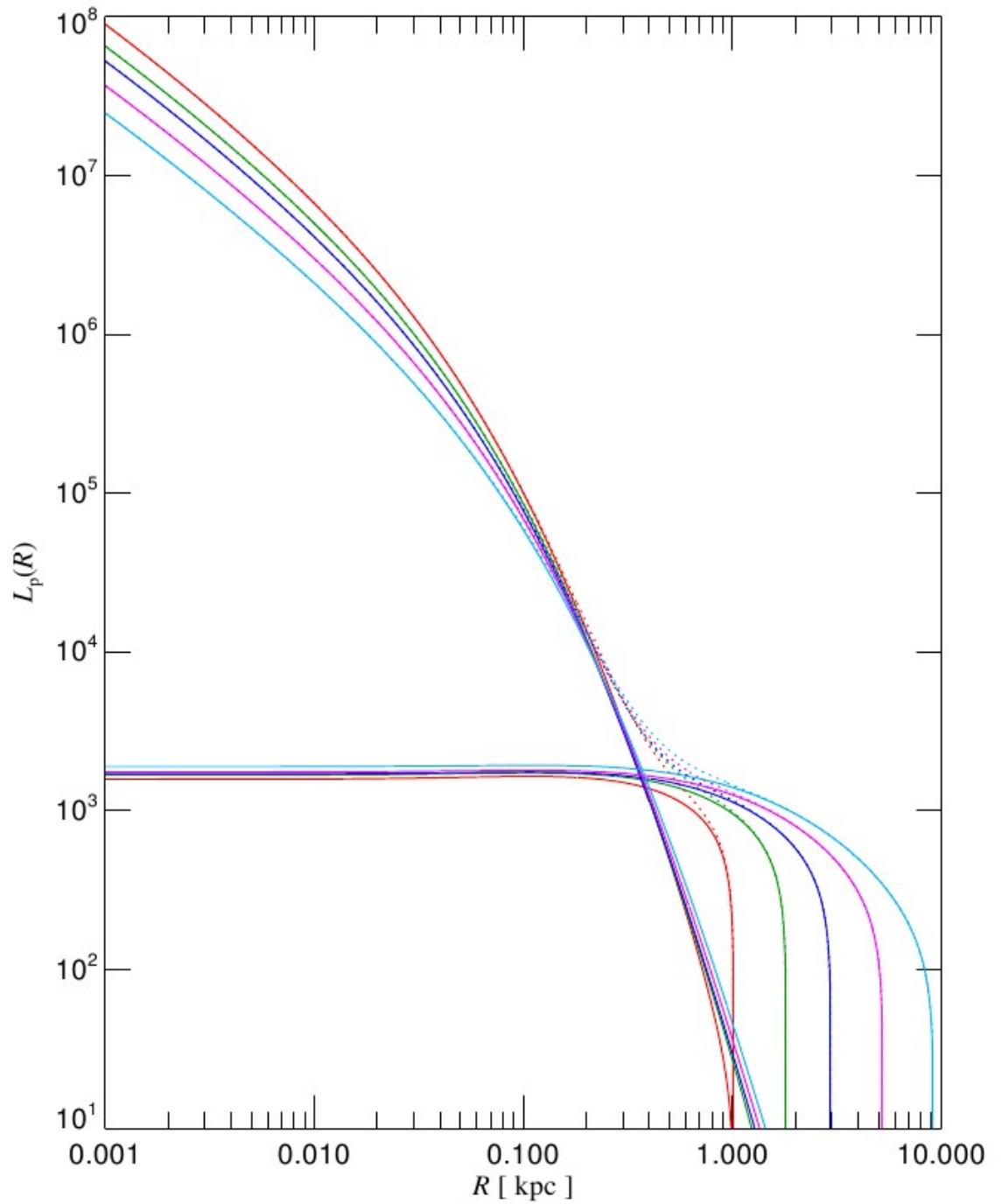


Surface brightness profile of a typical subhalo with  $V_{\max} = 10$  km/s at different distances from the galactic center

### SURFACE BRIGHTNESS PROFILE OF DIFFERENT SUBHALO COMPONENTS

The sub-sub component appears as a (extended) “disk” on the sky

The central surface brightness of the smooth component actually increases with smaller distance (because the concentration increases)



Dark matter annihilation can be best discovered with an optimal filter against a bright background

### THE SIGNAL-TO-NOISE FOR DETECTION WITH AN OPTIMAL FILTER

The optimal filter  
is proportional to  
the signal

$$S/N = \sqrt{\tau A_{\text{eff}}} \left[ \int \frac{n_\gamma^2(\theta, \phi)}{n_\gamma(\theta, \phi) + b_\gamma(\theta, \phi)} d\Omega \right]^{1/2}$$

signal

background noise

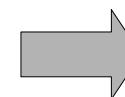
**The background dominates, then:**

Main halo's smooth component:

$$(S/N)_{\text{MainSm}} = f_{\text{MainSm}} \left[ \frac{\tau A_{\text{eff}}}{b_\gamma} \right]^{1/2} \frac{F}{\theta_h}$$

Subhalo's smooth component:

$$(S/N)_{\text{SubSm}} = f_{\text{SubSm}} (\theta_h / \theta_{\text{psf}}) \left[ \frac{\tau A_{\text{eff}}}{b_\gamma(\vec{\alpha})} \right]^{1/2} \frac{F}{(\theta_h^2 + \theta_{\text{psf}}^2)^{1/2}}$$



$$S/N \sim F / \theta$$

$$S/N \sim L / r_h d$$

Sub-substructure of a subhalo:

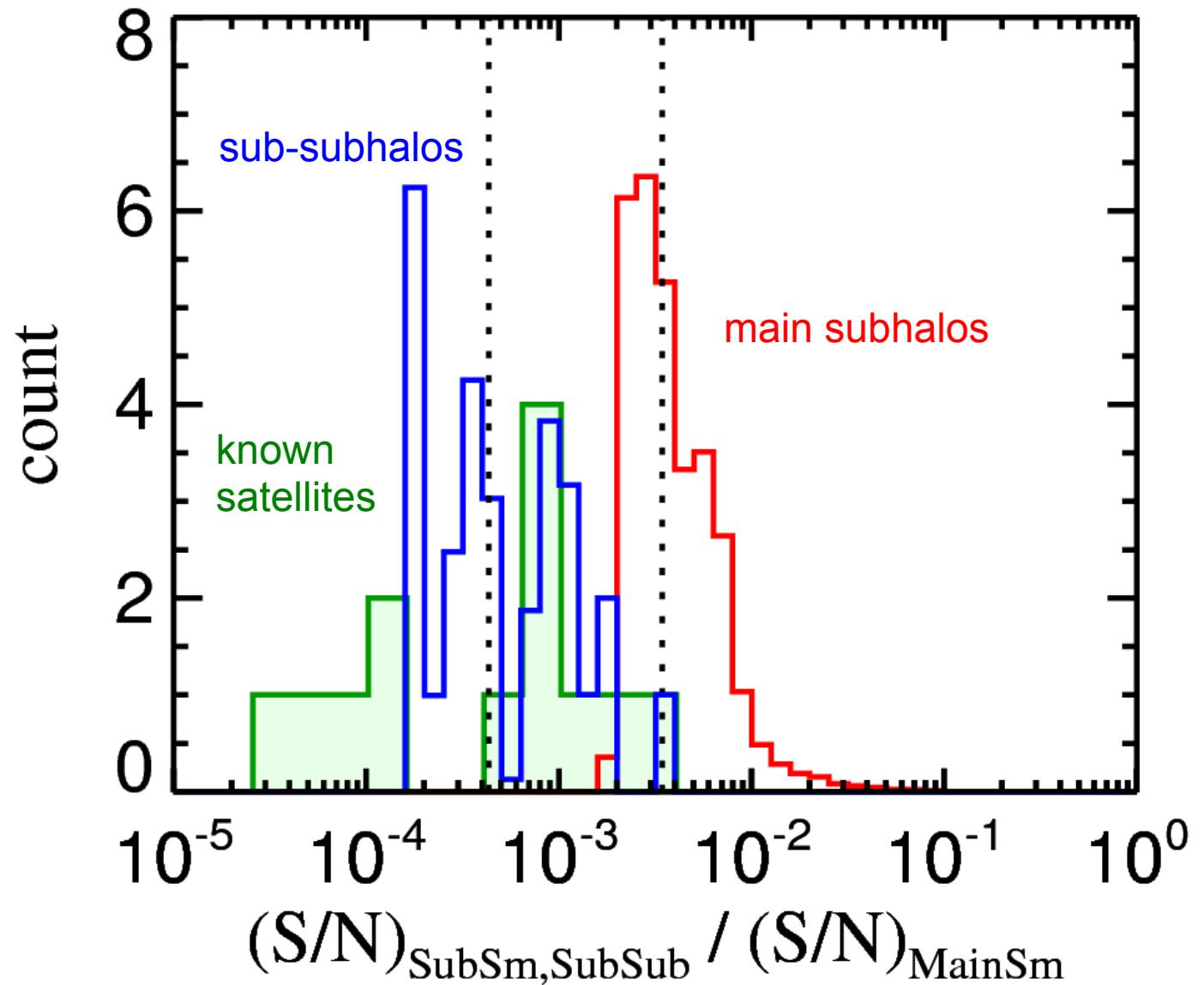
$$(S/N)_{\text{SubSub}} = f_{\text{SubSub}} (\theta_h / \theta_{\text{psf}}) \left[ \frac{\tau A_{\text{eff}}}{b_\gamma(\vec{\alpha})} \right]^{1/2} \frac{F}{(\theta_h^2 + \theta_{\text{psf}}^2)^{1/2}}$$

# Detectability of different annihilation emission components in the Milky Way

S/N for detecting subhalos **in units of** that for the **main halo**

30 highest S/N objects, assuming the use of **optimal filters**

$$S/N \propto CV_{\max}^4 / (r_{\text{half}}^2 d)$$

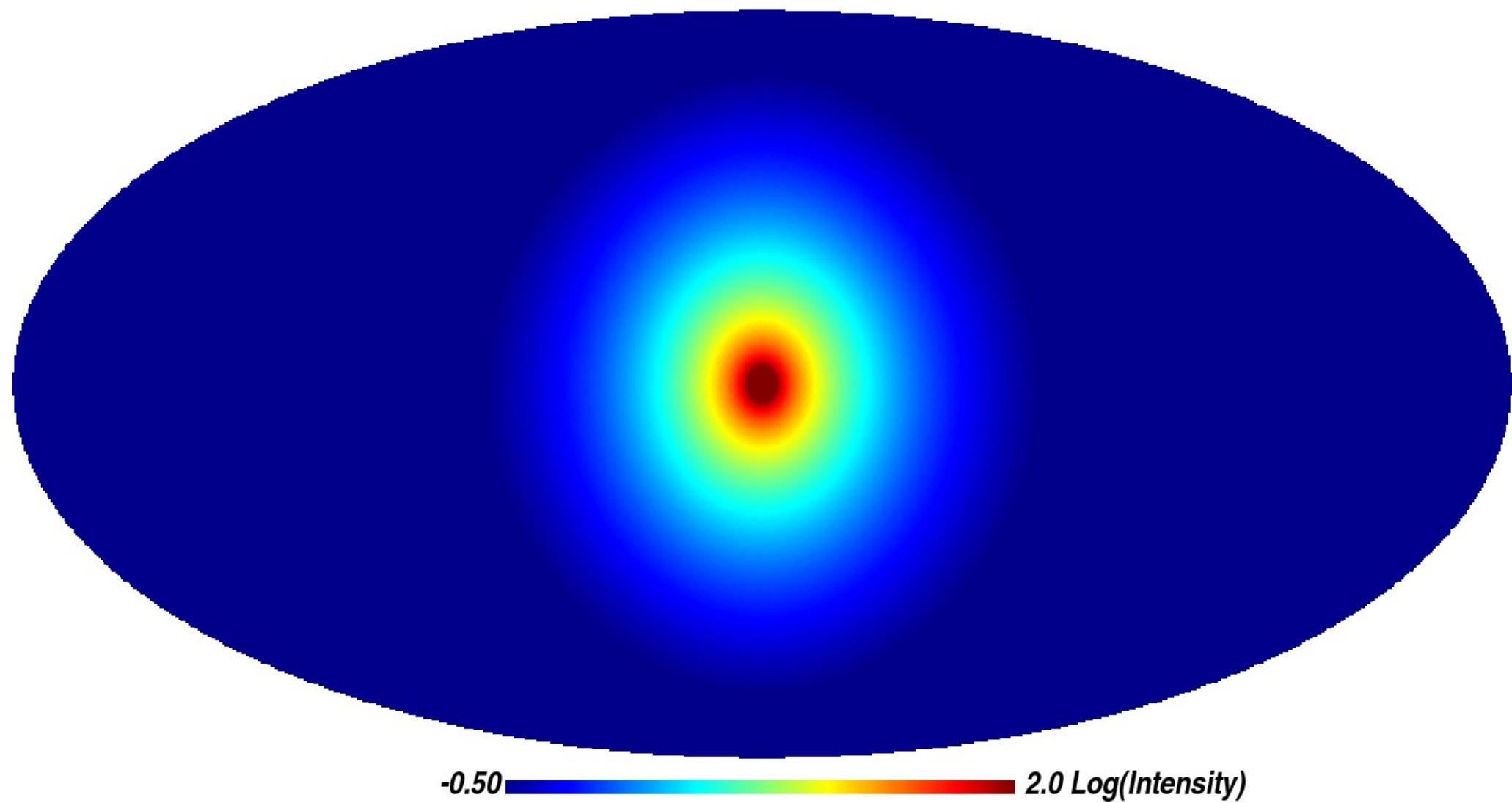


Highest S/N subhalos have 1% of S/N of main halo

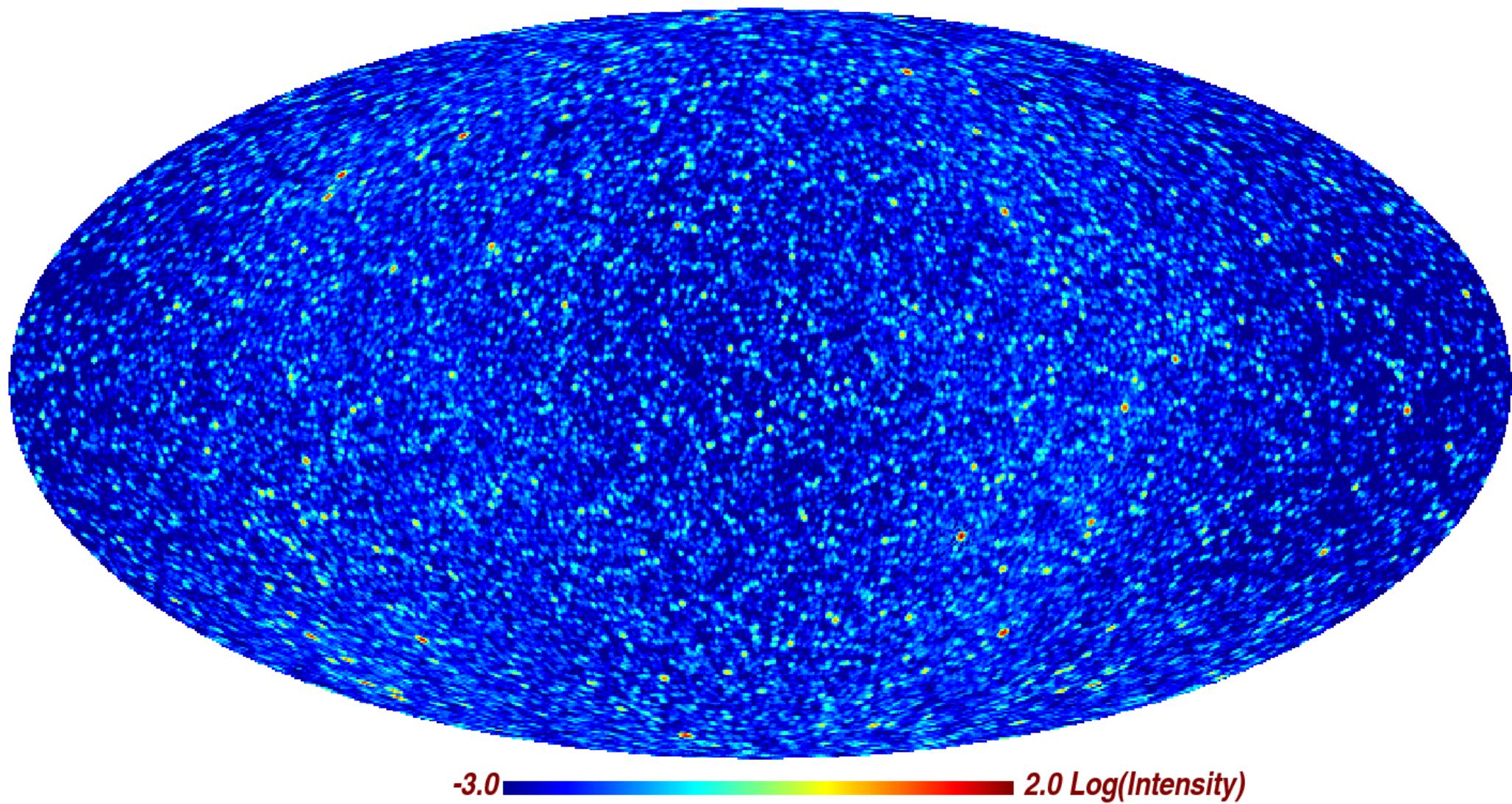
Highest S/N subhalos have 10 times S/N of known satellites

Substructure of subhalos has no influence on detectability

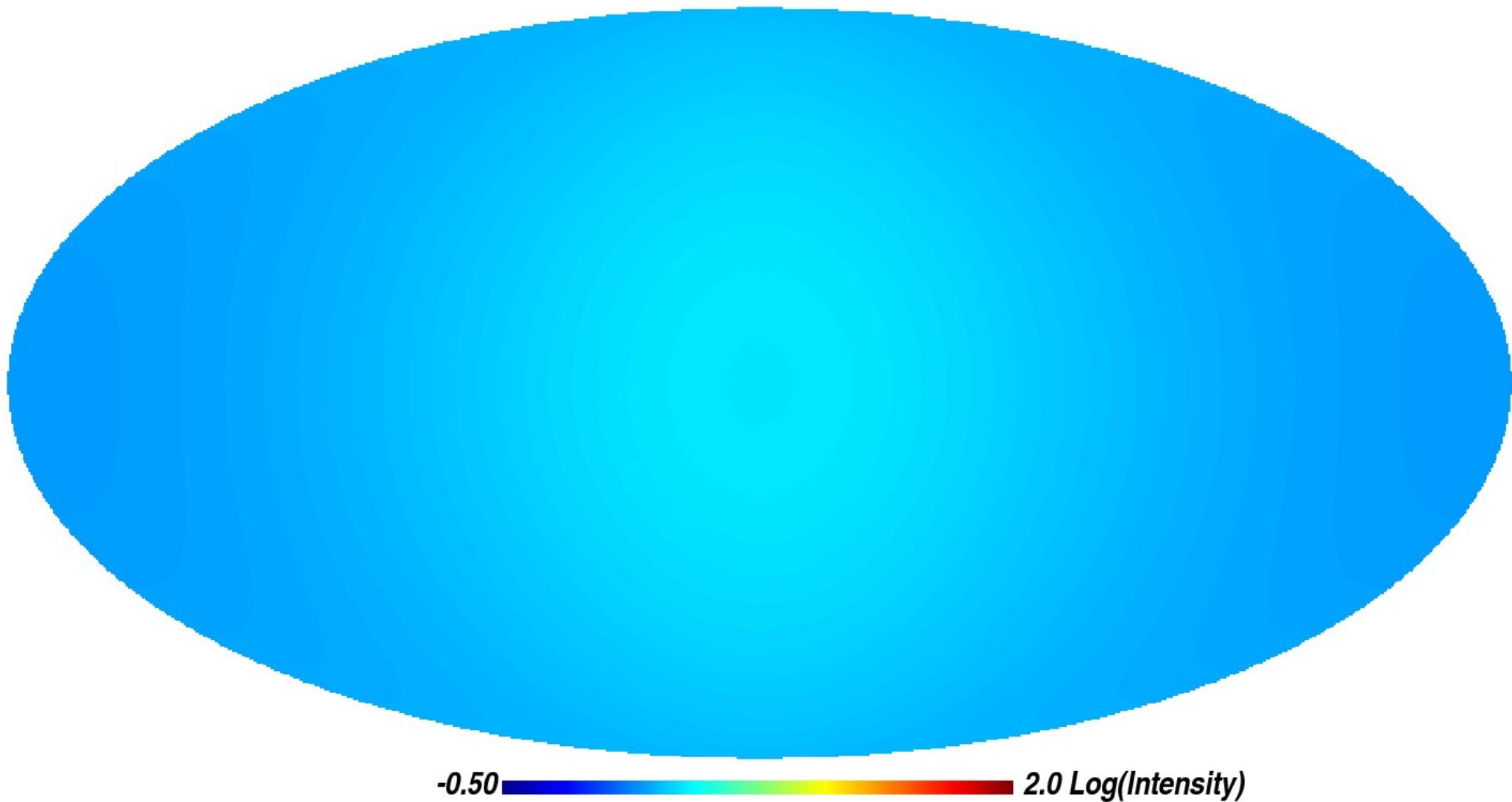
*smooth main halo emission (MainSm)*



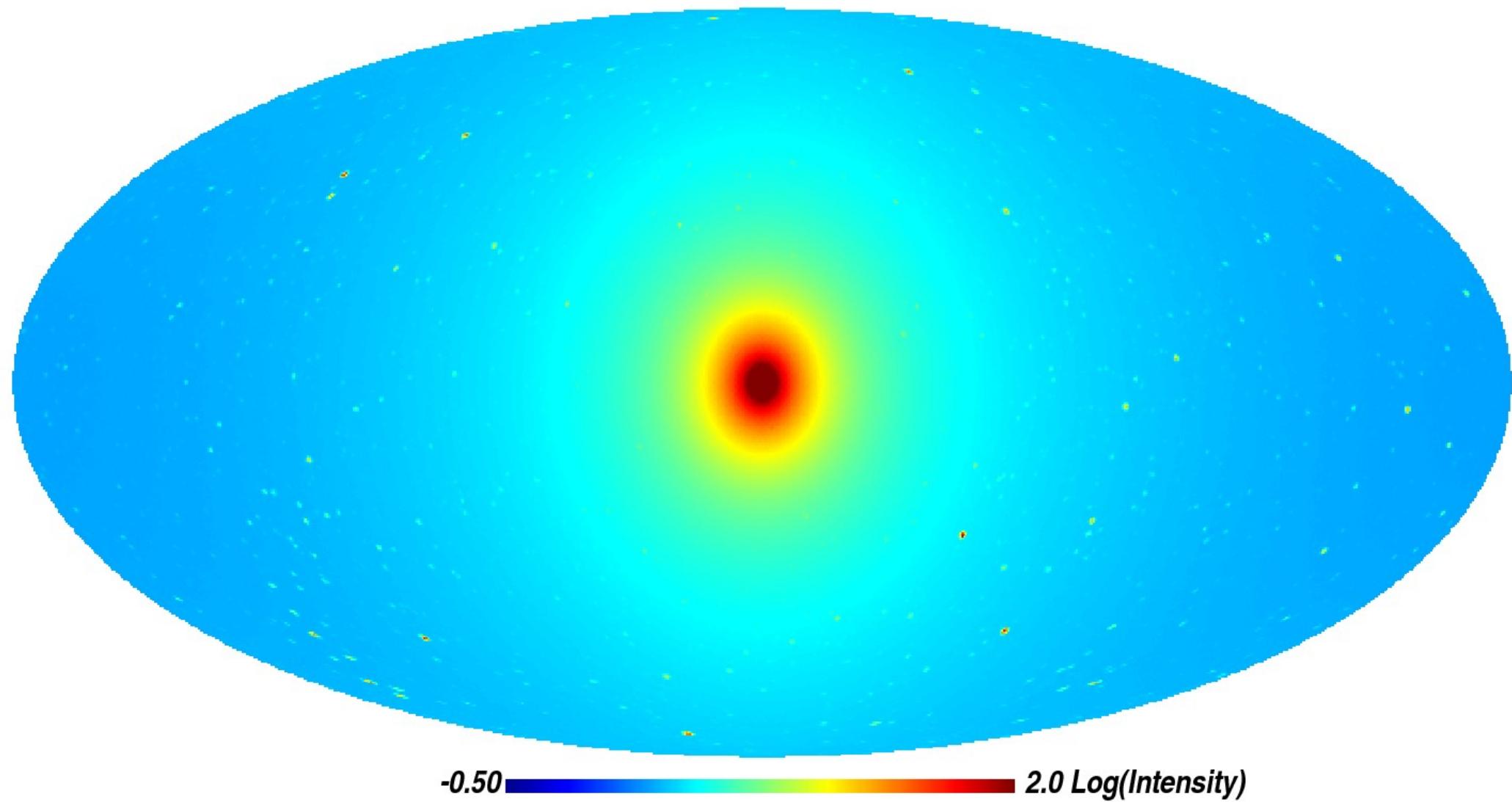
*emission from resolved subhalos (SubSm+SubSub)*



*unresolved subhalo emission (MainUn)*



*total emission*



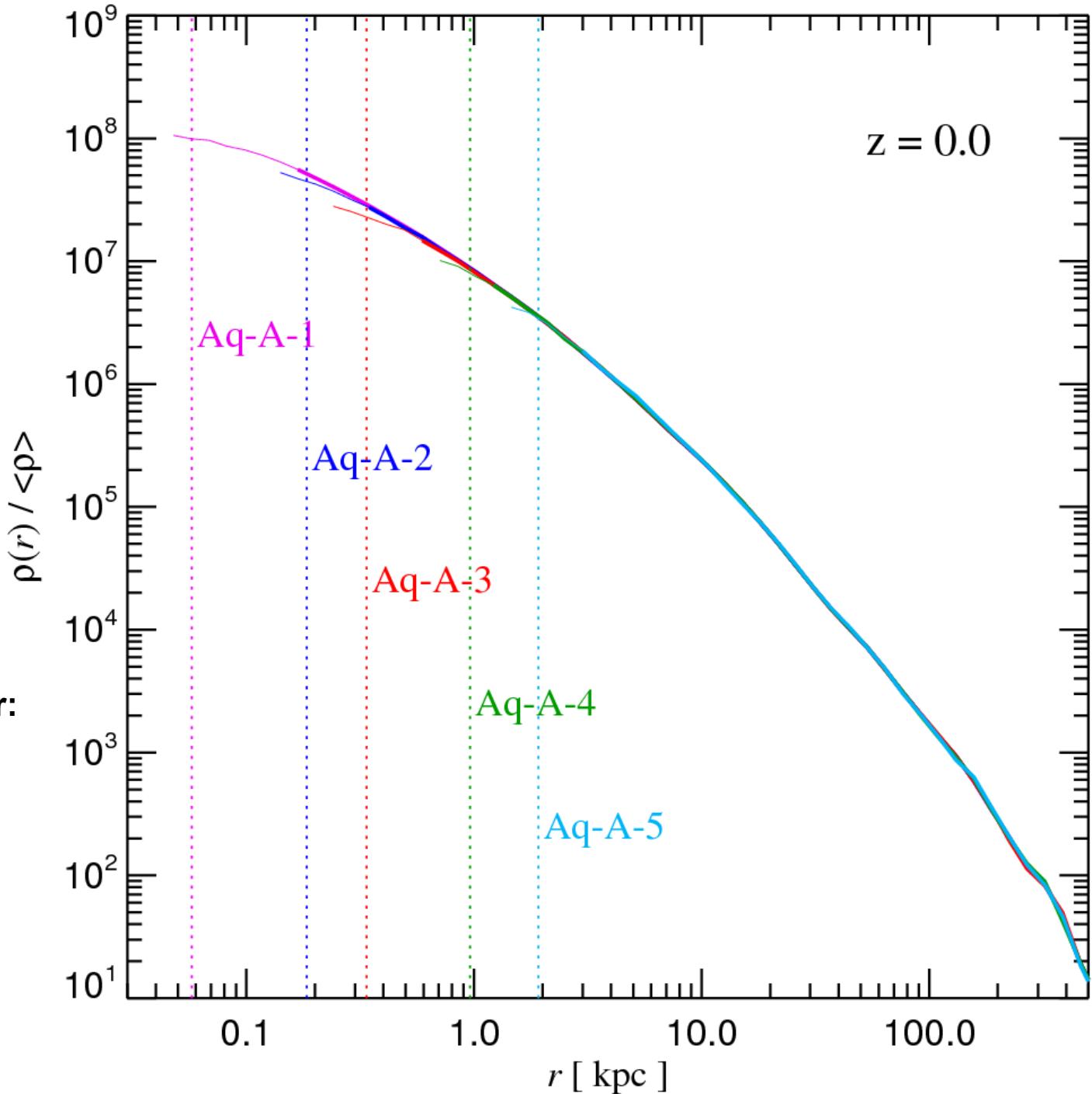
# Structure of the central cusp

The spherically averaged density profiles at  $z = 0.0$  show good convergence

### DENSITY PROFILE AS A FUNCTION OF RADIUS

Fundamental importance for:

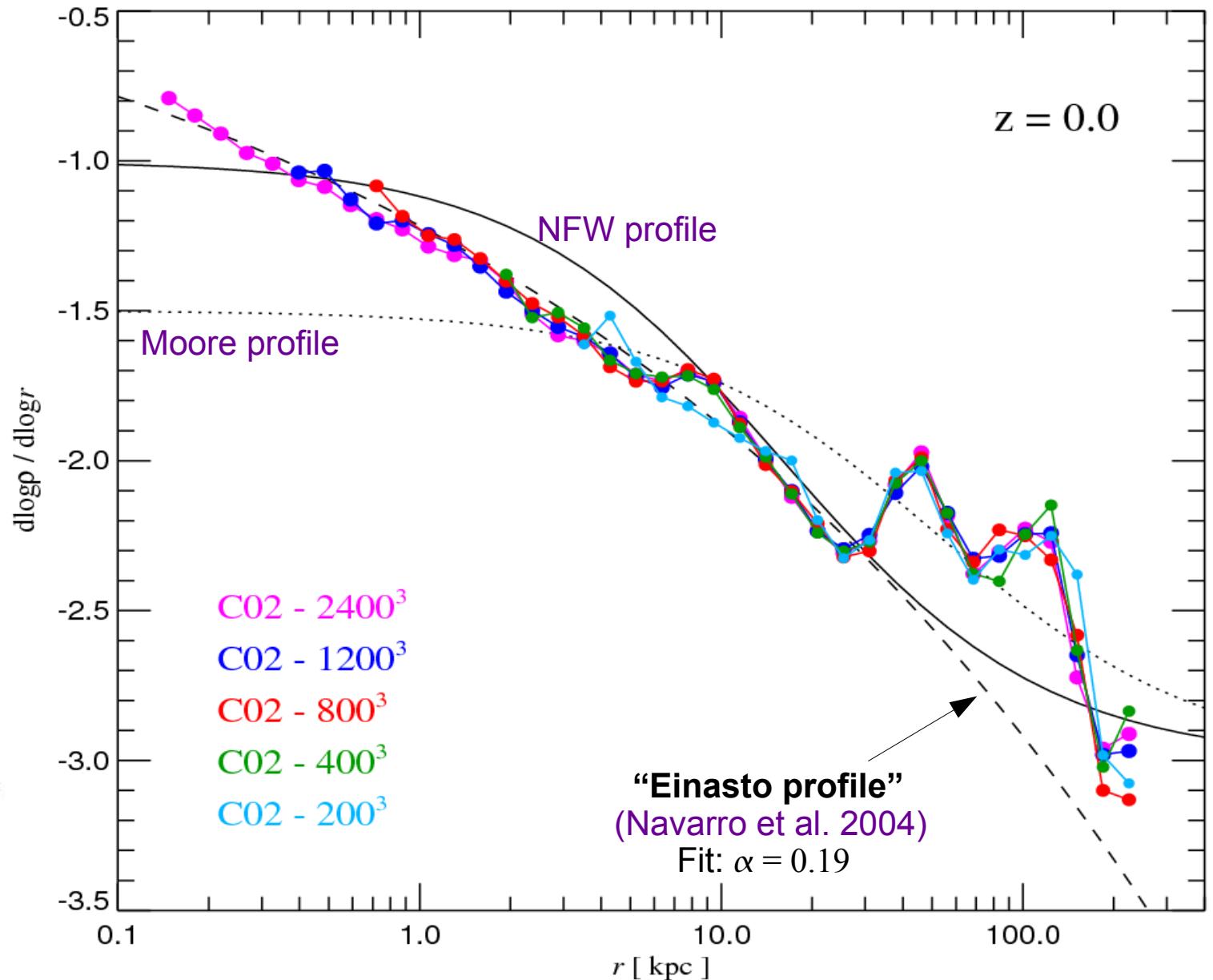
- Rotation curve of galaxies
- Internal structure of galaxy clusters
- Gravitational lensing
- DM annihilation
- Galaxy mergers



The logarithmic slope of the density profile does not show asymptotic behavior towards the core

### SLOPE OF THE DENSITY PROFILE AS A FUNCTION OF RADIUS

$$\frac{d \log \rho}{d \log r} = -2 \left( \frac{r}{r_{-2}} \right)^\alpha$$



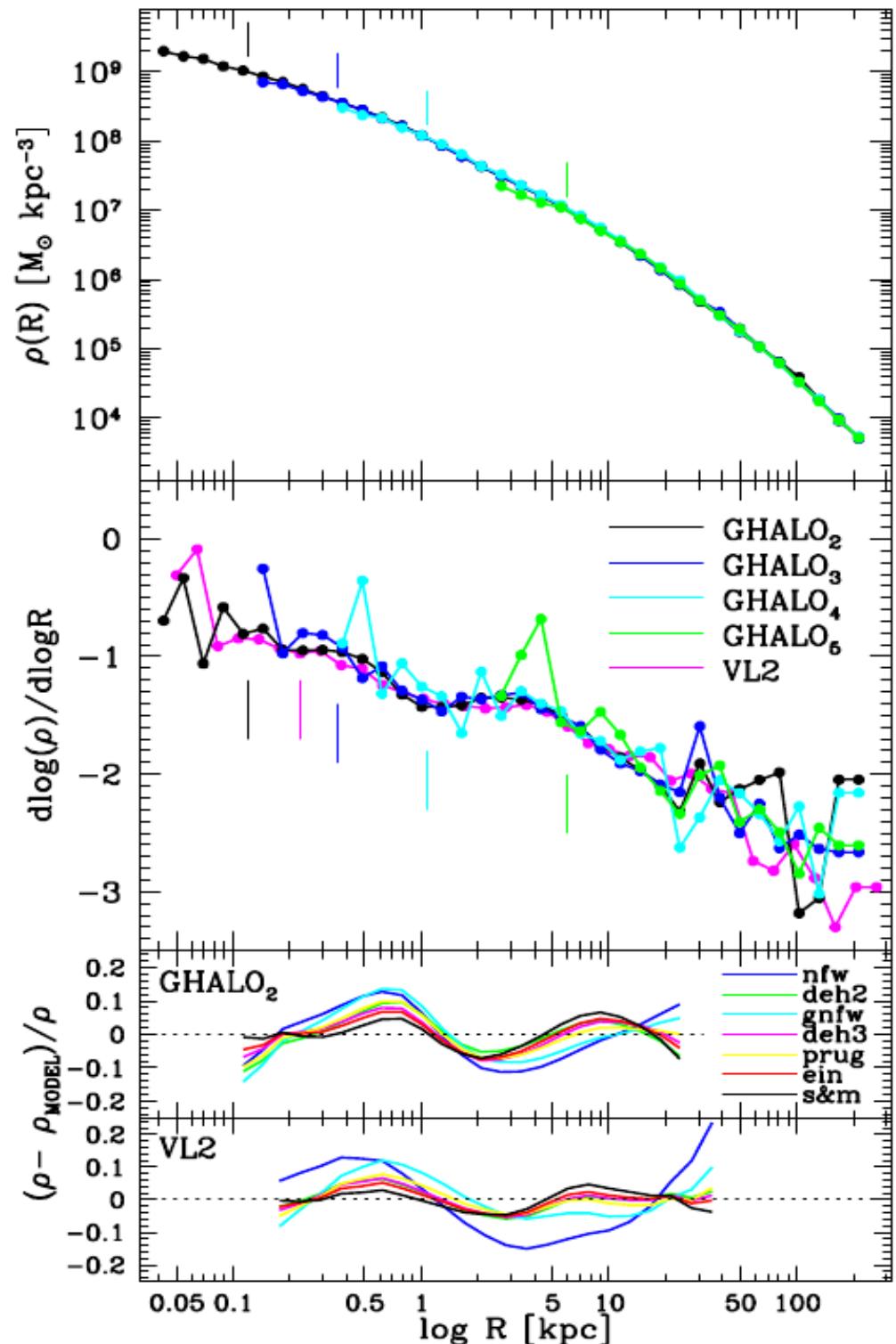
A consensus on the central structure  
of the cusps seems to be emerging

**RECENT RESULTS FROM THE 'GHALO'  
SIMULATION OF THE ZURICH GROUP**

**Stadel et al. (2009)**

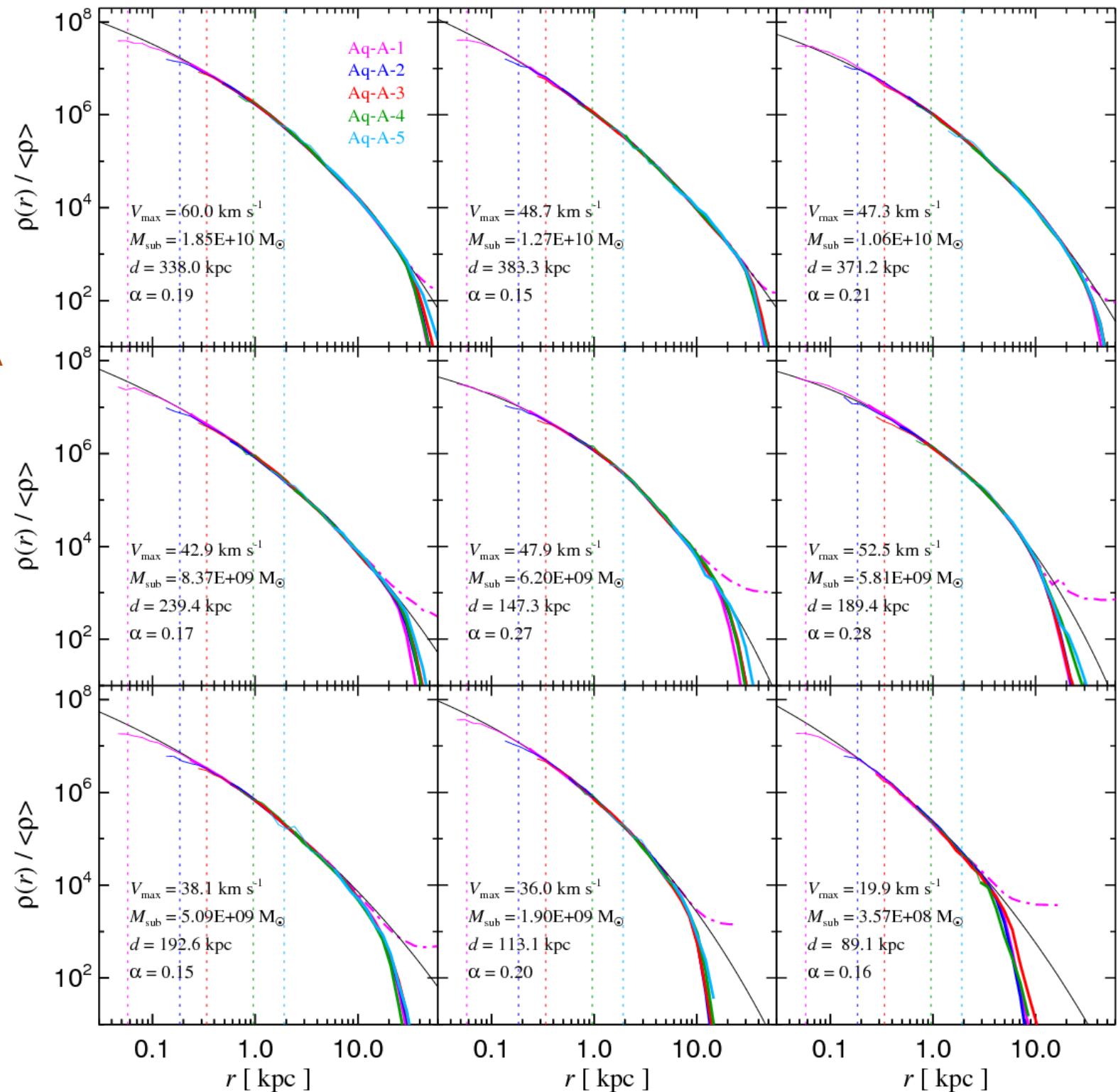
*"The logarithmic slope of the radial density profile is close to a power law, gradually turning over to a slope of -0.8 at our innermost resolved point."*

*"The Einasto profile also provides an excellent fit to the density profiles of the two simulations."*



Our simulations  
allow us to study  
the convergence  
of **subhalo**  
**density profiles**

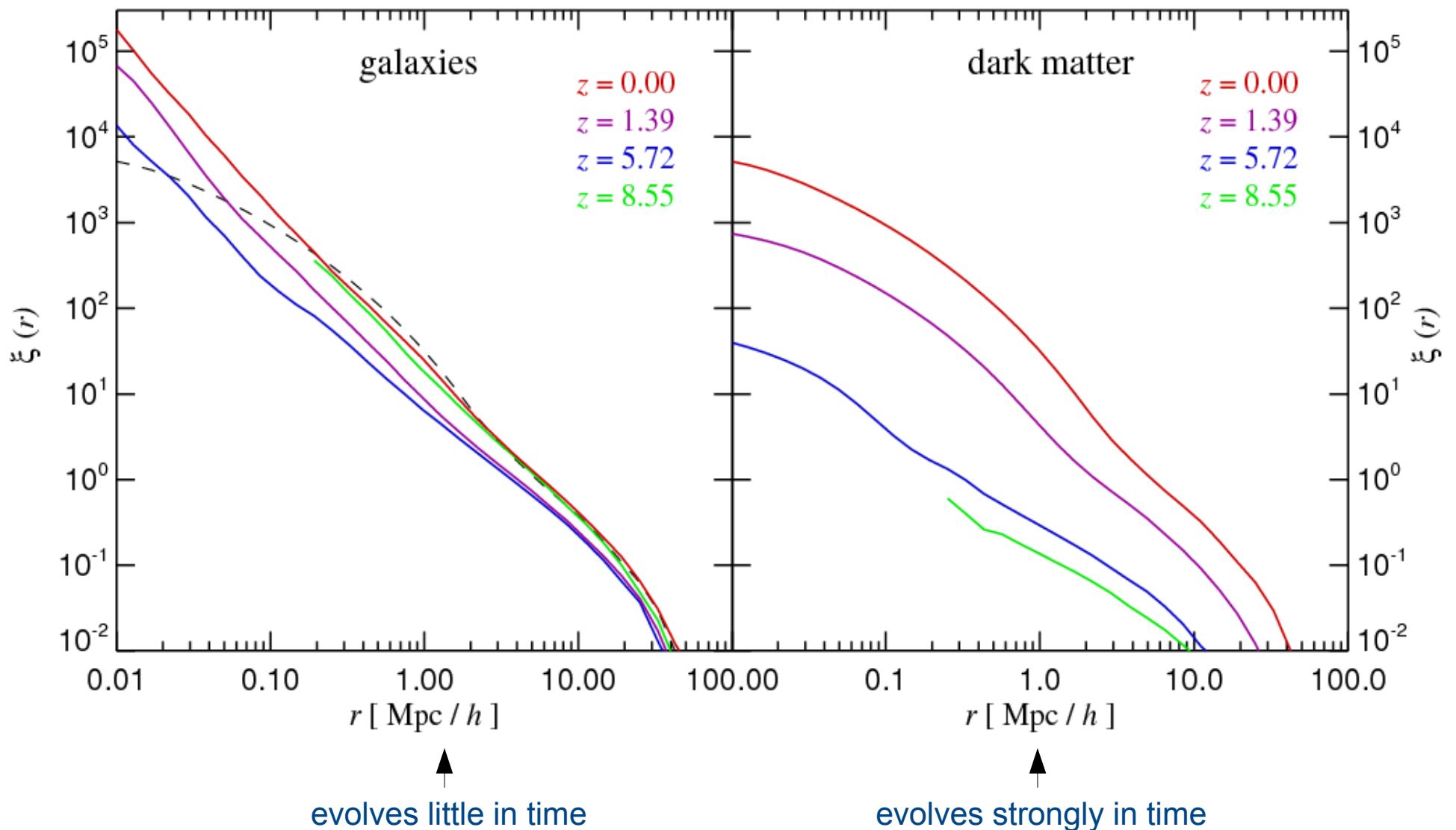
### SPHERICALLY AVERAGED DENSITY PROFILES IN THE AQ-A HALO AT DIFFERENT RESOLUTION



The need for simulations  
with larger volume

The galaxy distribution is **biased** with respect to the mass distribution

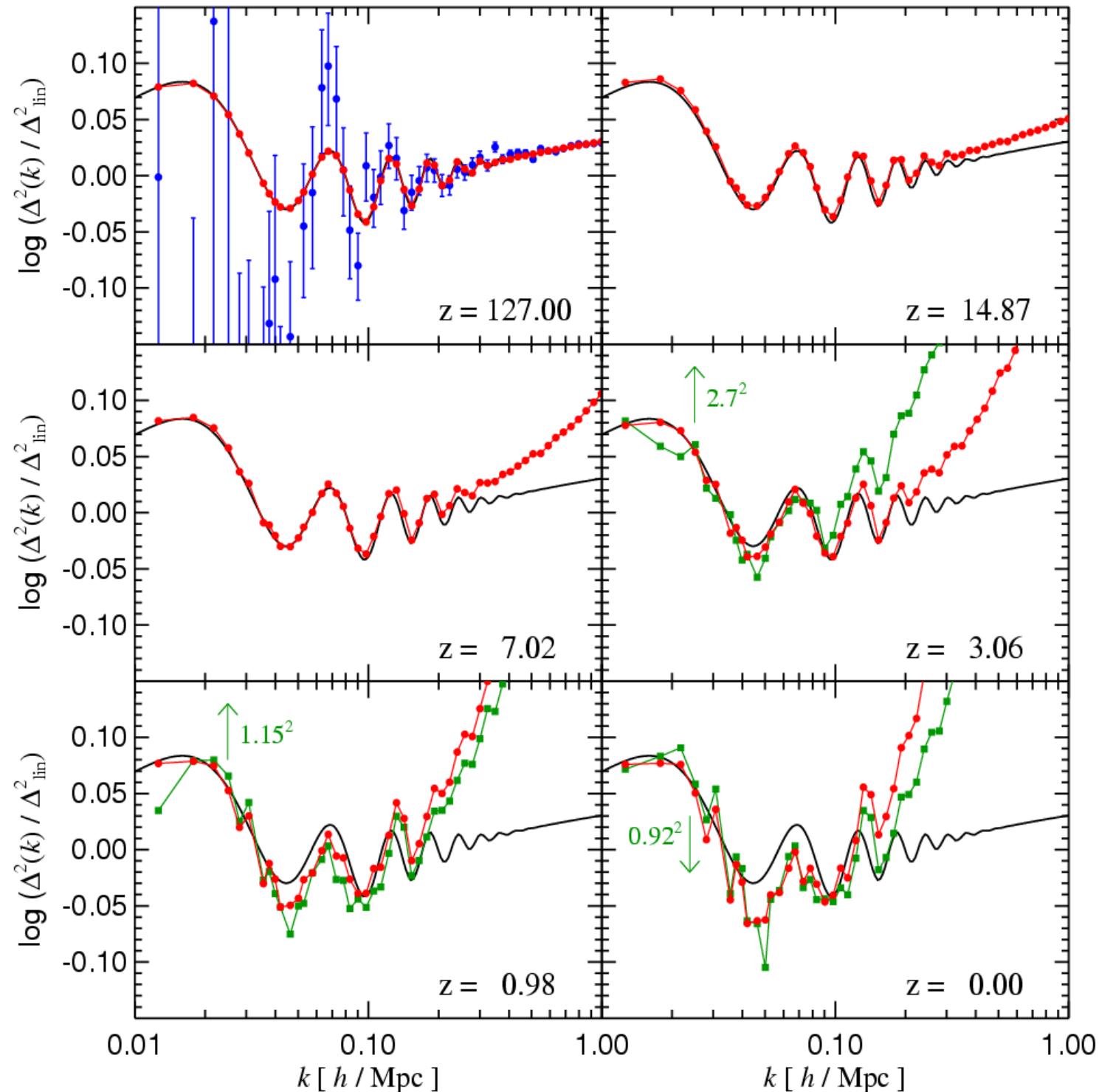
### GALAXY AND MASS CLUSTERING AT DIFFERENT EPOCHS



The baryonic wiggles remain visible in the galaxy distribution down to low redshift and may serve as a "standard ruler" to constrain dark energy

### DARK MATTER AND GALAXY POWER SPECTRA FROM THE MILLENNIUM SIMULATION IN THE REGION OF THE WIGGLES

Springel et al. (2005)



# Large volume simulations are needed for ongoing and future surveys

## GOALS FOR A “MILLENNIUM-XXL” CALCULATION

### Science goals

- Impact of galaxy physics on BAO/growth factor measurements
- Realistic mock catalogs for Pan-STARRS, SDSS-III/BOSS, BigBOSS, etc.
- Exploring galaxy physics in different cosmologies
- Integrated Sachs-Wolfe effect
- Clustering up to  $\sim 500$  Mpc/h, universality of halo bias and mass function, **rare events**, environmental effects, first quasars, etc.

### Desired simulation characteristics

- Box-Size:  $> 3000$  Mpc/h
- Particle mass:  $< \sim 6 \times 10^9 M_{\odot}/h$
- Particle number:  $> 300$  billion particles

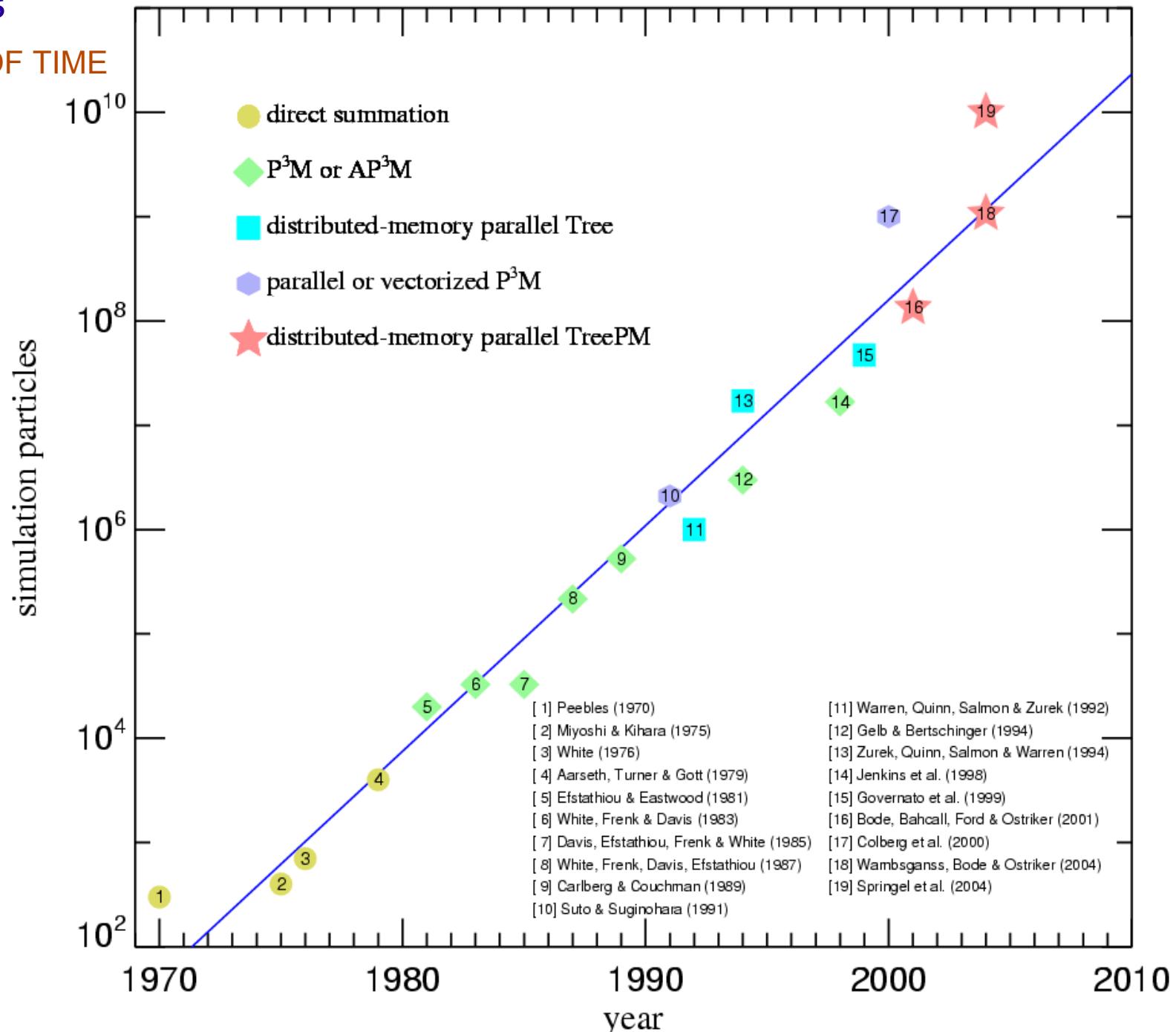
# Cosmological N-body simulations have grown rapidly over the last four decades

Millennium-XXL Project 

## "N" AS A FUNCTION OF TIME

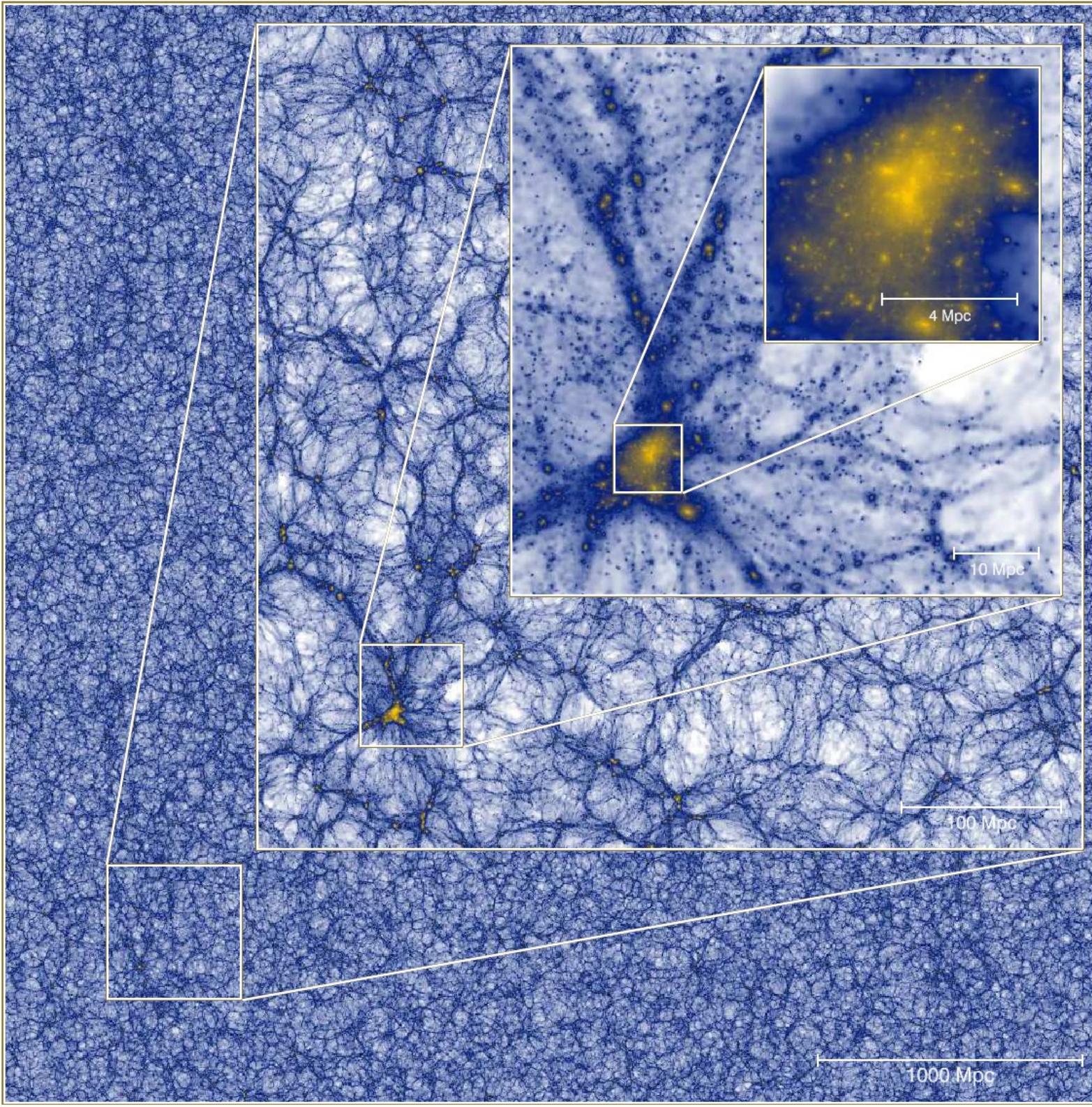
- ▶ Computers double their speed every 18 months (Moore's law)
- ▶ N-body simulations have doubled their size every 16-17 months
- ▶ Recently, growth has accelerated further.

The Millennium Run should have become possible in 2010 – we have done it in 2004 !



# Millennium-XXL

The World's largest  
cosmological simulation



Angulo, Springel,  
White et al. (2011)

# Millennium-XXL was successfully executed on JUROPA in Summer 2010

## PARAMETERS OF FINAL RUN

- ▶  $6720^3 \sim 303$  billion particles
- ▶ 3000 Mpc/h box, Millennium cosmology
- ▶ 12288 cores: 3072 MPI-task / 4 threads  
(70% of Juropa)
- ▶  $9216^3$  FFT mesh
- ▶ 86 trillion force calculations
- ▶ Cost: 2.7 million CPU hours (~300 years), corresponding to 9.3 days wallclock time (including FOF+SUBFIND)
- ▶ Peak memory usage: 29 TB (105 bytes/particle)
- ▶ 700 million halos at  $z=0$  (44% of particles)
- ▶ About 25 billion (sub)halos in merger trees
- ▶ Largest cluster has  $9 \times 10^{15} M_{\odot}$
- ▶ Size of a full snapshot: ~10 TB

JUROPA  
Jülich  
Forschungszentrum



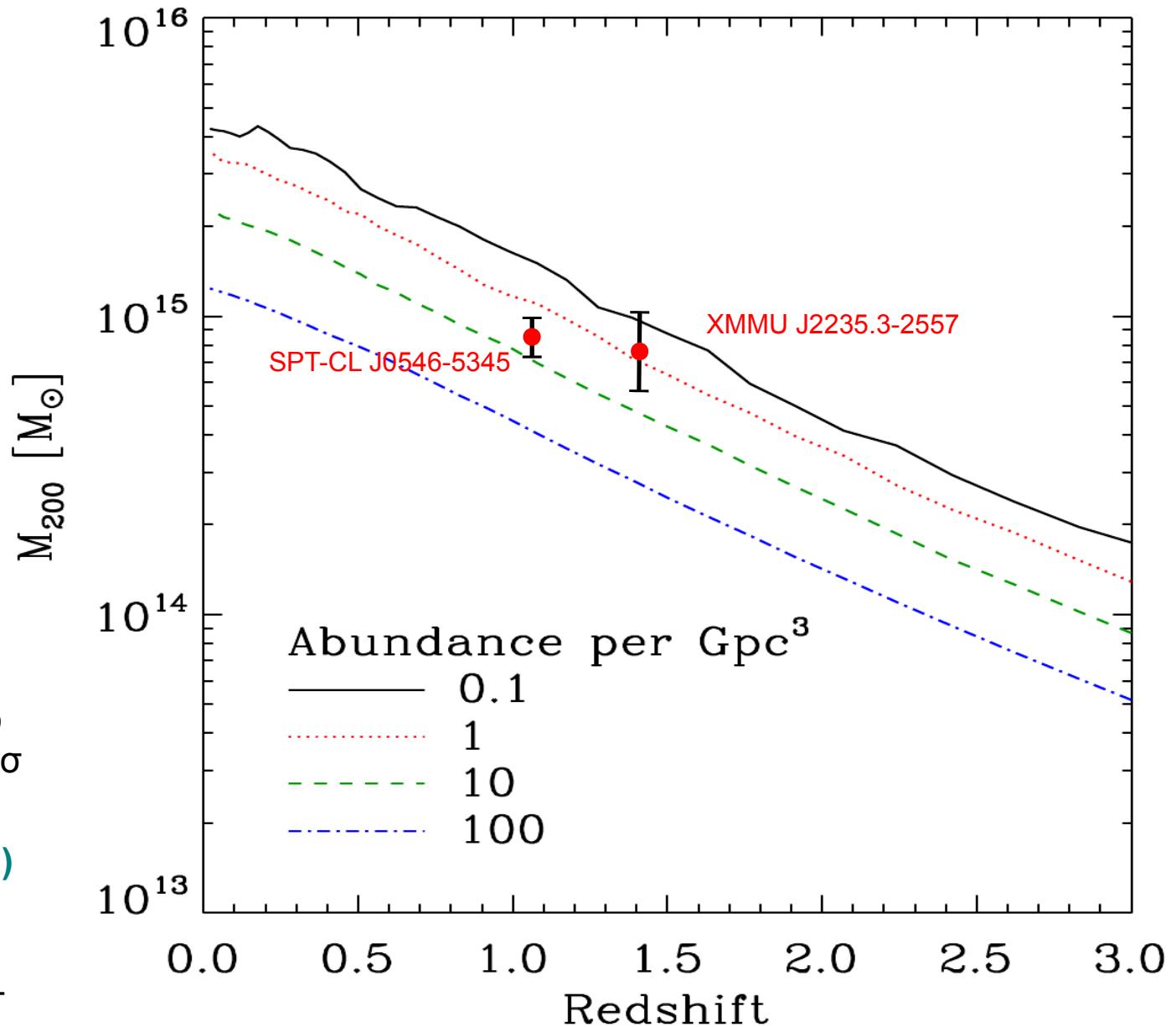
# Are the presently known high-mass clusters still consistent with $\Lambda$ CDM?

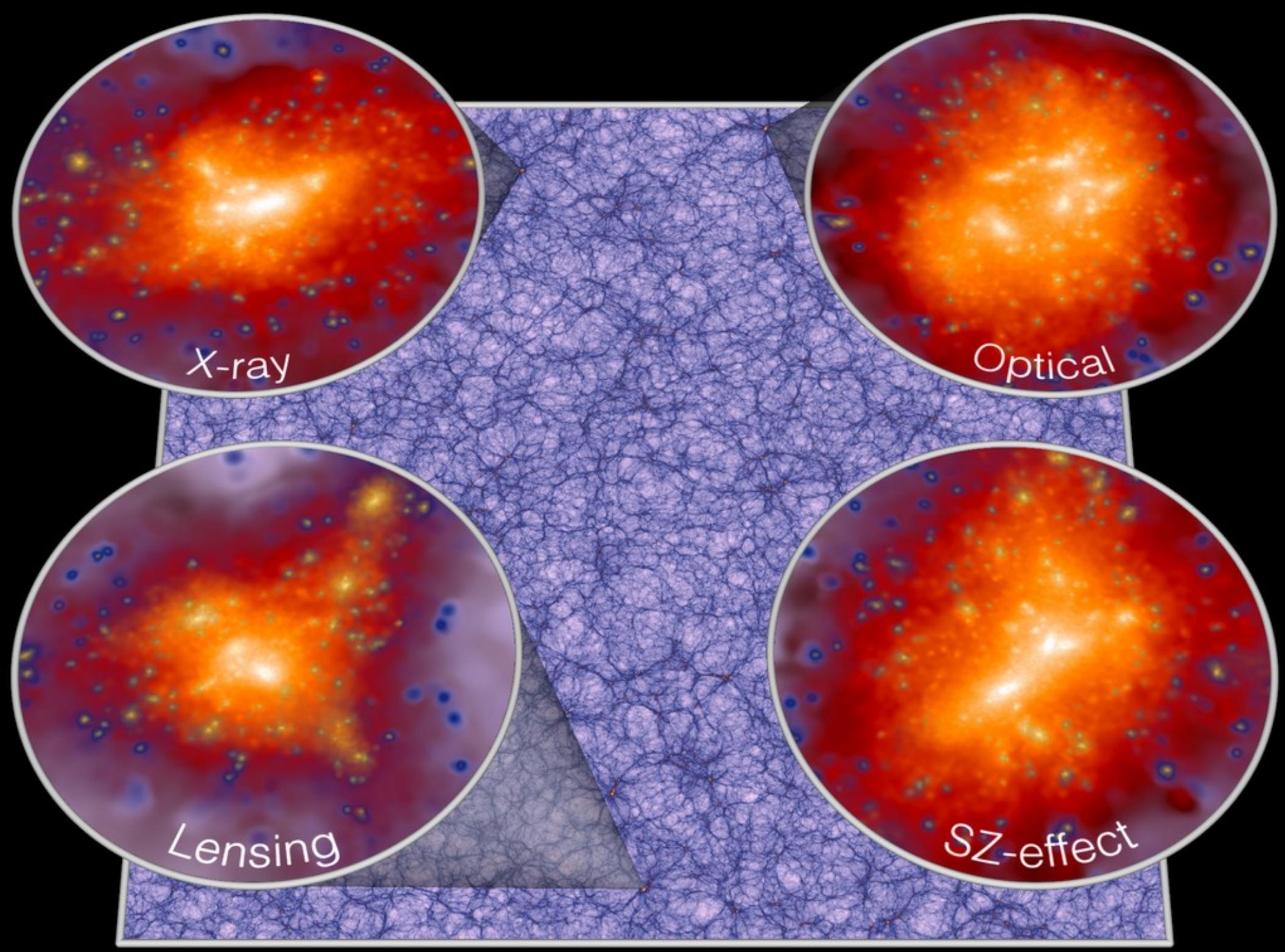
## CLUSTER MASS FOR GIVEN ABUNDANCE AS A FUNCTION OF TIME

Detection of one  
violating cluster would  
invalidate  $\Lambda$ CDM

Holz & Perlmutter (2010)  
argued XMMU J2235.3-2557 to  
be inconsistent with  $\Lambda$ CDM at  $3\sigma$

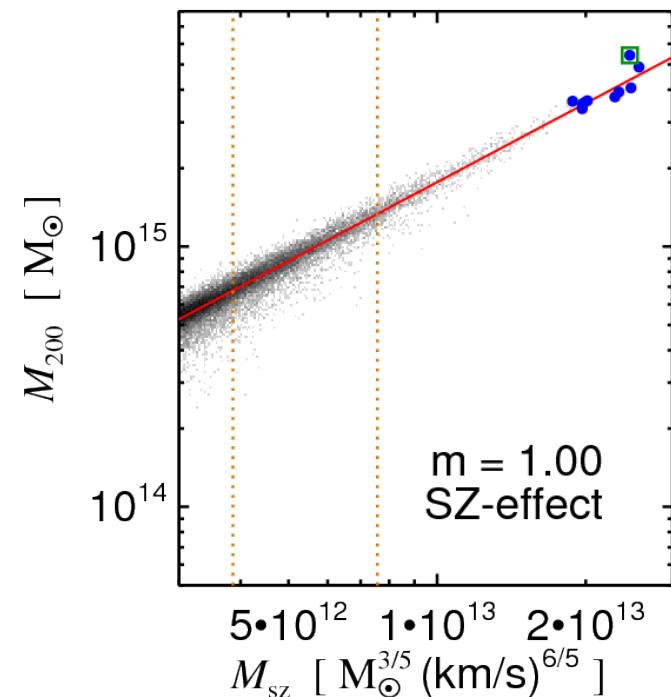
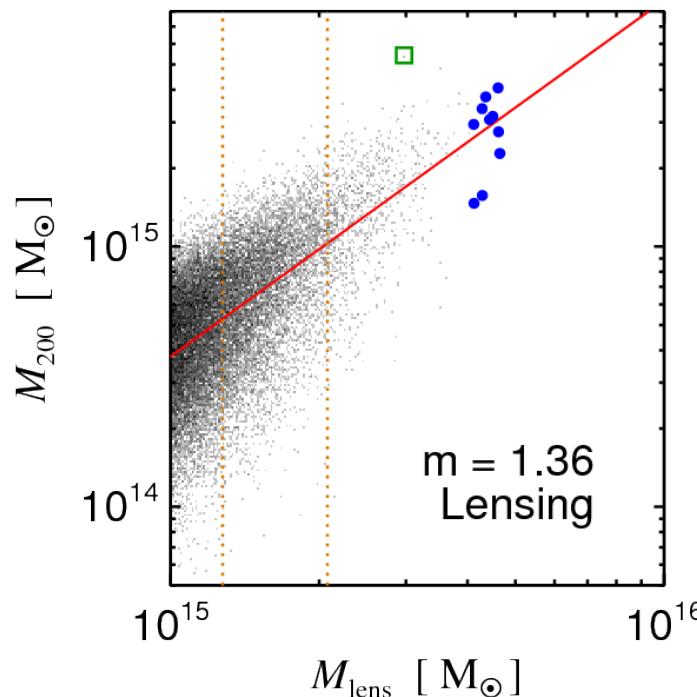
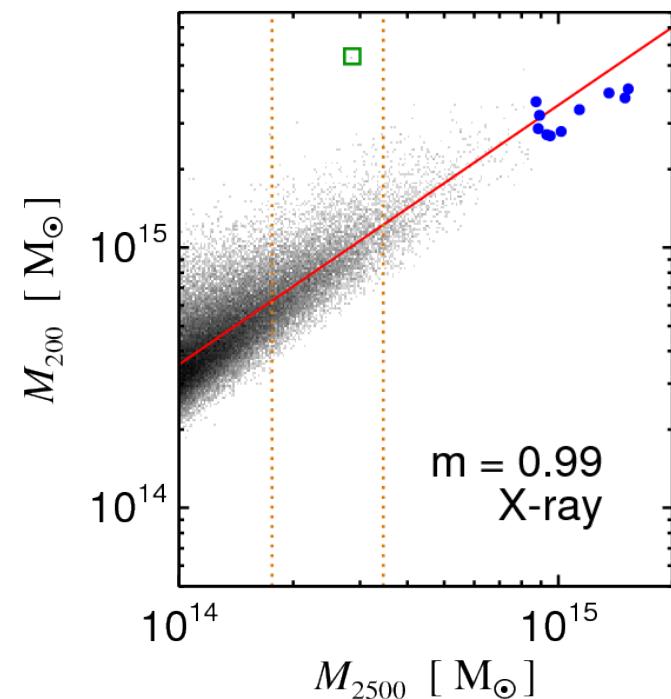
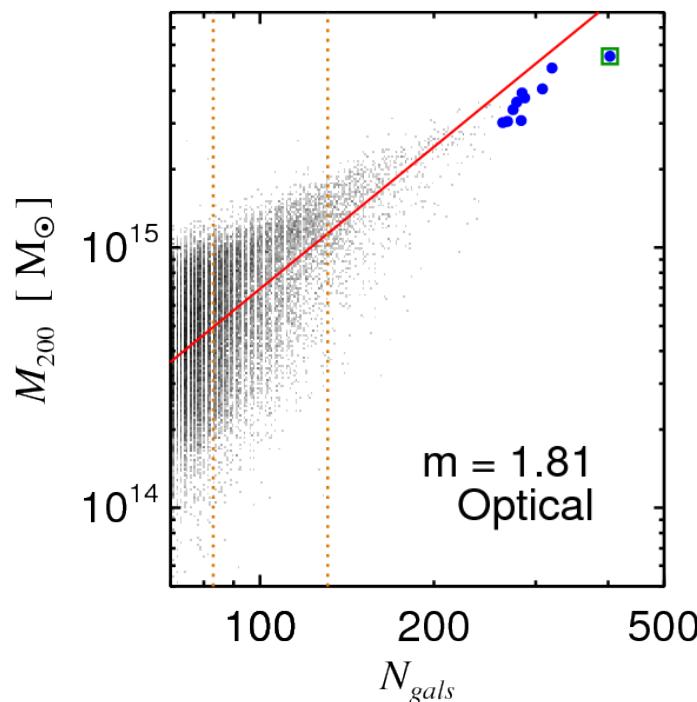
Boyle, Jiminez & Verde (2010)  
argue that  $\sigma_8$  would have to be  
 $\sim 4\sigma$  higher to accommodate  
massive clusters. Suggest non-  
Gaussian ICs as a solution.





# Diversity in the Extreme

THE MOST MASSIVE AND RAREST CLUSTERS FOLLOW THE SCALING RELATIONS EXPECTED FROM MORE ABUNDANT SMALLER SYSTEMS



So far reported massive clusters not in conflict with  $\Lambda$ CDM (yet)

Angulo et al. (2011)

# Conclusions

## Dark matter dynamics can be studied with high precision in cosmological N-body simulations

- Ultra high-resolution simulations begin to reliably resolve the inner dark matter cusp, both for the main halo and its subhalos.  
The inner profiles become gradually shallower – no sign of an asymptotic power-law slope.
- The phase-space structure of dark matter halos is extremely complex and lumpy.  
Less than ~18% of the mass of a typical Milky Way halo is expected to be in dark matter substructures. There *is* a smooth component in the halo, and the halo is very smooth at the position of the Sun.
- The smooth halo component shows residual structure in energy space, which affects direct detection experiments: WIMP recoil rates are changed at the 10% level, while axion experiments may even obtain clues about the formation history of the Milky Way.
- For dark matter annihilation radiation, the central cusp is the most promising target for detection if observed some angle away from the Galactic centre.
- If the central cusp is strongly detected, subhalos may also be detectable. The highest S/N subhalos are smaller and closer than the known satellites, and may contain no stars.
- At present, the most massive galaxy clusters known are not yet in serious tension with the LCDM model.