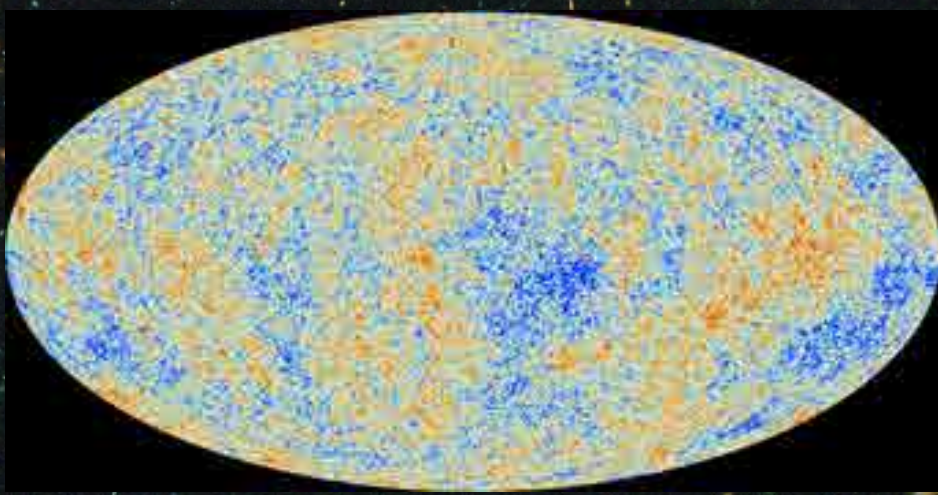


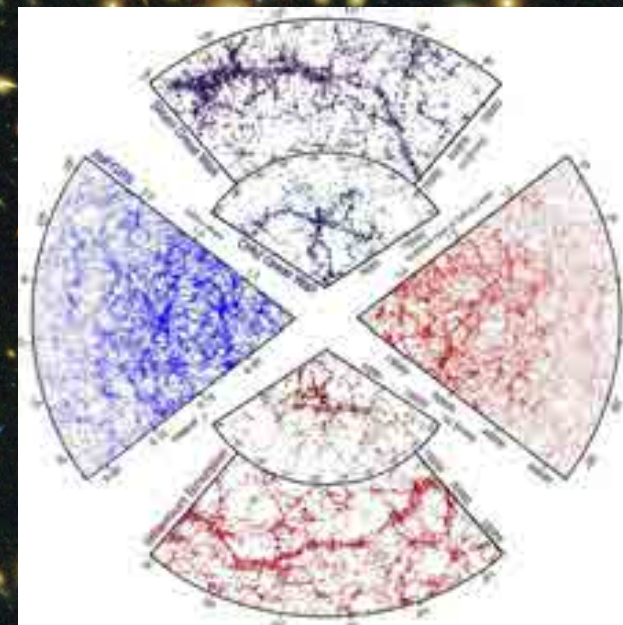
*IPMU, November 2015*



# The formation and evolution of the galaxy population

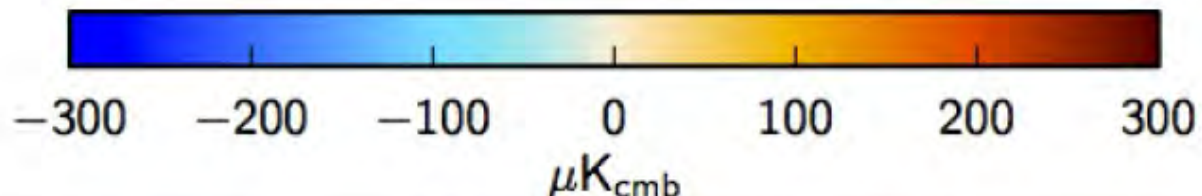
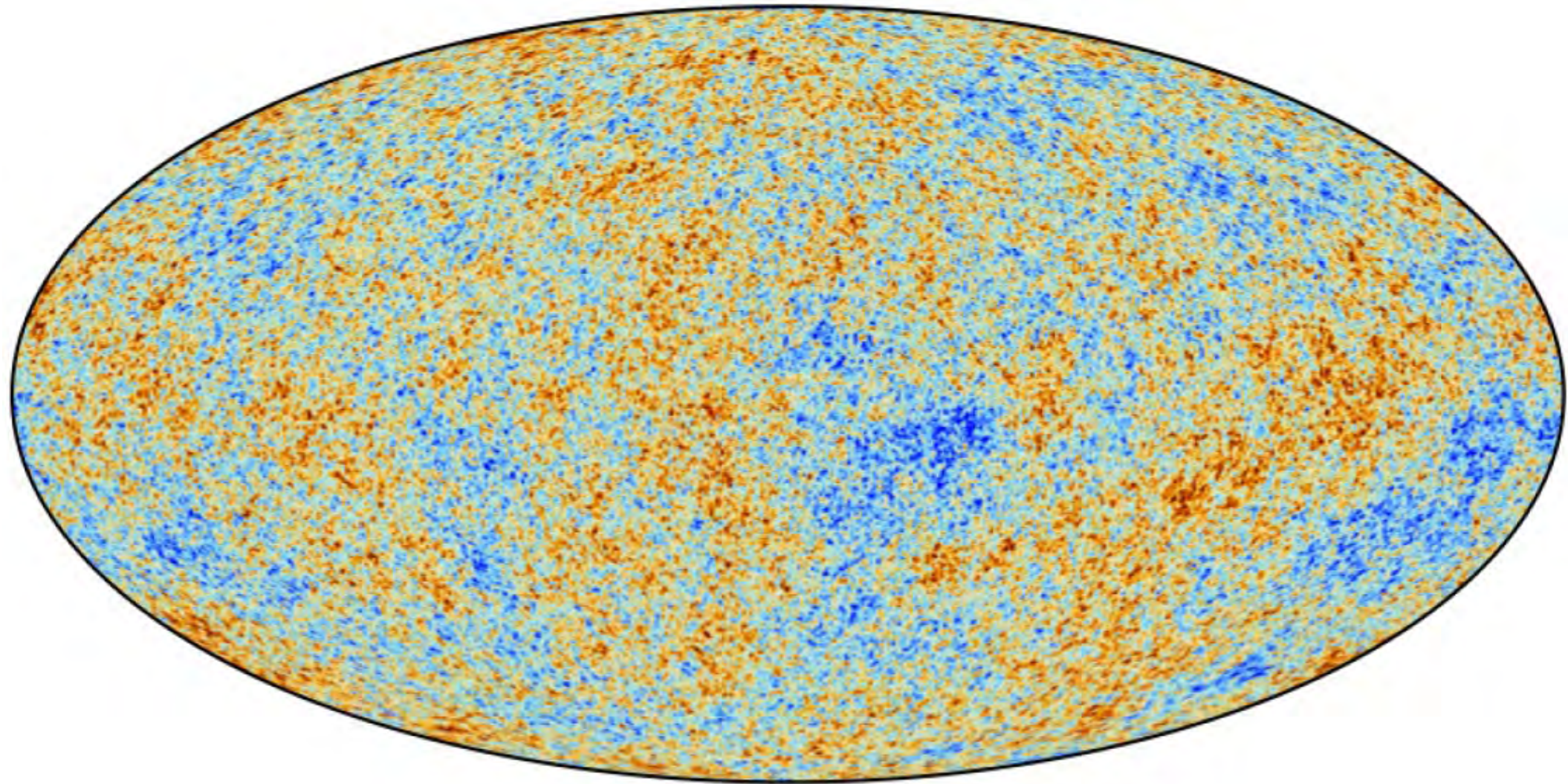
*Simon White*

*Max Planck Institute for Astrophysics*

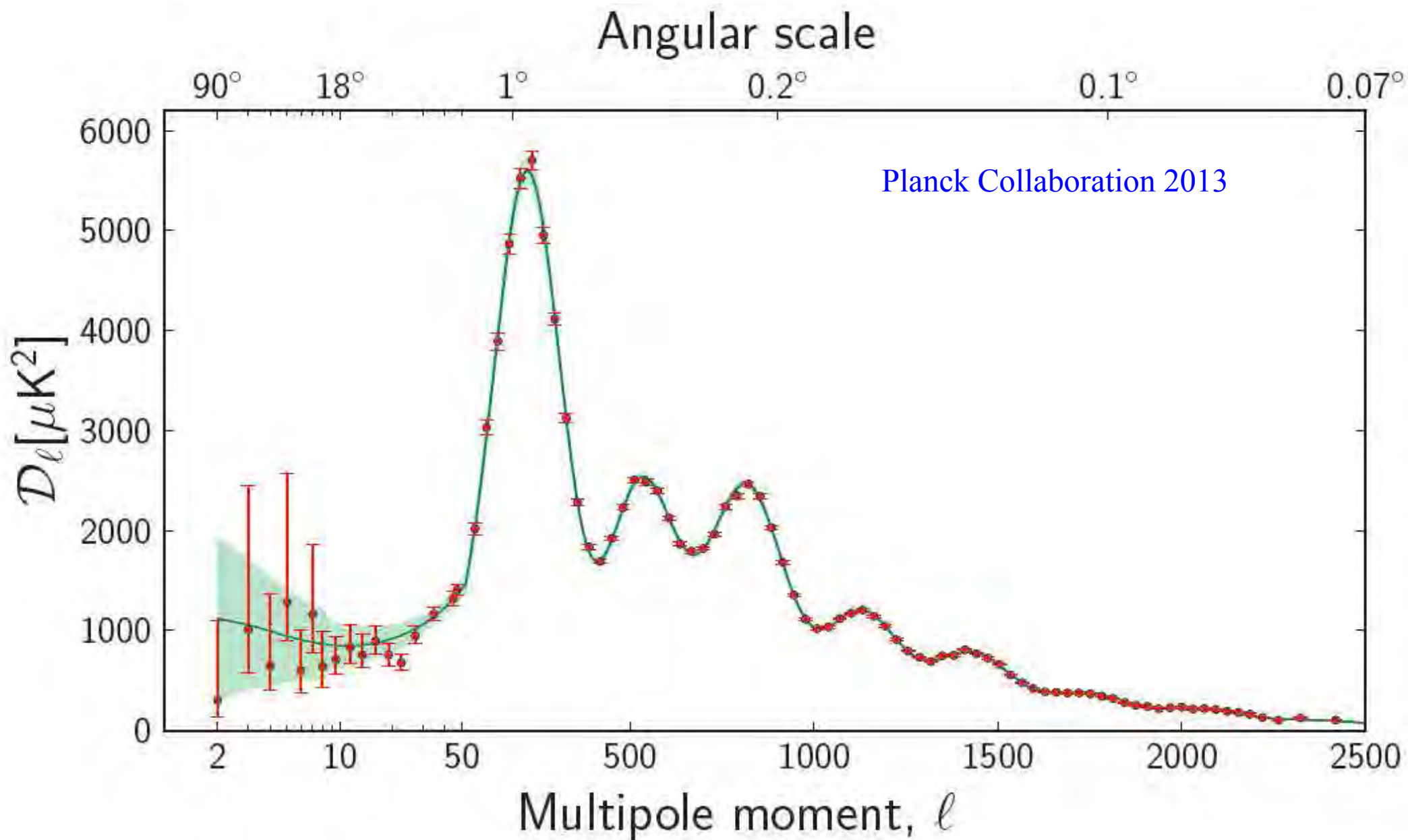




# *Planck* CMB map: the IC's for structure formation



# Information content of the *Planck* CMB map





# The six parameters of the minimal $\Lambda$ CDM model

Planck Collaboration 2013

*Planck*+WP

Parameter	Best fit	68% limits
$\Omega_b h^2$ . . . . .	0.022032	$0.02205 \pm 0.00028$
$\Omega_c h^2$ . . . . .	0.12038	$0.1199 \pm 0.0027$
$100\theta_{MC}$ . . . . .	1.04119	$1.04131 \pm 0.00063$
$\tau$ . . . . .	0.0925	$0.089^{+0.012}_{-0.014}$
$n_s$ . . . . .	0.9619	$0.9603 \pm 0.0073$
$\ln(10^{10} A_s)$ . . . . .	3.0980	$3.089^{+0.024}_{-0.027}$

# The six parameters of the minimal $\Lambda$ CDM model

Planck Collaboration 2013

*Planck*+WP

Parameter	A 1.5% measurement of the cosmic baryon density	
$\Omega_b h^2$ . . . . .	0.022032	0.02205 $\pm$ 0.00028
$\Omega_c h^2$ . . . . .	0.12038	0.1199 $\pm$ 0.0027
$100\theta_{MC}$	A 40 $\sigma$ detection of nonbaryonic DM using <i>only</i> $z \sim 1000$ data!	
$\tau$ . . . . .	0.0925	0.089 <sup>+0.012</sup> <sub>-0.014</sub>
$n_s$ . . . . .	0.9619	0.9603 $\pm$ 0.0073
$\ln(10^{10} A_s)$ . . . . .	3.0980	3.089 <sup>+0.024</sup> <sub>-0.027</sub>

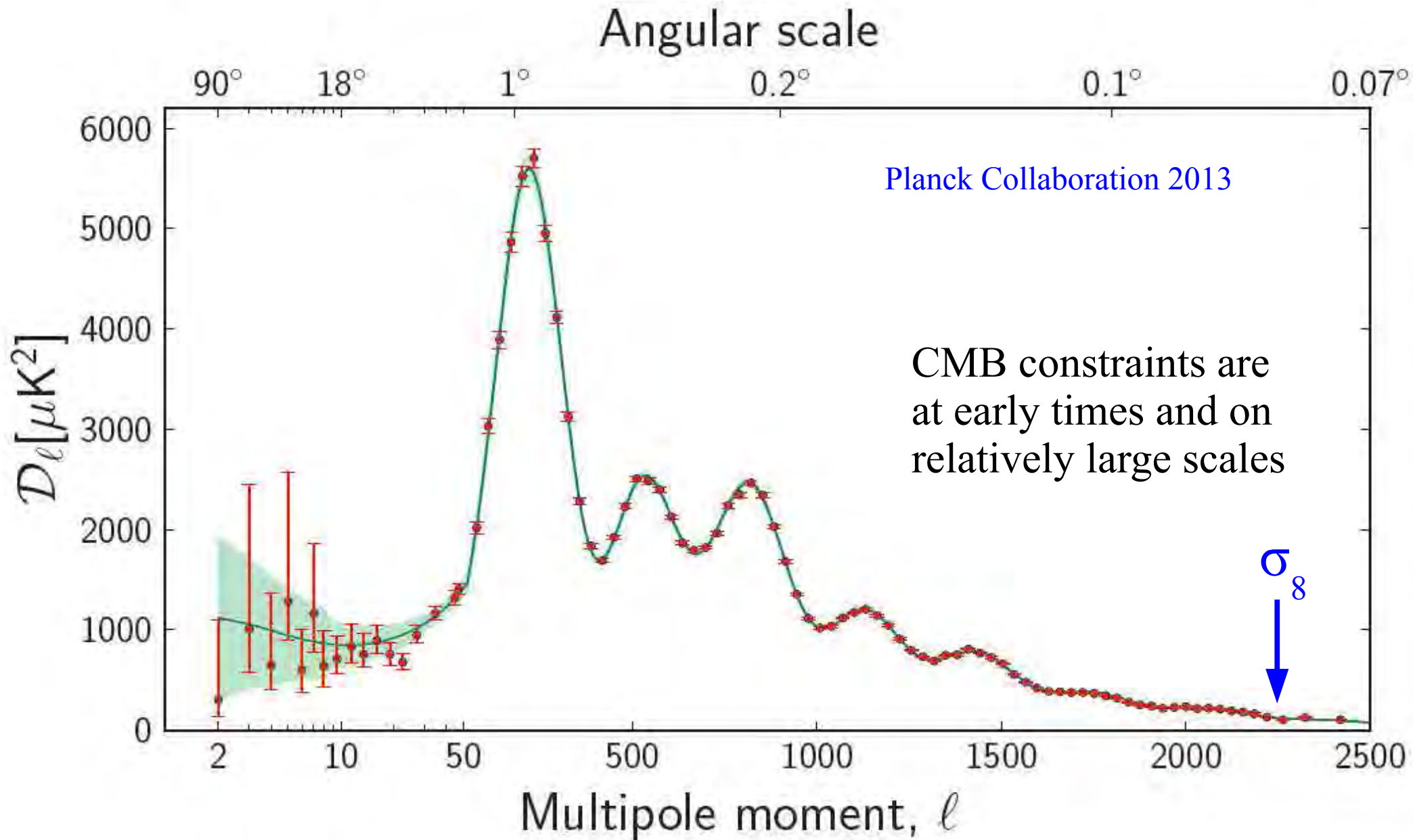
# The six parameters of the minimal $\Lambda$ CDM model

Planck Collaboration 2013

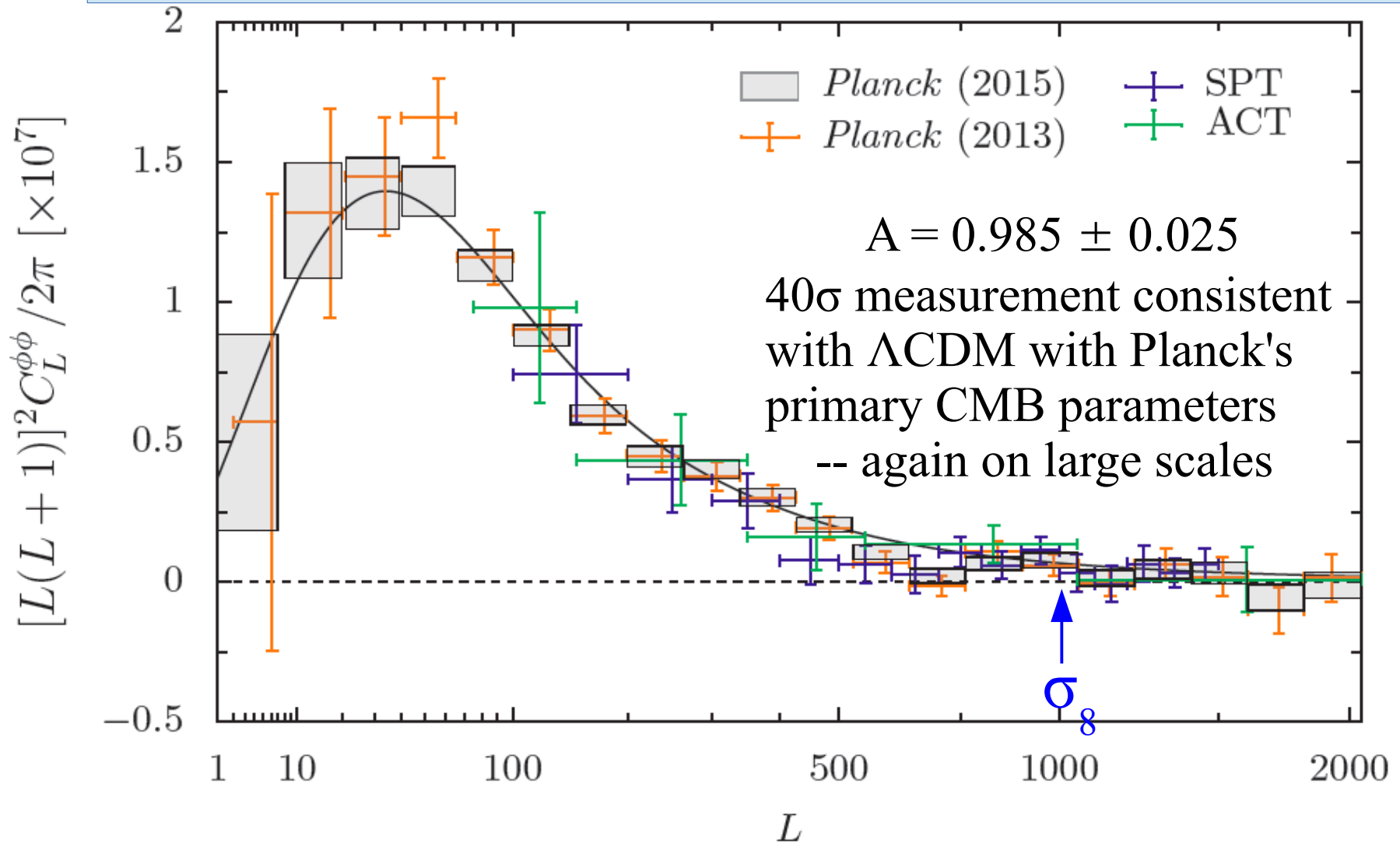
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$\tau$	86 $\sigma$ in 2015 using <i>Planck</i> data alone!!	
$n_s$	0.9619	0.9603 $\pm$ 0.0073
$\ln(10^{10} A_s)$	3.0980	3.089 <sup>+0.024</sup> <sub>-0.027</sub>

# Information content of the *Planck* CMB map



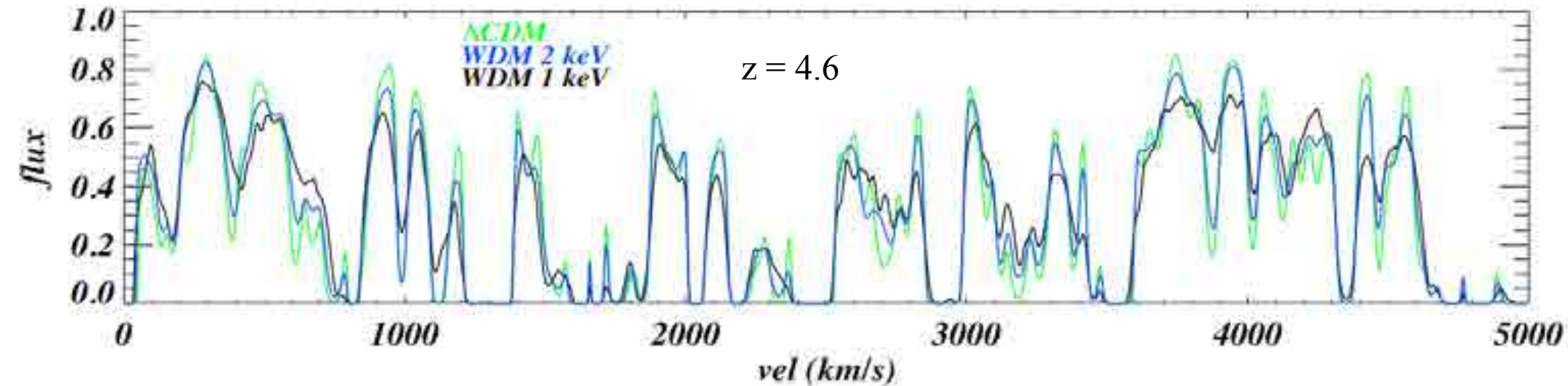
# Late-time mass fluctuations from CMB lensing





# Ly $\alpha$ forest spectra and small-scale initial structure

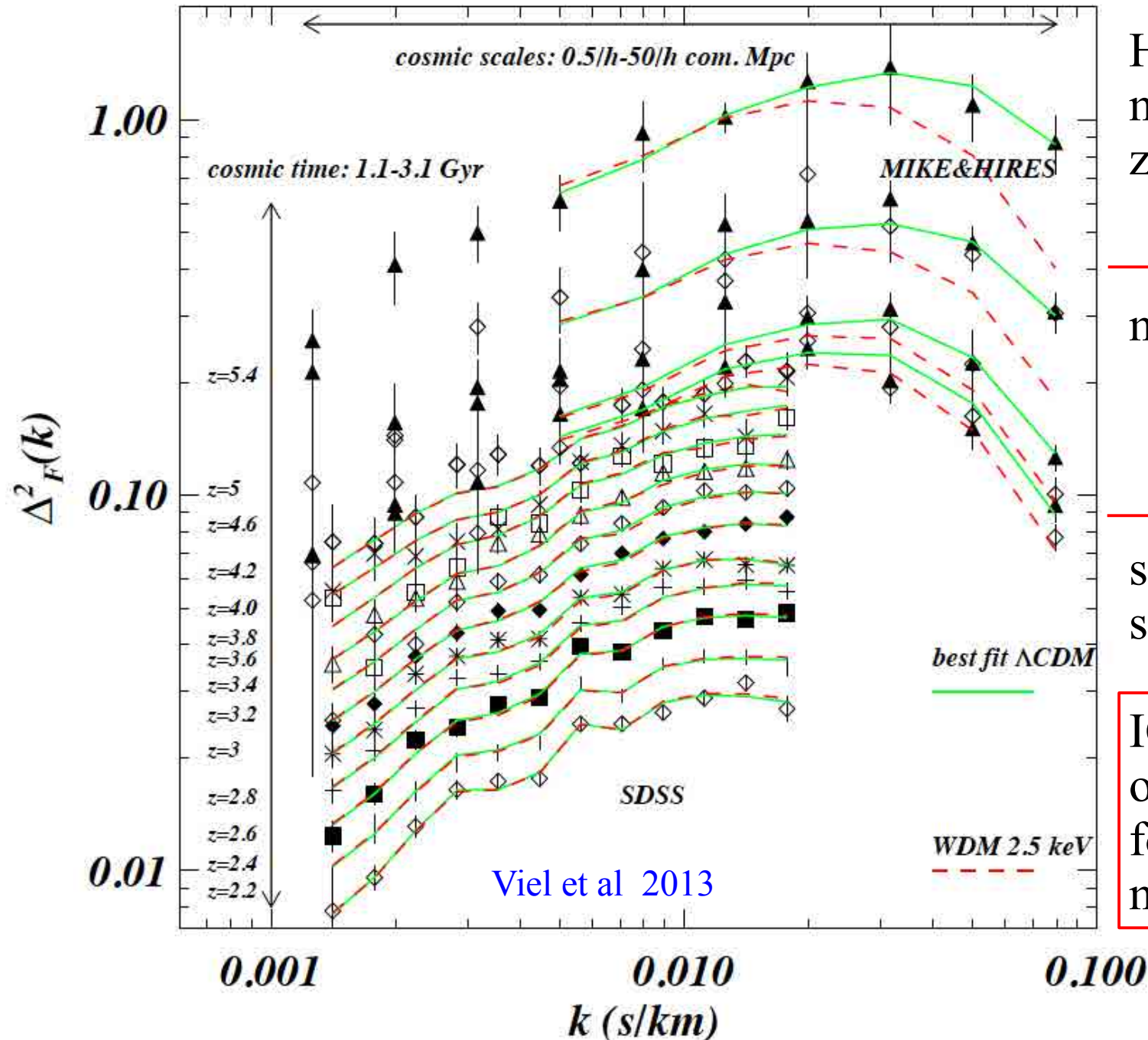
Viel, Becker, Bolton & Haehnelt 2013



Transmitted quasar flux in hydrodynamic simulations of the intergalactic medium in  $\Lambda$ CDM and WDM models.

High-frequency power is missing in the WDM case

# Lyman $\alpha$ forest spectra for WDM relative to $\Lambda$ CDM



High-resolution spectra match  $\Lambda$ CDM up to  $z = 5.4$

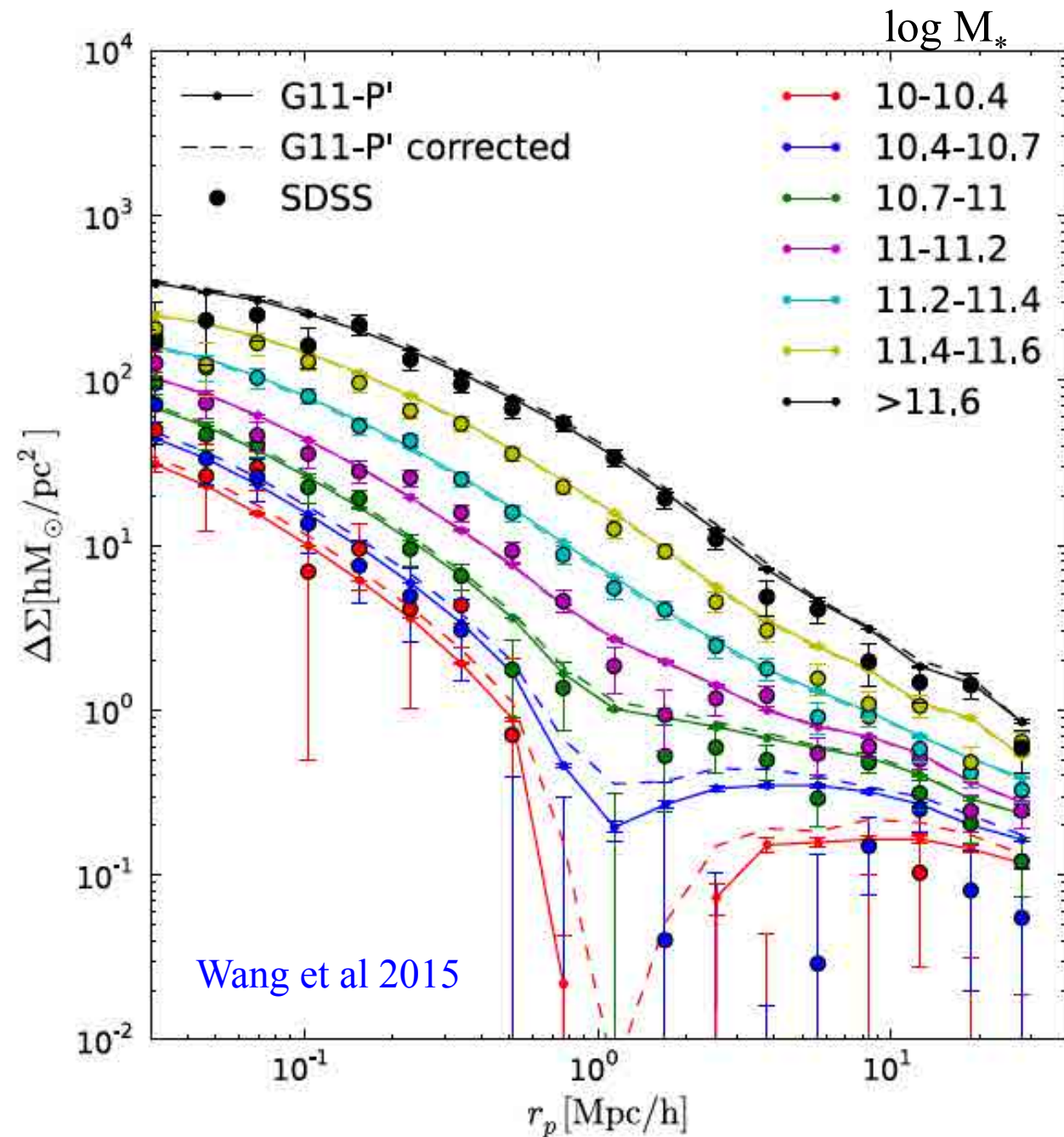
→  $2\sigma$  lower limit on the mass of a thermal relic  $m_{\text{WDM}} > 3.3 \text{ keV}$

→ WDM can affect the structure only of the smallest galaxies

IC's are well measured on all scales relevant for the formation of the main galaxy population



# Mean mass profiles around low-redshift galaxies



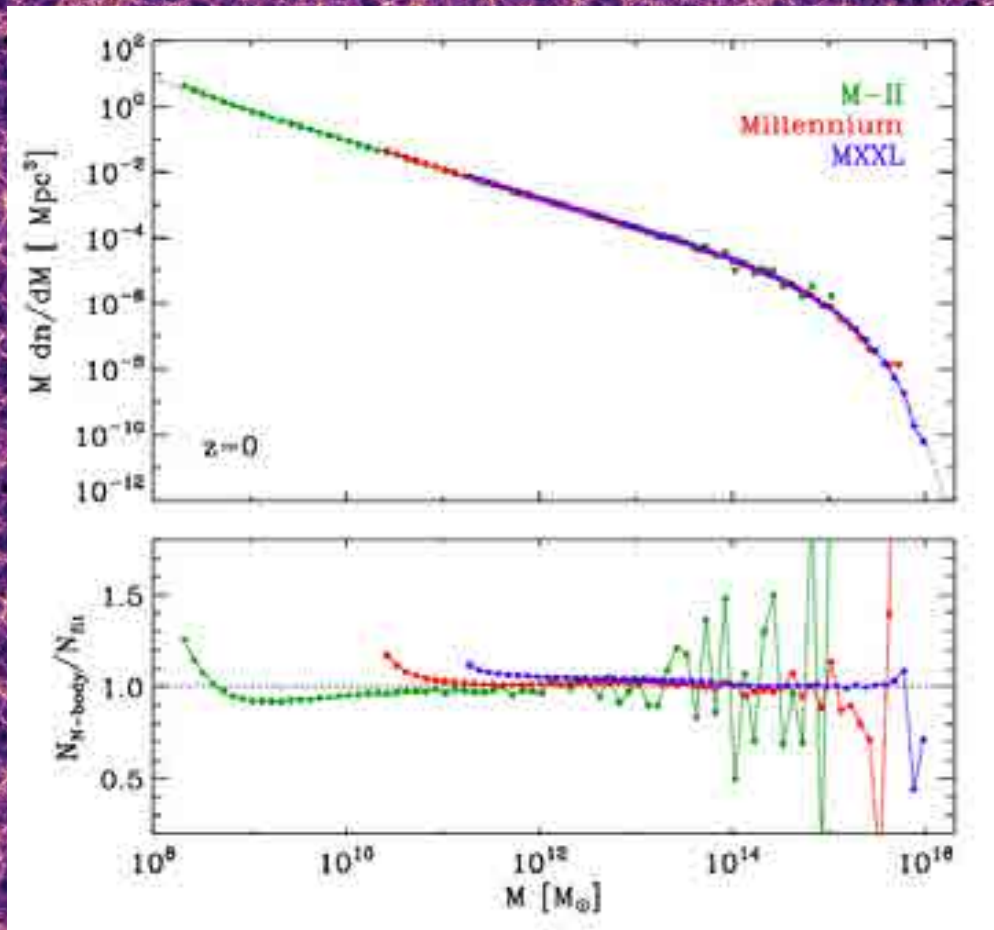
Points are mean weak lensing profiles around SDSS “central” galaxies as a function of their stellar mass.

Lines are from a simulation of the formation of the galaxy population within  $\Lambda$ CDM, assuming Planck parameters.

No simulation parameters were adjusted in this comparison, but the agreement does depend on the astrophysical modelling.



N-body codes can simulate the evolution of the abundance, internal structure and clustering of dark halos at high precision





N-body codes can simulate the evolution of the abundance, internal structure and clustering of dark halos at high precision

Galaxies correspond to self-bound *subhalos* within halos, rather than to the halos themselves

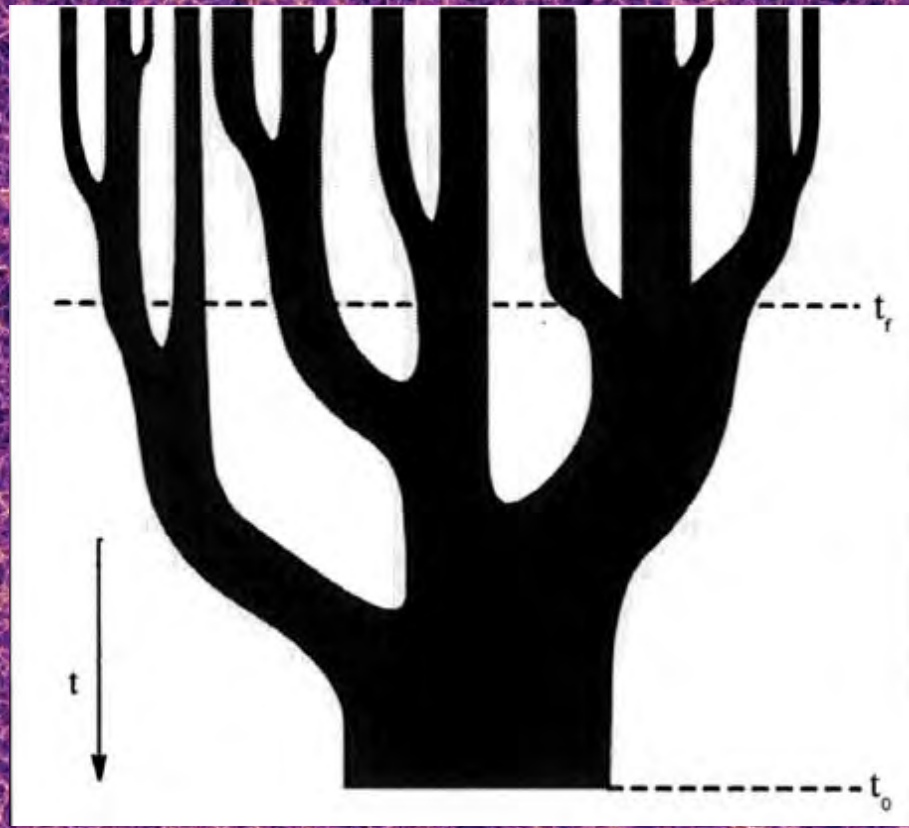




N-body codes can simulate the evolution of the abundance, internal structure and clustering of dark halos at high precision

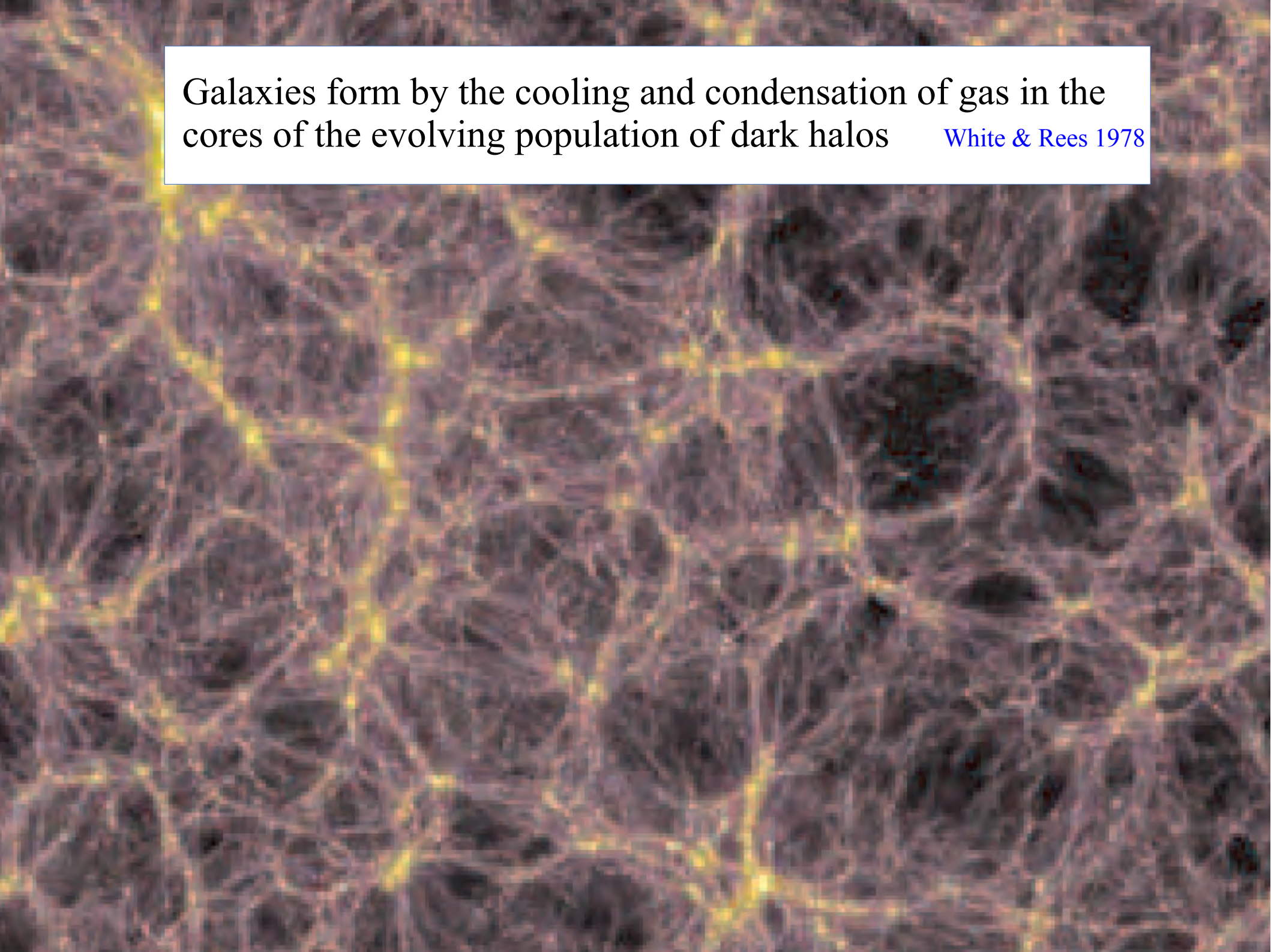
Galaxies correspond to self-bound *subhalos* within halos, rather than to the halos themselves

The information relevant to galaxy formation is encoded in *subhalo merger trees*

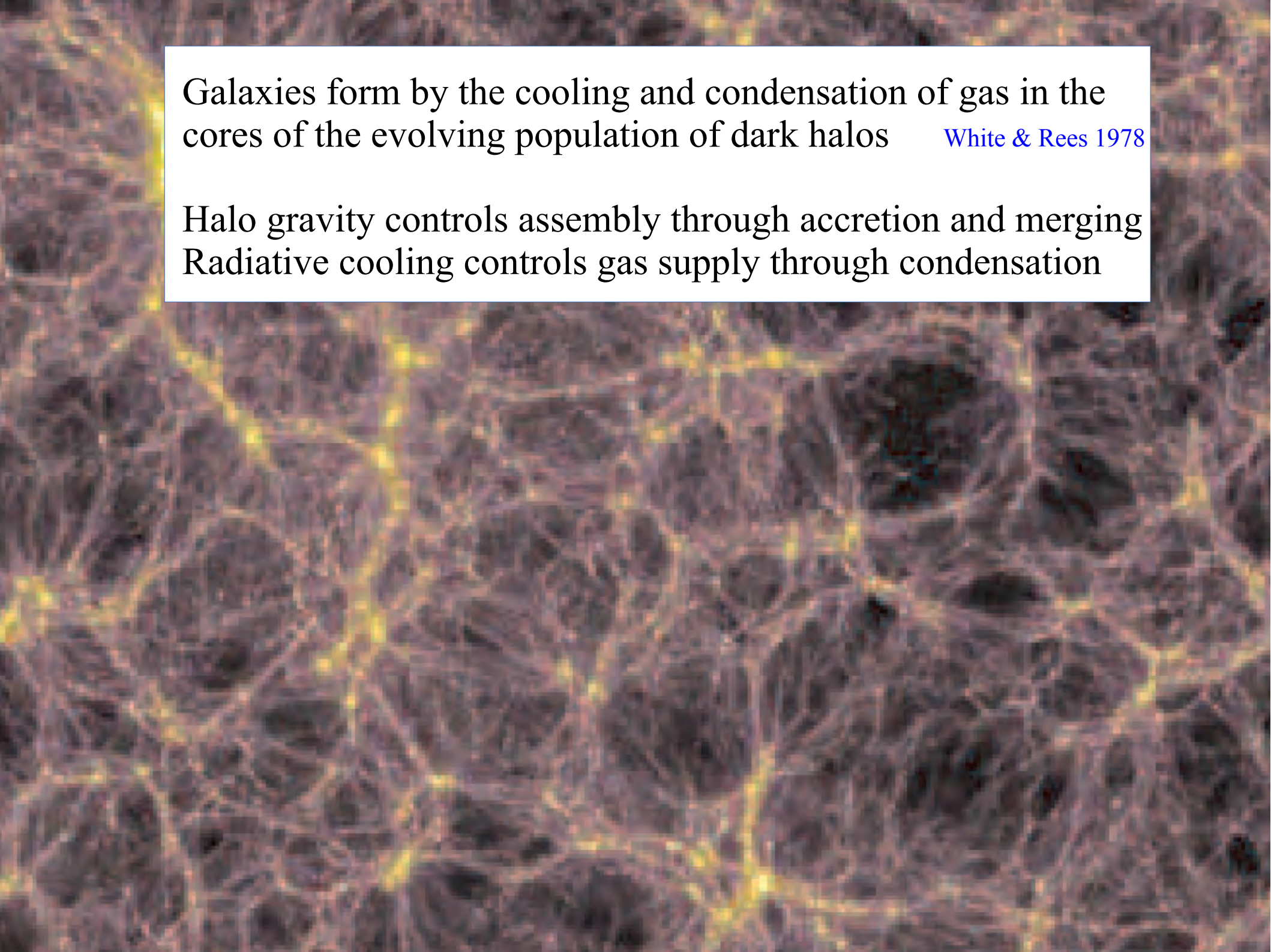




Galaxies form by the cooling and condensation of gas in the cores of the evolving population of dark halos [White & Rees 1978](#)





A visualization of the cosmic web, showing a complex network of dark matter filaments and nodes. The filaments are represented by thin, interconnected lines in shades of purple, blue, and yellow, forming a dense, interconnected structure. The background is dark, with some lighter patches indicating the distribution of matter.

Galaxies form by the cooling and condensation of gas in the cores of the evolving population of dark halos [White & Rees 1978](#)

Halo gravity controls assembly through accretion and merging  
Radiative cooling controls gas supply through condensation



Galaxies form by the cooling and condensation of gas in the cores of the evolving population of dark halos White & Rees 1978

Halo gravity controls assembly through accretion and merging  
Radiative cooling controls gas supply through condensation

White & Frenk 1991

We distinguish two different cases. When  $r_{\text{cool}}$  is larger than the virialized region of a halo, cooling is so rapid that infalling gas never comes to hydrostatic equilibrium. The supply of cold gas for star formation is then limited by the infall rate rather than by cooling. When  $r_{\text{cool}}$  lies deep within the halo, the accretion shock radiates only weakly, a quasi-static atmosphere forms, and the supply of cold gas for star formation is regulated by radiative losses near  $r_{\text{cool}}$ .

Thus, when  $r_{\text{cool}} \gg r_{\text{vir}}$ ,

$$\dot{M}_{\text{inf}}(V_c, z) = 0.15 f_g \Omega_b V_c^{-3} G^{-1} .$$

rapid infall  
“cold flows”

In the opposite limit,  $r_{\text{cool}} \ll r_{\text{vir}}$ ,

$$\dot{M}_{\text{cool}}(V_c, z) = 4\pi\rho_g(r_{\text{cool}})r_{\text{cool}}^2 \frac{dr_{\text{cool}}}{dt}$$

radiative settling  
“cooling flows”

Galaxies form by the cooling and condensation of gas in the cores of the evolving population of dark halos White & Rees 1978

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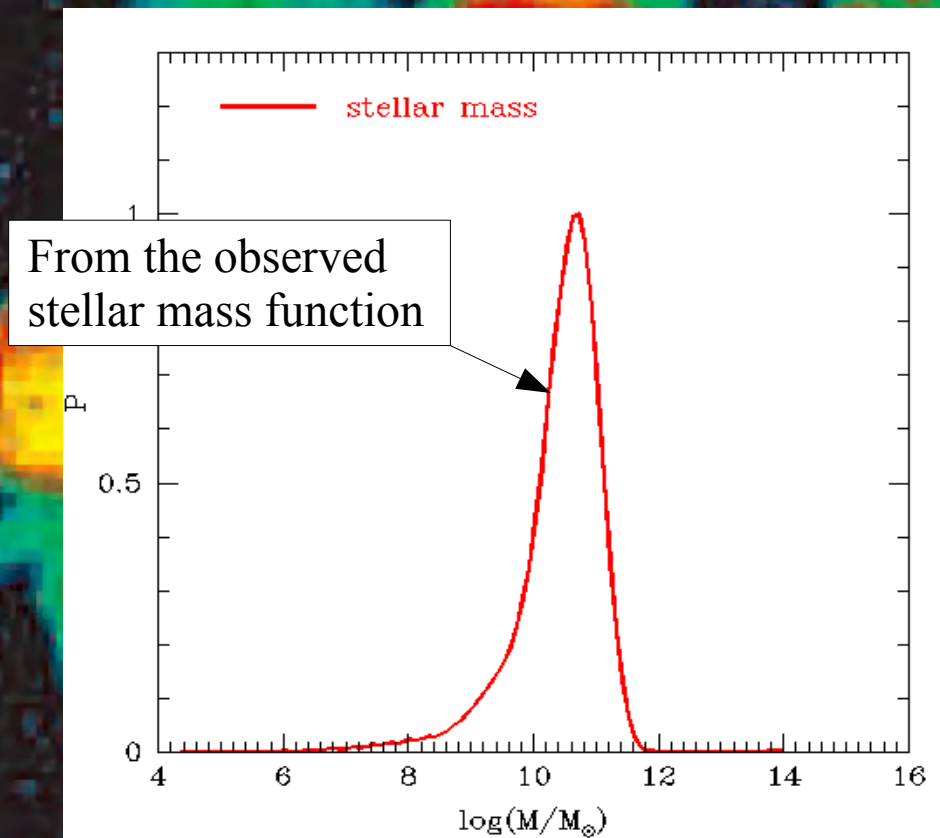
**low mass, hi z**  $\dot{M}_{\text{inf}}(V_c, z) = 0.15 f_g \Omega_b V_c^{-3} G^{-1}$  . rapid infall  
“cold flows”

In the opposite limit,  $r_{\text{cool}} \ll r_{\text{vir}}$ ,

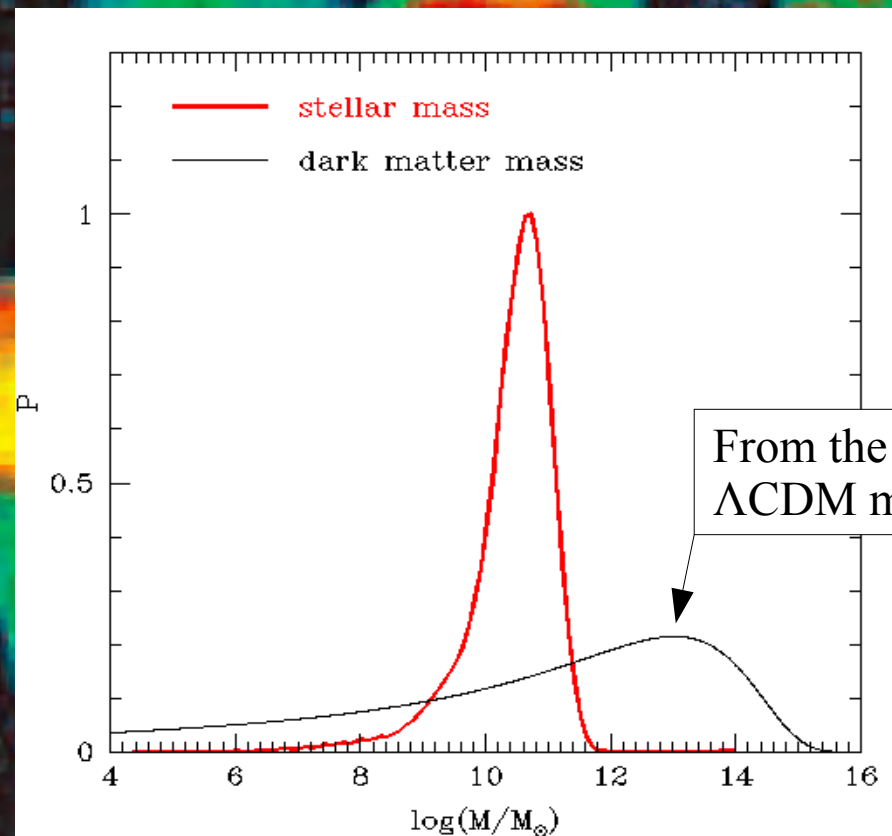
**hi mass, low z**  $\dot{M}_{\text{cool}}(V_c, z) = 4\pi\rho_g(r_{\text{cool}})r_{\text{cool}}^2 \frac{dr_{\text{cool}}}{dt}$  radiative settling  
“cooling flows”



Most stars are in galaxies similar in mass to the Milky Way



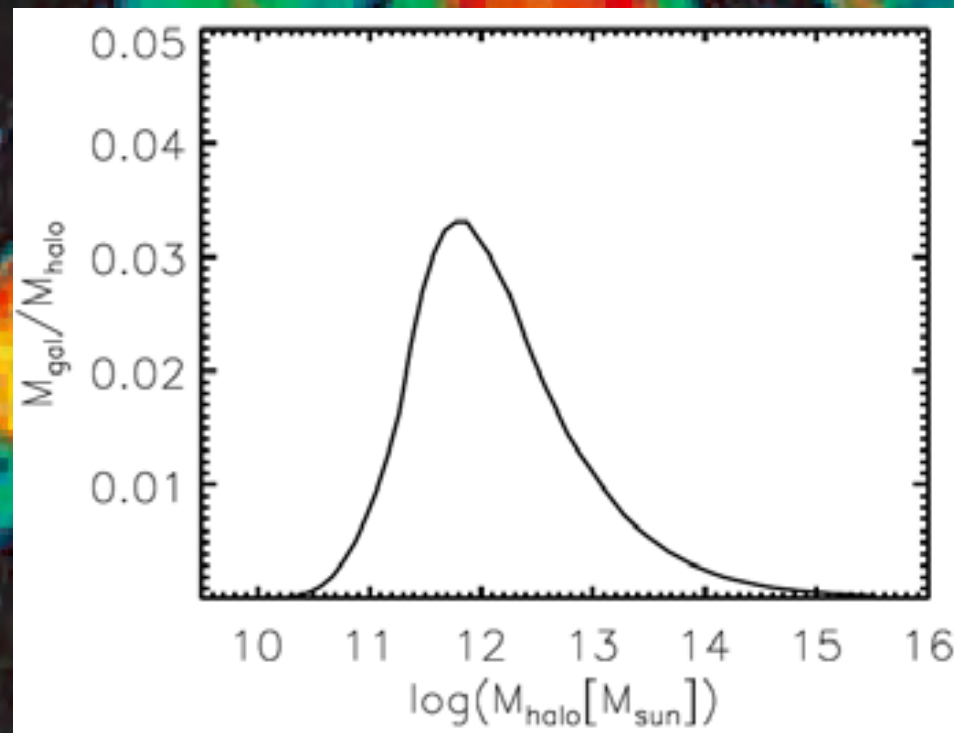
Most stars are in galaxies similar in mass to the Milky Way  
Dark matter is *much* more broadly distributed across halos





Most stars are in galaxies similar in mass to the Milky Way  
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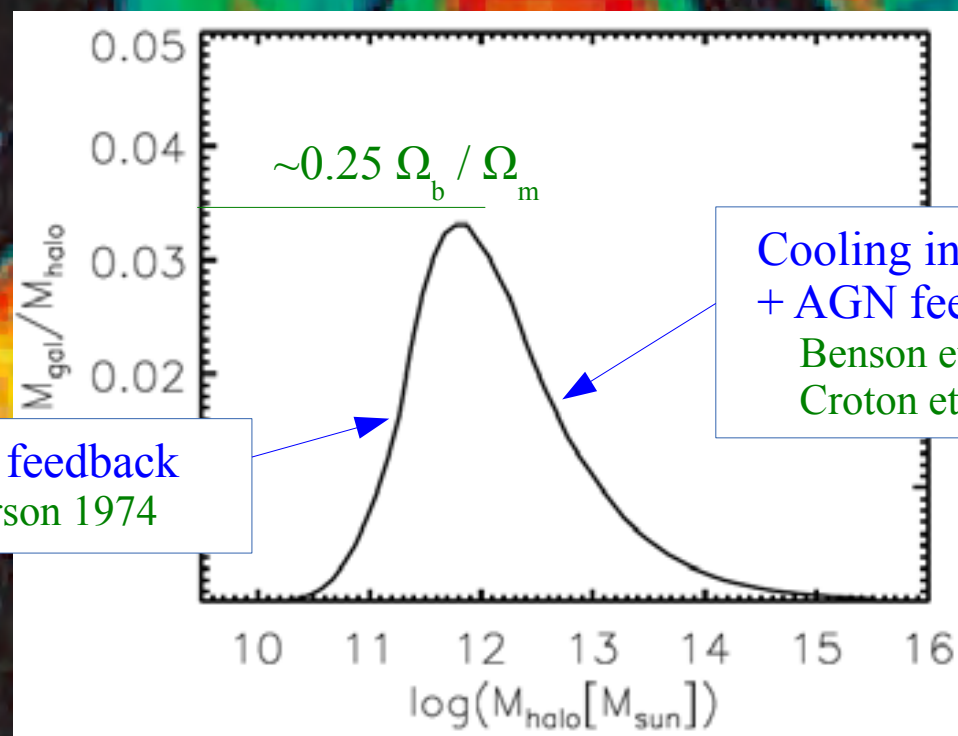
→ Galaxy to halo mass ratio varies *strongly* with mass



Most stars are in galaxies similar in mass to the Milky Way  
Dark matter is *much* more broadly distributed across halos

→ Halo to galaxy mass ratio varies *strongly* with mass

Star formation efficiency is reduced at both low *and* high halo mass



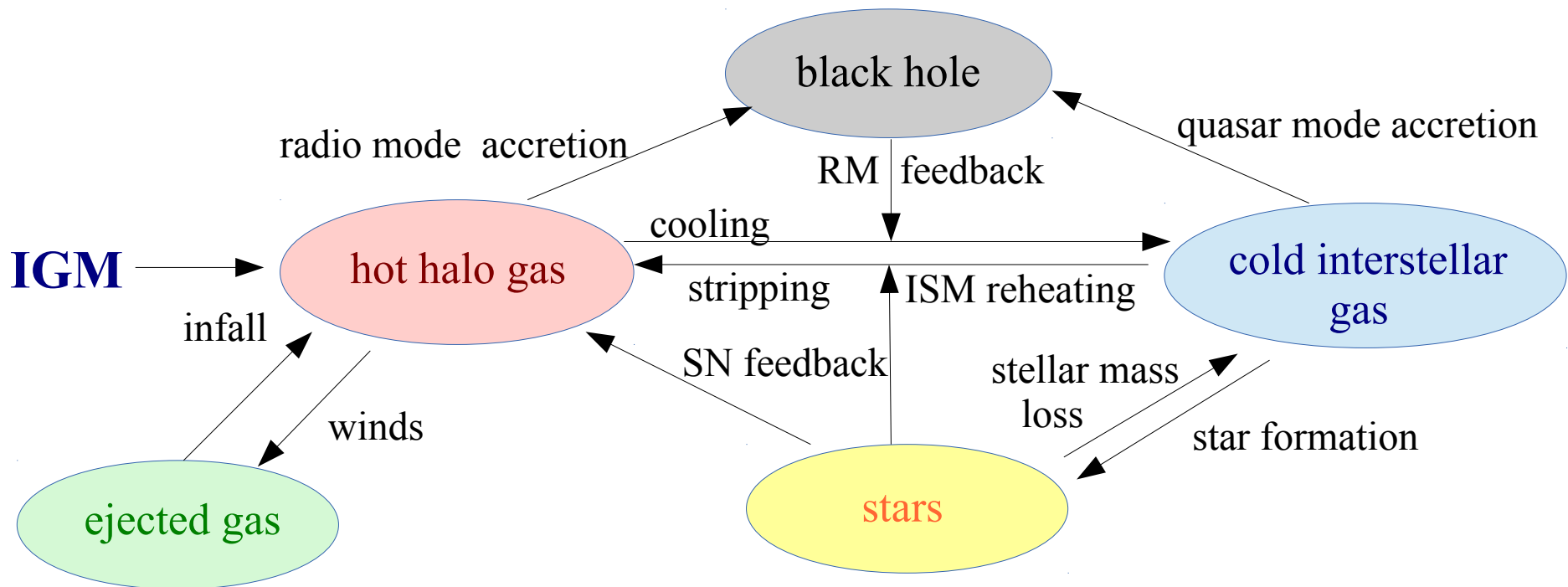


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$$(\Omega_b / \Omega_m) M_{\text{halo}} = M_{\text{hot}} + M_{\text{cold}} + M_{\text{ejecta}} + M_{\text{star}} + M_{\text{BH}}$$



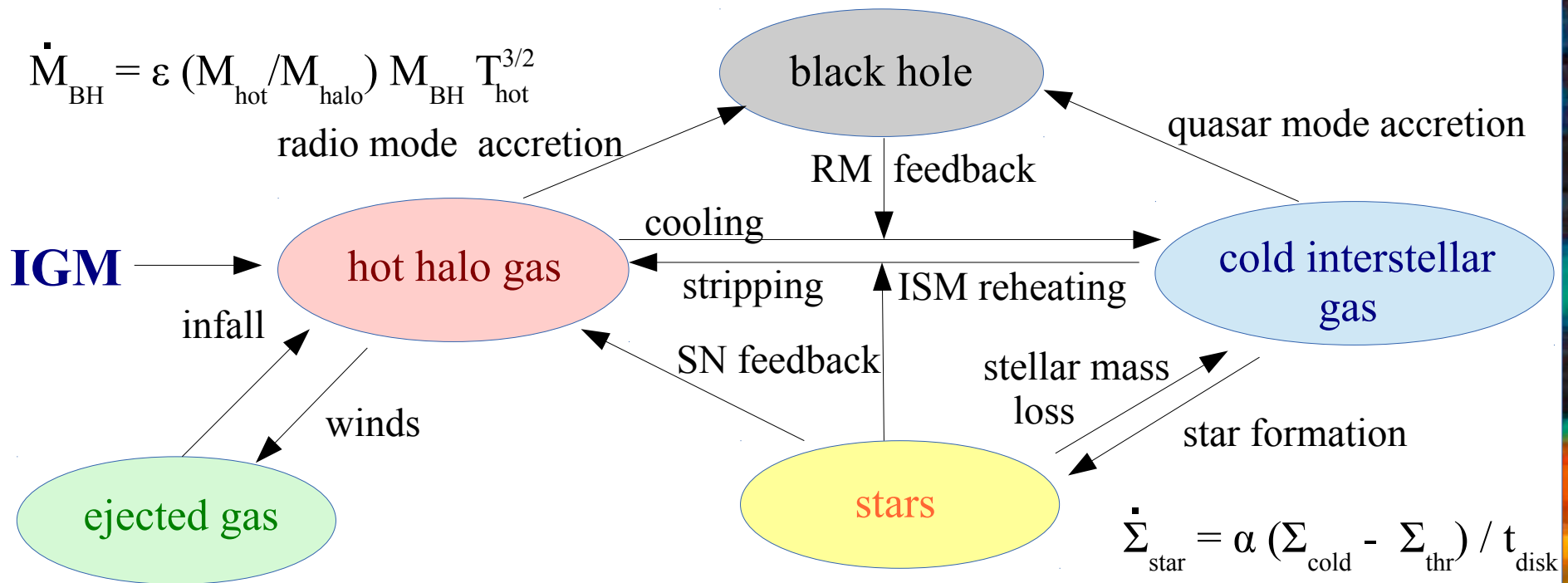
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$$\dot{M}_{\text{BH}} = \varepsilon (M_{\text{hot}} / M_{\text{halo}}) M_{\text{BH}} T_{\text{hot}}^{3/2}$$





# The semi-analytic programme

Follow the DM distribution with high-resolution simulations  
identify dark halos/subhalos at all times, building merger trees to describe their growth, internal structure and spatial distribution

Treat baryonic physics within the evolving population of DM objects using simplified physical models for processes such as  
gas cooling onto central galaxies  
star formation within these central galaxies  
central black hole growth  
generation of winds through stellar and AGN feedback  
production, expulsion and mixing of nucleosynthesis products

Measure the efficiencies of these processes as functions of redshift and galaxy properties by comparing model output directly with observational data

e.g.



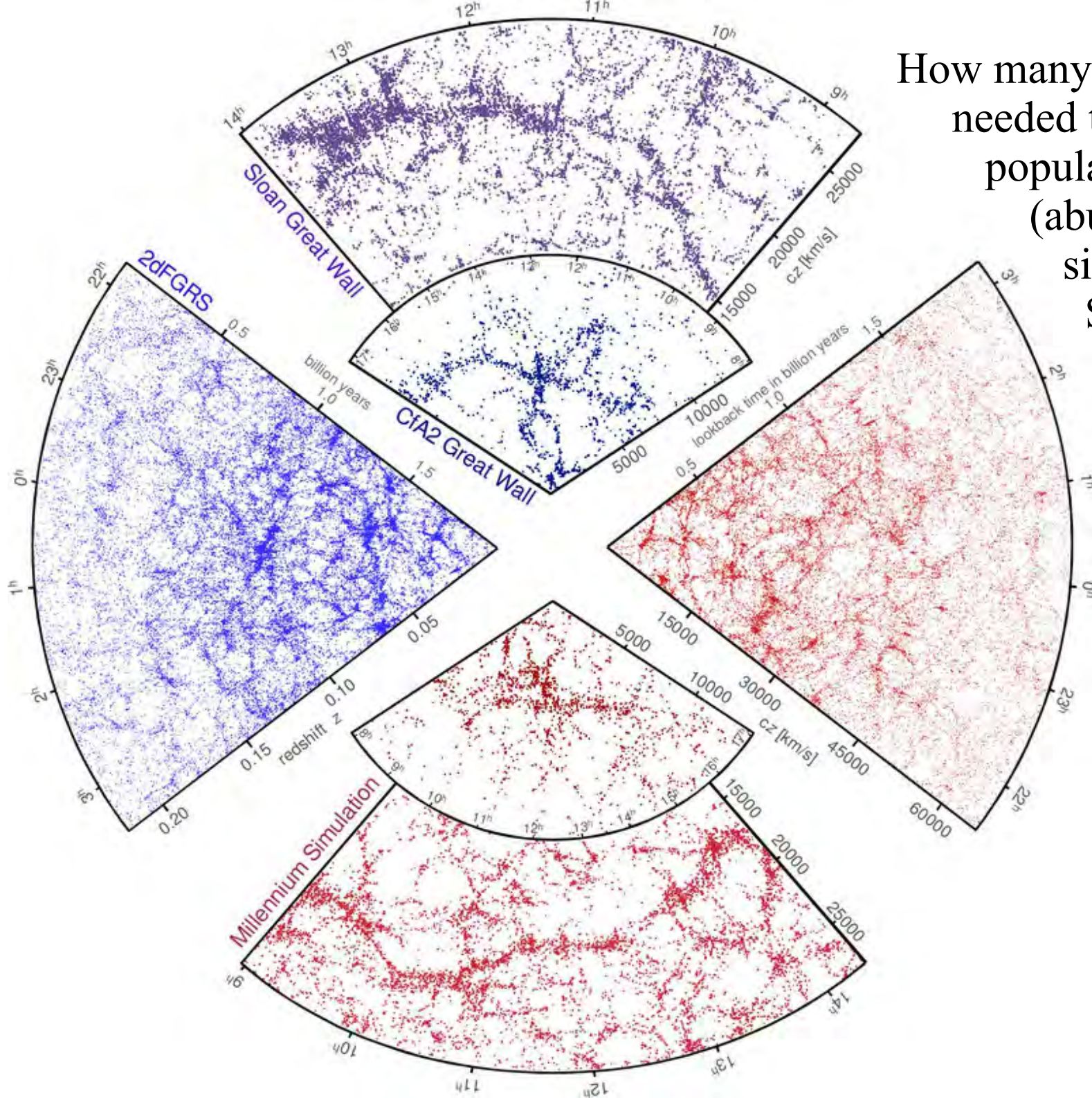
$\Omega$

# Six parameters fine-tuned to fit a single curve

*Planck+WP*

Parameter	Best fit	68% limits
$\Omega_b h^2$ . . . . .	0.022032	$0.02205 \pm 0.00028$
$\Omega_c h^2$ . . . . .	0.12038	$0.1199 \pm 0.0027$
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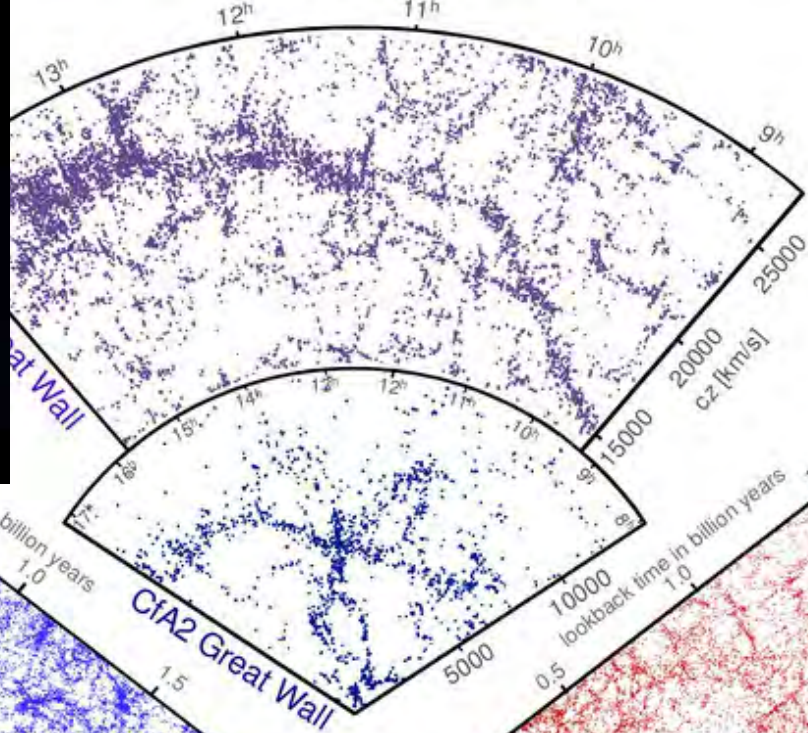




How many parameters are needed to fit the galaxy population?

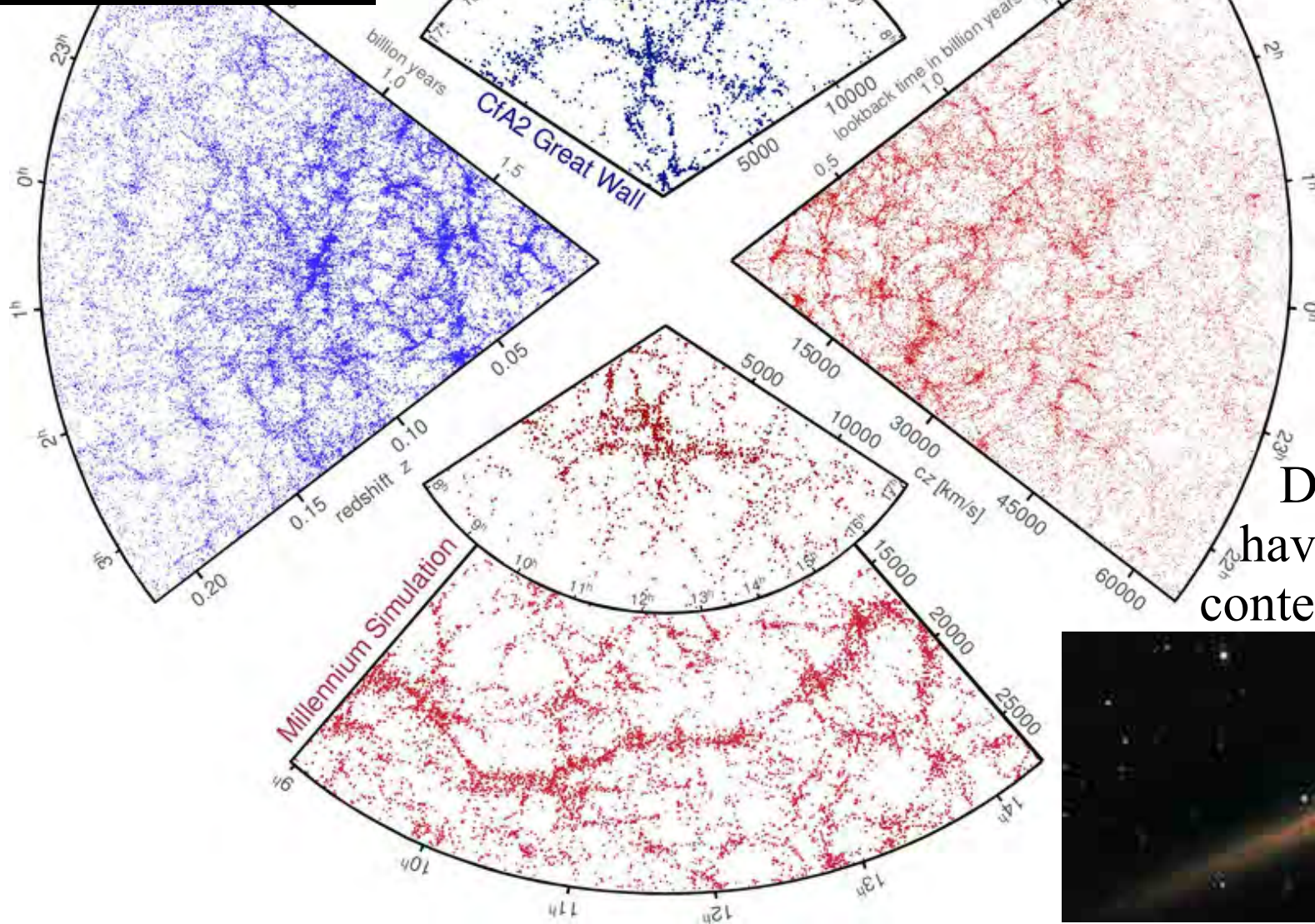
(abundance by mass, size, gas content, SFR, B/T, AGN; scaling relations; clustering...)





How many parameters are needed to fit the galaxy population?

(abundance by mass, size, gas content, SFR, B/T, AGN; scaling relations; clustering...)



Do the parameters have useful *physical* content?





# Population simulations provide a tool...

To explore the statistics and interactions of the many processes affecting stars and gas within growing  $\Lambda$ CDM structures

To understand how the effects of these processes are reflected in the various observed population properties of galaxies and their evolution -- abundances, scaling relations, clustering

To allow interpretation of large observational surveys in terms of the rates, efficiencies and significance of these processes

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To allow interpretation of large observational surveys in terms of the rates, efficiencies and significance of these processes

NOT to make a definitive *a priori* physical model for the formation of everything from linear  $\Lambda$ CDM initial conditions

NOR to represent the internal structure of individual galaxies at anything but the most schematic level



# Millennium Run 2004

2 June 2005 | www.nature.com/nature | £10

THE INTERNATIONAL WEEKLY JOURNAL OF SCIENCE

# nature

## GENOME EDITING

Rewriting the rules for gene therapy

## BCL-2 INHIBITORS

Potent new antitumour compounds

## HUMAN BEHAVIOUR

Oxytocin — the 'trust hormone'

## SURPRISING DINOSAURS

A sauropod, by a short neck

INSIDE: UP-TO-THE-MINUTE  
REVIEWS ON AUTOIMMUNITY



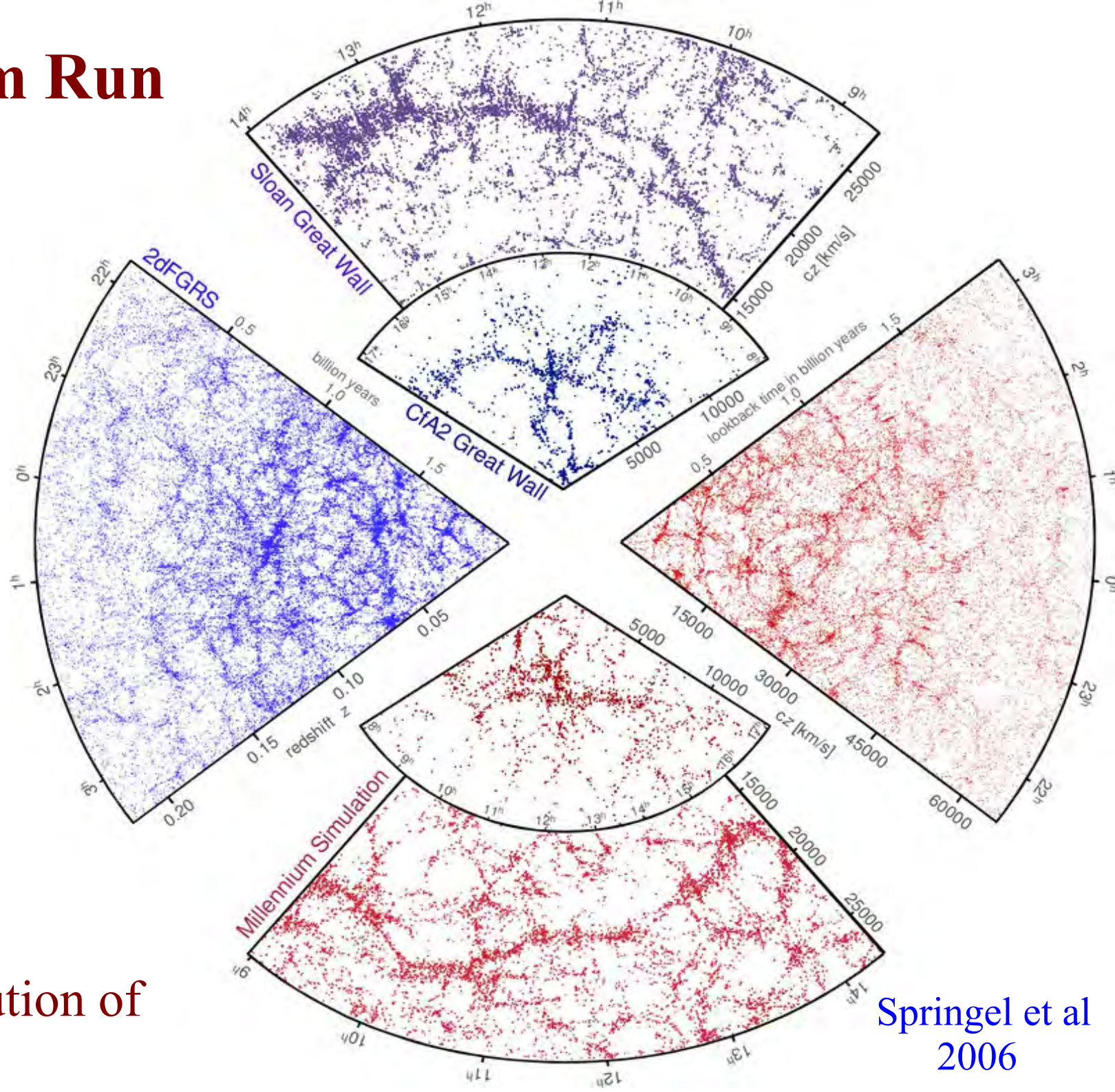
# EVOLUTION OF THE UNIVERSE

Supercomputer simulation of the  
growth of 20 million galaxies

Springel et al  
2005



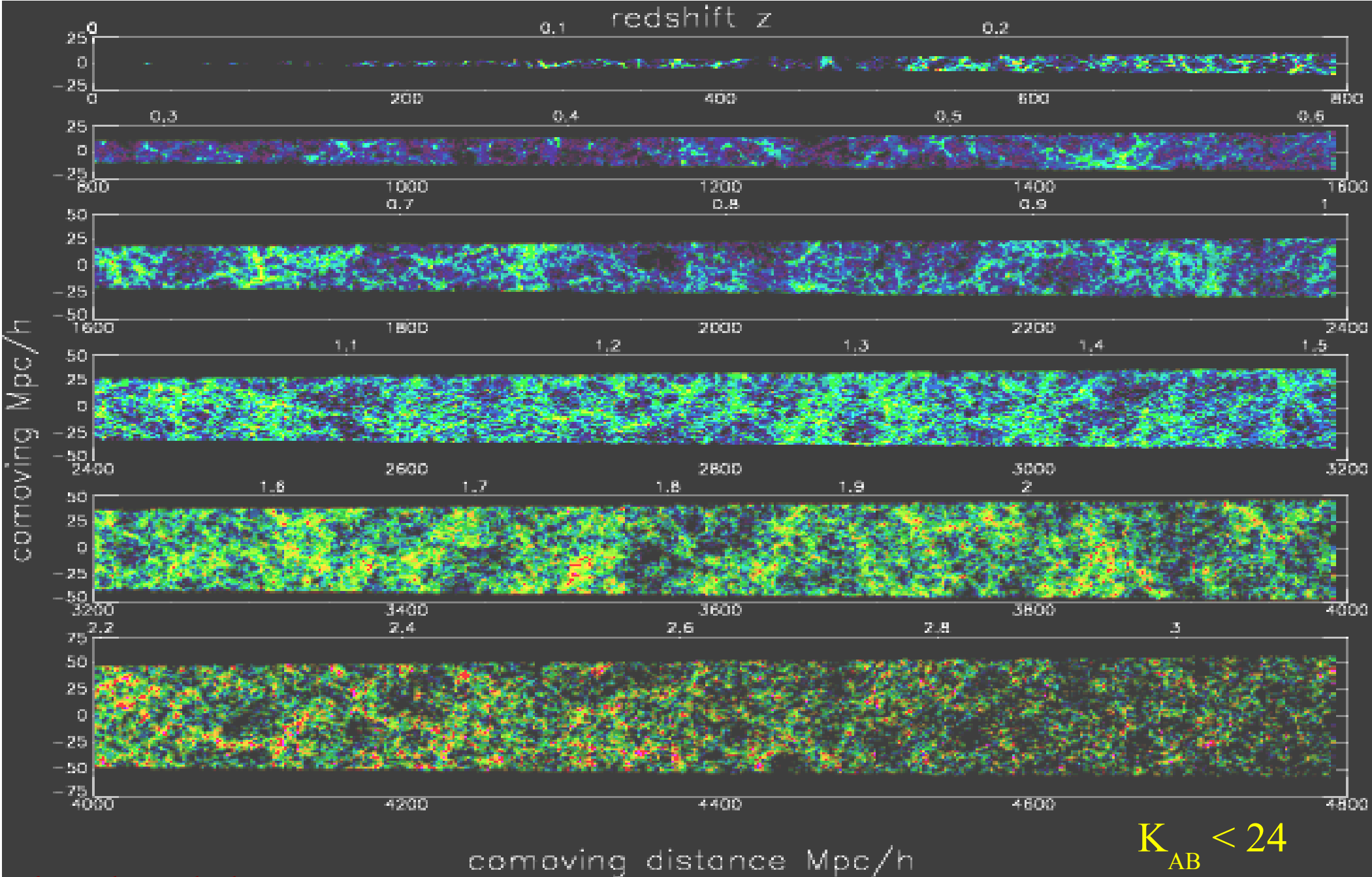
# Millennium Run 2004



simulated the  
formation/evolution of  
 $2 \times 10^7$  galaxies

Springel et al  
2006





simulated the  
 formation/evolution of  
 $2 \times 10^7$  galaxies from  $z = 10$  to  $z = 0$

Kitzbichler & White  
 2007

Documentation

CREDITS/Acknowledgments

Registration

News

FAQ

Public Databases

+ DGalaxies

+ DHaloTrees

+ Guo2010a

+ Guo2013a

+ Henriques2012a

+ MField

+ MillenniumII

+ millimil

+ miniMilII

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+ MPAGalaxies

+ MPAHaloTrees

+ MPAMocks

+ Snapshots

Private (MyDB) Databases

...sampling\_db (r)

...swhite\_db (rw) (context)



Welcome Simon White.

Streaming queries return unlimited number of rows in CSV format and are cancelled after 420 seconds.

Browser queries return maximum of 1000 rows in HTML format and are cancelled after 30 seconds.

- The MS halo and galaxy databases have been public since 2006

Query (stream)

Query (browser)

Help

Maximum number of rows to return to the query form:

**Demo queries:** click a button and the query will show in the query window.

Holding the mouse over the button will give a short explanation of the goal of the query. These queries are described in some more detail on [this page](#).

Mainly Halos:

Mainly Galaxies:

**Metadata queries:** The SQL statements under these buttons provide examples for querying and managing the state of a private database. Holding the mouse over the button will give a short explanation of the goal of the statement.

Show Tables

Show Views

Show Columns

Show Indexes

MyDB Size

MyDB Table Size

Create View

Drop Table

Create Index



# Virgo - Millennium Database

Documentation

CREDITS/Acknowledgments

Registration

News

FAQ

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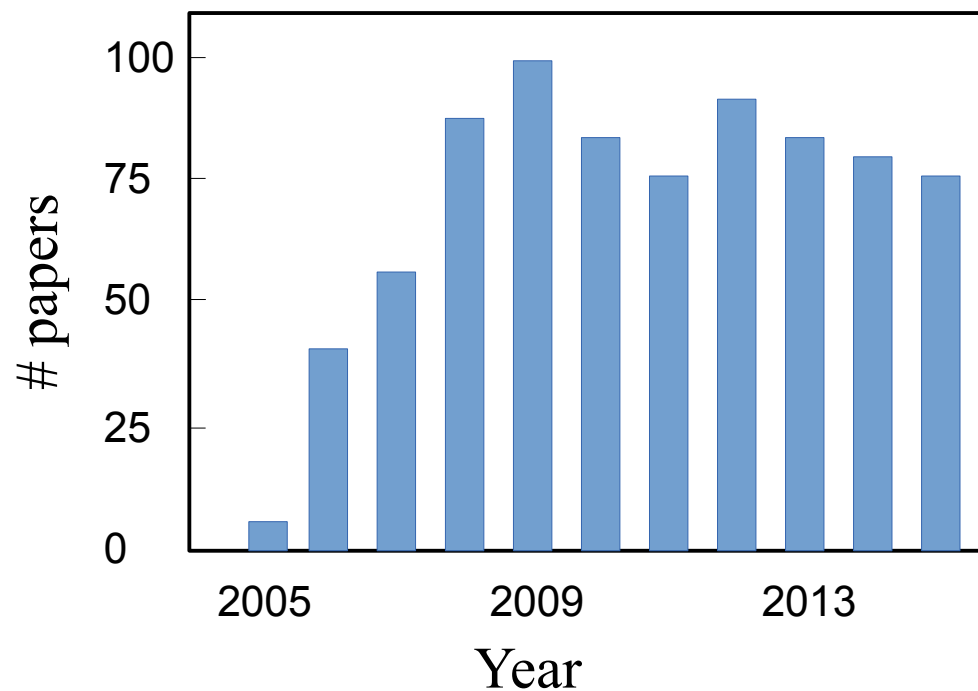
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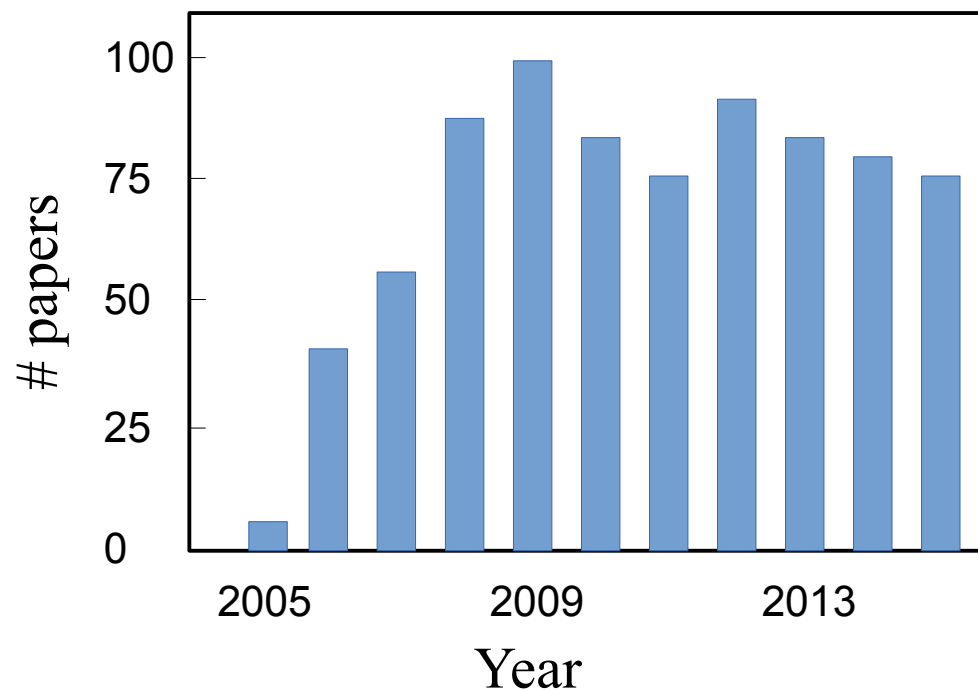
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- The MS halo and galaxy databases have been public since 2006
- >750 papers have used these predictions
- Most use the galaxies and are by authors unassociated with the Virgo Consortium

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Registration

News

FAQ

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- The MS halo and galaxy databases have been heavily used because
  - (i) they are publicly available
  - (ii) they are easy to use
  - (iii) they provide data in the form needed to calibrate and interpret observations
  - (iv) they give results for physical models

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# Limitations of the original Millennium Simulation

Limited modeling of *structure* of galaxies, gas components

Limited resolution – too poor to model formation of dwarfs

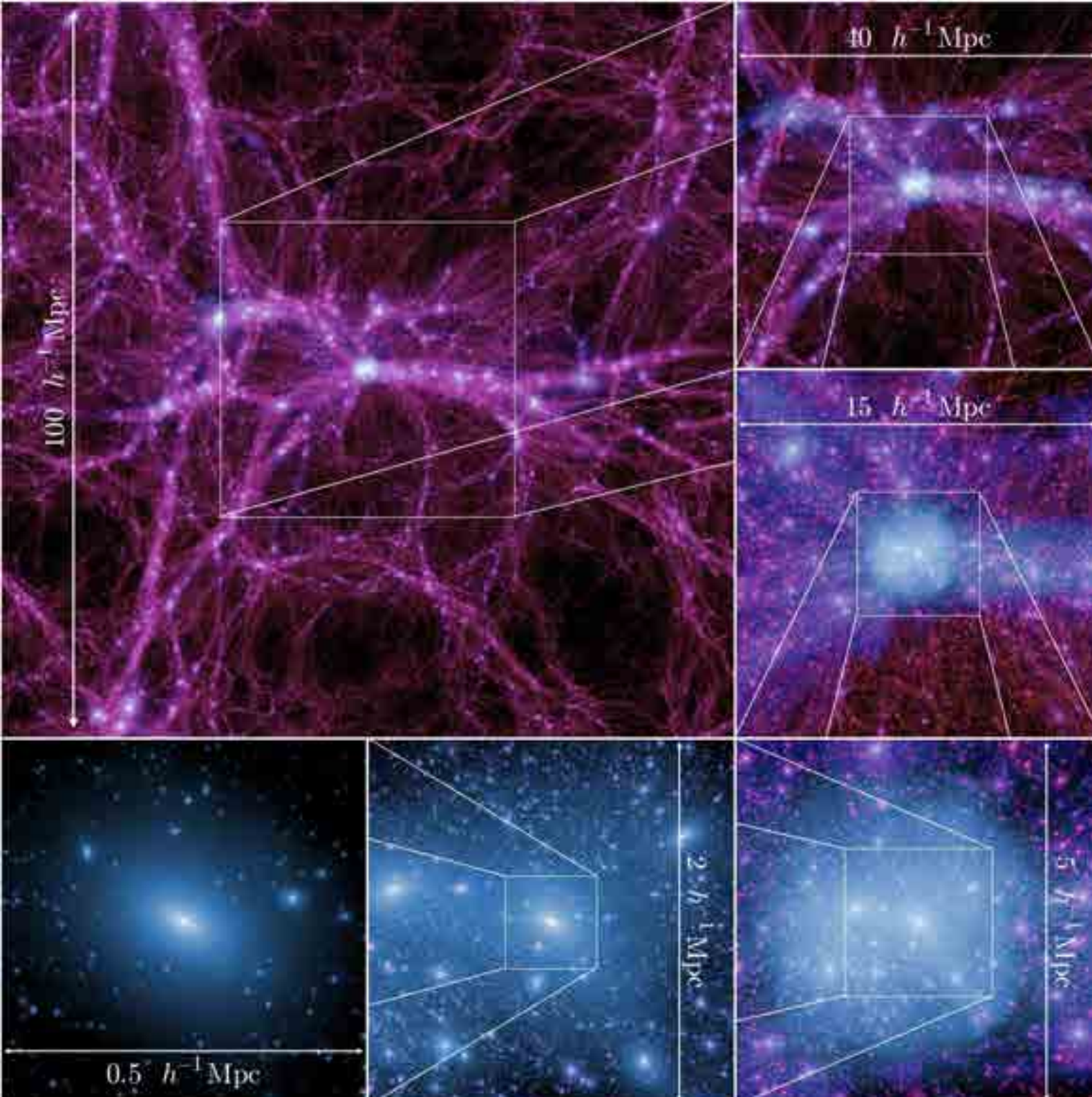
No convergence tests – are galaxy results numerically converged?

Limited volume – too small for BAO work, precision cosmology

Only one (“wrong”) cosmology

Users unable to test dependences on parameters/assumptions





## Millennium-II (2008)

Same cosmology

Same N

1/5 linear size

Same outputs/  
post-processing



Resolution tests  
of MS results and  
extension to  
smaller scales

Boylan-Kolchin et al  
2009

# Second generation galaxy formation models based on the MS and the MS-II jointly

Guo et al 2011

Implement modelling simultaneously on MS and MS-II

Test convergence of galaxy properties near resolution limit of MS

Extend to properties of dwarf galaxies

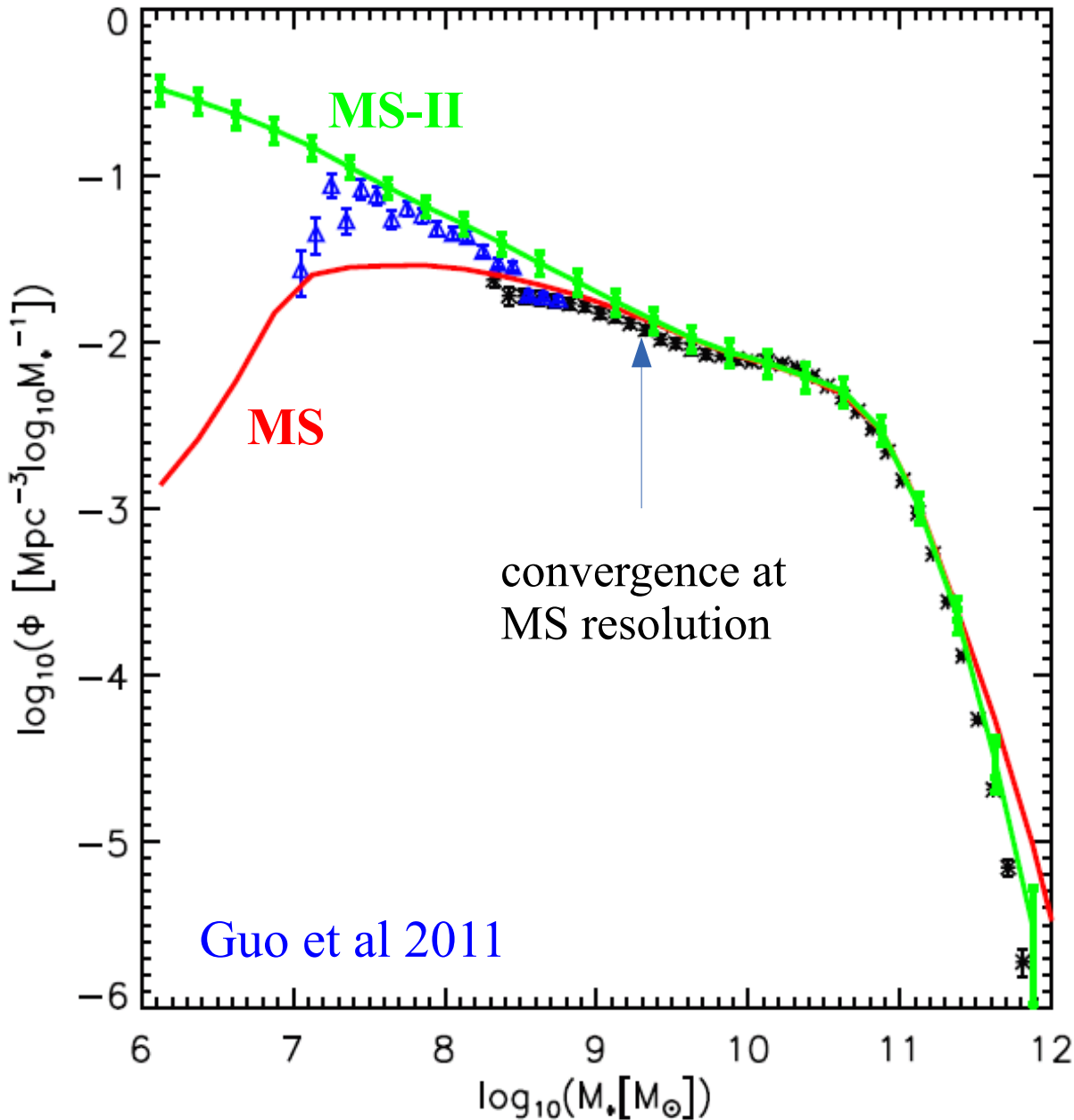
Improve/extend treatments of “troublesome” astrophysics

Adjust parameters to fit new, more precise data

Test against clustering and redshift evolution

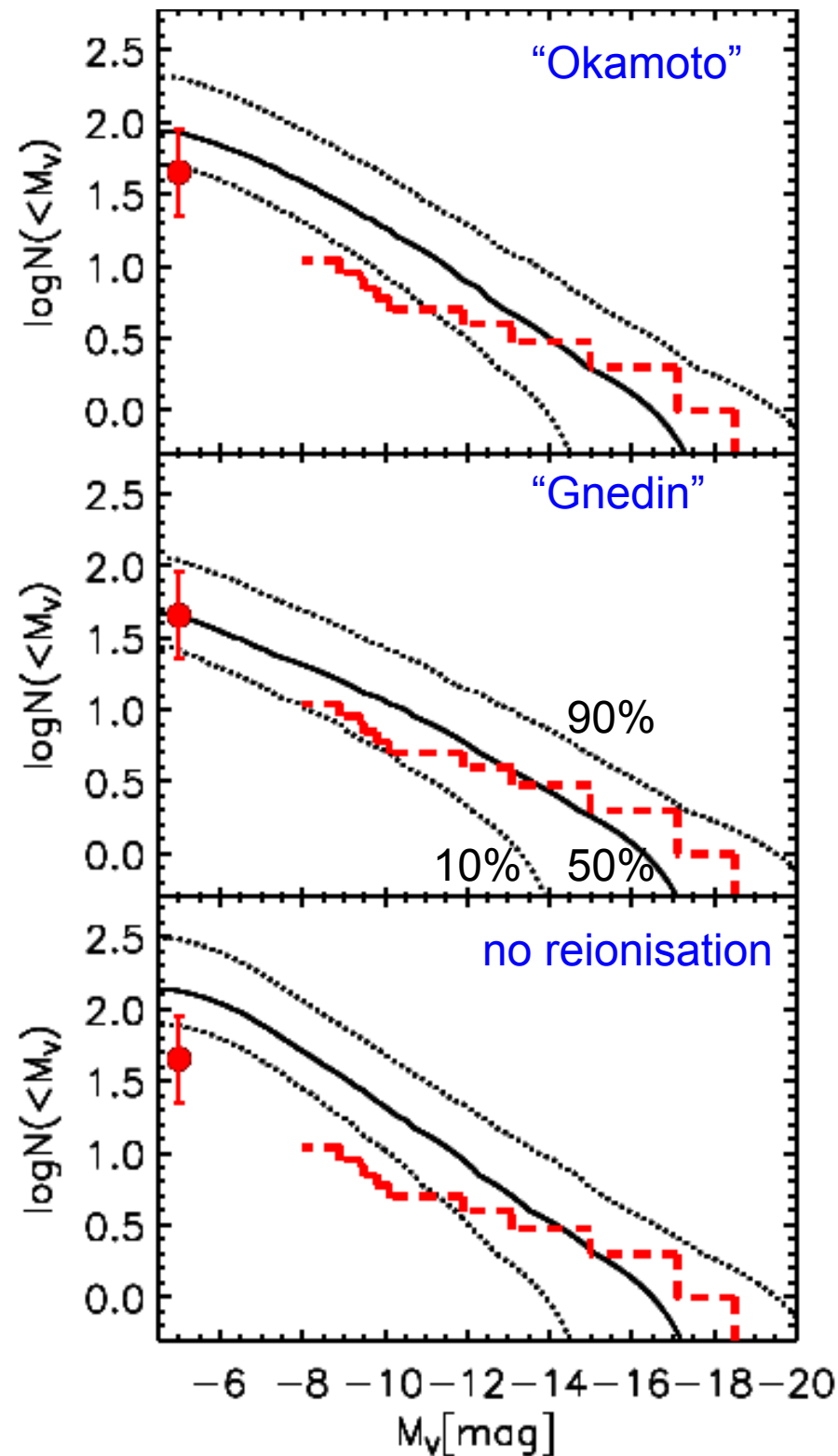


# The stellar mass function of galaxies



Note that the simulated mass function fits the data over 5 dex in stellar mass!

# Luminosity function of Milky Way satellites

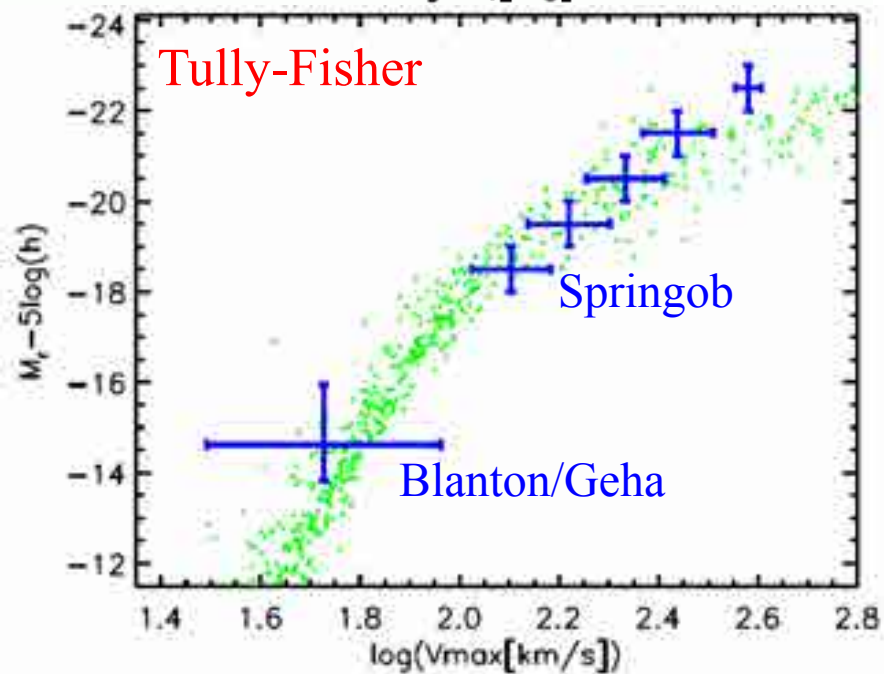
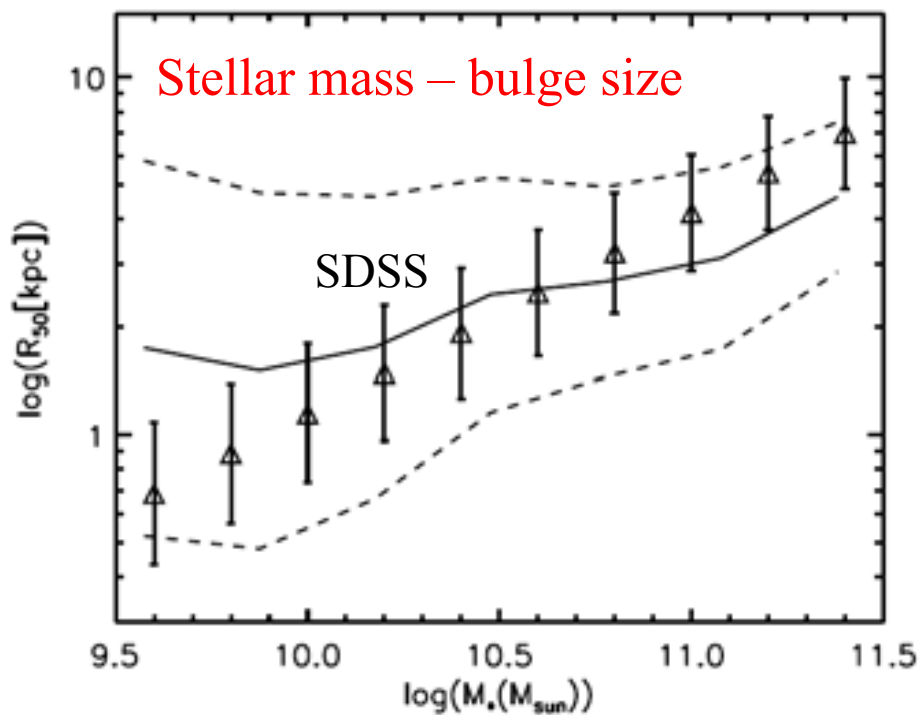
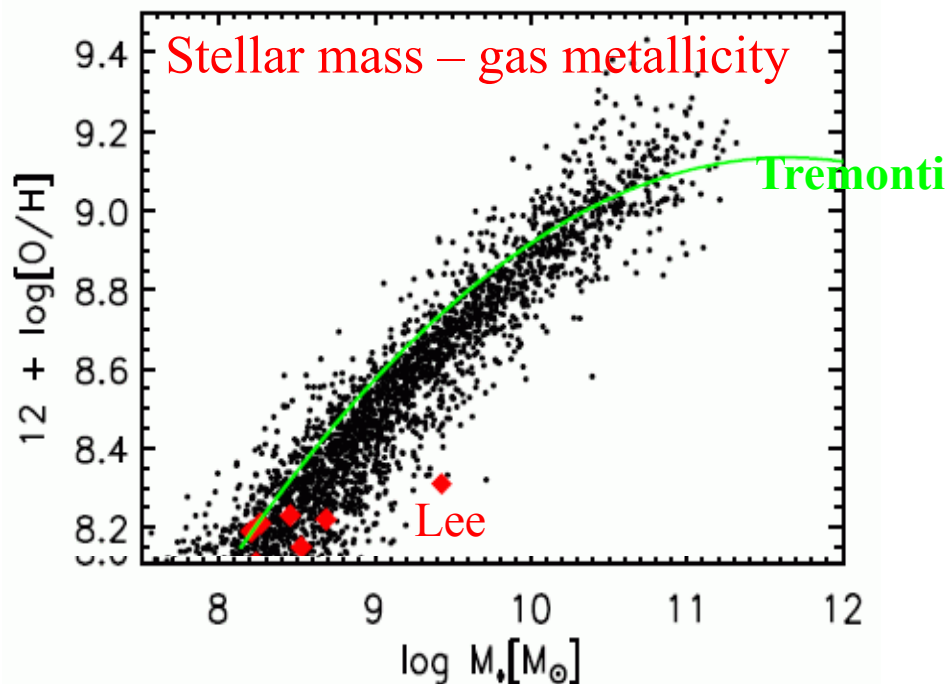
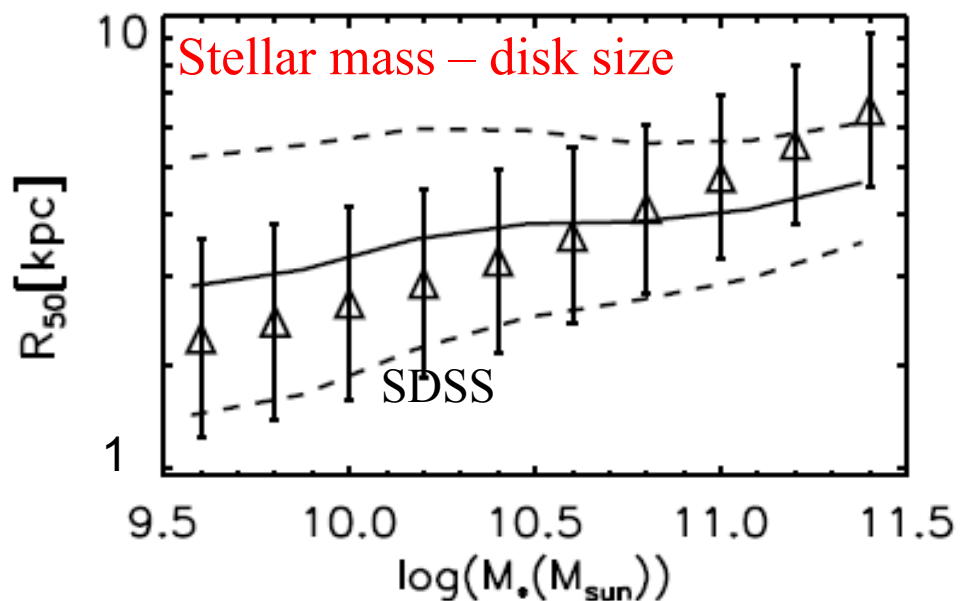


Luminosity functions of satellites around 1500 “Milky Ways” i.e. isolated disk galaxies with  $\log M_* = 10.8$



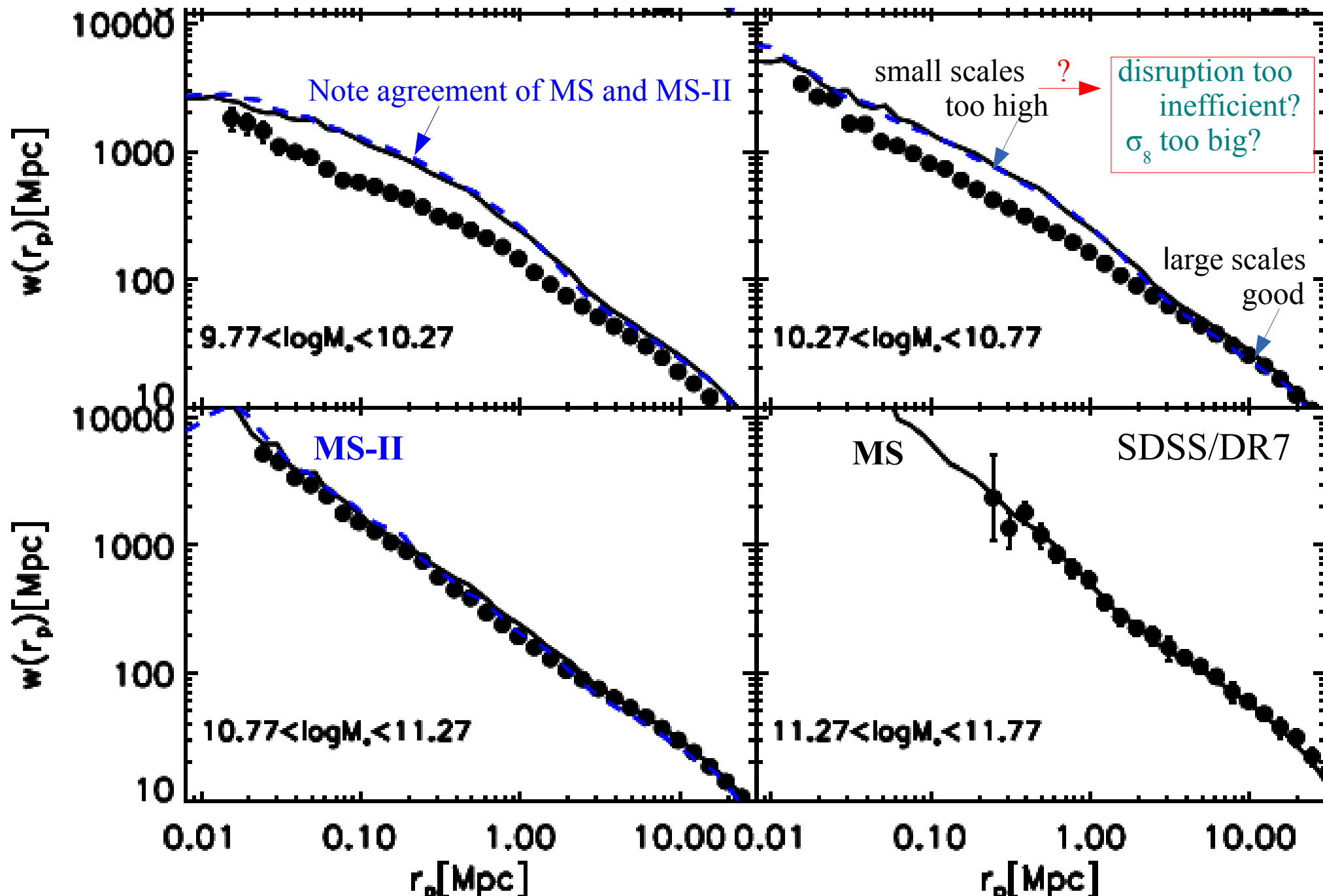
# Scaling relations

Guo et al 2011



# Mass-dependent galaxy clustering

Guo et al 2011





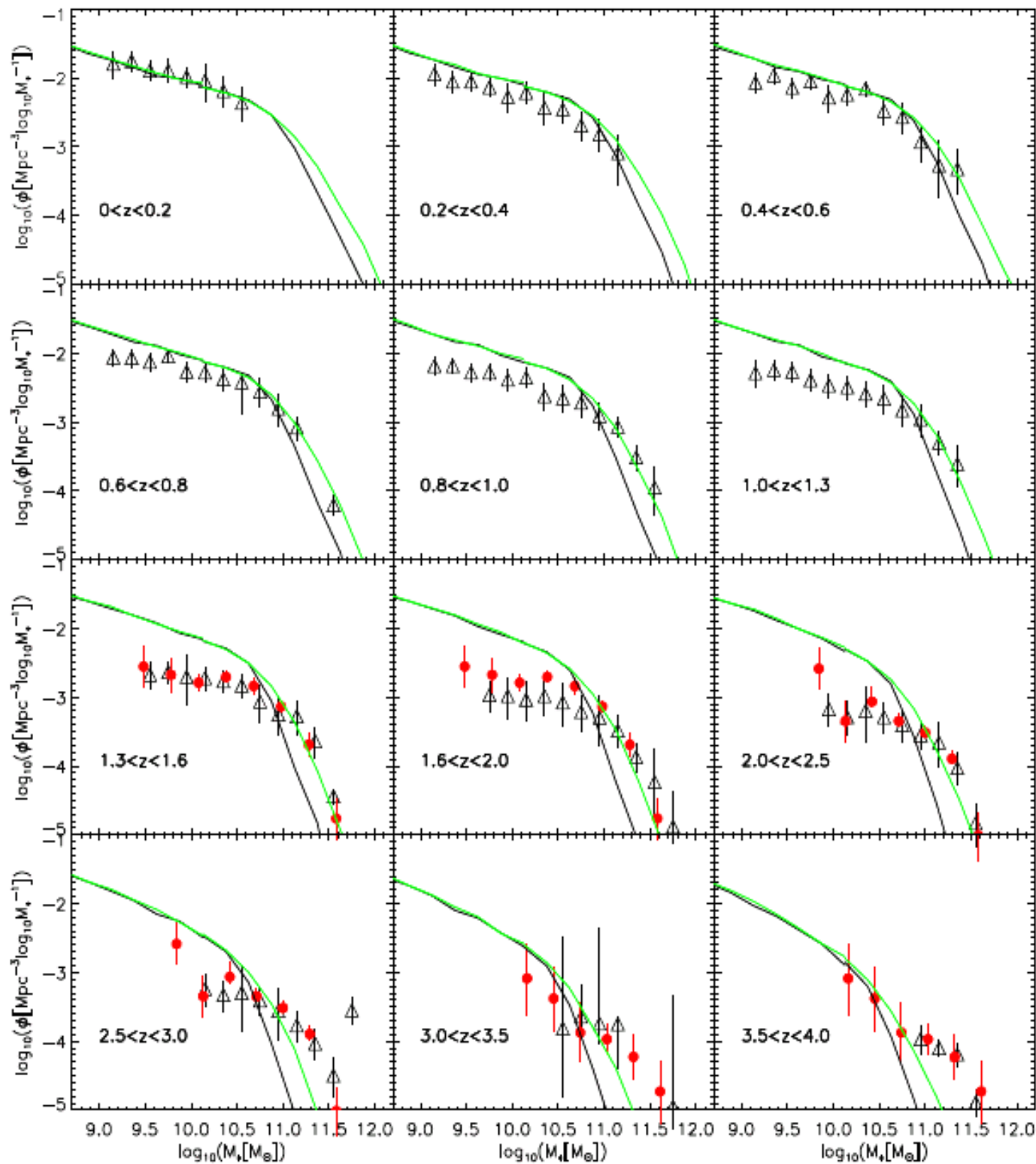
# Evolution of stellar mass function

$\triangle$  Perez-Gonzalez et al 2008

$\bullet$  Marchesini et al 2009

Lower mass galaxies  
 $\log M_* < 10.5$   
form too early

Efficiency of star-formation is too high  
in lower mass objects  
at high  $z$



Guo et al 2011



# The MXXL

(2010)

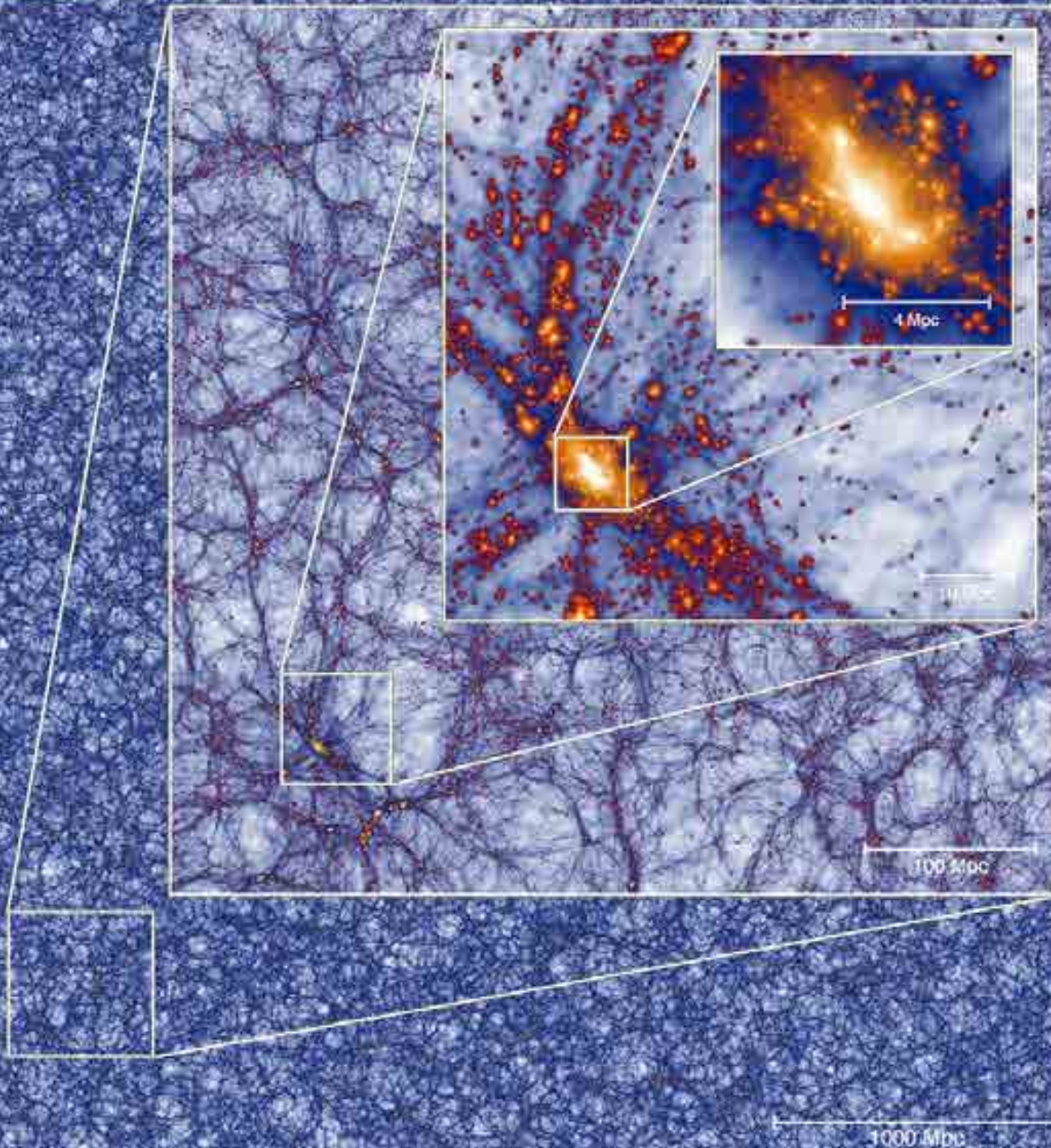
Angulo et al 2011

Bigger than the  
Millennium Run  
by factors of

30 in  $N_{\text{particle}}$

200 in Volume

6 in  $m_{\text{particle}}$





# The MXXL

(2010)

Angulo et al 2011

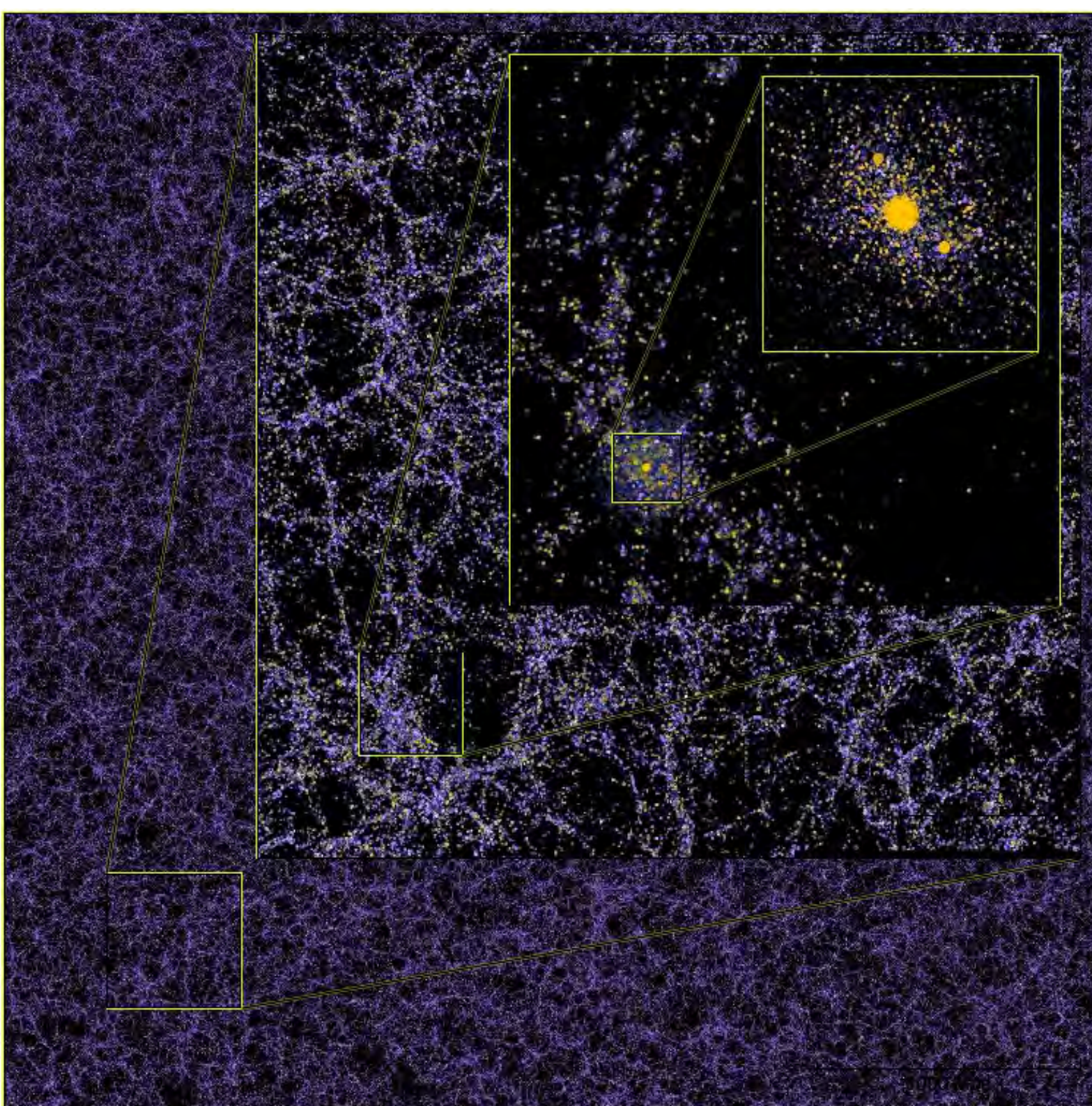
Bigger than the  
Millennium Run  
by factors of

30 in  $N_{\text{particle}}$

200 in Volume

6 in  $m_{\text{particle}}$

$3.3 \times 10^8$  galaxies  
at  $z = 0$  with  
 $\log M_*/M_{\odot} > 10$





# The MXXL

(2010)

Angulo et al 2011

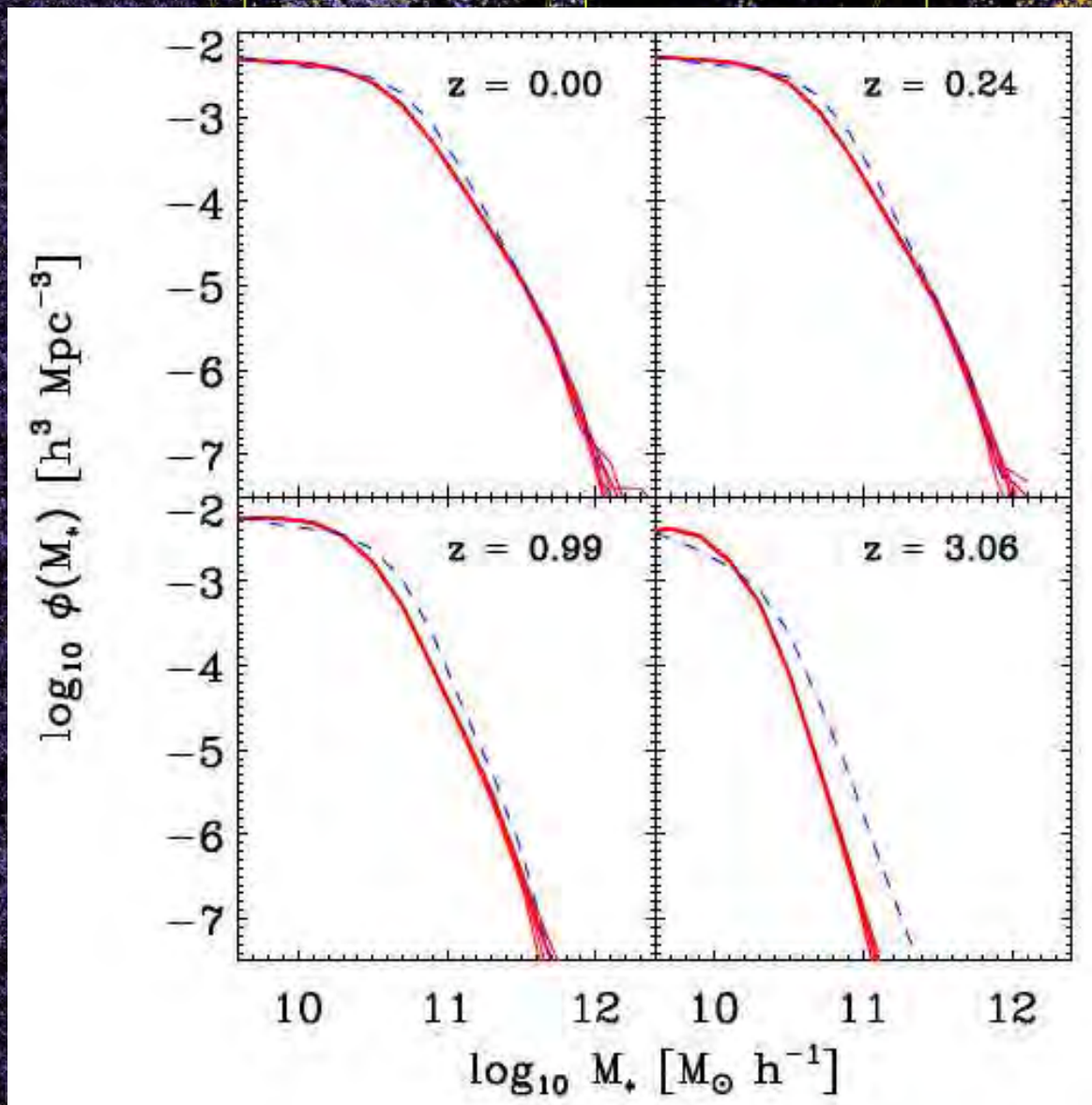
Bigger than the  
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6 in  $m_{\text{particle}}$

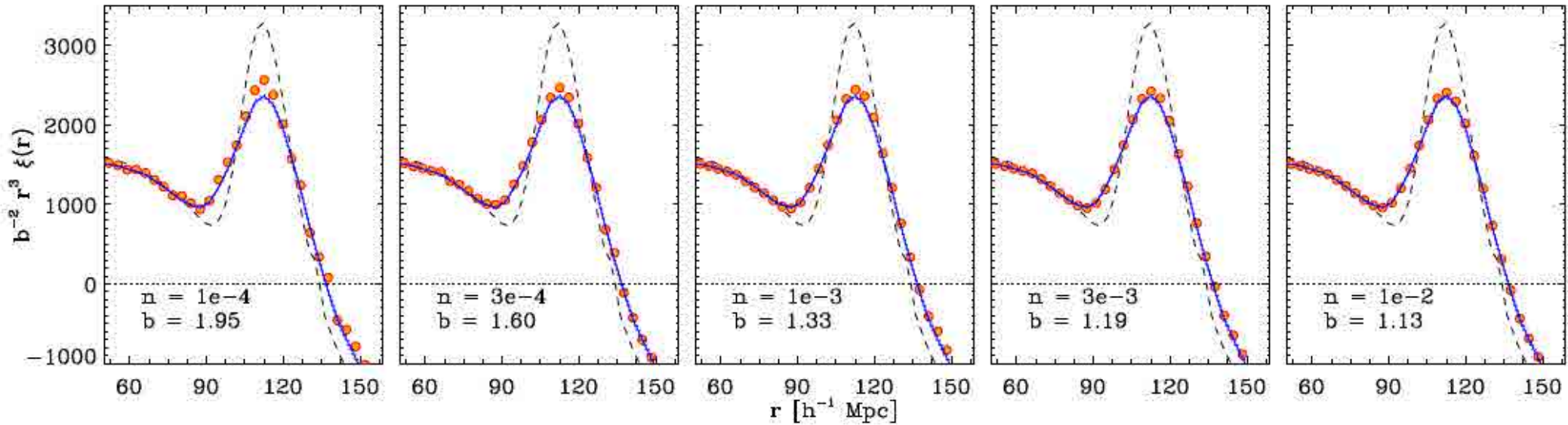
$3.3 \times 10^8$  galaxies  
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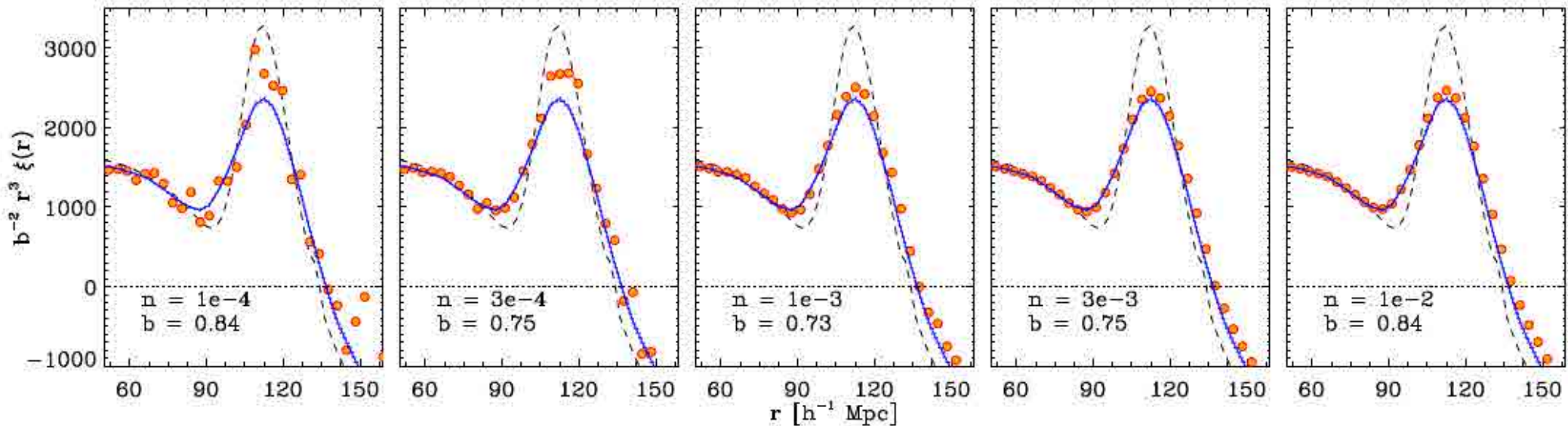


# Distortions of BAO feature in the galaxy population

Stellar Mass



Star Formation Rate



Small but measurable shifts for different selection methods

Angulo et al 2013

# Scaling simulations to neighboring cosmologies

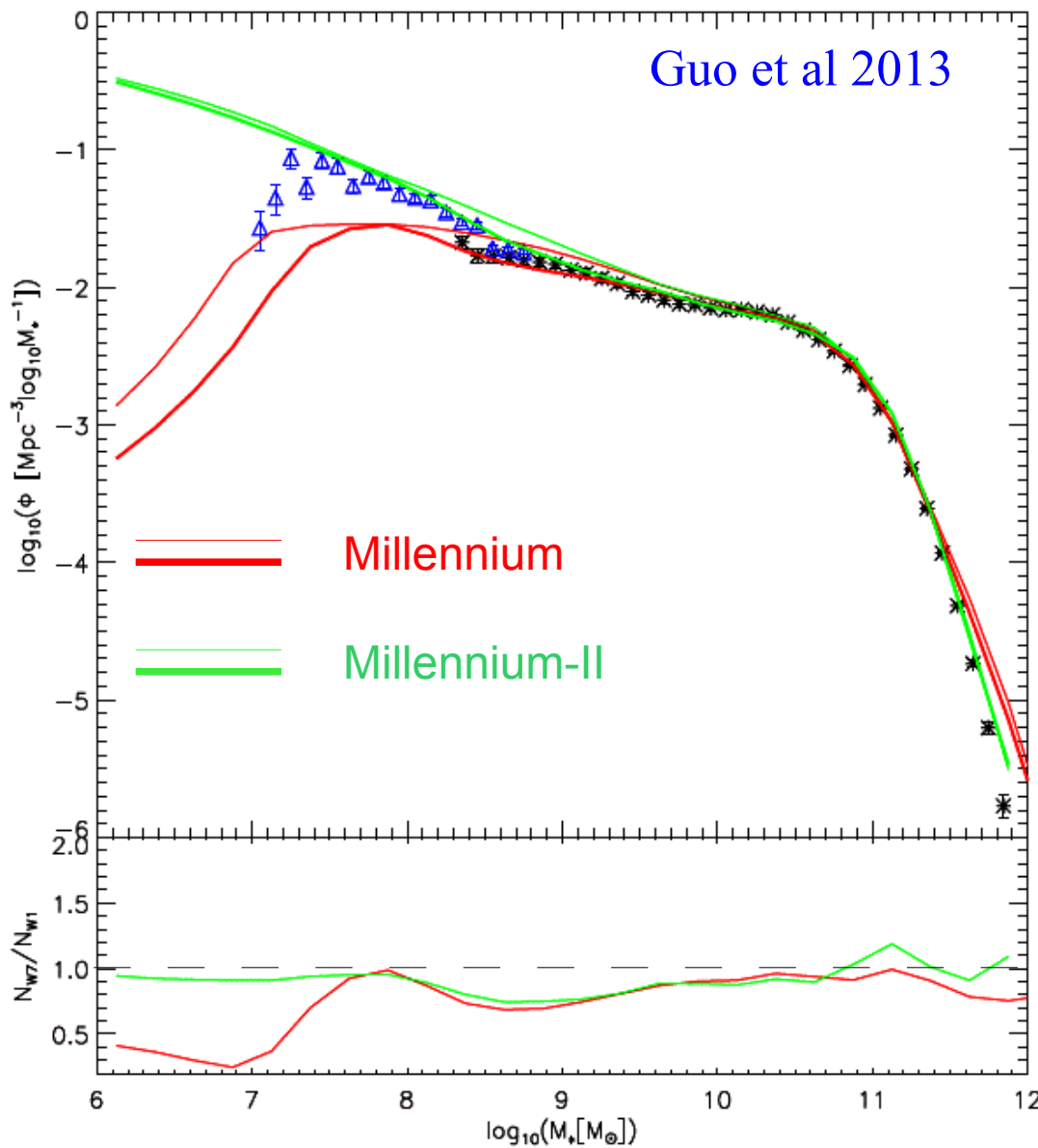
Angulo & White 2010  
Angulo & Hilbert 2014

For example: **WMAP1** –  $\Omega_m = 0.25$ ,  $n = 1$ ,  $\sigma_8 = 0.9$   
to **Planck1** –  $\Omega_m = 0.315$ ,  $n = 0.96$ ,  $\sigma_8 = 0.829$

- 1) Scale simulation size to match power spectrum slopes of original and target cosmologies on the scales of the target  $z=0$  halos  
-- 685 Mpc 713 Mpc
- 2) Reassign redshifts to match linear amplitudes on these scales  
--  $z = 0.12, 1.22, 2.34$   $z = 0, 1, 2$
- 3) Scale particle masses and velocities to match  $\Omega_m$  and new size  
--  $1.19 \times 10^9 M_\odot$   $1.44 \times 10^8 M_\odot$
- 4) Adjust for the difference between amplitudes of original and target power spectra on large scales using linear theory.



# Switching from WMAP1 to WMAP7

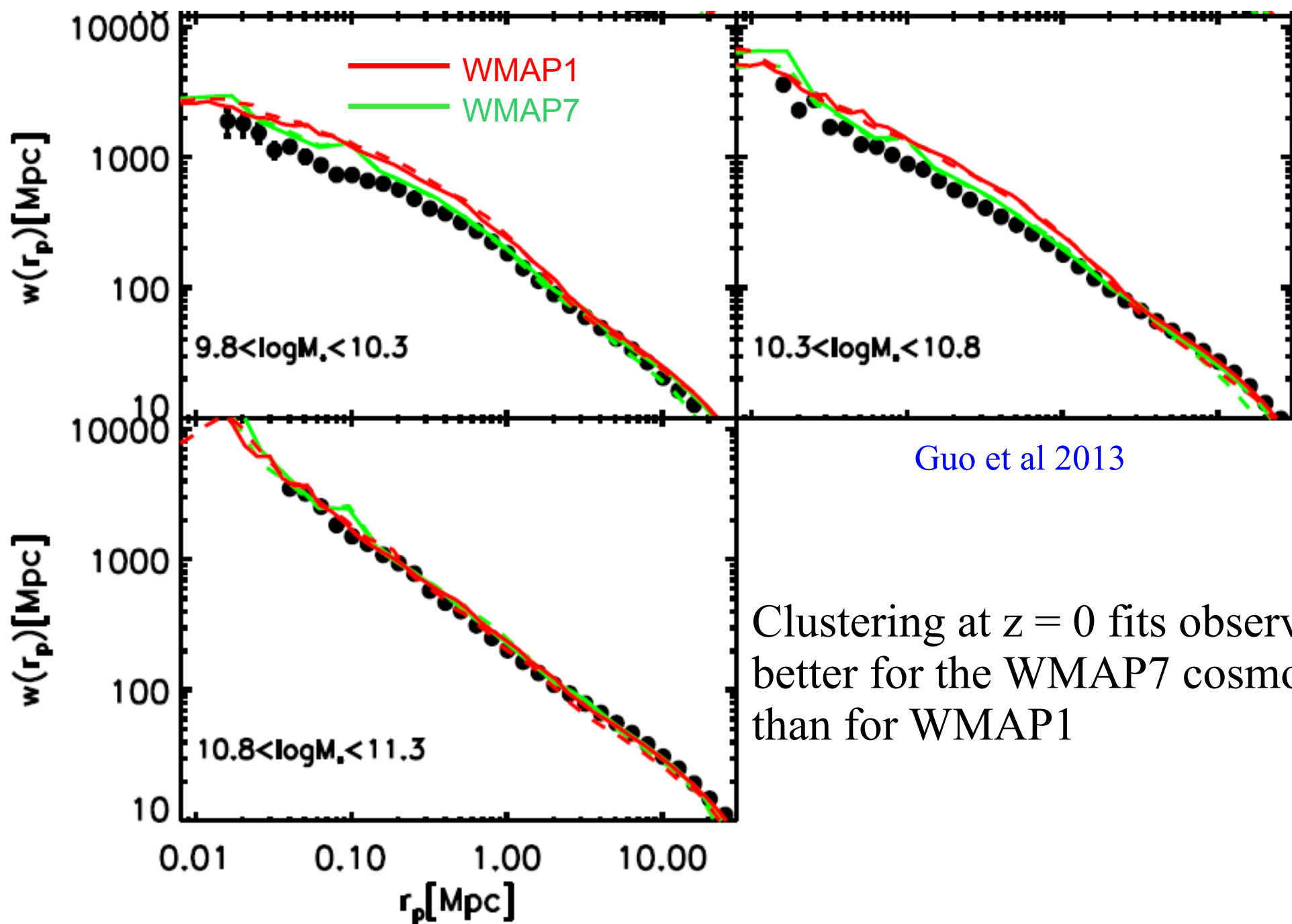


Small shifts in the parameters of the galaxy formation model allow the galactic stellar mass function to be fit equally well in the two different cosmologies despite

$$\sigma_8 = 0.90 \quad \longrightarrow \quad \sigma_8 = 0.81$$

Parameter	Description	WMAP1	WMAP7
$\alpha$	Star formation efficiency	0.02	0.015
$\epsilon$	Amplitude of SN reheating efficiency	6.5	4.5
$\beta_1$	Slope of SN reheating efficiency	3.5	4
$V_{reheat}$	normalization of SN reheating efficiency dependence on Vmax	70	80
$\eta$	Amplitude of SN ejection efficiency	0.32	0.33
$\beta_2$	Slope of SN ejection efficiency	3.5	6.5
$V_{eject}$	normalization of SN ejection efficiency dependence on Vmax	70	80
$\kappa$	Hot gas accretion efficiency onto black holes	$1.5 \times 10^{-5}$	$6.0 \times 10^{-6}$

## Switching from WMAP1 to WMAP7

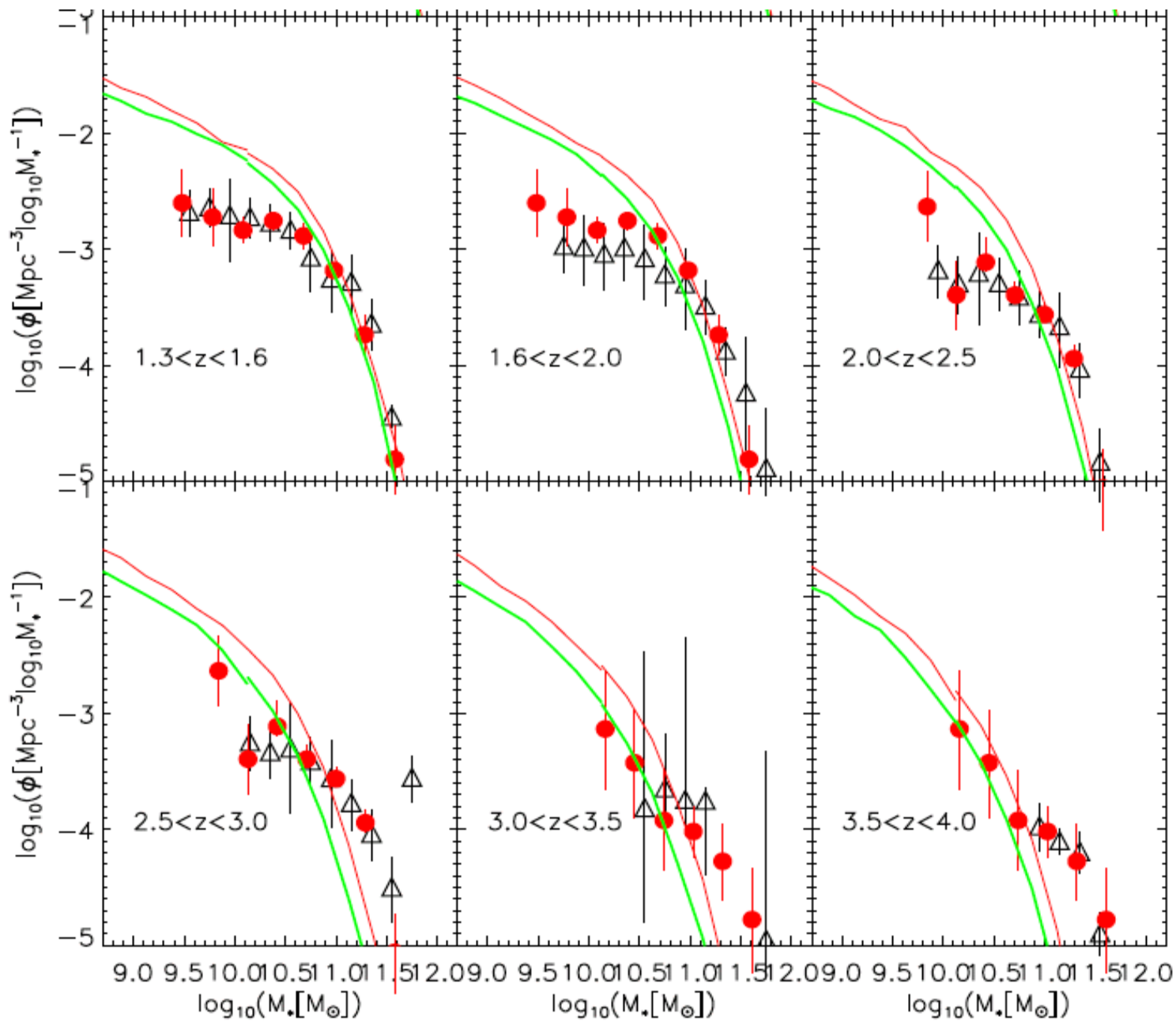




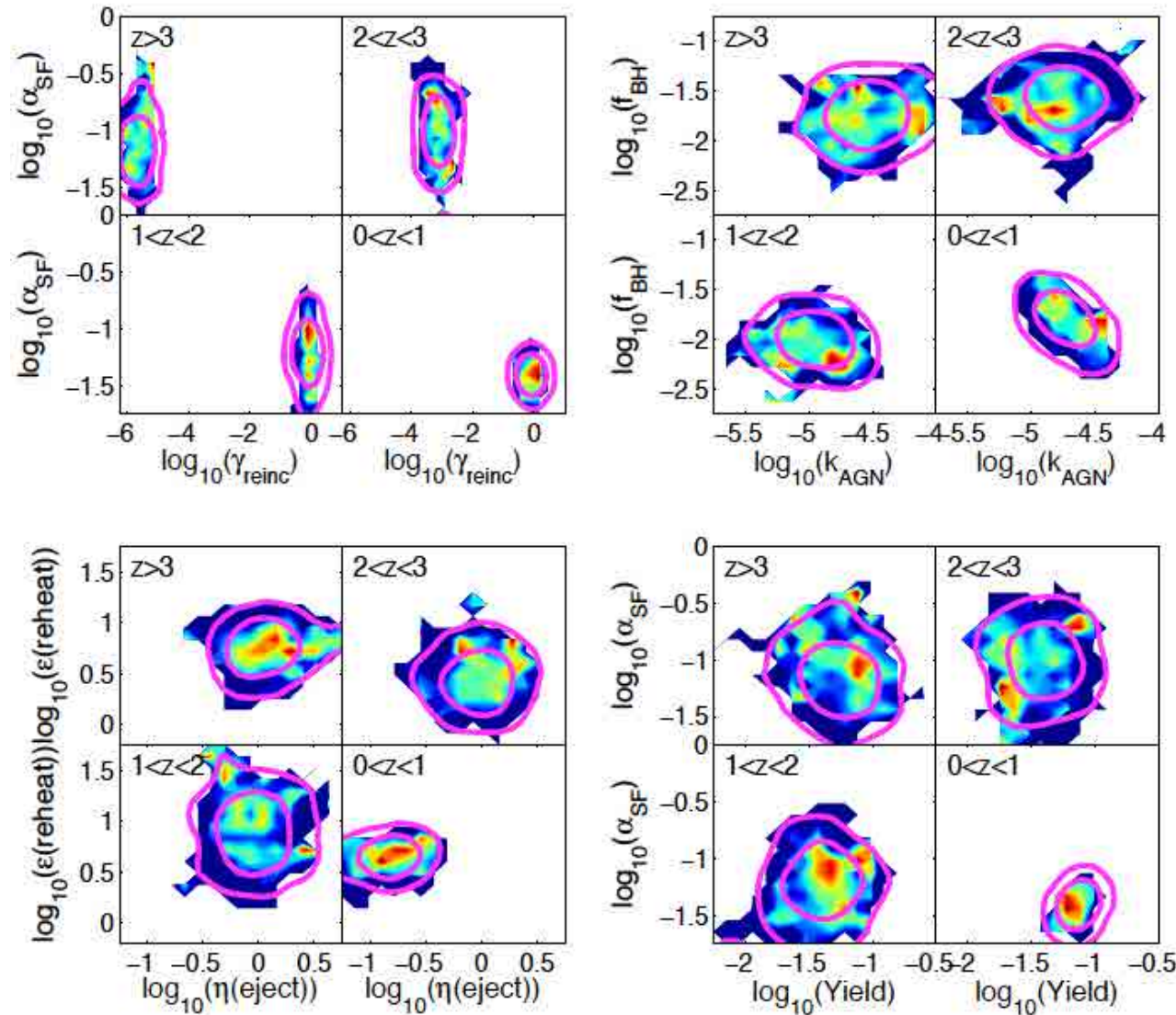
# Switching from WMAP1 to WMAP7

Guo et al 2013

..but the galaxy formation sequence is still incorrect



# MCMC allows exploration of parameter space



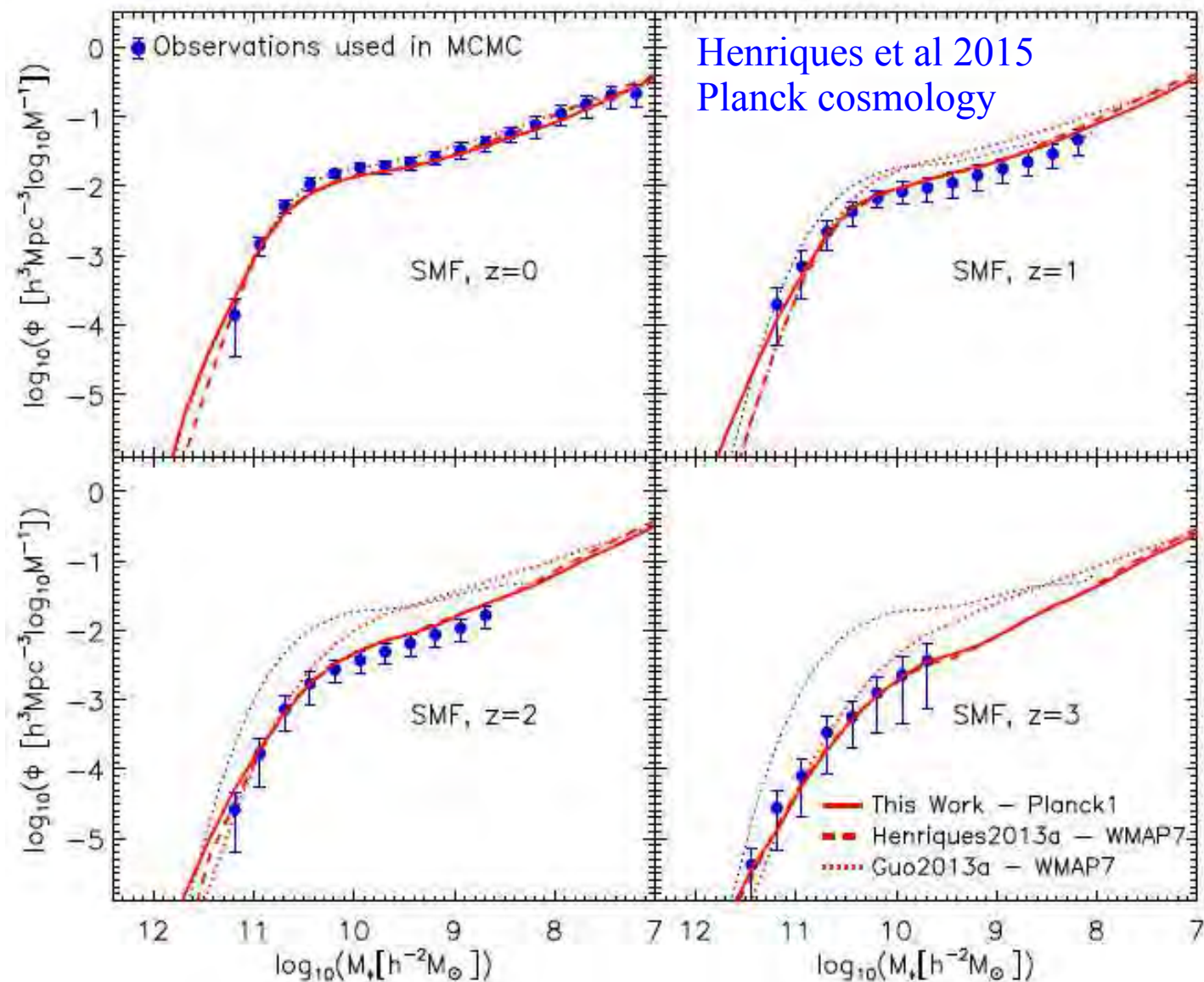
SA model of Guo et al (2011) constrained by observed stellar mass and luminosity functions at  $z = 0, 1, 2$  and  $3$

Parameters are determined by data at each individual redshift

*No* parameter set is consistent with data at all redshifts

(At least) one parameter is required to vary with redshift

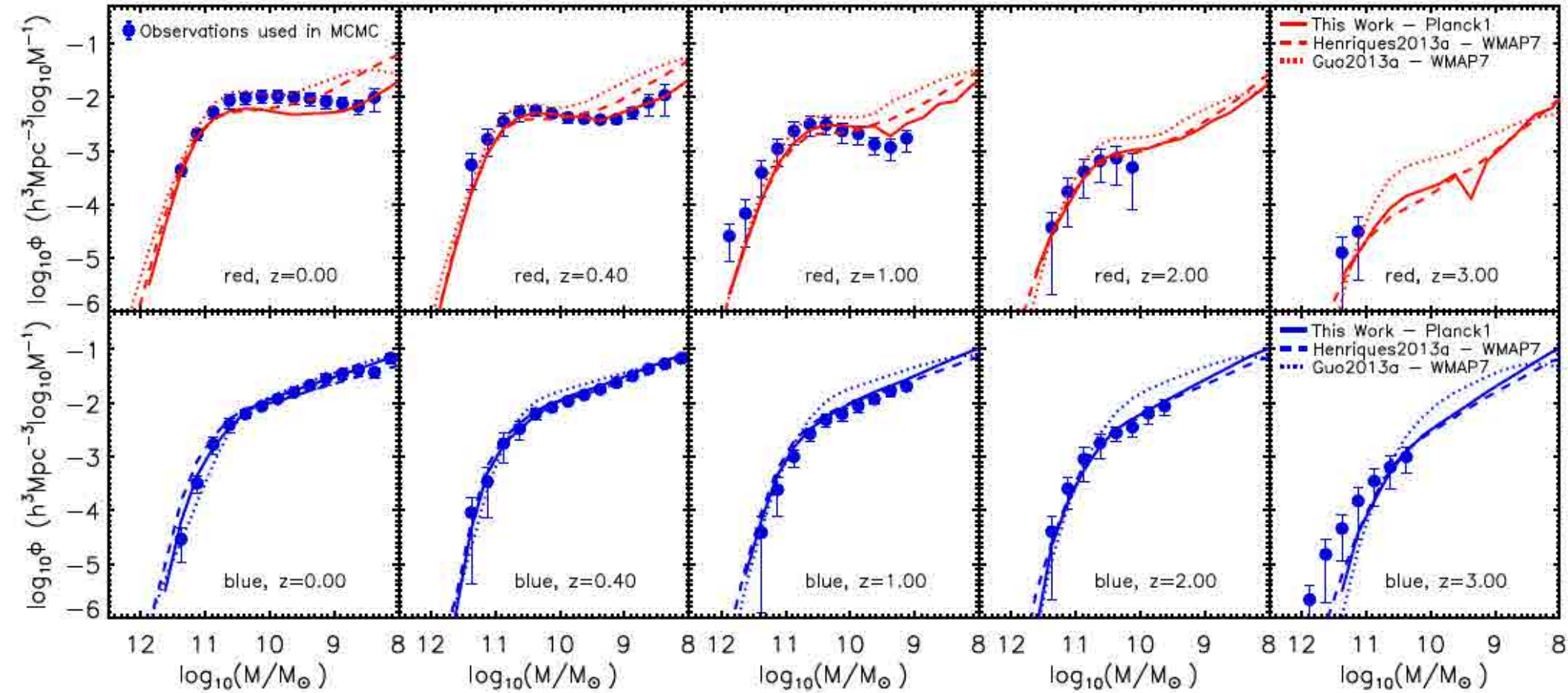




Changing the assumed timescale for reincorporation of wind ejecta

$$t_{\text{return}} = \text{const.} / H(z) V_{\text{halo}} \longrightarrow t_{\text{return}} = \text{const.} / M_{\text{halo}}$$

allows a good fit to data at all redshifts for the same # of parameters



Changing the assumed timescale for reincorporation of wind ejecta

$$t_{\text{return}} = \text{const.} / H(z) V_{\text{halo}} \longrightarrow t_{\text{return}} = \text{const.} / M_{\text{halo}}$$

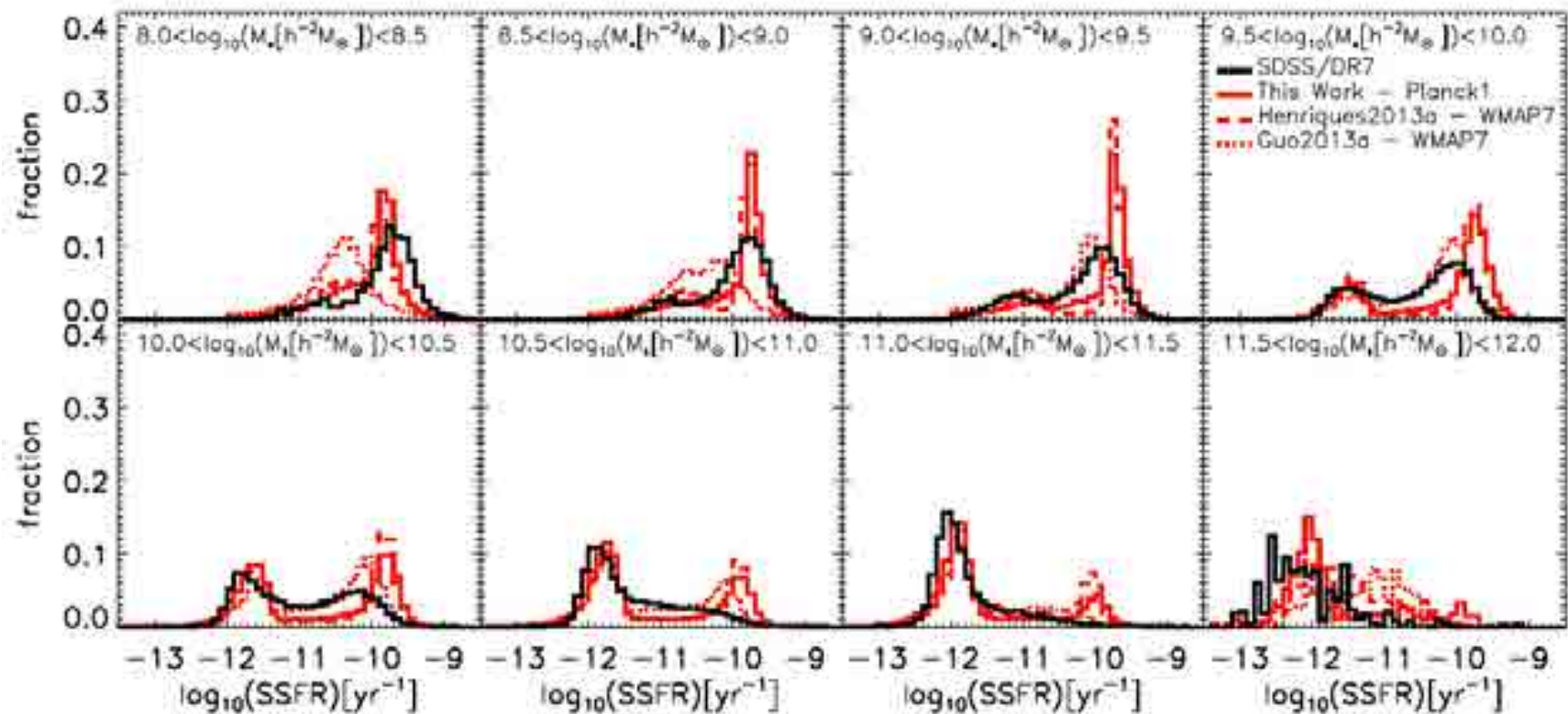
allows a good fit to data at all redshifts for the same # of parameters



# Updates to astrophysical modelling in 3<sup>rd</sup> generation models

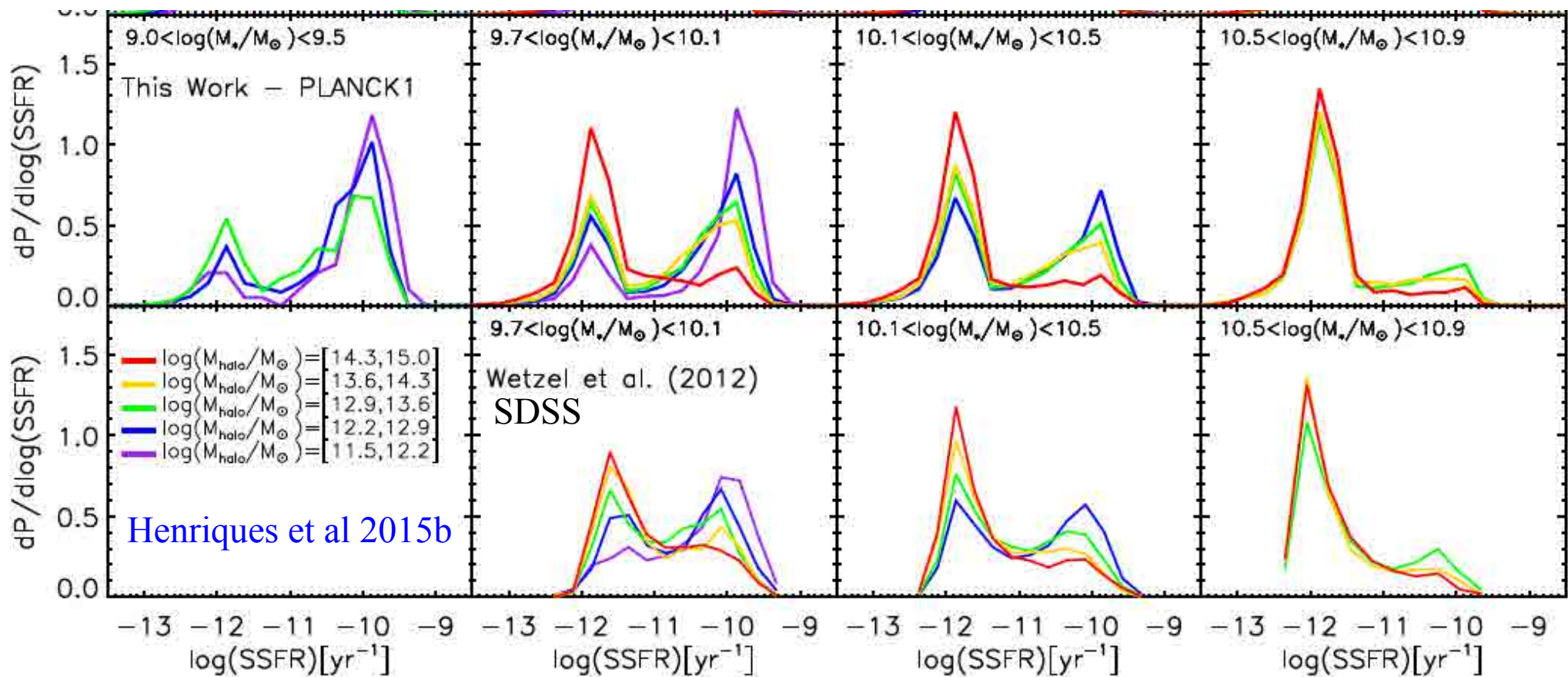
- Improved ejection/reincorporation models
- Elimination of ram-pressure stripping in low-mass halos ( $\log M < 14$ )
- MCMC exploration of full parameter space.
- Switch to Planck (2013) cosmology

Henriques et al 2015



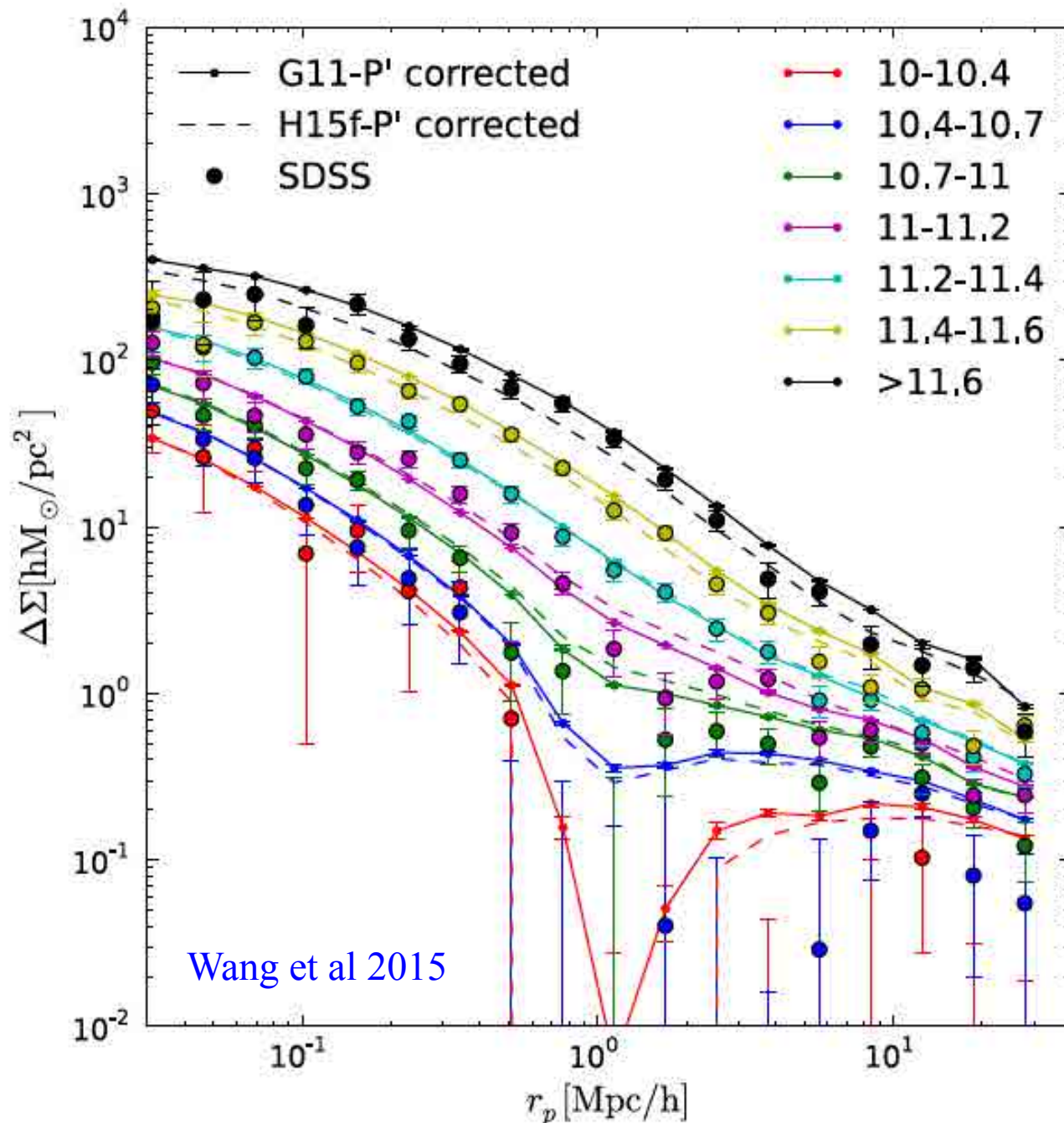
# Updates to astrophysical modelling in 3<sup>rd</sup> generation models

Specific star formation rates of satellite galaxies as a function of halo mass





# Influence of astrophysical modelling on halo predictions

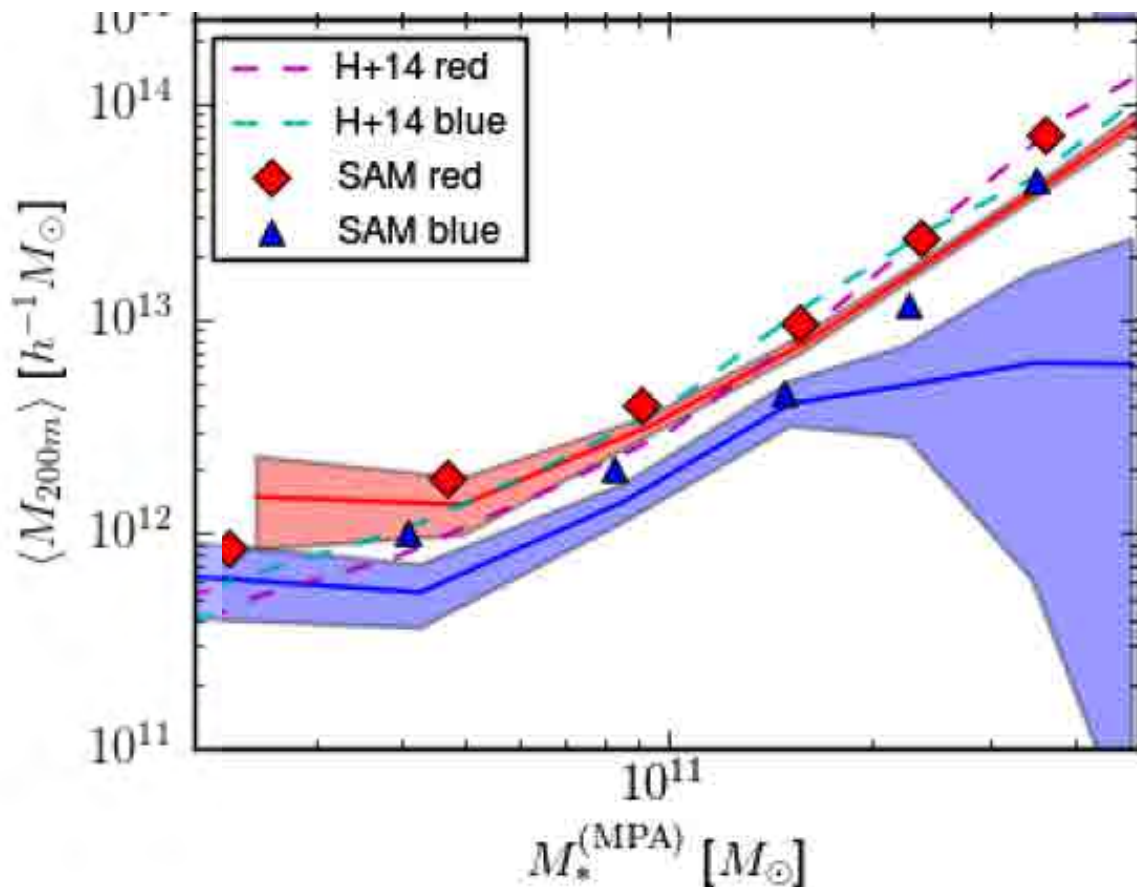


Two simulations of galaxy formation implemented on the same simulation of DM evolution and producing identical galaxy stellar mass functions give significantly different lensing predictions.

→ It matters exactly how the galaxies are assigned to dark matter (sub)halos

HOD models are not enough.  
Astrophysics is important!

## Relative halo masses of red and blue galaxies



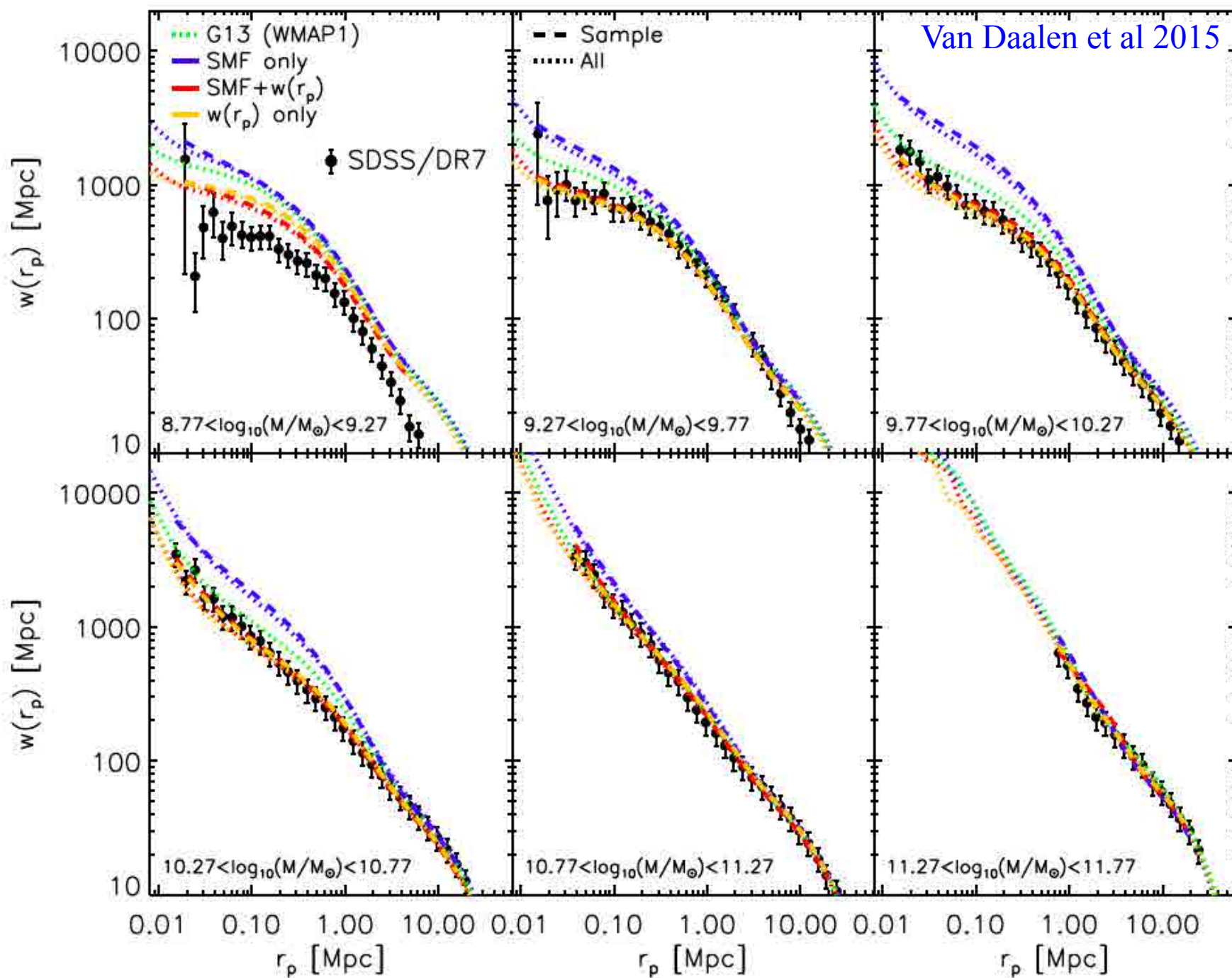
The halo masses of “central” galaxies in SDSS estimated separately for star-forming and passive systems.

At given stellar mass red galaxies have more massive halos than blue ones.

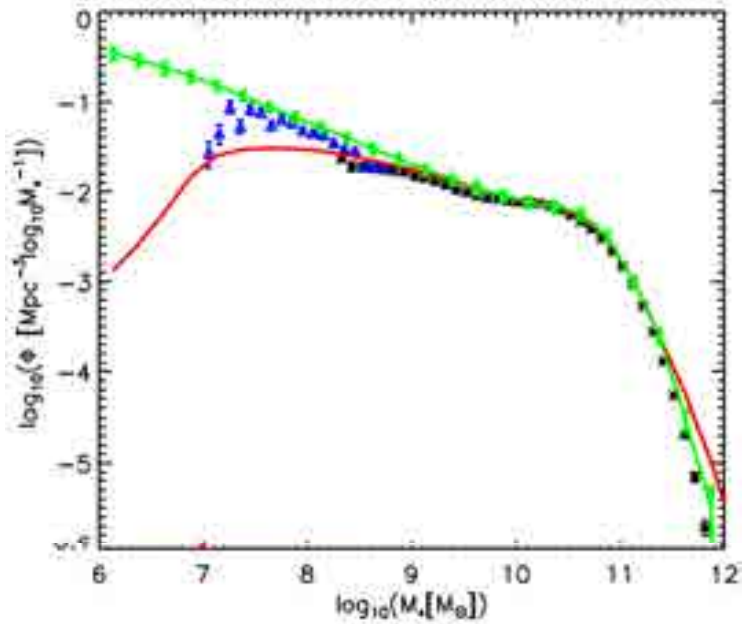
This is reproduced by the galaxy formation simulations, but “age-matching” models (Hearin et al 2014) predict the opposite.



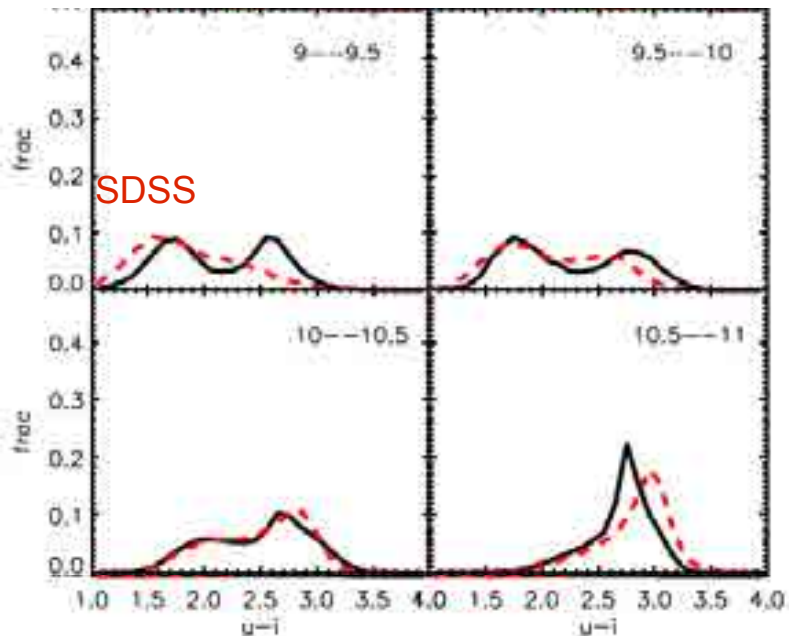
# Simultaneous MCMC fits to abundances *and* clustering



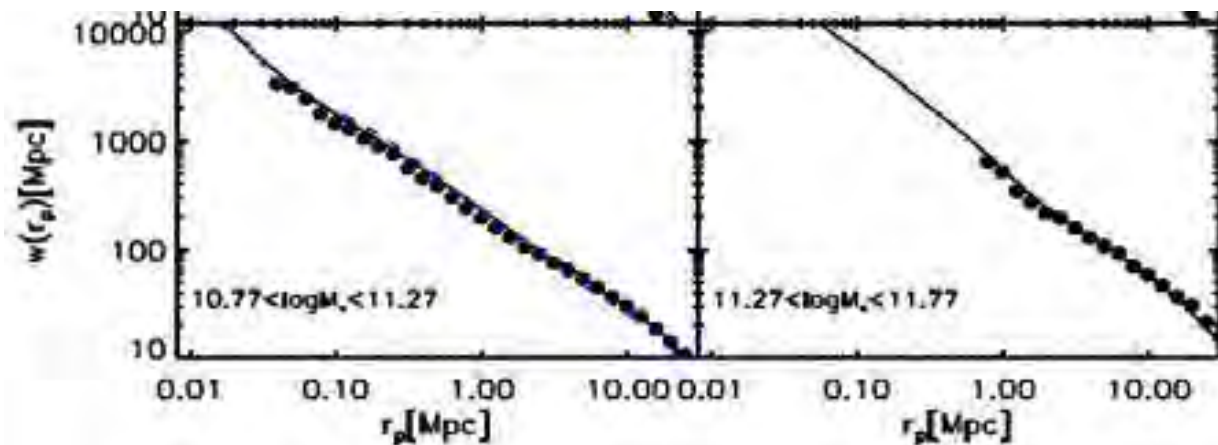
# How do we learn from population simulations?



When simulating the astrophysics of galaxy formation, agreement with data is a measure of success...



Guo et al 2011





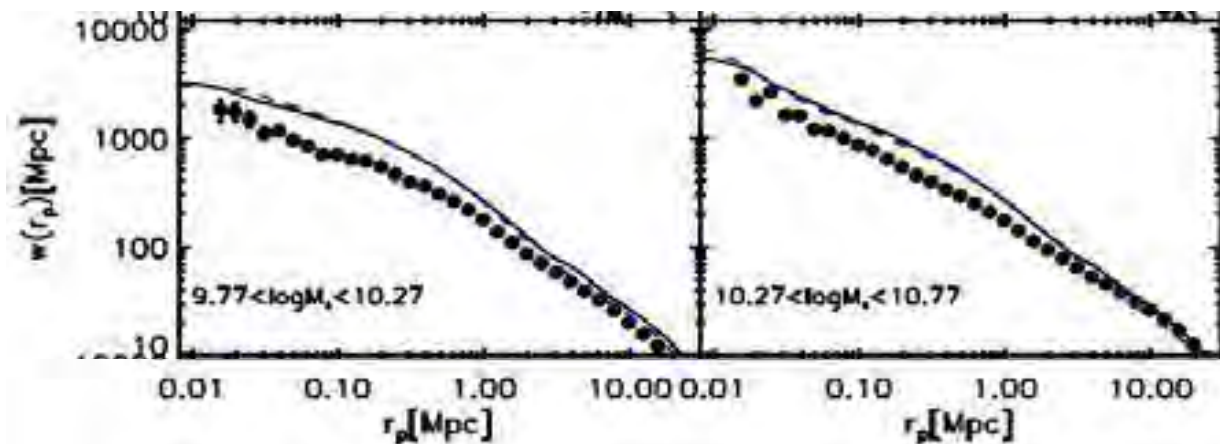
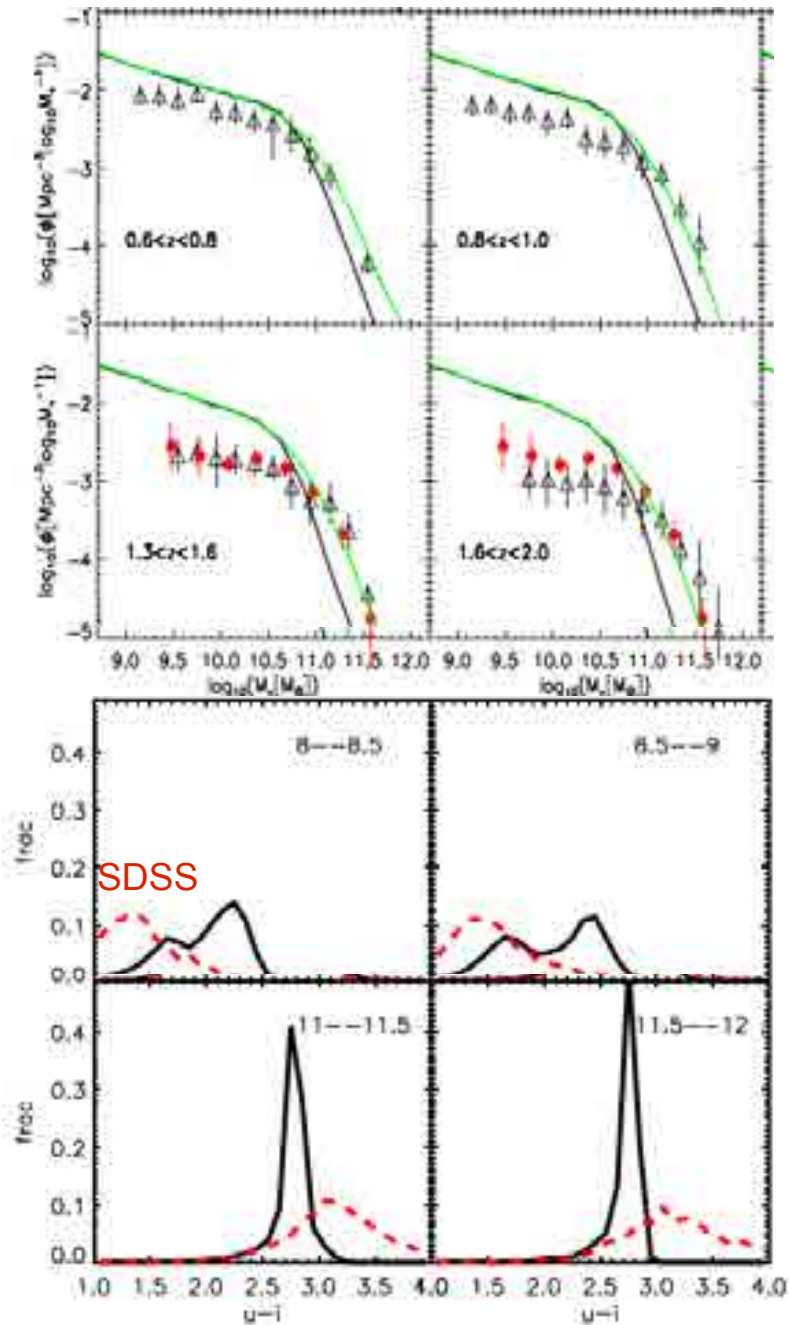
# How do we learn from population simulations?

When simulating the astrophysics of galaxy formation, agreement with data is a measure of success...

...but it is the failures which show where there is missing or inadequate physics

cosmology? star formation? enrichment and feedback? environmental effects?

Guo et al 2011



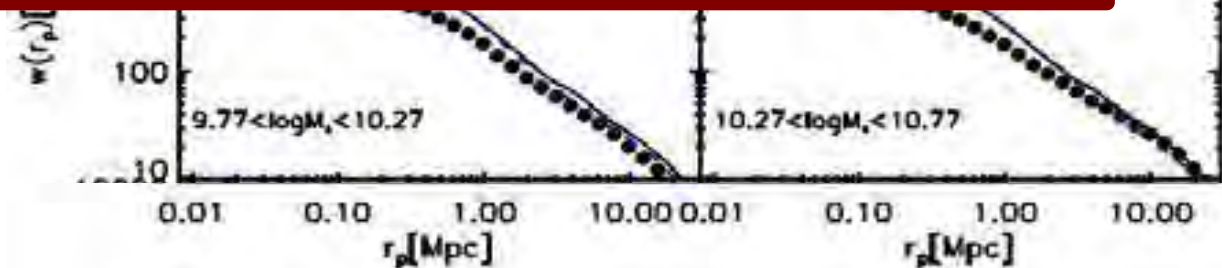
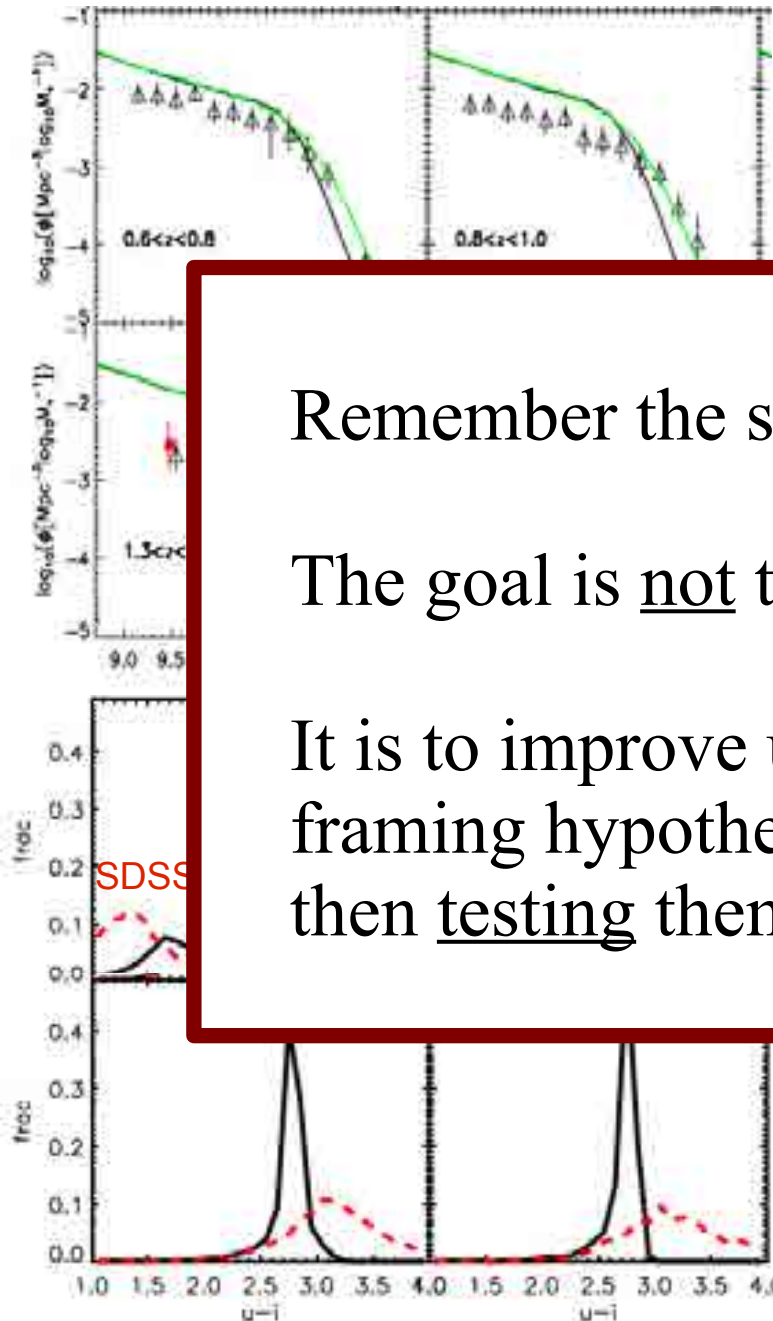
# How do we learn from population simulations?

When simulating the astrophysics of galaxy formation, agreement with data is a measure of success...

Remember the scientific method!

The goal is not to fit the observations

It is to improve understanding of the real world by framing hypotheses based on available data, and then testing them through acquisition of new data





## in conclusion...

- The initial conditions for galaxy formation are now precisely known in terms of both baryon/DM/radiation content and structure
- Simulations of nonlinear structure growth give precise and detailed statistics for the assembly histories of halos of all relevant masses
- Implementation of simplified treatments of baryonic processes (inflow, condensation, star and BH formation, enrichment, feedback, mergers...) gives *numerically converged* predictions for the full galaxy population
- These can be compared directly with the galaxy abundances, scaling relations, clustering and evolution found in large observational surveys
- Such comparisons indicate how galaxy formation and cosmological factors combine to influence observables, and hence allow us
  - i) to identify/characterize the primary galaxy formation processes
  - ii) to assess systematics when extracting cosmological information









C10024

Harsono & De Propris  
2007

$z = 0.40$

3.4' x 3.4'

HST/ACS

# “C10024”

$$M_{200} = 7 \times 10^{14} M_{\odot}$$

$$z = 0.41$$

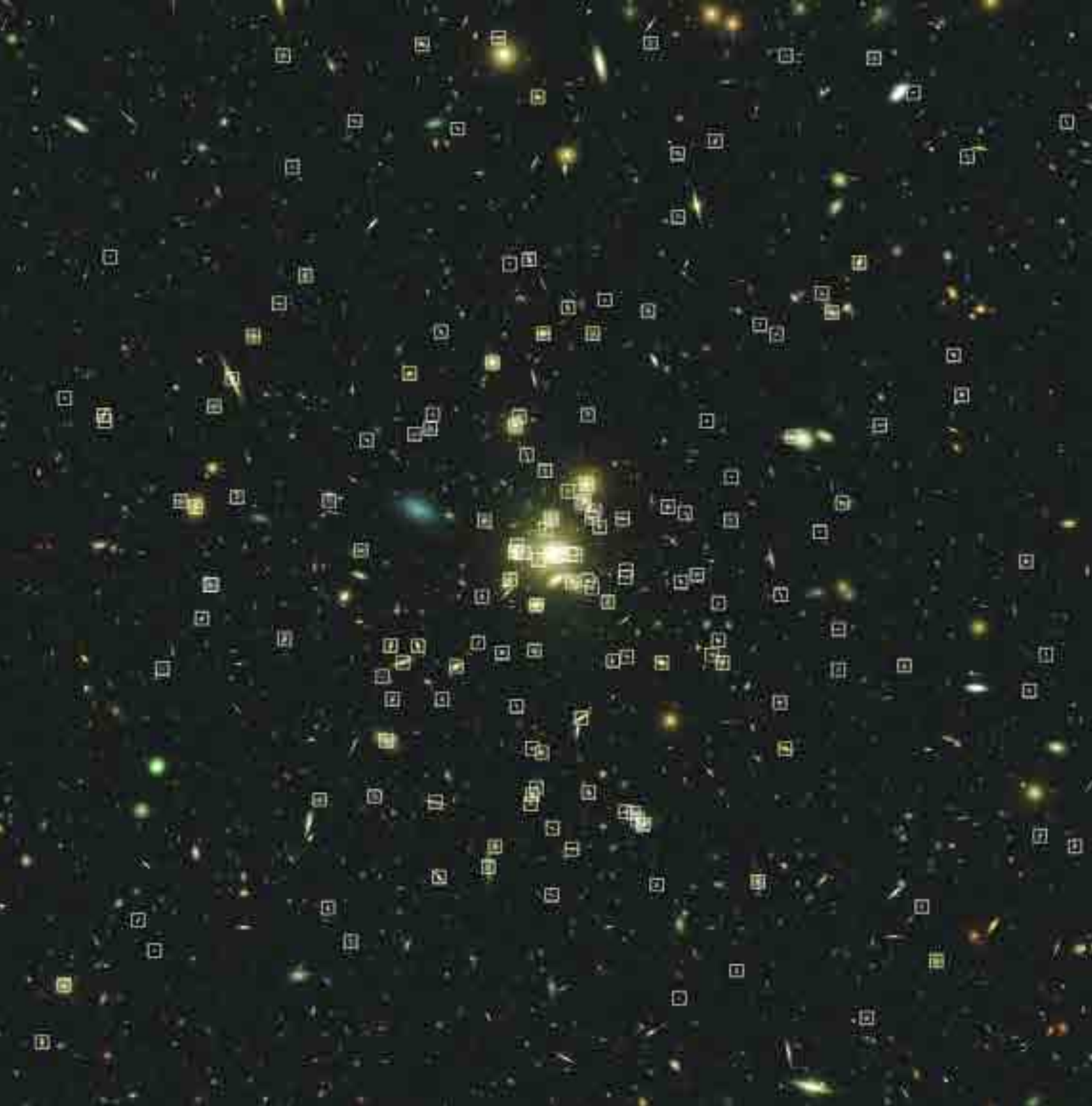
$$3.4' \times 3.4'$$

HST/ACS  
F475W, F625W,  
F850LP

10,000sec/filter

Overzier et al 2014





# “C10024”

$$M_{200} = 7 \times 10^{14} M_{\odot}$$

$$z = 0.41$$

$$3.4' \times 3.4'$$

HST/ACS  
F475W, F625W,  
F850LP

10,000sec/filter

Overzier et al 2014

We have developed the Millennium Run Observatory (MRObs), a theoretical virtual observatory framework which uses virtual telescopes to 'observe' semi-analytic galaxy formation simulations based on the suite of Millennium Run (MR) dark matter simulations.

Description of data products in the MRObs: [Here](#)

Explore our virtual observations in the MRObs Image Browser: [Here](#) (Interactive version of the MRObs Image Browser: [Here](#))

Data release: [Here](#)

FAQ and How-to: [Here](#)

Visualisations and PR material: [Here](#)

Contact: [Roderik Overzier](#), [Gerard Lemson](#)

References: Overzier, Lemson, et al. 2012, MNRAS, in press ([arXiv:1206.6923v2](#), high resolution paper [here](#)). (see '[about & credits](#)' for further references).

### Surveys Overview Table

<http://galformod.mpa-garching.mpg.de/mrobs/>

Survey ▲	Instrument/Filter	Stellar Population	IGM Model	Cosmology	Download
<b>CANDELS/COSMOS</b>	HST/ACS F606W HST/ACS F814W WFC3/IR F105W WFC3/IR F125W WFC3/IR F160W	BC03 M05	MADAU MEIKSIN INOUE-IWATA	WMAP1 WMAP7*	<a href="#">v0.5</a>
<b>CANDELS/UDS</b>	HST/ACS F606W HST/ACS F814W WFC3/IR F105W WFC3/IR F125W WFC3/IR F160W	BC03 M05	MADAU MEIKSIN INOUE-IWATA	WMAP1 WMAP7*	<a href="#">v0.5</a>
<b>CFHT-LS Deep</b>	Megacam u Megacam g Megacam r Megacam i Megacam z	BC03 M05	MADAU MEIKSIN INOUE-IWATA	WMAP1 WMAP7*	<a href="#">v0.5</a>



# Stellar mass function evolution in the Eagle simulations

