# Galaxy formation and distribution in a cosmological context

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14/05/2015 KIAA-PKU

## Galaxy and Cosmology group at PMO (theory)

partner group with max-planck-institute for astronomy (Heidelberg, Germany)



成员staff: 康熙(研究员),李国亮(研究员),王蕾(助研)

博士后(postdoc): Alessio Romeo, Emanuele Contini, 褚哲,

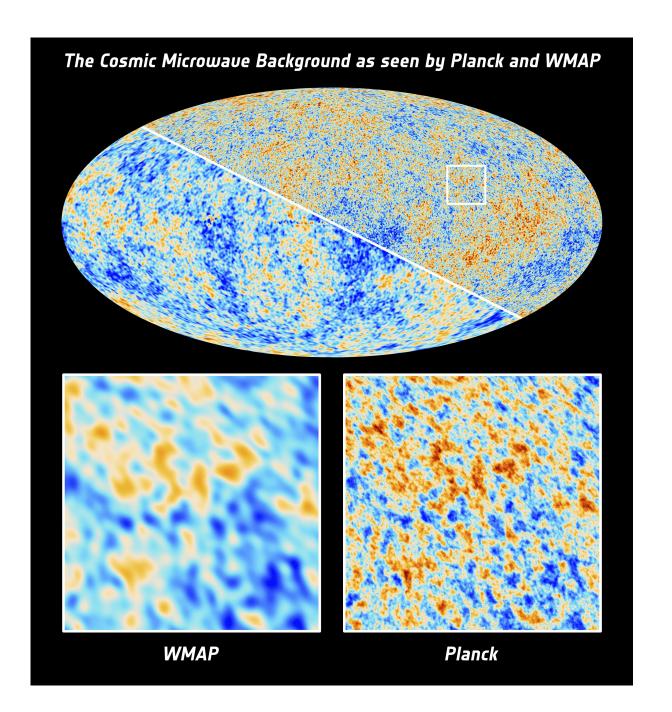
研究生: 10名

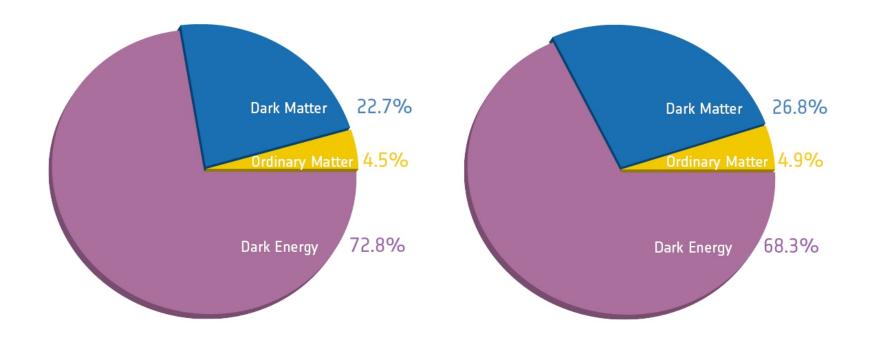
## Research interests in our group

- Semi-analytical model for galaxy formation
- Numerical simulation of galaxy cluster
- N-body simulation of galaxy merger
- Large scale structure analysis
- Gravitational lensing (strong + weak)

# Outline

- Structure formation
- Models for galaxy formation
- Several types of galaxy distribution
- milky way as a local lab
- Summary

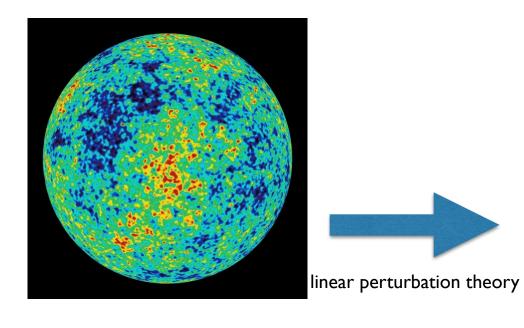


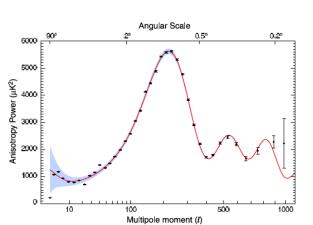


Before Planck

After Planck

The Universe is also expanding 7% slower than before and is 80,000,000 years older!





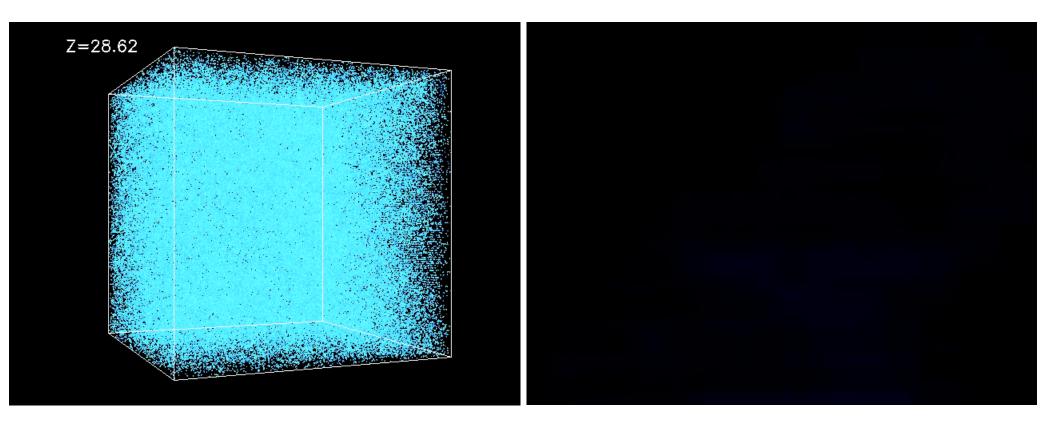
## Non-linear



N-body Simulation

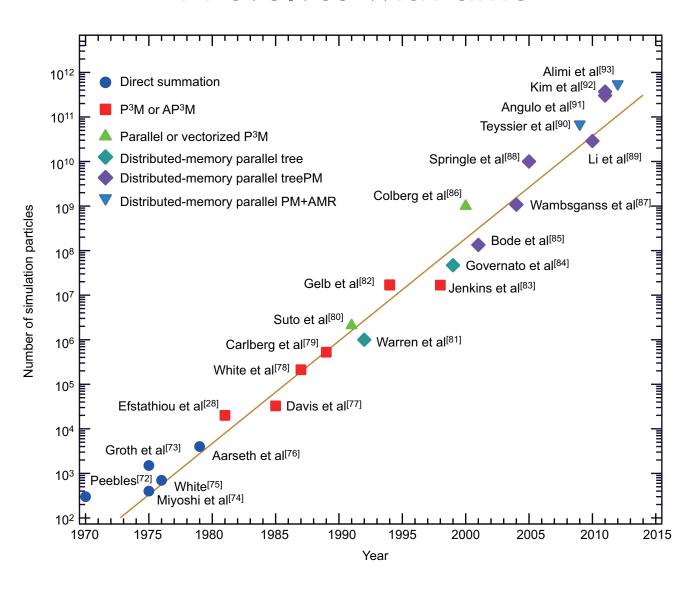
## structure formation in N-body simulation

large scale small scale



Gravitational instability is the driver of structure formation

## N evolves with time





# Computational Cosmology Consortium of China (C4)

盘古模拟



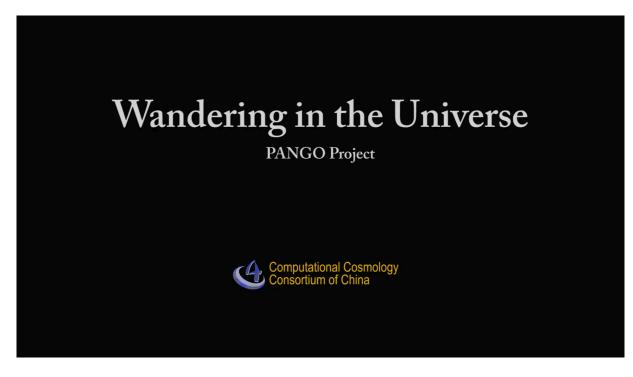
#### Members:

Purple Mountain Observatory
National Astronomical Observatory
Shanghai Astronomical Observatory
Shanghai Jiaotong University
Zhongshan University
Super-Computing Center of CAS

Facilities: ShenTeng 7000 (12,000 cores)

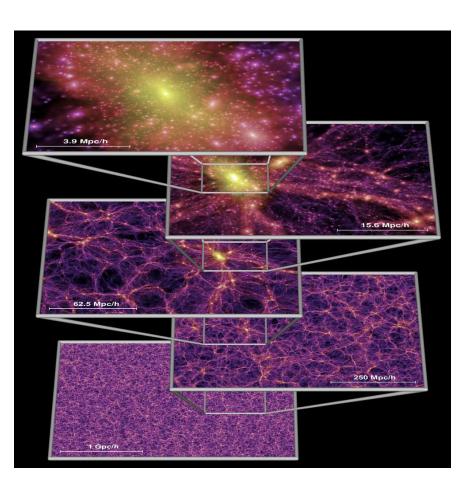
#### Pangu simulation

N=30 billion, Box Size=1000 Mpc/h, WMAP5 cosmology Using 2048 cores, 1 Million CPU hours, 6TB memory, Data Volume:40 TB



Running cosmological simulation is very expensive

## Hierarchic Structure of the universe



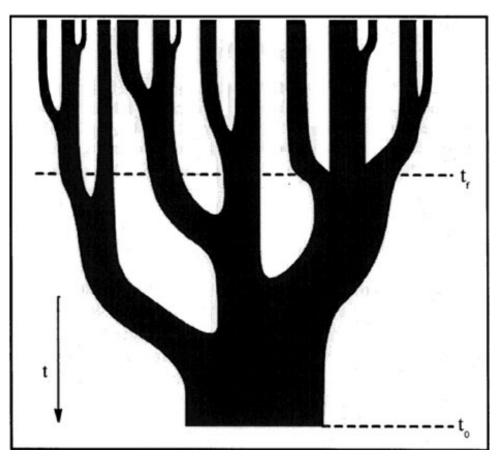
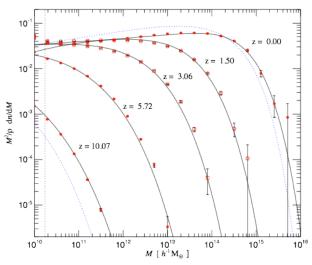


Image from Millennium Simulation

## Using N-body simulation to study



- v (km/s)

  observed

  expected from luminous disk

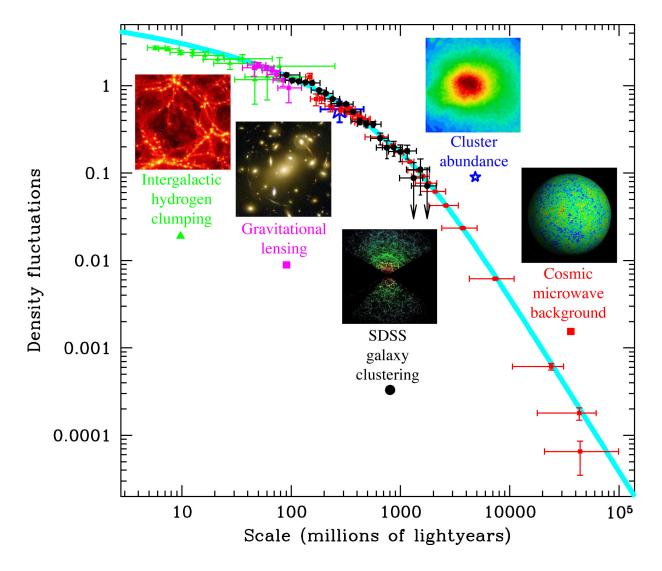
  5 10 R (kpc)

  M33 rotation curve (fig. 1)

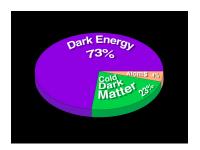
- Halo mass function
- Galaxy rotation curve
- Subhalo mass function
- •Cosmic web properties: filament, voids, sheets
- Dark matter power spectrum

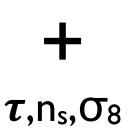
We can also:
Investigate the effects of dark matter and dark energy on the structure formation

## Concordance A-CDM Model



Credit: Max Tegmark





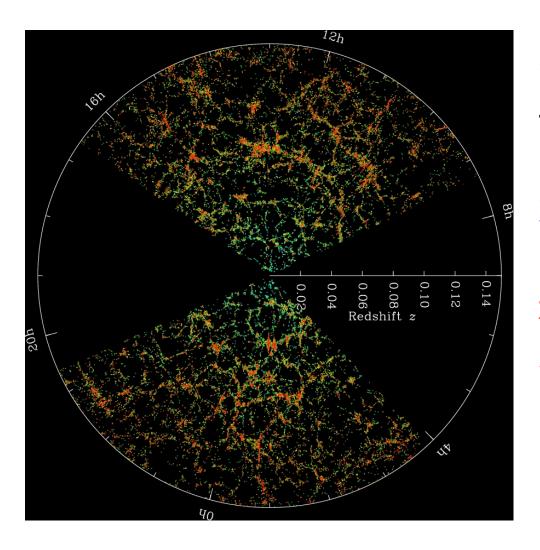
#### Still not clear:

- Nature of DE
- WDM vs CDM

Goal of next generation sky survey: BAO, Weak-lensing, redshift-distortion

## Outline

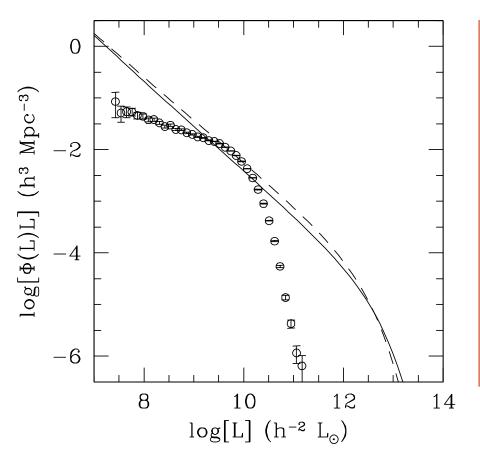
- Structure formation
- Models for galaxy formation
- Several types of galaxy distribution
- Various tests (milky way as a local lab)
- Summary



利用SDSS巡天,我们已经 直接观测到了100多万个星 系,精确地测量了其统计性 质:数目-光度,质量,颜 色,形态,空间分布等

模拟宇宙学背景下星系的形成(统计上)是当前星系宇宙学的重要研究方向

# luminosity function: theorists have been struggling with it for about 20 years



Line: theory

points: data

how to link them? we need models for galaxy population formation

Yang et al. 2003

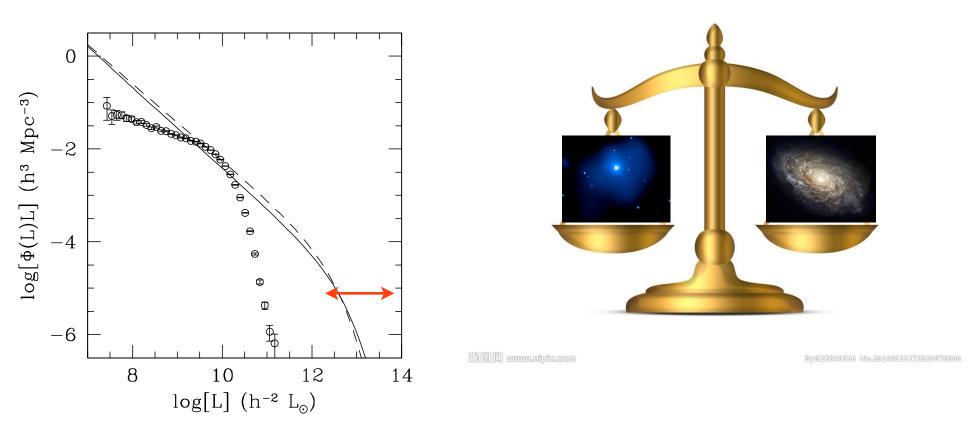
# interpreting galaxy distribution

- Abundance matching: using dark matter halo(subhalo) properties (often at accretion) with abundance match to galaxy population (no free parameters, still no physics)
- HOD/CLF: halo occupation distribution, conditional luminosity function: put galaxy(with given stellar mass/luminosity) in dark matter halo (local observations are inputs, no physics input)

# modeling galaxy formation

- Hydra-simulation: with gas, star formation included, advantage: model gas dynamics directly, but star formation, feedback still included by hand, problems: sub-grid physics, resolution effect, over-cooling, time consuming
- Semi-analytical model: combine dark matter halo merger trees with simple description of galaxy physics, advantages: computation easy to produce large sample of galaxy population, easy to change cosmology & model parameters (too many free parameters)

# Abundance matching (using stellar mass function only)



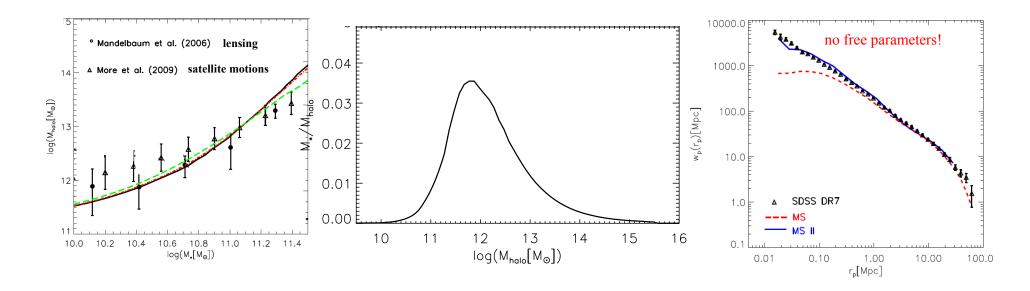
- n(>m\_star)=n(>M\_halo)
- current models have included subhalos and orphan galaxies, using halo mass at accretion(M\_{acc})

# predictions from Abundance matching

stellar-halo mass relation

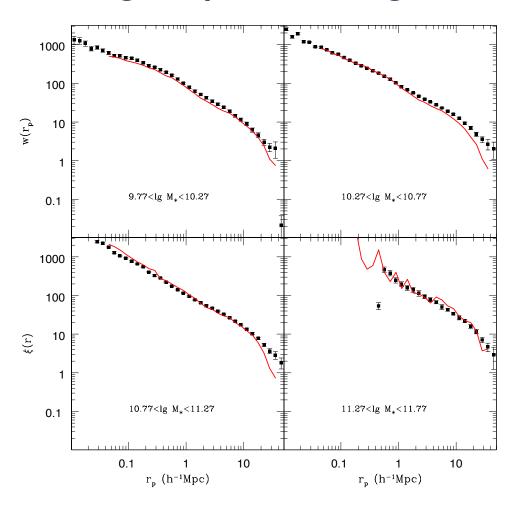
star formation efficiency

galaxy clustering



Guo et al. 2010

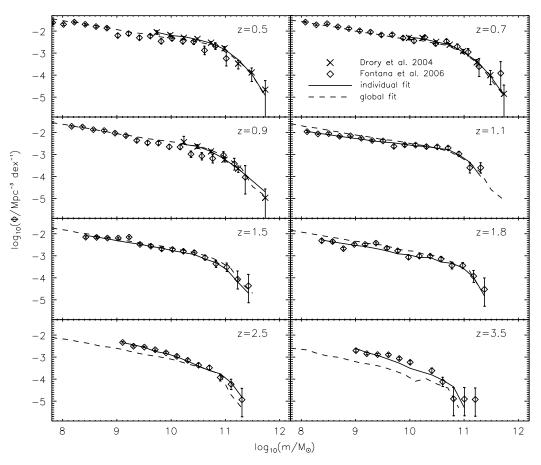
# Abundance matching: galaxy clusterings

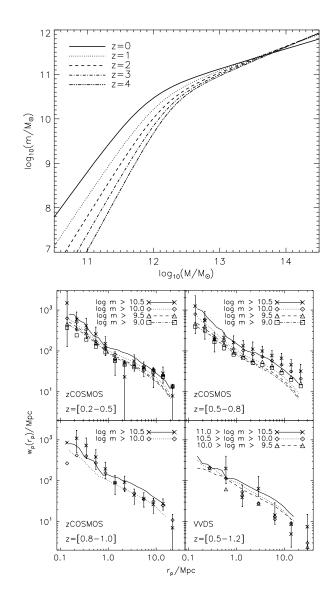


good agreement in different stellar mass bins

Kang et al. 2012

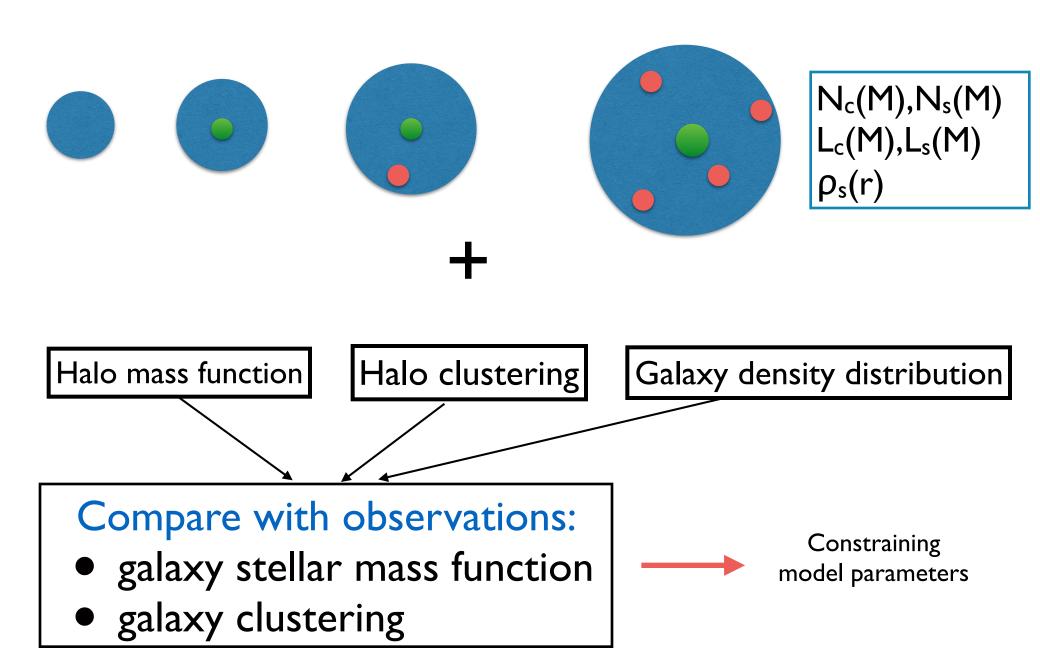
# Abundance matching (high-redshift)





Moster et al. 2010

## HOD/CLF (Halo Occupation Distribution)



#### **HOD** or CLF can

describe the galaxy distribution describe the star formation history

However, no physics, do not tell us why

we need models describing galaxy formation!

# Structure of SAMs

Formation of dark matter (sub)halos

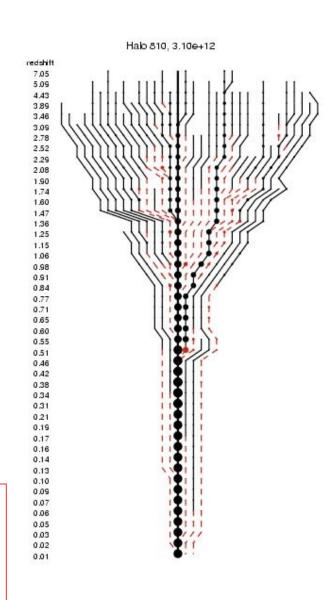
Baryonic physics (most uncertain)

# Formation of dark matter (sub)halos

Directly from N-body simulations

 EPS theory (high-resolution, no spatial information)

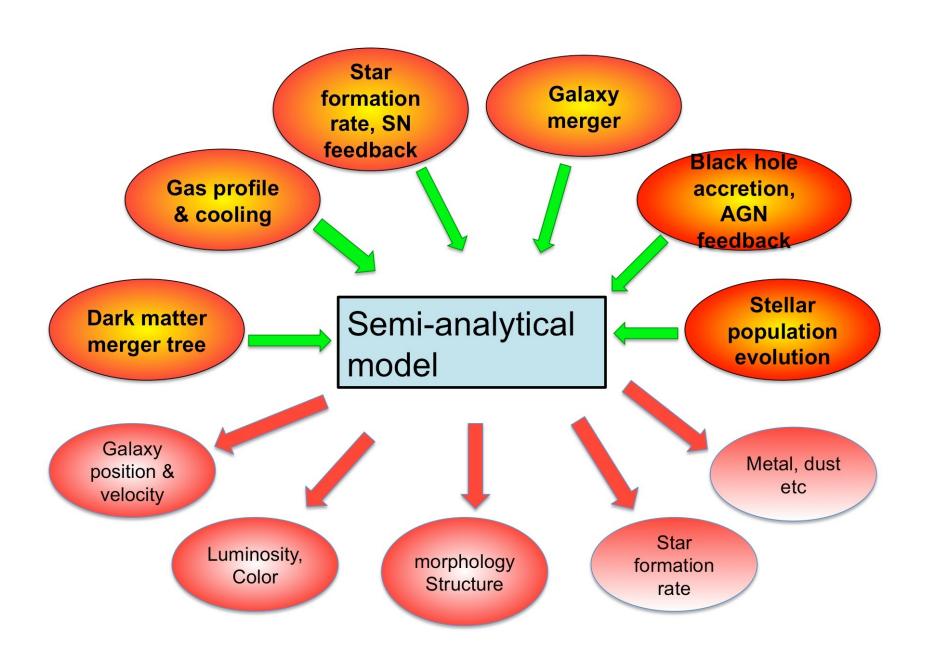
Halo merger trees are fully determined given cosmological model, initial conditions



# 5/24/12

#### Baryon process: part1

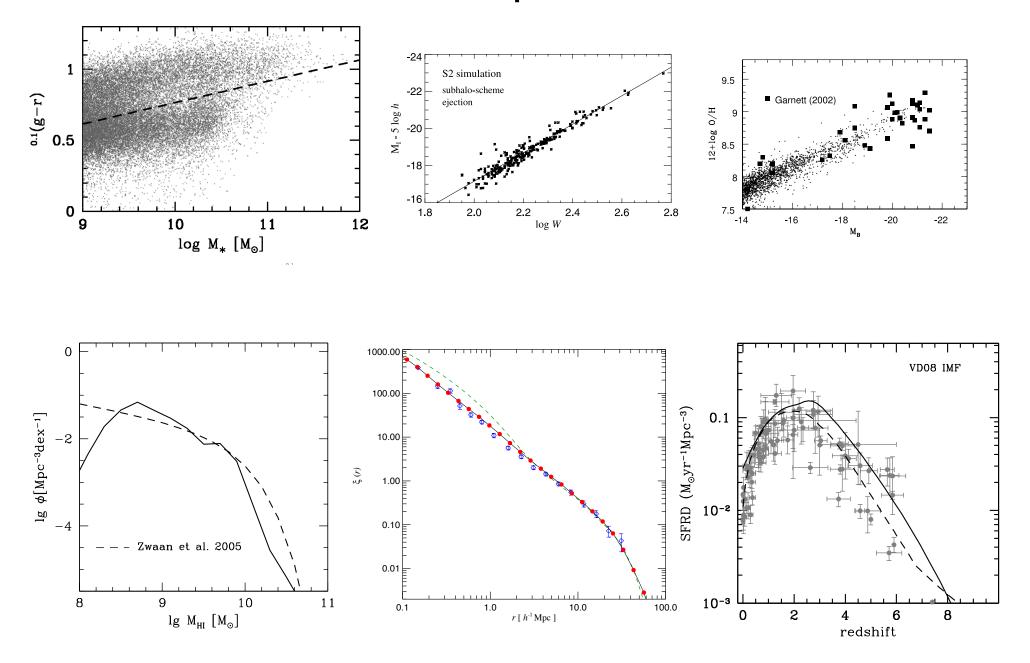
- Gas shocked heated to halo virial temperature
- Angular momentum conservation, r ~ 0.05R
- Satellite merge with central after a dynamical friction time
- Star form both in disk
   (efficiency not well
   constrained) and during
   merger, (merger trigger
   more stars formed)
- Major merger trigger bulge form, most gas consumed, others blow out (dear, red ellipticals)



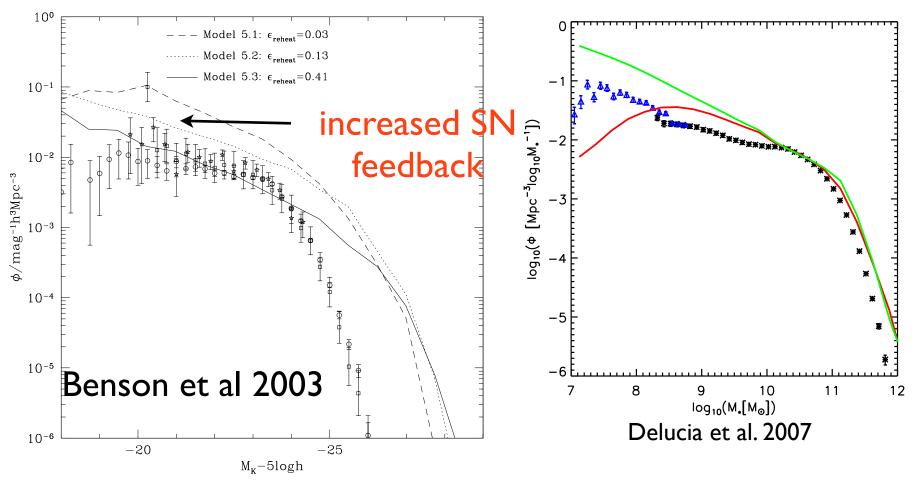
## Main baryonic process (not very clear)

- Cold gas accumulation: how many gas can cool in given halo (gas accretion manner?)
- Star formation efficiency (mass dependency, redshift evolution? )
- SN feedback, Black Hole feedback (fate of reheated gas, BH accretion rate?)
- Central galaxy ->satellite: ram-pressure stripping, stellar stripping, disruption, merger rate (partly understood)
- Stellar population evolution (IMF? )
- Others: galaxy merger, morphology transform, star burst,,,

# SAM predictions

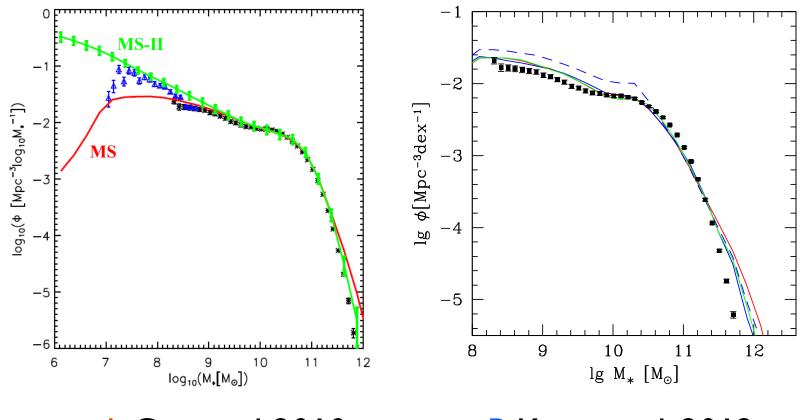


## What we have learned from SMF?



A flat faint end can be obtained if: SN feedback efficiency is  $\sim V^{-\alpha}$  ( $\alpha > 2$ ), (Cole et al. 2000)

## What we have learned from SMF?



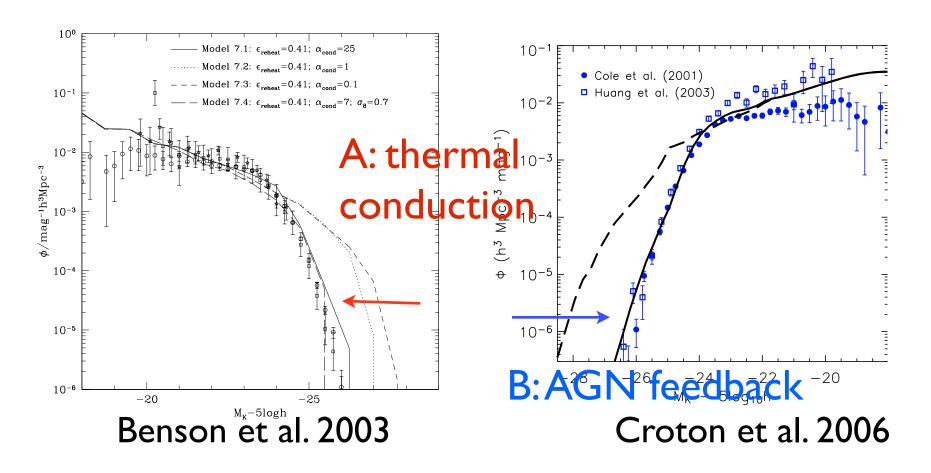
A:Guo etal 2010

B:Kang et al. 2012

A flat faint end can be obtained if:
A:gas re-incorporation time is longer
B:gas cooling is lower in small halo

B: M<sub>cool</sub>=fM<sub>hot</sub>/t<sub>dyn</sub>

#### What we have learned from SMF?



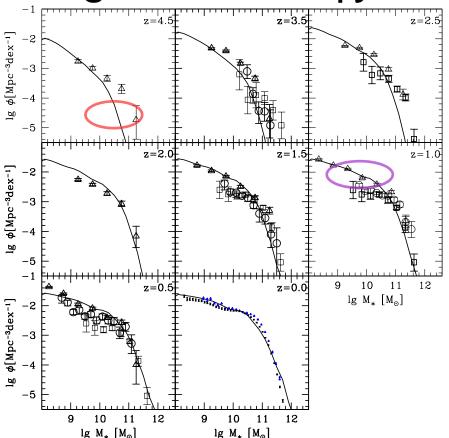
A sharp decline at the bright end can be obtained if:

A: high thermal conduction in cluster

B:AGN feedback is incorporated

## Problem 1: Stellar mass functions at z>0

Kang et al. 2010, ApJ

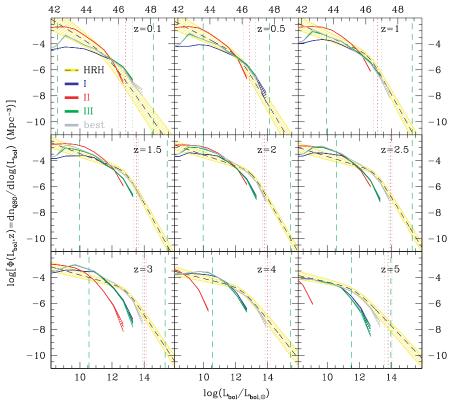


- Model under-predict number of massive galaxies at z>2
- be aware of Cosmic variance and stellar mass estimation uncertainty
- •Too many galaxies at M\_\*=10^10 at z>0 (But Faint end is not well constrained, discrepancies among data and recent COSMOS results has more faint galaxies)

Large uncertainty on SMF at massive end (Bernardi+2013, depending on how to fit light distribution) and faint end (survey magnitude limit etc)

## Predictions on QSOs

# **QSO** Luminosity functions



Most luminous QSO at z=6.3 (BH: 10^10 solar mass)



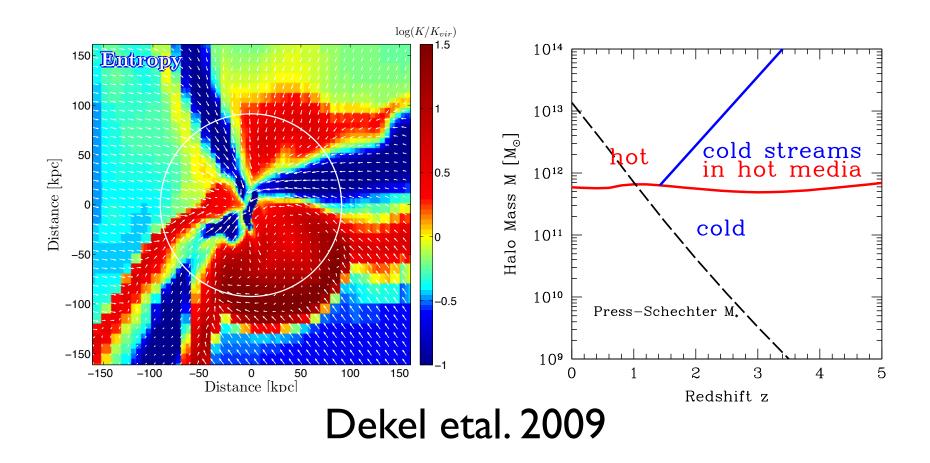
Marulli et al. 2008

吴学兵 et al. 2015 Nature

How to relate the growth of BH with galaxy formation? In SAM, QSO growth occur with major mergers

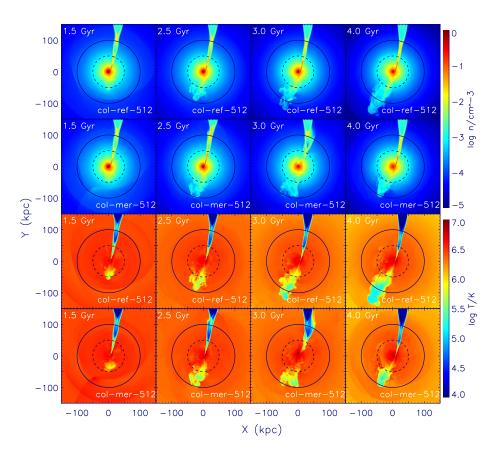
BH accretion more efficient at high-z? Any other source of rapid BH accretion?

# Even the gas cooling at high-z is quite different Cold flow at high-z, massive haloes:

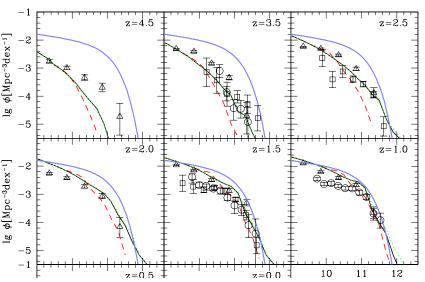


Gas goes to halo center in form of cold flow, faster than conventional cooling formula:  $M_{hot}(r_{cool})/t_{cool}$ 

# High-z galaxy suffers many mergers, and difficult to observed) Is cold flow stable?



Our toy model shows: cold flow can maintain its stability if continuous cold flow is sustained

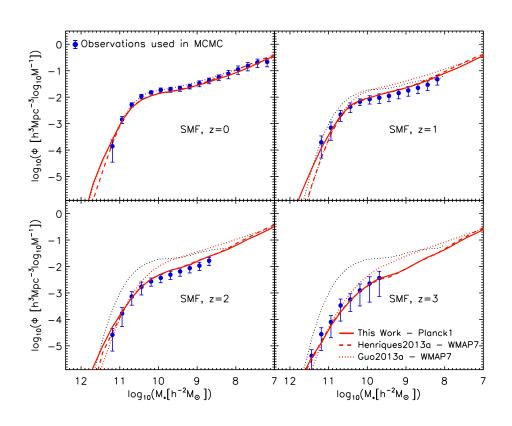


Wang, Kang+ 2014, MNRAS

Kang et al. 2010 ApJ: rapid cold accretion produce more massive galaxies

Could deep survey around luminous QSO identify the nearby filamentary structure around?

### Problem 2: low-mass galaxies (big & real problem)



Low-mass galaxy problem is solved if

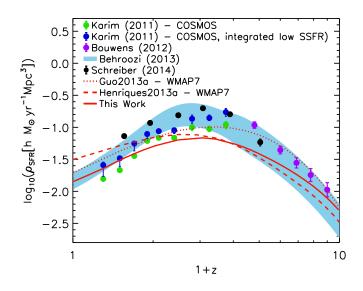
- gas re-incorporate time is longer
- star formation threshold is lower
- ram-pressure is suppressed
- However, SFRH is still not right!

#### Henriques et al. 2014 (Munich model)

Solutions are inconsistent with Hydro simulations by illustris

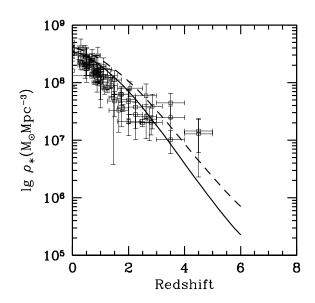
- gas cooling is full traced
- supernova feedback is maximized

# Problem 3: Cosmic Star Formation History (not a problem of SAM, but data itself)

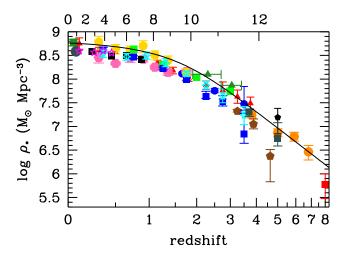


-0.4
-0.4
-0.8
-0.8
-1.2
-1.2
-2.4
0
1
2
3
4
5
6
7
8
redshift

henriques et al. 2014



Kang et al. 2010



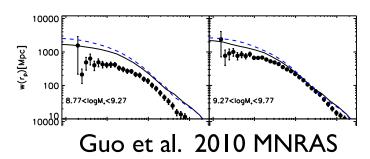
Madau & Dickinson 2014, ARAA previous work under-estimated SMD (using a too flat faint-end slope)

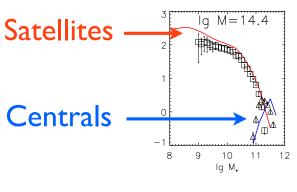
#### Physics affecting satellite galaxies

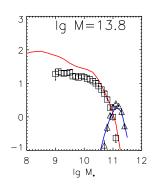
- Ram-pressure stripping: galaxy color
- Tidal stripping & disruption: red satellite fraction, intracluster light
- Supernova feedback efficiency: satellite galaxy mass
- Cosmic re-ionization: abundance of low-mass satellites
- Dark matter property: abundance/kinematics of satellites

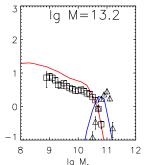
#### Problems for low-mass galaxies

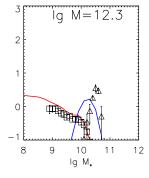
#### 2 points correlation function



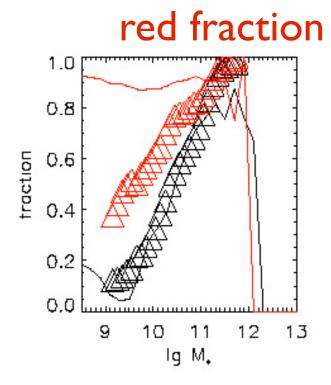




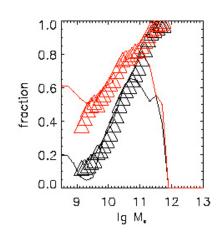




Kang 2014 MNRAS



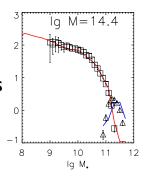
Too many low-mass & red satellite galaxies in Almost all Sam models !!!

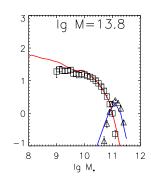


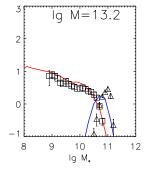
A: Non-instantaneous stripping

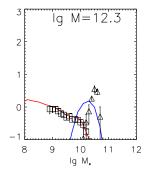
of hot halo gas in satellites lasting about 3 Gyr

+ Some fraction of satellites being disrupted

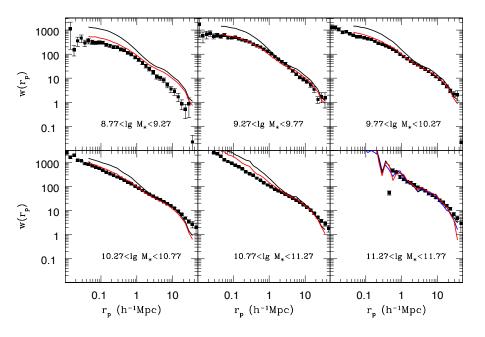








Kang & van den Bosch 2008

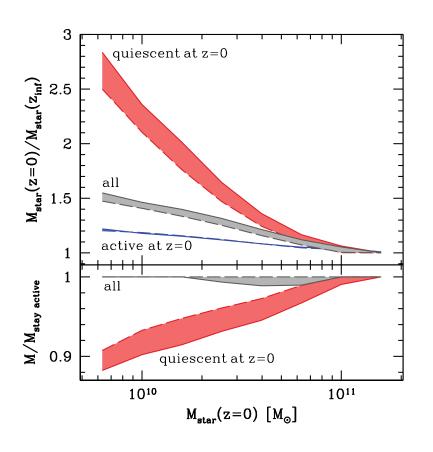


B:The supernova feedback efficiency should be a local effect:Vreheated=Vdisk previous models assume V<sub>reheated</sub>=V<sub>host</sub> (temperature of the host halo)

Effect A & B have opposite effects on satellite mass

Kang 2014 MNRAS

#### constraints on satellite mass growth

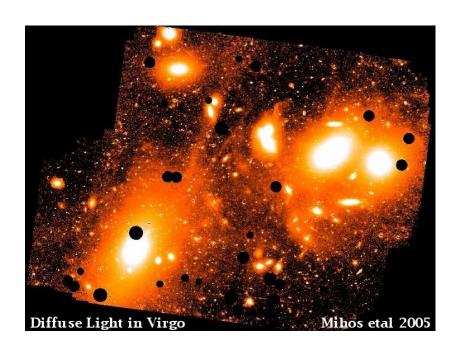


mass growth of satellites after infall should be very limited (at most by factor of 2)

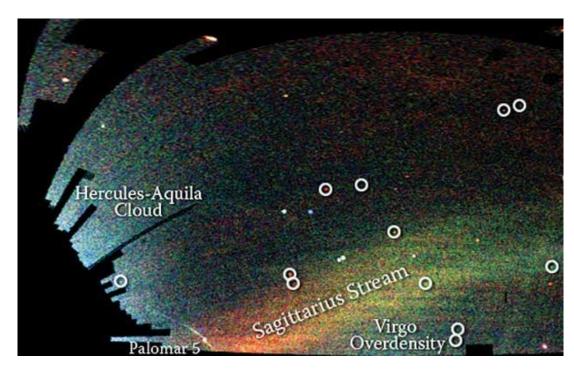
One possible solution to the too-many red satellites problem: strong stripping and disruption

Wetzel et al. 2013

#### diffuse stellar light and tidal stream



Virgo cluster

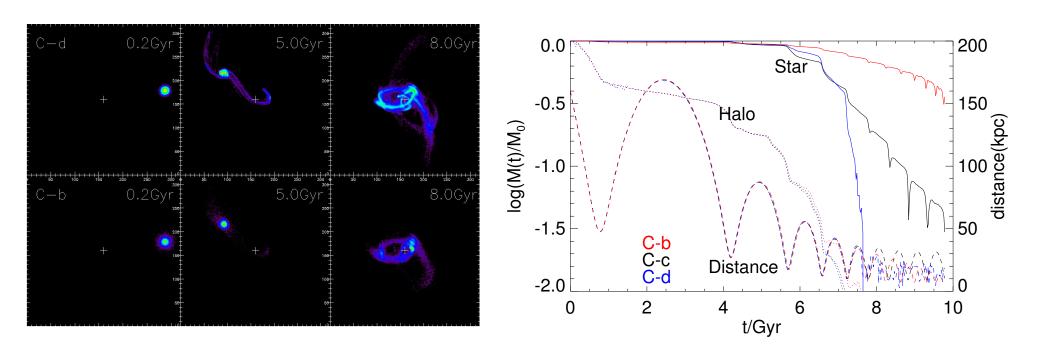


Milky Way

tidal stripping and disruption is included in SAM but in a very simple way dependence on galaxy morphology?

#### N-body simulation of tidal stripping

Chang, Kang+, 2013, MNRAS



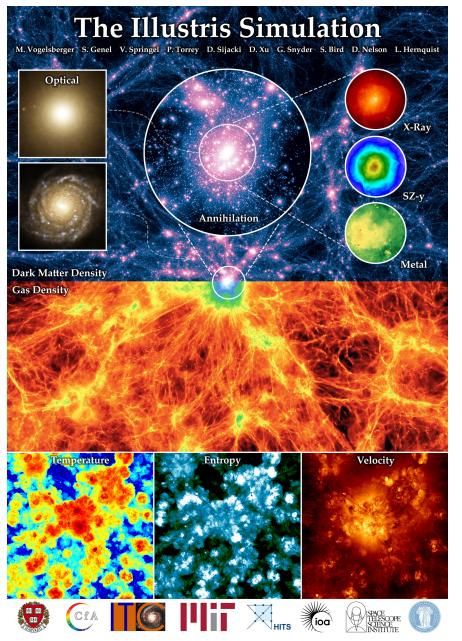
stripping efficiency depends on galaxy morphology!

# interpreting galaxy distribution

- Abundance matching: using dark matter halo(subhalo) properties (often at accretion) with abundance match to galaxy population (no free parameters, still no physics)
- HOD/CLF: halo occupation distribution, conditional luminosity function: put galaxy(with given stellar mass/luminosity) in dark matter halo (local observations are inputs, no physics input)

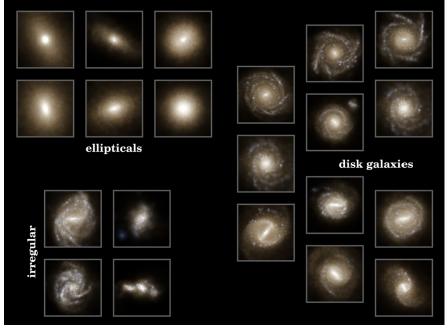
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Illustris: a state-of-the-art cosmological hydrodynamical simulation of galaxy formation. Including almost everything! (AREPO code)

A big step forward to model galaxy formation in Lab

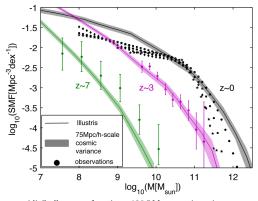


End of hydro-simulation of galaxy formation?

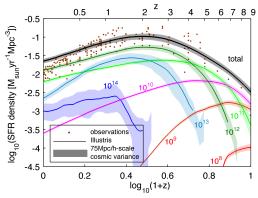
#### Vogelsberger et al. Nature, 2014:

AREPO (AMR): (75Mpc/h)<sup>3</sup> with 12 billion particles, 19 Million CPU hours, peak memory: 25TB

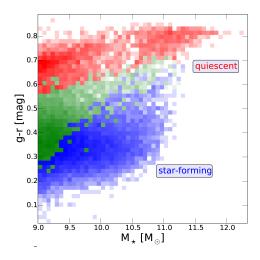
#### predictions from illustris

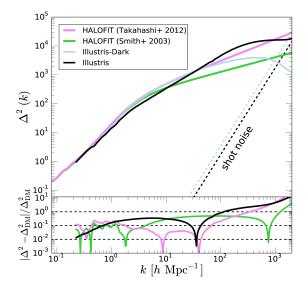


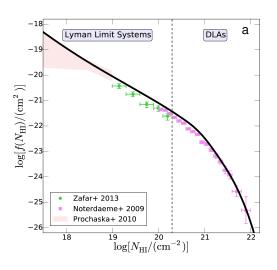


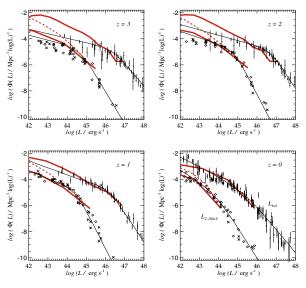


(c) Cosmic SFR density,  $106.5\,\mathrm{Mpc}$  cosmic variance





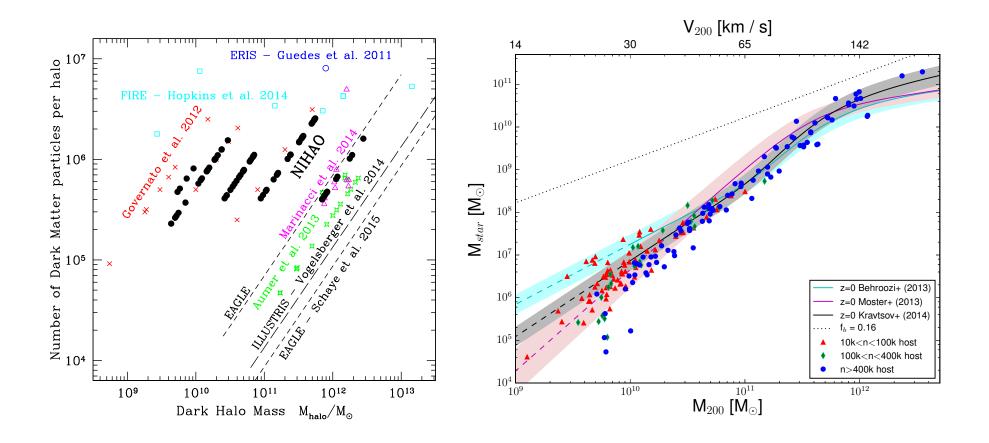




# Illustris Simulation well reproduces many properties of local and high-z galaxies, however

- The formation of low-mass galaxies is still too fast
- The energy feedback from SN and SMBH should be very strong and efficient
- Extremely computational cost, not possible to explore: cosmology parameters, dark matter property, physics of star formation

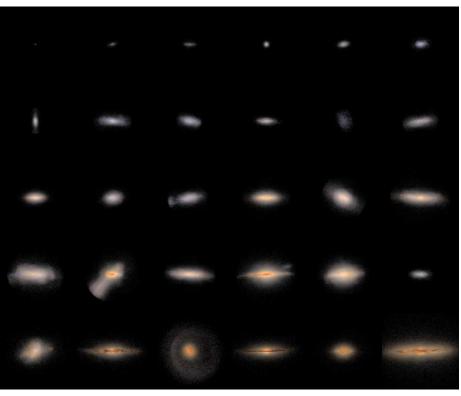
### NIHAO compared to ILLUSTRIS



NIHAO resolves low-mass galaxies with much high resolutions

# NIHAO (你好) project: Numerical Investigation of a Hundred Astrophysical Objects (collaboration between PMO and MPIA)



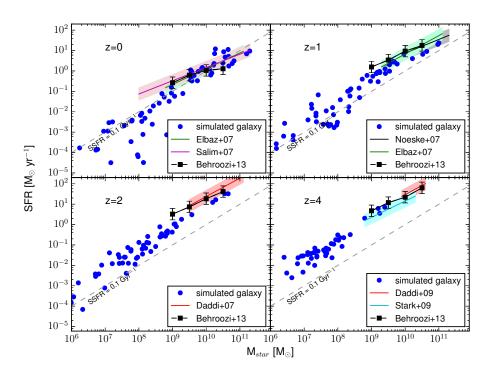


Hydro-dynamical simulation: star formation, feedback from supernova and Early Stellar Feedback (ionizing feedback from massive stars prior to SN explosion )

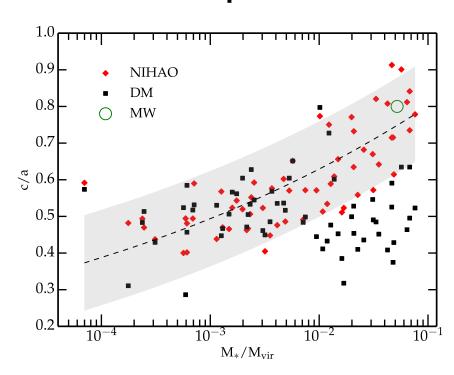
Wang L+Kang X et al., arXiv: 1503:04818 Butsky I+Kang X et al., arXiv: 1503.04814 Tollet E+Kang X et al., in preparation

#### **NIHAO**: predictions

#### SFR vs Mstar relations



#### Halo shape



- Well reproduce the main sequence relation
- · haloes are rounder in hydro-simulation

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- Various tests (milky way as a local lab)
- Summary

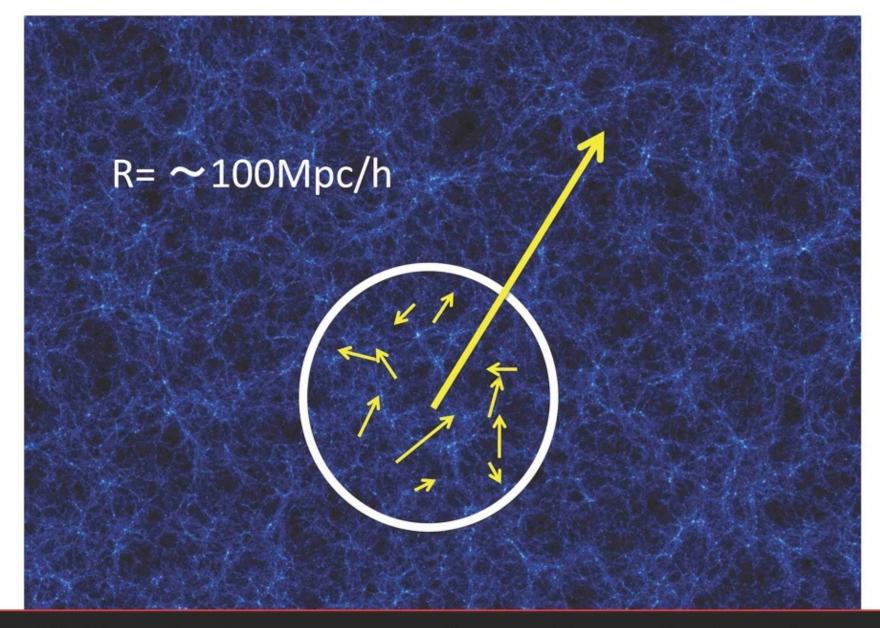
#### Does the distribution of galaxy reconcile with CDM?

#### Position distribution

- Bulk Flow (first order statistics)
- Galaxy two-point correlation function (second order)

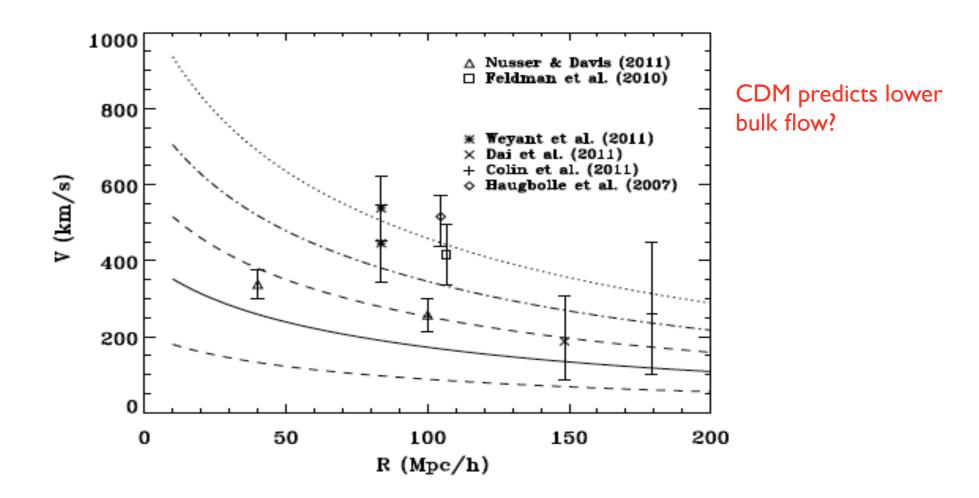
#### Shape distribution

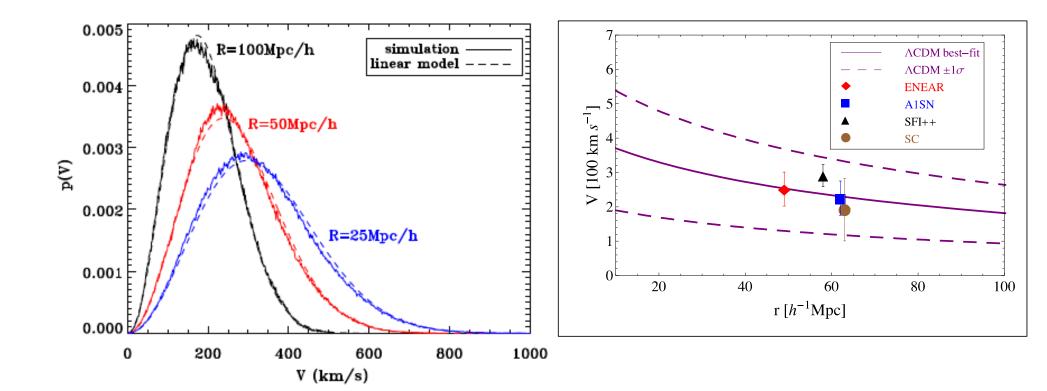
- Satellite-central alignment
- Galaxy-Galaxy alignment
- Galaxy distribution with LSS



Bulk flow is the average of peculiar velocity of dark matter, galaxy or galaxy cluster enclosed in volume

#### Measurement of bulk flow



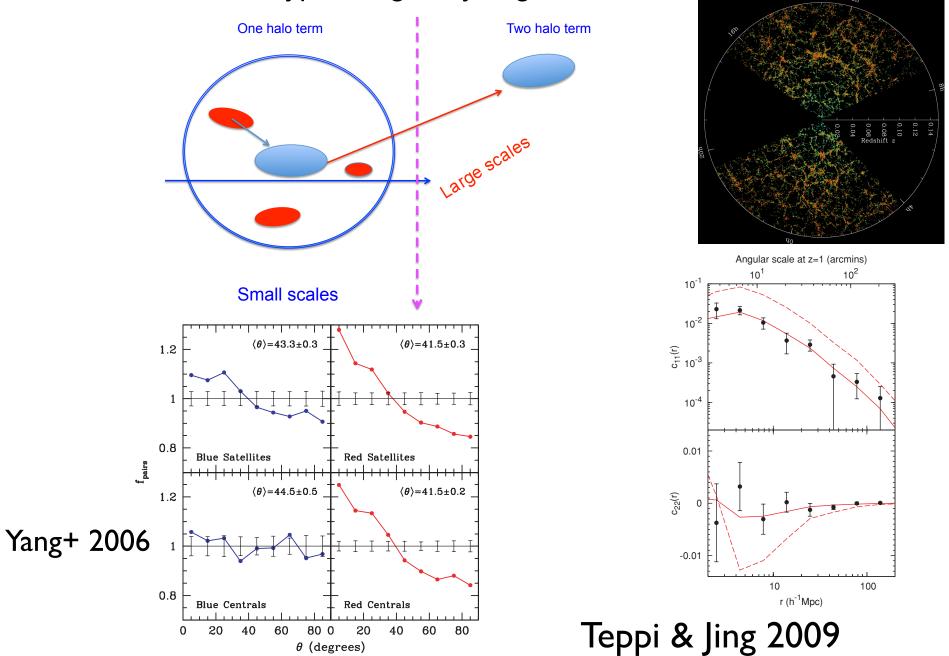


Bulk flow follows Maxwellian distribution, fits well the prediction by linear theory

Our results agree with new data

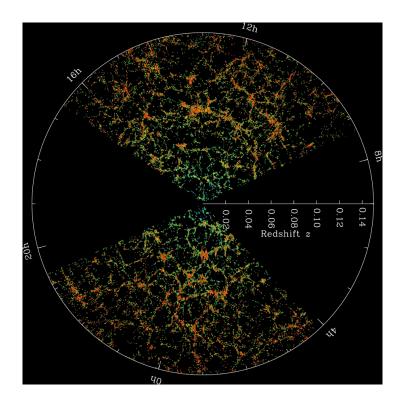
C4, 2012, ApJ

#### Several types of galaxy alignment

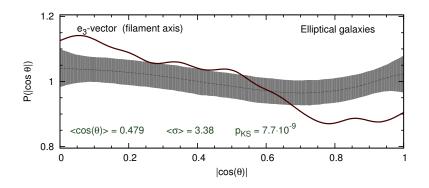


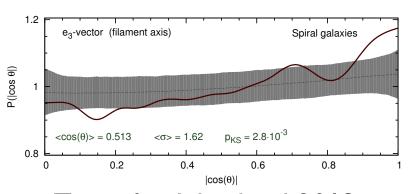
# galaxy spin and LSS

#### **SDSS**



# Galaxy Spin to Filament

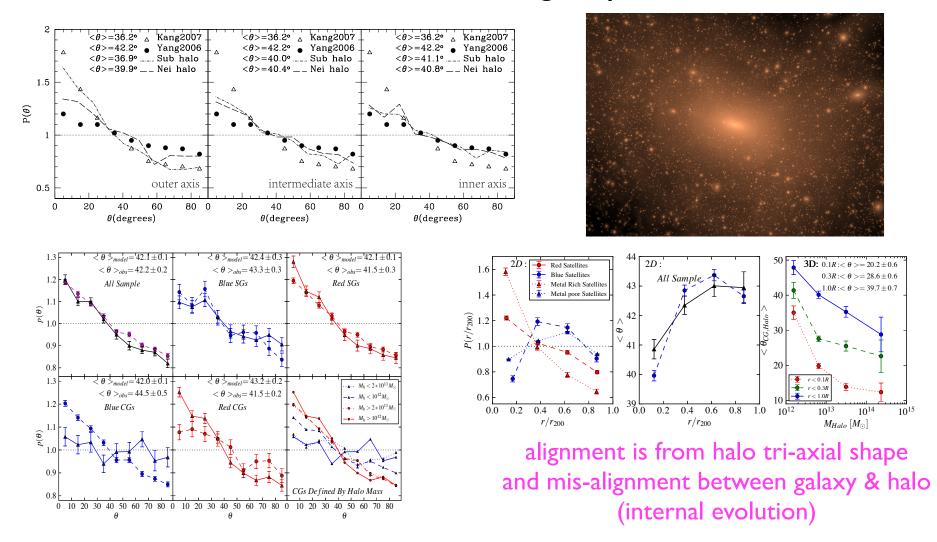




Tempel & Libeskind 2013 Also see Zhang et al. 2014

### galaxy alignment (shape correlation)

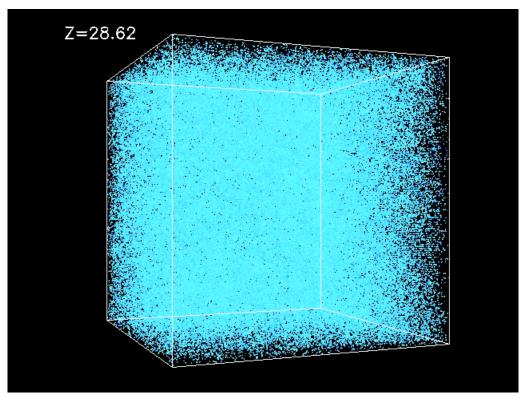
#### satellites distribution around central galaxy



Kang, Lin et al. 2007, 2014a, 2014b

any primordial alignment?

#### Cosmic Web

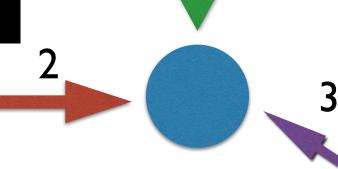


### Zel'dovich approximation

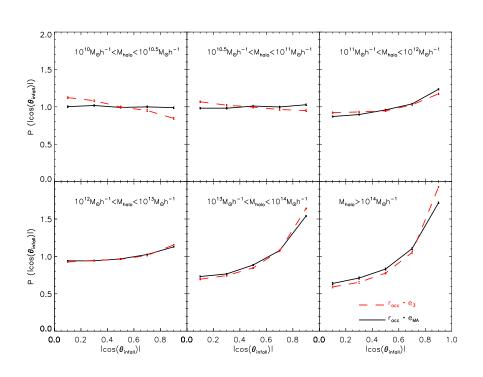
$$\mathbf{x}(t) = \mathbf{q} + D(t) \, \nabla \psi(\mathbf{q}) \,,$$

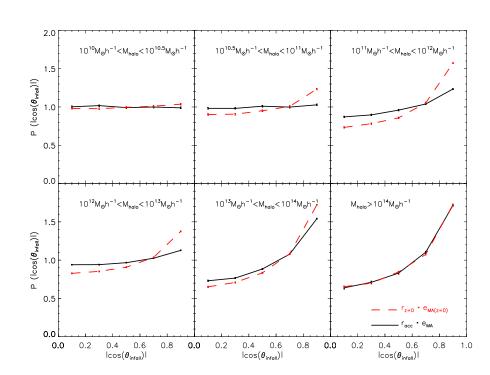
$$\rho(\mathbf{x}) = \frac{\bar{\rho}}{[1 - D \lambda_1(\mathbf{q})] [1 - D \lambda_2(\mathbf{q})] [1 - D \lambda_3(\mathbf{q})]}$$

Sheet—>Filament—>Node



#### is subhalo accretion universal?

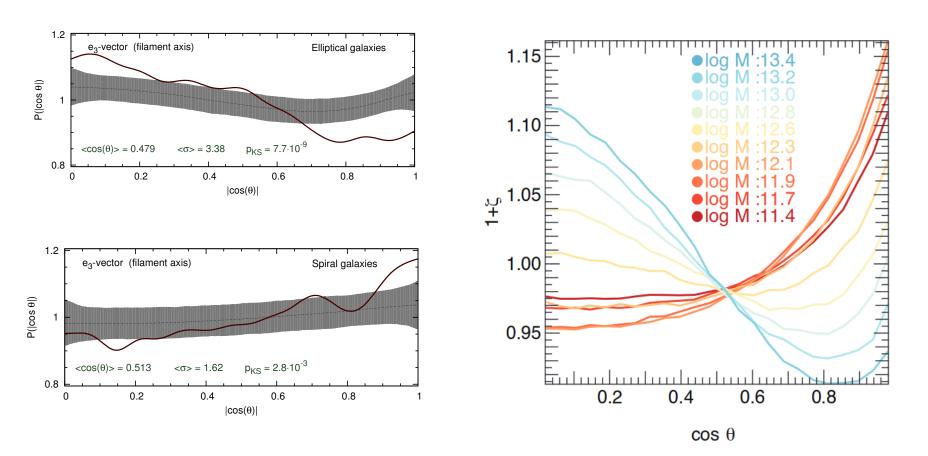




# Kang & Wang in preparation, 2015

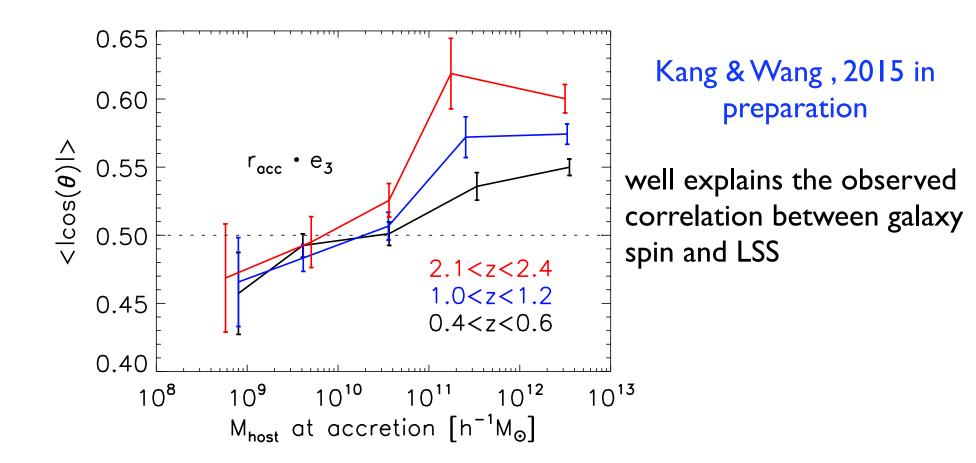
- subhaloes are accreted along halo major axis
- subhaloes are accreted along e3 only in massive haloes

# galaxy/halo spin with LSS



TTT theory predicts: halo spin is perpendicular to e3 (or filament)

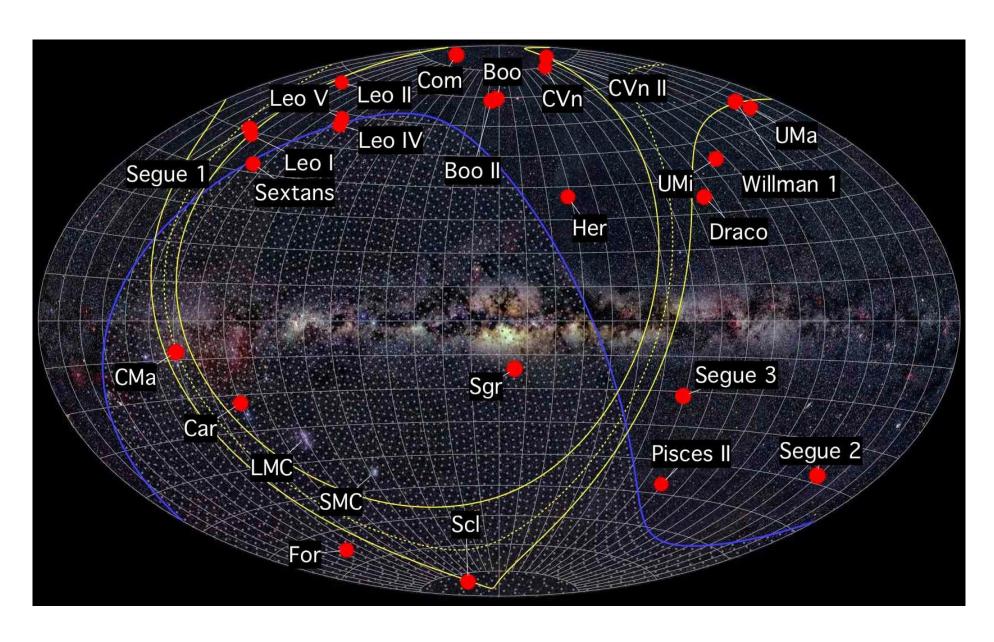
#### alignment between subhalo accretion and filament



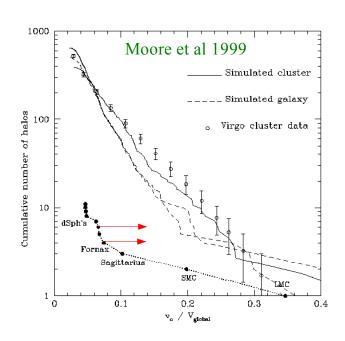
if the orbit angular momentum is transferred to halo spin, it is naturally expected that:

- for massive haloes, spin is perpendicular to filament
- for low-mass haloes, spin is parallel to filament

# Our Milky Way is a good laboratory to test CDM and model for galaxy formation

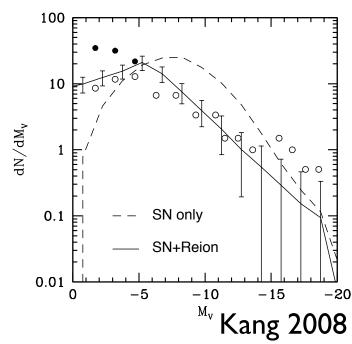


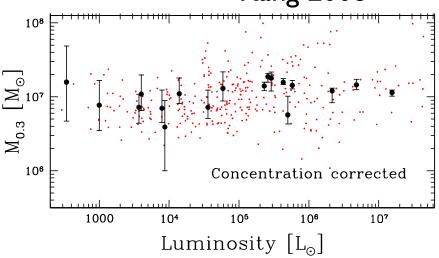
#### Missing satellite problem of the Milky Way



The luminosity function of MW can be obtained:

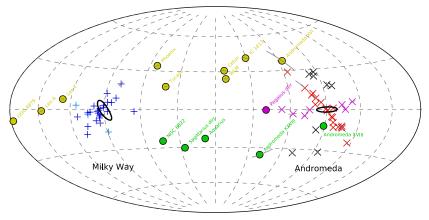
- •Cosmic re-ionization suppress gas cooling in low-mass halo (V<50 km/s or M<10^9 solar mass)
- Most MW satellites are in ~10^9
   solarmass haloes at accretion



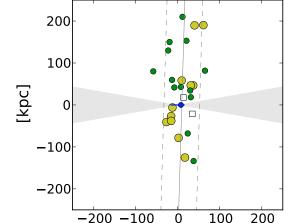


Maccio, Kang & Moore, 2008

# The spatial distribution of MW/M31 satellites is also a mystery



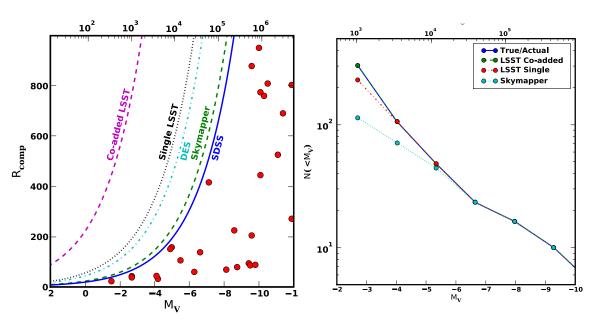
Observed Sats of MW/M31



Kroupa etal. 2010



predicted distribution of subhalos by CDM



Tollerud etal.2008

The story could be very different if future deep survey will discover more sats

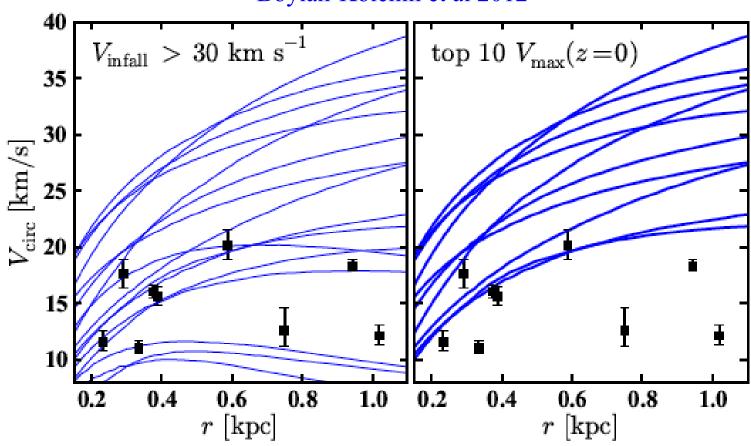
Satellites are

- in thin/great plane
- co-orbiting

Inconsistent with CDM predictions (<1%chance)

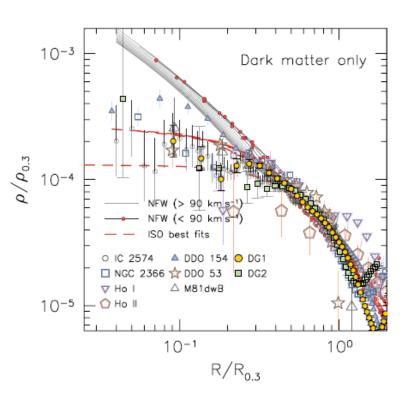
# Too big to fail

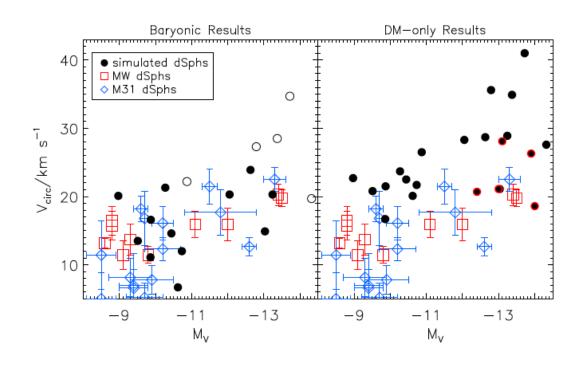




#### cusp vs core?

# baryon effect?



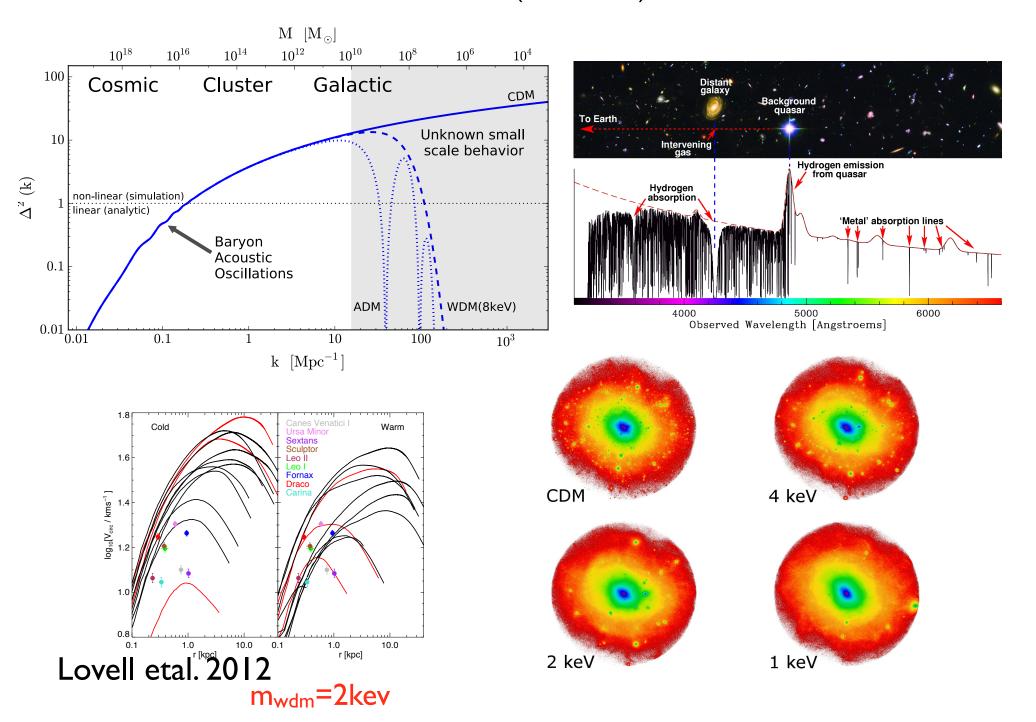


Oh et al. 2011

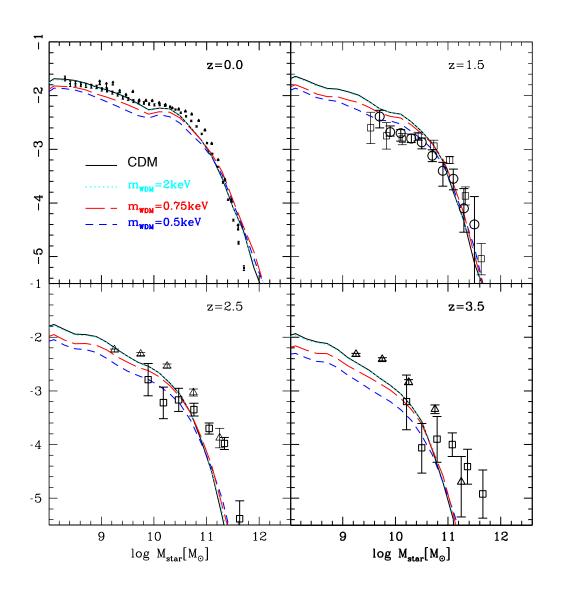
brooks & zolotov 2014

Baryonic effects seem to be more favorable to solve the small-scale crisis

#### solution: WDM? (not clear)



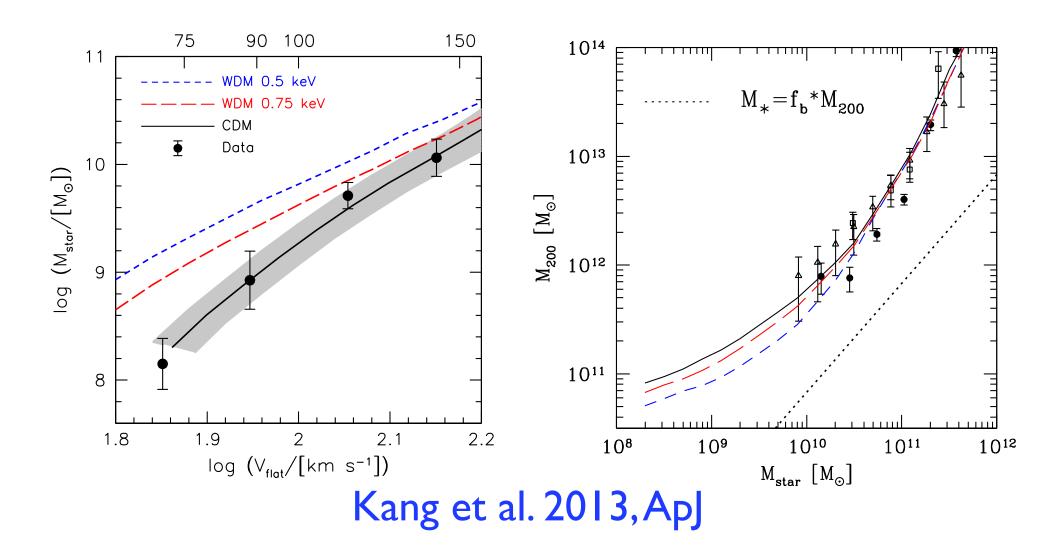
### constrain WDM using galaxy formation model



Fewer galaxy at M=10^10 solar mass

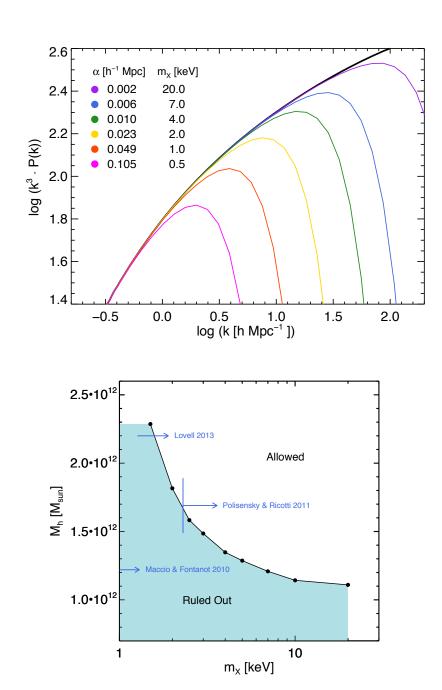
Kang et al. 2012 MNRAS Kang et al. 2013, ApJ

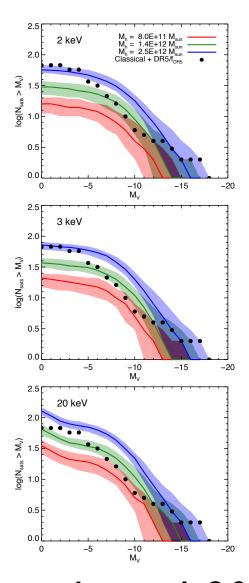
#### constrain WDM mass using galaxy formation



Our model still supports CDM

#### constrain WDM mass using MW satellites





Kennedy et al. 2013

# Summary

- The standard LCDM model (cosmological constant + cold dark matter) works well on large scales.
- On small scales, LCDM still works better (Warm dark matter VS baryonic effect)

- semi-analytical model and hydro-dynamical simulation are both useful to model galaxy formation in cosmological context, SAM is more fast to explore physical process
- The number of low-mass galaxies at high-z is crucial to understand the physics of galaxy formation: gas cooling, feedback, tidal disruption

• Our Milky Way may be an anomaly (outlier statistically, depending on future survey of satellites distribution: number counts, spatial distribution, kinematics etc)

Thanks for your attention!