

# **Comparing Simulated and Observed Galaxies**

**Joel R. Primack**

**Distinguished Professor of Physics, UCSC;  
Director, University of California  
High-Performance AstroComputing Center  
(UC-HiPACC)**

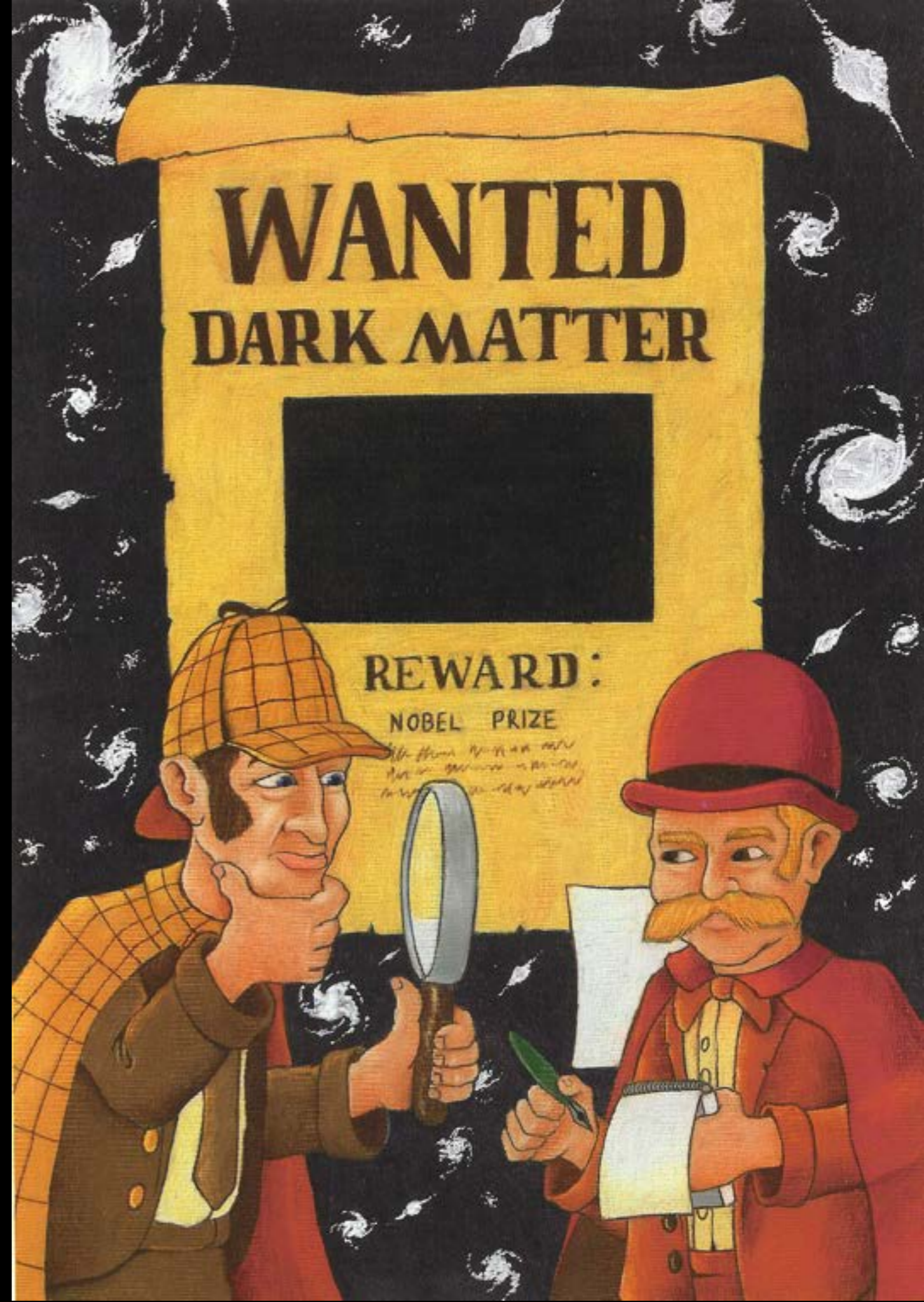


# “The Case of the Dark Matter”

from *World Book  
Science Year 1990*



by Joel R. Primack

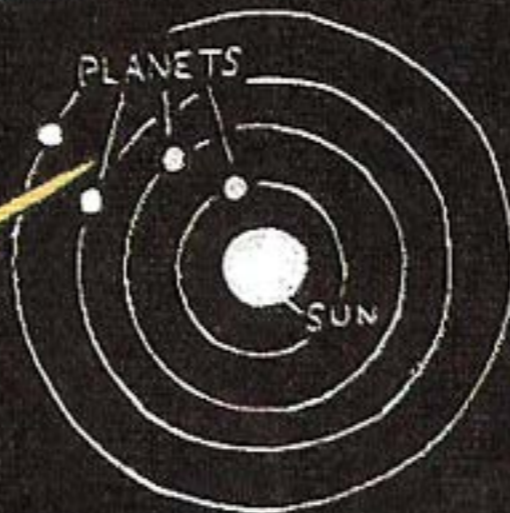




## Evidence for Dark Matter

Evidence that there is more matter in the universe than is visible rests on a theory of gravity, the force that keeps planets, stars, and other celestial objects in their orbits. The strength of this force depends on the mass of the orbiting objects and the distance between them. The amount of mass in the objects and their distance from each other determine the orbital speeds of the objects. Knowing orbital speeds and the distance between objects, astronomers can calculate the total mass in the orbital system.

THE PLANETS NEAREST THE SUN ORBIT FASTER THAN THOSE FARTHER AWAY. THIS IS BECAUSE THE SUN ACCOUNTS FOR ALMOST ALL OF THE MASS IN OUR SOLAR SYSTEM.



LIKE CARS TRAVELING AT DIFFERENT SPEEDS.





STARS IN GALAXIES  
ORBIT AT ABOUT THE  
SAME SPEEDS NO MATTER  
HOW FAR THEY ARE FROM THE  
MASSIVE GALACTIC CENTER. SO  
THERE MUST BE MUCH MORE  
MATTER IN THE OUTER REACHES  
OF THE GALAXY THAN IS VISIBLE.

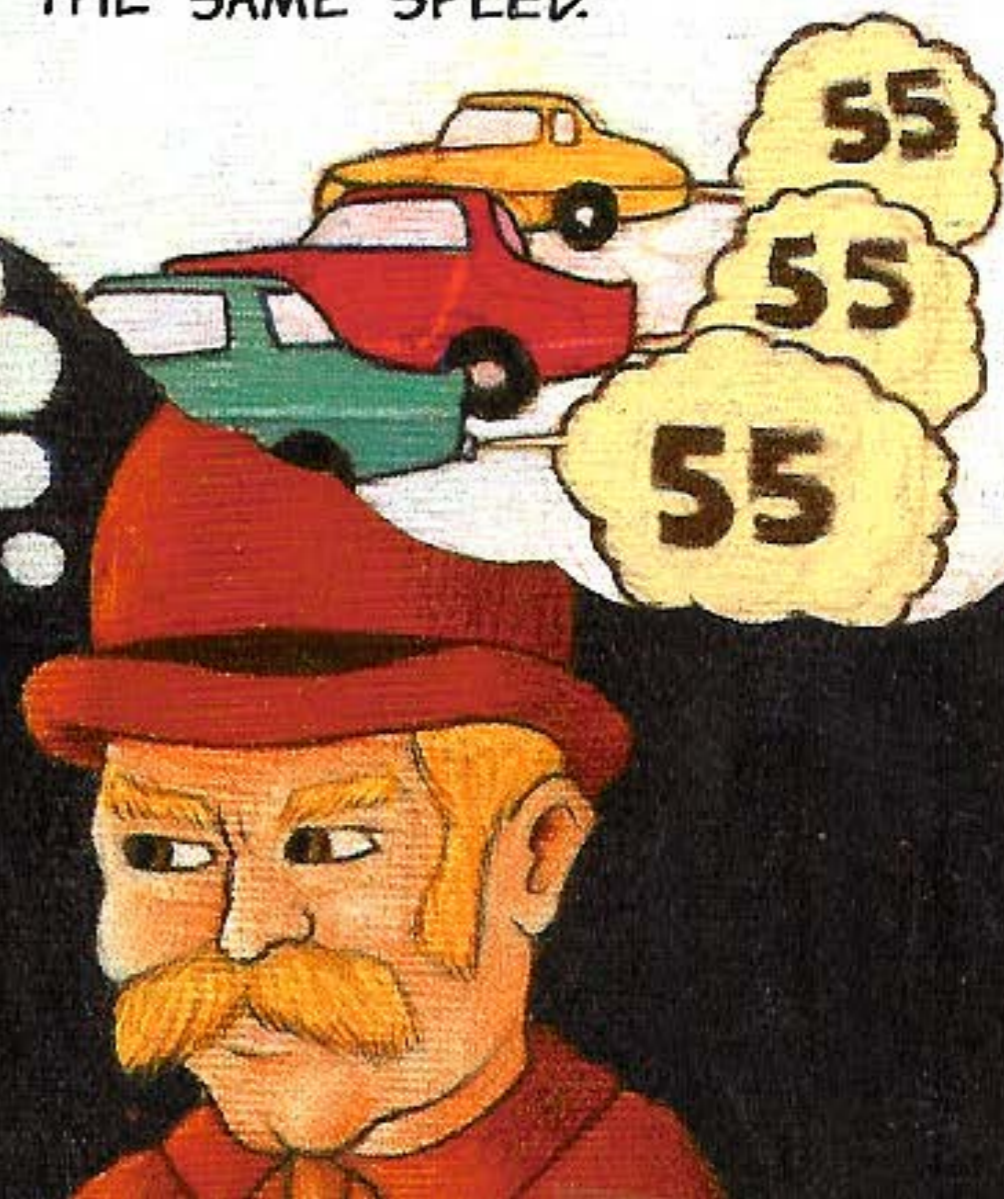
LIKE CARS WITH THEIR  
CRUISE CONTROLS SET  
AT THE SAME SPEED.



CENTER OF GALAXY



STARS





# Outline

- **The Universe is Mostly Dark Matter & Dark Energy**
- **Large Scale Simulations - Bolshoi**
  - Halo Abundance Matching vs. Observations
  - Semi-Analytic Models vs. Galaxies Near and Far
- **High Resolution Galaxy Simulations**
  - Making Mock Observations with Sunrise
  - Comparing Mocks with CANDELS Galaxies
  - Galaxy Evolution Revisited
- **The AGORA Galaxy Simulation Comparison Project**
- **Supercomputing the Universe: Challenges**

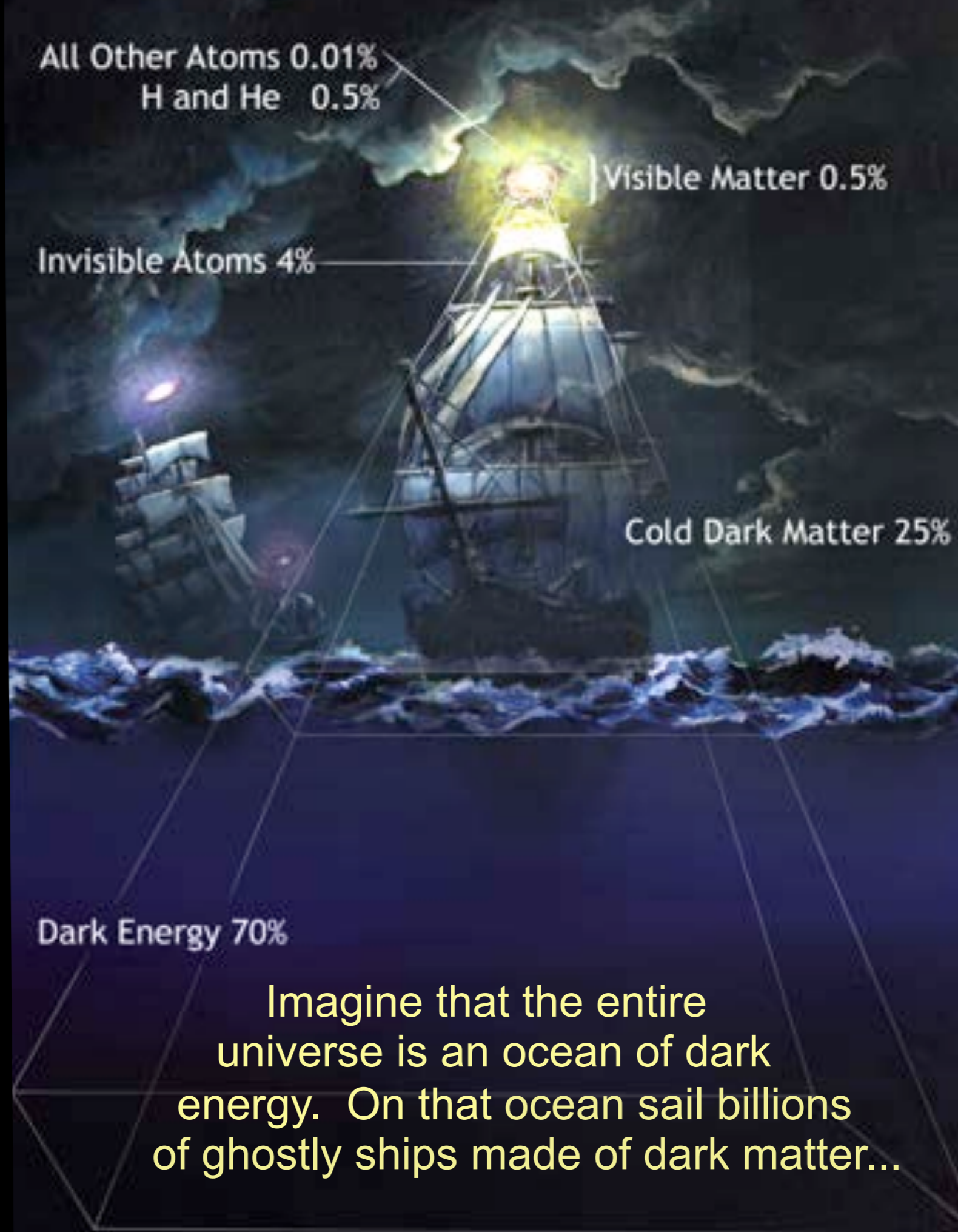


**This picture is beautiful but misleading, since it only shows about 0.5% of the cosmic density.**

**The other 99.5% of the universe is invisible.**



# Matter and Energy Content of the Universe





All Other Atoms 0.01%  
H and He 0.5%

Visible Matter 0.5%

Invisible Atoms 4%

Cold Dark Matter 25%

Dark Energy 70%

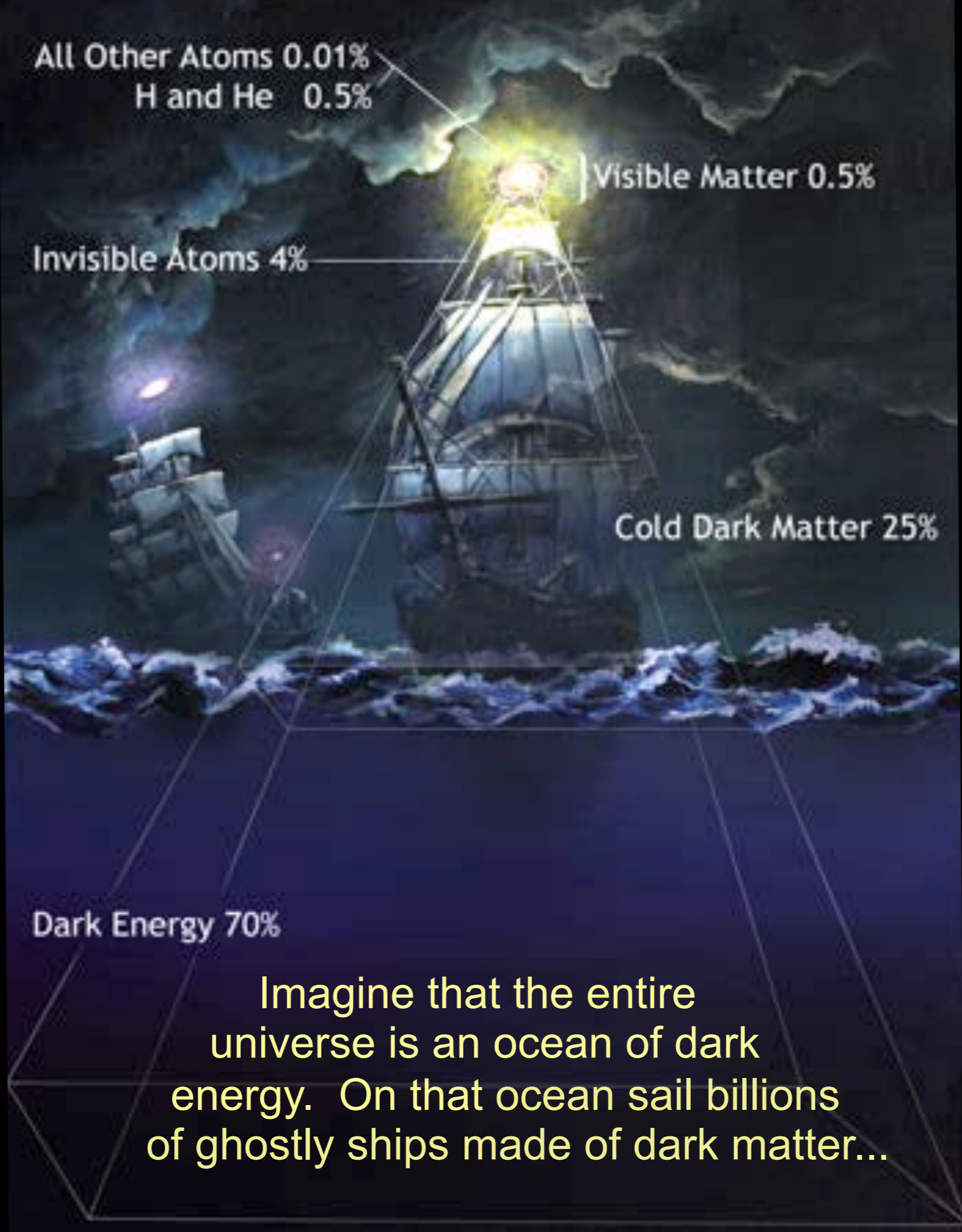
Imagine that the entire universe is an ocean of dark energy. On that ocean sail billions of ghostly ships made of dark matter...

Matter and Energy Content of the Universe

$\Lambda$ CDM

Double Dark Theory

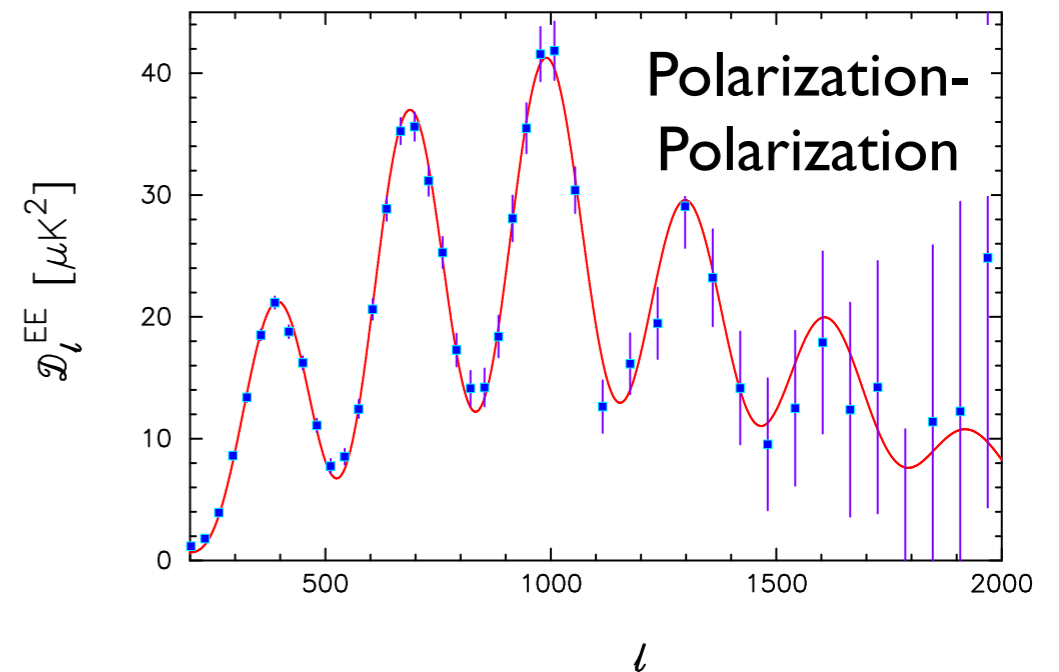
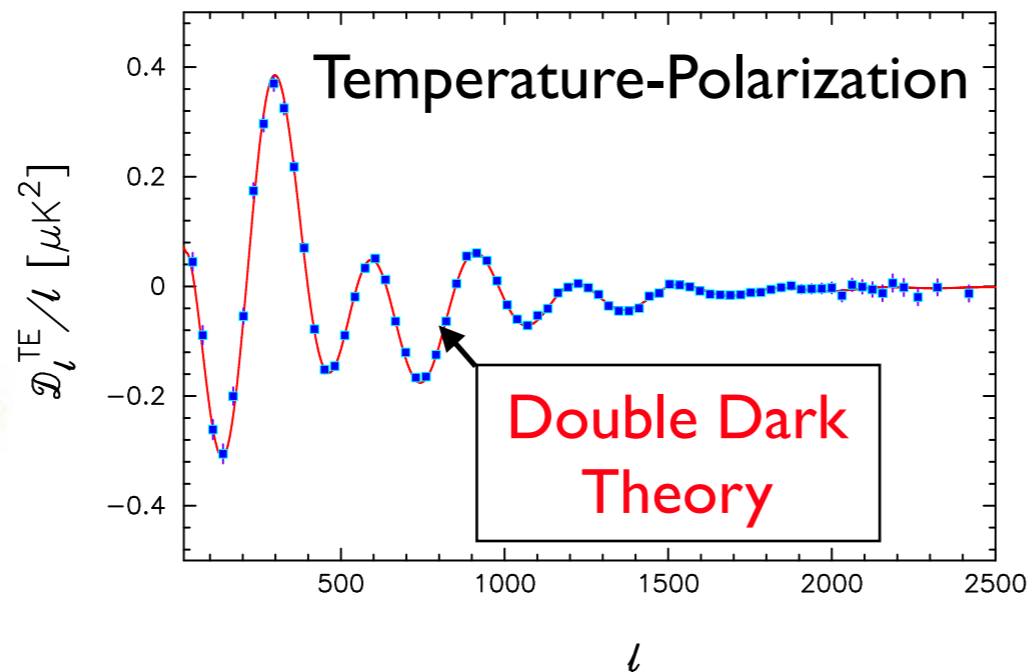
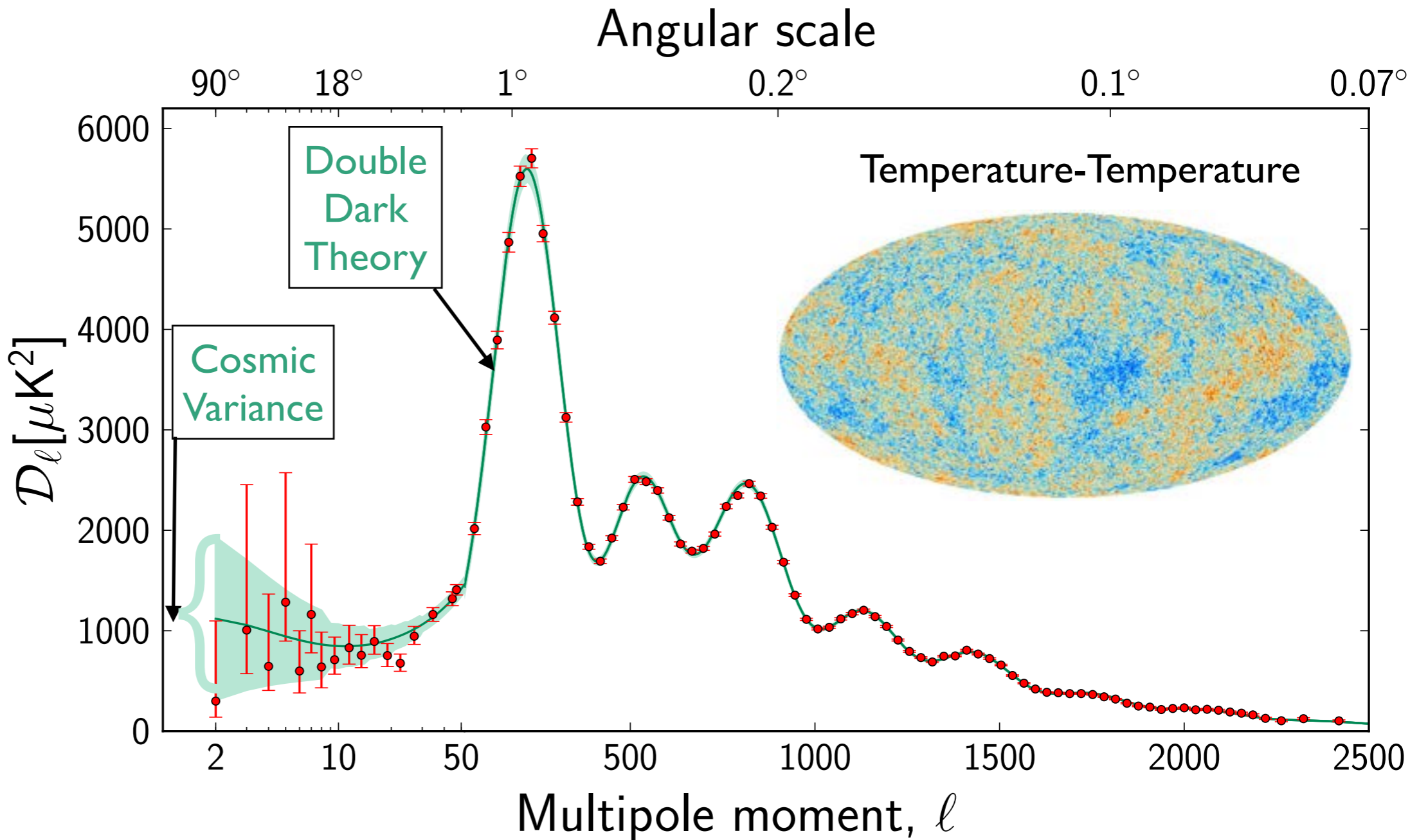
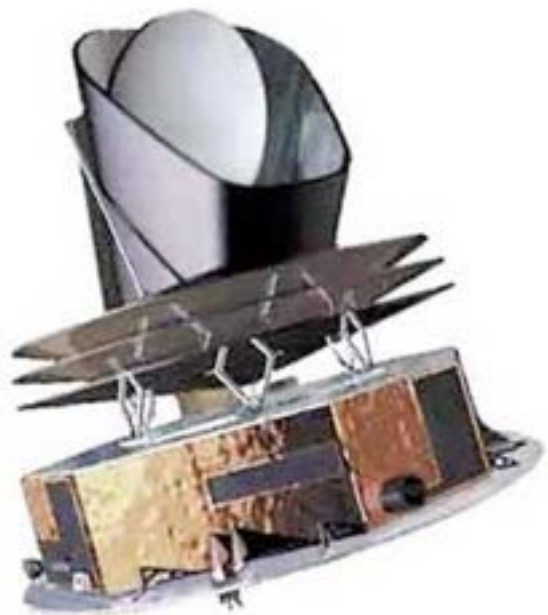
Dark Matter Ships on a Dark Energy Ocean





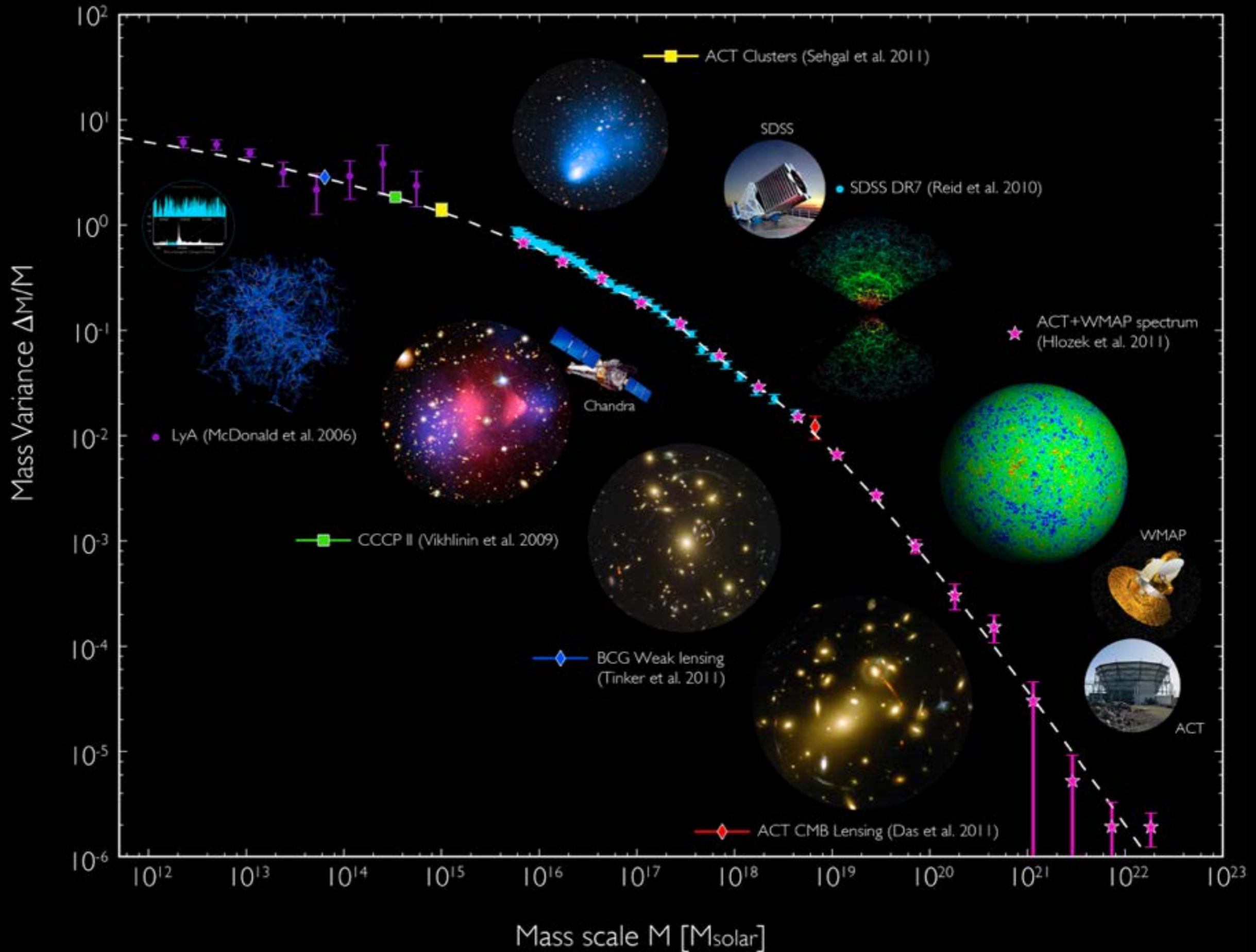
European  
Space  
Agency  
PLANCK  
Satellite  
Data

Released  
March 21,  
2013





# Matter Distribution Agrees with Double Dark Theory!





# Cosmological Simulations

Astronomical observations represent snapshots of moments in time. It is the role of astrophysical theory to produce movies -- both metaphorical and actual -- that link these snapshots together into a coherent physical theory.

**Cosmological dark matter simulations** show large scale structure, growth of structure, and dark matter halo properties

**Hydrodynamic galaxy formation simulations:** evolution of galaxies, formation of galactic spheroids via mergers, galaxy images in all wavebands including stellar evolution and dust



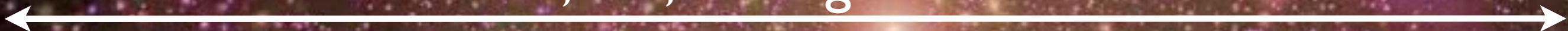
# Aquarius Simulation

Volker Springel

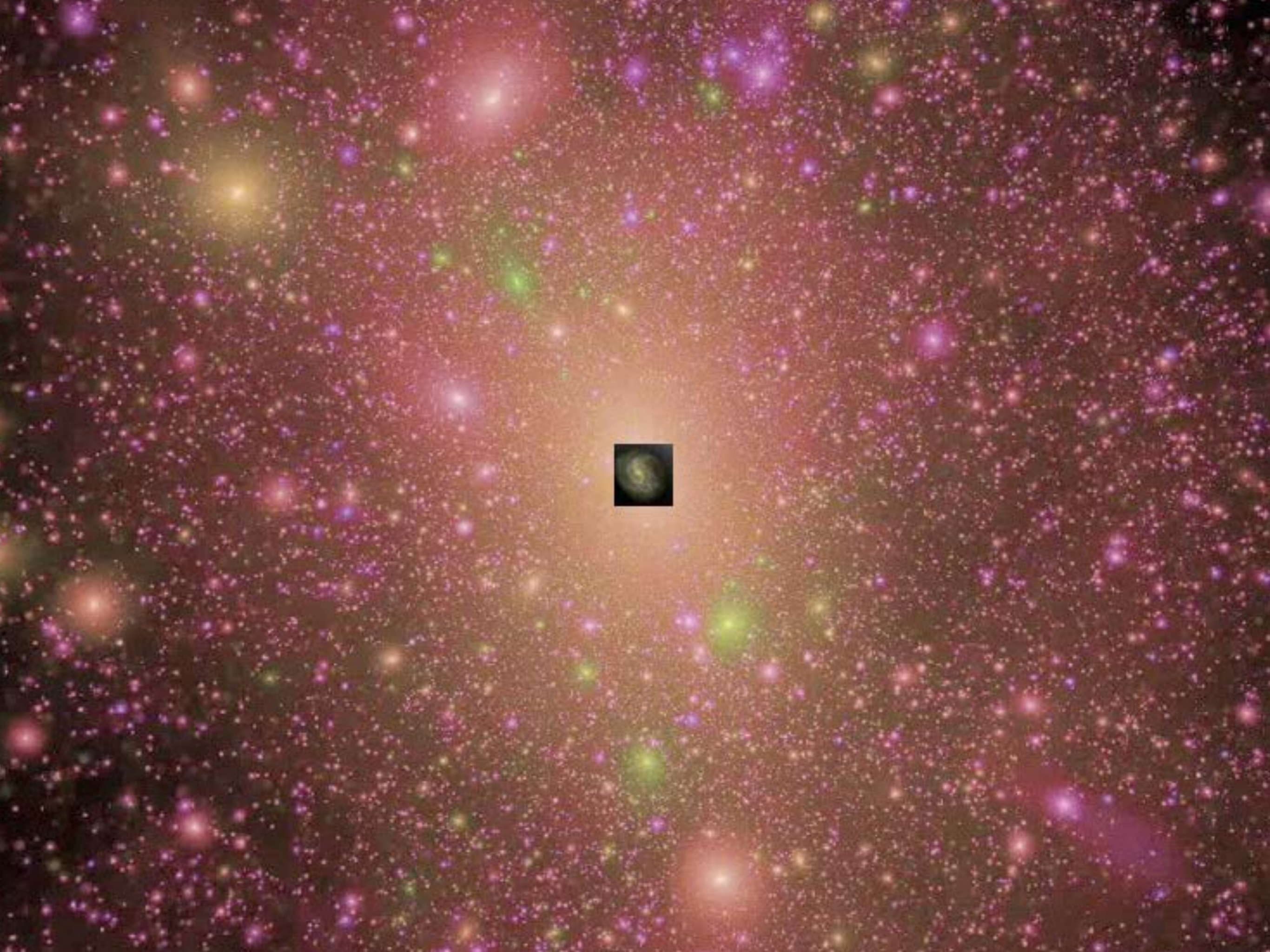
Milky Way  
100,000 Light Years



Milky Way Dark Matter Halo  
1,500,000 Light Years









# Bolshoi Cosmological Simulation

Anatoly Klypin & Joel Primack

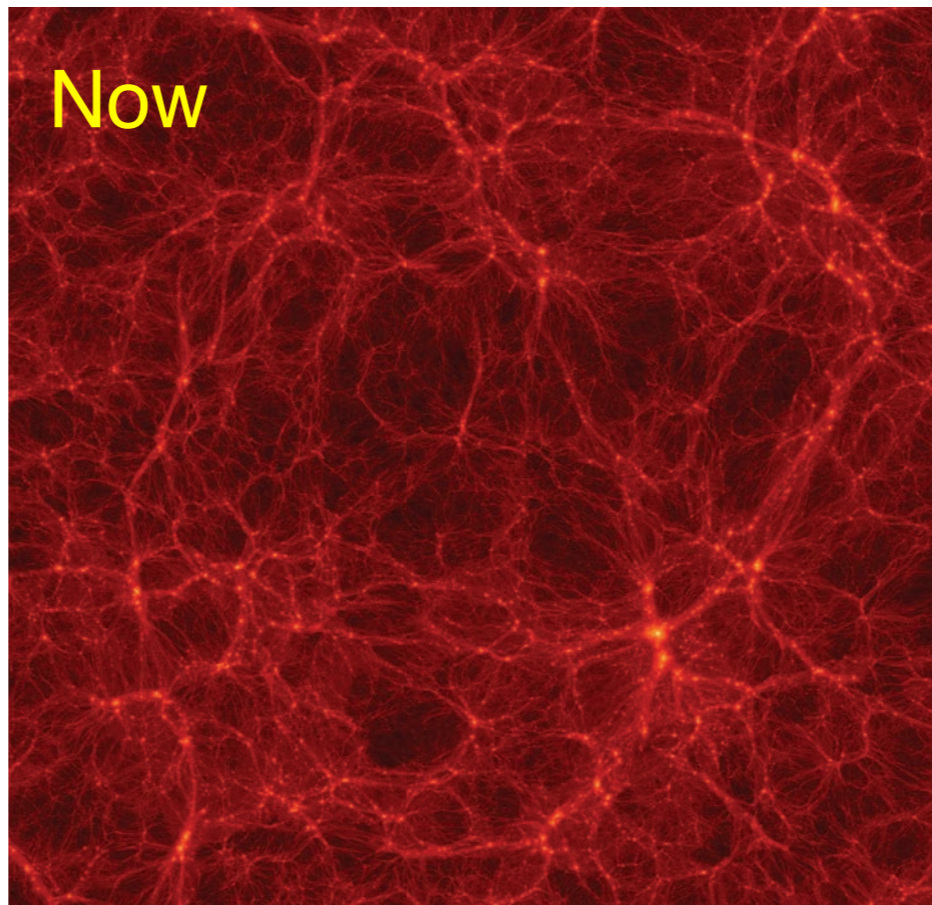
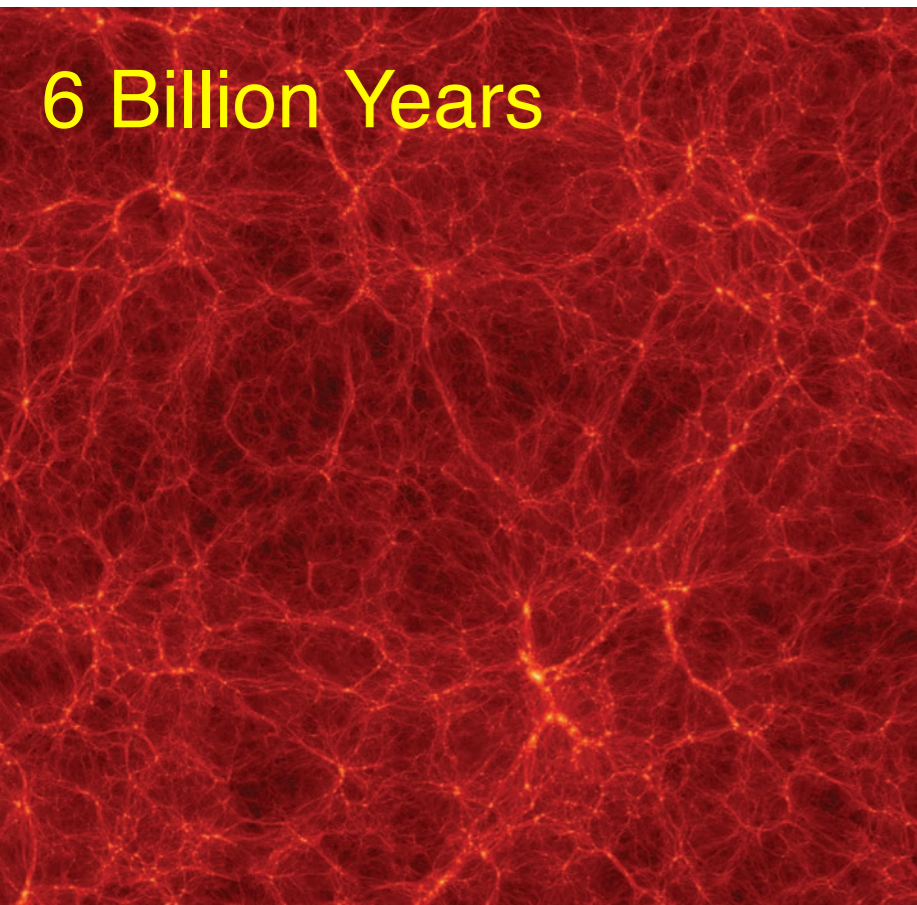
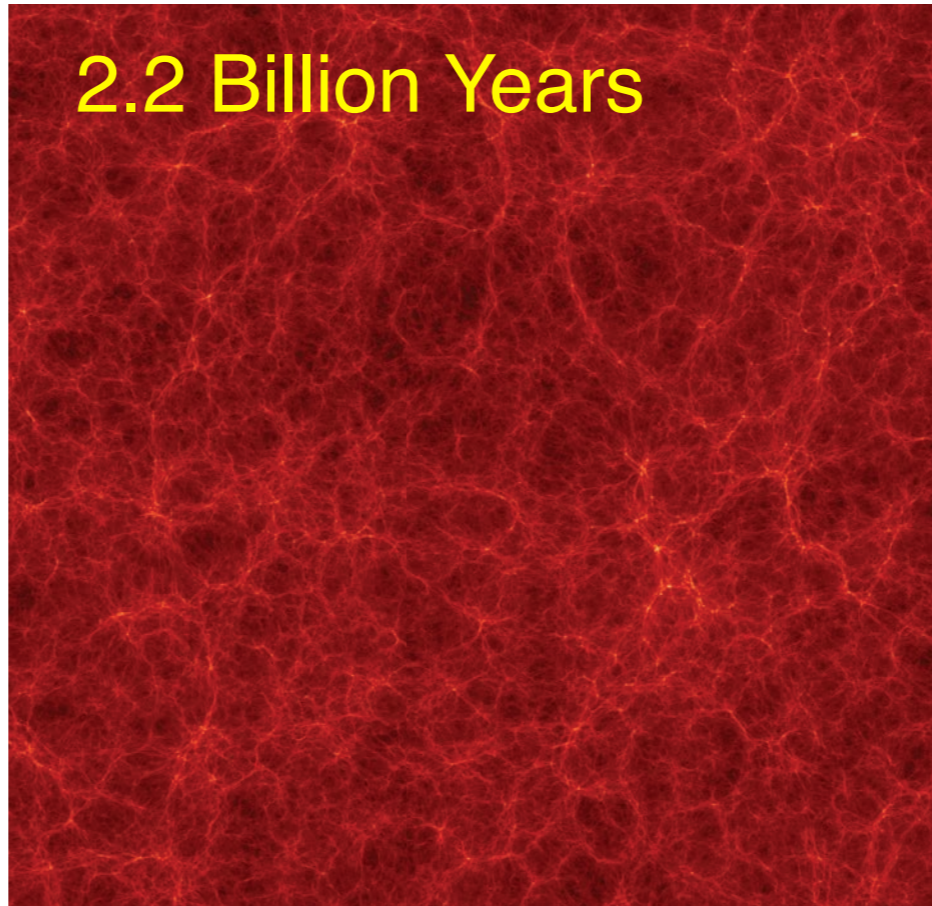
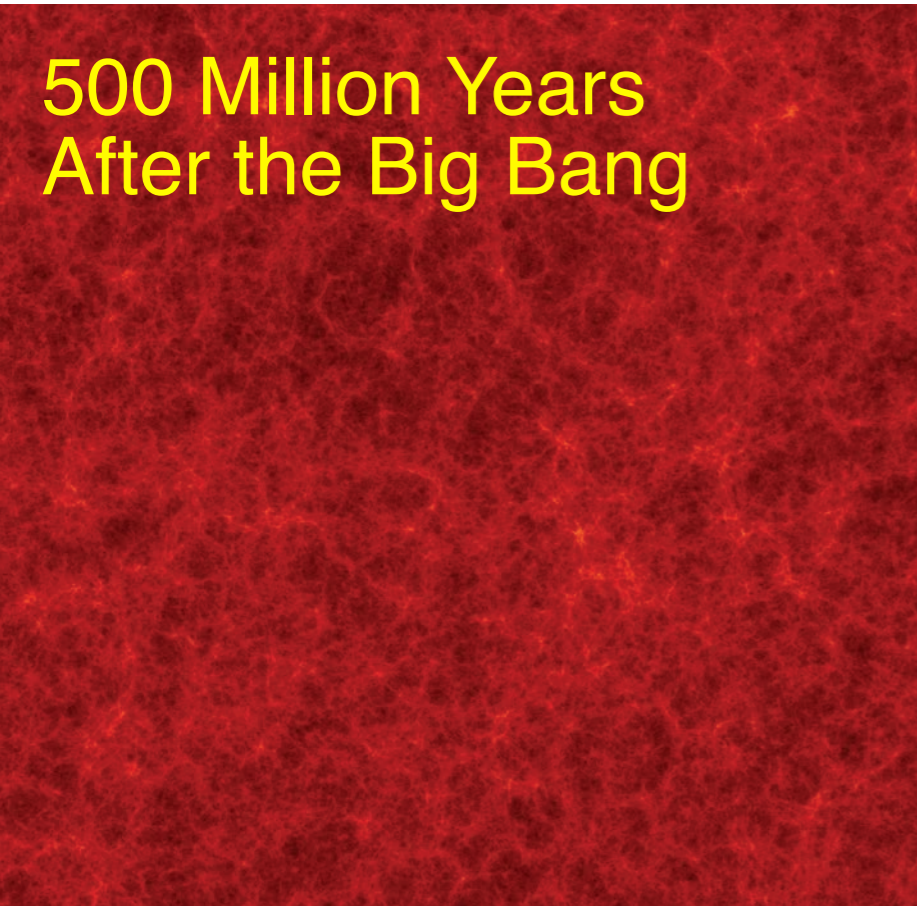
NASA Ames Research Center

$8.6 \times 10^9$  particles 1 kpc resolution

1 Billion Light Years

The image displays a vast, intricate web of dark matter filaments and clusters, rendered in shades of orange and red against a dark background. A single galaxy is highlighted in the center with a small, dark, textured square. At the bottom, a white double-headed arrow spans the width of the image, with the text "1 Billion Light Years" centered above it.





## THE UNIVERSE IN A SUPERCOMPUTER

**COSMIC WEB:** The Bolshoi simulation models the evolution of dark matter, which is responsible for the large-scale structure of the universe. Here, snapshots from the simulation show the dark matter distribution at 500 million and 2.2 billion years [top] and 6 billion and 13.7 billion years [bottom] after the big bang. These images are 50-million-light-year-thick slices of a cube of simulated universe that today would measure roughly 1 billion light-years on a side and encompass about 100 galaxy clusters.

SOURCES: SIMULATION, ANATOLY KLYPIN AND JOEL R. PRIMACK; VISUALIZATION, STEFAN GOTTLÖBER/LEIBNIZ INSTITUTE FOR ASTROPHYSICS POTSDAM

**To understand the cosmos, we must evolve it all over again**  
By Joel R. Primack

**W**HEN IT COMES TO RECONSTRUCTING THE PAST, you might think that astrophysicists have it easy. After all, the sky is awash with evidence. For most of the universe's history, space has been largely transparent, so much so that light emitted by distant galaxies can travel for billions of years before finally reaching Earth. It might seem that all researchers have to do to find out what the universe looked like, say, 10 billion years ago is to build a telescope sensitive enough to pick up that ancient light.

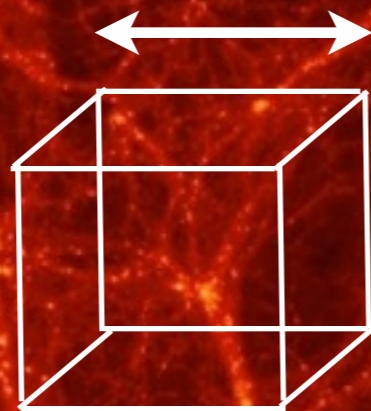
Actually, it's more complicated than that. Most of the ordinary matter in the universe—the stuff that makes up all the atoms, stars, and galaxies astronomers can see—is invisible, either sprinkled throughout intergalactic space in tenuous forms that emit and absorb little light or else swaddled inside galaxies in murky clouds of dust and gas. When astronomers look out into the night sky with their most powerful telescopes, they can see no more than about 10 percent of the ordinary matter that's out there.

To make matters worse, cosmologists have discovered that if you add up all the mass and energy in the universe, only a small fraction is composed of ordinary matter. A good 95 percent of the cosmos is made up of two very different kinds of invisible and as-yet-unidentified stuff that is “dark,” meaning that it emits and absorbs no light at all. One of these mysterious components, called dark matter, seems immune to all fundamental forces except gravity and perhaps the weak interaction, which is responsible for



# Bolshoi Cosmological Simulation

100 Million Light Years



1 Billion Light Years





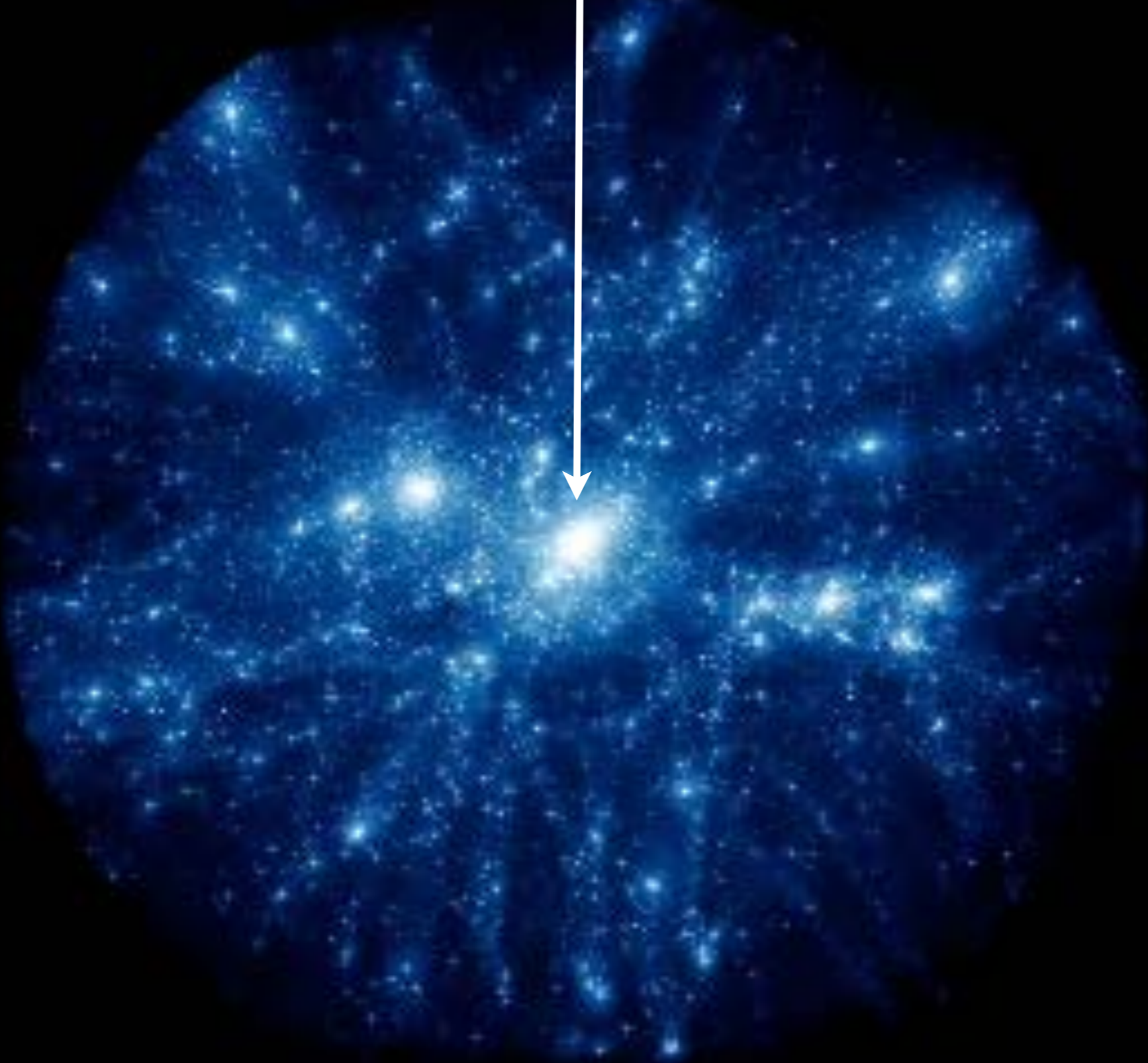
# Bolshoi Cosmological Simulation

100 Million Light Years





# How the Halo of the Big Cluster Formed





# How the Halo of the Big Cluster Formed

*Merger Tree (History) of All the Halos that Have Merged by Today*

Time: 13664 Myr Ago  
Timestep Redshift: 14.083  
Radius Mode: Rvir  
Focus Distance: 6.1  
Aperture: 40.0  
World Rotation: (216.7, 0.06, -0.94, -0.34)  
Trackball Rotation: (0.0, 0.00, 0.00, 0.00)  
Camera Position: (0.0, 0.0, -6.1)

Peter Behroozi



# SKY & TELESCOPE

Dive Deep In  
the Lagoon p. 61

JULY 2012

# Universe in

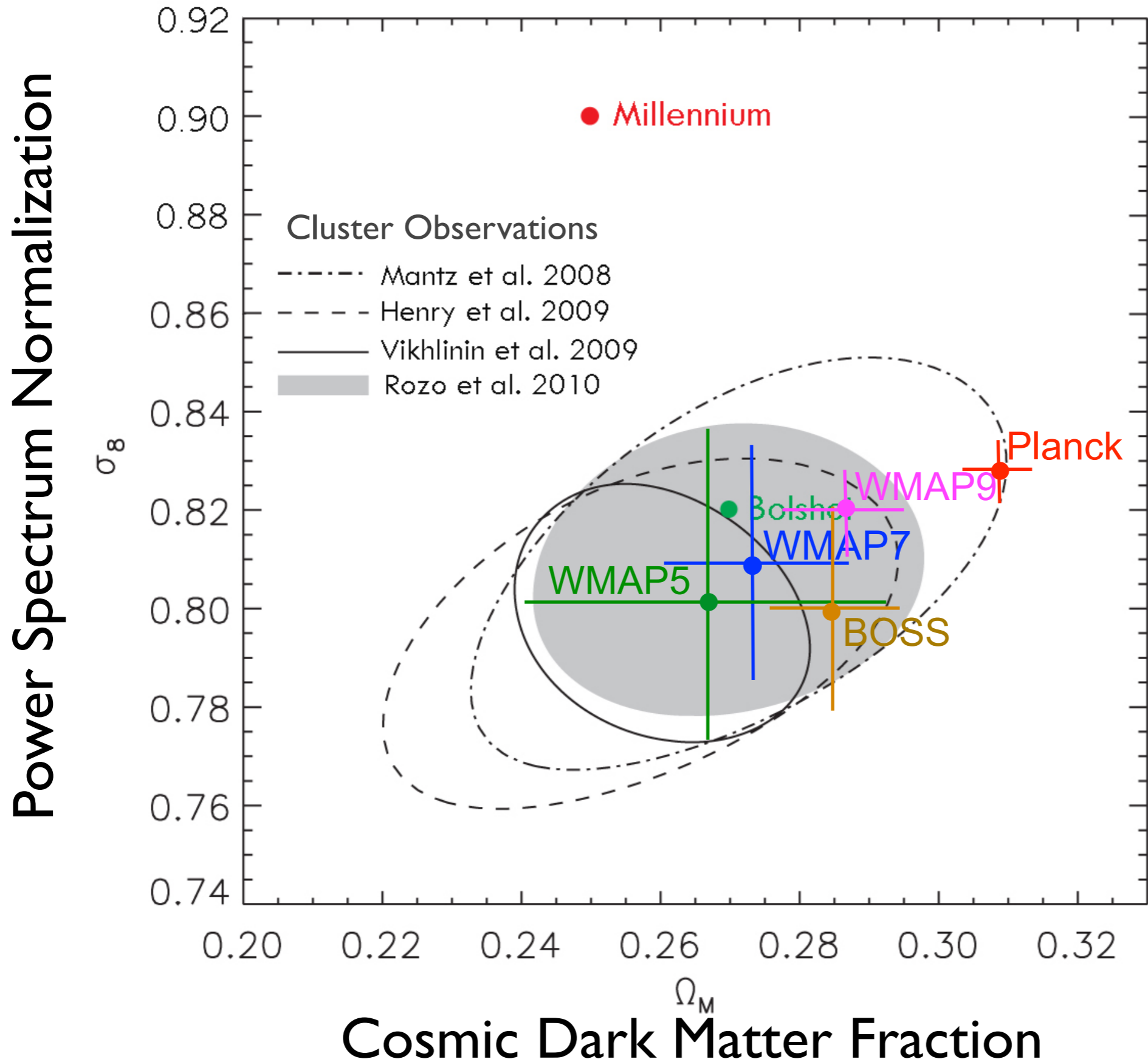
From the Big Bang to Now p. 26

# a Box





# Determination of $\sigma_8$ and $\Omega_M$ from CMB+ WMAP+SN+Clusters    Planck+WP+HighL+BAO





# Bolshoi-Planck Cosmological Simulation

Anatoly Klypin & Joel Primack

Finished 6 Aug 2013 on Pleiades computer

at NASA Ames Research Center

$8.6 \times 10^9$  particles 1 kpc resolution

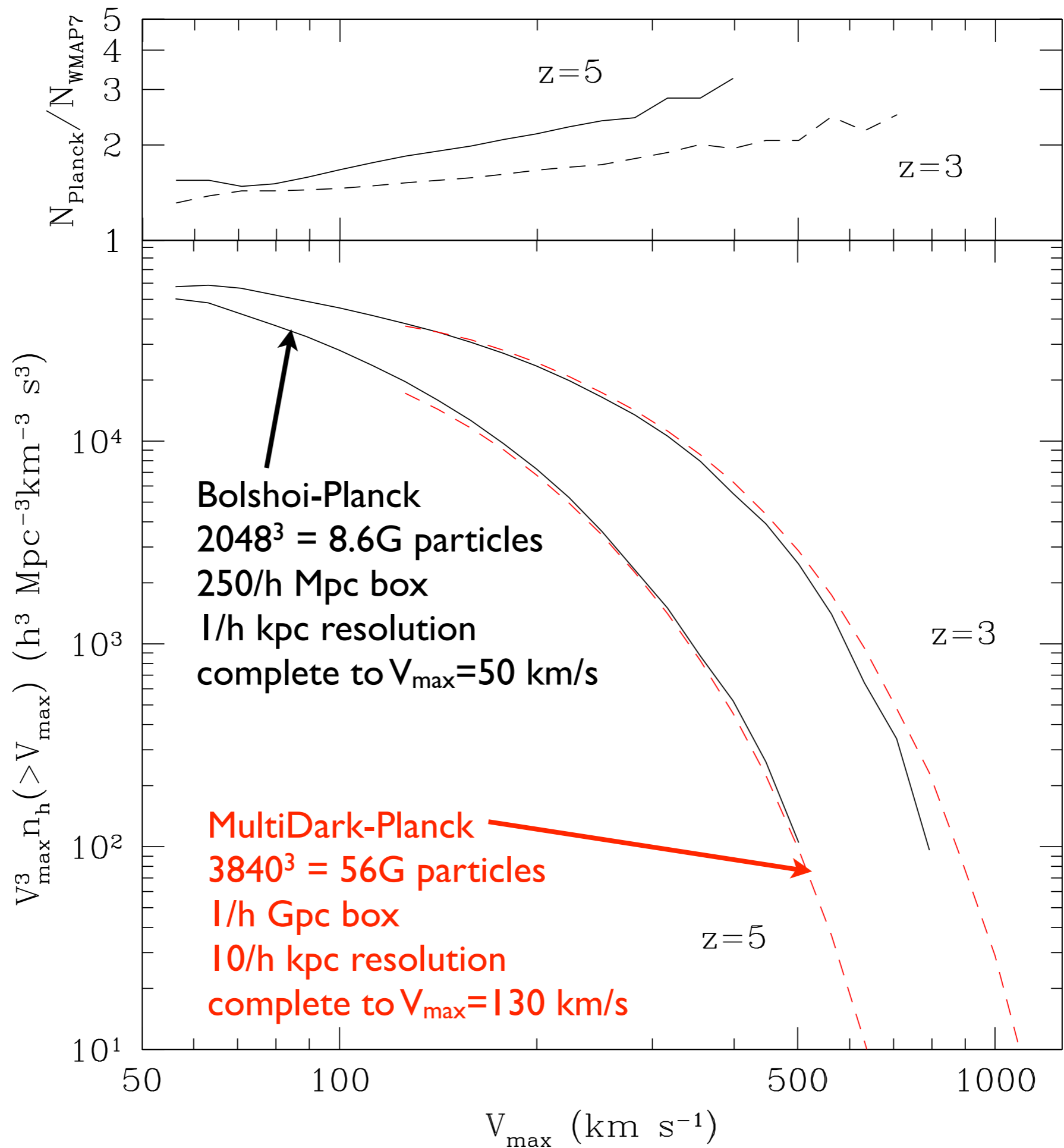
now being analyzed

1 Billion Light Years





Bolshoi-Planck  
has a lot more  
massive halos  
at high redshifts  
than Bolshoi!





# Observational Data

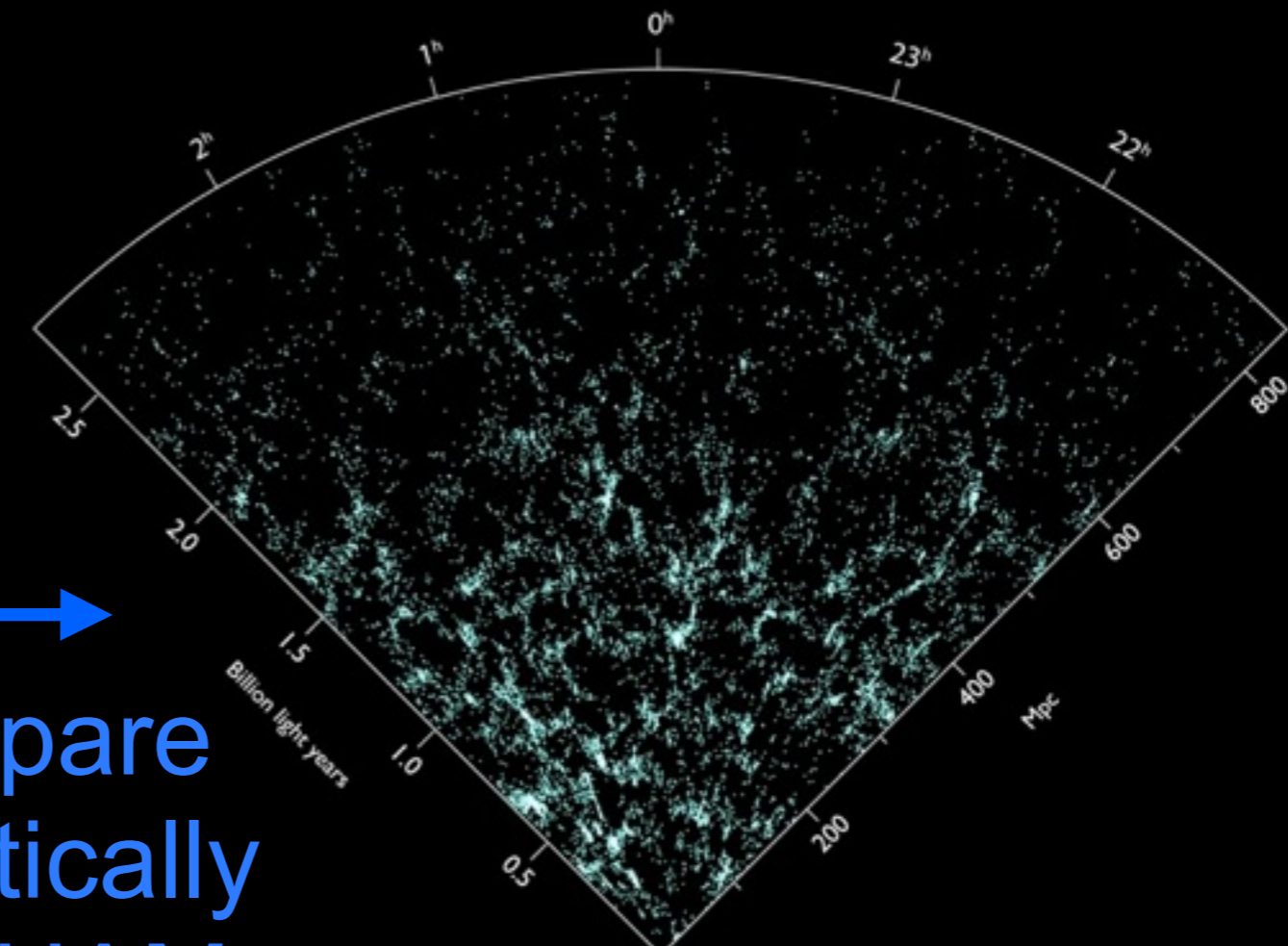
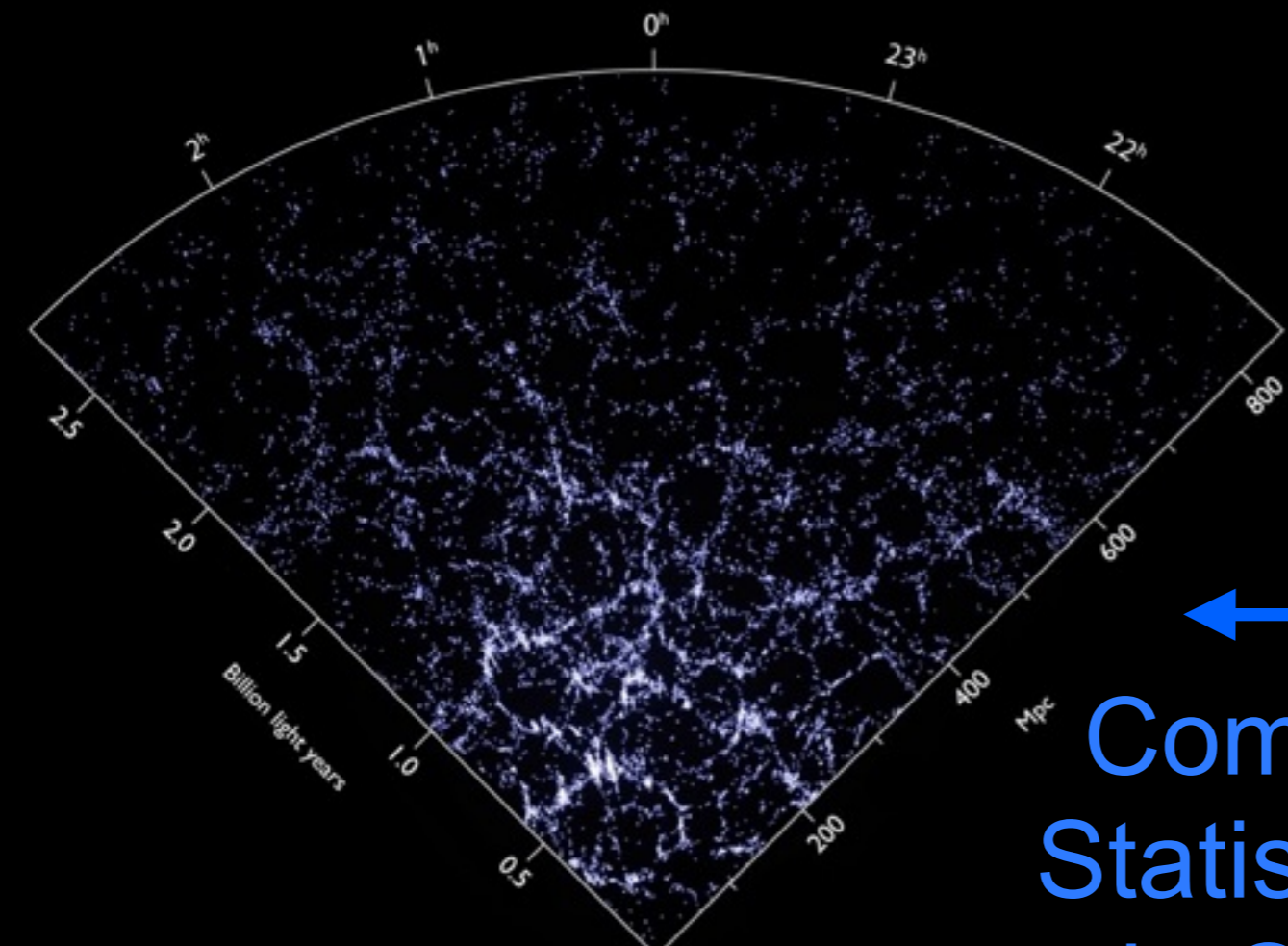
Sloan Digital Sky Survey

# Bolshoi Simulation

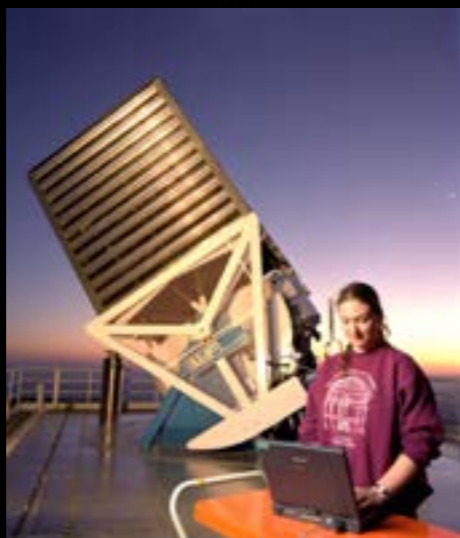
Anatoly Klypin, Joel Primack, Peter Behroozi  
Risa Wechsler, Ralf Kahler, Nina McCurdy

SDSS

Bolshoi



Compare  
Statistically  
via SHAM





**$\Lambda$ CDM  
PREDICTS  
EVOLUTION  
IN THE GALAXY  
CORRELATION  
FUNCTION**

$\xi_{gg}(r)$

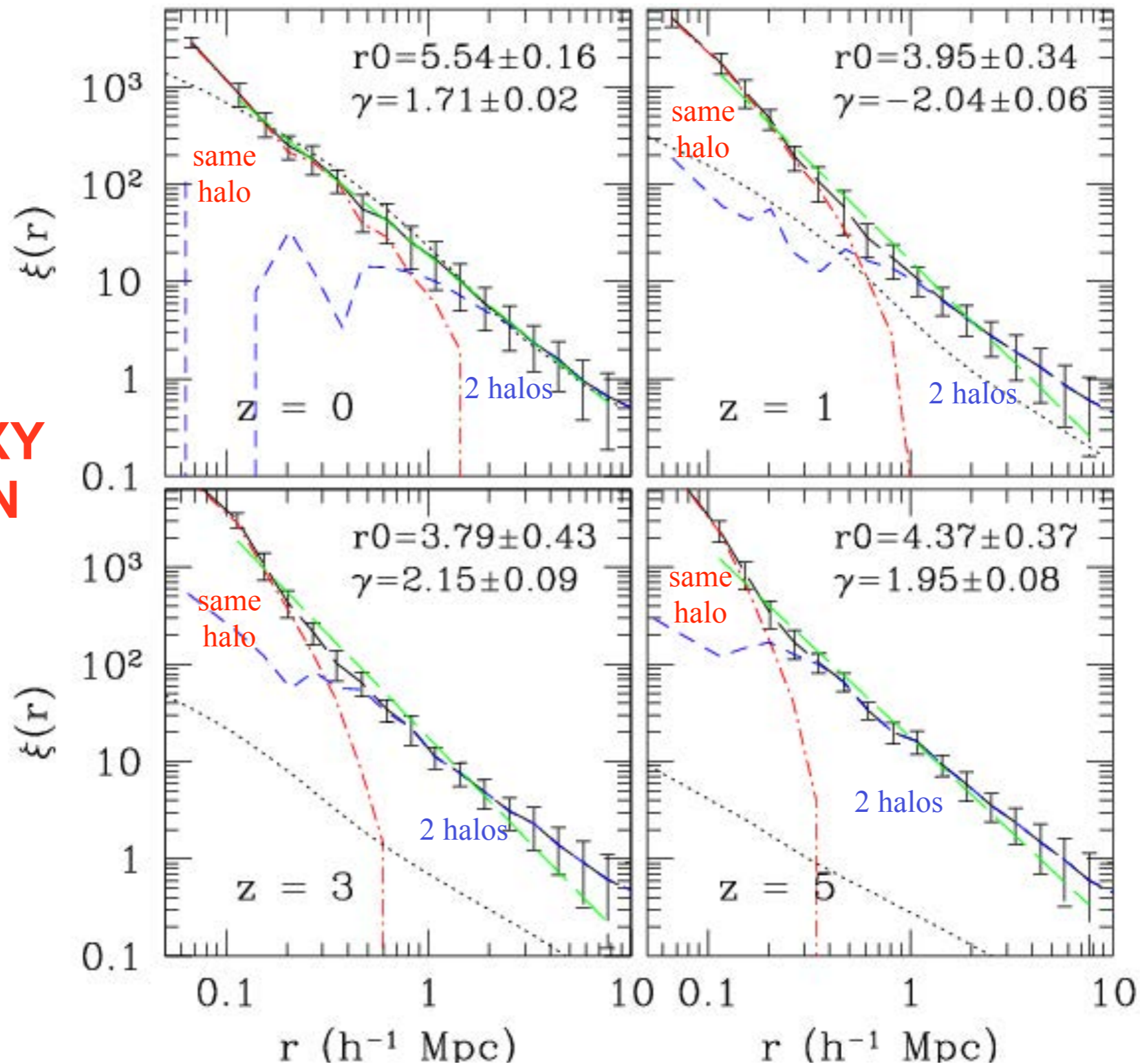
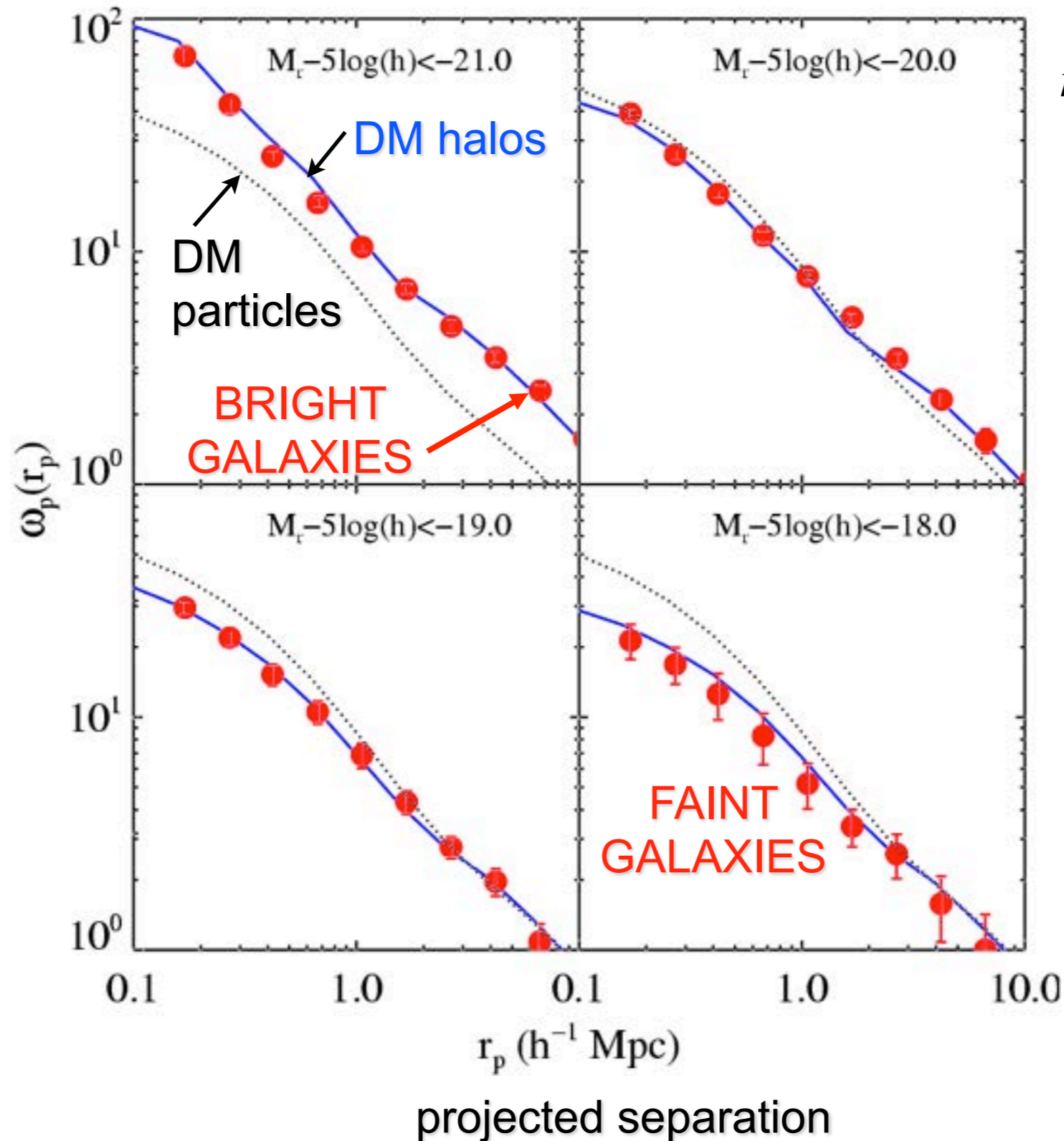


FIG. 8.— Evolution of the two-point correlation function in the  $80h^{-1}$  Mpc simulation. The solid line with error bars shows the clustering of halos of the fixed number density  $n = 5.89 \times 10^{-3} h^3 \text{ Mpc}^{-3}$  at each epoch. The error-bars indicate the “jack-knife” one sigma errors and are larger than the Poisson error at all scales. The dot-dashed and dashed lines show the corresponding one- and two-halo term contributions. The long-dashed lines show the power-law fit to the correlation functions in the range of  $r = [0.1 - 8h^{-1} \text{ Mpc}]$ . Although the correlation functions can be well fit by the power law at  $r \gtrsim 0.3h^{-1} \text{ Mpc}$  in each epoch, at  $z > 0$  the correlation function steepens significantly at smaller scales due to the one-halo term.



# Galaxy clustering in SDSS at $z \sim 0$ agrees with $\Lambda$ CDM simulations

projected  
2-point  
correlation  
function



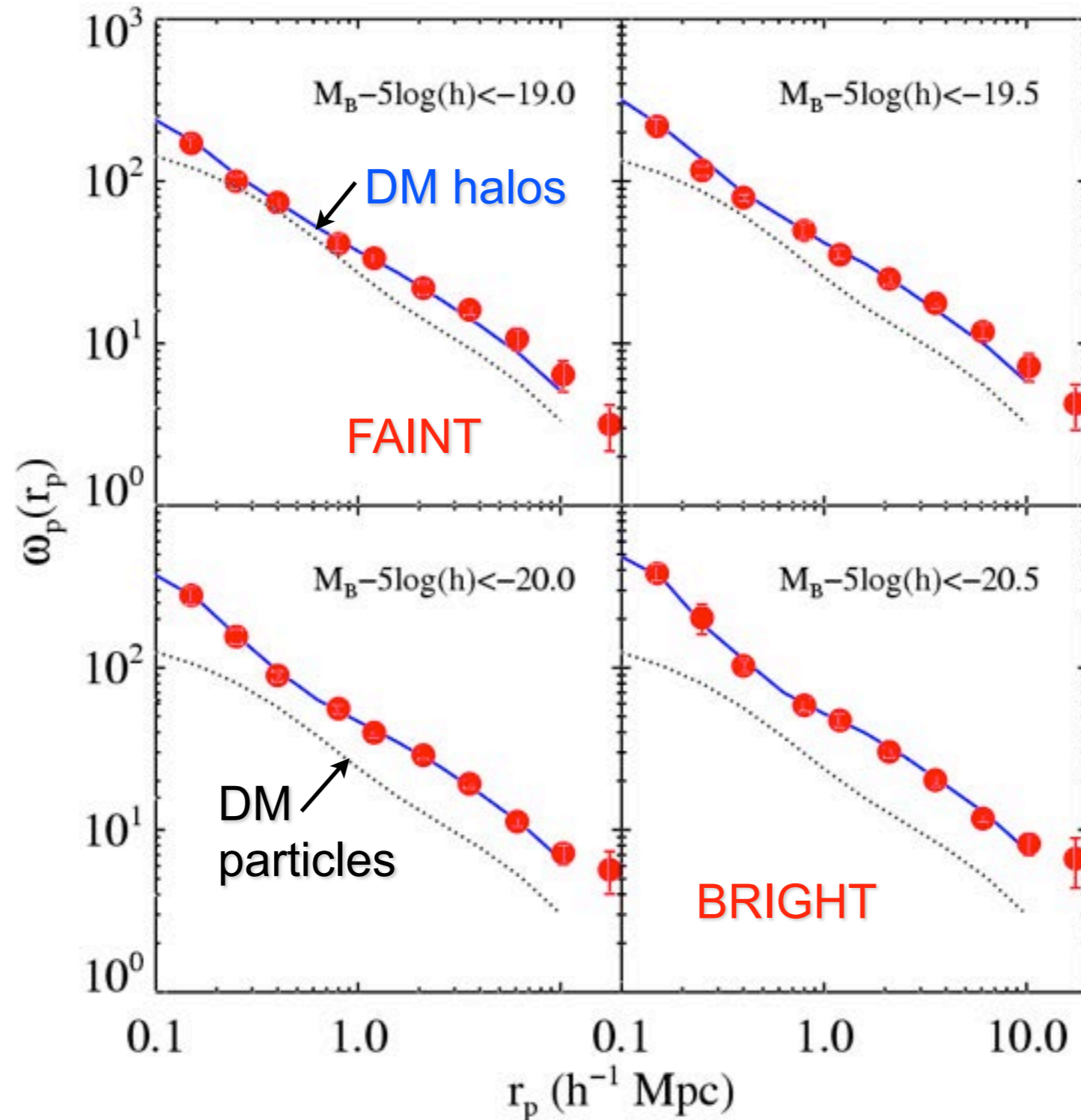
$$n(>V_{\max, \text{acc}}) = n(>L)$$

Conroy,  
Wechsler &  
Kravtsov  
2006, ApJ 647, 201



# and at redshift $z \sim 1$ (DEEP2)

projected  
2-point  
correlation  
function



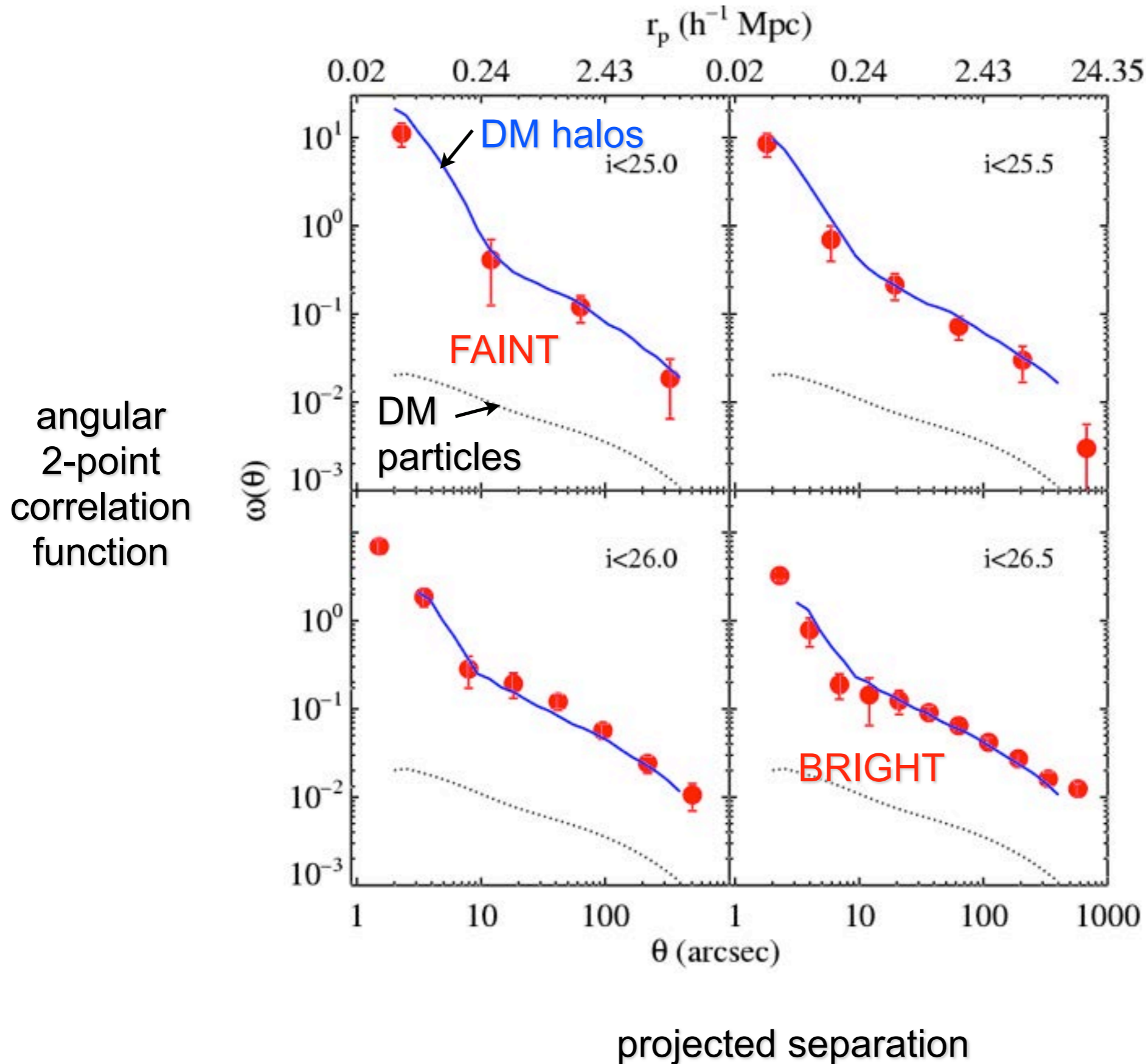
$$n(>V_{\max, \text{acc}}) = n(>L)$$

Conroy,  
Wechsler &  
Kravtsov 06

projected separation



# and at $z \sim 4-5$ (LBGs, Subaru)!



$$n(>V_{\text{max,acc}}) = n(>L)$$

Conroy,  
Wechsler &  
Kravtsov 06



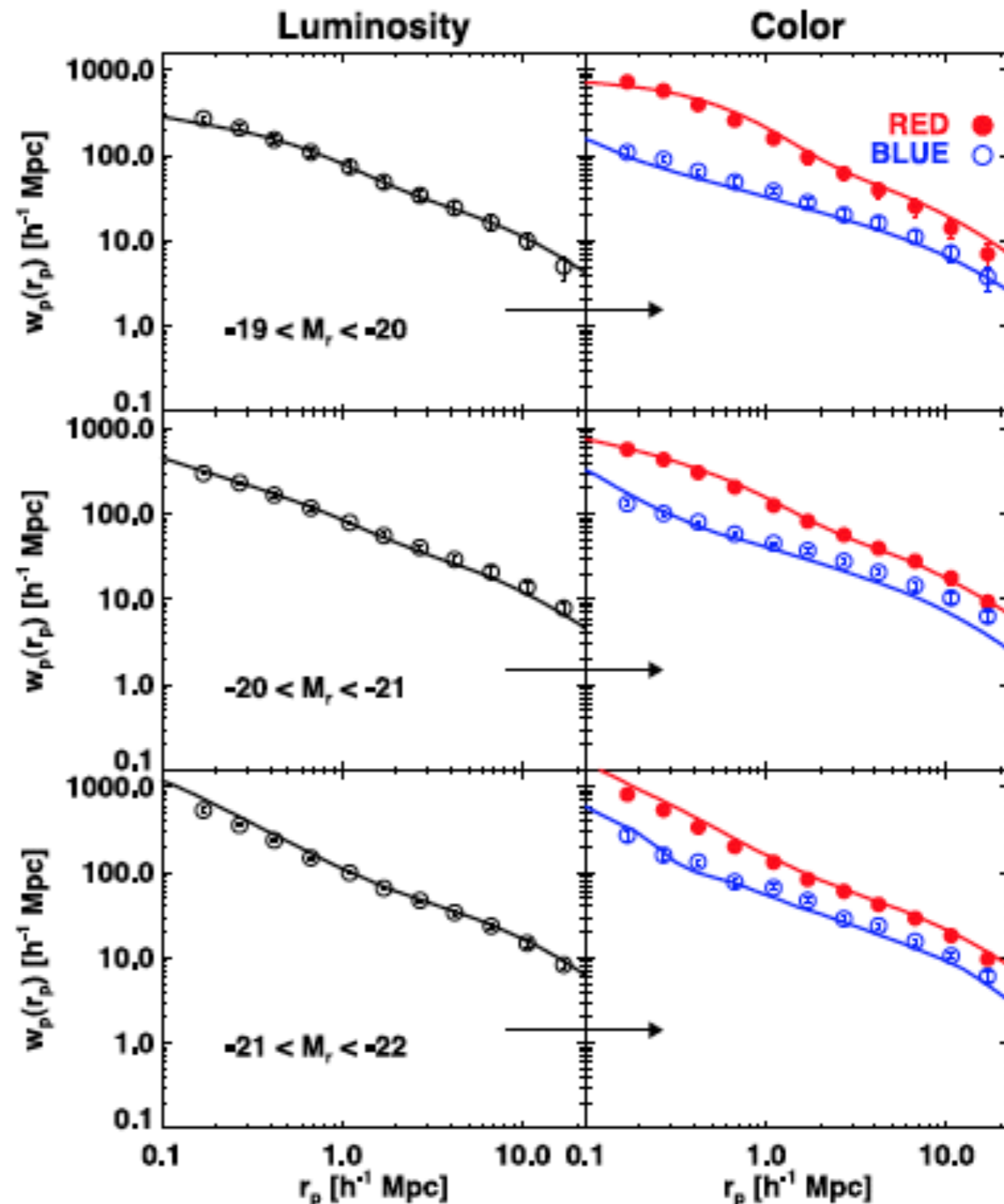
# The dark side of galaxy colour

Andrew P. Hearin & Douglas F. Watson MNRAS 435, 1313 (2013)

Hearin and Watson 2013 showed that by extending the traditional abundance matching formalism to consider an additional halo property beyond  $V_{\max}$ , the observed spatial distribution of galaxies as a function of luminosity and color could be accurately reproduced. Specifically, the authors considered the redshift, dubbed  $z_{\text{starve}}$ , that correlates with the epoch at which the star formation in the galaxy is likely stifled, ultimately leading to the quenching of the galaxy.

By using Bolshoi merger trees to map the full mass assembly history (MAH) of halos, a halo's  $z_{\text{starve}}$  value is determined by whichever of the following three events happens first in its MAH: (1) the epoch a halo accretes onto a larger halo, thus becoming a subhalo, (2) the epoch a halo reaches a characteristic mass, and (3) the epoch a halo transitioned from the fast- to slow-accretion regime. Under the simple assumption that  $z_{\text{starve}}$  correlates with  $g - r$  color at fixed luminosity, the age matching technique was able to accurately predict color-dependent clustering in the Sloan Digital Sky Survey (SDSS) and a variety of galaxy group statistics. **The success of the model supports the idea that the assembly history of  $\Lambda$ CDM halos and their central galaxies are correlated.**

## Galaxy Angular Correlations





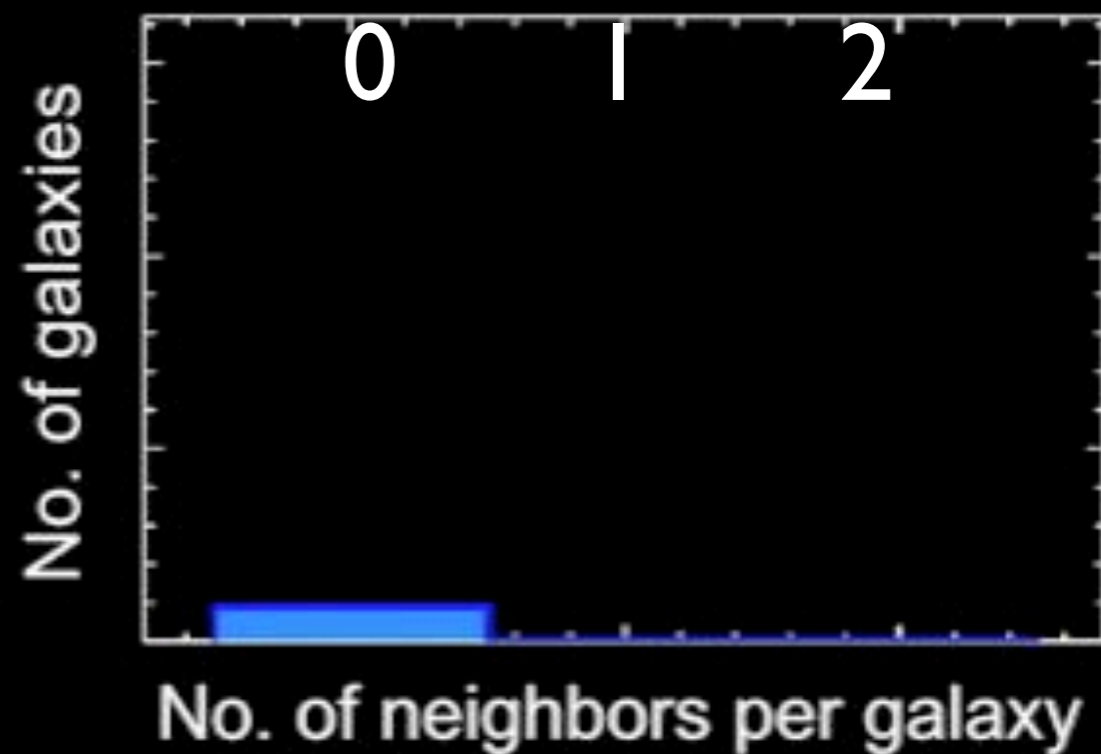
The Milky Way has two large satellite galaxies,  
the small and large Magellanic Clouds

*How common is this?*



The Bolshoi simulation + sub-halo abundance matching  
predicts the likelihood of 0, 1, 2, 3, ... large satellites

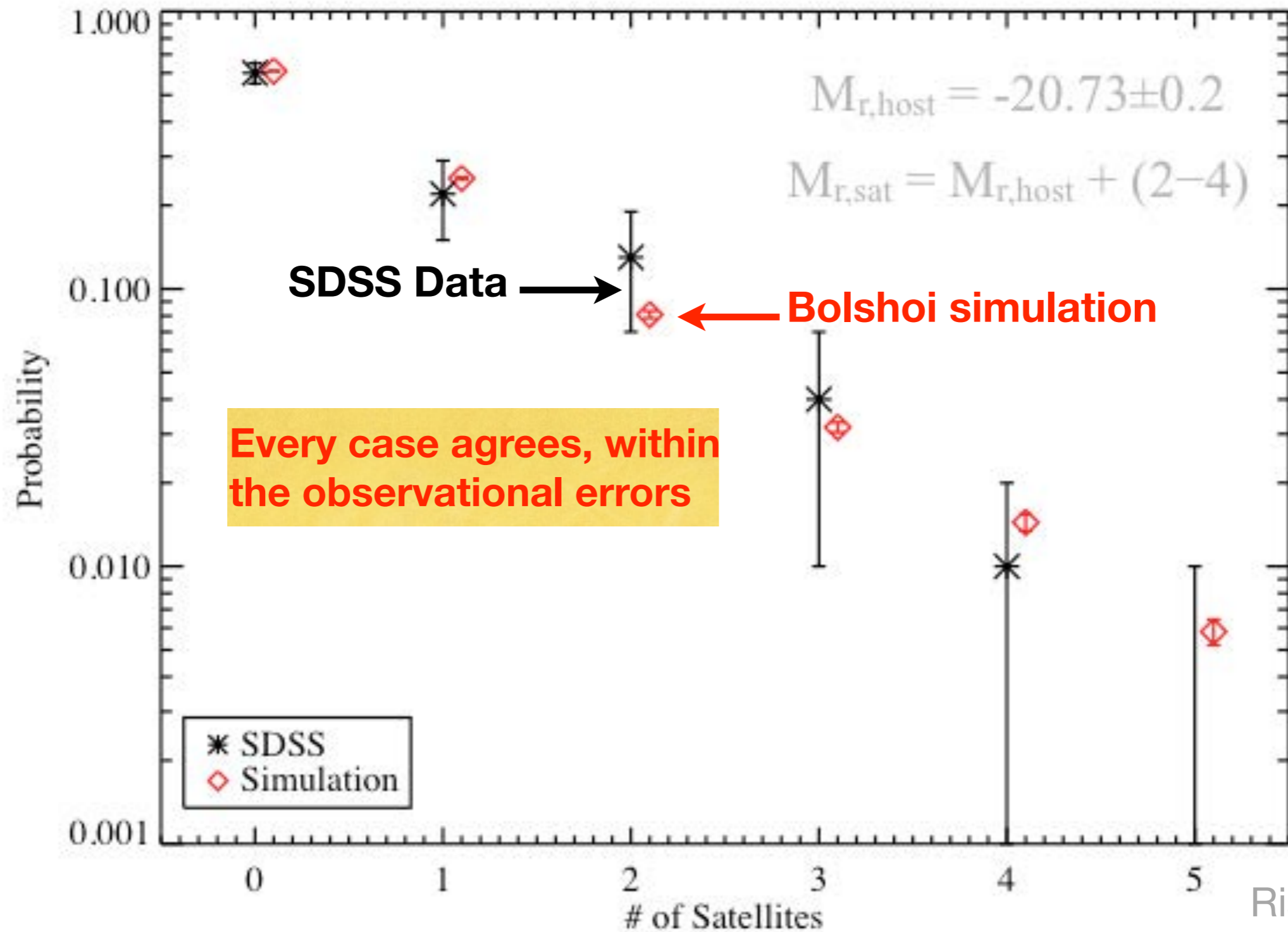






# Statistics of MW bright satellites:

## Sloan Digital Sky Survey data vs. Bolshoi simulation



Risa Wechsler

**Busha et al. 2011 ApJ**  
**Liu et al. 2011 ApJ**

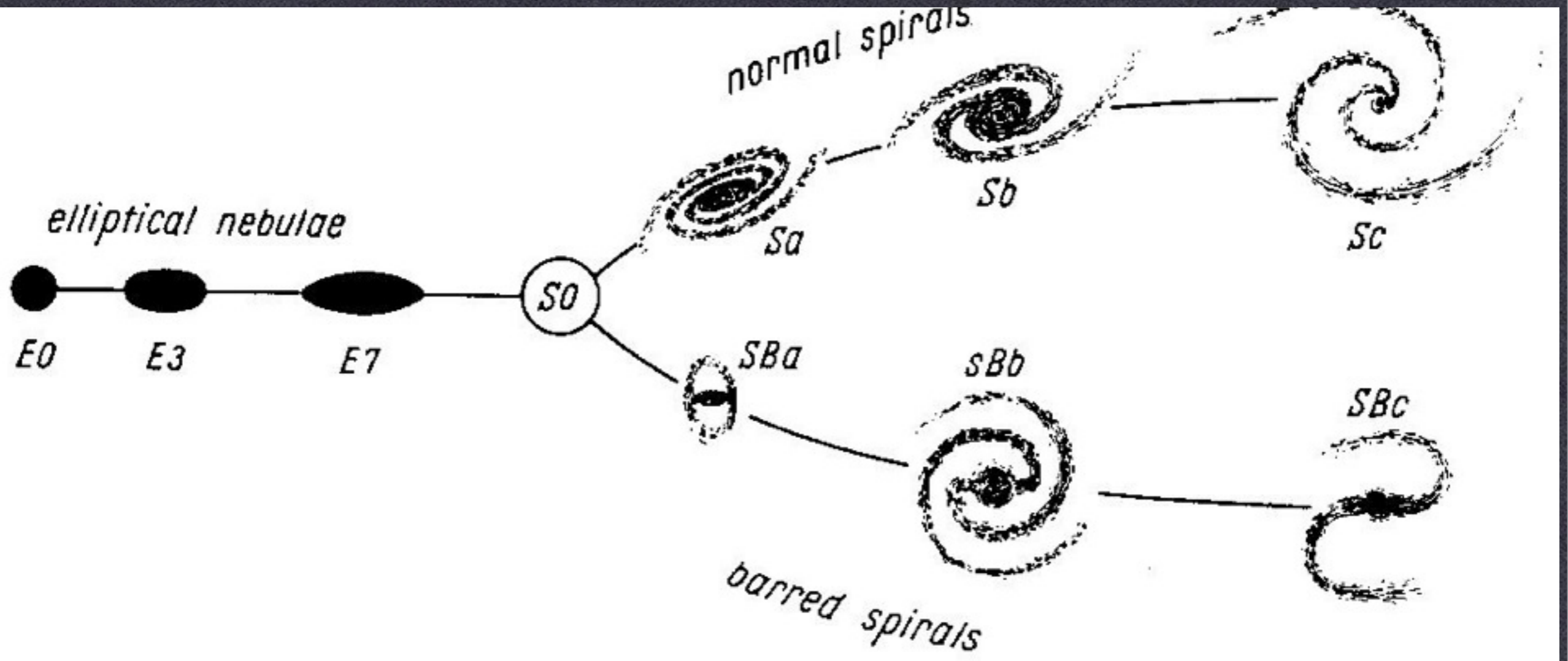




# ORIGIN OF HUBBLE SEQUENCE

CIRCA 1930



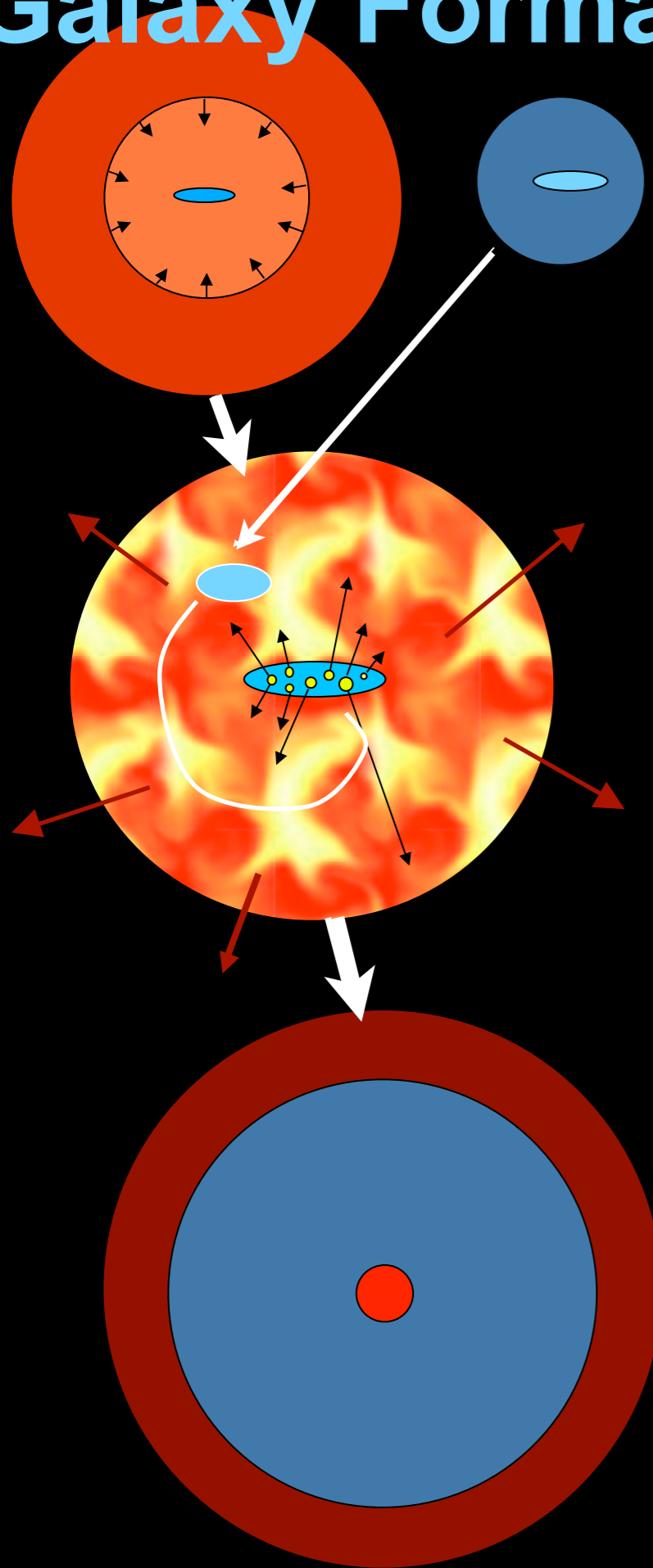


# ORIGIN OF HUBBLE SEQUENCE

CIRCA 1930

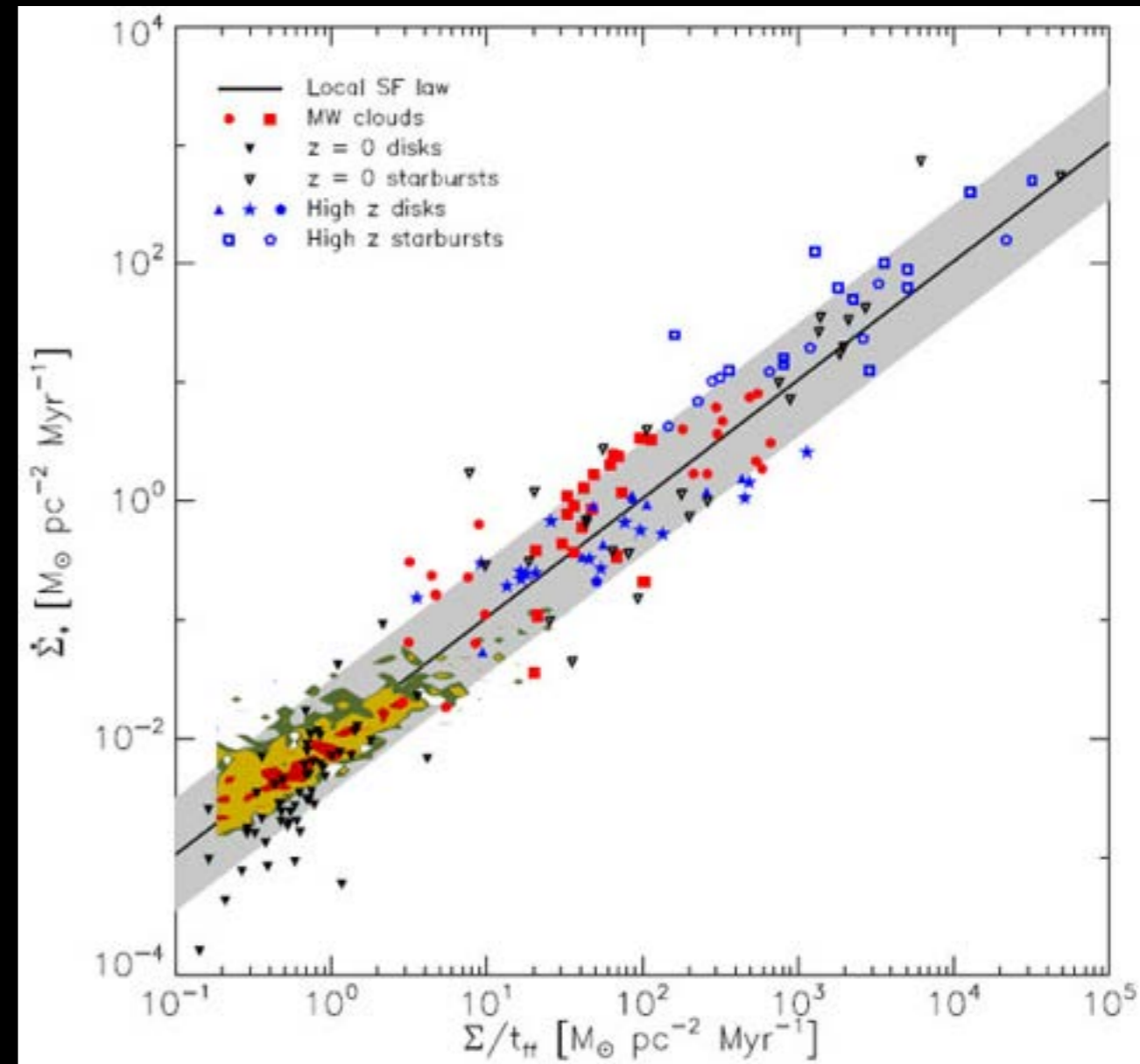


# Galaxy Formation via SemiAnalytic Models



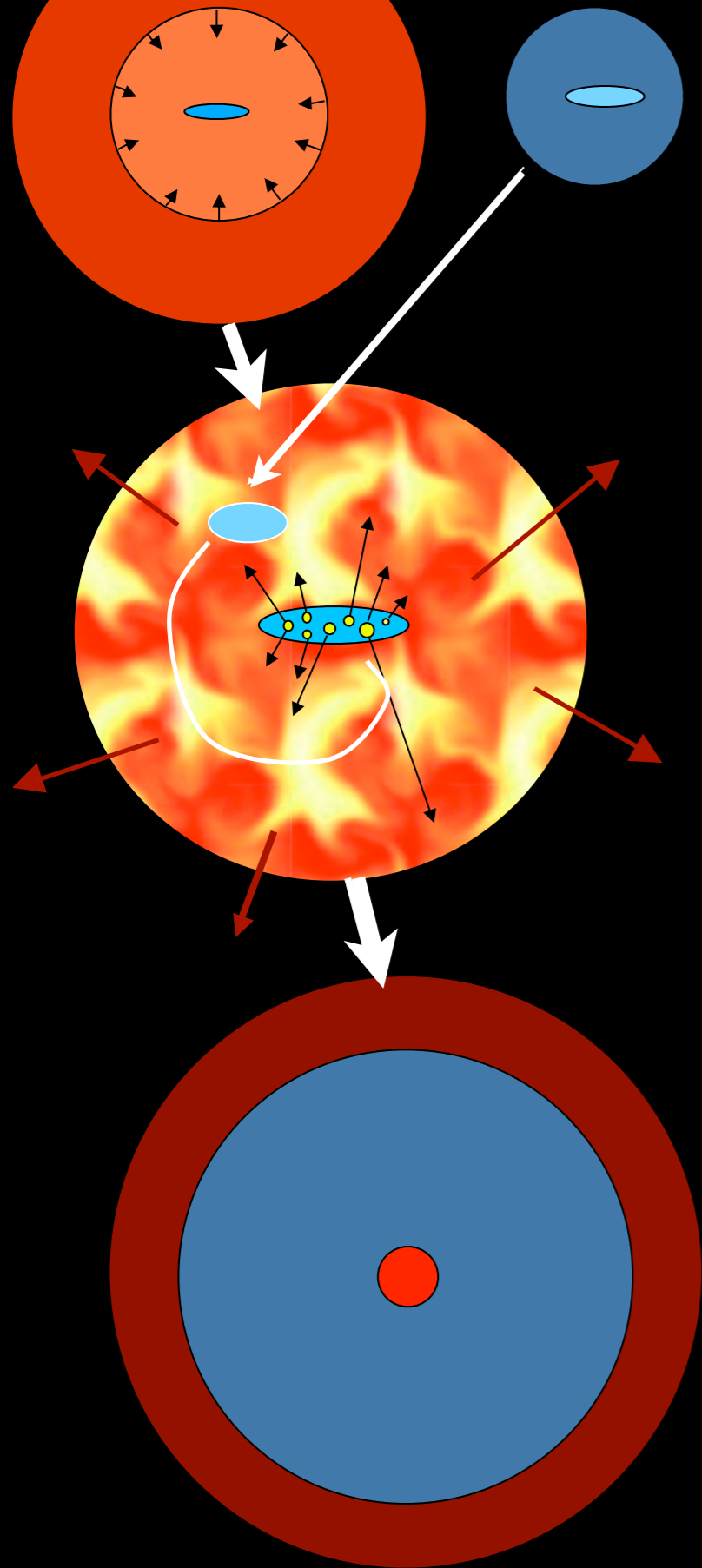
- gas is collisionally heated when perturbations 'turn around' and collapse to form gravitationally bound structures
- gas in halos cools via atomic line transitions (depends on density, temperature, and metallicity)
- cooled gas collapses to form a rotationally supported disk
- cold gas forms stars, with efficiency a function of gas density (e.g. Schmidt-Kennicutt Law, metallicity effects?)

Schmidt-Kennicutt laws on nearby (including Local Group galaxies as shaded regions) and distant galaxies, as well as Milky Way Giant Molecular Clouds (Krumholz et al. 2012):  
Rate of change of stellar surface density is proportional to gas surface density divided by free-fall time  
 $t_{\text{ff}} = (G\rho)^{-1/2}$

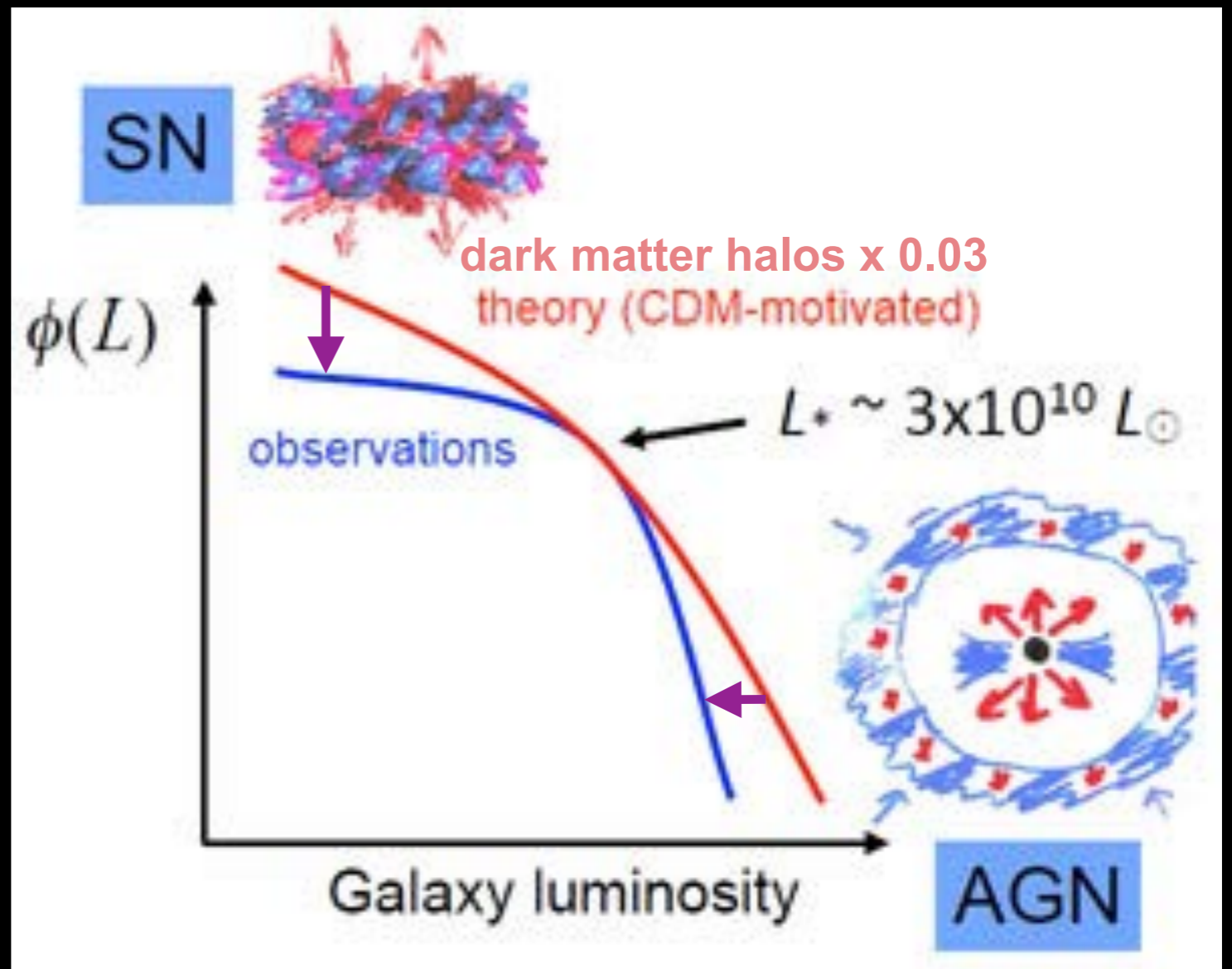




# Galaxy Formation via SemiAnalytic Models

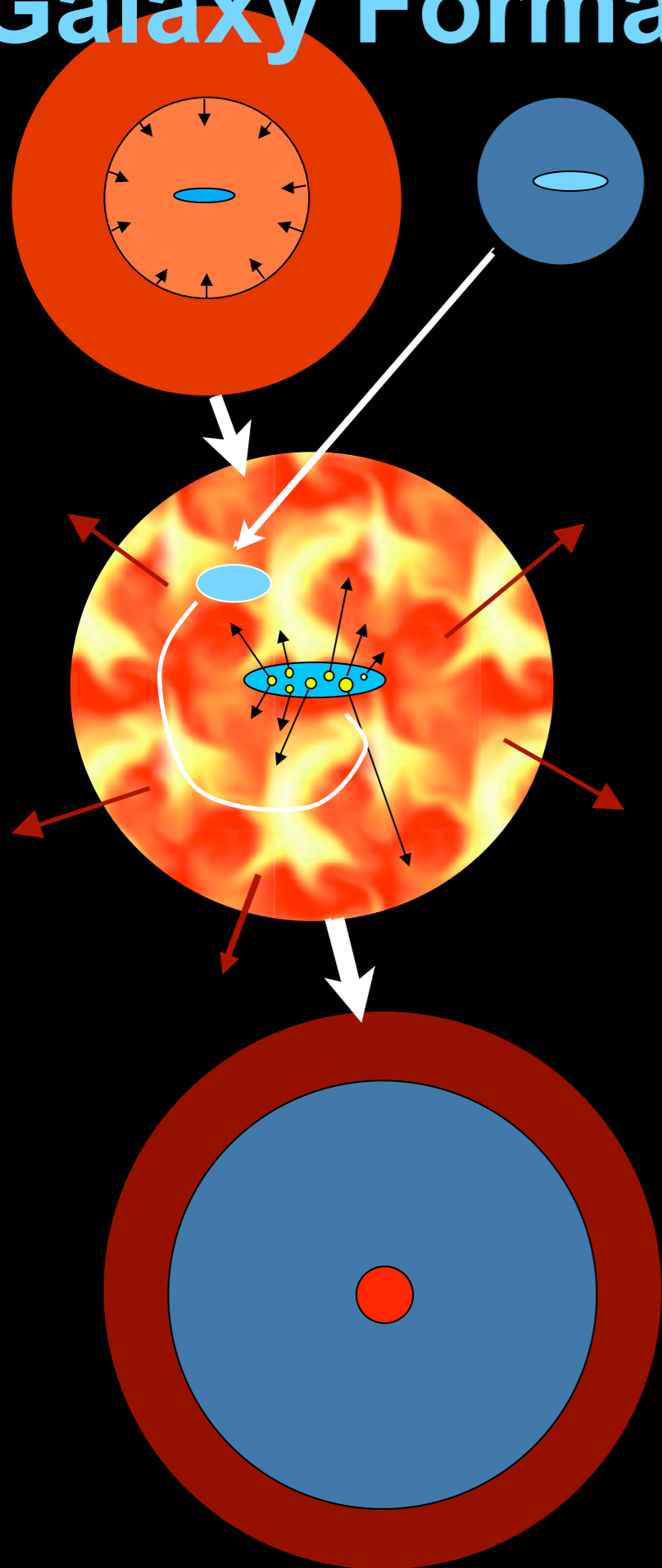


- cooled gas collapses to form a rotationally supported disk
- cold gas forms stars, with efficiency a function of gas density (e.g. Schmidt-Kennicutt Law, metallicity effects?)
- massive stars and SNe reheat (and in small halos expel) cold gas and some metals
- galaxy mergers trigger bursts of star formation; 'major' mergers transform disks into spheroids and fuel AGN
- AGN feedback cuts off star formation

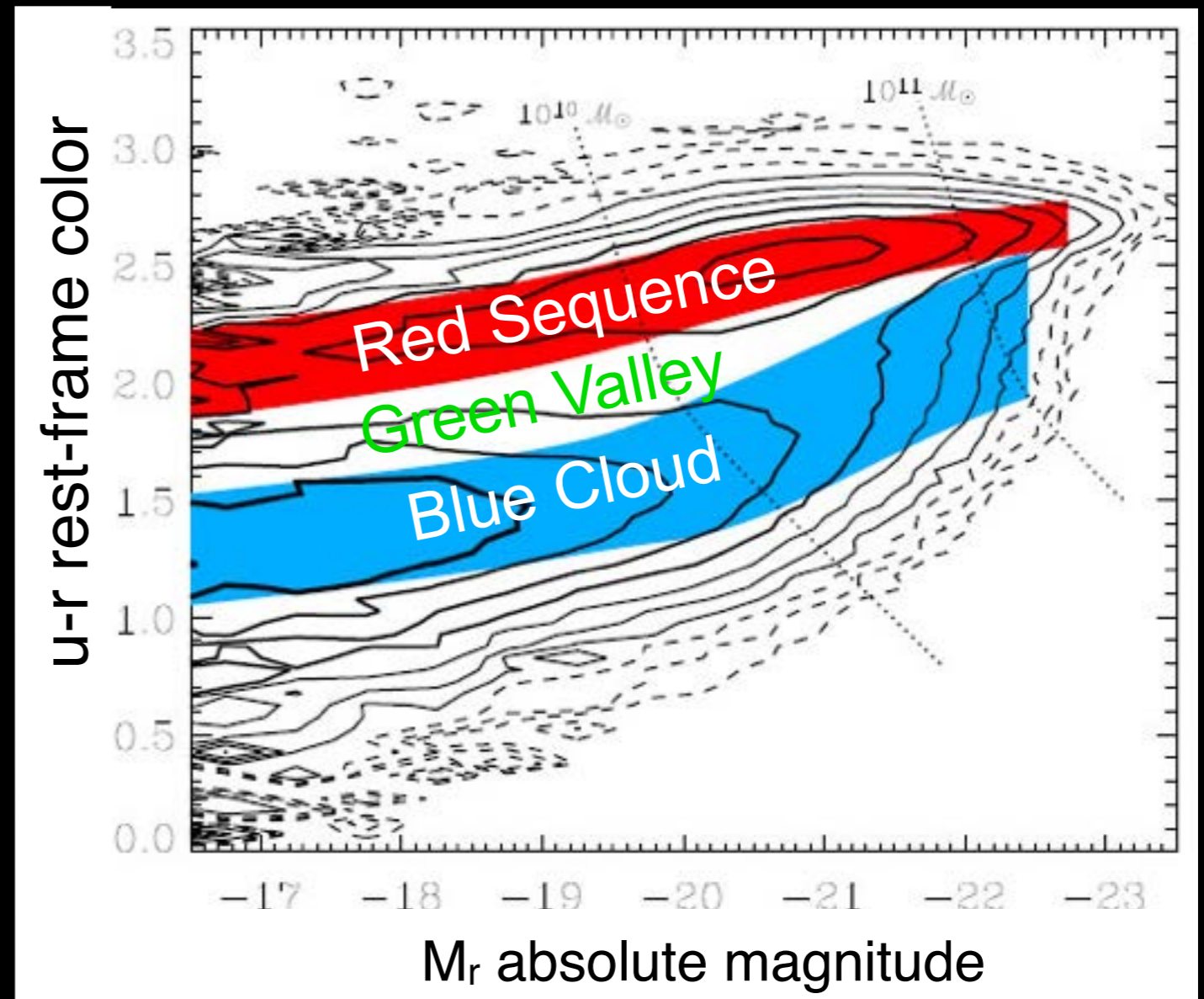




# Galaxy Formation via SemiAnalytic Models

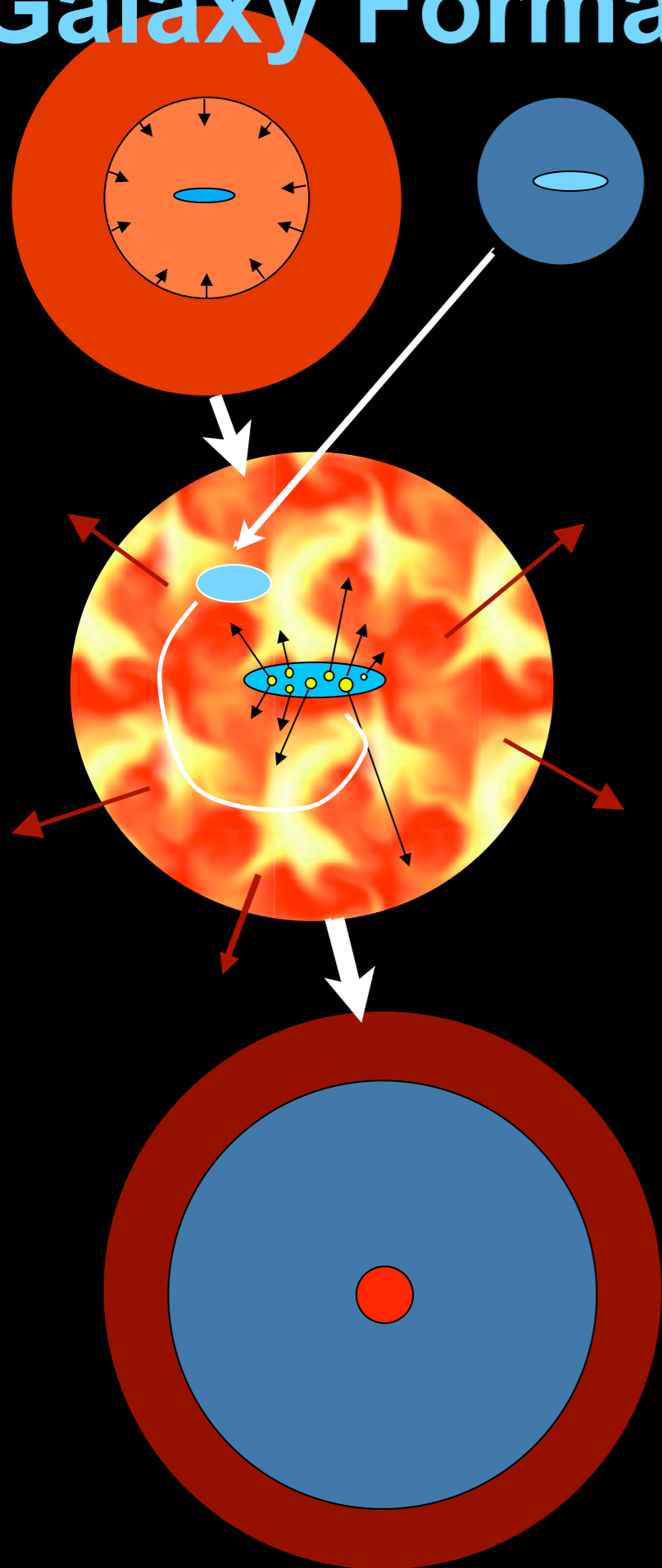


- cold gas forms stars, with efficiency a function of gas density (e.g. Schmidt-Kennicutt Law, metallicity effects?)
- massive stars and SNe reheat (and in small halos expel) cold gas and some metals
- AGN feedback cuts off star formation
- Illustration of galaxy bimodality. The contours are the density of SDSS galaxies in color-luminosity space, after correction for selection effects (Baldry et al. 2004).





# Galaxy Formation via SemiAnalytic Models



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- galaxy mergers trigger bursts of star formation; ‘major’ mergers transform disks into spheroids and fuel AGN
- AGN feedback cuts off star formation
- **including effects of dissipation in gas-rich galaxy mergers leads to observed elliptical size-mass relation**
- **including spheroid formation by disk instability is essential to reproduce the observed elliptical luminosity function**

White & Frenk 91; Kauffmann+93; Cole+94; Somerville & Primack 99; Cole+00; Somerville, Primack, & Faber 01; Croton et al. 2006; Somerville +08; Fanidakis+09; Covington et al. 10, 11; Somerville, Gilmore, Primack, & Dominguez 11; Porter et al.



● Elliptical galaxies follow a size-mass relation. Our semi-analytic model correctly predicts this and the other scaling relations of elliptical galaxies.

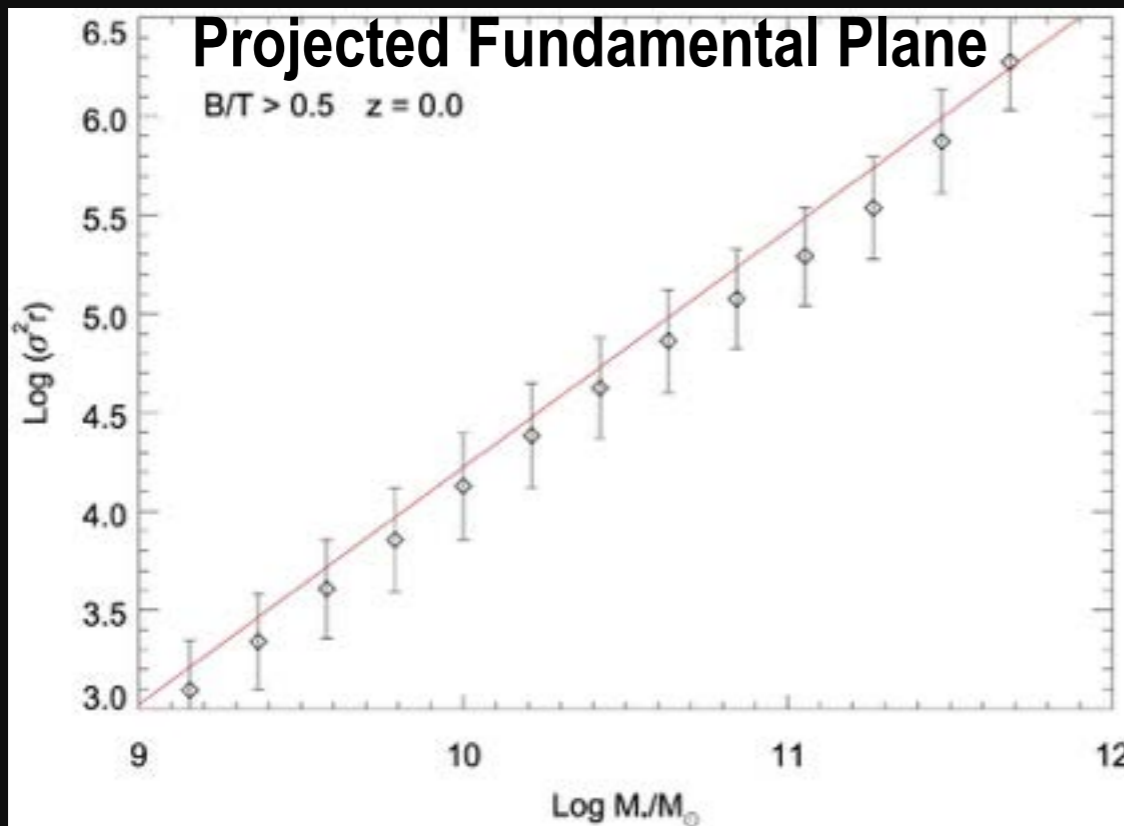
● Disk galaxies follow a relation between their rotation velocity and their luminosity. The model also correctly predicts this.



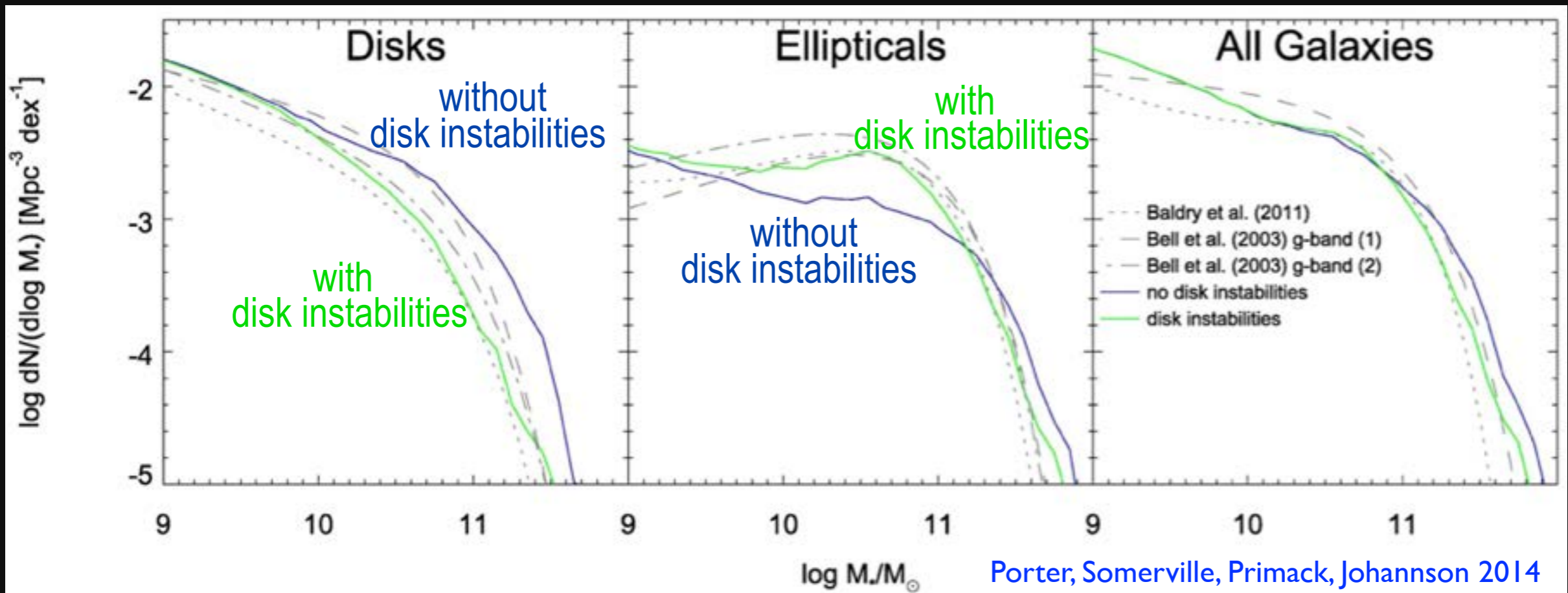
● Our semi-analytic model also correctly predicts the numbers of Disk galaxies and Elliptical galaxies of all masses.



# SemiAnalytic Model Low-Redshift Galaxies



- Correctly reproduces the  $z=0$  size-mass, Faber-Jackson, and Fundamental Plane relations
- Forming spheroids with major mergers + disk instabilities reproduces the morphology-selected  $z=0$  mass function



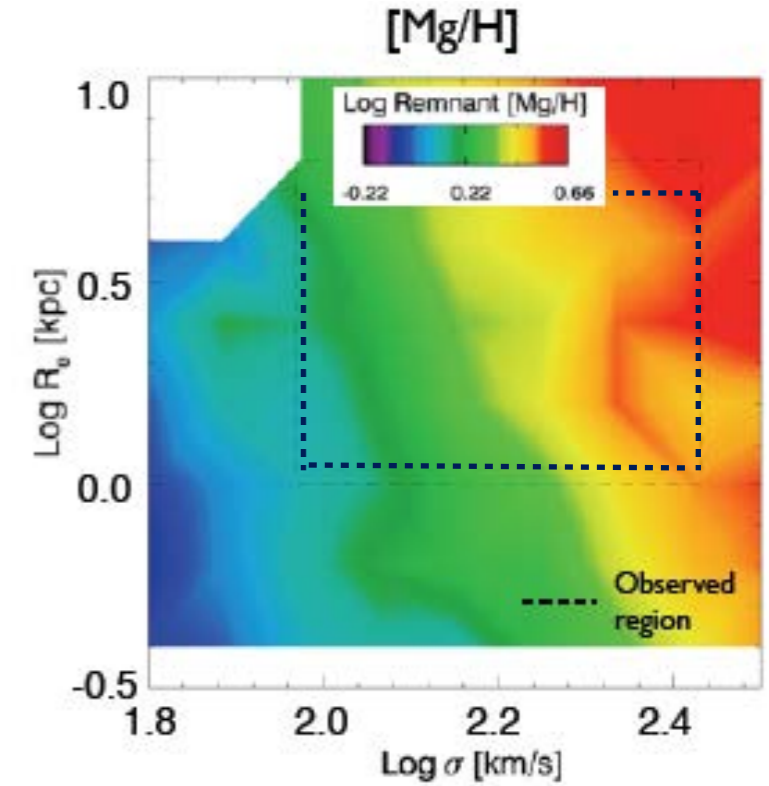
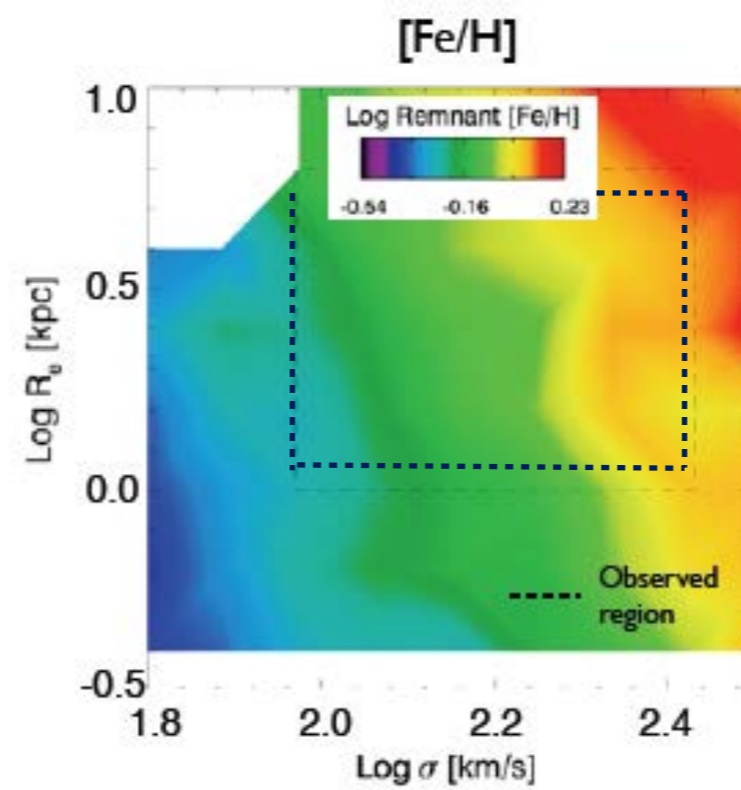
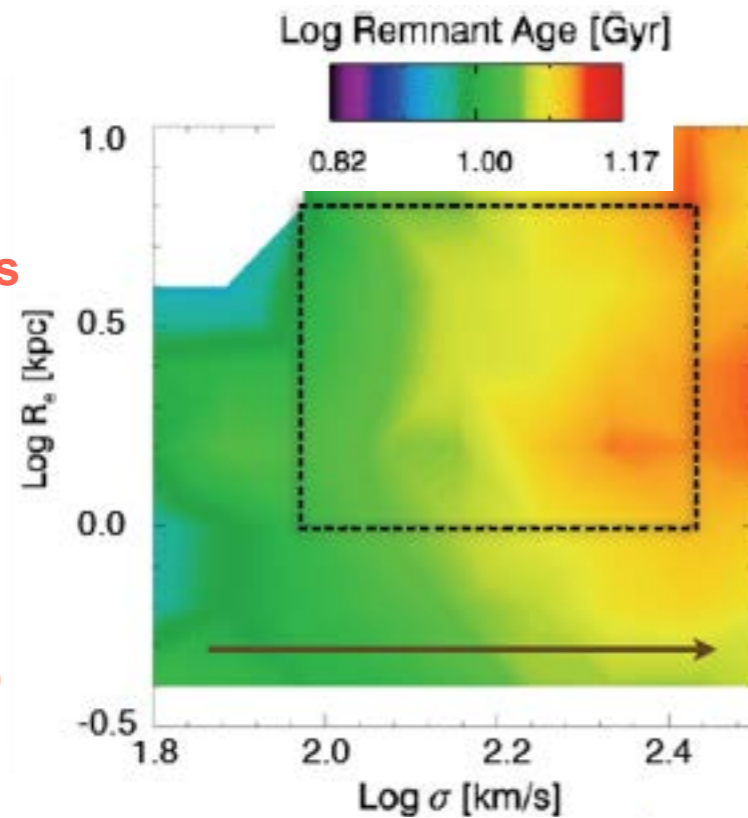


# SAM Predictions vs. SDSS Observations

## Galaxy Age

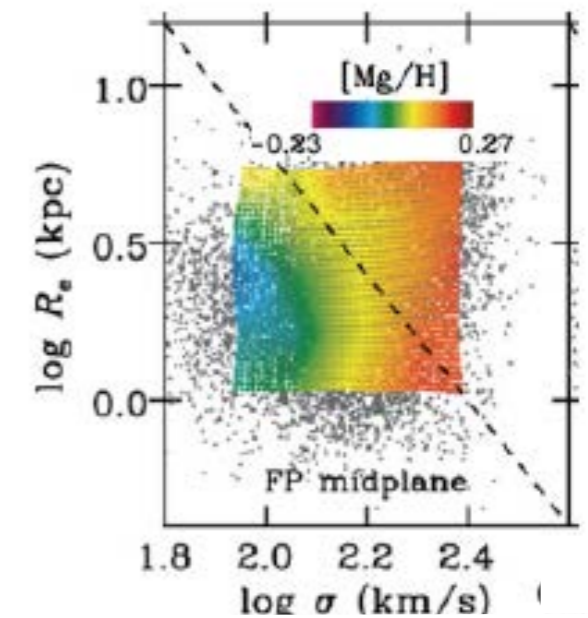
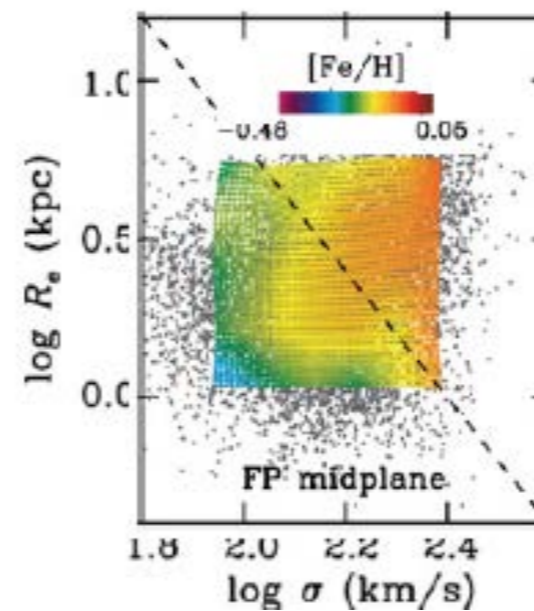
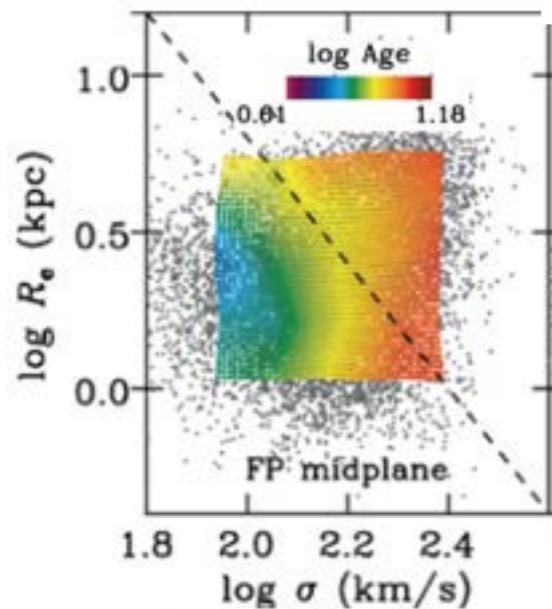
## Galaxy Metallicity

**SAM**  
Predictions



Lauren  
Porter et  
al. 2013b

**SDSS**  
Observations



Jenny  
Graves et  
al. 2009



# Cosmological Simulations

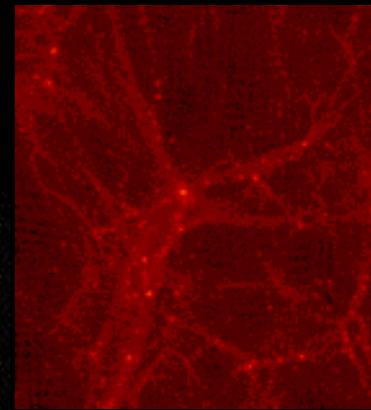
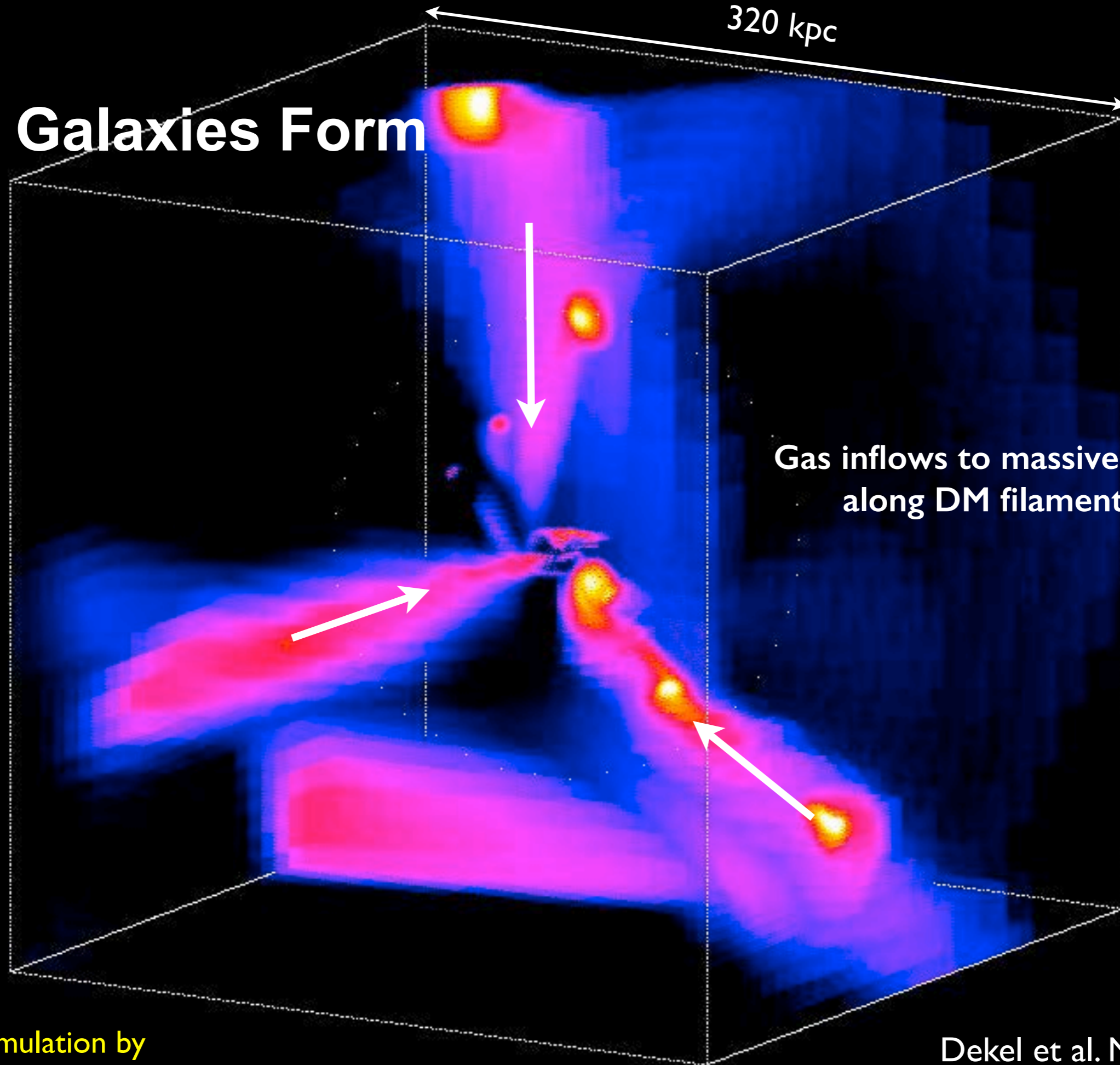
Astronomical observations represent snapshots of moments in time. It is the role of astrophysical theory to produce movies -- both metaphorical and actual -- that link these snapshots together into a coherent physical theory.

**Cosmological dark matter simulations** show large scale structure, growth of structure, and dark matter halo properties

**Hydrodynamic galaxy formation simulations:** evolution of galaxies, formation of galactic spheroids via mergers, galaxy images in all wavebands including stellar evolution and dust



# How Galaxies Form

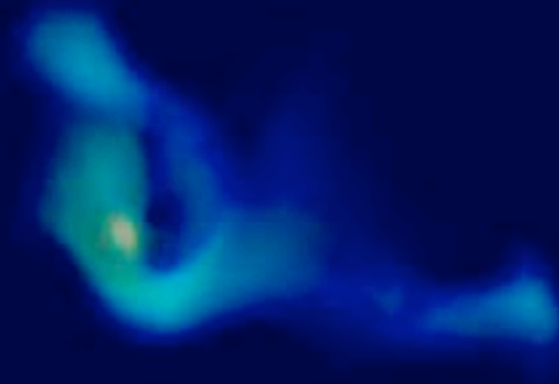




# How Gas moves and Stars form according to galaxy simulations



• Stars



time=276

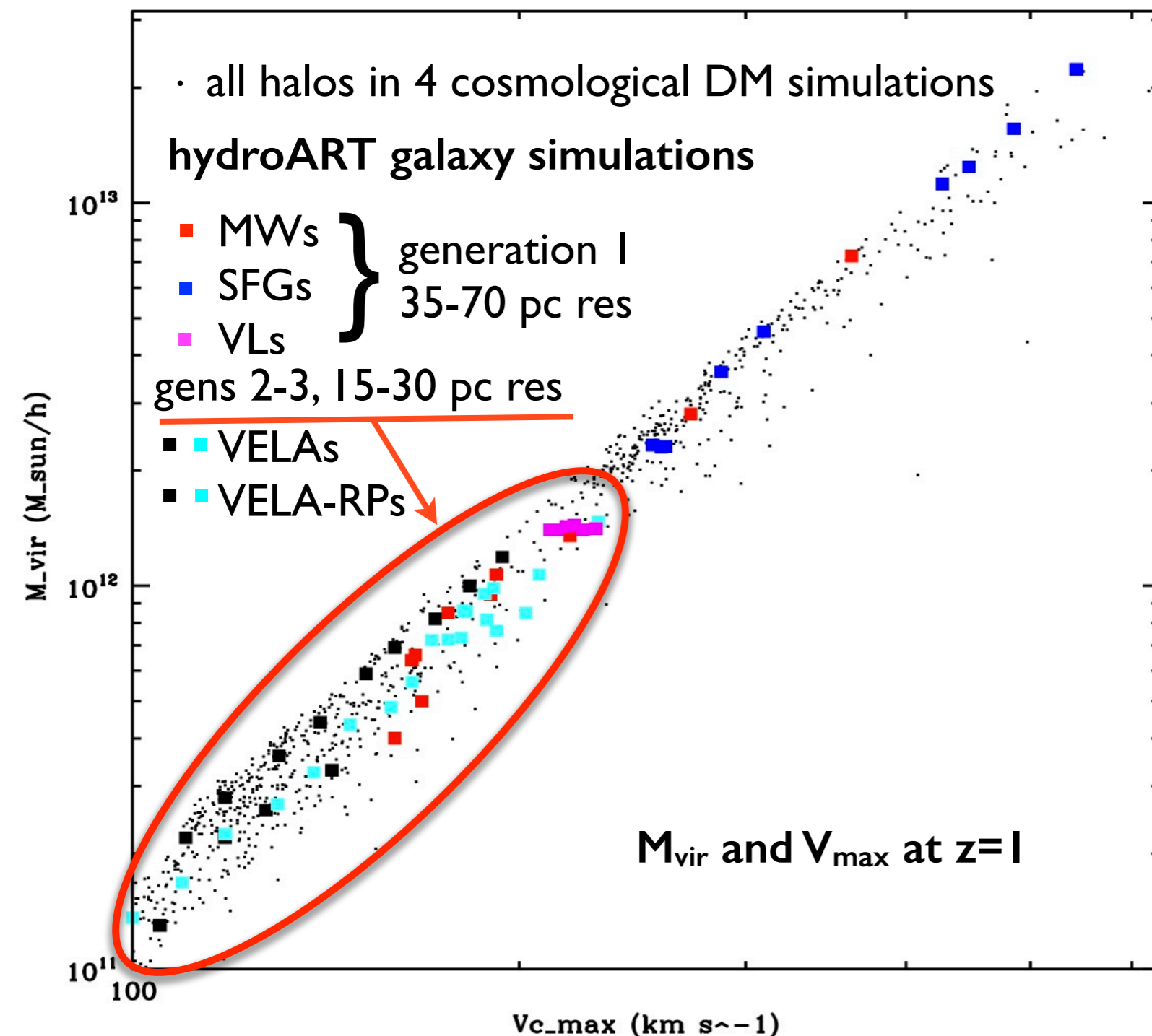
ART Simulation Daniel Ceverino;  
Visualization: David Ellsworth



# 3 Generations of hydroART simulations

## Generations 2 & 3

- ~35 zoom-in simulations
- 15-30 pc reso
- $M_{\text{DM}} = 8 \cdot 10^4 M_{\text{s}}$
- $M_{*} = 10^3 M_{\text{s}}$
- $z = 1-3$



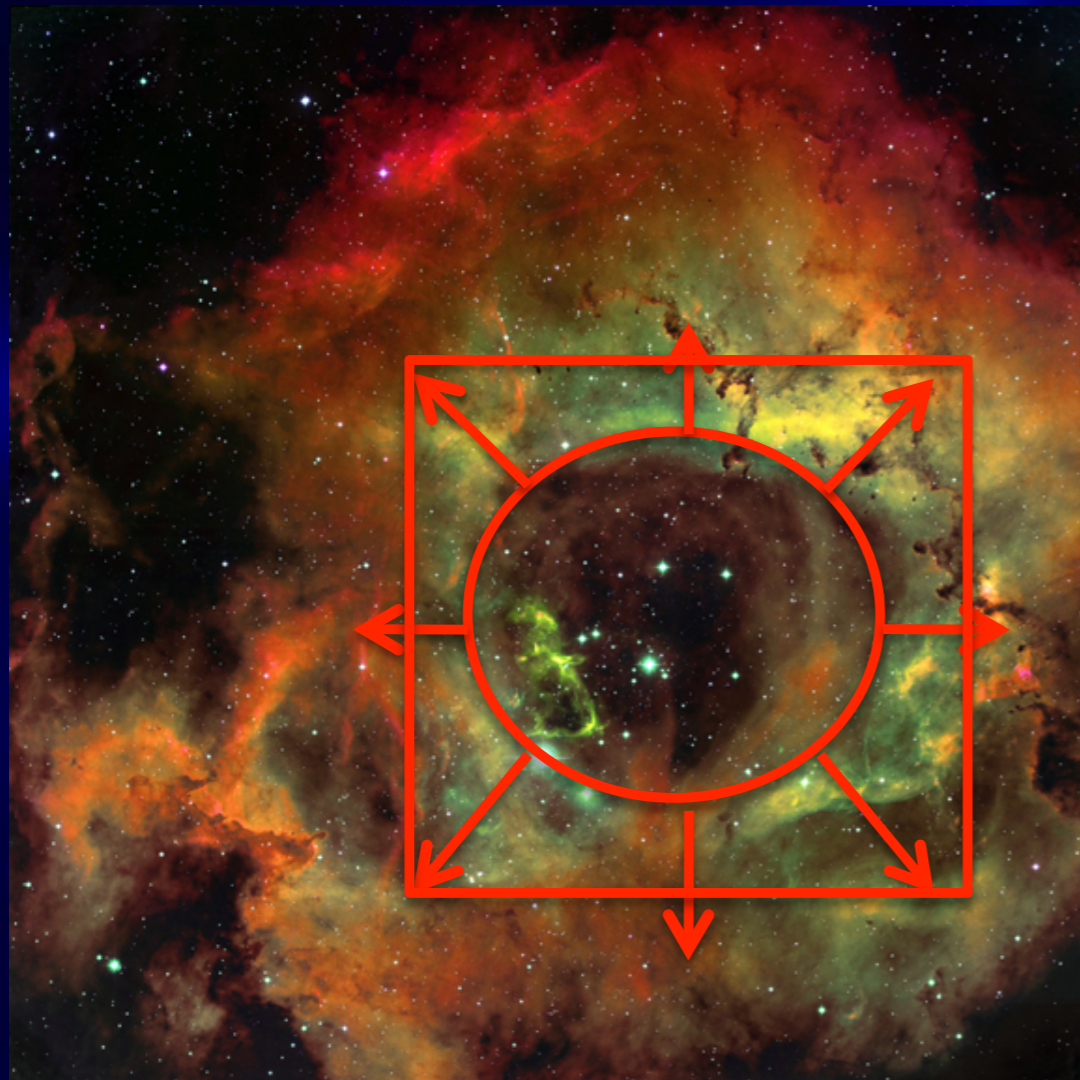
$10^{11} M_{\text{s}}/h < M_{\text{H}} < 10^{12} M_{\text{s}}/h$   
 $V_{\text{c,max}} = 100-200 \text{ km/s @ } z=1$



# Radiative feedback

Rosette Nebula

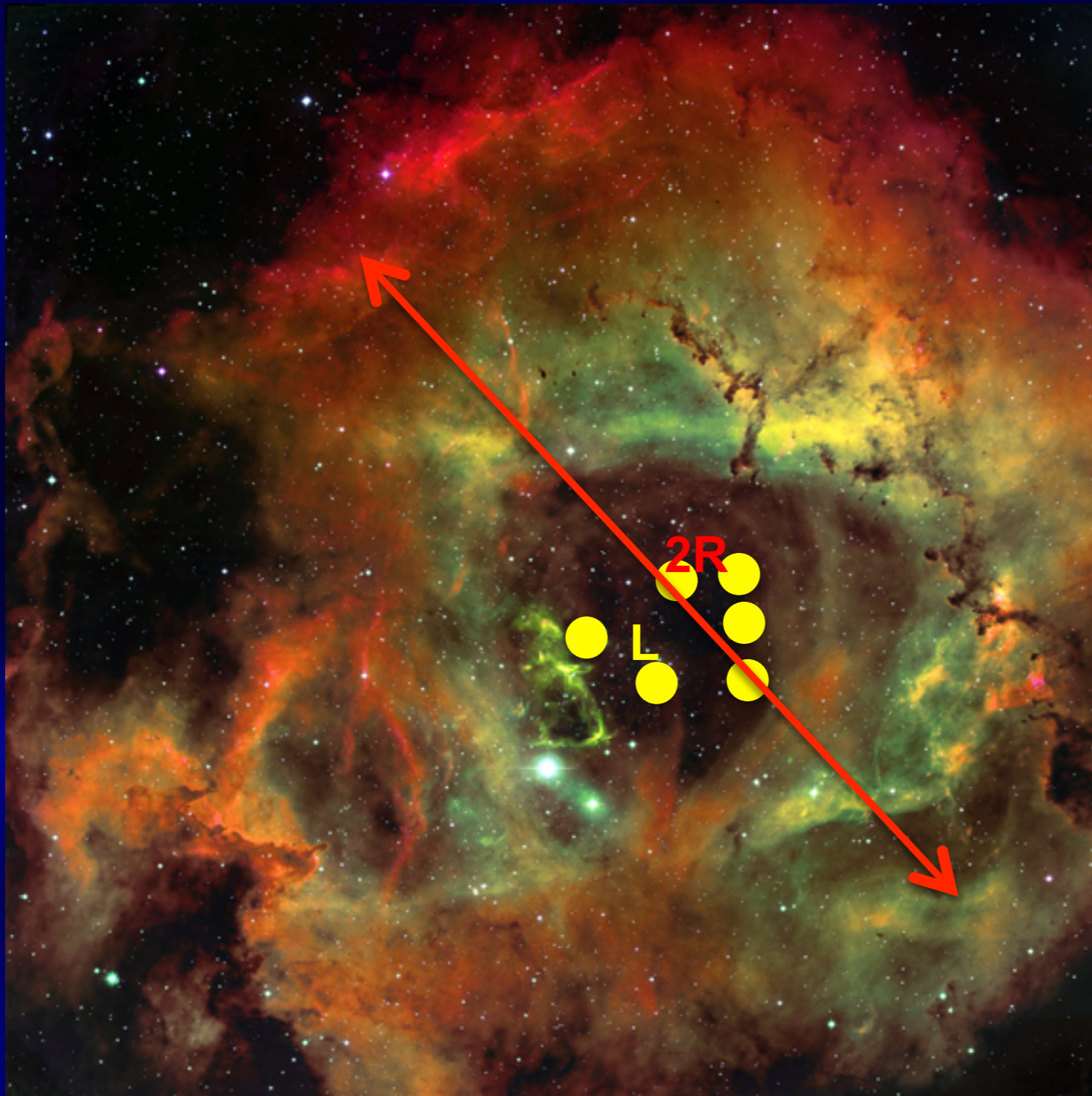
40 pc



No Supernova explosion yet  
Stellar winds  
Thermal pressure  
Radiation pressure  
from ionizing photons

Typical resolution of our zoom-in,  
cosmological simulation: ~ 20 pc





- At high column densities
- Add pressure

$$P_{\text{rad}} = L / (R^2 c)$$

$$L = M_* \Gamma$$

$$\Gamma = \text{cte for 5 Myr}$$

For column densities  $>10^{21} \text{ cm}^{-2}$

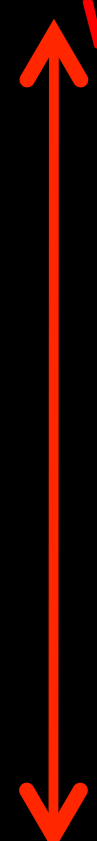
**No free parameters**



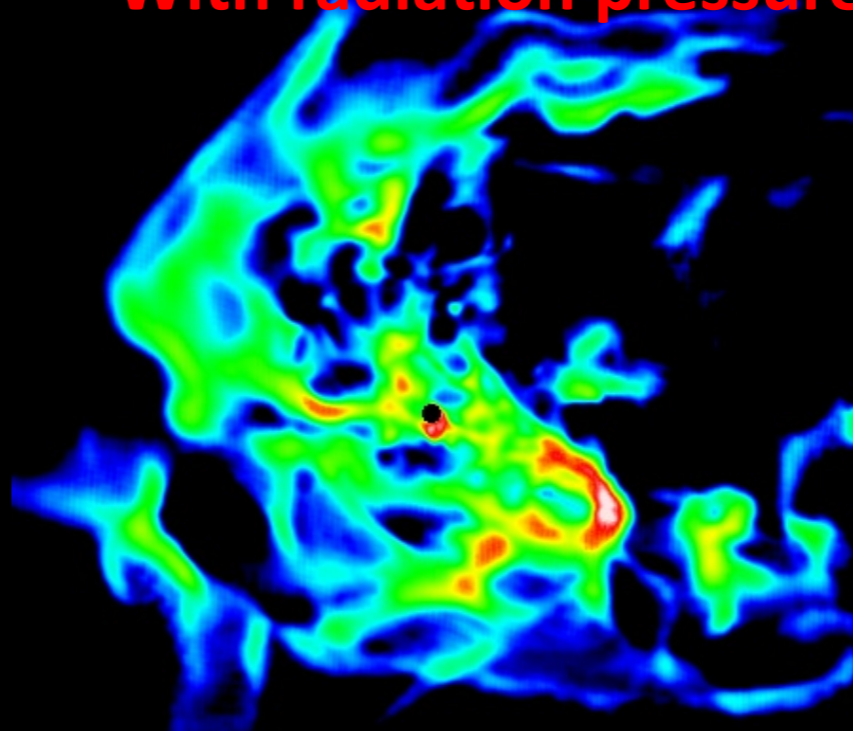
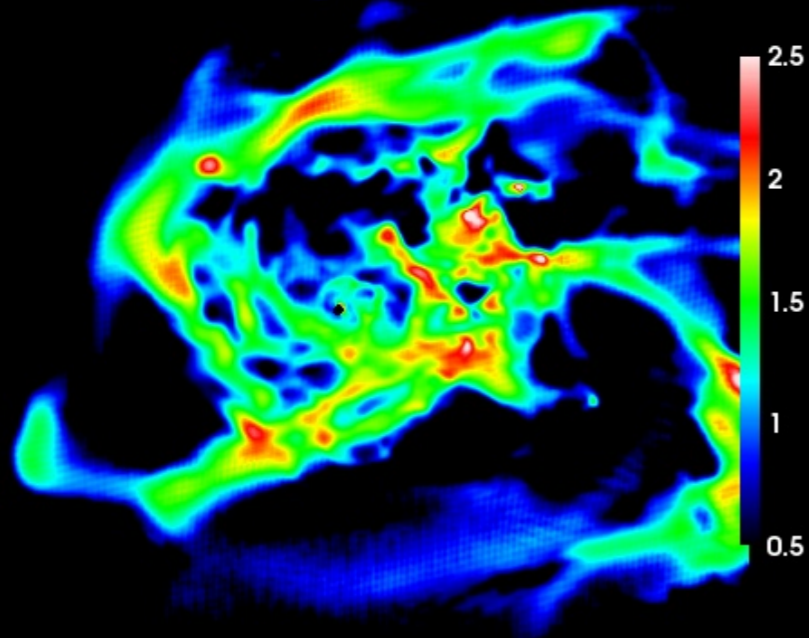
# Gas distributions

Without radiation pressure

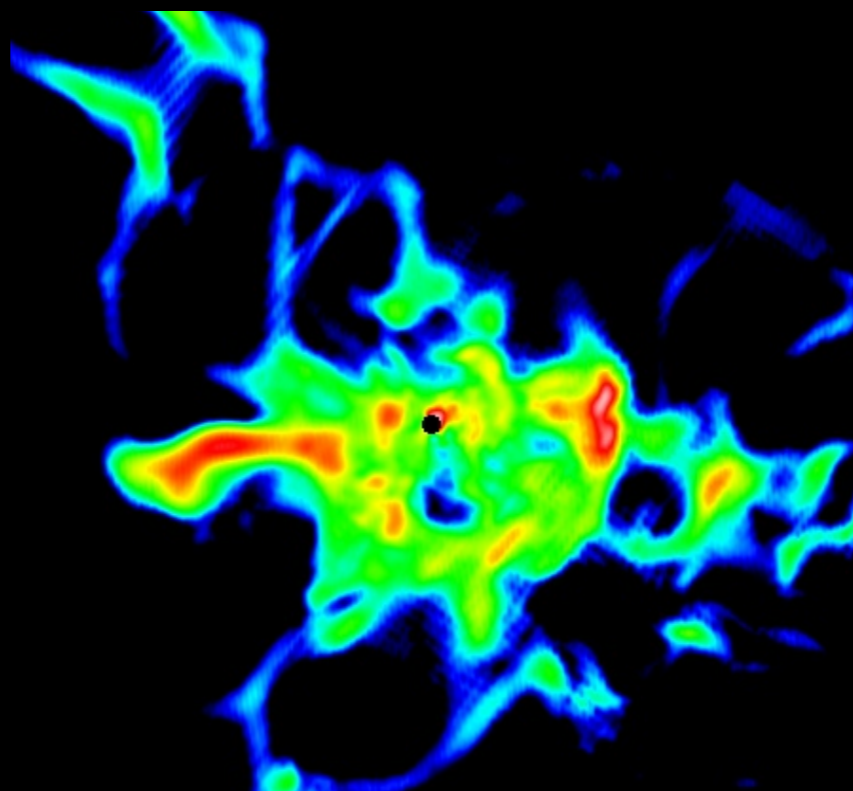
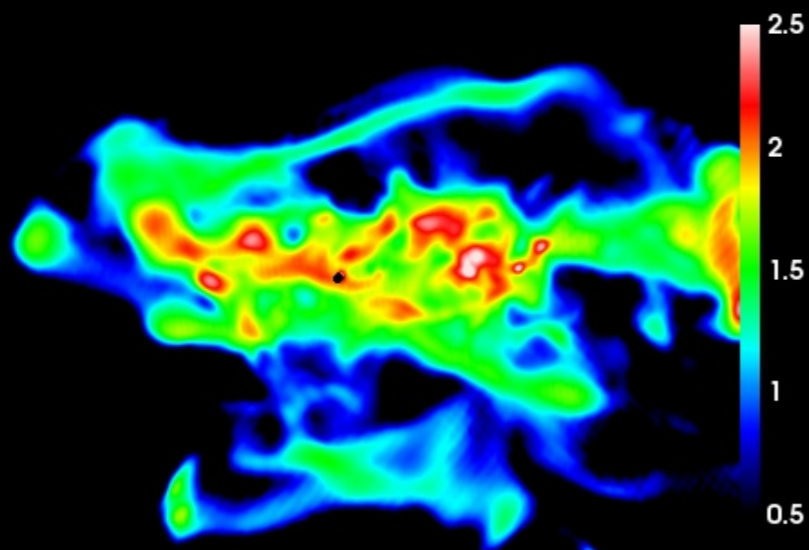
With radiation pressure



20 kpc



Gas face-on



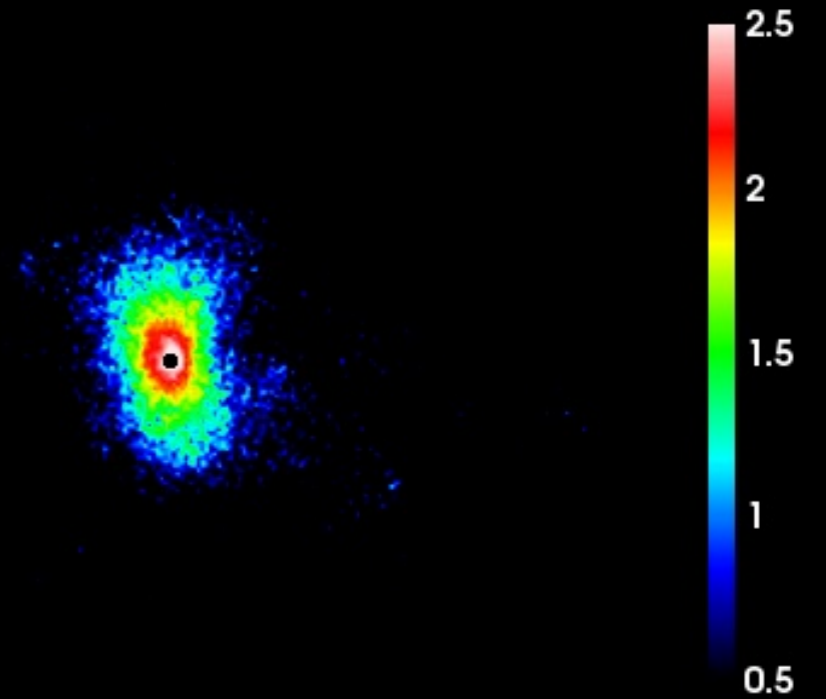
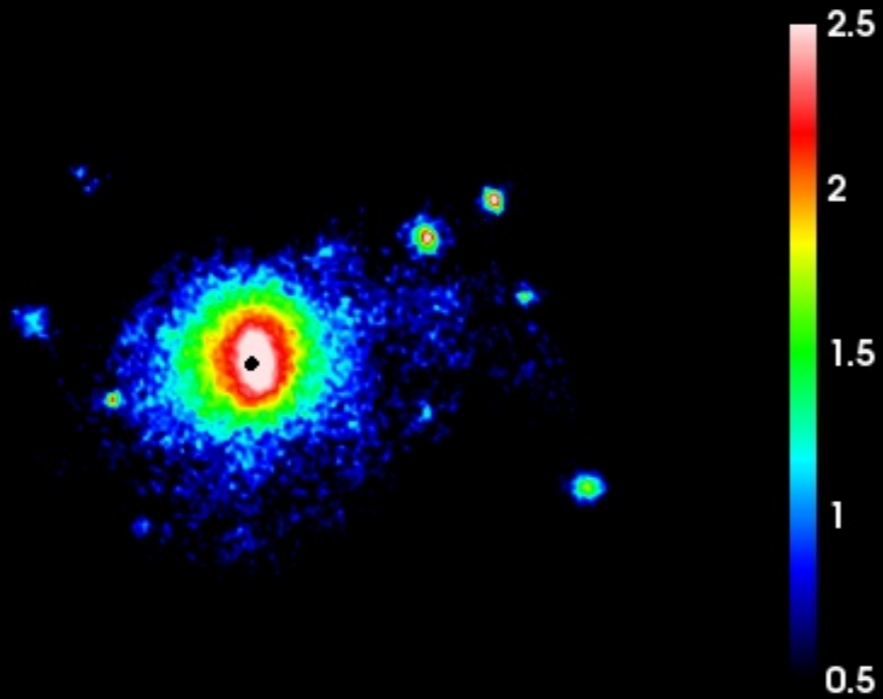
Gas edge-on



# Stars face-on

Without radiation pressure

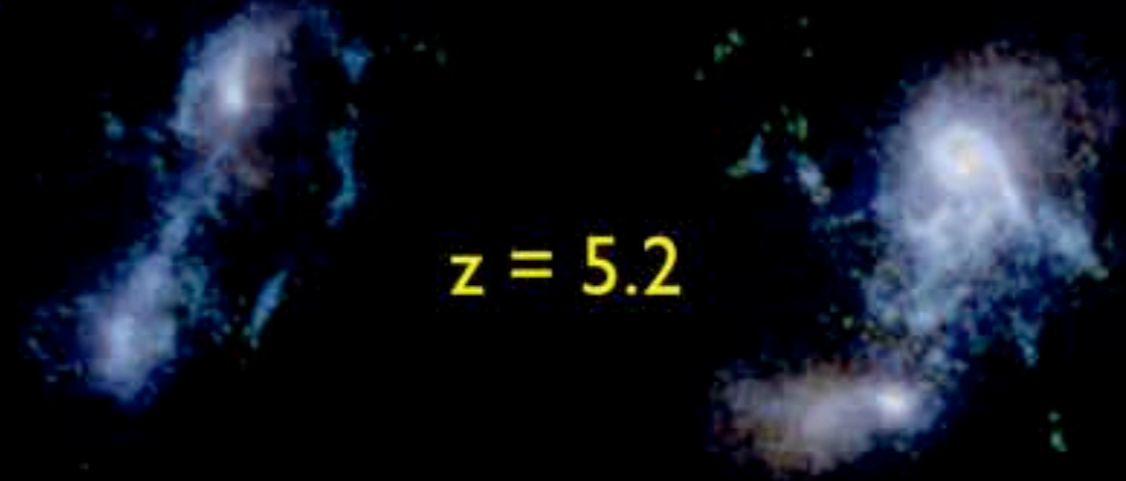
With radiation pressure



← 20 kpc →

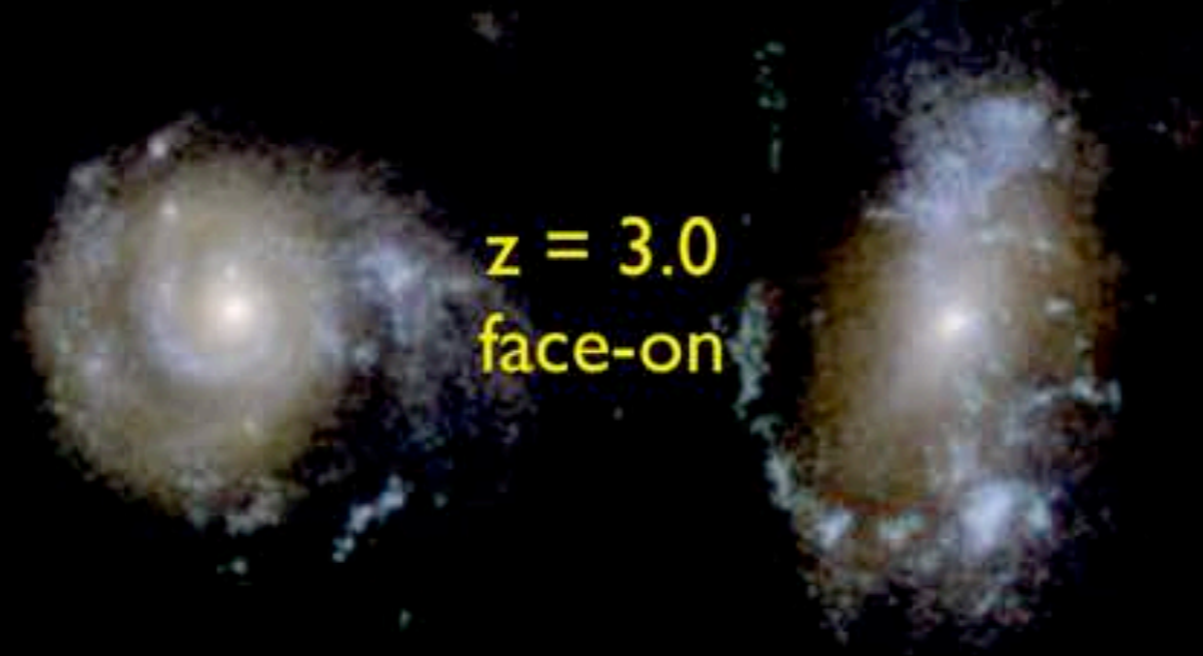


Simulation  
without  
Radiation  
Pressure  
feedback



$z = 5.2$

Same  
Simulation  
with  
Radiation  
Pressure  
feedback



$z = 3.0$   
face-on



$z = 3.0$   
edge-on

CANDELS  
paper in  
preparation:  
galaxy  
elongation  
observed

VELA27

VELA27-RP

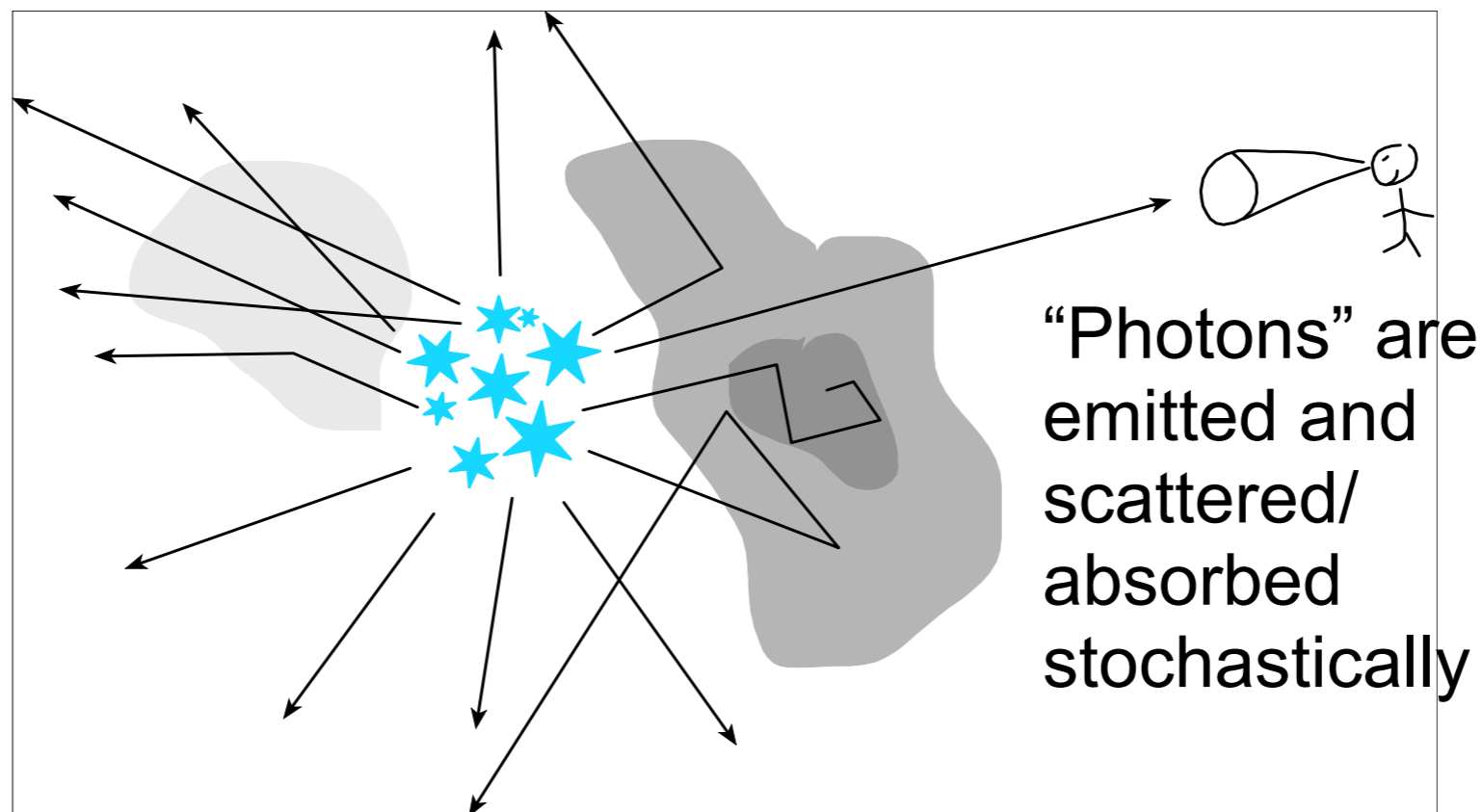


# *Sunrise* Radiative Transfer Code

Patrik Jonsson  
& Joel Primack

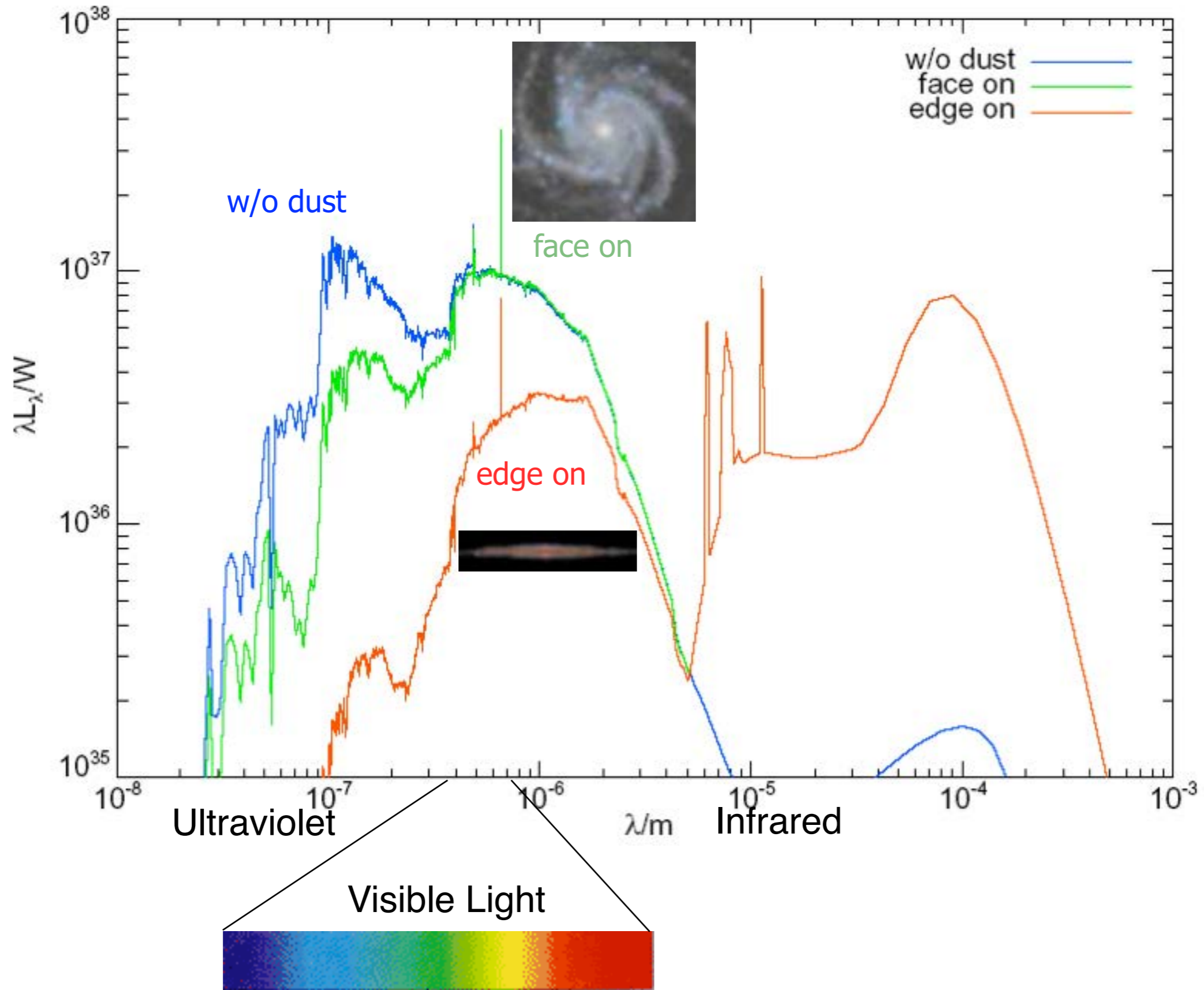
For every simulation snapshot:

- Evolving stellar spectra calculation
- Adaptive grid construction
- Monte Carlo radiative transfer
- “Polychromatic” rays save 100x CPU time
- Graphic Processor Units give 10x speedup





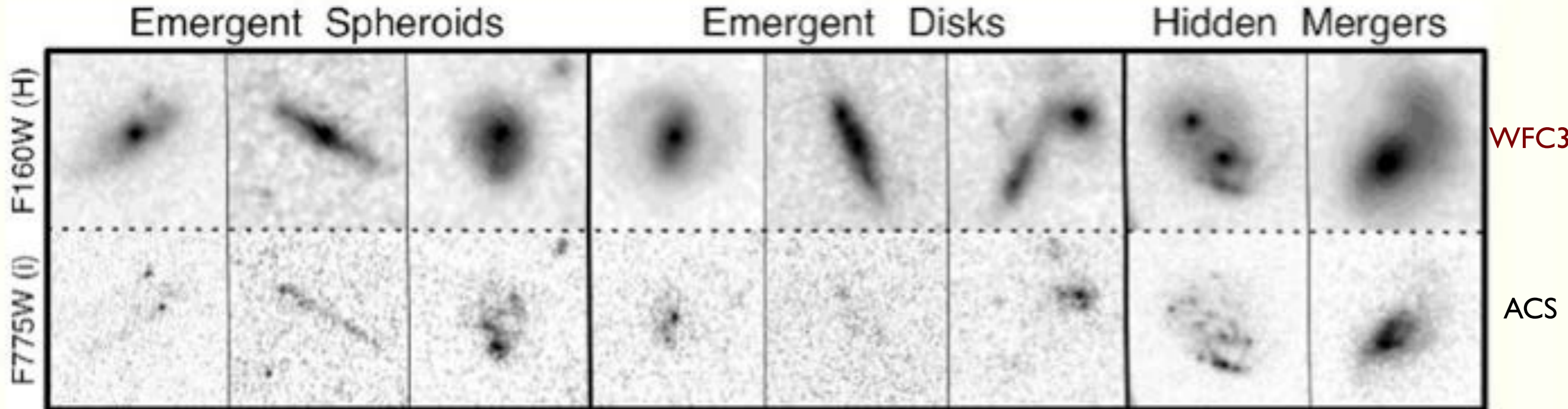
# Spectral Energy Distribution





# The CANDELS Survey with new near-IR camera WFC3

GALAXIES ~10 BILLION YEARS AGO



CANDELS makes use of the near-infrared WFC3 camera (top row) and the visible-light ACS camera (bottom row). Using these two cameras, CANDELS will reveal new details of the distant Universe and test the reality of cosmic dark energy.

Hubble  
Space  
Telescope



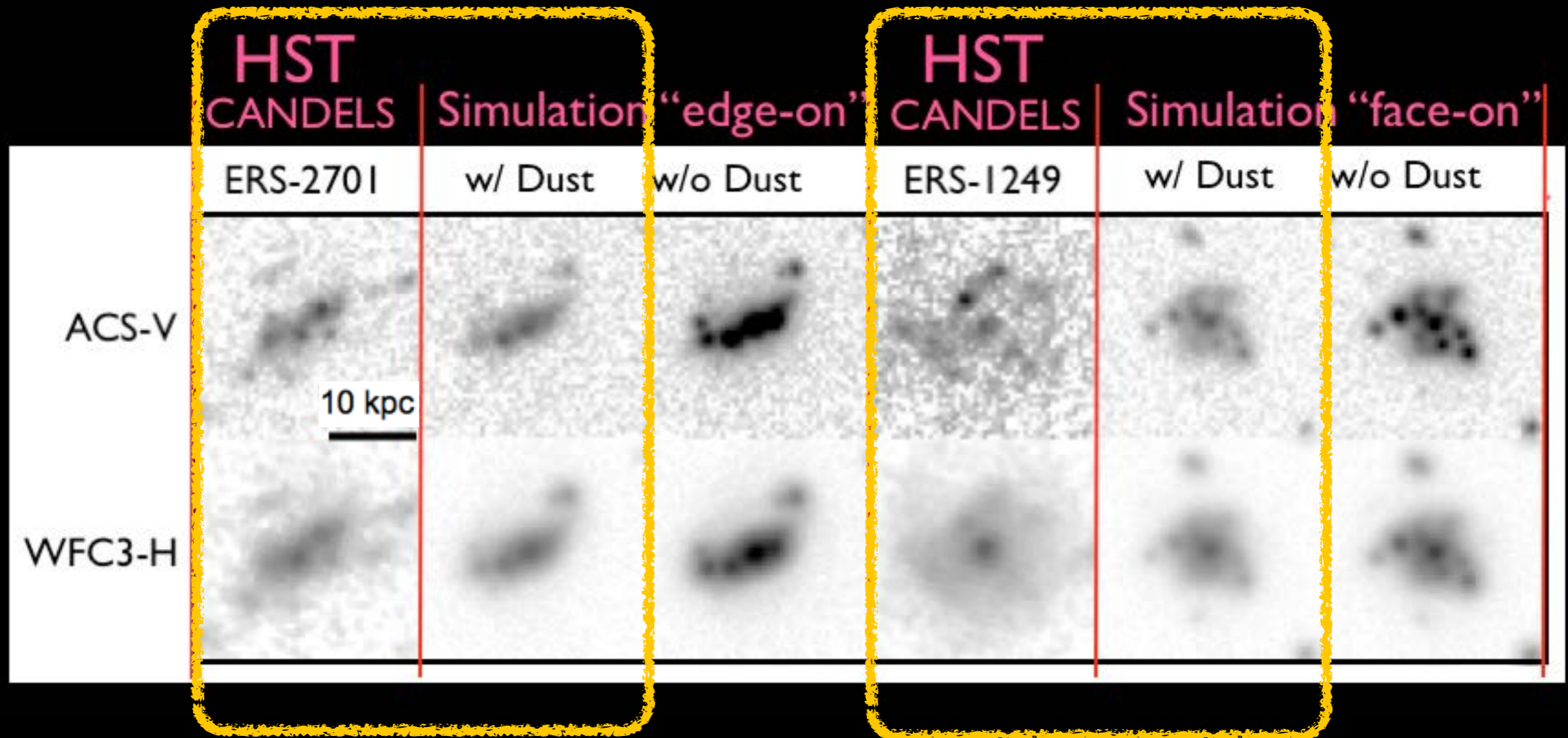
<http://candels.ucolick.org>

**CANDELS is a powerful imaging survey of the distant Universe being carried out with two cameras on board the Hubble Space Telescope.**

- **CANDELS is the largest project in the history of Hubble**, with 902 assigned orbits of observing time. This is the equivalent of four months of Hubble time if executed consecutively, but in practice CANDELS will take three years to complete (2010-2013).
- **The core of CANDELS is the revolutionary near-infrared WFC3 camera**, installed on Hubble in May 2009. WFC3 is sensitive to longer, redder wavelengths, which permits it to follow the stretching of lightwaves caused by the expanding Universe. This enables CANDELS to detect and measure objects much farther out in space and nearer to the Big Bang than before. CANDELS also uses the visible-light ACS camera, and together the two cameras give unprecedented panchromatic coverage of galaxies from optical wavelengths to the near-IR.



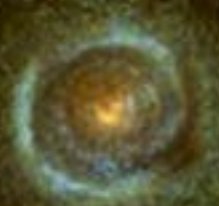
# Our Simulations w/ Dust look a lot like galaxies from 10 billion years ago that we see with Hubble Space Telescope



We are now systematically comparing simulated and observed galaxy images



# What's the effect of including dust?



with  
dust



Dramatic effects on

- Appearance
- Half-mass radii (bigger with dust)
- Sersic index (lower with dust)



stars  
only





**Simulated  
Galaxy  
10 billion  
years ago**

**as it would  
appear  
nearby to  
our eyes**

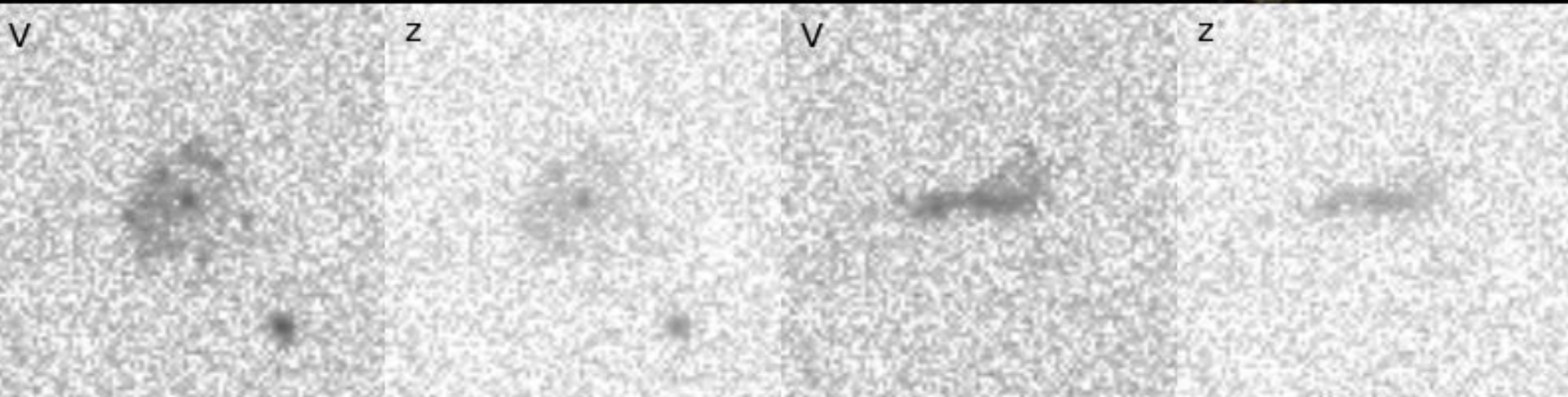


**face-on**

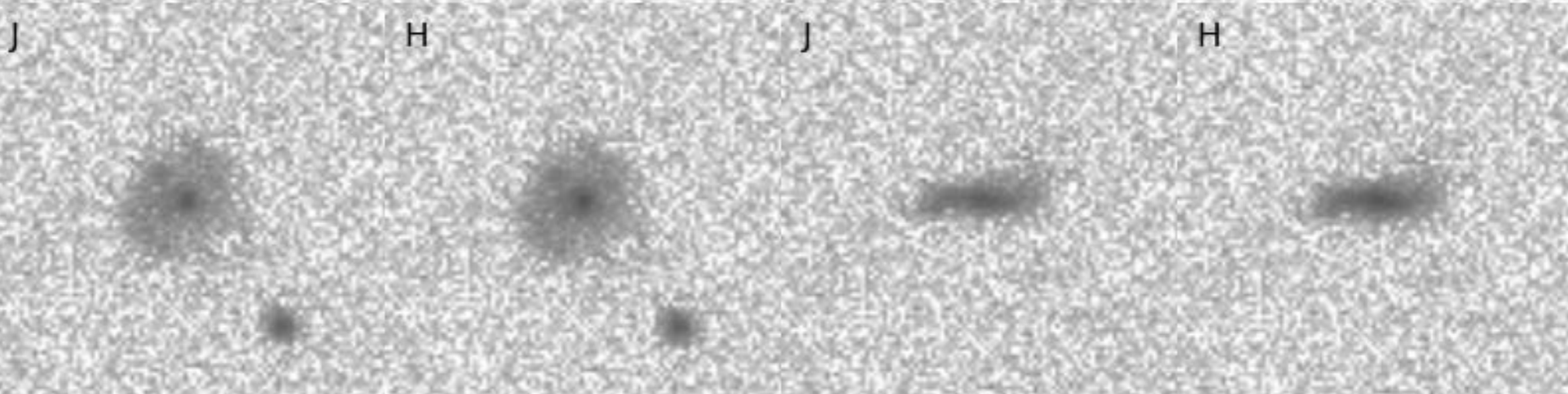


**edge-on**

**as it  
would  
appear to  
Hubble's  
ACS  
visual  
camera**

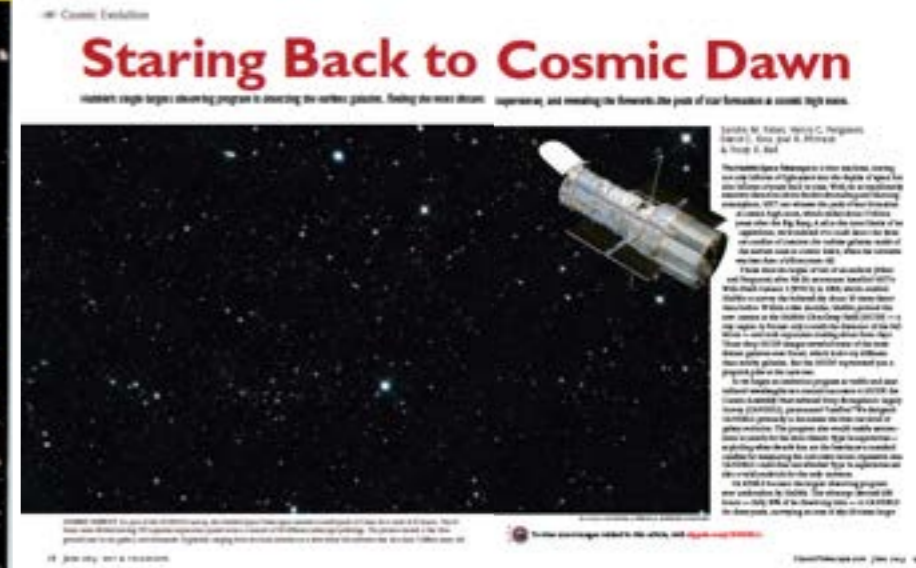
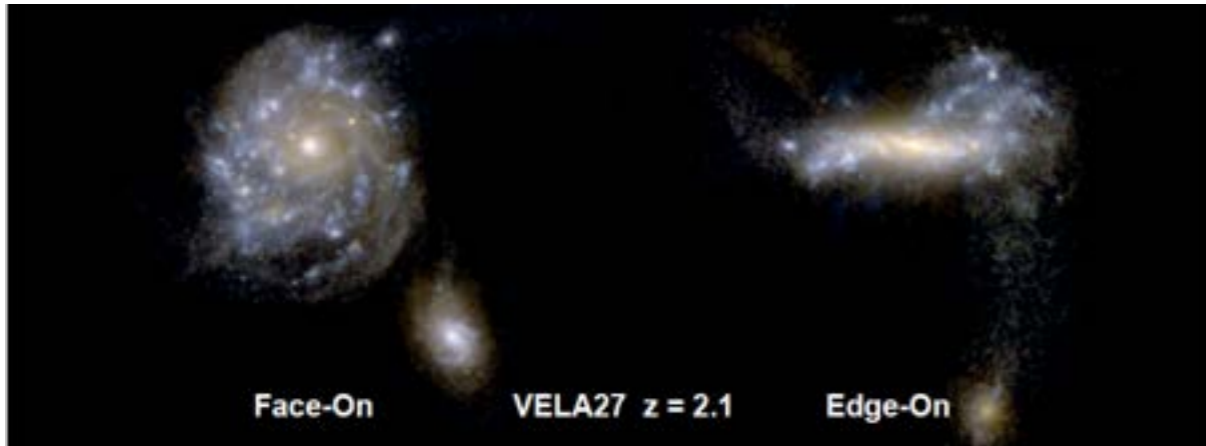


**as it  
would  
appear to  
Hubble's  
WFC3  
infrared  
camera**

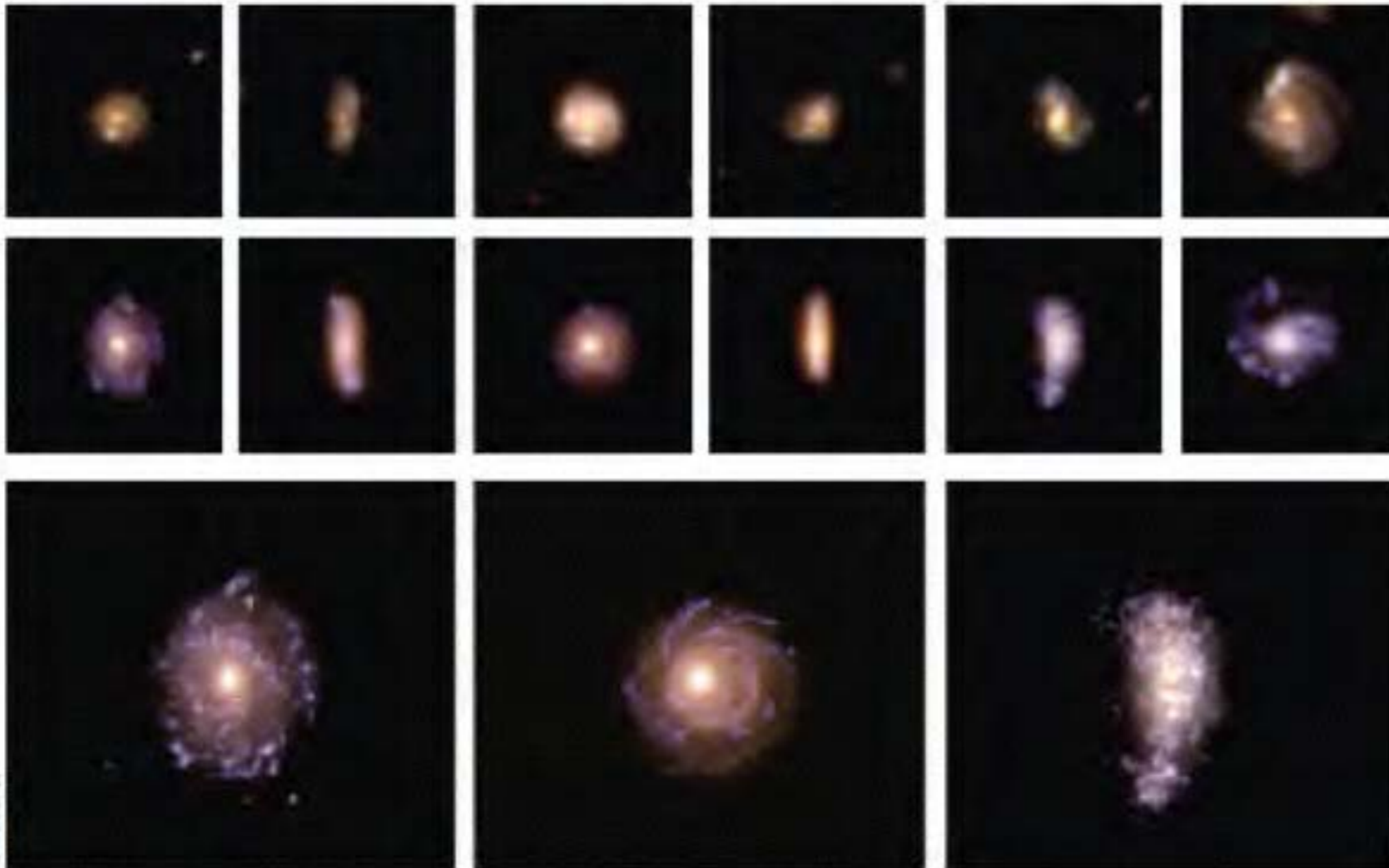




# High-resolution Sunrise Images



From June 2014 *Sky & Telescope* article

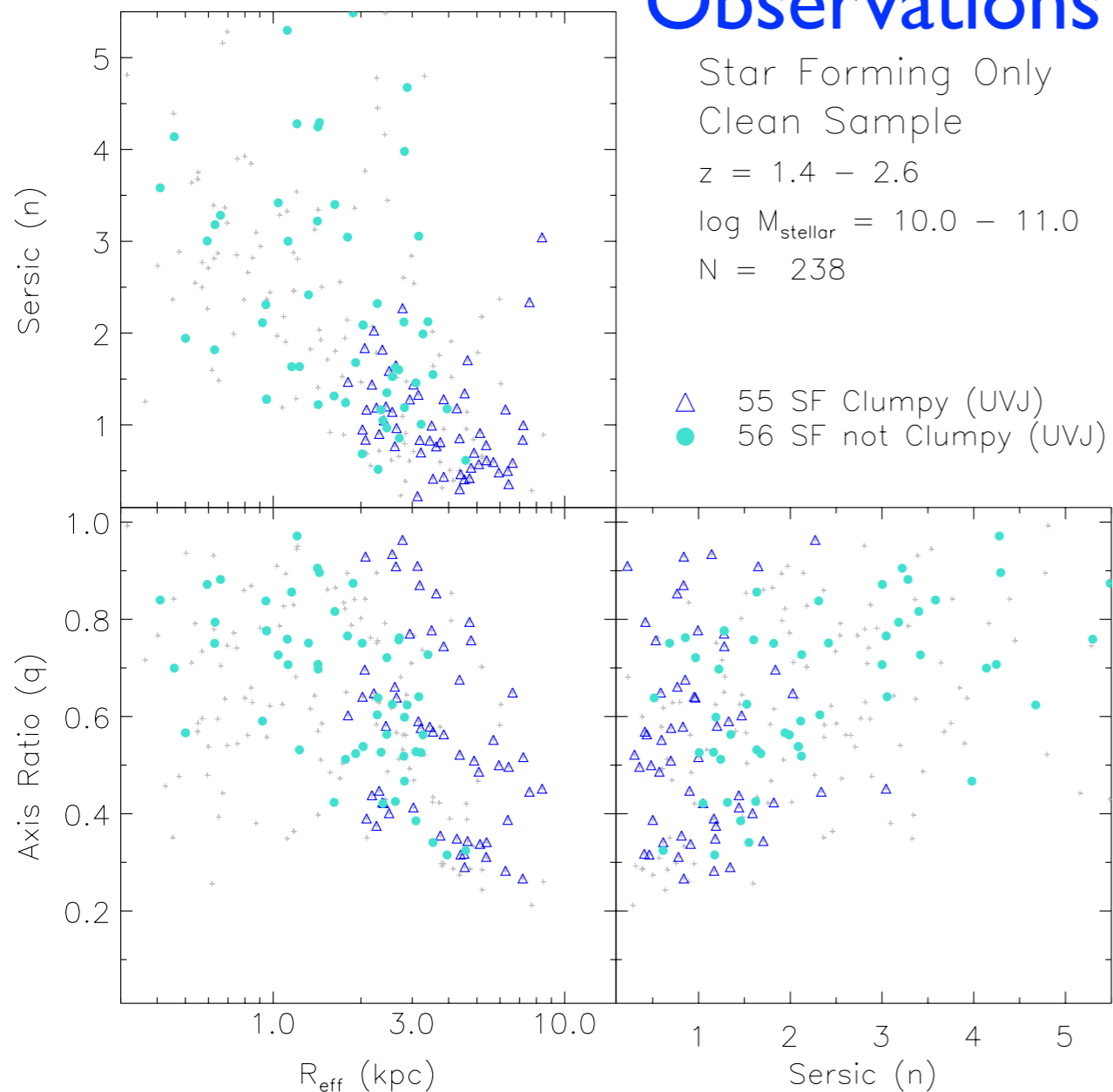


**CLUMPY GALAXIES**  
*Top row:* Six galaxies from CANDELS are seen when the universe was 4 to 6 billion years old. *Middle row:* These computer simulation frames show three disk galaxies as if imaged by CANDELS when viewed roughly face-on (*left of pair*) and edge-on (*right*). *Bottom row:* This is how these galaxies would appear if we could see them closer up from one angle. All three are about 4 billion years old and have large clumps of rapidly forming stars ignited by instabilities in their disks.

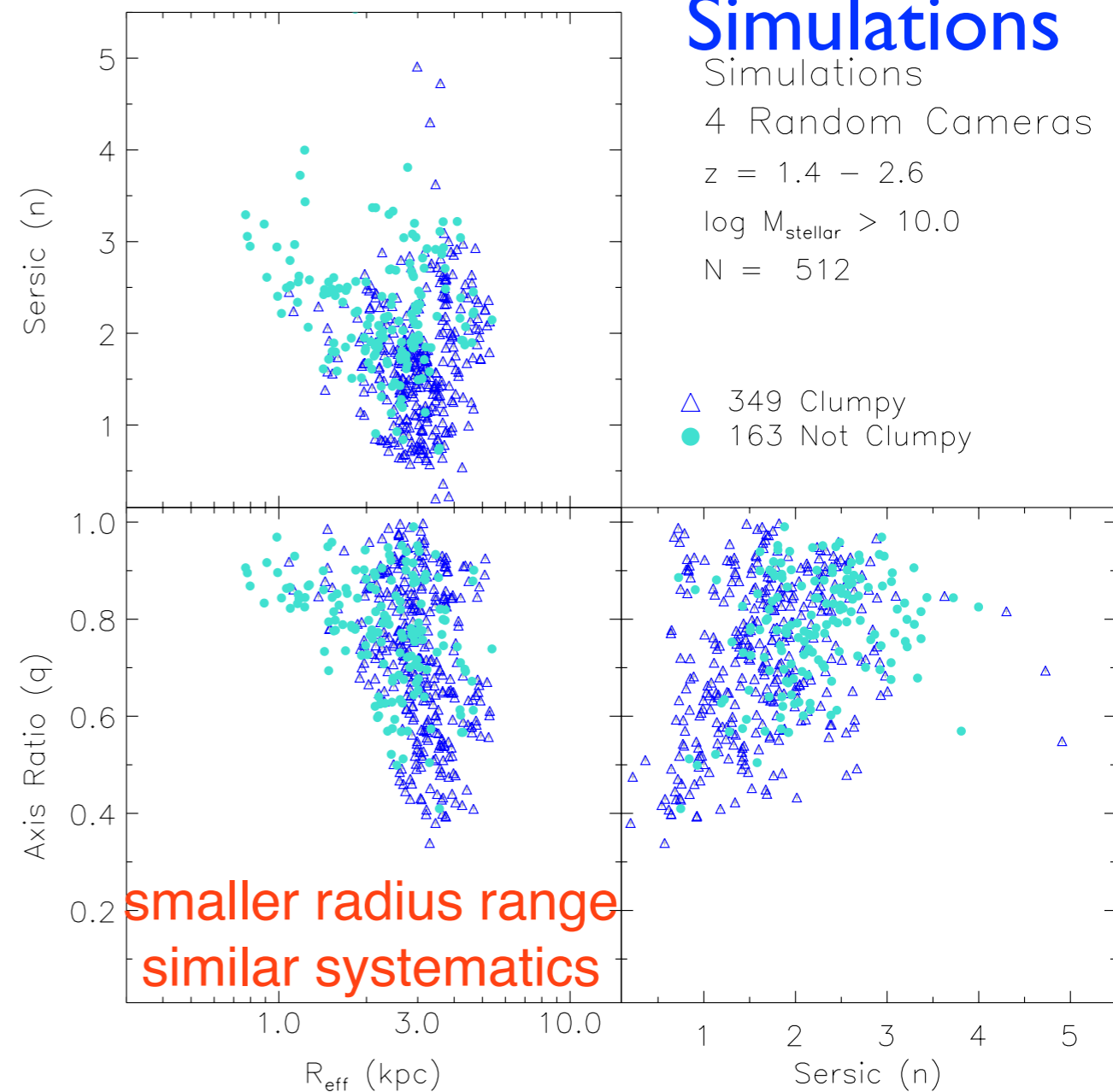


# CANDELS Galaxies Compared with Generations 1 & 2 hydroART simulations using $R_{\text{eff}}$ , Axis Ratio $q$ , Sersic $n$ , with clumpy vs. not clumpy from by-eye classification

## Observations



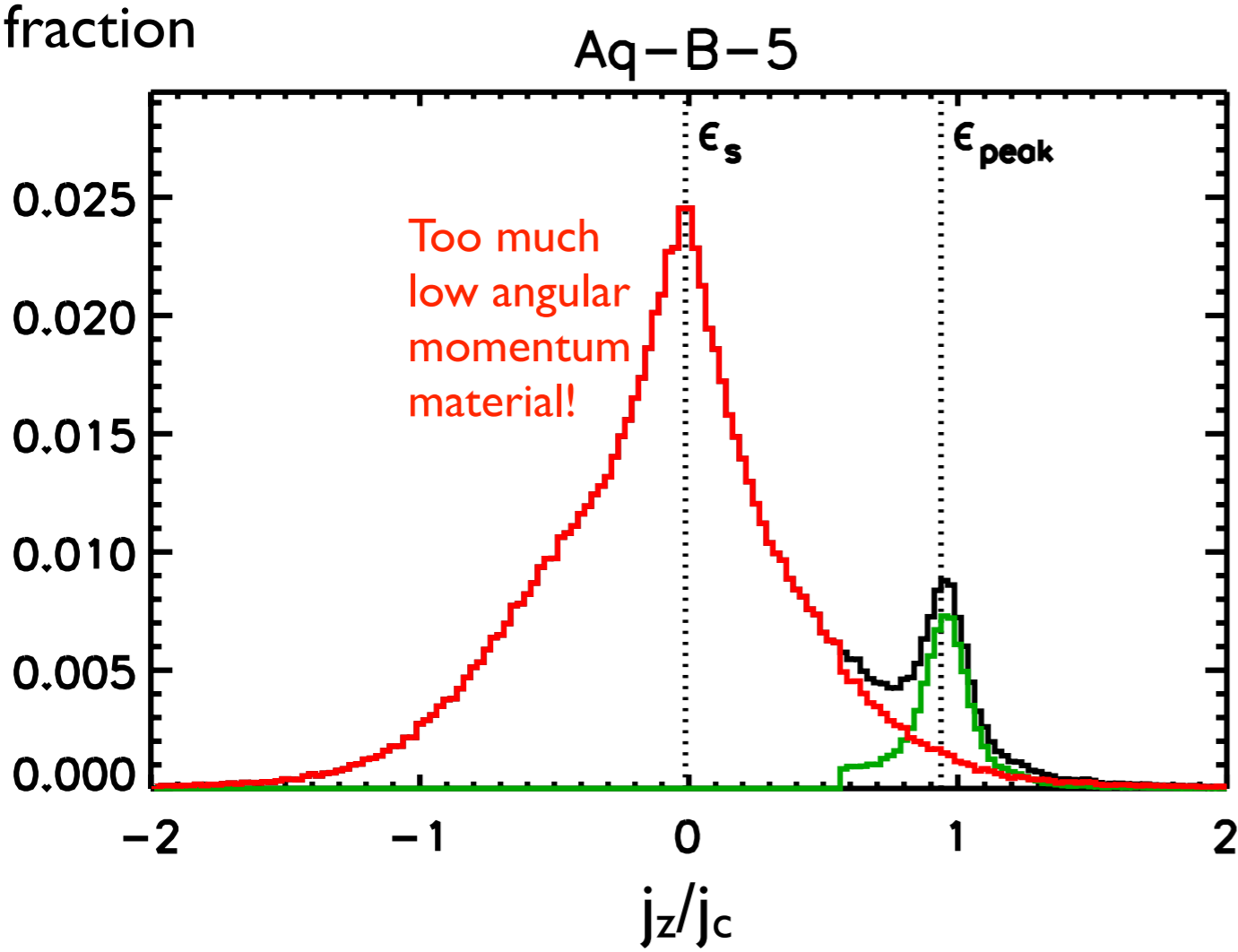
## Simulations





# The Angular Momentum Catastrophe

In practice it is not trivial to form galaxies with massive, extended disks and small spheroids. The angular momentum content of the disk determines its final structure.



$\neq$



Scannapieco et al. 2009

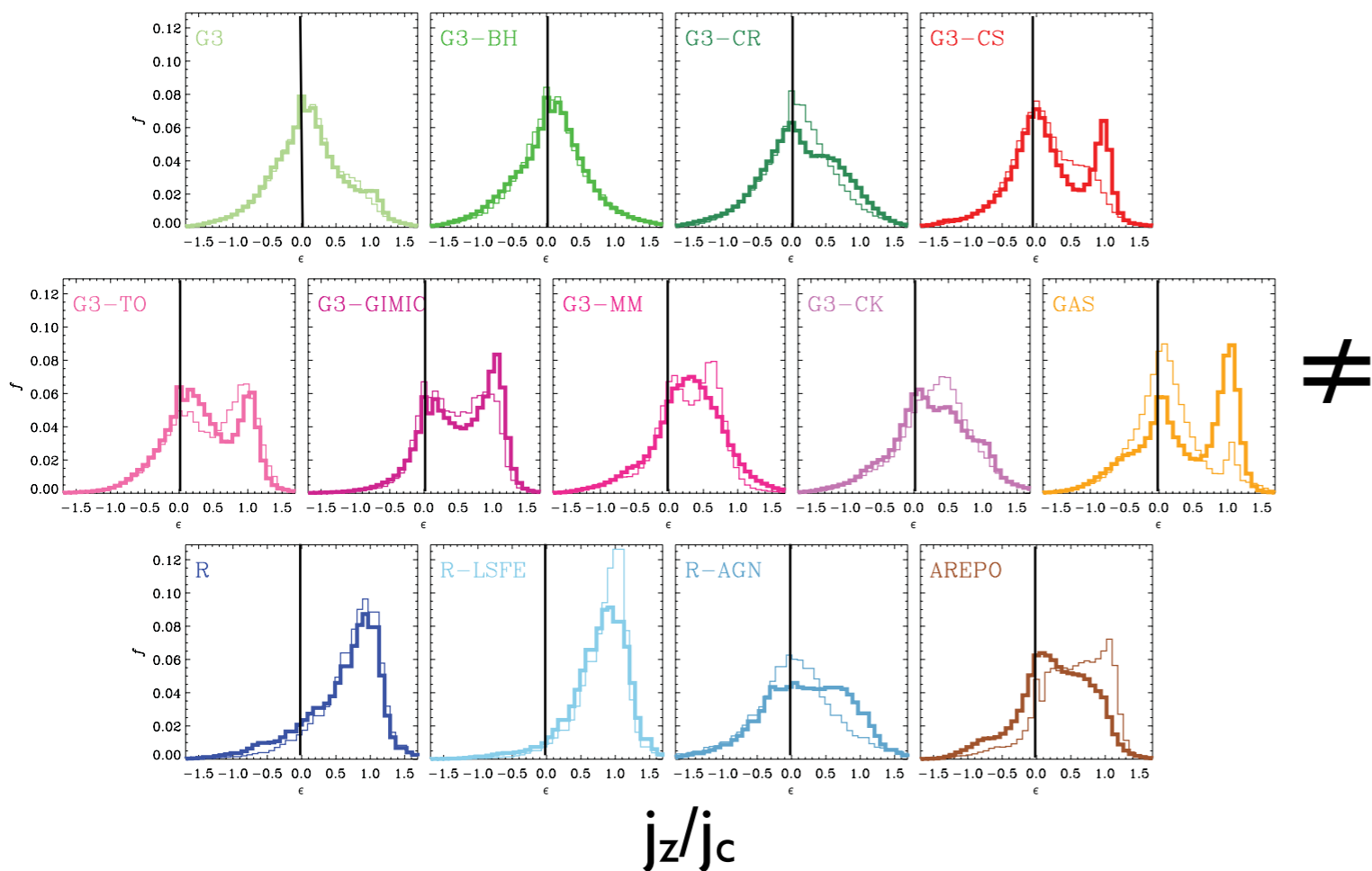
angular momentum / ang mom needed for rotational support



# The Angular Momentum Catastrophe

In practice it is not trivial to form galaxies with massive, extended disks and small spheroids. The **angular momentum** content of the disk determines its final structure. None of the 2012 Aquila low-resolution galaxy simulations had realistic disks.

fraction of stars with given angular momentum

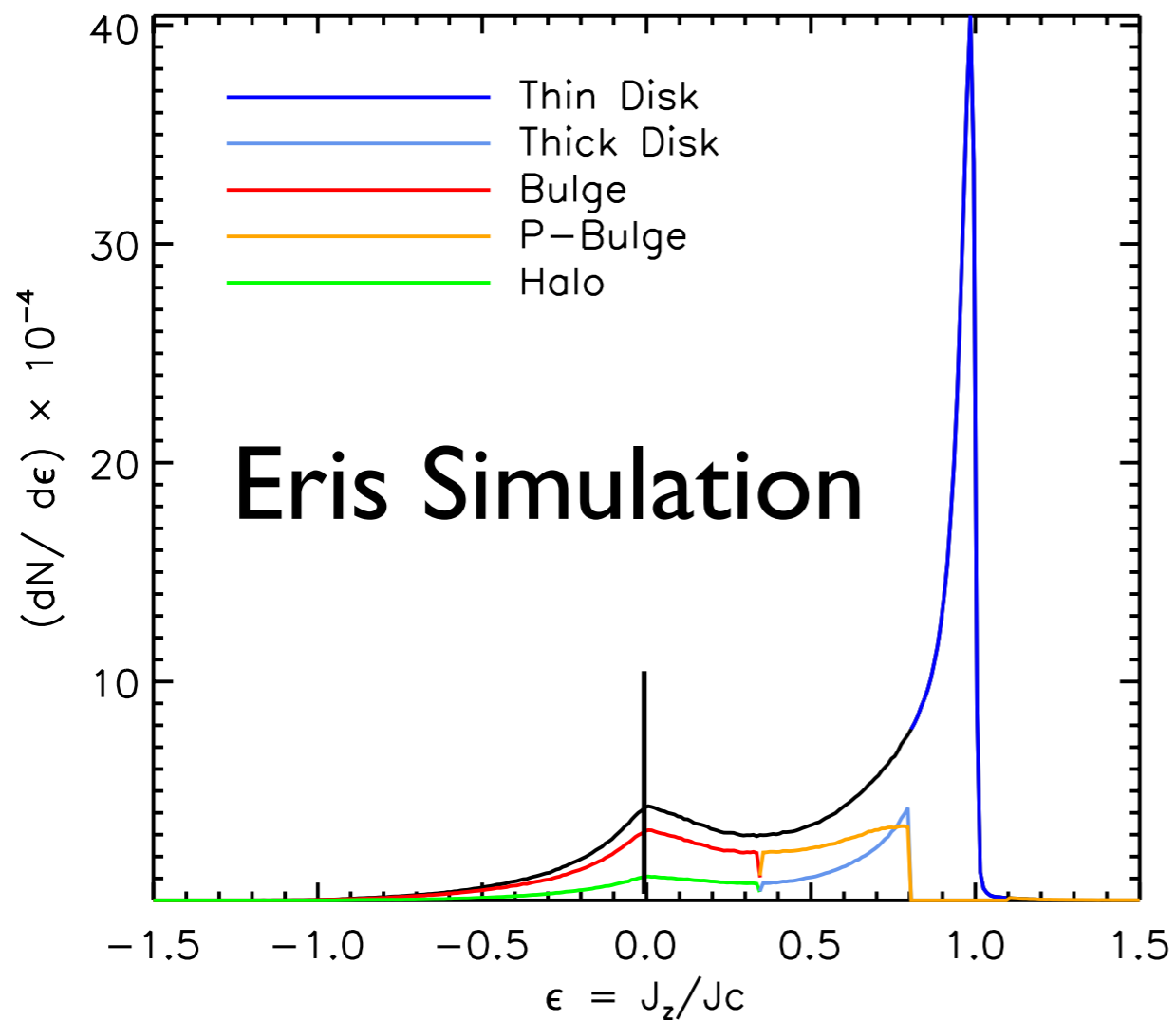


Scannapieco et al., Aquila Galaxy Simulation Comparison, 2012



# The Angular Momentum ~~Catastrophe~~

Eris, the first high-resolution simulation of formation of a  $\sim 10^{12} M_{\odot}$  galaxy, produced a realistic spiral galaxy. Adequate resolution and physically realistic feedback appear to be sufficient.



=





University of California  
High-Performance  
AstroComputing Center  
(UC-HiPACC)  
Joel Primack, Director



University of California  
Santa Cruz  
Next Telescope Science  
Institute (NEXSI)  
Piero Madau, Director

# *Assembling Galaxies of Resolved Anatomy* **AGORA High-Resolution Galaxy Simulation**

## **Comparison Project Steering Committee**

**Piero Madau & Joel R. Primack, UCSC, Co-Chairs**

**Tom Abel, Stanford**

**Nick Gnedin, Chicago/Fermilab**

**Lucio Mayer, University of Zurich**

**Romain Teyssier, Saclay & Zurich**

**James Wadsley, McMaster**

**Ji-hoon Kim, UCSC (Coordinator)**

**105 astrophysicists using 11 codes have joined AGORA**

[www.AGORAsimulations.org](http://www.AGORAsimulations.org)



# AGORA High-Resolution Simulation Comparison

## Initial Conditions for Simulations

MUSIC galaxy masses at  $z \sim 0$ :  $\sim 10^{10}, 10^{11}, 10^{12}, 10^{13} M_{\odot}$

with both quiet and busy merging trees

isolation criteria agreed for Lagrangian regions

Isolated Spiral Galaxy at  $z \sim 1$ :  $\sim 10^{12} M_{\odot}$

## Astrophysics that all groups will include

UV background (Haardt-Madau 2012)

cooling function (based on ENZO and Eris cooling)

Tools to compare simulations based on *yt*, to be available for all codes used in AGORA

Images and SEDs for all timesteps from *yt*  *Sunrise*

[www.AGORAsimulations.org](http://www.AGORAsimulations.org)



# AstroComputing is Prototypical Scientific Computing

Astronomy has several advantages:

The data tends to be pretty **clean**

The data is (mostly) **non-proprietary**

The research is (mostly) **funded**

The data is pretty **sexy**

There's a lot of **public involvement:**





# Big Challenges of AstroComputing

## Big Data

### Sloan Digital Sky Survey (SDSS) 2008

2.5 Terapixels of images  
40 TB raw data → 120 TB processed  
35 TB catalogs

### Mikulski Archive for Space Telescopes (MAST) 2013

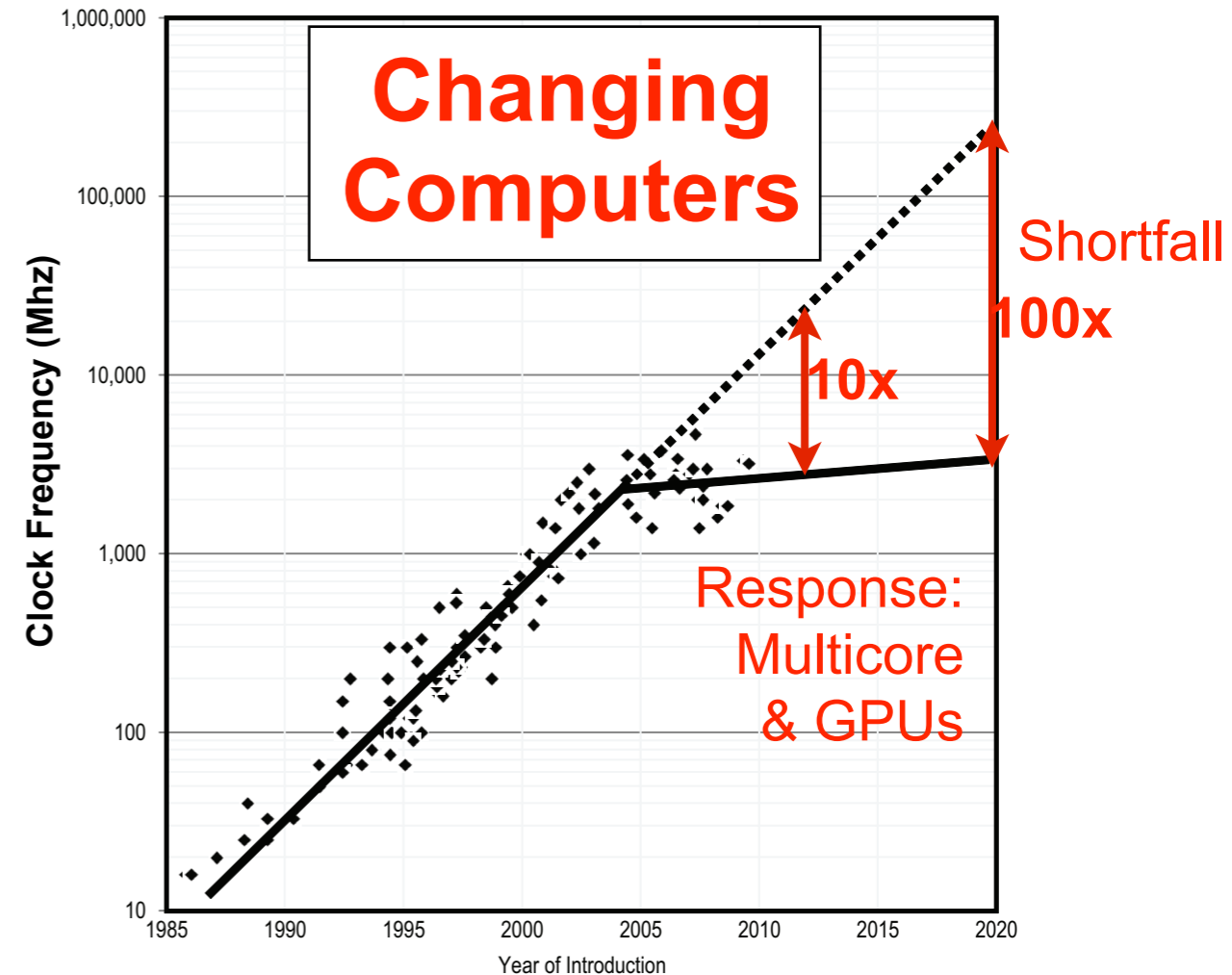
185 TB of images  
25 TB/year ingest rate  
>100 TB/year retrieval rate

### Large Synoptic Survey Telescope (LSST) 2019

15 TB per night for 10 years  
100 PB image archive  
20 PB final database catalog

### Square Kilometer Array (SKA) ~2024

1 EB per day (~ internet traffic today)  
100 PFlop/s processing power  
~1 EB processed data/year



Increasingly inhomogeneous computers are harder to program! We need **computational scientists and engineers** and new compilers that generate code for nodes with cores+accelerators with automatic load balancing and fault tolerance.

# High Performance Scientific Computing Needs

The challenges facing us are

“**Big data**” -- too large to move -- from more powerful observations, larger computer outputs, and falling storage costs

**Changing high-performance computer architecture** -- from networked single processors to multicore and GPUs

These challenges demand new collaborations between natural scientists and computer scientists to develop

Tools and scientific programmers to convert legacy code and write **new codes efficient on multicore/GPU/MIC architectures**, including **fault tolerance** and **automatic load balancing**

New ways to **visualize and analyze big data remotely**

**Train new generations of scientific & engineering computer users**

**Improve education and outreach**

UC-HiPACC is proposing a **California Scientific Computing Institute** in Silicon Valley to work on these issues -- **we welcome collaboration!**



# Double Dark Theory Successes

- Predicted Cosmic Background Radiation
- Predicted Large Scale Galaxy Distribution
- Predicted Abundance of Big Satellite Galaxies
- Explains Main Properties of Spiral & Elliptical Galaxies

## Big Remaining Questions

- Nature of Dark Matter and Dark Energy
- Explanation of the Proportions of DE, DM, “Baryons”
- Galaxy Formation and Evolution in Detail
- Galaxy Details: Cusp-Core, Satellites, Substructure
- Supercomputing the Universe Challenges



Thanks!



# Supercomputing the Universe

Joel R. Primack, UCSC

<http://scipp.ucsc.edu/personnel/profiles/primack.html>

Websites related to this talk:

<http://hipacc.ucsc.edu> University of California High-Performance AstroComputing Center (UC-HiPACC)

<http://hipacc.ucsc.edu/v4/> International Astronomy Visualization Gallery

<http://hipacc.ucsc.edu/Bolshoi> Bolshoi simulations

<http://candels.ucolick.org> CANDELS survey

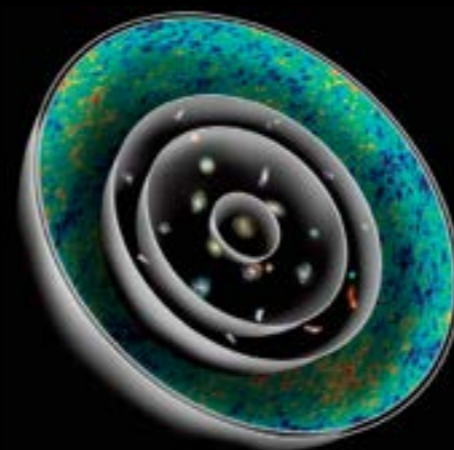
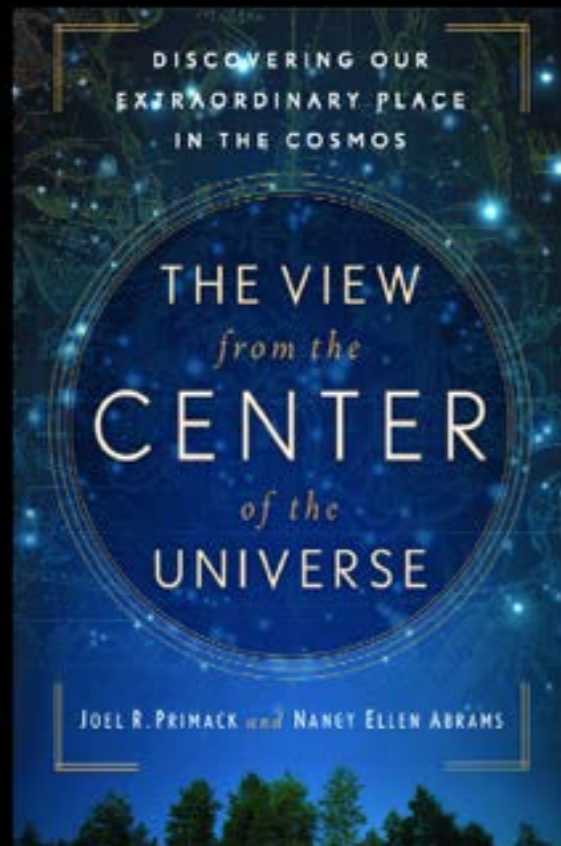
<http://code.google.com/p/sunrise/> Sunrise dust code

**Nancy Abrams & Joel Primack Book Websites with images and videos:**

[ViewfromtheCenter.com](http://ViewfromtheCenter.com)

[New-Universe.org](http://New-Universe.org)

[El-Nuevo-Universo.org](http://El-Nuevo-Universo.org)



THE NEW UNIVERSE  
AND THE  
HUMAN FUTURE  
How a Shared Cosmology Could Transform the World  
NANCY ELLEN ABRAMS AND JOEL R. PRIMACK

