

# Cosmological Simulations

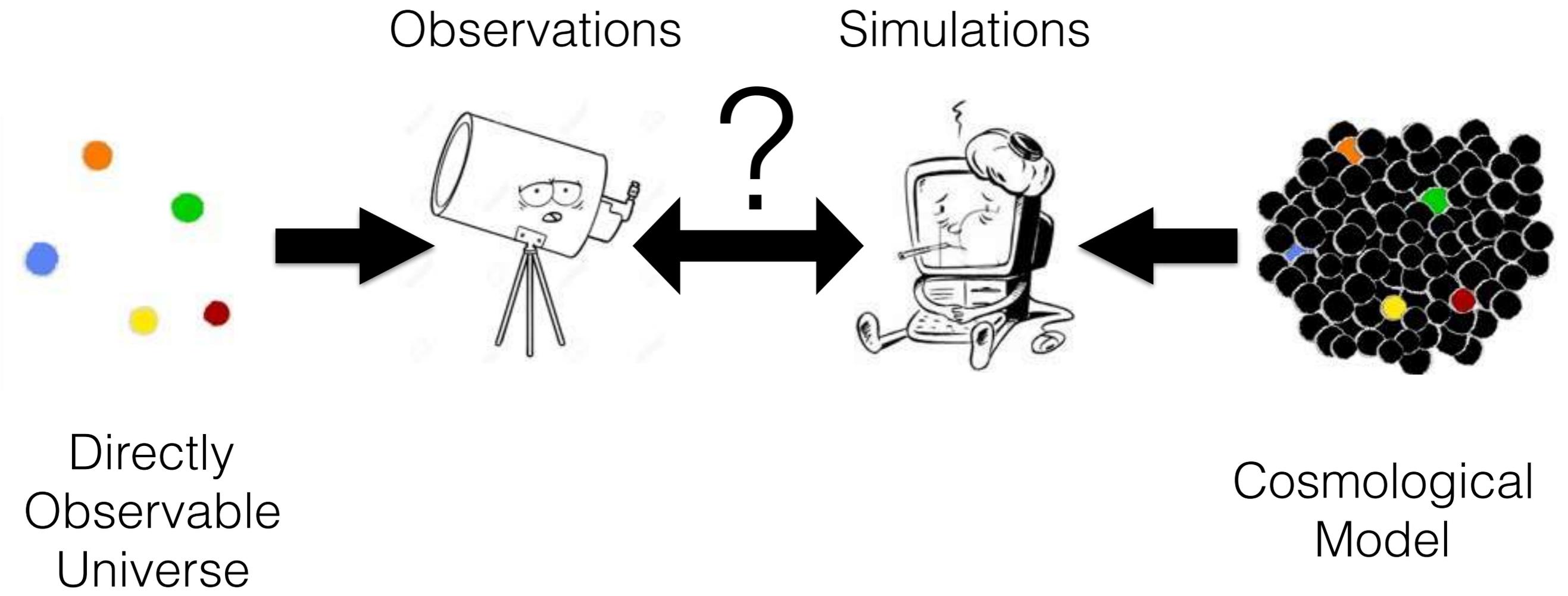
## Numerical CLONES

In memory of Cécile Renault

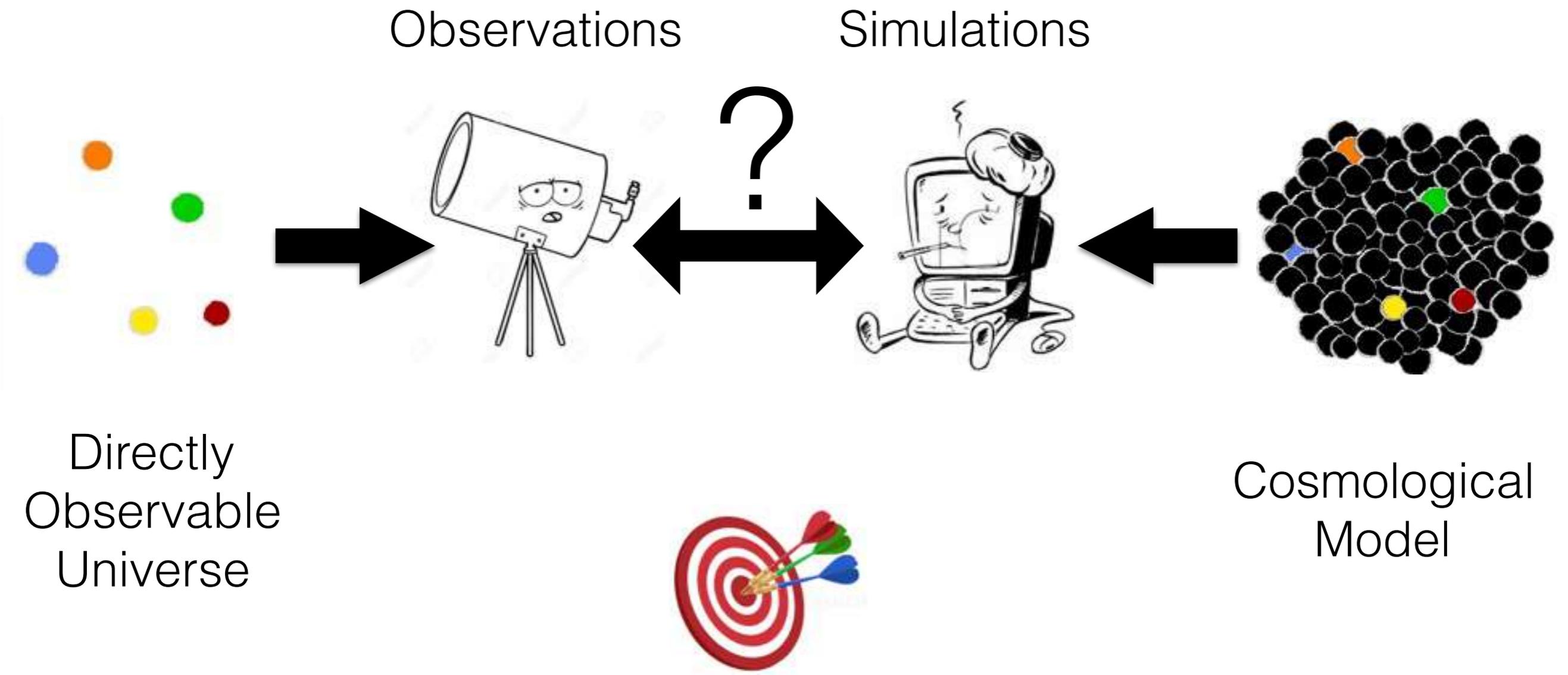
Jenny Sorce

Centre de Recherche Astrophysique de Lyon  
Webinar dark energy - May 11th 2021

# Motivation : $\Lambda$ CDM? $\blacktriangleright$ Current strategy

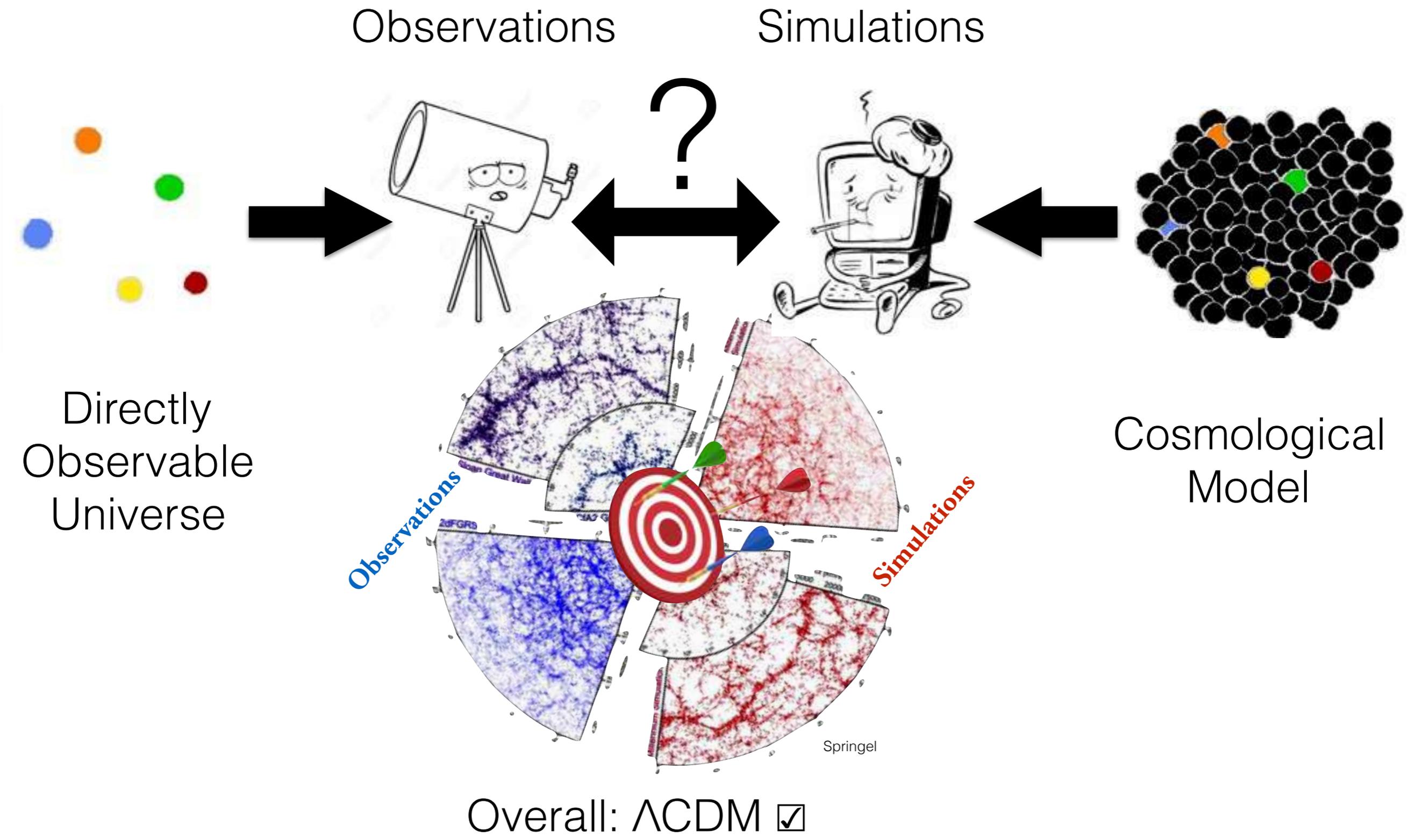


# Motivation : $\Lambda$ CDM? $\blacktriangleright$ Current strategy



If all goes well...  
it is a perfect match

# Motivation : $\Lambda$ CDM? ▶ In practice



# Motivation : $\Lambda$ CDM? $\blacktriangleright$ Toward precision cosmology

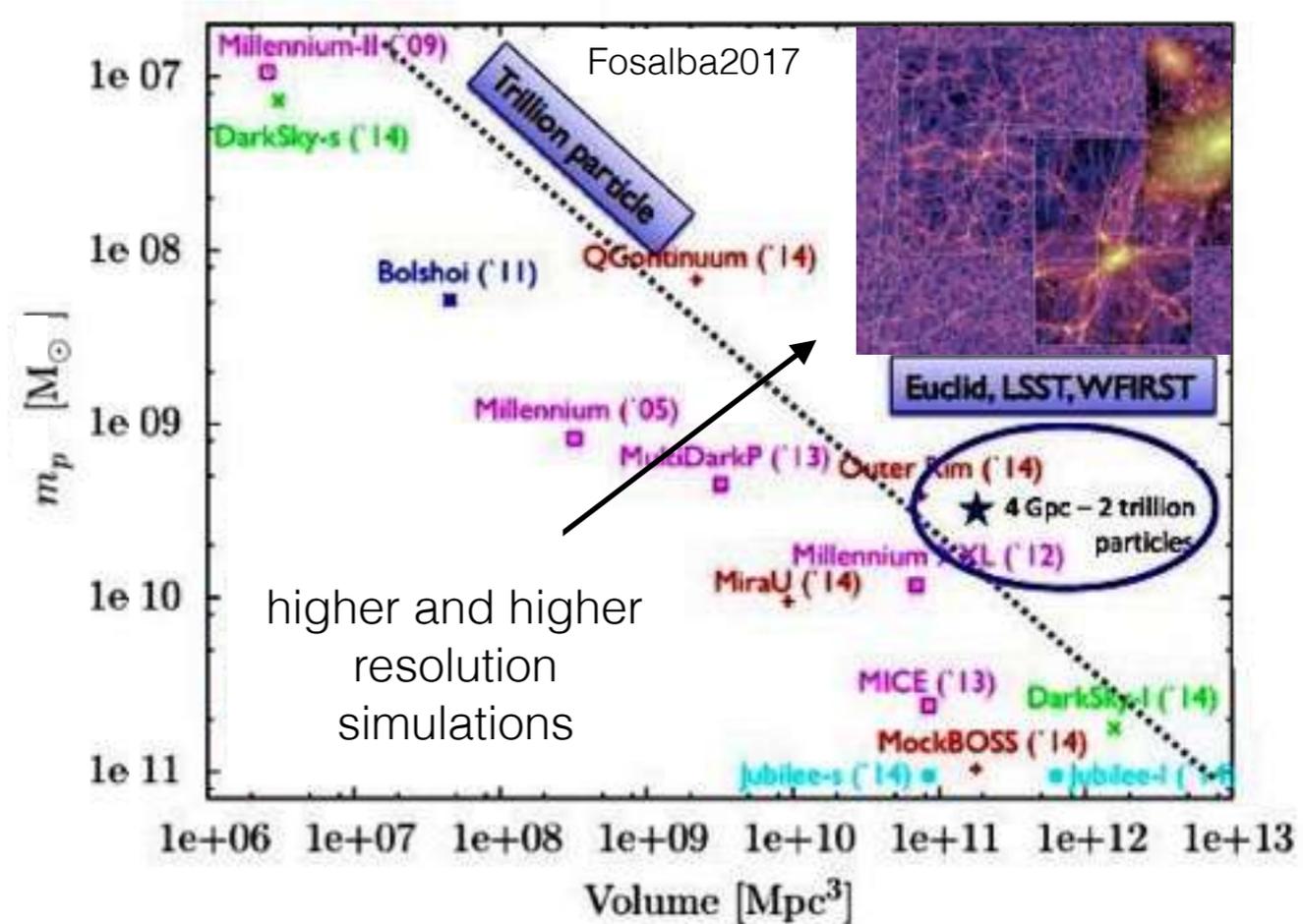
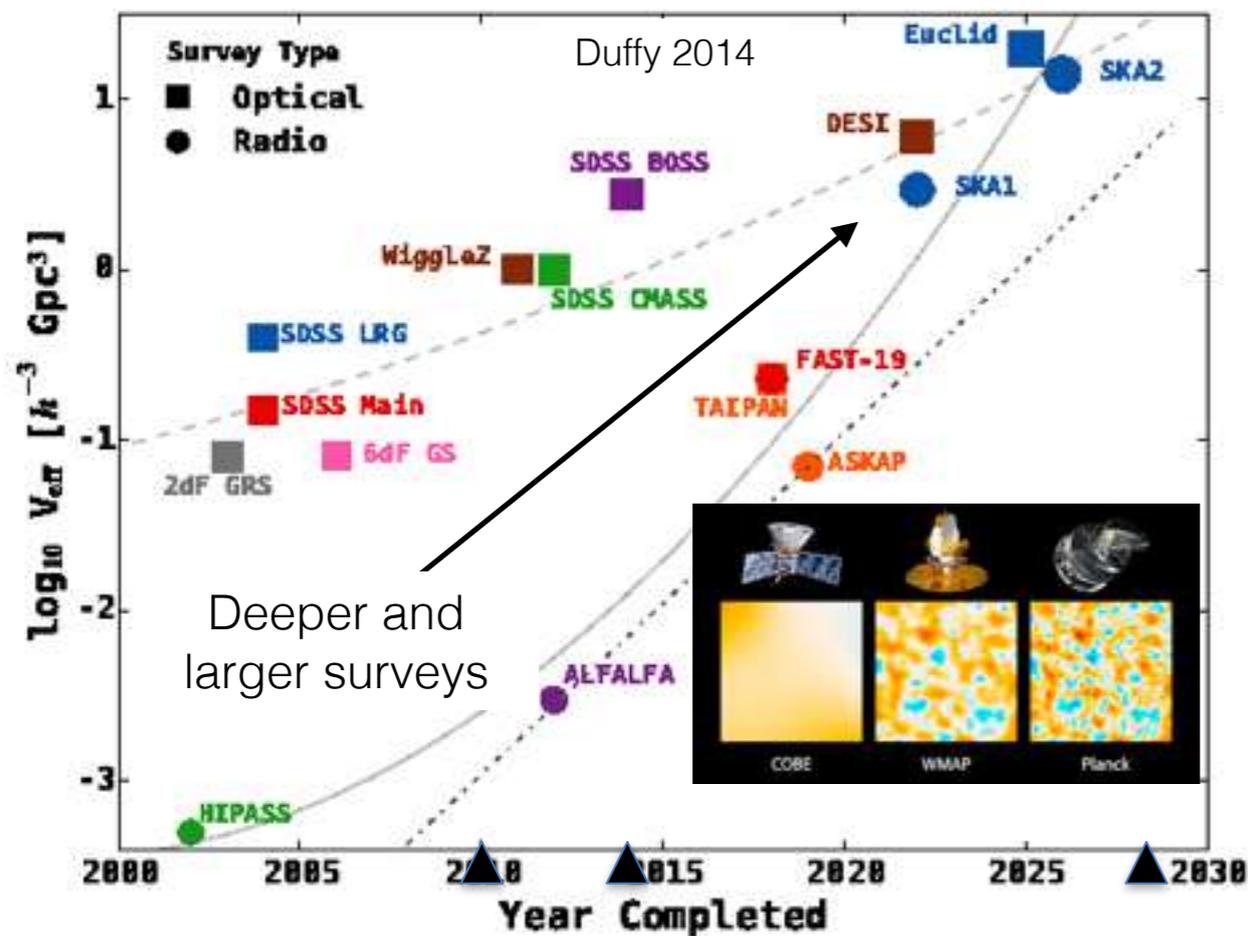


Precision Era:  
1-2% precision

## $\Lambda$ CDM checked on all scales

Observational

Dark matter only



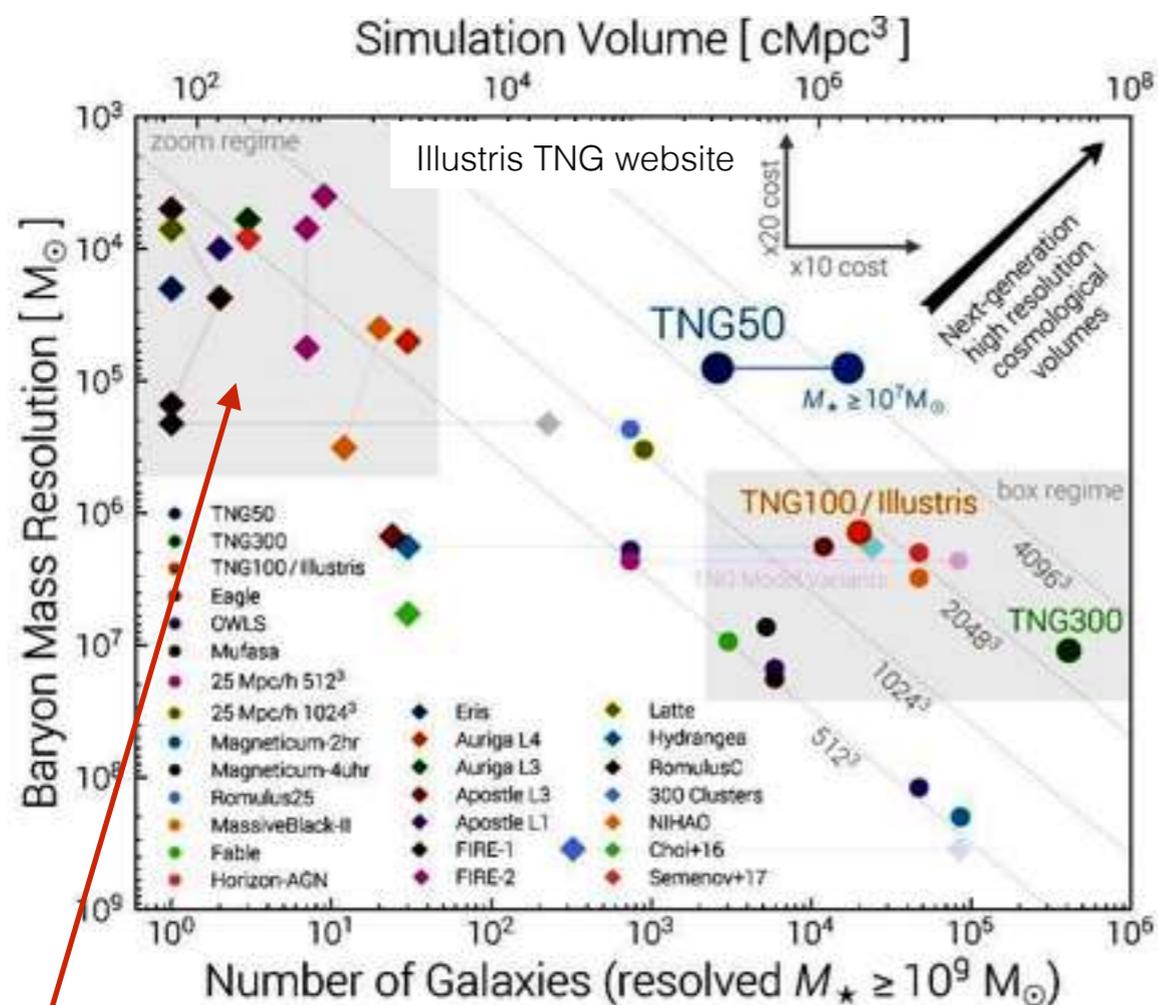
# Motivation : $\Lambda$ CDM? $\blacktriangleright$ Toward precision cosmology



Precision Era:  
1-2% precision

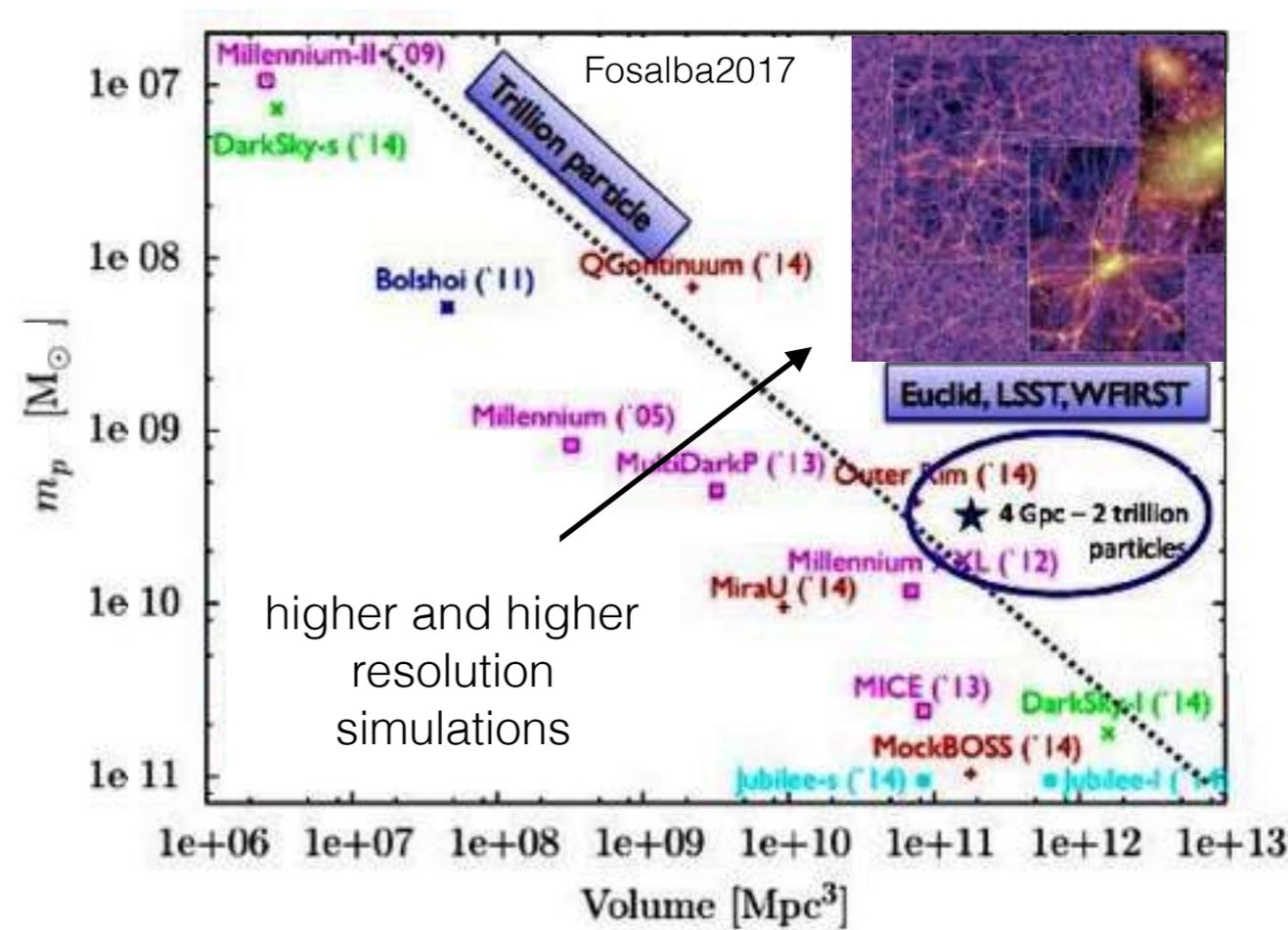
## $\Lambda$ CDM checked on all scales

With baryons



Zoom Simulations to retain large scale effects

Dark matter only





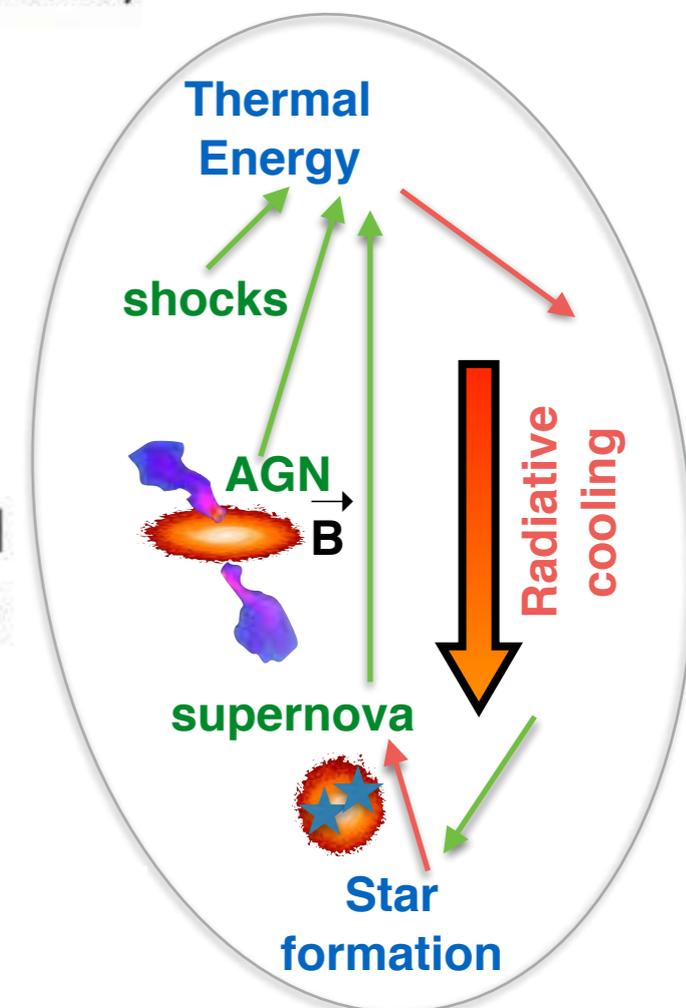
Precision Era:  
1-2% precision

## What is in there?

**Basic equations ruling the dynamics** (plus expansion = supercomoving variables) **and periodic boundaries**

$\frac{\partial f}{\partial t} + \mathbf{u} \cdot \nabla f - \nabla \Phi \cdot \nabla_{\mathbf{u}} f = 0$	Vlasov : dark matter, stars <b>Collisionless</b>
$\frac{\partial \rho_b}{\partial t} + \nabla \cdot (\rho_b \mathbf{u}) = 0$	Continuity : gas
$\frac{\partial \mathbf{u}}{\partial t} + (\mathbf{u} \cdot \nabla) \cdot \mathbf{u} = -\nabla \Phi - \frac{\nabla p}{\rho_b}$	Euler : gas <b>Collisional</b>
$\frac{\partial \varepsilon}{\partial t} + \mathbf{u} \cdot \nabla \varepsilon = -\frac{p}{\rho_b} \nabla \cdot \mathbf{u}$	Energy : gas
$p = (\gamma - 1) \varepsilon \rho_b$	Equation of state : gas
$\nabla^2 \Phi = 4\pi G \left[ \int f d^3 u + \rho_b \right]$	Poisson : everything

+  
subgrid  
models

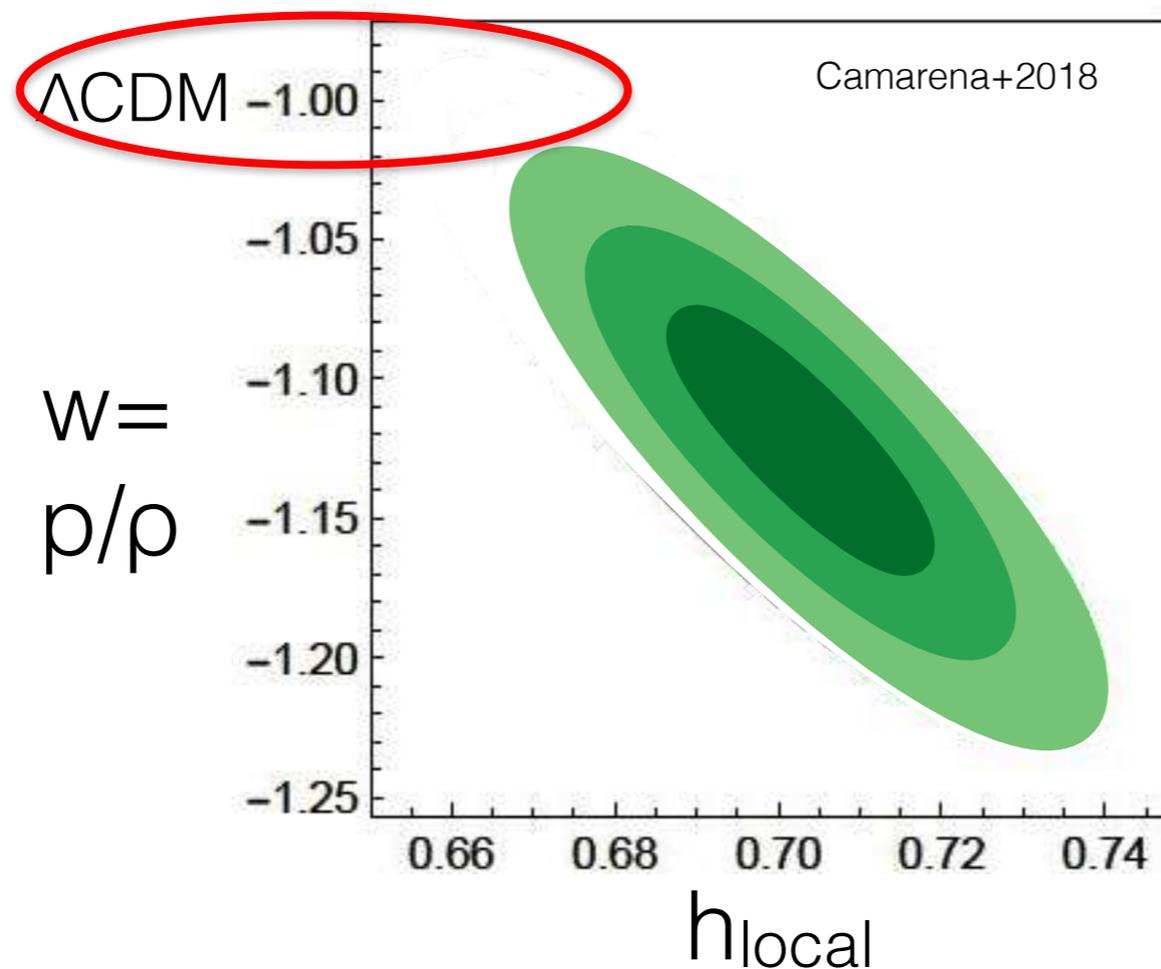


+ Cosmic Rays, etc

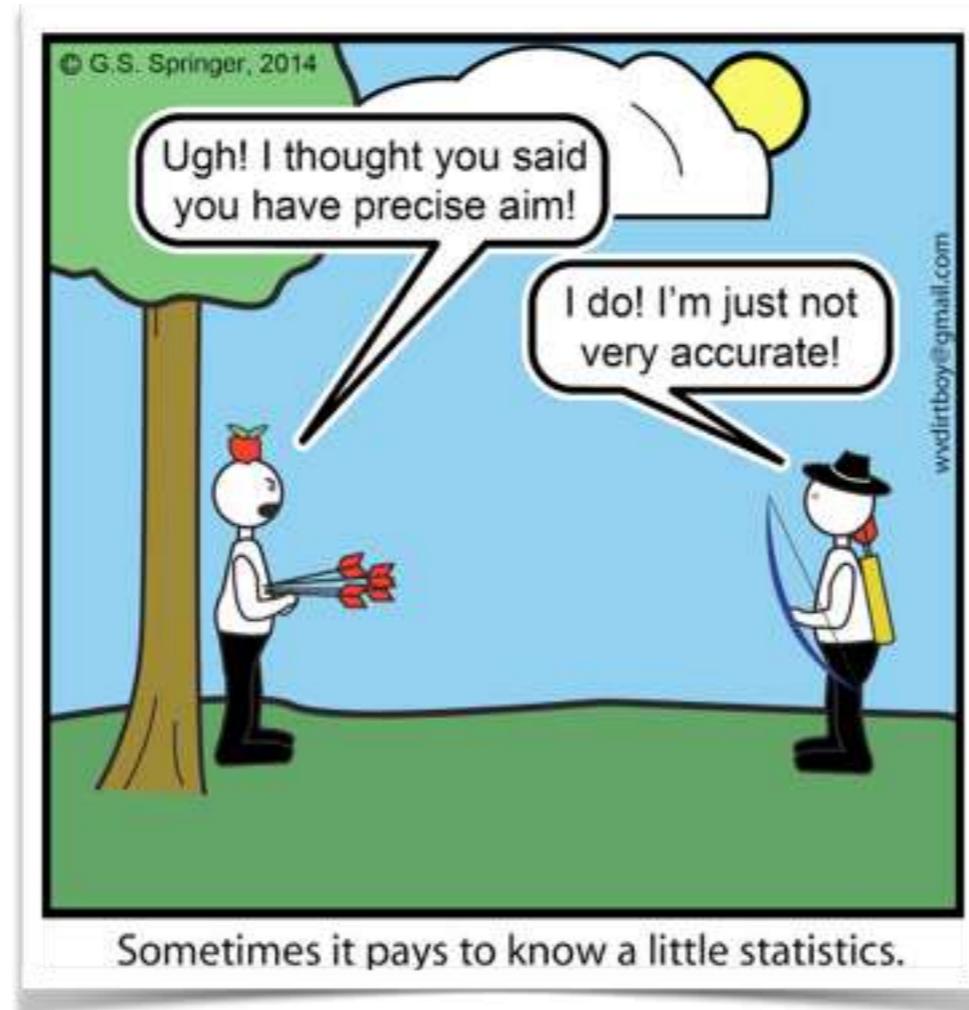
## What more can we do wrt these typical simulations and why ?

## Let's start with **why**

Example: Equation of state of the dark energy

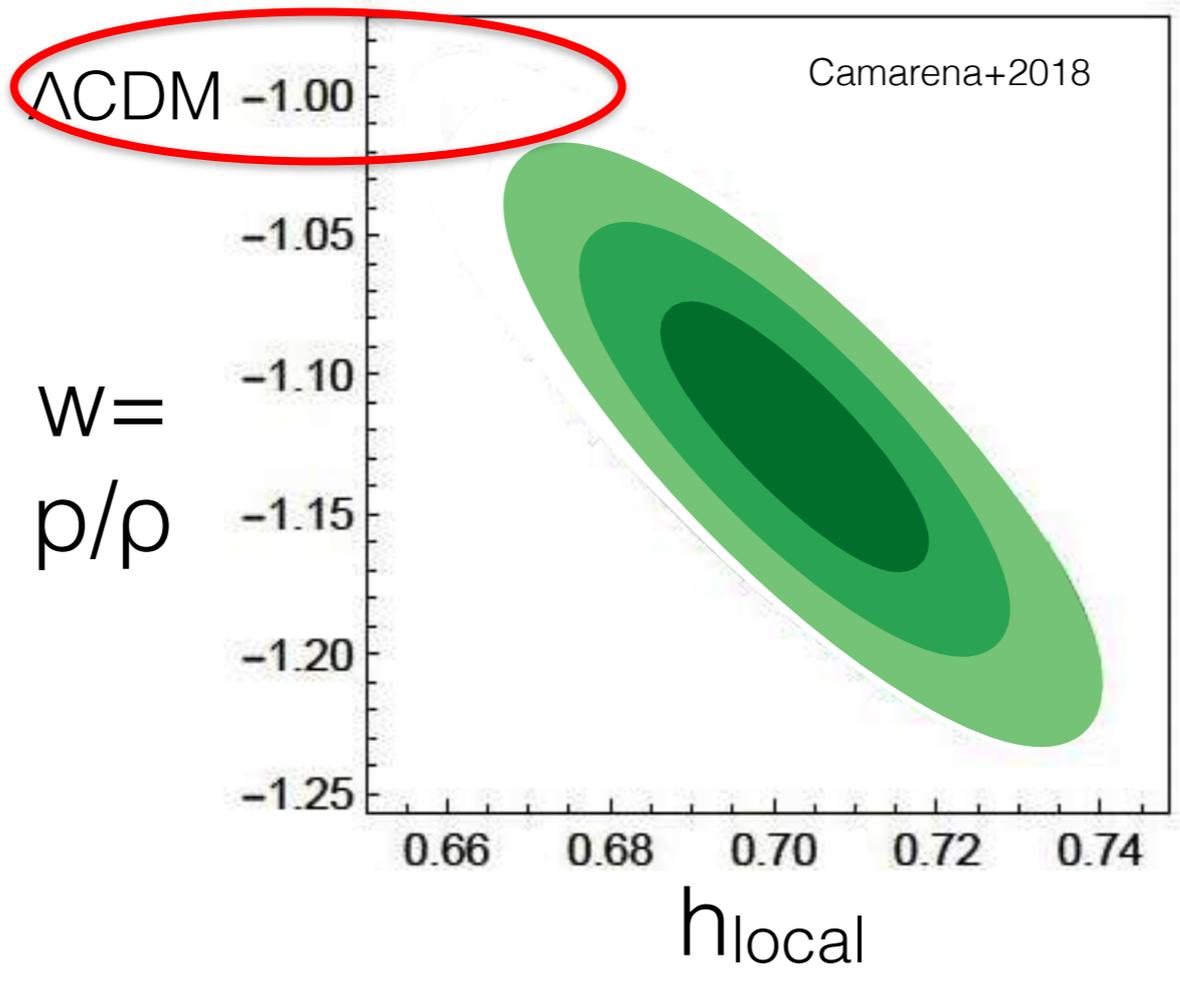


Precision is not accuracy !



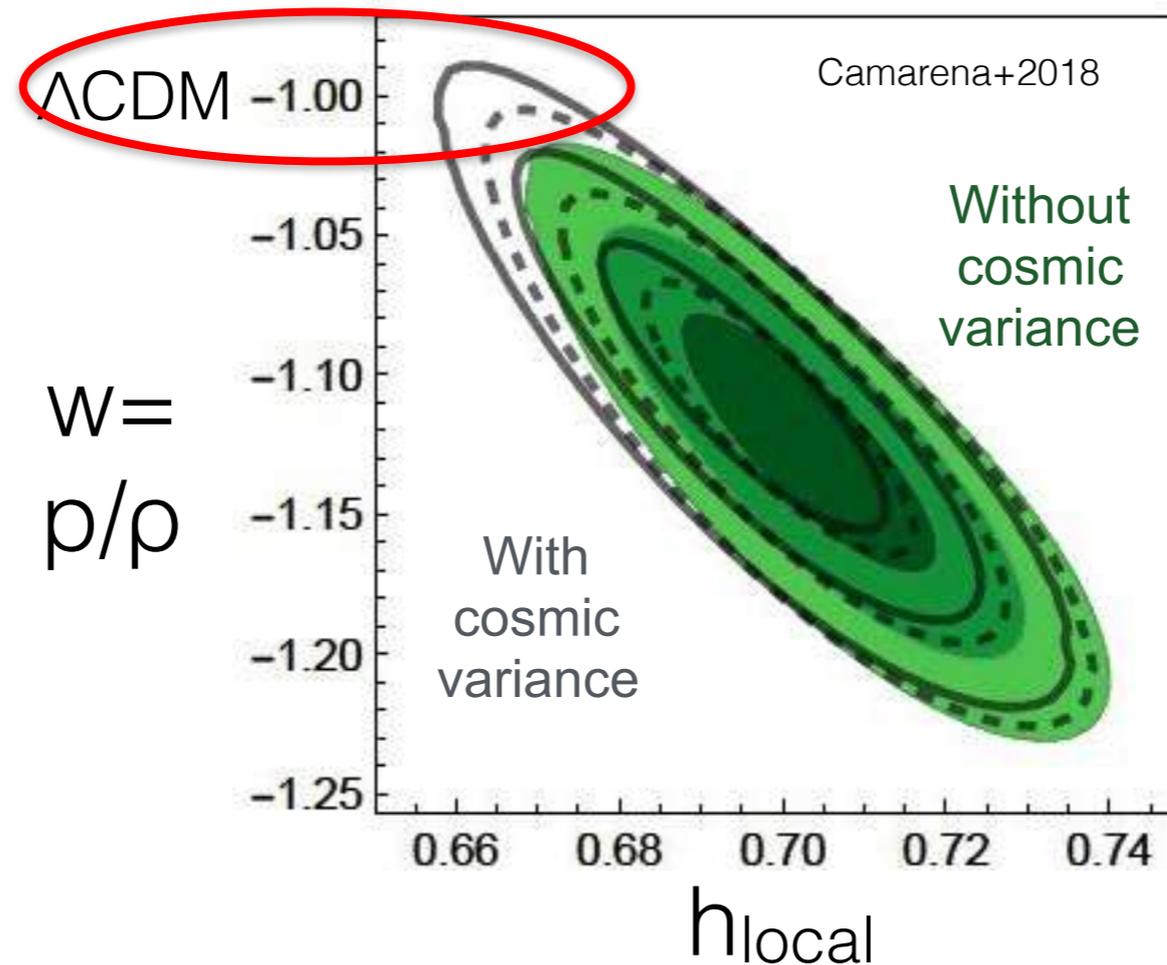
# Motivation : $\Lambda$ CDM? Precision is not accuracy: environmental biases?

Example: Equation of state of the dark energy



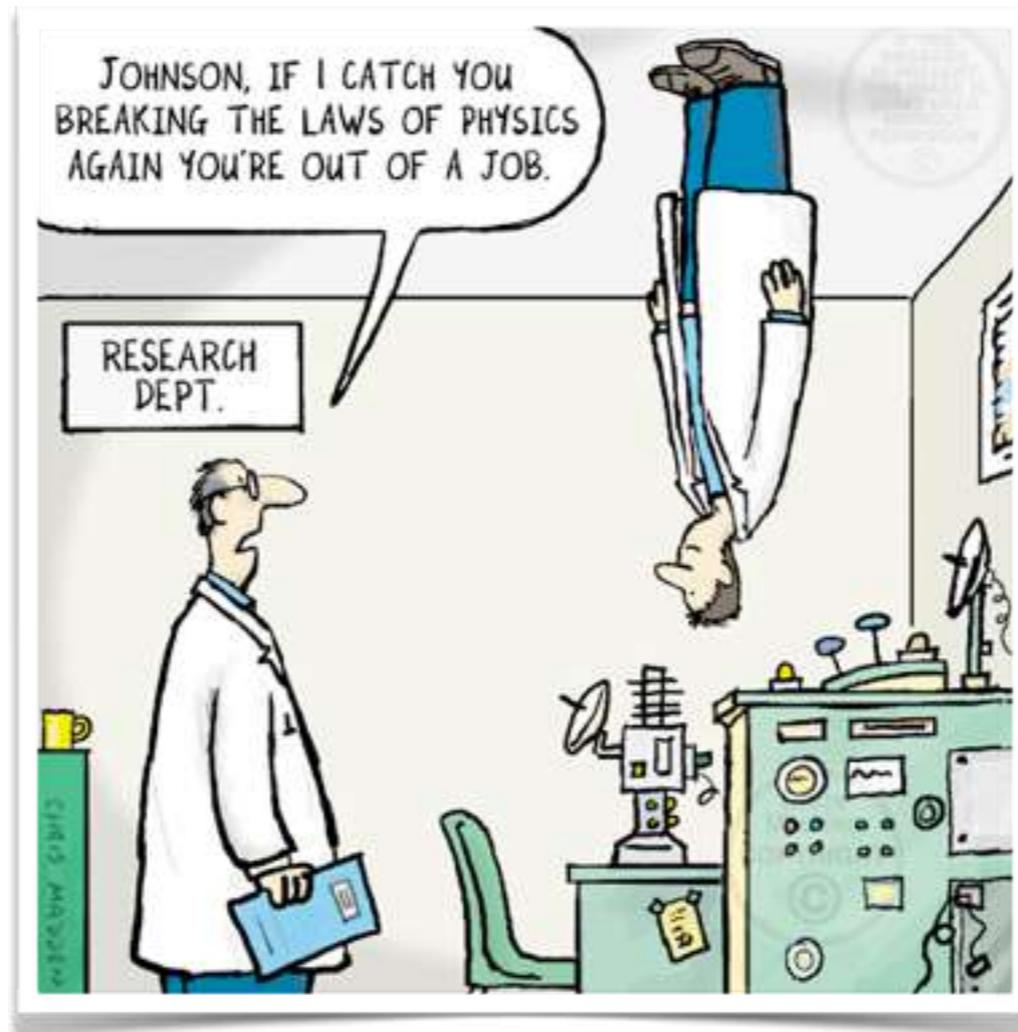
# Motivation : $\Lambda$ CDM? Both precision and accuracy are required!

Example: Equation of state of the dark energy



Accuracy:  
1% bias non-negligible

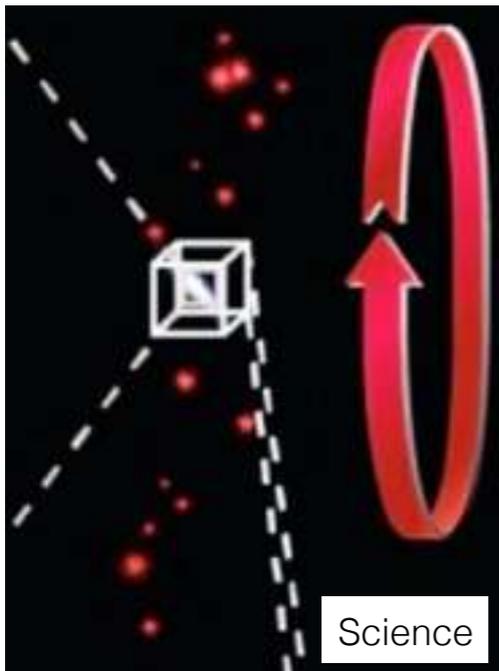
## When observations challenge $\Lambda$ CDM



A few examples

Small scales

Thin disks of satellites

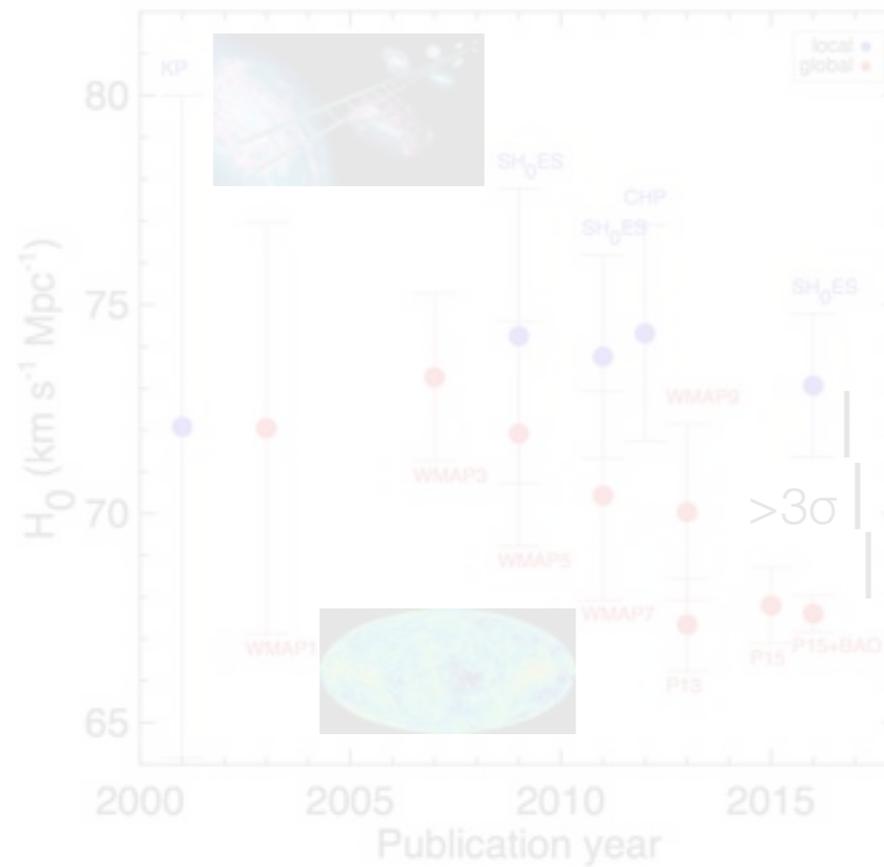


Observed... not simulated

Famaey+2013, Bullock+2017

local scales

local / global  $H_0$

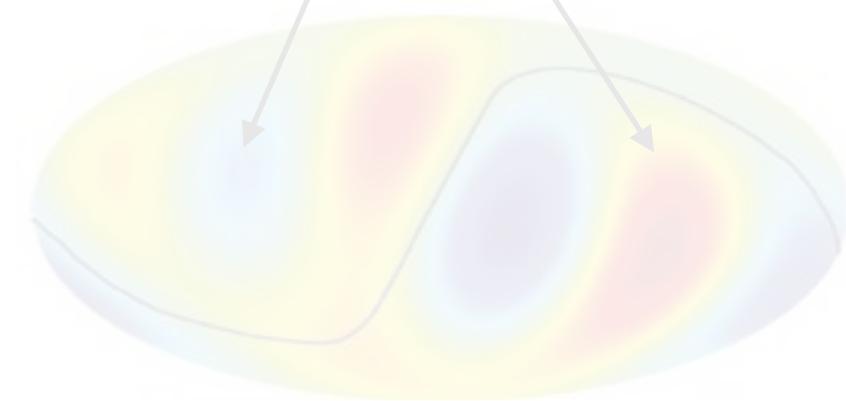


Freedman+2017

Large scales

CMB

North/South Asymmetry



Francis+2010

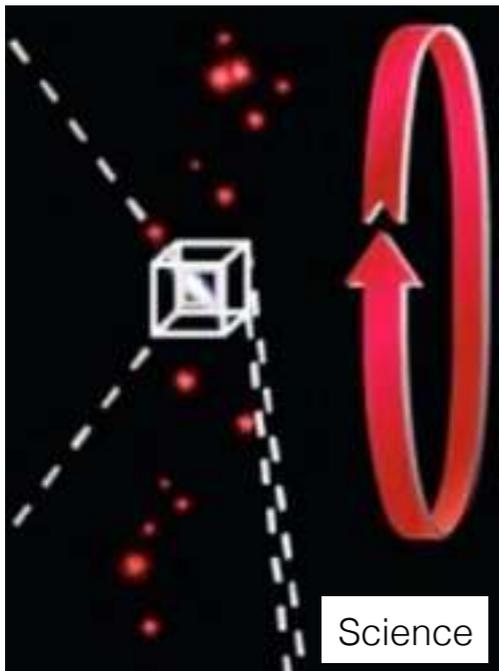
very unlikely...

e.g. Schwarz+2016

A few examples

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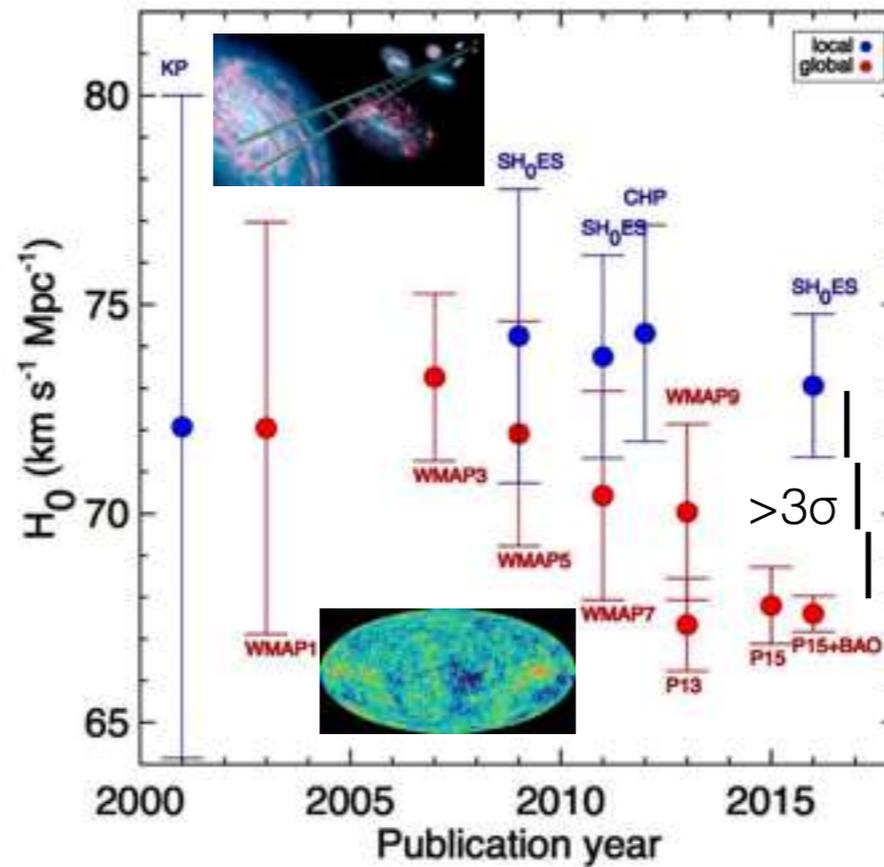


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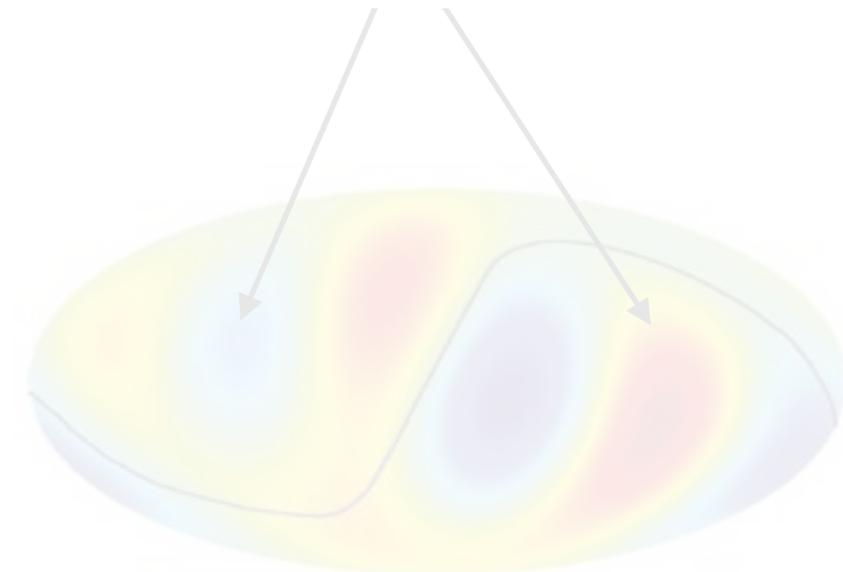


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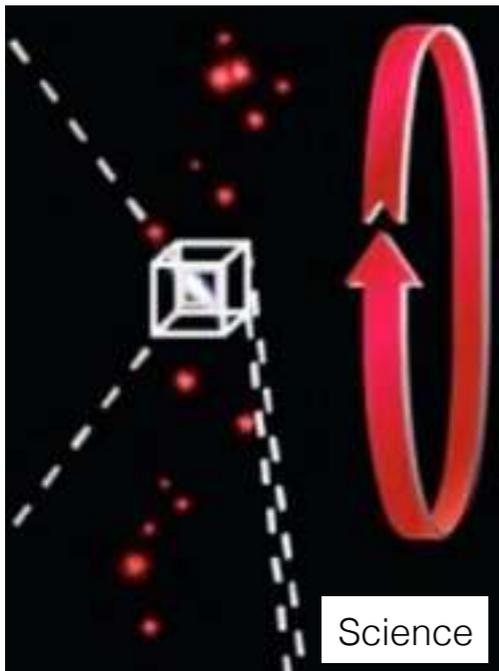
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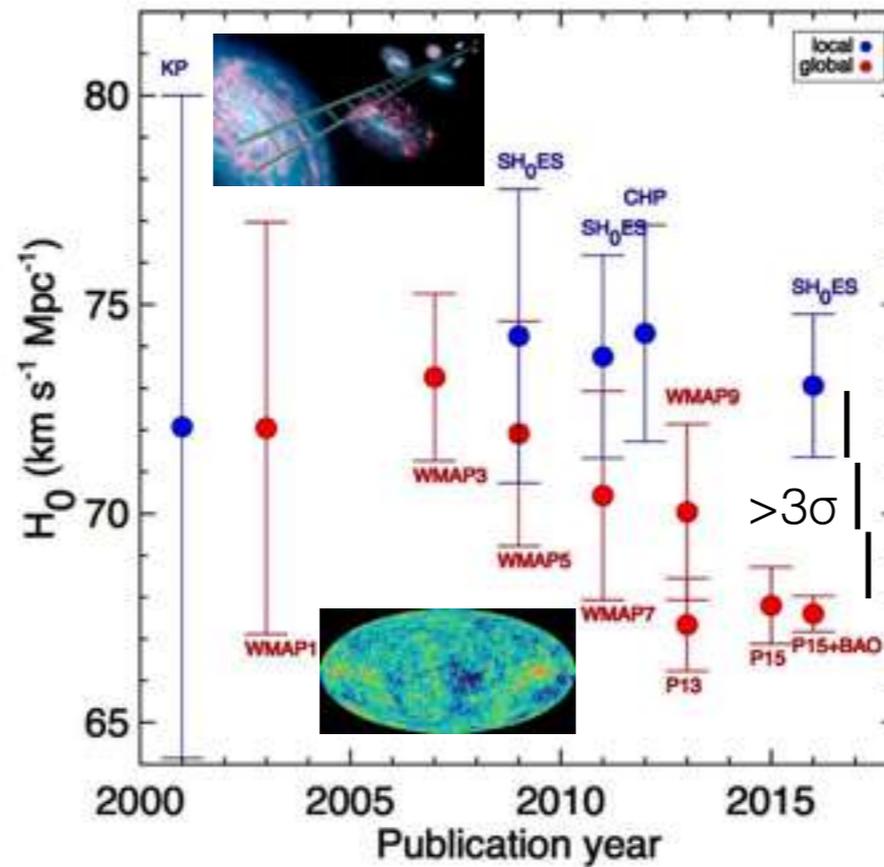


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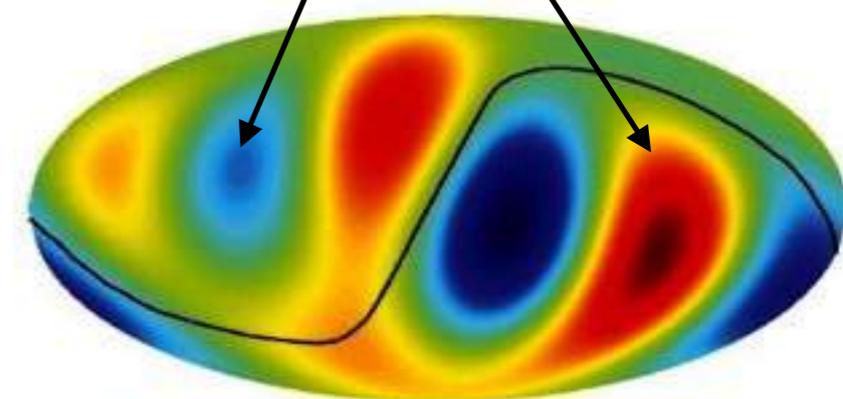


Freedman+2017

Large scales

CMB

North/South Asymmetry



Francis+2010

very unlikely...

e.g. Schwarz+2016

More examples: local void emptier with larger galaxies, CMB/galaxy clusters  $\sigma_8$ , lack of angular correlation at large scales  
local correlations slope and scatter, missing satellites, cold spot, etc

# Local-induced biases ?

Can our local environment bias our “perception” at the 1-2% level preventing us from reaching 1-2% accuracy...

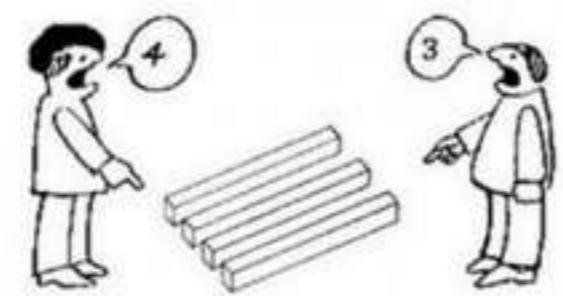
Small scales



Are we comparing apple to apple?  
Do we understand enough?

Correlation with environment

Local scales



Are we a neutral observer?

A neutral environment?  
Very unlikely...

Large scales



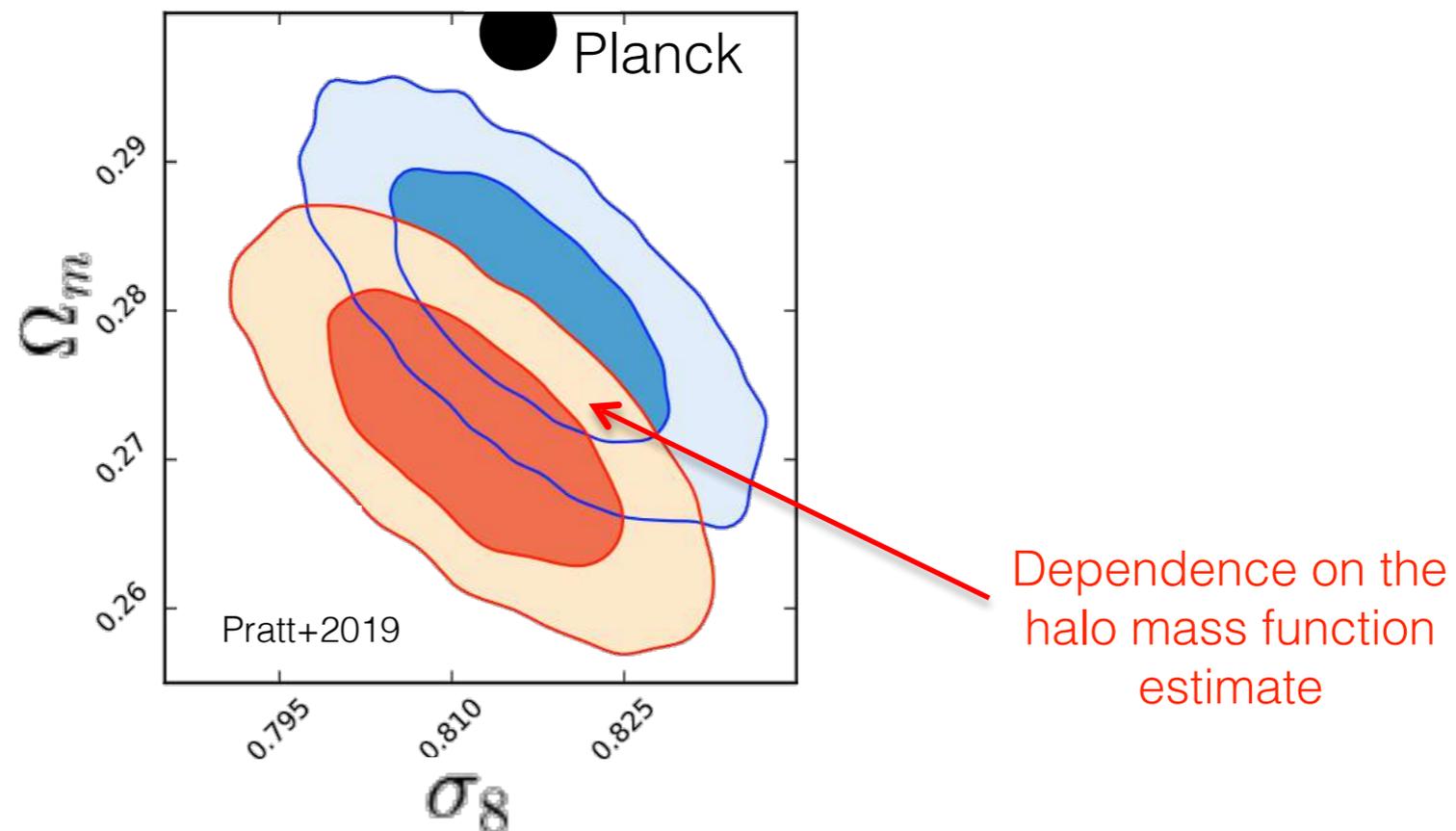
What about foreground effects?

Photons travel a lot before reaching us...

and eventually decrease *or increase* tensions with  $\Lambda$ CDM ?

# Local-induced biases ? on the small scales

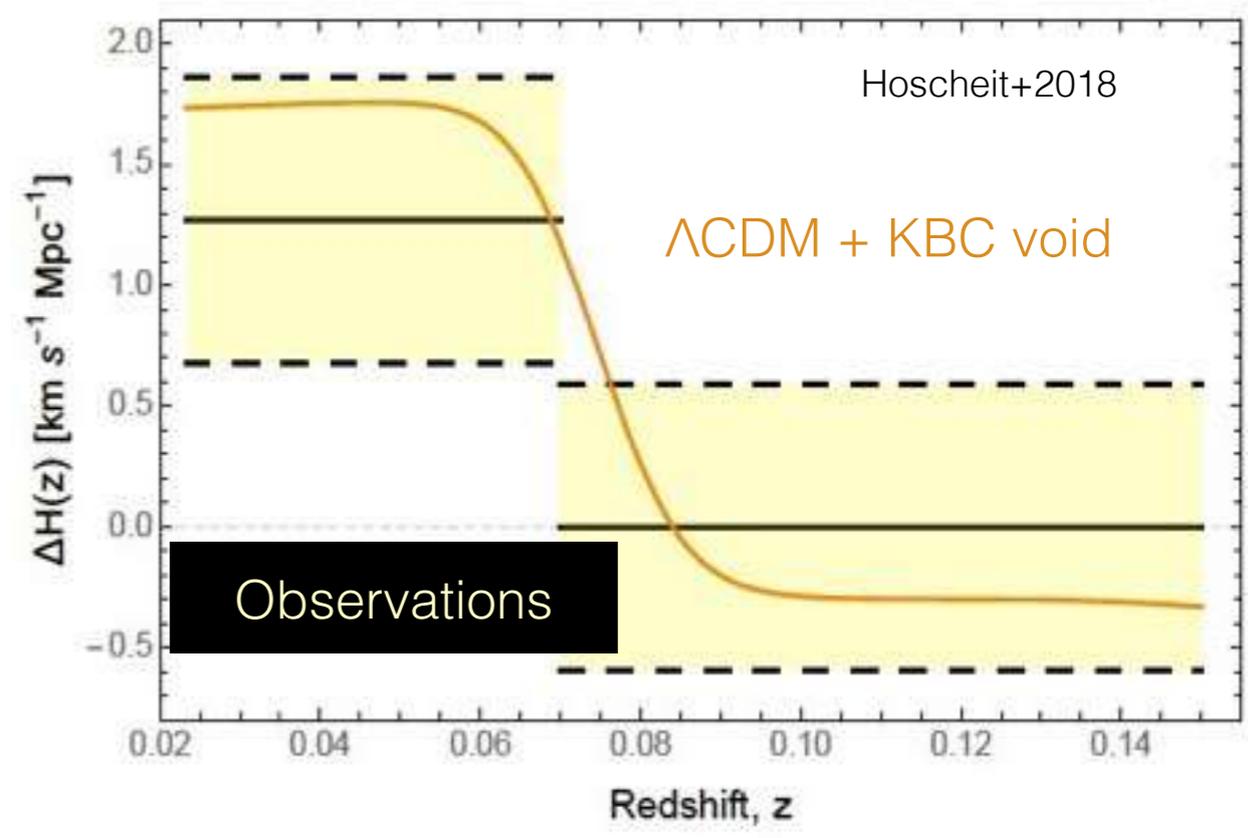
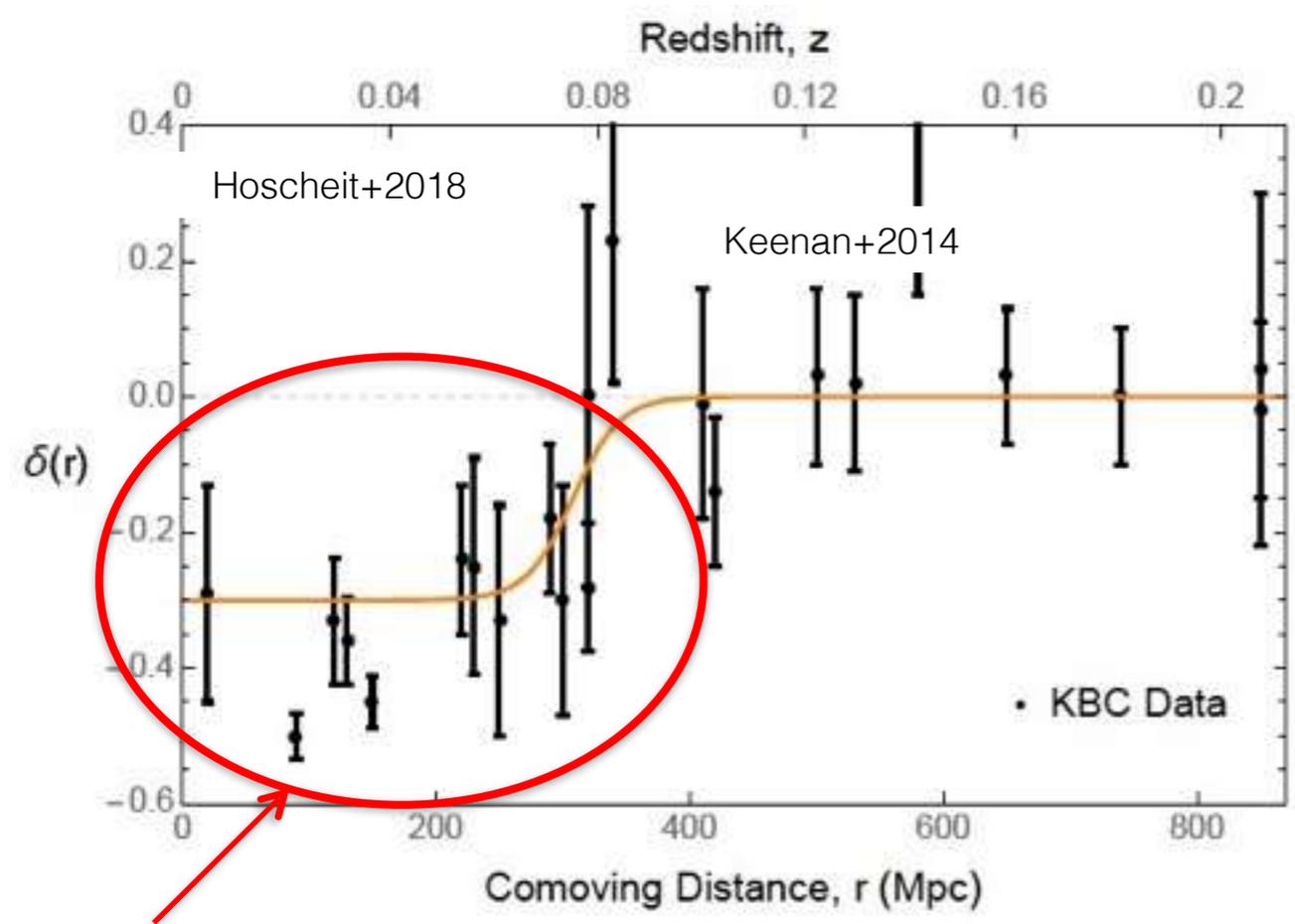
Everything relies on the mass estimate of galaxy clusters



Need to understand these physics laboratories before using them as cosmological probes  
Best known are closeby & Dependence on the environment !

# Local-induced biases ? on the local scales

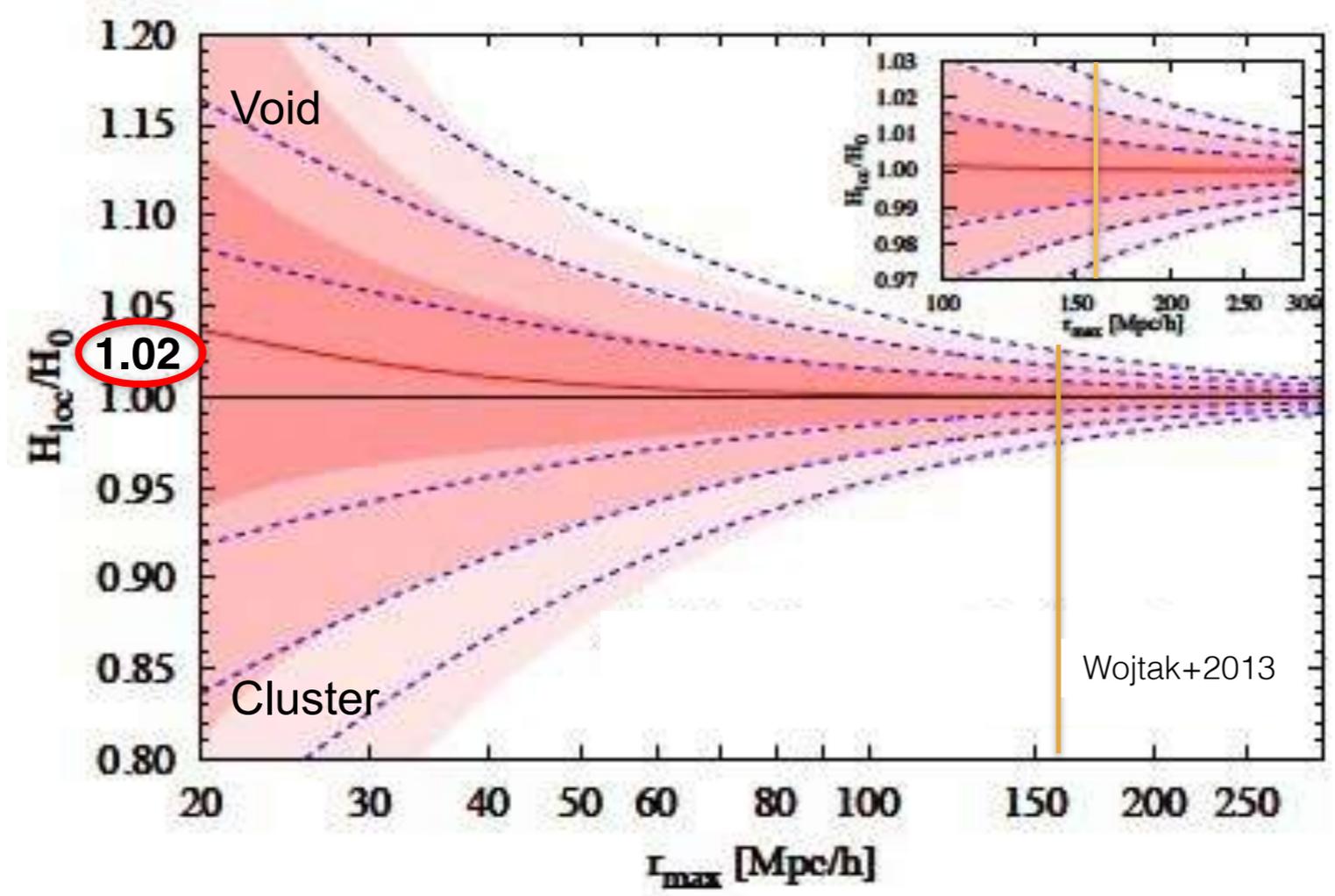
A simple example: if we live in a spherical underdensity



An example: Hint at a local underdensity up to  $z=0.07$

# Local-induced biases ? on the local scales

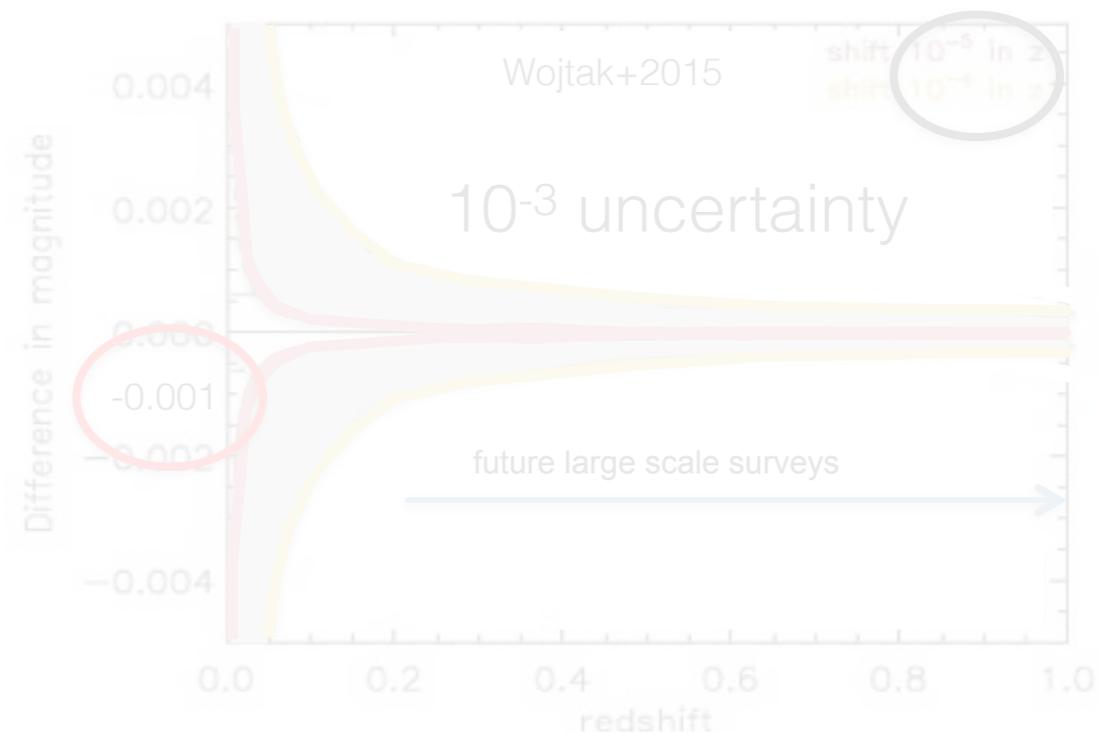
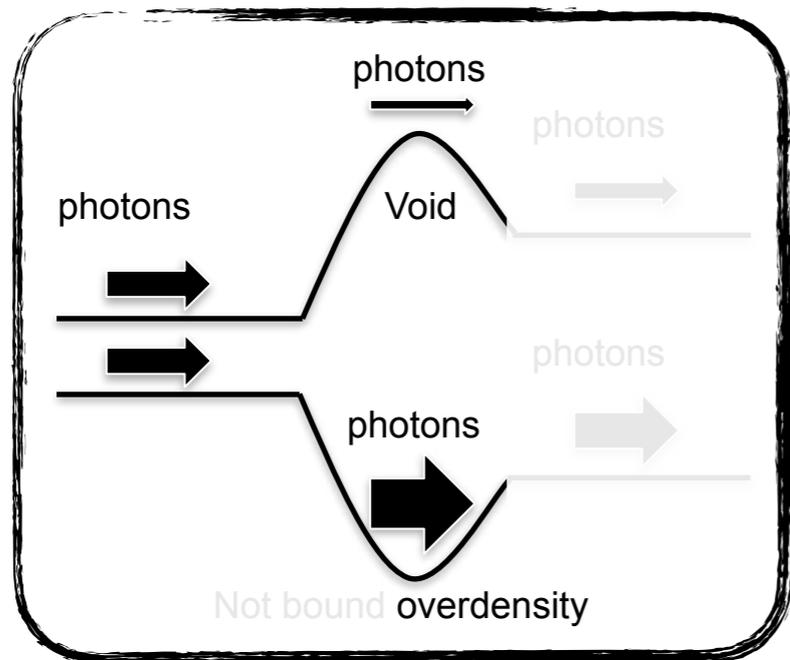
As many effect values as environments



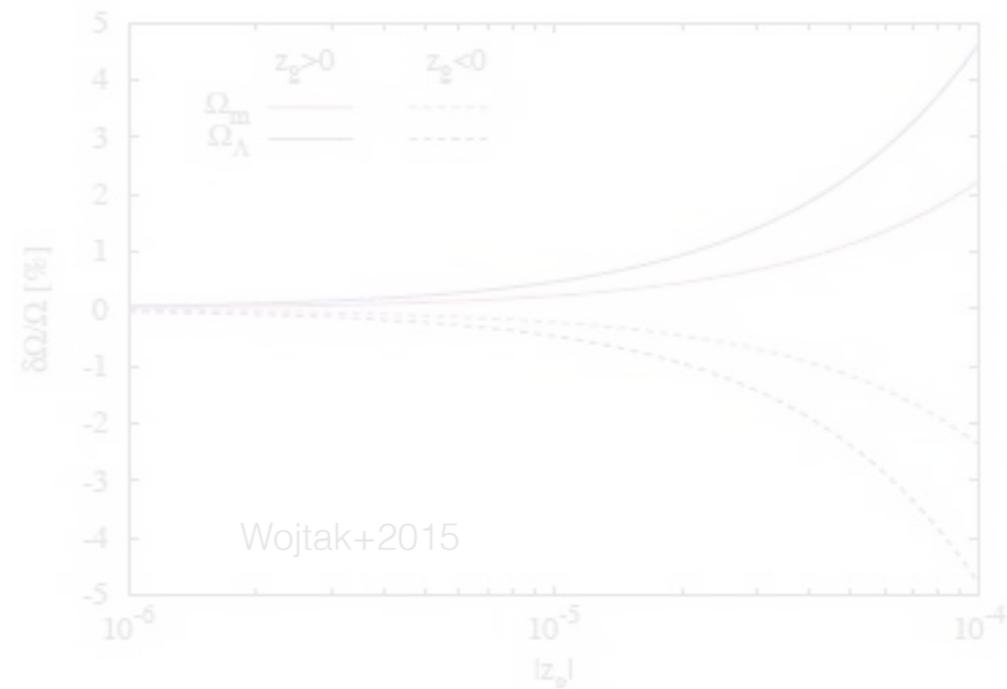
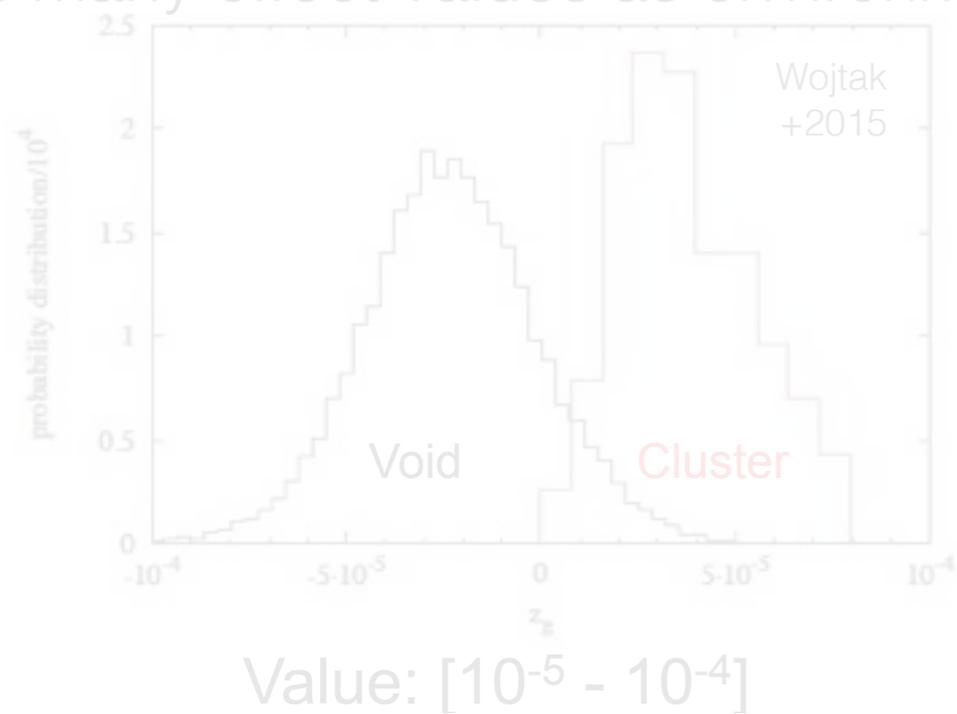
For an average environment: a 2% bias !

# Local-induced biases ? ▶ on the large scales

## Gravitational redshifts and the large scale surveys



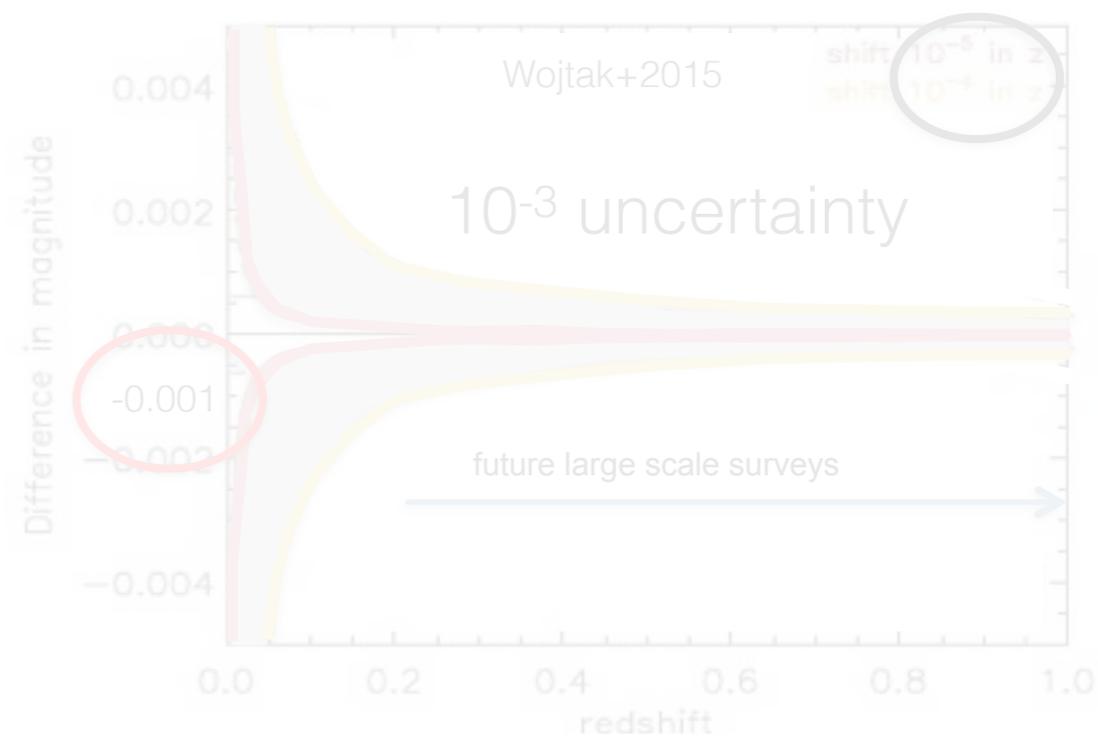
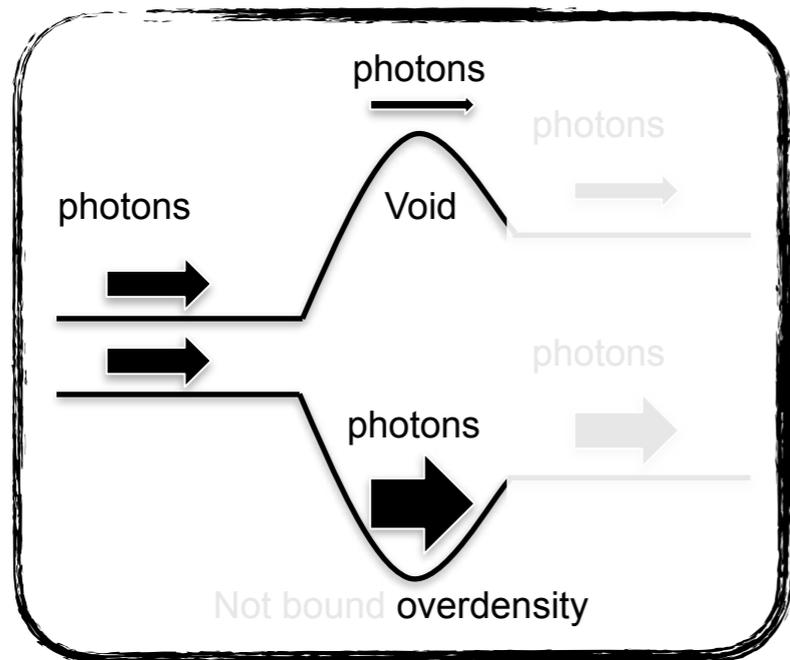
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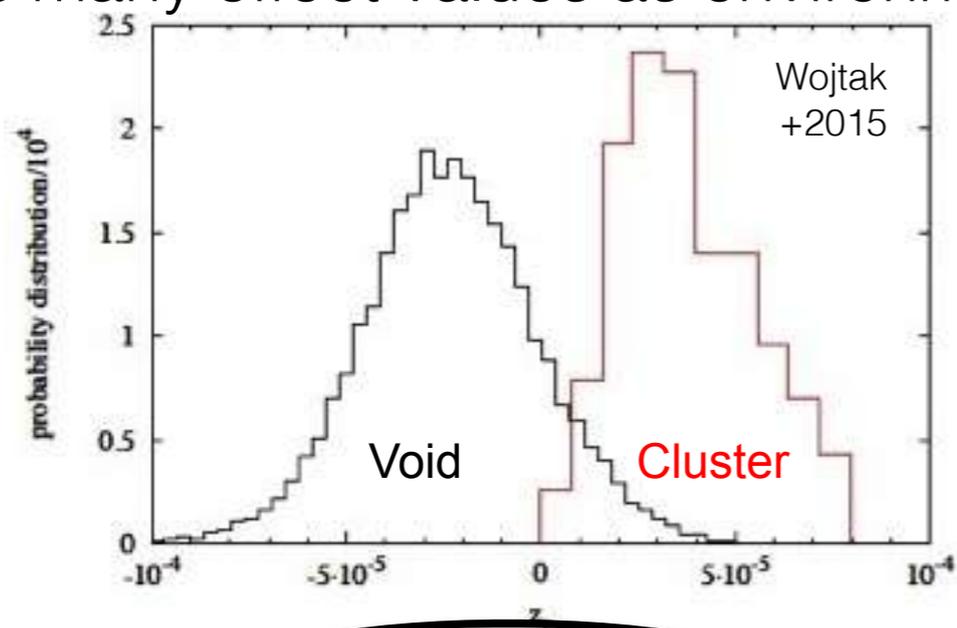
For an average environment: a 1-2% bias !

# Local-induced biases ? ▶ on the large scales

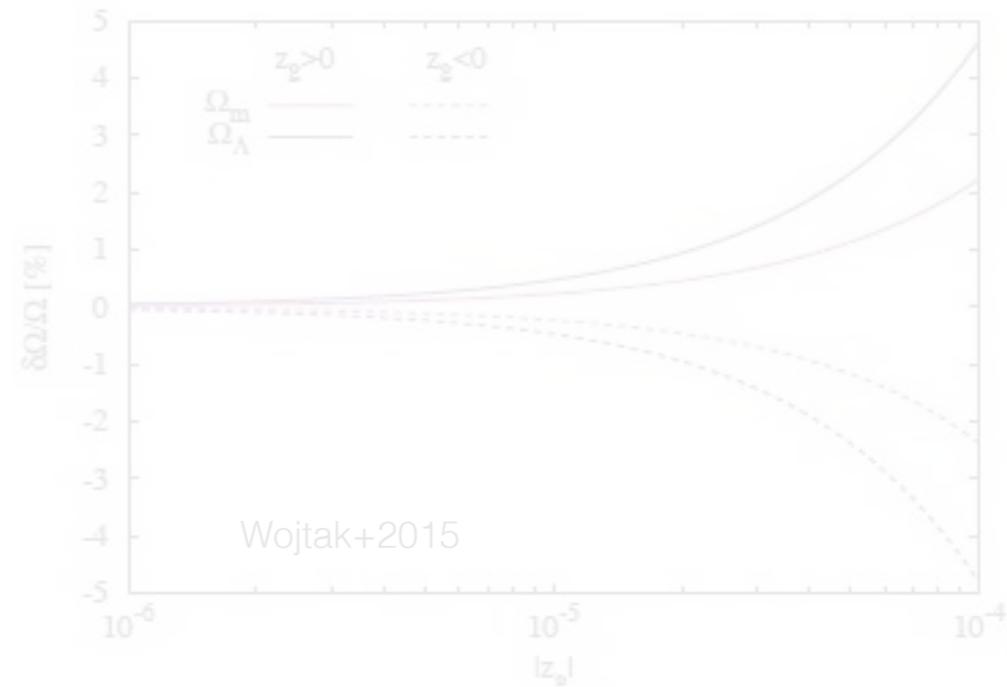
## Gravitational redshifts and the large scale surveys



As many effect values as environments



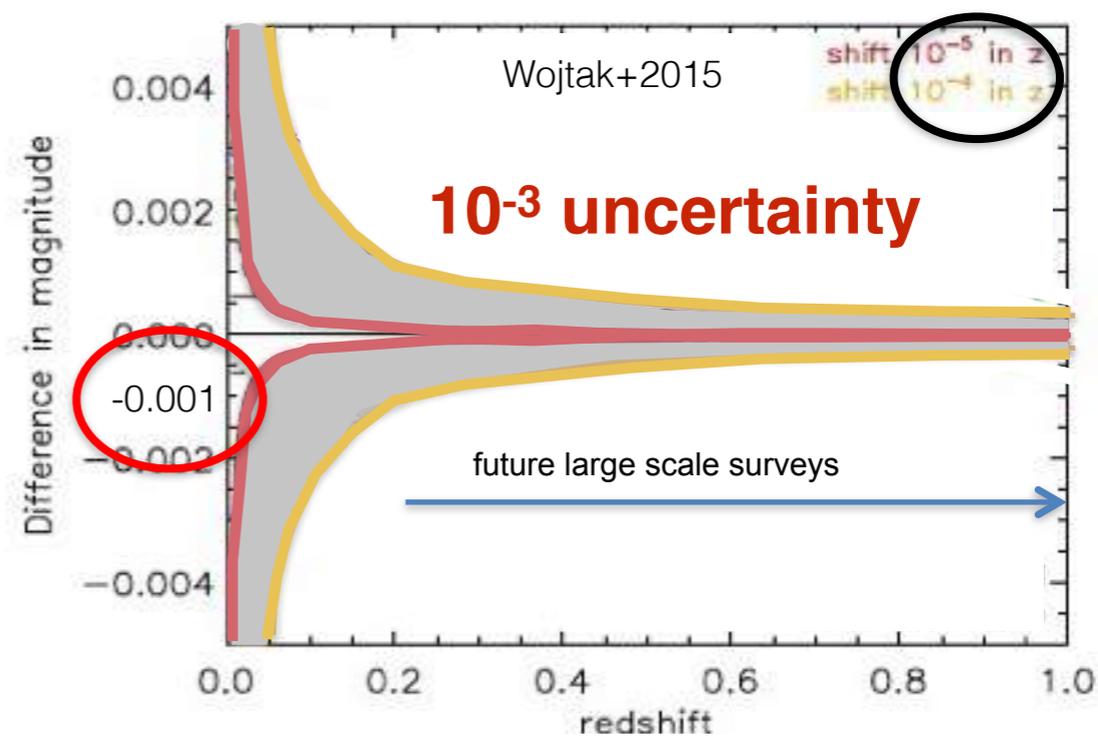
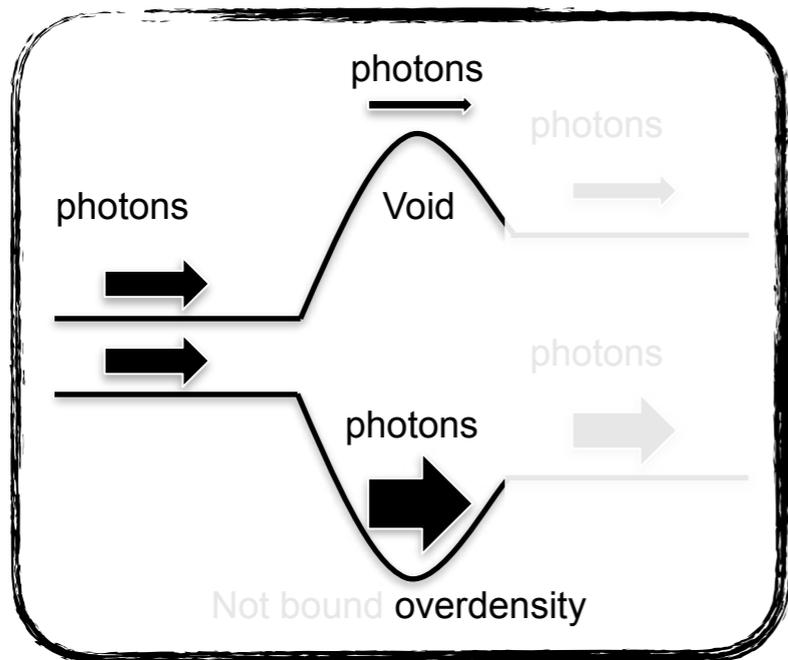
Value: [10<sup>-5</sup> - 10<sup>-4</sup>]



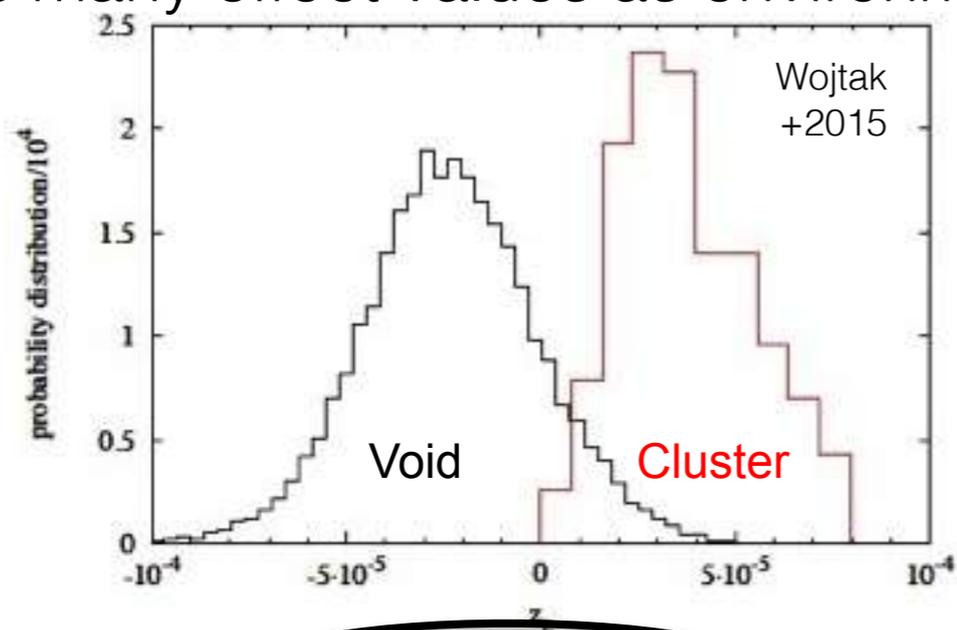
For an average environment: a 1-2% bias !

# Local-induced biases ? ▶ on the large scales

## Gravitational redshifts and the large scale surveys



As many effect values as environments



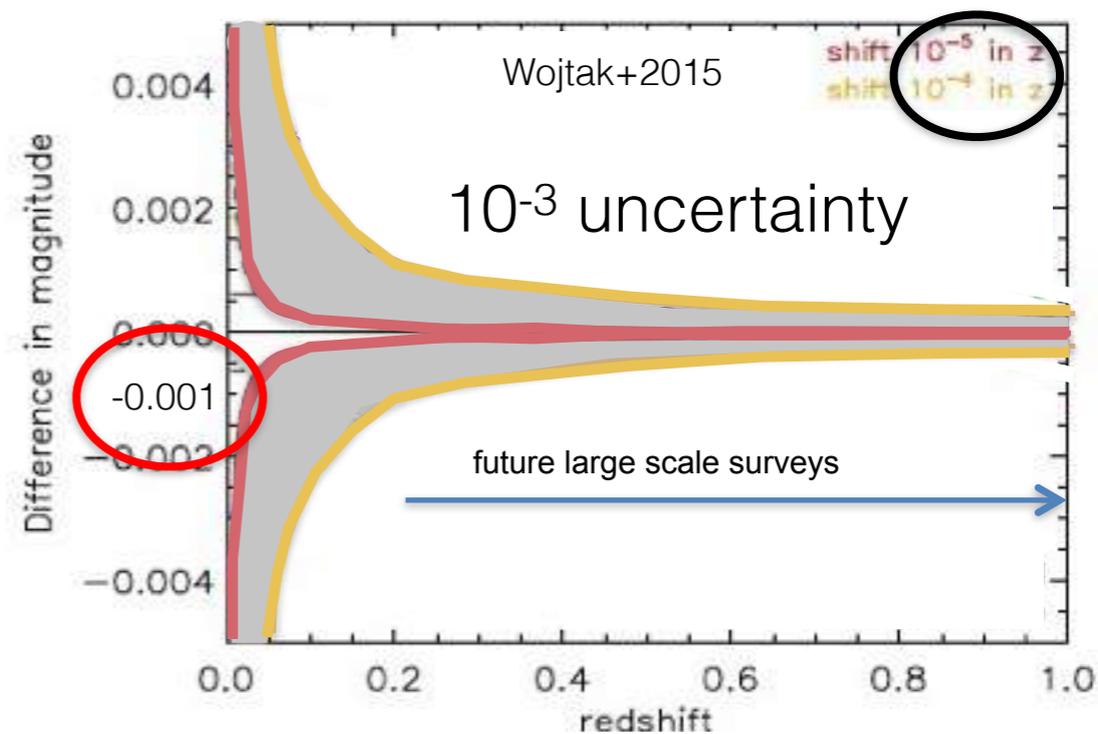
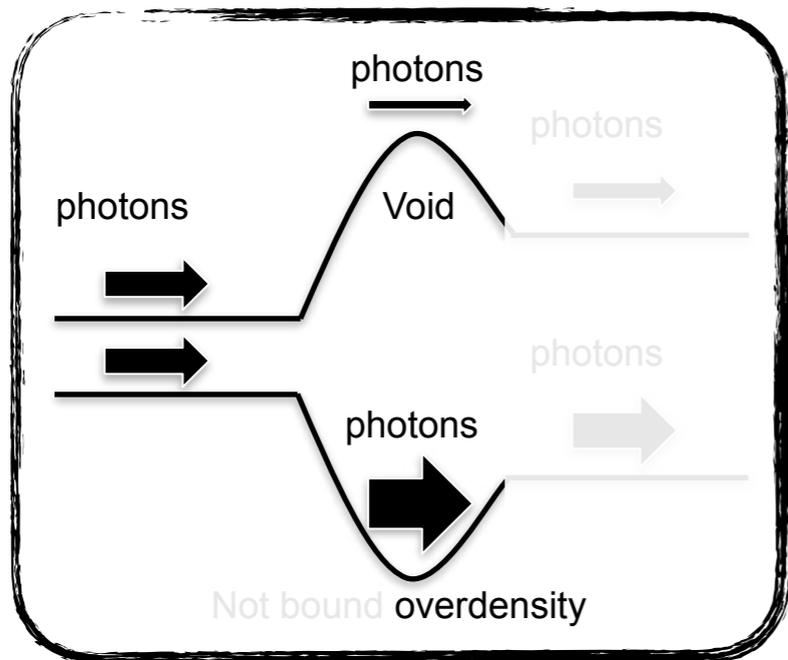
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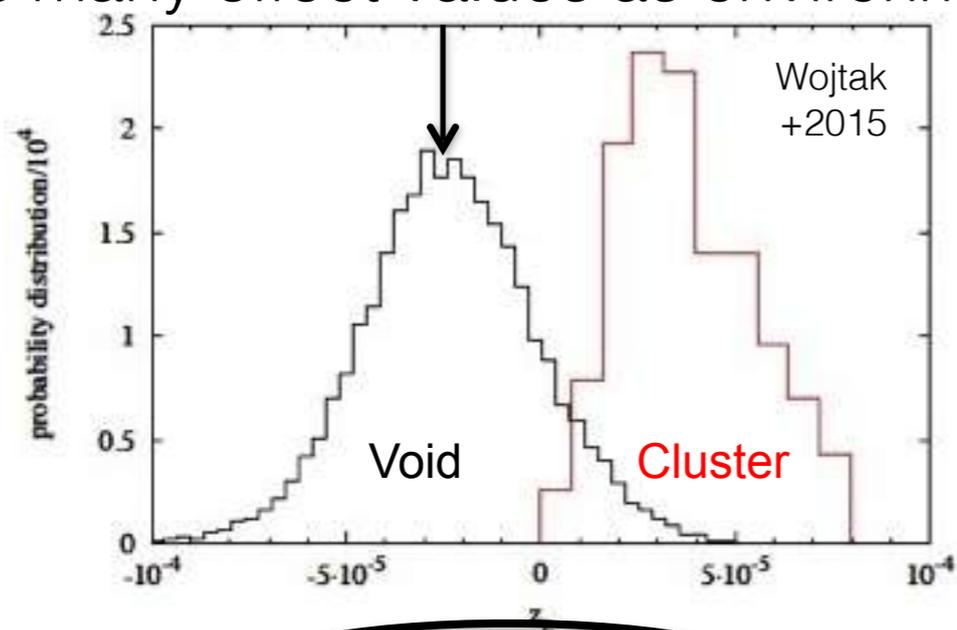
For an average environment: a 1-2% bias !

# Local-induced biases ? ▶ on the large scales

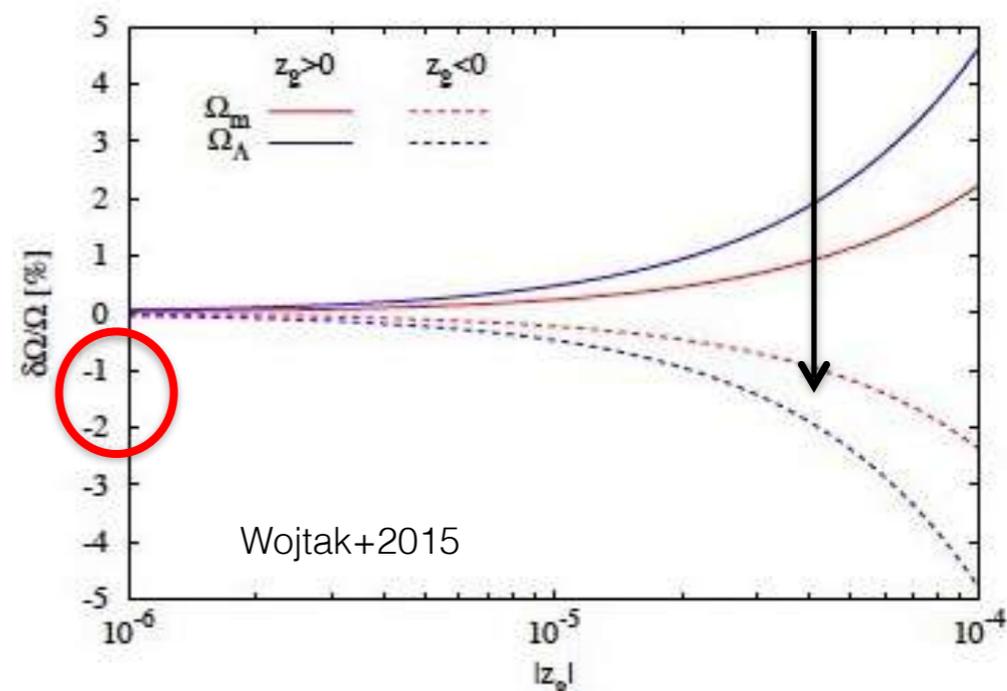
## Gravitational redshifts and the large scale surveys



As many effect values as environments



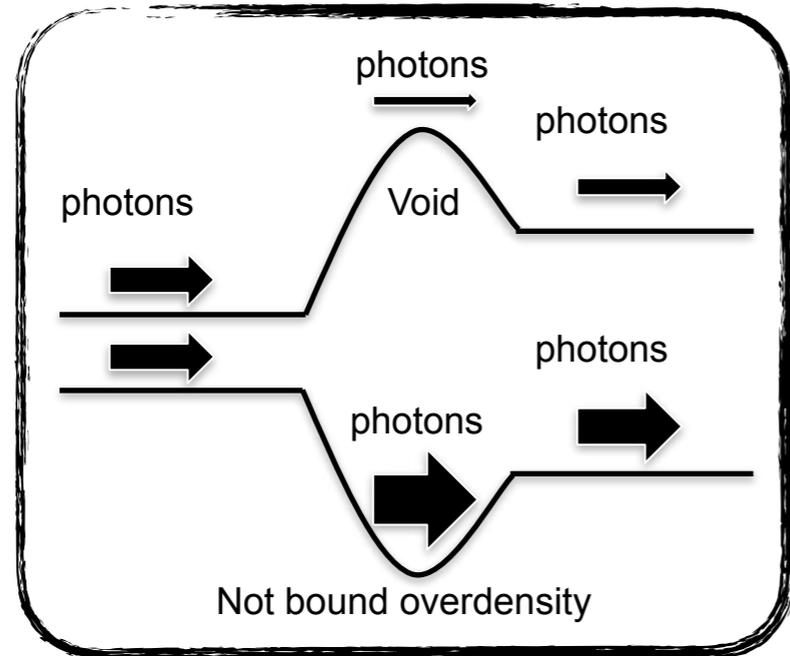
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For an average environment: a 1-2% bias !

# Local-induced biases ? on the large scales

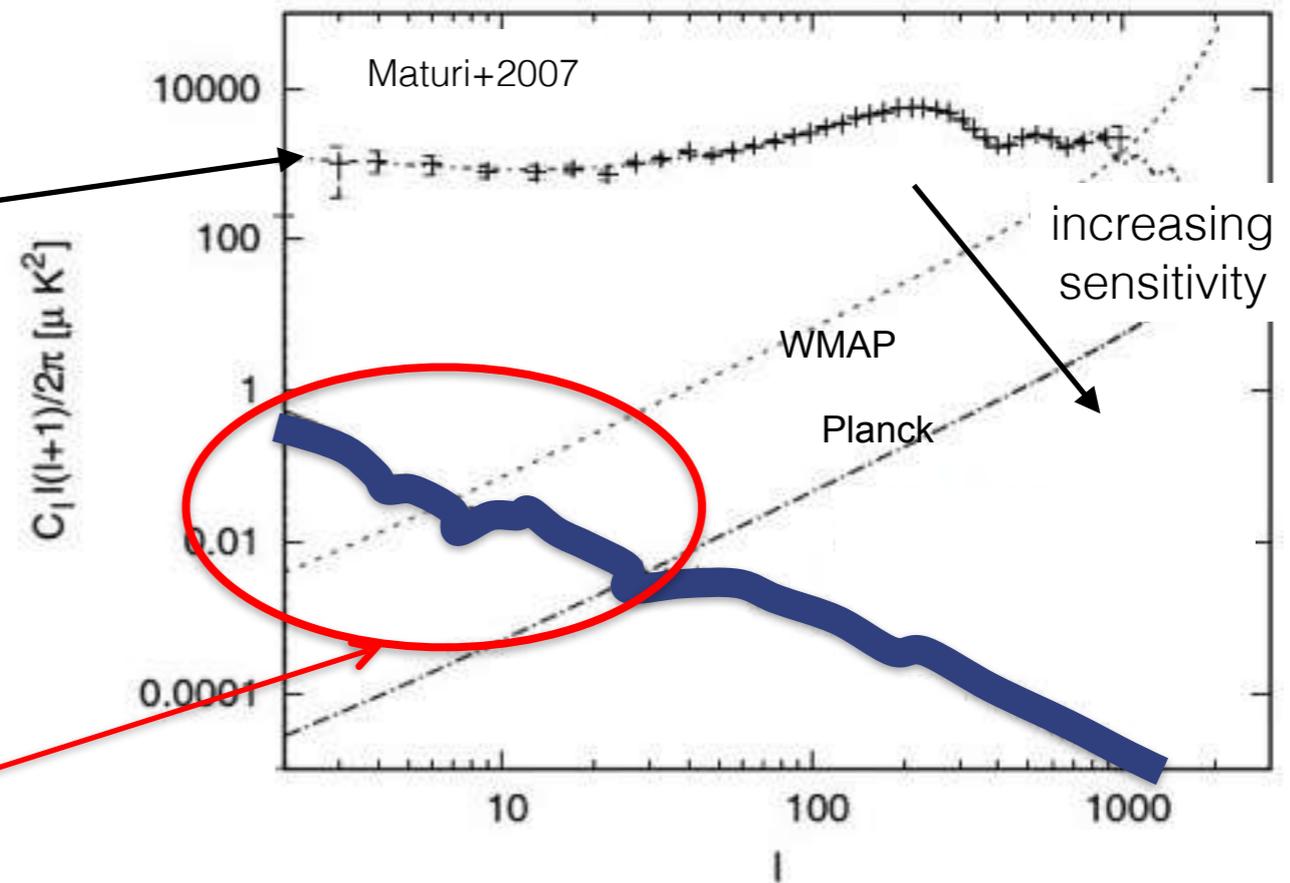
## Gravitational redshifts and the CMB



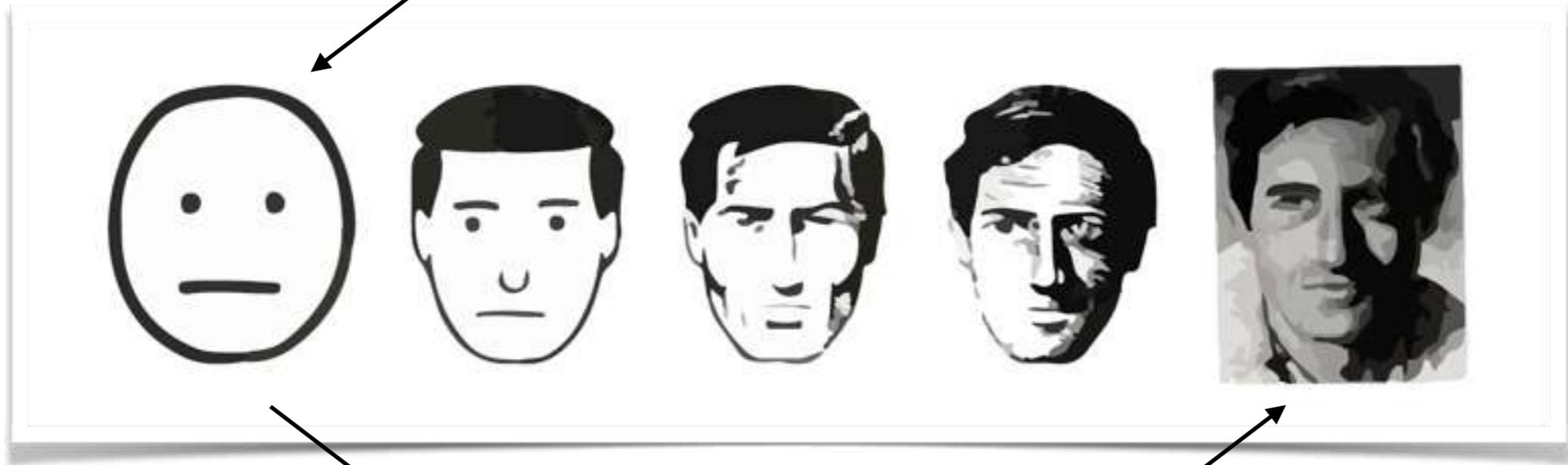
increasing precision  
= reducing error bars

local foreground  
effect = 'noise/  
bias'

## Integrated Sachs-Wolfe & Rees-Sciama Effects



A crude modeling is a beginning...

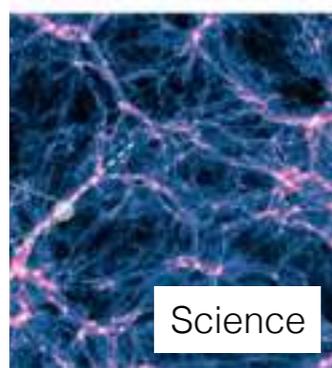


but not nearly enough...

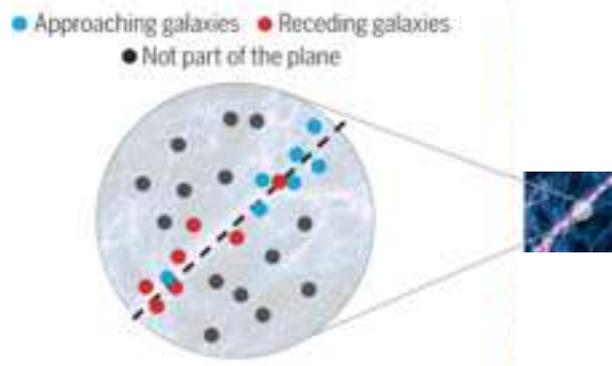
# Accounting for the effects crude modeling

A few examples

## Small scales

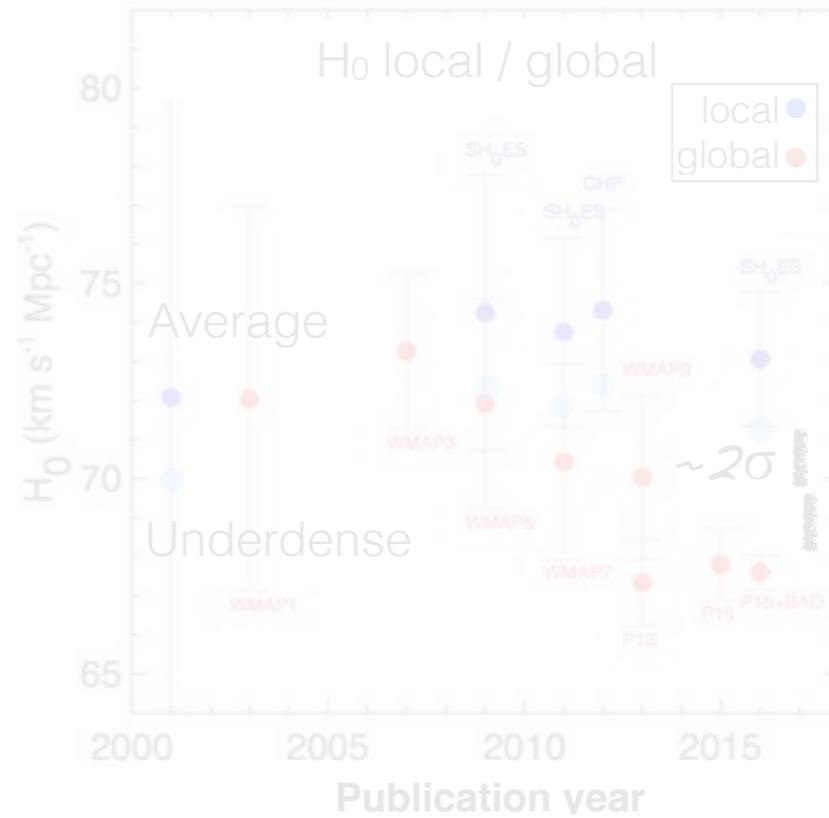


Science



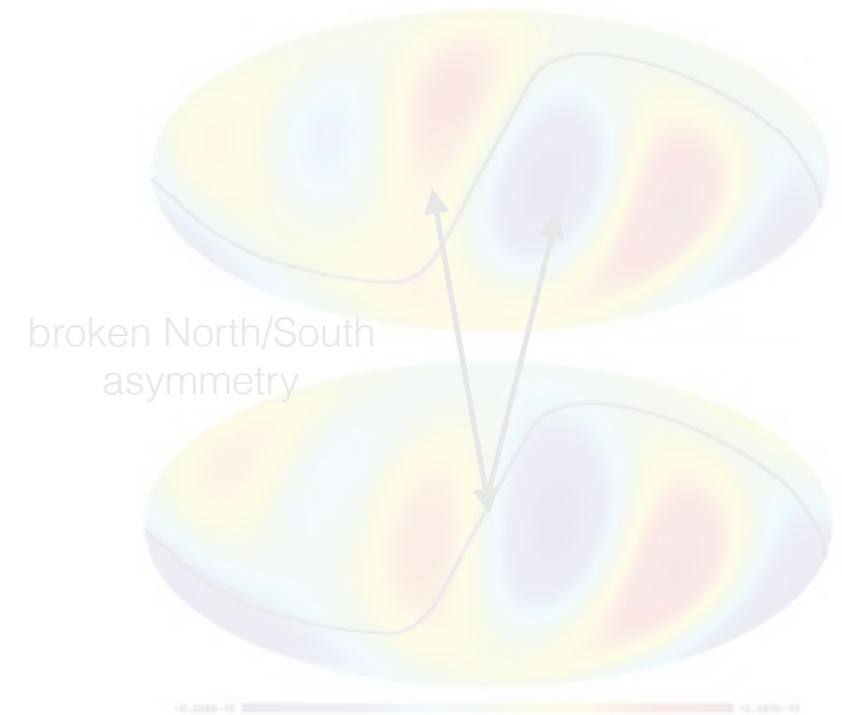
Do we live in a filament that reproduces exactly that thin plane?

## Local scales



In what kind of density do we live exactly?

## Large scales



Francis+2010

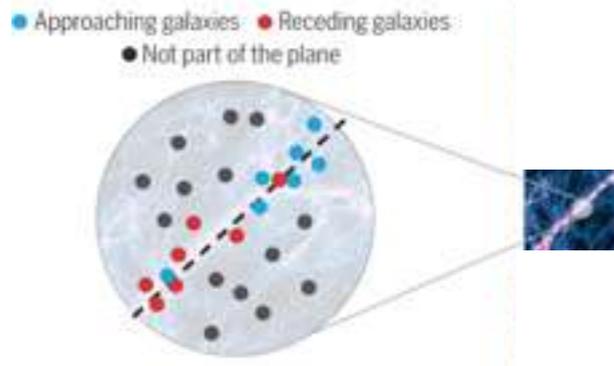
But correction from redshift surveys only...

A few examples

Small scales

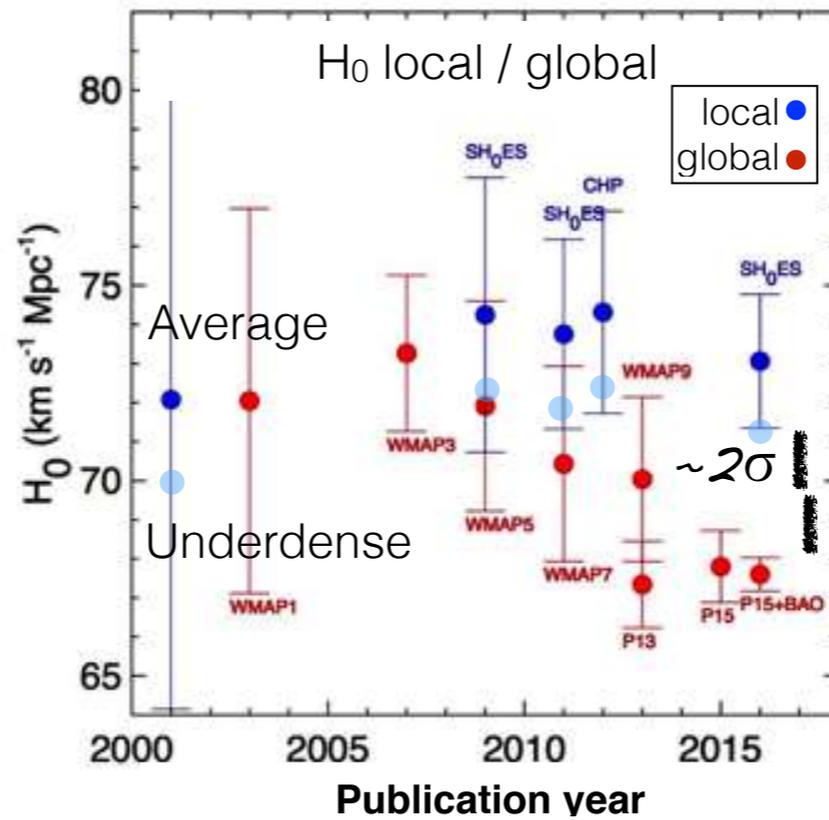


Science



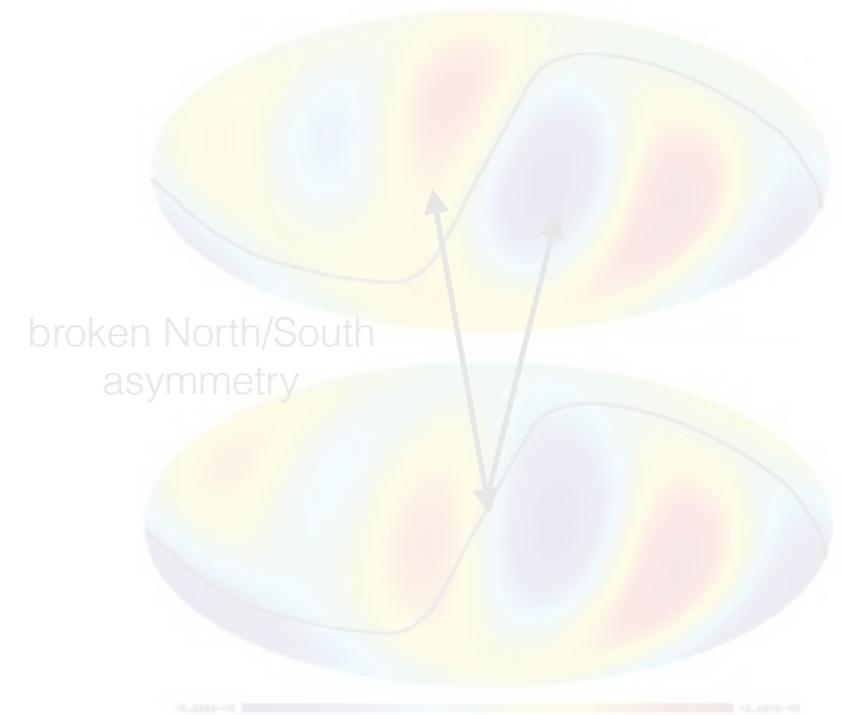
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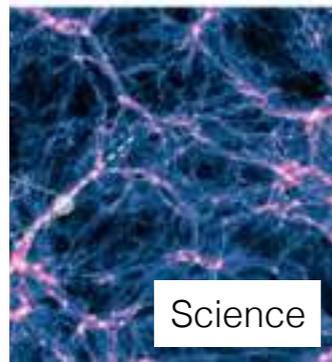


Francis+2010

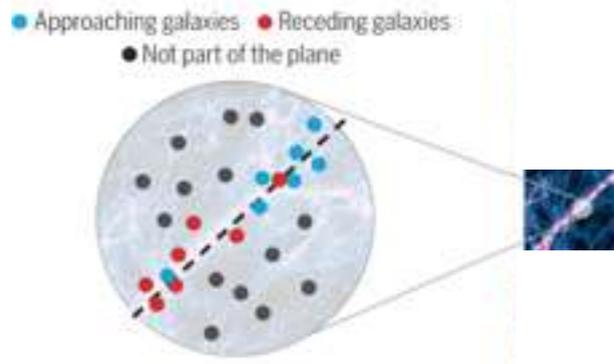
But correction from redshift surveys only...

A few examples

Small scales

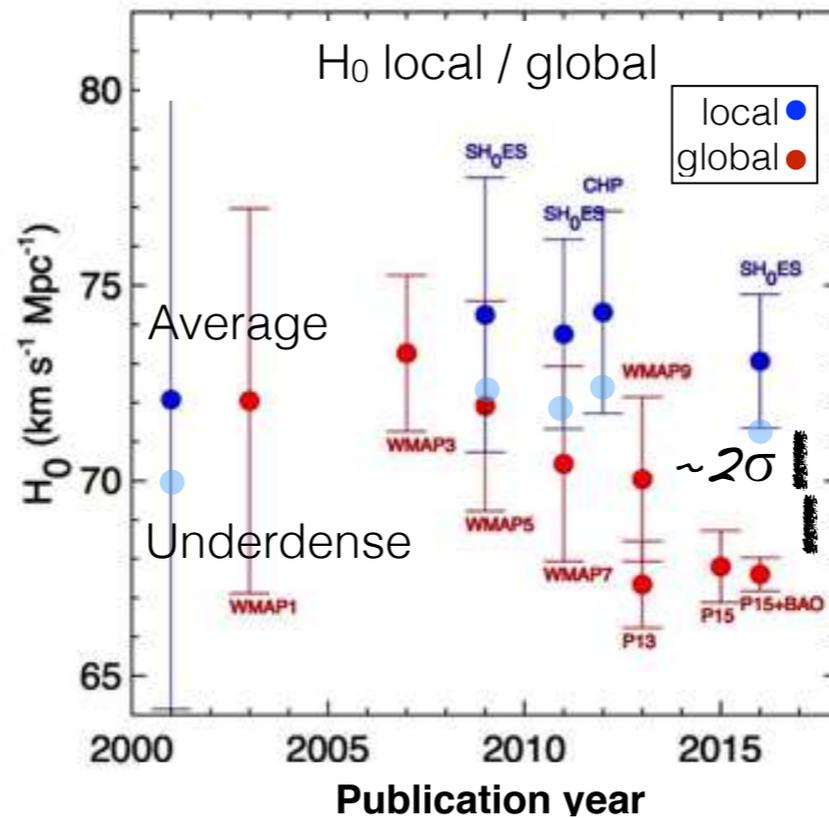


Science



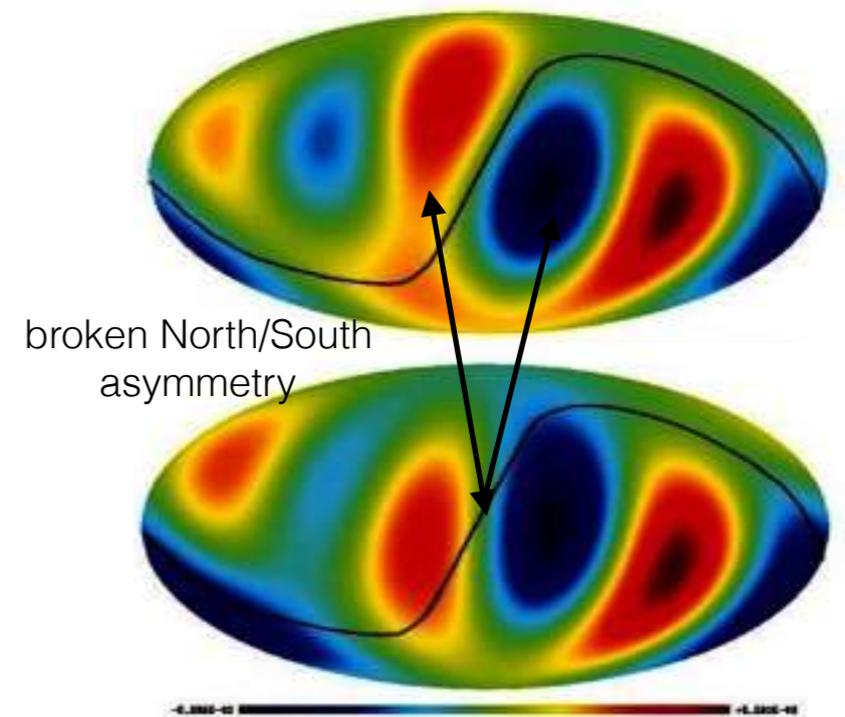
Do we live in a filament that reproduces exactly that thin plane?

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But correction from redshift surveys only...

Francis+2010

**That concludes why we might want to do more**

Let's continue with **what** more wrt typical simulations can we do or reformulating **how can we build a local modeling in order to account for the local-induced biases?**



**CLONES = Constrained LOcal & Nesting Environment Simulations**

## PATH INTEGRAL METHODS FOR PRIMORDIAL DENSITY PERTURBATIONS: SAMPLING OF CONSTRAINED GAUSSIAN RANDOM FIELDS

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Center for Theoretical Physics, Center for Space Research, and Department of Physics, Massachusetts Institute of Technology

Received 1987 August 17; accepted 1987 September 10

### ABSTRACT

Path integrals may be used to describe the statistical properties of a random field such as the primordial density perturbation field. In this framework the probability distribution is given for a Gaussian random field subjected to constraints such as the presence of a protovoid or supercluster at a specific location in the initial conditions. An algorithm has been constructed for generating samples of a constrained Gaussian random field on a lattice using Monte Carlo techniques. The method makes possible a systematic study of the density field around peaks or other constrained regions in the biased universe. The method is effective for generating initial conditions for  $N$ -body simulations with rare objects in the computational volume.

Bayes1761

Wiener1942

Hoffman & Ribak 1991

Zaroubi+1995

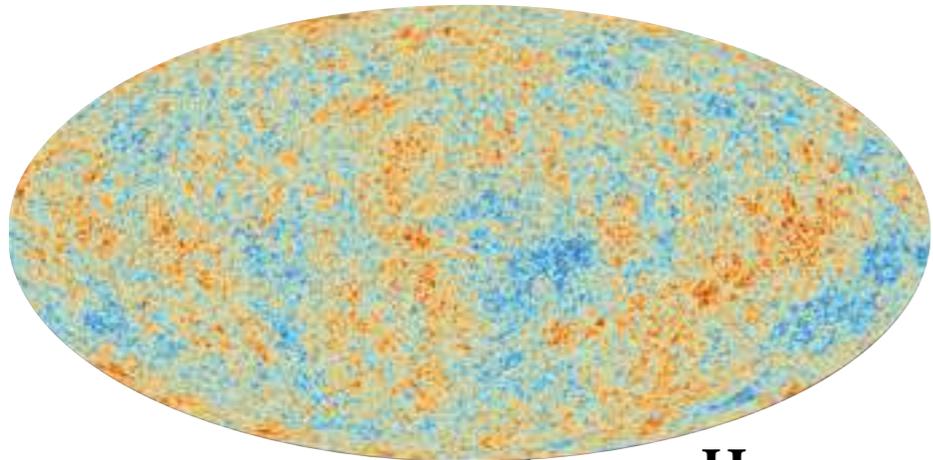
van der Weijgaert & Bertshinger 1996



"This identical twin of yours...  
Can you describe him?"

# Local Universe's initial conditions ▶ constrained initial conditions

Part of the Universe at 13.7 light-Gyr  
Photons received today have been  
emitted when it was ~380 000 yrs. old



Homogeneous and  
Isotropic Universe

Probability excess to have an object at a distance  $r$  from  
another = autocorrelation of the density contrast =  
Fourier transform of the power spectrum

$$\xi(r) = \langle \delta(\mathbf{x})\delta(\mathbf{x} + \mathbf{x}') \rangle = \frac{1}{(2\pi)^3} \int_0^\infty P(k)e^{-i\mathbf{k}\cdot\mathbf{r}} d\mathbf{k}$$

Gaussian  
initial density  
field

white noise  $w(\mathbf{k})$  and power spectrum are  
sufficient to get a ...  
RANDOM realization  
= whatever part of the Universe

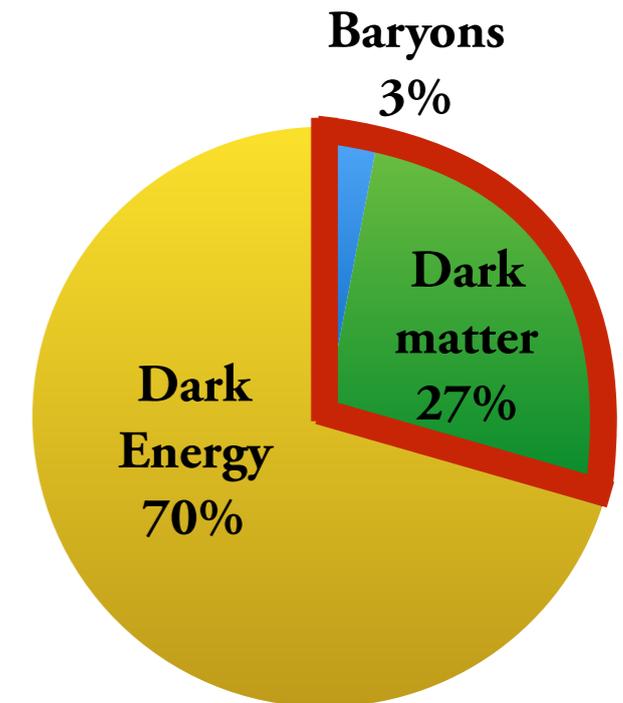
$$\delta(\mathbf{k}) = \sqrt{P(\mathbf{k})}\omega(\mathbf{k})$$

Applying local constraints

Constrained initial  
conditions

# Local Universe's initial conditions ▶ constrained initial conditions

Constraints Work	Redshift surveys	peculiar velocities + density	peculiar velocities
Kitaura2008,2012, 2013 Hess+2013	☑		
Lavaux2010, Jasche+2013-tdy	☑		
Wang+2014-tdy	☑		
Klypin+2003		☑	
Sorce+2014-tdy			☑



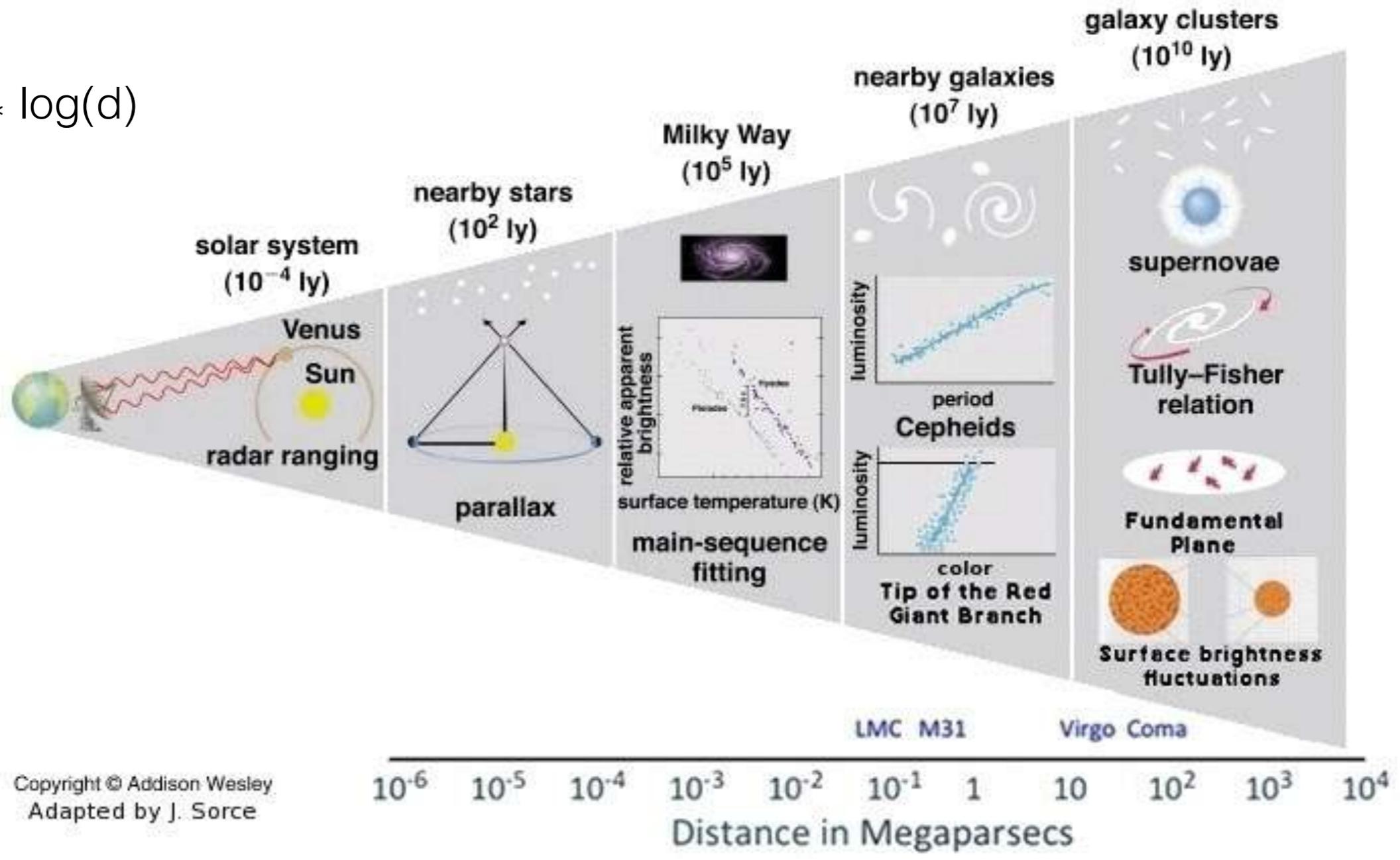
no luminosity bias

- Account for the entire underlying gravitational field
- Correlated on large scale
- Highly linear

e.g. Tully+(including Sorce)2013, Tully+(including Sorce)2016

$$V_{\text{radial pec}} = V_{\text{obs}} - H_0 \times d$$

$$m - M \propto \log(d)$$



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Adapted by J. Sorce

Radial peculiar velocity catalog

Grouping

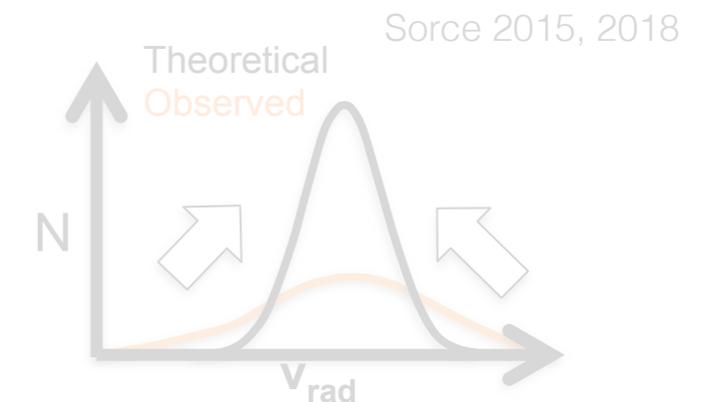
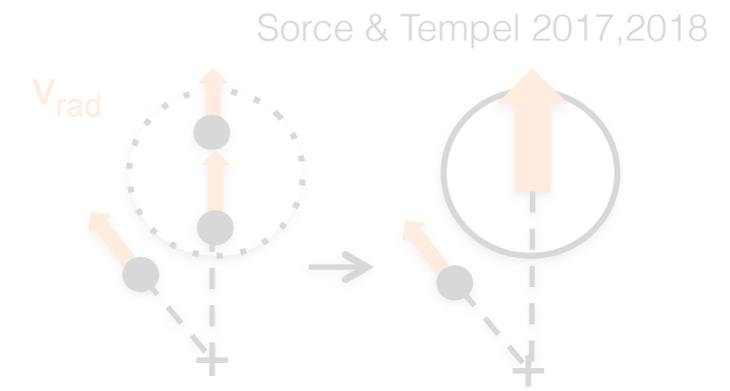
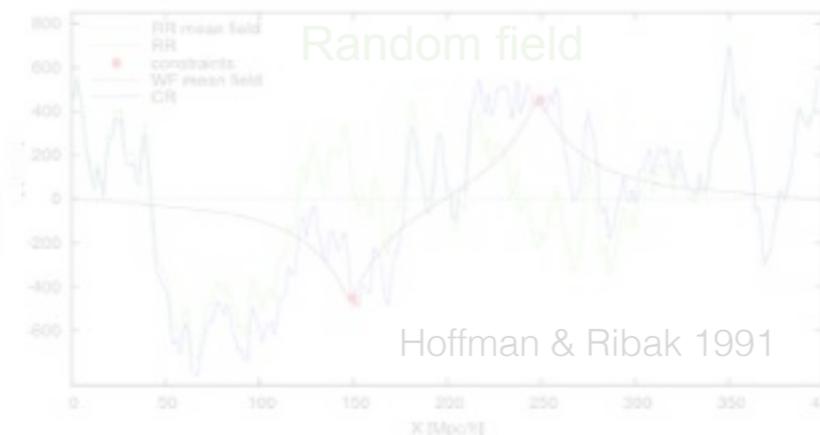
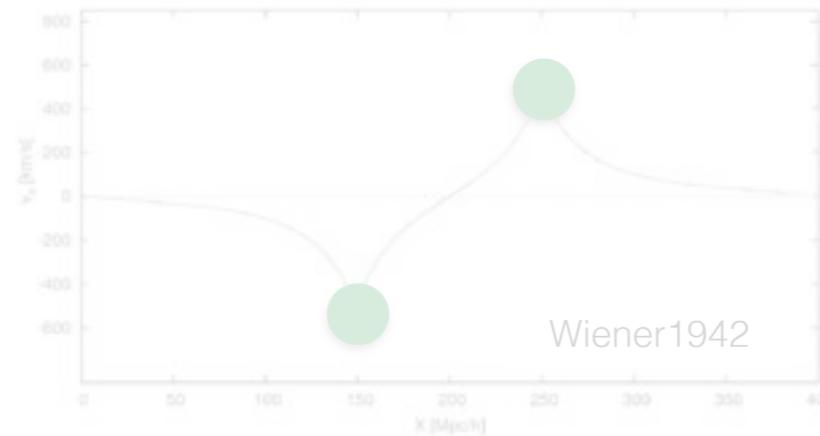
Minimization of biases

Wiener filtering

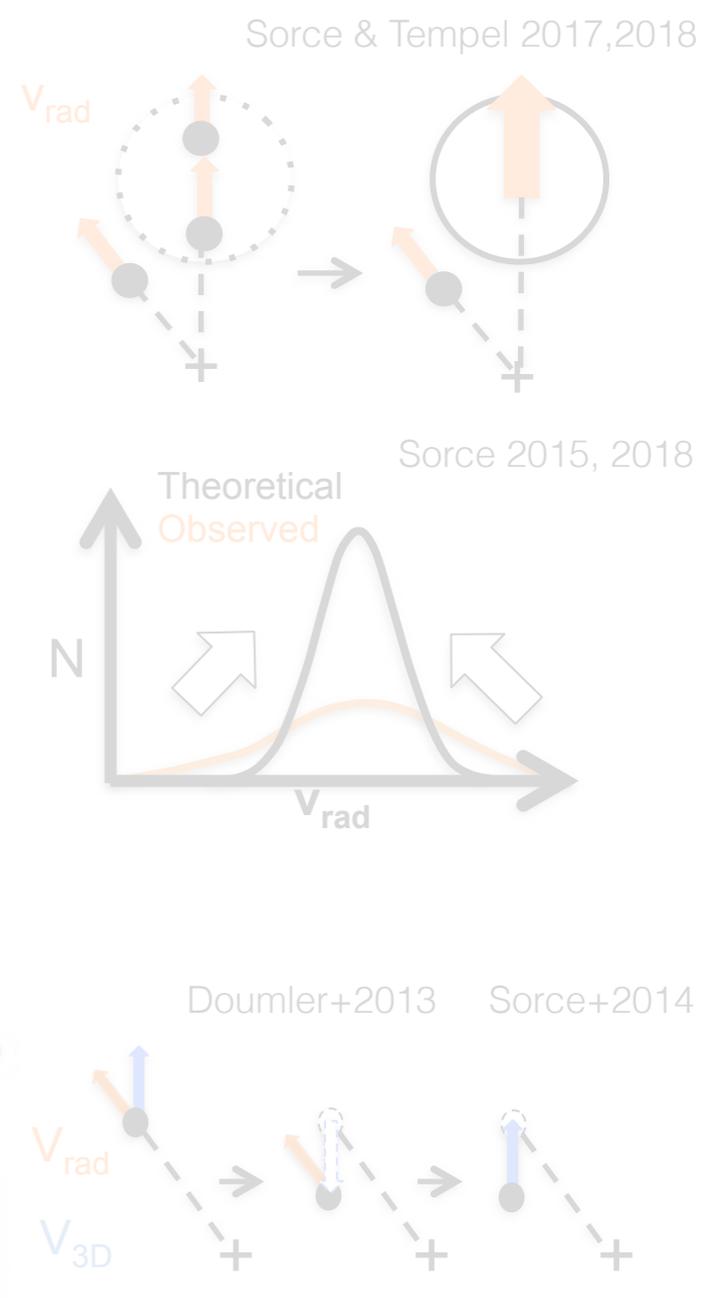
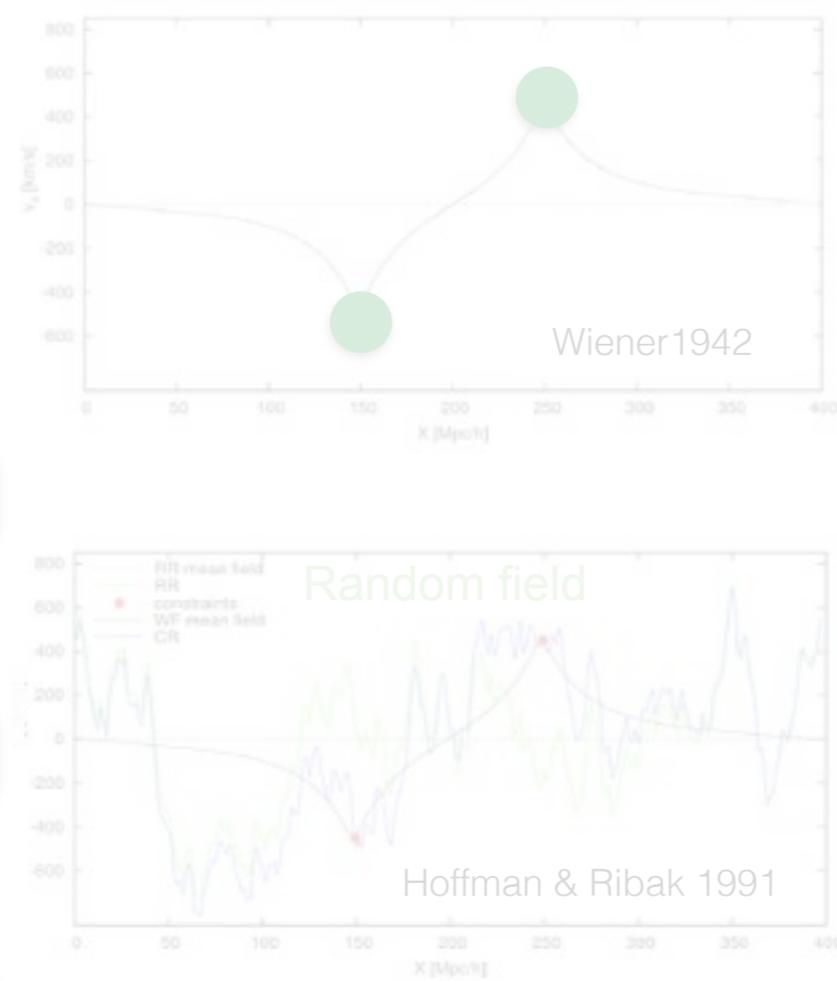
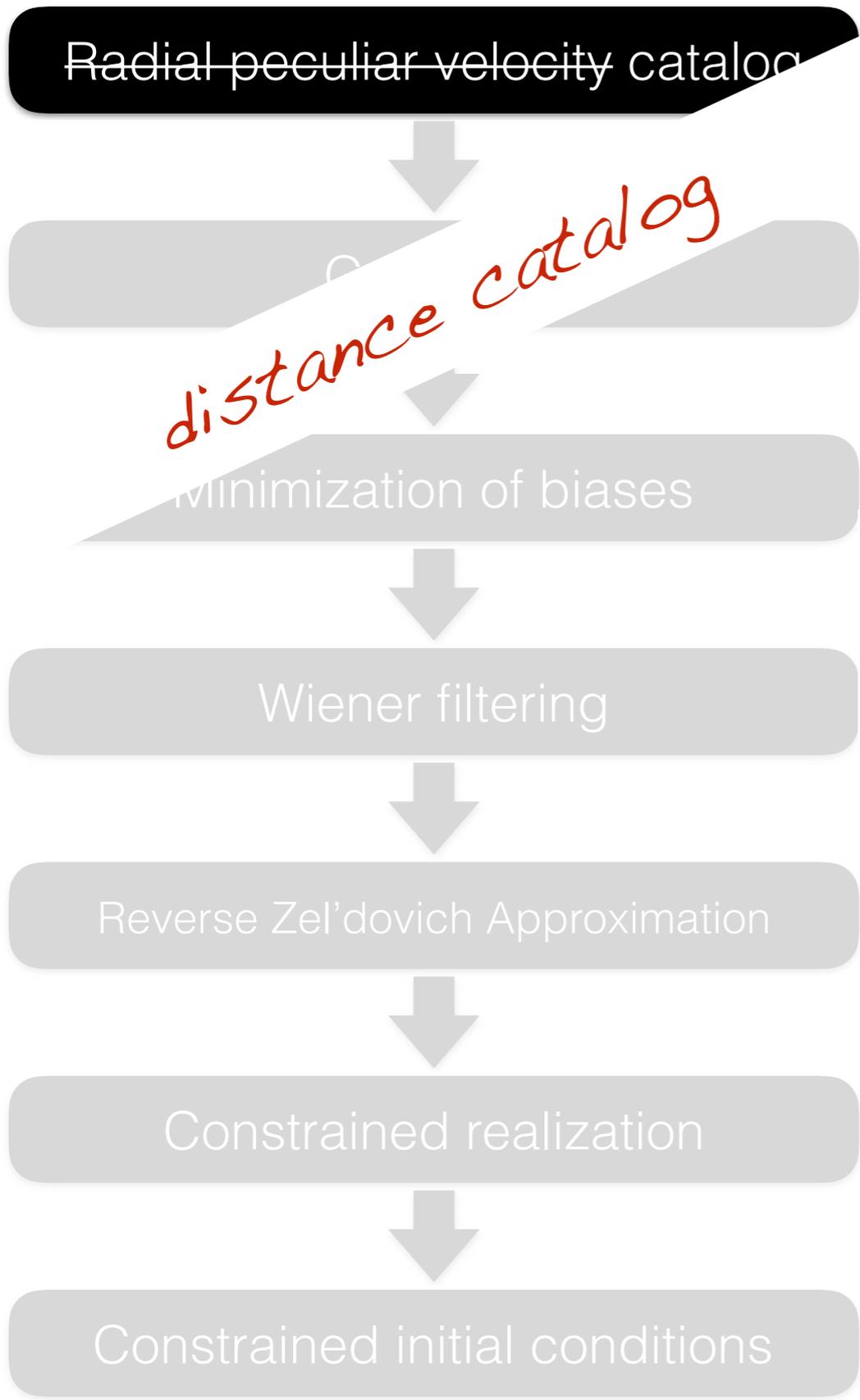
Reverse Zel'dovich Approximation

Constrained realization

Constrained initial conditions



# Method



# Method

Radial peculiar velocity catalog

Grouping

Minimization of biases

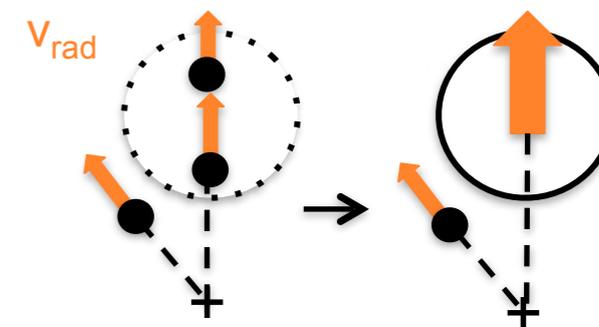
Wiener filtering

Reverse Zel'dovich Approximation

Constrained realization

Constrained initial conditions

Sorce & Tempel 2017,2018



*Distance (modulus) of the group and its uncertainty*

$$\mu_g = \frac{\sum w \times \mu}{\sum w} ; \sigma_{\mu g} = \sqrt{\frac{1}{\sum w}} \text{ where } w = \frac{1}{\sigma_{\mu}^2},$$

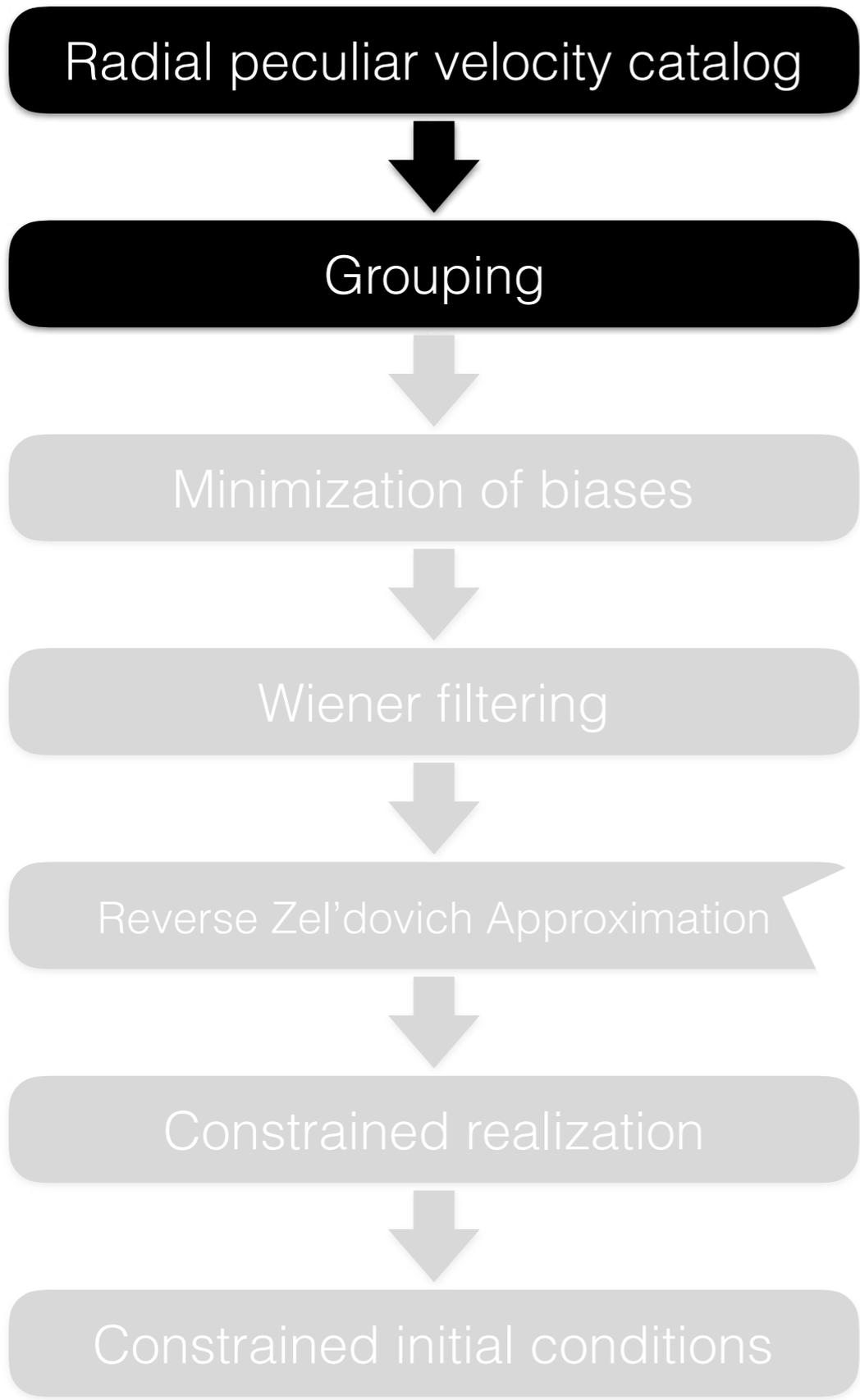
$$d_g = 10^{\frac{\mu_g - 25}{5}} ; \sigma_{d g} = \sigma_{\mu g} \times \frac{\log(10)}{5}$$

*Peculiar velocity of the group and its uncertainty*

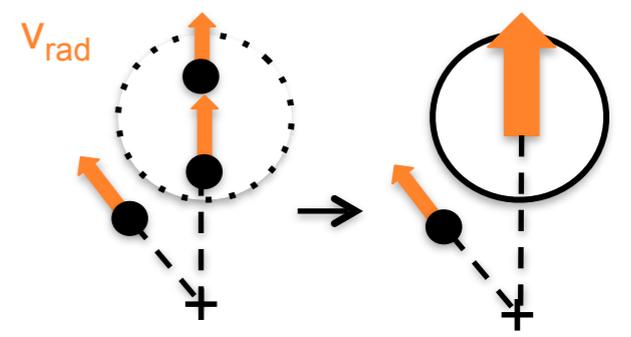
$$v_{\text{pec } g} = v_{\text{tot } g} - H_0 \times d_g ; \sigma_{v_{\text{pec } g}} = \sigma_{d g} \times d_g \times H_0$$



# Method



Sorce & Tempel 2017,2018



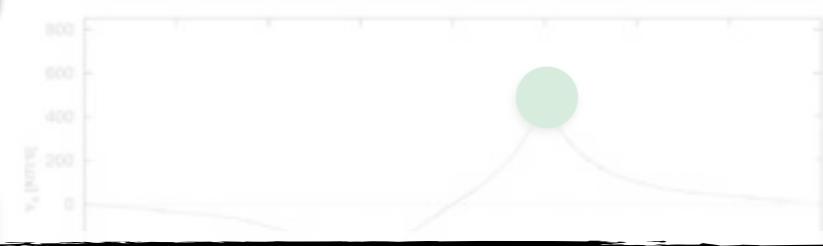
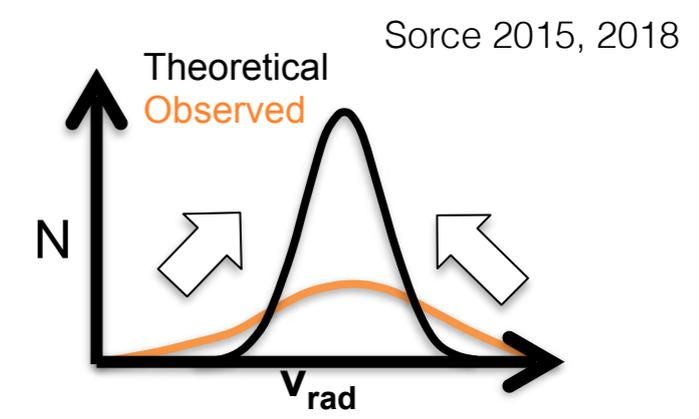
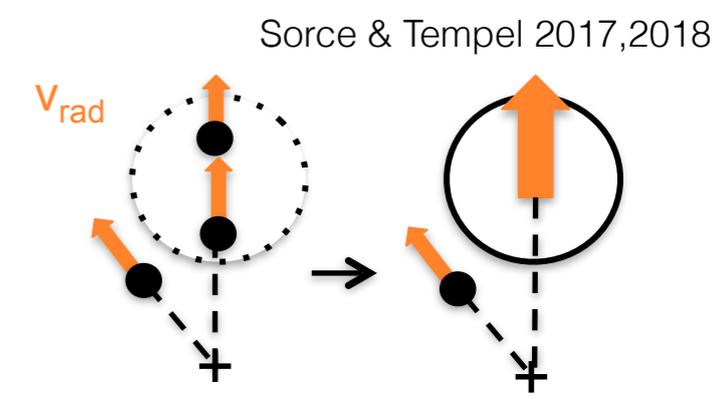
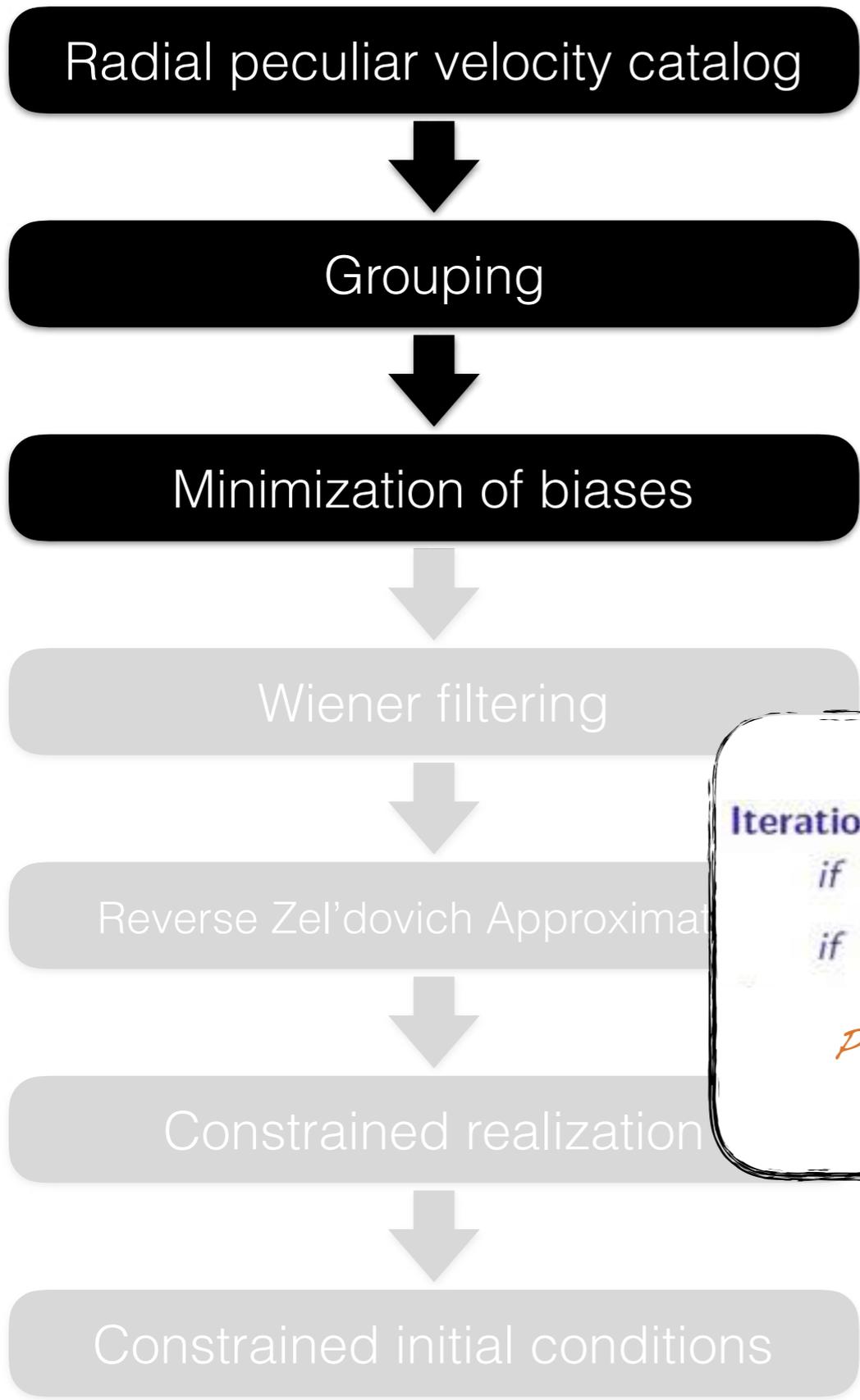
*Distance (modulus) of the group and its uncertainty*

$$\mu_g = \frac{\sum w \times \mu}{\sum w}; \sigma_{\mu g} = \sqrt{\frac{\sum w \times \mu^2}{\sum w} - \mu_g^2}$$

*The difficulty is to determine properly the groups!*

$$v_g = H_0 \times d_g; \sigma_{vpec g} = \sigma_{dg} \times d_g \times H_0$$


# Method



*Corrected peculiar velocities*

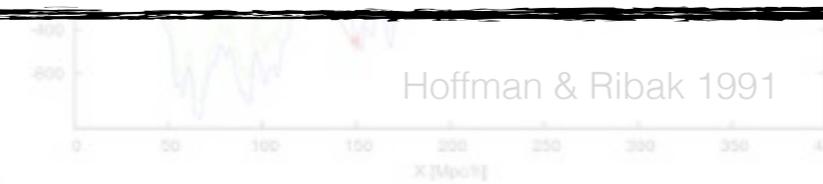
**Iterations on:**

if  $v_{pec} > 0$ ,  $v_{pec c} = (1 - w)[p(v_{pec} - \sigma_{v_{pec}}) + (1 - p)(v_{pec} + \sigma_{v_{pec}})] + w v_{pec}$

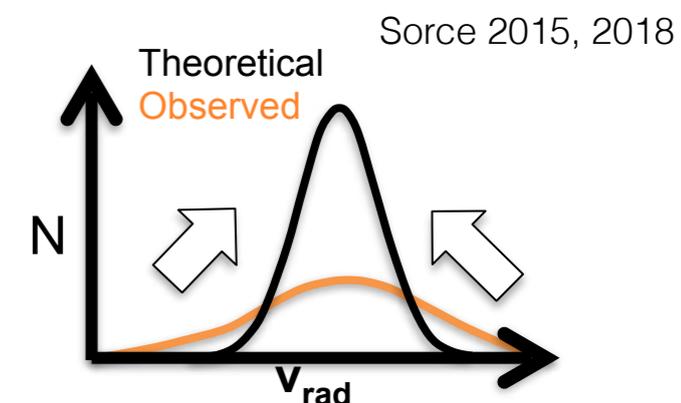
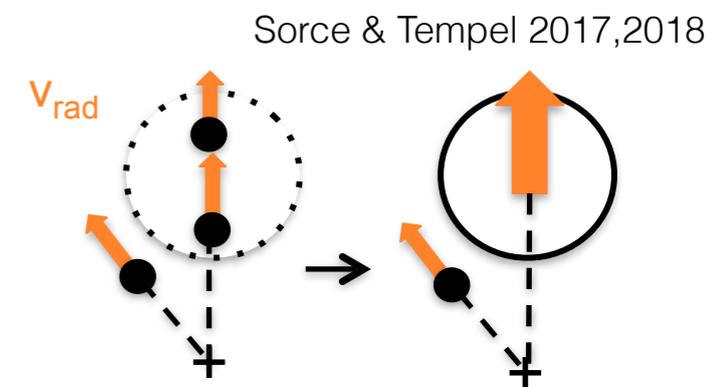
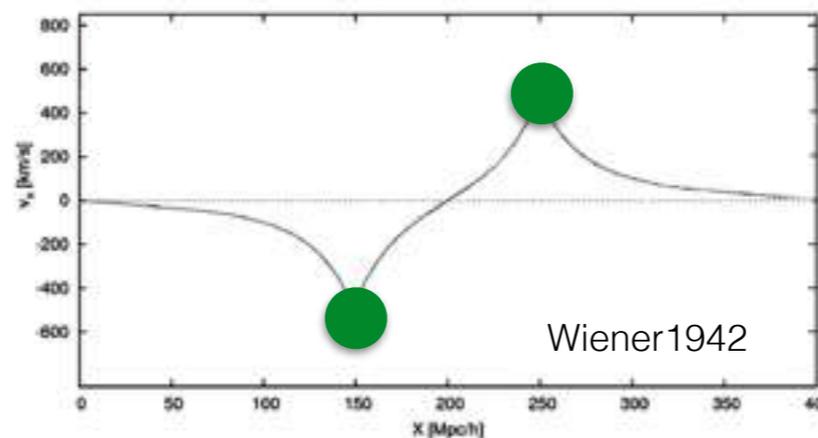
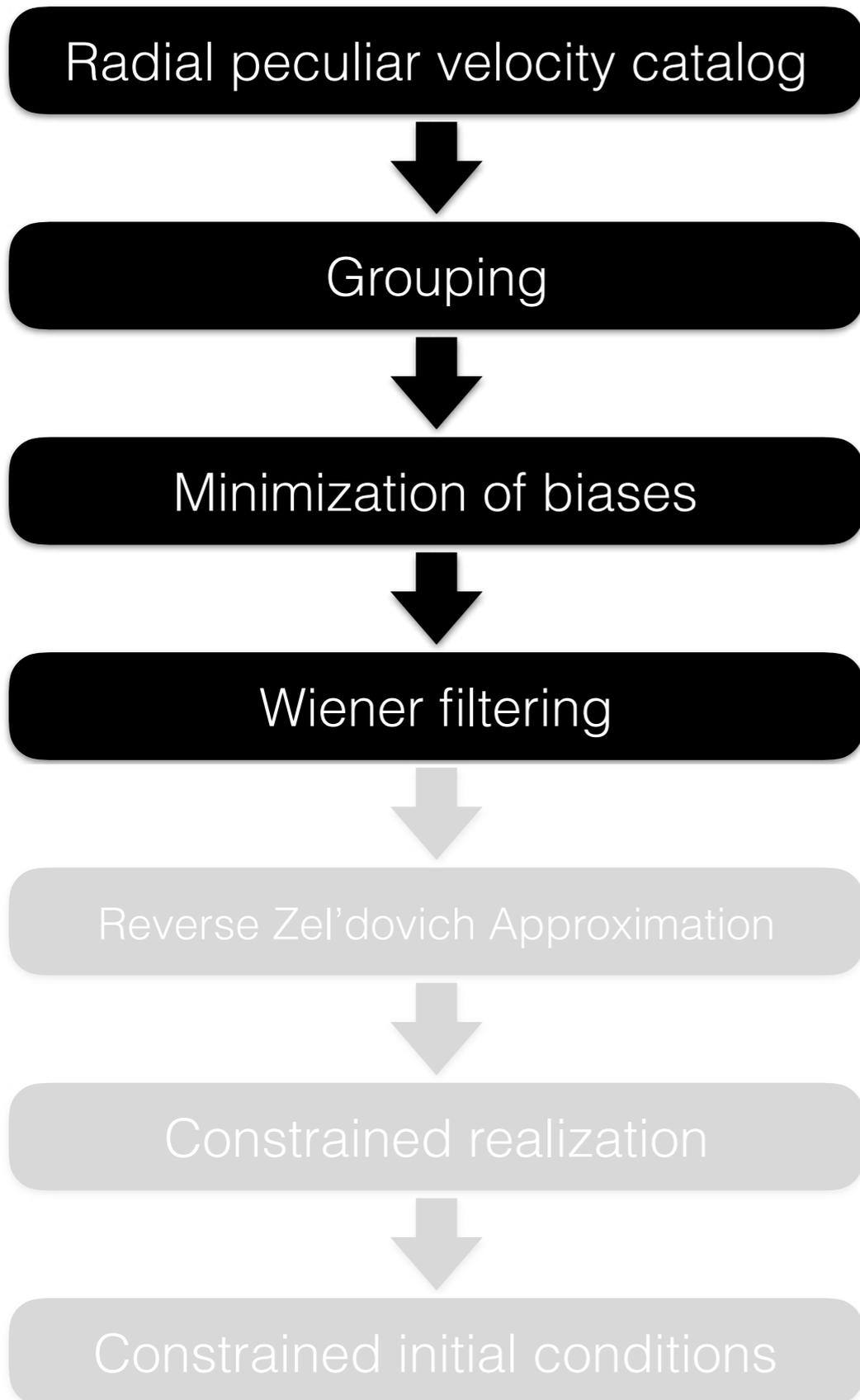
if  $v_{pec} < 0$ ,  $v_{pec c} = (1 - w)[p(v_{pec} + \sigma_{v_{pec}}) + (1 - p)(v_{pec} - \sigma_{v_{pec}})] + w v_{pec}$

*Probability & Gaussian*      *Weighted uncertainty*

*Final uncertainty  $\propto d$  &  $n_{constraints}$*



# Method



Doumler+2013 Sorce+2014

*Linear minimum variance estimator*

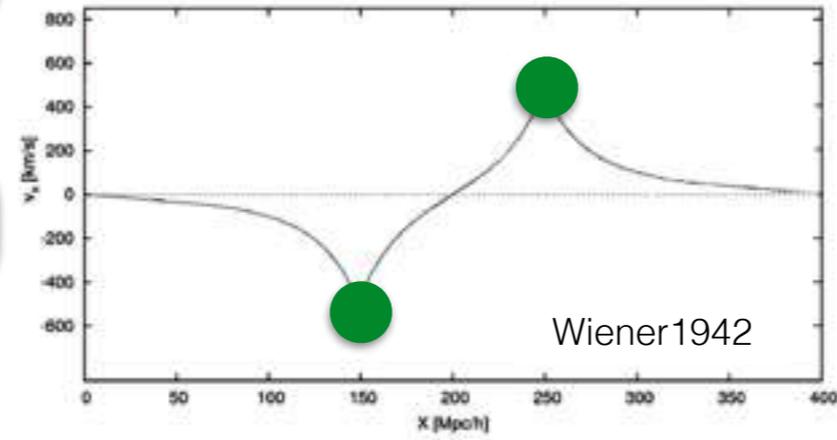
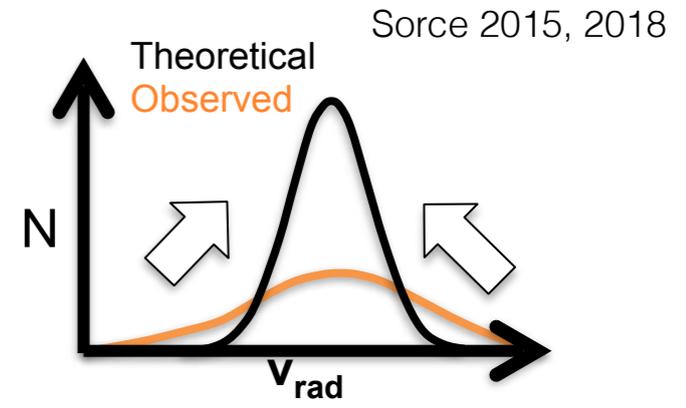
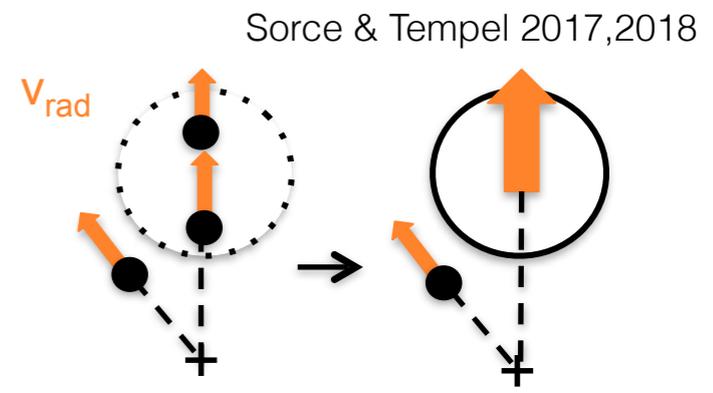
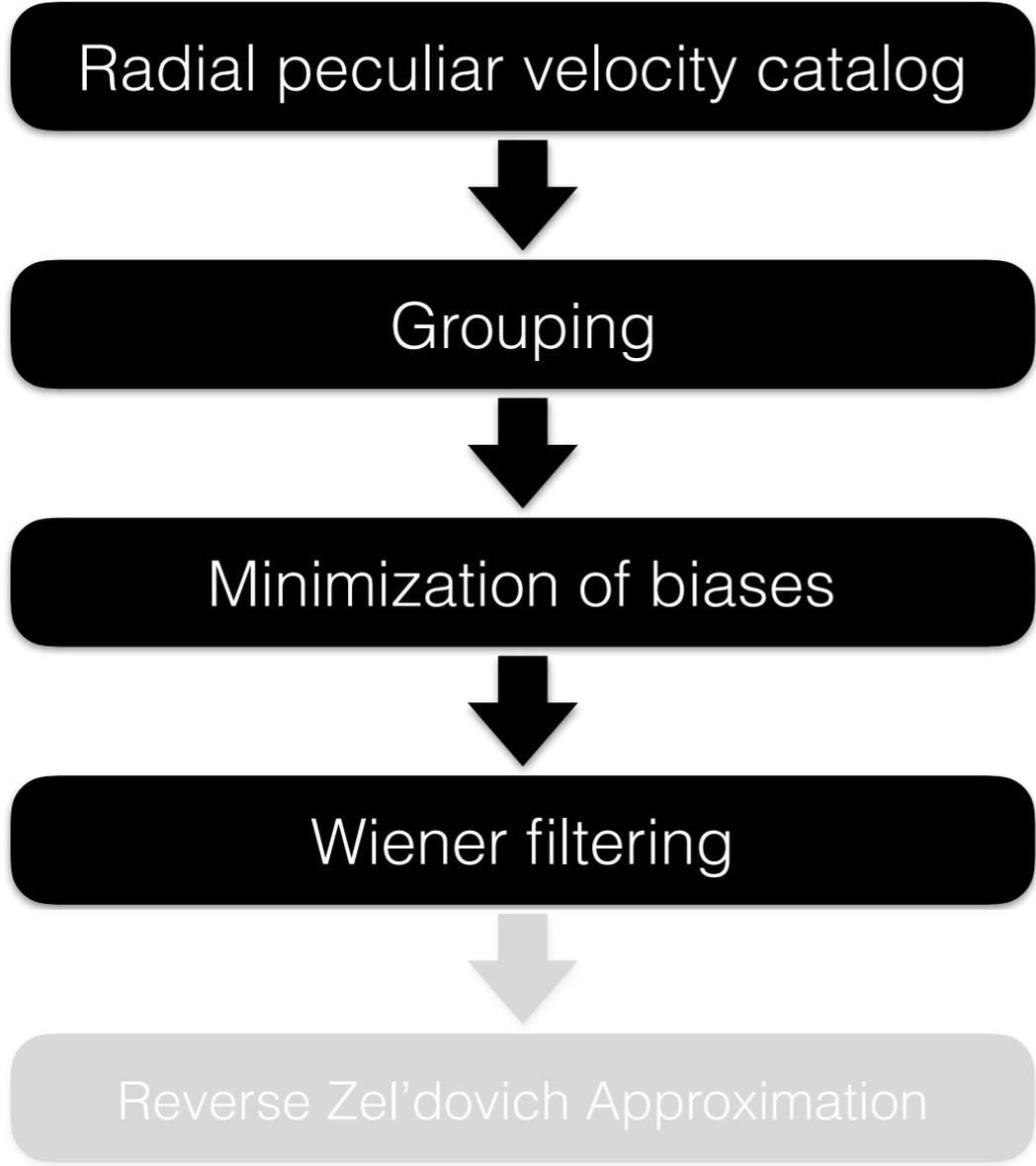
*Model*

$$f_i = \sum_{j=1}^n \sum_{i=1}^n \langle f_i c_i \rangle \langle c_i c_j \rangle^{-1} c_j$$

*Correlation functions*

*Data = constraints*

# Method



Doumler+2013 Sorce+2014

*power spectrum*

$$\langle \delta(\mathbf{r}') v_\alpha(\mathbf{r}'+\mathbf{r}) \rangle = \frac{\dot{a}f}{(2\pi)^3} \int_0^\infty \frac{ik_\alpha}{k^2} P(k) e^{-ik \cdot \mathbf{r}} dk$$

$$\langle v_\alpha(\mathbf{r}') v_\beta(\mathbf{r}'+\mathbf{r}) \rangle = \frac{(\dot{a}f)^2}{(2\pi)^3} \int_0^\infty \frac{k_\alpha k_\beta}{k^4} P(k) e^{-ik \cdot \mathbf{r}} dk$$

*Linear minimum variance estimator*

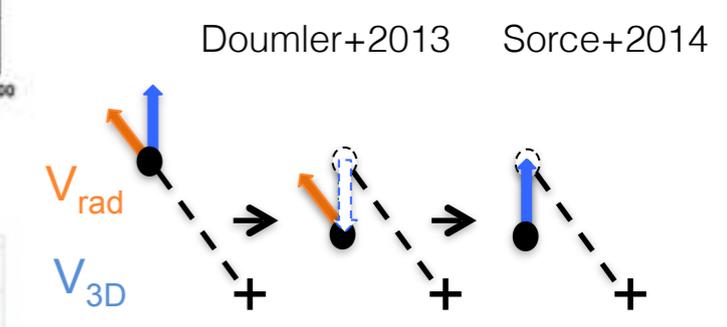
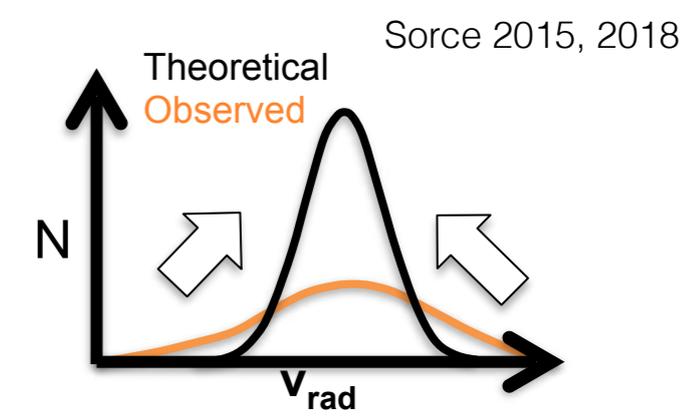
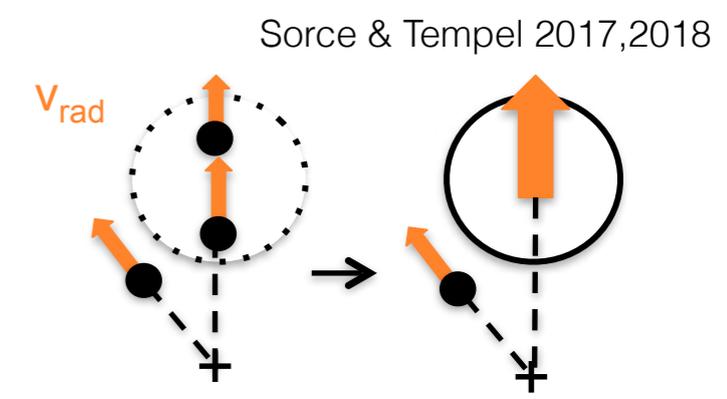
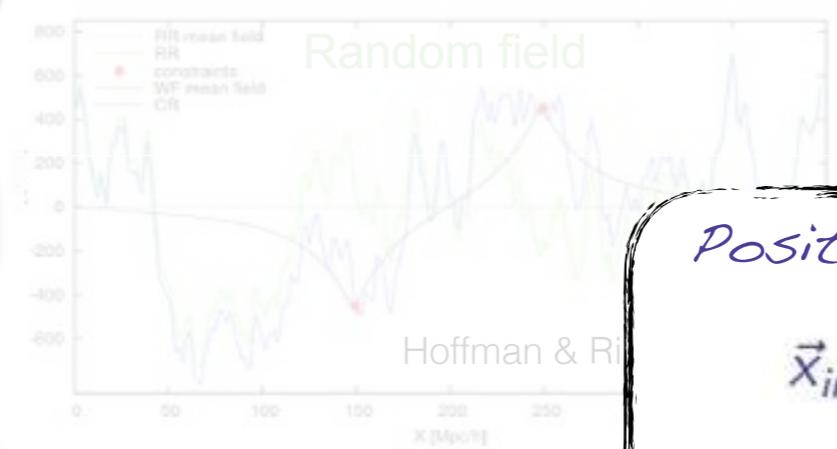
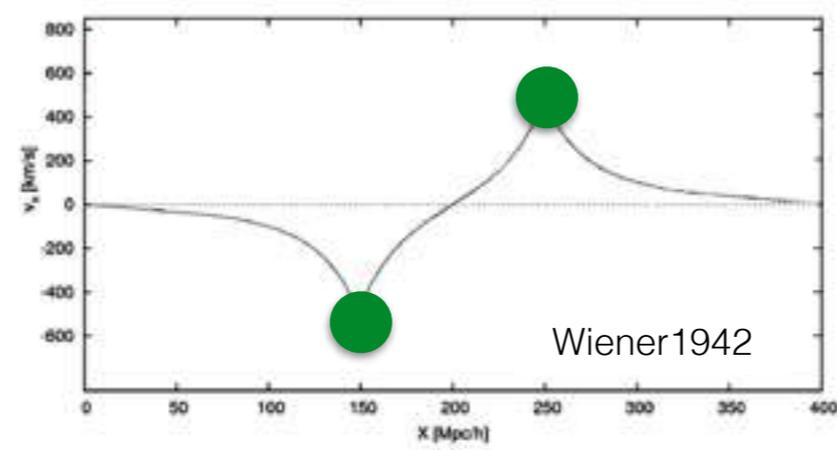
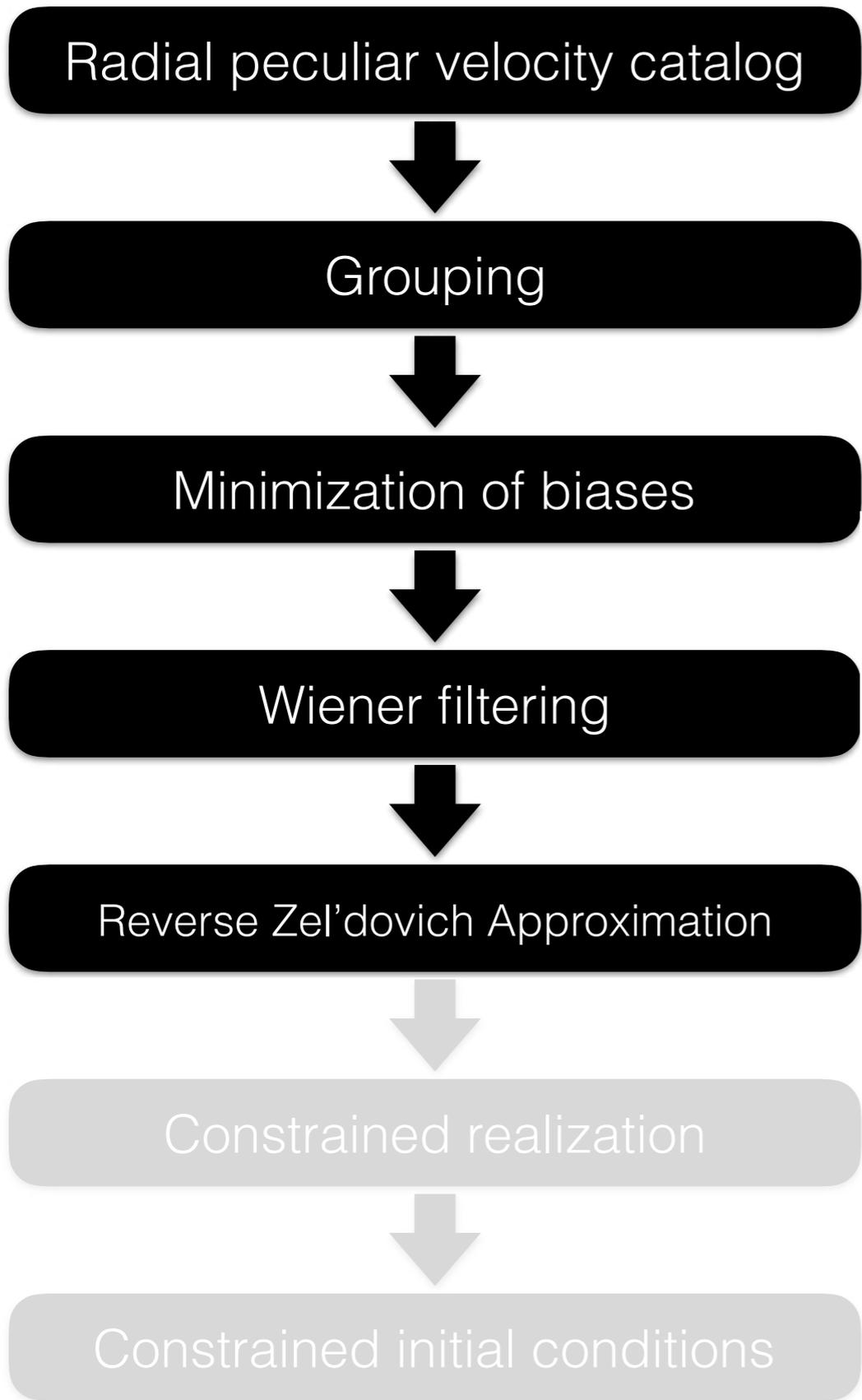
*Model*

$$f_i = \sum_{j=1}^n \sum_{i=1}^n \langle f_i c_i \rangle \langle c_i c_j \rangle^{-1} c_j$$

*Data = constraints*

*Correlation functions*

# Method

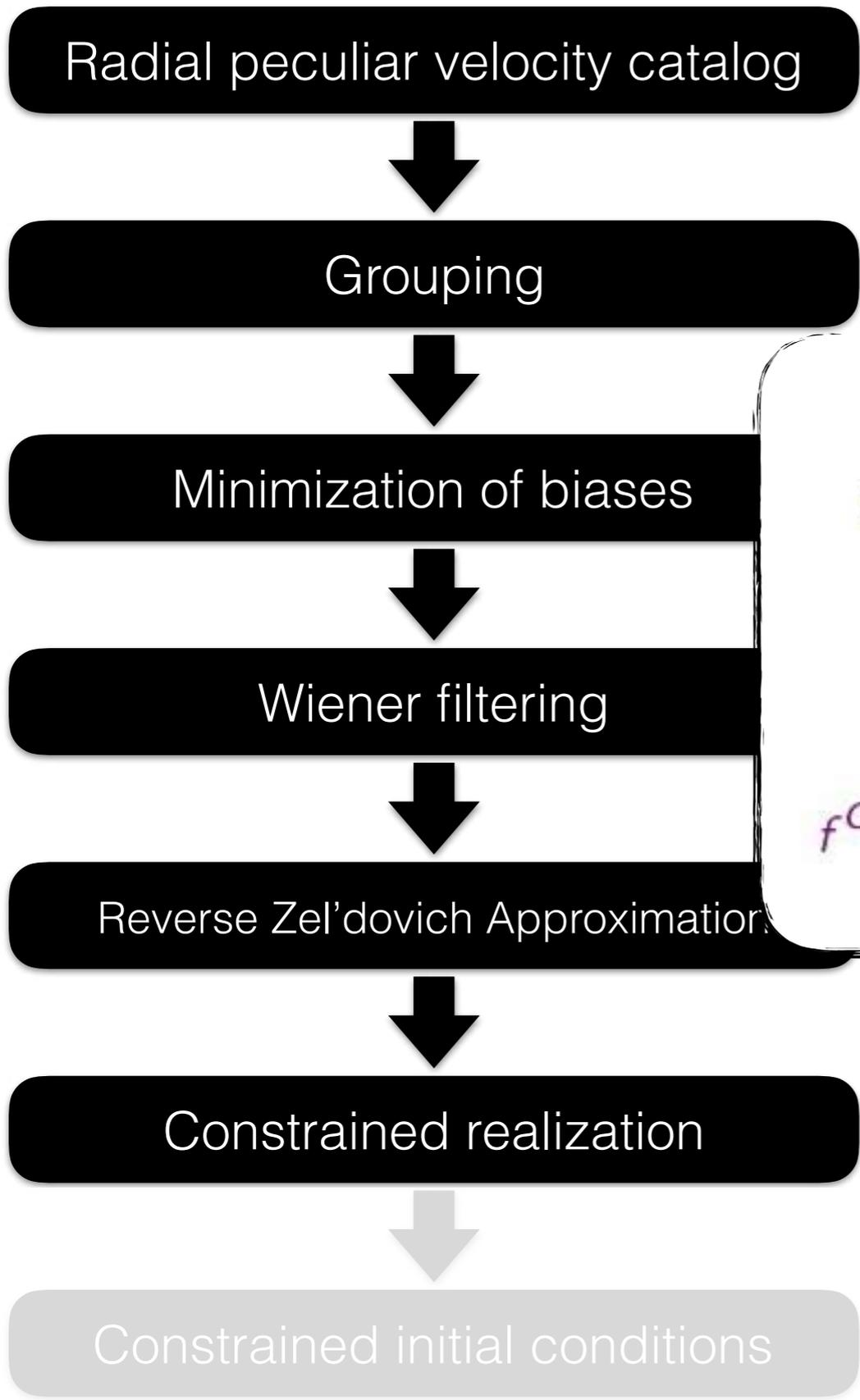


*Position of the progenitors*

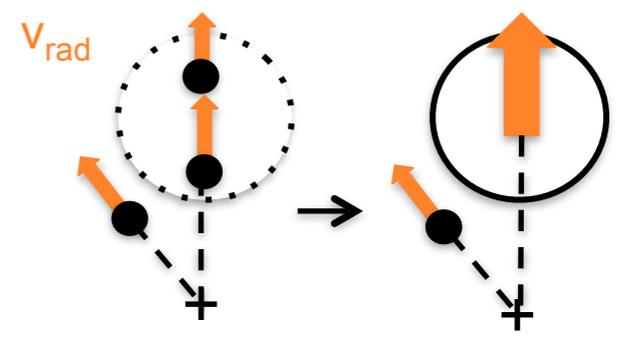
$$\vec{x}_{init}^{RZA} = \vec{r} - \frac{\vec{v}}{H_0 f(t_{init})}$$

*growth rate*

# Method



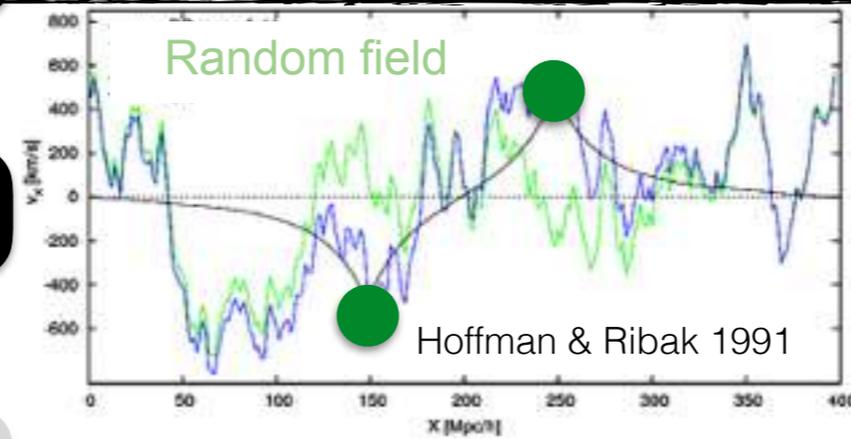
Sorce & Tempel 2017, 2018



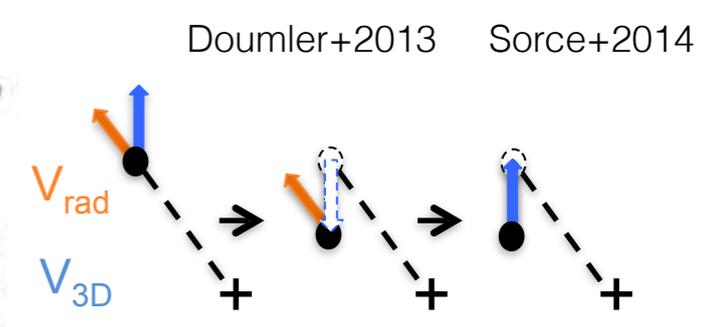
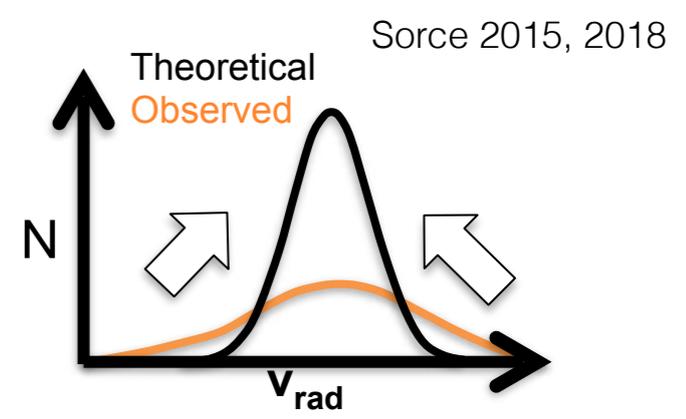
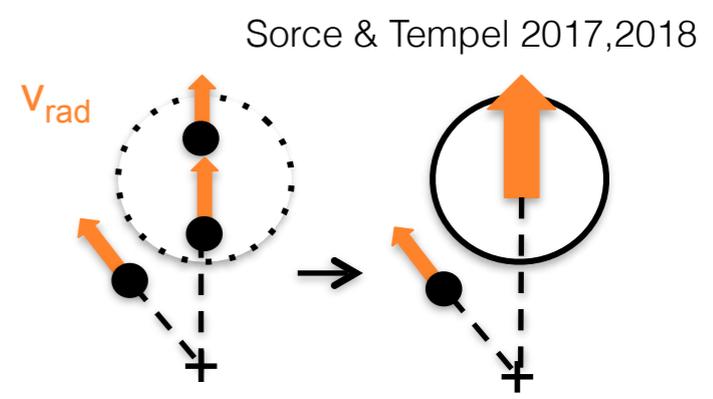
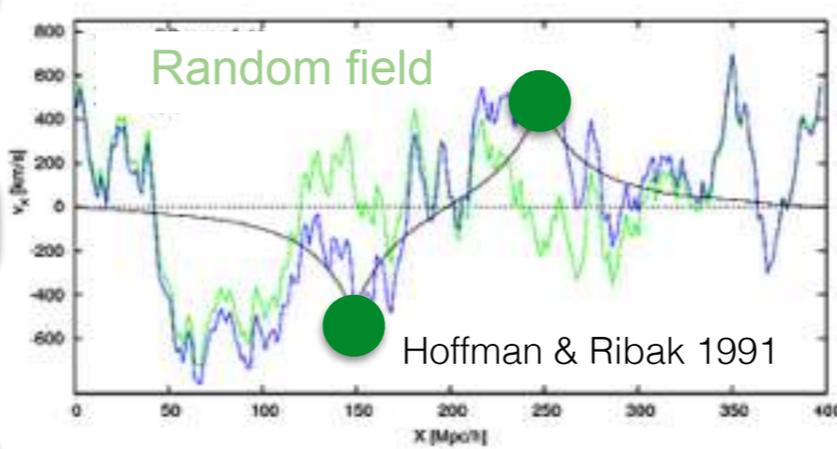
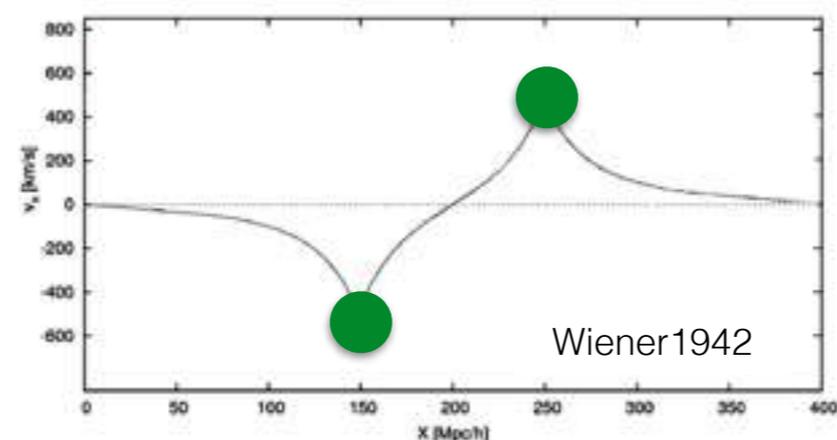
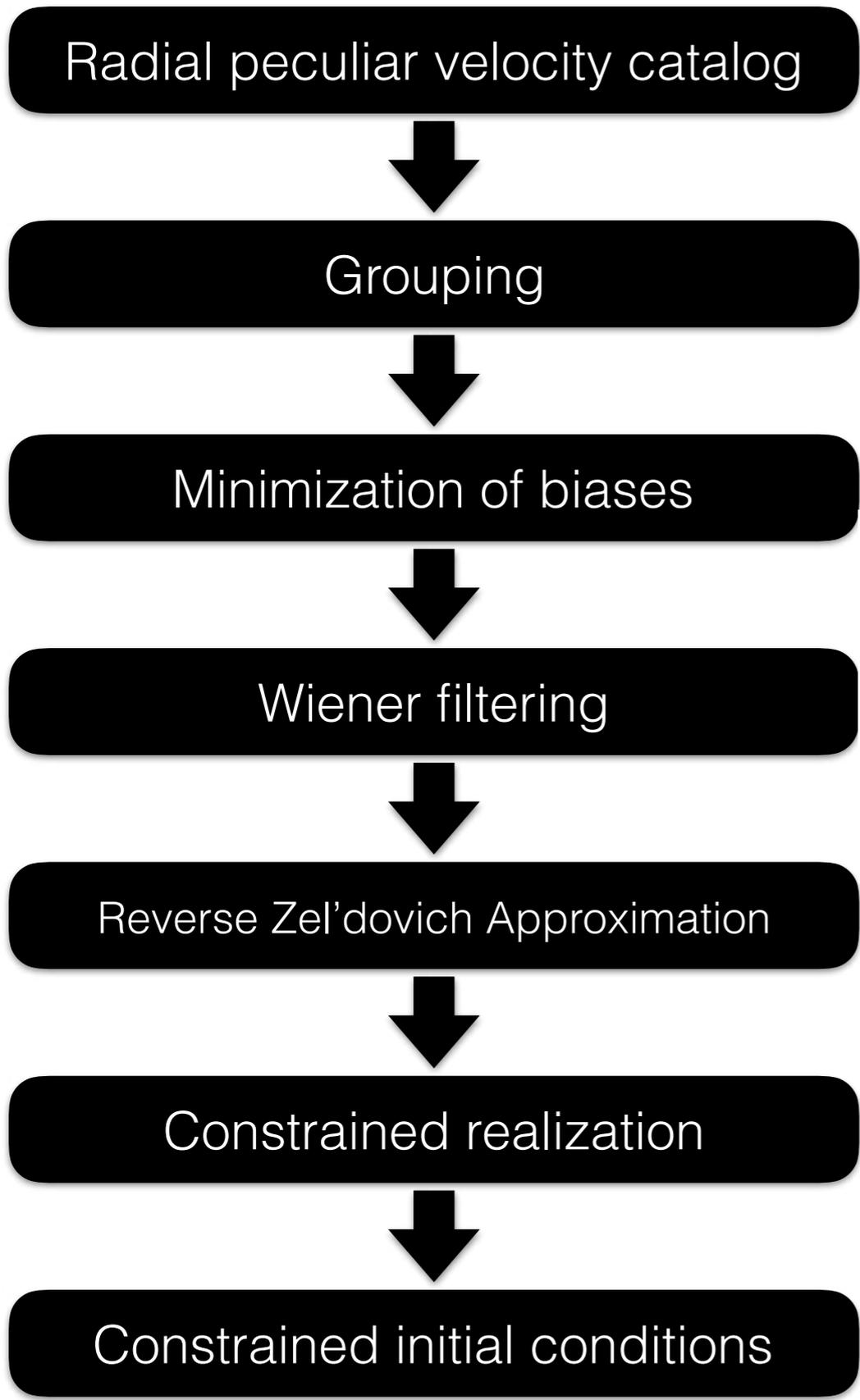
*Constrained Realization: Estimate of the residual*

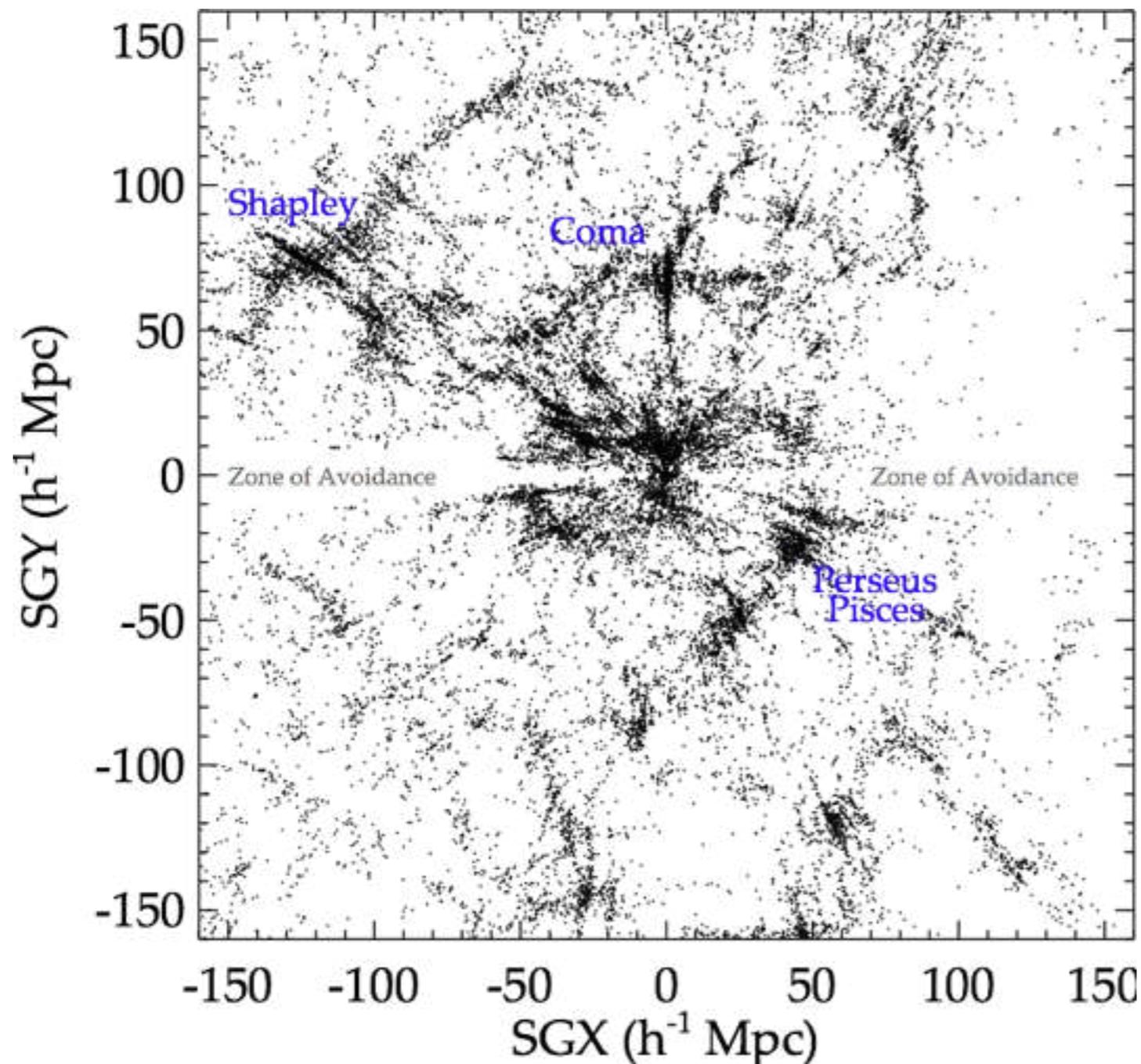
$$\tilde{R} = \tilde{f}^{RR} - \tilde{f}^{WF} \quad \& \quad \tilde{f}^{WF} = \sum_{j=1}^n \sum_{i=1}^n \langle f_i \tilde{C}_i \rangle \langle \tilde{C}_i \tilde{C}_j \rangle^{-1} \tilde{C}_j$$

*Correlation functions depend only on the model*

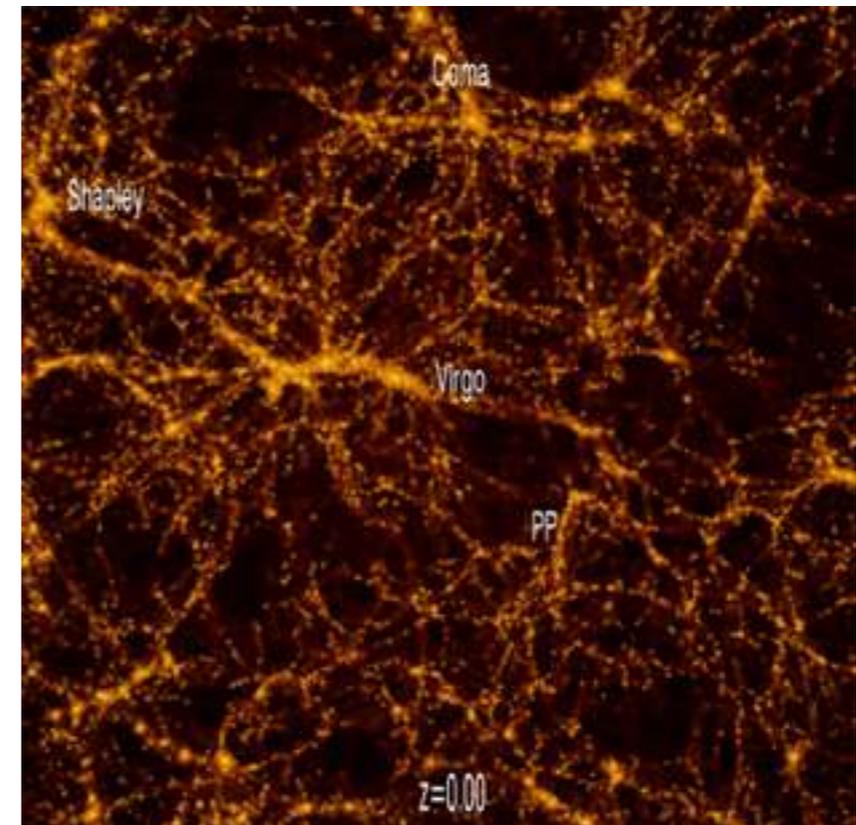
$$f^{CR} = f^{WF} + \tilde{R} = \tilde{f}^{RR} + \sum_{j=1}^n \sum_{i=1}^n \langle f_i C_i \rangle \langle C_i C_j \rangle^{-1} (C_j - \tilde{C}_j)$$


# Method

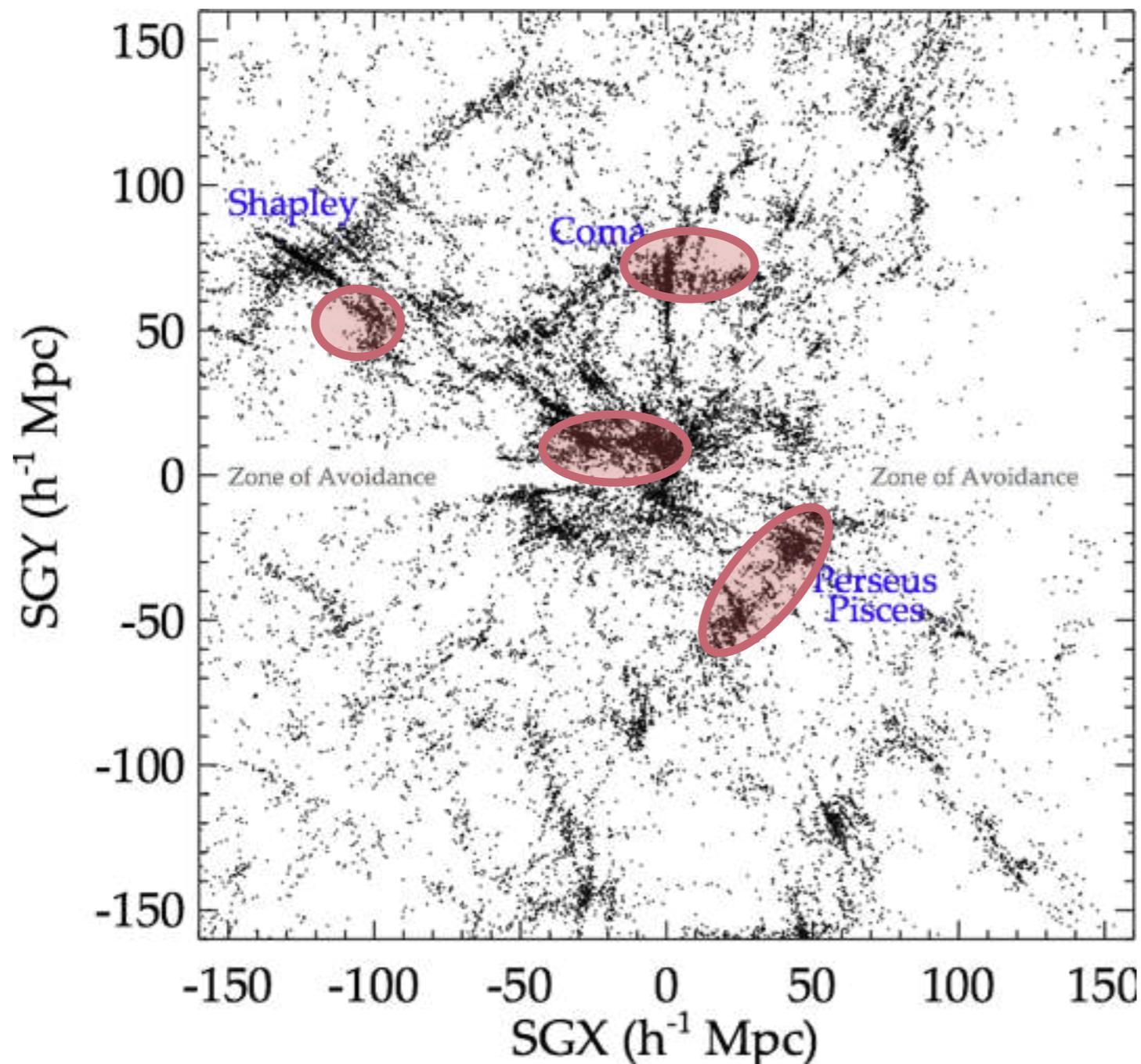




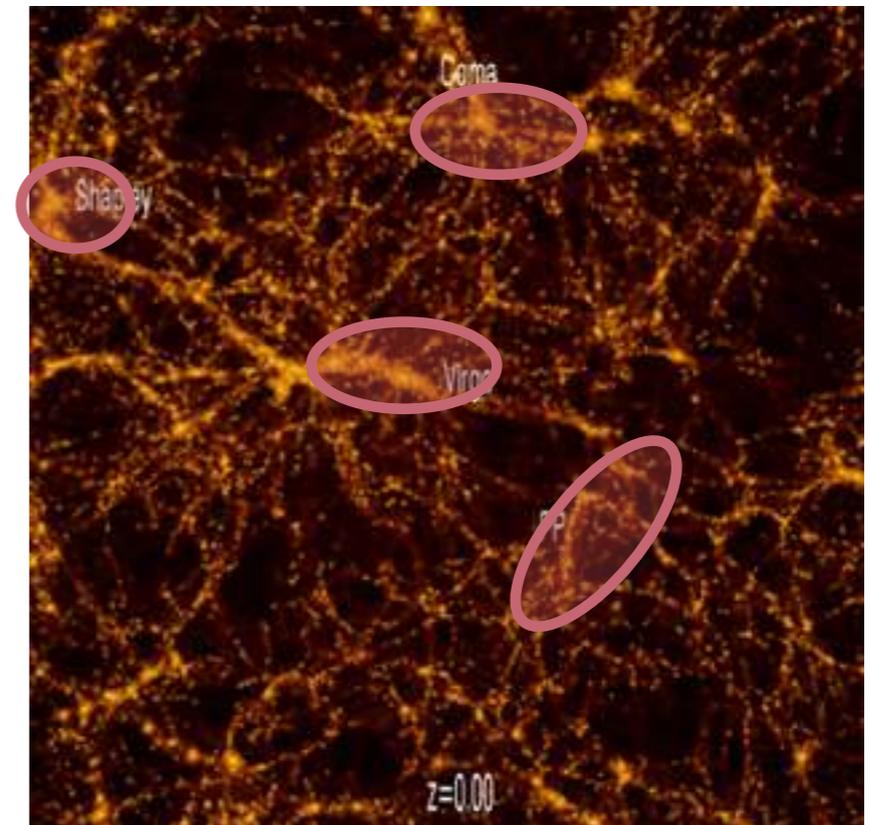
Note the fingers of gods



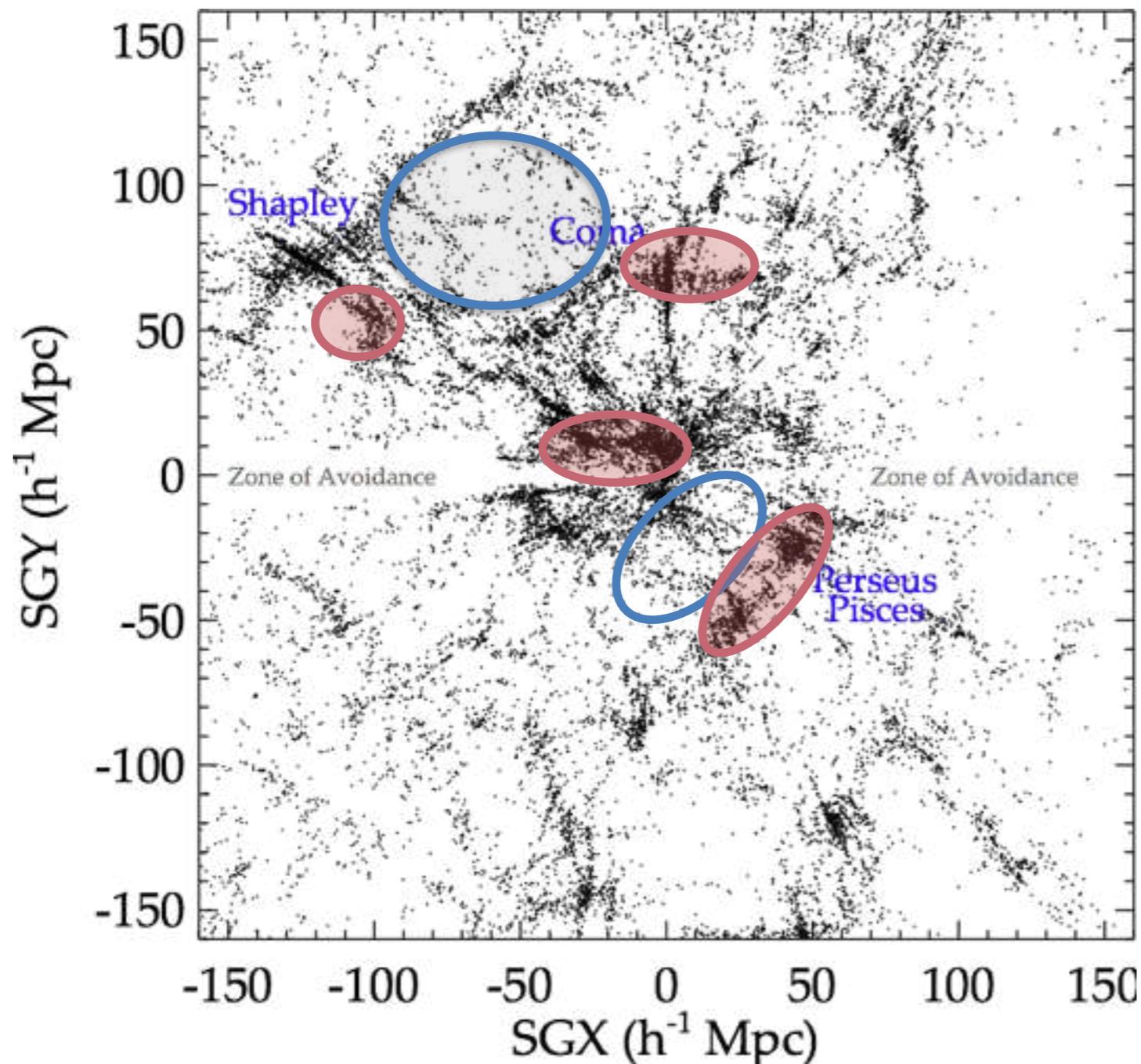
500 Mpc/h,  $1024^3$  particles, DM only, Planck cosmology



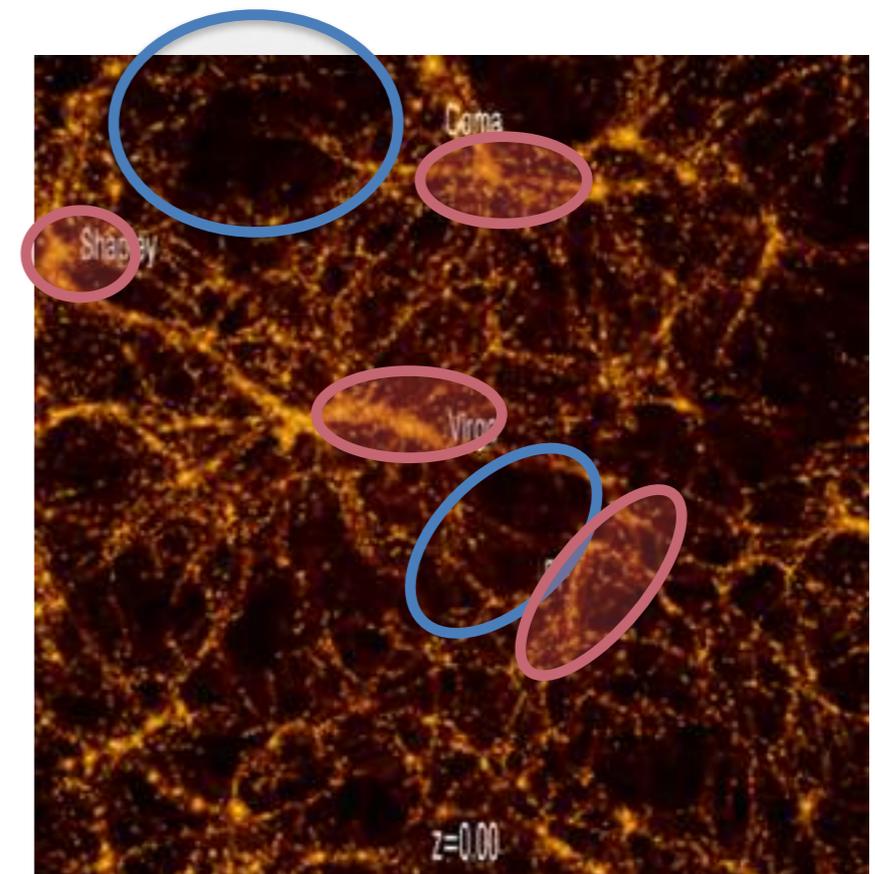
Note the fingers of gods



500 Mpc/h,  $1024^3$  particles, DM only, Planck cosmology

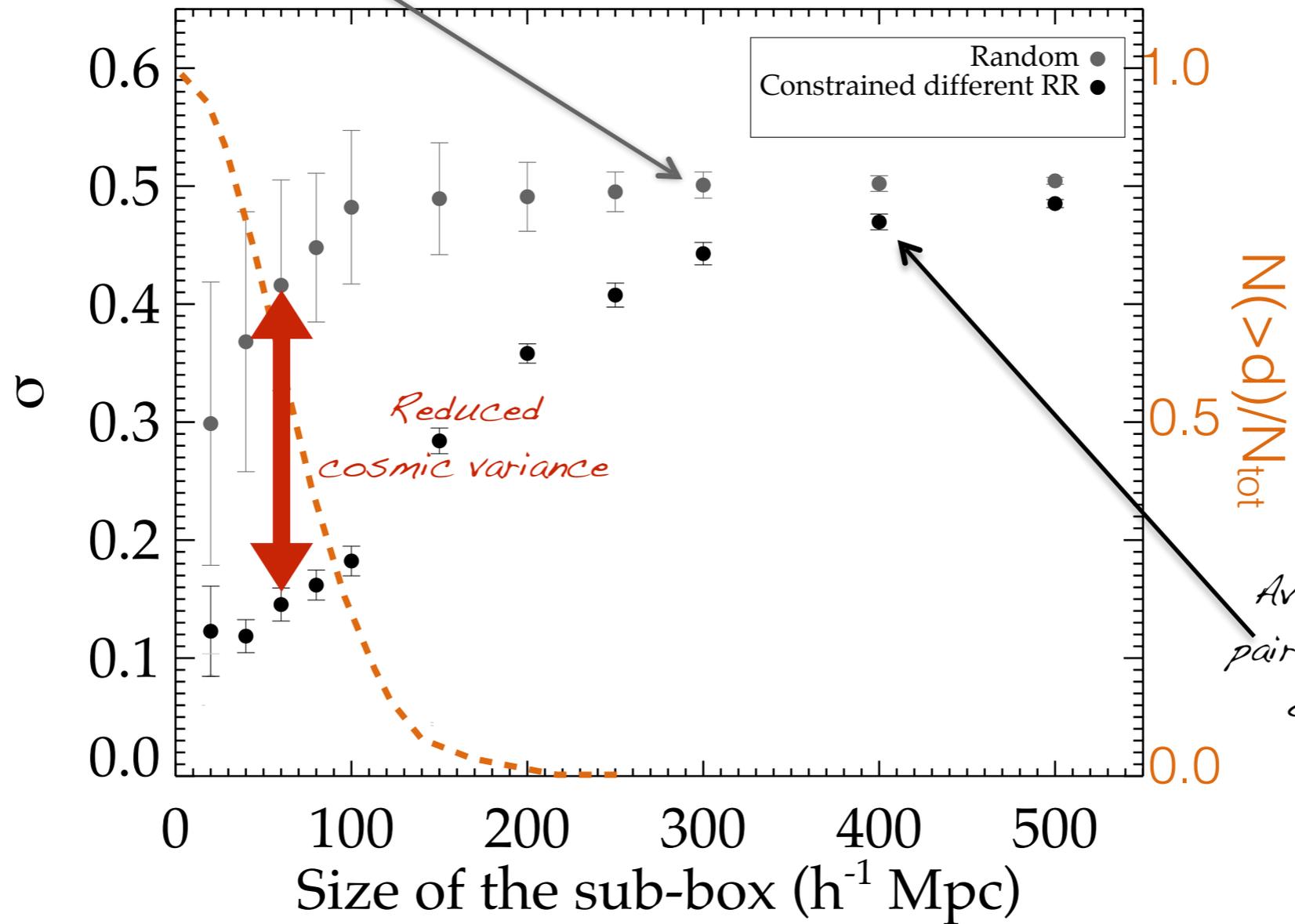


Note the fingers of gods

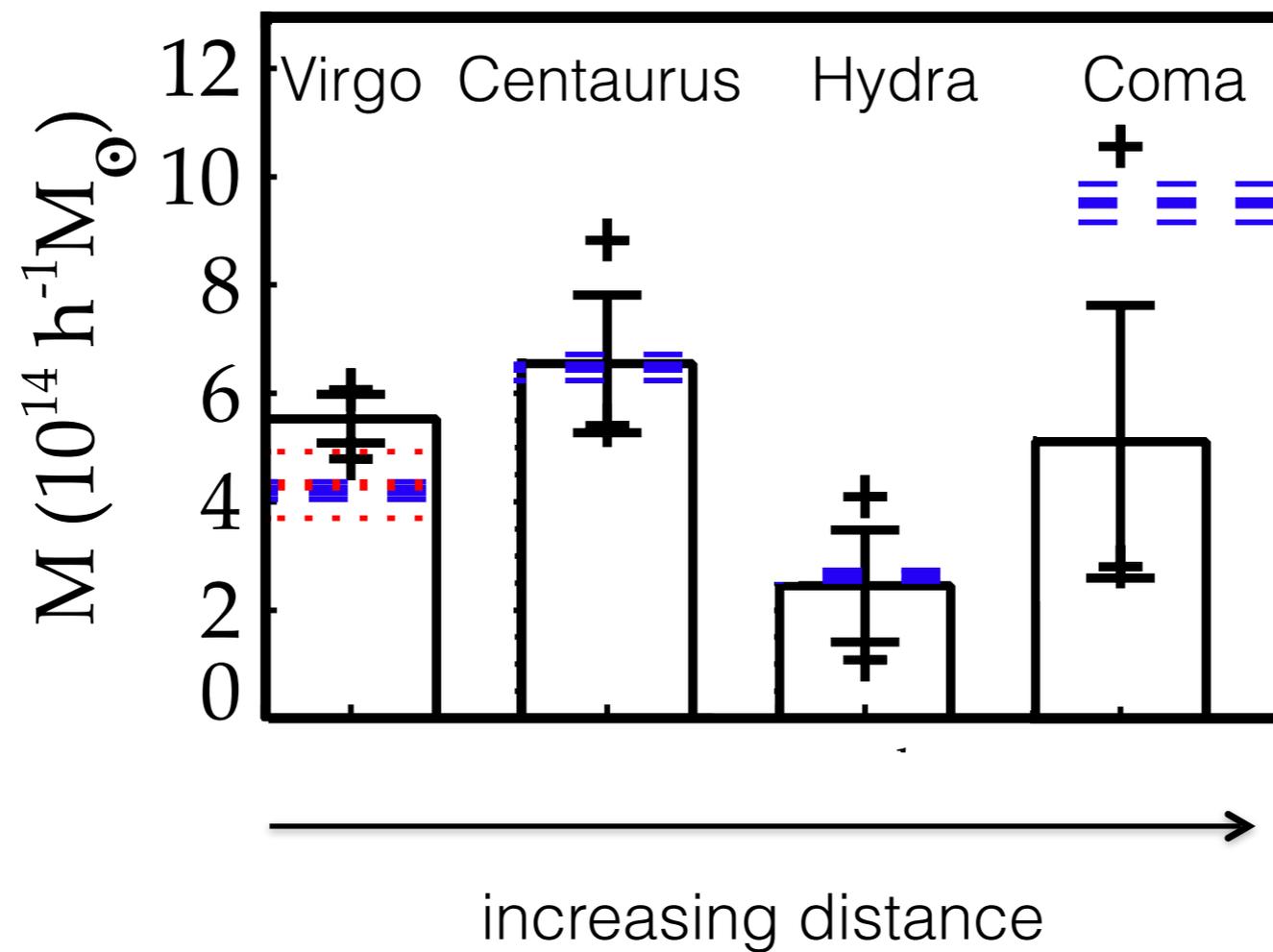


500 Mpc/h,  $1024^3$  particles,  
DM only, Planck cosmology

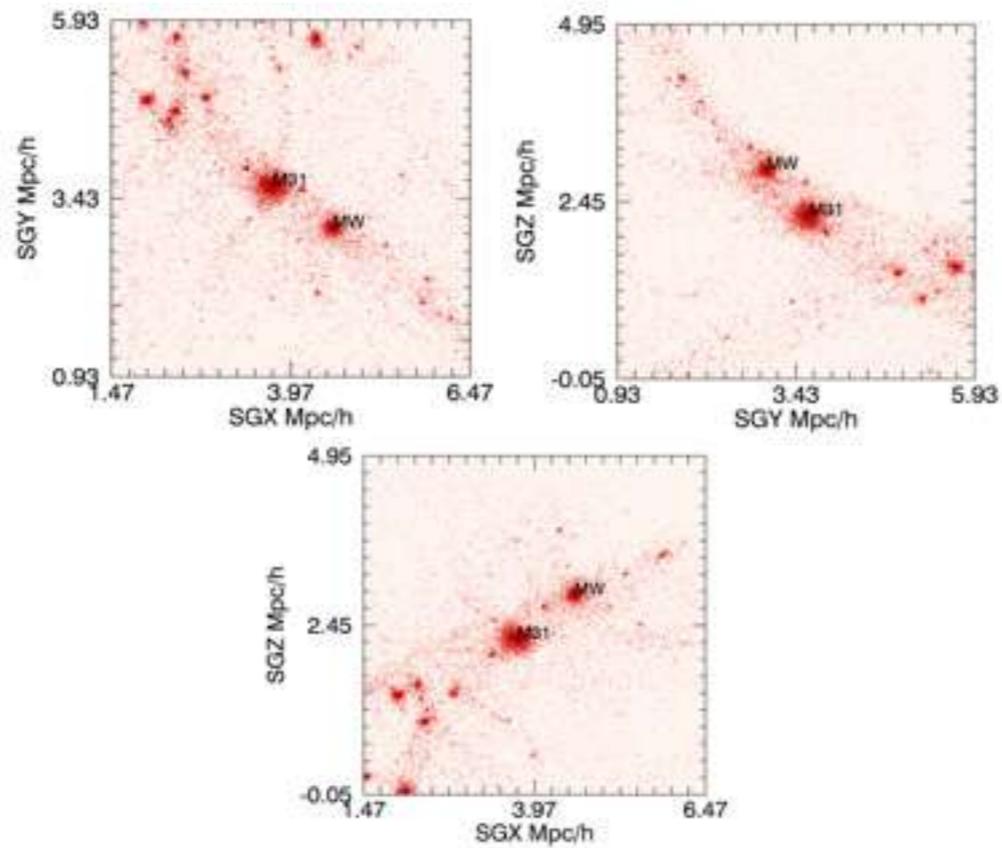
*Average variance between pairs of random fields of 300 Mpc/h aside*



Dark matter halos = counterparts of observed local clusters

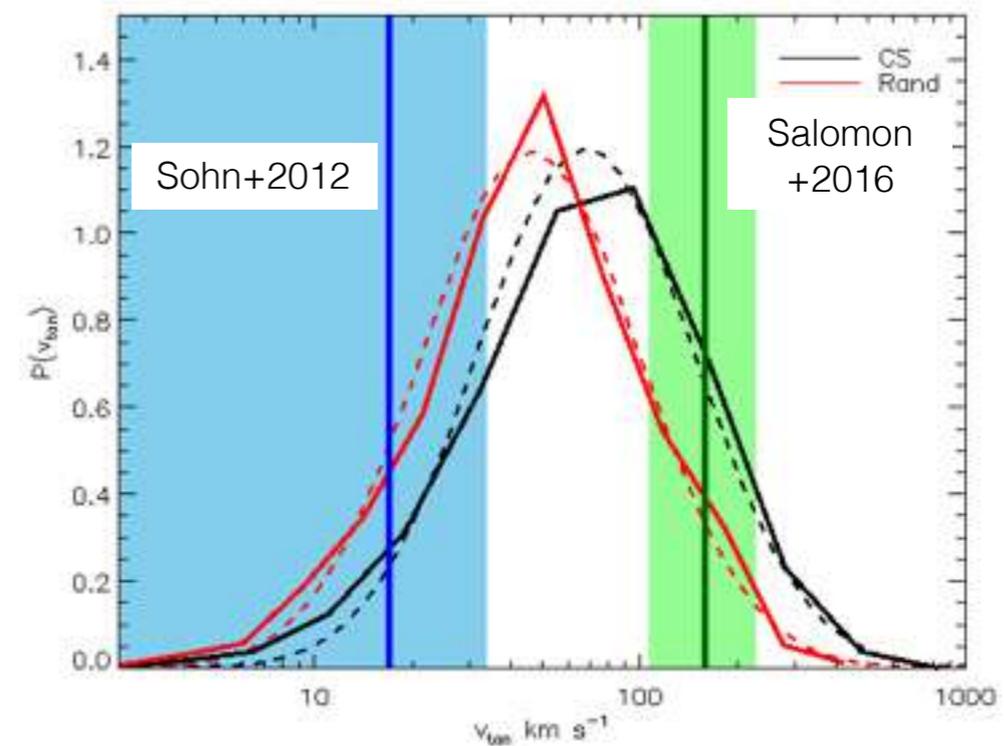


# Results: the Local Group CLONES = HESTIA $\rightarrow$ $z=0$ , group scale



induced by the local environment,  
not directly constrained  
(non-linear scales)

An example of  
application: in favor of a  
higher tangential velocity



Carlesi, Sorce+2016

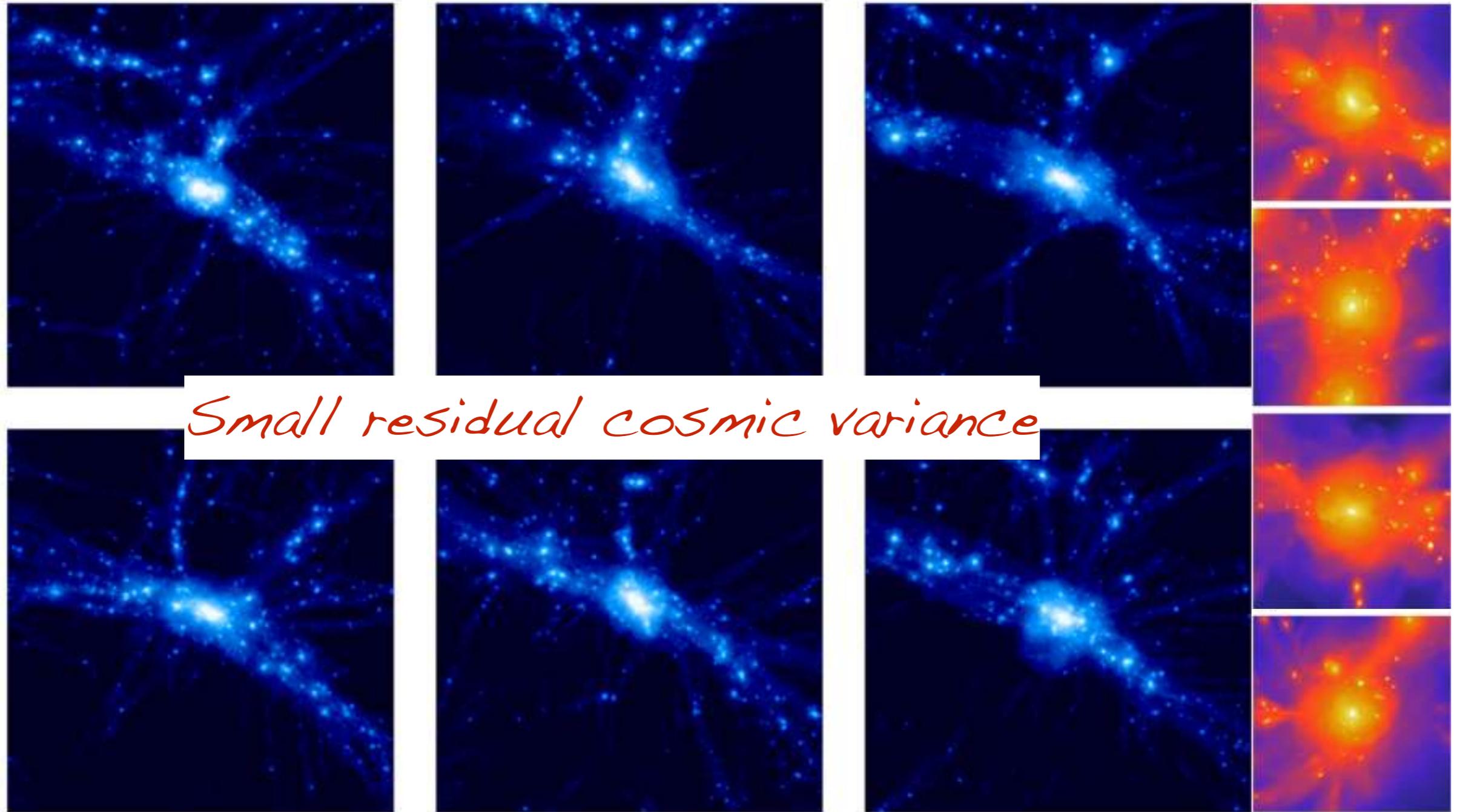
Carlesi, Hoffman, Sorce+2016

Carlesi, Hoffman, Sorce+2017

Libeskind+(including Sorce)2020

# The Virgo galaxy cluster CLONE

## Simulated Virgo & Random clusters

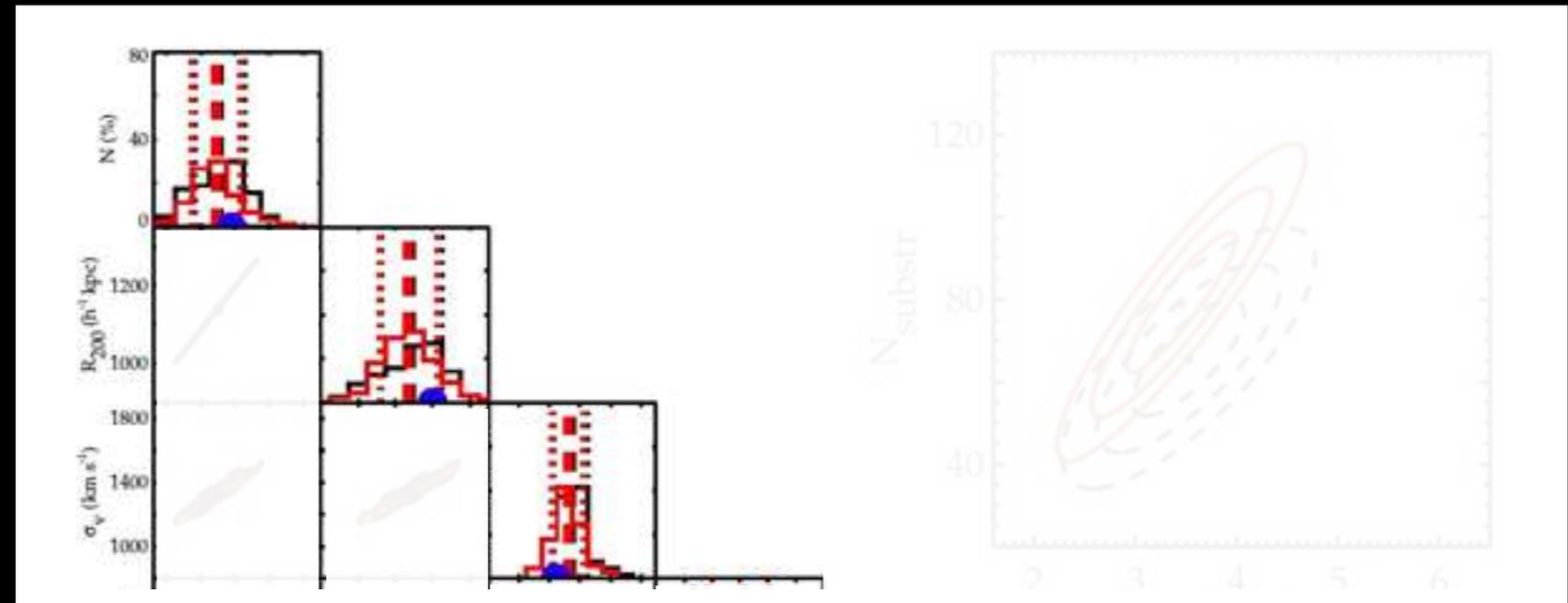


*Small residual cosmic variance*

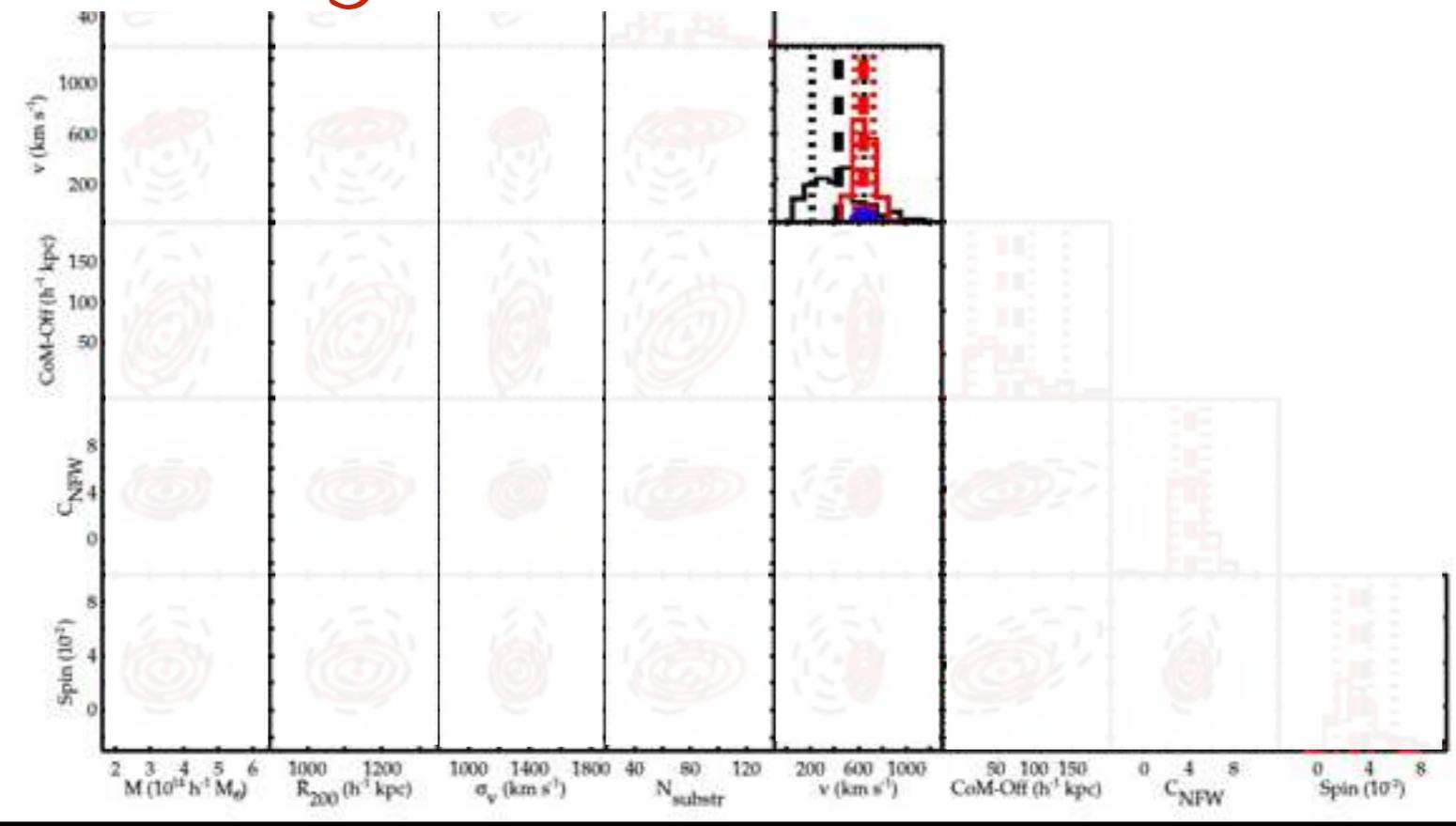
Rhapsody (Hahn +2017)

500 Mpc/h,  $2048^3$  particles effective (20 Mpc/h zoom), 3.8 kpc/h, DM only, Planck cosmology

# The Virgo galaxy cluster CLONE

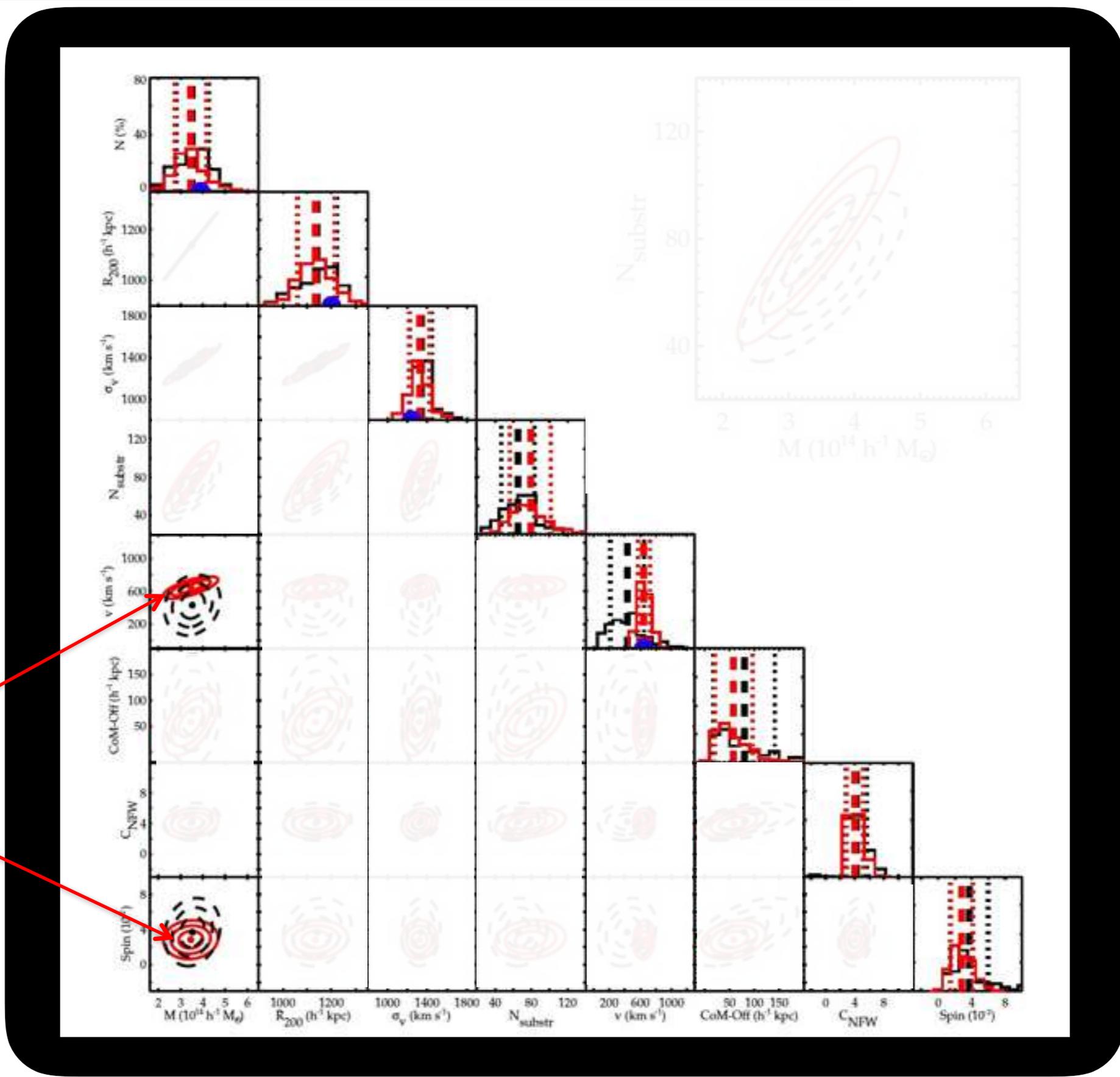


*Overall agreement with observations*



Sorce, Blaizot, Dubois 2019

# The Virgo galaxy cluster CLONE



Velocity

Spin

→ Environment

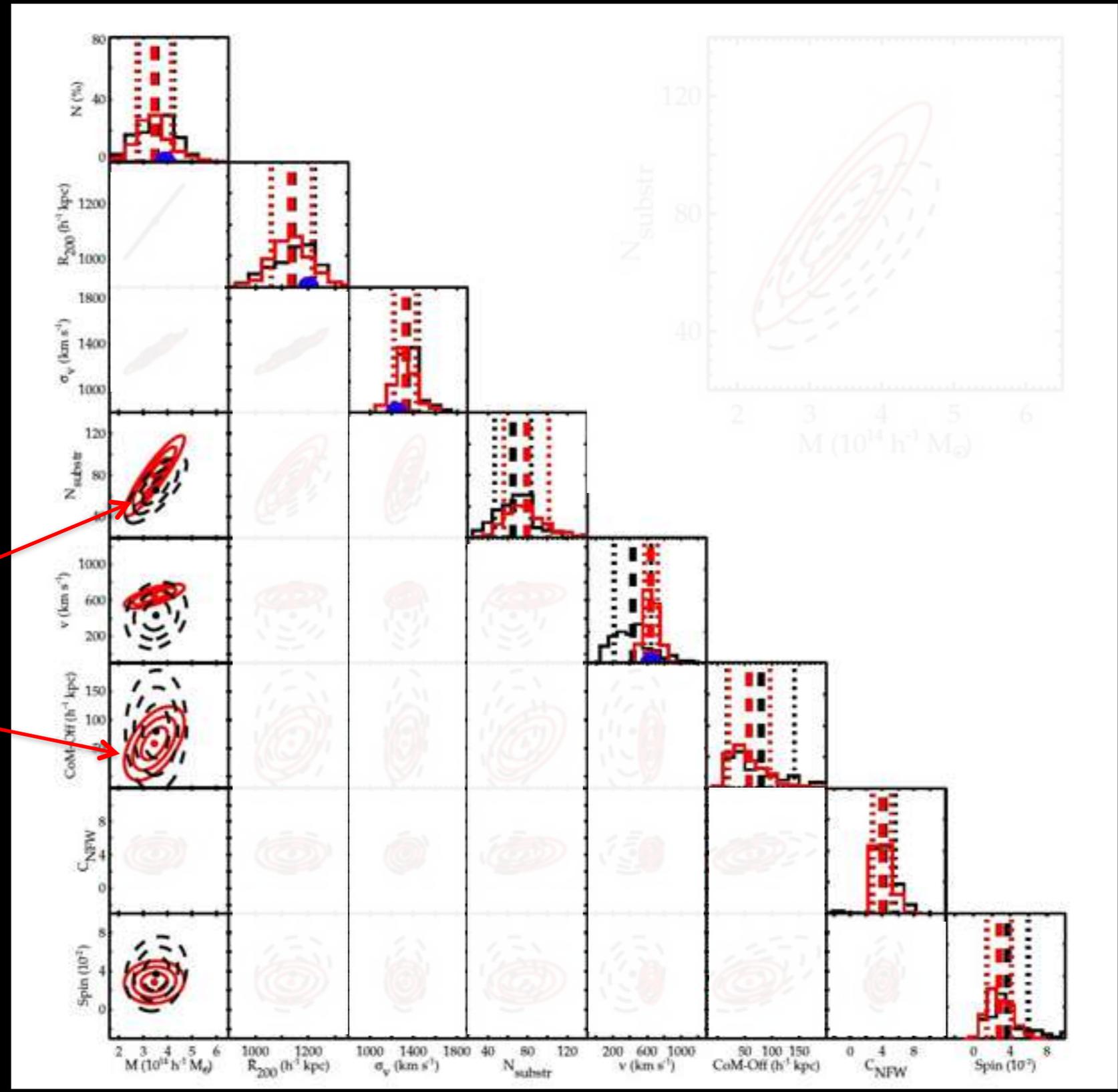
Sorce, Blaizot, Dubois 2019

# The Virgo galaxy cluster CLONE

Number of substructures

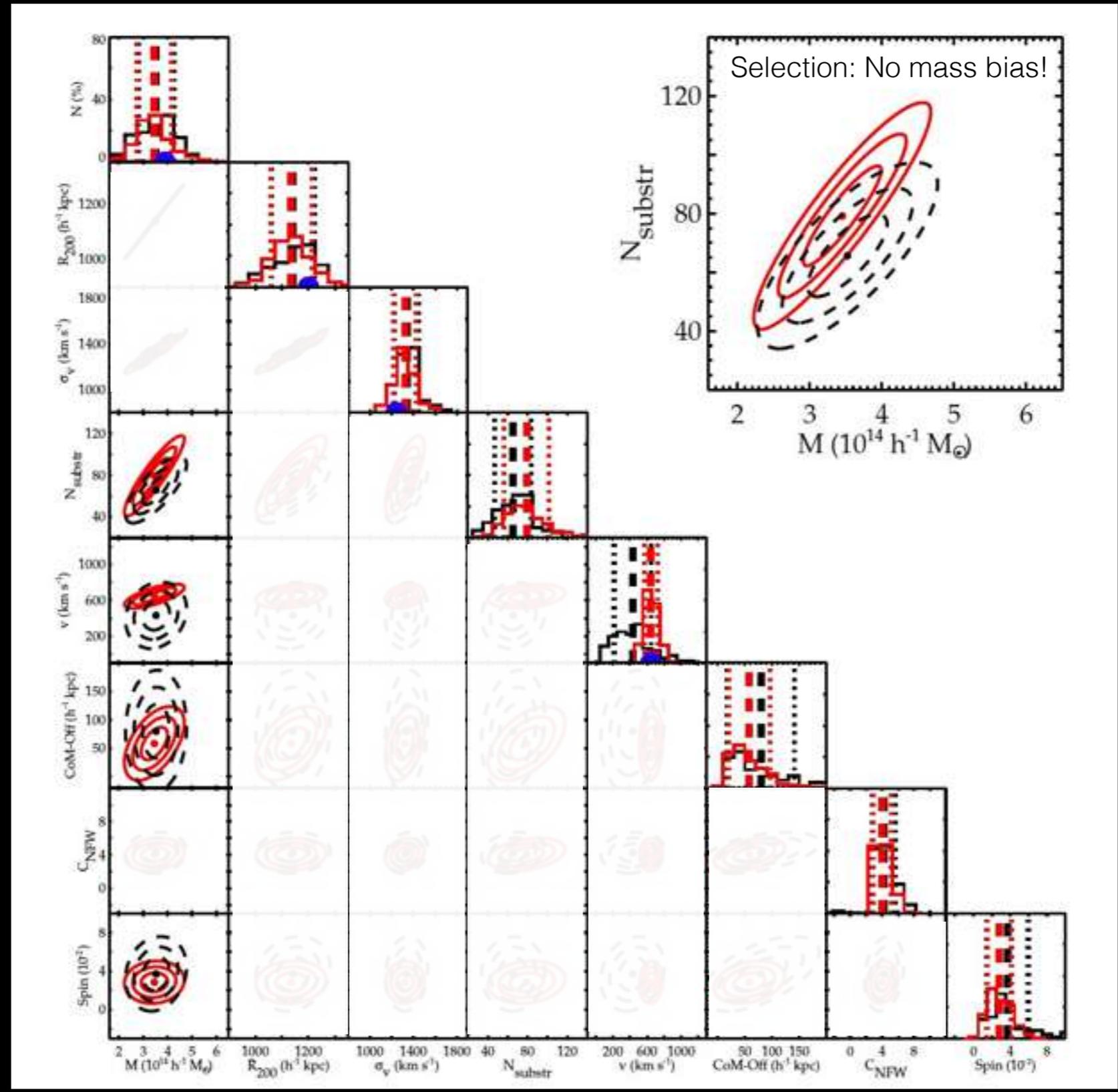
Center of mass offset wrt spherical center

→ History



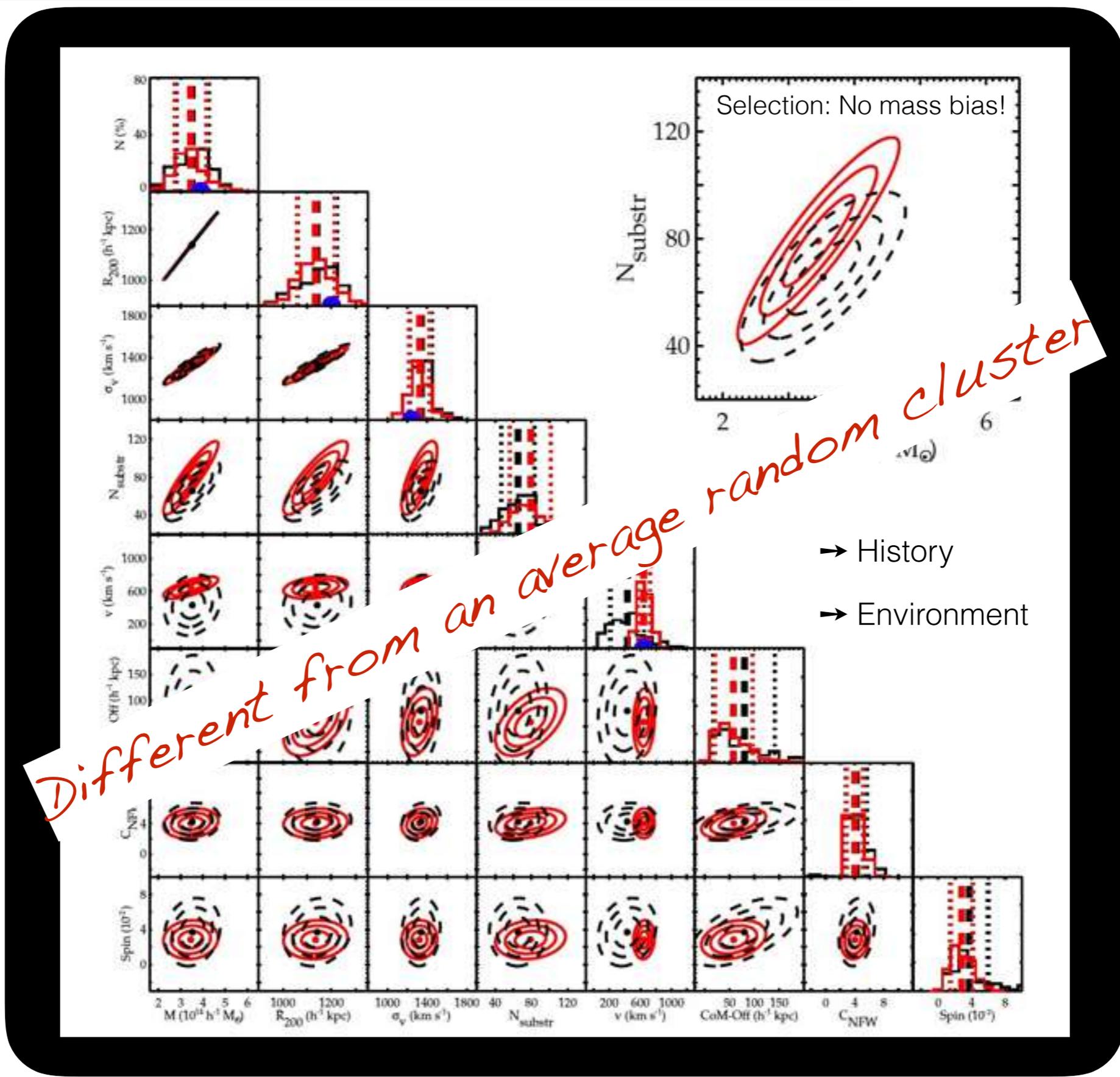
Sorce, Blaizot, Dubois 2019

# The Virgo galaxy cluster CLONE



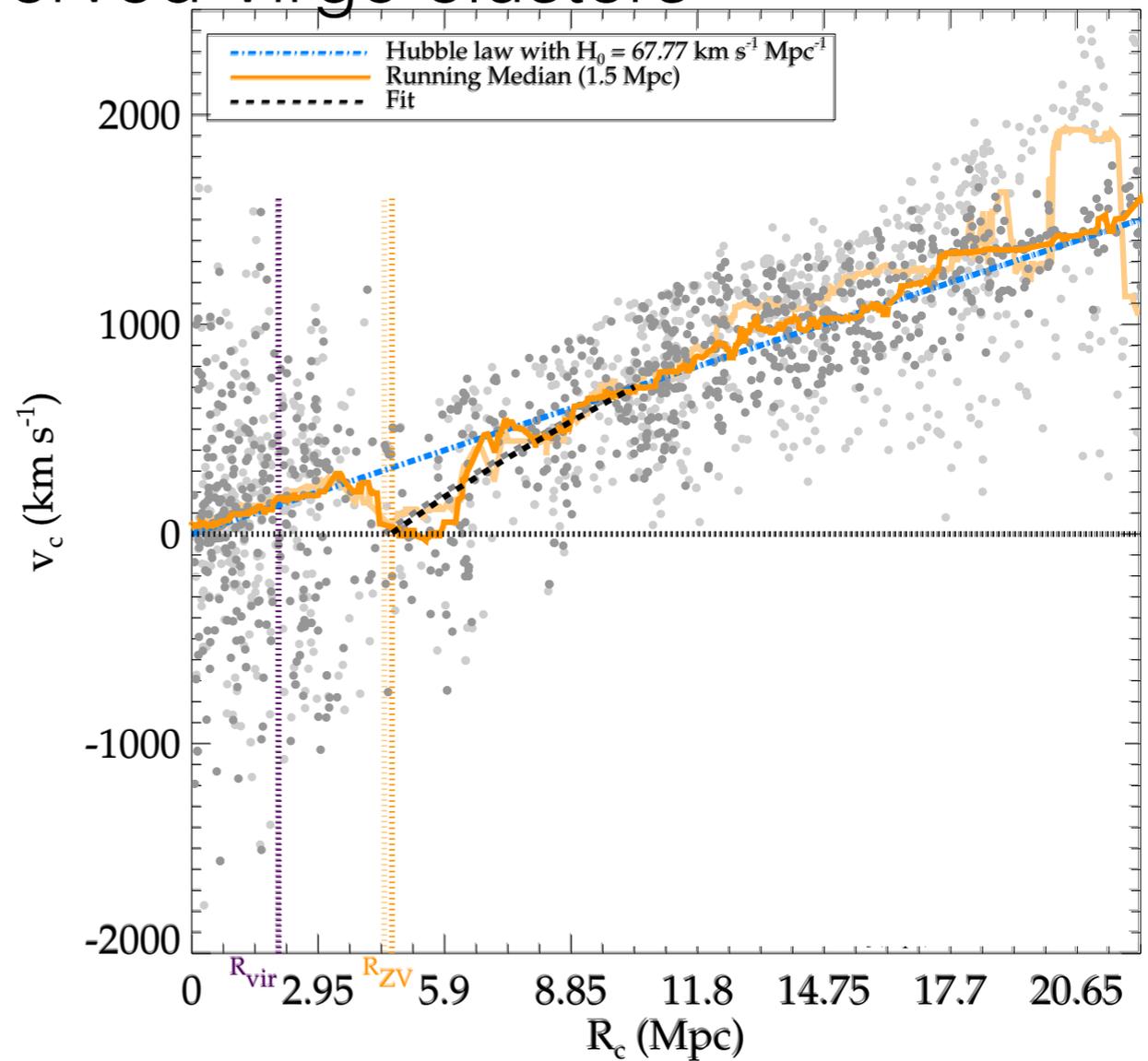
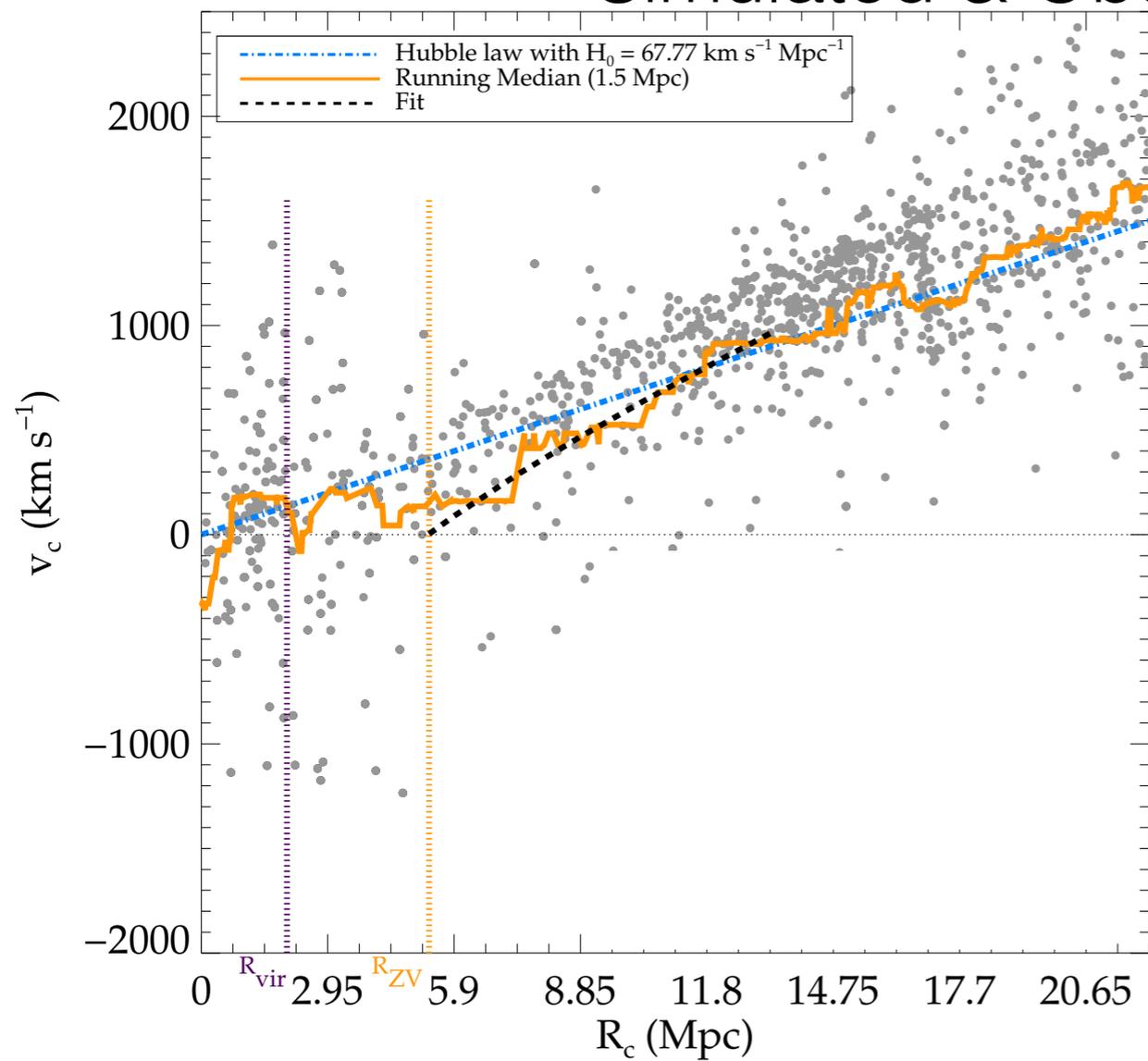
Sorce, Blaizot, Dubois 2019

# The Virgo galaxy cluster CLONE



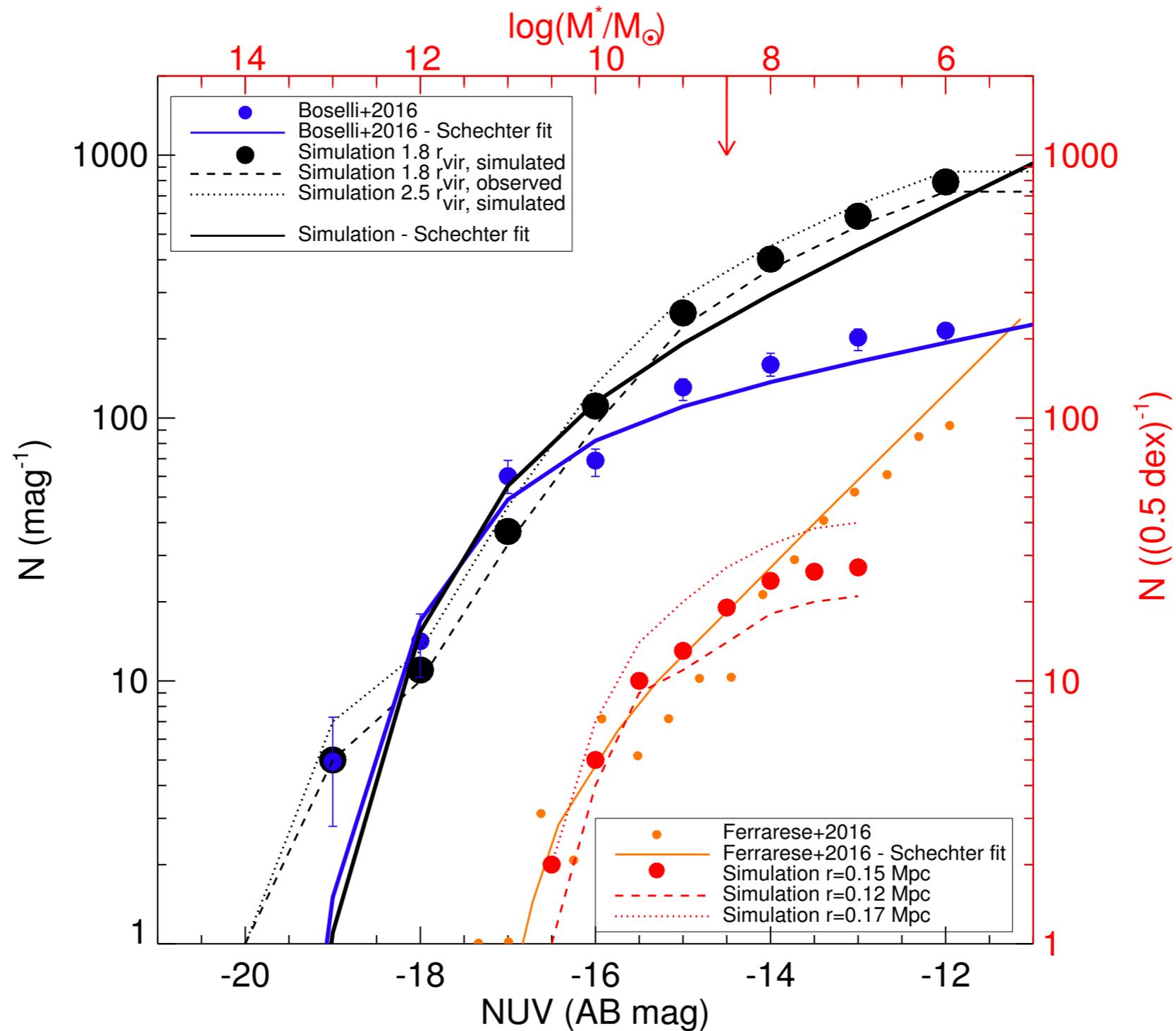
Sorce, Blaizot, Dubois 2019

## Simulated & Observed Virgo clusters



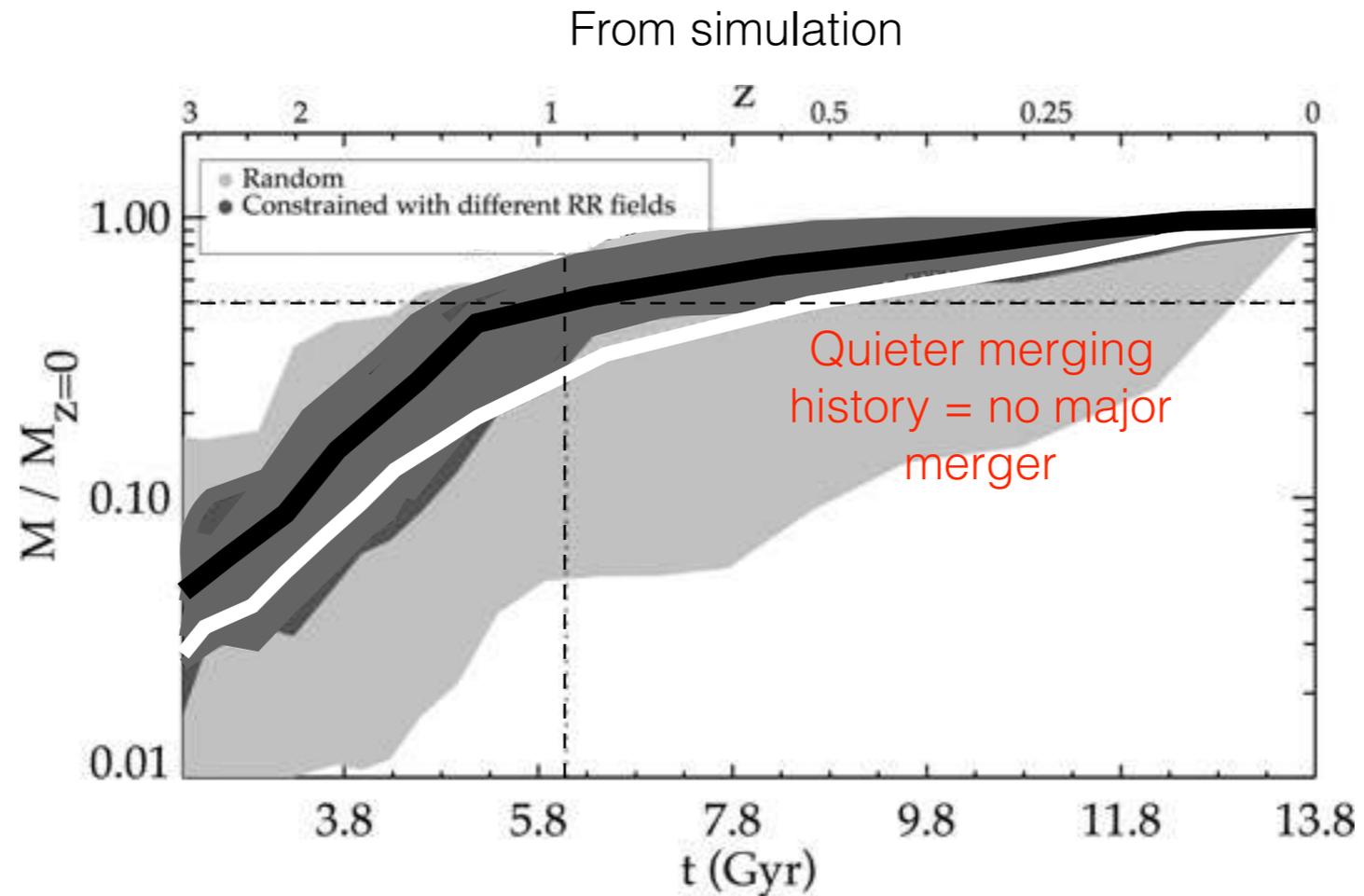
500 Mpc/h,  $8192^3$  particles effective (20 Mpc/h zoom), 0.24 kpc/h  
hydrodynamics: SN and AGN feedback, Planck cosmology

*Overall agreement with observations*



*Overall agreement with observations*

Boselli+2008,2014: from observation, only small mergers within the past few Gyrs

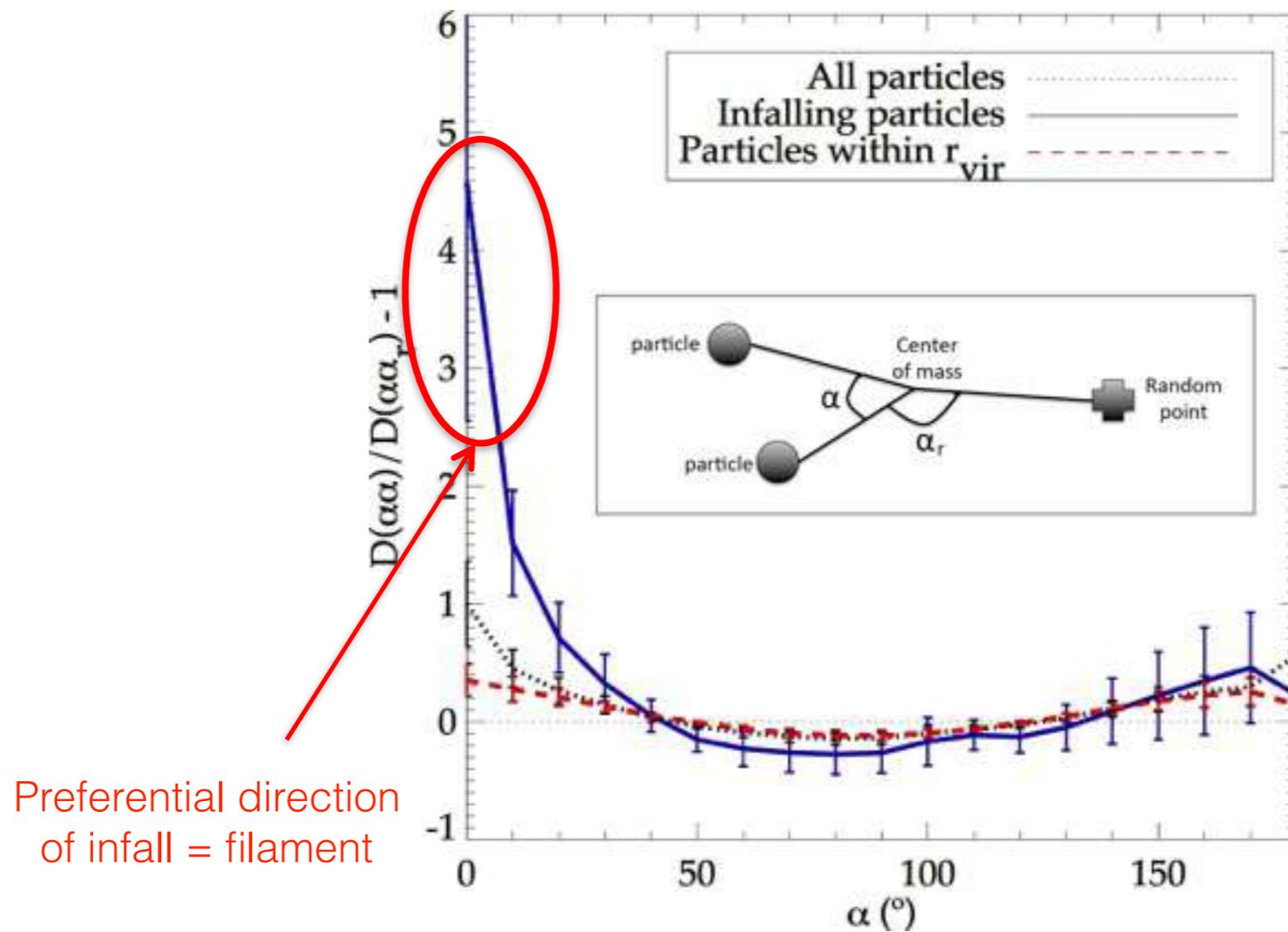


500 Mpc/h,  $512^3$  particles, DM only, Planck cosmology

*Agreement with observational predictions*

West & Blakeslee 2000 : from observation, formation along a filament

From simulation



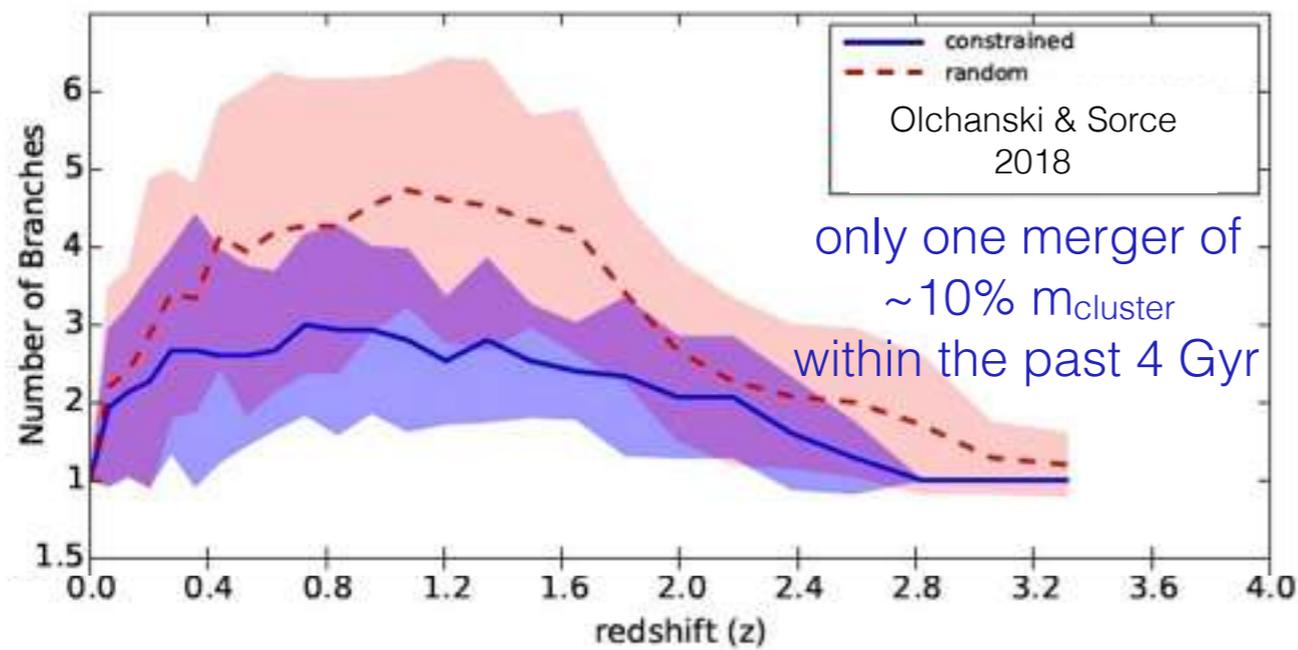
500 Mpc/h,  $512^3$  particles, DM only, Planck cosmology

*Agreement with observational predictions*

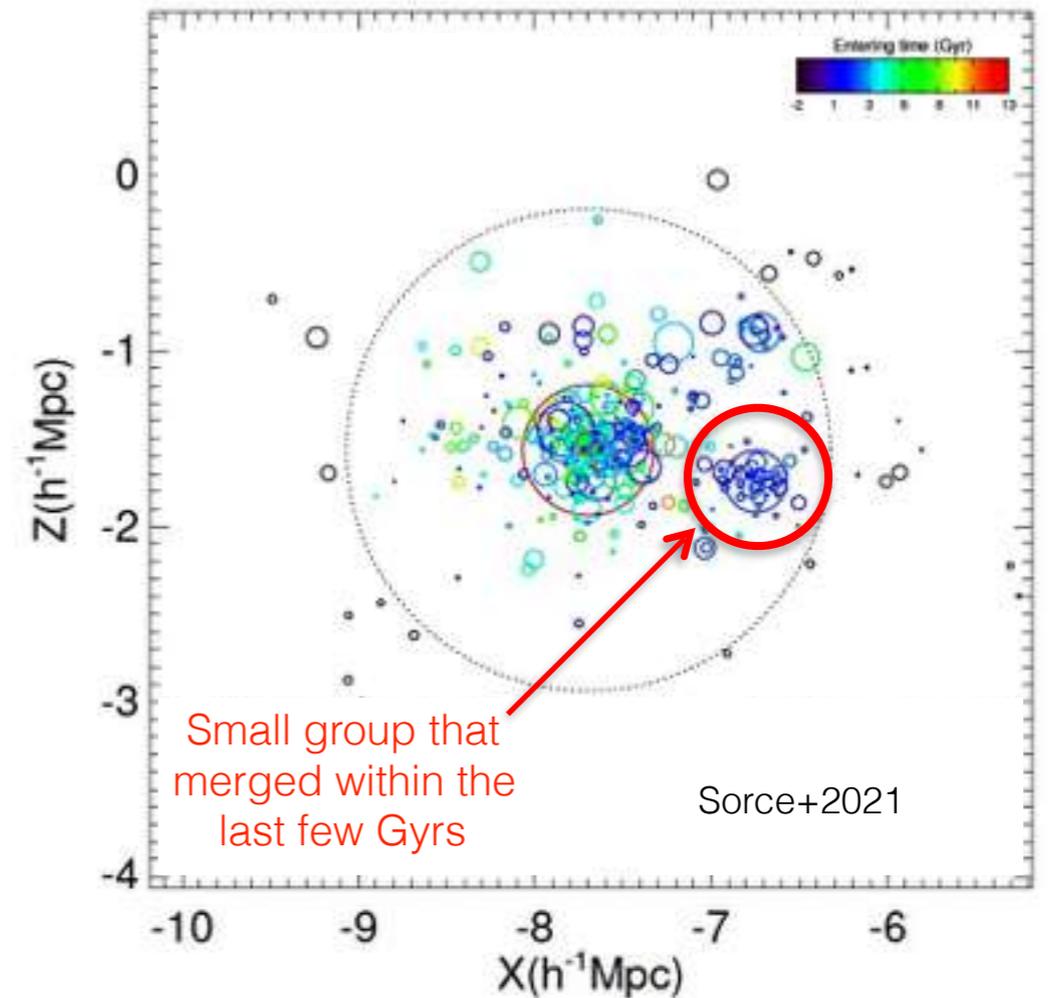
# The Virgo galaxy cluster CLONE

Lisker+2018: from observation, remnant of a group of  $\sim 10\% m_{\text{cluster}}$  that infall 2-3 Gyr ago

From simulation



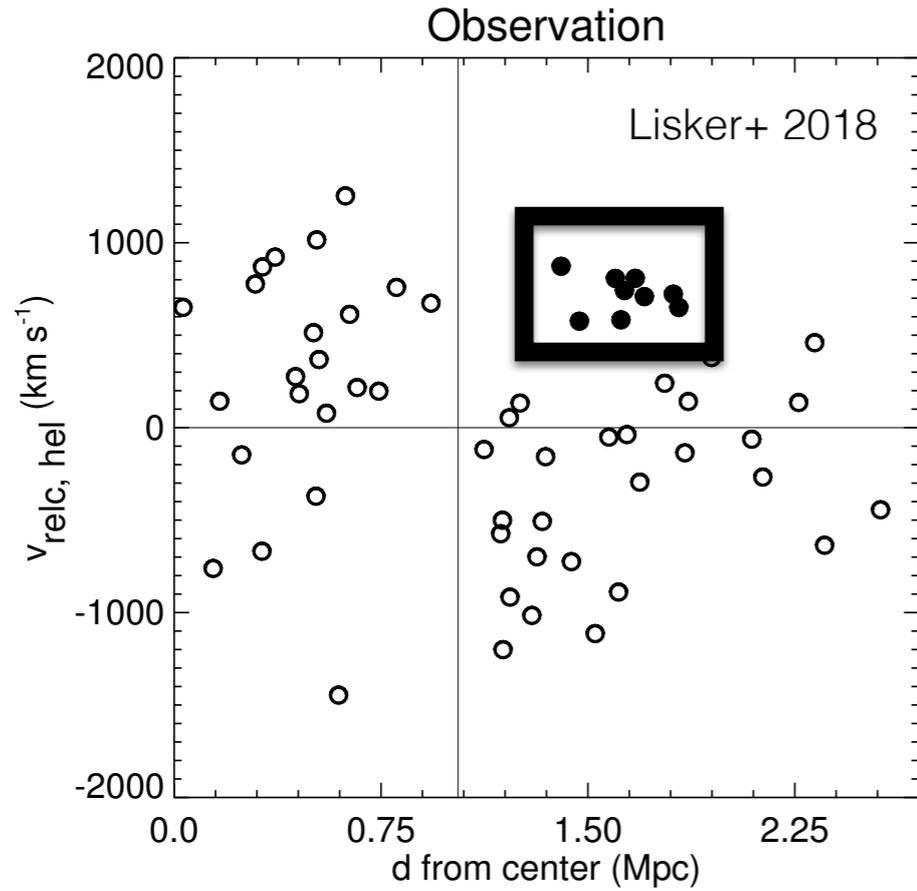
500 Mpc/h,  $512^3$  particles, DM only, Planck cosmology



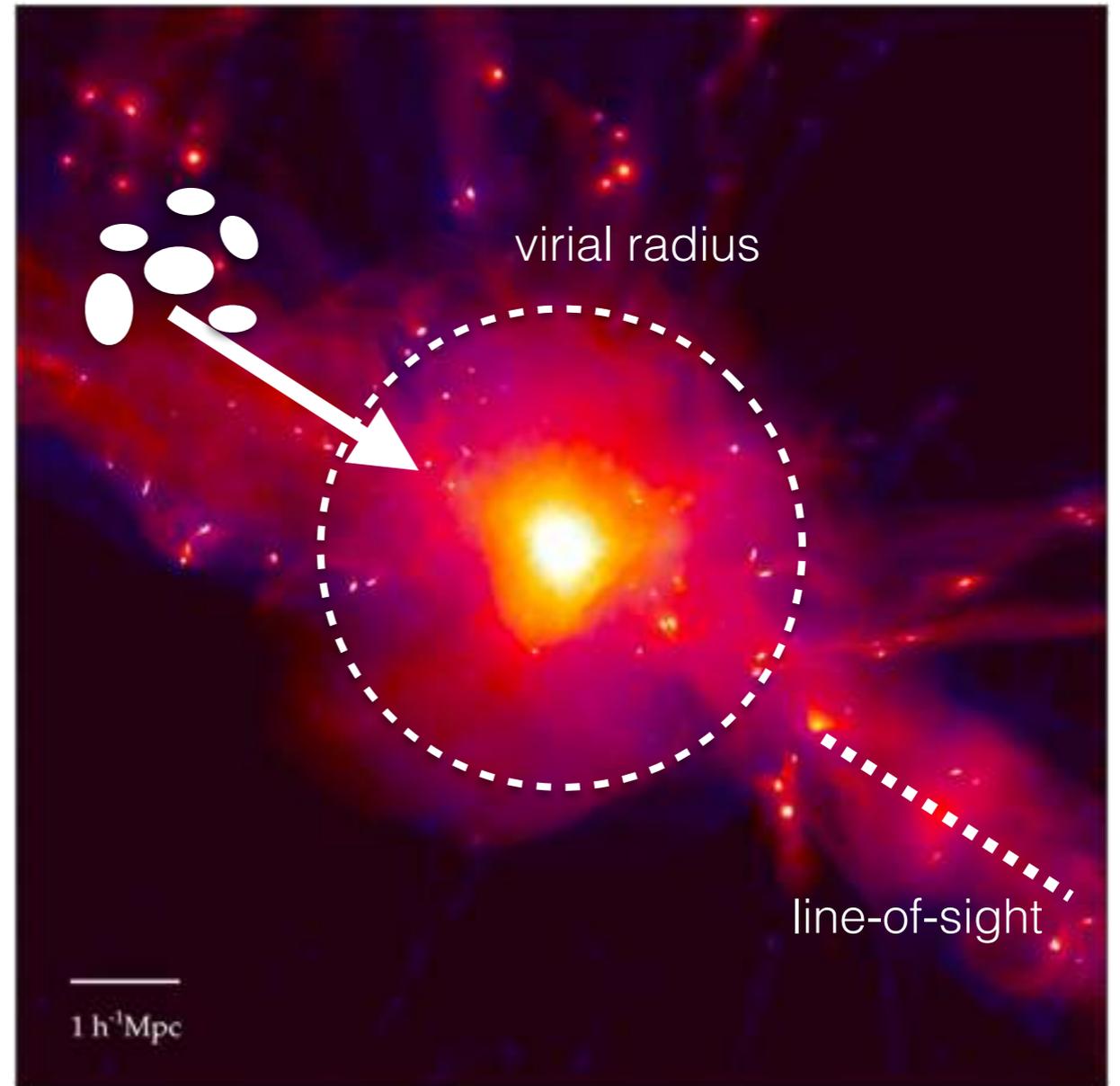
500 Mpc/h,  $8192^3$  particles effective (20 Mpc/h zoom), 0.24 kpc/h - Hydrodynamics: SN and AGN feedback, Planck cosmology

*Agreement with observational predictions*

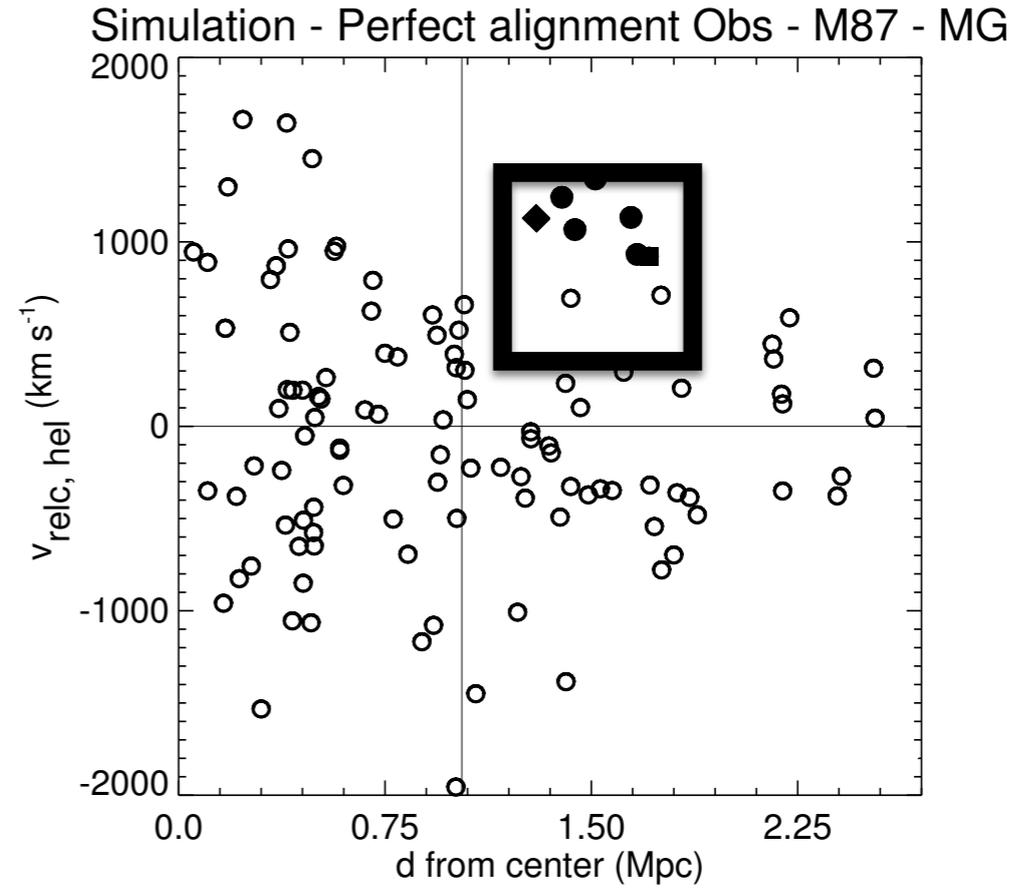
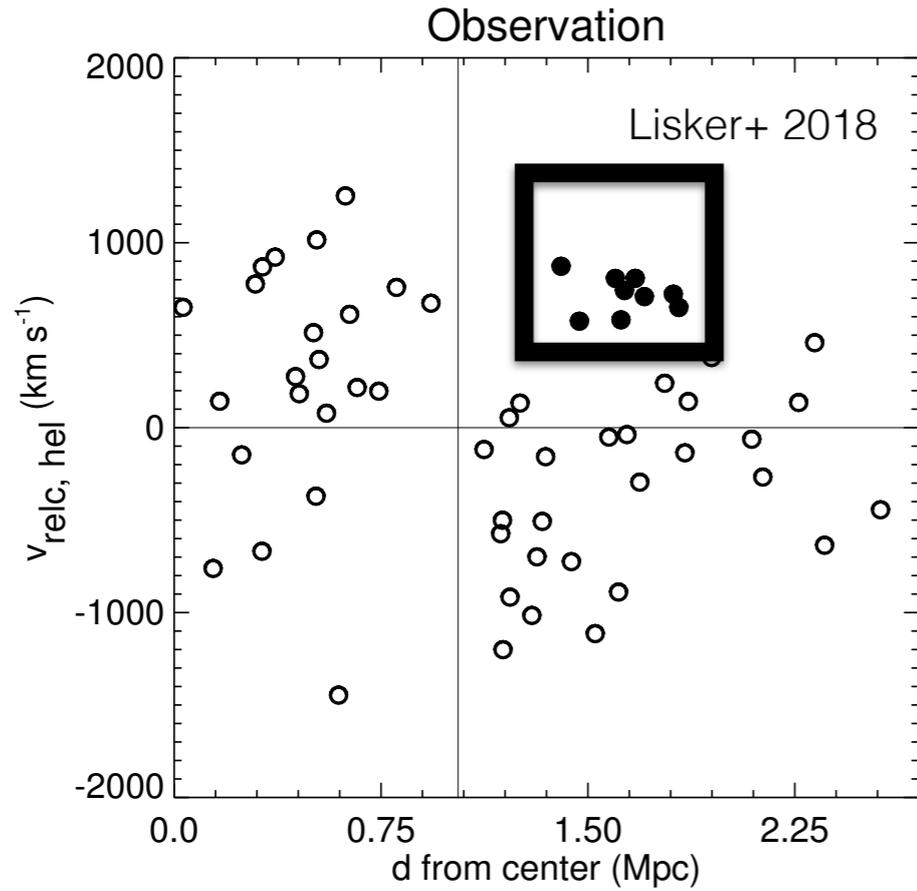
# The Virgo galaxy cluster CLONE



**Group of galaxies that fell  
within the line-of-sight?**



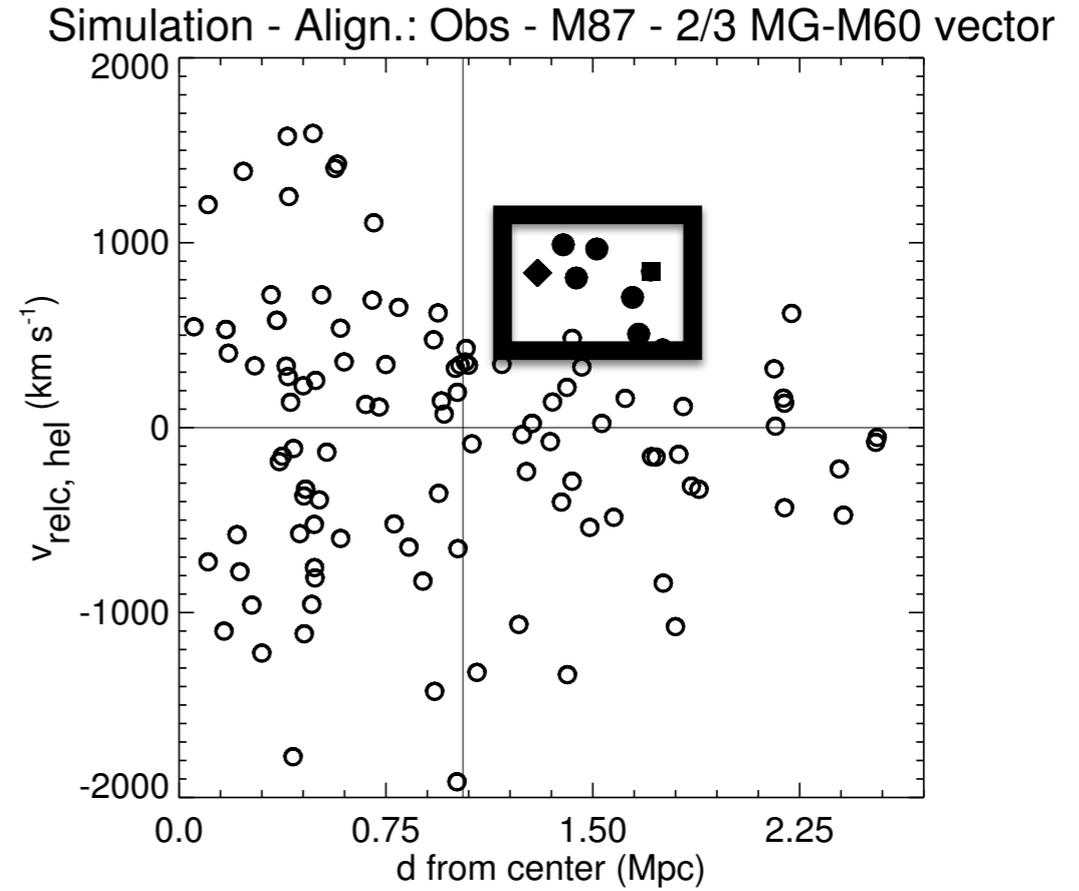
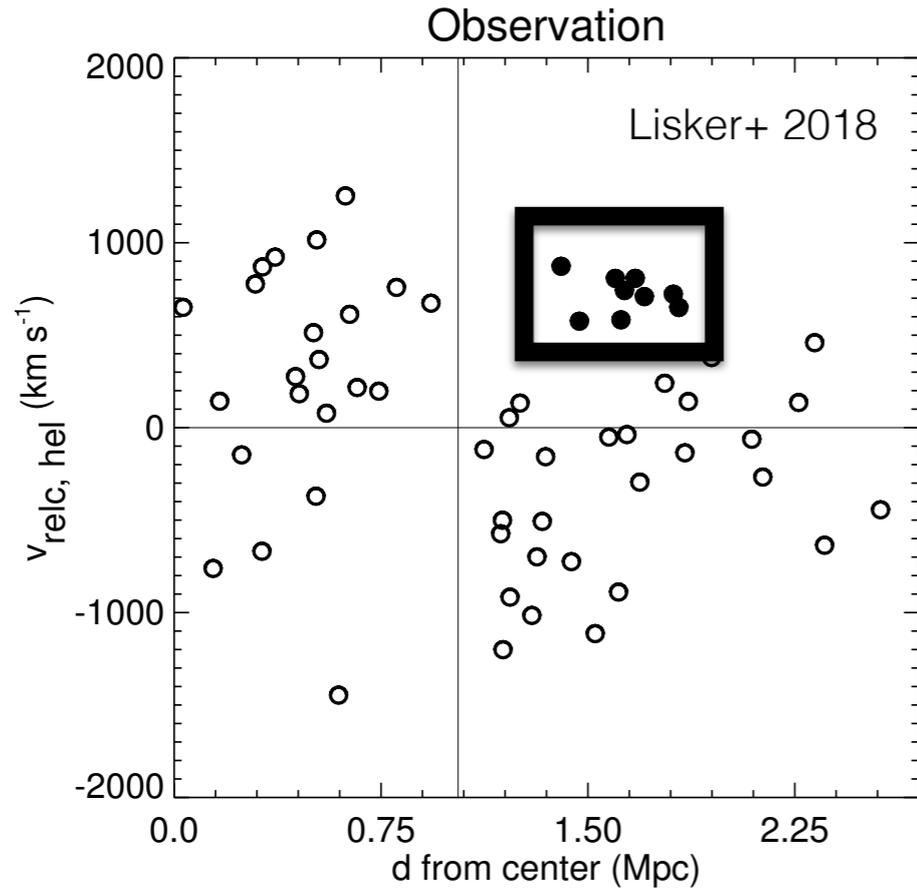
# The Virgo galaxy cluster CLONE



**Group of galaxies that fell  
within the line-of-sight?**

Sorce+2021

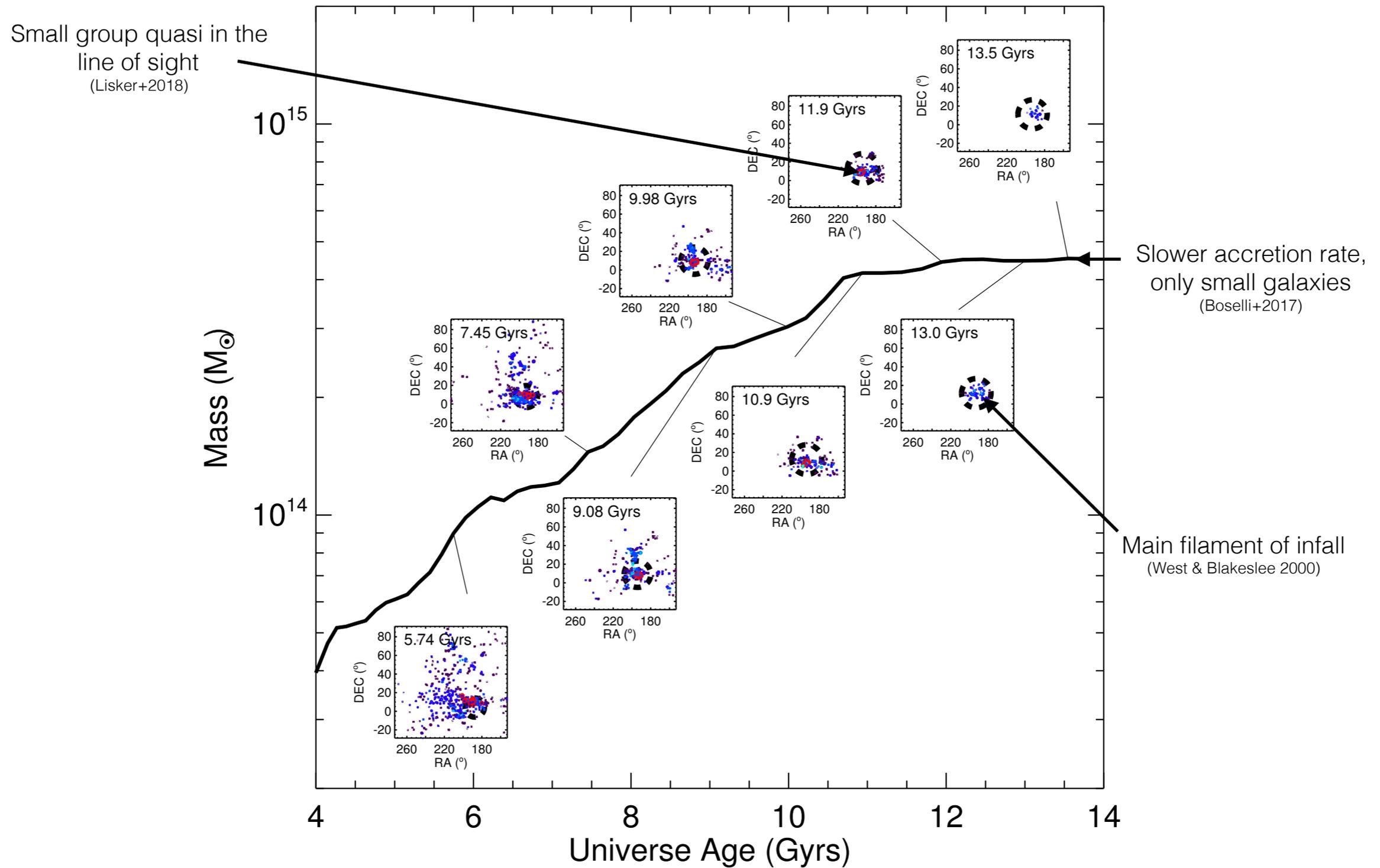
# The Virgo galaxy cluster CLONE



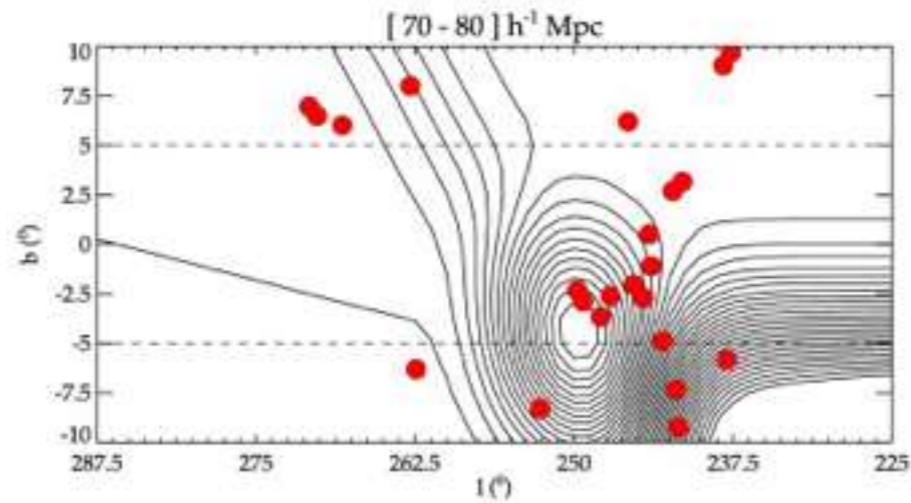
Group of galaxies that fell  
**quasi** within the line-of-sight

Sorce+2021

*Agreement with observational predictions*

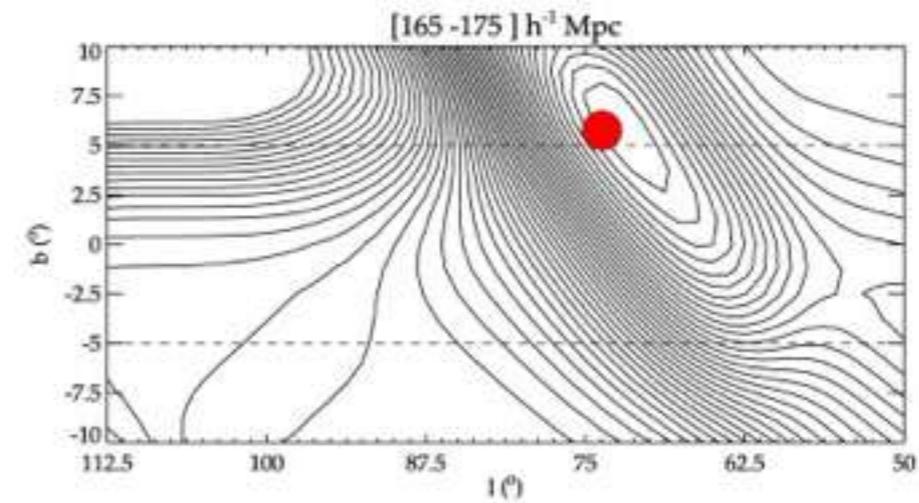


*Agreement with observational predictions*



## Puppis-3 Cluster

Chamaraux & Masnoux 2004

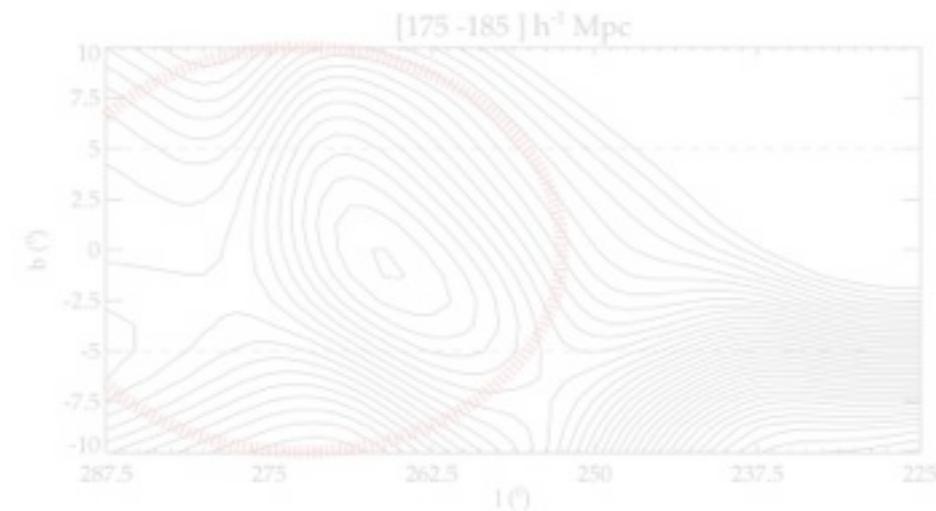


## Cygnus A Cluster

Ebeling+2002

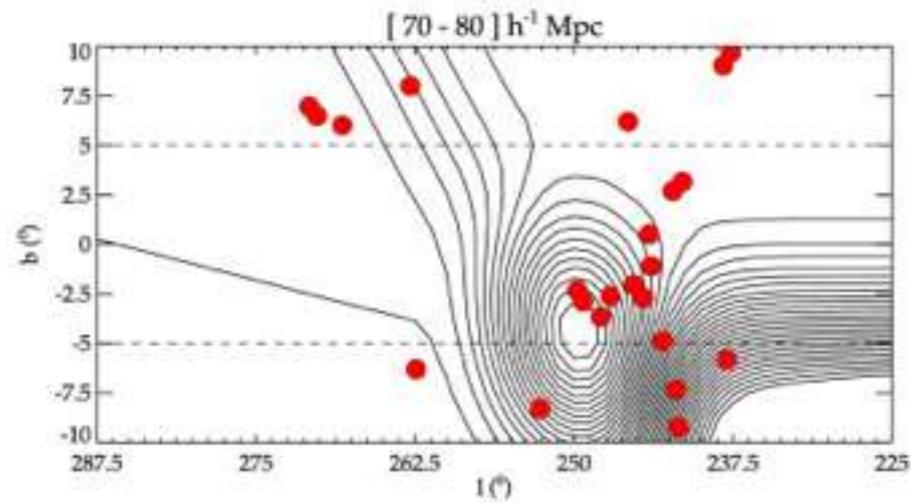
**$\Lambda$ CDM challenges hidden  
in the Zone of Avoidance?**

- number of superclusters
- longest structures



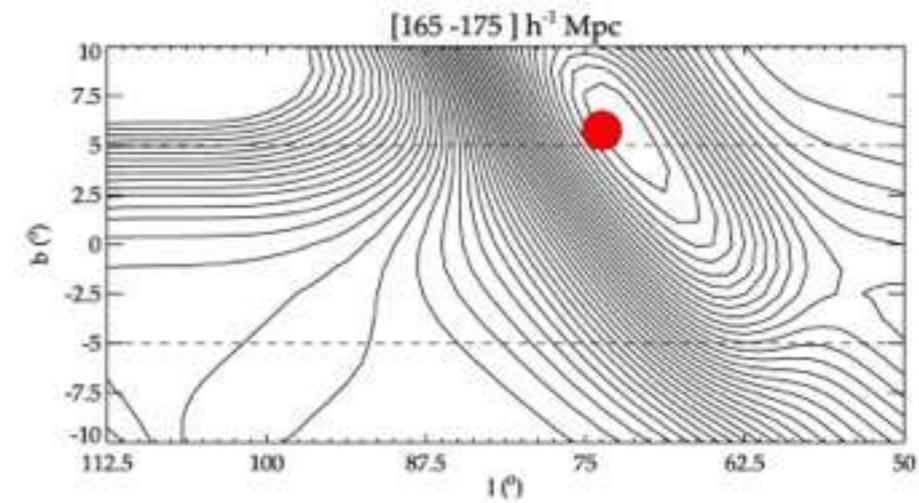
## Vela Supercluster

Kraan-Korteweg+2017



Puppis-3 Cluster

Chamaraux & Masnoux 2004

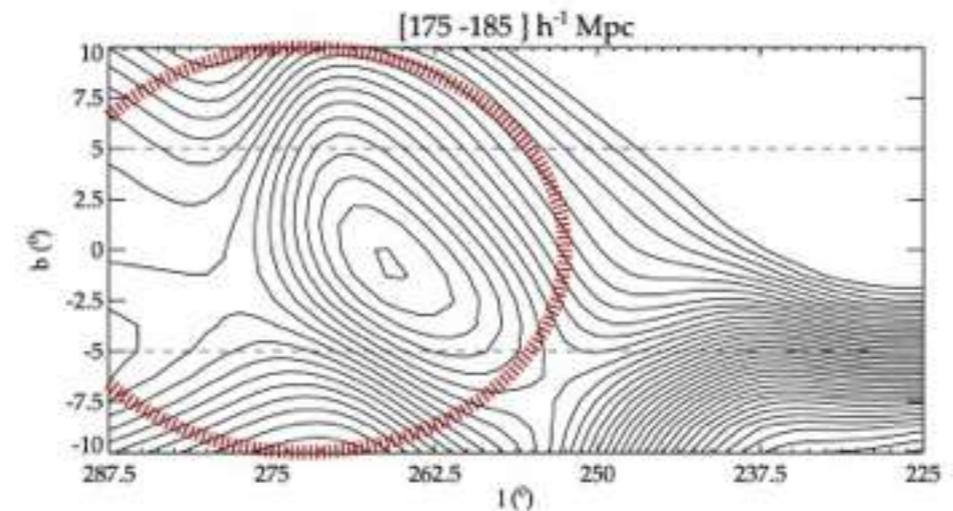


Cygnus A Cluster

Ebeling+2002

## $\Lambda$ CDM challenges hidden in the Zone of Avoidance?

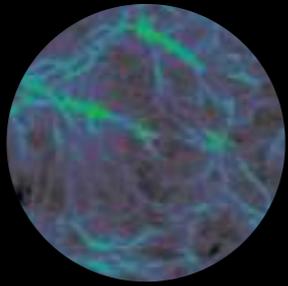
- number of superclusters
- longest structures



Vela Supercluster

Kraan-Korteweg+2017

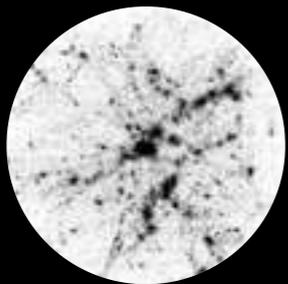
# Some other examples: ...



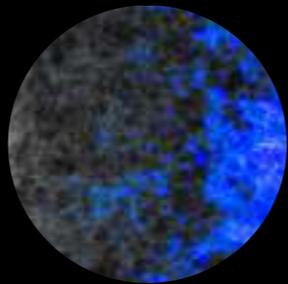
Cosmic Rays in the local  
Universe  
(Hackstein+2018)



SLOW : local galaxies  
(Sorice, Dolag +)



Coma connectivity  
(Malavi, Aghanim, Sorice+)



Reionization of the local  
Universe (CoDa)  
(Ocvirk+2020, Lewis+2020, etc)

and  
more...

# Take home message

Tensions = Do we need a new cosmological model?

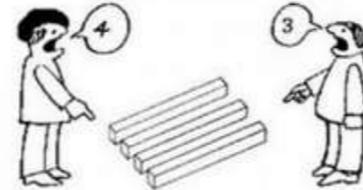
*To answer, nowadays : comparisons between typical cosmological simulations and observations*

Small scales



Simulations of  
Galaxy formation &  
evolution

Local scales



local estimates of cosmological  
parameters

Large scales

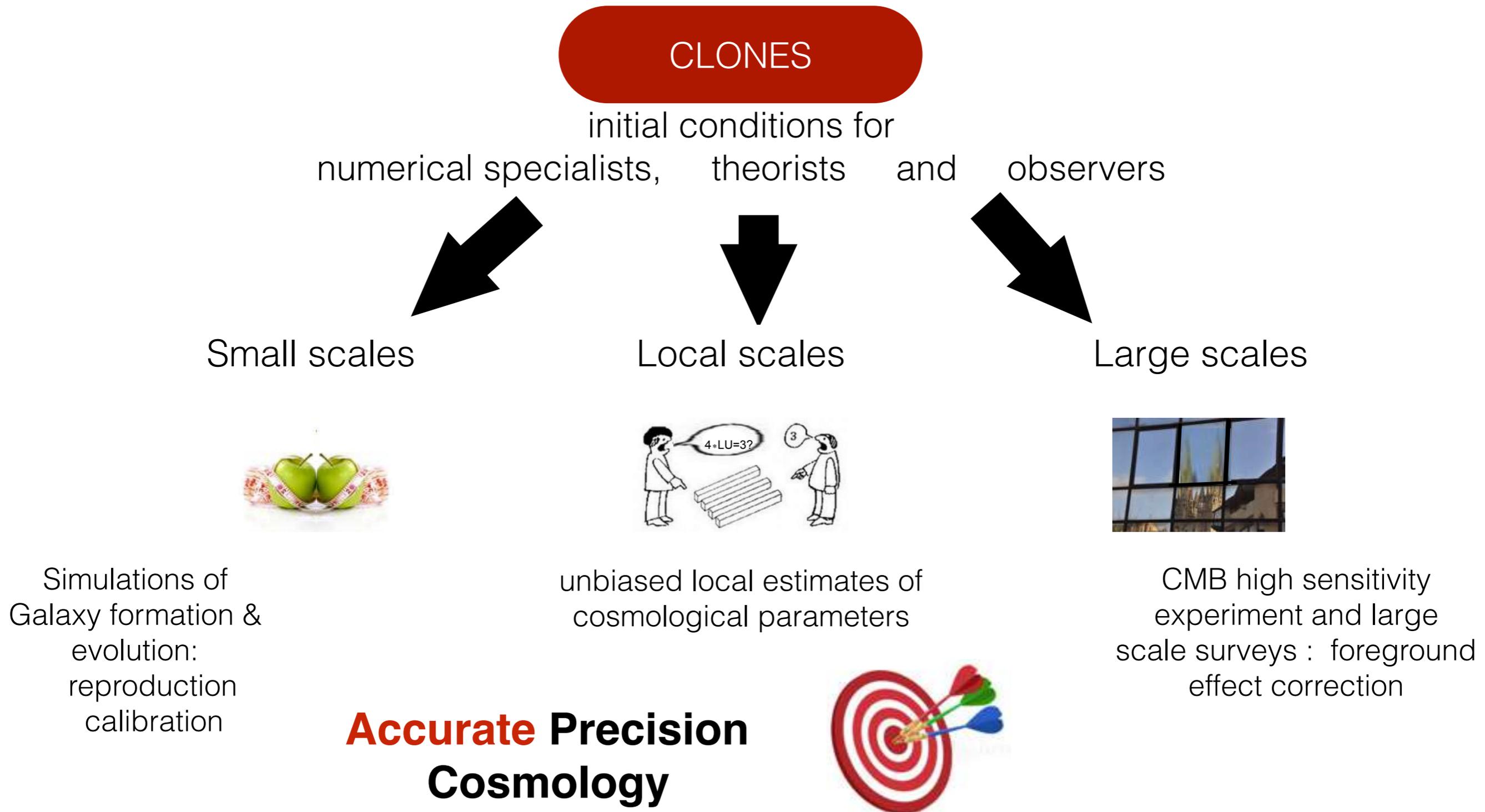


CMB high sensitivity  
experiment and large  
scale surveys

**Biased Precision  
Cosmology**



Tensions = Do we need a new cosmological model?



Thank you, Merci, Grazie,  
Gracias, Danke, **спасі́бо**,  
Mahalo, 谢谢, **ありがとう**,  
הודת, Obrigada, Dank u,  
Tak, Cảm ơn, Dziękuję,  
Kiitos, Aitäh, **diolch**, dankewol,  
**ಧನ್ಯವಾದಗಳು, ...\***

\* Missing your 'thanks' spelling? It means I did not get the chance  
yet to visit your country but I am looking forward to do so !

(exceptions in red: I have not been but I have had the opportunity to learn how to say it)