

# High redshift galaxy clusters as a cosmological tool

*galaxy clustering -- density field reconstructions -- constrained simulations*

**Metin Ata** ([metin.ata@ipmu.jp](mailto:metin.ata@ipmu.jp)),

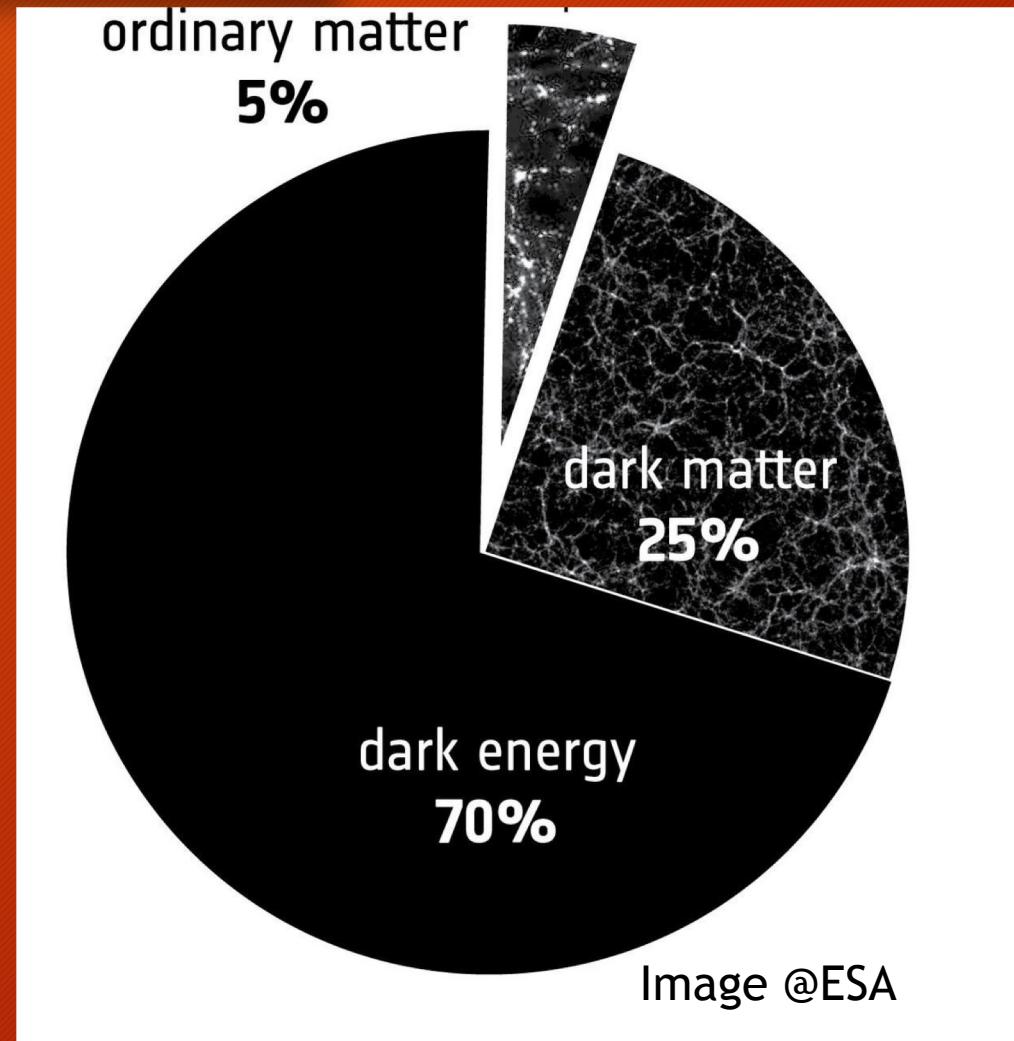
[arXiv:1605.09745](https://arxiv.org/abs/1605.09745), [arXiv:1911.00284](https://arxiv.org/abs/1911.00284), [arXiv:2004.11027](https://arxiv.org/abs/2004.11027)

Khee-Gan Lee (IPMU), Brian Lemaux (UC Davis), Daichi Kashino (ETH/Nagoya), Olga Cucciati (INAF)

Francisco-Shu Kitaura (IAC), Claudio Dalla Vecchia (IAC)

# Context

- Cosmology: Physics of the origin and dynamics of the Universe
- Cosmological principle: Universe is homogenous and isotropic at large enough scales.
- Standard model of Cosmology at present  $\Lambda$ CDM



## Menu of this talk

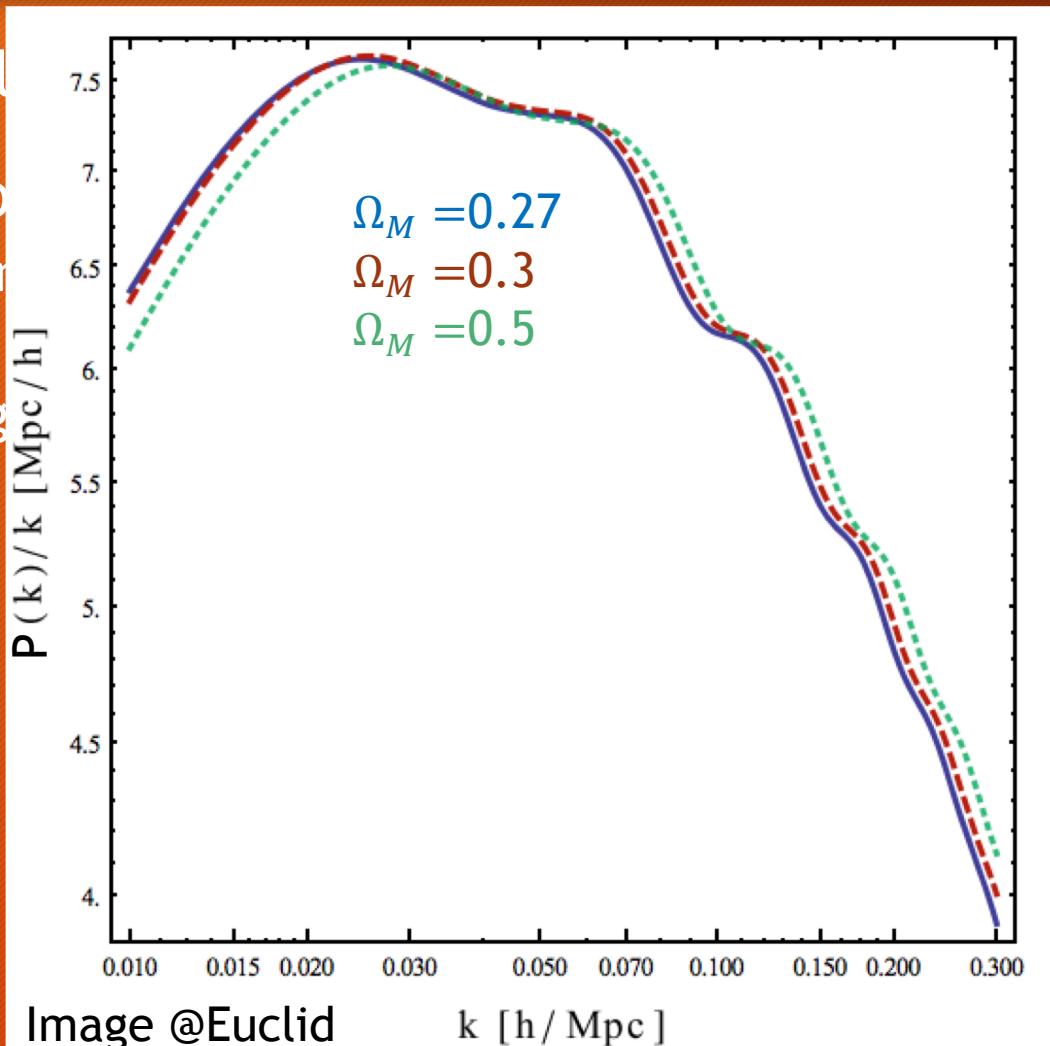
- Galaxy clustering / Galaxy surveys
- Density field & Initial conditions reconstructions
- Constrained simulations
- Conclusions

## Menu of this talk

- Galaxy clustering / Galaxy surveys

# Galaxy clustering / Galaxy surveys

- Analyze the spatial distribution
- Correlation functions
  - Cosmological parameters
  - Clustering history
  - Angular/line-of-sight

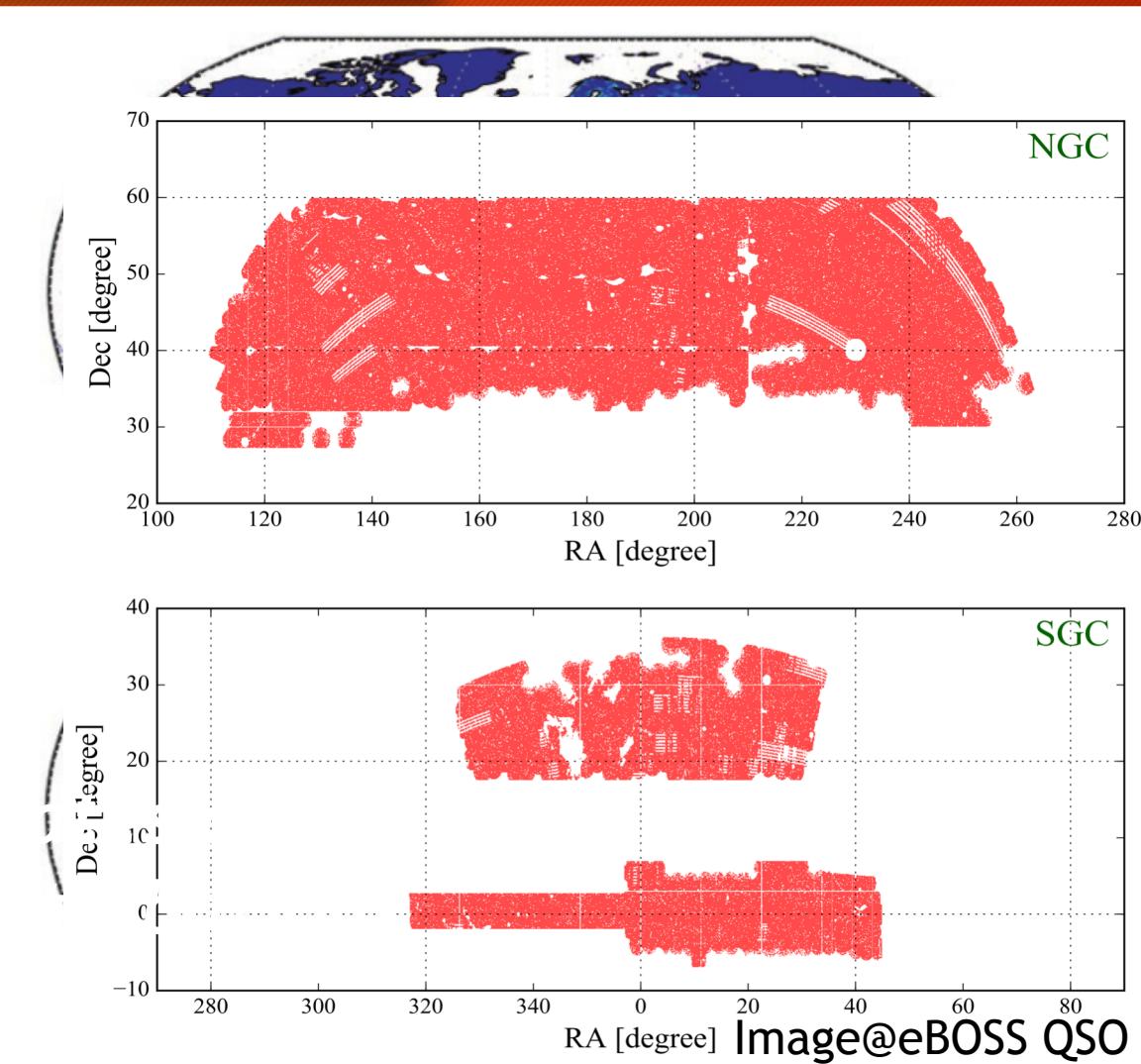


$$\delta(\vec{k}) \rightarrow P(|\vec{k}|)$$

# Galaxy clustering / Galaxy surveys

- Galaxy surveys observe 3D galaxy positions  $\vec{r}_i$
- We observe luminous matter
  - There is a galaxy bias  $\delta_{\text{Gal}} = \mathcal{B}(\delta_{\text{DM}})$
- Trade-off between number density and coverage
  - Complex survey geometry and completeness
- Measure redshifts, *not* distances
  - $z \approx \frac{H_0 D + v_r}{c}$  : Redshift Space Distortions
  - $\vec{r} = \vec{s} - ((\vec{v}_r(\vec{r}) \times \hat{r})/H(a)a) \hat{r}$

*We need unbiased estimators of the matter density power spectrum*

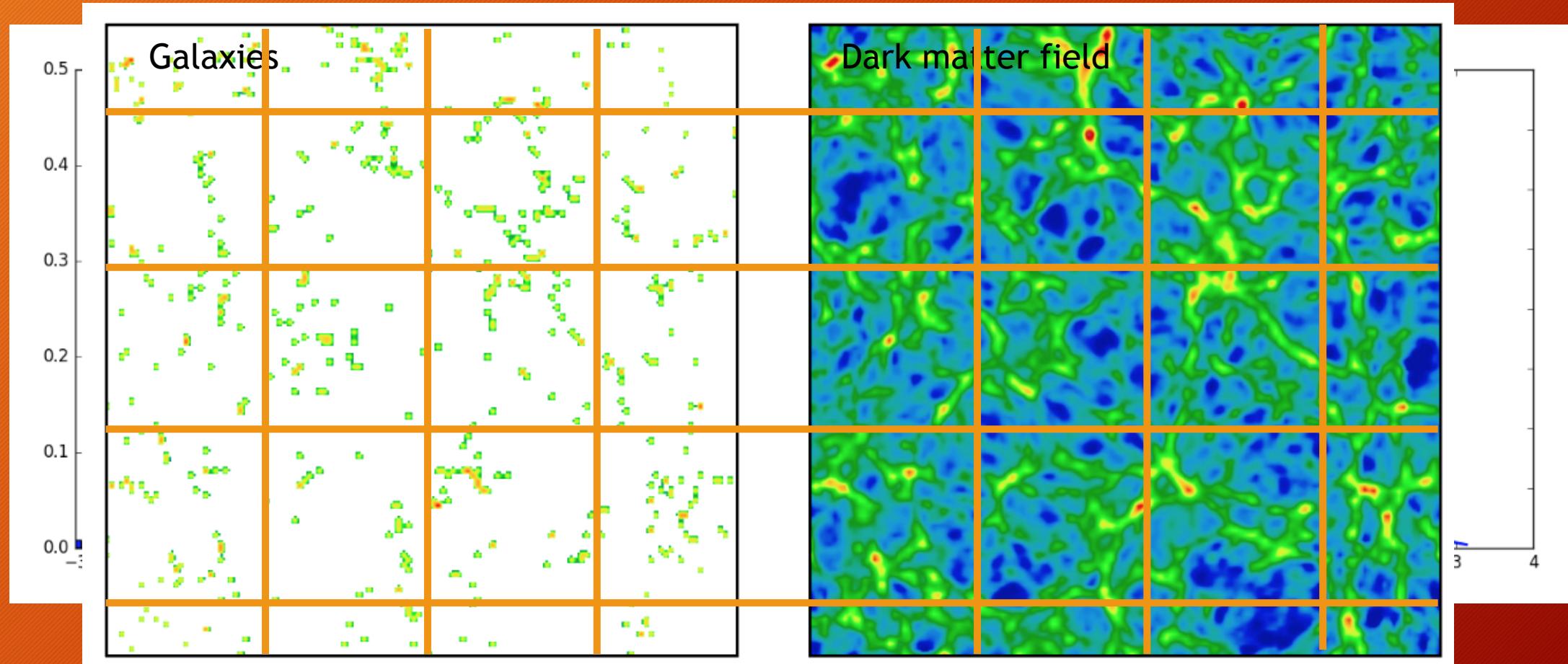


## Menu of this talk

- Galaxy clustering / Galaxy surveys
- Density field & Initial conditions reconstructions

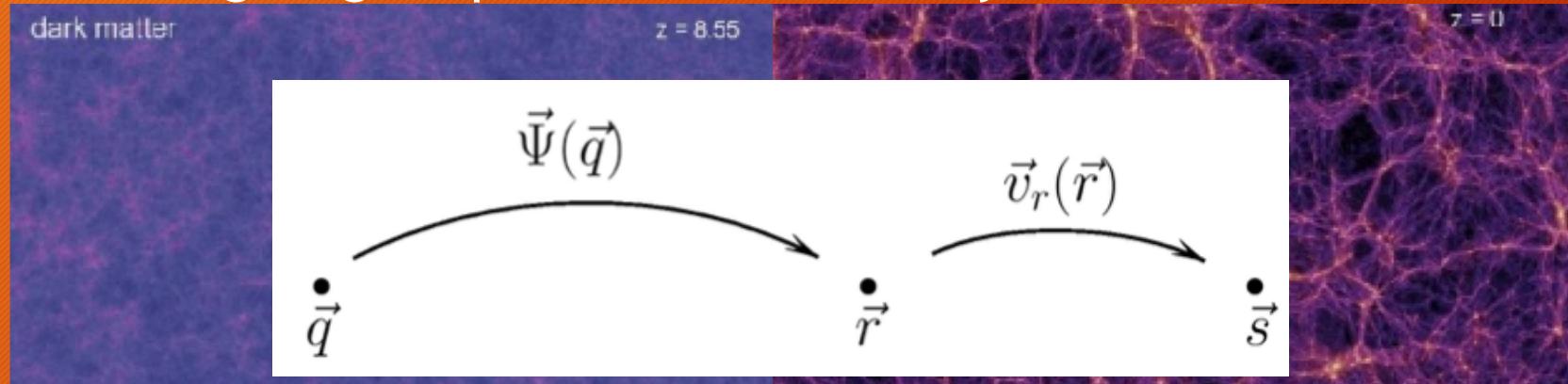
# Density field & Initial conditions reconstructions

- Statistical approach

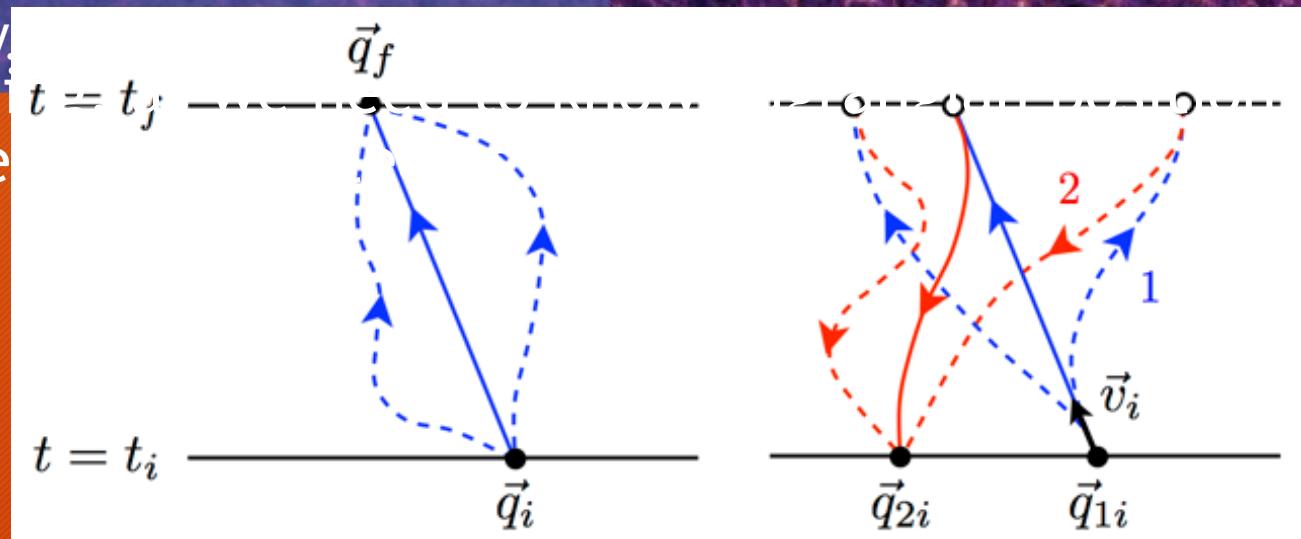


# Density field & Initial conditions reconstructions

- Initial (Lagrangian) positions  $\vec{q}$  to final (Eulerian)  $\vec{r}(\vec{q})$  mapping with gravity
- Connected via Lagrangian perturbation theory  $\vec{q} = \vec{s} - \vec{\Psi}(\vec{q}) - \vec{v}_r(\vec{q})$

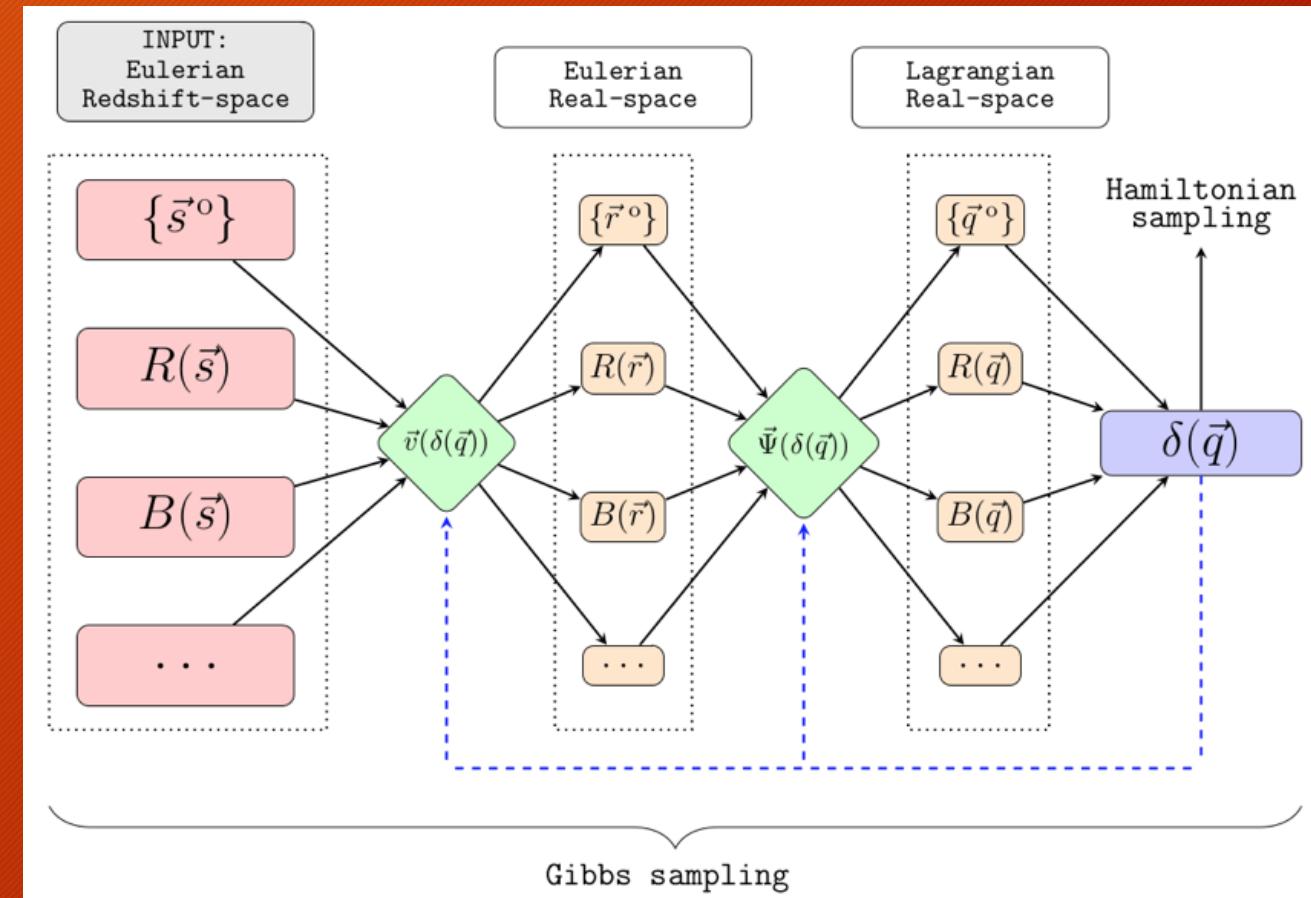


- Image @V  
• Ill defined mapping  
displacement field
- at which velocity and



# COSMIC BIRTH algorithm I

- COSMIC BIRTH (Kitaura, F.-S., MA et al 2019) [arXiv:1911.00284](https://arxiv.org/abs/1911.00284)  
(Based on KIGEN [arXiv:1205.5560](https://arxiv.org/abs/1205.5560) and ARGO e.g. [arXiv:1605.09745](https://arxiv.org/abs/1605.09745))
- Move galaxies back to initial positions and infer the Gaussian density field at Lagrangian frame  $\delta(\vec{q})$  with Hamiltonian Monte-Carlo
- Then use nested Gibbs sampling
  - Peculiar velocities,
  - Displacements, (ALPT Kitaura F.-S., Hess S., 2013)
  - Response function of the survey,
  - Bias parameters



# COSMIC BIRTH algorithm II

- Density sampling:  $\delta(\vec{q}) \sim \wp(\delta(\vec{q}) | (\vec{q}), R, B(\vec{q}))$

- $$\mathcal{P}_\delta(\boldsymbol{\delta}_M | N_G(\mathbf{r}), w(\mathbf{r}), \mathbf{C}\{p_C\}, \{p_B\}) = \frac{1}{\sqrt{(2\pi)^{N_c}, \det(\mathbf{C})}} \exp\left(-\frac{1}{2} \sum_{\alpha\beta} [\log(1 + \delta_\alpha) - \mu], C_{\alpha\beta}^{-1} [\log(1 + \delta_\beta) - \mu]\right) \times \\ \prod_{i=1}^{N_c} \left( \frac{[f_{\bar{N}} w(r_i)(1 + \delta_i)^b \Theta(\delta_i - \delta_{th})]^{N_i}}{N_i!} \frac{\Gamma(\beta + N_i)}{\Gamma(\beta)(\beta + [f_{\bar{N}} w(r_i)(1 + \delta_i)^b \Theta(\delta_i - \delta_{th})])^{N_i}} \frac{1}{\left(1 + \frac{[f_{\bar{N}} w(r_i)(1 + \delta_i)^b \Theta(\delta_i - \delta_{th})]}{\beta}\right)^\beta} \right)$$

- Kinetic artificial term  $K(q) = \frac{1}{2} p^T M^{-1} p$ , so that we sample  $U(q) = -\ln(P(q))$
- Bayesian statistics:  $-\ln P = -\ln \pi - \ln \mathcal{L}$
- Evolve system with Hamiltonian Equations of motion

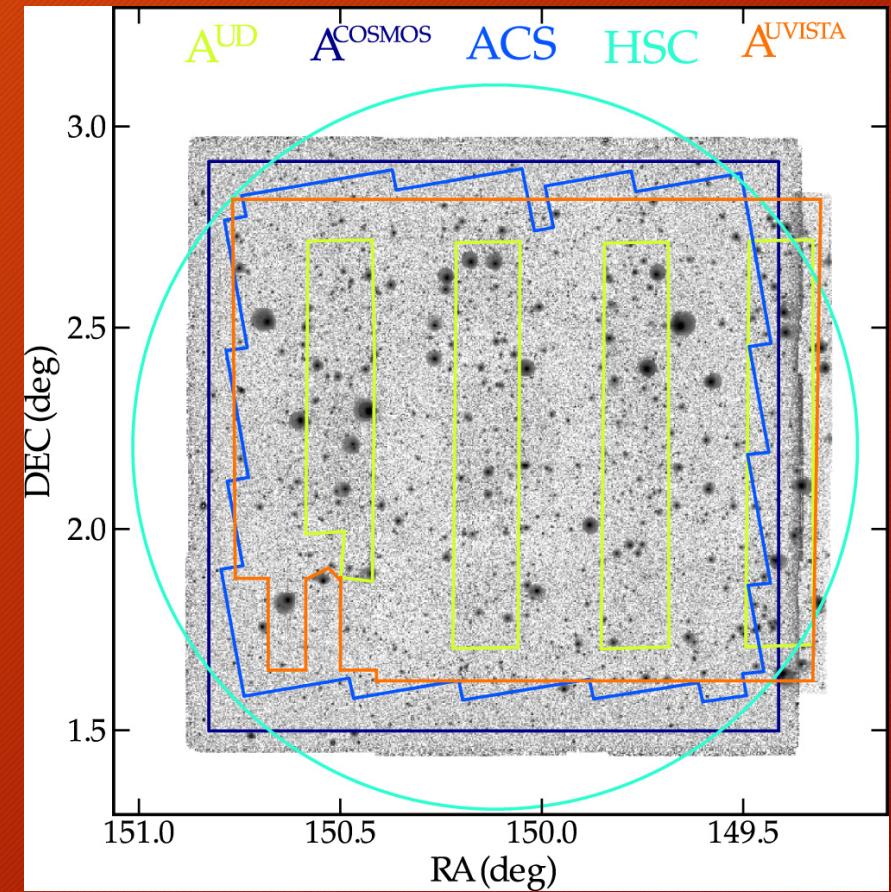
# COSMIC BIRTH algorithm III

- Evolve system with Hamiltonian Equations of motion
- Numerical integration with leap-frog symplectic scheme

$$\begin{aligned}\frac{d\mathbf{q}}{dt} &= \frac{\partial \mathcal{H}(\mathbf{q}, \mathbf{p})}{\partial \mathbf{q}} \\ \frac{d\mathbf{p}}{dt} \left( t + \frac{\epsilon}{2} \right) &= \mathbf{p}(t) - \frac{\epsilon}{2} \frac{\partial \mathcal{U}}{\partial \mathbf{q}}(\mathbf{q}(t)) \\ \mathbf{q}(t + \epsilon) &= \mathbf{q}(t) + \epsilon \mathbf{M}^{-1} \mathbf{p} \left( t + \frac{\epsilon}{2} \right) \\ \mathbf{p}(t + \epsilon) &= \mathbf{p} \left( t + \frac{\epsilon}{2} \right) - \frac{\epsilon}{2} \frac{\partial \mathcal{U}}{\partial \mathbf{q}}(\mathbf{q}(t + \epsilon))\end{aligned}$$

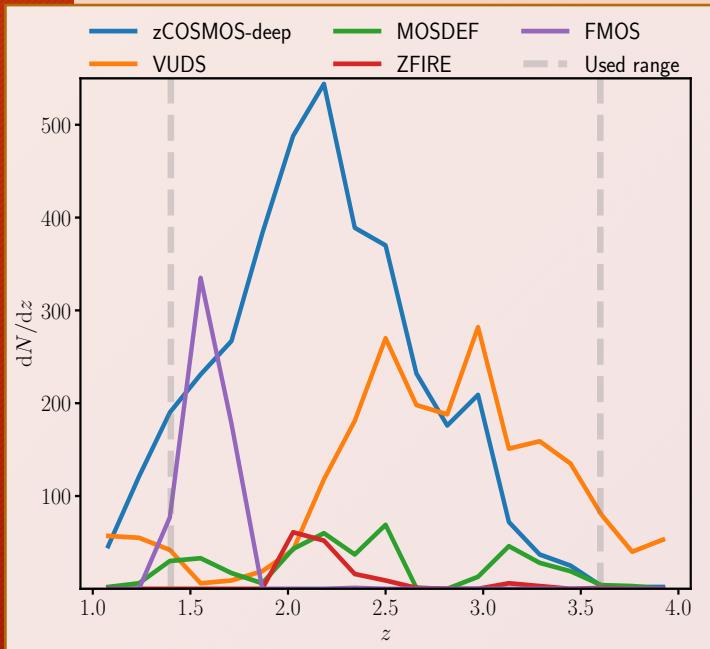
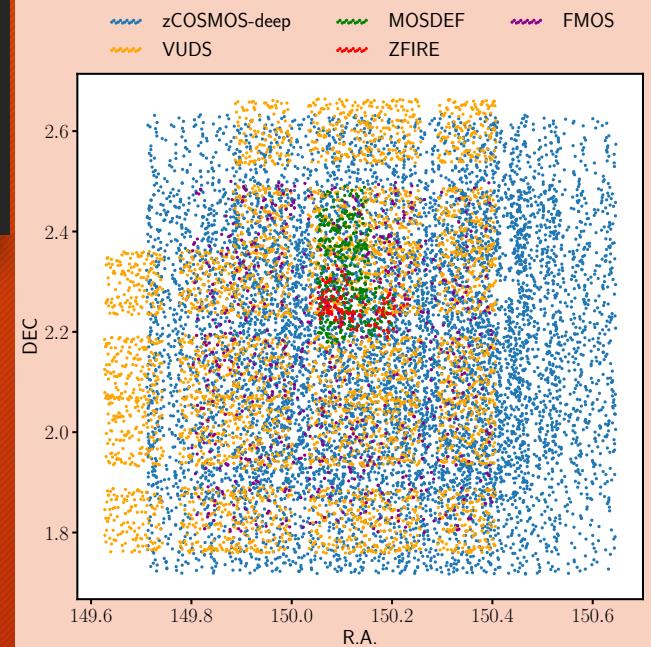
# BIRTH of the COSMOS Field (MA et al 2020 [arXiv:2004.11027](https://arxiv.org/abs/2004.11027))

- We apply our method to the COSMOS field (e.g. Capak et al. 2007, Laigle et al. 2016), because:
  - Deep field ( $1 < z < 6$ ), with  $5 \times 10^5$  galaxies,
  - Covering the peak of star formation (Madau&Dickinson 2014, Chiang et al 2017)
  - Ideal test lab for early structure formation
  - Ly $\alpha$  tomography:  
CLAMATO (Lee et al. 2014a,b, 2016, 2018),  
LATIS (Newman et al. 2020) in same field
  - Hosting several high redshift massive galaxy protoclusters observed  
(Diener et al. 2013, 2015; Chiang et al. 2015;  
Casey et al. 2015; Wang et al. 2016;  
Lee et al. 2016; Cucciati et al. 2018; Lemaux et al. 2018;  
Darvish et al. 2020)



# BIRTH of the COSMOS Field (MA et al 2020 [arXiv:2004.11027](https://arxiv.org/abs/2004.11027))

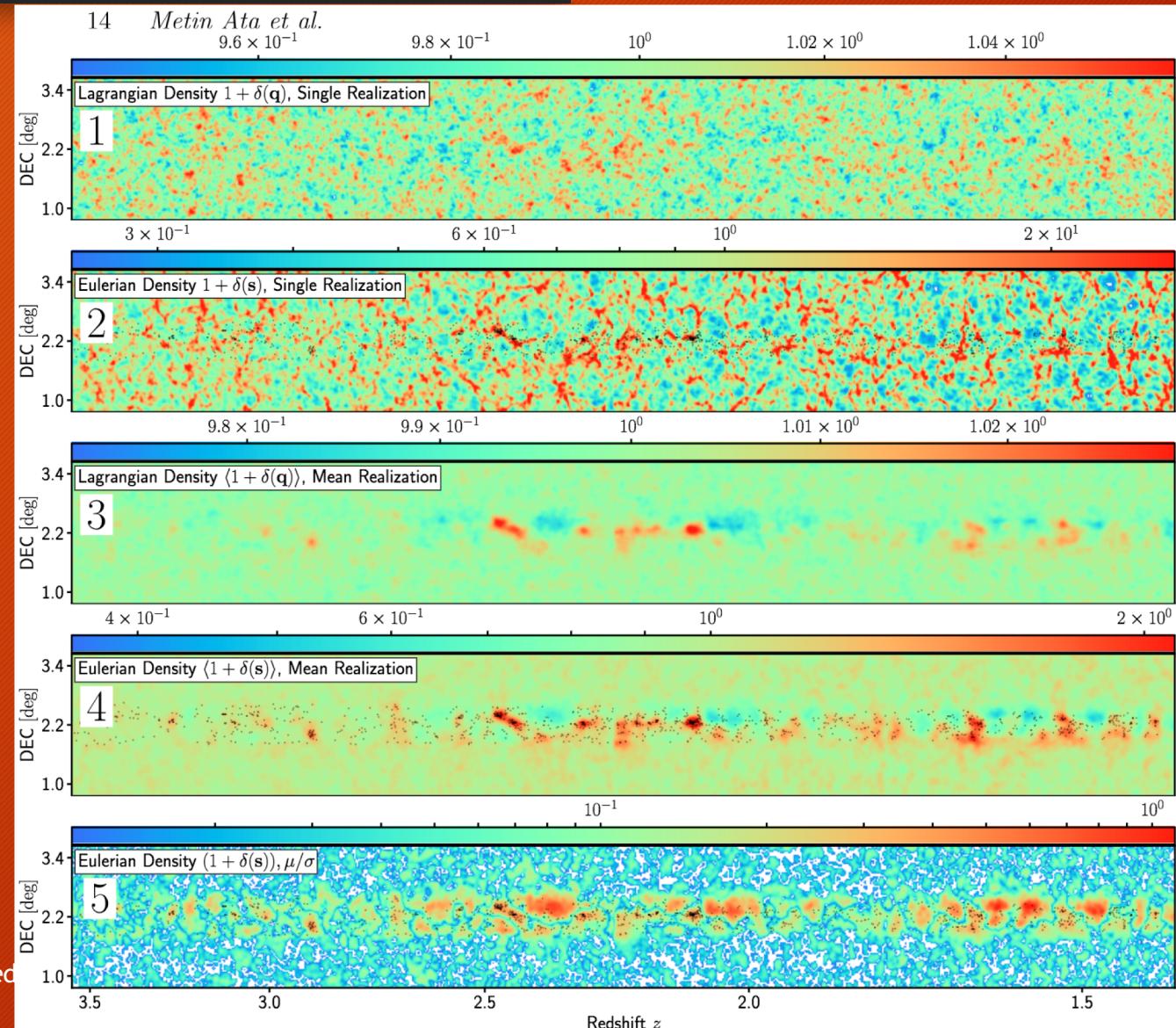
- Several spectroscopic surveys operated in the COSMOS field
  - Pro: More reliable redshift estimates
  - Con: Fewer galaxies
  - Con: Non-uniform selection function
- Surveys have different number densities, footprints, selection functions, biases
- Multi-survey & multi-tracer reconstruction needed



# BIRTH of the COSMOS Field (MA et al 2020 [arXiv:2004.11027](https://arxiv.org/abs/2004.11027))

- Work in a comoving Cartesian frame:
- $d_{\text{LOS}} = 1896 h^{-1}\text{Mpc}$ ,  $d_{\text{Trans}} = 66 - 74 h^{-1}\text{Mpc}$
- Cell resolution of  $2 h^{-1}\text{Mpc}$  per side
- Using fiducial CLAMATO cosmological parameters for immediate comparability

Drawing ~8000 samples of the posterior



## Menu of this talk

- Galaxy clustering / Galaxy surveys
- Density field & Initial conditions reconstructions
- Constrained simulations

## Constrained simulations

- What are Protoclusters? - [arXiv:1506.08835](https://arxiv.org/abs/1506.08835)
- Protocluster *candidates* are spatial concentrations of galaxies
- Not yet a galaxy cluster (virialization, gravitationally bound)
- Strong environmental dependency whether or not protocluster candidate evolves to cluster
- Galaxy surveys observe positions in redshift space
- Not straight forward to predict  $z=0$  mass from distant observations

*Use constrained simulations on top of inferred initial conditions to predict the fate of the protoclusters today*

# Constrained simulations II

Spectroscopic Galaxy catalogs →

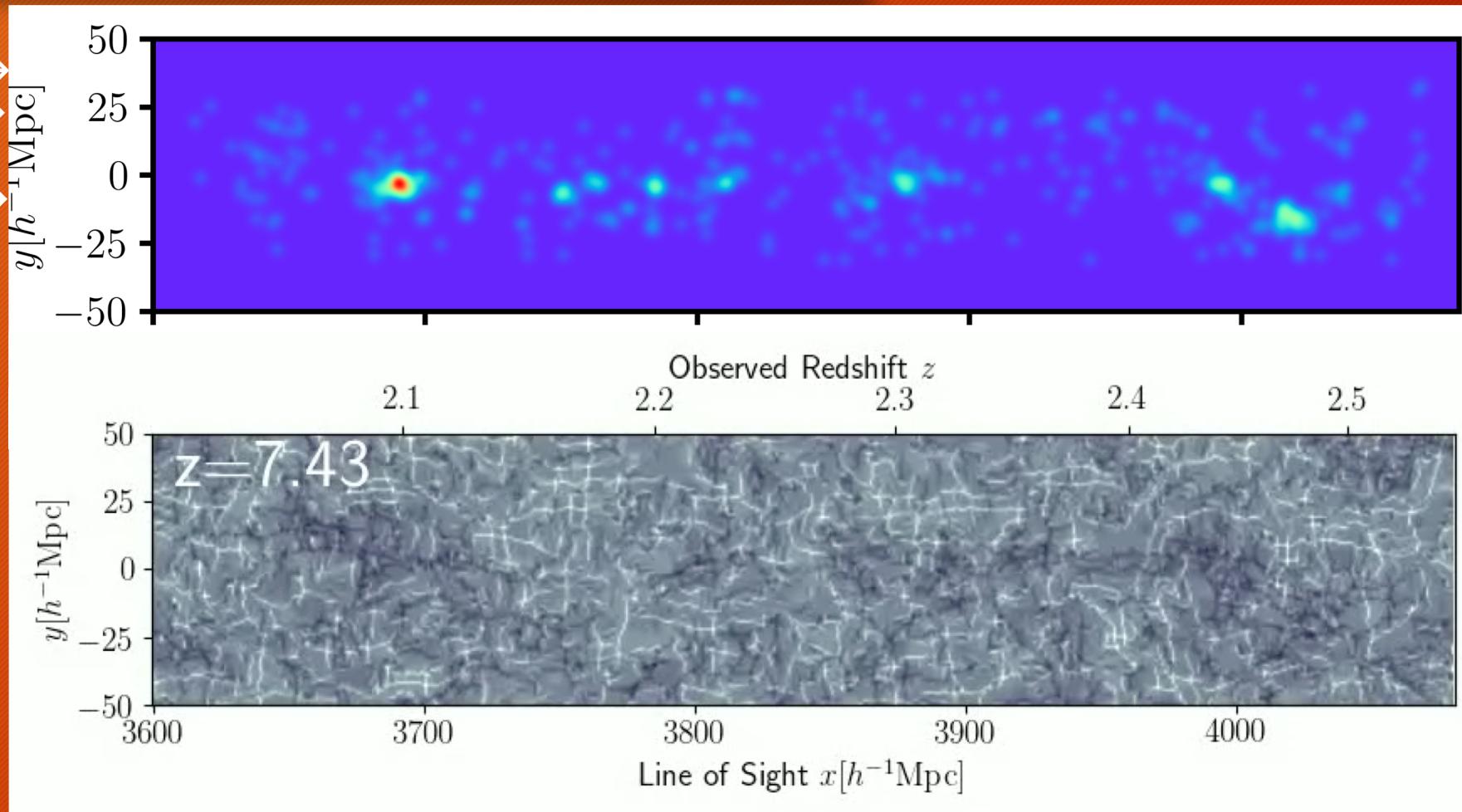
Initial Density (*BIRTH*, (F.-S.Kitaura, MA et al. 2019)) →

Initial Conditions (*MUSIC*, (O.Hahn&T.Abel 2011)) →

Nbody Sim(*PKDGRAV3* (D.Potter et al. 2016)) →

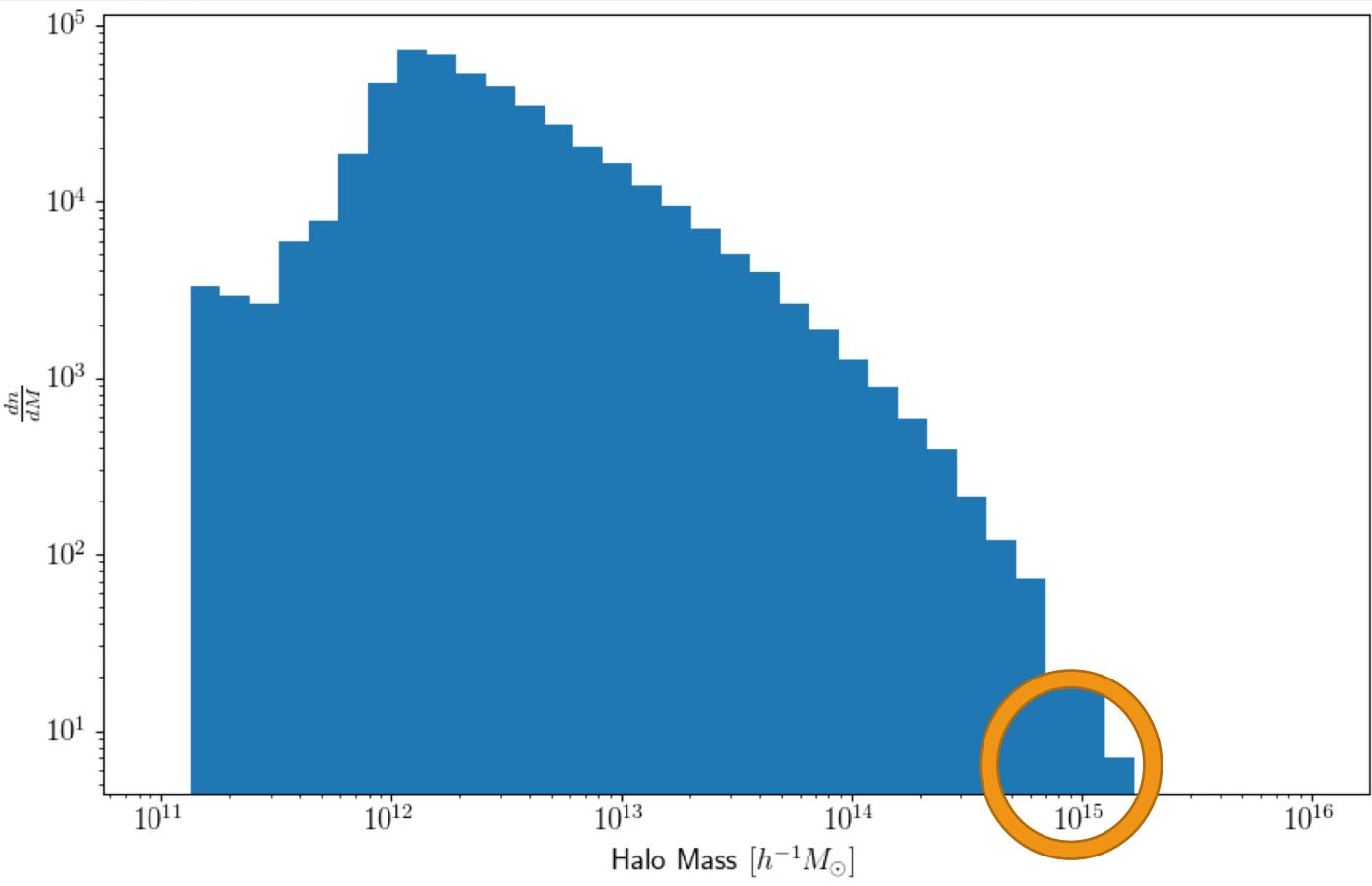
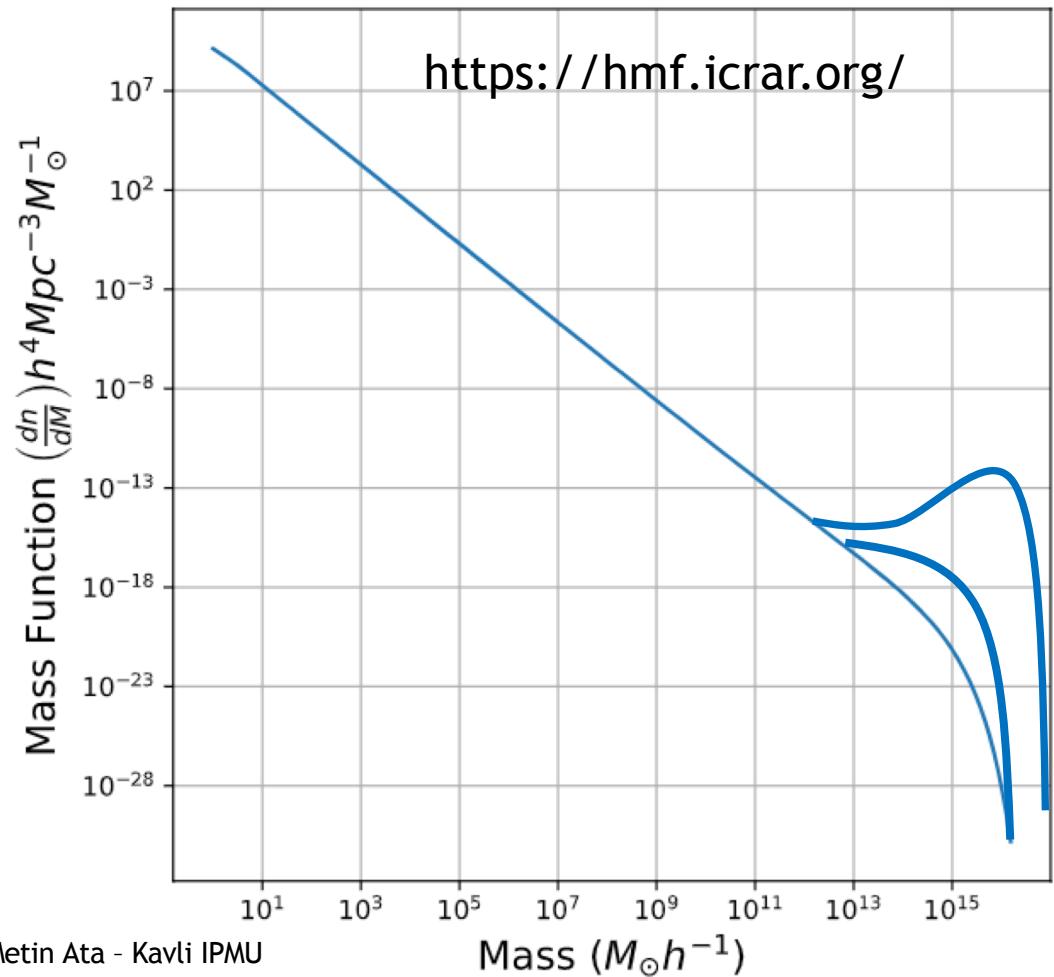
Halo Catalogs (*Rockstar*, (P.Behroozi et al. 2013a)) →

Trees (*Consistent trees*, (P.Behroozi et al. 2013b)) →



# Constrained simulations III: Results for z=0

- Closer look at most massive halos



## Menu of this talk

- Galaxy clustering / Galaxy surveys
- Density field & Initial conditions reconstructions
- Constrained simulations
- Conclusions

## Conclusions

- Matter clustering important to learn about cosmological parameters/models
- Density field reconstructions from spectroscopic galaxy surveys great tool
- Constrained simulations enable us to analyze observed structures on simulation level with full phase-space information