

# Dark Quest II project and halo shapes

**Takahiro Nishimichi** (YITP, Kyoto U / Kavli IPMU, U of Tokyo)

w/ **Satoshi Tanaka**, and many others in HSC weak lensing working group

See also:

*TN+ ApJ* **884** (2019) 29

*Kobayashi+ PRD* **102** (2020) 063504

*Kobayashi+ PRD* **105** (2022) 083517

*Miyatake+ PRD* **106** (2022) 083519

*Miyatake+ PRD* **106** (2022) 083520

*Cuesta-Lazaro+ arXiv:2208.05218*

for **DQ I** and its main applications

# Disclaimer!

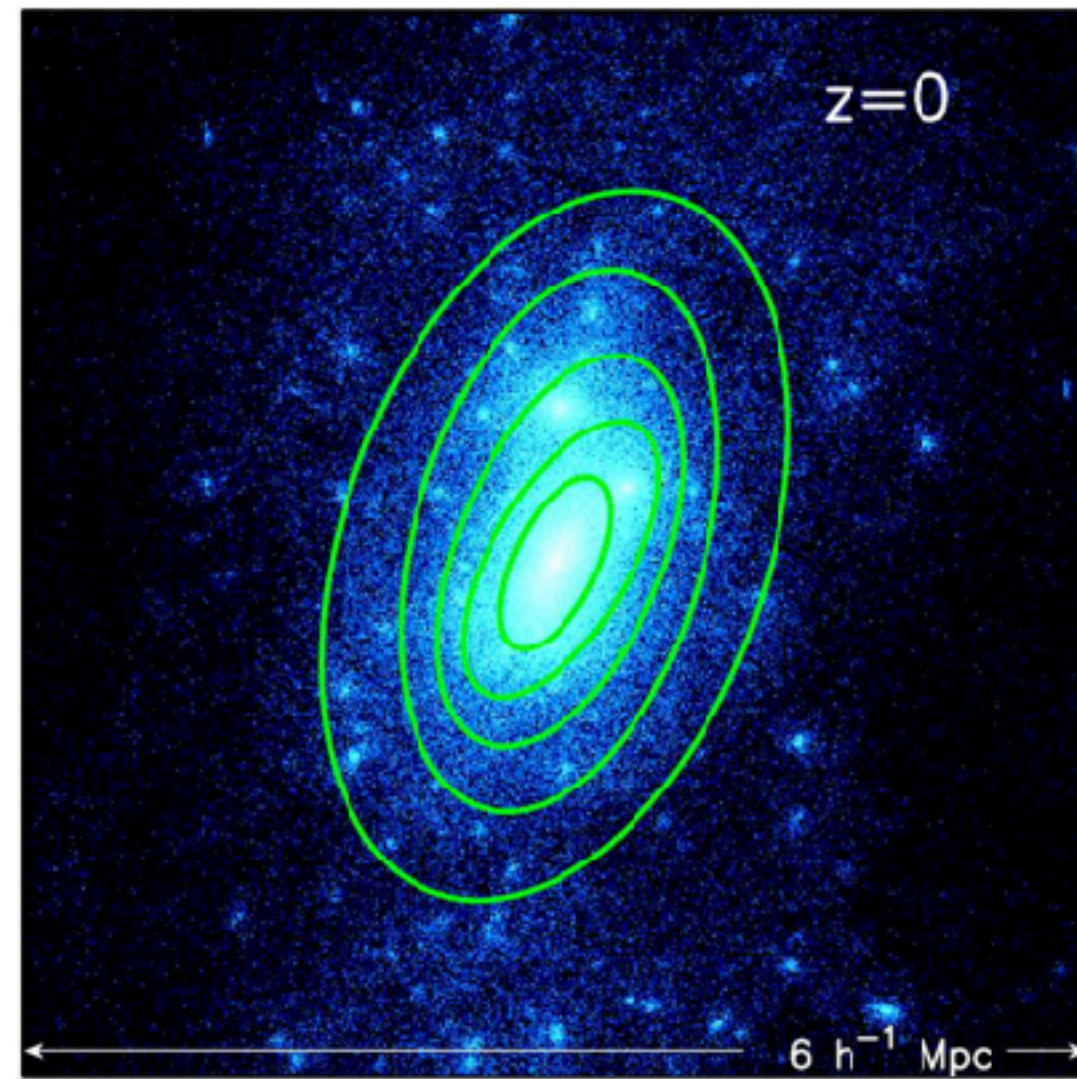
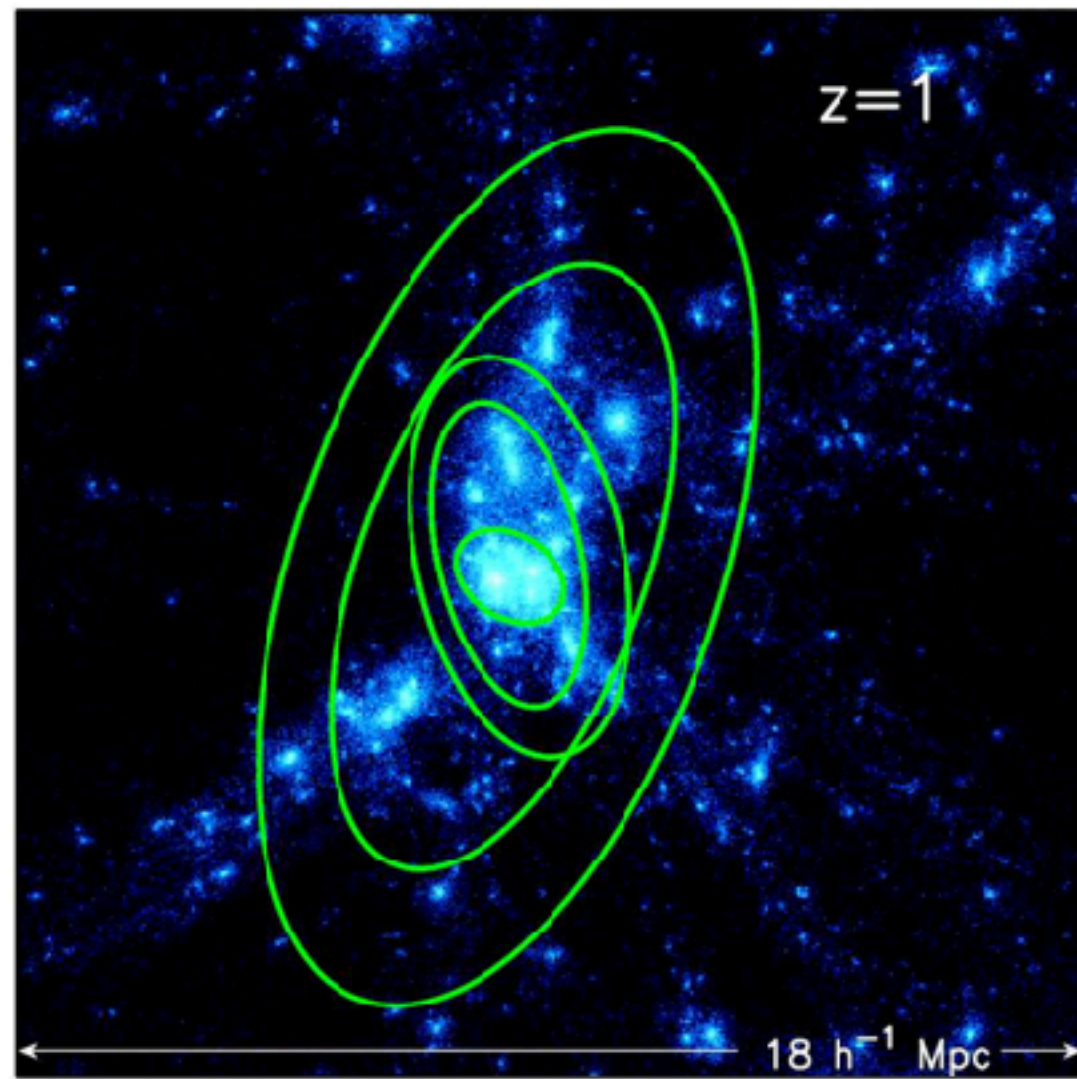
- I am not really seriously working on IA myself !
- But had the opportunities for some fruitful collaborations on shapes of halos and galaxies thanks to many (mostly young) people
  - w/ D. Suto/T. Okabe (U Tokyo) on halo shapes (**pre DQ1**) arXiv:1608.06494, arXiv:1611.05192, arXiv:1804.08843, arXiv:1911.04653, arXiv:2005.11469
  - w/ Ken Osato on projection effects (**DQ1 data**)
  - w/ Teppei Okumura on the configuration-space IA signal (**DQ1 data**)
  - w/ Toshiki Kurita on the Fourier-space counterpart (**DQ1 data**)
    - (see also Kazu Akitsu on non-Gaussianity)
  - w/ Shogo Ishikawa on cluster shapes traced by subhalos (**DQ2 data**)

Already covered

# Disclaimer!

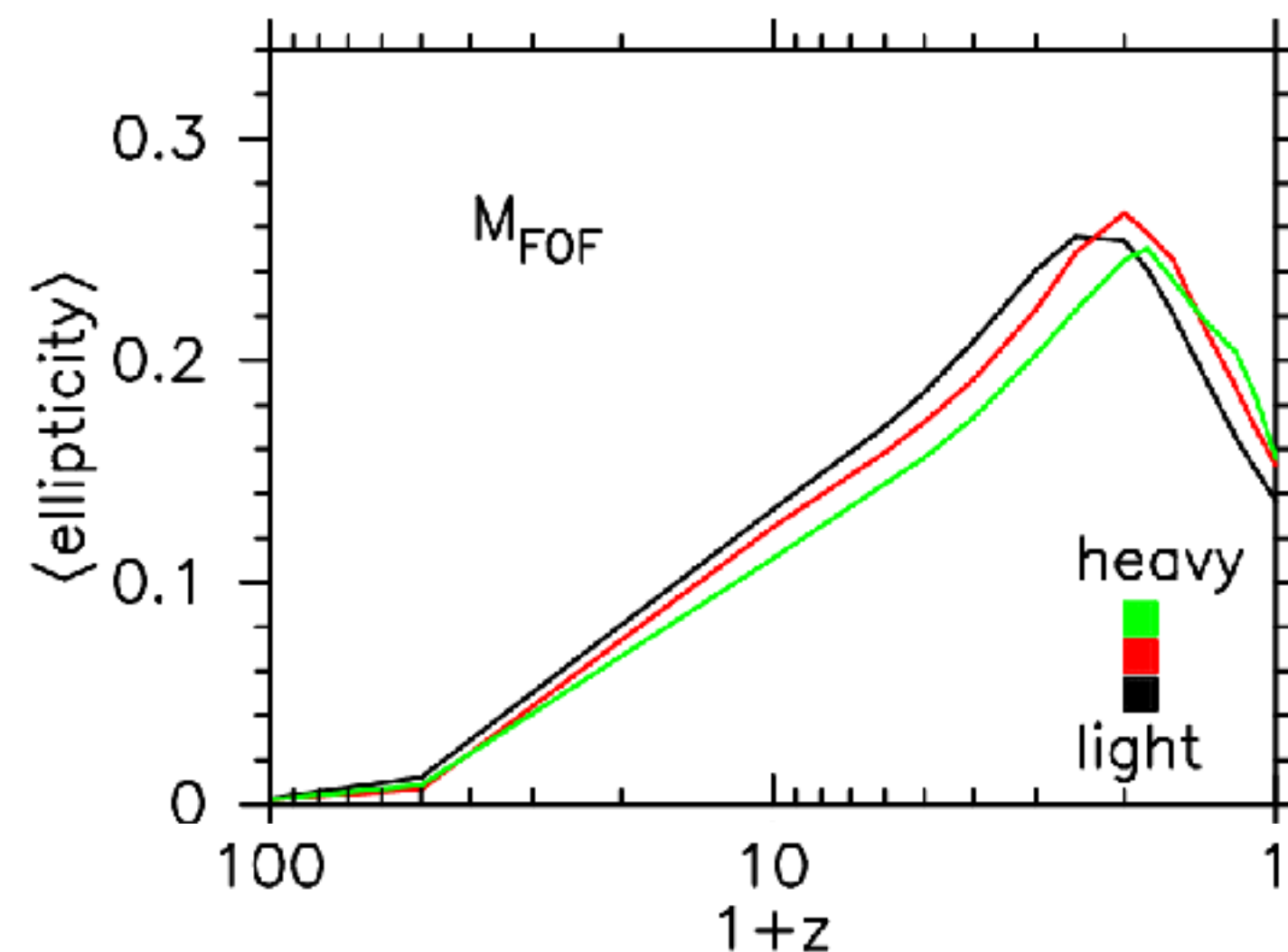
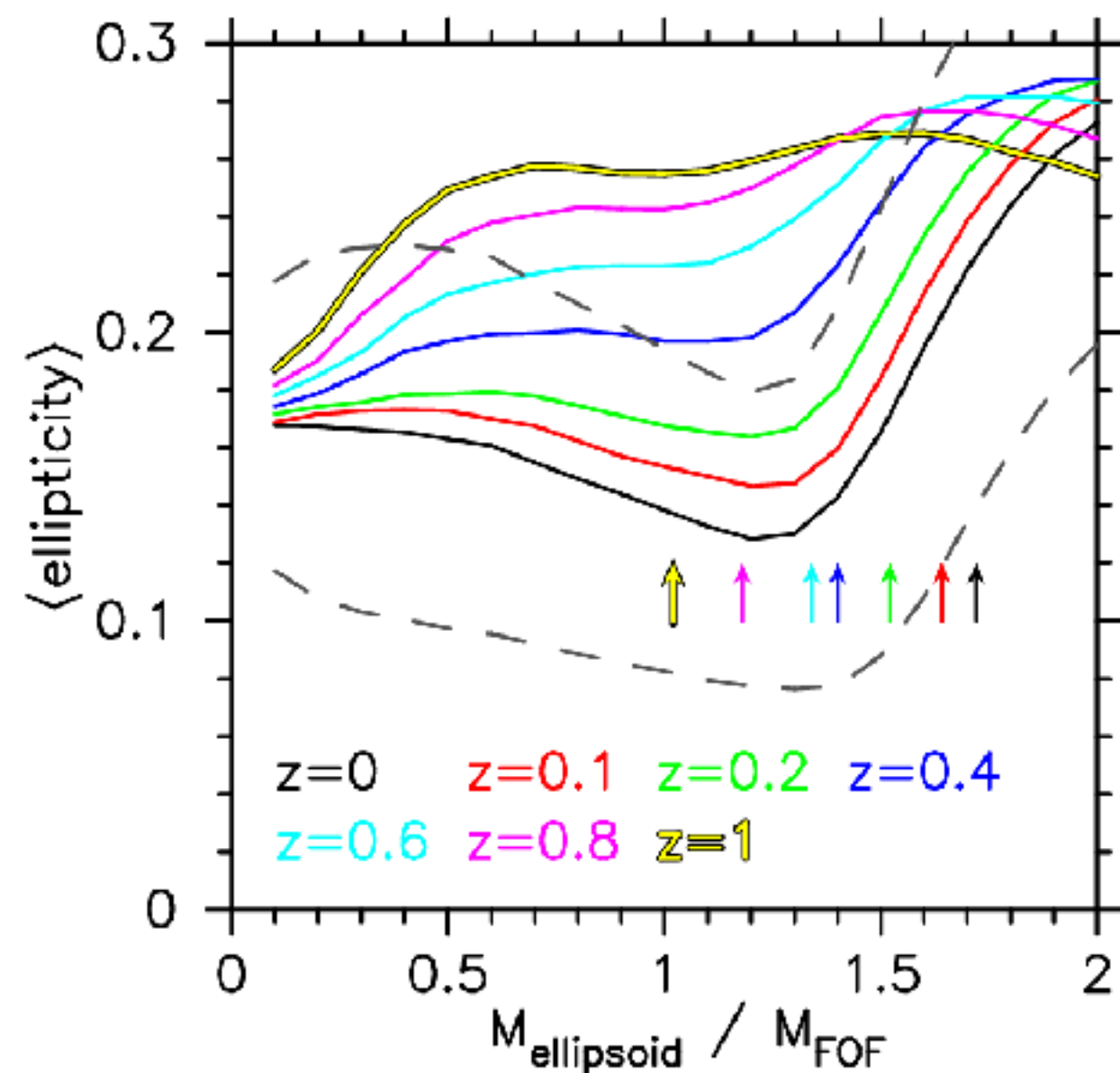
- The “Dark Quest” simulation campaign was originally planned for
  - BAO, RSD, weak lensing (2x2 or 3x2 pt analyses)
- Given the many interesting science cases from galaxy (halo) shapes, I now am seriously thinking of adding them as a part of the standard outputs of the DQ2 products
- Super preliminary results on halo shapes are at the very end of the talk (I have to thank **Satoshi Tanaka** for his hard work!)

# Halo shapes (groups — clusters)

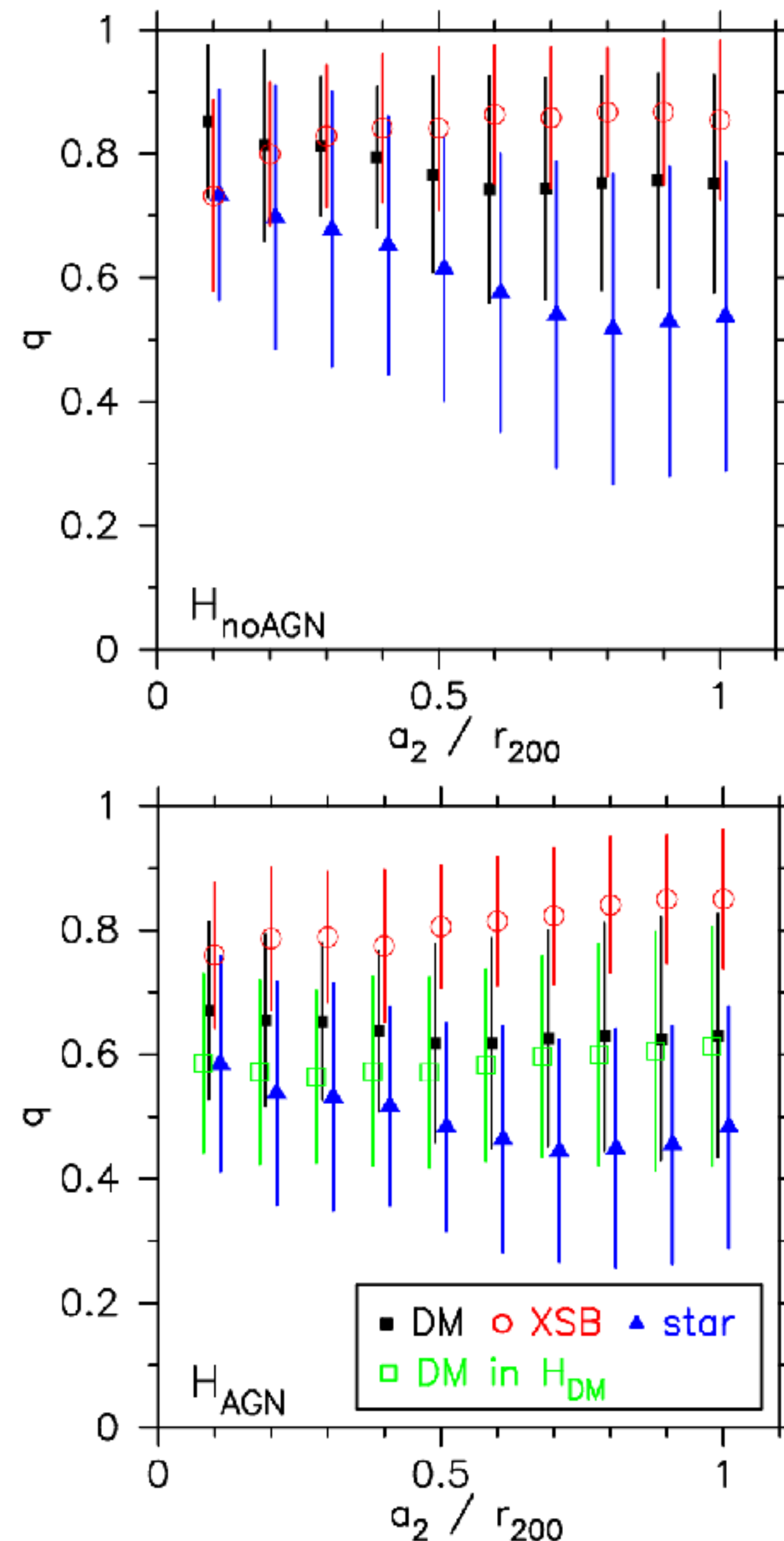
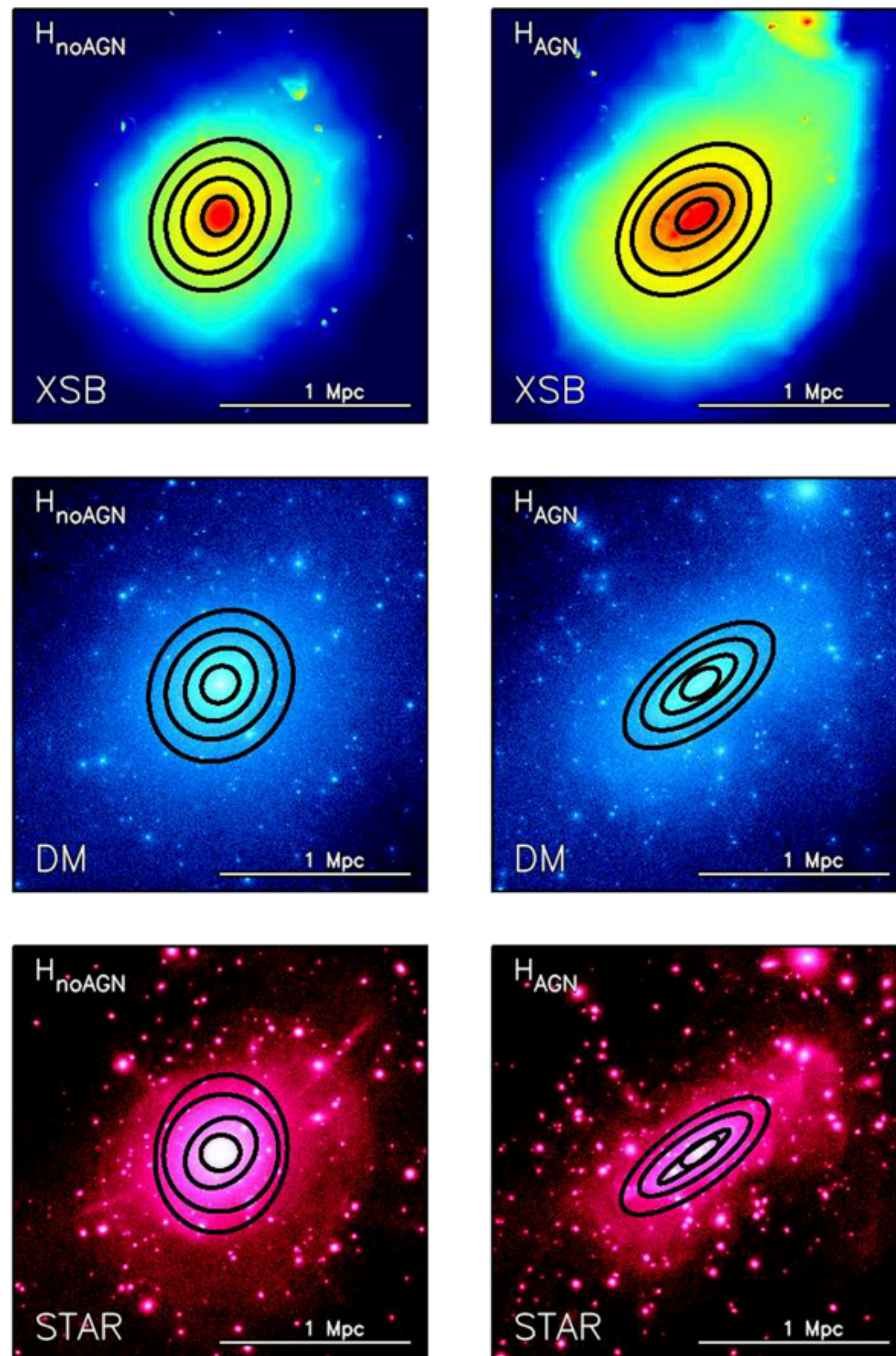


Suto+ arXiv:1608.06494

- Halos acquire the current shape in a complicated manner
- Time dependence
- Radial dependence
- Mass dependence
- Weighting scheme



# Halo shapes (groups — clusters)

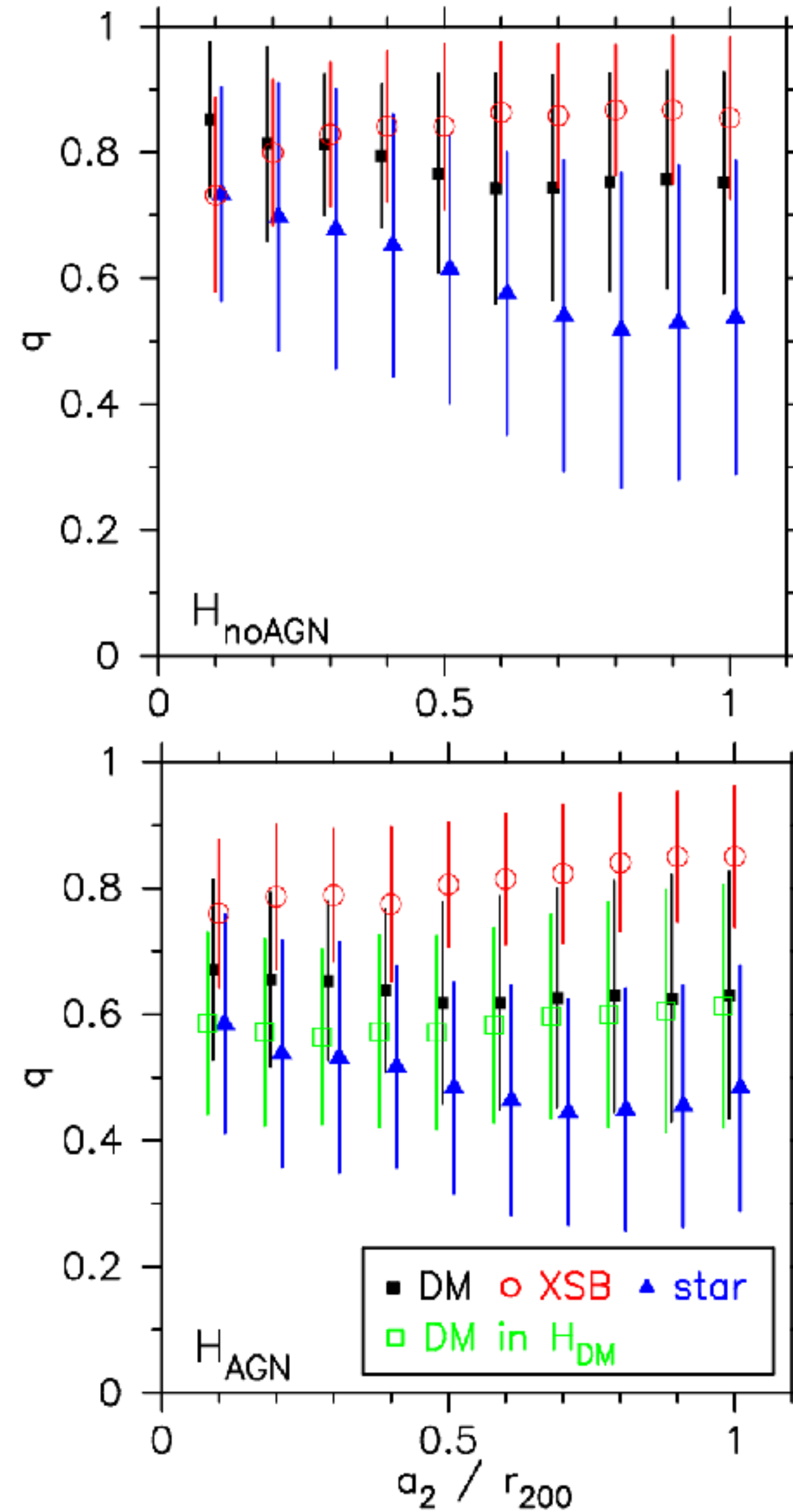
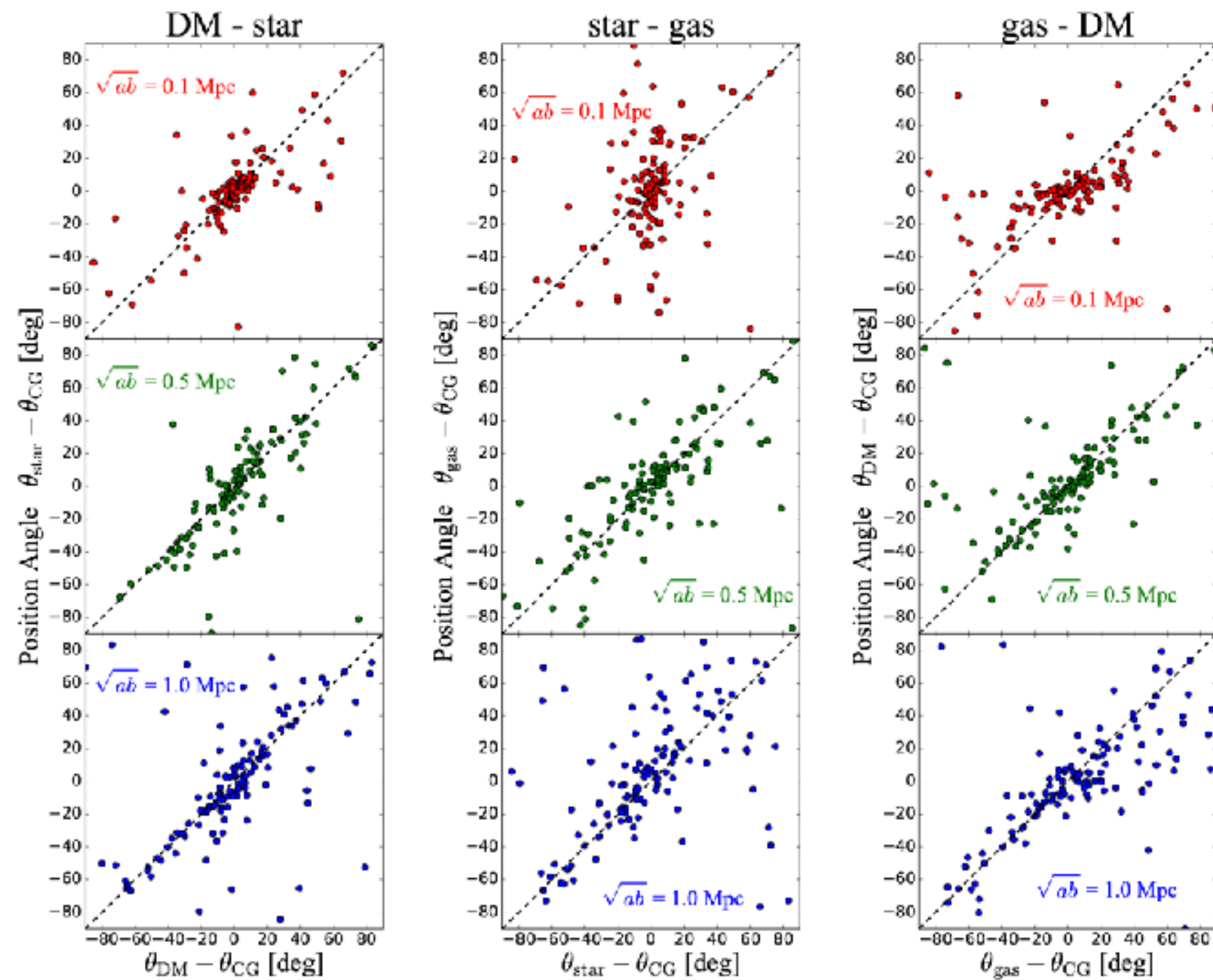
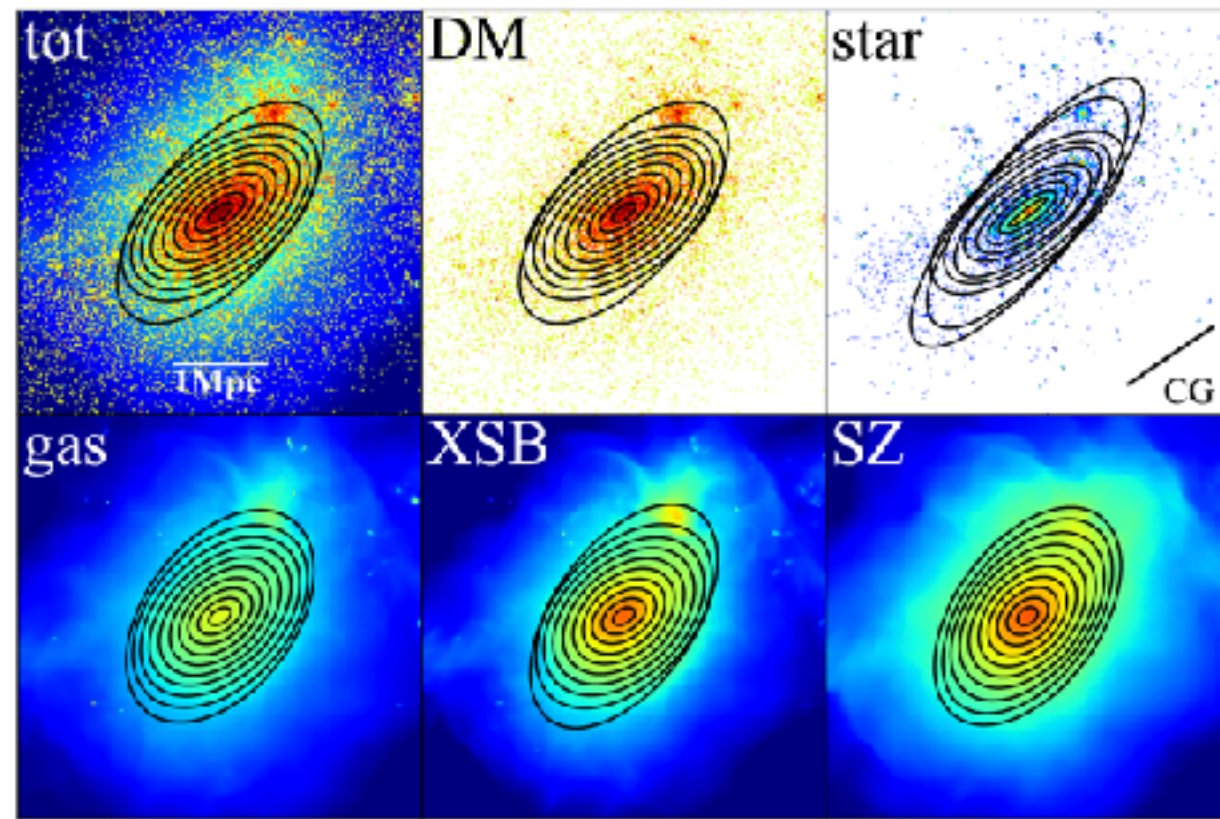


Suto+ arXiv:1611.05192

Horizon AGN simulation

- Halos acquire the current shape in a complicated manner
- Impact of baryonic physics
- Dependence on what we actually observe

# Halo shapes (groups — clusters)



Suto+ arXiv:1611.05192

Okabe+ arXiv:1804.08843

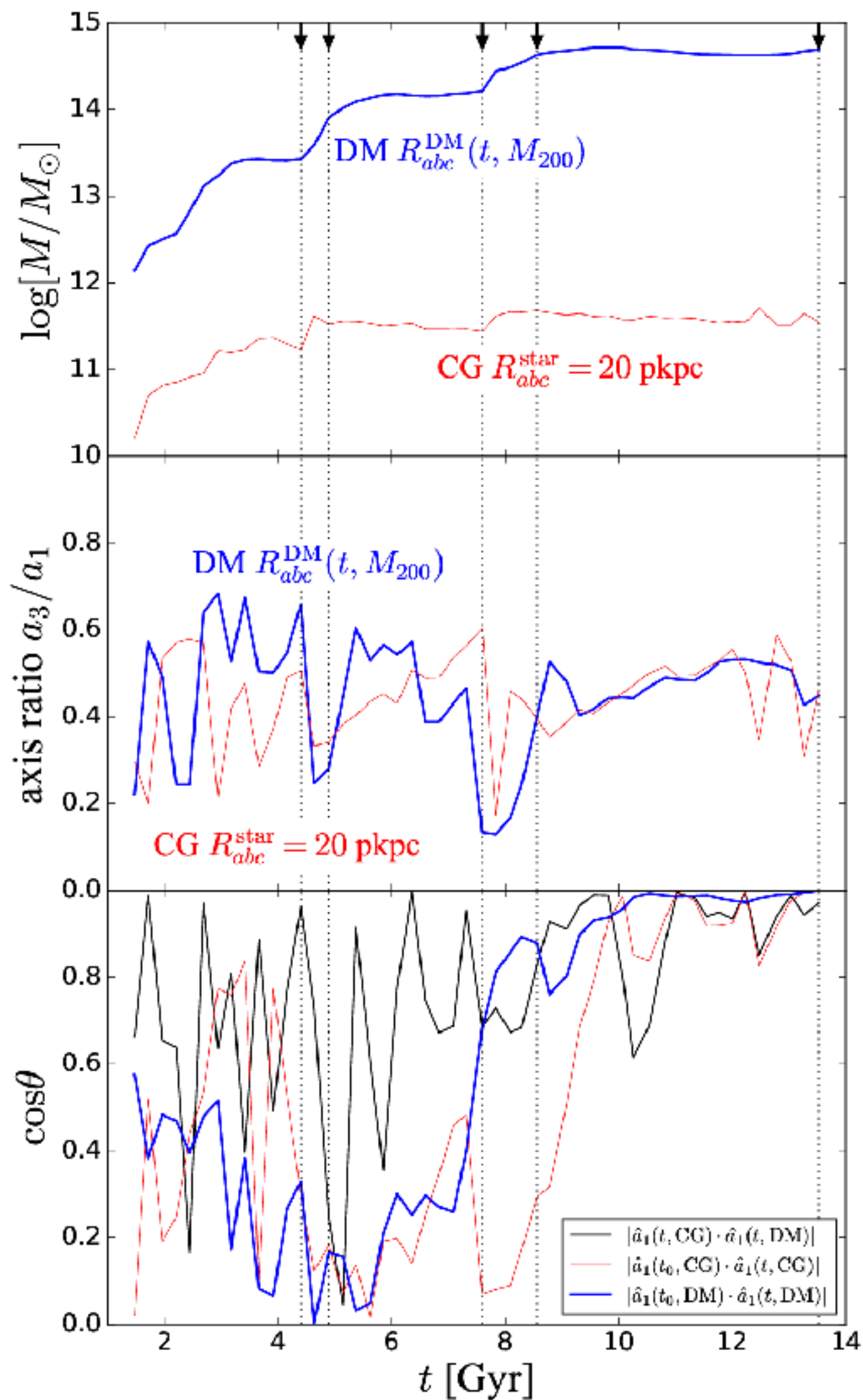
Horizon AGN simulation

- Halos acquire the current shape in a complicated manner
- Impact of baryonic physics
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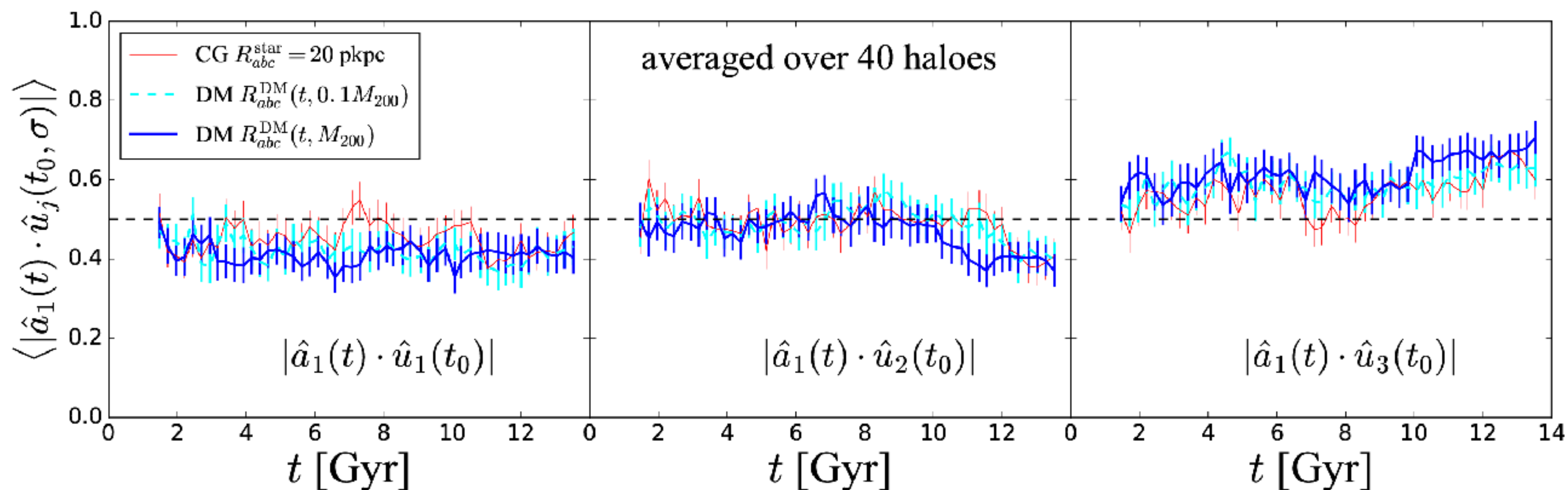
# Halo shapes (groups — clusters)

Okabe+ arXiv:1911.04653

Horizon AGN simulation



- Halos acquire the current shape in a complicated manner
- Time evolution is like a random process due to mergers
- Large scale tides are the attractor

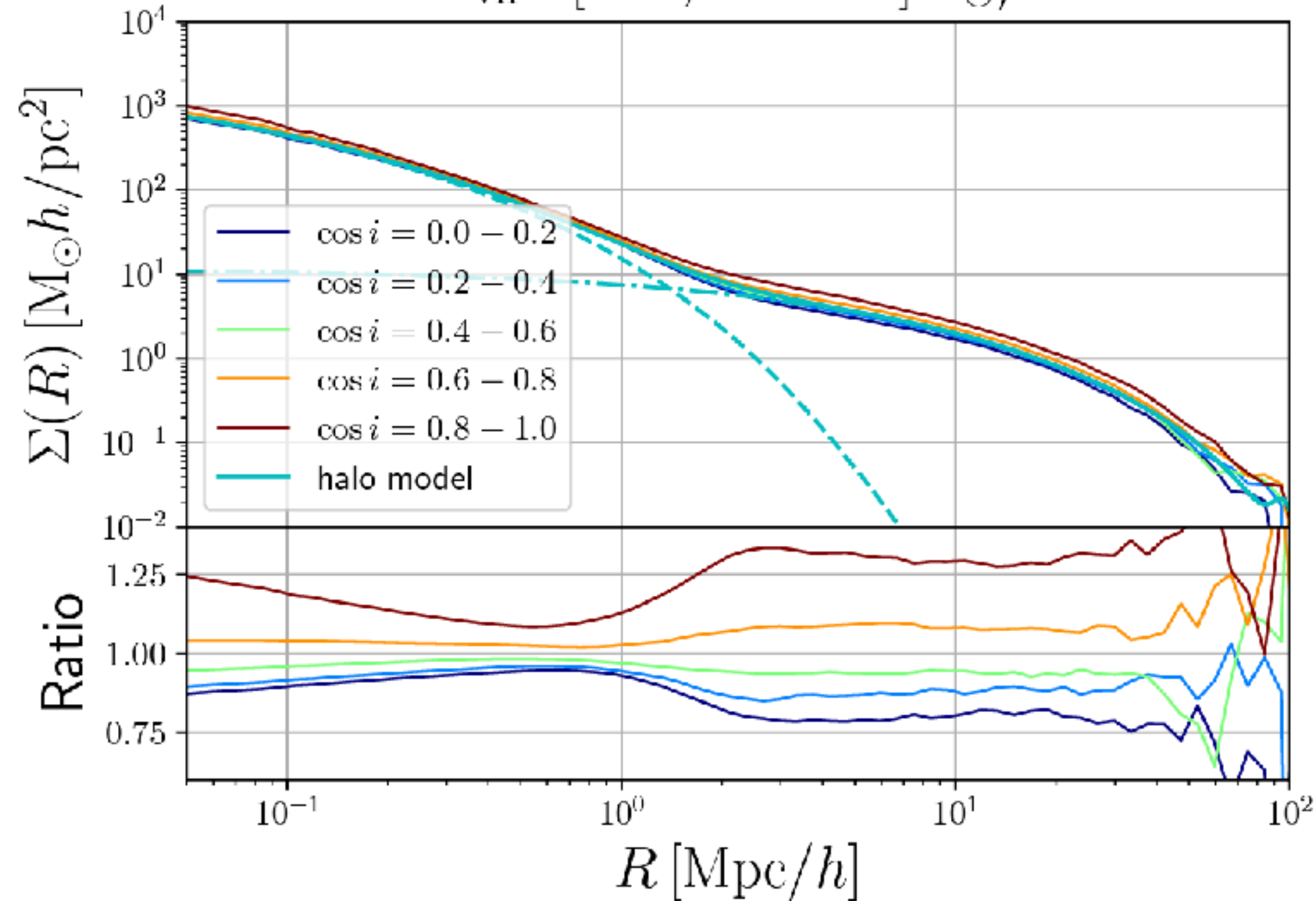


# Orientation dependence of clustering

Osato+ arXiv:1712.00094

DQ1 simulations

$M_{\text{vir}} : [10^{14}, 5 \times 10^{14}] M_{\odot}/h$

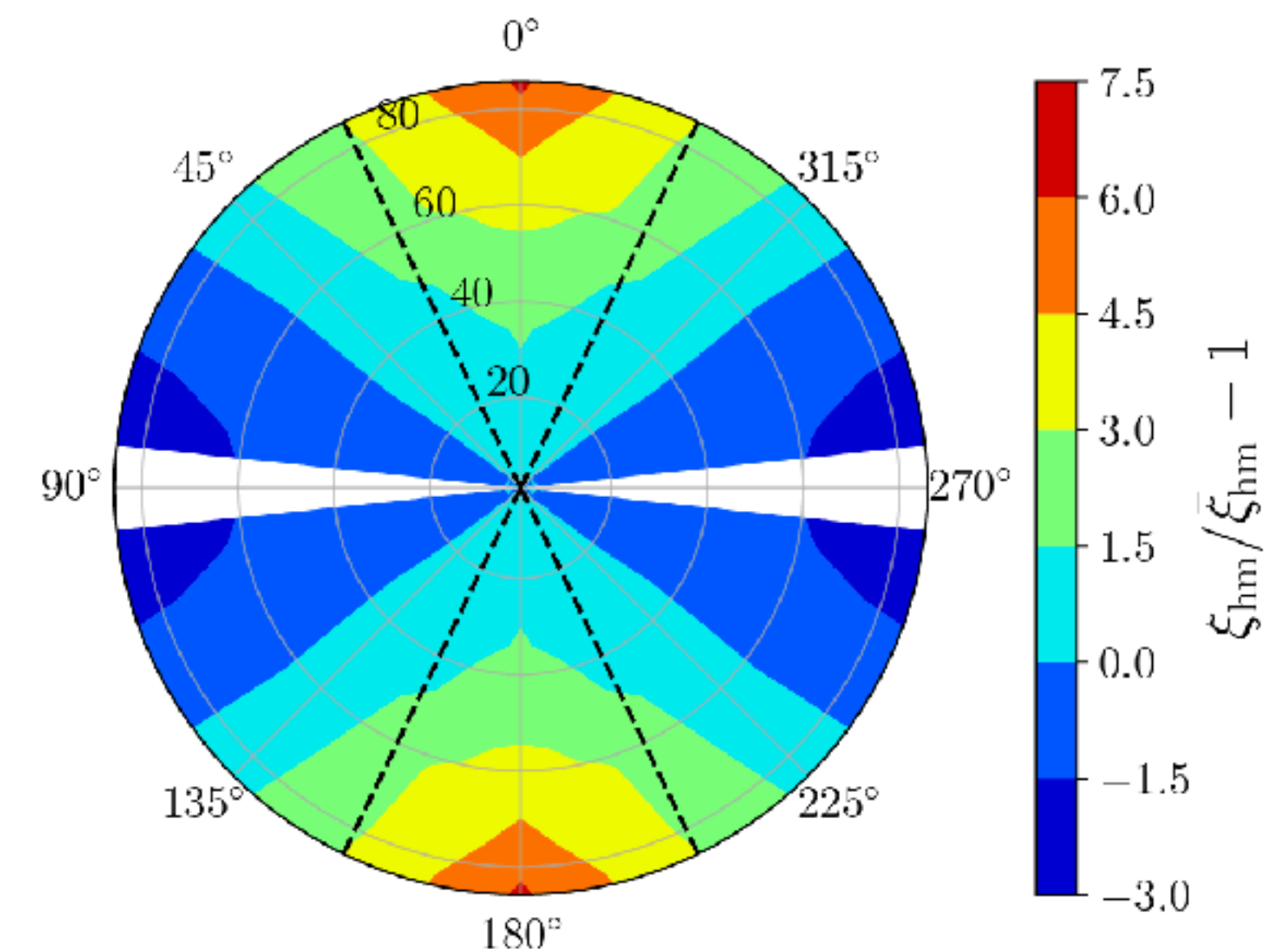


- Angular clustering could be affected if clusters elongated along the line of sight are preferentially detected

- Nothing but the IA signal

- $\xi_{g+}$

- Quadrupolar



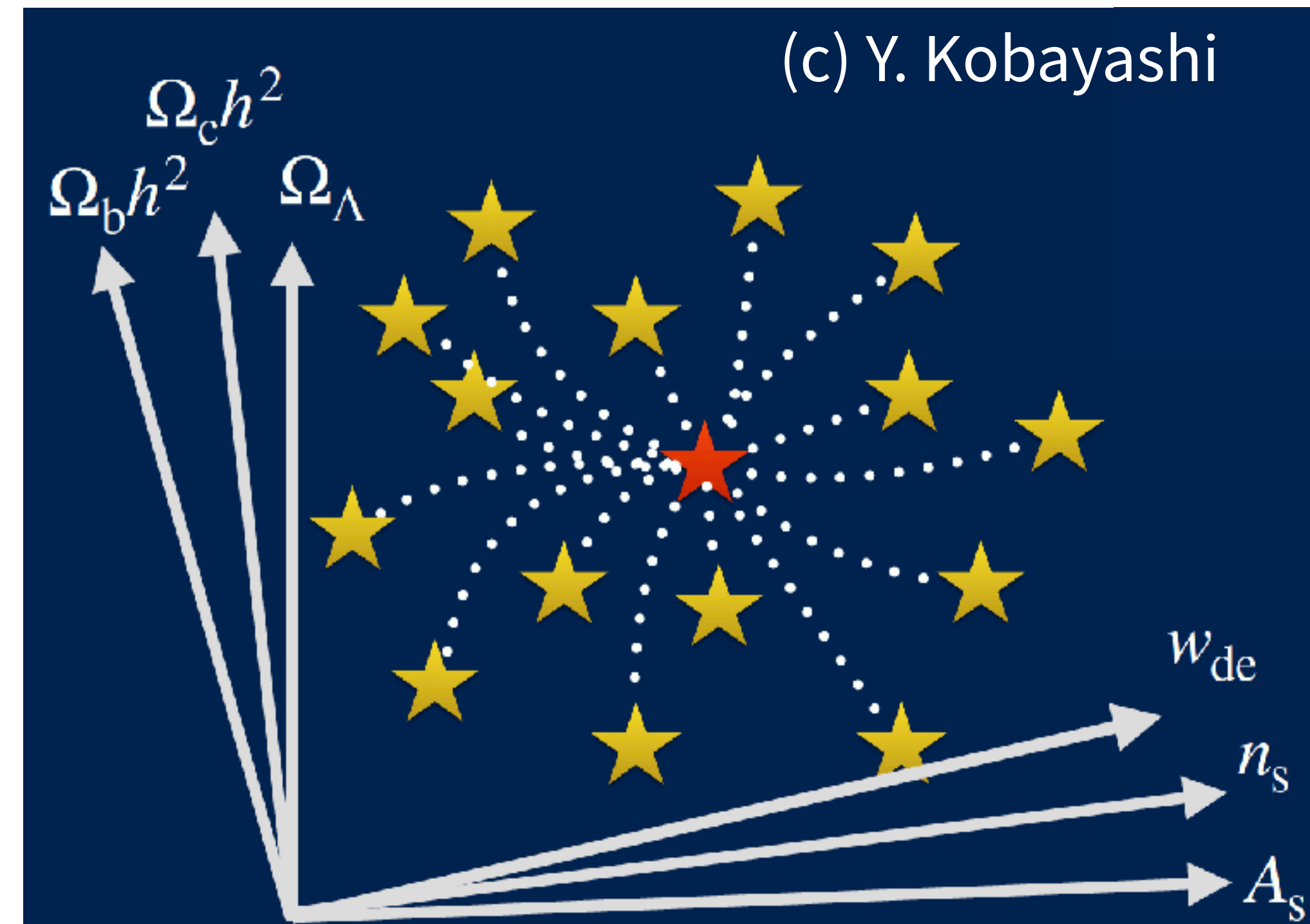
See also Sunayama *et al.* '20 (and Jingjing's talk)



# Dark Quest I

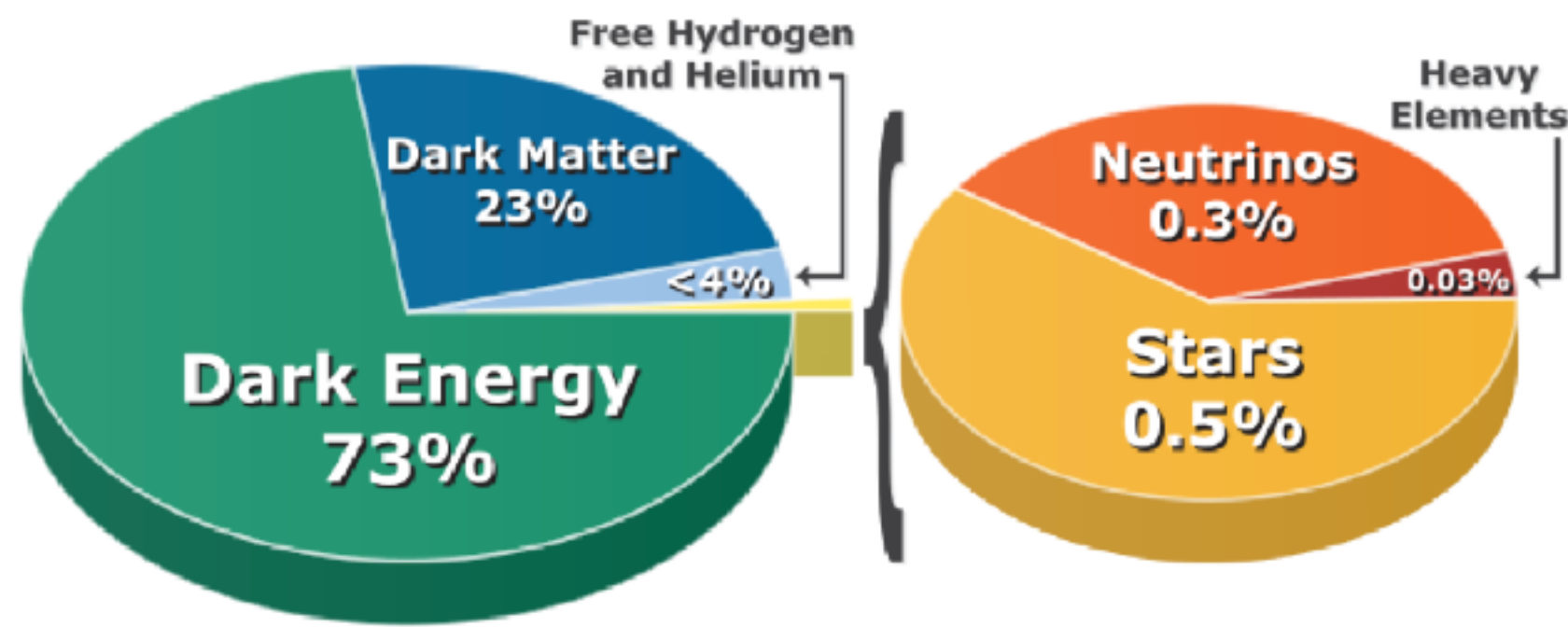
# Our solution: Emulation

- Replace costly numerical simulations with **a cheap statistical model** making “*simulation-based inference*” possible
  - Multi-input regression problem
  - Key challenge: *curse of dimensionality*
  - Introduced to cosmology by Heitmann+`06 (ApJL; “Cosmic calibration”)
    - Early studies focused on the **matter power spectrum** (not biased tracers)



# Dark Quest Project (2015~)

Observational data  
(Galaxies)



$\omega_b, \omega_c, H_0, A_s,$   
 $n_s, w_0, \dots$

Flexible galaxy-halo connection model (analytical)

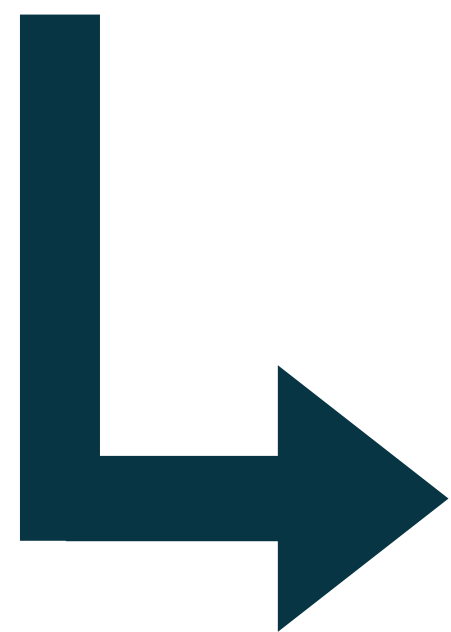


Bayesian inference

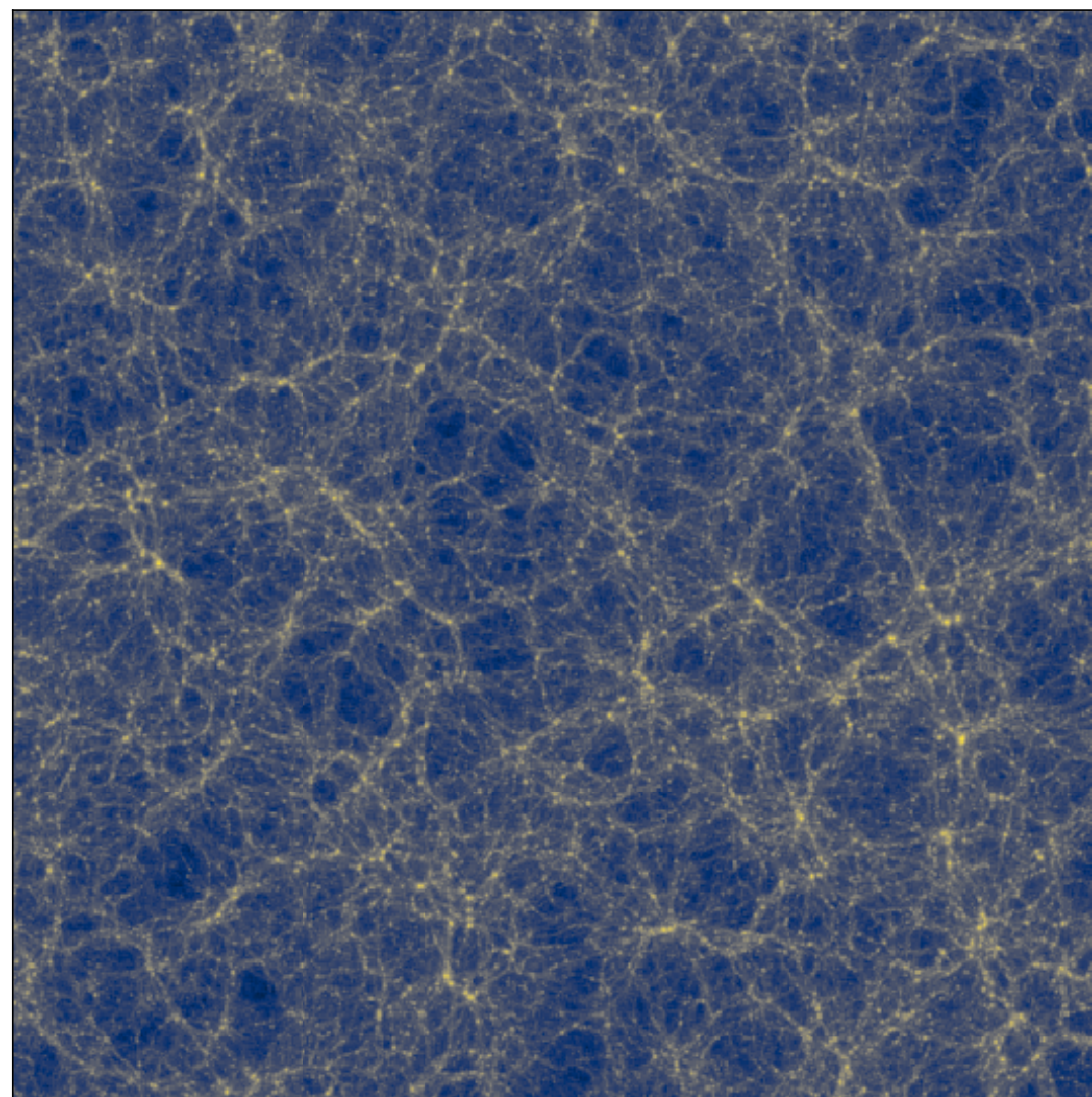
Fast emulation  
~100 milliseconds

Cosmological model/params

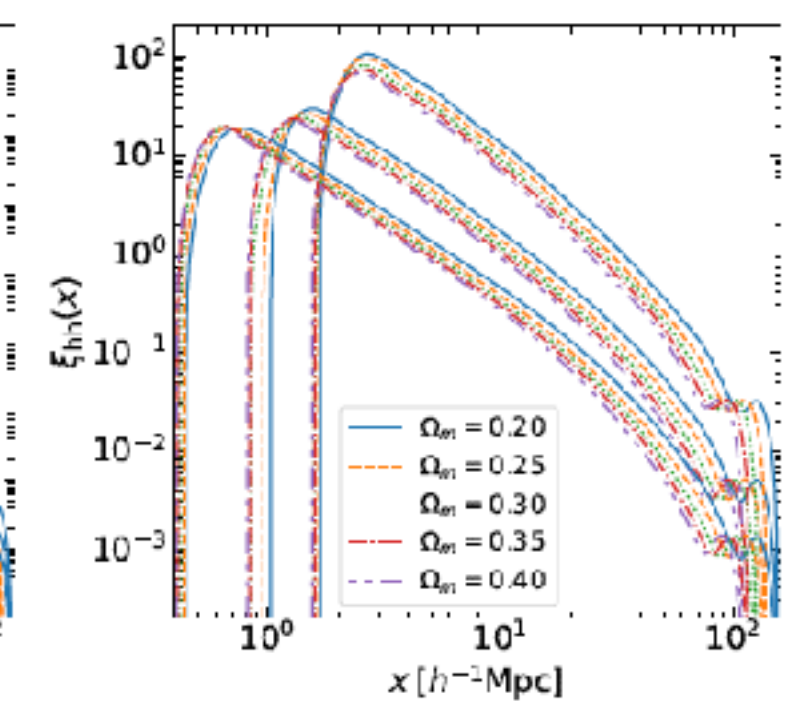
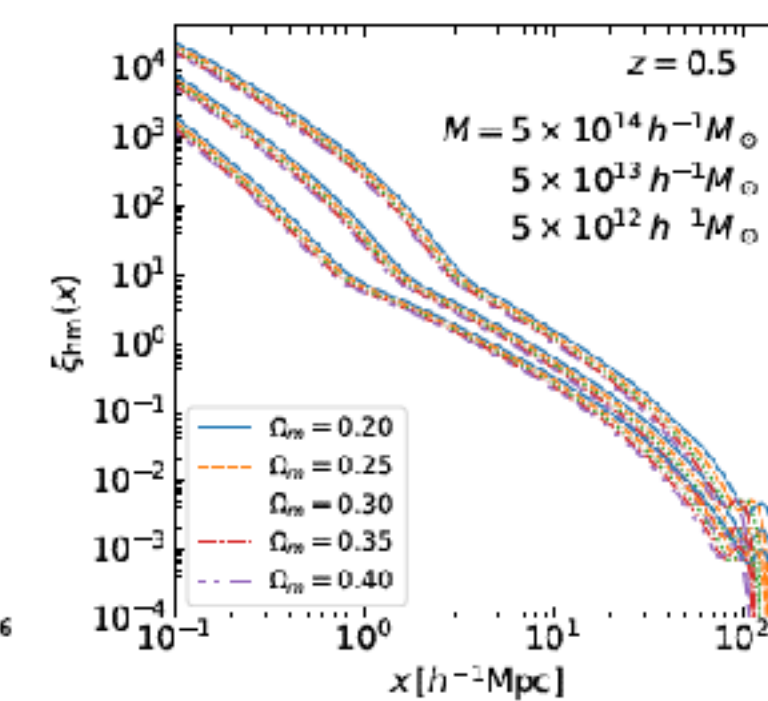
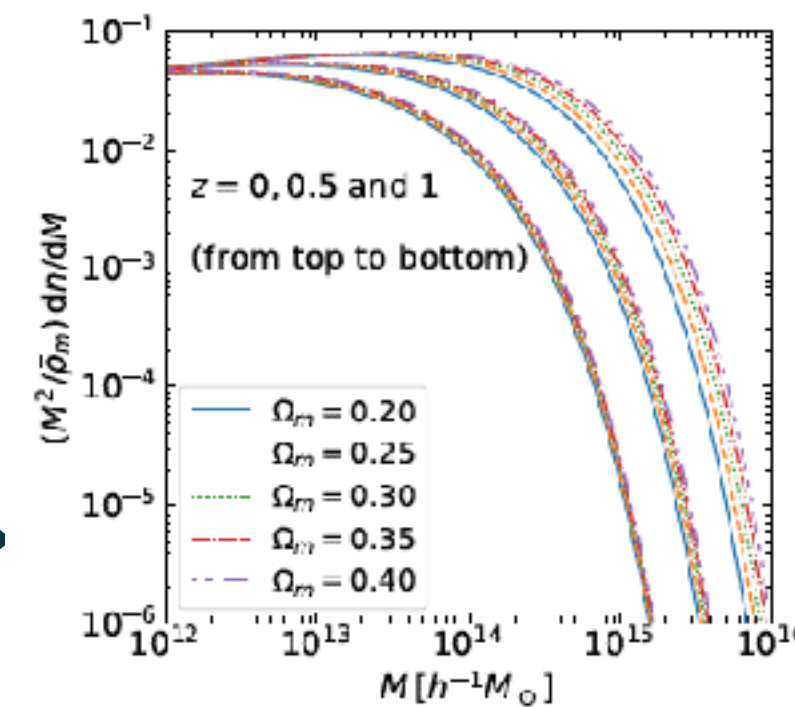
Halo clustering statistics



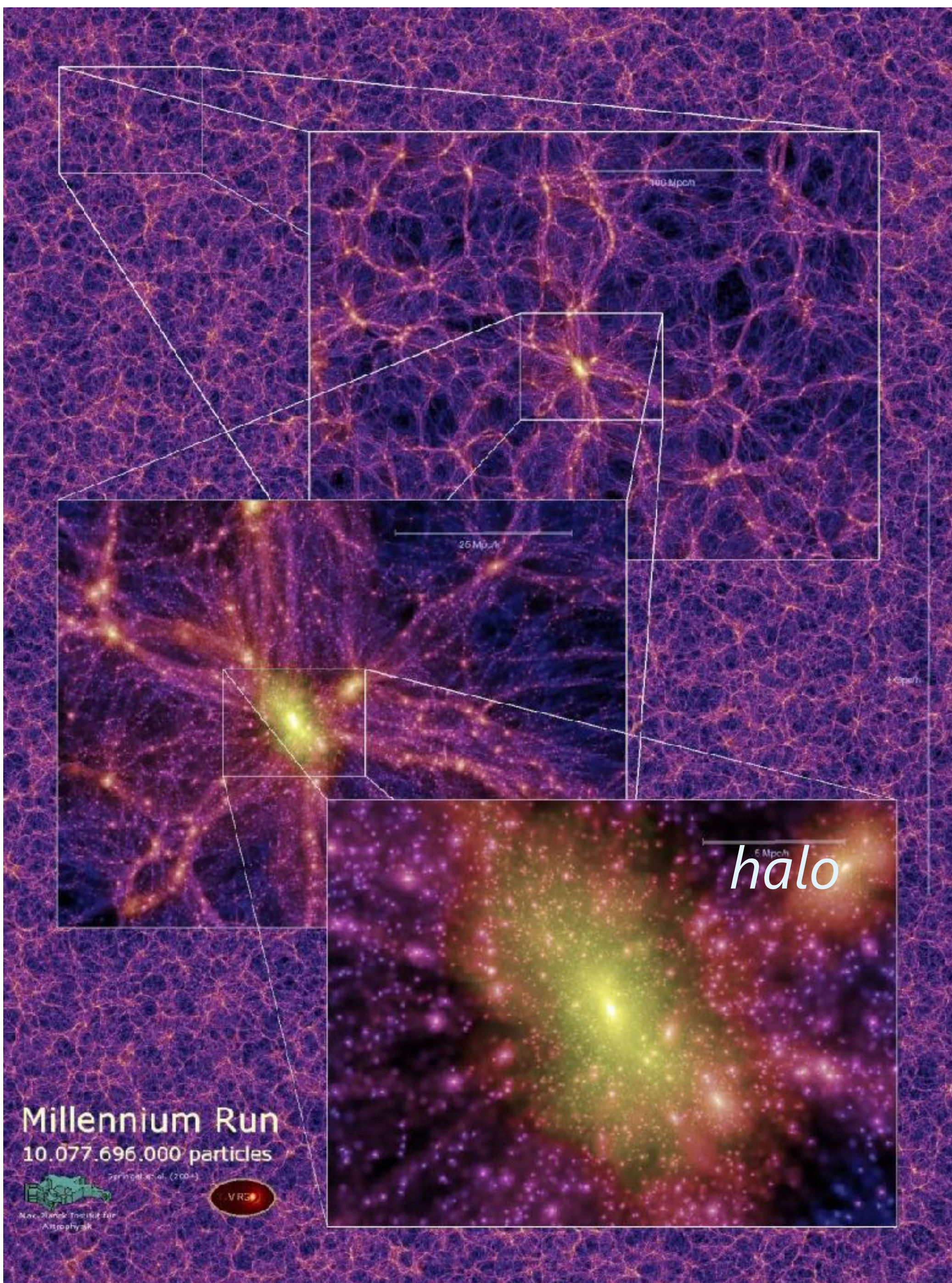
Simulation  
~days



Statistical analysis



Fully investigate basic statistical properties of halos as a function of cosmological parameters



# Project (2015~)

Observational data  
(Galaxies)

$\Omega_c, H_0, A_s,$   
 $\Omega_b, \dots$

Flexible galaxy-halo connection model (analytical)

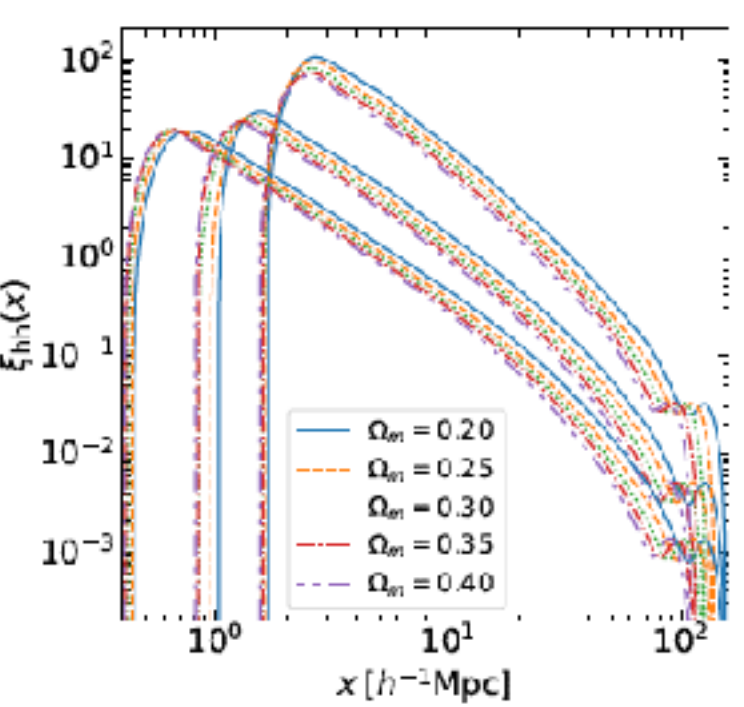
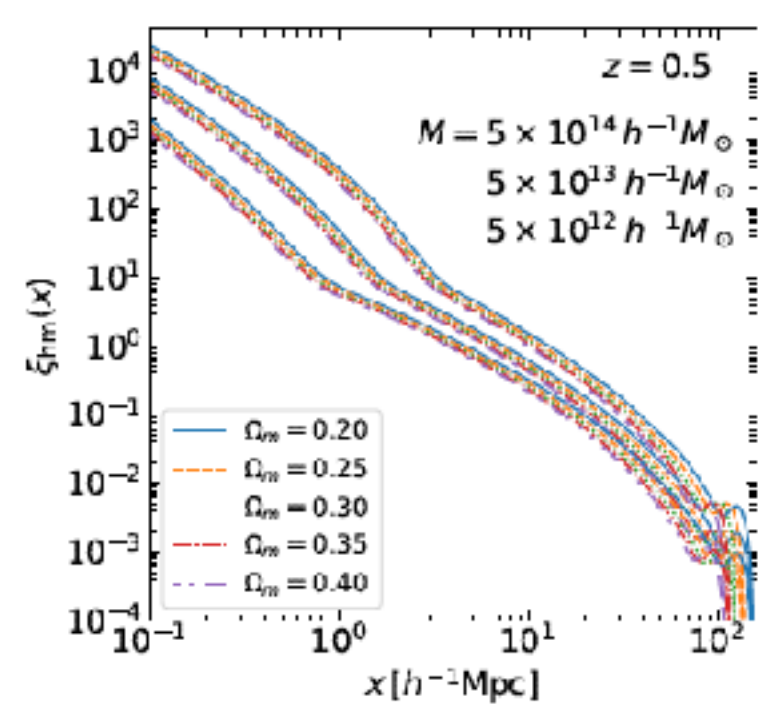
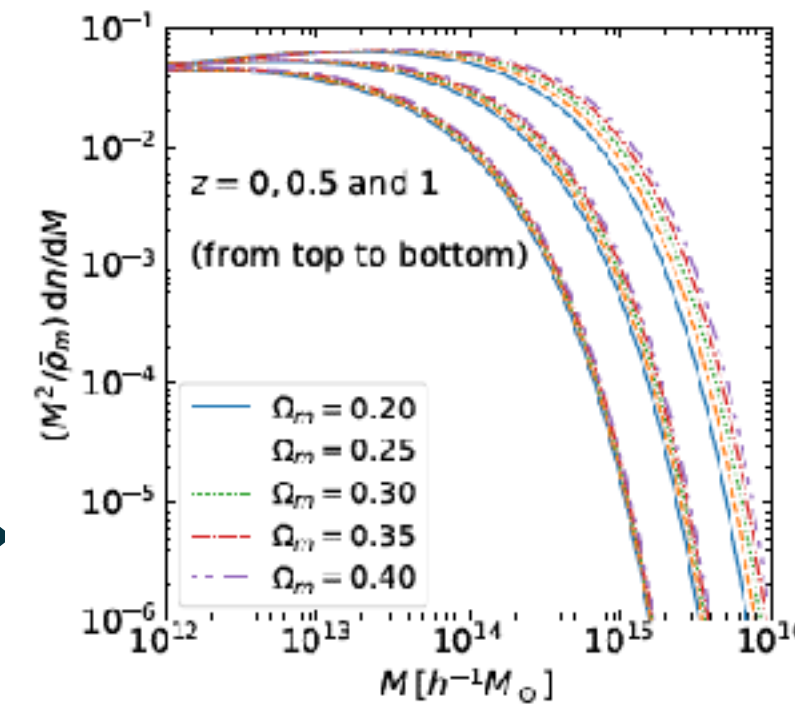


Bayesian inference

Fast emulation  
~100 milliseecs

## Halo clustering statistics

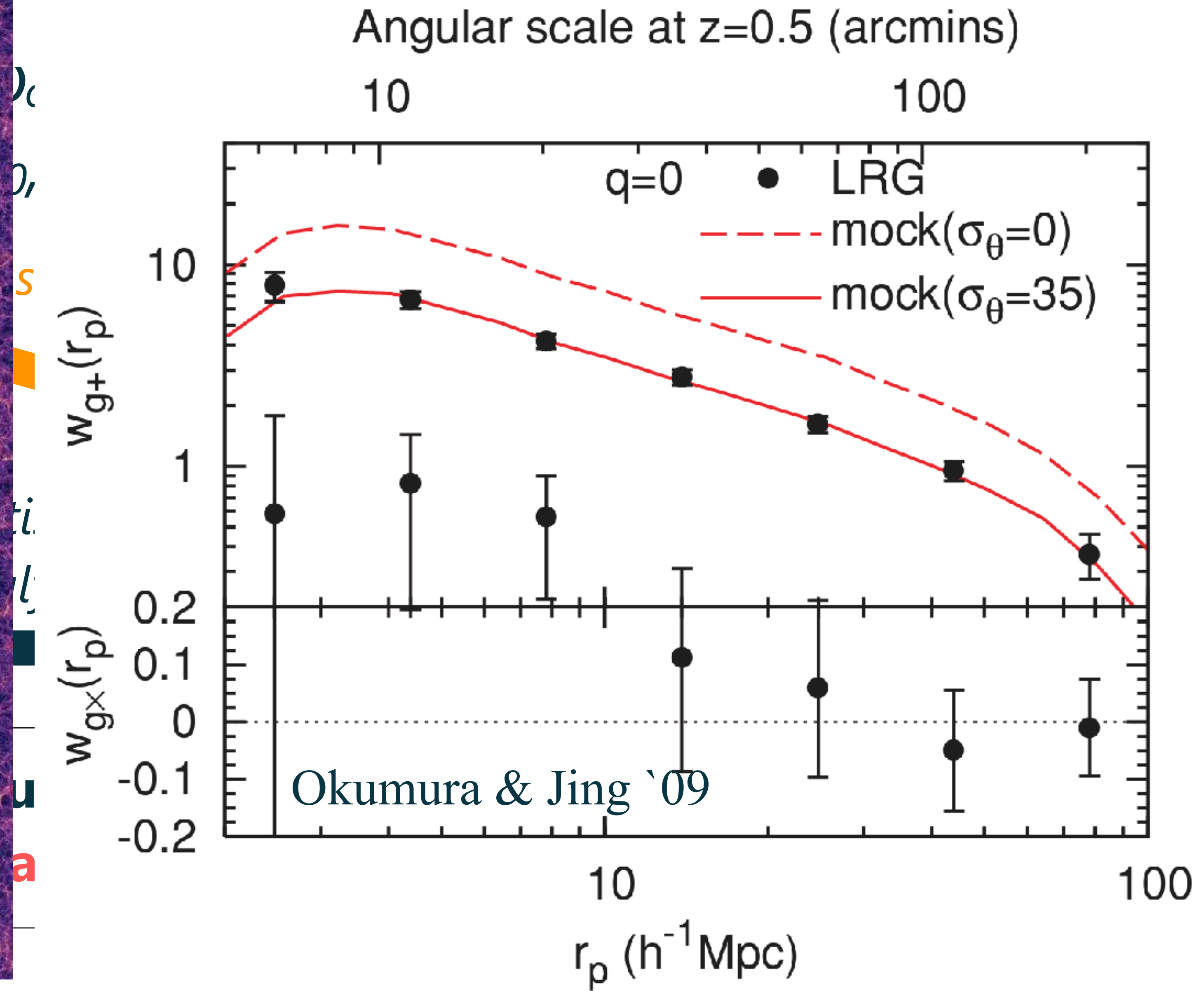
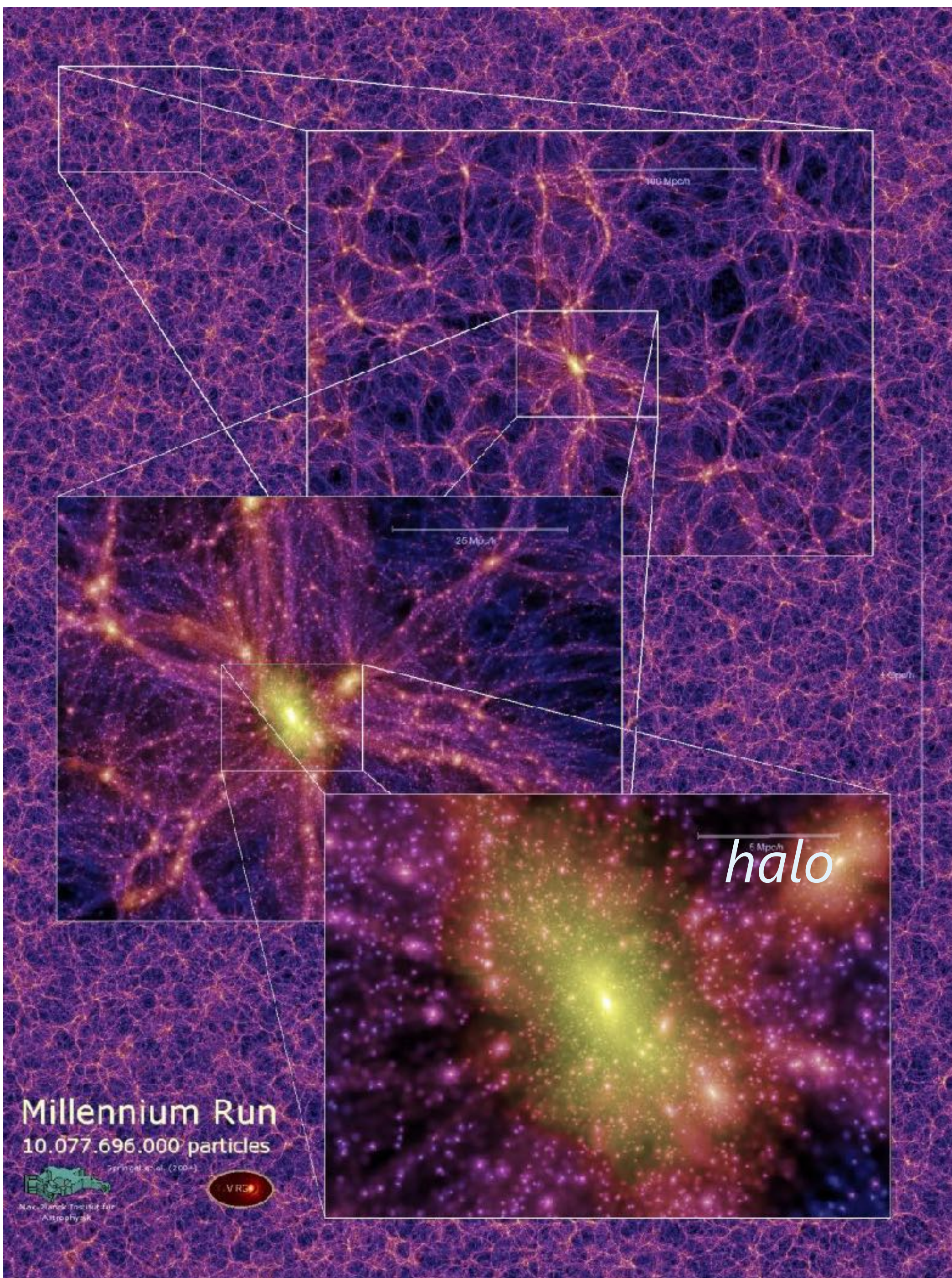
Statistical analysis



fully investigate basic statistical properties of halos as a function of cosmological parameters

# Project (2015~)

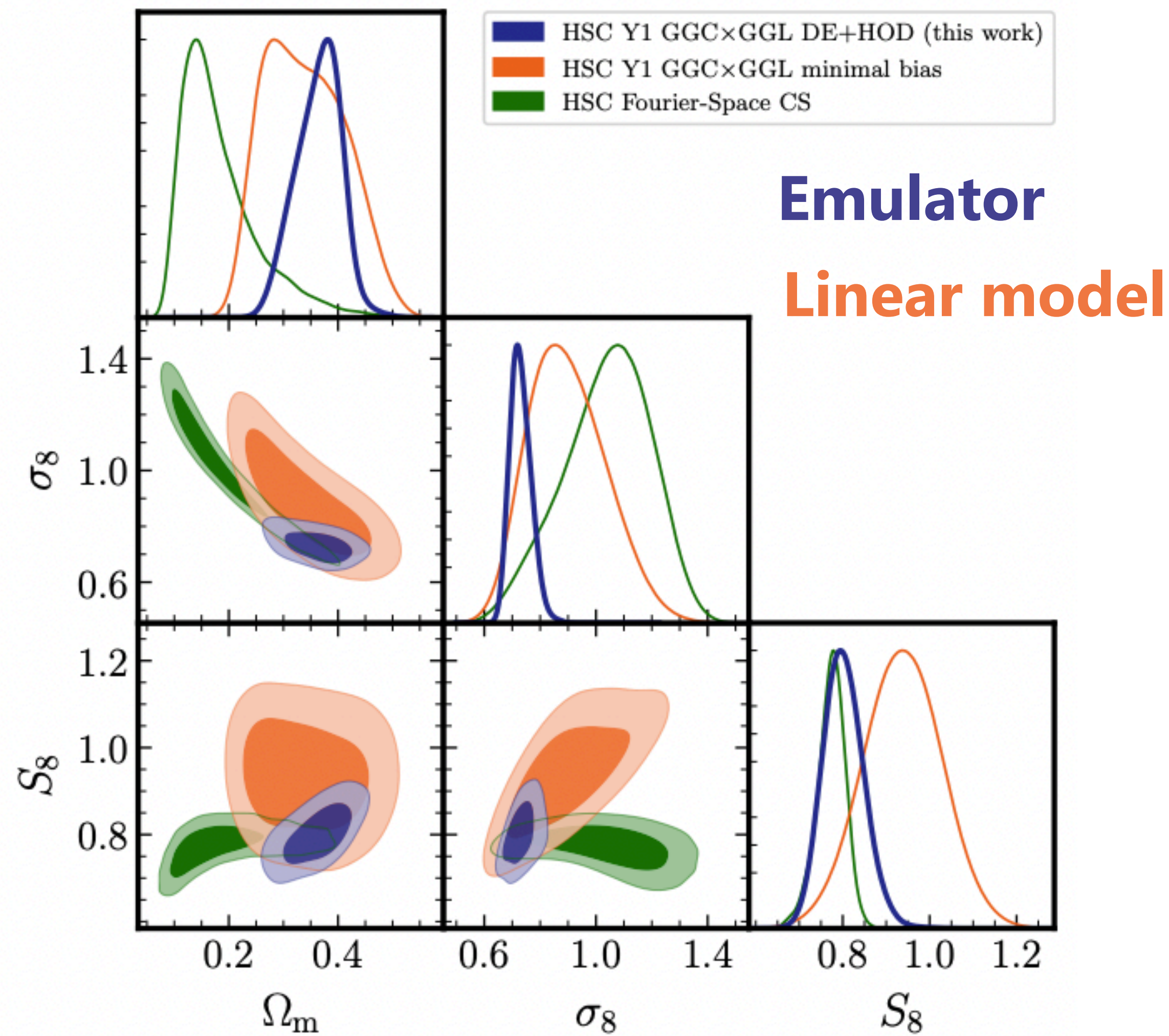
Observational data



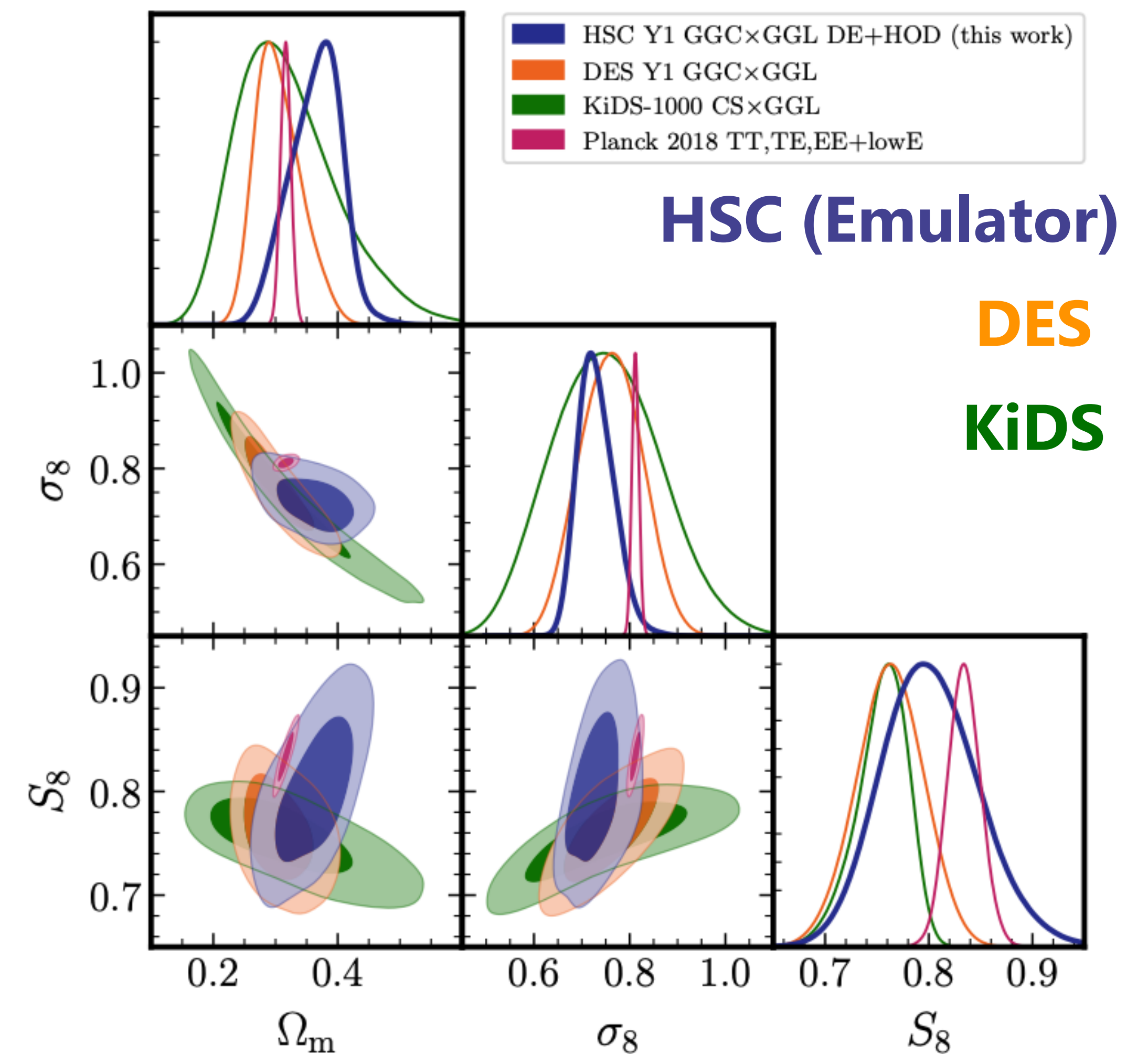
# DarkEmulator vs Subaru HSC

Miyatake+ PRD **106**  
(2022) 083520

## Internal consistency within HSC



## Comparison with other WL surveys



# SDSS BOSS “full shape”

Kobayashi, TN+, PRD **105** (2022) 083517

Full-shape cosmology analysis of SDSS-III BOSS galaxy power spectrum using emulator-based halo model: a 5% determination of  $\sigma_8$

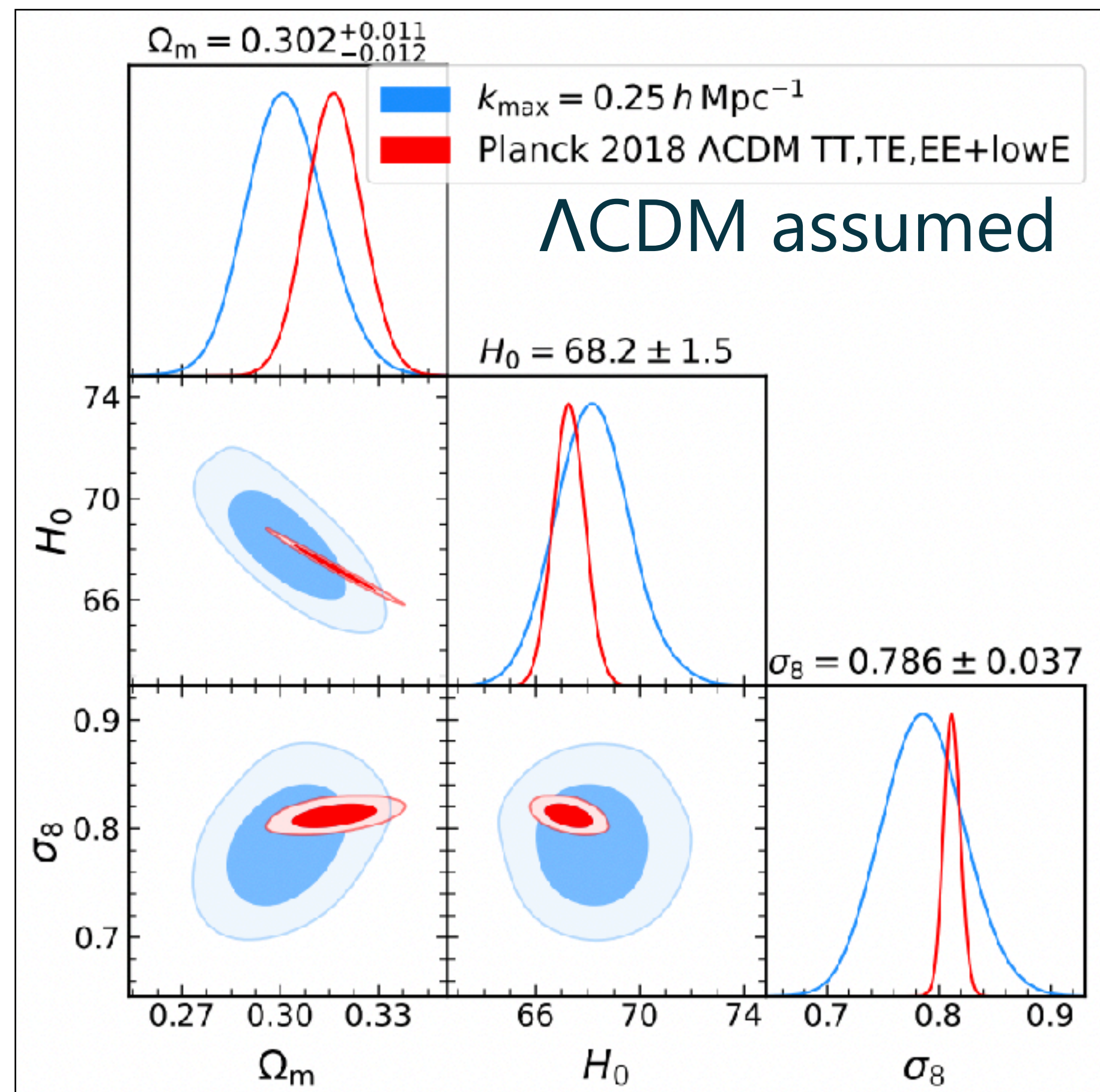
Yosuke Kobayashi<sup>1,2,\*</sup>, Takahiro Nishimichi<sup>3,2</sup>, Masahiro Takada<sup>2,†</sup> and Hironao Miyatake<sup>4,2</sup>

## Comparison with competitors (EFTofLSS)

Analyses on exactly the same power-spectrum data

Kobayashi+ (Emulator):	$\sigma_8 = 0.786^{+0.036}_{-0.037}$	$\Omega_m = 0.301^{+0.012}_{-0.011}$	$H_0 = 68.2 \pm 1.4$
Princeton (Philcox+21):	$\sigma_8 = 0.737^{+0.040}_{-0.044}$	$\Omega_m = 0.312^{+0.011}_{-0.012}$	$H_0 = 68.5^{+1.1}_{-1.3}$
Berkeley (Chen+21):	$\sigma_8 = 0.738 \pm 0.048$	$\Omega_m = 0.305 \pm 0.01$	$H_0 = 68.5 \pm 1.1$

- Roughly consistent with EFT-based analyses
- Better determination of  $\sigma_8$
- No tension with Planck! ( $\sigma_8 = 0.812 \pm 0.0073$ )



# Philosophy

Miyatake+ PRD **106** (2022) 083520

Kobayashi, TN+, PRD **105** (2022) 083517

- Gain cosmological info from the 2-halo term
  - Our emulator is **an update of the classical halo model**
- Our model automatically deals with
  - Nonlinear gravitational growth
  - Complicated bias relation
    - nonlinear bias
    - tidal bias ...
  - Halo exclusion effect

Parameter	Prior
<b>Cosmological parameters</b>	
$\omega_b$	$\mathcal{N}(0.02268, 0.00038)$
$\omega_c$	$\mathcal{U}(0.10782, 0.13178)$
$\Omega_\Lambda$	$\mathcal{U}(0.54752, 0.82128)$
$\ln(10^{10} A_s)$	$\mathcal{U}(2.4752, 3.7128)$
$n_s$	$\mathcal{N}(0.9649, 0.0042)$
<b>HOD parameters</b>	
$\log M_{\min}$	$\mathcal{U}(12.0, 15.0)$
$\sigma_{\log M}^2$	$\mathcal{U}(0.0001, 2.0)$
$\log M_1$	$\mathcal{U}(12.0, 16.0)$
$\alpha_{\text{sat}}$	$\mathcal{U}(0.01, 5.0)$
$\kappa$	$\mathcal{U}(0.01, 5.0)$
<b>Other nuisance parameters</b>	
$c_{\text{vel}}$	$\mathcal{U}(0.01, 10.0)$
$P_{\text{shot}}$	$\mathcal{U}(-10^4, 10^4) h^{-3} \text{Mpc}^3$
<b>Derived parameters</b>	
$\Omega_m$	—
$H_0$	—
$\sigma_8$	—



# Philosophy

- We can try adding/reducing complexity in the 1-halo term, which is anyway marginalized
- Non-standard HOD parameterization (beyond Zheng's 5 parameter model)
- Non-standard central/satellite distribution both for positions and velocities
  - (off-centering, modified c-M relations, velocity bias ...)

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# Philosophy

Miyatake+ PRD **106** (2022) 083520

Kobayashi, TN+, PRD **105** (2022) 083517

$$P_{\text{gg}}^{\text{S,1h}}(\mathbf{k}) = \frac{1}{\bar{n}_{\text{g}}^2} \int dM \frac{dn}{dM}(M) \langle N_{\text{c}} \rangle(M) \left[ 2\lambda_{\text{s}}(M) \tilde{\mathcal{H}}^{\text{S}}(\mathbf{k}; M) + \lambda_{\text{s}}(M)^2 \tilde{\mathcal{H}}^{\text{S}}(\mathbf{k}; M)^2 \right], \quad (20)$$

and

$$P_{\text{gg}}^{\text{S,2h}}(\mathbf{k}) = \frac{1}{\bar{n}_{\text{g}}^2} \int dM_1 \frac{dn}{dM}(M_1) \left[ \langle N_{\text{c}} \rangle(M_1) + \langle N_{\text{s}} \rangle(M_1) \tilde{\mathcal{H}}^{\text{S}}(\mathbf{k}; M_1) \right] \\ \times \int dM_2 \frac{dn}{dM}(M_2) \left[ \langle N_{\text{c}} \rangle(M_2) + \langle N_{\text{s}} \rangle(M_2) \tilde{\mathcal{H}}^{\text{S}}(\mathbf{k}; M_2) \right] \\ \times P_{\text{hh}}^{\text{S}}(\mathbf{k}; M_1, M_2), \quad (21)$$

with the mean number density of galaxies, defined as

$$\bar{n}_{\text{g}} = \int dM \frac{dn}{dM}(M) [\langle N_{\text{c}} \rangle(M) + \langle N_{\text{s}} \rangle(M)]. \quad (22)$$

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$H_0$	—
$\sigma_8$	—

# Dark Quest II

Sorry, please just wait until we post papers on arXiv...

# Summary

- Emulation is an efficient way to prepare theoretical templates in cosmological inference
  - Quick and accurate
  - **DarkEmulator** from DQ1 successfully applied to real data!!
  - Use 2-halo term, discard 1-halo term
- Halo shapes complicated and interesting
  - Trying to incorporate in DQ2 as a standard entry of the halo catalog
  - “*Emulator for IA*” in the near future (?)