# Constrain Galaxy Formation Physics from Large-Scale Structure Measurements and Weak Lensing

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IPMU, 2016

More details on **Youtube** and **arXiv**:

Mandelbaum, Wang, Zu+ (2015), arXiv:1509.06762; in press





#### Zu & Mandelbaum (2015a), MNRAS, 454, 1161

Zu & Mandelbaum (2015b), arXiv:1509.06758; in press

# "Theory of Galaxy Formation"

- Gravity
- Hydrodynamics and the thermal evolution of gas
- Star formation from giant molecular clouds
- Blackhole growth
- Stellar feedback
- AGN feedback
- Stellar population synthesis
- Radiative transfer
- Chemical evolution of metals
- Magnetic Fields
- and the coupling of all the above processes!

# Semi-Analytic Model (SAM)



#### De Lucia & Blaizot (2007)

# Semi-Analytic Model (SAM)



#### De Lucia & Blaizot (2007)



BlueTides (Feng et al. 2015)

# galaxy stellar mass functions (SMFs)



Somerville & Dave (2015)

# **Distributions of galaxy color**



# "Theory of Galaxy Formation" "Theory of galaxy stellar mass & color"



Mutch et al. (2013)

Taylor et al. (2015)

# Switching from predictive to probabilistic models

Alternatively we can constrain  $P(\mathbf{g}|\mathbf{h})$ , i.e., the probability distribution of galaxies with properties  $\mathbf{g}$  within halos with fixed properties  $\mathbf{h}$ .



Mutch et al. (2013)

# Switching from predictive to probabilistic models





Mutch et al. (2013)

# Large-scale structure probes

spatial clustering

$$w_p(r_p) = \int_{-r_{\pi,\max}}^{+r_{\pi,\max}} \xi_{gg}(r_p,r_\pi) \,\mathrm{d}r_\pi. \propto \xi_{gg}$$

• galaxy-galaxy lensing 
$$\Delta \Sigma(r_p) = \gamma_t(r_p) \Sigma_{crit} \propto \xi_{gm}$$

marked correlation

$$M_{p} = \frac{1 + W_{p}(r_{p})/r_{p}}{1 + w_{p}(r_{p})/r_{p}}$$

(sensitive to environ. effects)

# For a volume-limited galaxy sample thresholded in $M_{st}$

Halo Occupation Distribution (HOD)

defines  $\langle N(M_h) \rangle$  as the number of galaxies as a function of halo mass. Centrals and satellites are modeled separately

> $M_h \to M_*^{\rm cen}$  $M_h \to \langle N_{\rm sat} \rangle$

Subhalo Abundance Matching (SHAM)

matches stellar masses to (sub)halos based on their ranking order in some halo mass proxy, e.g., the peak circular velocity:

 $V_{\text{peak}} \to M_*$ 

# For a volume-limited galaxy sample thresholded in $M_{st}$

#### Halo Occupation Distribution (HOD)



#### Subhalo Abundance Matching (SHAM)



Reddick et al (2013); Lehmann et al.(2015)

Zheng et al (2005); Contreras et al. (2013)

#### volume-limited galaxy samples selected in SDSS DR7



galaxy spectra are expensive!



0.5	1.0	1.5 1	2.0 2.5 $\lg N_g$		314,302 vs 170,483 (84% or 143,819 more galaxies!)			
11.5		della	inter					
11.0				$1 \text{g} M_*/h^{-2} \text{M}_{\odot}$	z <sub>min</sub>	Zmax	Ng	
10.5		/		8.5-9.4	0.01	0.04	13616	
	/		100	9.4-9.8	0.02	0.06	16 247	
10.0				9.8-10.2	0.02	0.09 (0.06)	46 910 (22 409	
9.5		100		10.2-10.6	0.02	0.13 (0.09)	96 946 (58 209	
	7	<b></b>		10.6-11.0	0.04	0.18 (0.13)	102 307 (60 283	
9.0				11.0-11.2	0.08	0.22 (0.19)	24 908 (19 506	
				11.2-11.4	0.08	0.26 (0.22)	10231 (7427)	
8.5	5			11.4-12.0	0.08	0.30 (0.27)	3137 (2649)	
	-	0.1	0.	2 0	.3			

# more galaxies buy us improved S/N



# i HOD

- $P(M_*, M_h)$  defined on the 2D grid of stellar mass and halo mass.
- Central galaxies are described by a mean stellar-tohalo mass relation with a mass-dependent logscatter.
- Satellite galaxies are described by a halo massdependent satellite HOD.
- Derive  $P(M_h|M_*)$ , i.e., HOD for a single galaxies.

$$P(M_h \mid M_*, z) = \frac{P(M_*, M_h \mid z)}{P(M_* \mid z)} = \frac{P(M_*, M_h \mid z)}{\int P(M_*, M_h \mid z) \, \mathrm{d}M_h}$$



# iHOD on the $M_* - M_h$ plane

By treating each redshift slice independently, iHOD takes into account the redshift-dependent sample incompleteness self-consistently.

The galaxies in each narrow redshift slice can be described using a standard HOD by combining all the individual  $P(M_h|M_*)$ 

0.3

0.1

1.5

lg

0.5

12.0

11.5

11.0

10.5

10.0

9.5

9.0

8.5

 $\lg M_*[M_{\odot}h^{-2}]$ 

1.0

Redshift

0.2

#### Signal Contributions from different redshift slices



clustering

# g-g lensing

# parameter constraints

Parameter	Description	Uniform prior range	iHOD	CHOD
$\log M_{\rm h}^1$	Characteristic halo mass of the SHMR	[9.5, 14.0]	$12.10^{+0.17}_{-0.14}$	$12.32_{-0.29}^{+0.29}$
$\log M_*^0$	Characteristic stellar mass of the SHMR	[9.0, 13.0]	$10.31_{-0.09}^{+0.10}$	$10.47_{-0.21}^{+0.18}$
β	Low-mass slope of the SHMR	[0.0, 2.0]	$0.33^{+0.21}_{-0.15}$	$0.54_{-0.26}^{+0.29}$
δ	Controls high-mass slope of the SHMR	[0.0, 1.5]	$0.42^{+0.03}_{-0.04}$	$0.42^{+0.08}_{-0.09}$
γ	Controls intermediate-mass behaviour of the SHMR	[-0.1, 4.9]	$1.21^{+0.18}_{-0.20}$	$1.05^{+0.24}_{-0.26}$
Bsat	Normalizes the scaling of $M_{sat}$	[0.01, 25.0]	8.98+1.18	$11.22^{+2.61}_{-1.99}$
$\beta_{sat}$	Slope of the scaling of $M_{\rm sat}$	[0.1, 1.8]	$0.90^{+0.04}_{-0.05}$	$0.85^{+0.06}_{-0.05}$
B <sub>cut</sub>	Normalizes the scaling of $M_{\rm cut}$	[0.0, 6.0]	$0.86^{+0.32}_{-0.37}$	$0.73^{+0.58}_{-0.44}$
$\beta_{\rm cut}$	Slope of the scaling of $M_{\rm cut}$	[-0.05, 1.50]	$0.41^{+0.16}_{-0.15}$	$0.63^{+0.31}_{-0.33}$
asat	Power-law slope of the satellite HOD	[0.5, 1.5]	$1.00^{+0.03}_{-0.02}$	$1.07^{+0.05}_{-0.05}$
$\sigma_{\ln M_*}$	Low-mass scatter in the SHMR	[0.01, 3.0]	$0.50^{+0.04}_{-0.03}$	$0.42^{+0.07}_{-0.08}$
η	Slope of the scaling of high-mass scatter	[-0.4, 0.4]	$-0.04^{+0.02}_{-0.02}$	$-0.01\substack{+0.04\\-0.03}$
fc	Concentration ratio between satellites and dark matter	[0.1, 3.0]	$0.86^{+0.14}_{-0.11}$	$1.00^{+0.32}_{-0.20}$

#### **Best-fit model predictions vs. measurements**



#### iHOD vs. traditional HOD constraints



Stellar-to-Halo Mass (centrals)

Satellite HODs of five samples

#### **Observed Stellar Mass Functions are reproduced!**



Note that SMFs are not used as input to the constraint.

# Compare with SHAM

# Stellar mass fraction reaches plateau



stellar-to-halo mass relation (centrals) Stellar mass fraction (cen+sat)

#### average host halo mass at fixed stellar mass



# short summary for paper I

- iHOD is able to extract maximum information from galaxy clustering and lensing measurements, without the need to select volume limited samples.
- We obtained tight constraints on the mean and scatter of the stellar-to-halo mass relation.
- The best-fit iHOD not only describes the clustering and lensing over four decades in stellar mass, but also reproduces the SMFs observed by SDSS.

# Paper II: What drives quenching

# $P(M_*|M_h) \implies P(M_*, g-r|M_h, \dots)$

#### color bimodaity persists in different environments



#### color bimodaity persists at different redshifts





# Environment quenching



# Stellar Mass quenching

Peng et al. (2010)



#### Caveats

- "Environment": distance to 5th nearest neighbor
- "Environment" quenching is entirely due to satellites (Peng+2012)
- Trend with halo mass hard to recover in observations (Campbell+2015)



# Stellar Mass quenching

Peng et al. (2010)



Environment and stellar mass trends can be fully explained by **halo mass** quenching.

Gabor & Dave (2015)

# Distinguishing the Two Scenarios



bands: stellar vs. halo mass of **central** galaxies

The two scenarios should predict different color split in galaxy clustering and g-g lensing.

# Halo quenching model

#### centrals

#### satellites



Red fraction is tied to halo mass for both centrals and satellites.

# Hybrid quenching model

#### centrals

#### satellites



Red fraction is tied to **stellar mass** for all galaxies, while satellite quenching has an extra dependence on halo mass

# Red fraction to Signal prediction

- The best-fit iHOD of overall galaxies is kept fixed.
- We split the overall iHOD into red & blue, using only four parameters for each quenching model (*traditional HODs require ~15-20*).
- Red & blue clustering and g-g lensing signals can be predicted from respective iHODs in each quenching model.
- Again, the 84% more galaxies helped tremendously!

# g-g lensing

# clustering



# g-g lensing

# clustering



Key Discriminator: Lensing of Massive Blue Galaxies



# Average Host Halo Mass of Red and Blue Centrals



# locally brightest galaxies (LBGs): centrals with high purity

Mandelbaum, Wang, Zu, White, Henriques, More (2015)

# Compare to traditional HOD and Age-matching



#### Strong bimodality in the host halo mass of centrals!

# central galaxy quenching in age-matching



bluer centrals at fixed stellar mass are put in younger (thus higher mass) halos



# satellite quenching timescales

How recent is the latest starformation episode in quiescent galaxies around group centers



2 Mpc x 2 Mpc

# Marked Correlation: Conformity, & Assembly Bias



# Conclusions

- The **iHOD** is a powerful formalism that can be easily applied to ongoing and future surveys.
- The clustering and g-g lensing of red and blue galaxies in SDSS point to the necessity of having a dominant halo quenching effect in the low-redshift Universe. **No 2nd variable needed so far.**
- The inferred critical masses for the quenching of centrals and satellites are both around  $1.5 \times 10^{12} M_{\odot}/h$ , consistent with the value expected in the canonical halo quenching theory.
- Models without halo quenching, e.g., the age-matching model, fail to reproduce the strong bimodality observed in the weak lensing mass of host halos between red and blue centrals.
- Marked correlations will be the key observable for constraining conformity and assembly bias. **Is a 2nd variable needed?**