# Scatter and bias in cluster mass estimates

Masamune Oguri (University of Tokyo)

2015/3/25 Astroparticle View of Galaxy Clusters @ Hiroshima

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#### Cluster mass

- one of the most fundamental parameters that characterize clusters
- not easy to measure because it is dominated by the mass of dark matter
- critically important for cluster cosmology

# Planck 2015

- cosmology with Planck
   SZ cluster counts
- different mass estimates yield quite different cosmology results
- uncertainty in cluster mass estimates is the most outstanding issue in cluster cosmology!



#### Mass estimates: scatter and bias

"accuracy" of mass estimates?

scatter

important for analysis of individual clusters

• bias

important for statistical analysis even for the case scatter  $\gg$  bias



#### Cluster mass estimates

- X-ray hydrostatic equilibrium small scatter, large bias
- weak gravitational lensing large scatter, small bias

## X-ray hydrostatic equilibrium

- X-ray mass derived w/ hydrostatic equilibrium is known to be biased low by ~10-40%
- need independent mass estimates to quantify the X-ray mass bias



# Weak lensing

- purely gravitational effect
- direct measurements of total mass, including dark matter!



S. Colombi

#### Scatter and bias in lensing mass

#### • scatter

statistical error – shot noise, LSS halo triaxiality

#### • bias

profile mismatch substructure? (not in this talk) photo-z, dilution, ... (not in this talk)

## Halo triaxiality

- ACDM model predicts highly non-spherical halo shape
- typical major-to-minor axis ratio 2:1



http://www.mpa-garching.mpg.de/galform/millennium/

#### Observational evidence

y [h<sup>-1</sup>Mpc]

- direct measurements of halo shapes w/WL
- non-sphericity detected at  $\gtrsim 5\sigma$

 $\langle e_{2D} \rangle = 0.46 \pm 0.04$ (Oguri et al. 2010 w/ LoCuSS)  $\langle e_{2D} \rangle = 0.47 \pm 0.06$ (Oguri et al. 2012 w/ SGAS)

 e<sub>2D</sub> quite consistent with \CDM predictions!





Oguri, Takada, Umetsu, Broadhurst ApJ 632(2005)841

#### Projection effect



 projected mass profile depends sensitively on the projection direction Oguri, Takada, Umetsu, Broadhurst ApJ 632(2005)841

#### Projection effect



 lensing-derived mass and concentration are significantly affected by the cluster orientation
 → ~20-30% scatter in lensing mass

## Bias from radial mass profile

- data have often been analyzed assuming a simple NFW profile
- any mismatch between assumed and true mass profiles can cause bias



#### Possible origins of bias



#### Halo concentration

- in some work, specific values ρ(r)
   or forms of concentrations
   are assumed to get mass
- the mass would be biased if the assumed concentration is wrong



 concentrations in real clusters consistent with ΛCDM predictions?

(cf. anomalously high concentrations claimed by Broadhurst et al.)





#### LoCuSS (Okabe et al. 2013)



#### CLASH (Merten et al. 2014)



concentration values also consistent with ACDM prediction!

(←see talk by N. Okabe)

## Outer density profile of clusters



- has not attracted much attention until recently
- turned out to be quite important for accurate mass measurements

Oguri & Hamana MNRAS 414(2011)1851 Outer lensing profiles



- detailed lensing profiles from ray-tracing in N-body simulations
- truncated NFW profile + 2-halo term can fit the profile in the simulation well

#### Oguri & Hamana MNRAS 414(2011)1851 Truncation radius



 profiles in simulations are fitted with a smoothly truncated NFW profile (Baltz, Marshall & Oguri 2009)

$$\rho_{\rm BMO}(r) = \frac{\rho_s}{(r/r_s)(1+r/r_s)^2} \left(\frac{r_t^2}{r^2+r_t^2}\right)^n$$

 truncation radius weakly depends on halo masses, more massive halos have smaller truncation radius

Adhikari, Dalal & Chamberlain (2014)

# Physical origin of steepening?

- steepening can be explained by "turn-around" of infalling material
- this suggests that the cutoff radius is partly determined by the accretion rate



#### Oguri & Hamana MNRAS 414(2011)1851 Mass bias and outer density profile

- fitting shear profiles assuming traditional NFW without 2-halo
- best-fit mass can be biased low up to ~10%
- bias can be reduced by restricting fitting region to ≤ r<sub>vir</sub> (or including steepening and 2-halo in profile fitting)



thin: r<sub>t</sub>=2.0r<sub>vir</sub>

#### Scatter and bias in lensing mass

#### • scatter

statistical error – shot noise, LSS halo triaxiality

• bias

profile mismatch substructure? (not in this talk)

getting more and more understood by ray-tracing simulations and observations

#### Statistical lensing mass estimate

- weak lensing mass estimates have large scatter
- one way to beat down scatter is to combine many measurements → stacked weak lensing
- very powerful approach in the era of wide-field surveys

## Power of stacking

- stacking significantly enhances S/N
- one can get average properties very well
- particularly powerful when applied to wide -field survey data



#### Oguri MNRAS 444(2014)147 Scaling relation

- stacking of CFHTLenS data for SDSS clusters
- calibrate richness-mass relation well from ~120 deg<sup>2</sup> lensing data, down to ~10<sup>14</sup>M<sub>Sun</sub>



#### Bias in stacking analysis

- you need to understand your sample very well for proper understanding of stacking results
- if you take the interpretation of the sample wrong, stacking analysis results will be biased
- selection function is critically important!

#### Possible cluster selection effects

- concentration/formation history
- merger
- orientation bias

# Effects of merger

- merger can have large impact on observables
- change X-ray properties drastically
- strong lensing cross section also enhanced



Clowe et al. (2006)



1.5

#### Ota, Oguri et al. ApJ **758**(2012)26 Oguri et al. MNRAS **429**(2013)482 **An extreme example?**

- SDSS J1029+2623 ("the Hidden Fortress")
- mass distribution very concentrated
- mass discrepancy M<sub>X</sub>/M<sub>lens</sub>~2-3 (!)
- interpretation: line-of-sight merger



#### Cluster selection in optical surveys



optical (galaxy)



weak lensing (see talk by S. Miyazaki)

#### Orientation bias

- triaxiality affects some cluster selection methods
- then resulting cluster sample has orientation bias, i.e., cluster orientations w.r.t line-of-sight direction is *not* random
- since lensing properties are sensitive to cluster orientations, the orientation bias can have large impact on stacked lensing analysis



#### Estimated orientation bias



 optical and weak lensing selected clusters are preferentially aligned with line-of-sight direction!

# Summary

- origins of scatter and bias in cluster (lensing) mass estimates are getting more and more understood

   triaxiality, outer profile, ...
- stacking analysis is powerful in reducing scatter, but understanding of the selection function is critically important (e.g., orientation bias)