#### Modern cosmology with x-ray luminous clusters of galaxies, Monday Lecture: Basic Cluste Cosmolog

#### at XXIX Heidelberg Graduate Days

Rapetti Serra, David Angelo

Publication date: 2012

Document version Early version, also known as pre-print

*Citation for published version (APA):* Rapetti Serra, D. A. (2012, Oct 8). Modern cosmology with x-ray luminous clusters of galaxies, Monday Lecture: Basic Cluste Cosmolog: at XXIX Heidelberg Graduate Days. (Heidelberg ed.) *Germany*.

# Modern cosmology with X-ray luminous clusters of galaxies

Monday Lecture: Basic Cluster Cosmology

#### David Rapetti DARK Fellow

Dark Cosmology Centre, Niels Bohr Institute

Dark Cosmology Centre University of Copenhagen



October 8, 2012

# **Outline:**

# Initial plan for the week

#### (that will somewhat depend on the interaction with the class)

Monday Lecture: Introduction to cosmology, cluster cosmology and the gas mass fraction experiment

Tuesday Lecture/Practice: CAMB and CosmoMC (download them at <u>http://cosmologist.info/cosmomc/</u> and the fgas module at <u>http://www.slac.stanford.edu/~drapetti/fgas\_module/</u>) including initial practice with SNe, and fgas.

Wednesday Lecture: Cluster abundance experiment

Thursday Lecture: Cosmological models and modeling

Friday Lecture/Practice: CosmoMC project: constraining a theoretical model

October 8, 2012

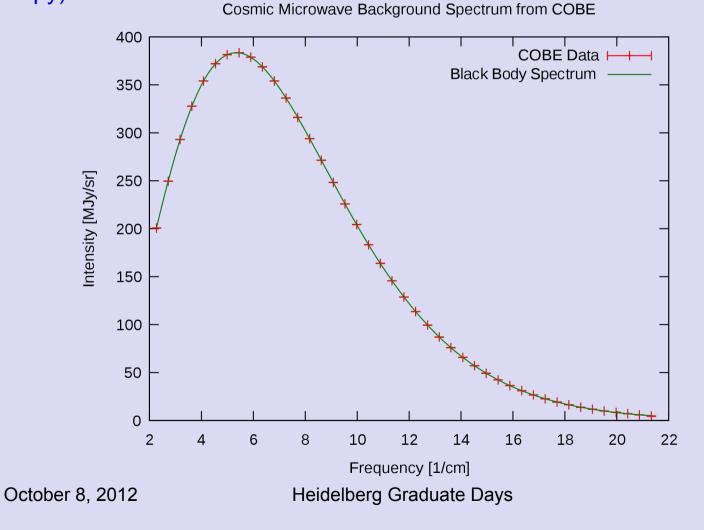
### **Recent discoveries and current results**

October 8, 2012

### **Cosmic Microwave Background (CMB)**

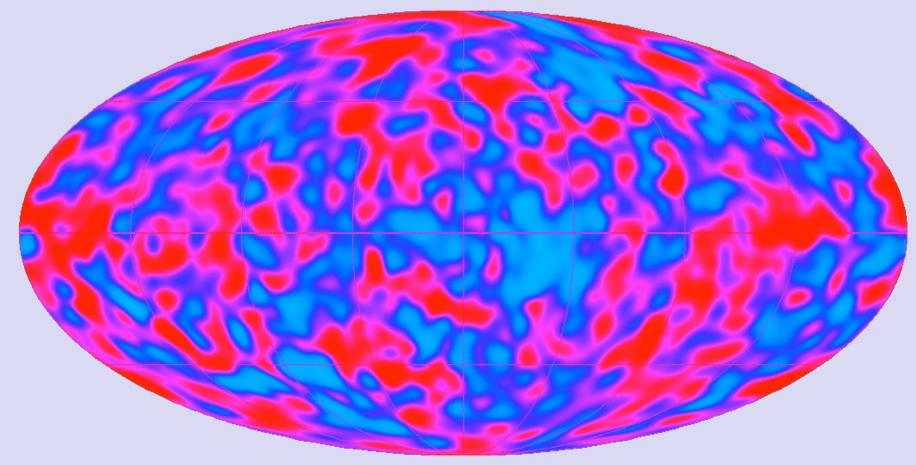
Nobel Prize in Physics 1978: Arno Penzias & Robert Wilson (CMB discovery in 1965) [Pyotr Kapitsa (Low-temperature physics)]

Nobel Prize in Physics 2006: John Mather & George Smoot (CMB blackbody and anisotropy)

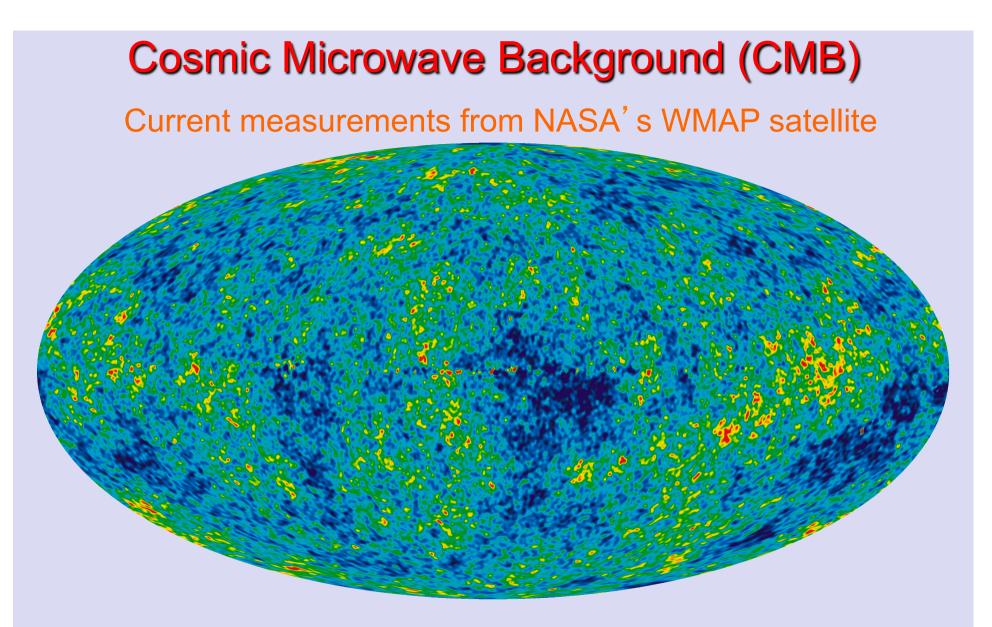


### **Cosmic Microwave Background (CMB)**

Nobel Prize in Physics 1978: Arno Penzias & Robert Wilson (CMB discovery in 1965) [Pyotr Kapitsa (Low-temperature physics)] Nobel Prize in Physics 2006: John Mather & George Smoot (CMB blackbody and anisotropy) From NASA' s COBE satellite



October 8, 2012



Next: results from ESA's Planck satellite are coming next year...

October 8, 2012

### **Discovery of cosmic acceleration**

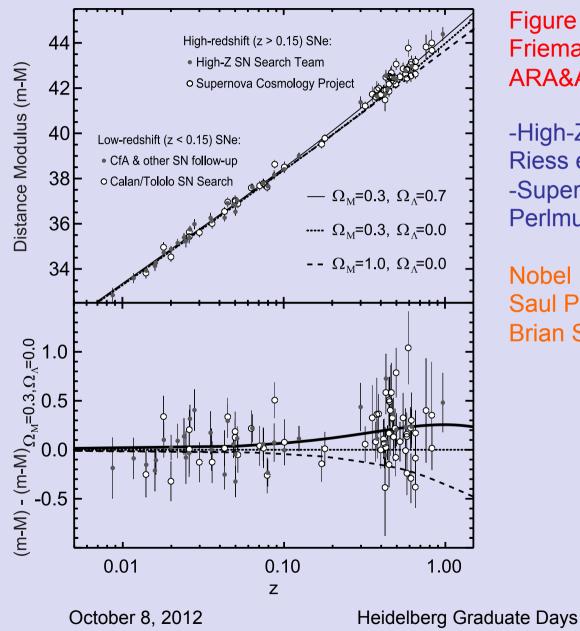
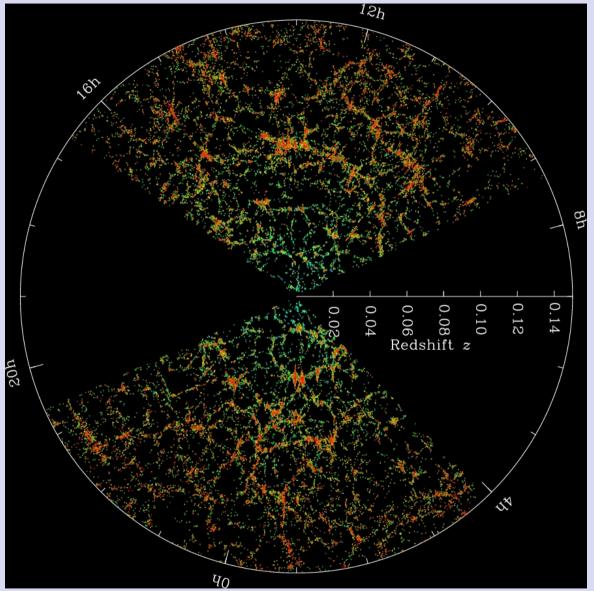


Figure from the dark energy review of Frieman, Turner & Huterer, 2008, ARA&A., 46, 385

-High-Z SN Search Team (HZT): Riess et al 1998 -Supernova Cosmology Project (SCP): Perlmutter et al et al. 1999

Nobel Prize Award in Physics 2011: Saul Perlmutter (SCP) Brian Schmidt & Adam Riess (HZT)

### Large scale distribution of galaxies



Sloan Digital Sky Survey (from the SDSS website)

Slice of a 3D map of galaxies

Galaxies are colored according to the ages of their stars: redder, more strongly cluster made of older starts.

Outer circle: two billion light years

>930000 galaxies

October 8, 2012

### Cluster cosmology

October 8, 2012

## **Cluster cosmology**

Figure from Allen, Evrard & Mantz 11 (credits X-ray/Mantz; Optical/von der Linden et al; SZ/Marrone)



#### X-ray

#### Optical

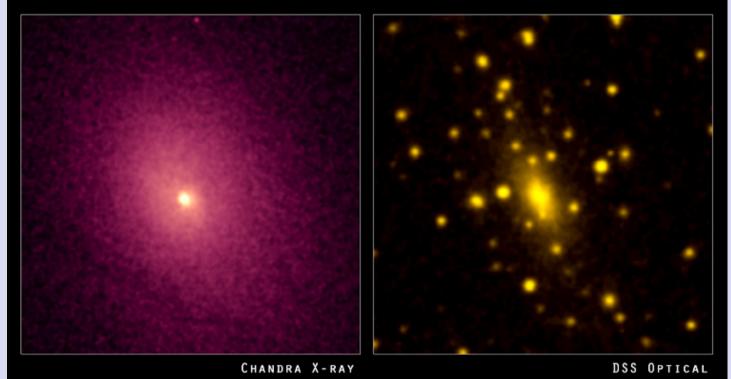


- Images of galaxy cluster Abell 1835 in different wavelength
- Cosmology with galaxy clusters using X-ray observations:
  - Gas mass fraction
  - Abundance of clusters and their observable-mass relations

Cluster cosmology review: Allen, Evrard & Mantz, 2011, ARA&A, 49, 409

October 8, 2012

# X-ray galaxy cluster



Galaxy cluster Abell 2029:

Thousands of galaxies optical (right panel)

Hot (multimillion Kelvin degrees) gas (left panel).

Dark matter (only gravitational interaction) >10<sup>15</sup> solar masses.

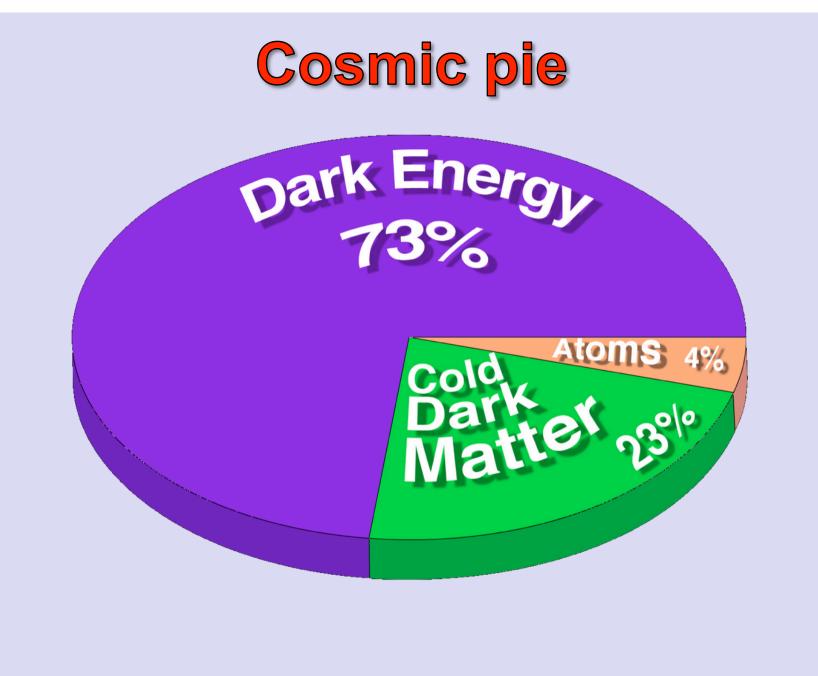
In 1933 Fritz Zwicky proposed "missing matter" (dark matter) in clusters of galaxies (Note: Central enormous elliptically shaped galaxy.)

October 8, 2012

### **Basic cosmology**

Peebles; Luchin & Mataresse; Peacock; Dodelson; Weinberg ; Mukhanov; etc.

October 8, 2012

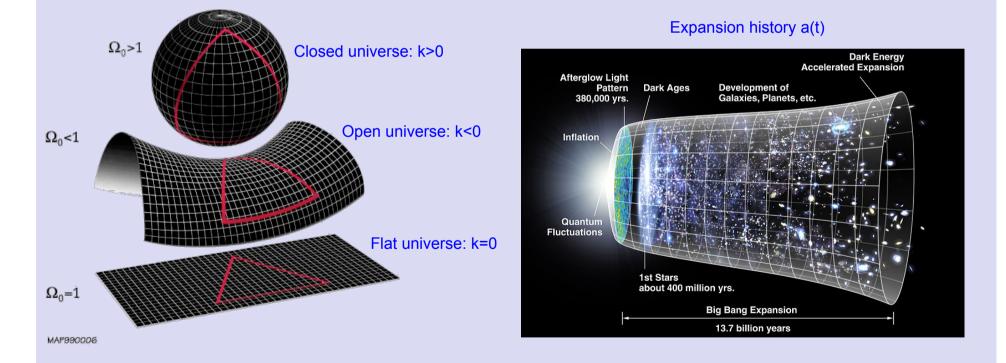


October 8, 2012

#### Space-time metric of the Universe

Friedmann-Lemaitre-Robertson-Walker (FLRW) metric: for an isotropic and homogenous space-time (current data indicate that at large scale these assumptions are nearly valid)

$$ds^{2} = dt^{2} - a^{2}(t) \left[ \frac{dr^{2}}{(1 - kr^{2})} + r^{2}d\theta^{2} + r^{2}\sin^{2}\theta d\phi^{2} \right]$$



October 8, 2012

#### Gravity and energy density

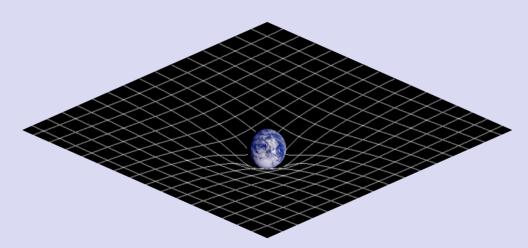
Einstein's equations

$$G^{\mu\nu} + \Lambda g^{\mu\nu} = 8\pi T^{\mu\nu}$$
$$c = G = 1$$

$$G^{\mu\nu}=R^{\mu\nu}-\frac{1}{2}Rg^{\mu\nu}$$

 $R^{\mu\nu}$  Ricci tensor R Ricci scalar  $G^{\mu\nu}$  metric tensor

Interaction between gravity and energy-matter



John Wheeler: Matter tells space how to curve and space tells matter how to move

Useful reference for perturbation theory: Ma & Bertschinger 1995, ApJ, 455, 7

October 8, 2012

#### Cosmic energy content and expansion

Example of stress-energy tensor:

$$T^{\mu\nu} = \left( \begin{array}{ccccc} \rho & 0 & 0 & 0 \\ 0 & p & 0 & 0 \\ 0 & 0 & p & 0 \\ 0 & 0 & 0 & p \end{array} \right)$$

Fluid in a thermodynamic equilibrium

$$H^{2} = \left(\frac{\dot{a}}{a}\right)^{2} = \frac{8\pi G\rho}{3} - \frac{k}{a^{2}} + \frac{\Lambda}{3}$$
$$\frac{\ddot{a}}{a} = -\frac{4\pi G}{3}\left(\rho + 3p\right) + \frac{\Lambda}{3}$$

Friedmann equations: key equations in cosmology; Einstein field equations for the FRWL metric

 $\Lambda = 8\pi G \rho_{\rm VAC} = -8\pi G p_{\rm VAC}$ 

Energy density of the vacuum

Dark energy review: Frieman, Turner & Huterer 2008, ARA&A., 46, 385

October 8, 2012

#### Cosmic energy content and expansion

$$H^2 = \frac{8\pi G}{3}\rho - \frac{k}{a^2}$$

Friedmann equation  $\rho$  sum of the energy densities of matter, dark energy, radiation

$$w = \frac{p_{de}}{\rho_{de}} \quad \begin{array}{c} \text{Dark energy} \\ \text{equation of state} \end{array} \quad a(t)$$

$$= \frac{1}{1+z}$$
 a(t) scale  
z redshift

$$E(a) = \left[\Omega_{\rm m} a^{-3} + \Omega_{\rm de} a^{-3(1+w)} + \Omega_{\rm k} a^{-2}\right]^{1/2}$$

**Evolution parameter** 

$$E(z) = \sqrt{\Omega_{\rm m}(1+z)^3 + \Omega_{\rm de}f(z) + \Omega_{\rm k}(1+z)^3}$$

 $E(a)=H(a)/H_0$ 

scale factor

i) flat  $\Lambda$ CDM w=-1,  $\Omega_k$ =0 ii) flat wCDM w constant,  $\Omega_k=0$ iii) non-flat  $\Lambda$ CDM w=-1,  $\Omega_k$  constant

October 8, 2012

# The f<sub>gas</sub>(z) experiment

e.g. Allen et al 02, 04, 08; Ettori et al 03, 09; Rapetti et al. 05, 07, 08; LaRoque et al 06

October 8, 2012

# Chandra X-ray Observatory



Cluster cosmology revolutionized First opportunity to carry out: ->Detailed spatially-resolved and ->X-ray spectroscopy of galaxy clusters.

Technical details for ACIS instrument (X-ray CCDs):

- Field of view 16x16 arcmin<sup>2</sup>
- Good spectral resolution ~100eV over 0.5-8 keV range.
- Exquisite spatial resolution (0.5 arcsec FWHM).

Consider a spherical region of observed angular radius  $\boldsymbol{\theta}$  within which the gas mass fraction is measured

 $R = \theta d_A$  R physical size

 $L_x = 4\pi d_L^2 F_x$   $L_x$  X-ray Luminosity of the region  $F_x$  detected flux

$$d_L = d_A (1+z)^2$$

 $d_L$  luminosity distance  $d_A$  angular diameter distance

Since the X-ray emission is mainly due to collisional processes (bremsstrahlung and emission line) and is optically thin

 $L_x \propto n^2 V$  n mean matter density of colliding gas particles V volume of the emitting region:  $V = 4\pi (\theta d_A)^3 / 3$ 

October 8, 2012

$$n \propto \frac{d_L}{d_A^{3/2}} \longrightarrow M_{gas} \propto nV \propto d_L d_A^{3/2}$$
 M<sub>gas</sub> observed gas mass within the measurement radius

 $M_{tot} \propto d_A$  M<sub>tot</sub> total mass determined by X-ray data assuming hydrostatic equilibrium

 $M_{gas}$  gas mass $\propto d_A(z)^{2.5}$  (X-ray Luminosity) $M_{tot}$  total cluster mass $\propto d_A(z)$  (primarily X-ray Temperature)

$$f_{gas} = \frac{M_{gas}}{M_{tot}} \propto d_L d_A^{1/2} \qquad \text{f}_{gas} \text{ gas mass fraction}$$

October 8, 2012

$$f_{gas} = \frac{M_{gas}}{M_{tot}} \propto d_A(z)^{1.5}$$

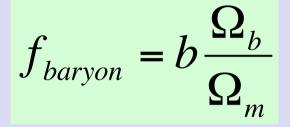
$$s = f_{stars} / f_{gas} = (0.16 \pm 0.05) h_{70}^{0.5}$$

s baryonic mass fraction in stars

Lin & Mohr 04, Fukugita et al 98, White et al 93

$$f_{baryon} = f_{stars} + f_{gas} = f_{gas}(1+s)$$
 Baryon mass fraction

October 8, 2012



The matter content of rich clusters of galaxies is expected to provide an almost fair sample of the matter content of the Universe (White & Frenk 91, White et al. 93, Eke et al. 98).

b, the bias factor accounts for the relatively small amount of gas expelled when clusters form.

$$\Omega_m = \frac{b\Omega_b}{f_{gas}(1+s)}$$

+HST+BBNS priors when clusters alone or +CMB data

October 8, 2012

$$f_{gas}^{ref}(z) = \frac{b(z)\gamma K}{1+s(z)} \left(\frac{\Omega_b}{\Omega_m}\right) \varepsilon(\theta) \left[\frac{d_A^{ref}(z)}{d_A^{\text{mod}}(z;\theta)}\right]^{3/2}$$

Apparent evolution of the gas mass fraction

$$\varepsilon(\theta) = \left[\frac{H^{\text{mod}}(z;\theta)d_A^{\text{mod}}(z;\theta)}{H^{\text{ref}}(z)d_A^{\text{ref}}(z)}\right]^{\eta}$$

Small angular correction

 $\eta = 0.214 \pm 0.022$  Measured from the data profiles

October 8, 2012

Small angular correction that accounts for the angle subtended at the measurement radius  $r_{2500}$  as the underlying cosmology varies

$$\boldsymbol{\varepsilon}(\boldsymbol{\theta}) = \left(\frac{\boldsymbol{\theta}_{2500}^{ref}}{\boldsymbol{\theta}_{2500}^{\text{mod}}}\right)^{\eta}$$

For each cluster the measured  $f_{gas}$  value at  $r_{2500}$  corresponds to a fixed angle  $\theta_{2500}^{ref}$  for the reference cosmology that is slightly different from that  $\theta_{2500}^{mod}$  for the test cosmology.

$$M_{2500} \propto 4\pi r_{2500}^{3} \rho_{crit} / 3 \text{ th}$$

$$\rho_{crit} = 3H(z)^{2} / 8\pi G \quad \rho_{crit} G$$

Mass at the measurement radius  $r_{2500}$ , for which the density is 2500 the critical density

 $\rho_{\text{crit}}$  critical density

October 8, 2012

Assuming hydrostatic equilibrium (HSE) in the intracluster medium (ICM) and spherical symmetry we can calculate the mass within a given radius using the following expression (Sarasin 1988)

$$M(r) = -\frac{rkT(r)}{G\mu m_p} \left[ \frac{d\ln n}{d\ln r} + \frac{d\ln T}{d\ln r} \right]$$
 n(r) is the gas density  
T(r) ICM temperature  
k Boltzmann constant  
 $\mu m_p$  mean molecular weight

Measuring cluster masses is one of the cornerstones of cluster cosmology. Under those assumptions we can measure the total mass from density n(r) and temperature T(r) profiles obtained from X-ray data. Note also that M(r) depends more strongly on T(r) than n(r).

Given that the temperature, and temperature and density gradients, in the region of  $\theta_{2500}$  are likely to be constant, we have

$$M_{2500} \propto r_{2500}$$

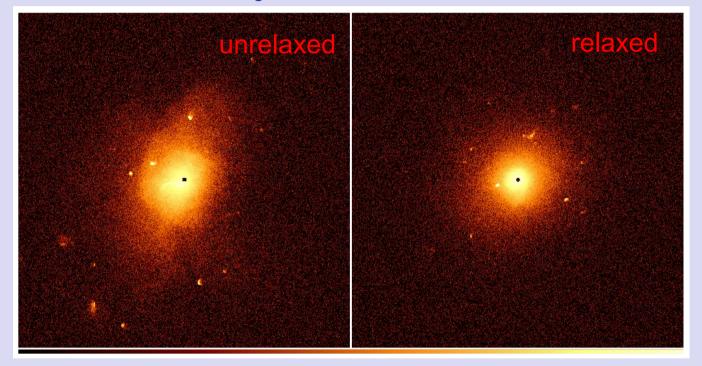
October 8, 2012

# X-ray galaxy cluster cosmology: How well can we measure cluster mass?

October 8, 2012

# Hydro dynamical simulations of X-ray galaxy clusters

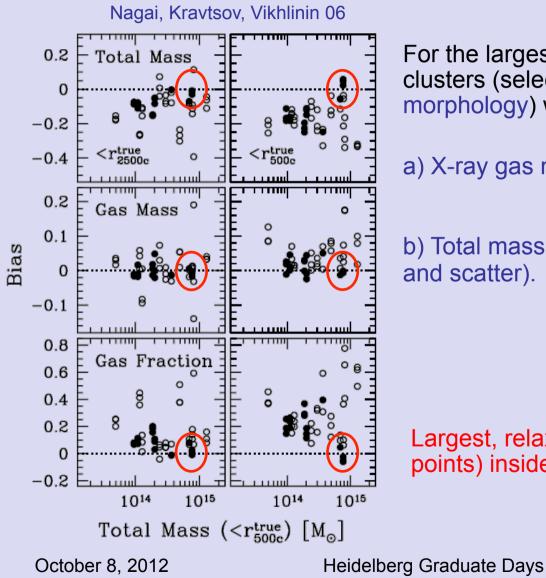
Nagai, Kravtsov, Vikhlinin 06



Very good news for X-ray galaxy cluster cosmology from the most recent simulations: systematics are relatively small and can be quantified.

October 8, 2012

#### How accurately can we measure the mass?



For the largest, hottest (kT>5keV), relaxed clusters (selection based on X-ray morphology) we currently expect to measure:

a) X-ray gas mass to ~1% accuracy.

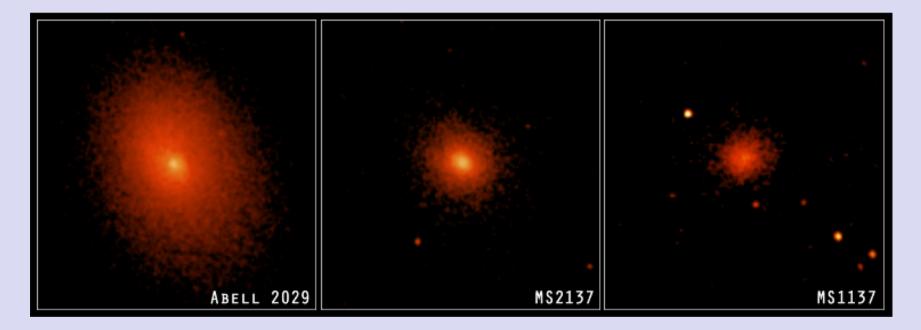
b) Total mass to few % accuracy (both bias and scatter).

Largest, relaxed clusters (filled points) inside red circles.

# X-ray galaxy cluster data

It is crucial to use only dynamically relaxed clusters:

Regular X-ray morphology, Low ellipticities, Minimal centroid variation, Sharp central brightness peaks centered on their dominant elliptical galaxies.



October 8, 2012

$$M_{2500} \propto r_{2500}$$
  

$$M_{2500} \propto 4\pi r_{2500}^{3} \rho_{crit} / 3$$
  

$$r_{2500} \propto H(z)^{-1}$$
  

$$\rho_{crit} = 3H(z)^{2} / 8\pi G$$

$$r_{2500} \propto H(z)^{-1} \longrightarrow \theta_{2500} = r_{2500} / d_A \propto [H(z)d_A]^{-1}$$

Angle spanned by  $r_{\rm 2500}$  at redshift z

$$\varepsilon(\theta) = \frac{\varepsilon(\theta)^{\text{mod}}}{\varepsilon(\theta)^{\text{ref}}} = \left(\frac{\theta_{2500}^{\text{ref}}}{\theta_{2500}^{\text{mod}}}\right)^{\eta} \approx \left[\frac{H^{\text{mod}}(z;\theta)d_A^{\text{mod}}(z;\theta)}{H^{\text{ref}}(z)d_A^{\text{ref}}(z)}\right]^{\eta}$$

October 8, 2012

$$F(d_A^{\text{mod}}) = \frac{d_A^{\text{mod}}(z;\theta)^{3/2}}{\varepsilon(\theta)^{\text{mod}}} = \frac{b(z)\gamma K}{1+s(z)} \left(\frac{\Omega_b}{\Omega_m}\right) \left[\frac{d_A^{ref}(z)^{3/2}}{\varepsilon(\theta)^{ref} f_{gas}^{ref}(z)}\right]$$

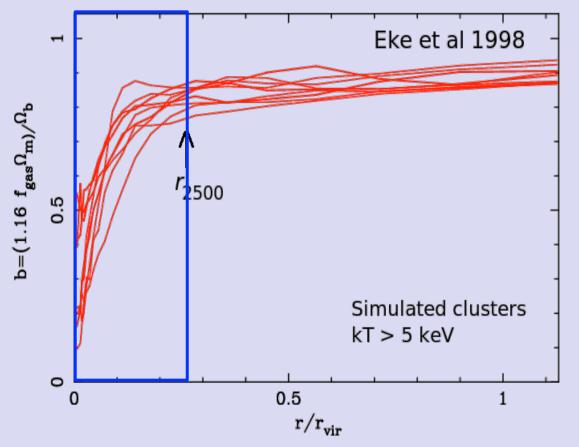
Angular diameter distance measurement for the fgas experiment

Angular diameter distance measurement for the SNIa experiment: homework (for tomorrow)

October 8, 2012

## Gas mass: simulations Low scatter total mass proxy





Simulations indicate low cluster-to-cluster scatter

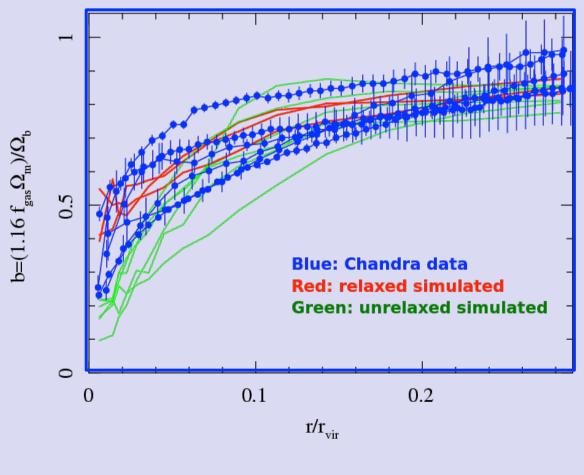
Gas-mass low-scatter totalmass proxy through  $f_{gas}$ 

Simulations indicate that baryonic mass fraction in clusters is slightly lower than mean value for the Universe as a whole. Some gas is lifted beyond the virial radius by shocks (e.g. Evrard et al 90, Thomas & Couchman 92, Navarro & White 93; NFW 95 etc, Kay et al 04, Ettori et al 06, Crain et al 06, Nagai et al 07).

Heidelberg Graduate Days

## Gas mass: data Low scatter total mass proxy

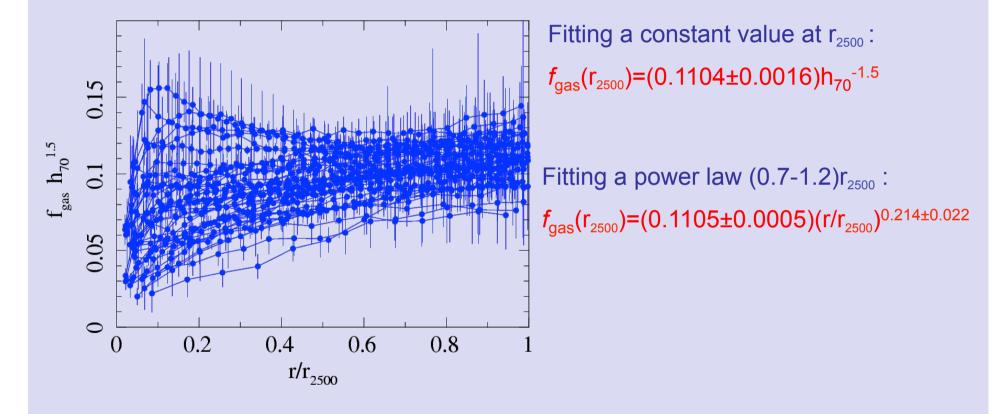
 $\Lambda$ CDM ( $\Omega_m$ =0.3,  $\Omega_{\Lambda}$ =0.7)



Undetected systematic scatter when weighted mean scatter ~5% in distance

October 8, 2012

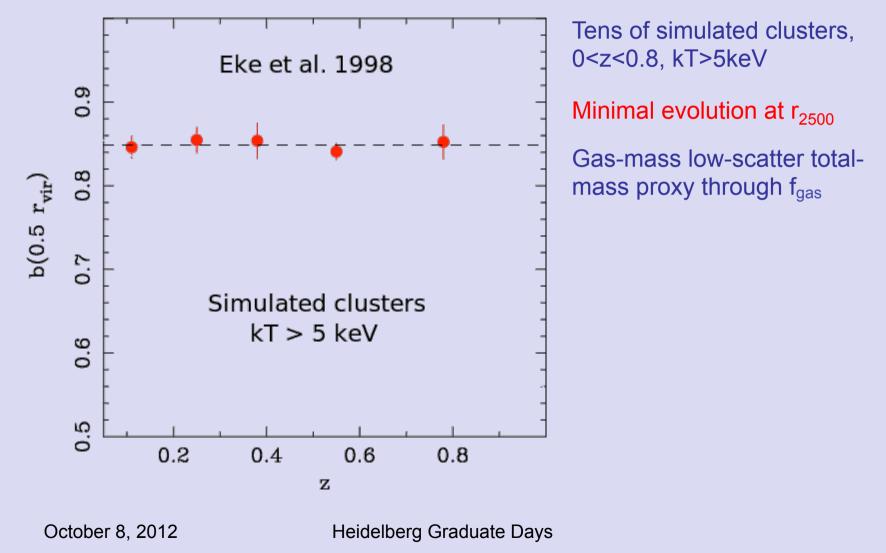
### Chandra fgas(r) data: 42 relaxed clusters with redshifts 0.06<z<1.07

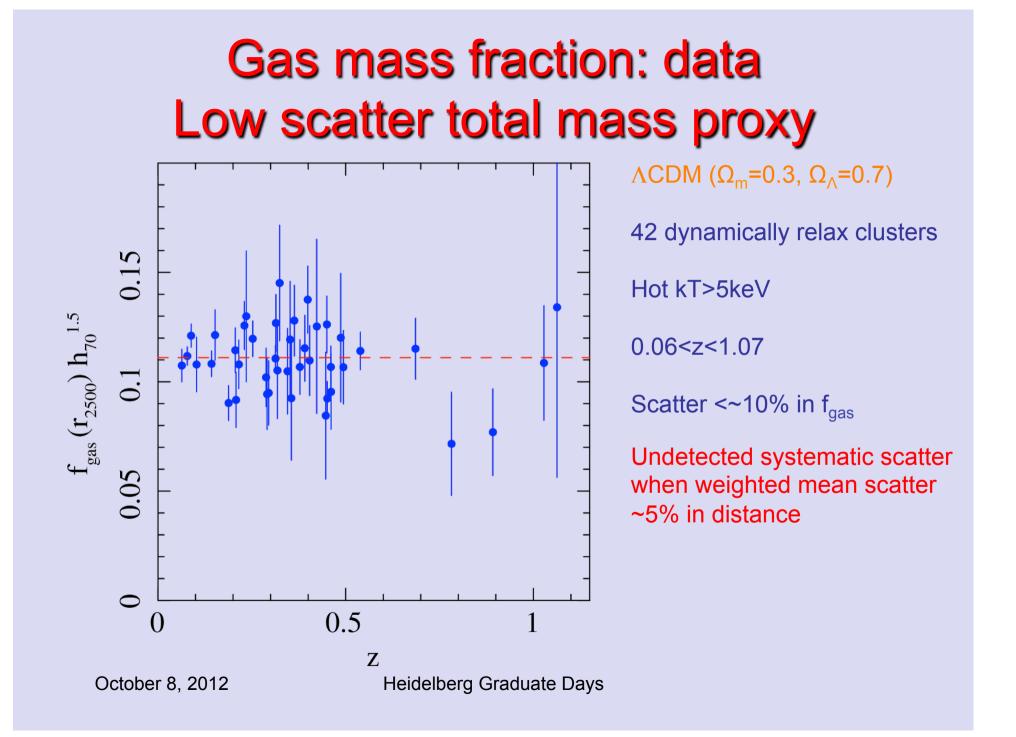


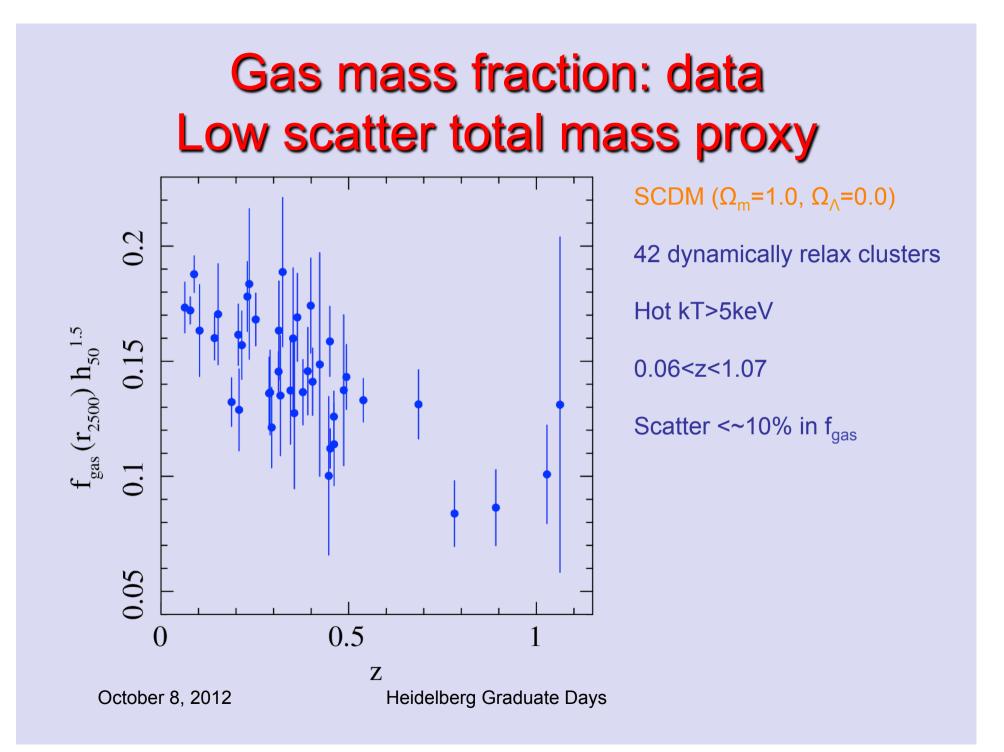
Assuming hydrostatical equilibrium and spherical symmetry (only relaxed clusters).

October 8, 2012

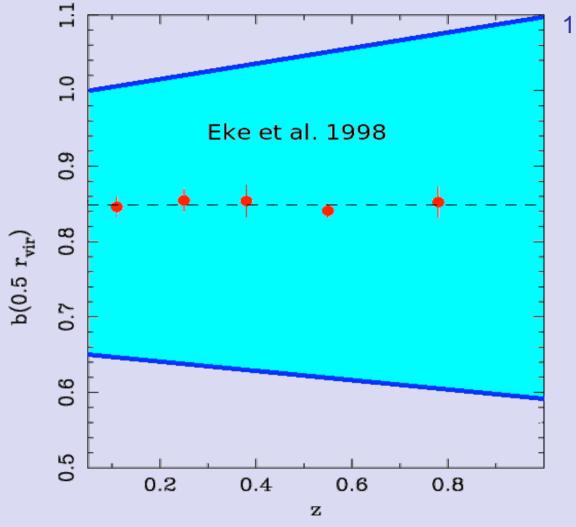
# Gas mass: simulations Low scatter total mass proxy







#### Allowances for systematic uncertainties



1) Gas depletion (simulation physics)

 $b(z)=b_0(1+\alpha_b z)$ 

normalization: 20% uniform prior  $0.65 < b_0 < 1.0$ 

evolution: 10% at z=1 uniform prior -0.1 <  $\alpha_{\rm b}$  < 0.1

October 8, 2012

Heidelberg Graduate Days

#### Allowances for systematic uncertainties

2) Instrument calibration and modelling (gas clumping, etc.)

1.0±0.1, 10% Gaussian prior on K

3) Baryonic mass in stars

 $s(z)=s_0(1+\alpha_s z)$ 

normalization  $s_0$ : 30% Gaussian uncertainty (observational)

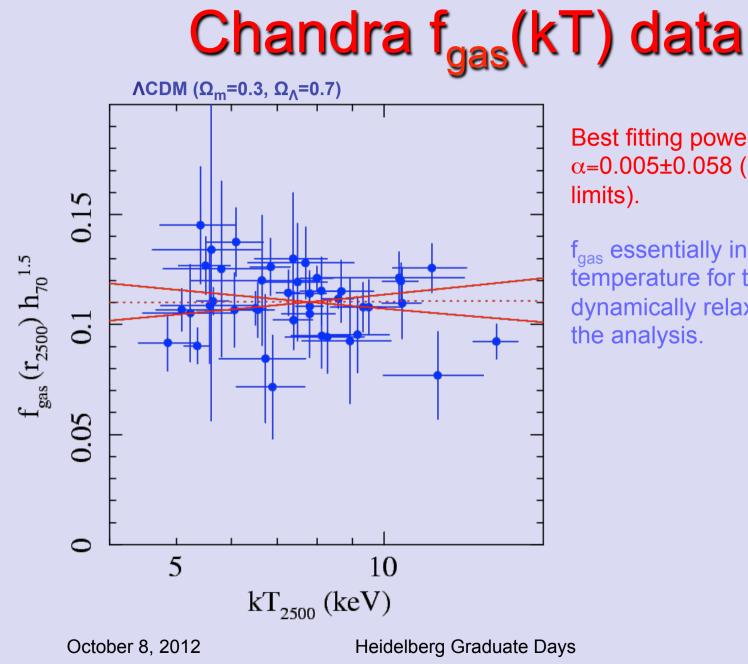
evolution -0.2 <  $\alpha_s$  < 0.2: 20% at z=1 uniform prior (observational)

4) Non-thermal pressure support in gas: (primarily due to bulk motions)

 $\gamma = M_{true}/M_{X-ray}$ 

 $1 < \gamma < 1.1$ 10% uniform (Nagai et al 07, Werner et al 09, Sanders et al 09)

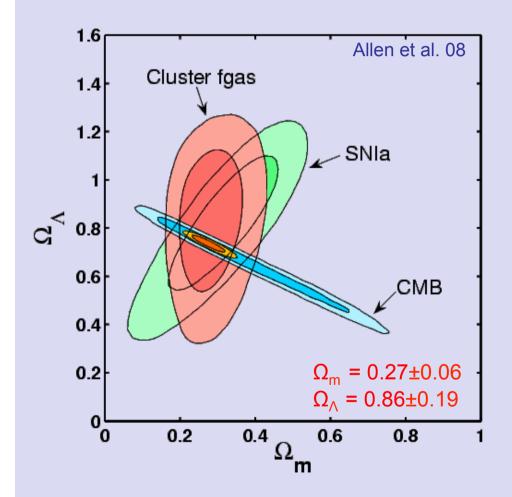
October 8, 2012



Best fitting power law:  $\alpha$ =0.005±0.058 (solid lines  $2\sigma$ limits).

f<sub>aas</sub> essentially independent of temperature for the massive, dynamically relaxed clusters in the analysis.

# Constraints on ACDM from three independent experiments



42 f<sub>gas</sub> clusters (Allen et al 08) including standard BBNS+HST priors and full systematic allowances.

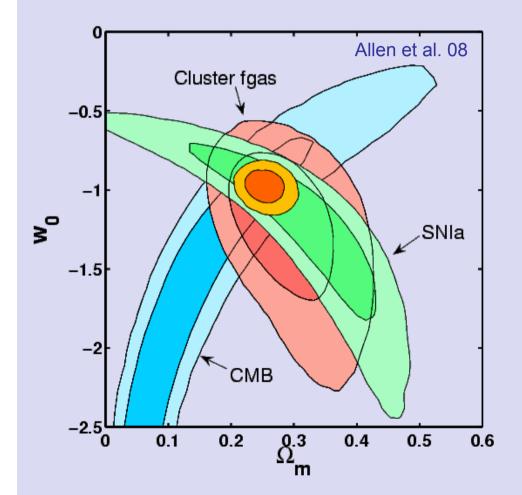
192 SNe la [Davis et al 07: Riess et al 07 (Gold sample), Wood-Vasey et al 07 (ESSENCE), Astier et al 06 (1rst year SNLS].

CMB data from WMAP3, CBI, Boomerang, ACBAR (prior 0.2<h<2.0).

Combined constraints  $\Omega_m = 0.275 \pm 0.033$  $\Omega_{\Lambda} = 0.735 \pm 0.023$ 

October 8, 2012

# Constraints on wCDM from three independent experiments



42 f<sub>gas</sub> clusters (Allen et al 08) including standard BBNS+HST priors and full systematic allowances.

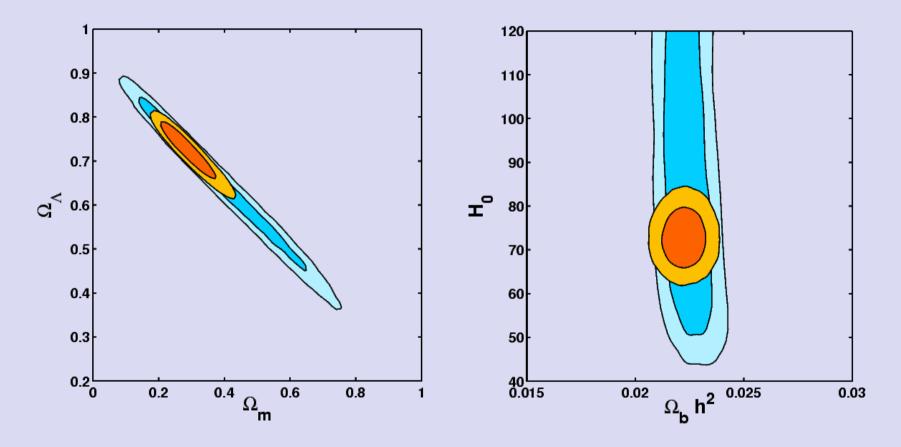
192 SNe la [Davis et al 07: Riess et al 07 (Gold sample), Wood-Vasey et al 07 (ESSENCE), Astier et al 06 (1rst year SNLS].

CMB data from WMAP3, CBI, Boomerang, ACBAR (prior 0.2<h<2.0).

Combined constraints  $\Omega_m = 0.253 \pm 0.021$  $w_0 = -0.98 \pm 0.07$ 

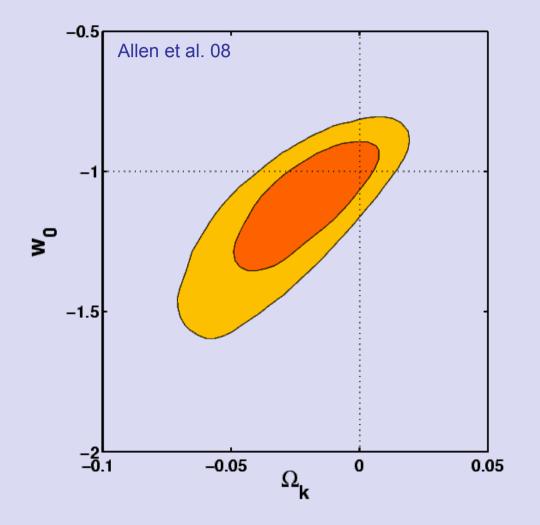
October 8, 2012

# **Breaking degenarcy power**



CMB constraints; CMB+f<sub>gas</sub> constraints

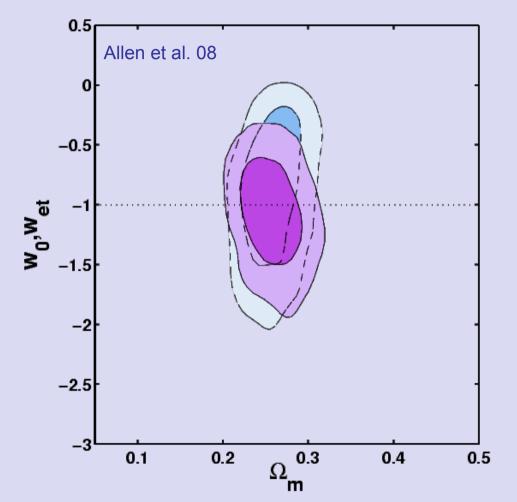
# Current constraints: non-flat constant w



Orange: combined constraints. Marginalized 68%  $\Omega_m = 0.312 \pm 0.052$  $w_0 = -1.08 \pm 0.13 - 0.19$ 

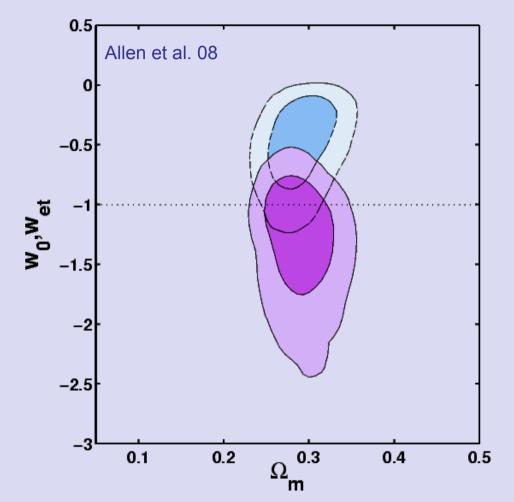
October 8, 2012

# Current constraints: flat evolving w



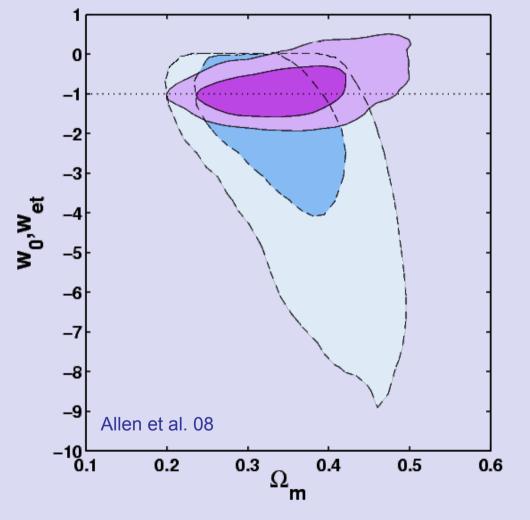
Combined constraints Marginalized 68%  $\Omega_m = 0.254 \pm 0.022$   $w_0 = -1.05 \pm 0.31 \pm 0.26$   $w_{et} = -0.83 \pm 0.48 \pm 0.43$ marginalized over  $0.05 \le z_t \le 1$ SNIa: Davis et al. 07

# Current constraints: flat evolving w



Combined constraints Marginalized 68%  $\Omega_m = 0.287 \pm 0.026$   $w_0 = -1.19 \pm 0.29 \pm 0.35$   $w_{et} = -0.33 \pm 0.18 \pm 0.34$ marginalized over  $0.05 < z_t < 1$ SNIa: Riess et al. 07

# Current constraints: non-flat evolving w



Combined constraints Marginalized 68%  $\Omega_{m} = 0.29 + 0.09 - 0.04$  $w_{0} = -1.15 + 0.50 - 0.38$  $w_{et} = -0.80 + 0.70 - 1.30$ marginalized over  $0.05 < z_{t} < 1$ 

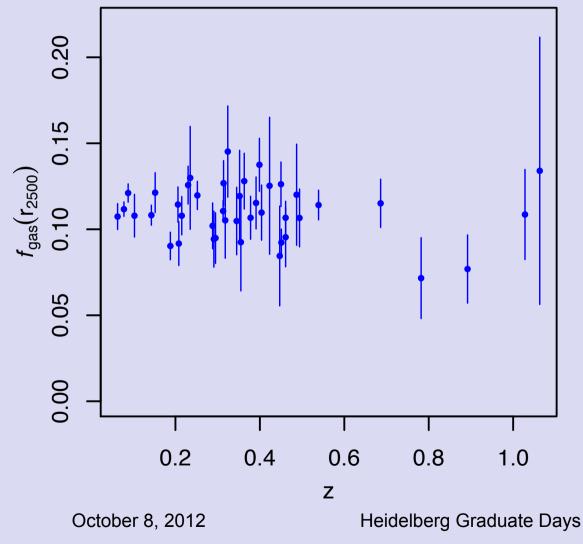
October 8, 2012

# Preliminary new f<sub>gas</sub> data

Allen et al 2012 (in prep)

October 8, 2012

# Gas mass fraction: data Low scatter total mass proxy



 $\Lambda \text{CDM} (\Omega_{\text{m}}=0.3, \Omega_{\Lambda}=0.7)$ 

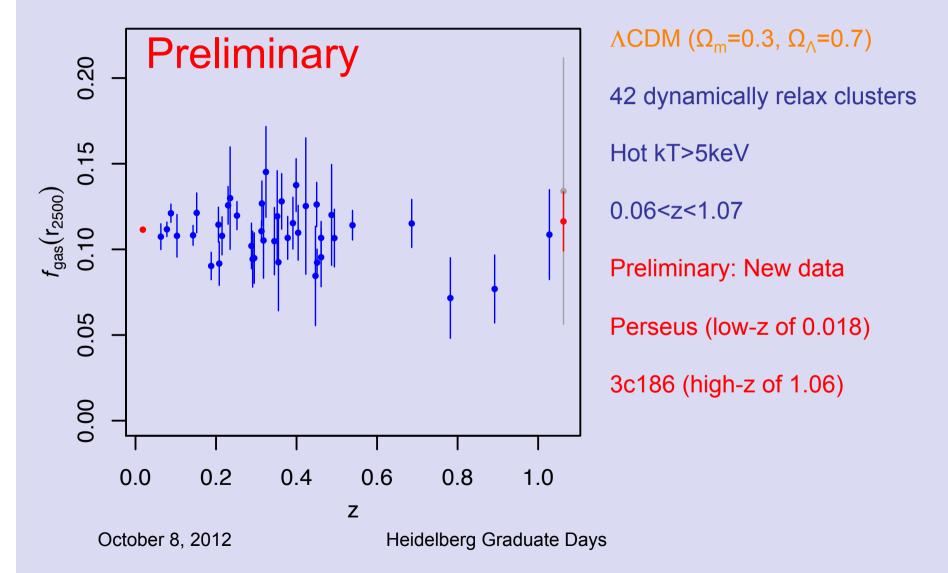
42 dynamically relax clusters

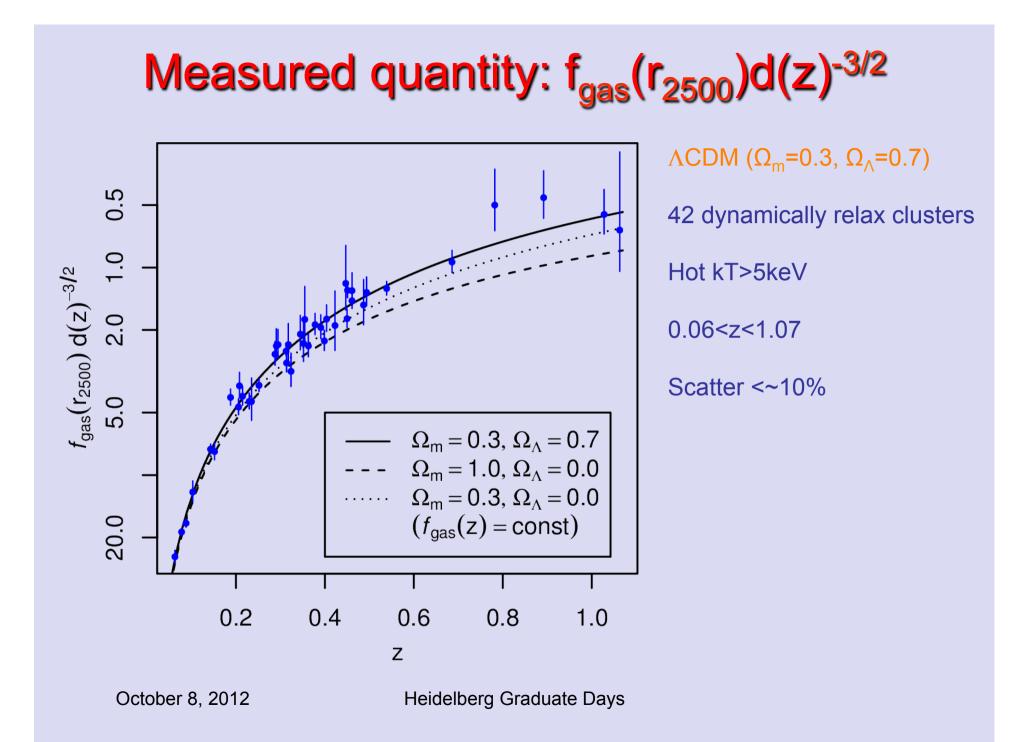
Hot kT>5keV

0.06<z<1.07

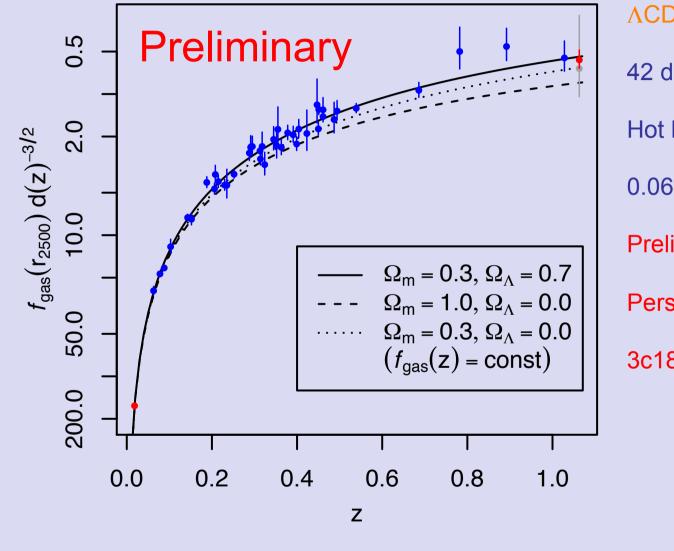
Scatter <~10% in f<sub>gas</sub>

# Gas mass fraction: data Low scatter total mass proxy





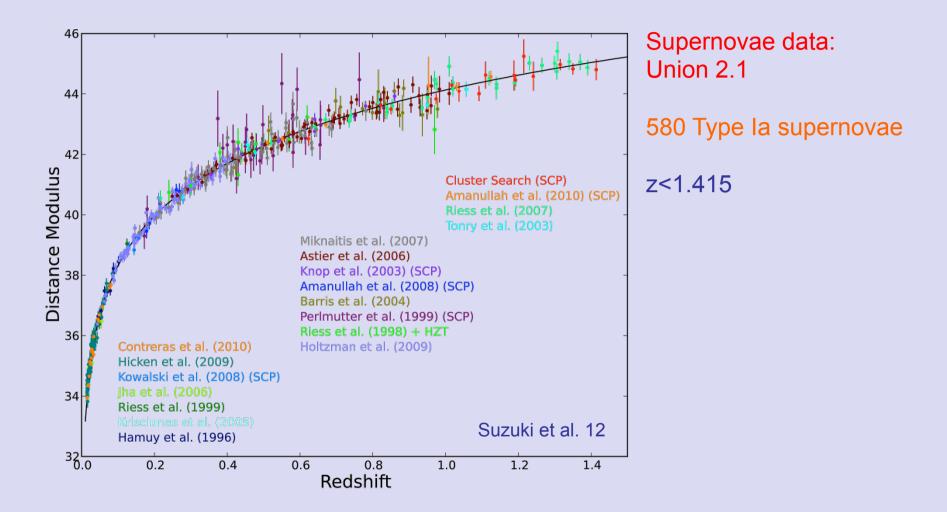
# Measured quantity: f<sub>gas</sub>(r<sub>2500</sub>)d(z)-3/2



 $\Lambda$ CDM ( $\Omega_m$ =0.3,  $\Omega_{\Lambda}$ =0.7) 42 dynamically relax clusters Hot kT>5keV 0.06<z<1.07 Preliminary: New data Perseus (low-z of 0.018) 3c186 (high-z of 1.06)

October 8, 2012

# Measured quantity: magnitude: prop d(z)-2

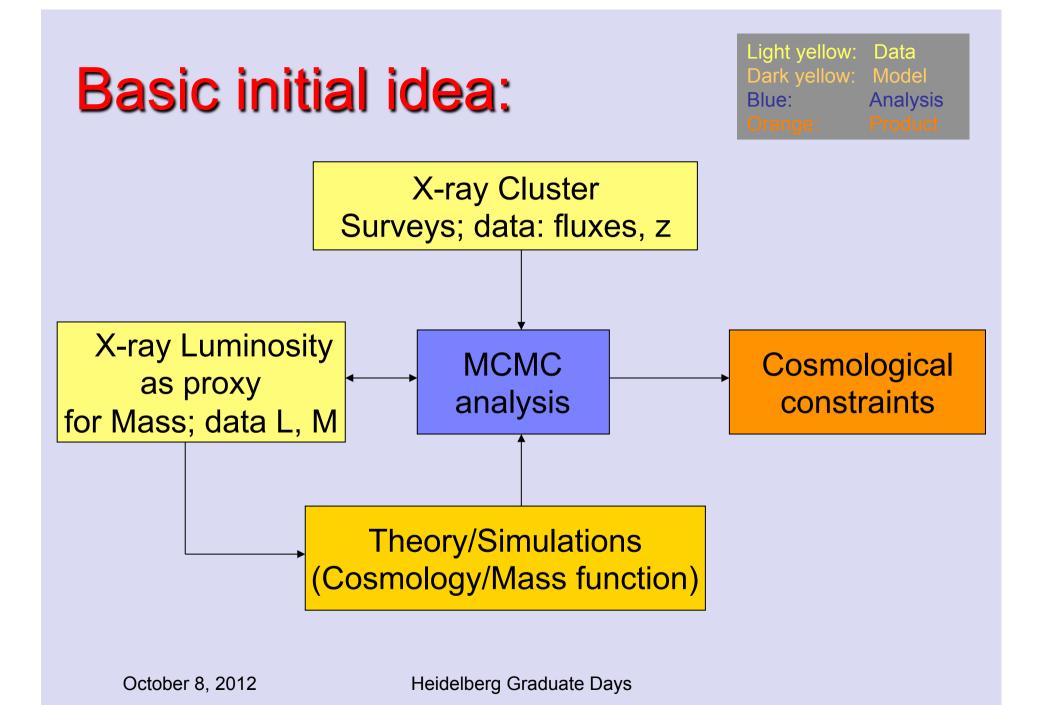


October 8, 2012

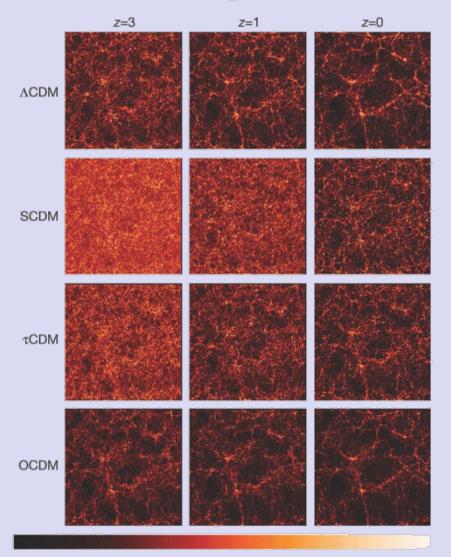
# **Cluster abundance and scaling relations**

e.g. Mantz et al 08, 10a, 10b; Vikhlinin et al 09; Rapetti et al. 09, 10; Schmidt et al 09

October 8, 2012



# **Theory: Growth of structure**

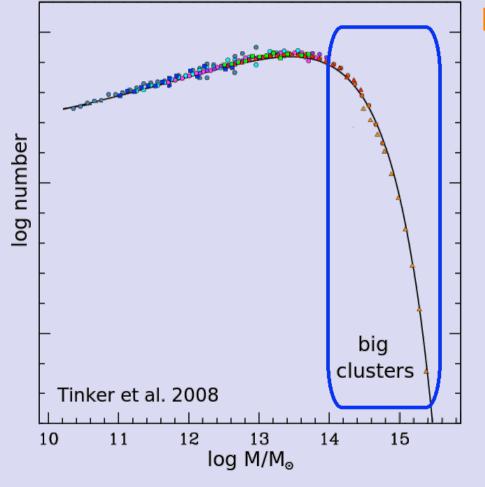


- Simulated cosmologies to model the non-linear growth of structure.
- Even looking so apparently different can be conveniently related with the linear growth calculations through a fitting formula. (See e.g. Jenkins et al 2001, Tinker et al 2008, etc.)

Cole et al 2005

October 8, 2012

# Cluster abundance as a function of mass and redshift



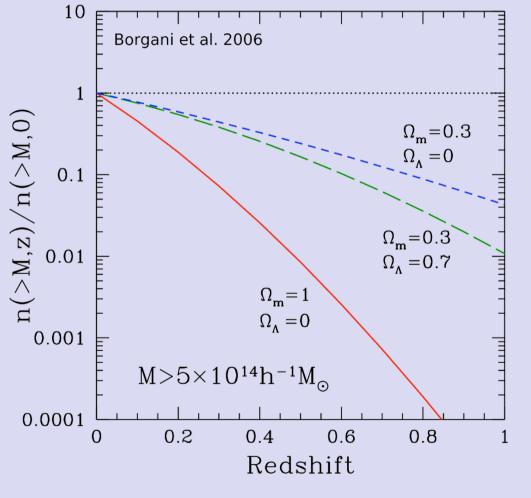
#### **N-body simulations**

Non-linear structure formation

Big clusters steep mass function; sensitive to the cosmological model; quintessence, selfinteracting, early, clustering dark energy as well as modified gravity

October 8, 2012

# Cluster abundance as a function of mass and redshift



#### Linear theory

Sensitive to the cosmological model; quintessence, selfinteracting, early, clustering dark energy as well as modified gravity

October 8, 2012

# Modern cosmology with X-ray luminous clusters of galaxies

Tuesday Lecture/Practice: cosmological codes and MCMC techniques

> David Rapetti DARK Fellow

Dark Cosmology Centre, Niels Bohr Institute

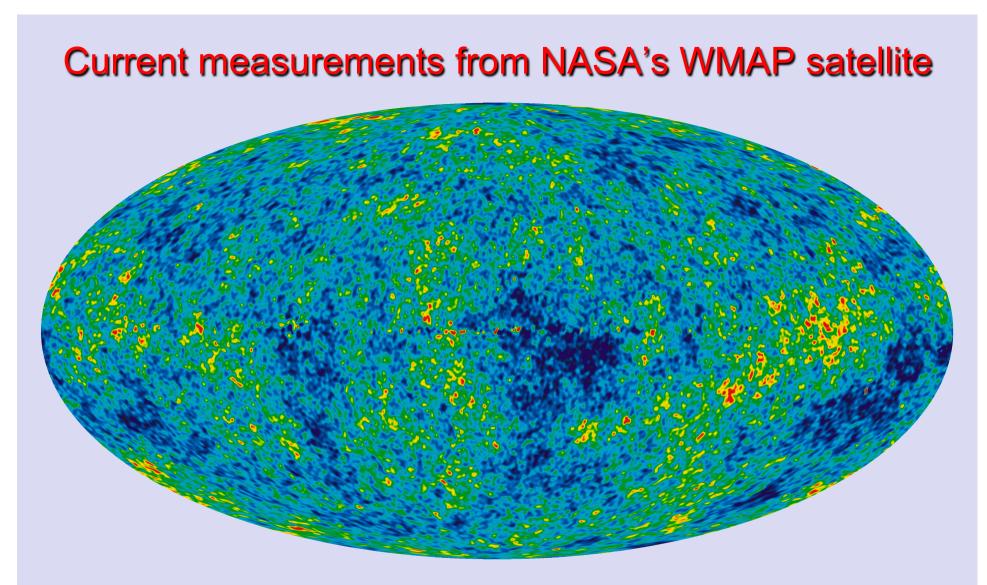
Dark Cosmology Centre University of Copenhagen



October 9, 2012

# Install CosmoMC and CAMB

- After having CosmoMC and CAMB downloaded from <u>http://cosmologist.info/cosmomc/</u> and the fgas module from <u>http://www.slac.stanford.edu/~drapetti/fgas\_module/</u>, follow the installation instructions in the corresponding websites: do not hesitate to ask questions in class whenever needed.
- Go into the CAMB folder in CosmoMC and compile it using an appropriate Fortran compiler according with your choices in your makefile.
- Later on (after the CAMB exercises) repeat the same operation to compile CosmoMC working within the source folder.

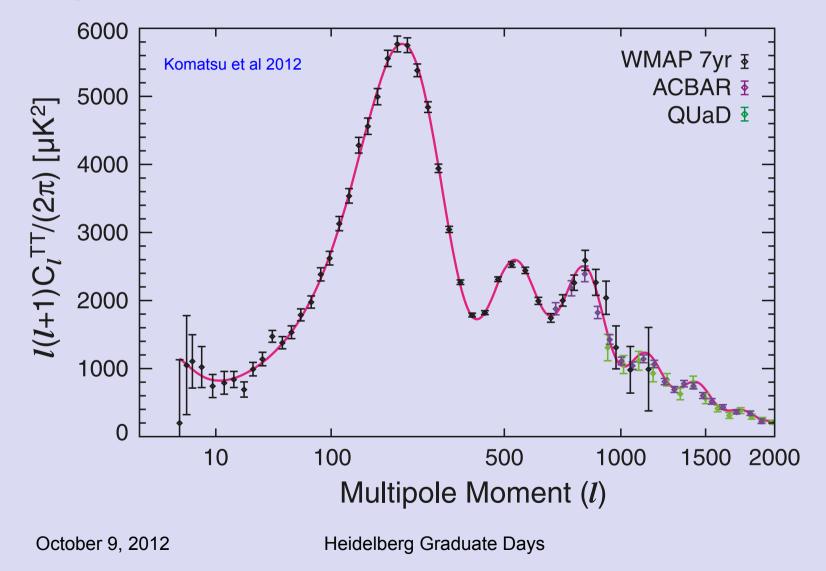


To calculate the power spectrum we can use CAMB (see e.g. the connection between such a map and the power spectrum in this link: http://background.uchicago.edu/~whu/metaanim.html)

October 9, 2012

### **Cosmic Microwave Background (CMB)**

Wilkinson Microwave Anisotropy Map (WMAP): currently, 7 years results (together with ACBAR and QUaD data)



# Practice/exercises with CAMB

October 9, 2012

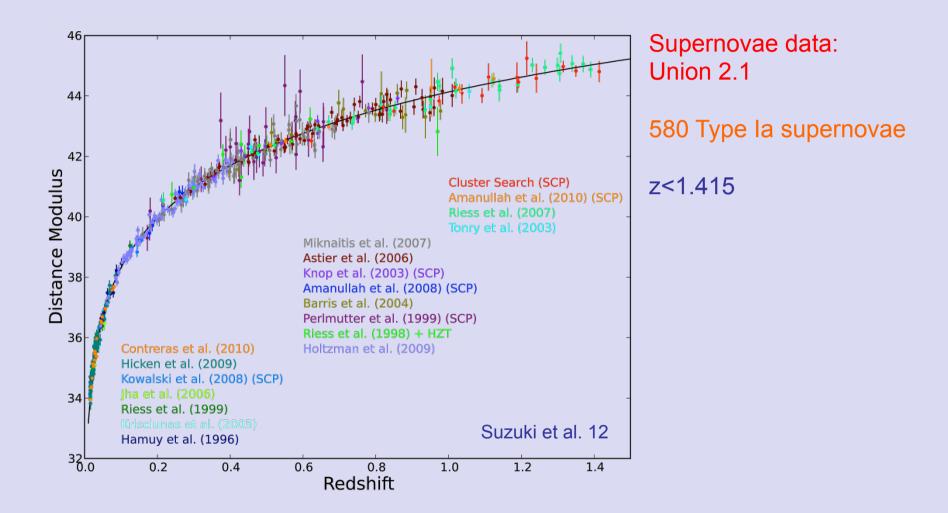
# **CMB exercises using CAMB**

- Using the WMAP7 cosmology calculate the theoretical curve of the previous figure. Plot the results (use your favorite plotting program).
- Change one cosmological parameter at a time to explore how it modifies the curve.
- Repeat the above operation for various cosmological parameters (you can check the following website for inspiration and for comparison: <u>http://background.uchicago.edu/~whu/</u>)
- Remember to ask when needed to be able to move on to the next exercises timely.

## Practice/exercises with CosmoMC

October 9, 2012

## Type la supernovae



October 9, 2012

## Type la supernovae

**Distance modulus** 

 $\mu(z) \equiv m - M = 5 \log_{10} \left( d_L / 10 \,\mathrm{pc} \right) = 5 \log_{10} \left[ (1+z)r(z) / \mathrm{pc} \right] - 5$ 

From Suzuki et al 2012, ApJ, 746, 85

$$\mu_B = m_B^{\max} + \alpha \cdot x_1 - \beta \cdot c + \delta \cdot P\left(m_{\star}^{\text{true}} < m_{\star}^{\text{threshold}}\right) - M_B$$

and the fitting procedure:

$$\chi_{\text{stat}}^{2} = \sum_{\text{SNe}} \frac{\left[\mu_{B}(\alpha, \beta, \delta, M_{\text{B}}) - \mu(z; \Omega_{m}, \Omega_{w}, w)\right]^{2}}{\sigma_{\text{lc}}^{2} + \sigma_{\text{ext}}^{2} + \sigma_{\text{sample}}^{2}}$$

**Exercise:** Use the SNe Ia code of the Union 2.1 in CosmoMC to obtain the constraints on the paper (Suzuki et al 12). You can also use the SCP website <u>http://supernova.lbl.gov/Union/</u>.

October 9, 2012

# X-ray gas mass fraction experiment

$$f_{gas}^{ref}(z) = \frac{b(z)\gamma K}{1+s(z)} \left(\frac{\Omega_b}{\Omega_m}\right) \varepsilon(\theta) \left[\frac{d_A^{ref}(z)}{d_A^{\text{mod}}(z;\theta)}\right]^{3/2}$$

Apparent evolution of the gas mass fraction

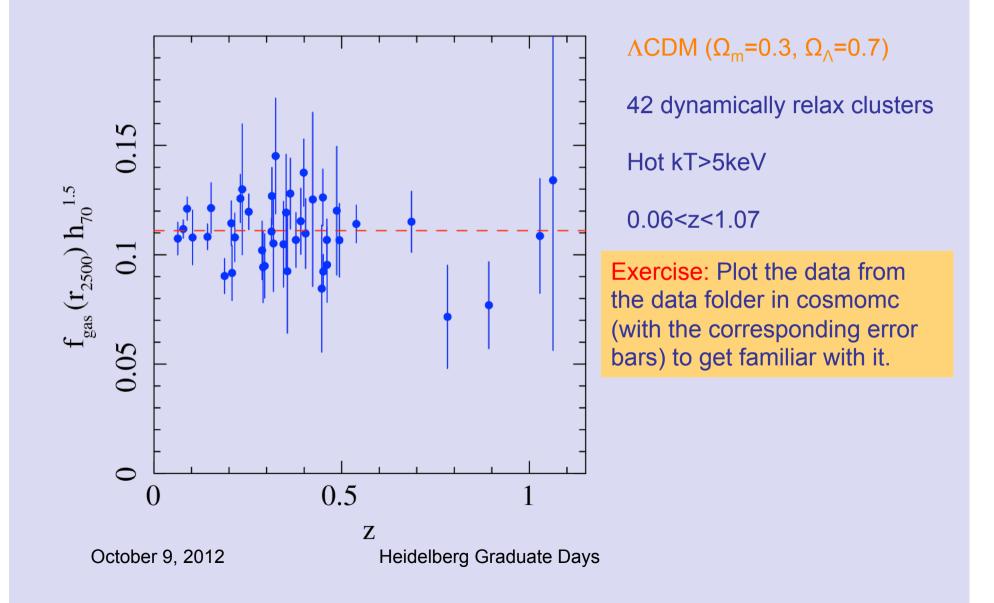
$$\varepsilon(\theta) = \left[\frac{H^{\text{mod}}(z;\theta)d_A^{\text{mod}}(z;\theta)}{H^{\text{ref}}(z)d_A^{\text{ref}}(z)}\right]^{\eta}$$

Small angular correction

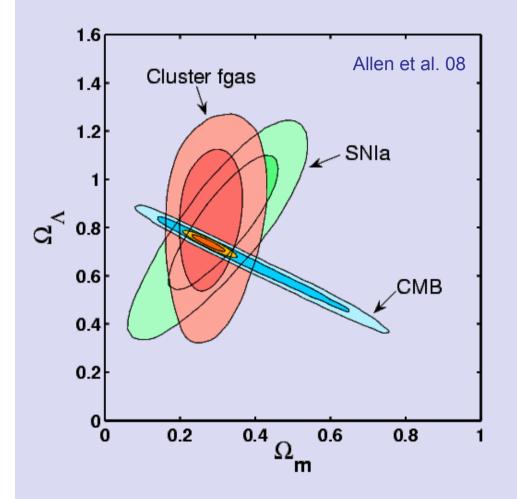
 $\eta = 0.214 \pm 0.022$  Measured from the data profiles

October 9, 2012

### X-ray gas mass fraction data



# **Constraints on ACDM**



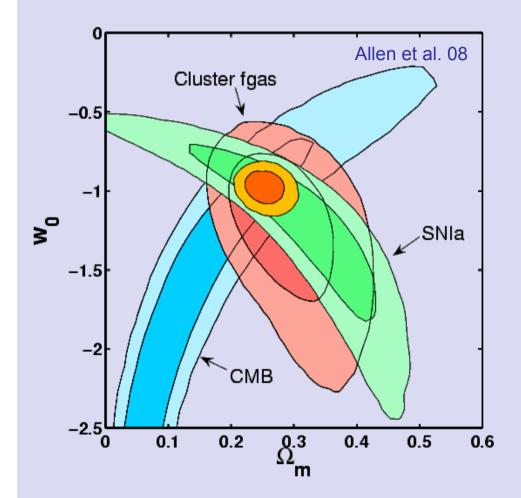
42 f<sub>gas</sub> clusters (Allen et al 08) including standard BBNS+HST priors and full systematic allowances.

Exercise: Reproduce the clusters, red constraints using the fgas module in CosmoMC; obtain also the marginalized constraints below.

 $\Omega_{\rm m} = 0.27 \pm 0.06$  $\Omega_{\Lambda} = 0.86 \pm 0.19$ 

October 9, 2012

### **Constraints on wCDM**



42 f<sub>gas</sub> clusters (Allen et al 08) including standard BBNS+HST priors and full systematic allowances.

Exercise: Reproduce the clusters, red constraints using the fgas module in CosmoMC.

October 9, 2012

#### Systematic uncertainty parameters

1) Gas depletion (simulation physics)

b(z)=b<sub>0</sub>(1+ $\alpha_{b}$ z) normalization: 20% uniform prior 0.65 < b<sub>0</sub> < 1.0 evolution: 10% at z=1 uniform prior -0.1 <  $\alpha_{b}$  < 0.1

2) Instrument calibration and modelling (gas clumping, etc.)

1.0±0.1, 10% Gaussian prior on K

3) Baryonic mass in stars

Exercise: Test their robustness by sensibly changing the allowances in the fgas module in CosmoMC and obtaining new constraints

```
s(z)=s_0(1+\alpha_s z)
normalization s_0: 30% Gaussian uncertainty (observational)
evolution -0.2 < \alpha_s < 0.2: 20% at z=1 uniform prior (observational)
```

#### 4) Non-thermal pressure support in gas: (primarily due to bulk motions)

 $\gamma = M_{true}/M_{X-ray}$ 1<  $\gamma$  <1.1 10% uniform (simulations/observations)

October 9, 2012

### Modern cosmology with X-ray luminous clusters of galaxies

Wednesday Lecture: Cluster Abundance Cosmology

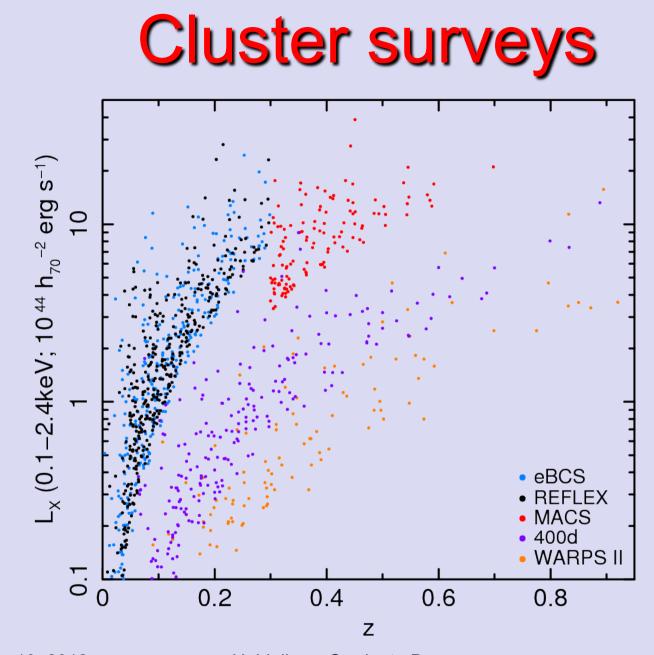
#### David Rapetti DARK Fellow

Dark Cosmology Centre, Niels Bohr Institute

Dark Cosmology Centre University of Copenhagen



October 10, 2012



October 10, 2012

Heidelberg Graduate Days

#### Full cosmological analysis in this series of papers

"The Observed Growth of Massive Galaxy Clusters I: Statistical Methods and Cosmological Constraints", MNRAS 406, 1759, 2010 Adam Mantz, Steven Allen, David Rapetti, Harald Ebeling

> "The Observed Growth of Massive Galaxy Clusters II: X-ray Scaling Relations", MNRAS 406, 1773, 2010 Adam Mantz, Steven Allen, Harald Ebeling, David Rapetti, Alex Drlica-Wagner

"The Observed Growth of Massive Galaxy Clusters III: Testing General Relativity at Cosmological Scales",

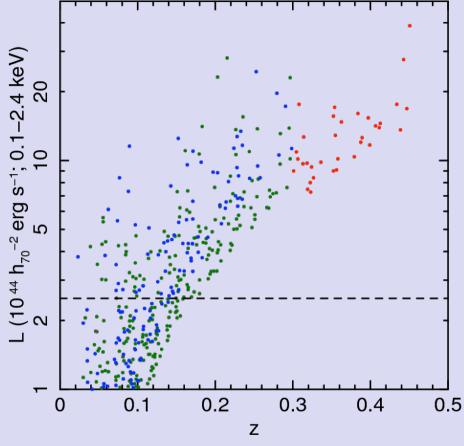
#### MNRAS 406, 1796, 2010

David Rapetti, Steven Allen, Adam Mantz, Harald Ebeling (Chandra/NASA press release together with Schmidt, Vikhlinin & Hu 09, April 14 2010, "Einstein' s Theory Fights off Challengers")

"The Observed Growth of Massive Galaxy Clusters IV: Robust Constraints on Neutrino Properties", MNRAS 406, 1805, 2010 Adam Mantz, Steven Allen, David Rapetti

October 10, 2012

# **Cluster survey data**



Low redshift (z<0.3)

- ➢ BCS (Ebeling et al 98, 00))
  - $F > 4.4 \times 10^{-12} \text{ erg s}^{-1} \text{ cm}^{-2}$

~33% sky coverage

REFLEX (Böhringer et al 04)
 F > 3.0 x 10<sup>-12</sup> erg s<sup>-1</sup> cm<sup>-2</sup>
 ~33% sky coverage

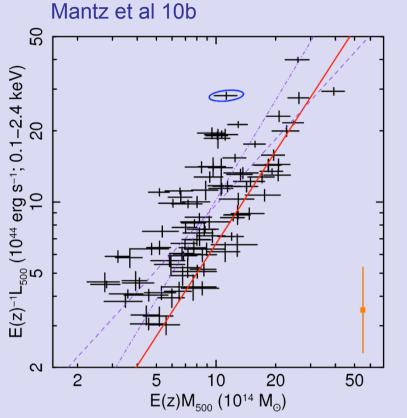
Intermediate redshifts (0.3<z<0.5)</li>
 ➢ Bright MACS (Ebeling et al 01, 10)
 F > 2.0 x 10<sup>-12</sup> erg s<sup>-1</sup> cm<sup>-2</sup>
 ~55% sky coverage

L >  $2.55 \times 10^{44} h_{70}^{-2} \text{ erg s}^{-1}$  (dashed line). Cuts leave 78+126+34=238 massive clusters

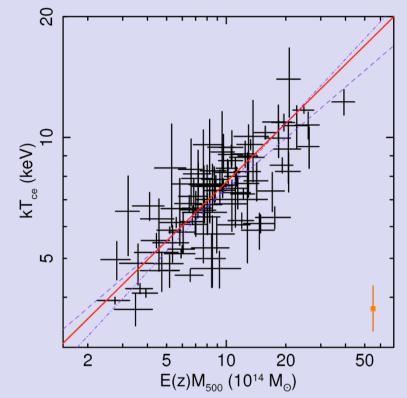
All based on RASS detections. Continuous and all 100% redshift complete.

October 10, 2012

#### Scaling relations data: X-ray follow-up for 94 clusters



Best fit for all the data (survey+follow-up+other data).



Both, power law, self-similar, constant log-normal scatter.

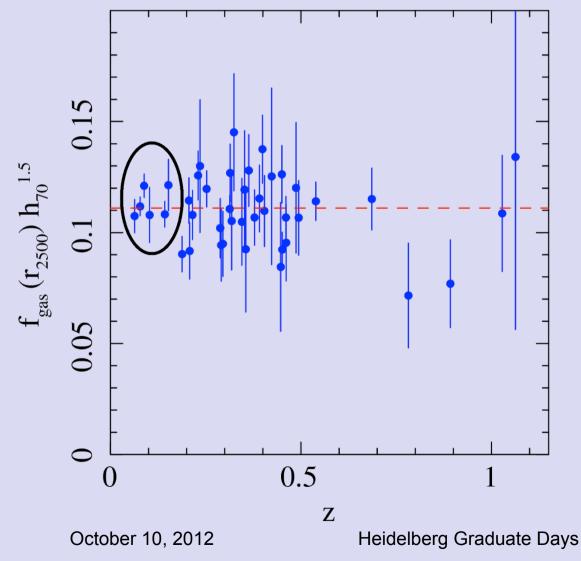
\* Crucial: self-consistent and simultaneous analysis of survey+follow-up data, accounting for selection biases, degeneracies, covariances, and systematic uncertainties.

\* Data does not require additional evolution beyond self-similar (see tests in Mantz et al 10b).

\* Important cluster astrophysics conclusions (see Mantz et al 10b).

October 10, 2012

### Gas mass fraction: calibration data Total mass proxy



 $\Lambda$ CDM ( $\Omega_m$ =0.3,  $\Omega_\Lambda$ =0.7)

Only the 6 lowest-z clusters

Hot kT>5keV

z<0.15

Scatter <~10% in f<sub>gas</sub>

- To properly account for selection biases [in a previous analysis of the mass function, Mantz et al 08 (M08), using an external data set to constrain the luminosity-mass relation, we restrict the data set of Reiprich & Bohringer 02 to low redshift and high fluxes to minimize the effects of selection bias].
- M08, Vikhlinin et al 09a,b binned their detected clusters in redshift and mass with infinitesimally small bins taking the previous approach to its logical limit, but there was still no self-consistent fit for both scaling relations and cosmology.
- Generalization of M08 to allow a simultaneous and self-consistent fit using follow-up observations of flux-selected clusters over the whole redshift range of the data accounting for both Malmquist and Eddington biases.
- Likelihood can be derived from first principles beginning from a Bayesian regression model.
- General problem: counting sources as a function of their properties

- A population function: <dN/dx> theoretical prediction of the distribution (i.e. number) of sources as a function of their properties.
- Population variables x (properties).
- Response variables y obeying a stochastic scaling relation as a function of x.
- Stochastic scaling relation P(y|x): probability distribution of y given x.
- Observed values  $\hat{x}$  and  $\hat{y}$  (note that not all x and y need to be measured, except for those determining if a source belongs to the sample, i.e. if it is detected).
- Sampling distributions for the observations as a function of the population and response variables  $P(\hat{x}, \hat{y} | x, y)$ .
- A selection function  $P(I | x, y, \hat{x}, \hat{y})$ , where *I* represents the inclusion in the sample, i.e. detection.

- For our large sky coverage surveys of massive clusters we assume that the clustering of the sources is not important compared with the purely Poisson probability distribution of their occurrence (Hu & Kravtsov 03; Holder 06).
- Binning derivation: We divide the observed space  $(\hat{x}, \hat{y})$  into infinitesimal bins which contain at a maximum one detected source and the population function and scaling relations are assumed to be constant in each bin.

Expected number of detected sources

$$\langle N_{\det,j} \rangle = (\Delta \hat{x}_j \Delta \hat{y}_j) \int dx \int dy \left\langle \frac{dN}{dx} \right\rangle P(y|x) P(\hat{x}_j, \hat{y}_j|x, y) P(I|x, y, \hat{x}_j, \hat{y}_j)$$

Likelihood (product of Poisson likelihoods)

$$\mathcal{L}(\{N_j\}) = \prod_j \frac{\langle N_{\det,j} \rangle^{N_j} e^{-\langle N_{\det,j} \rangle}}{N_j!} = e^{-\langle N_{\det} \rangle} \prod_{j:N_j=1} \langle N_{\det,j} \rangle$$
$$N_j \in \{0, 1\}$$

October 10, 2012

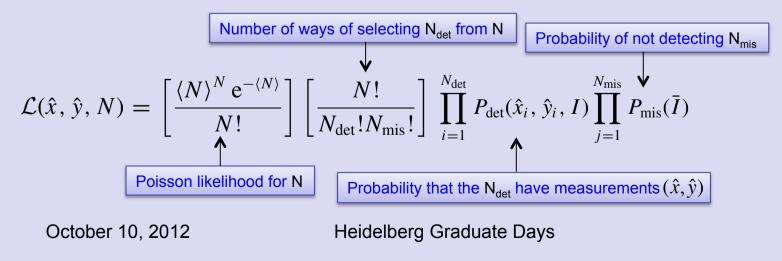
 Regression derivation: for truncated data (with undetected sources) the total number of sources is the addition of detected plus undetected (missed) sources and is part of the model and must be marginalized over (Gelman et al 04; Kelly 07).

$$\langle N \rangle = \int dx \left\langle \frac{dN}{dx} \right\rangle$$

$$\langle N_{det} \rangle = \int dx \left\langle \frac{dN}{dx} \right\rangle \int dy \ P(y|x) \int d\hat{x} \int d\hat{y} \ P(\hat{x}, \hat{y}|x, y) P(I|x, y, \hat{x}, \hat{y})$$

$$\langle N_{mis} \rangle = \langle N \rangle - \langle N_{det} \rangle$$

- Joint likelihood of the observations  $(\hat{x}, \hat{y})$  and the total number of sources N is



- Using the previous expressions we can calculate the probabilities of detecting a source with given properties and of missing a source

$$P_{\text{det}}(\hat{x}_i, \hat{y}_i, I) = \int dx \int dy \frac{\langle dN/dx \rangle}{\langle N \rangle} P(y|x) P(\hat{x}_i, \hat{y}_i|x, y) P(I|x, y, \hat{x}_i, \hat{y}_i) = \frac{\langle \tilde{n}_{\text{det},i} \rangle}{\langle N \rangle}$$

P(x) Probability for a source to have properties x

$$P_{\rm mis}(\bar{I}) = \int dx \int dy \frac{\langle dN/dx \rangle}{\langle N \rangle} P(y|x) \int d\hat{x} \int d\hat{y} \ P(\hat{x}, \, \hat{y}|x, \, y) P(\bar{I}|x, \, y, \, \hat{x}, \, \hat{y}) = \frac{\langle N_{\rm mis} \rangle}{\langle N \rangle}$$

Substituting these expressions we have

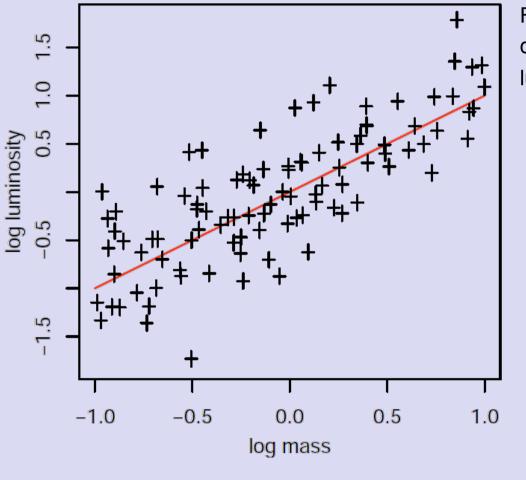
$$\mathcal{L}(\hat{x}, \hat{y}, N) = \left[\frac{\langle N \rangle^{N}}{\langle N \rangle^{N_{\text{det}}} \langle N \rangle^{N_{\text{mis}}}}\right] \left[\frac{1}{N_{\text{det}}!}\right] \left[\frac{\langle N_{\text{mis}} \rangle^{N_{\text{mis}}} e^{-\langle N_{\text{mis}} \rangle}}{N_{\text{mis}}!}\right] e^{-\langle N_{\text{det}} \rangle} \prod_{i=1}^{N_{\text{det}}} \langle \tilde{n}_{\text{det},i} \rangle$$
$$\langle \tilde{n}_{\text{det},j} \rangle = \langle N_{\text{det},j} \rangle / (\Delta \hat{x}_{j} \Delta \hat{y}_{j})$$

October 10, 2012

Heidelberg Graduate Days

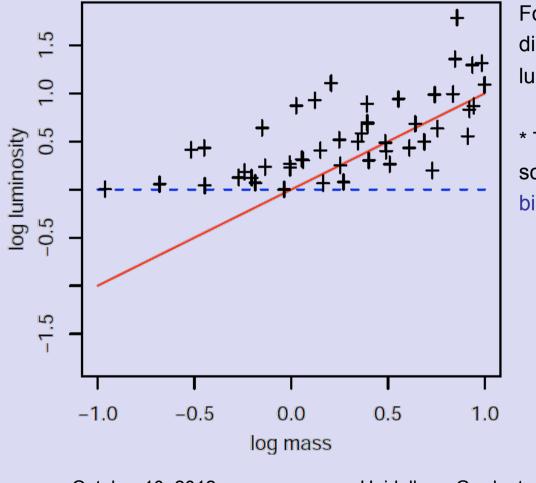
Mantz et al 10b

October 10, 2012



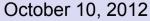
For illustration purposes: Uniform distribution of simulated data and fictitious luminosity-mass relation (red line).

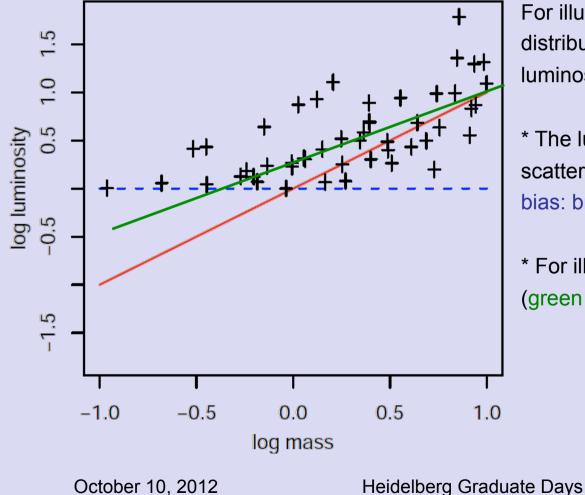
Mantz et al 10b



For illustration purposes: Uniform distribution of simulated data and fictitious luminosity-mass relation (red line).

\* The luminosity-mass relation has intrinsic scatter (~40%), which leads to Malmquist bias: brighter cluster are easier to find.



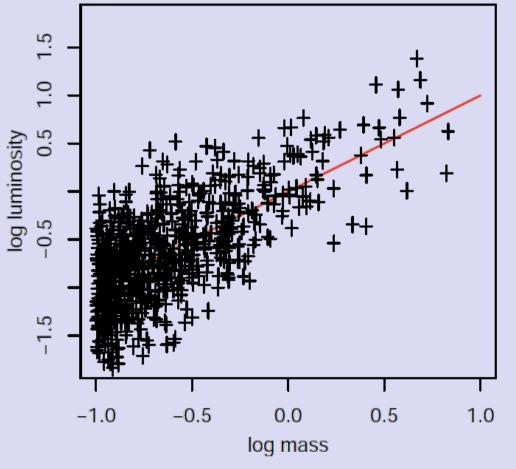


For illustration purposes: Uniform distribution of simulated data and fictitious luminosity-mass relation (red line).

\* The luminosity-mass relation has intrinsic scatter (~40%), which leads to Malmquist bias: brighter cluster are easier to find.

\* For illustration purposes: fitting by eye (green line) only these data is wrong.

Mantz et al 10b



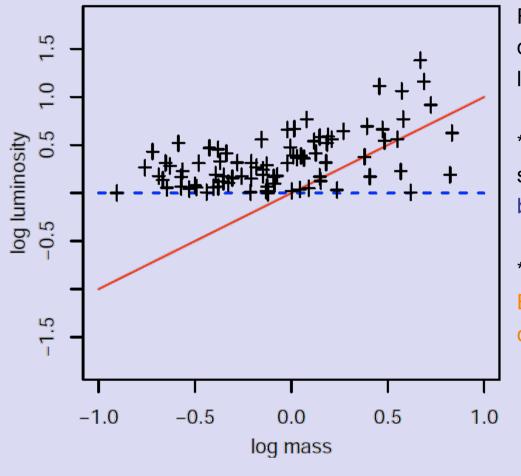
For illustration purposes: Exponential distribution of simulated data and fictitious luminosity-mass relation (red line).

\* The luminosity-mass relation has intrinsic scatter (~40%), which leads to Malmquist bias: brighter cluster are easier to find.

\* The shape of the mass function leads to Eddington bias: much more low-mass clusters

October 10, 2012

Mantz et al 10b

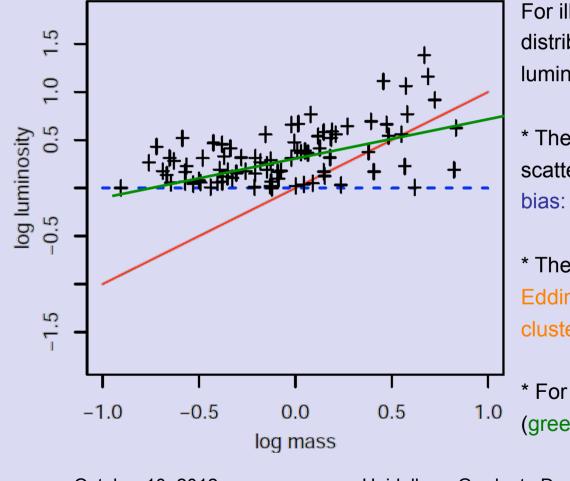


For illustration purposes: Exponential distribution of simulated data and fictitious luminosity-mass relation (red line).

\* The luminosity-mass relation has intrinsic scatter (~40%), which leads to Malmquist bias: brighter cluster are easier to find.

\* The shape of the mass function leads to Eddington bias: much more low-mass clusters

October 10, 2012



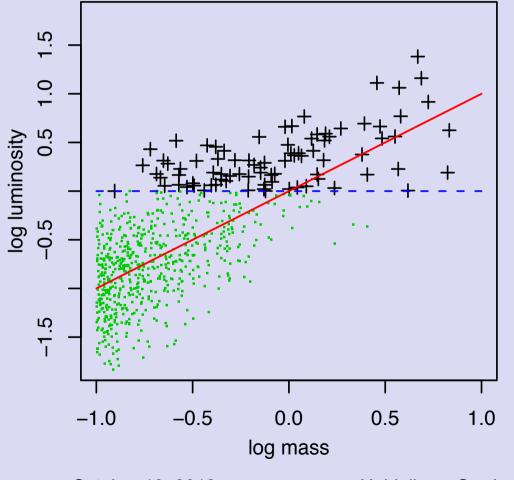
For illustration purposes: Exponential distribution of simulated data and fictitious luminosity-mass relation (red line).

\* The luminosity-mass relation has intrinsic scatter (~40%), which leads to Malmquist bias: brighter cluster are easier to find.

\* The shape of the mass function leads to Eddington bias: much more low-mass clusters.

\* For illustration purposes: fitting by eye (green line) only these data is wrong.

Allen, Evrard, Mantz 11

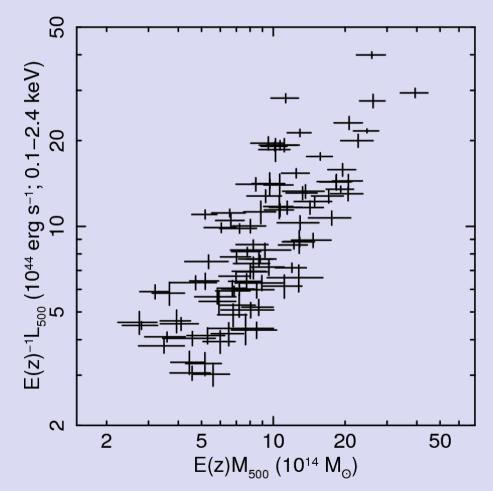


For illustration purposes: Exponential distribution of simulated data and fictitious luminosity-mass relation (red line).

\* The luminosity-mass relation has intrinsic scatter (~40%), which leads to Malmquist bias: brighter cluster are easier to find.

\* The shape of the mass function leads to Eddington bias: much more low-mass clusters

### X-ray luminosity-mass relation



Fitted with simple power law model, selfsimilar evolution and constant log-normal scatter  $\sigma_{lm}$ 

$$\langle l(m) \rangle = \beta_0^{lm} + \beta_1^{lm} m$$

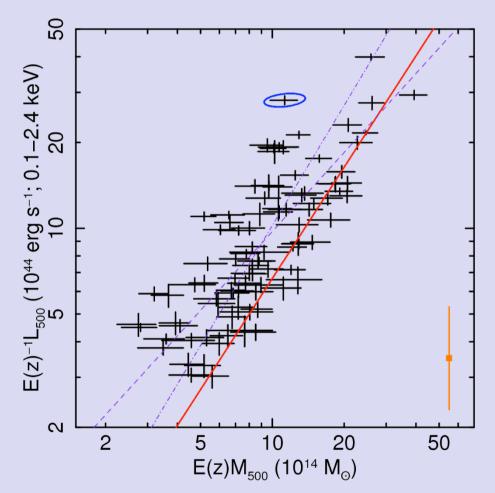
Using the definitions

$$l = \log_{10} \left( \frac{L_{500}}{E(z) 10^{44} \, erg \, s^{-1}} \right)$$
$$m = \log_{10} \left( \frac{M_{500} E(z)}{10^{15} \, M_{solar}} \right)$$

Current data do not require (i.e. acceptable fit) neither additional evolution beyond selfsimilar and constant scatter or asymmetric scatter (see details in Mantz et al 10b).

October 10, 2012

### X-ray luminosity-mass relation



For bolometric luminosities, the best fit using all the data (survey+follow-up+other cosmological data sets):

norm.  $\beta_0^{lm} = 1.23 \pm 0.12$ slope  $\beta_1^{lm} = 1.63 \pm 0.06$ scatter  $\sigma_{lm} = 0.185 \pm 0.019$  (~ 40%)

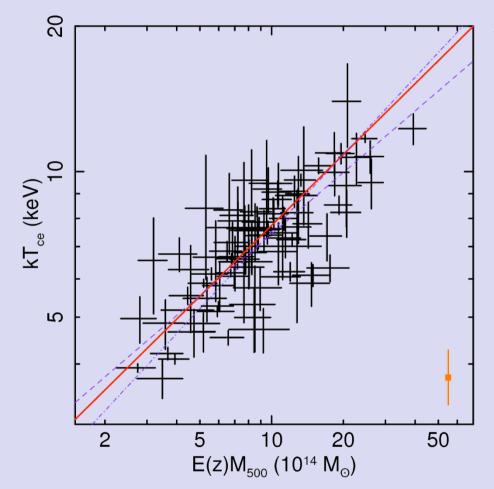
Slope steeper than the simple virial prediction:  $\beta_1^{lm} = 1.33$ 

#### Consistent with excess heating

Energy injection heats (e.g. AGN) the gas raising the temperature, decreasing the density and therefore the luminosity, being more important for less massive systems.

October 10, 2012

#### **Temperature-mass relation**



Again, simple power law, self-similar, constant log-normal scatter. Best fit for all the data:

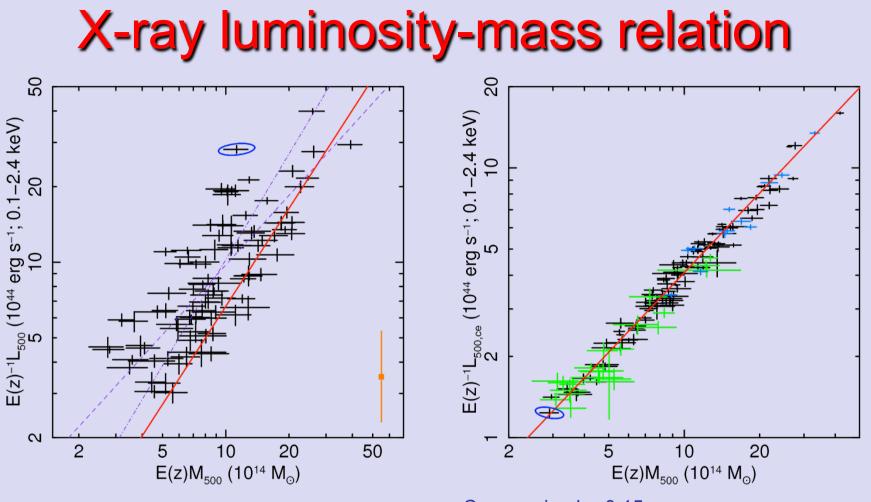
norm.  $\beta_0^{tm} = 0.89 \pm 0.03$ slope  $\beta_1^{tm} = 0.49 \pm 0.04$ scatter  $\sigma_{tm} = 0.055 \pm 0.008$  (~15%)

Slope shallower than the simple virial prediction:  $\beta_1^{tm} = 0.67$ 

#### Consistent with excess heating

Energy injection heats (e.g. AGN) the gas raising the temperature, decreasing the density and therefore the luminosity, being more important for less massive systems.

October 10, 2012



Core-included: scatter ~40%

Data consistent with self-similar evolution suggesting that excess heating occurred at z>0.5

Core-excised r<0.15r<sub>500</sub>. Scatter undetected <5%.

 $\beta_1^{lm} = 1.30 \pm 0.05$  Consistent with the virial th.

Excess heating limited to the centers / effective mass-limited cluster sample could be possible

October 10, 2012

### Sampling model: follow-up observations

$$M(r_{500}) = \frac{M_{\text{gas}}(r_{500})}{f_{\text{gas}}(r_{500})} = \frac{4\pi}{3}(500)\rho_{\text{cr}}(z)r_{500}^3$$

Masses, luminosities and temperatures measured at r<sub>500</sub>

$$M_{\rm gas}(r) \propto \rho_{\rm cr}(z) r^3 f_{\rm gas}(r) \propto r^{\eta_g}$$

 $\eta_{g} = 1.092 \pm 0.006$   $r_{500} \propto \left[ f_{gas}(r_{500}) H^{2}(z) \right]^{1/(\eta_{g}-3)}$   $n_{g} \text{ logarithmic slope of the gas mass profiles at large radius; fit to the entire sample from 0.7-1.3r_{500}$   $\frac{M^{\text{ref}}(r)}{M(r)} = \frac{M_{\text{gas}}^{\text{ref}}(r) / f_{\text{gas}}^{\text{ref}}(r)}{M_{\text{gas}}(r) / f_{\text{gas}}(r)} R_{\text{NFW}} = \frac{d_{A}^{\text{ref}}(z)^{2.5} f_{\text{gas}}}{d_{A}(z)^{2.5} f_{\text{gas}}^{\text{ref}}} R_{\text{NFW}}$ We assume that the NFW profile is a good approximation here  $L_{500}(r) \propto d_{\text{L}}^{2}(z) \left(\frac{r_{500}}{d_{A}(z)}\right)^{\eta_{\text{L}}}$   $n_{\text{L}}=0.1135+-0.0005$ 

October 11, 2012

### **Theory: linear and non-linear**

$$n(M, z) = \int_0^M f(\sigma) \frac{\bar{\rho}_{\rm m}}{M'} \frac{\mathrm{d} \ln \sigma^{-1}}{\mathrm{d} M'} \,\mathrm{d} M'$$

Number density of galaxy clusters

$$\sigma^{2}(M, z) = \frac{1}{2\pi^{2}} \int_{0}^{\infty} k^{2} P(k, z) |W_{\rm M}(k)|^{2} dk$$

Variance of the density fluctuations

 $P(k, z) \propto k^{n_{\rm s}} T^2(k, z_{\rm t}) D(z)^2$ 

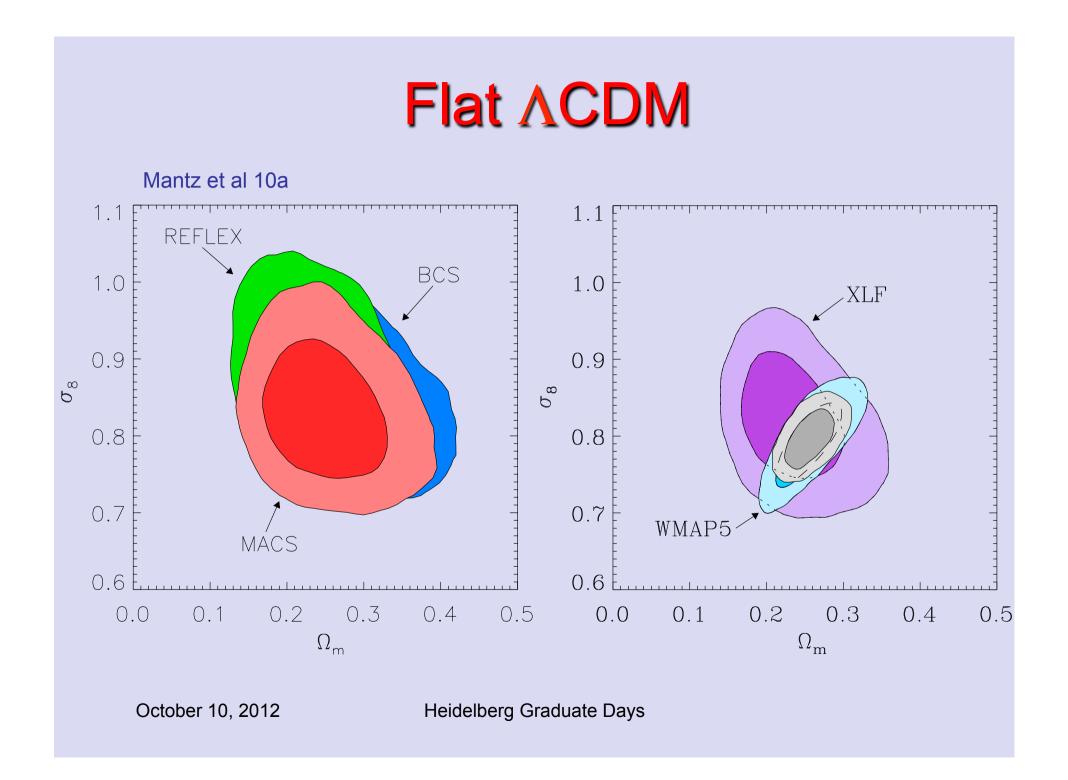
Linear power spectrum

$$f(\sigma, z) = A\left[\left(\frac{\sigma}{b}\right)^{-a} + 1\right] e^{-c/\sigma^2}$$

Fitting formula from N-body simulations (Tinker et al 08)

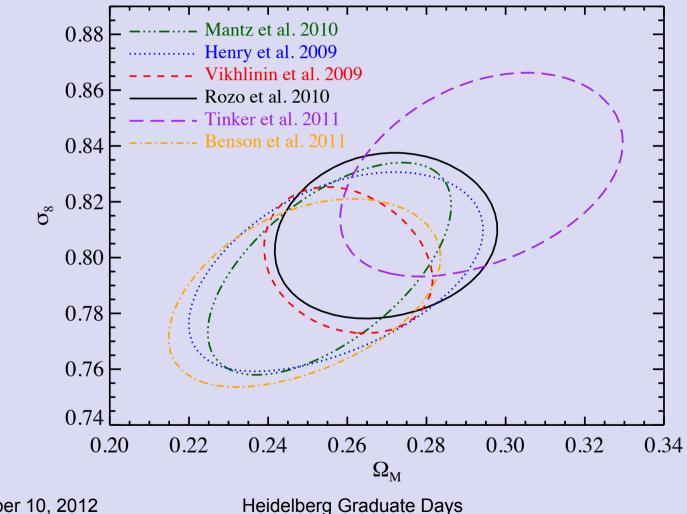
$$x(z) = x_0(1+z)^{\varepsilon \alpha_x} \ x \in \{A, a, b, c\}$$

October 11, 2012



#### Agreement between cluster experiments

From Weinberg et al 12



October 10, 2012

### Constraints on dark energy

October 10, 2012

# All data sets

1. Abundance of massive clusters (X-ray Luminosity Function, XLF) to measure cosmic expansion and growth of matter fluctuations with respect to the mean density.

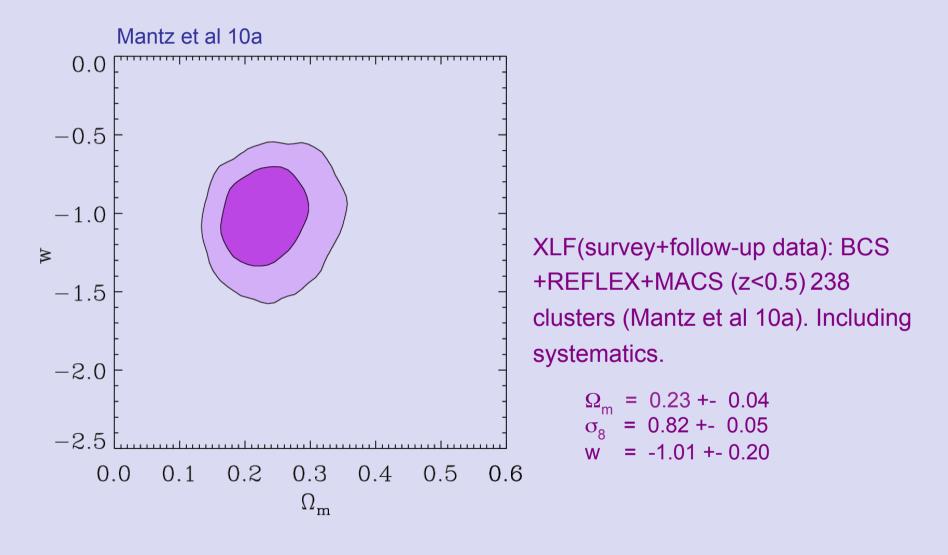
$$D(z) \equiv \frac{\delta(z)}{\delta(z_{\rm t})} = \frac{\sigma(M, z)}{\sigma(M, z_{\rm t})} \qquad \delta = (\rho_{\rm m} - \bar{\rho}_{\rm m})/\bar{\rho}_{\rm m}$$

2. SNIa, fgas, XLF, CMB, BAO to measure the cosmic expansion of the background density. We use three expansion histories well fitted by these data sets.

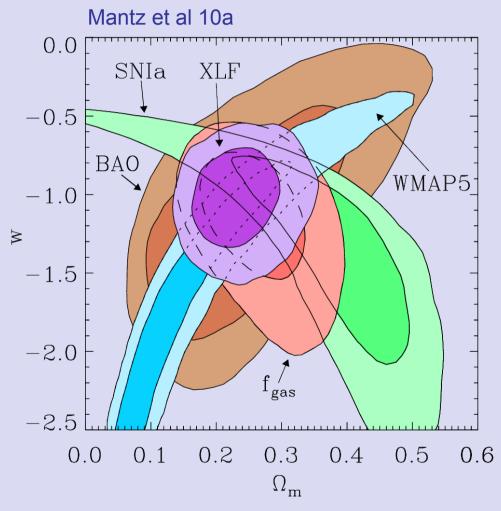
$$E(a) = \begin{bmatrix} \Omega_{\rm m} a^{-3} + \Omega_{\rm de} a^{-3(1+w)} + \Omega_{\rm k} a^{-2} \end{bmatrix}^{1/2}$$
  
i) flat  $\Lambda$ CDM w=-1,  $\Omega_{\rm k}$ =0  
ii) flat wCDM w constant,  $\Omega_{\rm k}$ =0

iii) non-flat  $\Lambda$ CDM w=-1,  $\Omega_k$  constant

October 10, 2012



October 10, 2012

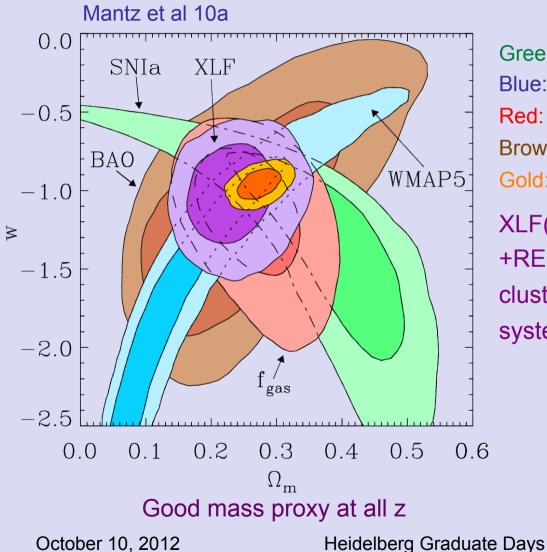


Green: SNIa (Kowalski et al 08, Union) Blue: CMB (WMAP5) Red: cluster f<sub>gas</sub> (Allen et al 08) Brown: BAO (Percival et al 07)

XLF(survey+follow-up data): BCS +REFLEX+MACS (z<0.5) 238 clusters (Mantz et al 10a). Including systematics

> $\Omega_{\rm m} = 0.23 + 0.04$   $\sigma_8 = 0.82 + 0.05$ w = -1.01 + 0.20

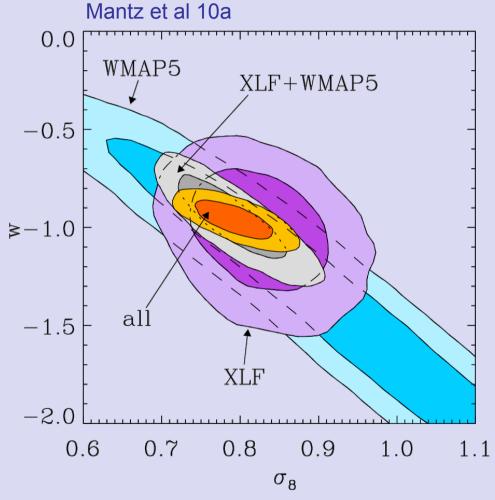
October 10, 2012



Green: SNIa (Kowalski et al 08, Union) Blue: CMB (WMAP5) Red: cluster f<sub>gas</sub> (Allen et al 08) Brown: BAO (Percival et al 07) Gold: XLF+f<sub>gas</sub>+WMAP5+SNIa+BAO

XLF(survey+follow-up data): BCS +REFLEX+MACS (z<0.5) 238 clusters (Mantz et al 10a). Including systematics

> $\Omega_{\rm m} = 0.23 + 0.04$   $\sigma_8 = 0.82 + 0.05$ w = -1.01 + 0.20



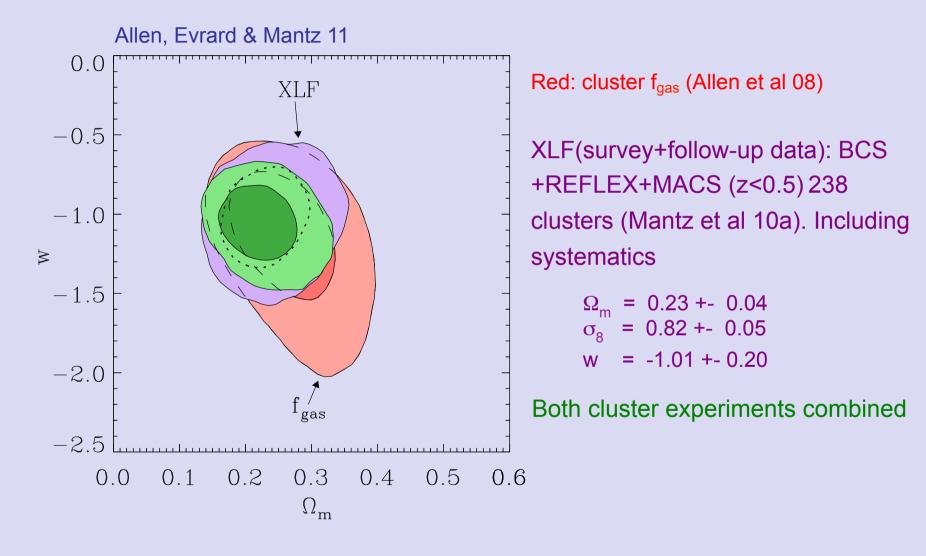
Grey: XLF+WMAP5 Blue: CMB (WMAP5) Gold: XLF+f<sub>gas</sub>+WMAP5+SNIa+BAO

 $\Omega_{\rm m} = 0.272 + 0.016$   $\sigma_8 = 0.79 + 0.03$ W = -0.96 + 0.06

XLF(survey+follow-up data): BCS +REFLEX+MACS (z<0.5) 238 clusters (Mantz et al 10a). Including systematics

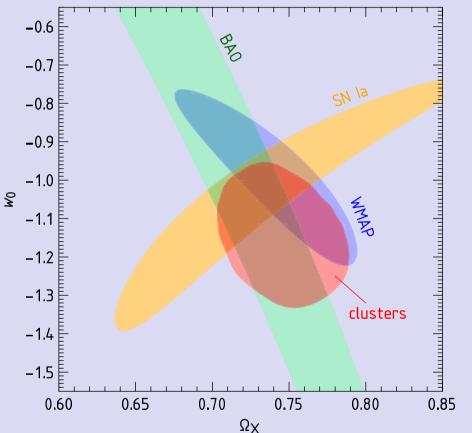
> $\Omega_{\rm m} = 0.23 + 0.04$   $\sigma_8 = 0.82 + 0.05$ W = -1.01 + 0.20

October 10, 2012



October 10, 2012

Vikhlinin et al 10



Green: BAO Blue: CMB (WMAP) Red: Clusters Gold: SNIa

$$\Omega_{\rm m} = 0.26 + 0.08$$
  
 $\sigma_8 = 0.81 + 0.04$   
w = -1.14 + 0.21

October 10, 2012

## Beyond ACDM: Neutrino properties

October 10, 2012

### **Neutrinos and Cosmology**

- Neutrino flavor oscillation experiments (solar, atmospheric, reactors) have conclusively shown that the neutrino mass eigenstates are non-degenerate (e.g. Fukuda et al 98, Ahn et al 03, 06, Sanchez et al 03, Aharmim et al 05, Beringer et al 12, etc.). However, measuring the absolute mass scale is still challenging.
- Three 'normal' neutrino species: v<sub>e</sub>, v<sub>µ</sub>, v<sub>T</sub>. There are though some hints for possible additional, sterile neutrinos from oscillation data (Kopp et al 11, Huber 11, etc.). Recently, CMB observations also seem to favor the presence of additional radiation at the time of decoupling over that from photons and the three 'normal' neutrino species.
- Current constraints from the laboratory experiments: lower bound on M<sub>v</sub>=Σ<sub>i</sub>m<sub>i</sub> (sum of the masses of the different species) of ~0.056 (0.095)eV/c<sup>2</sup> for the normal (inverted) hierarchy; and an upper bound of ~6eV/c<sup>2</sup> (from hereon c=1). The Heidelberg-Moscow experiment has limited the mass of the electron neutrino to <0.35eV (Klapdor-Kleingrothaus & Krivosheina 06).</li>

### **Neutrinos and Cosmology**

- Neutrinos play an important role in the early universe and therefore affect cosmological observations (review: Lesgourges & Pastor 06).
- The primary cosmological effect of the non-zero neutrino mass is to suppress the formation of cosmic structure on intermediate and small scales. CMB contains information on LSS at early times. The combination with probes today give good constraints on the absolute neutrino mass scale.
- Interference with dark energy and inflation physics. Combining experiments helps.
- Combined cosmological observations:  $\Sigma_i m_i < \sim 0.3 0.6 eV$ .
- Neutrino oscillation experiments favor a large mass for sterile neutrinos yielding a lower limit on their mass of 1eV which is incompatible with cosmological observations. This can be alleviated with for example initial lepton asymmetry (Hannestad et al 12).

## Robust constraints on neutrino properties

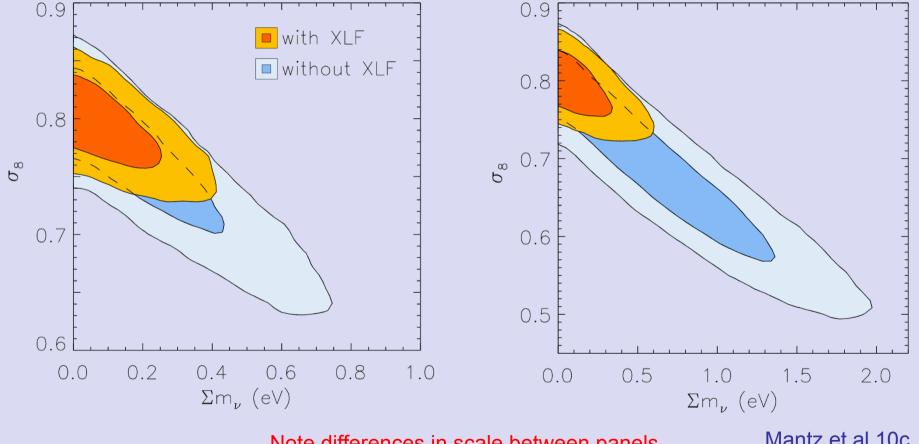
Even more useful when allowing N<sub>eff</sub>,

 $\Sigma m_v < 0.7 eV (95.4\%) N_{eff} = 3.7 + -0.7 (68.3\%)$ 

 $\Omega_k$ , r, n<sub>t</sub> (tensors) to be free

 $\Lambda CDM + \Sigma m_{v}$ : Breaking the degeneracy in the  $\Sigma m_{\nu}$ ,  $\sigma_8$  plane

Σm<sub>v</sub><0.33eV (95.4%)



Note differences in scale between panels

Mantz et al 10c

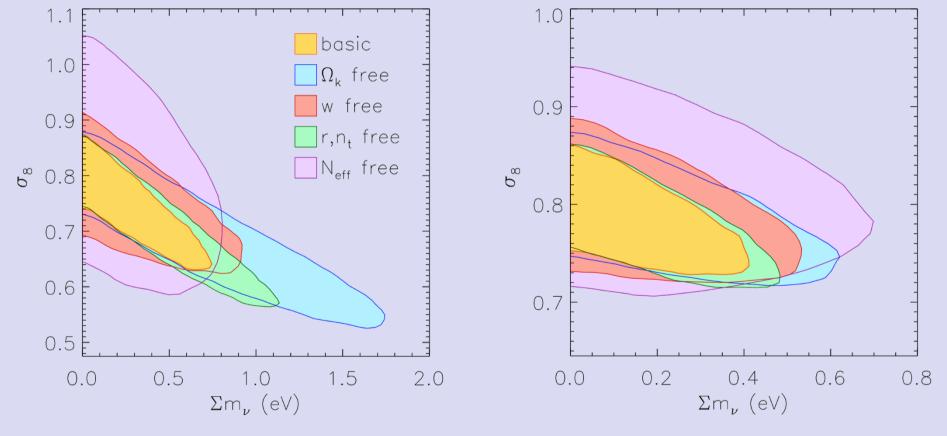
October 10, 2012

## Robust constraints on neutrino properties

Basic:  $\Lambda CDM + \Sigma m_v$ 

CMB+fgas+SNIa+BAO

#### CMB+fgas+SNIa+BAO+XLF



Mantz et al 10c

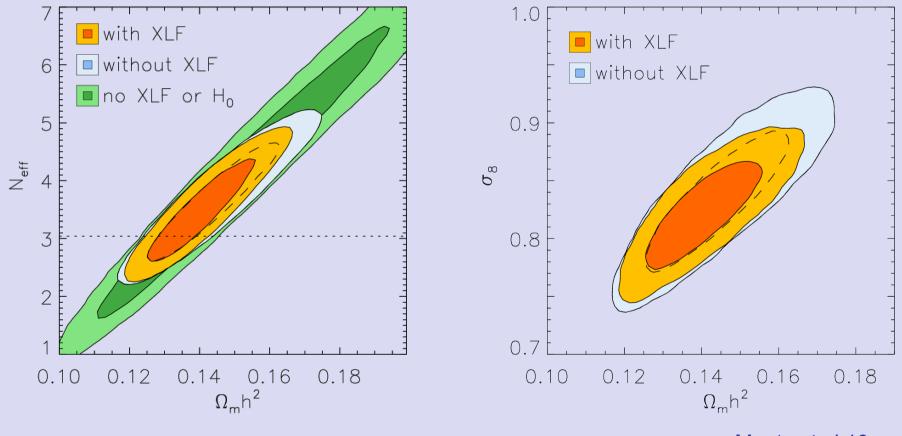
October 10, 2012

## Robust constraints on neutrino properties

CMB+fgas+SNIa+BAO

 $\Lambda \text{CDM+N}_{\text{eff}}$ 

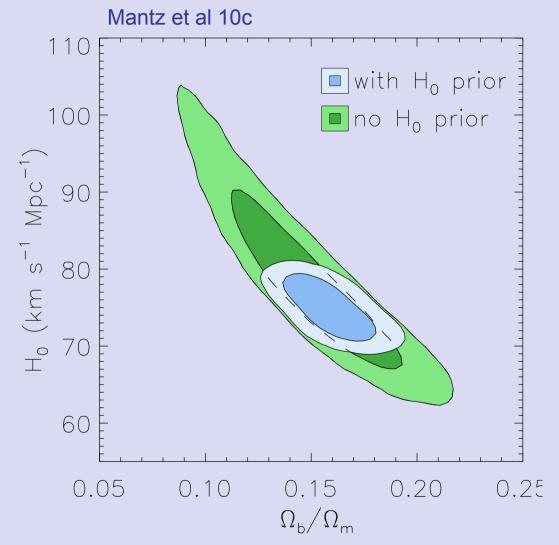
 $\Lambda CDM + N_{eff} + M_v + \Omega_k + r + n_t$ 



Mantz et al 10c

October 10, 2012

## Breaking degeneracies with other data sets



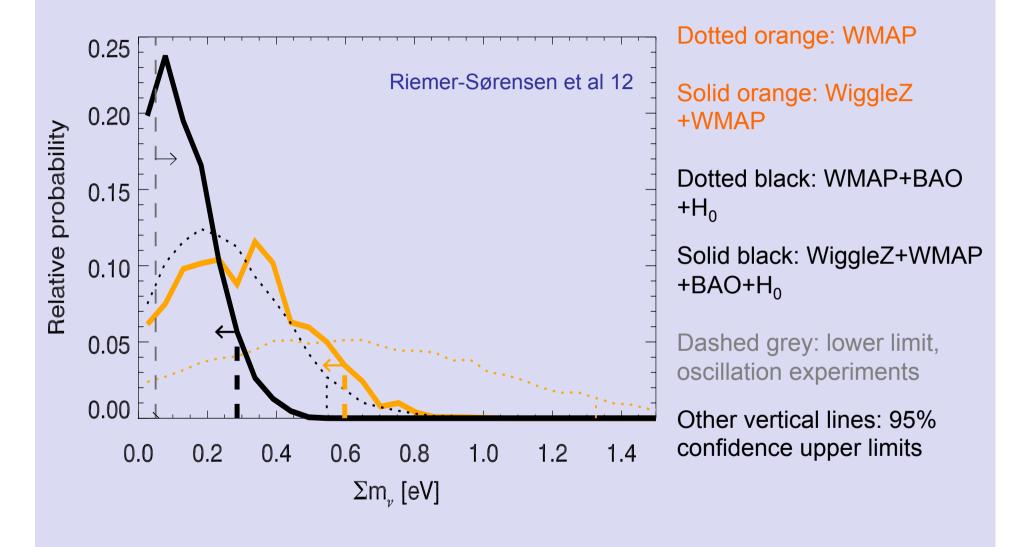
 $N_{\text{eff}} \, \text{is free}$ 

Green contours: CMB+fgas +SNIa+BAO (strong degeneracy).

Blue contours: adding  $H_0$  at the 5% level helps significantly with this degeneracy.

October 10, 2012

## Other cosmological constraints on neutrinos



October 10, 2012

## Summary

• For the first time, we present a simultaneous and self-consistent analysis of cluster survey plus follow-up data accounting for survey biases, systematic uncertainties and parameter covariances. This kind of analysis is essential for both cosmological and scaling relation studies.

• We obtain the tightest constraints on w for a single experiment from measurements of the growth of cosmic structure in clusters (flat wCDM): w = -1.01+-0.2.

•We use follow-up Chandra and ROSAT data for a wide redshift range of clusters and gas mass as total mass proxy (f<sub>gas</sub> has low scatter), which is crucial to obtain such tight constraints. We obtain not only important cosmological but also astrophysical results for clusters.

 Our results highlight the importance of X-ray cluster data to test dark energy and modified gravity models as well as neutrino properties.

The same techniques developed here can be applied to SZ and optical surveys.

•Future: more MACS and Chandra data, XCS, XXL, Astro-H, eROSITA, Athena, WFXT.

October 10, 2012

## Modern cosmology with X-ray luminous clusters of galaxies

Thursday Lecture: Cosmological Models and Modeling

### David Rapetti DARK Fellow

Dark Cosmology Centre, Niels Bohr Institute

Dark Cosmology Centre University of Copenhagen



October 11, 2012

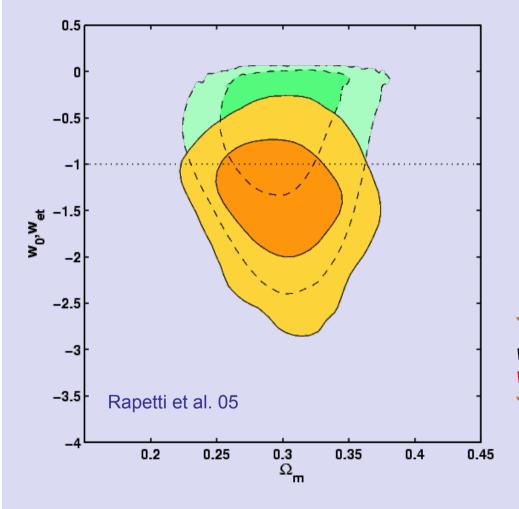
## Models and probes of cosmic acceleration

- Some recent dark energy reviews:
  - Copeland, Sami, Tsujikawa, 06, Int. J. Mod Phys D
  - Frieman, Turner, Huterer, 08, Ann. Rev. Astr. & Astrophys., 46, 385
  - Weinberg, Mortonson, Eisenstein, Hirata, Riess, Rozo, 12, for Phys. Reports, arXiv:1201.2434
- Dark energy task forces and future dark energy missions:
  - Albrecht, Bernstein, Cahn, Freedman, Hewitt, Hu, Huth, Kamionkowski, Kolb, Knox, Mather, Staggs, Suntzeff, 06, arXiv/0609591
  - Albrecht, Amendola, Bernstein, Clowe, Eisenstein, Guzzo, Hirata, Huterer, Kirshner, Kolb, Nichol, 09, arXiv:0901.0721
  - Amendola, et al (Euclid Satellite), 12, arXiv:1206.1225

## Beyond $\Lambda$ CDM: Evolving dark energy w(z)

October 11, 2012

## Constraints on w<sub>0</sub>, w<sub>et</sub> marginalizing over z<sub>t</sub>



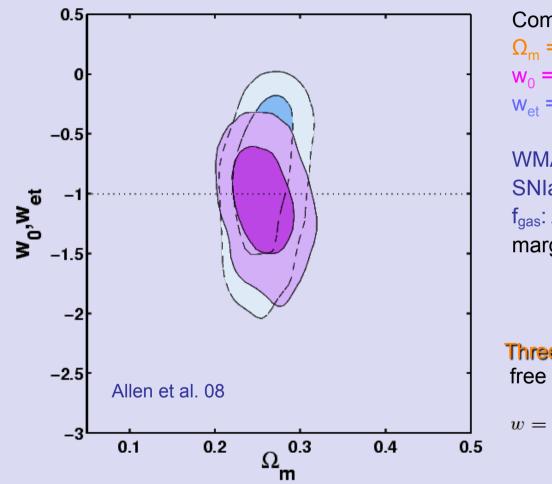
Combined constraints (marginalized 68%)  $\Omega_m = 0.299 + 0.029 - 0.027$   $w_0 = -1.27 + 0.33 - 0.39$  $w_{et} = -0.66 + 0.44 - 0.62$ 

WMAP1+CBI+ACBAR SNIa: Riess et al 04 f<sub>gas</sub>: Allen et al 04 marginalized over 0.05<z<sub>t</sub><1

#### **Two parameters:** $w=w_0+w_1(1-a)$ fix transition at $z_t=1$ between $w_0$ (present) and $w_{et} = w_0+w_1$ (early times). **Three parameters:** free transition $z_t$ between $w_0$ and $w_{et}$ : $w = \frac{w_{et}z + w_0z_t}{z + z_t} = \frac{w_{et}(1-a)a_t + w_0(1-a_t)a}{a(1-2a_t) + a_t}$ Rapetti et al. 05

October 11, 2012

## Constraints on w<sub>0</sub>, w<sub>et</sub> marginalizing over z<sub>t</sub>



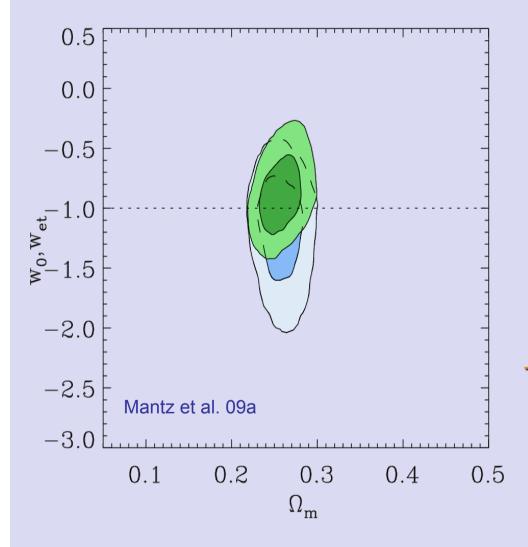
Combined constraints (marginalized 68%)  $\Omega_m = 0.254 \pm 0.022$   $w_0 = -1.05 + 0.31 - 0.26$  $w_{et} = -0.83 + 0.48 - 0.43$ 

WMAP3+CBI+Boomerang+ACBAR SNIa: Davis et al. 07  $f_{gas}$ : Allen et al. 08 marginalized over 0.05<z<sub>t</sub><1

Three parameters: free transition  $z_t$  between  $w_0$  and  $w_{et}$ :  $w = \frac{w_{et}z + w_0 z_t}{z + z_t} = \frac{w_{et}(1 - a)a_t + w_0(1 - a_t)a}{a(1 - 2a_t) + a_t}$ Rapetti et al. 05

October 11, 2012

## Current constraints: evolving w



Combined constraints (marginalized 68%)  $\Omega_m = 0.257 + 0.016$   $w_0 = -0.88 + -0.21$  $w_{et} = -1.05 + 0.20 - 0.36$ 

WMAP5 SNIa: Kowalski et al. 08 f<sub>gas</sub>: Allen et al. 08 BAO: Percival et al. 07 XLF: Mantz et al. 09a marginalized over 0.05<z<sub>t</sub><1

Three parameters: free transition  $z_t$  between  $w_0$  and  $w_{et}$ :  $w = \frac{w_{et}z + w_0 z_t}{z + z_t} = \frac{w_{et}(1 - a)a_t + w_0(1 - a_t)a}{a(1 - 2a_t) + a_t}$ Rapetti et al. 05

October 11, 2012

#### "A kinematical approach to dark energy studies" MNRAS 375 (2007) 1510-1520,

#### David Rapetti, Steve Allen, Mustafa Amin, Roger Blandford

October 11, 2012

## Why kinematical approaches?

- Do not assume any particular gravity theory.
  - Most of current cosmological analyses are dynamical, use the Friedmann equations (and General Relativity) employing  $\Omega_m$  and w as model parameters.
  - Other dynamical approaches use modified gravity theories.
- Describe directly the expansion history of the Universe, a(t).
  - We measure a late-time cosmic acceleration.
  - It is important now to measure kinematically a transiton to a decelerating phase at earlier times.

# Using distance measurement to constrain cosmic acceleration

To SNe Ia z<1.7 (Riess et al. 2004), z<1 (Astier et al. 2005)

The apparent magnitude with redshift:

$$d_{L}^{th}(z) = 5\log_{10} D(z;\theta) + \mu_{0}$$
  $d_{L}(z;\theta) = \frac{c(1+z)}{H_{0}} \int_{0}^{z} \frac{dz}{E(z;\theta)}$ 

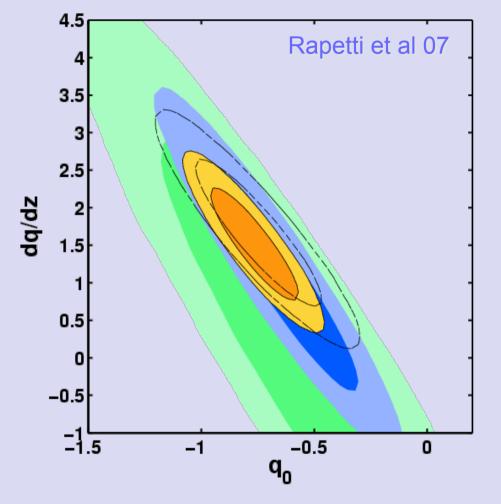
To 41 X-ray clusters 0.06<z<1.07 (Allen et al. 2008)

The apparent evolution of  $f_{gas}=M_{gas}/M_{tot}$  with redshift:

$$f_{gas}^{ref}(z) = F \left[ \frac{d_A^{ref}(z)}{D_A^{\text{mod}}(z;\theta)} \right]^{1.5} \qquad F = \frac{b\Omega_b H_0^{1.5}}{\Omega_m (1+0.19\sqrt{h})}$$

October 11, 2012

# Constraints on the deceleration parameter using the three data sets



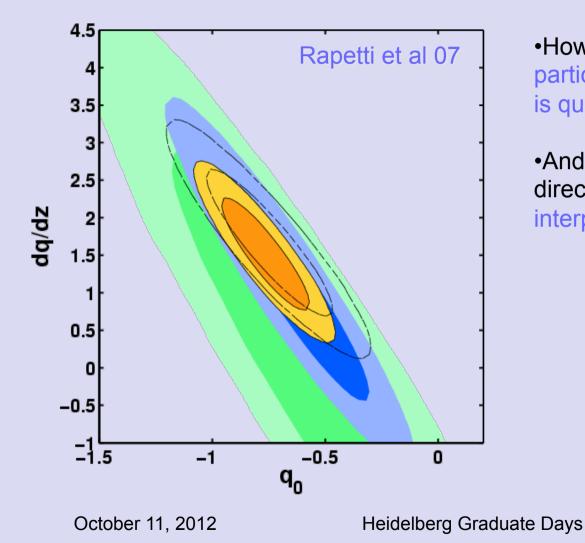
• Using  $q(z)=q_0+z(dq/dz)$  as Riess et al 04 we note that the three independent data sets overlap and combined give tight constraints.

 Clusters (green contours); SNLS SNIa (blue contours); Gold SNIa sample (dashed contours); all combined (orange contours)

•Shapiro & Turner 05 and Elgaroy & Multamaki 06 also used other q(z) parameterizations.

October 11, 2012

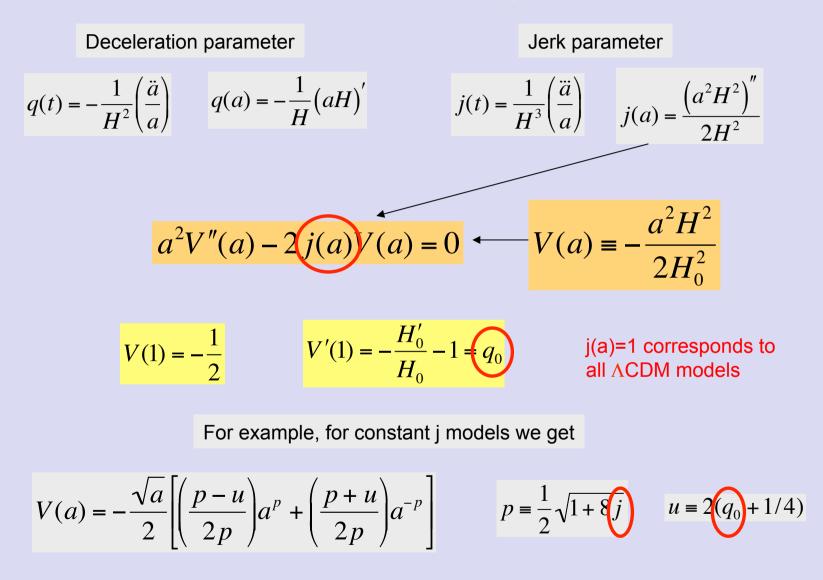
# Constraints on the deceleration parameter using the three data sets



•However, the choice of a particular parameterization of q(z) is quite arbitrary.

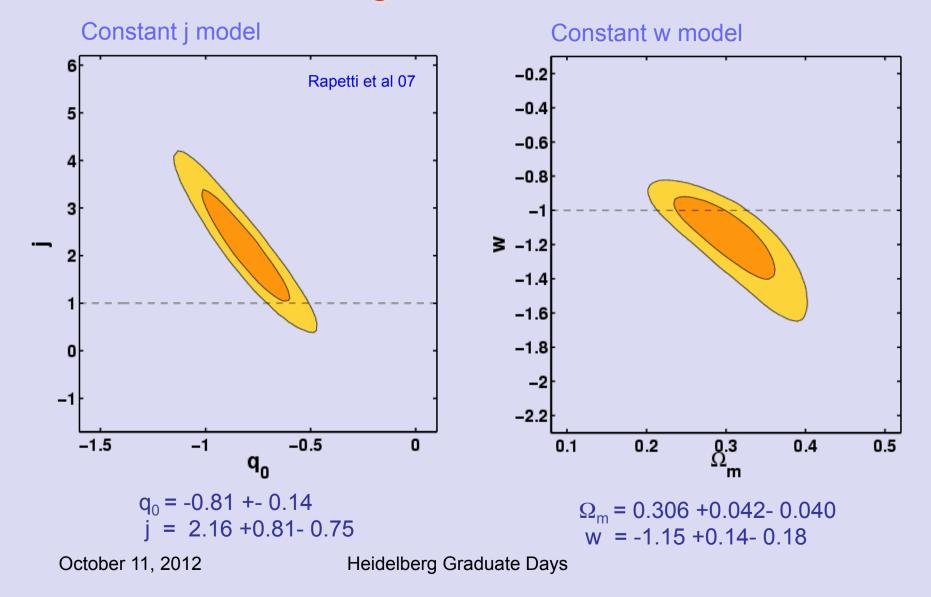
•And in general does not have a direct meaningful physical interpretation.

### Our kinematical formalism: (q<sub>0</sub>,j) parameter space

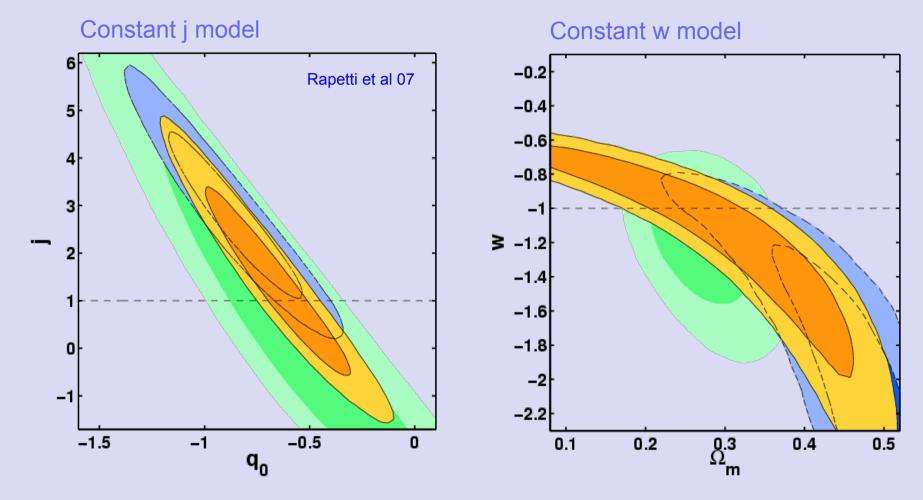


October 11, 2012

# Basic kinematical and dynamical models combining all three data sets



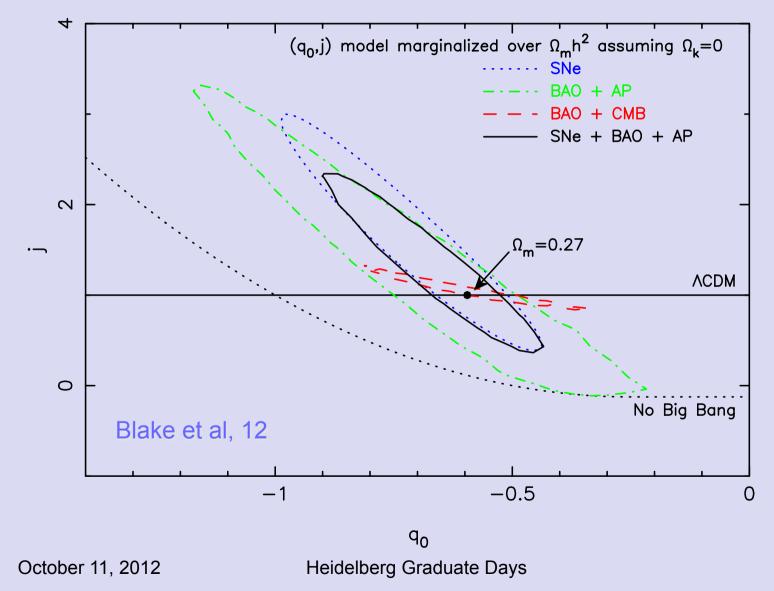
### Basic kinematical and dynamical models for each data set



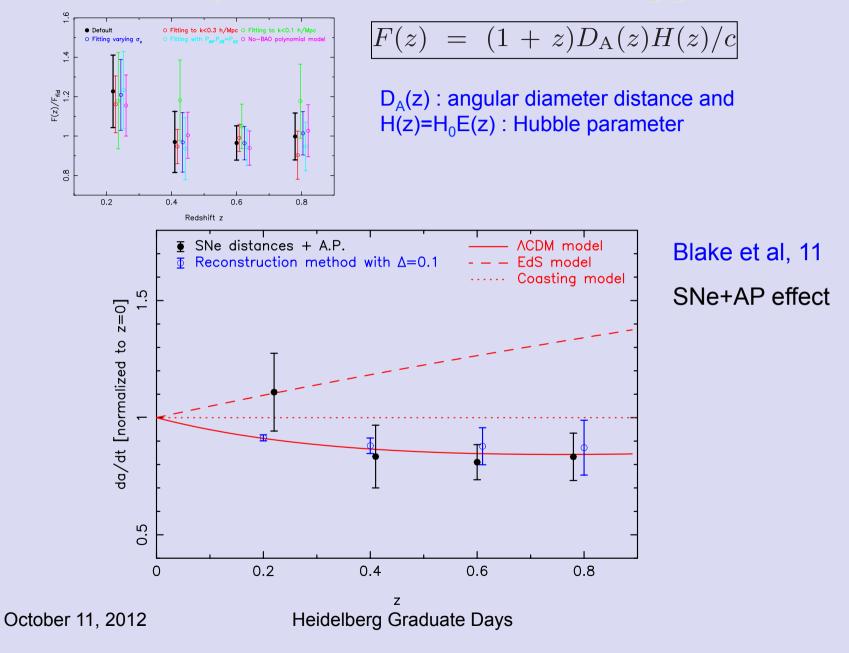
Gold, blue : SNLS, orange : Clusters, green

October 11, 2012

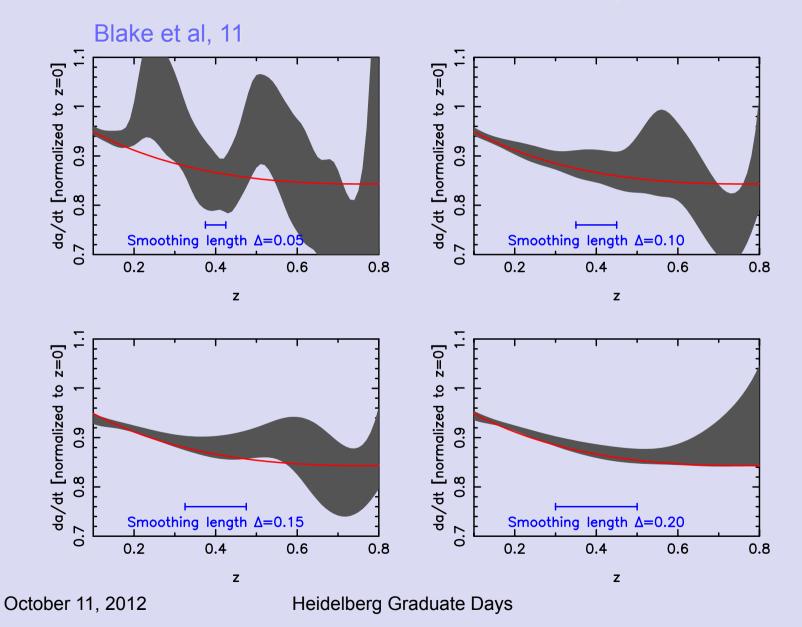
## Recent results on the kinematical model for various combinations of data sets



### Alcock-Paczynski test data from WiggleZ data

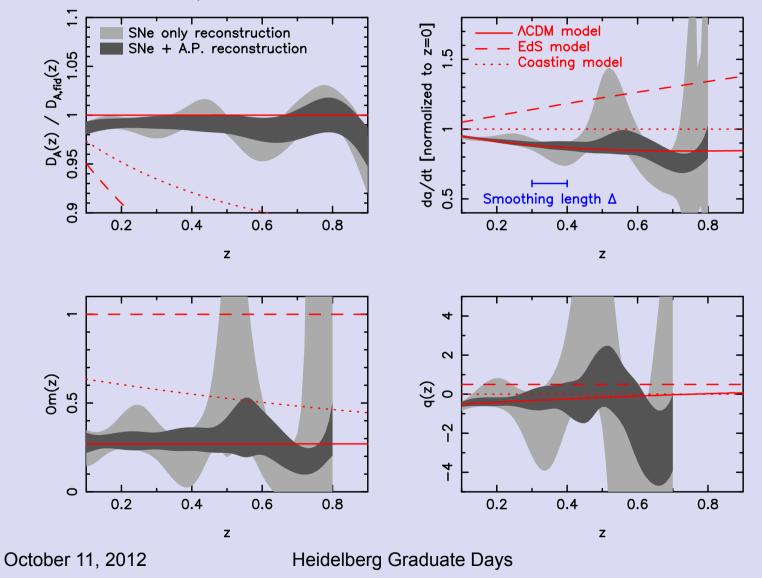


### **Reconstruction of kinematical quantities**



#### Non-parametric reconstruction of the cosmic expansion history

#### Blake et al, 11



In an analogous manner to dynamical studies which allow w(a) we search for evolution in j(a) as a model parameter.

$$j(a;C) = j^{\Lambda CDM} + \Delta j(a;C) \qquad j^{\Lambda CDM} = 1$$

General scheme: Expanding ∆j in Chebyshev polynomials

$$\Delta j(a;C) \approx \sum_{n=0}^{N} c_n T_n(a_c)$$

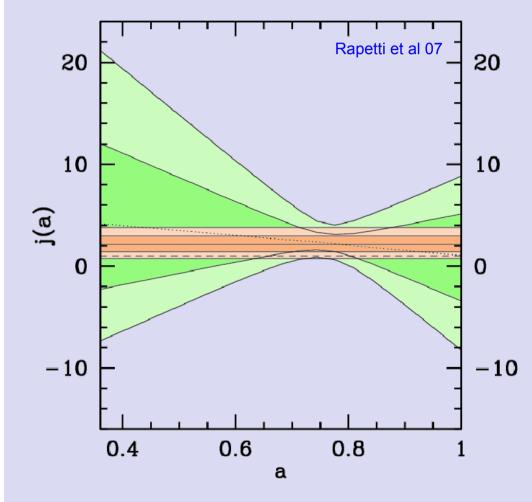
$$[a_{\min} = 0.36, a_{\max} = 1]$$

$$a_{c} = \frac{a - (1/2)(a_{\min} + a_{\max})}{(1/2)(a_{\max} - a_{\min})} \qquad T_{n+1}(a_{c}) = 2a_{c}T_{n}(a_{c}) - T_{n-1}(a_{c})$$
$$C = (c_{0}, c_{1}, c_{2}, \dots, c_{N})$$

For example  $T_0(a_c) = 1$ ,  $T_1(a_c) = a_c$ ,  $T_2(a_c) = 2a_c^2 - 1$ , ...

October 11, 2012

### Constraints on an evolving jerk model



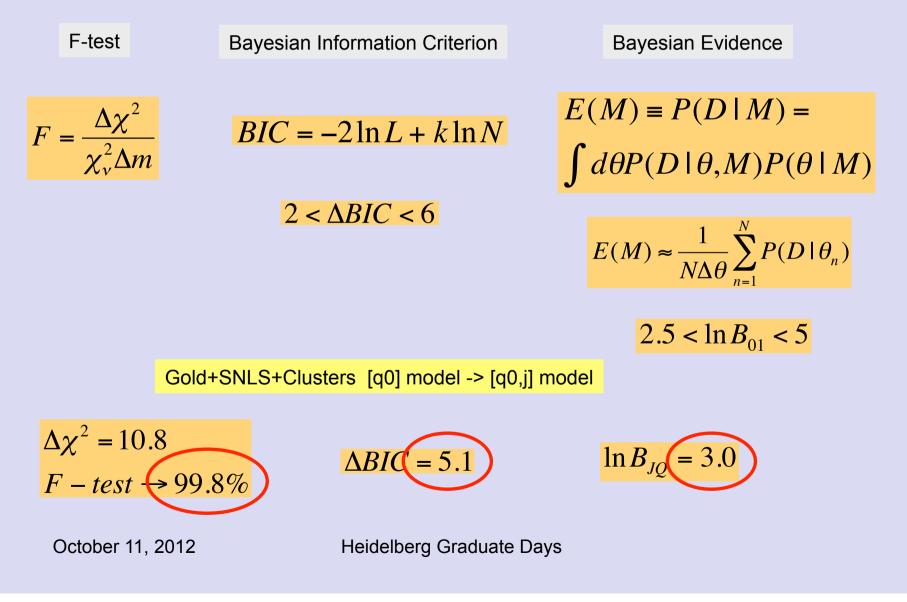
• 68.3 and 95.4 per cent confidence variations about the median values for j(a) over the range [0.36,1].

• Constant jerk model (red contours), [q<sub>0</sub>,j(a;c<sub>0</sub>,c<sub>1</sub>)] model (green contours). The evolving model is not required for current data.

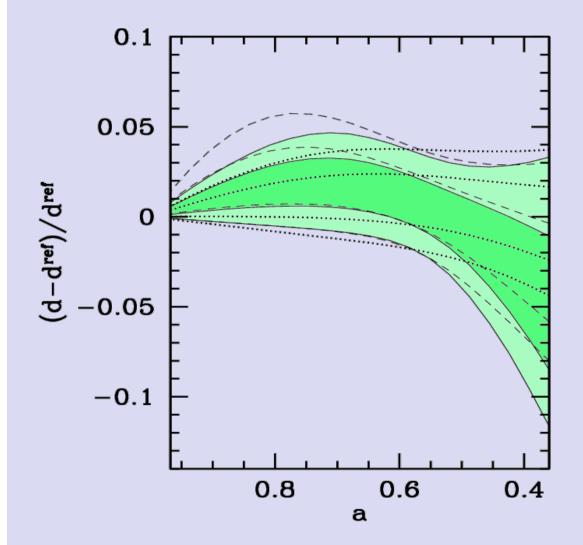
Dashed line, j(a)=1, i.e.
 cosmological constant.

October 11, 2012

# Hypothesis testing: How many model kinematical parameters are required?



### Constraints on the distances



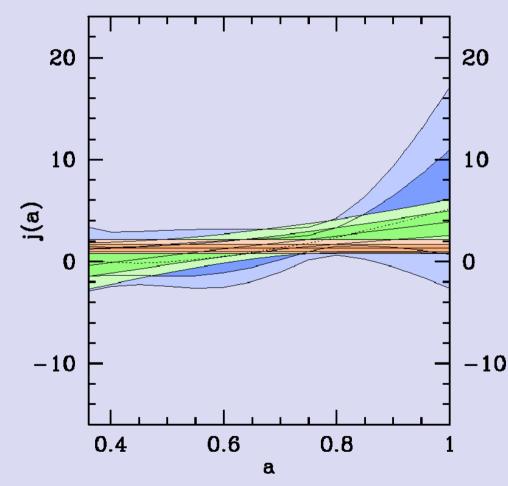
• The 68.3 and 95.4 % confidence limits on the offset in distance as a function of a(t) relative to a reference  $\Lambda$ CDM.

• Kinematical, constant j model (green contours);

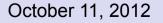
• Dynamical, constant w model (dotted lines); and relaxing the priors (dashed lines)

October 11, 2012

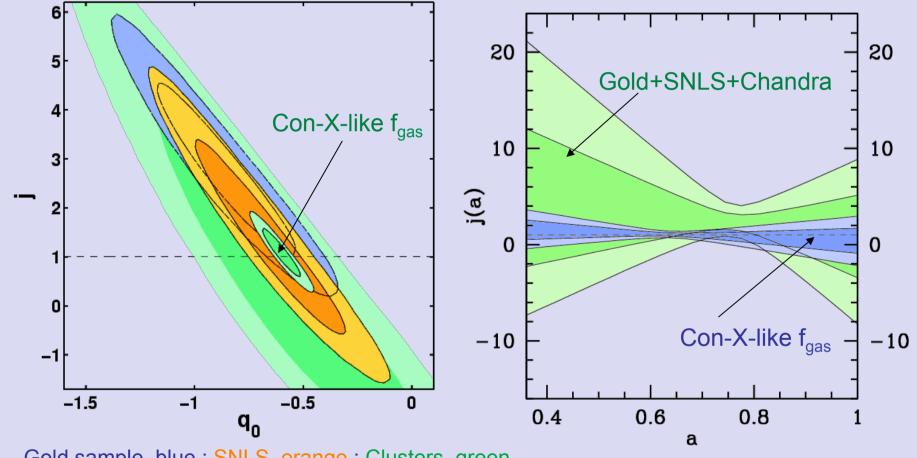
### Using the distance to the last scattering surface



- We use a pseudo-distance measurement to the last scattering surface,  $d_A = r_s(a_{dec})/\theta_A$ , for illustration purposes.
- Extra strong, though wellmotivated, assumptions: dark matter behaves like standard cold dark matter at all redshifts; prerecombination physics are well described by the standard model; any early dark energy is negligible.
  - $r_s(z_{dec})=146+-10Mpc$ , comoving d ( $z_{dec}$ )=13.8+-1.1Gpc,  $z_{dec}=1088$ . Blue contours for [ $q_0$ ,j(a; $c_0$ , $c_1$ , $c_2$ )] model.



## Projected Con-X-like constraints on: Kinematics, constant and linear evolving j



Gold sample, blue : SNLS, orange : Clusters, green  $\sigma(q_0)=0.06 \quad \sigma(j)=0.33$ 

October 11, 2012

## **Kinematical model**

• We have developed a new, natural kinematical parameter space,  $(q_0,j)$  to study the expansion history of the Universe.

• We use two independent sets of distance measurements (SNIa and Clusters) making our results more robust against systematics in each individual data set.

• Both models contain a simple representation of  $\Lambda$ CDM (w=-1, j=1) and both are consistent with it at the 1 $\sigma$  level. This represents an additional support for the  $\Lambda$ CDM paradigm.

• The kinematical framework do not assume any particular gravity theory. The combination of both dynamical and kinematical frameworks may be helpful for distinguishing between dark energy and modified gravity models.

October 11, 2012

## Beyond ACDM: Gravity at large scales

"The Observed Growth of Massive Galaxy Clusters III: Testing General Relativity at Cosmological Scales",

MNRAS 406, 1796, 2010 David Rapetti, Steven Allen, Adam Mantz, Harald Ebeling (Chandra/NASA press release together with Schmidt, Vikhlinin & Hu 09, April 14 2010, "Einstein' s Theory Fights off Challengers")

October 11, 2012

## **Testing GR on cosmic scales**

- 1. From the evolution of the cluster abundance (XLF) we directly measure linear cosmic expansion and growth.
- 2. From a variety of measurements we find cosmic acceleration and face the cosmological constant problems.
- 3. We can either include a new energy component, dark energy, or modify the theory of gravity.
- 4. We test General Relativity (GR) for consistency.
- 5. GR has been very well tested from small to Solar system scales. Here we test modifications of GR at cosmological scales.

# Ingredients to test a given theory of gravity with cluster abundance data

- 1. Cosmic expansion model / mean matter density (theory).
- 2. Matter power spectrum / linear density perturbations (theory).
- Halo mass function / nonlinear structure formation (N-body simulations for f(R) or DGP: e.g. Schmidt et al 2009, Schmidt 2009a/ b, Chan & Scoccimarro 2009, Zhao, Li & Koyama 2011).
- 4. Relation between the observed mass (e.g. "dynamical") and the true mass (e.g. "lensing") (Theory/N-body simulations: Schmidt 2010a).

# Consistency test of the growth rate of General Relativity

- 1. We use a phenomenological time-dependent parameterization of the growth rate and of the expansion history.
- 2. We assume the same scale-dependence as GR.
- 3. We test only for linear effects (not for non-linear effects). We use the "universal" dark matter halo mass function (Tinker et al 2008). Note that the relevant scales for the cluster abundance experiment are at the low end of the linear regime.
- 4. We match GR at early times and small scales.

### Modeling linear, time-dependent departures from GR

$$n(M,z) = \int_0^M f(\sigma) \,\frac{\bar{\rho}_{\rm m}}{M'} \,\frac{d\ln\sigma^{-1}}{dM'} \,dM$$

Number density of galaxy clusters

 $\sigma^{2}(M,z) = \frac{1}{2\pi^{2}} \int_{0}^{\infty} k^{2} P(k,z) |W_{M}(k)|^{2} dk$ 

Variance of the density fluctuations

$$P(k,z) \propto k^{n_{
m s}} T^2(k,z_{
m t}) D(z)^2$$
 Linear power spectrun

**General Relativity** 

Phenomenological parameterization

$$\ddot{\delta} + 2\frac{\dot{a}}{a}\dot{\delta} = 4G\pi\rho_{\rm m}\bar{\delta}$$

$$rac{d\delta}{da} = rac{\delta}{a} \Omega_{
m m}(a)^{\gamma}$$
 Gr y~0.55

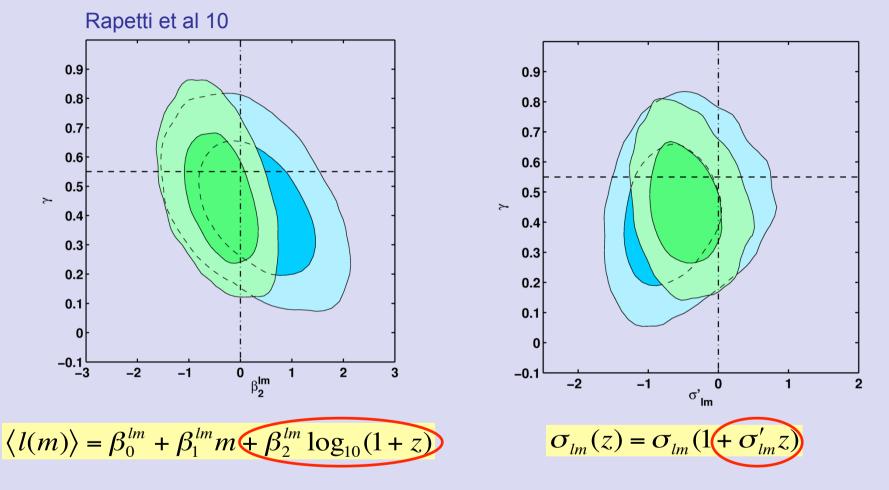
Scale independent in the synchronous gauge

$$f(a)\equiv d\ln\delta/d\ln a=\Omega_{
m m}(a)^{\gamma}\,\,$$
 Growth rate

Heidelberg Graduate Days

October 11, 2012

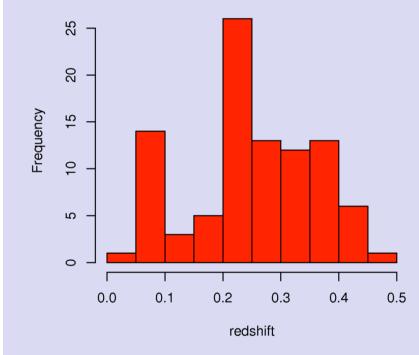
### Test of GR robust w.r.t evolution in the I-m relation



Current data do not require (i.e. acceptable fit) additional evolution beyond selfsimilar and constant scatter nor asymmetric scatter (Mantz et al 2010b).

October 11, 2012

### Investigating luminosity-mass evolution



Within the 238 flux-selected clusters we used pointed observations for

23 clusters (z<0.2) from ROSAT 71 clusters (z>0.2) from Chandra

Mass-luminosity and its intrinsic scatter

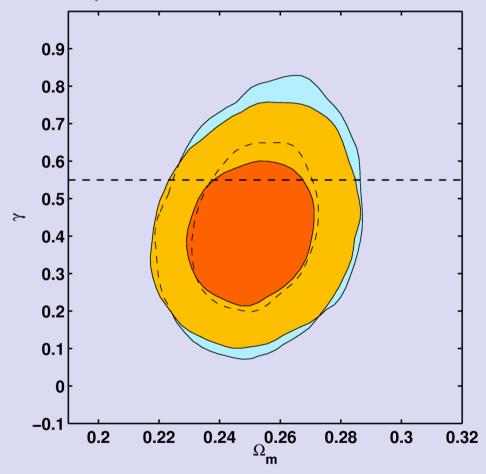
$$\langle l(m) \rangle = \beta_0^{lm} + \beta_1^{lm} m + \beta_2^{lm} \log_{10}(1+z)$$

$$\sigma_{lm}(z) = \sigma_{lm}(1 + \sigma'_{lm}z)$$

$$l = \log_{10} \left( \frac{L_{500}}{E(z) 10^{44} erg \, s^{-1}} \right); \quad m = \log_{10} \left( \frac{M_{500} E(z)}{10^{15} M_{solar}} \right)$$

October 11, 2012

Rapetti et al 10



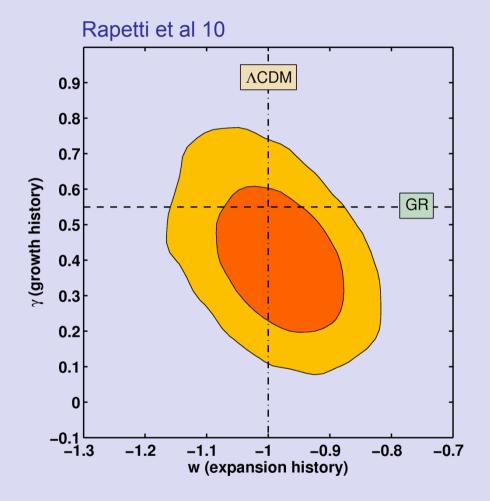
XLF: BCS+REFLEX+MACS (z<0.5) 238 survey with 94 X-ray follow-up CMB (WMAP5) SNIa (Kowalski et al 2008, UNION) cluster f<sub>gas</sub> (Allen et al 2008)

#### For General Relativity $\gamma \sim 0.55$

Gold: Self-similar evolution and constant scatter Blue: Marginalizing over  $\beta^{Im}_2$  and  $\sigma'_{Im}$  (only ~20 weaker: robust result on  $\gamma$ ).

Remarkably these constraints are only a factor of ~3 weaker than those forecasted for JDEM/ WFIRST-type experiments (e.g. Thomas et al 2008, Linder 2009).

October 11, 2012



XLF: BCS+REFLEX+MACS (z<0.5) 238 survey with 94 X-ray follow-up CMB (WMAP5) SNIa (Kowalski et al 2008, UNION) cluster f<sub>gas</sub> (Allen et al 2008)

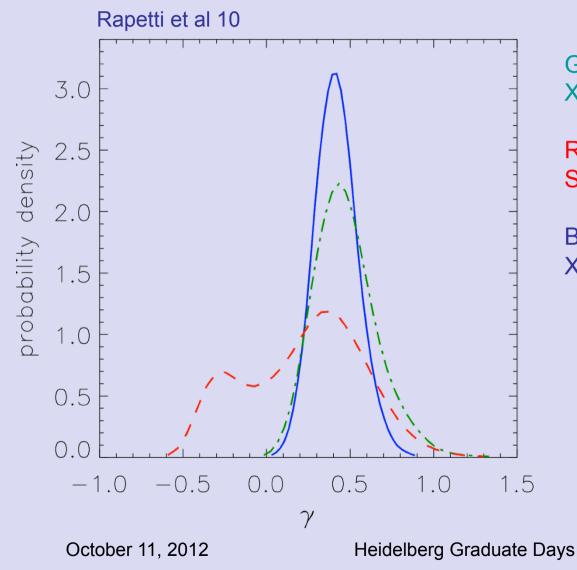
For General Relativity γ~0.55

Gold: Self-similar evolution and constant scatter

Simultaneous constraints on the expansion and growth histories of the Universe at late times: Consistent with  $GR+\Lambda CDM$ 

October 11, 2012

### The impacts of the different data sets

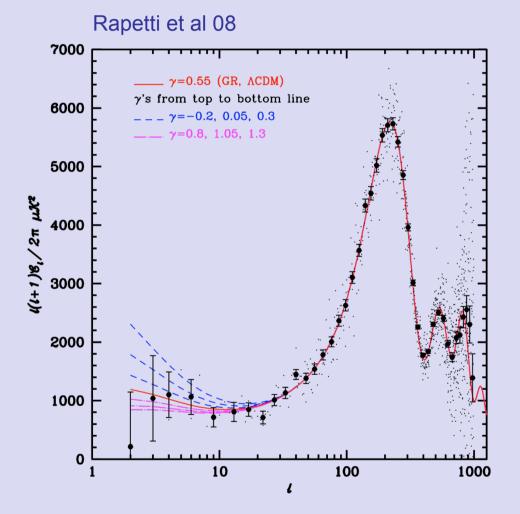


Green, dotted-dashed line: XLF alone

Red, dashed line: SNIa+fgas+BAO+CMB(ISW)

Blue, solid line: XLF+SNIa+fgas+BAO+CMB(ISW)

# Integrated Sachs-Wolfe effect



The ISW effect changes for different growth rates.

$$\Delta_l^{\rm ISW}(k) = 2 \int dt \, \mathrm{e}^{-\tau(t)} \phi' j_l \left[ k(t-t_0) \right]$$

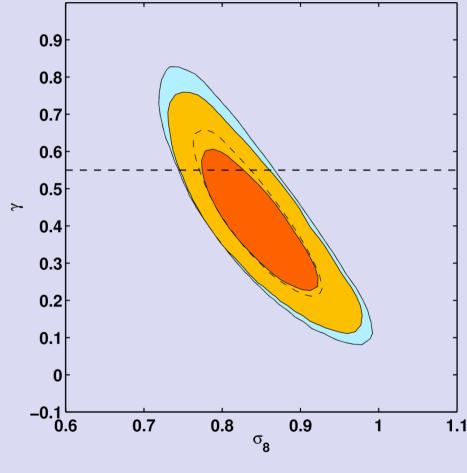
$$\phi' = -\frac{4\pi G}{k^2} \frac{\partial}{\partial t} \left(a^2 \,\delta \rho_{\rm m}\right)$$

$$\frac{d\delta}{da} = \frac{\delta}{a} \Omega_{\rm m}(a)^{\gamma}$$

We consistently use it, but it is not competitive with XLF in constraining  $\gamma$ 

October 11, 2012

Rapetti et al 10



#### XLF: BCS+REFLEX+MACS (z<0.5) 238 survey with 94 X-ray follow-up

CMB (WMAP5) SNIa (Kowalski et al 2008, UNION) cluster f<sub>gas</sub> (Allen et al 2008)

#### For General Relativity $\gamma \sim 0.55$

Gold: Self-similar evolution and constant scatter Blue: Marginalizing over  $\beta^{Im}_2$  and  $\sigma'_{Im}$ 

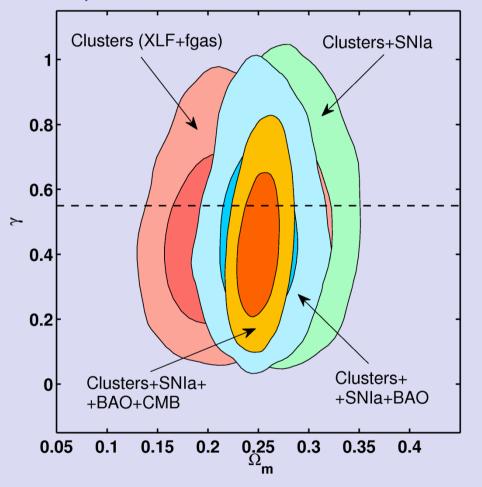
$$\gamma \left(\frac{\sigma_8}{0.8}\right)^{6.8} = 0.55^{+0.13}_{-0.10}$$

Tight correlation between  $σ_8$  and γ:  $\rho = -0.87$ 

October 11, 2012

### The impacts of the different data sets

Rapetti et al 10



Red: clusters (XLF+fgas)

Green: clusters+SNIa

Blue: clusters+SNIa+BAO

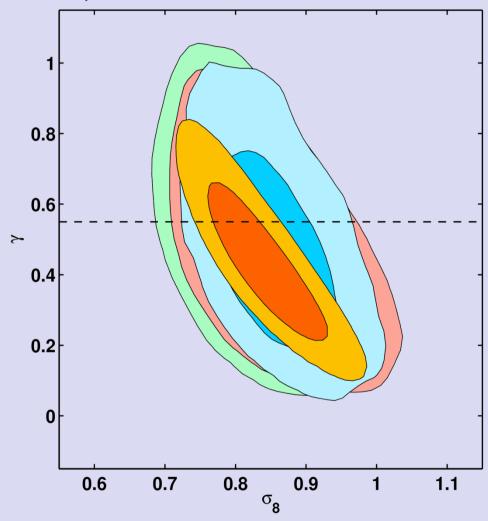
Gold: clusters+SNIa+BAO+CMB

Adding the CMB tightens  $\Omega_m$ , however the correlation with  $\gamma$  is weak.

October 11, 2012

# The impacts of the different data sets

Rapetti et al 10



Red: clusters (XLF+fgas)

Green: clusters+SNIa

Blue: clusters+SNIa+BAO

Gold: clusters+SNIa+BAO+CMB

Adding the CMB leads to a tight correlation between  $\sigma_8$  and  $\gamma$  thanks to the constraints on several cosmological parameters:

$$\gamma \left(\frac{\sigma_8}{0.8}\right)^{6.8} = 0.55^{+0.13}_{-0.10}$$

Strong correlation between  $\sigma_8$  and  $\gamma$ :

 $\rho = -0.87$ 

October 11, 2012

### Redshift space distortions and Alcock-Paczynski effect

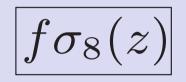
e.g. Blake et al 11; Beutler et al 2012; Reid et al 12

October 11, 2012

### **Anisotropic galaxy clustering: RSD** and **AP** effect

Sources of anisotropy in the distribution of galaxies (2-point statistics) used to constrain the cosmological model:

- Redshift space distortions: due to velocity patterns of galaxies infalling into gravitational potential wells



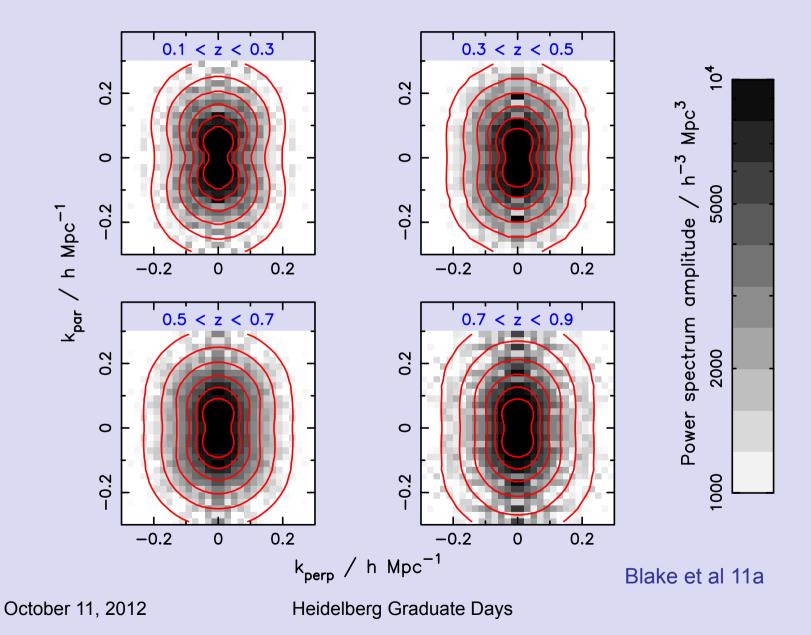
 $f\sigma_8(z)$  f(z) is the linear growth rate and  $\sigma_8(z)$  the variance in the density field at 8h-1Mpc

- Alcock-Paczynski distortion: between the tangential and radial dimensions of objects or patterns when the correct cosmological model is assumed to be isotropic

$$F(z) = (1 + z)D_{\mathrm{A}}(z)H(z)/c$$

 $D_{A}(z)$  is the angular diameter distance and  $H(z)=H_0E(z)$  is the Hubble parameter

### WiggleZ: two-dimensional power spectra

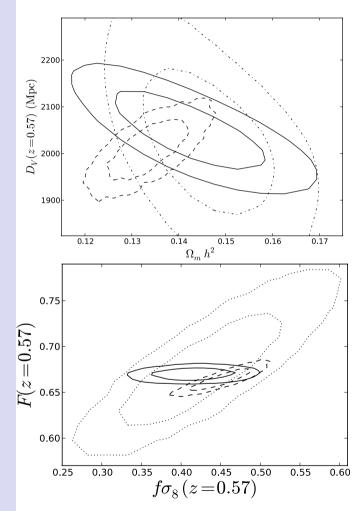


### WiggleZ and 6dFGS constraints on RSD and AP effect

Blake et al 11 For WiggleZ (Blake et al 11): - We use a bivariate Gaussian likelihood on 0.1 < z < 0.30.3 < z < 0.5 $f\sigma_8(z)$  and F(z) (good approximation):  $F/F_{fid}(z)$ F/F<sub>fid</sub>(z) 2, 0.41, 0.60, 0.78) z = (  $(0.53\pm0.14, 0.40\pm0.13, 0.37\pm0.08,$  $f\sigma_8(z)$ 0.5 0.5  $0.49 \pm 0.12$ 0.8 0.2 0.2 0.6 0.4 0.6 0.4 0 0 f  $\sigma_8(z)$ f  $\sigma_8(z)$  $F(z) = (0.28 \pm 0.04, 0.44 \pm 0.07, 0.68 \pm 0.06,$ 0.97±0.12) 0.5 < z < 0.70.7 < z < 0.9F/F<sub>fid</sub>(z)  $F/F_{fid}(z)$ r=(0.83, 0.94, 0.89, 0.84) For 6dFGS (Beutler et al 2012): 0.5 0.5 - We use a Gaussian likelihood on  $f\sigma_8(z)$ 0.2 0.2 0.6 0.8 0.6 0.8 0 0.4 0 0.4 only (since at low-z the AP effect is f  $\sigma_{\rm g}(z)$ f  $\sigma_{\rm g}(z)$ negligible): Relative probability density 0 0.5  $f_{\sigma_8}(z=0.067) = 0.423 \pm 0.055$ October 11, 2012 Heidelberg Graduate Days

### **SDSS-III CMASS BOSS constraints**

Reid et al 12



For CMASS BOSS (Reid et al 2012):

- We use either a bivariate (growth) or a trivariate (BAO) Gaussian likelihood on  $f\sigma_8$  (z), F(z) and A(z) (good approximation):

 $f\sigma_8(z=0.57) = 0.43\pm0.07$ F(z=0.57) = 0.68±0.04 A(z=0.57) = 1.023±0.019

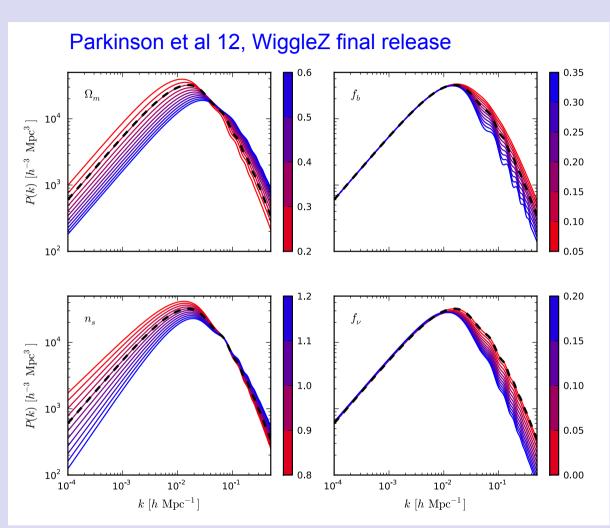
 $r_{f\sigma F} = 0.87$  $r_{f\sigma A} = -0.0086$  $r_{FA} = -0.080$ 

 $A(z) \equiv (D_{\rm v}/r_{\rm s})/(D_{\rm v}/r_{\rm s})_{\rm fiducial}$  $D_V(z) = [(1+z)^2 D_A(z)^2 c z/H(z)]^{1/3}$ 

October 11, 2012

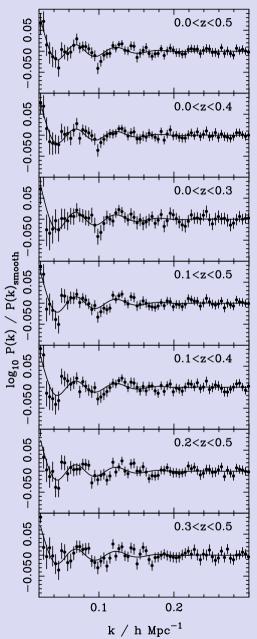
# Large scale distributions of galaxies: matter power spectrum

#### Percival et al 10, SDSS DR7



WiggleZ CosmoMC module: http://smp.uq.edu.au/wigglez-data

October 11, 2012



# Combined constraints on growth and expansion: breaking degeneracies

"A combined measurement of cosmic growth and expansion from clusters of galaxies, the CMB and galaxy clustering",

arXiv:1205.4679

David Rapetti, Chris Blake, Steven Allen, Adam Mantz, David Parkinson, Florian Beutler

October 11, 2012

### Modeling the abundance of clusters and their scaling relations

$$n(M,z) = \int_0^M \mathcal{F}(\sigma,z) \,\frac{\rho_{\rm m}}{M'} \,\frac{d\ln\sigma^{-1}}{dM'} \,dM'$$

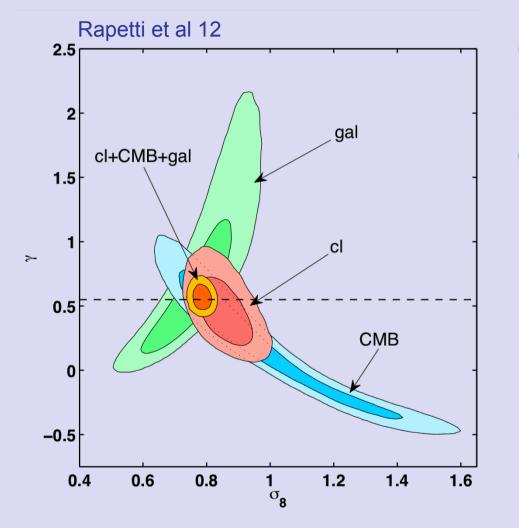
Number density of dark matter halos

$$\mathcal{F}(\sigma, z) = A\left[\left(\frac{\sigma}{b}\right)^{-a} + 1\right]e^{-c/\sigma^2}$$
 Fitting formulae from N-body simulations  
$$x(z) = x_0(1+z)^{\varepsilon\alpha_x} \qquad \begin{array}{c} x \text{ being A, a, b, or c} \\ (\text{Tinker et al 2008}) \end{array}$$

 $\begin{array}{l} \langle \ell(m) \rangle = \beta_0^{\ell m} + \beta_1^{\ell m} m + \beta_2^{\ell m} \log_{10}(1+z) & \mbox{Luminosity-mass relation} \\ \sigma_{\ell m}(z) = \sigma_{\ell m} (1 + \sigma'_{\ell m} z) & \mbox{Scatter in the luminosity-mass relation} \end{array}$ 

(same expressions for the temperature-mass relation but changing I for t)

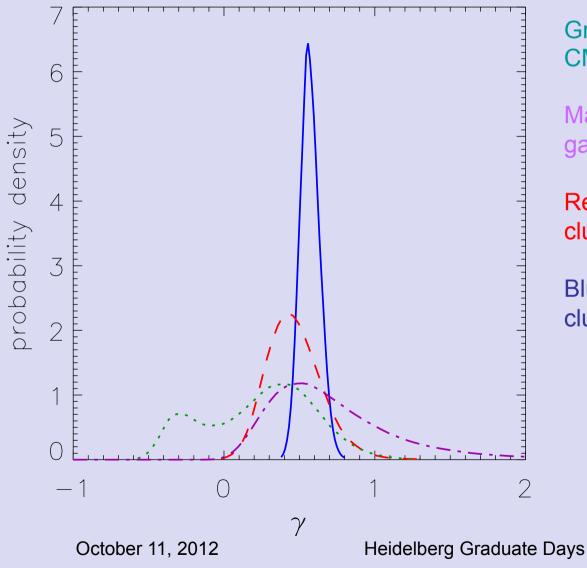
October 11, 2012



clusters (XLF+f<sub>gas</sub>): BCS+REFLEX +MACS CMB (ISW): WMAP galaxies (RSD+AP): WiggleZ +6dFGS+BOSS Gold: clusters+CMB+galaxies

(+BAO+SNIa+SH0ES)  $\gamma = 0.576^{+0.058}_{-0.059}$   $\sigma_8 = 0.789 \pm 0.019$   $\Omega_m = 0.255 \pm 0.011$  $H_0 = 72.1 \pm 1.0$ 

October 11, 2012



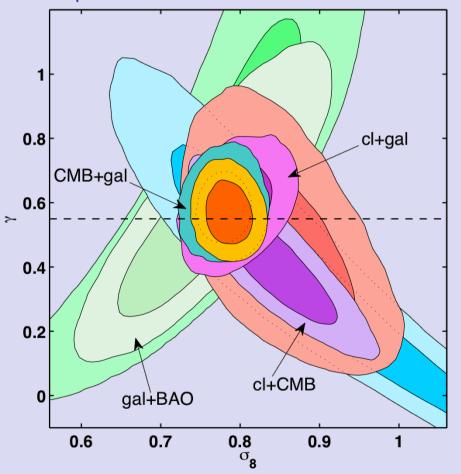
Green, dotted line: CMB alone

Magenta, dotted-dashed line: galaxies

Red, dashed line: clusters

Blue, solid line: clusters+CMB(ISW)+galaxies

Rapetti et al 12



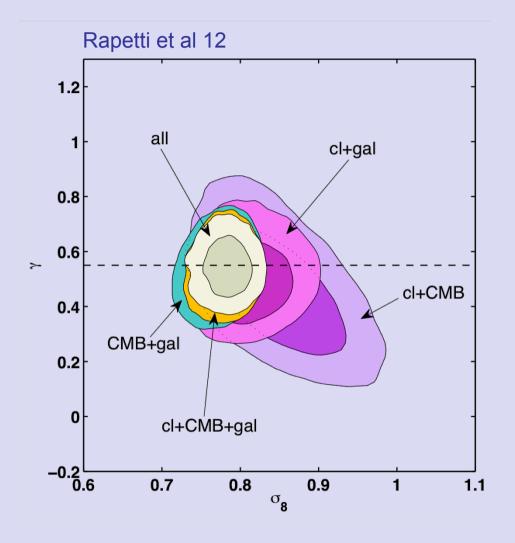
clusters (XLF+f<sub>gas</sub>): BCS+REFLEX +MACS CMB (ISW): WMAP galaxies (RSD+AP): WiggleZ +6dFGS+BOSS

For General Relativity  $\gamma \sim 0.55$ 

Magenta: clusters+galaxies Purple: clusters+CMB Turquoise: CMB+galaxies Gold: clusters+CMB+galaxies

October 11, 2012

### Flat wCDM + growth index γ: growth plane



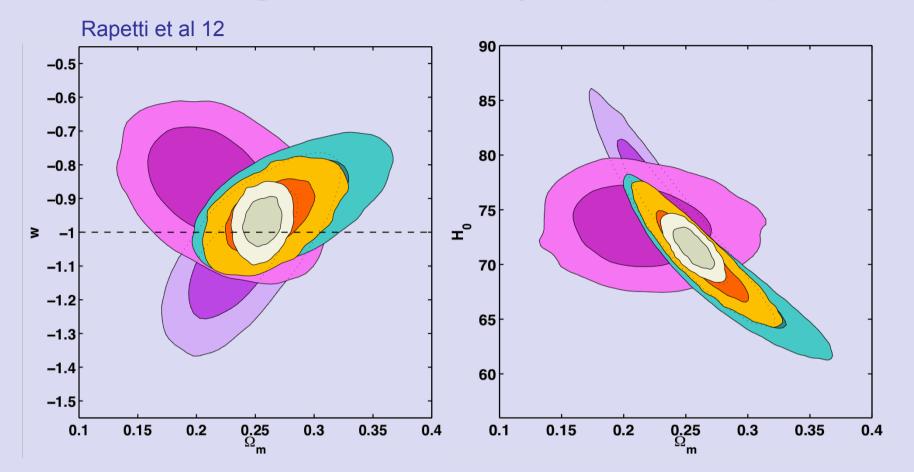
For General Relativity  $\gamma \sim 0.55$ 

Magenta: clusters+galaxies Purple: clusters+CMB Turquoise: CMB+galaxies Gold: clusters+CMB+galaxies

Platinum: clusters+CMB+galaxies +BAO (Reid et al 12; Percival et al 10)+SNIa (Suzuki et al 12) +SH0ES (Riess et al 11)

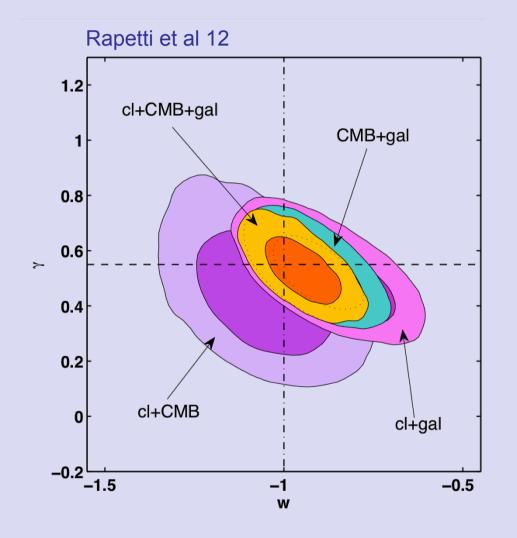
October 11, 2012

### Flat wCDM + growth index γ: expansion planes



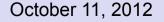
Platinum: clusters + CMB + galaxies + BAO (Reid et al 12; Percival et al 10) + SNIa (Suzuki et al 12) + SH0ES (Riess et al 11)

### Flat wCDM + growth index γ: growth+expansion

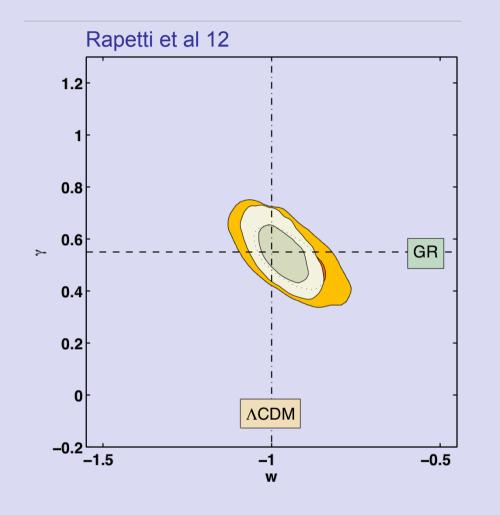


For General Relativity  $\gamma \sim 0.55$ 

Magenta: clusters+galaxies Purple: clusters+CMB Turquoise: CMB+galaxies Gold: clusters+CMB+galaxies



### Flat wCDM + growth index γ: growth+expansion



For General Relativity  $\gamma \sim 0.55$ For  $\Lambda CDM$  w=-1

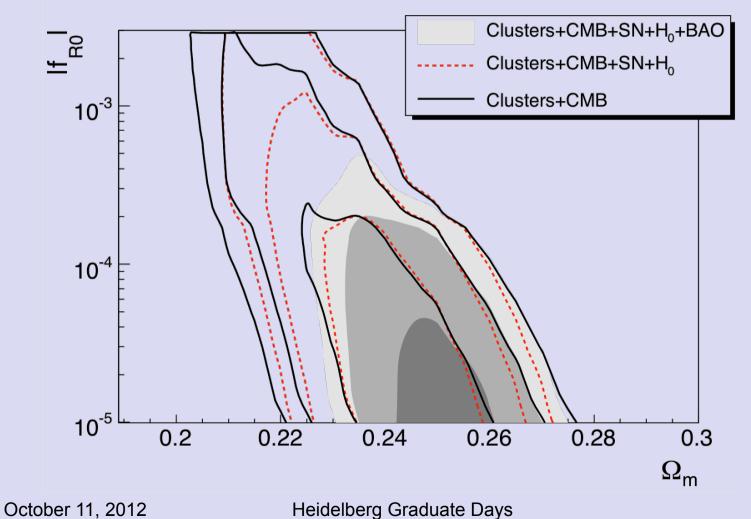
Gold: clusters+CMB+galaxies Platinum: clusters+CMB+galaxies +BAO+SNIa+SH0ES

 $\gamma = 0.546_{-0.072}^{+0.071}$   $\sigma_8 = 0.783_{-0.019}^{+0.020}$   $w = -0.968 \pm 0.049$   $\Omega_m = 0.256 \pm 0.011$   $H_0 = 71.5 \pm 1.3$ 

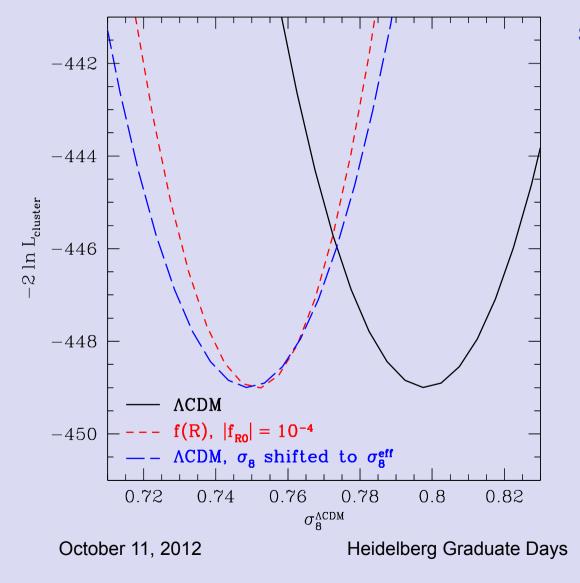
October 11, 2012

### flat+ACDM expansion history, f(R) gravity model



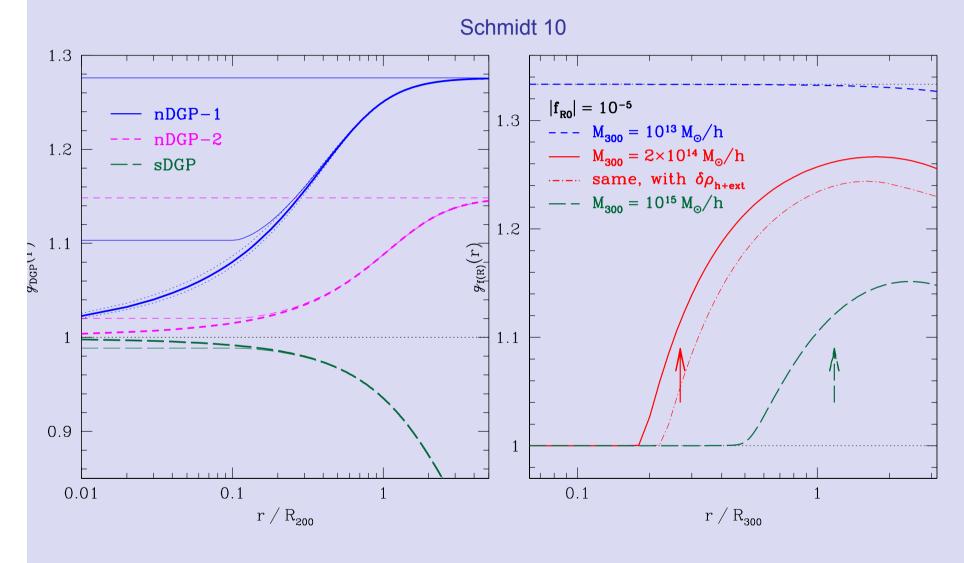


### flat+ACDM expansion history, f(R) gravity model

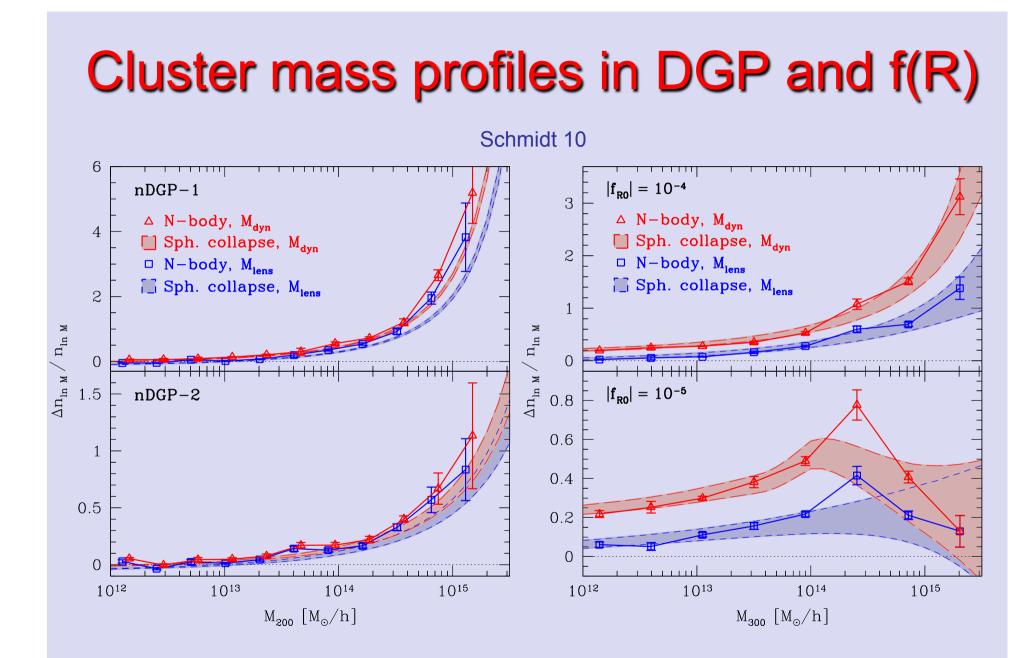


Schmidt, Vikhlinin & Hu et al 10

# Cluster mass profiles in DGP and f(R)



October 11, 2012



October 11, 2012

### Summary

• We have performed a consistency test of General Relativity (growth rate) at large scales using cluster growth data: BCS+REFLEX+Bright MACS, Tinker et al 2008 mass function, 94 clusters with X-ray follow-up observations as well as other cosmological data from  $f_{gas}$ +SNIa+CMB+BAO.

• We obtain a tight correlation  $\gamma(\sigma_8/0.8)^{6.8}=0.55+0.13-0.10$  for the flat  $\Lambda$ CDM model. This promises significant improvements on  $\gamma$  by adding independent constraints on  $\sigma_8$ .

• Our results are **robust** when allowing additional evolution in the luminositymass relation and its scatter thanks to the wide redshift range covered by the follow-up data.

• Simultaneously fitting  $\gamma$  and w, we find that current data is consistent with GR + $\Lambda$ CDM.

### Remember: choose a dark energy model to implement in CosmoMC tomorrow

- Some recent dark energy reviews:
  - Copeland, Sami, Tsujikawa, 06, Int. J. Mod Phys D
  - Frieman, Turner, Huterer, 08, Ann. Rev. Astr. & Astrophys., 46, 385
  - Weinberg, Mortonson, Eisenstein, Hirata, Riess, Rozo, 12, for Phys. Reports, arXiv:1201.2434
- Dark energy task forces and future dark energy missions:
  - Albrecht, Bernstein, Cahn, Freedman, Hewitt, Hu, Huth, Kamionkowski, Kolb, Knox, Mather, Staggs, Suntzeff, 06, arXiv/0609591
  - Albrecht, Amendola, Bernstein, Clowe, Eisenstein, Guzzo, Hirata, Huterer, Kirshner, Kolb, Nichol, 09, arXiv:0901.0721
  - Amendola, et al (Euclid Satellite), 12, arXiv:1206.1225

October 11, 2012 Heidelbe

### Modern cosmology with X-ray luminous clusters of galaxies

Friday Lecture/Practice: Implementing and constraining a theoretical model using CosmoMC

> David Rapetti **DARK Fellow**

Dark Cosmology Centre, Niels Bohr Institute

Dark Cosmology Centre University of Copenhagen



October 12, 2012

# Other public cosmological codes

- CLASS: <u>http://lesgourg.web.cern.ch/lesgourg/class.php</u> (Blas, Lesgourgues, Tram, 11, JCAP, 07, 034)

Analyse this! and CMBEASY: <a href="http://www.thphys.uni-heidelberg.de/">http://www.thphys.uni-heidelberg.de/</a>
 <u>~robbers/cmbeasy/</u>

(Doran & Müller, 04, JCAP, 09, 003; Doran, 05, JCAP, 10, 011)

- CosmoPMC: <u>http://www2.iap.fr/users/kilbinge/CosmoPMC/</u> (Kilbinger et al, 11, arXiv:1101.0950)

- CosmoNest: as add-on for CosmoMC: <u>http://cosmonest.org/</u> (Mukherjee, Parkinson, Liddle, 06, ApJ, 638, 51)

 MultiNest: bayesian inference: <u>http://ccpforge.cse.rl.ac.uk/gf/project/multinest/</u> (Feroz, Hobson, Bridges, 09, MNRAS, 398, 1601)

### **Finish previous exercises**

Exercise: Use the SNe Ia code of the Union 2.1 in CosmoMC to obtain the constraints on the paper (Suzuki et al 12). You can also use the SCP website <u>http://supernova.lbl.gov/Union/</u>.

**Exercise**: Plot the data from the data folder in CosmoMC (with the corresponding error bars) to get familiar with it.

Exercise: Using the fgas module for CosmoMC, reproduce the constraints in Allen et al 08 for the non-flat LCDM model and flat wCDM models; obtain the 2D (or 1D) marginalized constraints.

**Exercise**: Test the robustness of the previous results by sensibly changing the allowances in the fgas module and obtaining new constraints.

October 12, 2012

# **CosmoMC** project

- Implement your chosen theoretical model
- To modify the expansion history model go into the camb folder and appropriately change the file equations.f90
- Include the new variables of your model into cosmomc
- For this, modify accordingly files in the source folder such as driver.f90, etc. (hint: you can trace other equivalent parameters to see which other files you need to modify)
- Remember to include your new parameters in your params.ini
- Compile, run with your choice of expansion data sets (fgas, SNe Ia, BAO, etc.), and analyze the chains with getdist with a corresponding distparams.ini. Again, ask questions when needed and good luck!