

## Observational aspects of weak lensing

### Overview

- Shape measurement
- Photometric redshifts
- Intrinsic alignment
- Non-linear structure formation
- Non-Gaussian errors

(Leiden list)

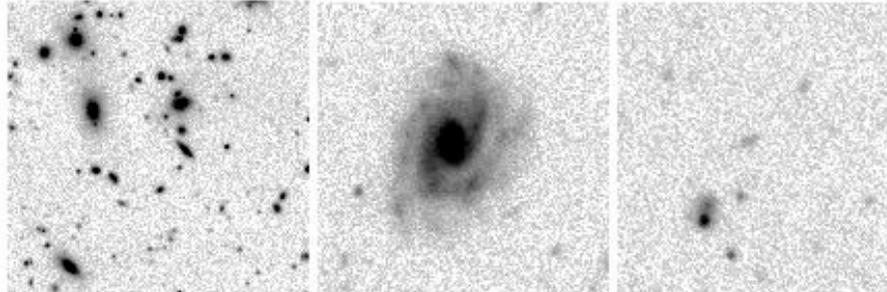
## Measuring ellipticity

### Reminder:

Weak gravitational lensing causes small image distortions.

(Linearized) lens mapping: **circle**  $\rightarrow$  **ellipse**.

Need to measure “ellipticity” for irregular shaped objects such as faint, high-redshift galaxies...



[Y. Mellier]

## Defining ellipticity

- Second-order tensor of brightness distribution

$$Q_{ij} = \frac{\int d^2\theta q[I(\boldsymbol{\theta})] (\theta_i - \bar{\theta}_i)(\theta_j - \bar{\theta}_j)}{\int d^2\theta q[I(\boldsymbol{\theta})]}, \quad i, j = 1, 2$$

$I(\boldsymbol{\theta})$  : brightness distribution of galaxy

$q$  : weight function

$$\bar{\boldsymbol{\theta}} = \frac{\int d^2\theta q_I[I(\boldsymbol{\theta})] \boldsymbol{\theta}}{\int d^2\theta q_I[I(\boldsymbol{\theta})]} : \text{ barycenter}$$

- **Ellipticity**

$$\varepsilon = \frac{Q_{11} - Q_{22} + 2iQ_{12}}{Q_{11} + Q_{22} + 2(Q_{11}Q_{22} - Q_{12}^2)^{1/2}}$$

- Circular object  $Q_{11} = Q_{22}, Q_{12} = Q_{21} = 0$
- Elliptical isophotes, axis ratio  $r$ :  $|\varepsilon| = (1 - r)/(1 + r)$

## From source to image

- Analogously define  $Q_{ij}^s$  for source brightness
- With lens equation:

$$Q^s = \mathcal{A}Q\mathcal{A}$$

[Reminder:

$$\mathcal{A} = \begin{pmatrix} 1 - \kappa - \gamma_1 & -\gamma_2 \\ -\gamma_2 & 1 - \kappa + \gamma_1 \end{pmatrix} = (1 - \kappa) \begin{pmatrix} 1 - g_1 & -g_2 \\ -g_2 & 1 + g_1 \end{pmatrix}$$

Jacobi-matrix of mapping between lens and source position. Reduced shear  $g_i = \gamma_i / (1 - \kappa)$

- Relation between source  $\varepsilon^s$  and image ellipticity  $\varepsilon$

$$\varepsilon^s = \begin{cases} \frac{\varepsilon - g}{1 - g^* \varepsilon} & \text{for } |g| \leq 1 \\ \frac{1 - g\varepsilon^*}{\varepsilon^* - g^*} & \text{for } |g| > 1 \end{cases},$$

- **weak-lensing** regime:  $\kappa, |\gamma| \ll 1 \rightarrow \varepsilon \approx \varepsilon^s + \gamma$

## Measuring second-order shear

### Estimators

- 2PCF: correlate all galaxy pairs

$$\hat{\xi}_{\pm}(\vartheta) = \frac{1}{N_{\text{pair}}} \sum_{\substack{ij \\ \text{pairs} \in \vartheta\text{-bin}}}^{N_{\text{pair}}} (\varepsilon_{it}\varepsilon_{jt} \pm \varepsilon_{ix}\varepsilon_{jx})$$

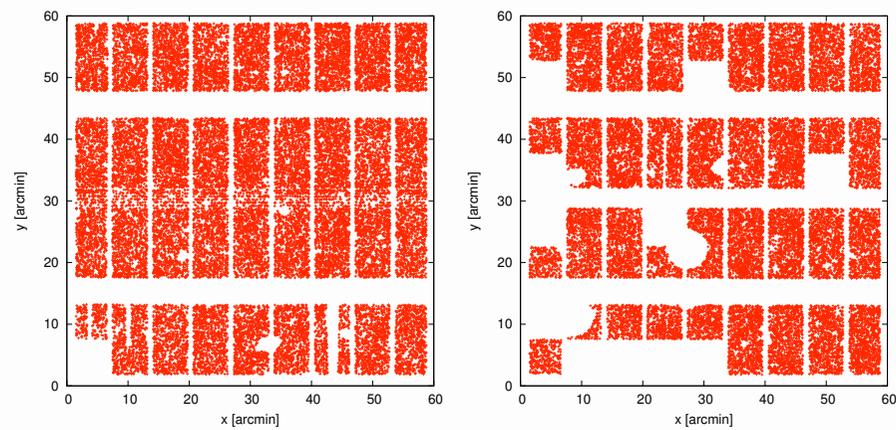
- Aperture-mass dispersion: place apertures over data field

$$\hat{M}(\theta) = \frac{1}{N_{\text{ap}}} \sum_{n=1}^{N_{\text{ap}}} \frac{1}{N_n(N_n - 1)} \sum_{\substack{i \neq j \\ \text{gal} \in \text{ap.}}}^{N_n} Q_i Q_j \varepsilon_{it} \varepsilon_{jt}^*$$

(tophat-variance similar)

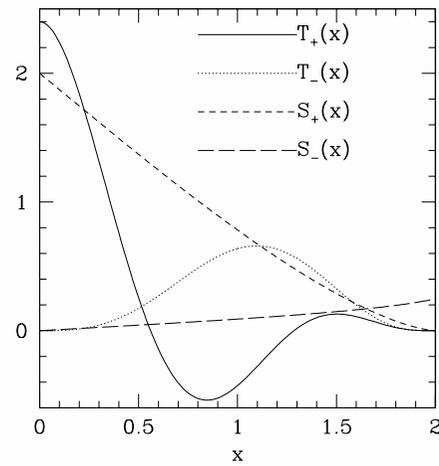
## Interrelations

Placing apertures very inefficient due to gaps, masking. Correlating pairs for 2PCF makes optimal use of data.



Invert relation between 2PCF and power spectrum  $\rightarrow$  express aperture measures in terms of 2PCF

## Interrelations



$T_{\pm}, S_{\pm}$  depend on  $\hat{U}$ , analytical expressions exist

$$\begin{aligned} \langle M_{\text{ap}}^2 \rangle(\theta) &= \int_0^{2\theta} \frac{d\vartheta}{\theta^2} T_+ \left( \frac{\vartheta}{\theta} \right) \xi_+(\vartheta) \\ &= \int_0^{2\theta} \frac{d\vartheta}{\theta^2} T_- \left( \frac{\vartheta}{\theta} \right) \xi_-(\vartheta) \end{aligned}$$

$$\begin{aligned} \langle |\gamma|^2 \rangle(\theta) &= \int_0^{2\theta} \frac{d\vartheta}{\theta^2} S_+ \left( \frac{\vartheta}{\theta} \right) \xi_+(\vartheta) \\ &= \int_0^{\infty} \frac{d\vartheta}{\theta^2} S_- \left( \frac{\vartheta}{\theta} \right) \xi_-(\vartheta) \end{aligned}$$

## Interrelations in the presence of a B-mode

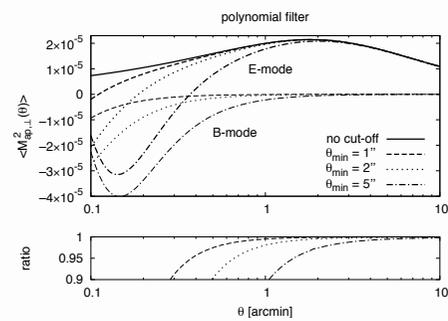
$$\langle M_{\text{ap},\times}^2 \rangle(\theta) = \frac{1}{2} \left[ \int_0^{2\theta} \frac{d\vartheta \vartheta}{\theta^2} T_+ \left( \frac{\vartheta}{\theta} \right) \xi_+(\vartheta) \pm \int_0^{2\theta} \frac{d\vartheta \vartheta}{\theta^2} T_- \left( \frac{\vartheta}{\theta} \right) \xi_-(\vartheta) \right]$$

$$\langle |\gamma|^2 \rangle_{\text{E,B}}(\theta) = \frac{1}{2} \left[ \int_0^{2\theta} \frac{d\vartheta \vartheta}{\theta^2} S_+ \left( \frac{\vartheta}{\theta} \right) \xi_+(\vartheta) \pm \int_0^\infty \frac{d\vartheta \vartheta}{\theta^2} S_- \left( \frac{\vartheta}{\theta} \right) \xi_-(\vartheta) \right]$$

$$\xi_{\text{E,B}}(\theta) = \frac{1}{2} \left[ \xi_+(\theta) \pm \xi_-(\theta) \pm \int_\theta^\infty \frac{d\vartheta}{\vartheta} \xi_-(\vartheta) \left( 4 - 12 \frac{\theta^2}{\vartheta^2} \right) \right]$$

Top-hat-variance and corr. function not local!

## E- and B-mode mixing

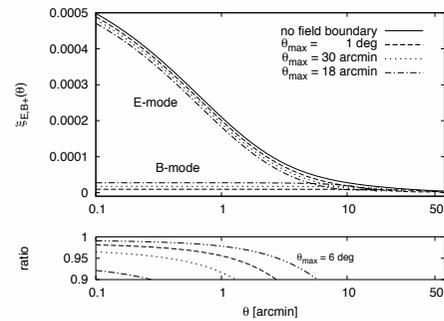


Aperture-mass statistics: B-mode on small scales due to minimum angular scales (blending of galaxy images)

[MK, Schneider & Eifler 2006]

E-/B-mode separation on finite angular range: Ring statistics

[Schneider & MK 2006]



Correlation function and top-hat-variance:  $\approx$  constant B-mode on all scales due to maximum scale (field size)

## PSF effects

The problem:

- Need to measure galaxy shapes to percent-level accuracy.
- Galaxies are **faint** ( $I > 21$ ), **small** ( $\gtrsim$  arcsec = few pixel) and are
  1. smeared by seeing
  2. distorted by instrumental imperfections: defocusing, aberration, coma etc., tracking errors, chip not planar, image coaddition

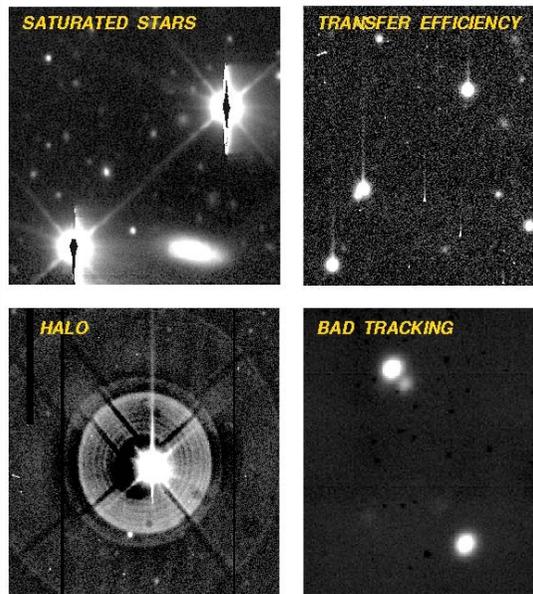
Effect:

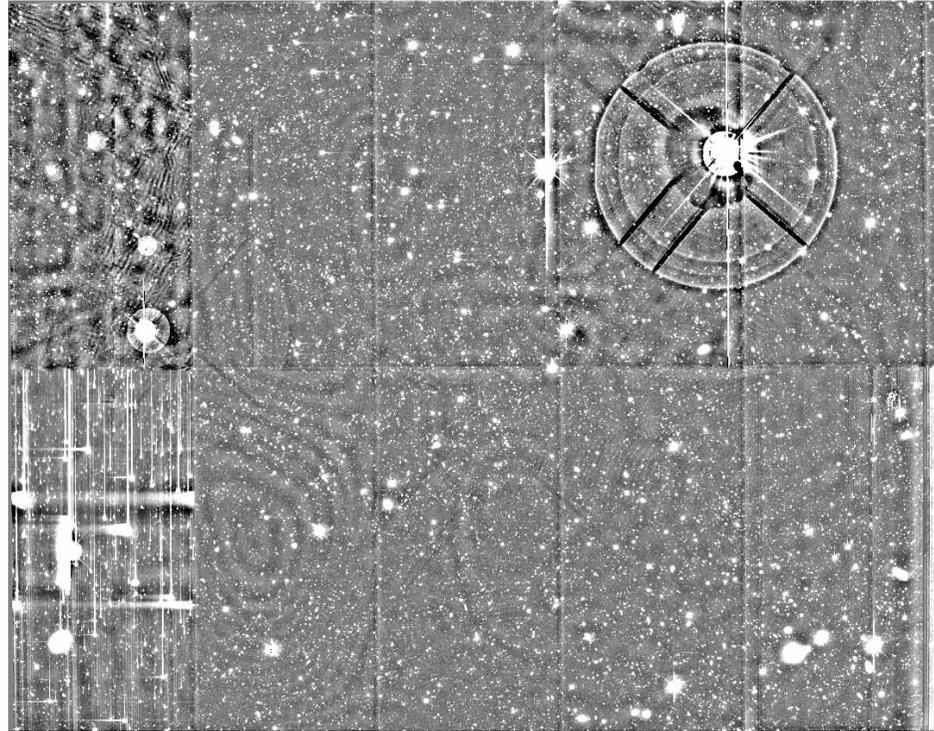
1. Makes galaxies rounder
2. Mimics a shear signal  $\gg \gamma$  !

Solution:

1. Seeing  $\lesssim 1''$
2. Correct for PSF anisotropies

## Example of star images





## KSB

[Kaiser, Squires & Broadhurst 1995]: Perturbative ansatz for PSF effects

$$\varepsilon^{\text{obs}} = \varepsilon^{\text{s}} + P^{\text{sm}}\varepsilon^* + P^{\text{sh}}\gamma$$

[c.f.  $\varepsilon^{\text{obs}} = \varepsilon^{\text{s}} + \gamma$  from before]

$P^{\text{sm}}$	smear polarisability, (linear) response of to ellipticity to PSF anisotropy
$e^*$	PSF anisotropy
$P^{\text{sh}}$	shear polarisability, isotropic seeing correction
$\gamma$	shear

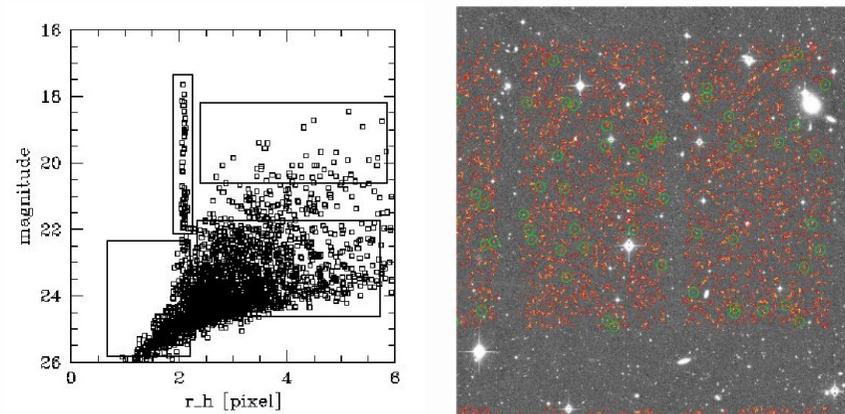
$P^{\text{sm}}, P^{\text{sh}}$  are functions of galaxy brightness distribution.

$e^*$ : fit function (polynomial/rational) to star PSFs, extrapolate to galaxy positions

PSF effects depend on galaxy ...

- size
- magnitude
- morphology
- SED (color gradient within broad-band filter)

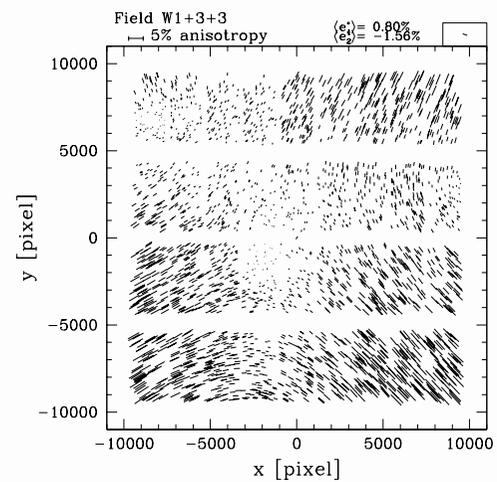
## Object selection



CFHTLS Wide [I. Tereno]

From size-magnitude diagram select **galaxies** and **stars**.

## PSF pattern



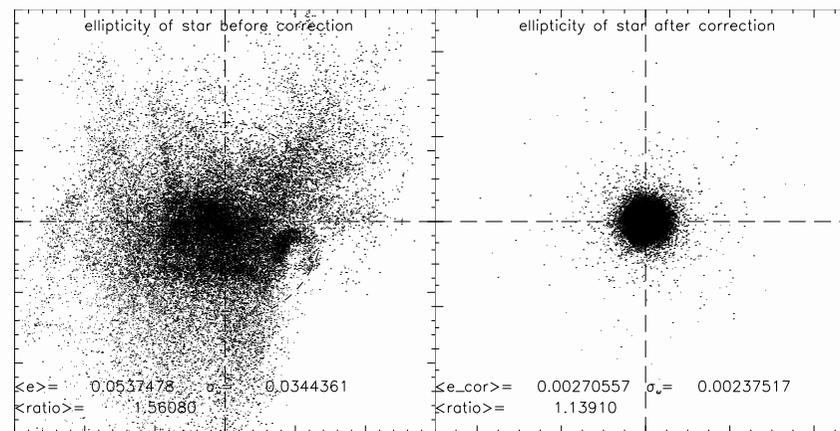
PSF correction works if

- PSF pattern is smooth  
(can be fitted by simple function)
- star density is high enough  
( $\sim 10$ - $20$  stars per chip)

[Hoekstra et al. 2006]

## PSF correction

55 CFHTLS Wide pointings

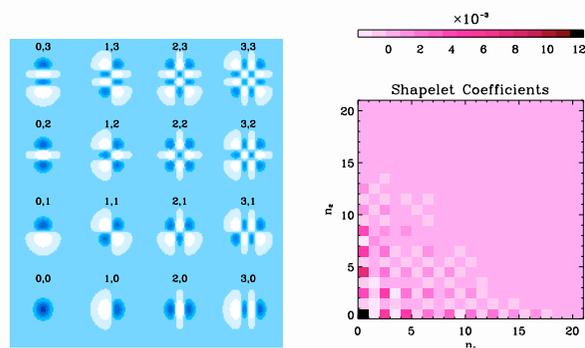


[Fu et al. 2007 (in prep.)]

## KSB alternatives

Shapelets [Refregier 2003, Massey &amp; Refregier 2003, Kuijken 2006]

- Decompose galaxies and stars into basis functions.



- PSF correction, convergence and shear acts on shapelet coefficients, deconvolution feasible
- Beyond second-order (quadrupole moment)

## KSB alternatives

[PCA decomposition](#) [Bernstein & Jarvis 2002, Nakajima & Bernstein 2007]

Similar to shapelets method, but shears the basis functions until they match observed galaxy image

[im2shape](#) [Kuijken 1999, Bridle et al. 2002]

Fits sum of elliptical Gaussian to each galaxy (MCMC). In principle offers clean way to translate shape measurement errors into errors on cosmological parameters. **But:** Very slow!

## Weak lensing from space

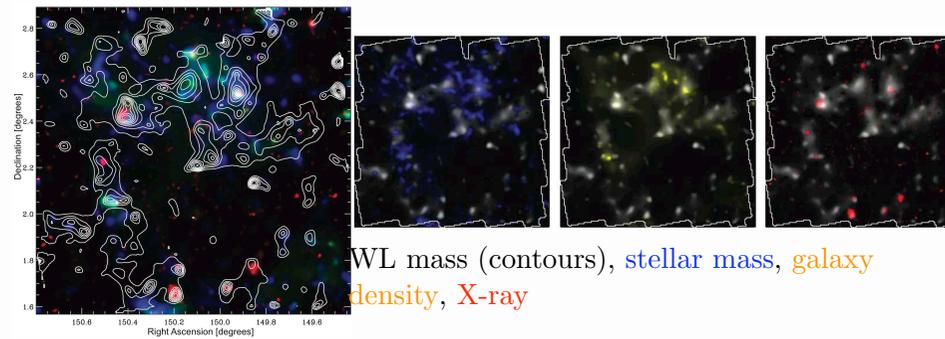
### Advantages and disadvantages

- No seeing, resolution is diffraction-limited (HST:  $< 100$  mas)
- Deeper (higher  $z$ , larger number density), better IR-coverage than from earth
- HST: PSF undersampled, 'ugly', time-variations
- small field of view, few stars
- CCD 'aging', many cosmic rays, CTE problems

### Results

- Cluster WL: excellent results (high shear signal, calibration less crucial)
- Cosmic shear: COSMOS, GEMS, GOODS, ACS parallel survey

## Space-based cosmic shear surveys



[Massey et al. 2007]

## STEP = Shear TEsting Programme

- World-wide collaboration of most of the weak lensing groups, started in 2004.
- Blind analysis of simulated images to test and calibrate different shape measurement methods, data reduction pipelines.

STEP 1 Simple Galaxy and PSF types Heymans et al. 2006

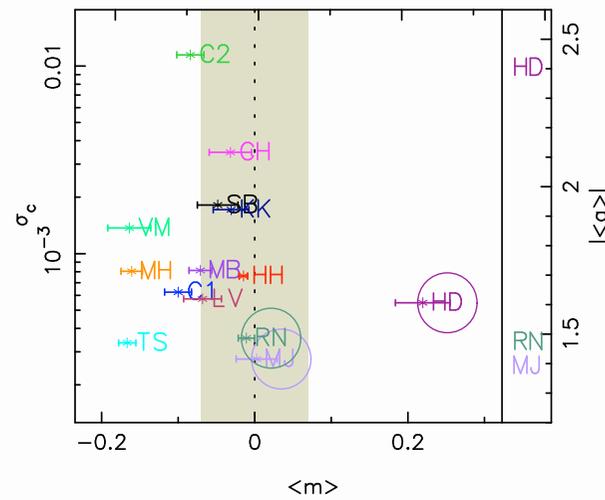
STEP 2 Galaxy images with shapelets  
Results from STEP 1 used Massey et al. 2007

STEP 3 Space-based observations in prep.

STEP 4 Back to the roots?

...

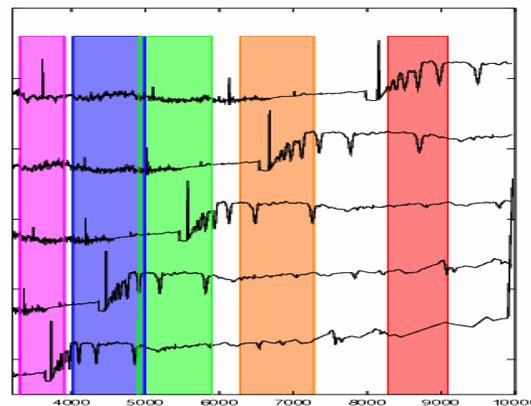
## STEP results



- Multiplicative  $m$  and additive errors  $\sigma_c$ ,  
 $\gamma^{\text{obs}} - \gamma^{\text{true}} = m\gamma^{\text{true}} + c$
- Best methods measure better shear than 7%
- STEP 2: Sub-percent level not yet reached

## Principle of photo-zs

- Redshifted galaxy spectra have different colors



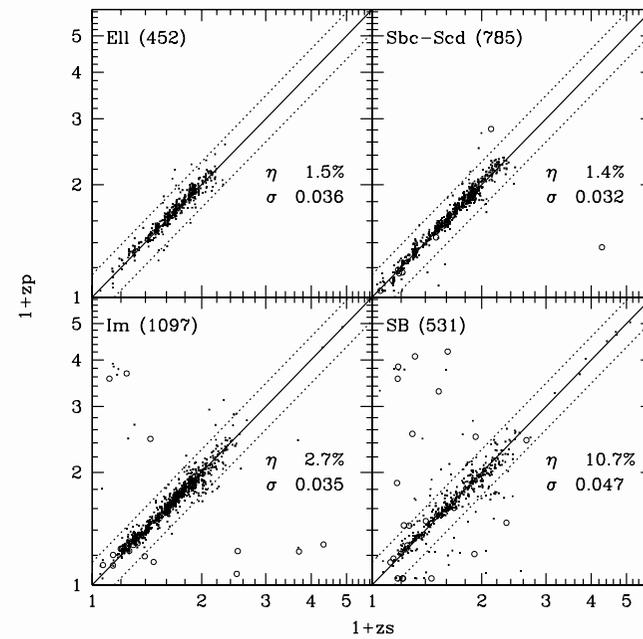
[from Y. Mellier]

- 4000 Å-break strongest feature → ellipticals (old stellar population) best, spirals ok, irregular/star-burst (emission lines) very unreliable

## Photometric redshifts

- **Redshift desert**  $z \approx 1.5 - 2.5$ , neither 4000 Å-break nor Ly-break in visible range
- Confusion between low- $z$  dwarf ellipticals and high- $z$  galaxies
- Need UV band and IR for high redshifts! **But:** UV very insensitive, IR absorbed by atmosphere, have to go to space
- Need database of galaxy spectra templates (observed or synthetic)
- Calibrate with spectroscopic galaxy sample. But always  $N_{\text{spec}} \ll N_{\text{WL}}$

## Photo-z calibration



Minimize  
catastrophic  
failures

$$\frac{z_{\text{ph}} - z}{1+z} \lesssim 0.5$$

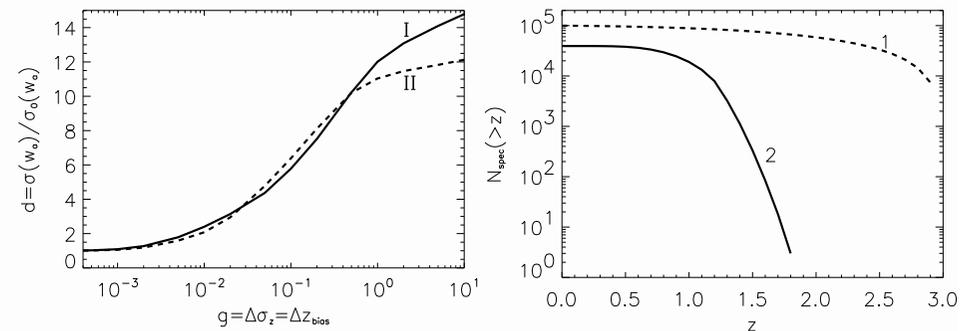
$$17.5 \leq i'_{AB} \leq 24$$

[Ilbert et al. 2006]

## Photometric errors and cosmology

Degradation of  $w_a$ -constraint as fct. of uncertainty in photo-z parameters  $\Delta z_{\text{bias}} = \Delta\sigma_z$

Cumulative number of galaxies in spectroscopic sample for degradation = 1.5



perfect redshifts:

$$\sigma_0(w_a) = 0.69 \quad (\text{I})$$

$$\sigma_0(w_a) = 0.96 \quad (\text{II})$$

[Ma, Hu & Huterer 2006]

## Size of spectroscopic sample

Error on bias and dispersion in  $\mu^{\text{th}}$  redshift bins

$$\Delta z_{\text{bias}}^{\mu} = \frac{\sigma_z^{\mu}(\text{ind. gal})}{\sqrt{N_{\text{spect}}^{\mu}}}$$
$$\Delta \sigma_z^{\mu} = \frac{\sigma_z^{\mu}(\text{ind. gal})}{\sqrt{N_{\text{spect}}^{\mu}/2}}$$

Assume  $\sigma_z(\text{ind. gal}) = 0.1$ , 5 photo-z bands. To reach  $\Delta z_{\text{bias}}^{\mu} = 10^{-3}$ , we need a total of  $N_{\text{spec}} = 5 \cdot 10^4$  spectra!

### Requirements for high-precision cosmology

- some  $10^4$  spectra to very faint magnitudes
- IR bands from space

### Other possibilities

- Intermediate calibration step between  $\approx 5$  bands and spectra: large number of broad bands from UV to far-IR ( $10^3$  spectra sufficient?)
- Angular correlation between photo- $z$  bins to determine true  $z$ -distribution (e.g. correlation between low- and high- $z$  bins  $\leftarrow$  contamination by catastrophic outliers)

## Intrinsic alignment

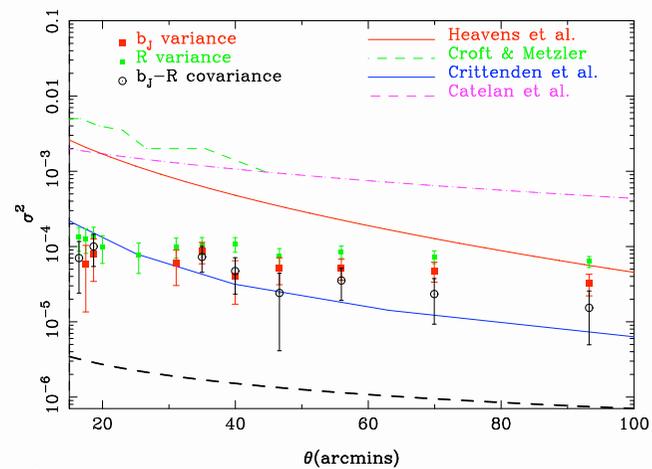
### Intrinsic-intrinsic correlation (II)

- Reminder: basic equation of weak lensing  $\varepsilon = \varepsilon^s + \gamma$
- Second-order correlations

$$\langle \varepsilon_i \varepsilon_j^* \rangle = \langle \varepsilon_i^s \varepsilon_j^{s*} \rangle + \langle \varepsilon_i^s \gamma_j^* \rangle + \langle \gamma_j \varepsilon_i^{s*} \rangle + \langle \gamma_i \gamma_j^* \rangle$$

- $\langle \varepsilon_i^s \varepsilon_j^{s*} \rangle \neq 0$  for  $z_i \approx z_j$ , and if shapes of galaxies intrinsically correlated, e.g. through spin-coupling with dm halo, tidal torques
- II measured in COMBO-17 (Heymans et al. 2004), not measured in SDSS (Hirata et al. 2004). B-modes as diagnostics?
- Theoretical predictions do not agree with each other

## Theoretical predictions of II-correlation



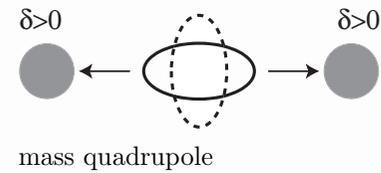
[Brown et al. 2002]

## Conclusion

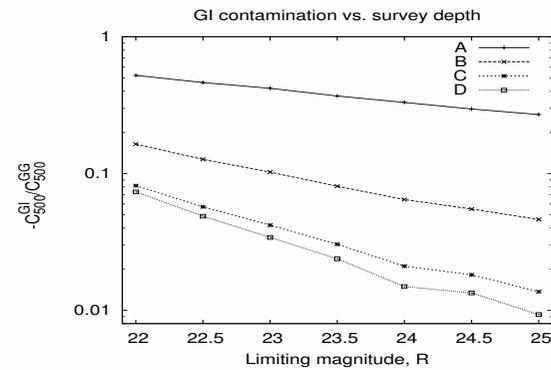
- II-contamination probably unimportant. Can be reduced by going deep, and down-weighting (physically) close pairs (photo-zs!)

## Intrinsic-shear correlation (GI)

- $\langle \varepsilon_i^s \gamma_j^* \rangle \neq 0$  for  $z_i < z_j$ , and if foreground galaxy aligned with its halo that causes lensing signal

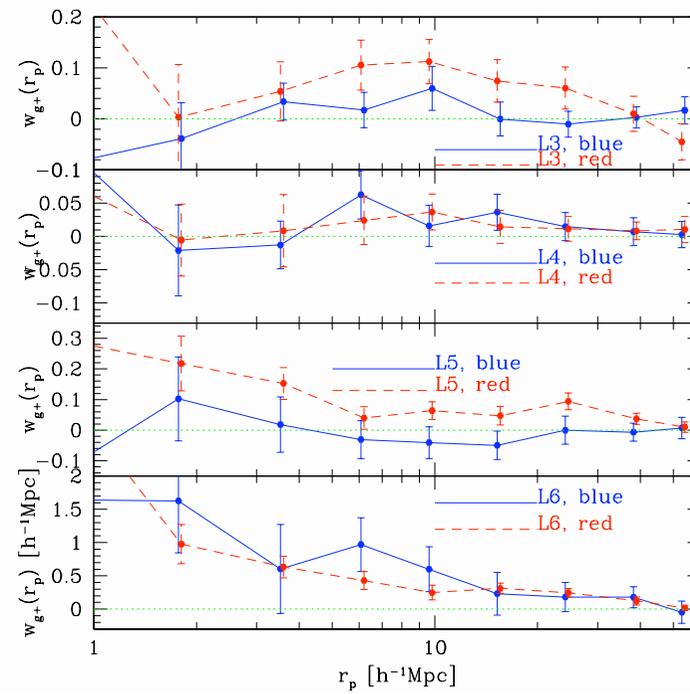


- Anti-correlation between background shear and foreground orientation  $\rightarrow$  underestimate  $\sigma_8$  by up to 10%
- Unlike II, GI cannot be down-weighted!



[Hirata et al. 2004, 2007] SDSS+2SLAQ

$w_{g^+}$  for Main colour subsamples

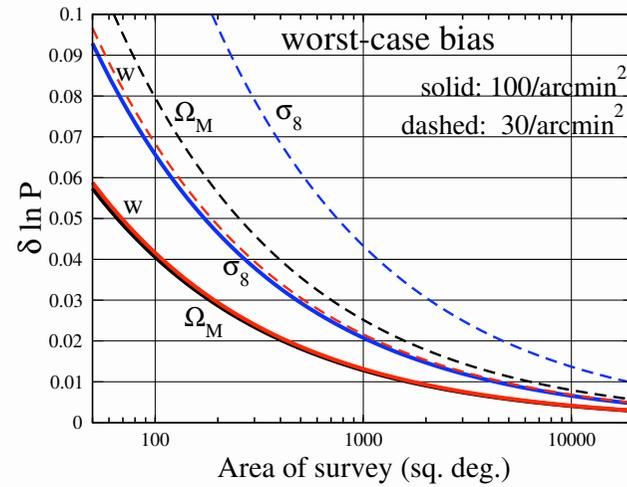


## Non-linear structure formation

### Problems

- Non-linear predictions of dark-matter  $P_\delta$  not better than  $\approx 5\%$  on small scales [Peacock&Dodds 1996, Smith, Peacock et al. 2003]
- With baryonic physics much worse!
- Dark energy dependence not really tested, extrapolations valid?
- Accuracy of non-linear bispectrum  $B_\delta$  15 – 30% [Scoccimarro & Couchman 2001]
- **Halo model**, semi-analytic, works also for higher-order statistics, but many fine-tuning parameters

Necessary accuracy of  $P_\delta$  not to be dominated by systematic errors in  $P_\delta$  (@  $k \sim 1$  h/Mpc).



[Huterer & Takada 2005]

## Non-Gaussian errors

- Second-order correlations

$$\langle \varepsilon_i \varepsilon_j^* \rangle = \langle \varepsilon_i^s \varepsilon_j^{s*} \rangle + \langle \gamma_i \gamma_j^* \rangle = \sigma_\varepsilon^2 \delta_{ij} + \xi_+(\vartheta_{ij})$$

- **Error** of second-order correlations is square of above.  
Schematically:

$$\begin{aligned} \text{cov} &= c_1 \sigma_\varepsilon^4 + c_2 \sigma_\varepsilon^2 \langle \gamma\gamma \rangle + c_3 \langle \gamma\gamma\gamma \rangle \\ &\equiv D + M + V \end{aligned}$$

$D$  : 'diagonal term', shot noise due to intrinsic  
ellipticity and finite numbers of galaxies

$M$  : mixed term

$V$  : sample "cosmic" variance, due to finite observed volume

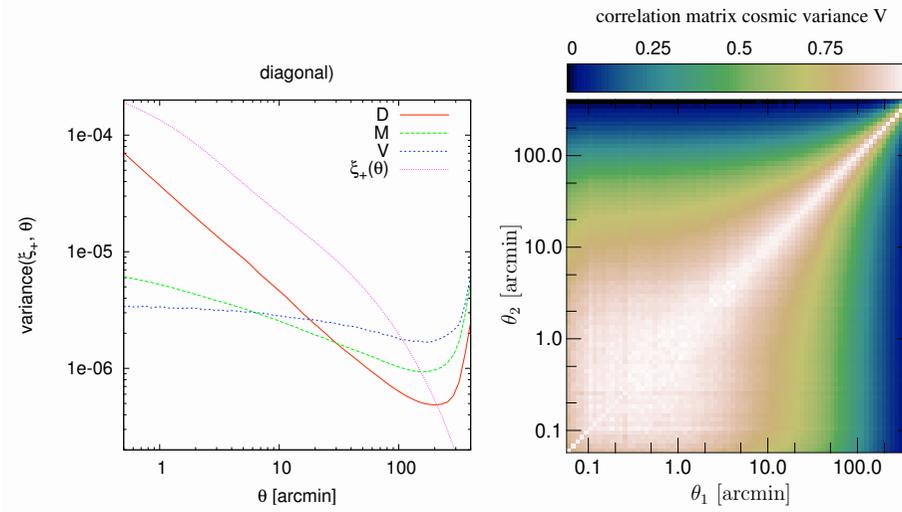
## Cosmic variance term $V$

If shear field were Gaussian:  $V = 3 \langle \gamma \gamma \rangle^2$ , cov known analytically [Schneider, van Waerbeke, MK & Mellier]. But this is not the case! What is  $\langle \gamma \gamma \gamma \gamma \rangle_c$ ?

Possible ways to get  $V_{\text{non-Gauss}}$ :

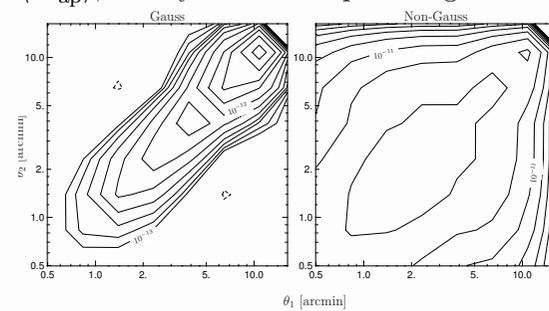
- Field-to-field variance from data, if large number of independent patches observed
- From ray-tracing simulations
- Fitting formulae [Semboloni et al. 2007]
- Cov. of  $P_\kappa$ , fourth-order statistics from halo-model, [e.g. Cooray & Hu 2001]

### Covariance for CFHTLS Wide, 55 deg<sup>2</sup>

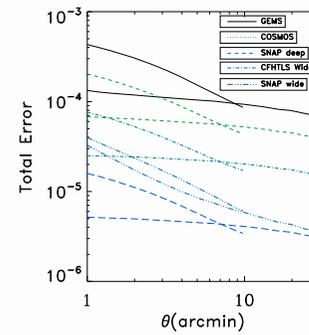


Non-Gaussian cosmic variance important on small scales

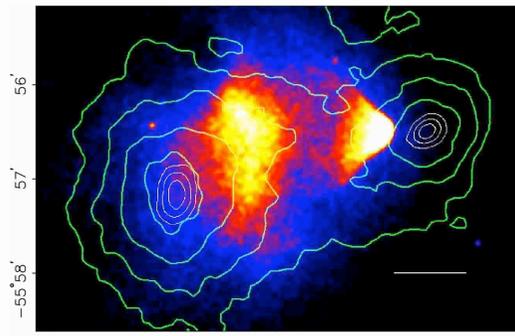
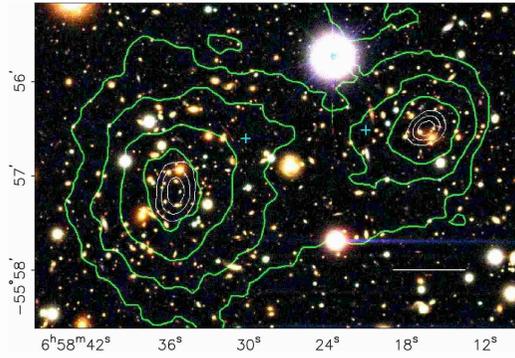
$\langle M_{\text{ap}}^2 \rangle$ , survey area = 3 square degree



[MK & Schneider 2005]

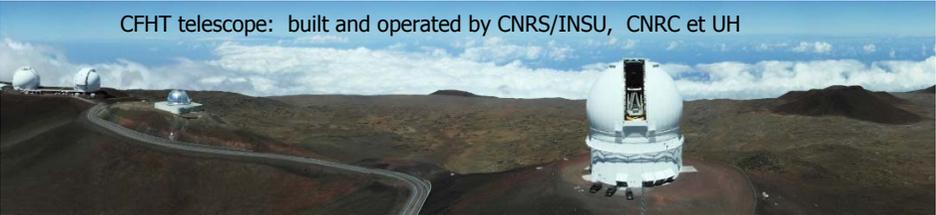


[Semboloni et al. 2007]

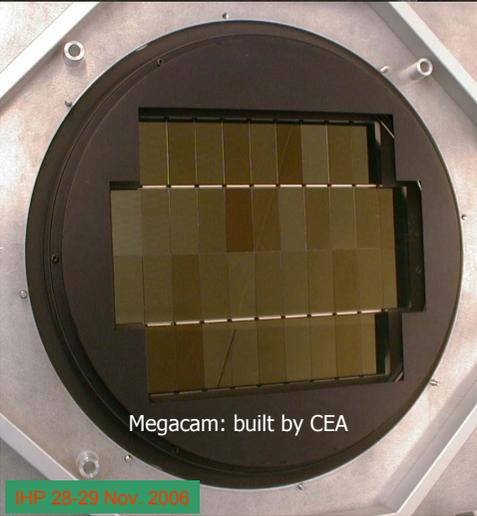


## Results from the bullet cluster

- Combined strong+weak lensing, optical, X-ray analysis [Bradač et al., Clowe et al. 2006]
- Self-interaction of dark matter:  $\sigma/m < 1.25 \text{cm g}^{-1}$  [Randall et al. 2007]
- [Angus, Shan, Zhao & Famaey 2007]: MOND + 2 eV hot neutrinos as collisionless dark matter, falsifiable by KATRIN  $\beta$ -decay experiment by 2009. Not a new idea [Sanders 2003, McGaugh 2004]

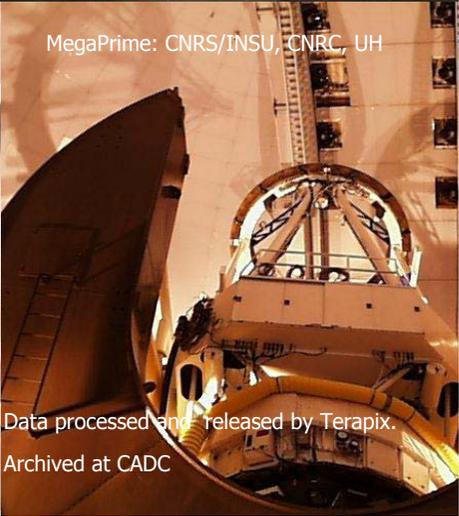


CFHT telescope: built and operated by CNRS/INSU, CNRC et UH



Megacam: built by CEA

IHP 28-29 Nov. 2006



MegaPrime: CNRS/INSU, CNRC, UH

Data processed and released by Terapix.  
Archived at CADC

