

**Weak lensing in the UNIONS survey.**

**Analysis with the galaxy shape  
measurement pipeline ShapePipe &  
first results.**

19 January 2023

Kick-off meeting du GDR CoPhy

Martin Kilbinger, CEA Paris-Saclay, CosmoStat  
[martin.kilbinger@cea.fr](mailto:martin.kilbinger@cea.fr)





# Outline

- The UNIONS survey
- ShapePipe weak-lensing data analysis pipeline
- First results



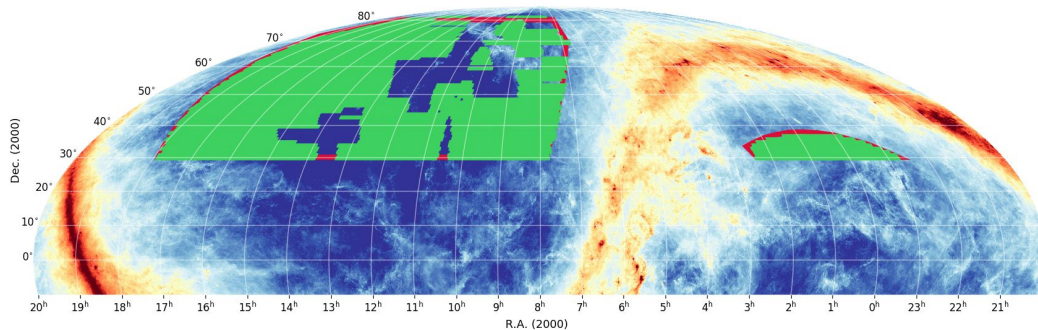
# UNIONS: Ultra-violet Near-Infrared Optical Northern Survey

## CFIS: Canada-France Imaging Survey

Large imaging survey ( $4,800 \text{ deg}^2$ ) in the Northern hemisphere with CFTH in optical bands  $u, r$  (CFIS),  $i, z$  (Pan-STARRS),  $g, z$  (HSC).

P.I.: Jean-Charles Cuillandre (DAP) & Alain McConnell (Victoria/Canada)

- Optical bands for Euclid for photometric redshifts
- Weak lensing
- Milky Way dynamics
- Large-scale structure
- Galaxy evolution



CFIS-r survey area and realized coverage as of September 2022

Total survey area:  $4,800 \text{ deg}^2$   
Covered area:  $4012 \text{ deg}^2$  (83%), left to cover:  $788 \text{ deg}^2$  (17%)

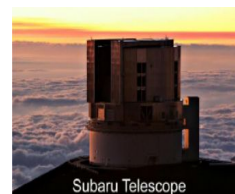
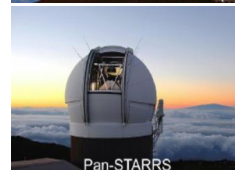
[www.skysurvey.cc](http://www.skysurvey.cc)

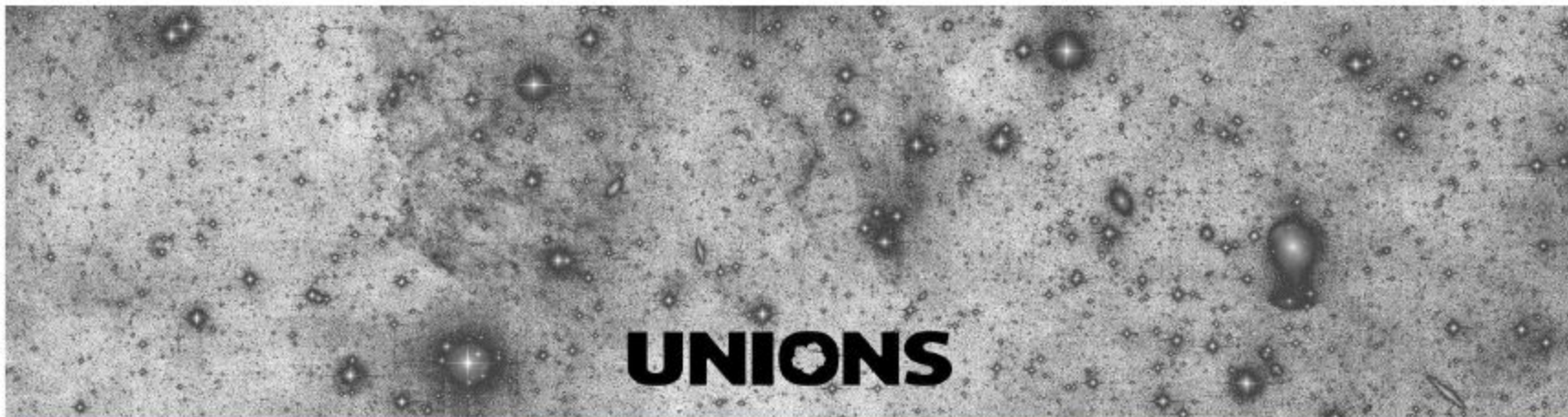


UNIONS



Dust map: Planck Collaboration







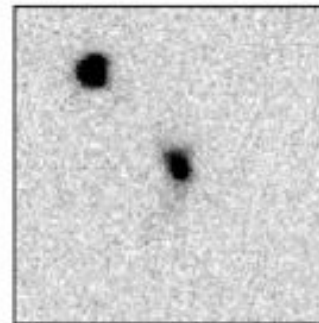
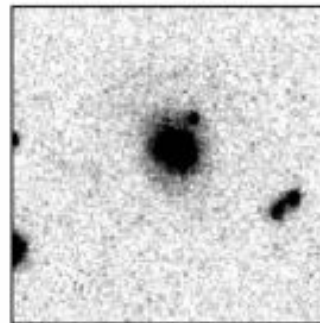
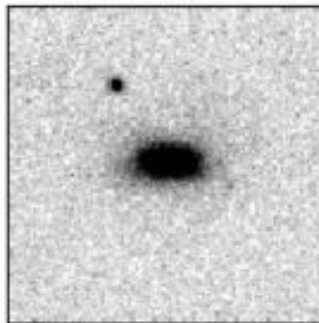
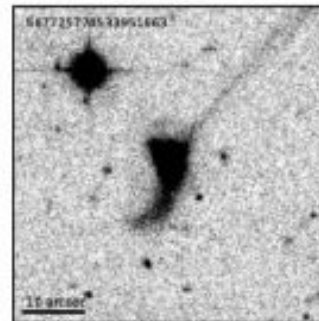
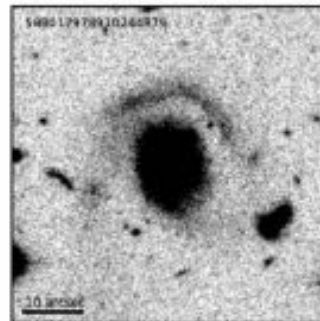
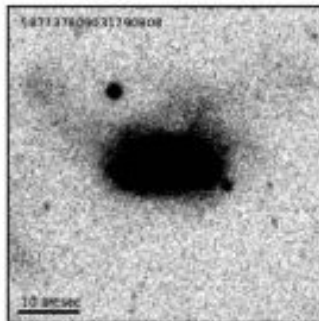
# UNIONS/CFIS vs. SDSS

CFIS

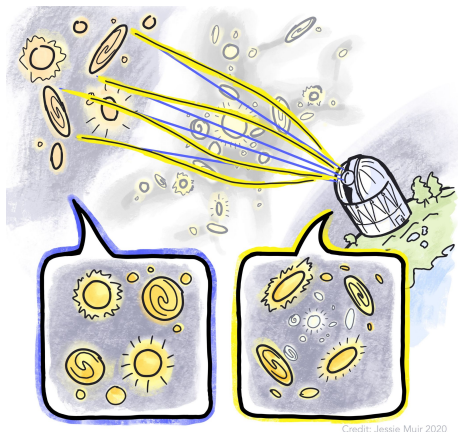
$r \sim 27.1 \text{ mag/arcsec}^2$

SDSS

$r \sim 24.4 \text{ mag/arcsec}^2$

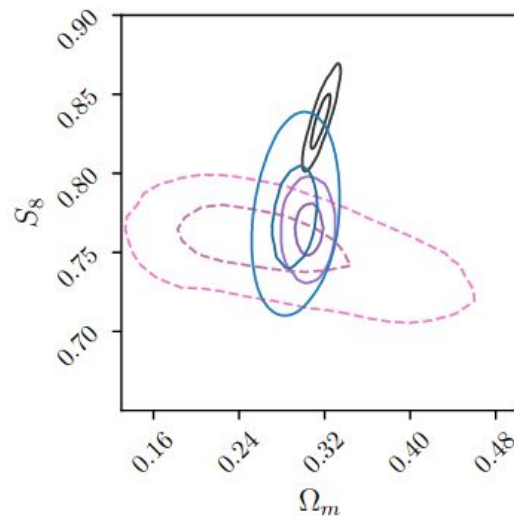
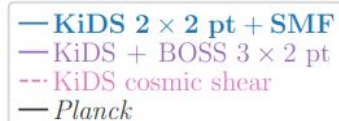


# Weak gravitational lensing



- Probe of (dark) matter distribution at large scales, and in clusters and galaxies
- Measures density amount and fluctuations amplitude (“ $\sigma_8$  /  $S_8$  tension”)
- Dark-energy dominated epoch

Dvornik, Heymans, Asgari et al. 2022



- “Weak” = galaxy shape distortions at %-level
  - $\ll$  intrinsic galaxy shapes
  - $\ll$  atmosphere & telescope distortions
- → Need dedicated pipeline to process massive amounts of data for high-precision galaxy shape measurements + calibration





# ShapePipe

A modular weak-lensing processing and analysis pipeline

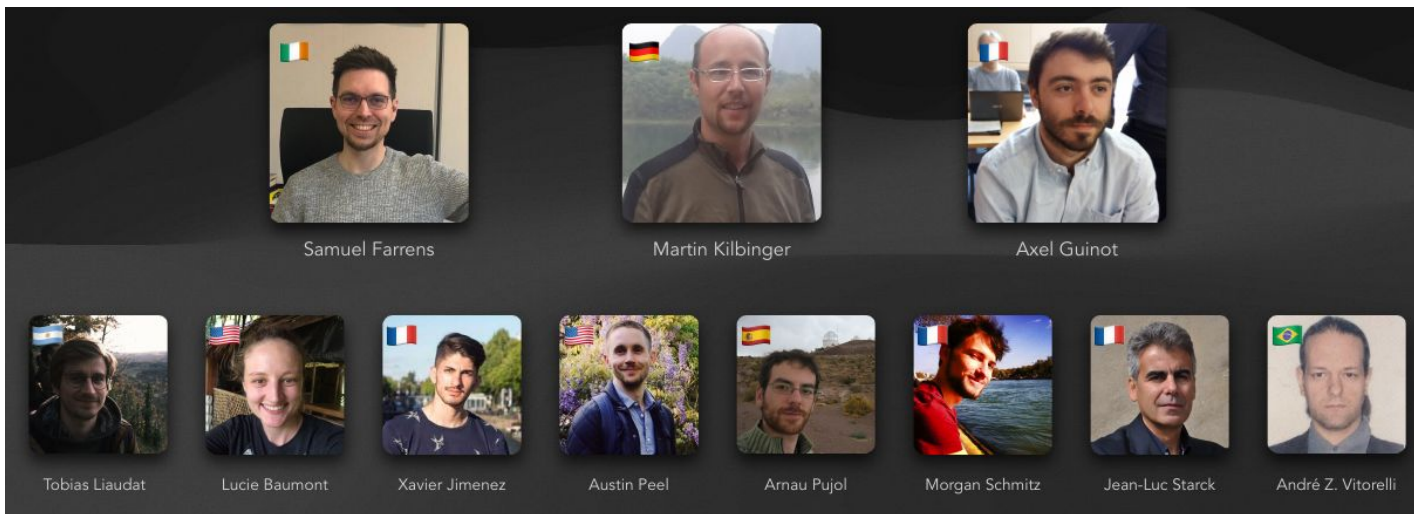
<https://github.com/cosmostat/shapepipe>

## ShapePipe

CI passing pages-build-deployment passing python 3.9 release v1.0.1

ShapePipe is a galaxy shape measurement pipeline developed within the CosmoStat lab at CEA Paris-Saclay.

See the [documentation](#) for details on how to install and run ShapePipe.





# ShapePipe

A modular weak-lensing processing and analysis pipeline

Software paper

Farrens et al., 2022, [A&A, 664, 141](#)

## ShapePipe: A modular weak-lensing processing and analysis pipeline

S. Farrens<sup>1</sup>\*, A. Guinot<sup>2</sup>, M. Kilbinger<sup>1</sup>, T. Liaudat<sup>1</sup>, L. Baumont<sup>1</sup>, X. Jimenez<sup>3</sup>, A. Peel<sup>4</sup>, A. Pujol<sup>1</sup>, M. Schmitz<sup>5</sup>, J.-L. Starck<sup>1</sup>, and A. Z. Vitorelli<sup>1</sup>

<sup>1</sup> AIM, CEA, CNRS, Université Paris-Saclay, Université Paris Diderot, Sorbonne Paris Cité, F-91191 Gif-sur-Yvette, France

<sup>2</sup> Université de Paris, CNRS, Astroparticule et Cosmologie, F-75013 Paris, France

<sup>3</sup> Université Paris-Saclay, CNRS, ENS Paris-Saclay, Centre Borelli, 91190, Gif-sur-Yvette, France

<sup>4</sup> Institute of Physics, Laboratory of Astrophysics, Ecole Polytechnique Fédérale de Lausanne (EPFL), Observatoire de Sauverny, 1290 Versoix, Switzerland

<sup>5</sup> Université Côte d'Azur, Observatoire de la Côte d'Azur, CNRS, Laboratoire Lagrange, Bd de l'Observatoire, CS 34229, 06304 Nice Cedex 4, France

### ABSTRACT

We present the first public release of SHAPEPIPE, an open-source and modular weak-lensing measurement, analysis, and validation pipeline written in Python. We describe the design of the software and justify the choices made. We provide a brief description of all the modules currently available and summarise how the pipeline has been applied to real Ultraviolet Near-Infrared Optical Northern Survey data. Finally, we mention plans for future applications and development. The code and accompanying documentation are publicly available on GitHub.

**Key words.** Gravitational lensing: weak – Methods: data analysis





# ShapePipe

## Goals



- Modular
- Easy
- Fast (enough)
- Robust

## Code installation



- Conda
- Docker (in prep)
- CD/CI

## Three components

### Pipeline



- Arguments & config
- I/O
- Job handling (MPI, SMP)
- Errors & logging

### Modules



- WL data processing
- Book-keeping

### Utilities



- Scripts
- Tools
- Survey-specific stuff



# ShapePipe modules

Input images are pre-processed (calibrated for astrometry and photometry)

## Main processing

- Mask
- Detect objects
  - Star candidates on single exposures
  - Galaxy candidates and stacks
- Select stars
- (Select galaxies)
- Create PSF model
- Interpol PSF model to galaxy positions
- Validate PSF model
- Measure galaxy shapes

## Further processing

- Process multi-band images (joint photometry)
- Match with (external) catalogue
- Create random catalogue



# Masking

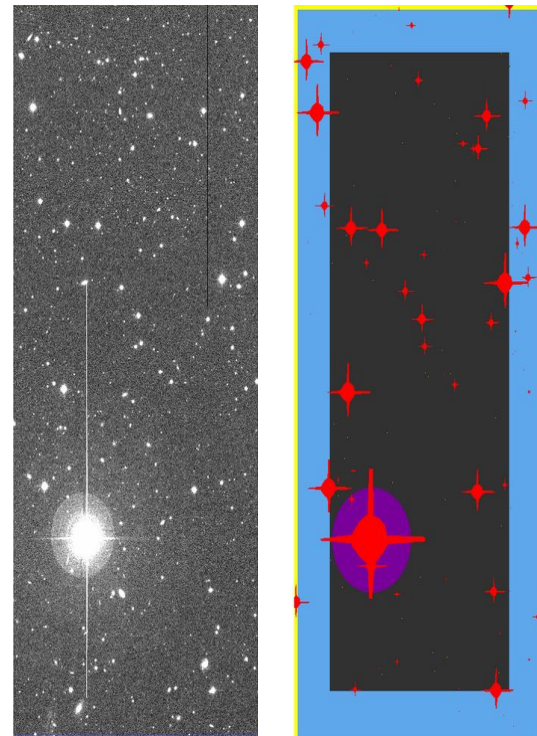
Image artefacts: spurious detections as galaxies, contaminations to weak-lensing shear (correlations).

We mask:

- Halos and diffraction spikes of bright halos (from Guide Star Catalogue GSC II)
- Messier & NGC objects
- CCD borders

Already masked in pre-processing:

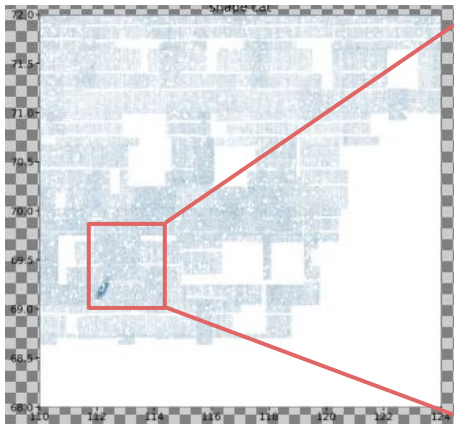
- cosmic rays (somewhat)
- bad columns



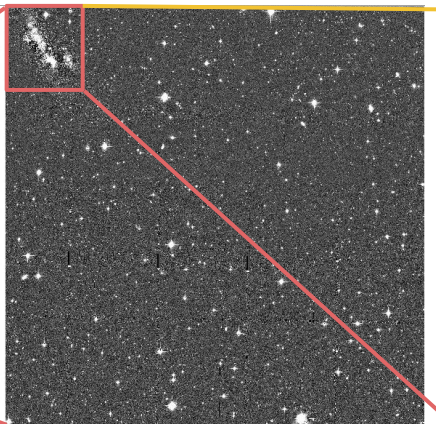


# Masking: example

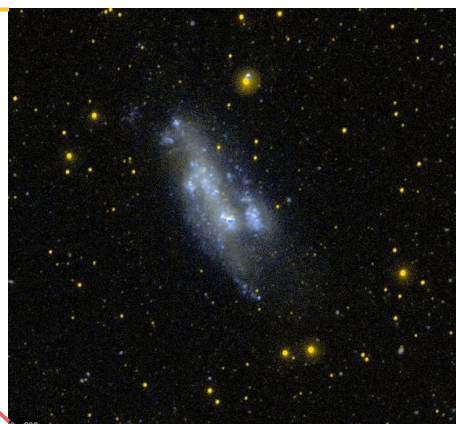
Detections in a 50 deg<sup>2</sup> area



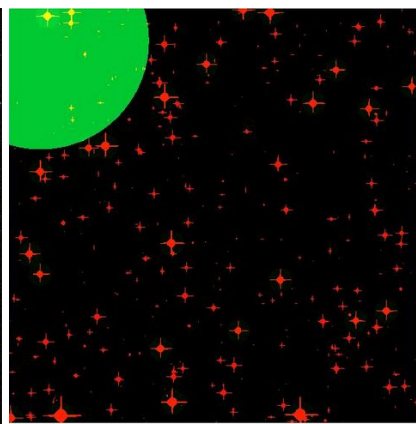
Stacked image



NGC 2366 (UGC 3851)



Add mask



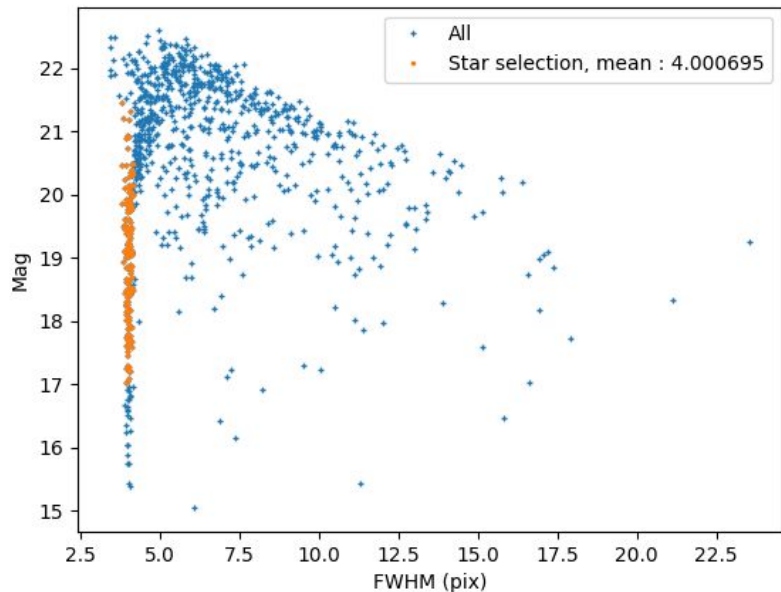
Knots in nearby galaxies create spurious detections as WL galaxies, need to be removed from analysis.



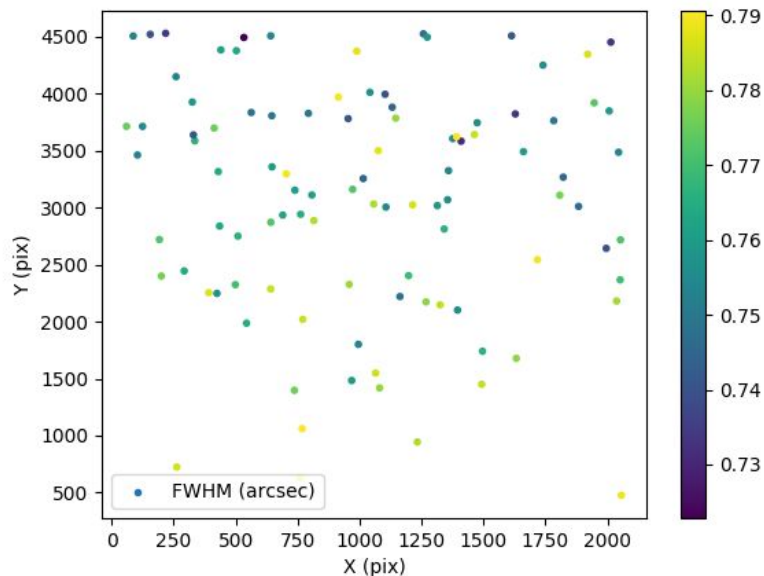
# Star selection

Use stars to create PSF model.

Star selection



Stars FWHM in field



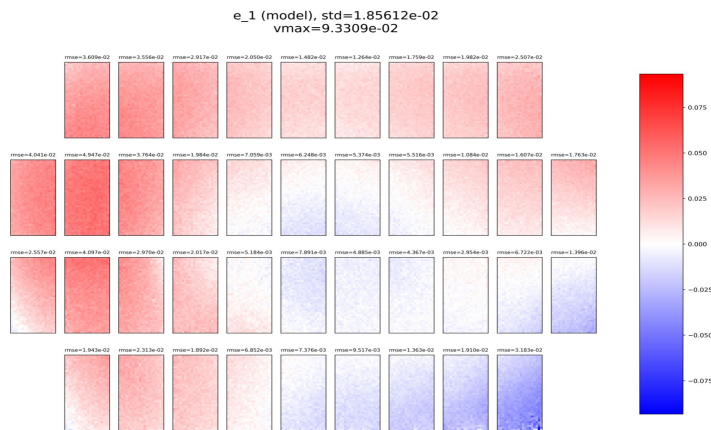


# PSF model

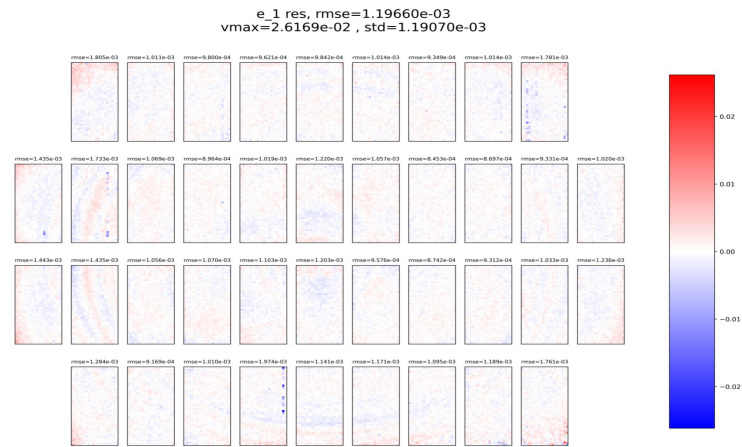
Two models can be used:

- PSFEx, Bertin et al. 2011
- MCCD, Liaudat et al. 2021, [A&A, 646, A27](#)

Stacked MegaCAM focal plane



PSF ellipticity component 1



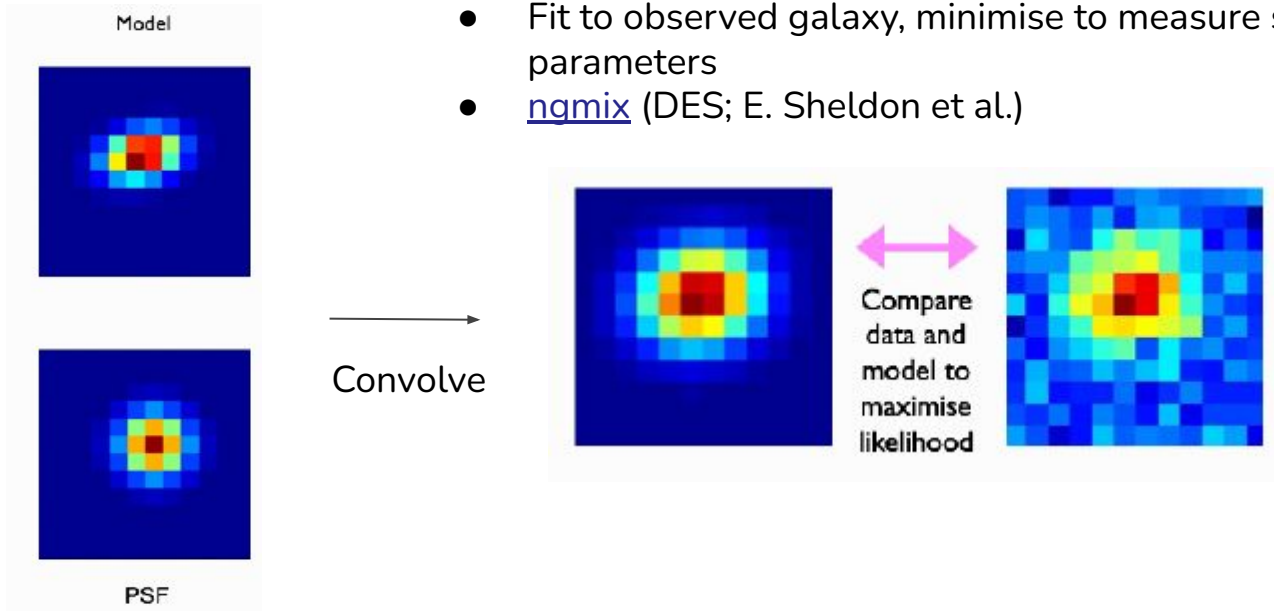
PSF ellipticity residual component 1





# Galaxy shape measurement

- Simple model for galaxy light profile (Gaussian)
- Convolve model with PSF
- Fit to observed galaxy, minimise to measure shape parameters
- [ngmix](#) (DES; E. Sheldon et al.)





# (Meta-)Calibration

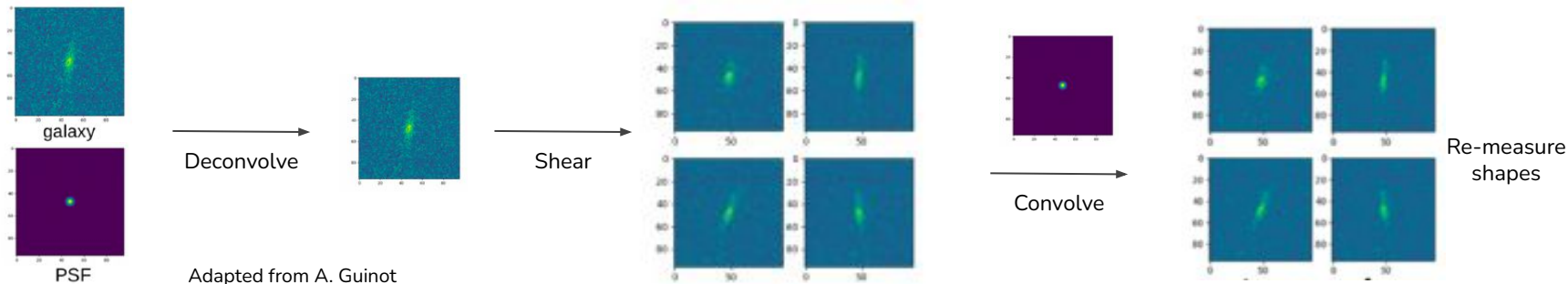
- Weak-lensing shapes are biased (noise, wrong model or PSF, blended galaxies).
- Multiplicative bias  $\mathbf{R}$  most important:

$$\mathbf{y}^{\text{obs}} = \mathbf{R} \mathbf{y}^{\text{true}} + \mathbf{c}$$

- Interpret  $\mathbf{R}$  as response of the observed shape to a (small) shear:

$$\mathbf{R} = d\mathbf{y}^{\text{obs}} / d\mathbf{y}^{\text{true}} \approx [ \mathbf{y}^{\text{obs}}(\mathbf{y}^{\text{true}} + \delta\mathbf{y}) - \mathbf{y}^{\text{obs}}(\mathbf{y}^{\text{true}} - \delta\mathbf{y}) ] / [ 2 \delta\mathbf{y} ]$$

- $\mathbf{R}$  can be measured by applying small artificial shear  $\delta\mathbf{y}$  to each observed galaxy.





# Some early results

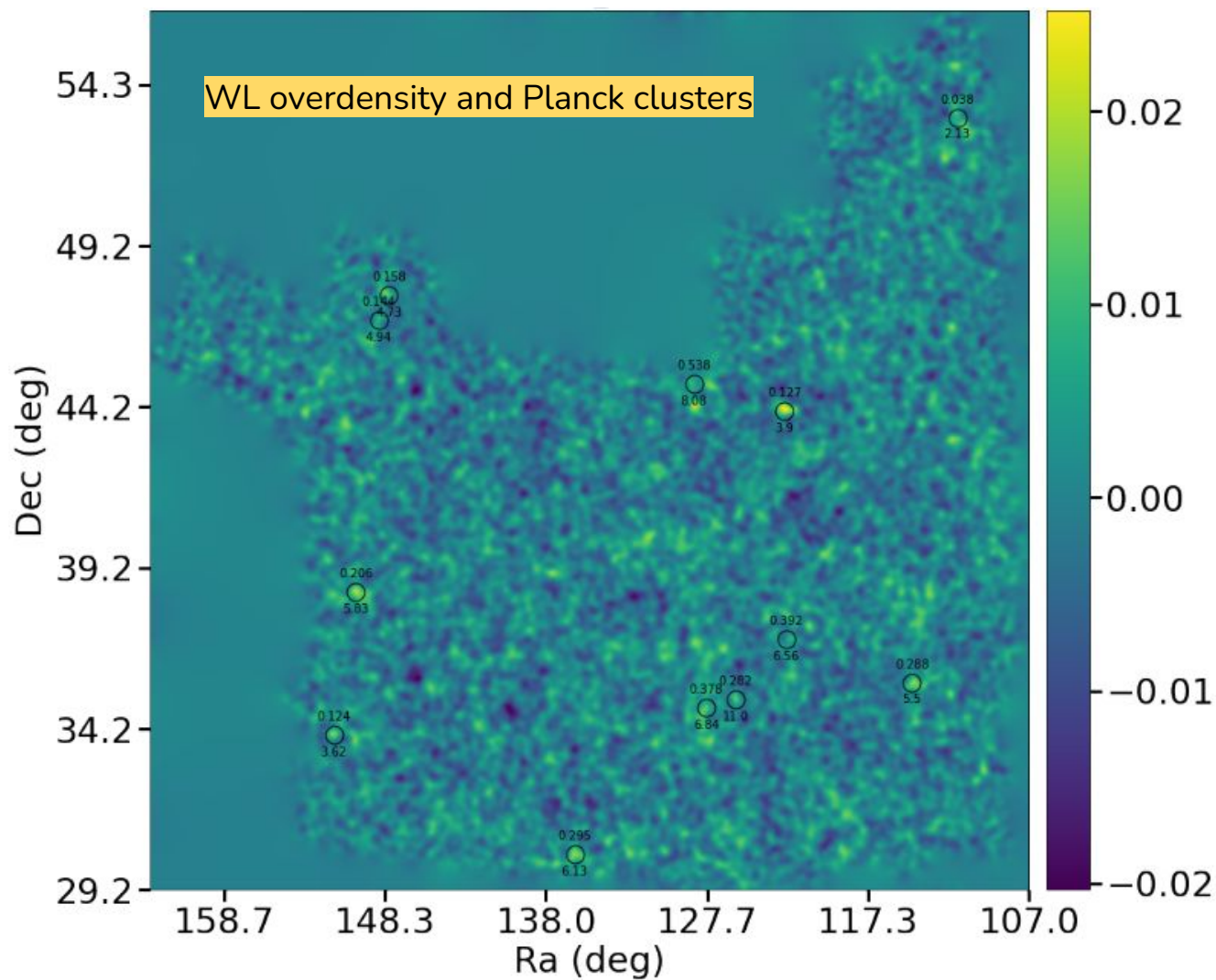
- Mass maps, cluster convergence & masses
- Halo ellipticity
- Peak counts
- Intrinsic galaxy alignment
- Void lensing

## Future publications

- Blinded (redshift distribution)
- Two pipelines (ShapePipe and *lensfit*)



# Mass maps



Guinot et al. (2021)



# Mass

WL overdensity and Planck clusters

0.038  
2.13

54.3  
49.2

$\kappa_E$  map

$\kappa_B$  map

Stacked overdensity

Overdensity (E-mode)

Systematic (B-mode)

0.02

0.01

0.00

-0.01

-0.02

Guinot et al. (2021)

Martin Kilbinger (CEA CosmoStat)

158.7 148.3 138.0 127.7 117.3 107.0

Ra (deg)

# Mass

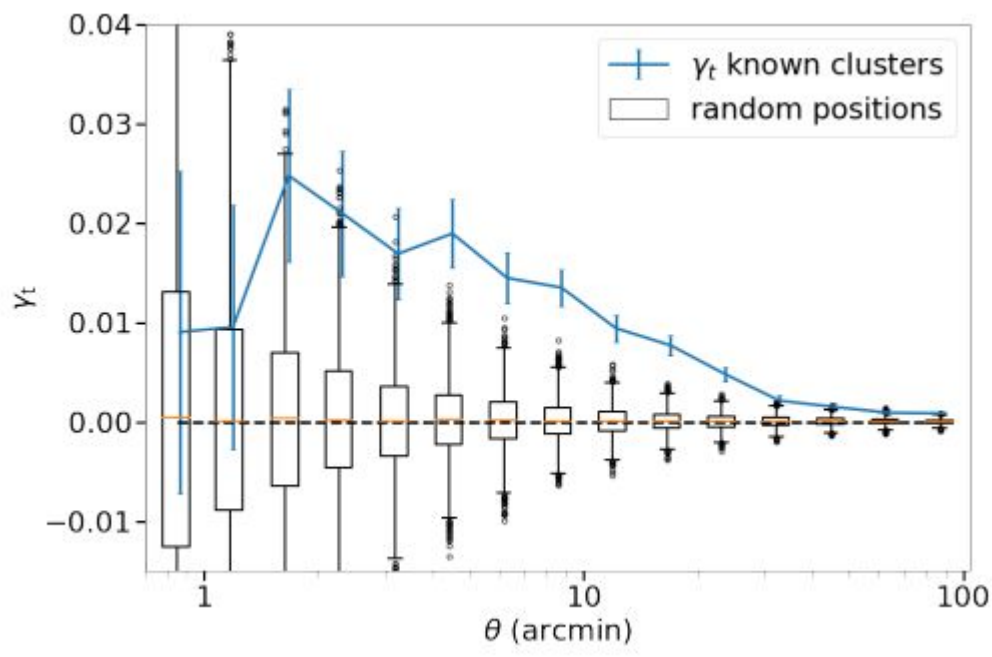
WL overdensity and Planck clusters

0.038  
2.13  
-0.02

$\kappa_E$  map

Stacked ov

Overdensity (E-mode)



-0.004  
-0.02

Guinot et al. (2021)

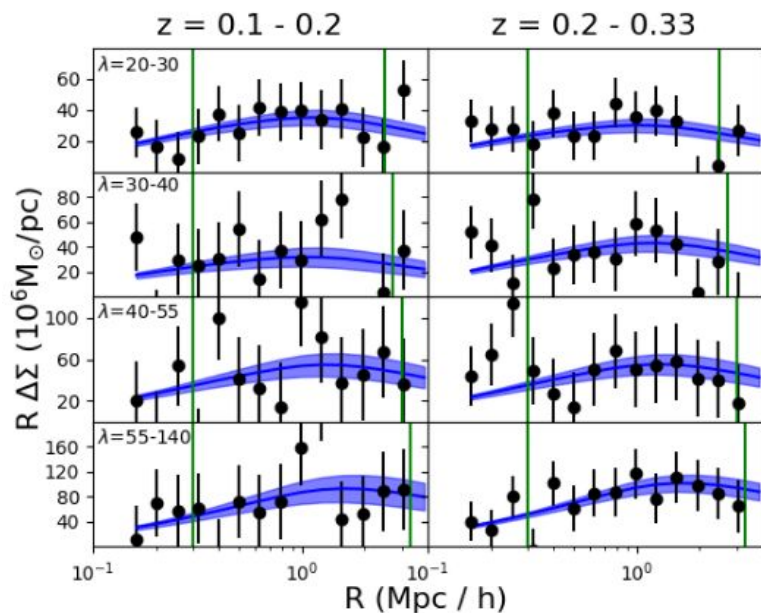
Martin Kilbinger (CEA CosmoStat)

158.7 148.3 138.0 127.7 117.3 107.0  
Ra (deg)

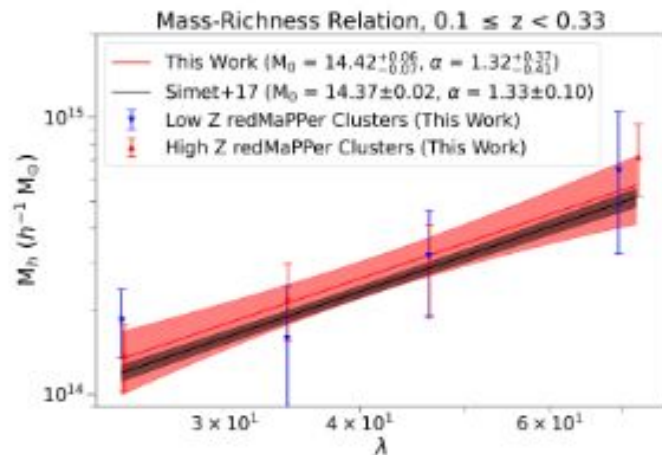


# Group and cluster masses

Overdensity around SDSS redMaPPer groups



Spitzer et al. (2022)

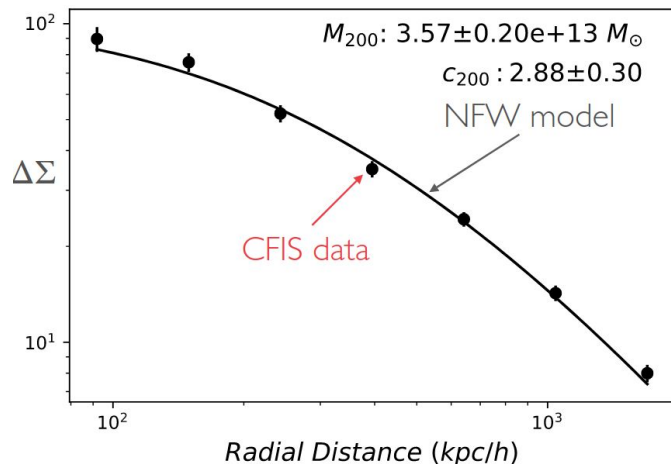




# Dark-matter halo shapes

WL halo profile of 146,000 SDSS DR7  
Luminous Red Galaxies (LRGs).

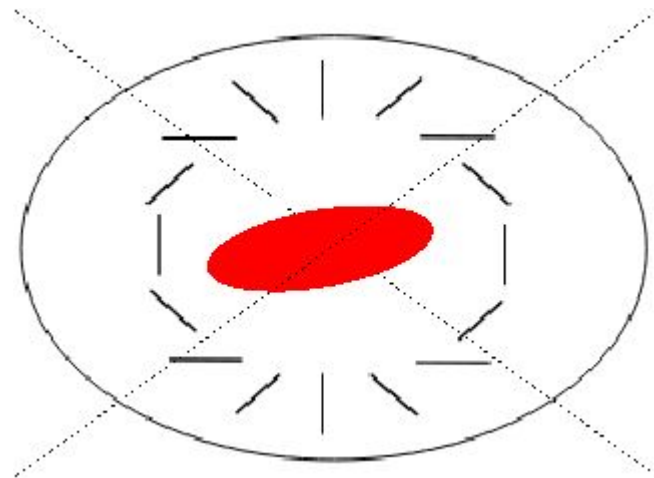
## Monopole.



Can we measure the **quadrupole**?

→ halo shape

Stack LRGs along galaxy orientation

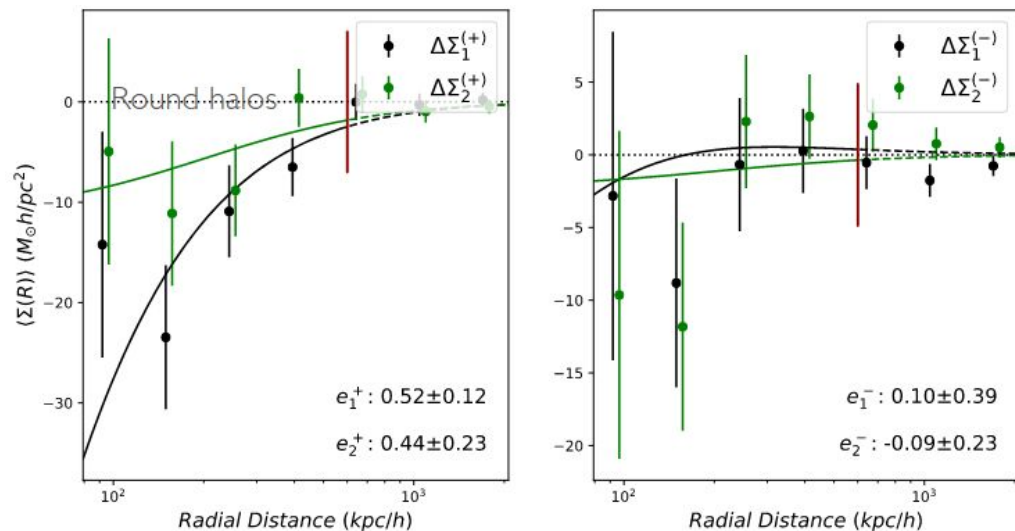


Robison et al, 2022

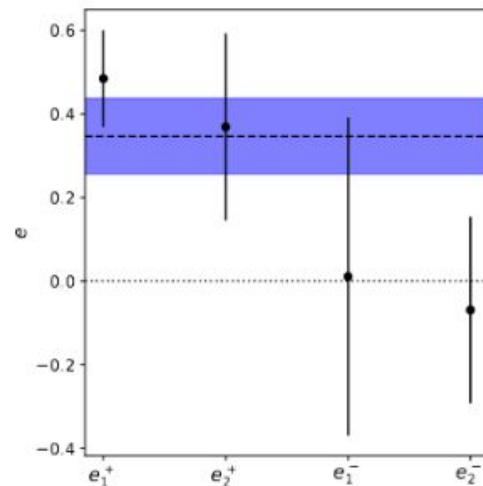


# Dark-matter halo shapes

WL halo profile quadrupole estimators.



Robison et al, 2022

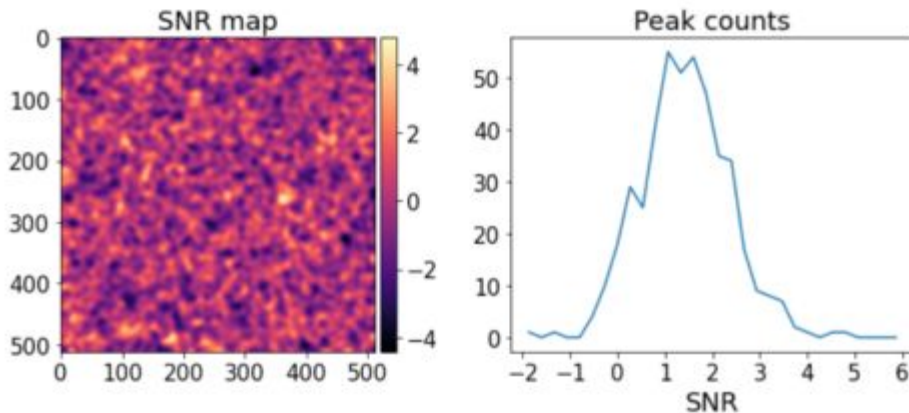


$e = 0.35 \pm 0.09$  ( $\sim 4\sigma$  detection of DM halo ellipticity)



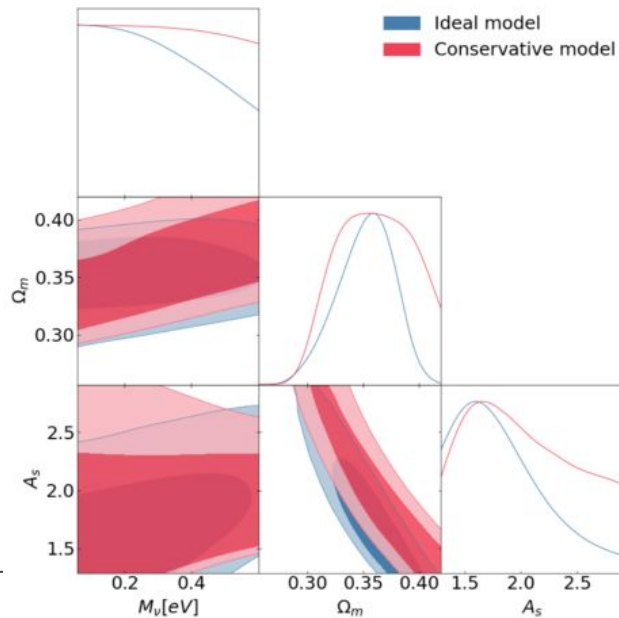
# Peak counts

Number of peaks in WL overdensity ( $\delta$  / noise) map depends on cosmological parameters.



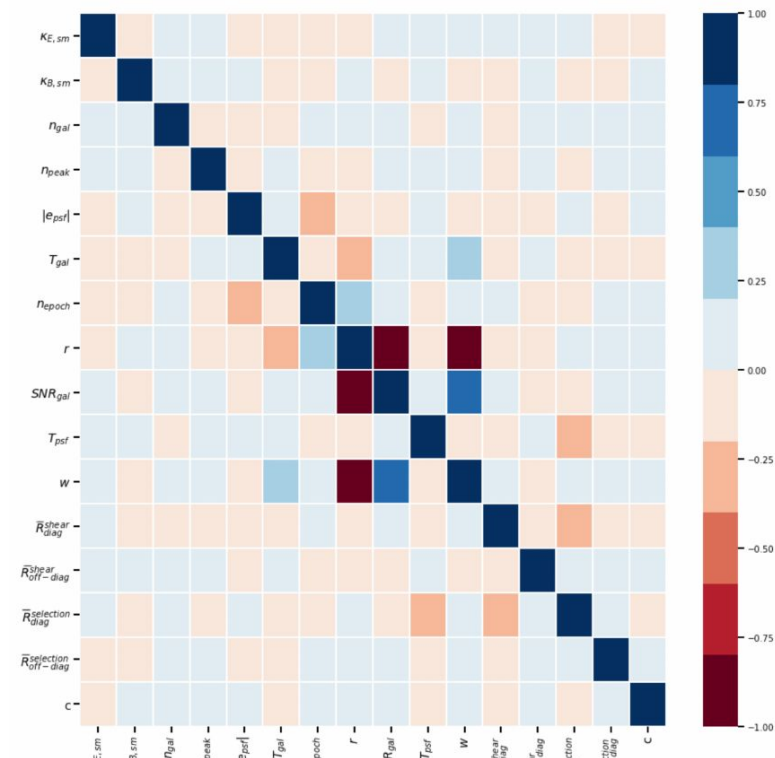
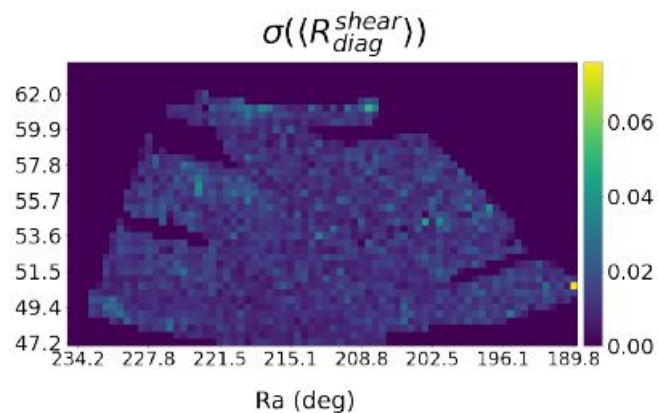
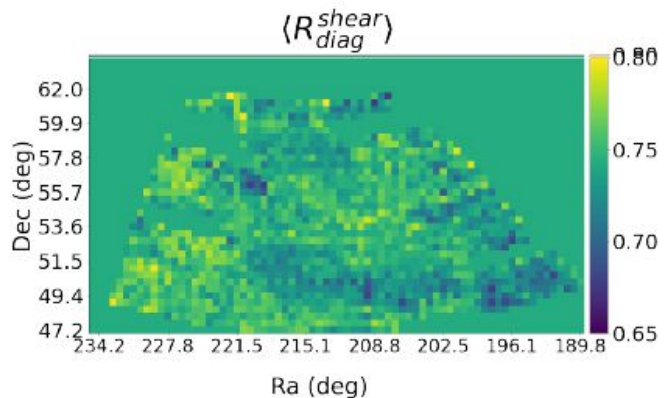
Study of systematic effects:

- Local shear calibration
- Baryonic effects
- Intrinsic alignments
- Redshift uncertainty



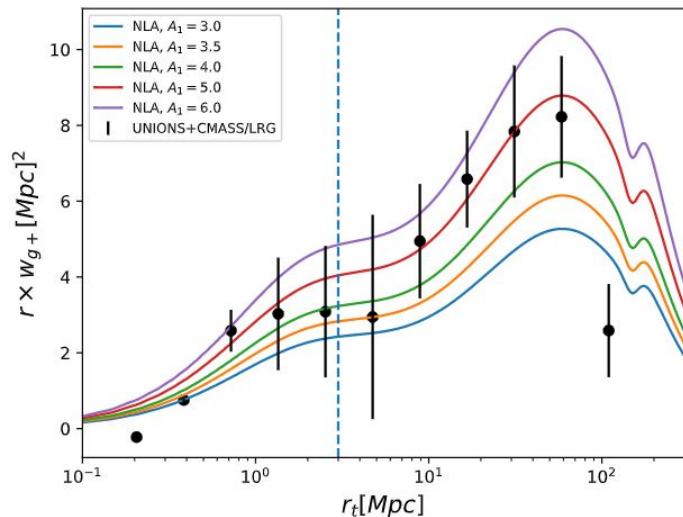
Ayçoberry et al, 2022

# Peak counts & local calibration



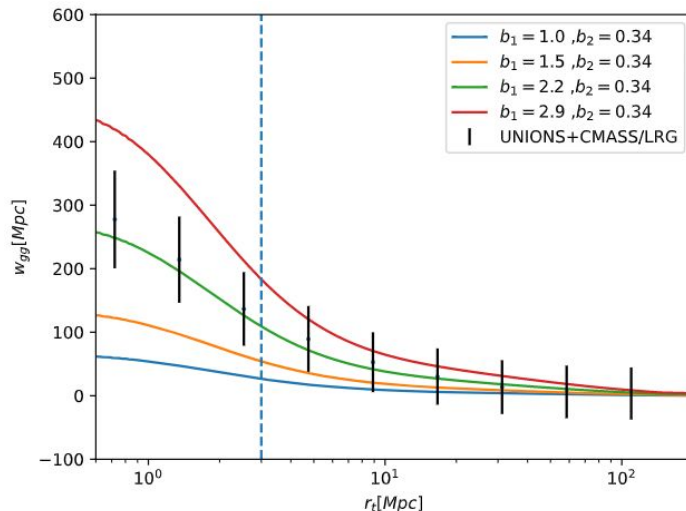
# Intrinsic galaxy alignment

“Lensing” galaxies at same  $z$  as LRGs:  
Measure intrinsic alignment amplitude.



From Fabian Hervás Peters

“Lensing” galaxies behind LRGs:  
Measure galaxy bias.







# ShapePipe

A modular weak-lensing processing and analysis pipeline

Software paper

Farrens et al., 2022, [A&A, 664, 141](#)

Code & documentations

<https://github.com/cosmostat/shapepipe>

UNIONS first weak-lensing analysis

Guinot et al., 2022, [A&A, 666, A162](#)

Group & cluster masses

Spitzer et al., 2022, submitted to MNRAS

Dark-matter halo shapes

Robison et al., 2022, [arXiv:2209.09088](#)

Peak counts

Ayçoberry et al., 2022, [A&A in press](#)

Multi-CCD PSF model

Liaudat et al., 2021, [A&A, 646, A27](#)

*In progress*

Intrinsic galaxy alignment

Void lensing

Cosmic shear, constraints on  $\Omega_m$ ,  $\sigma_8$ , DE

Peak counts II

Lensing by AGNs,  $M_{\text{BH}}$  -  $M_{\text{halo}}$  relation

Analysis of CFHT P.I. data (rotating galaxy cluster, FRB field)



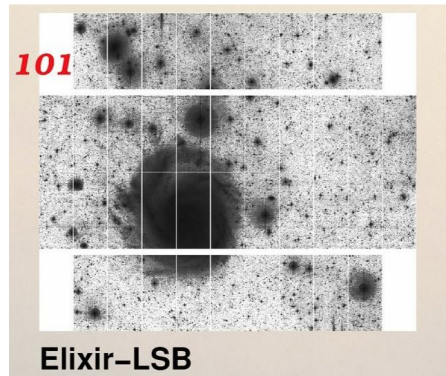
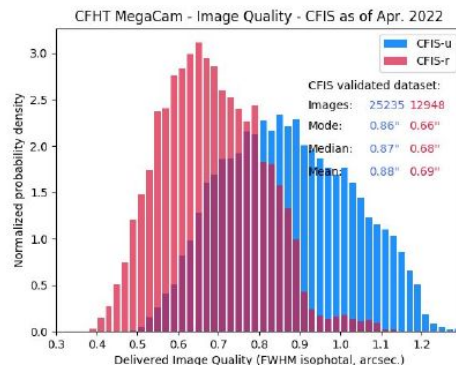
# Backup slides



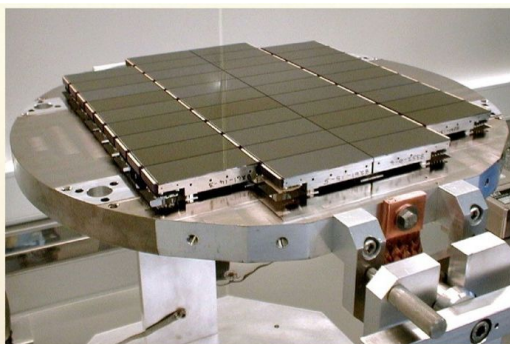
# UNIONS/CFIS

Best wide-field imager on CFHT ever.

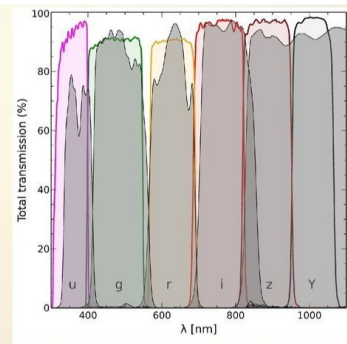
Improvements (2011 - 2014)



Dome venting



40 CCDs + Fast readout



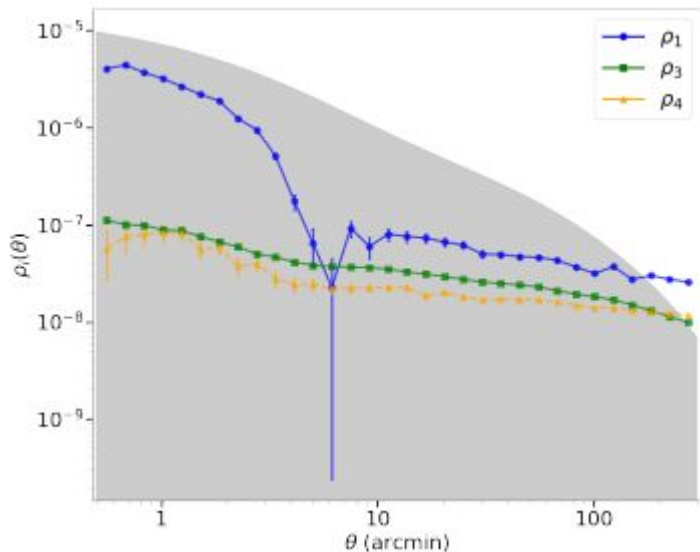
New "square" filters

UNIONS is basically a static LSST in the North, not likely to be outperformed any time soon.

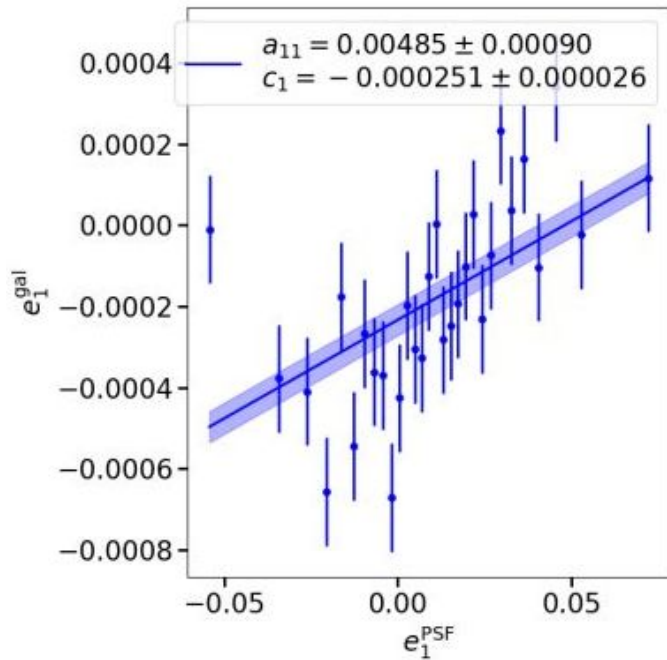


# PSF diagnostics

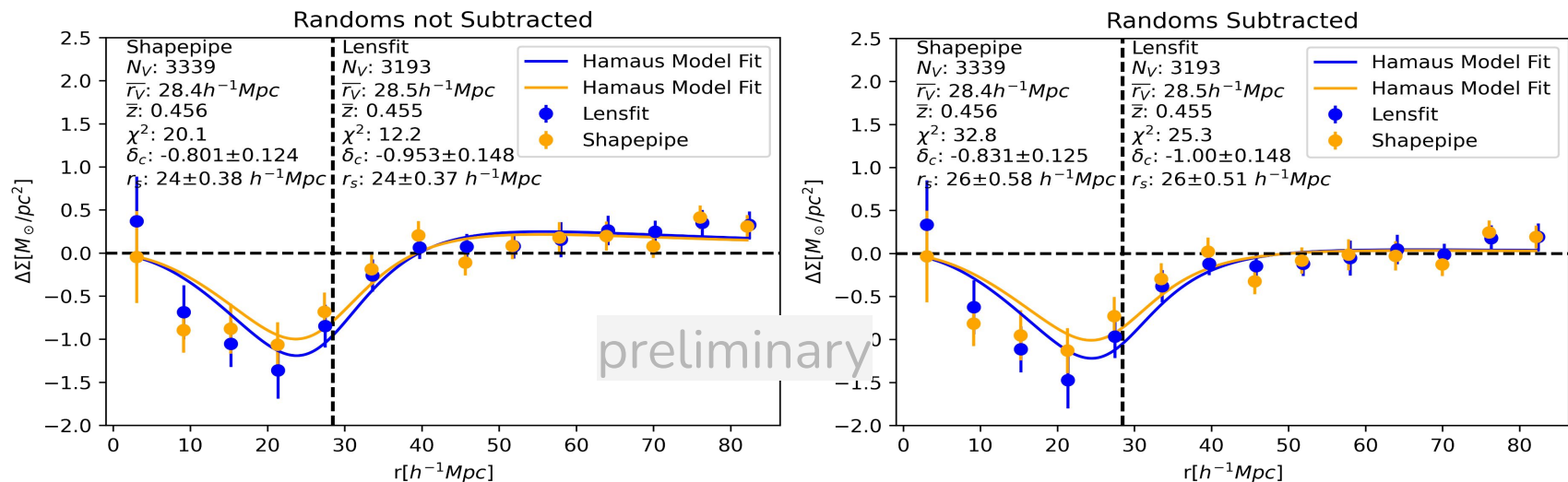
PSF residual correlation functions,  
propagation to cosmology.



PSF leakage into galaxy ellipticity



# Void lensing (previous WL catalogues)



# Void lensing

$$\frac{\rho_V(r)}{\bar{\rho}} - 1 = \delta_c \frac{1 - (r/r_s)^\alpha}{1 + (r/r_V)^\beta}$$

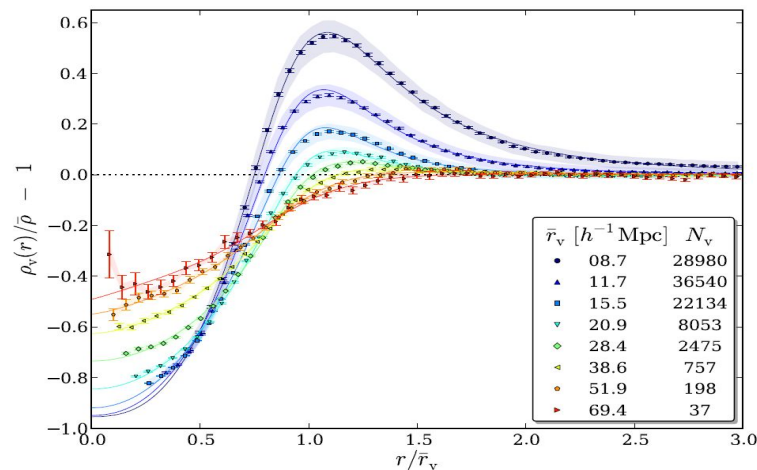
2 free parameters:  $\delta_c$  and

$$\Sigma_H(y) = 2 \int_y^{\infty} \frac{(\rho_V(r) - \bar{\rho})r}{\sqrt{r^2 - y^2}} dr$$

$$\Delta\Sigma = \overline{\Sigma(< r)} - \Sigma(r)$$

Citation: Hamaus N., Sutter P. M., Wandlet B. D., 2014, Phys. Rev. Lett., 112, 251302

Universal density profile



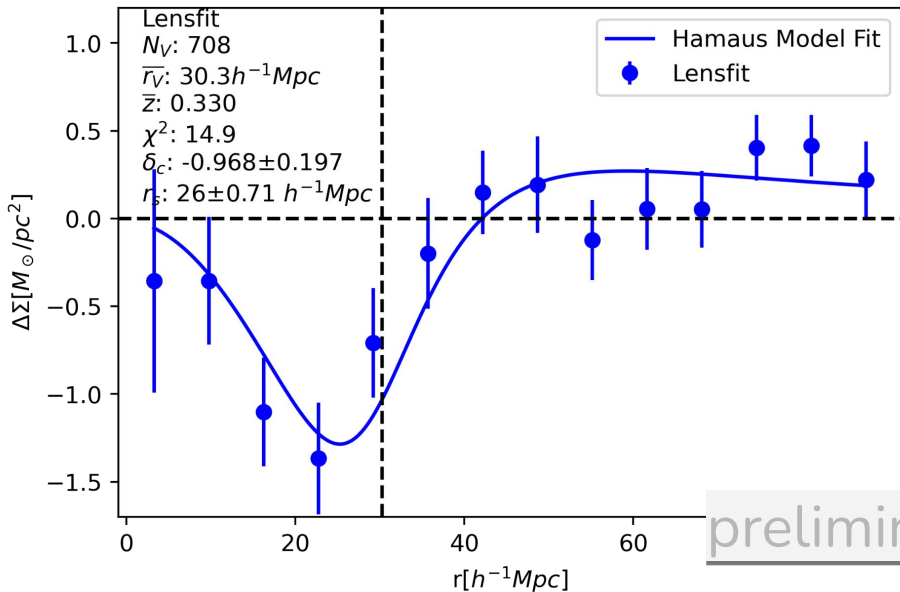
Fits of overdensity profiles of stacked simulated voids at redshift of 0. Source: (Hamaus et al. 2014)



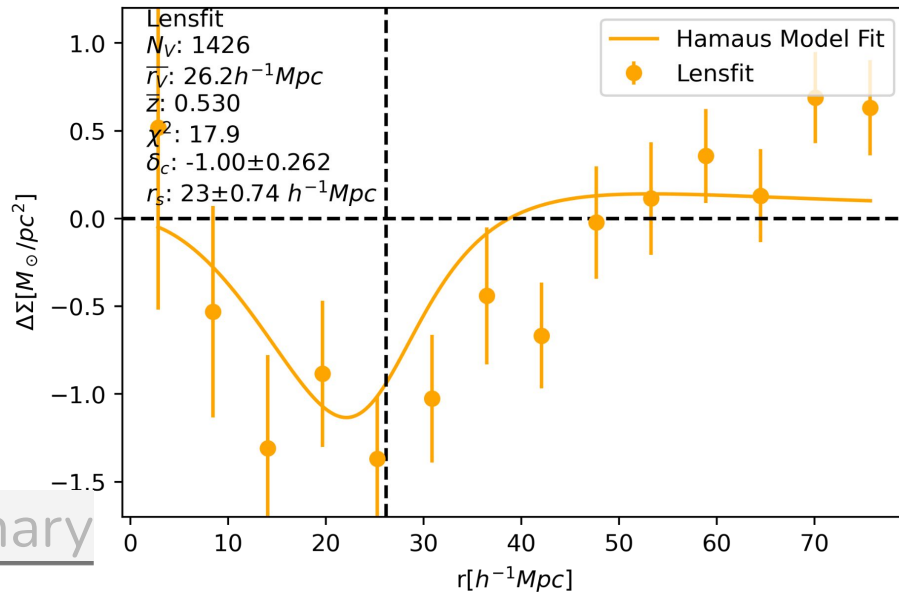


# Void lensing

LF LOWZ, Random Covariance

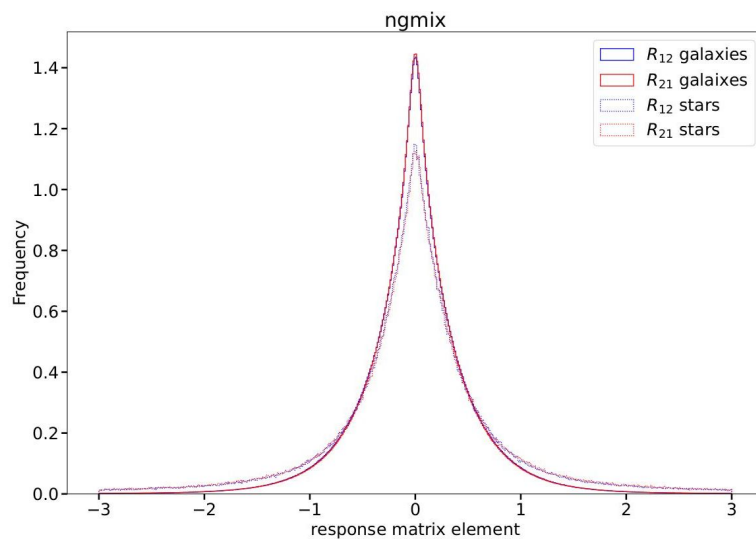
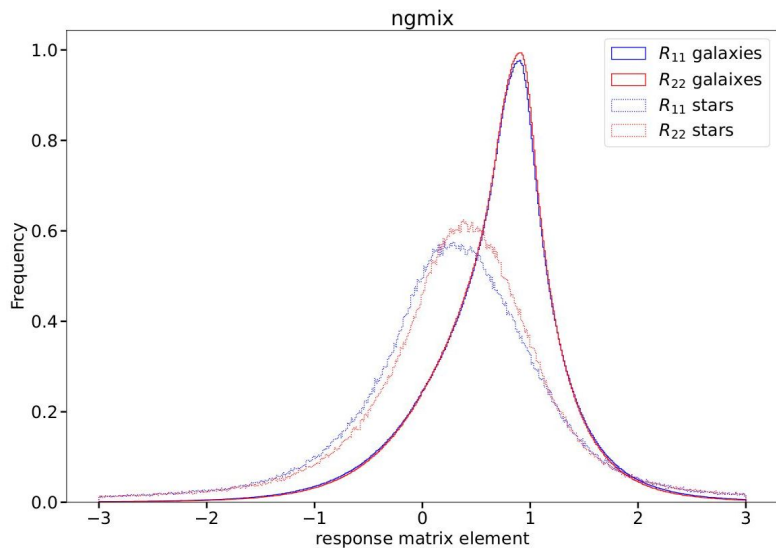


LF CMASS, Random Covariance



From Hunter Martin, Mike Hudson

# Metacalibration response matrix



Galaxies:  $\langle R \rangle \sim 0.7$ , 30% bias. Stars:  $\langle R \rangle \sim 0-0.2$ , stars are point sources, no/small response to shear.