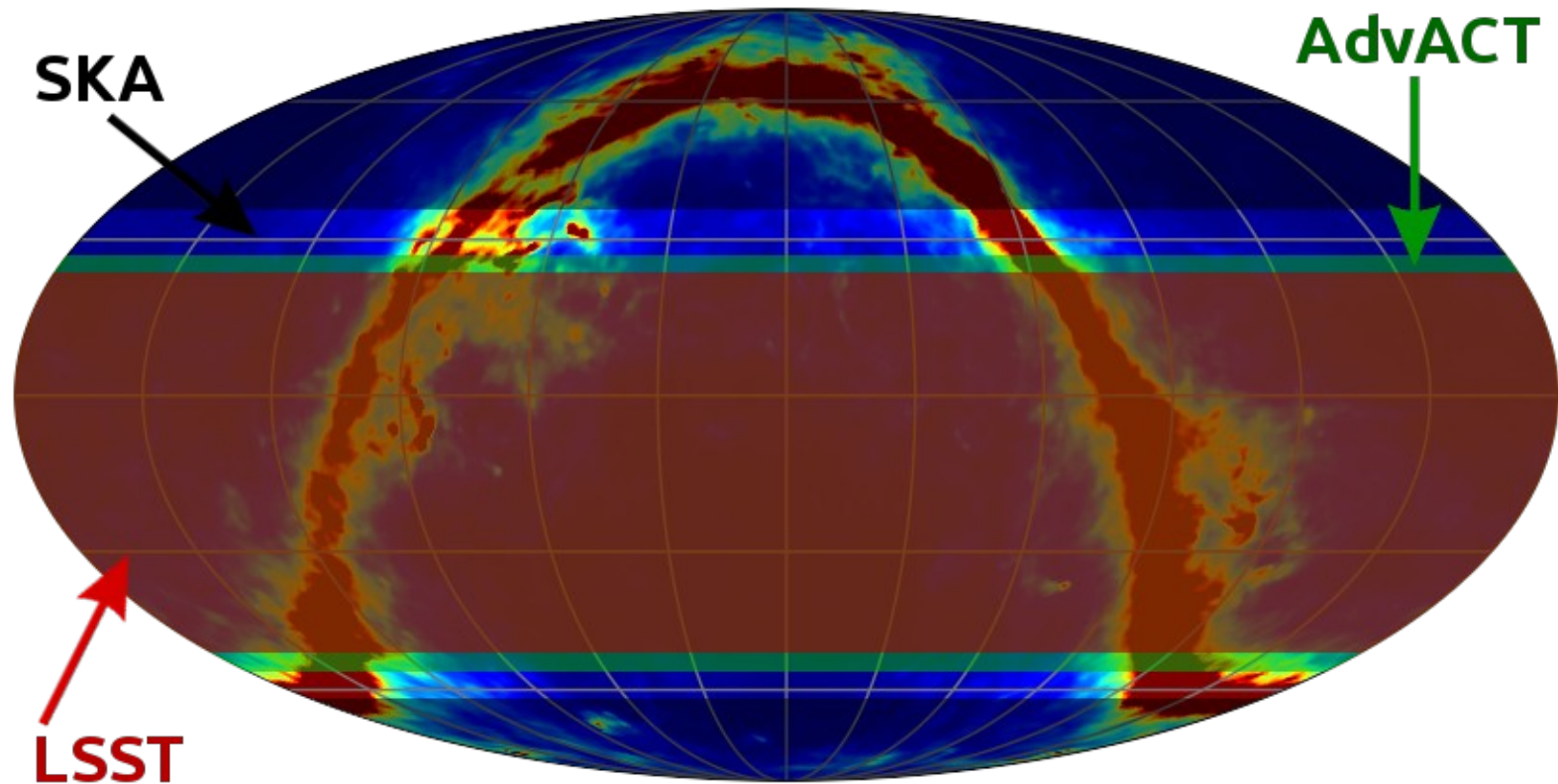


Multi-tracer science with optical and radio surveys

David Alonso – Oxford Astrophysics



ArXiv: 1405.1751, 1409.8667, 1505.07596, 1507.03550, 1604.01382

In collaboration with: P. Ferreira, M. Santos, R. Maartens, P. Bull, T. Louis

IFT-UAM, June 2016

2020



LSST

AdvACT

SKA-MID

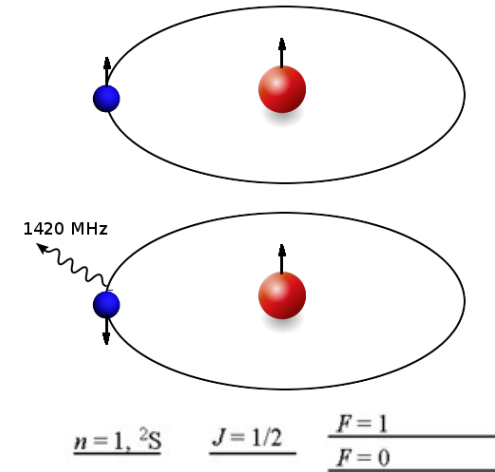
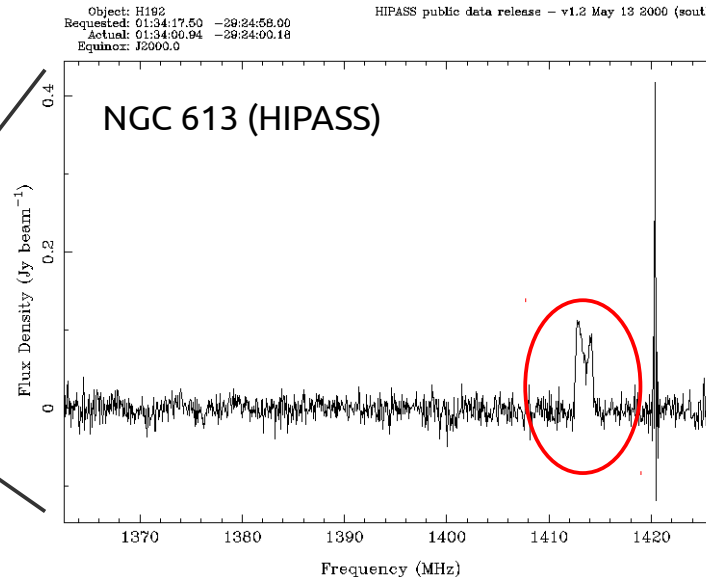
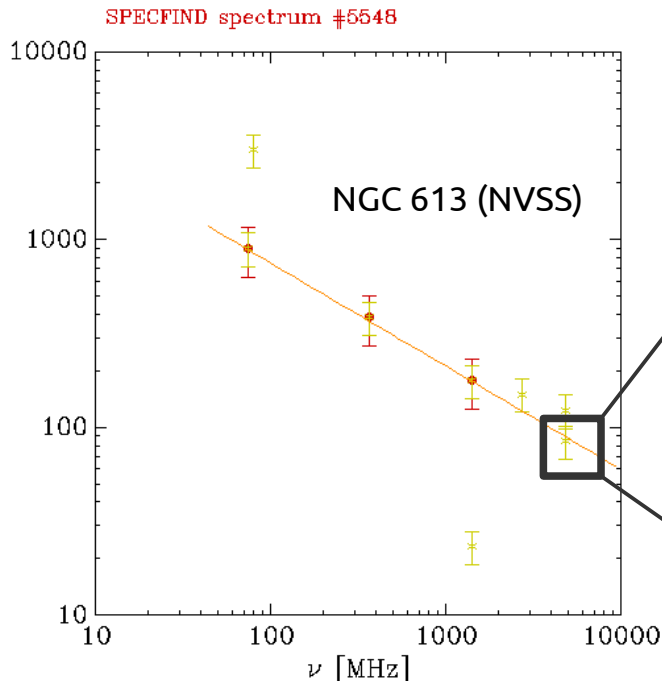
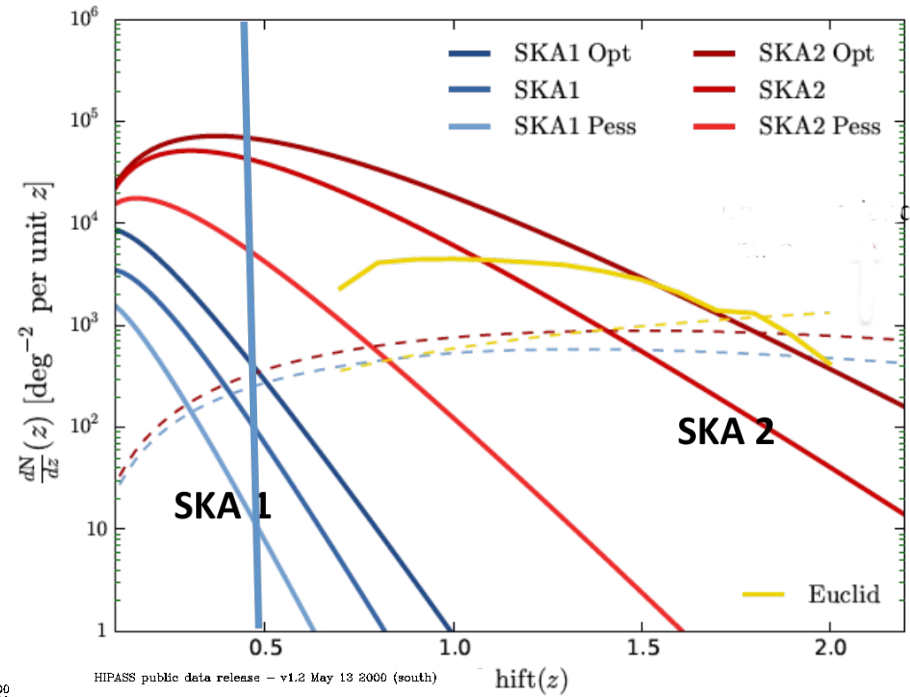
SKA-LOW

1. SKA and HI intensity mapping

Cosmological radio signals

The astrophysical radio spectrum

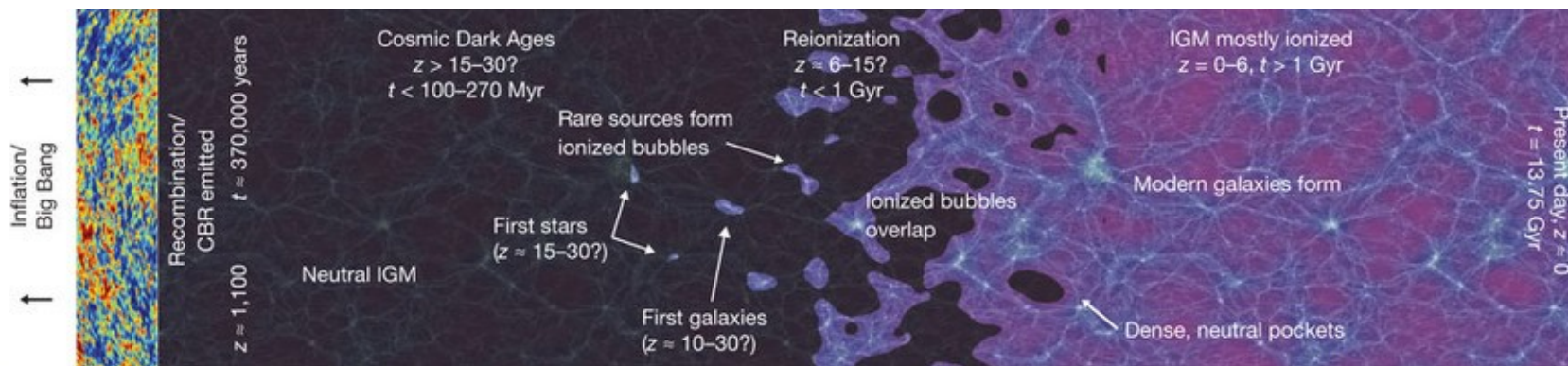
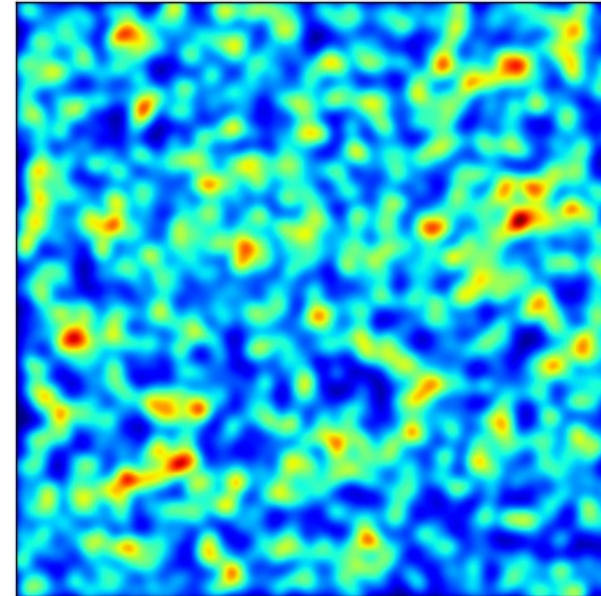
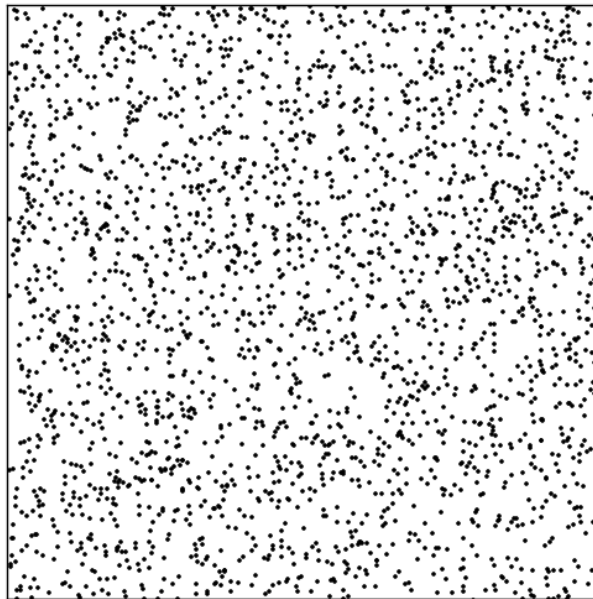
- Characterized by featureless continuum emission (e.g. synchrotron).
- Few radio lines. Mainly neutral hydrogen (HI).
- Costly to measure for individual sources.



HI intensity mapping

- Large pixels: joint emission from multiple galaxies instead of resolving them.
- We only care about large scales
- “Cheap” way to observe large volumes

Battye, Davies & Weller 2004



SKA

Two experiments:

- SKA-LOW: 50-350 MHz
- SKA-MID: 350 MHz – 14 GHz

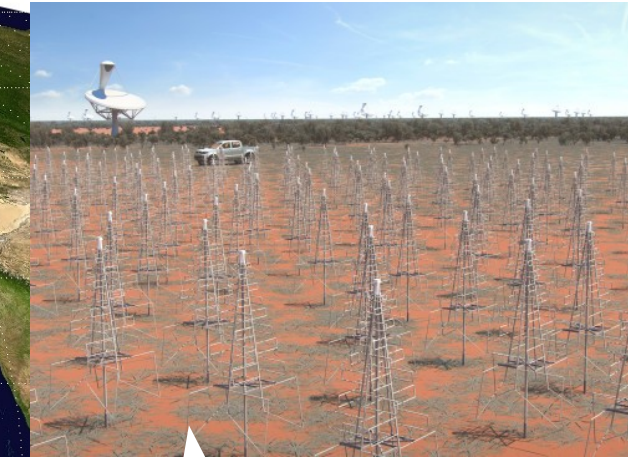
Many science cases:

- Continuum survey: no z , many sources
- Weak lensing (with the above)
- HI survey: good z , few sources
- **HI intensity mapping ($z < 3$)**
- EoR ($z > 3$)
- Non-cosmological (e.g. pulsars)

SKA-MID

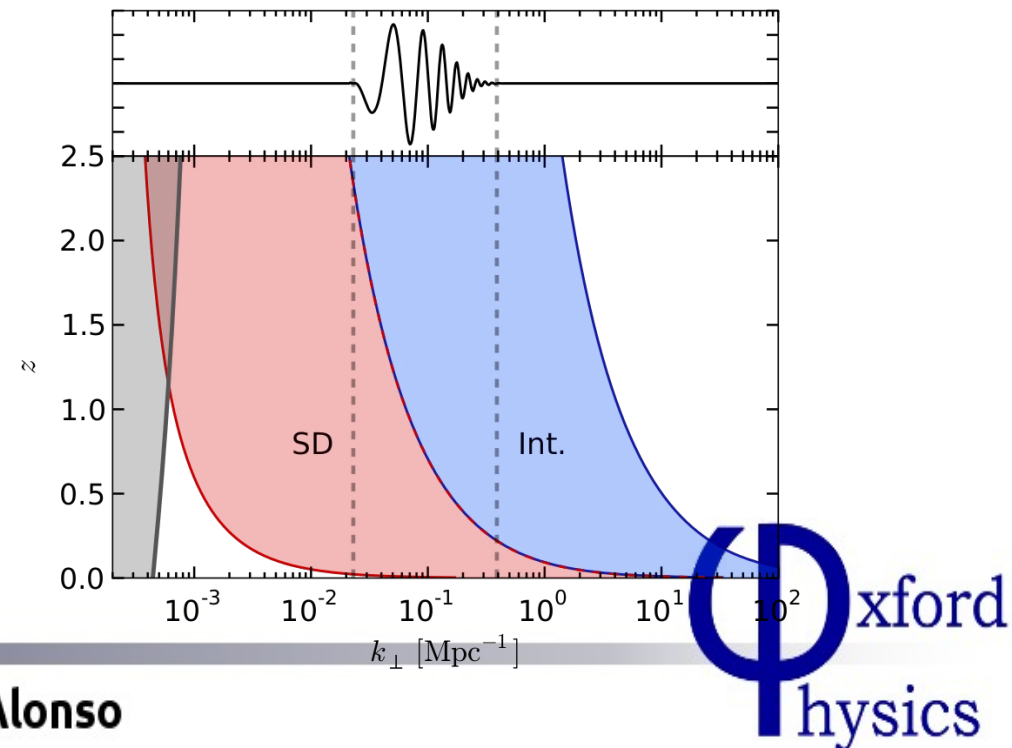
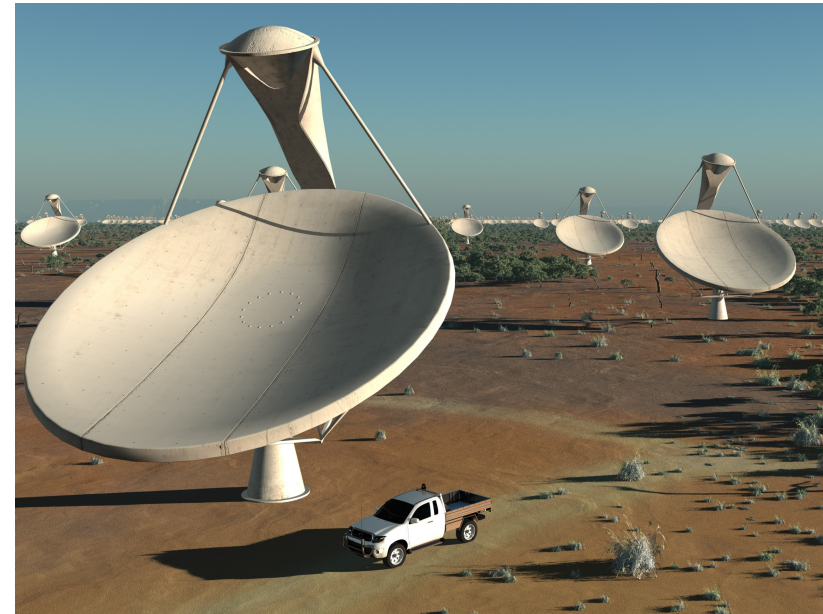
SKA-LOW

Maartens et al. 1501.04076



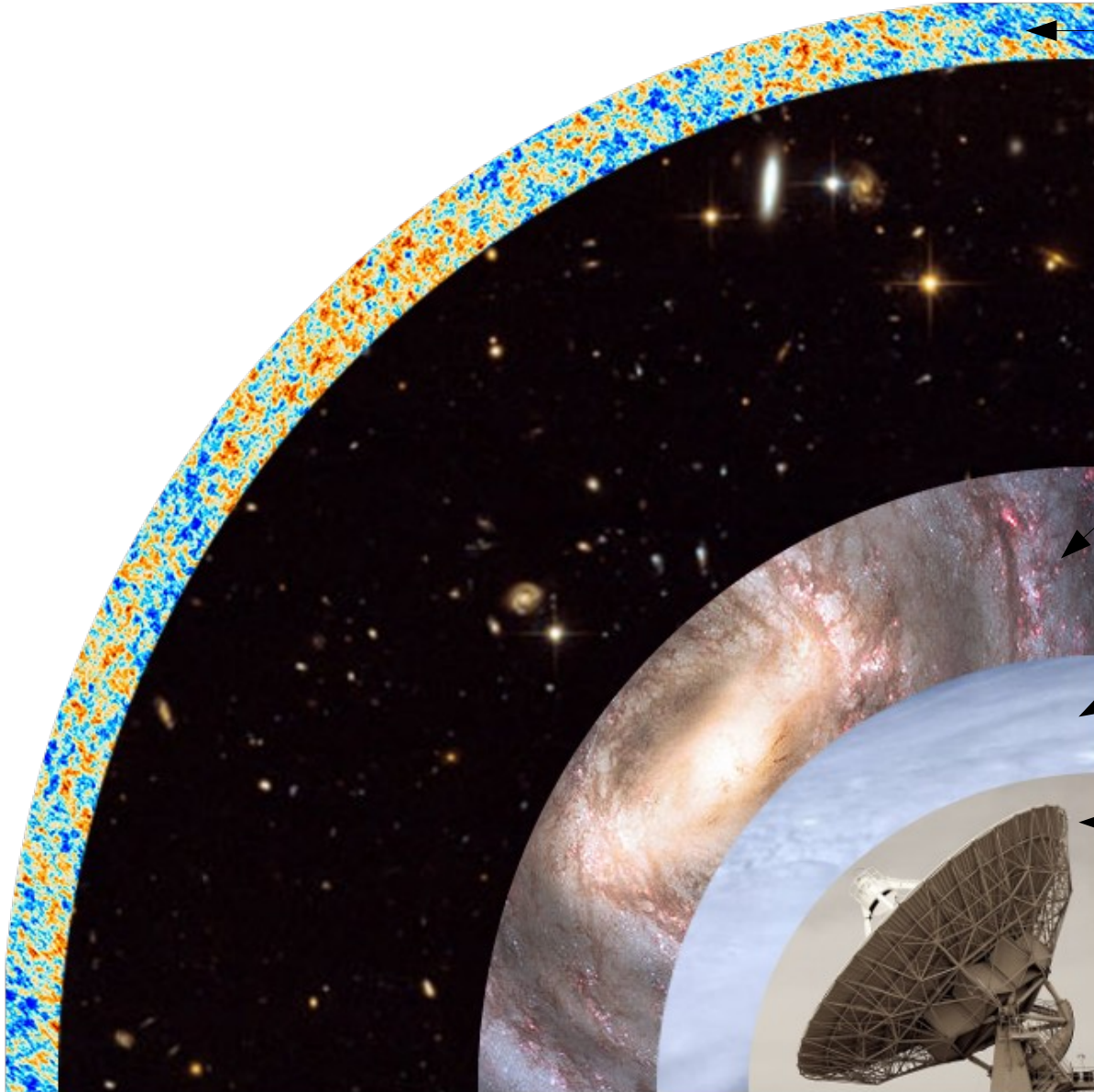
Intensity mapping with the SKA

- Baselines not small enough to cover BAO scales in interferometric mode.
- SKA1-MID will be used as a multi-single-dish experiment.
- Save interferometer data for calibration.
- Proposal to provide calibrated auto-correlations has been approved by the SKA office.
- SKA1 survey: 30K sq-deg, 10K hours, 350-1050 MHz.
- KAT7 (7) → MeerKAT (64) → SKA1 (197)



Santos et al. 1501.03989

The problem of foregrounds



IM signal

Extragalactic foregrounds:

- Point sources
- E.G. free-free

Galactic foregrounds:

- Synchrotron (I,Q,U)
- Free-free
- Dust

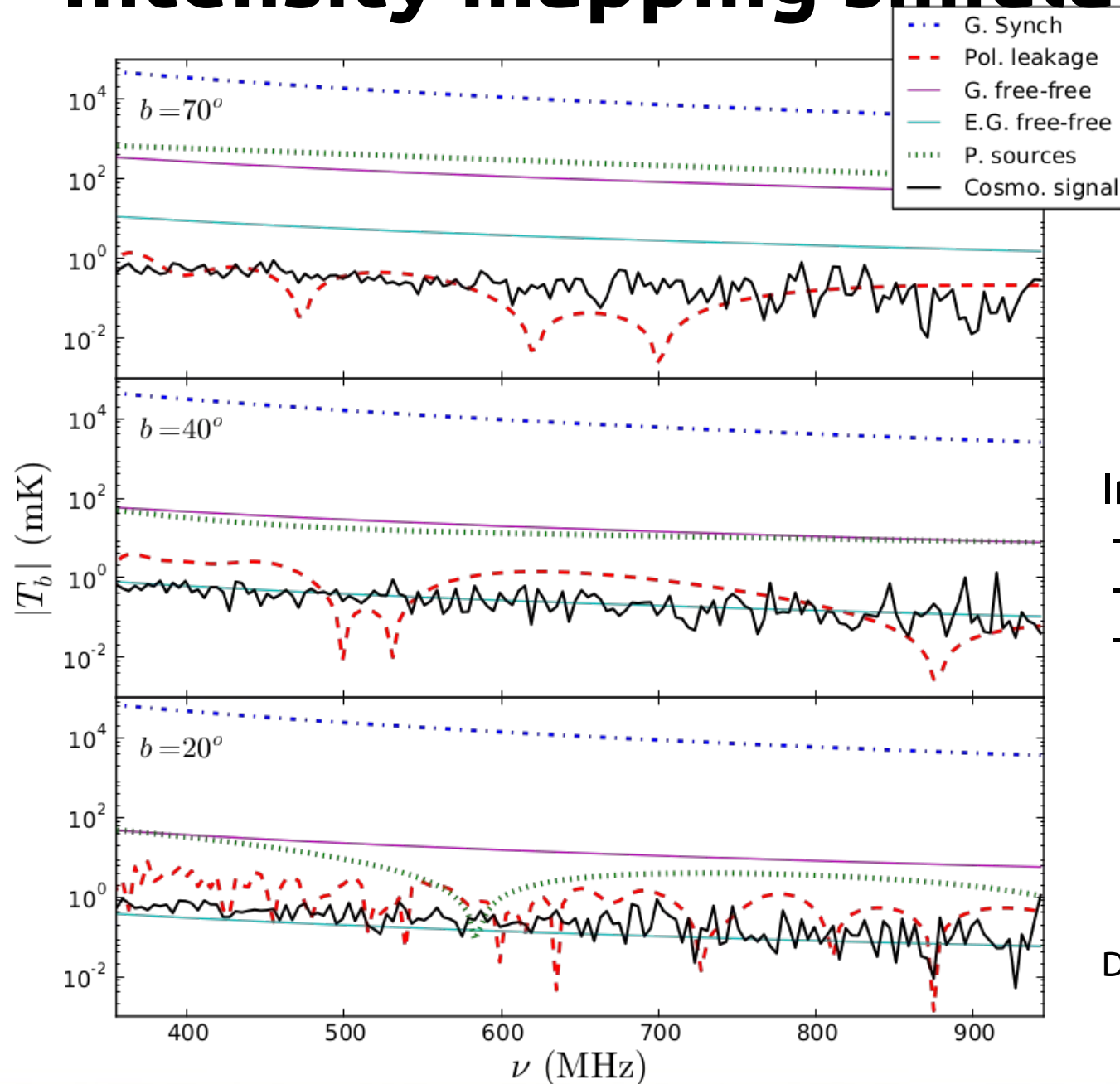
Earth:

- Atmosphere: clouds, H₂O, ionosphere
- RFI

Instrument:

- Spillover
- Gain fluctuations
- Beam fluctuations
- Polarization leakage

Intensity mapping simulations



Instrumental effects:
- Beam convolution
- Polarization leakage
- Noise

DA et al. ArXiv:1405.1751.

Blind foreground subtraction

- Blind methods: minimize assumptions about foregrounds → foregrounds are ν -smooth

- Blind source equation

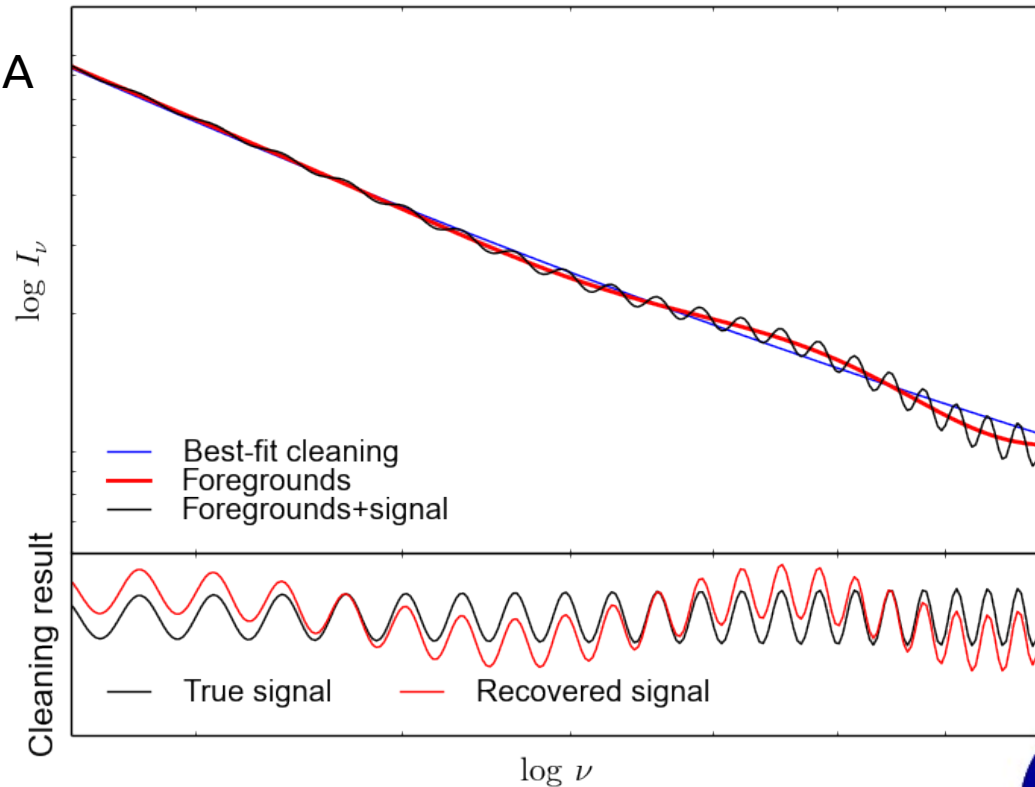
$$T(\nu, \theta) = \sum_{k=1}^{N_{\text{fg}}} f_k(\nu) S_k(\theta) + T_{\text{cosmo}}(\nu, \theta) + T_{\text{noise}}(\nu, \theta)$$

$$x_i = T(\nu_i, \theta) \quad A_{ik} = f_k(\nu_i) \quad s_k = S_k(\theta)$$

$$\mathbf{x} = \hat{\mathbf{A}} \cdot \mathbf{s} + \mathbf{n}$$

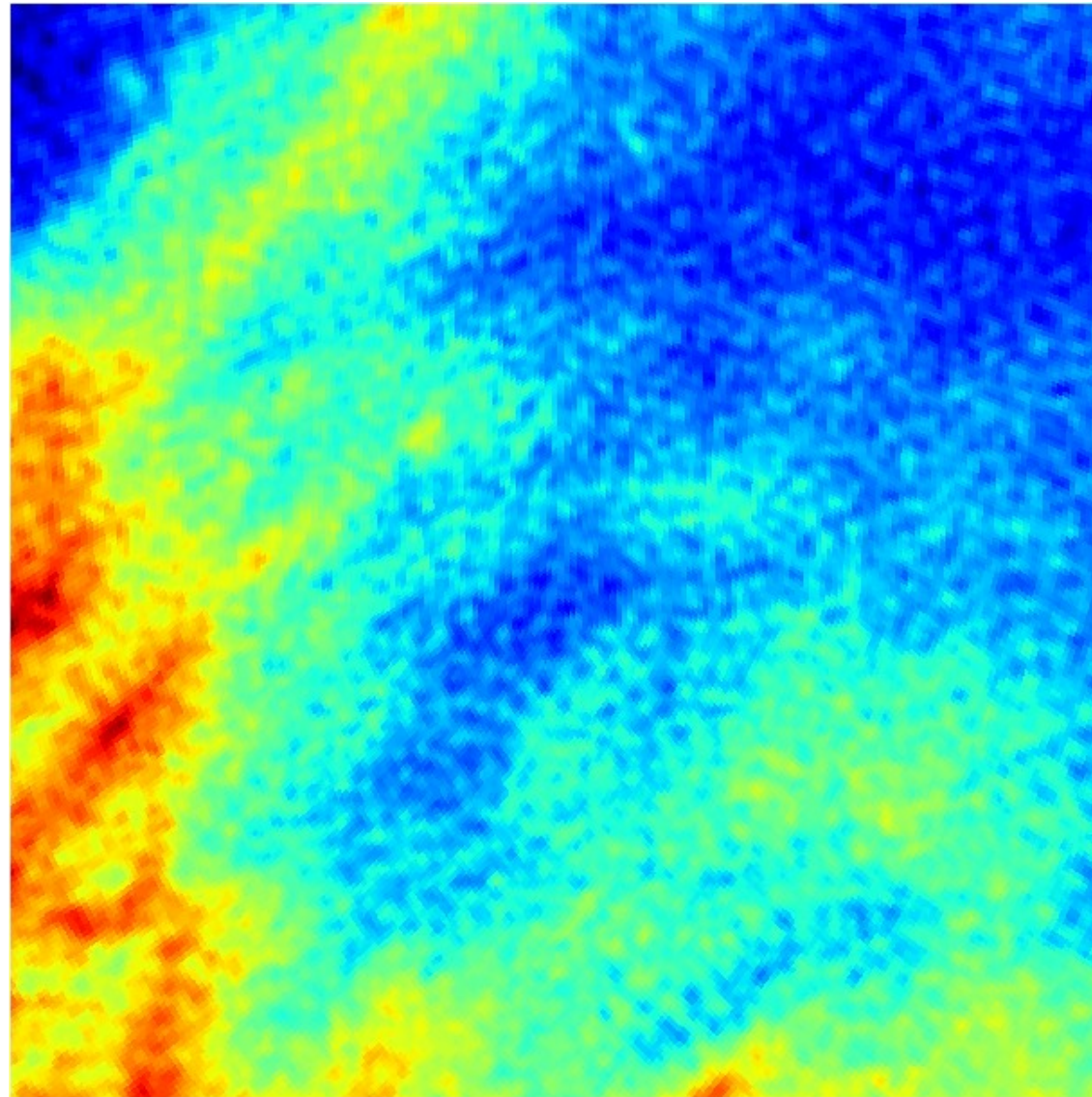
- Methods: LOS fitting, PCA, ICA

Wolz et al. 1310.8144
DA et al. 1409.8667



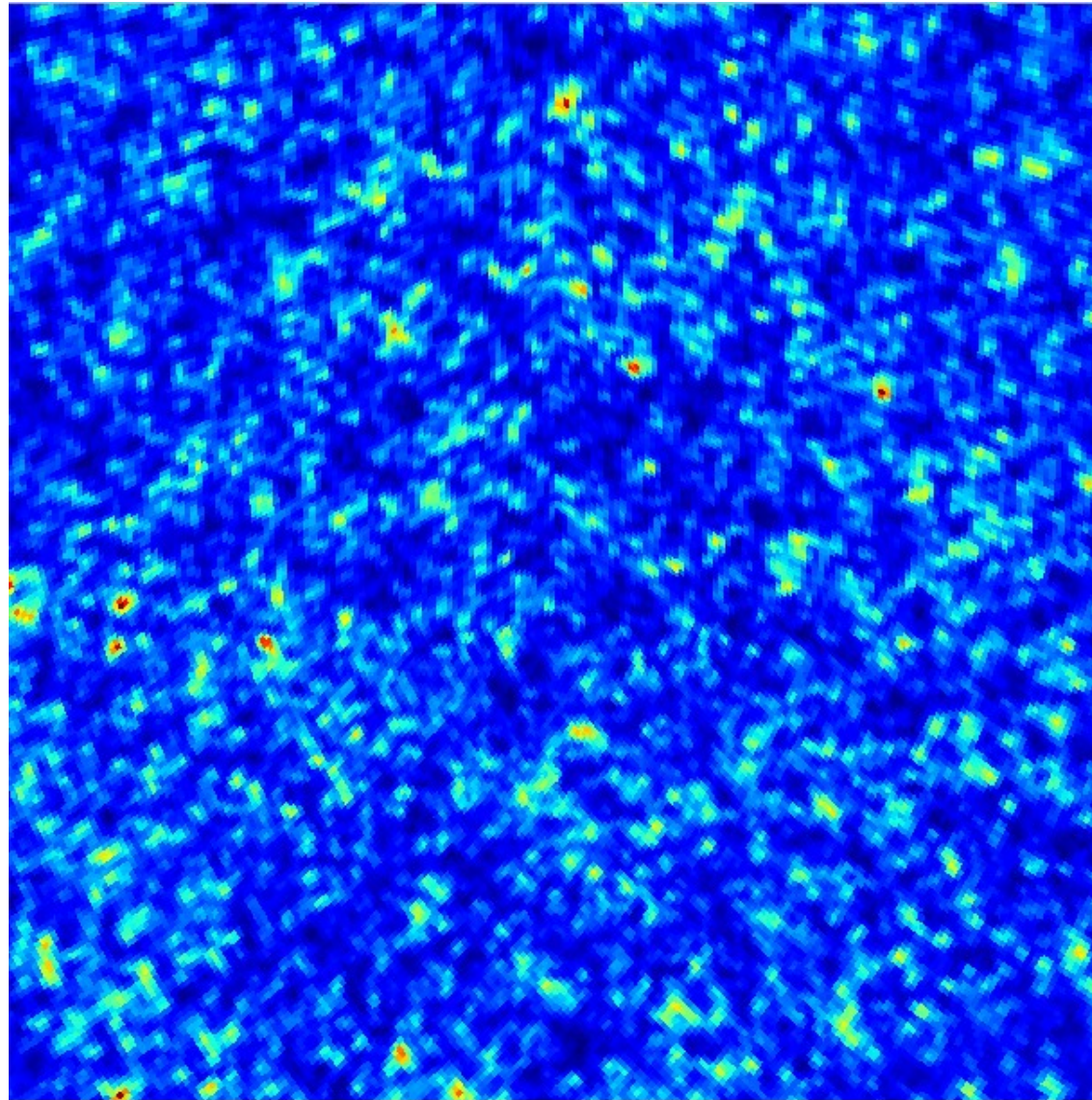
Blind foreground subtraction

Signal+FG



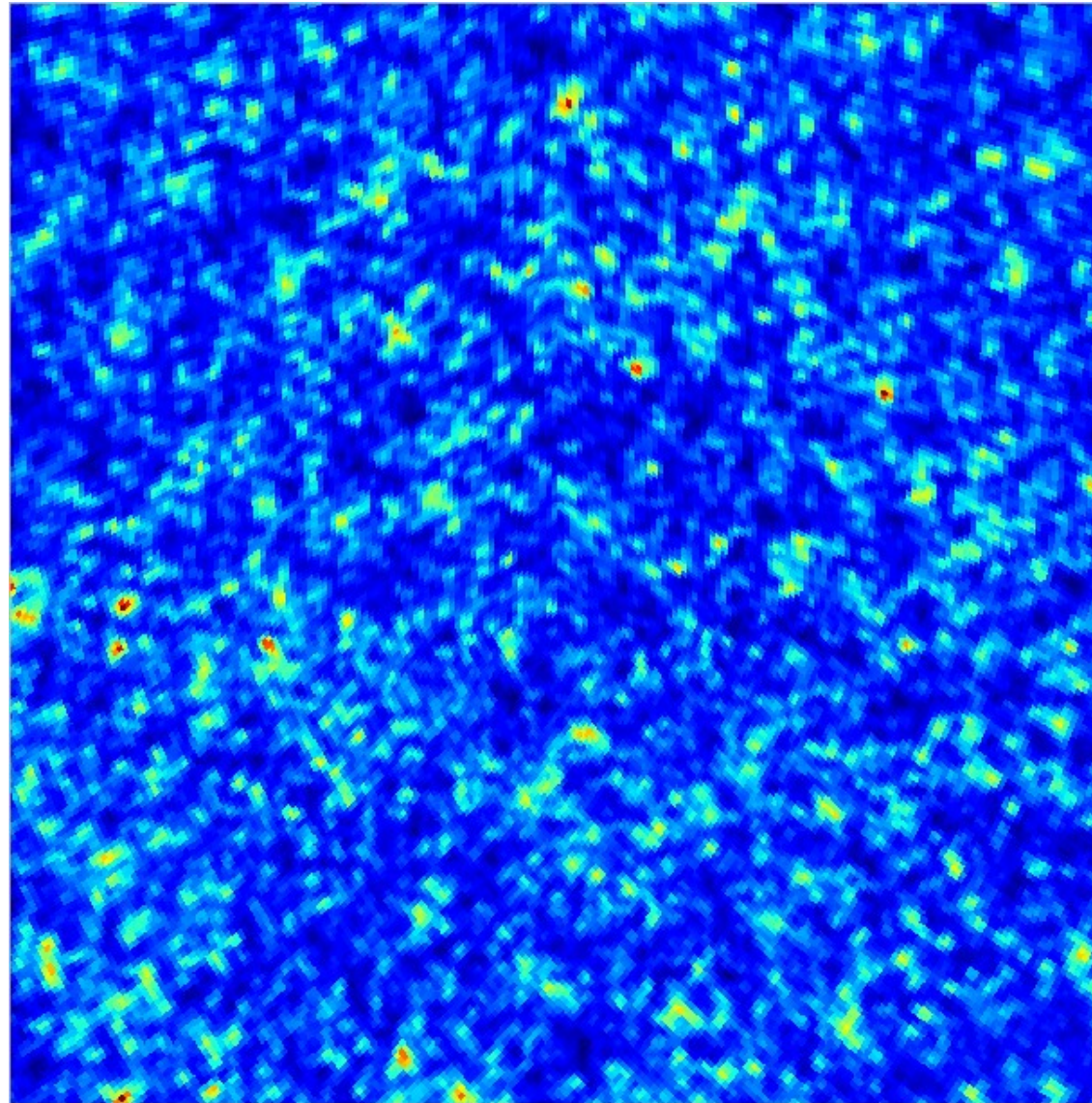
Blind foreground subtraction

Signal only

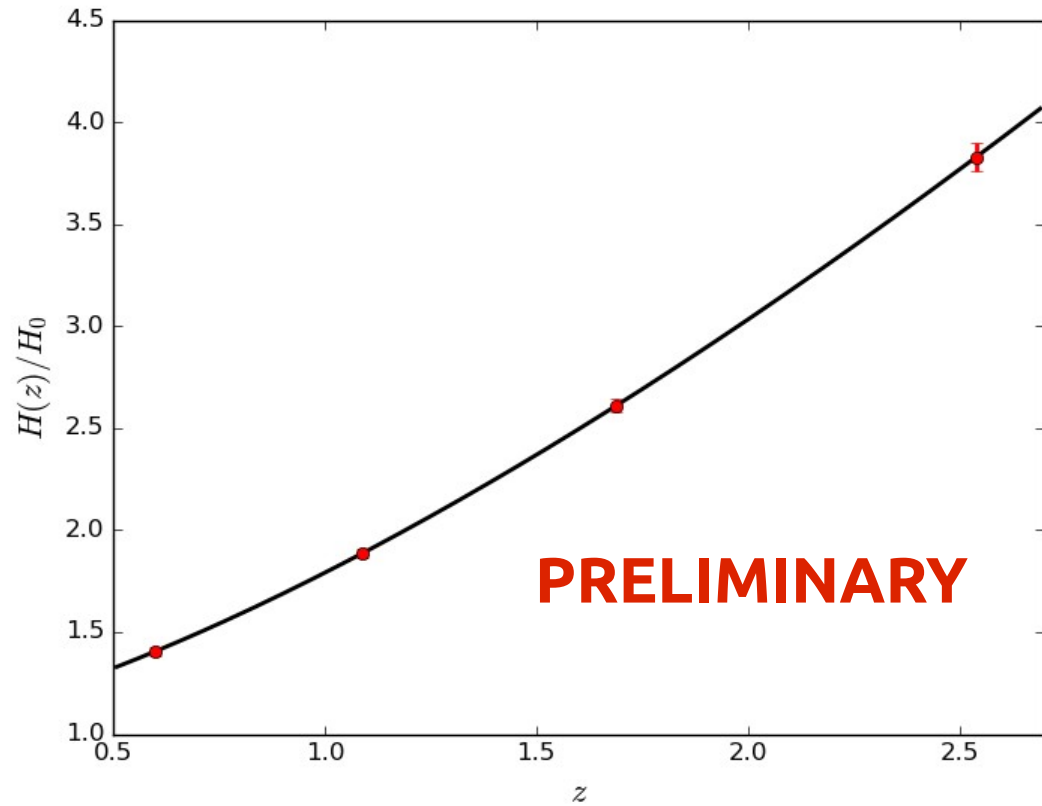
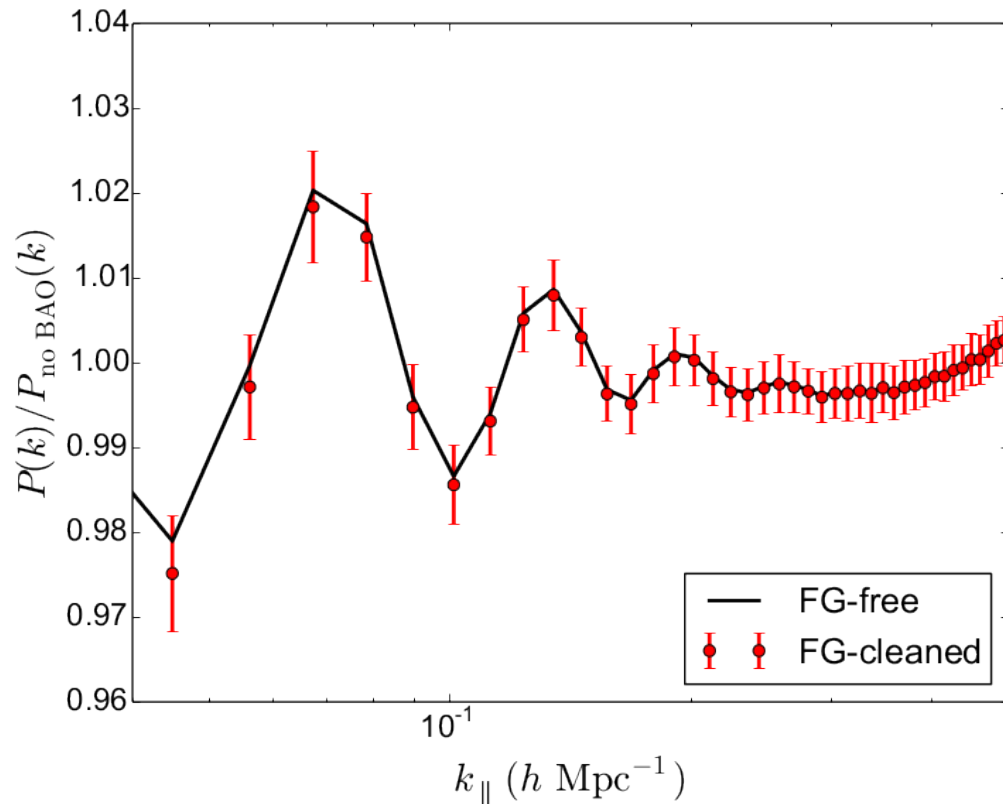


Blind foreground subtraction

Cleaned map



Blind foreground subtraction



~1% measurements of the radial BAO
(DA, F. Villaescusa-Navarro, M. Viel in prep.)

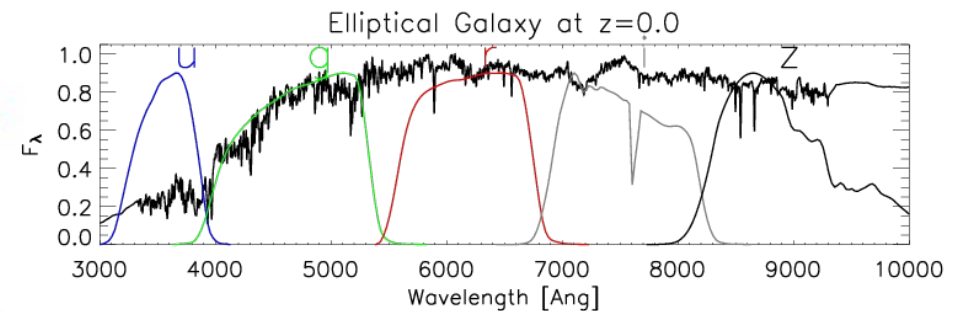
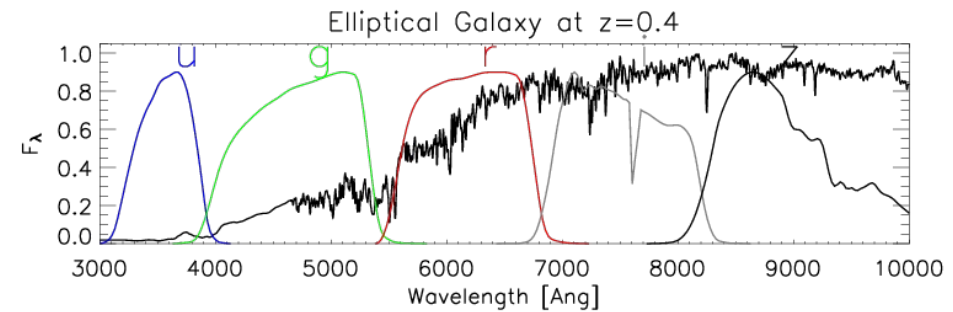
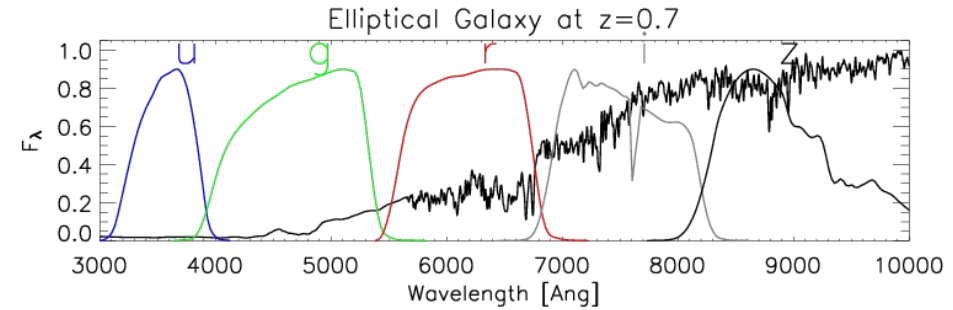
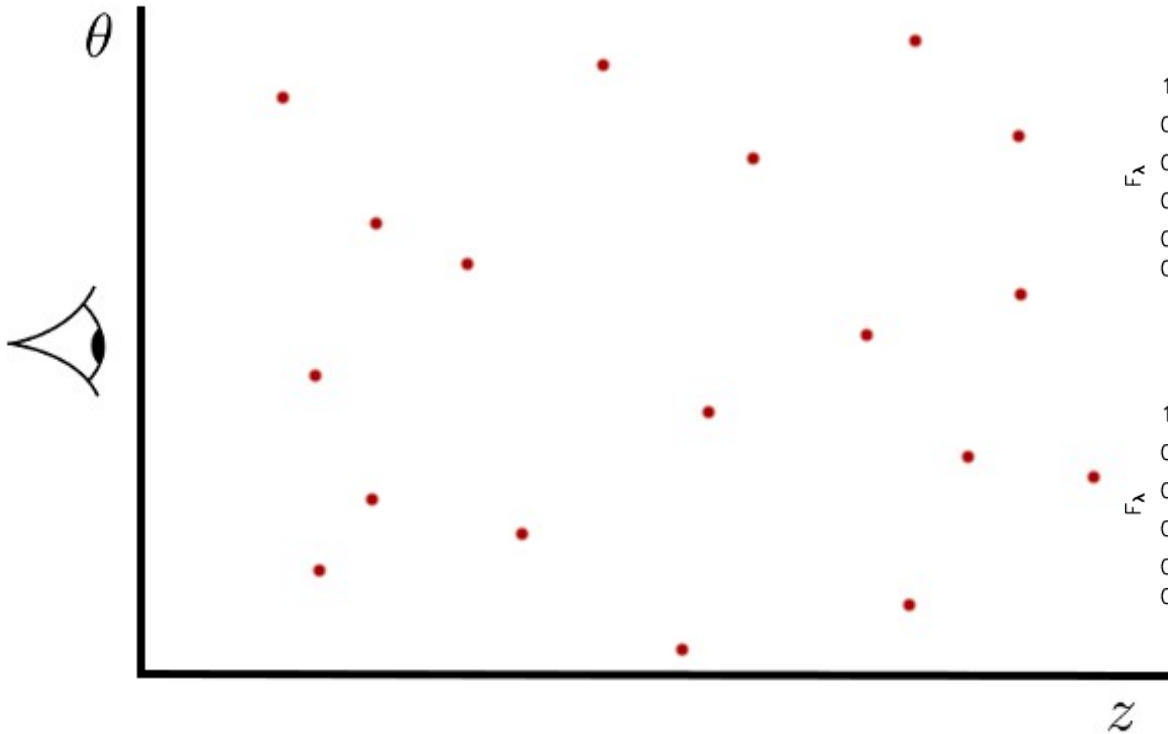
Most important features still observable! (e.g. radial BAO)

2. Optical surveys – the LSST

Optical surveys:

Spectroscopic surveys

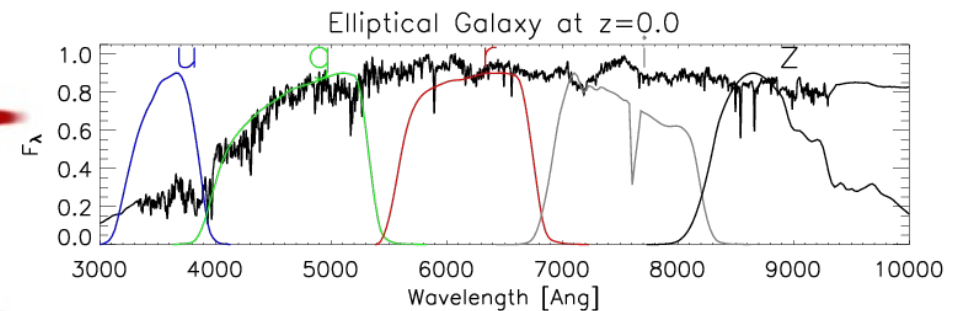
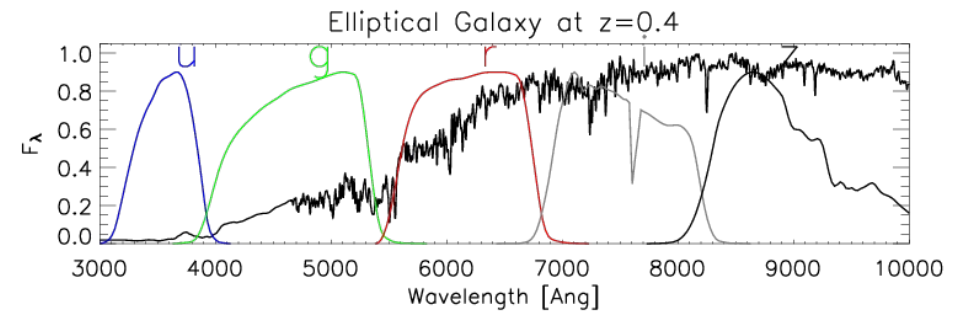
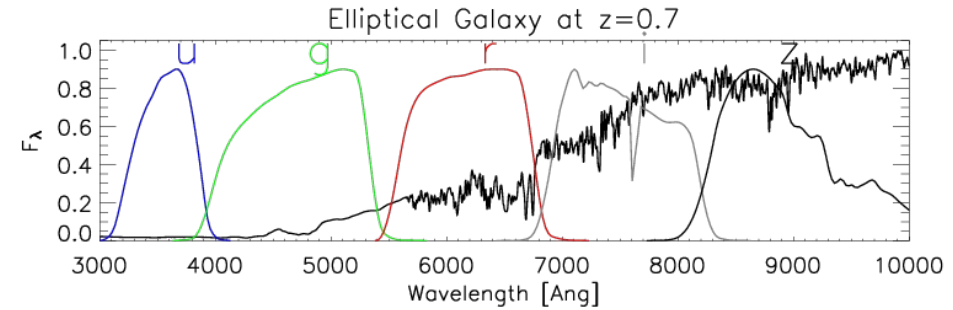
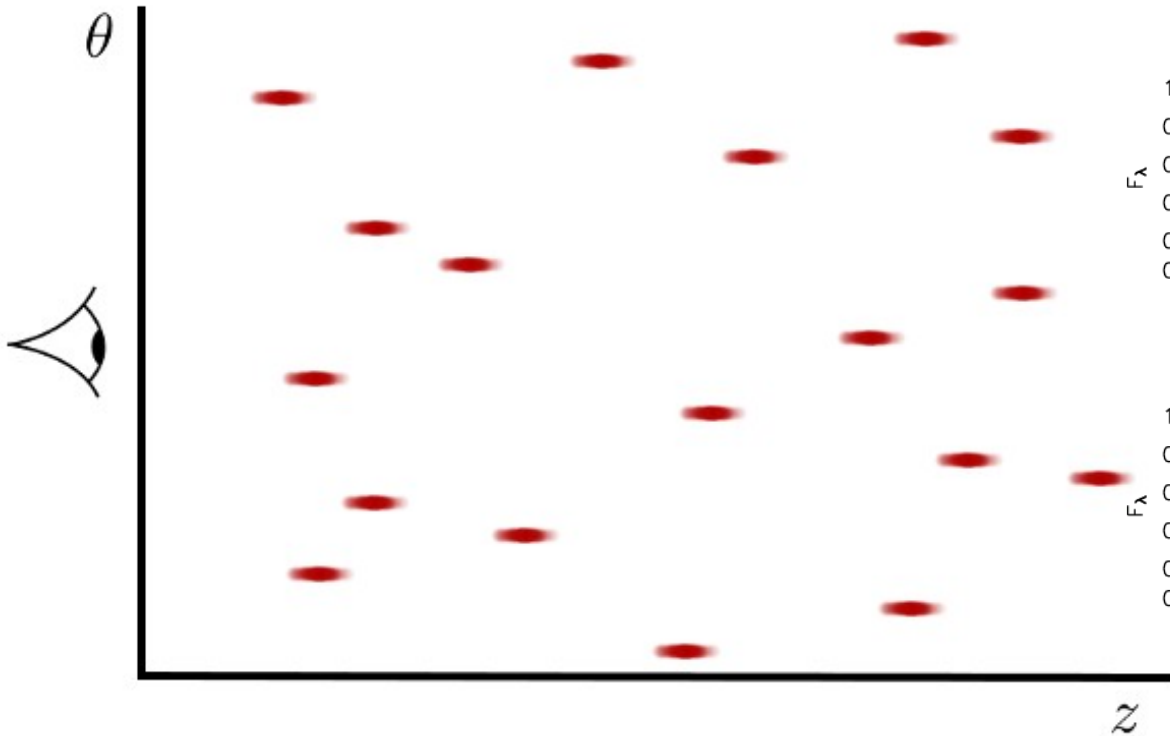
- Good radial and angular resolution
- Long integration times →
- Low number density and redshift



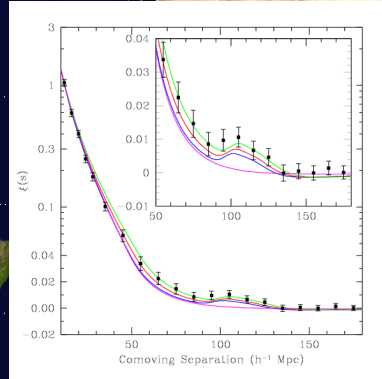
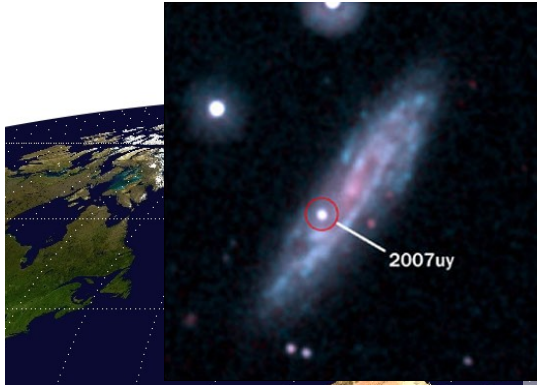
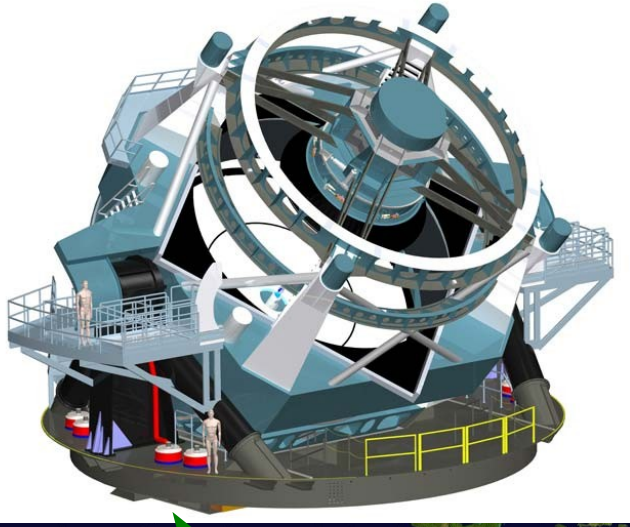
Optical surveys

Photometric surveys

- Good angular resolution, bad radial
- Higher number densities and redshifts
- Photo-z systematics



LSST (2022)



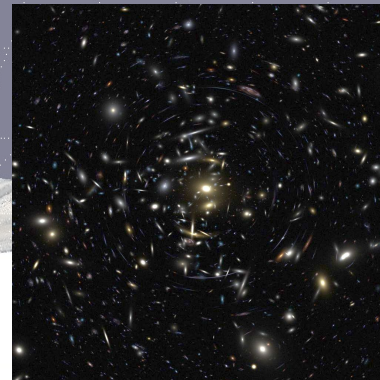
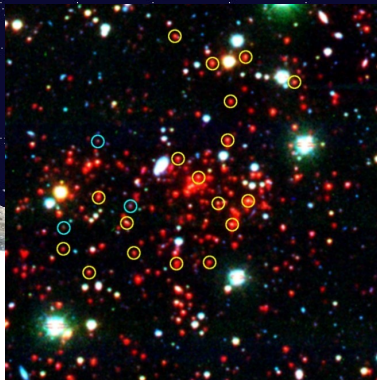
Outstanding numbers:

- World's largest imager
 - 8.4 m, 9.6 sq-deg FOV
- Wide: 20K sq-deg
- Deep: $r \sim 27$
- Fast: ~ 100 visits per year
- Big data: ~ 15 TB per day

Multi-science facility:

- Supernovae
- Galaxy clustering
- Cluster science
- Weak & strong lensing
- Non-cosmological:
 - Transients, Solar System, Milky Way

LSST



LSST Coll. et al. 0912.0201

3. Constraining gravity with multiple tracers

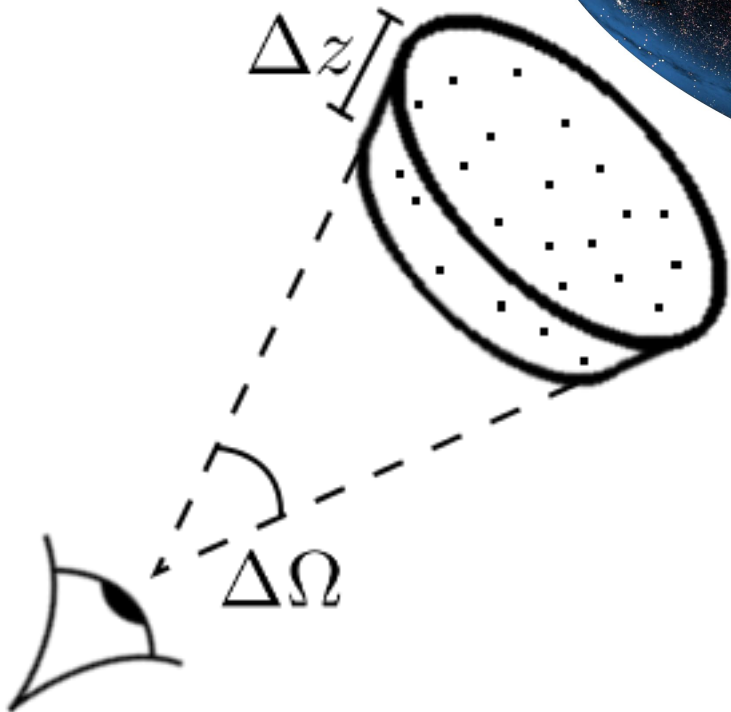
Relativistic effects in LSS

$$z_{\text{obs}} = z_{\text{BG}} + \delta z$$

$$\theta_{\text{obs}} = \theta_{\text{BG}} + \delta\theta$$



Credit: 2MASS



$$\frac{\Delta N}{\Delta\Omega\Delta z} = \bar{n} (1 + b\delta_M) \frac{\Delta V}{\Delta\Omega\Delta z}$$

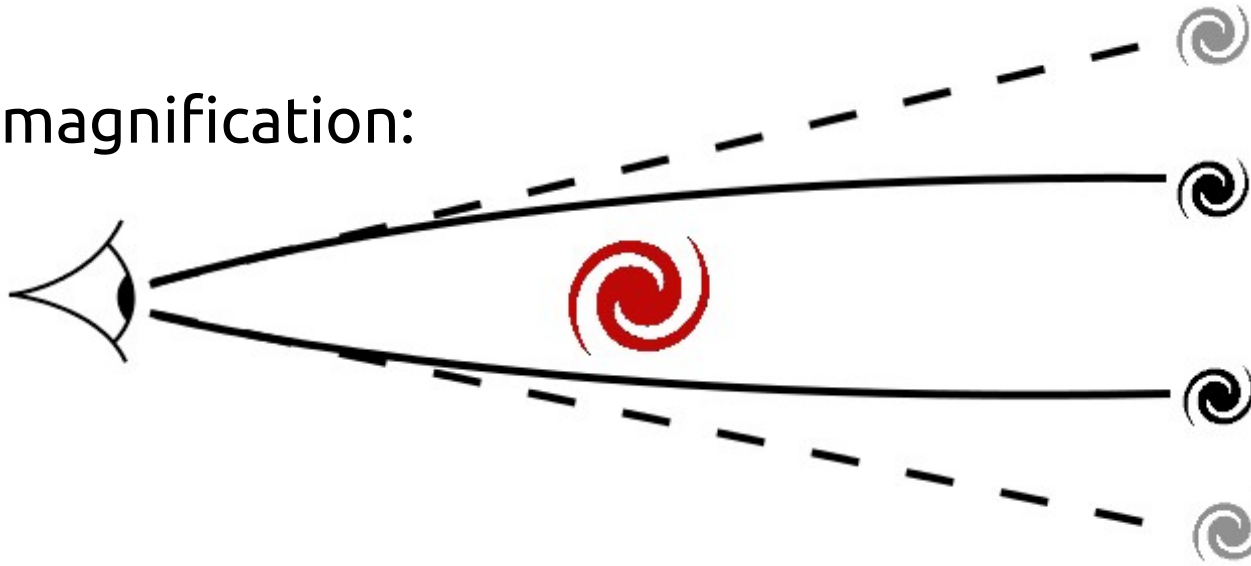
Relativistic effects in LSS

RSDs:



$$\delta z \propto v$$

Lensing magnification:



$$\delta\theta \propto \nabla_{\theta} \int dr \Phi$$

Sachs-Wolfe:

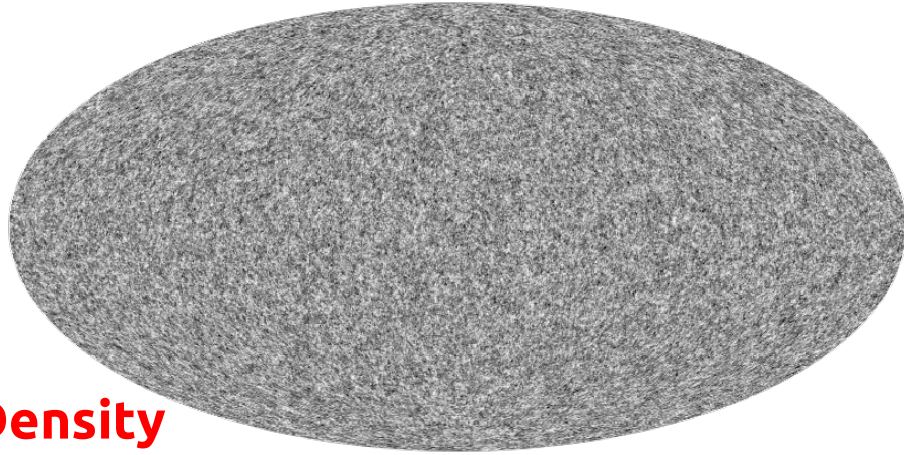


$$\begin{cases} \delta z \propto \Phi \\ \delta z \propto \int \dot{\Phi} \end{cases}$$

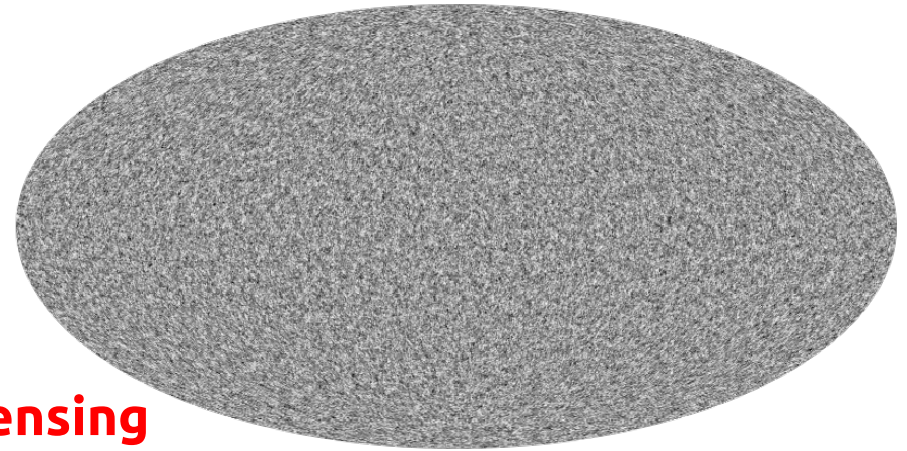
Challinor and Lewis, arXiv:1105.5292

Bonvin and Durrer, arXiv:1105.5280

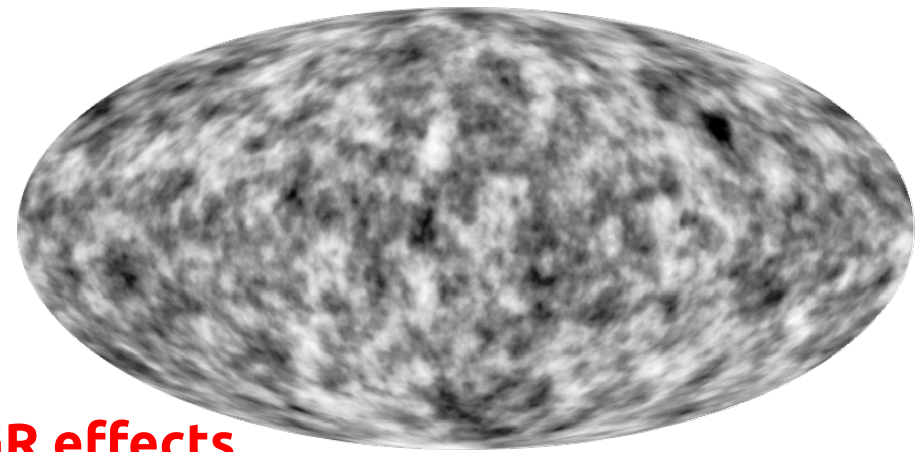
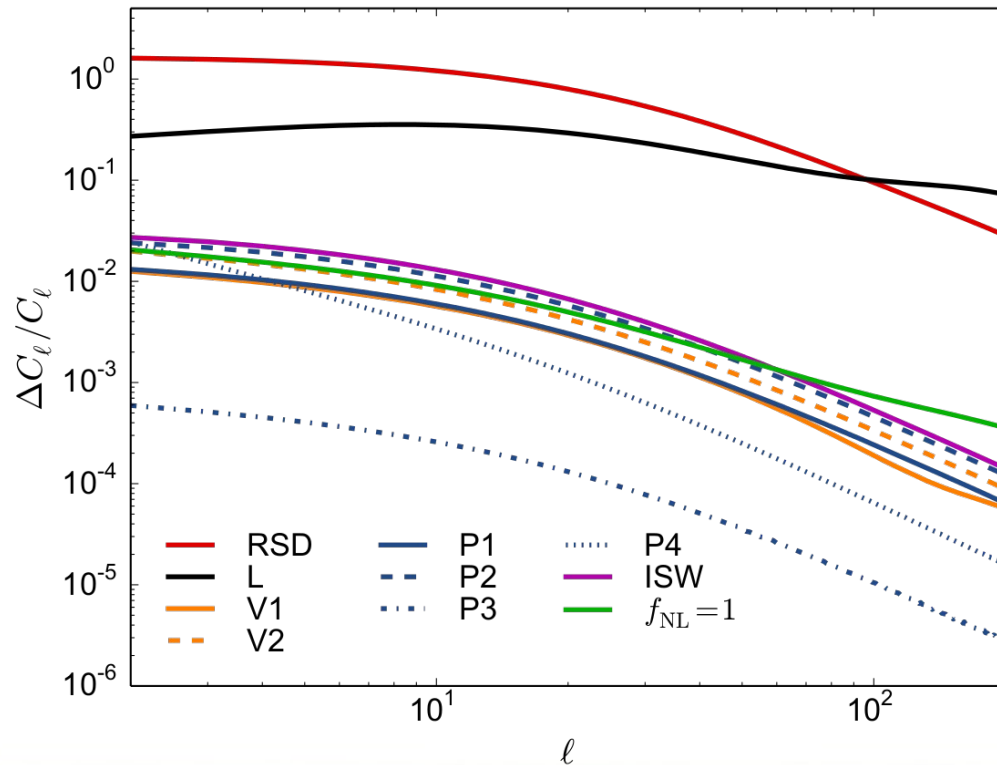
Relativistic effects in LSS



Density



Lensing

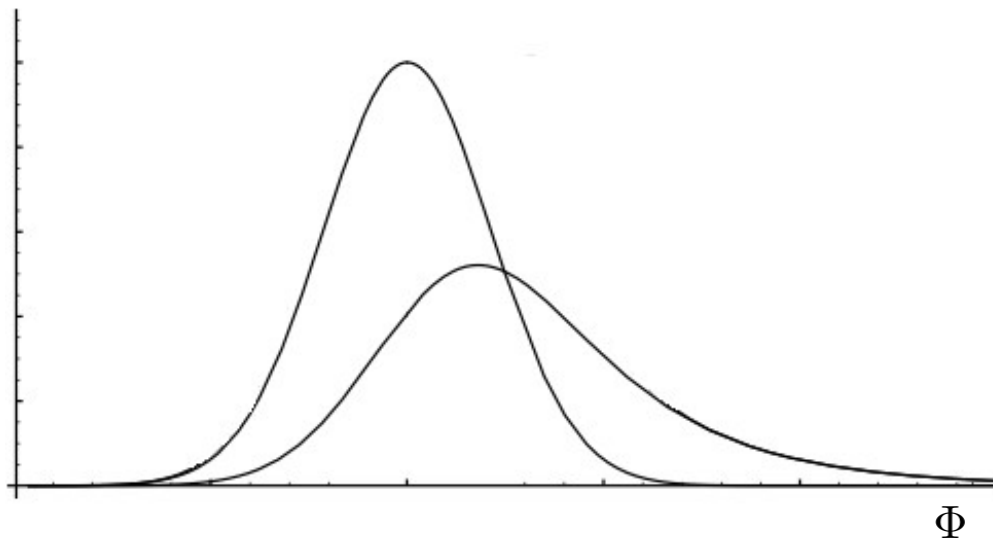


GR effects

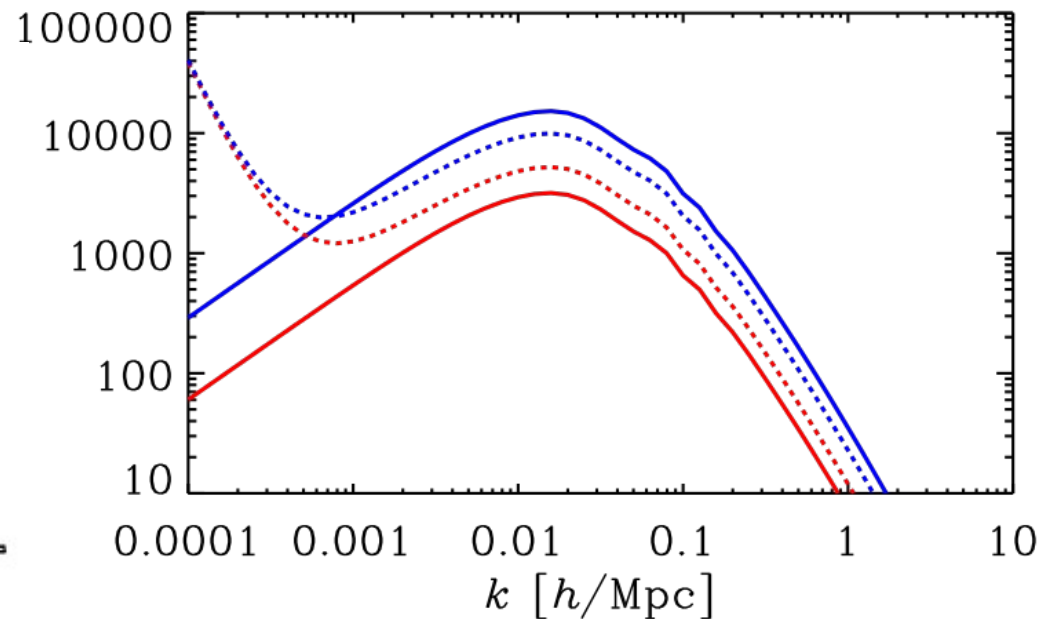
Primordial non-Gaussianity

- Massive objects, hosting galaxies, form in high-density environments.
- Primordial non-Gaussianity affects the clustering statistics of biased tracers.

$$\Delta b_M(k, f_{\text{NL}}) = f_{\text{NL}} [b_M(k, 0) - 1] \frac{3\delta_L \Omega_{\text{m}0} H_0^2}{c^2 k^2 T(k) D(z)}$$



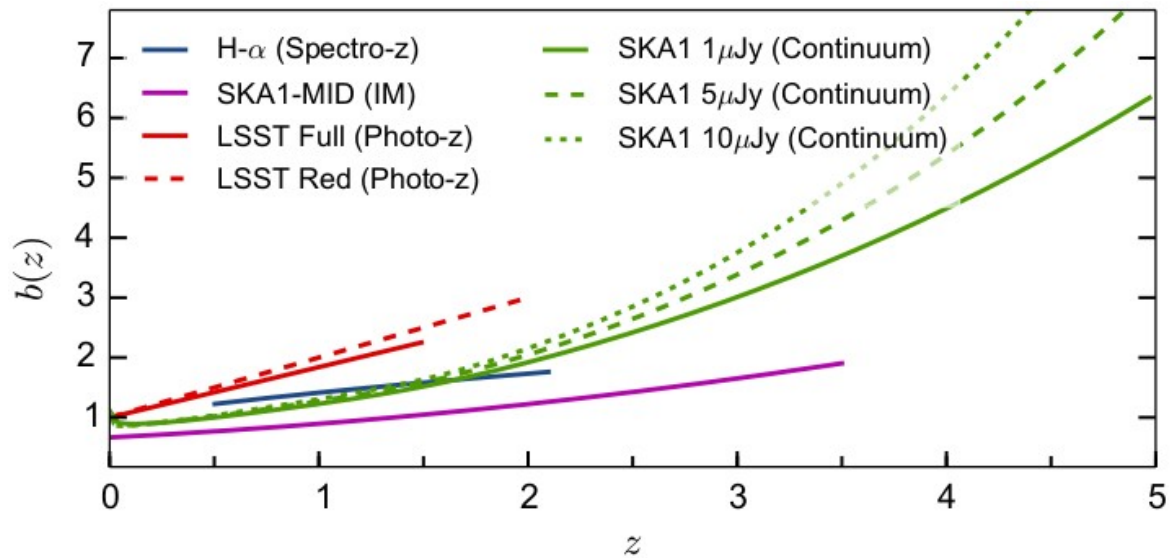
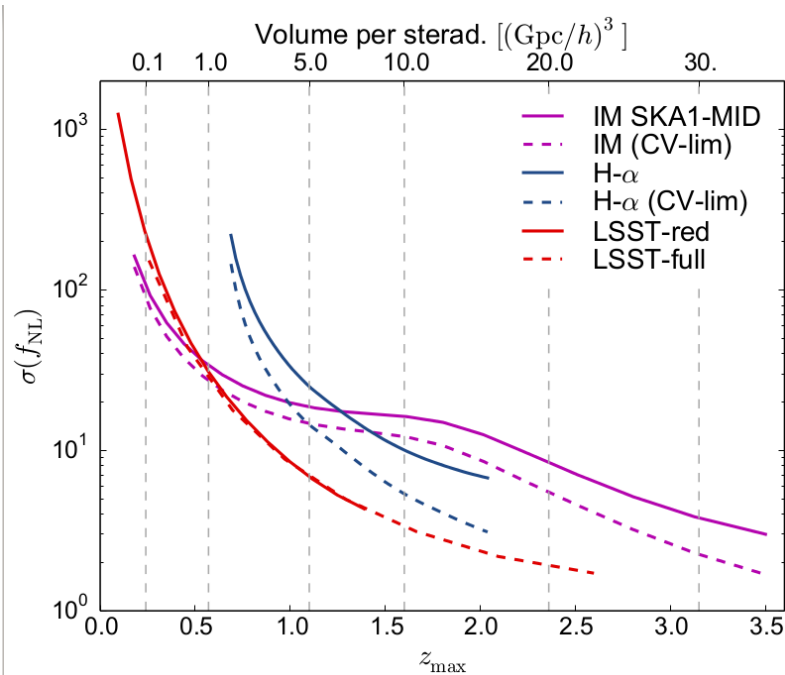
Dalal et al. arXiv:0710.4560
Matarrese and Verde arXiv:0801.4826



Camera et al. arXiv:1305.6928

Results: single tracers

Experiment	$\sigma(f_{\text{NL}})$	$\sigma(\epsilon_{\text{GR}})$
Intensity mapping (SKA1-MID)	3.01	2.75
Continuum survey ($S_{\text{cut}} = 1\mu\text{Jy}$)	11.8	17.1
Spectroscopic survey (Euclid)	6.64	2.57
Photometric survey (LSST)	1.71	2.33

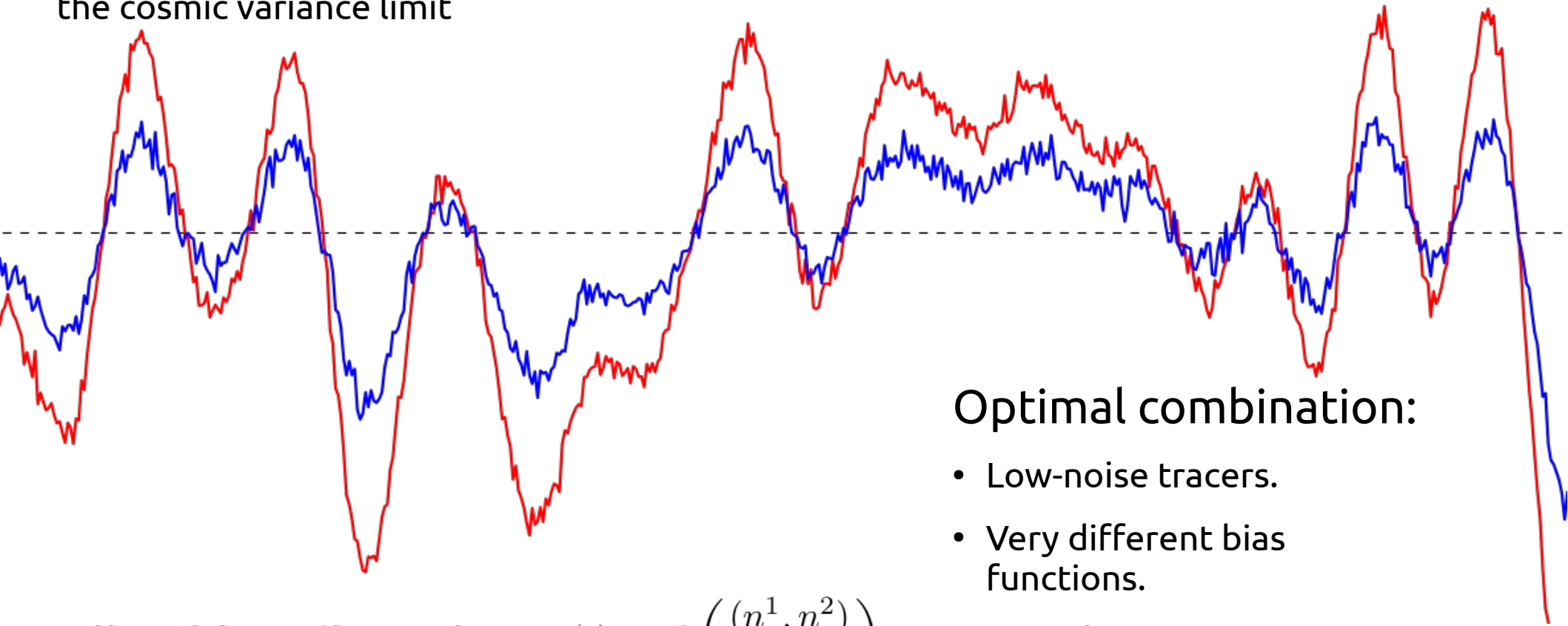


DA et al. arXiv:1505.07596, 1507.03550

Multi-tracer analyses

For disjoint tracers deterministically related to the density field, terms proportional to the bias parameters can be measured below the cosmic variance limit

$$\delta_{\mathbf{k}}^a = b^a \delta_{\mathbf{k}} + n^a \longrightarrow \sigma \left(\frac{b^1}{b^2} \right) = \mathcal{O}(n^1, n^2)$$



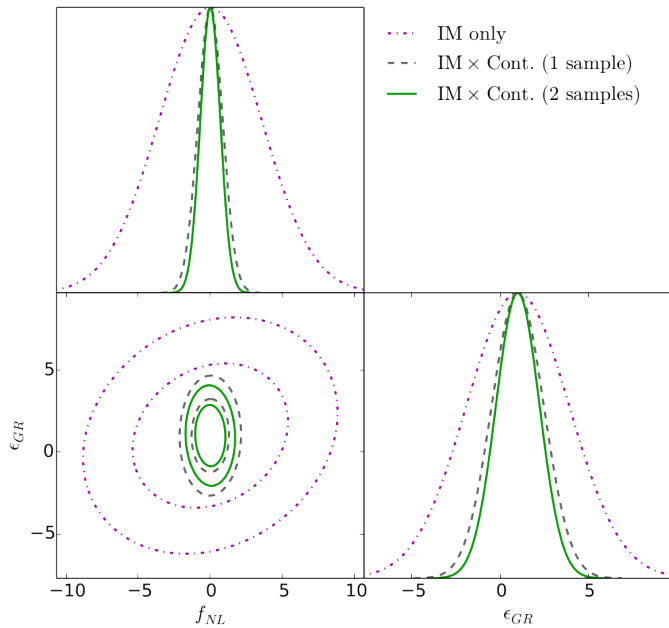
$$\delta_{\mathbf{k}}^a = b^a \delta_{\mathbf{k}} + \epsilon f^a g_{\mathbf{k}} + n^a \longrightarrow \sigma(\epsilon) = \mathcal{O} \left(\frac{(n^1, n^2)}{f^1 - f^2} \right)$$

Seljak 0807.1770

Optimal combination:

- Low-noise tracers.
- Very different bias functions.
- E.g.: photometric survey, red vs. blue galaxies

Multi-tracer analyses



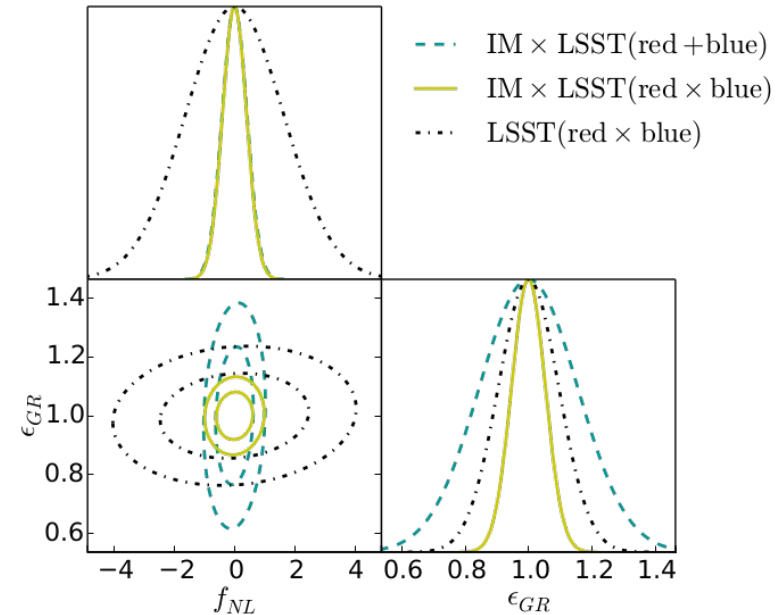
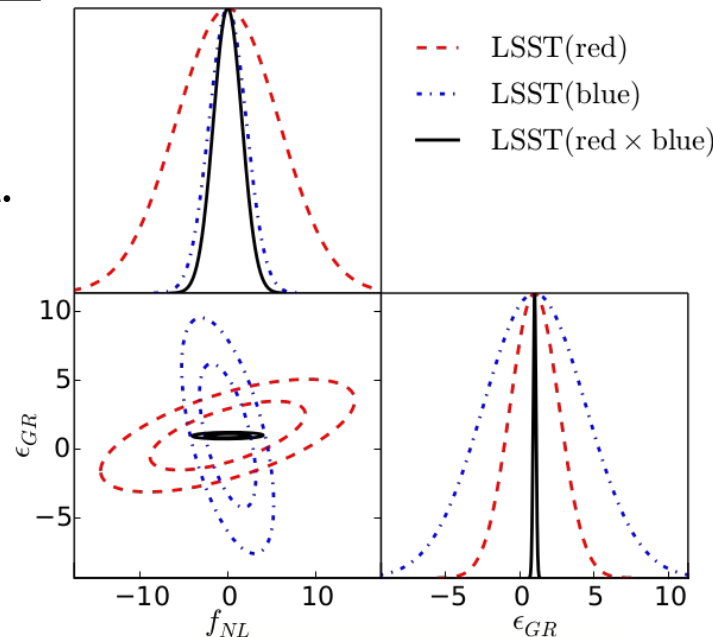
SKA-only

- 4 x improvement on f_{NL} .
- No detection of GR effects.

DA et al. arXiv:1507.03550
Fonseca et al. arXiv:1507.04605

LSST-only

- Slight improvement for f_{NL} .
- 5-10 σ detection of GR effects.
- 3 σ detection for DES



LSST x SKA

- IM and photo-z are complementary.
- Major improvement in both cases. x4 in f_{NL}
- 10-20 σ detection of GR effects.

Scalar-tensor gravity

$$\mathcal{L}_2 = G_2(X, \phi),$$

$$\mathcal{L}_3 = -G_3(X, \phi)\square\phi,$$

$$\mathcal{L}_4 = G_4(X, \phi)R + G_{4,X} [(\square\phi)^2 - \phi_{;\mu\nu}\phi^{;\mu\nu}],$$

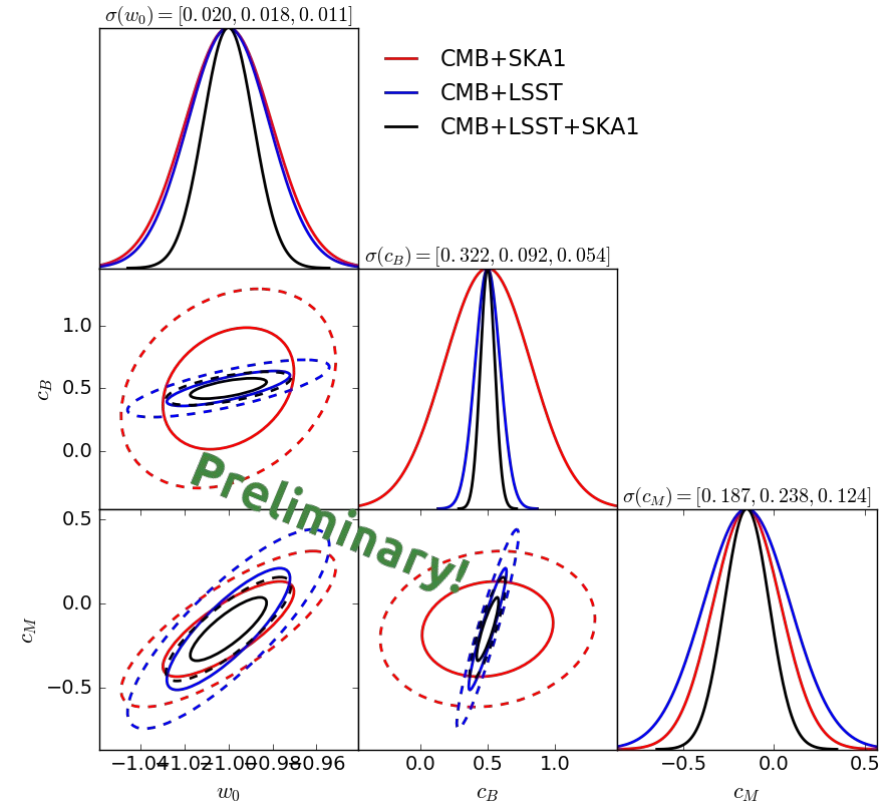
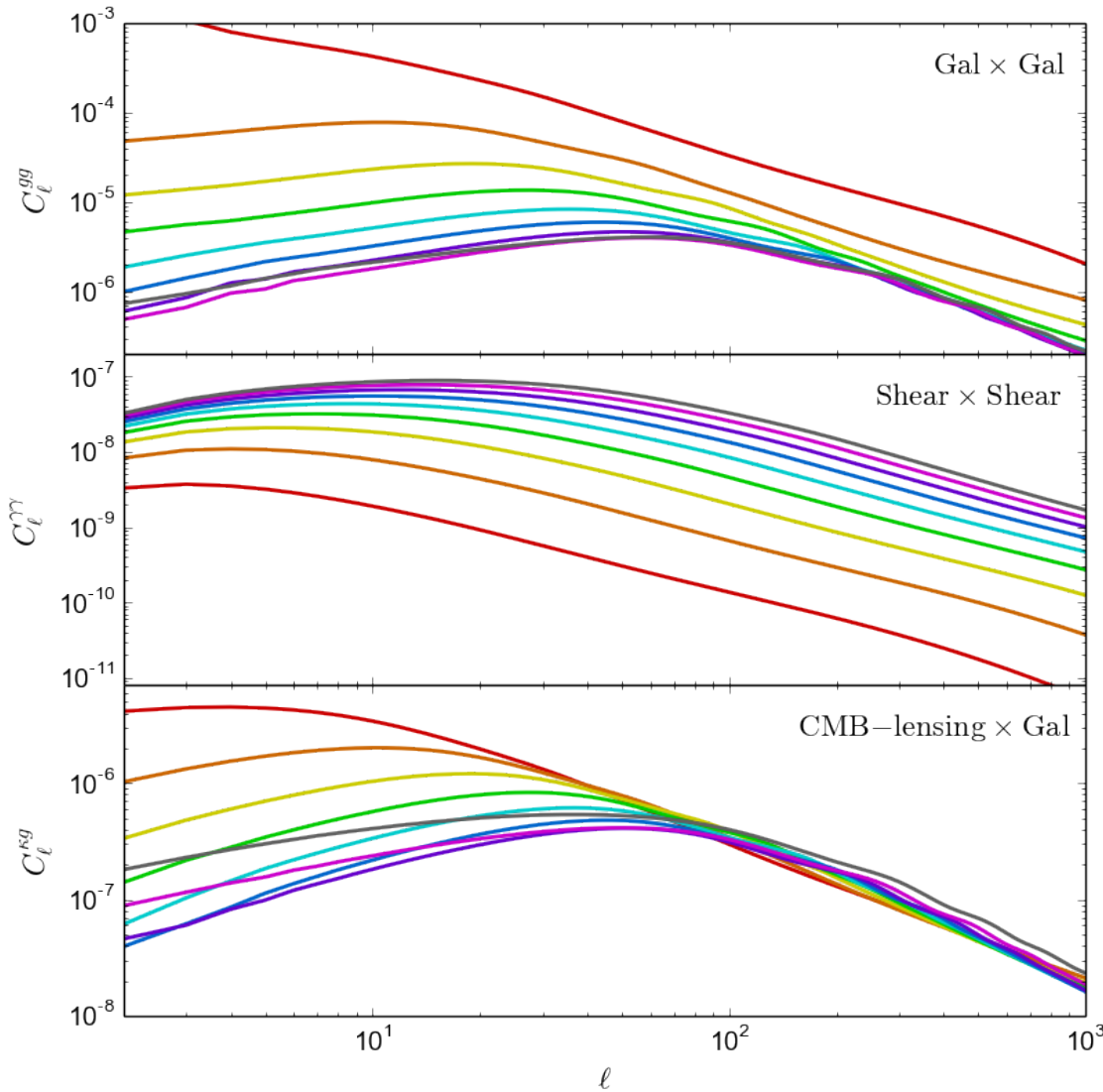
$$\mathcal{L}_5 = G_5(X, \phi)G_{\mu\nu}\phi^{;\mu\nu} - \frac{1}{6}G_{5,X} [(\square\phi)^3 - 3(\square\phi)\phi_{;\mu\nu}\phi^{;\mu\nu} + 2\phi_{;\mu}{}^{;\nu}\phi_{;\nu}{}^{;\lambda}\phi_{;\lambda}{}^{;\mu}]$$

$$S[g_{\mu\nu}, \phi] = \int \sqrt{-g} \sum_{i=2}^5 \mathcal{L}_i$$

Horndeski Lagrangian:

- Most general scalar-tensor theory with 2nd-order equations of motion
- Enormous functional freedom.
- Reduced in the Bellini-Sawicki parametrization:
 - α_K : parametrizes standard kinetic term
 - α_B : off-diagonal kinetic terms. Scale-dependent gravitational constant.
 - $\alpha_M = \frac{d \log(M_*^2)}{d \log(a)}$: evolving gravitational constant.
 - $c_{GW} = 1 + \alpha_T$: speed of tensors.

Constraining Horndeski gravity

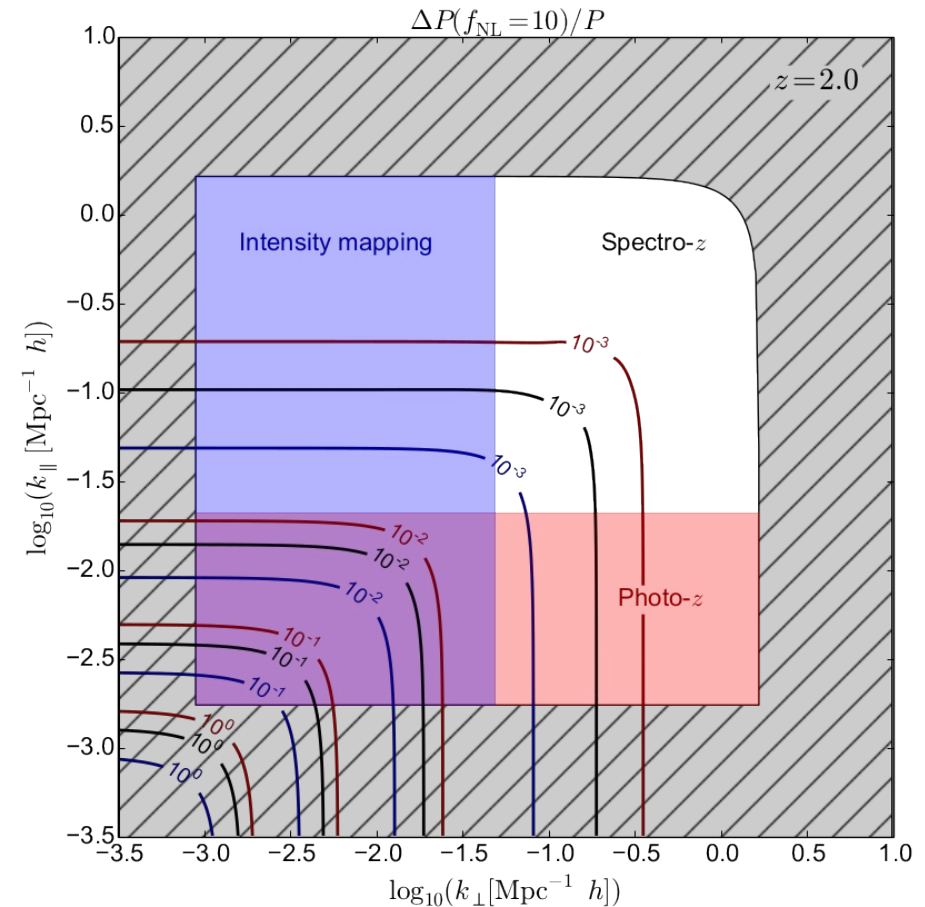
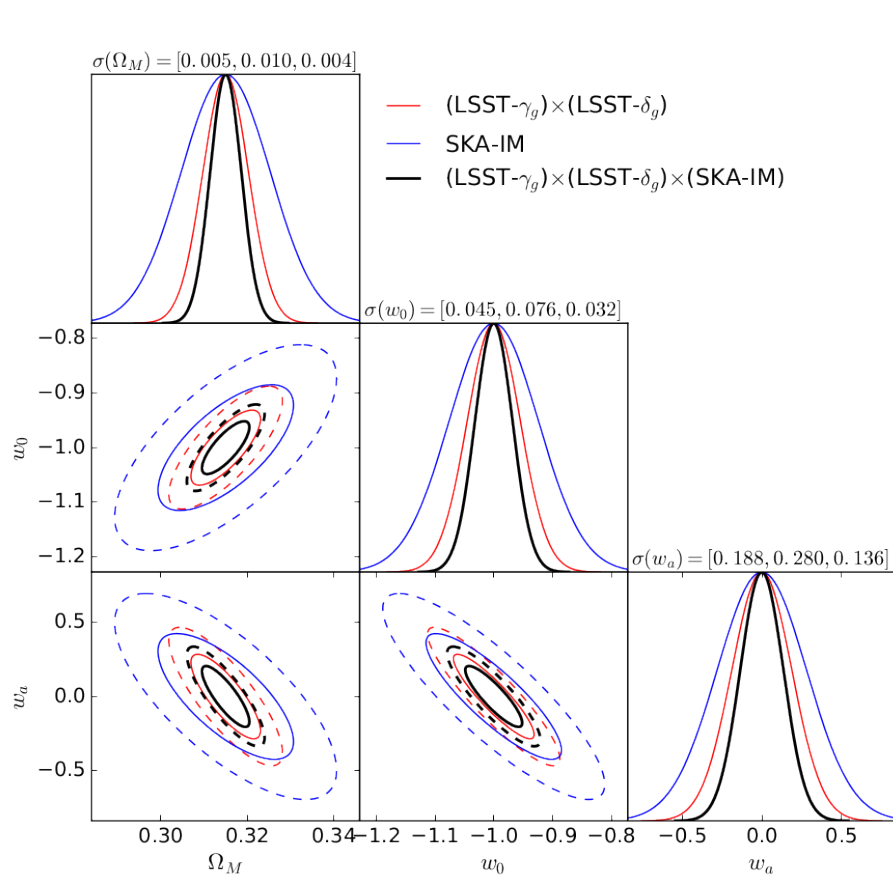


- Concept: throw in all tracers (and x-corrs!)
 - Galaxy clustering (LSST, blue and red)
 - Galaxy shear (LSST, gold sample)
 - Intensity mapping (SKA-1, 200 bins)
 - CMB primary (Planck)
 - CMB lensing (AdvACT)
- $\sim 10x$ improvement over current constraints.

DA, P. Ferreira, E. Bellini, M Zumalacarregui (in prep.)

4. Combining photo-z's and IM.

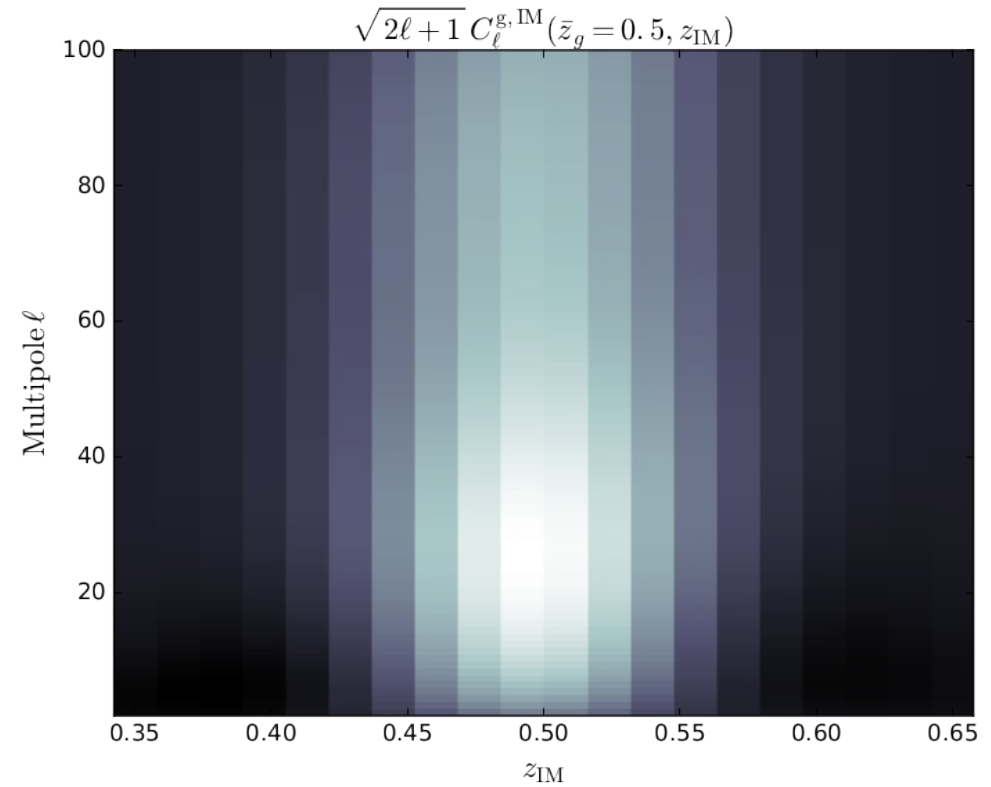
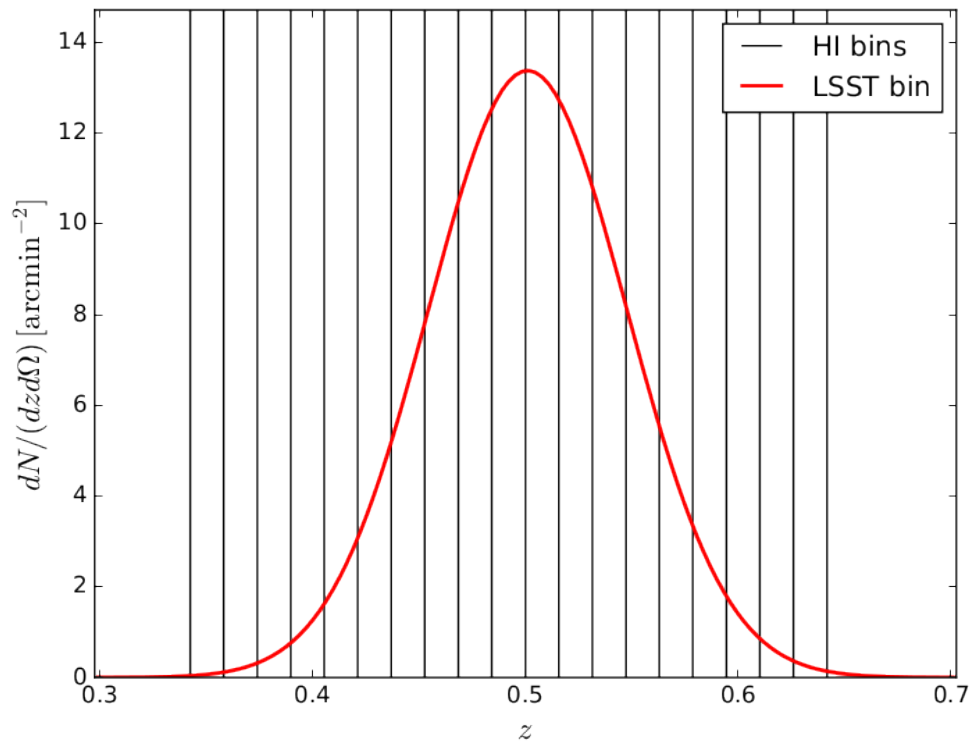
1 Combined cosmological constraints



- Complementary coverage of scales.
- Complementary tracer properties (e.g. bias, magnification).

DA, P. Ferreira, M. Jarvis (in prep.)

2 Reducing photo-z systematics

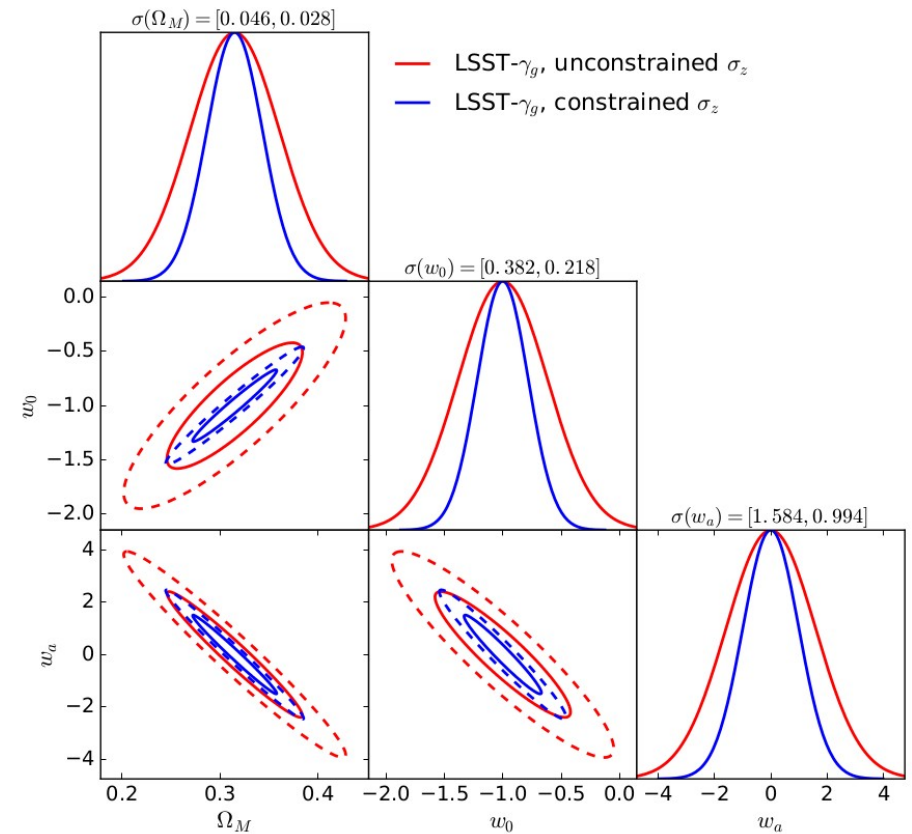
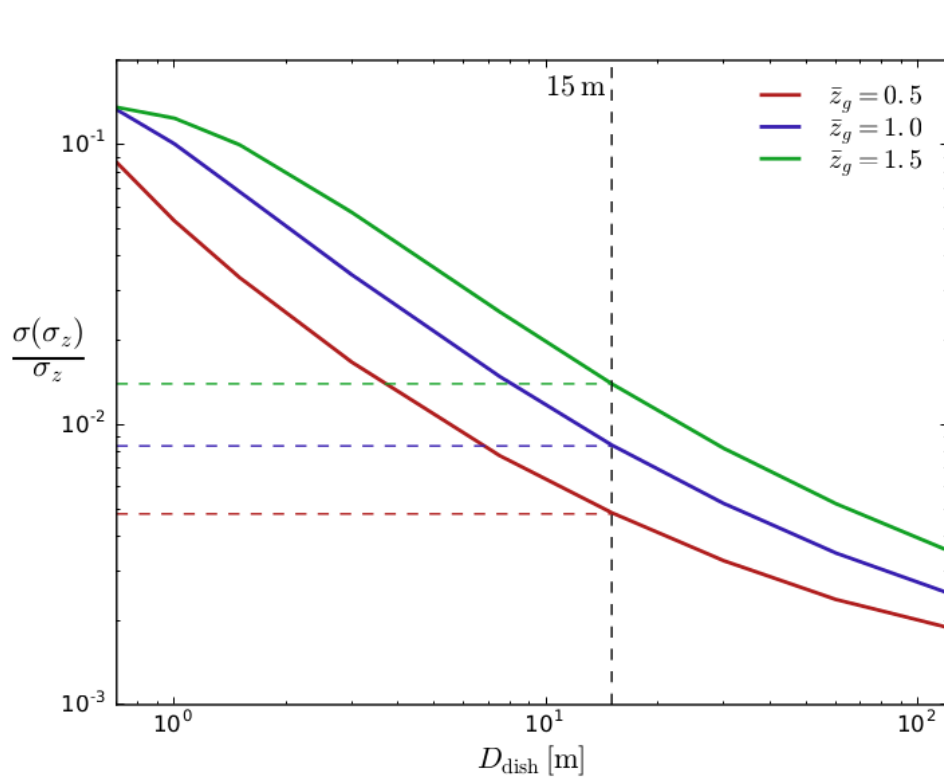


Clustering redshifts:

- Idea: reconstruct photo-z distribution using cross-correlations with spectro-z
- Cross correlate photo-z bin with thin spectro-z bins.
- The amplitude of the cross-correlation traces the shape of the photo-z distribution.
- IM could work just as well!

DA, P. Ferreira, M. Jarvis (in prep.)

2 Reducing photo-z systematics

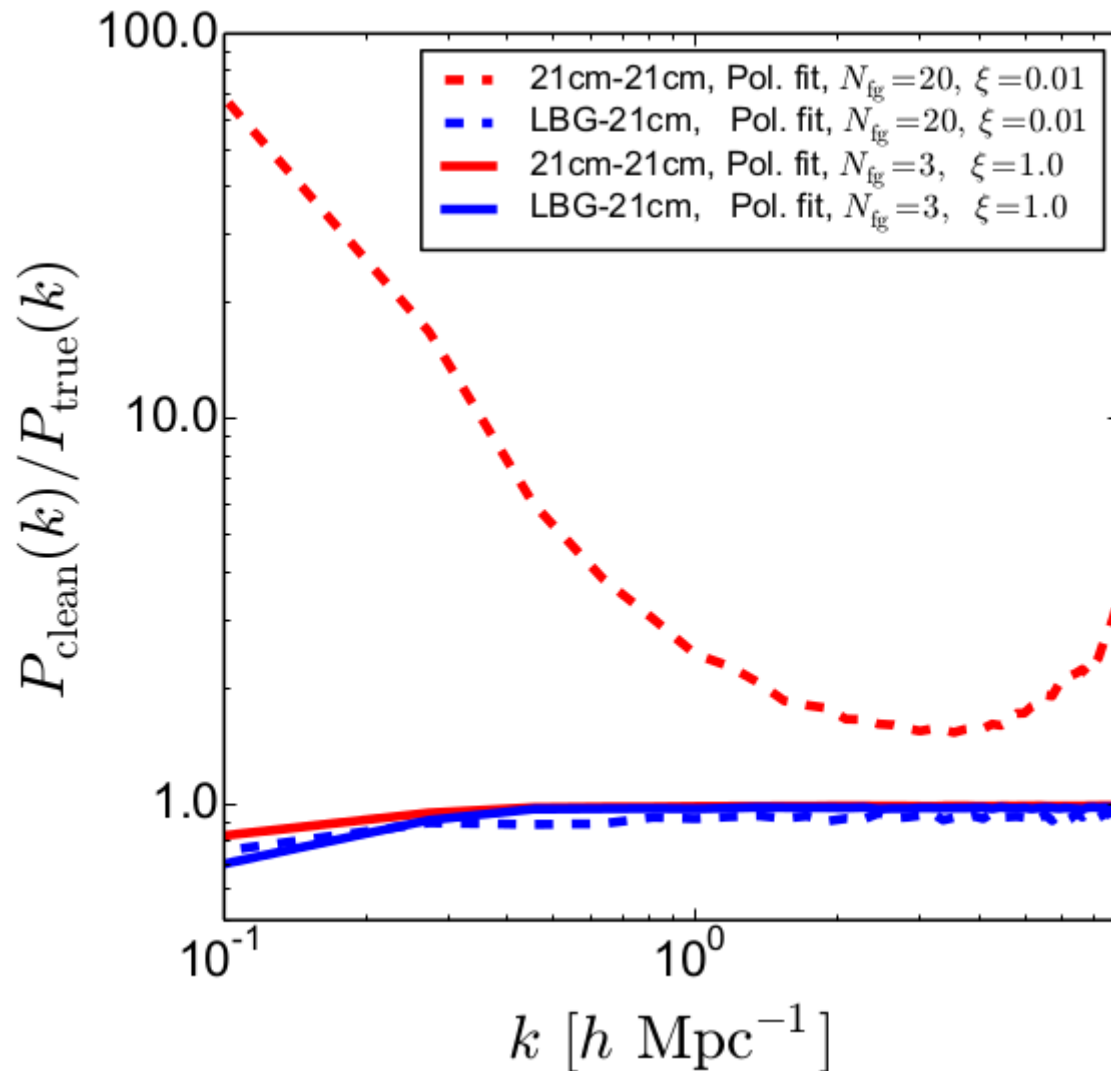


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- IM could work just as well!

DA, P. Ferreira, M. Jarvis (in prep.)

3 Reducing foreground systematics



- Badly behaved foregrounds could be impossible to subtract.
- E.g. leaked polarized synchrotron.
- Foregrounds cancel out in cross-correlation.
- This was used to make 1st detection of IM signal (Masui et al. 1208.0331)
- Not yet done with photo-z surveys.

Villaescusa-Navarro et al. 1410.7393

4 Bayesian clustering analyses

General motivation: use **ALL** information to measure redshifts

$$\mathbf{z} \leftarrow p(\mathbf{z} | \mathbf{m}, \hat{\mathbf{n}}, \delta_{\text{HI}})$$

magnitudes
angular positions
HI density

Jointly sample the underlying density distribution.

$$\{\mathbf{z}, \delta\} \leftarrow p(\mathbf{z}, \delta | \mathbf{m}, \hat{\mathbf{n}}, \delta_{\text{HI}})$$

Can be done in a Gibbs-sampling way:

$$\mathbf{z}_{n+1} \leftarrow p(\mathbf{z} | \mathbf{m}, \hat{\mathbf{n}}, \delta_{\text{HI}}, \delta_n) = \prod_g p(z^g | m^g) p(z | \delta_n(\hat{n}^g))$$

redshifts sampled individually

$$\delta_{n+1} \leftarrow p(\delta | \mathbf{z}_{n+1}, \mathbf{m}, \hat{\mathbf{n}}, \delta_{\text{HI}}) = p(\delta | \delta_g(\mathbf{z}_{n+1}, \hat{\mathbf{n}}), \delta_{\text{HI}})$$

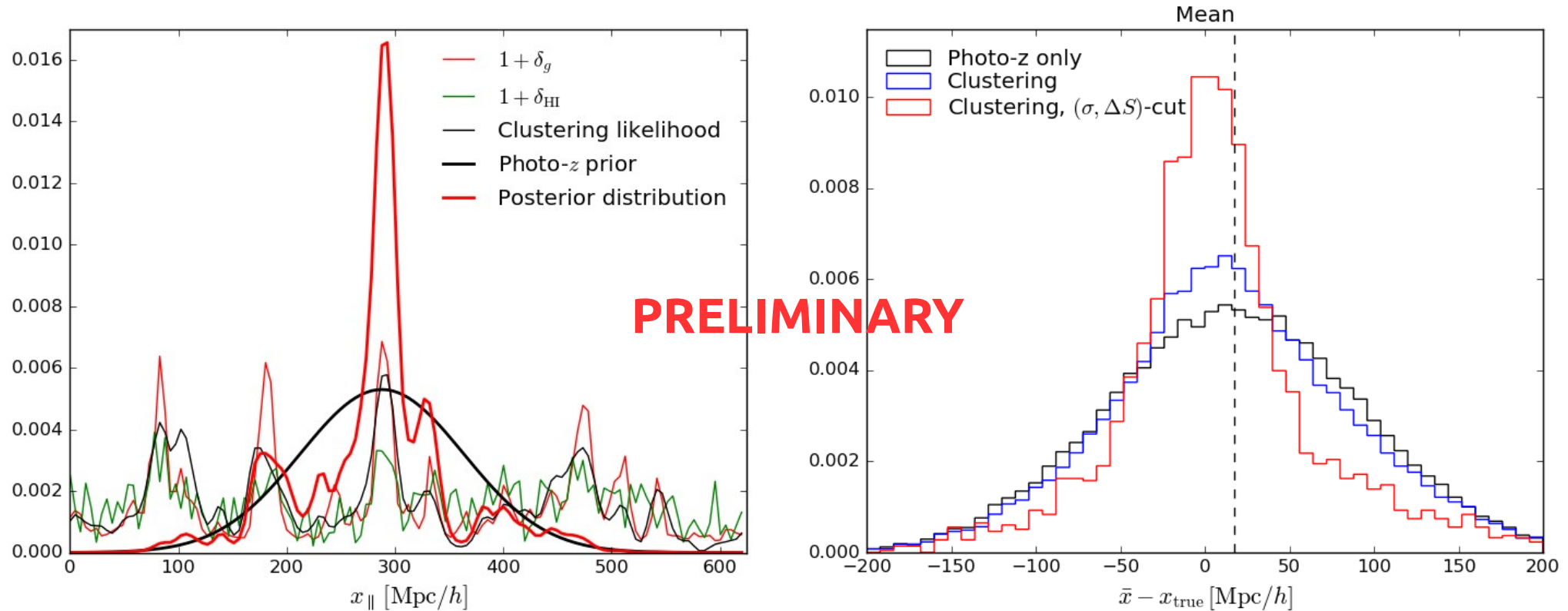
Jasche & Wandelt 1106.2757

Galaxy overdensity according in the (n+1)-th realization

DA, P. Ferreira, M. Jarvis (in prep.)

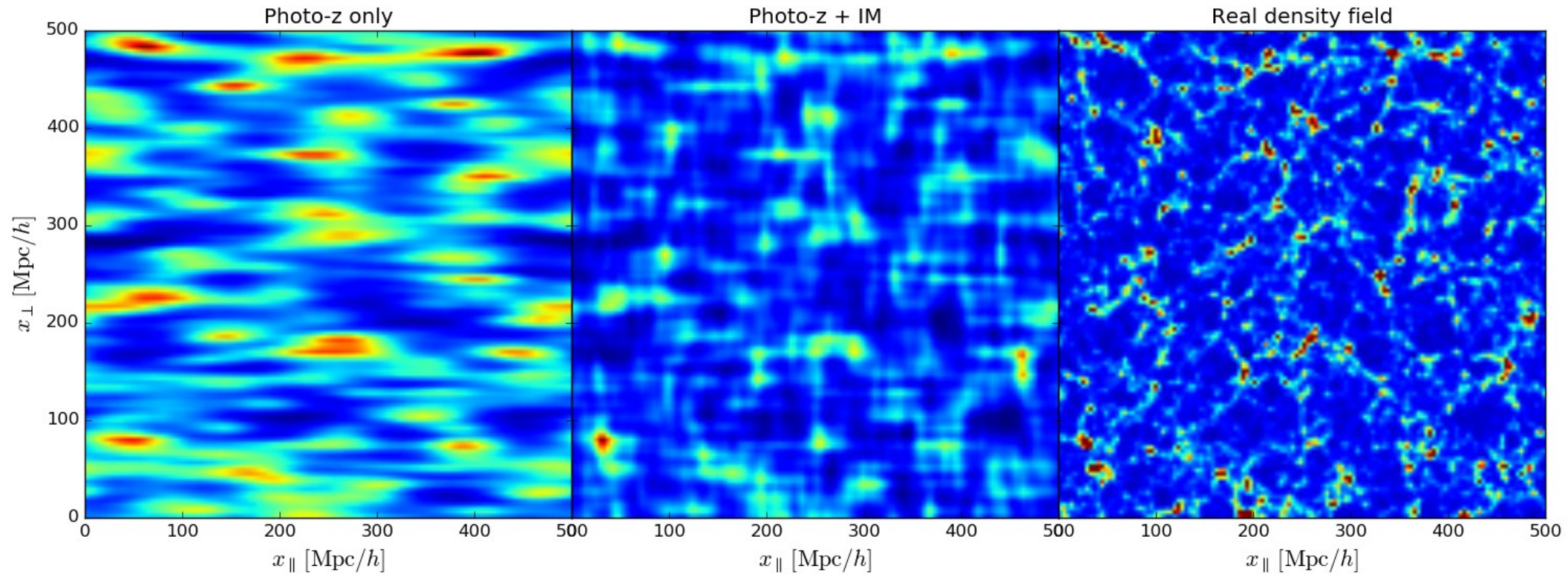
4 Bayesian clustering analyses

DA, P. Ferreira, M. Jarvis (in prep.)



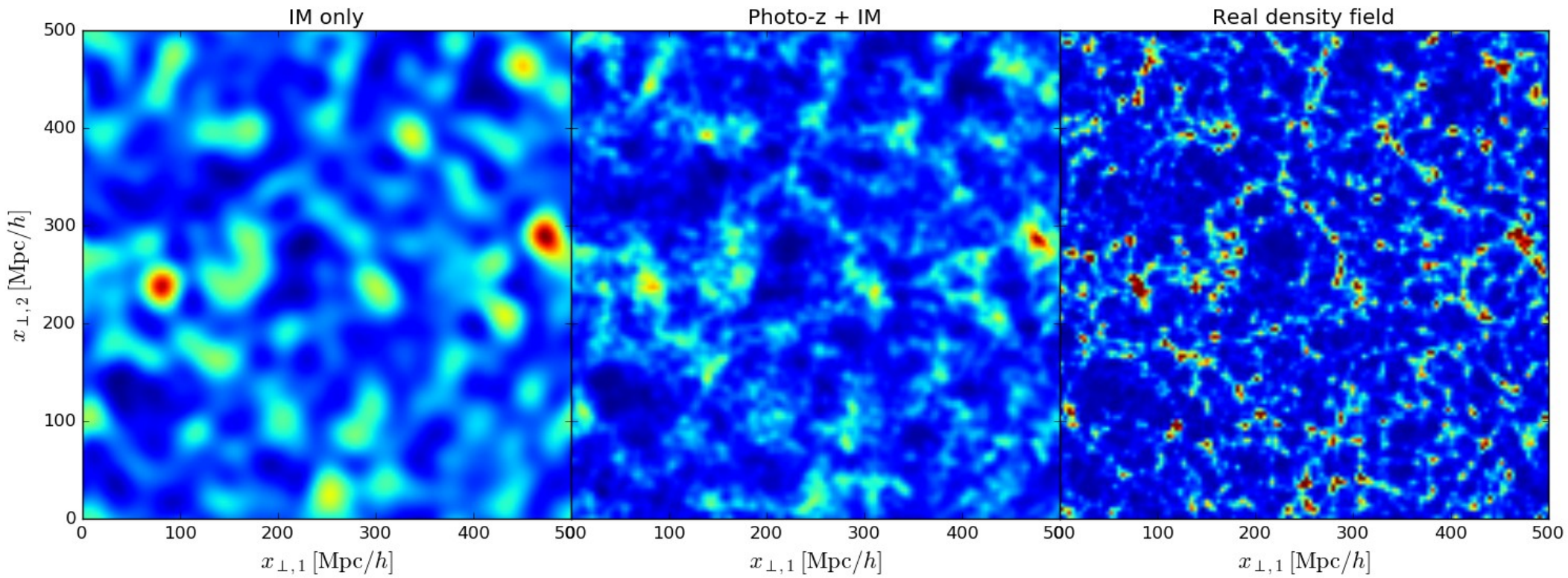
- The posterior distributions are a lot more informative.
- On average, reduced photo-z uncertainties (>10%)
- On high-density regions, σ_z reduced by a factor of ~ 10
- Clean sample can be selected:
 - $\sim 30\%$ better photo-z's
 - Impervious to photo-z bias
- Improved redshift usable for non-clustering analyses (e.g. SNe?)

4 Bayesian clustering analyses



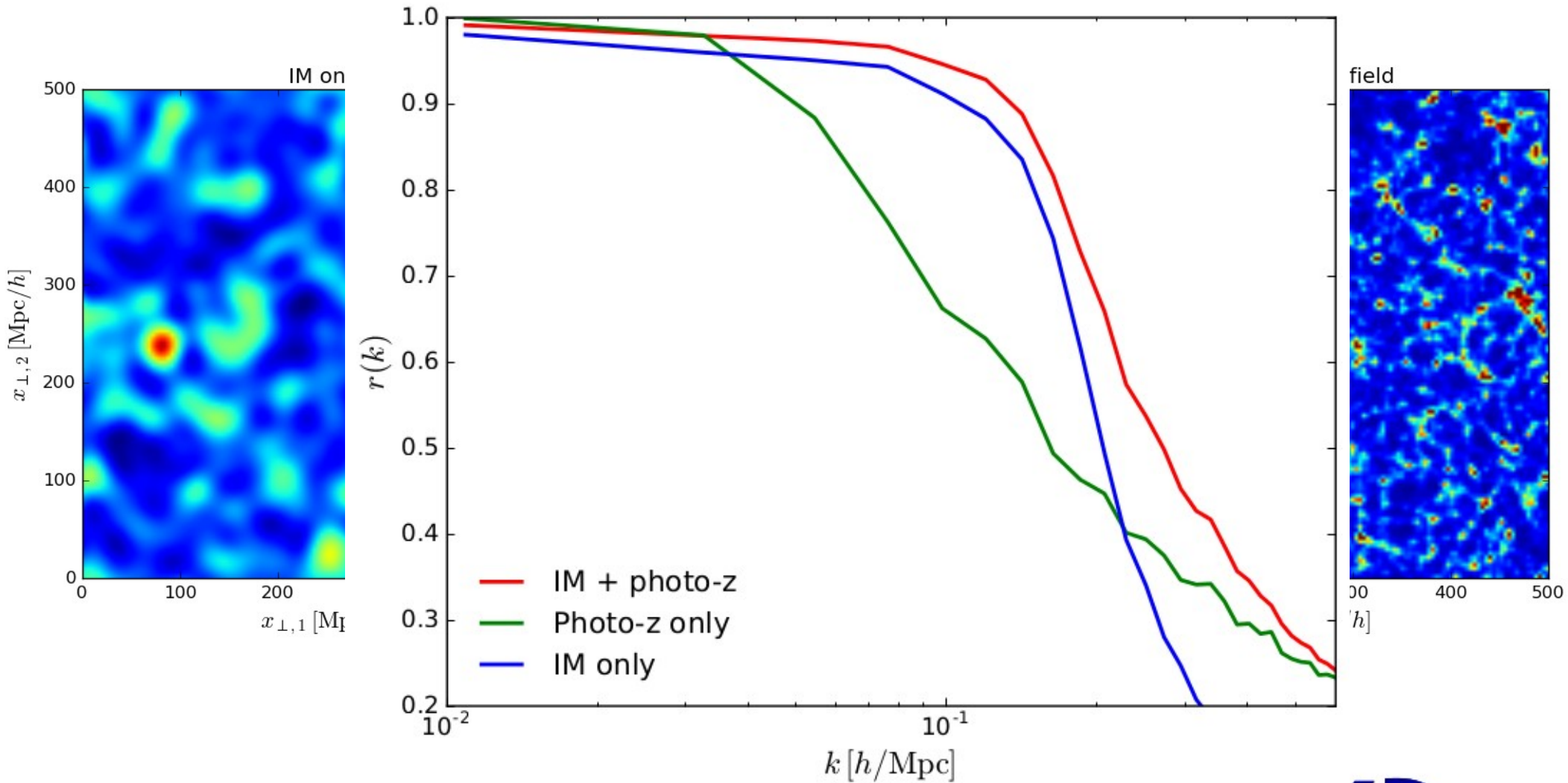
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4 Bayesian clustering analyses

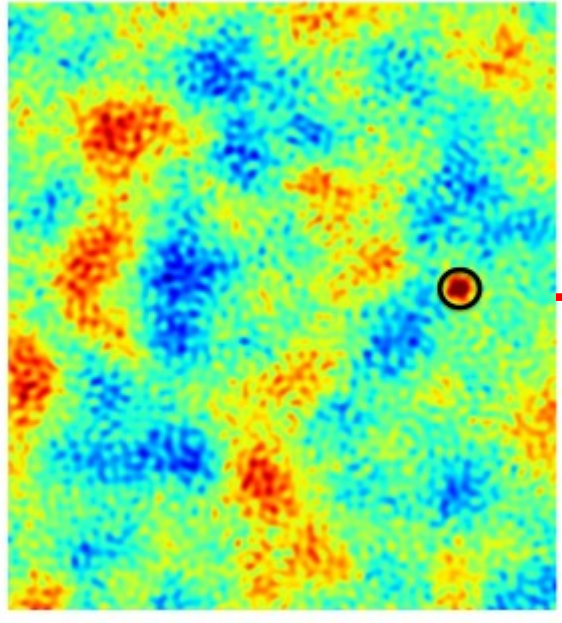


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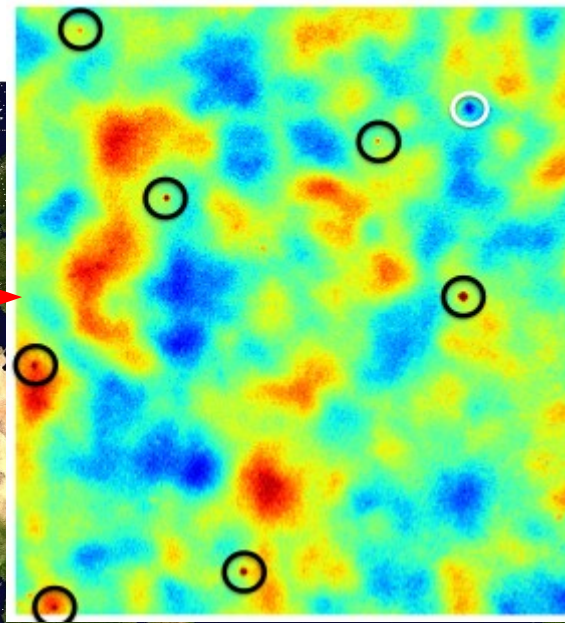
5. Measuring growth with kSZ

AdvACT

Planck



ACTPol

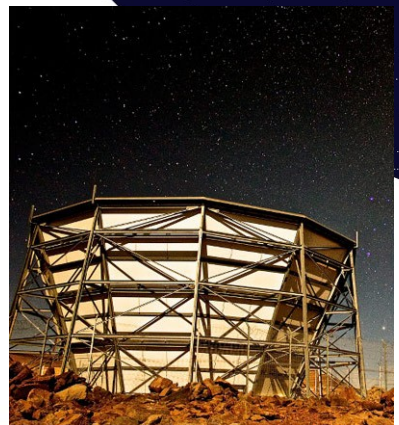


AdvACT

Science products:

- CMB primary
- Primordial GW
- CMB lensing
- Thermal SZ
- Kinematic SZ
- Point sources (DSFGs)

Henderson et al. 1510.02809



Growth from kSZ

Method:

- CMB experiment + overlapping spectroscopic survey
- tSZ-selected clusters with kSZ measurements
- Use galaxy positions to reconstruct cluster velocities.

$$\mathbf{v}(t, \mathbf{k}) = \frac{H f}{a} \frac{i\mathbf{k}}{k^2} \delta(t, \mathbf{k})$$

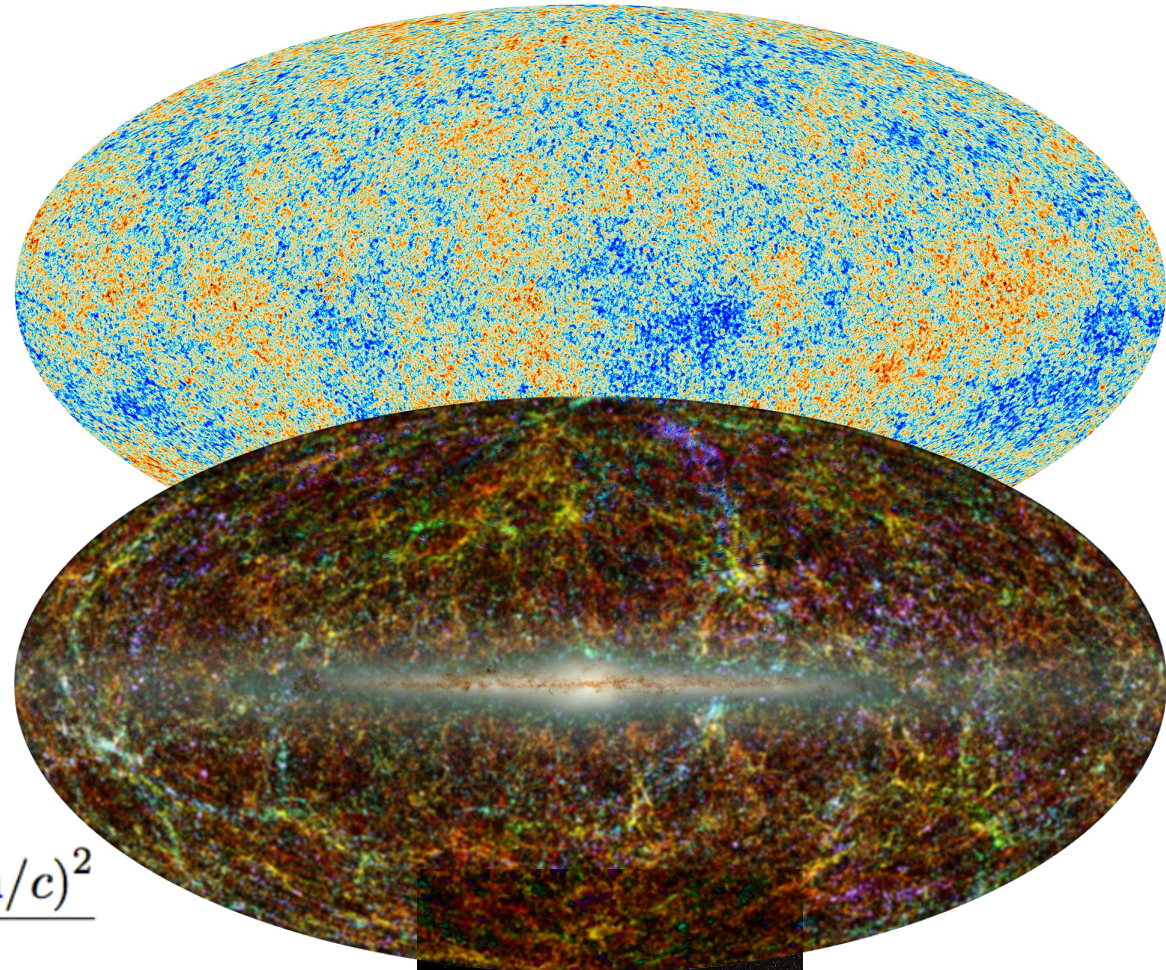
- Match reconstructed velocity with kSZ measurement.

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$$\chi^2(H f) = \frac{(\Delta T(\hat{\mathbf{n}}) - \tau(Y) \mathbf{v}(\delta, H f) \cdot \hat{\mathbf{n}}/c)^2}{\sigma^2}$$

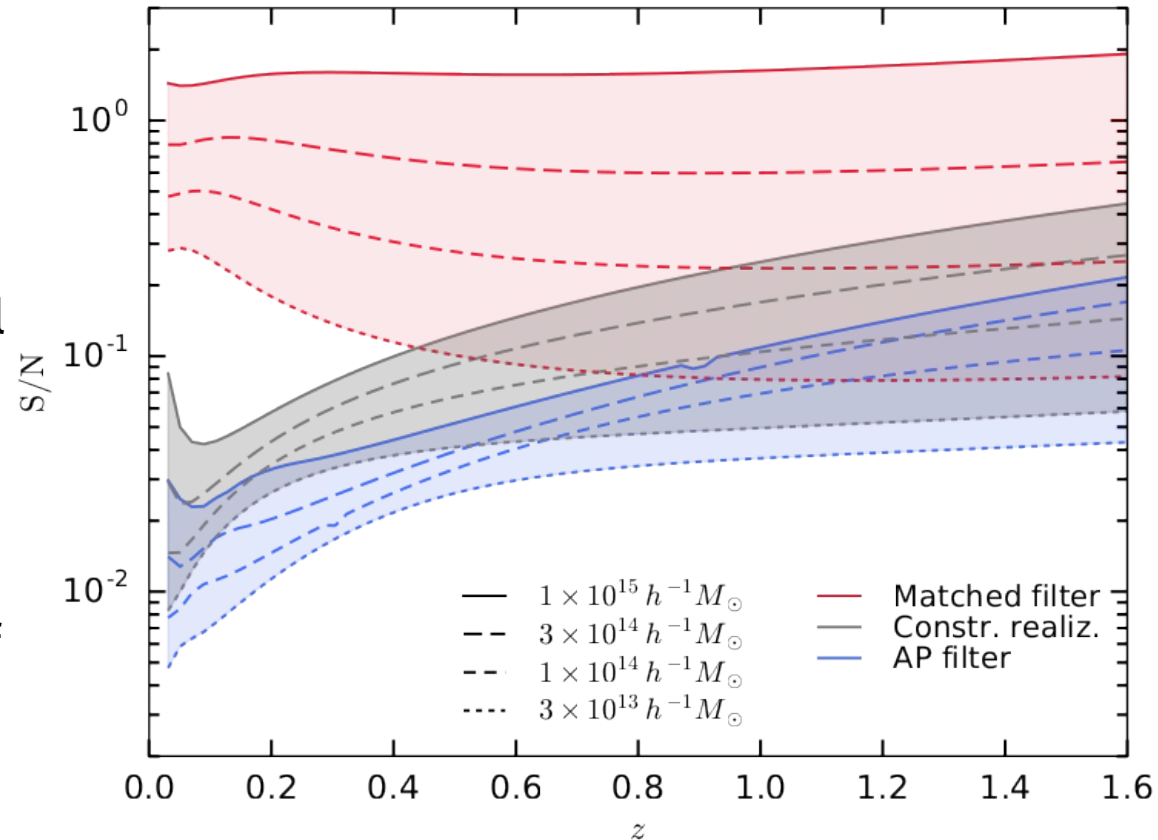
$$\left. \frac{\Delta T}{T} \right|_{\text{tSZ}}(\nu, \hat{\mathbf{n}}) = f_{\text{tSZ}}(\nu) \frac{\sigma_T}{m_e c^2} \int P_e(l_z, \hat{\mathbf{n}}) dl_z$$

$$\left. \frac{\Delta T}{T} \right|_{\text{kSZ}}(\hat{\mathbf{n}}) = -\sigma_T \int (\boldsymbol{\beta} \cdot \hat{\mathbf{n}}) n_e(l_z, \hat{\mathbf{n}}) dl_z$$



Measuring the kSZ effect

- tSZ can be separated using multi-frequency.
- kSZ has black-body spectrum
- Must be separated using different scale dependence.
- Three methods:
 - AP filter: assume only a clear spectral separation.
Most conservative method.
 - Constrained realizations: assume knowledge of CMB power spectrum.
Less conservative, still safe.
 - Matched filter: assume knowledge of CMB power spectrum AND cluster profiles.
Optimal. Dependent on cluster assumptions.



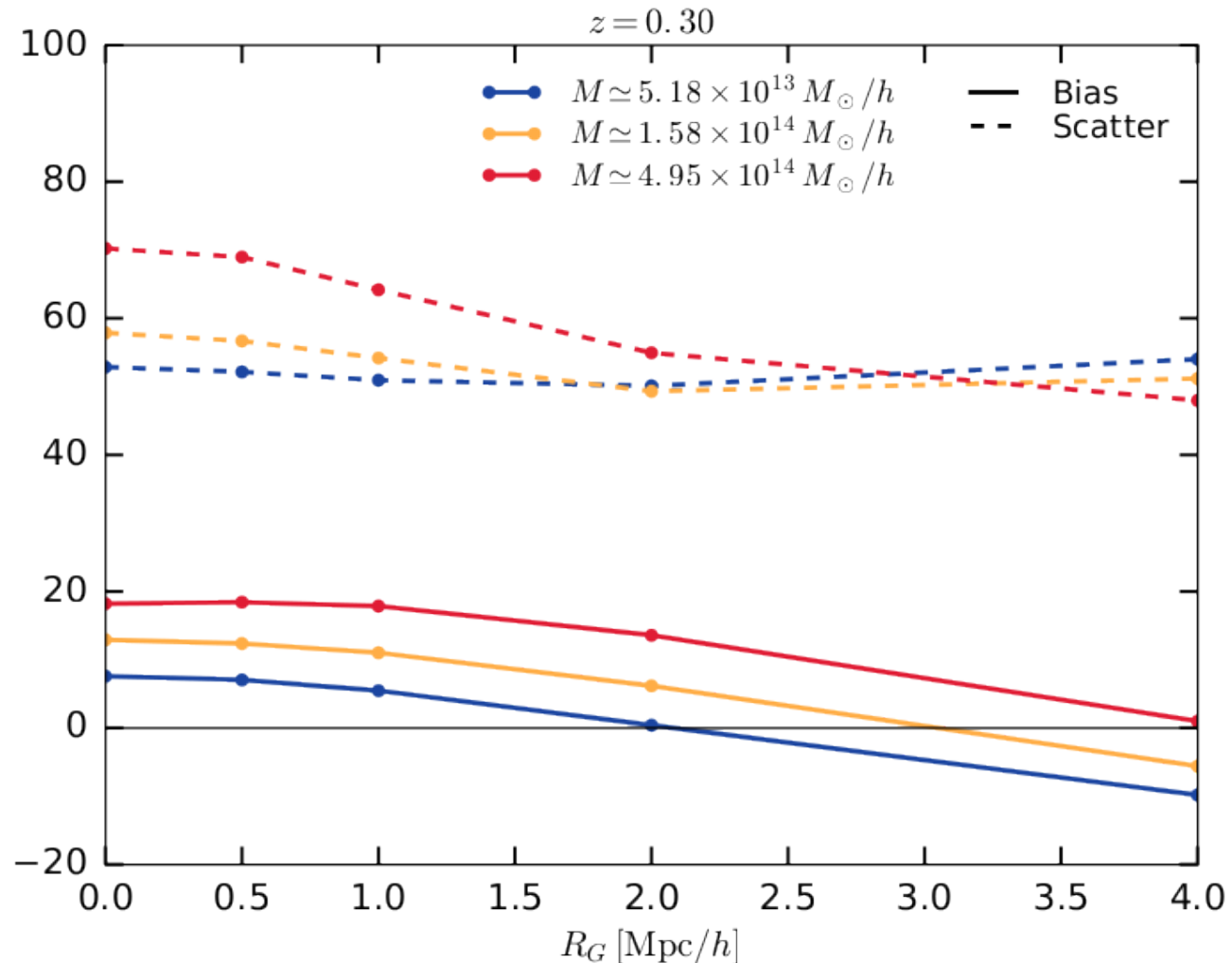
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Velocity reconstruction

- Simple density-velocity relation in the linear regime.

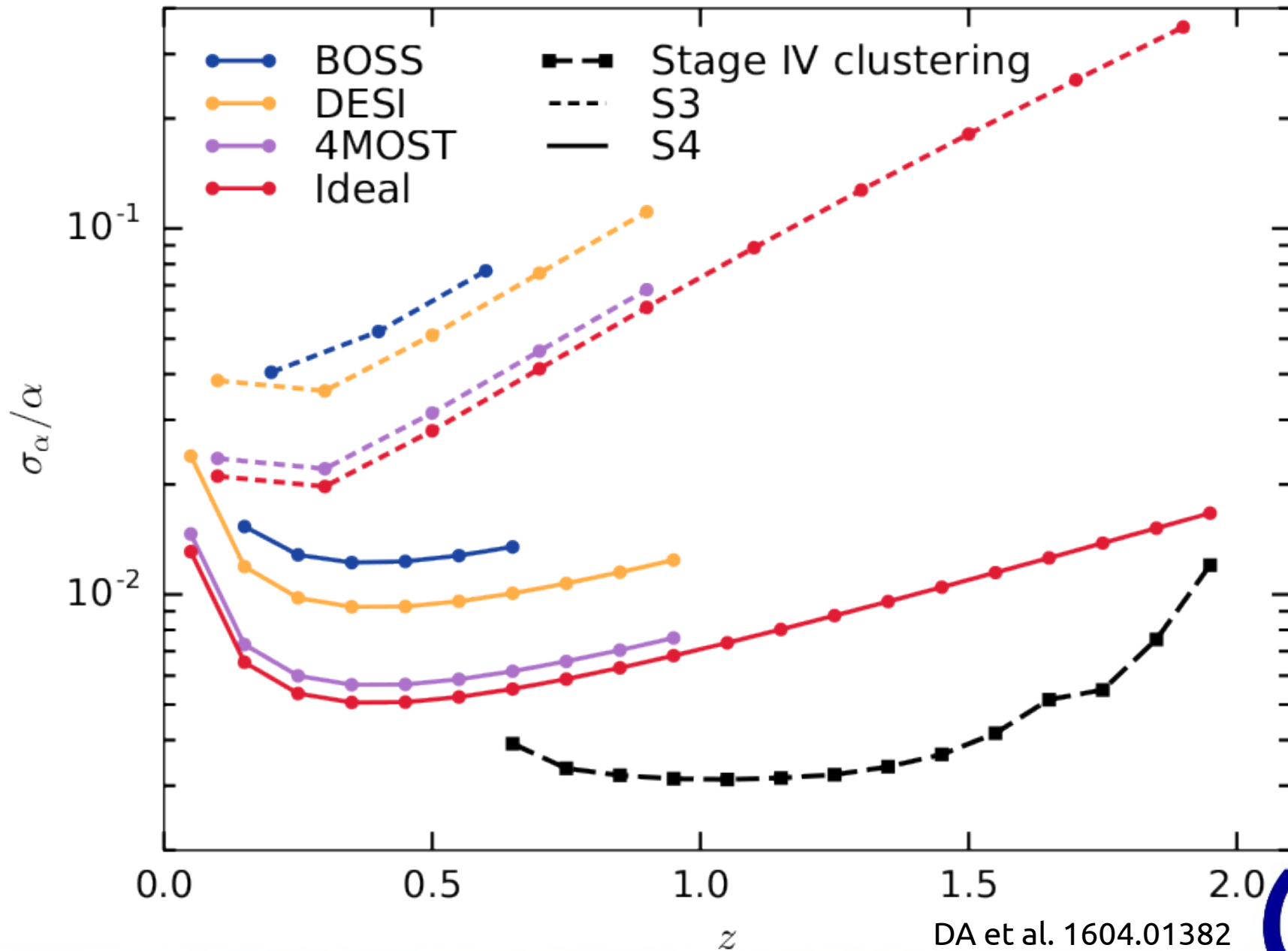
$$\mathbf{v}(t, \mathbf{k}) = \frac{H f}{a} \frac{i\mathbf{k}}{k^2} \delta(t, \mathbf{k})$$

- Better estimates possible (e.g. 2LPT, full Bayesian modelling).
- Estimated reconstruction error from simulations.
- Linear method works well after smoothing (e.g. bad in high-density regions).



DA et al. 1604.01382

Constraints from S-IV experiments



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Conclusions

- In the next decade we will have an unprecedented coverage of the sky, in terms of area, depth and frequency bandwidth.
- 21cm intensity mapping is a cheap method to cover large portions of the sky, enabling large-scale cosmological studies.
- Robust observables, such as the BAO should be impervious to the effect of foregrounds.
- HI is also a great probe to combine with other tracers (e.g. low bias, no lensing).
- Relativistic LSS effects are only observables using multi-tracer techniques. f_{NL} measurements will benefit greatly from cross-correlations.
- Constraints on modified-gravity parameters will improve by a factor of ~ 10 with Stage-IV experiments.
- IM and photo-z's are almost complementary probes in terms of scale-coverage.
- A combination of both can:
 - Improve cosmological constraints.
 - Eliminate/mitigate individual systematics.
 - Improve individual redshift estimates and help reconstruct the true density field.
- The combination of CMB and LSS observations offers multiple new cosmological probes.
- Combining velocity reconstruction from spectroscopic surveys and kSZ measurements can yield alternative measurements of the growth rate.
- A good understanding of cluster physics is indispensable

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¡Gracias!

Relativistic effects in LSS

$$\Delta_N = b \delta_M - \frac{1}{\mathcal{H}} \frac{\partial v_r}{\partial \chi} + (5s - 2) \left[\kappa - \frac{2}{\chi} \int \Phi d\eta \right] +$$

$$\left[\frac{2 - 5s}{\mathcal{H}\chi} + 5s - f_{\text{evo}} + \frac{\dot{\mathcal{H}}}{\mathcal{H}} \right] \left[\psi + \int \dot{\Phi} d\eta - v_r \right] +$$

$$\frac{\dot{\phi}}{\mathcal{H}} + \psi + (5s - 2)\phi$$



Density



RSDs



Lensing



“Relativistic effects”

Challinor and Lewis, arXiv:1105.5292
Bonvin and Durrer, arXiv:1105.5280