

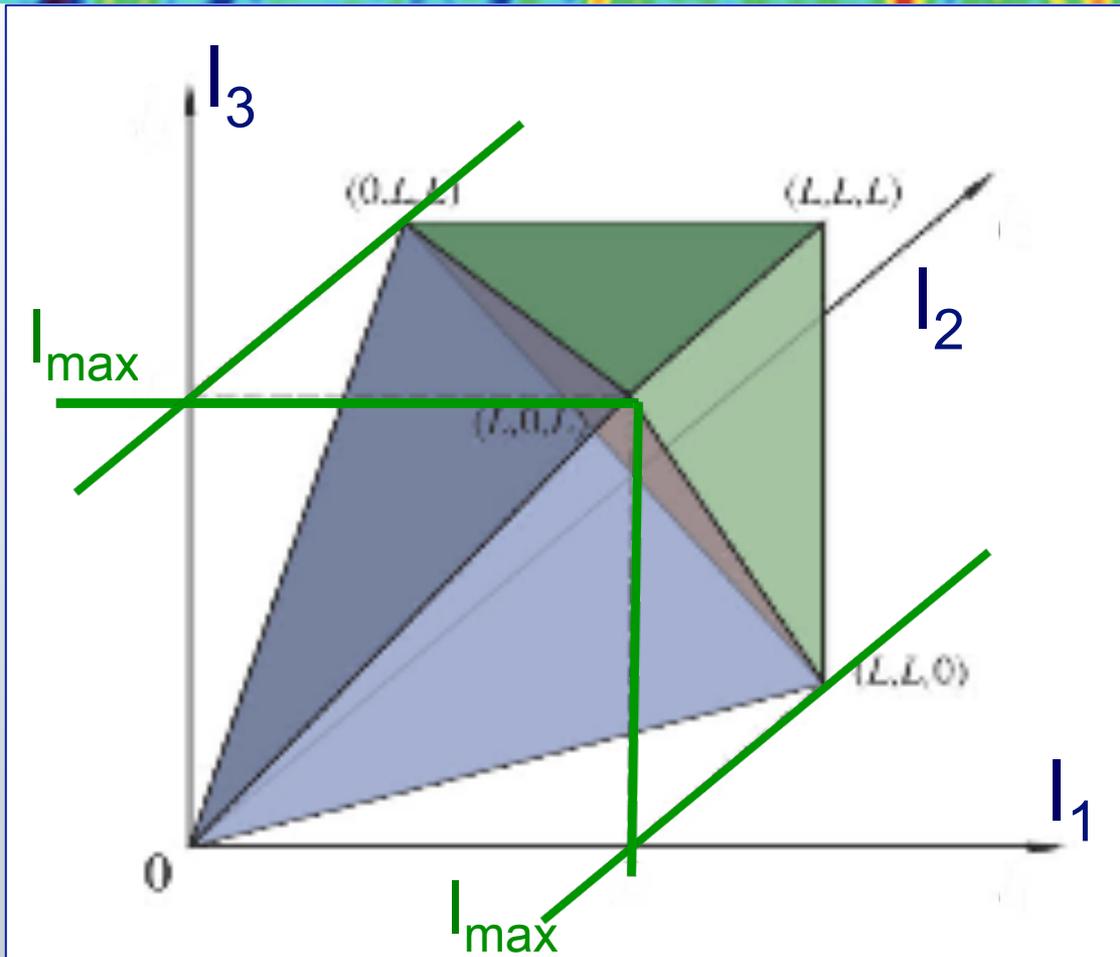
A 3D rendering of the Planck satellite, showing its complex structure with multiple layers and a large central dish.

# Modal bispectrum estimation with Planck data

Michele Liguori

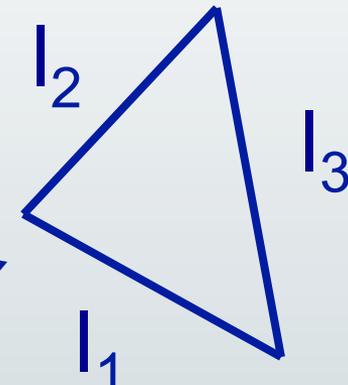
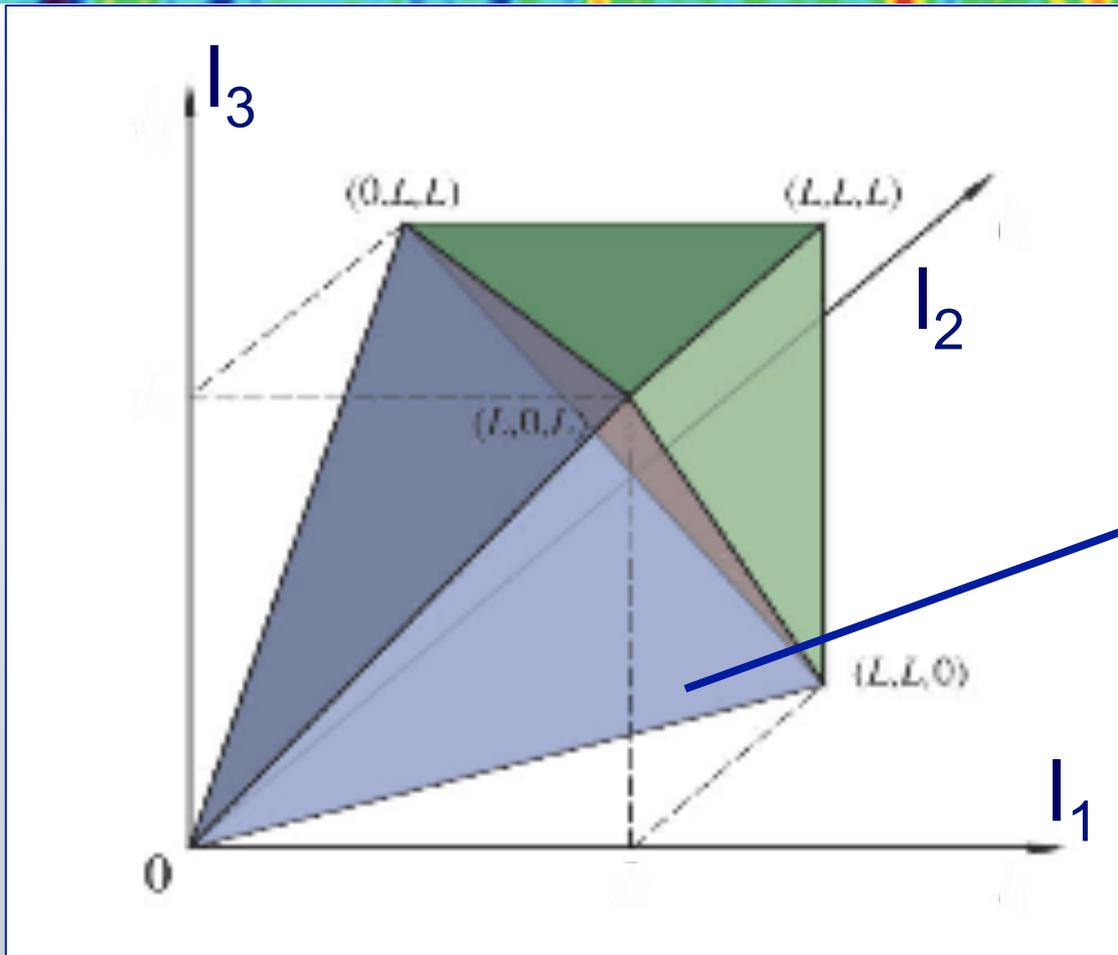
Department of Physics and Astronomy, University of Padova

*On behalf of the Planck collaboration*

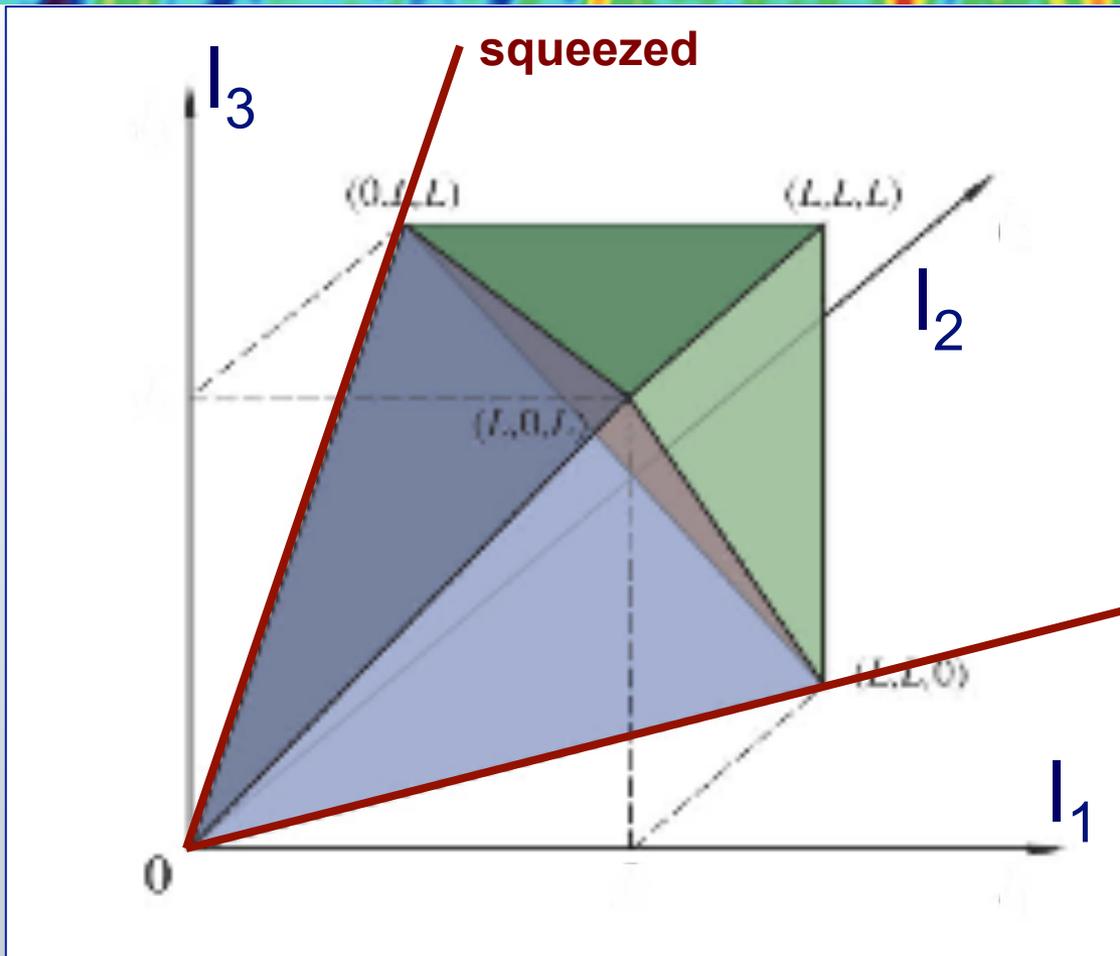


$$B_{l_1 l_2 l_3} = \sum \begin{pmatrix} l_1 & l_2 & l_3 \\ m_1 & m_2 & m_3 \end{pmatrix} \langle a_{l_1}^{m_1} a_{l_2}^{m_2} a_{l_3}^{m_3} \rangle ; B_{l_1 l_2 l_3} = h_{l_1 l_2 l_3} b_{l_1 l_2 l_3}$$

# Bispectrum definition

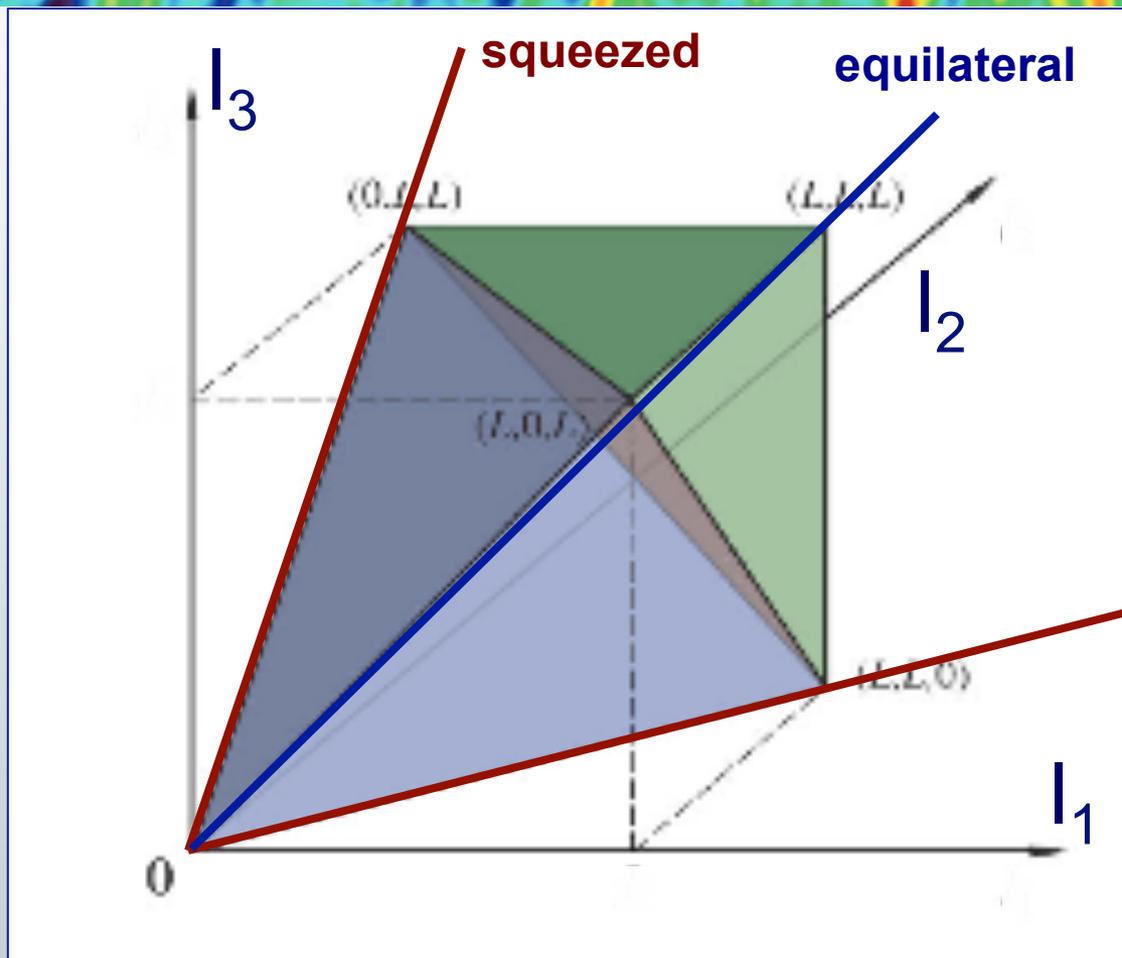


$$B_{l_1 l_2 l_3} = \sum \begin{pmatrix} l_1 & l_2 & l_3 \\ m_1 & m_2 & m_3 \end{pmatrix} \langle a_{l_1}^{m_1} a_{l_2}^{m_2} a_{l_3}^{m_3} \rangle ; B_{l_1 l_2 l_3} = h_{l_1 l_2 l_3} b_{l_1 l_2 l_3}$$



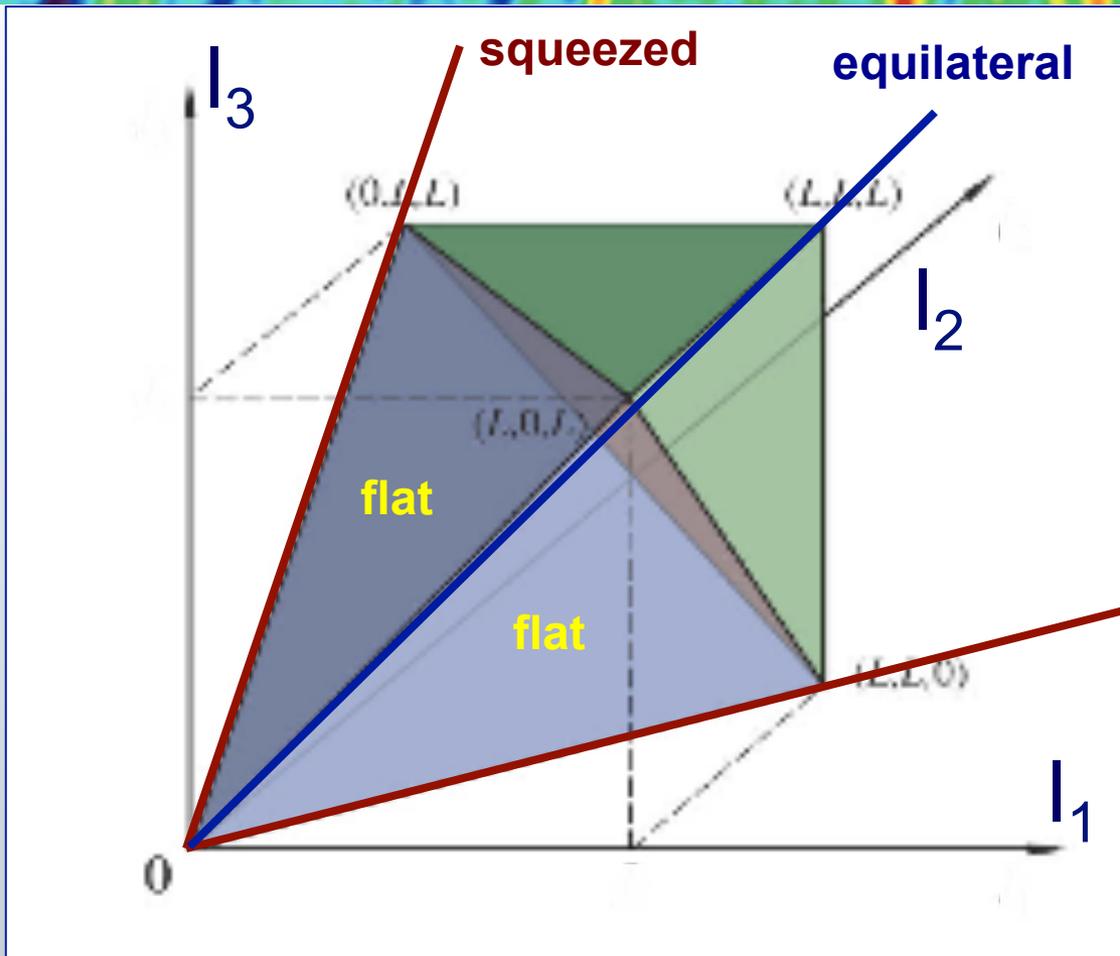
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# Bispectrum definition

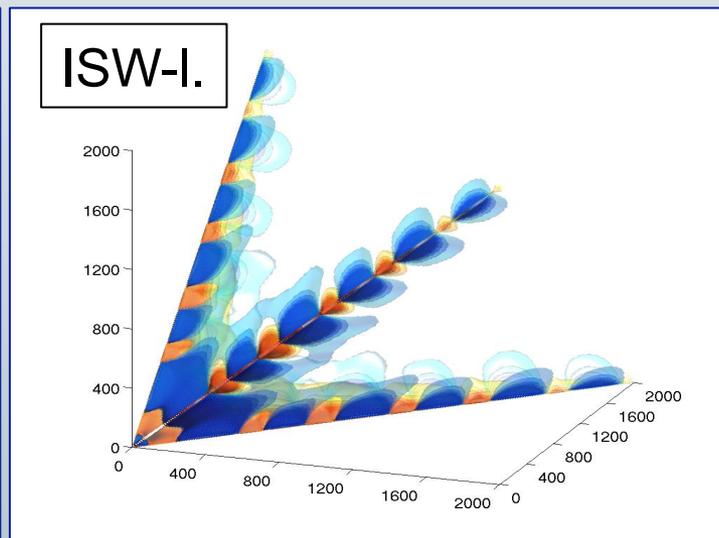
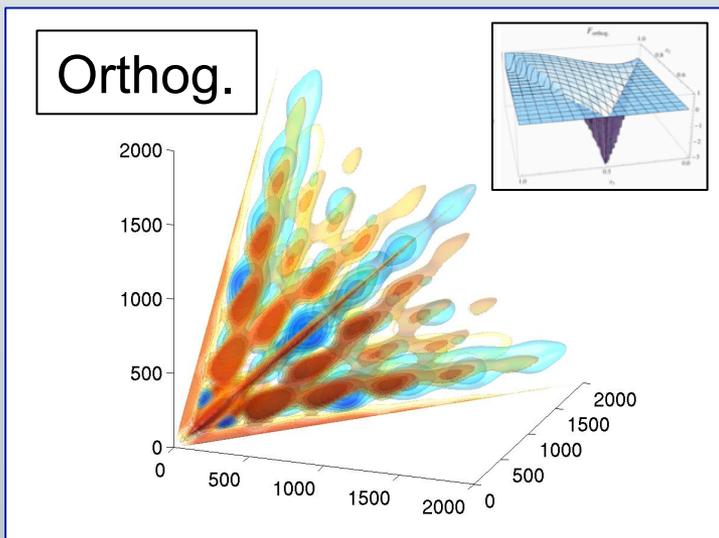
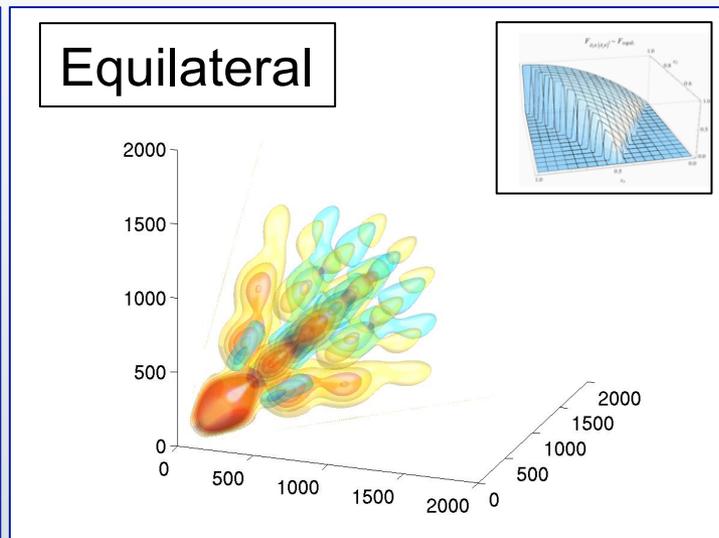
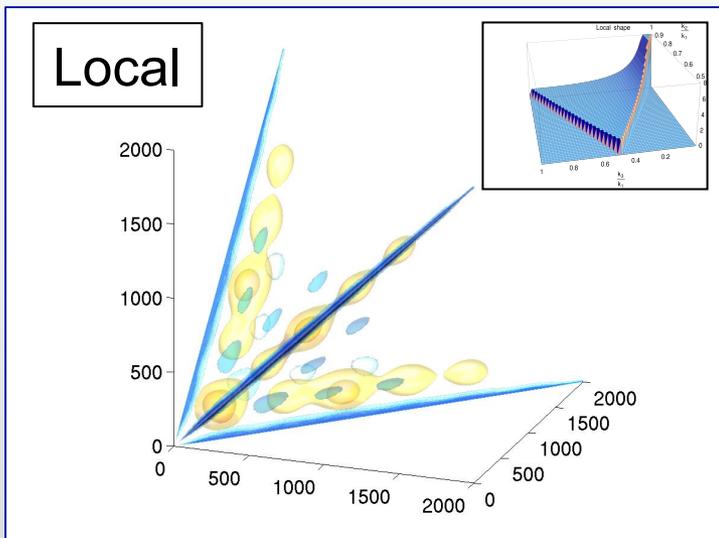


$$B_{l_1 l_2 l_3} = \sum \begin{pmatrix} l_1 & l_2 & l_3 \\ m_1 & m_2 & m_3 \end{pmatrix} \langle a_{l_1}^{m_1} a_{l_2}^{m_2} a_{l_3}^{m_3} \rangle ; B_{l_1 l_2 l_3} = h_{l_1 l_2 l_3} b_{l_1 l_2 l_3}$$

# Bispectrum definition



$$B_{l_1 l_2 l_3} = \sum \begin{pmatrix} l_1 & l_2 & l_3 \\ m_1 & m_2 & m_3 \end{pmatrix} \langle a_{l_1}^{m_1} a_{l_2}^{m_2} a_{l_3}^{m_3} \rangle ; B_{l_1 l_2 l_3} = h_{l_1 l_2 l_3} b_{l_1 l_2 l_3}$$



$$\hat{f}_{NL} = \frac{1}{N} \sum B_{\ell_1 \ell_2 \ell_3}^{m_1 m_2 m_3} (C^{-1} a)_{\ell_1}^{m_1} (C^{-1} a)_{\ell_2}^{m_2} (C^{-1} a)_{\ell_3}^{m_3} - 3C_{\ell_1 m_1 \ell_2 m_2}^{-1} (C^{-1} a)_{\ell_3}^{m_3}$$

Leaving aside complications coming from breaking of statistical isotropy (sky-cut, noise...), one can see that we are extracting the three point Function from the data and fitting theoretical bispectrum templates to it

$$\hat{f}_{NL} = \frac{1}{N} \sum_{\ell_i m_i} B_{\ell_1 \ell_2 \ell_3}^{m_1 m_2 m_3} \frac{a_{\ell_1}^{m_1}}{C_{\ell_1}} \frac{a_{\ell_2}^{m_2}}{C_{\ell_2}} \frac{a_{\ell_3}^{m_3}}{C_{\ell_3}}$$

A brute force implementation scales like  $\ell_{\max}^5$ . Unfeasible at Planck (or WMAP) resolution.

Can achieve massive speed improvement ( $\ell_{\max}^3$  scaling) if the reduced bispectrum is *separable* (Komatsu, Spergel, Wandelt 2003)

$$b_{\ell_1 \ell_2 \ell_3} = \sum_{ijk} X_{\ell_1}^i Y_{\ell_2}^j Z_{\ell_3}^k \Rightarrow B_{\ell_1 \ell_2 \ell_3}^{m_1 m_2 m_3} = b_{\ell_1 \ell_2 \ell_3} \int Y_{\ell_1}^{m_1}(\Omega) Y_{\ell_2}^{m_2}(\Omega) Y_{\ell_3}^{m_3}(\Omega)$$

We expand theoretical shapes as a series of *separable* bispectrum templates (“modes”), forming a complete orthonormal basis in bispectrum space, with the scalar product:

$$\langle f, g \rangle = \sum_{\{l\}} w_{l_1 l_2 l_3} \frac{(2l_1 + 1)(2l_2 + 1)(2l_3 + 1)}{4\pi} \begin{pmatrix} l_1 & l_2 & l_3 \\ 0 & 0 & 0 \end{pmatrix} f_{l_1 l_2 l_3} g_{l_1 l_2 l_3}$$

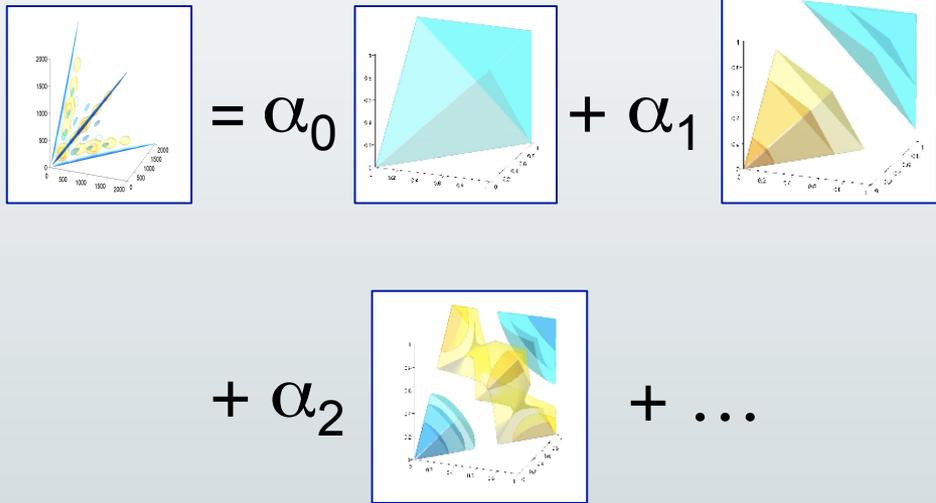
Define modes with  $\mathfrak{R}_n(l_1, l_2, l_3)$  and expand:

$$\frac{b_{l_1 l_2 l_3}^{theory}}{\sqrt{C_{l_1} C_{l_2} C_{l_3}}} = \sum_n \alpha_n \mathfrak{R}_n$$

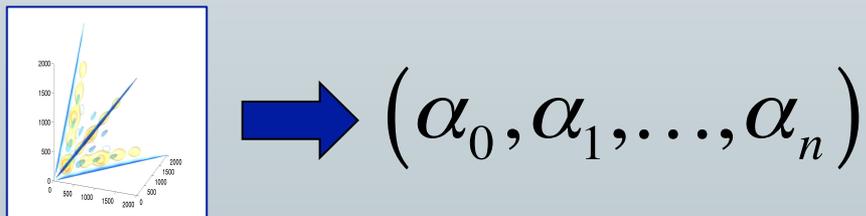
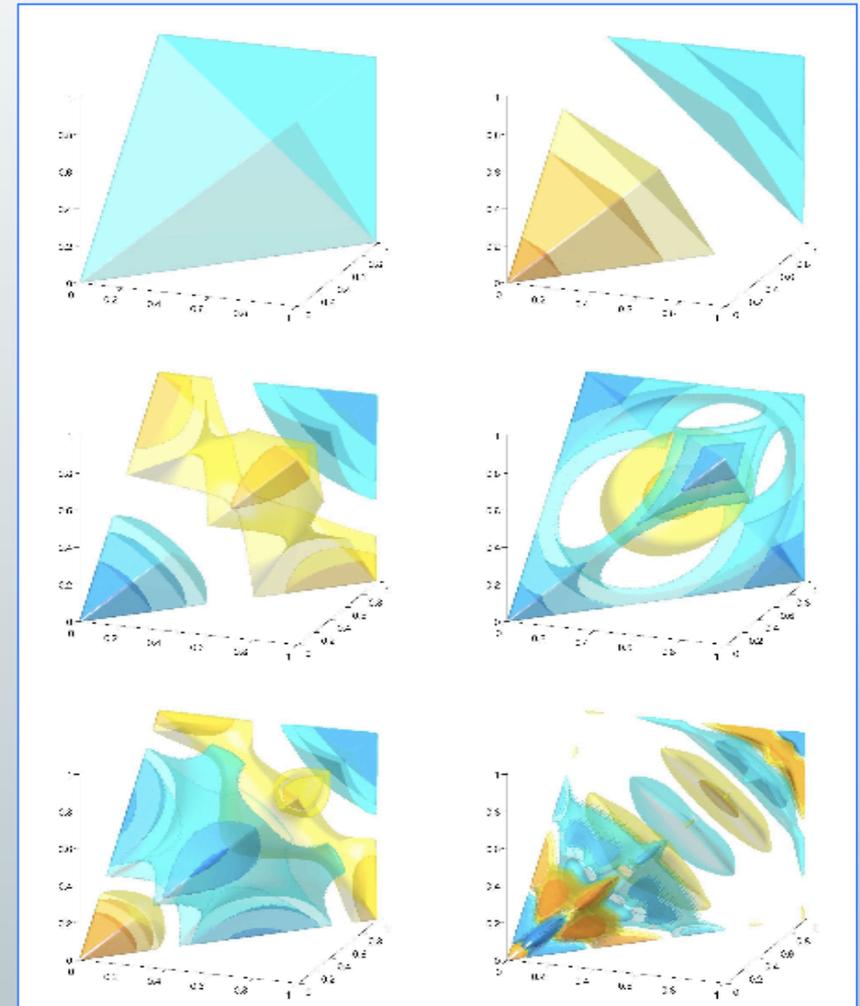
Truncate when the expanded shape is highly correlated to the initial one ( $r > 0.95$ )

(Fergusson, ML, Shellard, 2009, 2010)

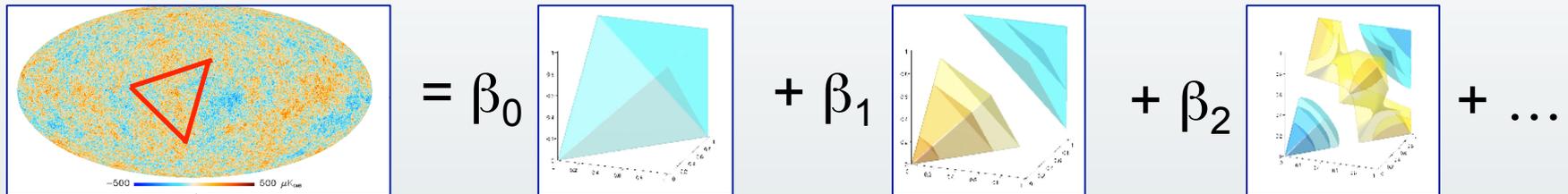
## Expansion



## Basis modes

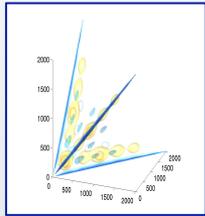


# Bispectrum estimation

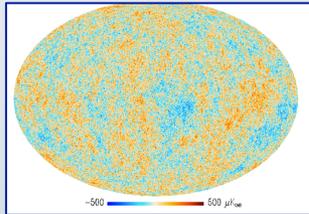


For a given dataset, extract best-fit  $b_i$ ,  $i=1, \dots, n$

- The basis elements pictured on the right *are by construction factorizable*
- Apply position space cubic statistics, “KSW”, to each separable template on the right to estimate the amplitudes  $\beta_i$
- Orthonormal basis  $\rightarrow \beta_i$  uncorrelated (in first approx.)



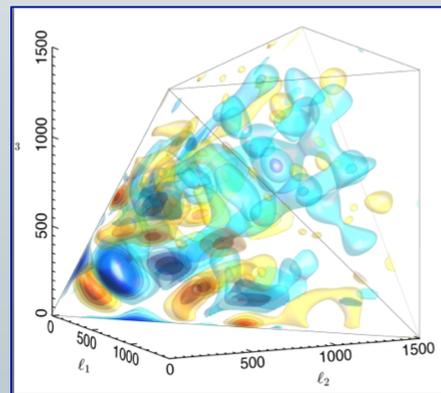
→  $(\alpha_0, \alpha_1, \dots, \alpha_n)$  Theory



→  $(\beta_0, \beta_1, \dots, \beta_n)$  Data ("mode spectrum")

$$f_{NL} = \frac{1}{N} \sum_n \alpha_n \beta_n$$

$$N = \frac{1}{6} \sum_n \alpha_n^2$$



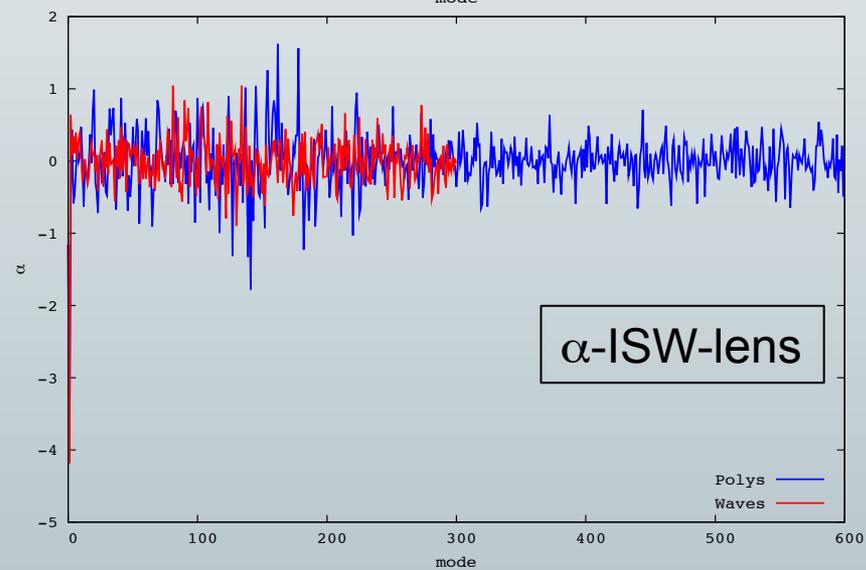
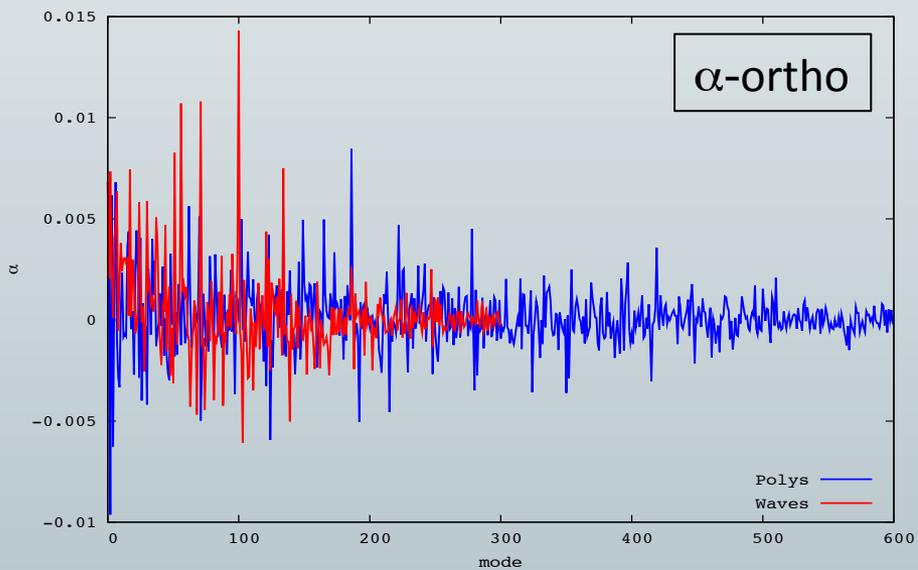
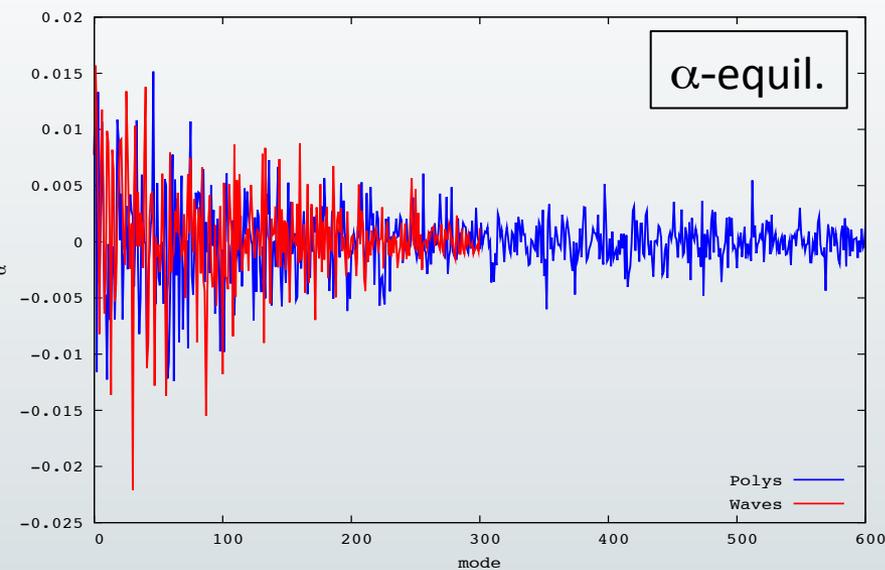
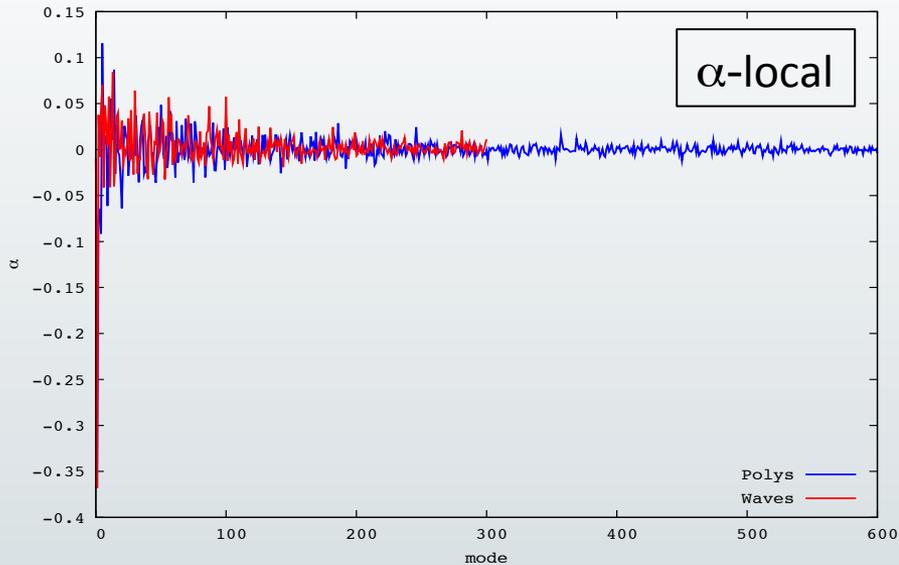
$$= \sum_n \beta_n \mathfrak{R}_n$$

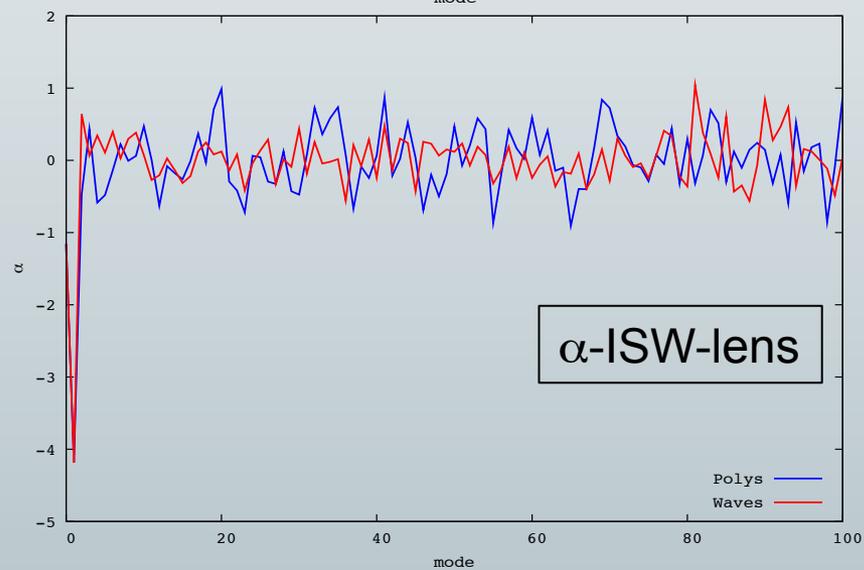
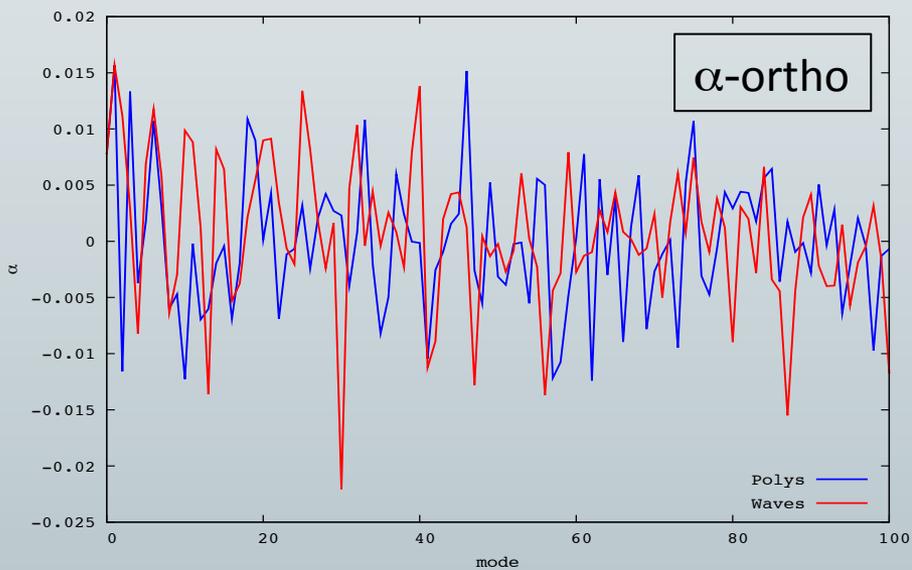
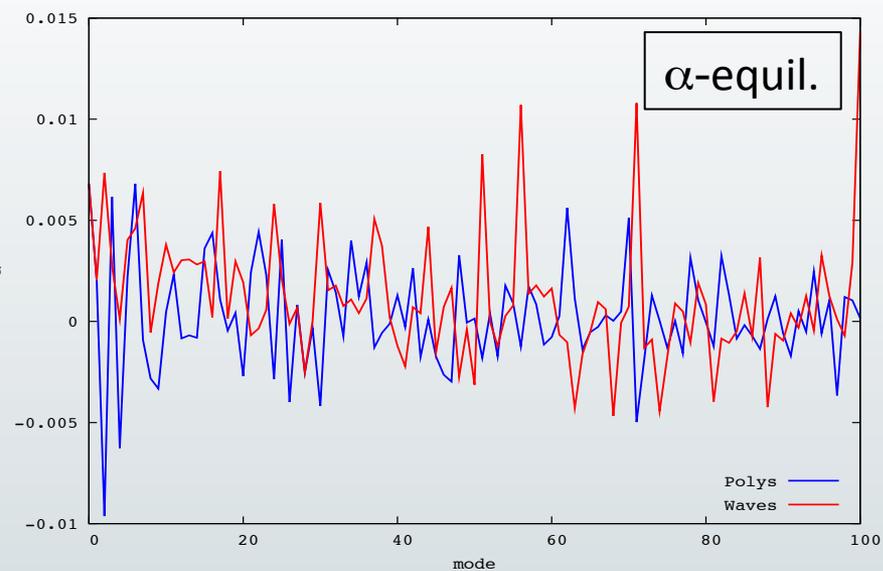
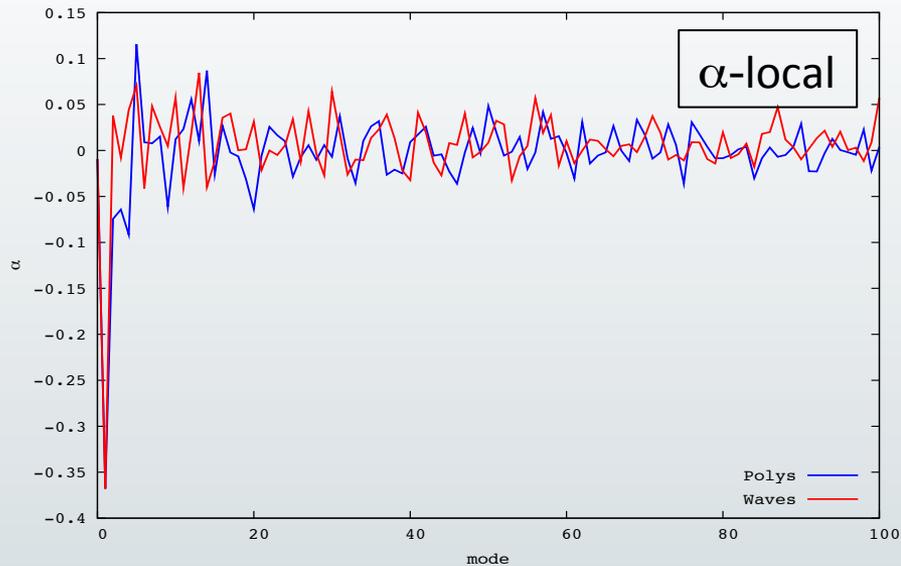
We work at  $l_{\max} = 2000$  and consider two sets of modes throughout the analysis

- Plane wave templates,  $n_{\max} = 300$  (faster, slightly less accurate)
- Polynomial modes,  $n_{\max} = 600$  (slower, slightly more accurate)

Both sets are augmented with a local Sachs Wolfe template (B~CC+perm.) to improve convergence in the squeezed limit

	Local	Equil.	Ortho.	ISW-lens
Waves	95%	99%	97%	70%
Polys	99%	99%	99%	90%



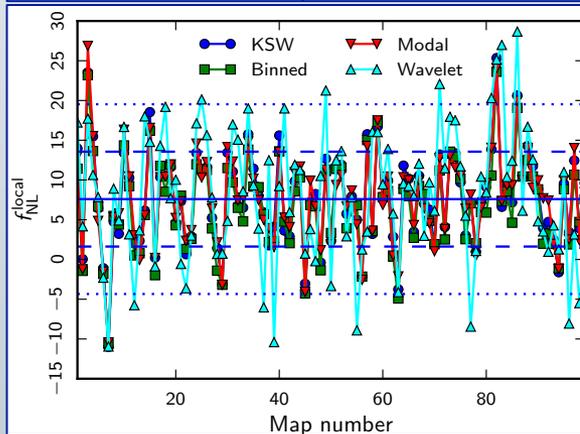
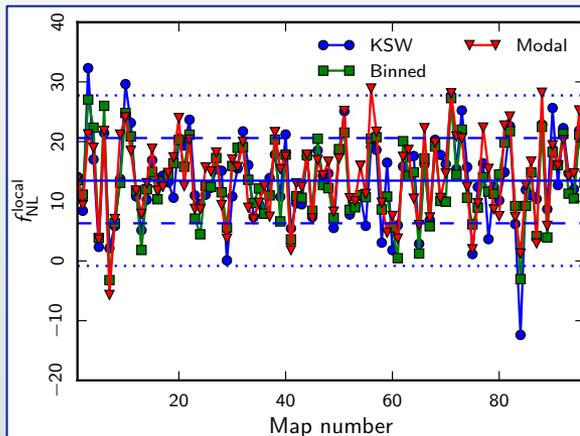


- Different pipelines (KSW, binned, modal) and expansions (waves, polys) have *highly correlated* but *not identical* weights.
- Expected scatter on average (Gaussian, full sky, homogenous noise):

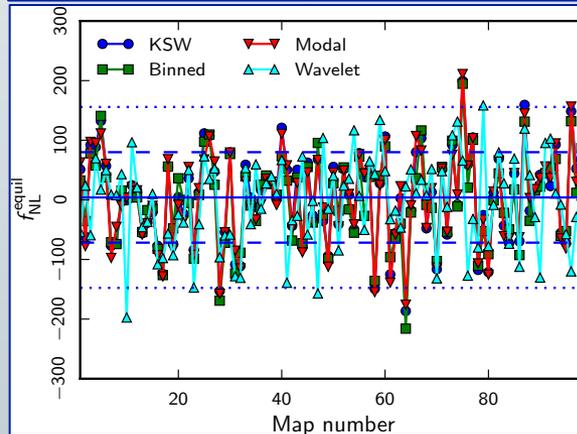
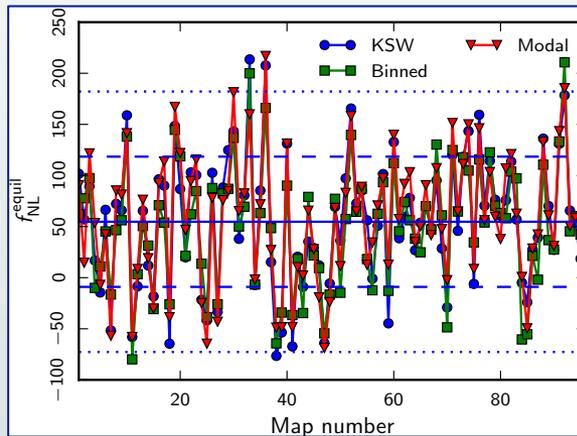
$$\sigma_{\delta f_{NL}} = \Delta_{f_{NL}} \frac{\sqrt{1-r^2}}{r}$$

- We perform a large amount of tests on G and NG simulations (loc.+ equil.+ortho.)
- We start from full sky noiseless maps, and include several features in various steps: corr. noise, sky cut, NG, lensing, foreground residuals.
- We check:
  - ✓ unbiasedness,
  - ✓ optimality,
  - ✓ agreement on a map-by-map basis.

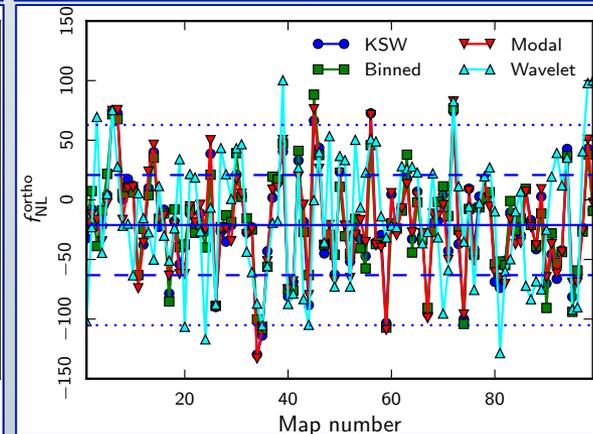
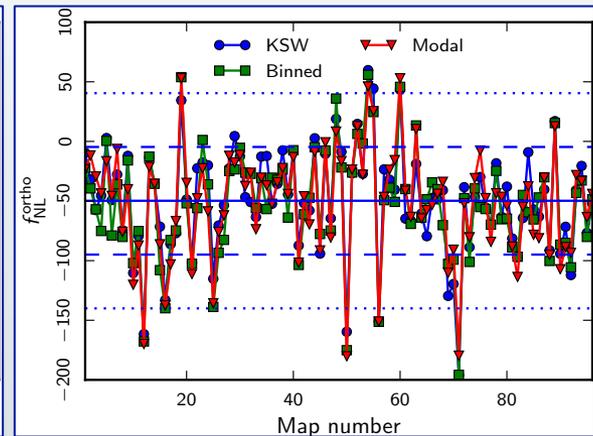
## Local



## Equilateral

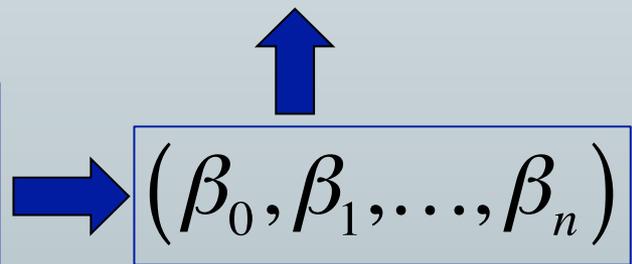
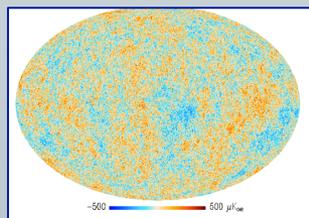
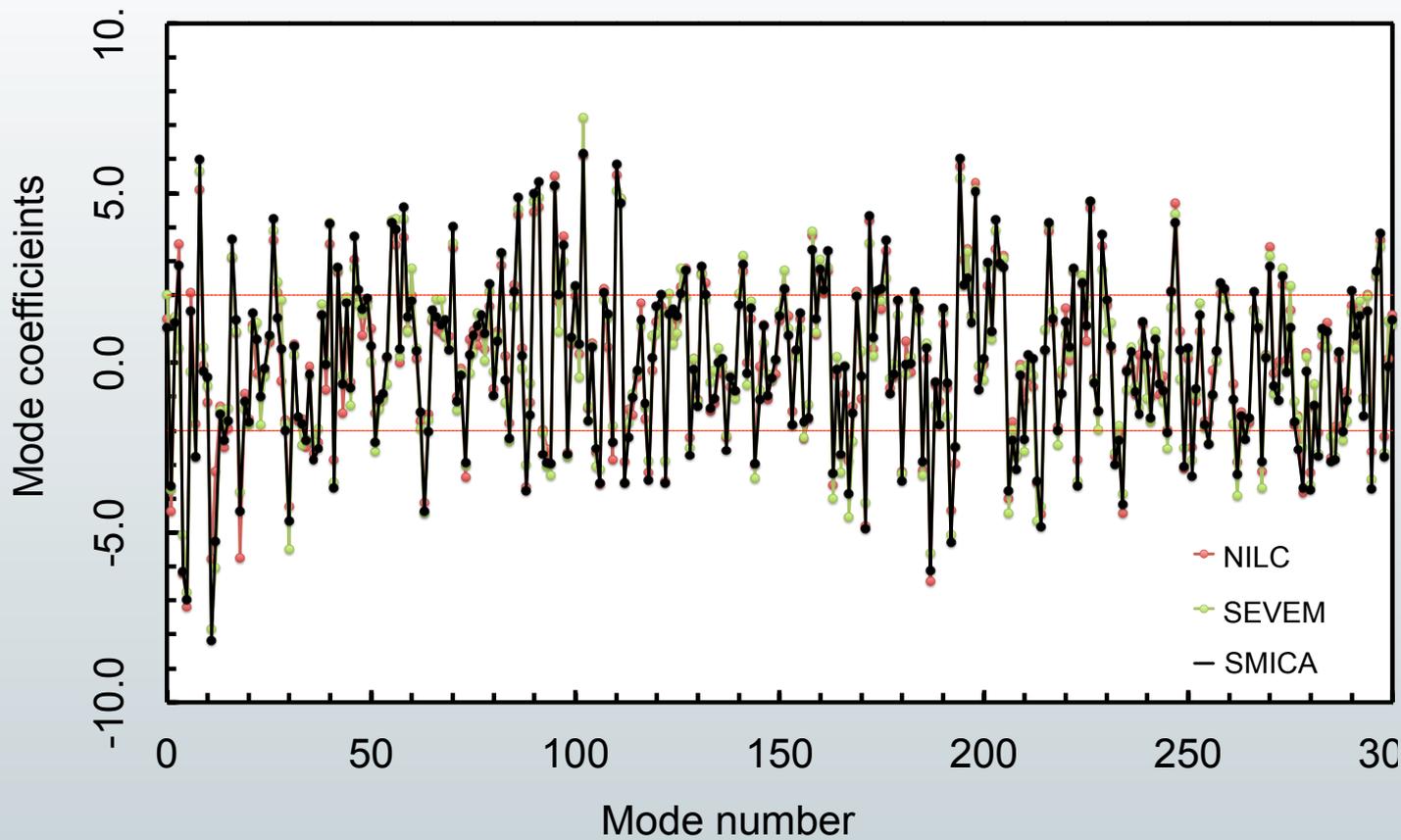


## Orthogonal



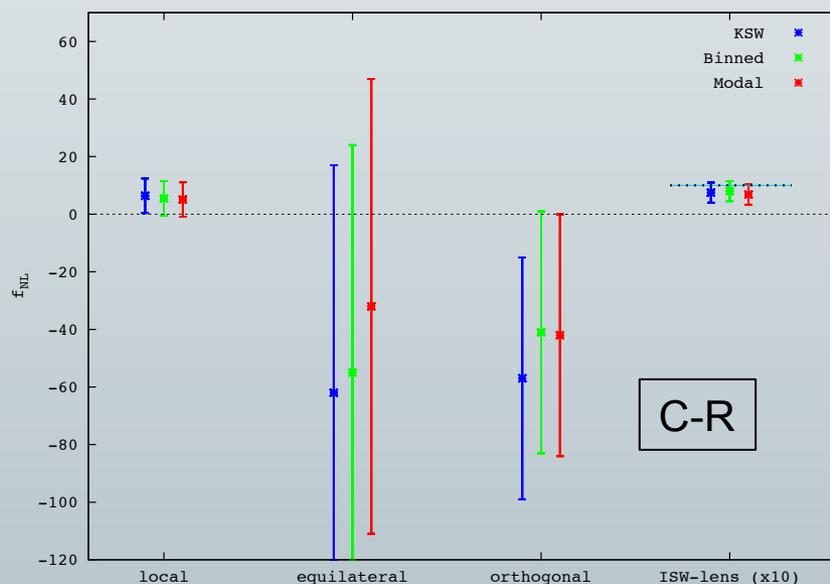
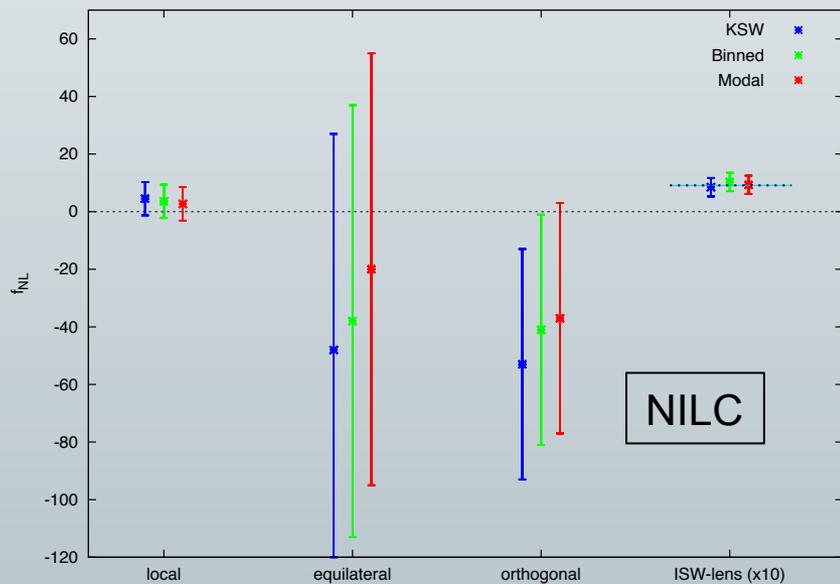
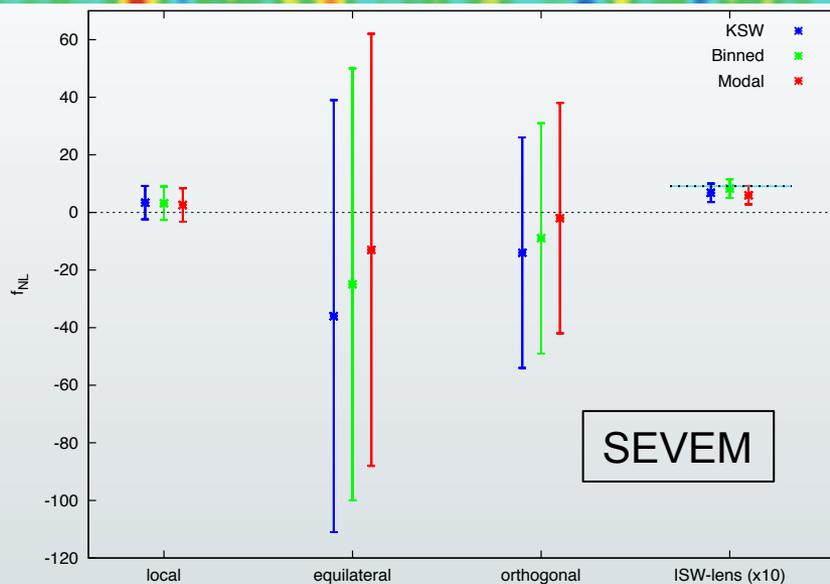
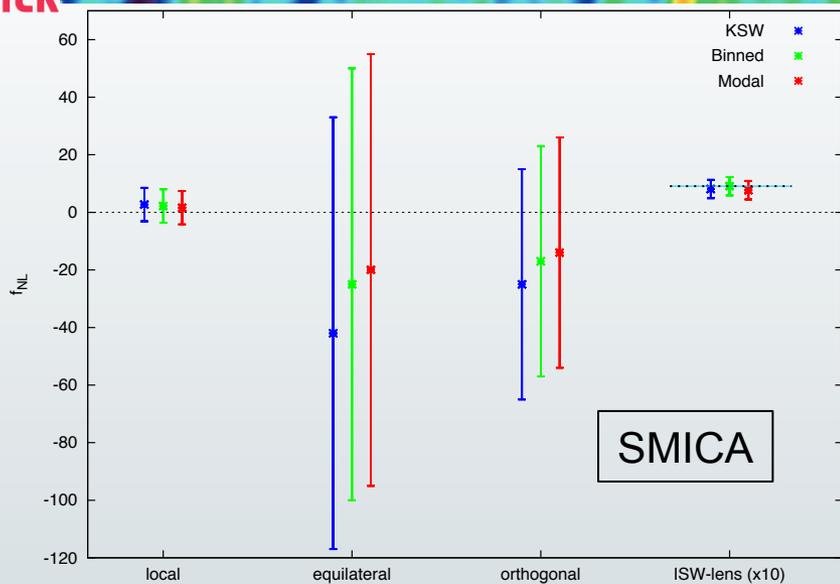
- Top row: wave expansion, NG sims (loc+eq+ortho, anis. noise, U73 mask)
- Bottom row: polynomial expansion, lensed FFP6 sims

# Modes from *Planck* data

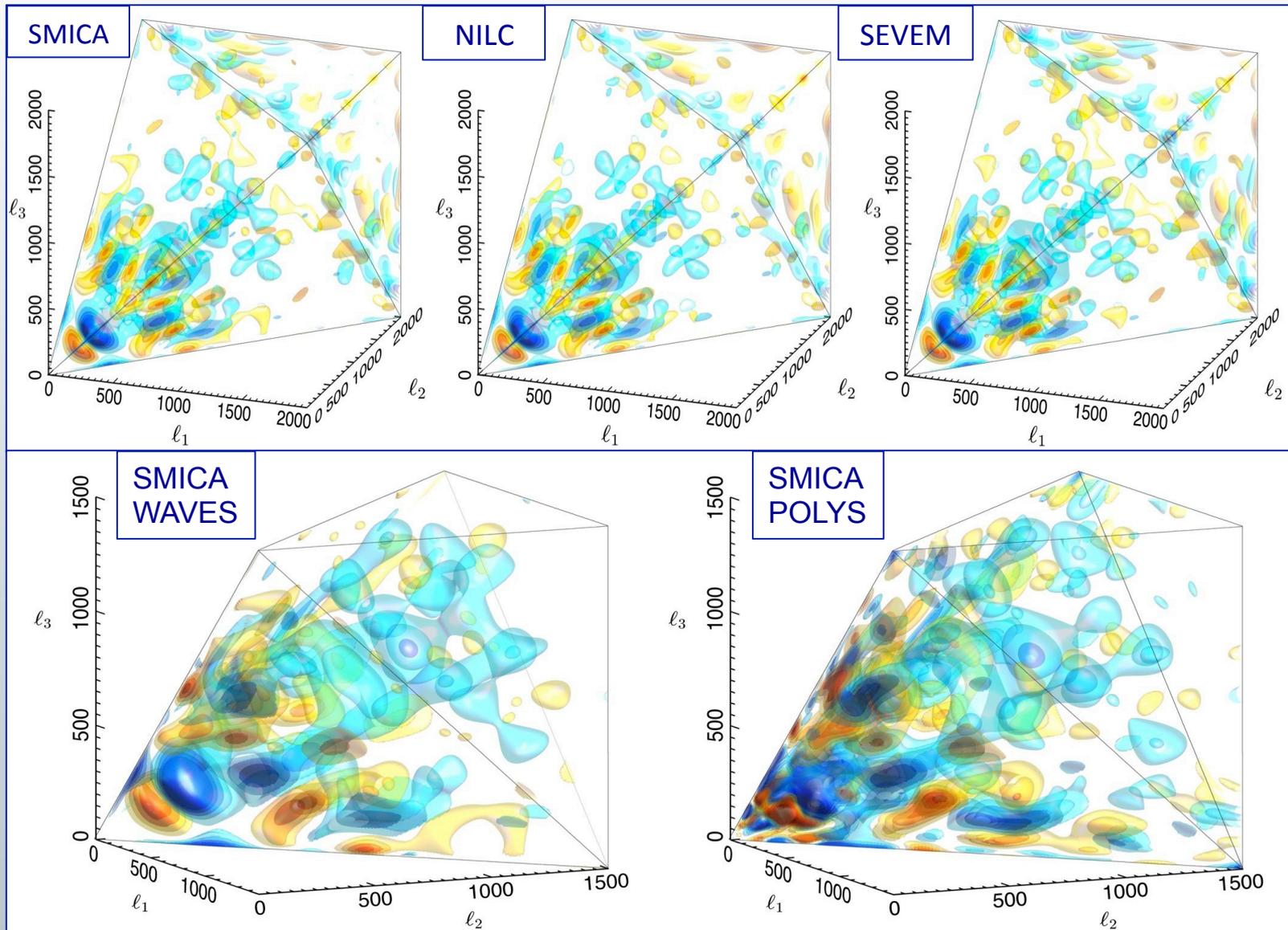




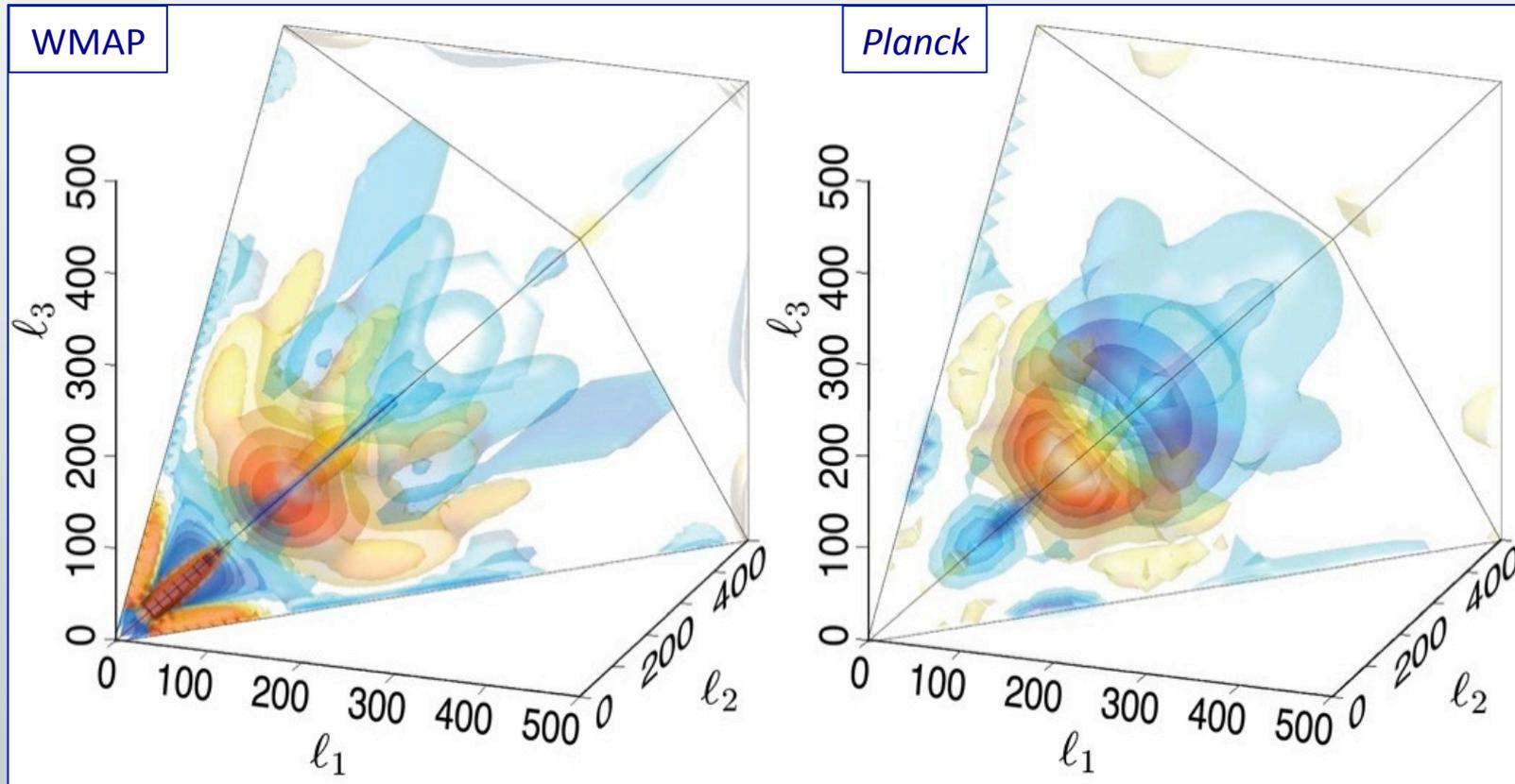
# $f_{NL}$ from *Planck* data



# The *Planck* bispectrum



# WMAP vs. Planck



We perform several additional tests of robustness of the results:

- ✓ SMICA, dependence on  $l_{\max}$
- ✓ SMICA, dependence on sky coverage (\*)
- ✓  $f_{\text{NL}}$  from raw single-frequency channels (70,100,143,217 GHz) (\*)
- ✓ Jackknife analysis (\*)
- ✓ Study of FFP6 lensed simulations including foreground residuals from SMICA and NILC (\*)

(\*) = modal pipeline was used for this test

*See B. Van Tent's talk*

# “Non-standard” shapes

- *All we need from the data are the mode amplitudes  $\beta$ . We can then estimate  $f_{NL}$  for all the shapes that we can accurately expand in our basis.*
- We compute  $\alpha$  and  $f_{NL}$  for a large number of models, including
  - ✓ Equilateral family (DBI, EFT, ghost)
  - ✓ Flattened shapes (non-Bunch Davies)
  - ✓ Feature models (oscillatory bispectra, scale-dependent)
  - ✓ Vector models
  - ✓ Quasi-single-field
- Results are validated (besides previous tests in the local, equi, ortho direction) using waves and polynomial expansions, changing  $l_{max}$  and mask, and using SMICA, NILC and SEVEM foreground cleaned data.
- No evidence for NG found, constraints on parameters from the models above

*See P. Shellard's talk*

- Modal method: expand the bispectrum in a complete orthonormal set of separable basis templates (“modes”). It allows:  $f_{NL}$  estimation in full generality and model independent (smoothed) bispectrum reconstruction
- The modal estimator was one of three optimal bispectrum pipelines used to measure  $f_{NL}$  in Planck data (the other two being the “KSW” and binned method).
- The main steps of the analysis were summarized:
  - ✓ Cross validation of the pipelines on simulations
  - ✓ Measurement of the mode spectrum
  - ✓  $f_{NL}$  estimation: loc., equil., ortho., isw-lens, using  
(KSW,binned,modes)  $\times$  (SMICA,NILC,SEVEM,C-R)
  - ✓ Bispectrum reconstruction
  - ✓ Consistency checks on data
- The modal pipeline provided also constraints on a large number of primordial shapes, beyond the standard local, equilateral, orthogonal analysis.



The scientific results that we present today are a product of the Planck Collaboration, including individuals from more than 100 scientific institutes in Europe, the USA and Canada



planck



National Research Council of Italy



Deutsches Zentrum für Luft- und Raumfahrt e.V.



Planck is a project of the European Space Agency, with instruments provided by two scientific Consortia funded by ESA member states (in particular the lead countries: France and Italy) with contributions from NASA (USA), and telescope reflectors provided in a collaboration between ESA and a scientific Consortium led and funded by Denmark.

