

G. Rossi

INTRO TO NON-
GAUSSIANITY

STATISTICAL
TECHNIQUES

PIXEL
STATISTICS

MINKOWSKI
FUNCTIONALS

HIGHLIGHTS

CMB NON-GAUSSIANITIES: STATISTICAL METHODS AND THEIR APPLICATIONS

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“Primordial features and Non-Gaussianities”

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OUTLINE

- 1 Non-Gaussianity: Brief Intro
- 2 Statistical Techniques
- 3 Pixel Statistics
- 4 Minkowski Functionals
- 5 Basic Highlights

INTRO TO NON-
GAUSSIANTITY

STATISTICAL
TECHNIQUES

PIXEL
STATISTICS

MINKOWSKI
FUNCTIONALS

HIGHLIGHTS

MAIN REFERENCES

- **G. Rossi**, P. Chingangbam & C. Park (2010), MNRAS in press
- **G. Rossi**, R. K. Sheth, C. Park & C. Hernández-Monteagudo (2009), MNRAS, 399, 304-316
- P. Chingangbam, **G. Rossi** & C. Park, JCAP in prep.

NON-GAUSSIANITY AS A PROBE OF NEW PHYSICS

Non-Gaussianity as a Probe of the Physics of the Primordial Universe and the Astrophysics of the Low Redshift Universe

E. Komatsu,^{1,2} N. Afshordi,³ N. Bartolo,⁴ D. Baumann,^{5,6} J.R. Bond,⁷ E.I. Buchbinder,³ C.T. Byrnes,⁸ X. Chen,⁹ D.J.H. Chung,¹⁰ A. Cooray,¹¹ P. Creminelli,¹² N. Dalal,⁷ O. Doré,⁷ R. Easther,¹³ A.V. Frolov,¹⁴ K.M. Górski,¹⁵ M.G. Jackson,¹⁶ J. Khoury,¹⁷ W.H. Kinney,¹⁸ L. Kofman,⁷ K. Koyama,¹⁹ L. Leblond,²⁰ J.-L. Lehnert,²¹ J.E. Lidsey,²² ...

In the coming decade, *non-Gaussianity* will become an important probe of both the early and the late Universe. Specifically, it will play a leading role in furthering our understanding of two fundamental aspects of cosmology and astrophysics → NEW PHYSICS RELATED TO COSMOLOGY

- The physics of the very early universe that created the primordial seeds for large-scale structures
- The subsequent growth of structures via gravitational instability and gas physics at later times

INTRO TO NON-GAUSSIANITY

STATISTICAL
TECHNIQUESPIXEL
STATISTICSMINKOWSKI
FUNCTIONALS

HIGHLIGHTS

WHY IS NON-GAUSSIANITY IMPORTANT?

CANONICAL SLOW-ROLL INFLATION

- φ **free** scalar field in ground state of Bunch-Davis vacuum
- $\mathcal{R} = -[H(\phi)/\dot{\phi}_0]\varphi$ primordial curvature pert. (**linear** order)
- If $p(\varphi) \rightarrow \text{Gaussian}$ then $p(\mathcal{R}) \rightarrow \text{Gaussian}$

SLOW-ROLL INFLATION – BREAKING GAUSSIANTY

- NG $\rightarrow$ Allow interactions between scalar fields
- NG $\rightarrow$ Non-linear corrections to the relation $\mathcal{R} \rightarrow \phi$

BEYOND CANONICAL MODELS

- Non-standard inflationary models (ex. $\rightarrow$ *Sasaki 2008*)
- Alternative early-universe models (ex. $\rightarrow$ *Brandenberger 2009*)

INTRO TO NON-GAUSSIANITY

STATISTICAL
TECHNIQUESPIXEL
STATISTICSMINKOWSKI
FUNCTIONALS

HIGHLIGHTS

WHY NG NOW?

GAUSSIANITY

- **1980-1989** → 153 titles, 1387 abstracts
- **1990-1999** → 723 titles, 5835 abstracts
- **2000-2010** → 3466 titles, 14946 abstracts

NON-GAUSSIANITY

- **1980-1989** → 0 titles, 0 abstracts
- **1990-1999** → 31 papers titles, 85 abstracts
- **2000-2010** → 495 titles, 1266 abstracts

“VIVE LA RESOLUTION” → BOUCHET’S TALK

- **1980-1989** → No powerful observational probes
- **1990-1999** → COBE
- **2000-2010** → WMAP, **PLANCK**

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GAUSSIANITYSTATISTICAL
TECHNIQUESPIXEL
STATISTICSMINKOWSKI
FUNCTIONALS

HIGHLIGHTS

DESCRIBING NG: THE f_{NL} OR g_{NL} BUSINESS

$$\langle \Phi(\mathbf{k}_1)\Phi(\mathbf{k}_2)\Phi(\mathbf{k}_3) \rangle = (2\pi)^3 \delta^3(\mathbf{k}_1 + \mathbf{k}_2 + \mathbf{k}_3) F(k_1, k_2, k_3)$$

$$\Phi = \phi_L + f_{\text{NL}} \cdot (\phi_L^2 - \langle \phi_L^2 \rangle) + g_{\text{NL}} \cdot \phi_L^3 + \dots$$

● **Single-Field Models** → Break Slow-Roll

● **Multi-Field Models** → Break Single-Field

- Source of density perturbation → second light scalar field σ

$$F(k_1, k_2, k_3) = f_{\text{NL}}^{\text{equil}} 6\Delta_\Phi^2 \left(\frac{1}{k_1 k_2^2 k_3^3} + \dots \right)$$

$$F(k_1, k_2, k_3) = f_{\text{NL}}^{\text{local}} 2\Delta_\Phi^2 \left(\frac{1}{k_1^3 k_2^3} + \frac{1}{k_1^3 k_3^3} + \frac{1}{k_2^3 k_3^3} \right)$$

- Amplitude of bispectrum of “squeezed” triangles

- Curvaton scenario, variable decay width model, ...

● **Alternative Models**

- Ekpyrotic scenario
- String gas
- Cosmic strings

INFLATION MODELS $\rightarrow f_{\text{NL}}$ AND g_{NL}

MODEL	$f_{\text{NL}}(\mathbf{k}_1, \mathbf{k}_2)$
Canonical inflation	$\simeq 0.1$
Curvaton	$5/4r$
Modulated reheating	$-5/4 - l$
Multi-field inflation	large?

MODEL	$f_{\text{NL}}(\mathbf{k}_1, \mathbf{k}_2)$
Ekpyrotic models	$-50 < f_{\text{NL}} < 200$
Generalized slow-roll	$f_{\text{NL}} \gg 1$
Warm inflation	typically $\simeq 0.1$
Multi-DBI inflation	...

WMAP7 (95 % CL)

- $-10 < f_{\text{NL}}^{\text{local}} < 74$
- $-151 < f_{\text{NL}}^{\text{equil}} < 253$

MODEL	$g_{\text{NL}}(\mathbf{k}_1, \mathbf{k}_2)$
Slow-roll inflation (including multiple fields)	$O(\epsilon, \eta)$
Curvaton scenario	$ g_{\text{NL}} \simeq 10^5$
Inhomogeneous reheating	$(5/3)f_{\text{NL}}^2 + \dots$
DBI inflation	$\simeq 0.1c_s^4$
Ekpyrotic models	$ g_{\text{NL}} \leq 10^4$

OTHER PROBES (95 % CL)

- $-29 < f_{\text{NL}}^{\text{local}} < 70$ (Slosar et al. 2009)
- $-4 < f_{\text{NL}}^{\text{local}} < 80$ (Smith et al. 2009)
- $-36 < f_{\text{NL}}^{\text{local}} < 58$ (Smidt et al. 2010)

SDSS + N-BODY

$$-3.5 \times 10^5 < g_{\text{NL}} < +8.2 \times 10^5$$

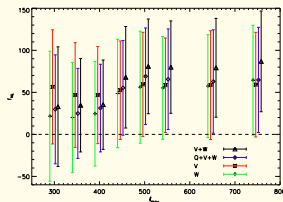
(Desjacques & Seljak 2010)

NG: EVIDENCE? DETECTION?

Profound implications if non-Gaussianity detected

NON-GAUSSIANITY → EVIDENCE? DETECTION?

- One-point statistics (Jeong & Smoot 2007)
- Bispectrum estimator (Yadav & Wandelt 2008)



ANOMALIES OF ANY KIND

- “The mystery of the WMAP cold spot” (Naselsky et al. 2008)
- “The CMB cold spot: texture, cluster or void?” (Cruz et al. 2008)
- “CMB cold spot: a gate to extra dimensions?” (Cembranos et al. 2008)
- Asymmetries, alignments (i.e. Kim & Naselsky 2010)

NG IN THE CMB: METHODS AND PHILOSOPHY

- **Real-space methods (selection)**

- Pixel statistics
- Peak statistics
- Morphology of hotspots
- Fractal analysis
- Minkowski functionals

- **Harmonic-space methods (selection)**

- Bispectrum
- Trispectrum
- Wavelets

MODUS OPERANDI

- Choose a priori the statistics
- Select type of primordial NG
- Test statistics performance under assumed NG

CONCEPTUAL POINTS

- Choice of statistics → a priori!
- Type of primordial NG is unknown
- A posteriori statistics → misleading
- Concept of “optimal” → related to the type of NG
- Geometrical and topological tests

INTRO TO NON-GAUSSIANITY

STATISTICAL
TECHNIQUESPIXEL
STATISTICSMINKOWSKI
FUNCTIONALS

HIGHLIGHTS

NG IN THE CMB: STRATEGY

STRATEGY

(1) Theory (2) Simulations (3) Data Analysis

MAP-MAKING PROCEDURE

Method:

$$\Delta T(\hat{n}) = \sum_{\ell m} a_{\ell m} Y_{\ell m}(\hat{n})$$

Rewrite $a_{\ell m}$ as real space integral

$$a_{\ell m} = \int dr r^2 \Phi_{\ell m}(r) \Delta_{\ell}(r)$$

$$\Phi_{\ell m}(r) \equiv \Phi_{\ell m}^G(r) + f_{NL} \Phi_{\ell m}^{NG}(r) + g_{NL} \Phi_{\ell m}^{NNG}(r)$$

INTRO TO NON-
GAUSSIANITY

STATISTICAL
TECHNIQUES

PIXEL
STATISTICS

MINKOWSKI
FUNCTIONALS

HIGHLIGHTS

TECHNIQUE, ASSUMPTIONS, NOTATION

MAIN TECHNIQUE

Statistics of **hot** and **cold pixels** above threshold (excursion sets)

ASSUMPTIONS

$$D = T - \langle T \rangle \equiv \delta T = s + n$$

Signal: homogeneous, may have spatial correlations

Noise: independent of signal, inhomogeneous, spatial correlations

BASIC NOTATION

$p(D)$: observed one-point distribution of D

$G(s)$: distribution of s

$p(\sigma_n)$: rms noise distribution

$g(n|\sigma_n)$: distribution of the noise when its rms value is σ_n

INTRO TO NON-
GAUSSIANITY

STATISTICAL
TECHNIQUES

PIXEL
STATISTICS

MINKOWSKI
FUNCTIONALS

HIGHLIGHTS

ONE- AND TWO-POINT FUNCTIONS

ONE-POINT FUNCTION

$$\begin{aligned} p(D) &= \int d\sigma_n p(\sigma_n) \int ds G(s) p(D - s | \sigma_n) \\ &= \int d\sigma_n p(\sigma_n) p(D | \sigma_n) \end{aligned}$$

TWO-POINT FUNCTION

$$p(D_1, D_2 | \theta) = \int_0^\infty d\sigma_1 \int_0^\infty d\sigma_2 p(\sigma_1, \sigma_2 | \theta) p(D_1, D_2 | \sigma_1, \sigma_2, \theta)$$

- Assume PDFs to be Gaussian or non-Gaussian
- Measure $p(\sigma_n)$ and $p(\sigma_1, \sigma_2 | \theta)$ from data

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TECHNIQUESPIXEL
STATISTICSMINKOWSKI
FUNCTIONALS

HIGHLIGHTS

NUMBER DENSITY AND CLUSTERING

- Merge the noise model into the two-point statistics formalism
- Obtain the two-point function **above** or **below** threshold
- Provide analytic formulae in the weak non-Gaussian limit

MAIN GOALS → ND & CLUSTERING

$$\text{Number Density} \rightarrow n_{\text{pix}}(\nu) = \frac{N_{\text{pix,tot}}}{4\pi} \cdot P_1, \quad (1)$$

$$\text{Clustering} \rightarrow 1 + \xi_\nu(\theta) = P_2/P_1^2, \quad (2)$$

$$P_1 = \int_\nu^\infty p(D) dD \quad (3)$$

$$P_2 = \int_\nu^\infty dD_1 \int_\nu^\infty dD_2 p(D_1, D_2, w) \quad (4)$$

INTRO TO NON-GAUSSIANITY

STATISTICAL
TECHNIQUESPIXEL
STATISTICSMINKOWSKI
FUNCTIONALS

HIGHLIGHTS

EDGEWORTH EXPANSIONS

- Conceptually simple
- Use Edgeworth expansion around a Gaussian field

$$p(\mu)d\mu \approx \frac{1}{\sqrt{2\pi}} e^{-\mu^2/2} \left\{ 1 + \frac{\sigma S^{(0)}}{6} \mu(\mu^2 - 3) \right\} d\mu, \quad (5)$$

$$n_{\text{pix}}^{\text{NG}}(\nu) = n_{\text{pix}}^{\text{G}}(\nu) + n_{\text{pix}}^{\text{fNL}}(\nu) \quad (6)$$

$$n_{\text{pix}}^{\text{fNL}}(\nu) = \frac{N_{\text{pix,tot}}}{4\pi} \left\{ \frac{\sigma S^{(0)}}{6\sqrt{2\pi}} (\nu^2 - 1) e^{-\nu^2/2} \right\}. \quad (7)$$

$$p(\mu_1, \mu_2, w) d\mu_1 d\mu_2 \approx \frac{1}{2\pi\sqrt{1-w^2}} \exp \left\{ -\frac{\mu_1^2 + \mu_2^2 - 2\mu_1\mu_2 w}{2(1-w^2)} \right\} \\ \times \left[1 + \sigma S^{(0)} \left(\frac{H_{30} + H_{03}}{6} \right) + \lambda \left(\frac{H_{21} + H_{12}}{2} \right) \right] d\mu_1 d\mu_2 \quad (8)$$

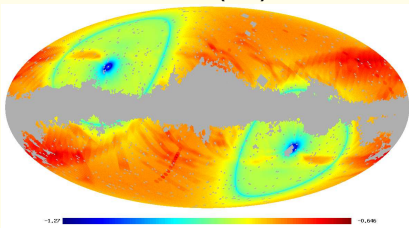
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STATISTICAL
TECHNIQUESPIXEL
STATISTICSMINKOWSKI
FUNCTIONALS

HIGHLIGHTS

MAIN MOTIVATION → WMAP5 ANOMALIES

Rossi et al. (2009)



- Pixel covariance matrix is diagonal
- $\sigma(p) = \sigma_0 / \sqrt{N_{obs}(p)}$
- Noise is inhomogeneous

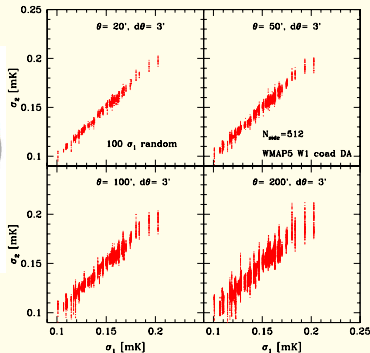


FIGURE: Joint distribution $p(\sigma_1, \sigma_2 | \theta)$ at four different angular distances

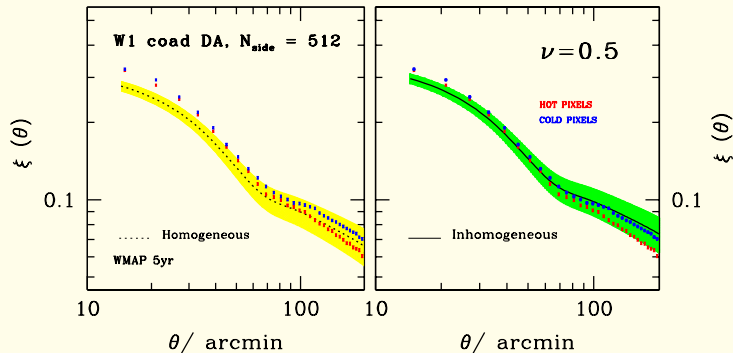
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STATISTICAL
TECHNIQUESPIXEL
STATISTICSMINKOWSKI
FUNCTIONALS

HIGHLIGHTS

MAIN MOTIVATION $\rightarrow$ WMAP5 ANOMALIES

Rossi, Sheth, Park & Hernández-Monteagudo (2009)



INTRO TO NON-GAUSSIANITY

STATISTICAL
TECHNIQUES

PIXEL
STATISTICS

MINKOWSKI
FUNCTIONALS

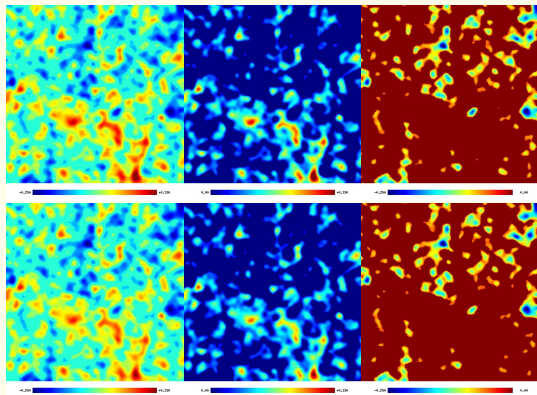
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NON-GAUSSIAN SIMULATIONS: f_{NL} MOCK MAPS

ALL

HOT

COLD



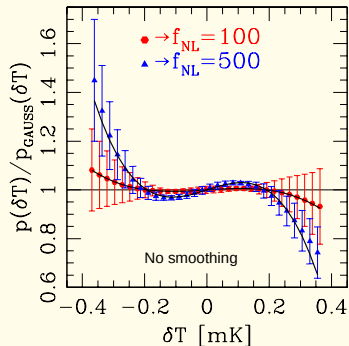
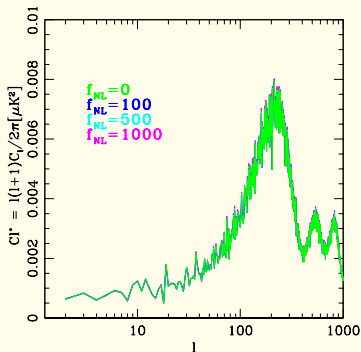
- $\simeq 10^\circ \times 10^\circ$
- $f_{NL} = 0 \uparrow$
- $f_{NL} = 500 \downarrow$
- $\nu = 0.50$
- FWHM=30'

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FUNCTIONALS

HIGHLIGHTS

POWER SPECTRA AND TEMPERATURES



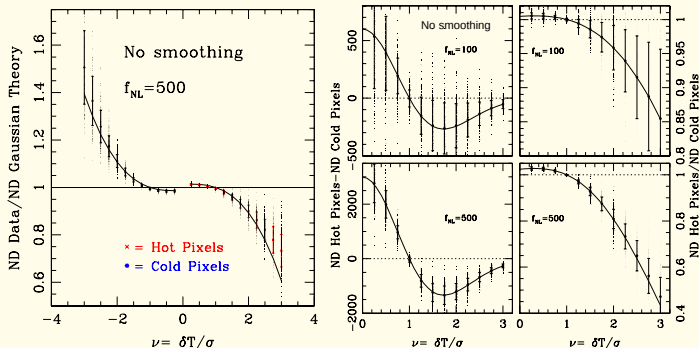
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FUNCTIONALS

HIGHLIGHTS

PIXEL NUMBER DENSITY AND NG

Rossi, Chingam & Park (2010)



Solid lines → Theory predictions using the Edgeworth expansion

(1) Regions where NG is maximized (2) Non-optimal ν (3) f_{NL} and ND

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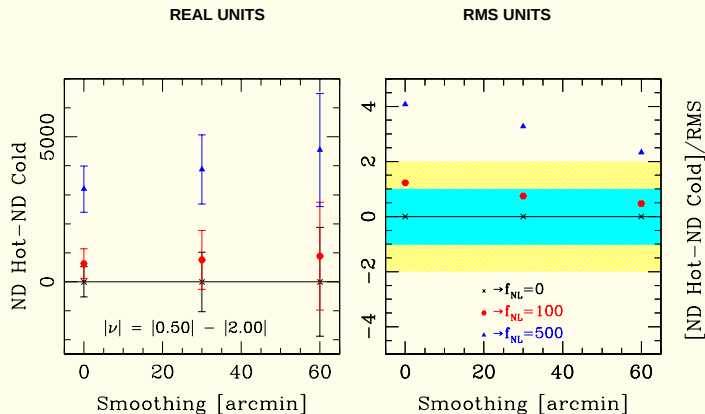
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PIXEL
STATISTICS

MINKOWSKI
FUNCTIONALS

HIGHLIGHTS

NUMBER DENSITY AND NG $\rightarrow$ A NEW ESTIMATOR



Derived quantity which amplifies the f_{NL} contribution

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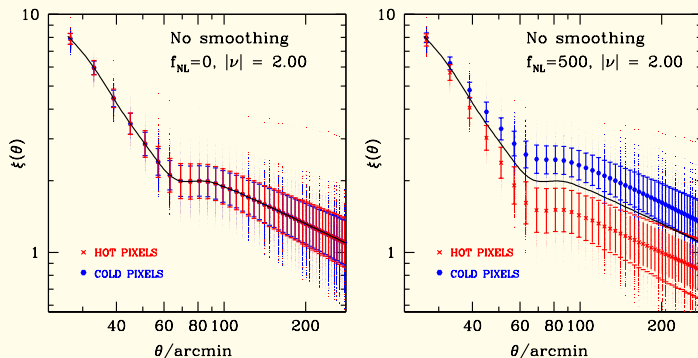
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HIGHLIGHTS

PIXEL CLUSTERING AND NG

Rossi, Chingangbam & Park (2010)



$|\nu| = 2.00$, $f_{\text{NL}} = 500 \rightarrow$ cold pixel clustering enhanced around
 $\theta \simeq 75'$

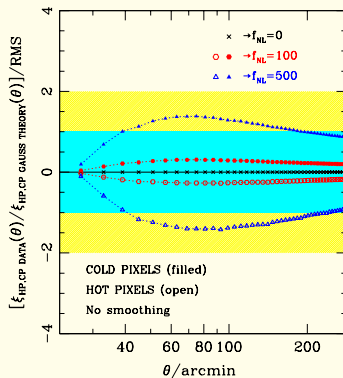
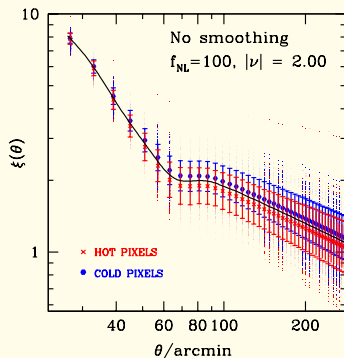
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STATISTICAL
TECHNIQUESPIXEL
STATISTICSMINKOWSKI
FUNCTIONALS

HIGHLIGHTS

PIXEL CLUSTERING AND NG

Rossi, Chingambam & Park (2010)



Is

Gaussianity well-constrained? Sensitive test?

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STATISTICAL
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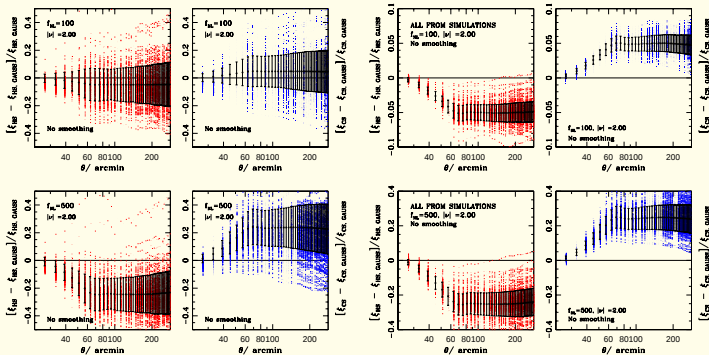
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STATISTICS

MINKOWSKI
FUNCTIONALS

HIGHLIGHTS

THE COSMIC VARIANCE PROBLEM

ROSSI, CHINGANGBAM & PARK (2010)



Real case

Idealized case

MINKOWSKI FUNCTIONALS: THEORY

GOTT ET AL (1990)

Threshold: $\nu \equiv \frac{\Delta T}{\sigma_0}$, $\sigma_0 = \sqrt{\langle \Delta T \Delta T \rangle}$.

- Area fraction above threshold $\sim V_0(\nu)$
- Contour length of iso-temperature contours $\sim V_1(\nu)$
- Genus = number of hot spots - number of cold spots $\sim V_2(\nu)$

For Gaussian field:

$$V_k(\nu) \propto \left(\frac{\sigma_1}{\sigma_0} \right)^k \exp^{-\nu^2/2} H_{k-1}(\nu), \quad \sigma_1 = \sqrt{\langle |\nabla(\Delta T)|^2 \rangle}$$

INTRO TO NON-GAUSSIANITY

STATISTICAL TECHNIQUES

PIXEL STATISTICS

MINKOWSKI FUNCTIONALS

HIGHLIGHTS

SUMMARY

NON-GAUSSIANITY: NEW FRONTIER

- Reliable theoretical prediction of NG from models
- ▶ Extract information on non-Gaussianity from data
- * Characterization of non-Gaussian confusion effects

ACHIEVEMENTS: OBSERVATIONAL SIDE

- New model for the effects of inhomogeneous noise
- Anomalies detected and plausible explanations

ACHIEVEMENTS: THEORETICAL SIDE

- Excursion set statistics extended to f_{NL} models
- Theoretical insights: optimal thresholds, Edgeworth approximation
- New statistical tests, in order to minimize cosmic variance

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STATISTICSMINKOWSKI
FUNCTIONALS

HIGHLIGHTS

WAITING FOR PLANCK ...

Constraining/detecting NG smoking-gun for non-standard inflation models

- Planck gains a factor of 2.5 in angular resolution and up to 10 in instantaneous sensitivity with respect to WMAP
- Nearly photon noise limited in the CMB channels
- Temperature PS limited by ability to remove foregrounds
- 2 acoustic peaks above WMAP V band
- Polarization, NG, SZ clusters
- Most accurate microwave experiment to date in terms of control, reduction and correction of systematic and stochastic noise

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STATISTICAL
TECHNIQUESPIXEL
STATISTICSMINKOWSKI
FUNCTIONALS

HIGHLIGHTS

An aerial photograph of a hillside. A large, rusted metal wire mesh fence runs diagonally across the frame, enclosing a dirt area. In the background, a small green and white building is visible on the grassy slope. The text "Kamsahamnida!" is overlaid in the center of the image.

Kamsahamnida!

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INTRO TO NON-
GAUSSIANITY

STATISTICAL
TECHNIQUES

PIXEL
STATISTICS

MINKOWSKI
FUNCTIONALS

HIGHLIGHTS