



planck

# Testing Isotropy and Statistics of the CMB with Planck

Andrei Frolov on behalf of Planck Collaboration

*11<sup>th</sup> International Workshop  
Dark Side of the Universe 2015*

*Yukawa Institute for Theoretical Physics  
Kyoto, Japan, 14 December 2015*





**It's Nice to be Here...**

# Outline



- 1 Instrument and Mission Overview**
- 2 Foregrounds and Component Separation**
- 3 CMB Maps and Spectra**
- 4 Variance Asymmetry**
- 5 Peak Statistics & Cold Spot**
- 6 Stacking & Polarization**
- 7 Conclusions**



# Planck 2015: What's New?



- **More data:** 48/29 months of LFI/HFI observations, enabling further checks
- **Improved data processing:** systematics removal, calibration, beam reconstruction
- **Improved foreground model:** larger sky-fraction used for analysis
- **More robust to systematics:** based on half-mission cross power spectra
- **The 2015 analysis includes polarization**

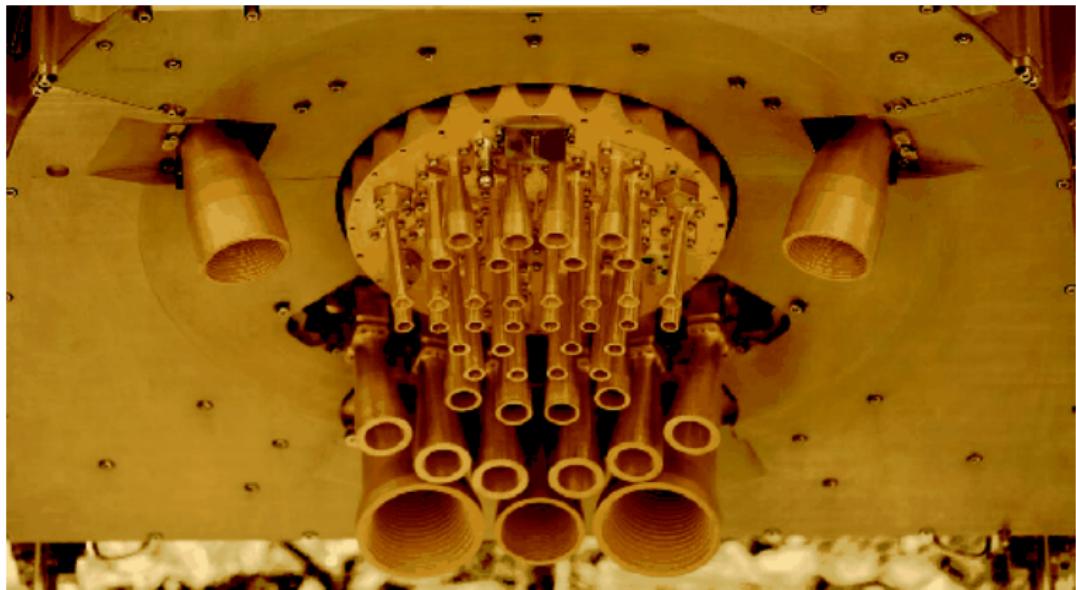


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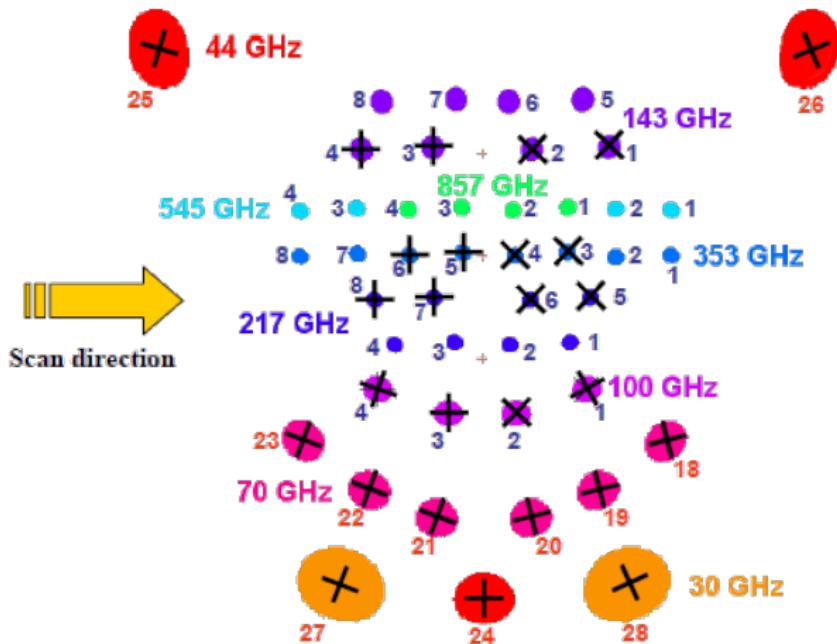


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# Planck Focal Plane



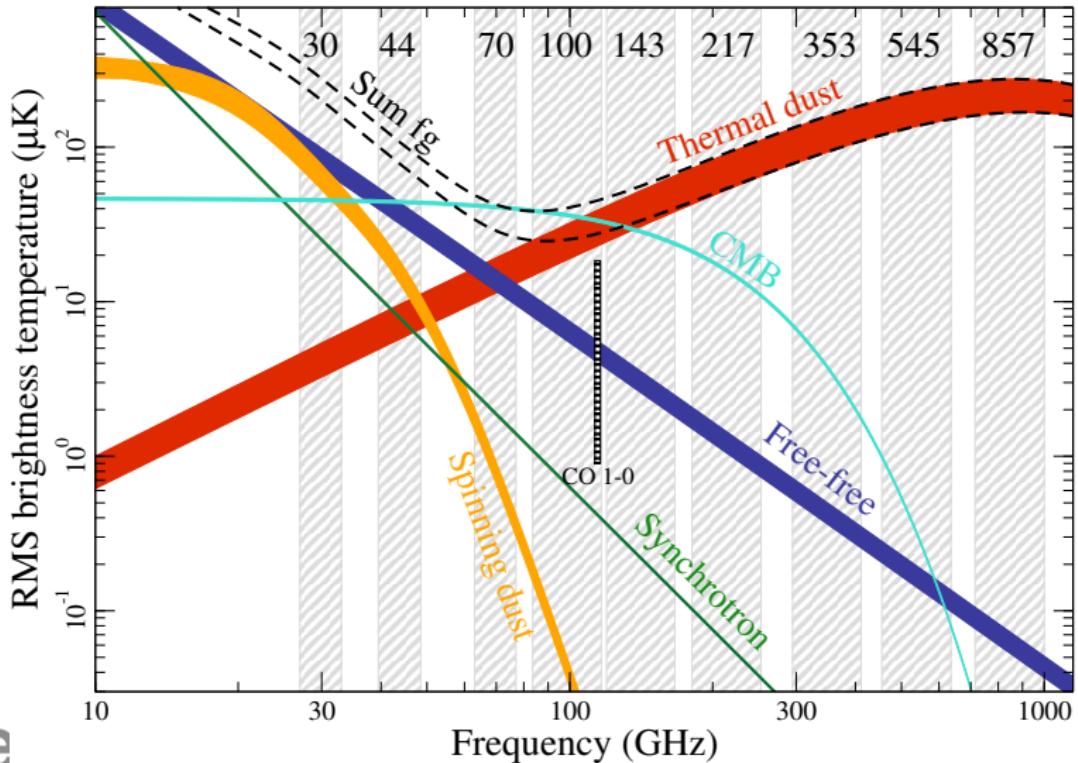
# Planck Focal Plane Schematics



# CMB vs. Astrophysical Foregrounds



- Intensity
- Polarization
- Atmospheric Transmission

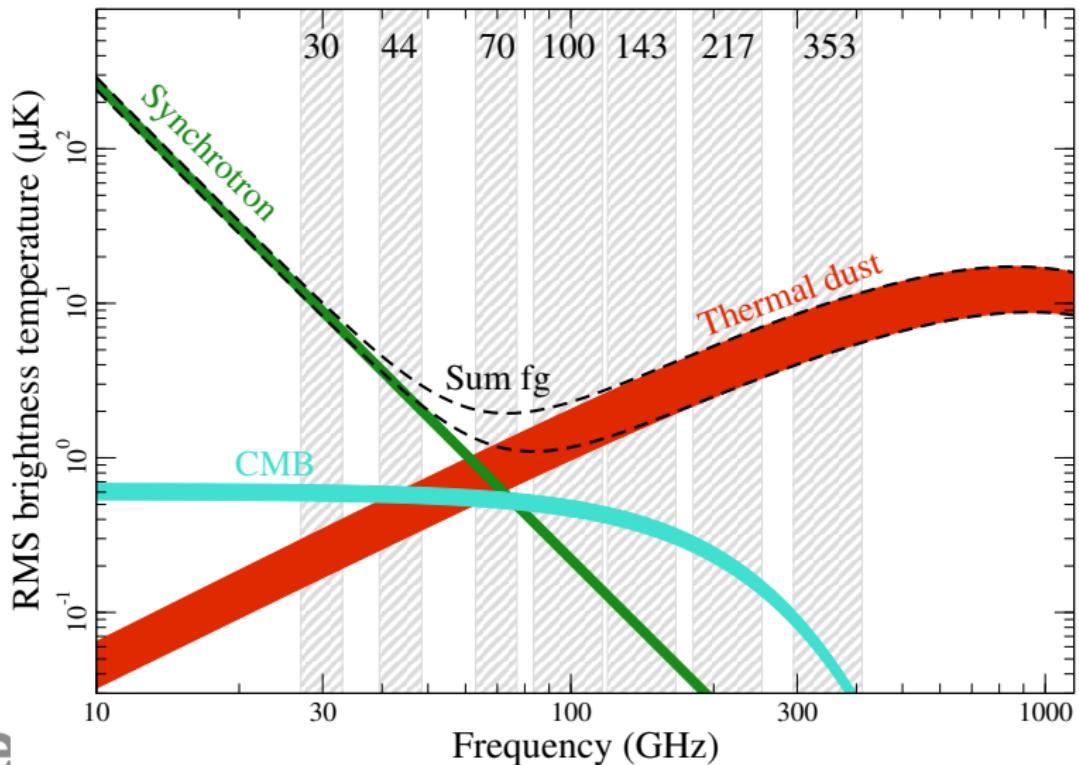


# CMB vs. Astrophysical Foregrounds



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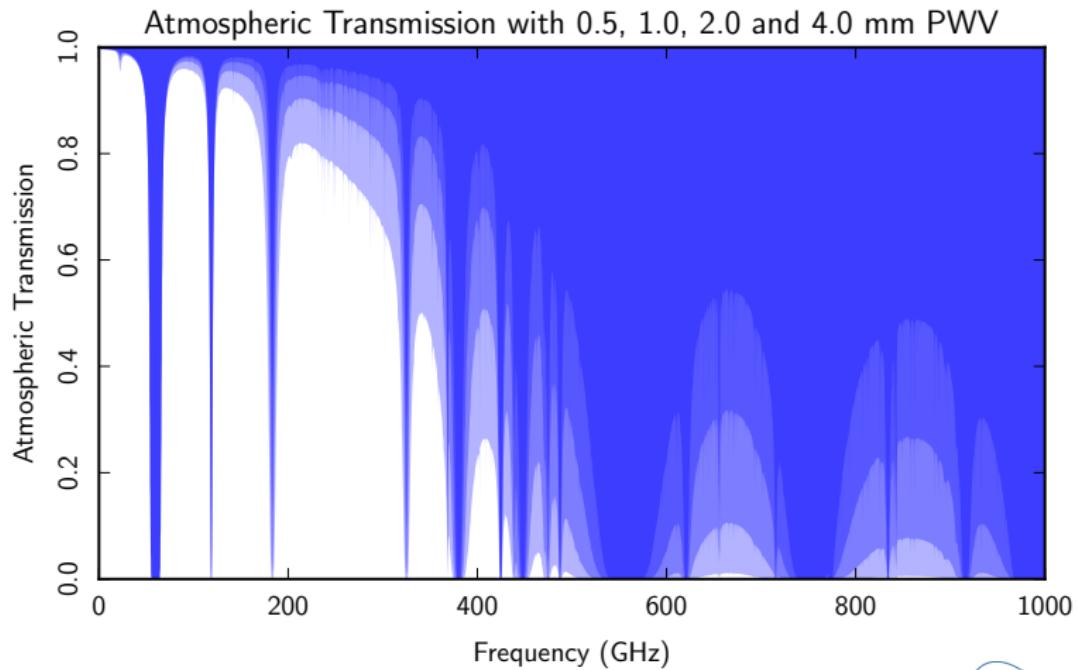


# CMB vs. Astrophysical Foregrounds



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# Component Separation Methods

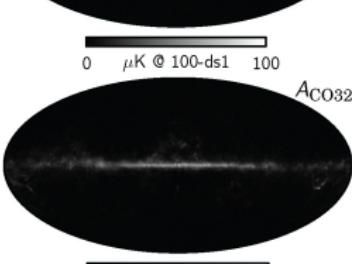
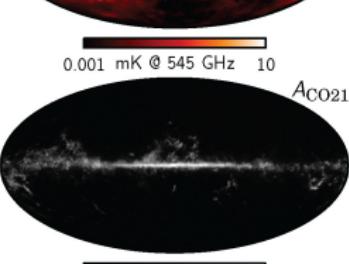
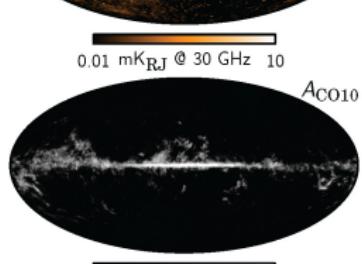
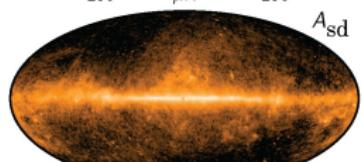
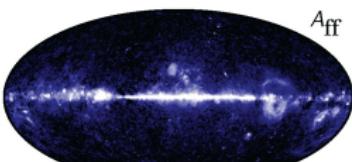
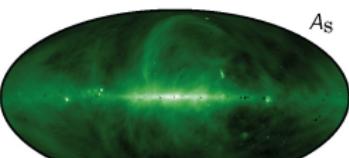
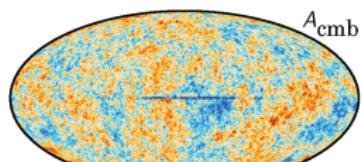


Like in 2013, three CMB cleaning methods (SMICA, SEVEM, NILC) & 1 explicit Component Separation method (Commander).

# Temperature Component Maps



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# Polarization Component Maps



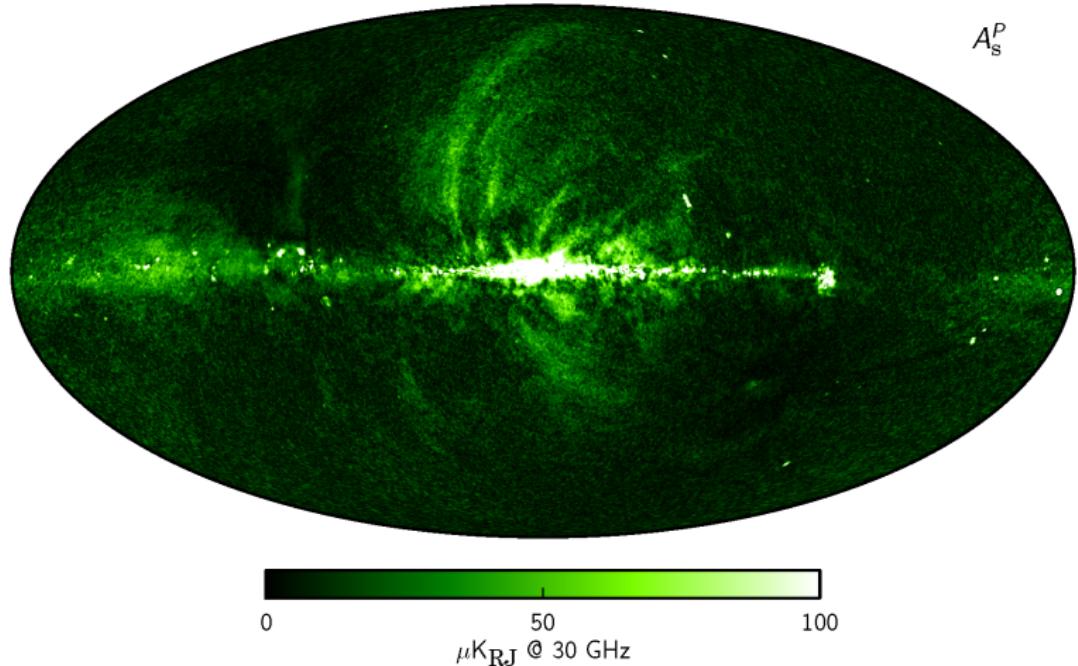
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- Two main foregrounds, synchrotron emission and thermal dust
- Amplitude of CMB polarization **is less** than foregrounds
- Dust emission is highly polarized (polarization fraction is up to 20%)

# Synchrotron Polarization Amplitude



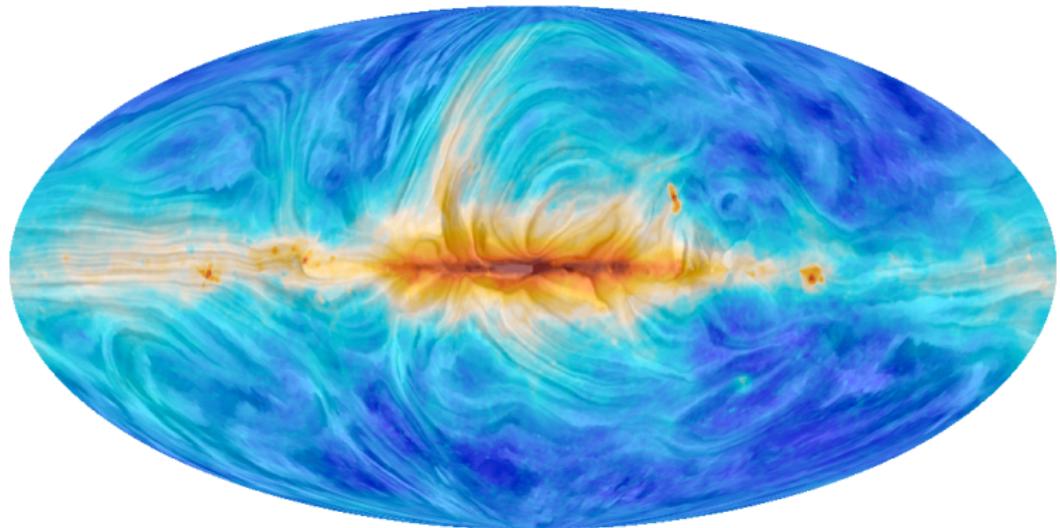
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$$P = \sqrt{Q^2 + U^2}, \text{ at 30 GHz, smoothed to } 40'$$



# Magnetic Field and Total Intensity



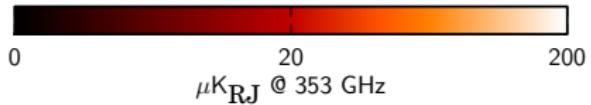
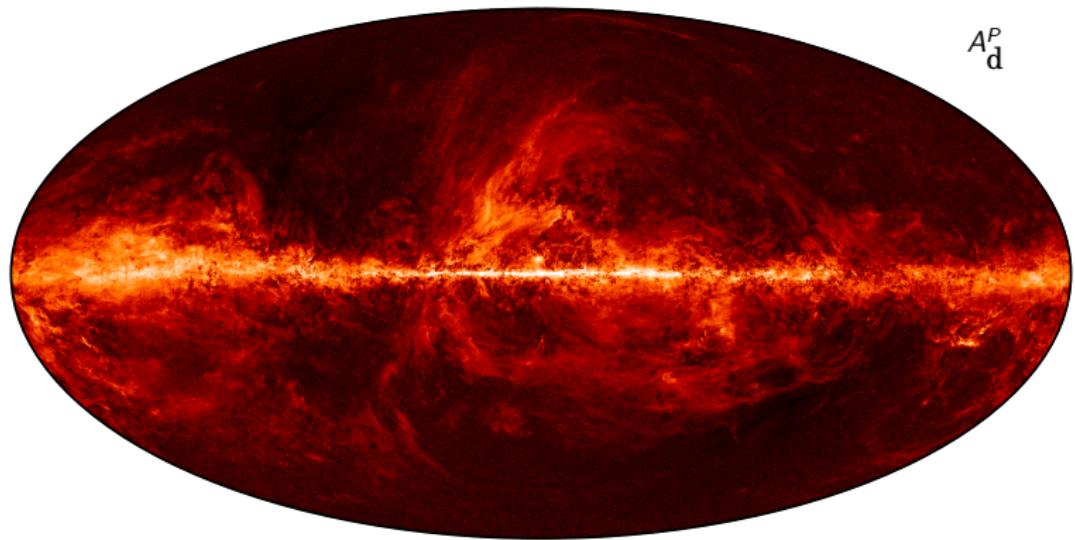
The colours represent intensity. The “drapery” pattern indicates the orientation of magnetic field projected on the plane of the sky, orthogonal to the observed polarization.



# Dust Polarization Amplitude



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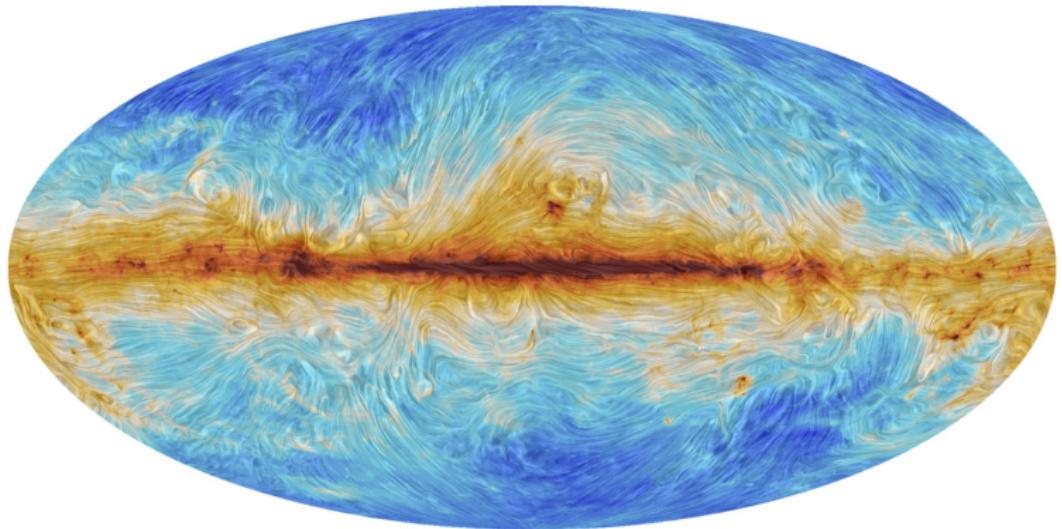
$$P = \sqrt{Q^2 + U^2}, \text{ at } 353 \text{ GHz, smoothed to } 10'$$



# Magnetic Field and Total Intensity



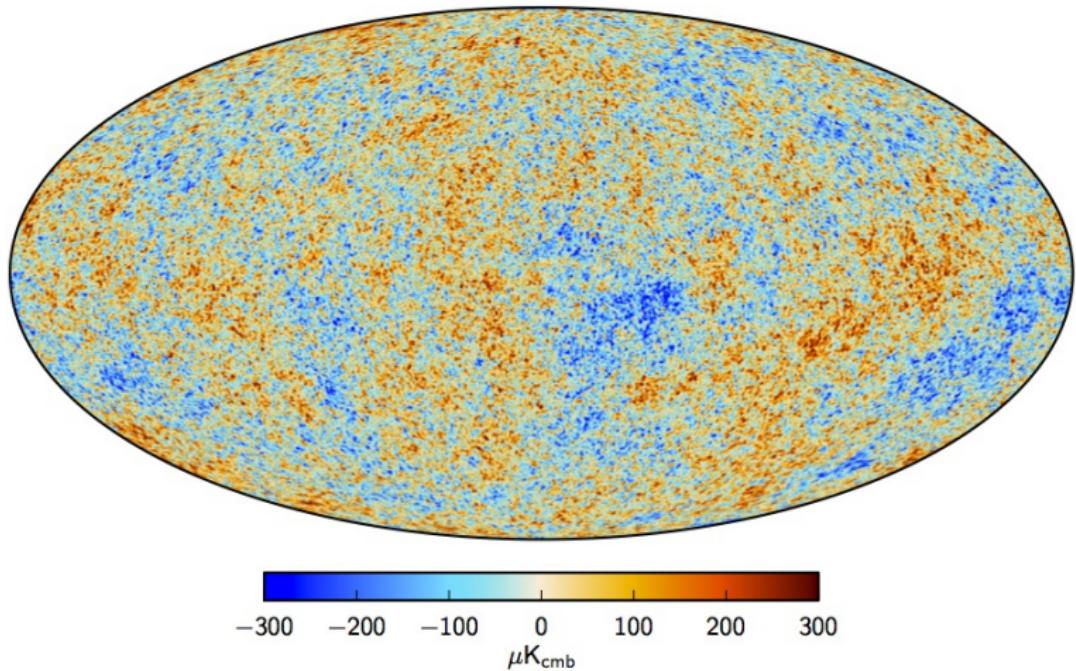
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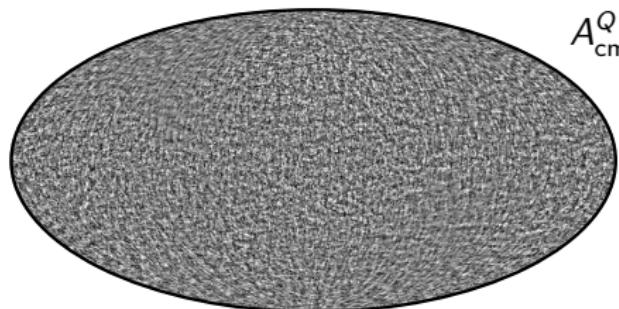
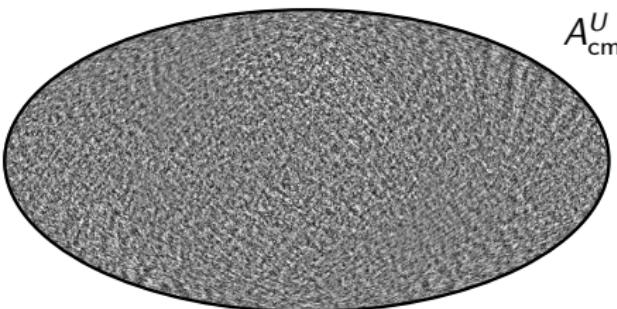
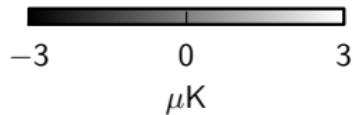
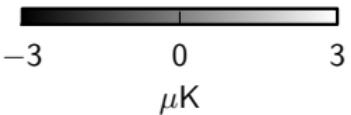
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# CMB Intensity Map



# CMB Polarization Maps

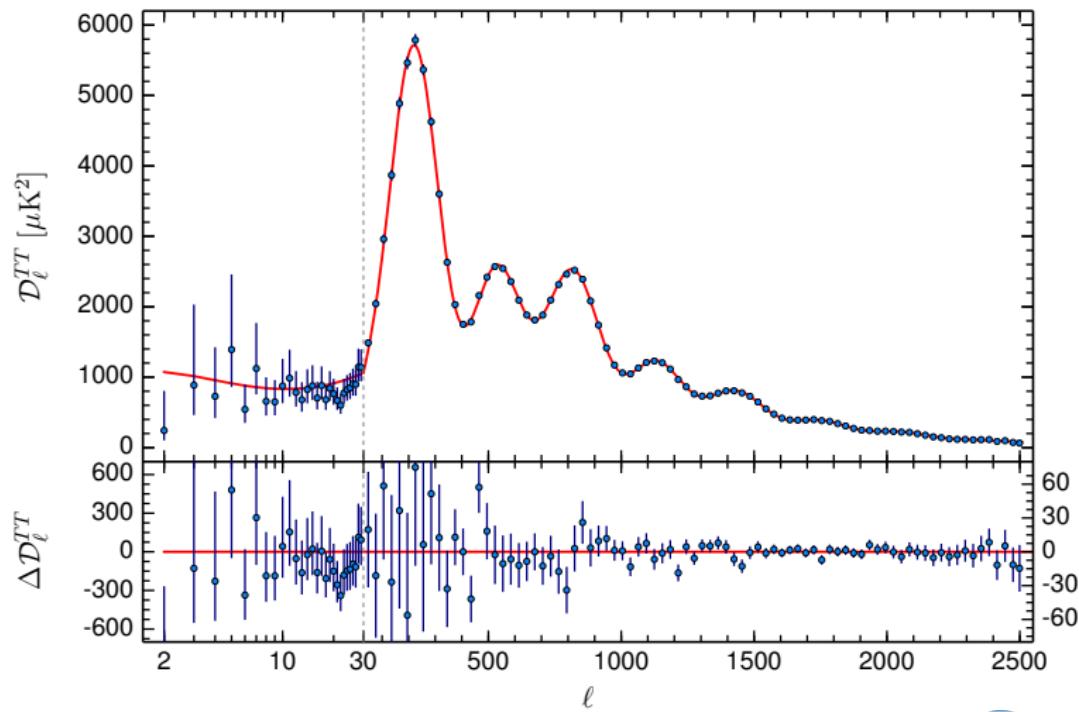
 $A_{\text{cmb}}^Q$  $A_{\text{cmb}}^U$ 

- Smoothed to 1 degree resolution
- High-pass filtered with  $\ell=20-40$  cosine filter
- Galactic plane replaced with constrained Gaussian realization

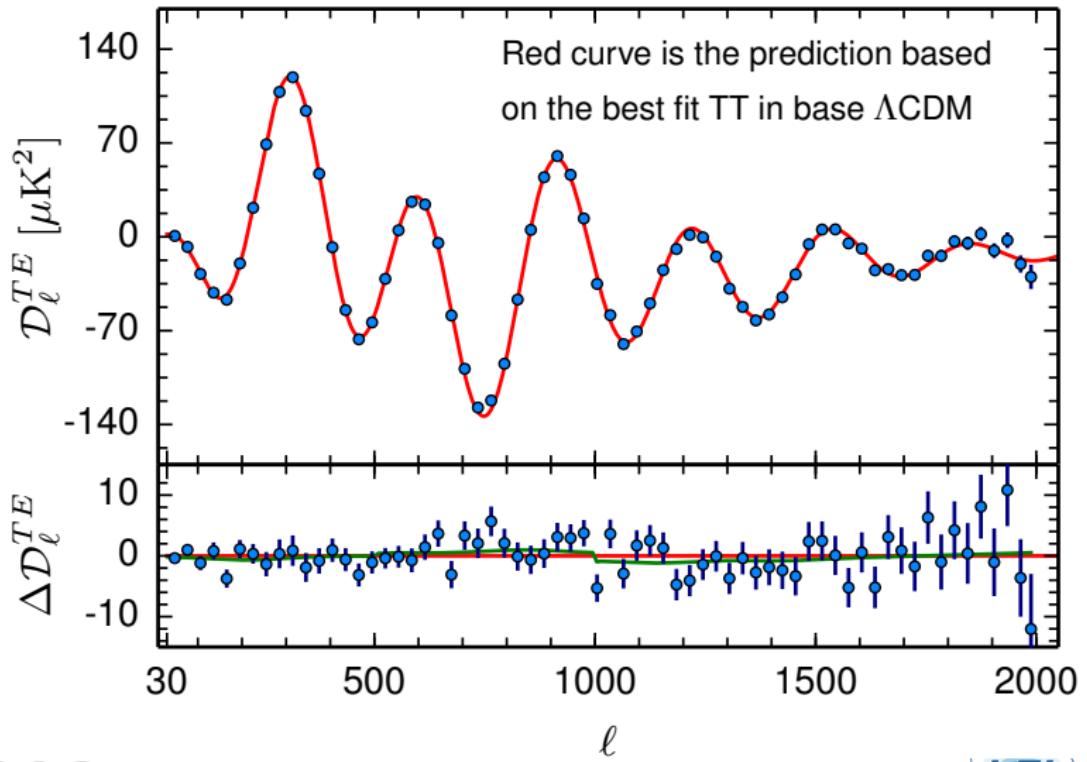
# Planck 2015 TT Power Spectrum



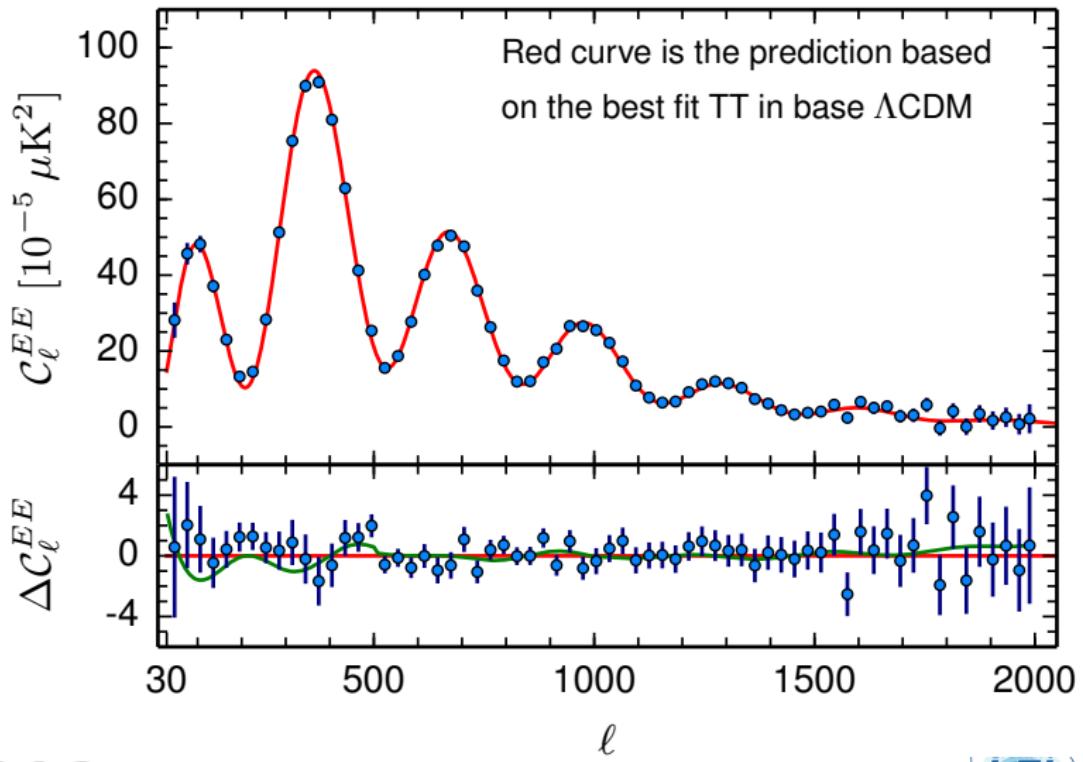
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# Planck 2015 TE Power Spectrum



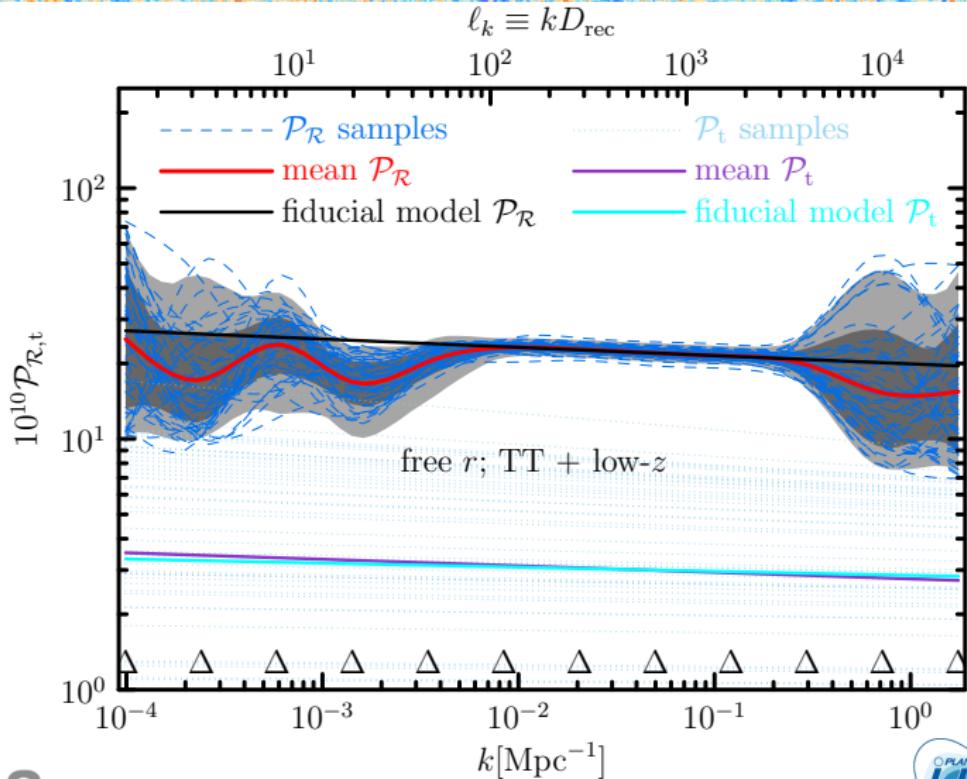
# Planck 2015 EE Power Spectrum



# Primordial Spectrum Reconstruction



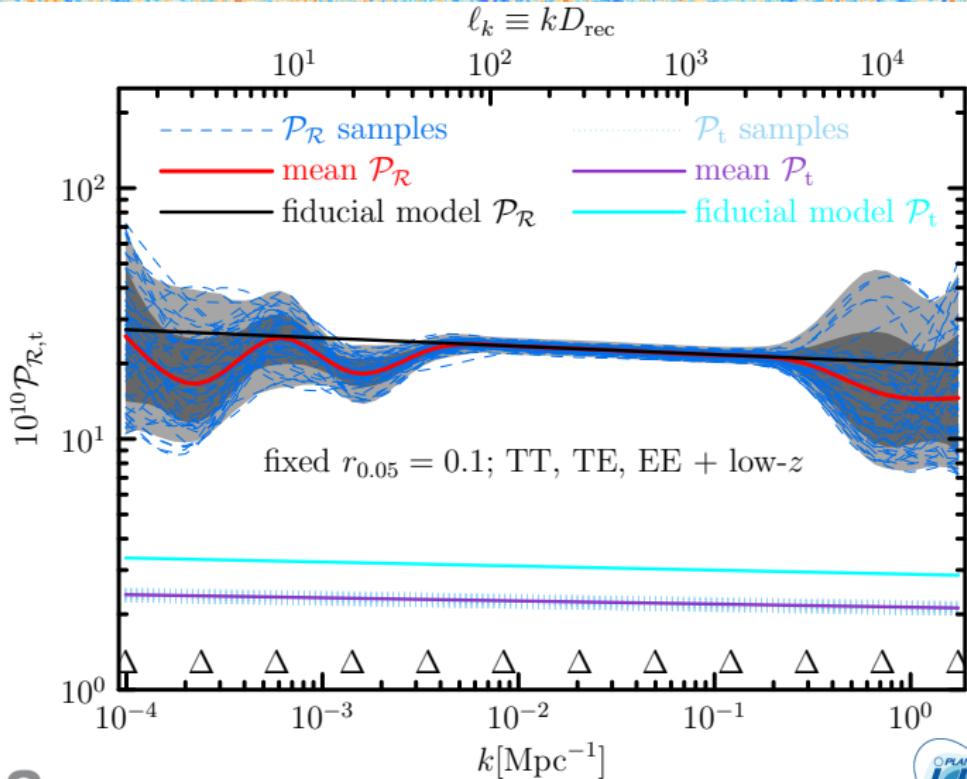
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# Primordial Spectrum Reconstruction



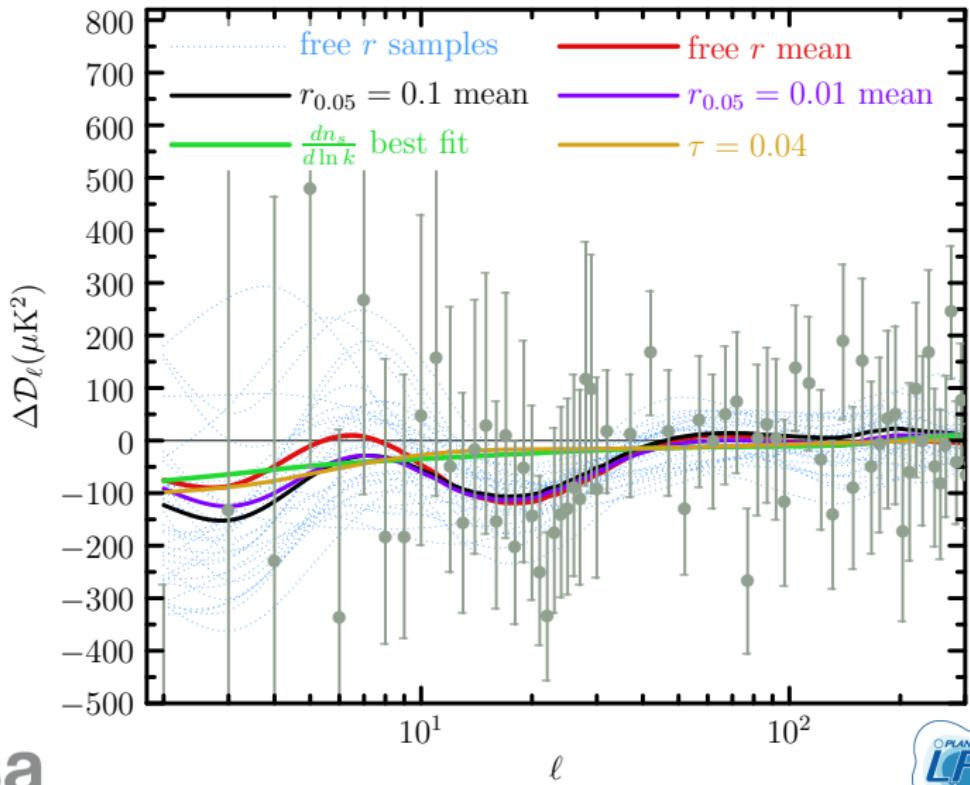
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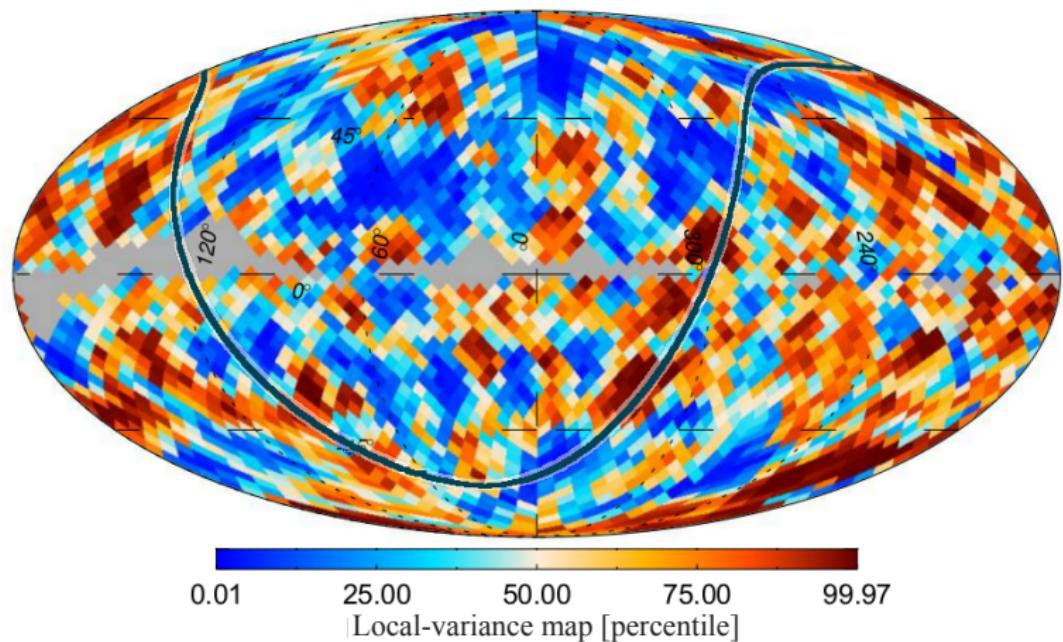
# Running Spectral Index is Not a Good Fit



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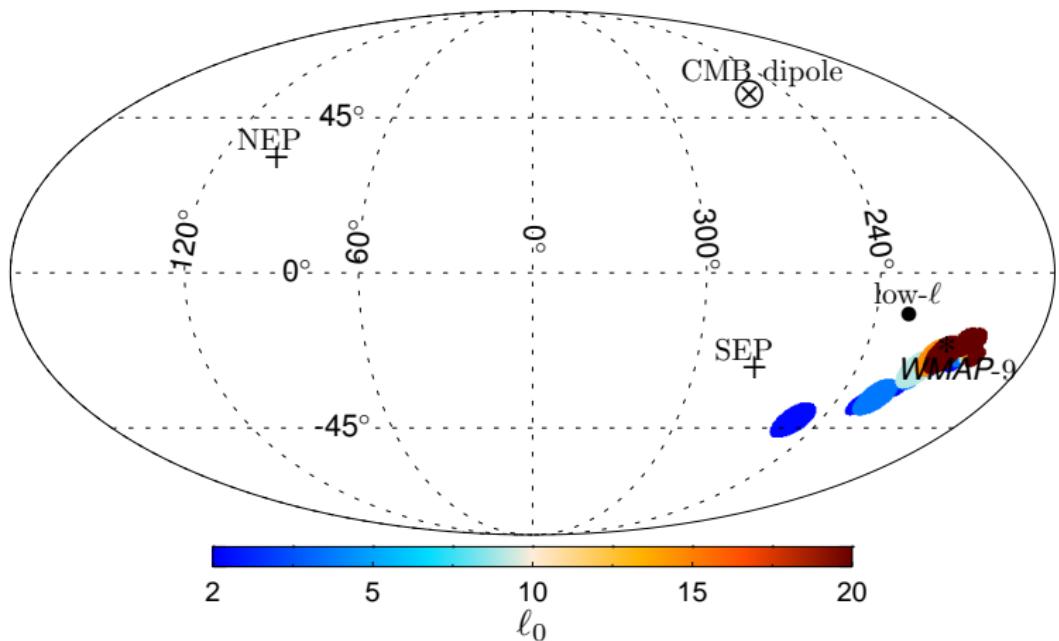
# Local Variance Map of CMB



mean-subtracted and inverse-variance-weighted local-variance map  
for 8° discs in Commander component-separated CMB map



# Local Variance Dipole Modulation



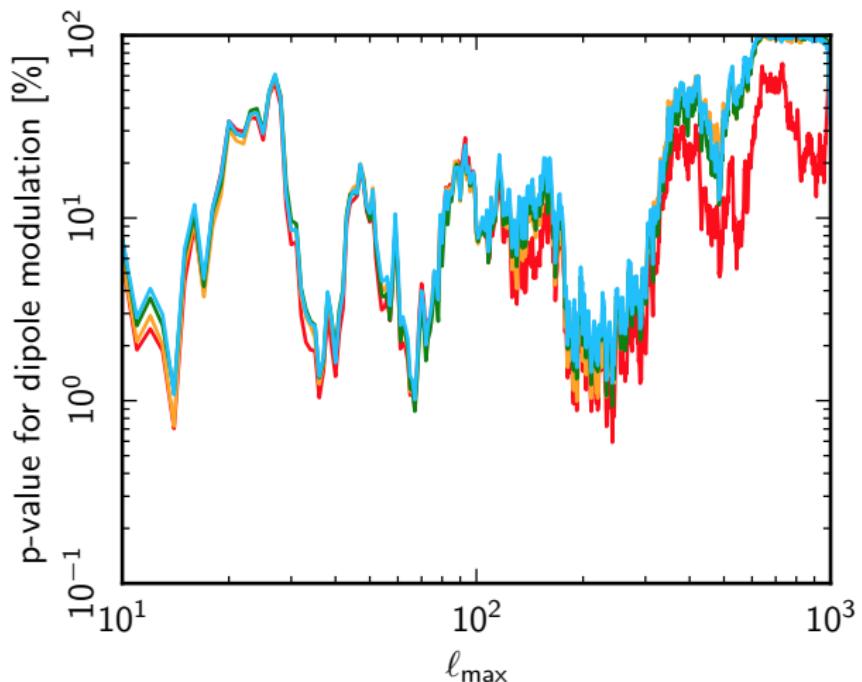
variance dipole amplitude  $0.052 \pm 0.016$ , direction  $(l, b) = (210^\circ, -26^\circ)$   
(no high-pass filter applied)



# QML Estimator of Dipole Modulation



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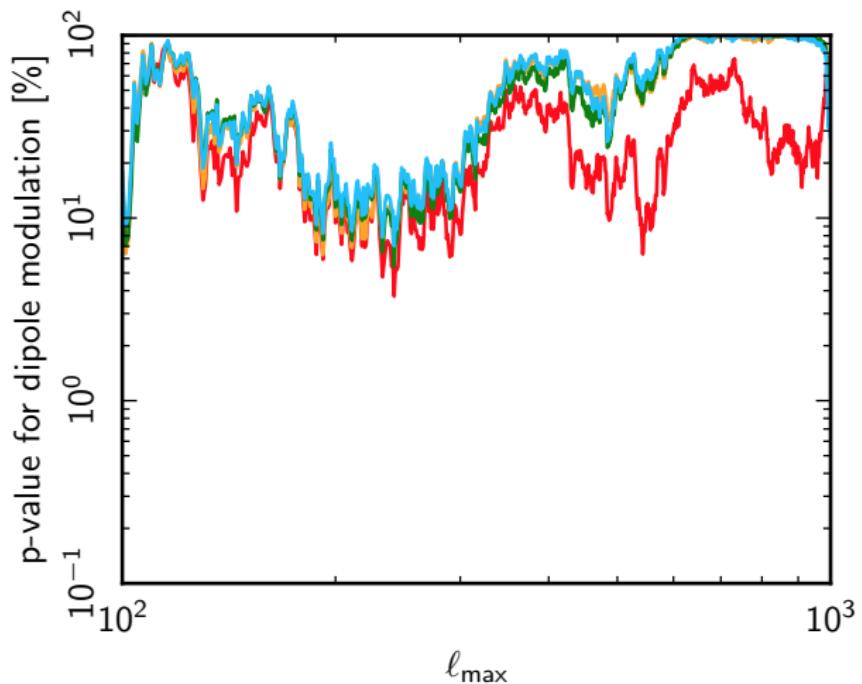
Go after  $\delta C_{\ell\ell+1}$  in  $2 < \ell < \ell_{\text{max}}$  range, compare to sims  
(remove  $\ell < 100$  modes)



# QML Estimator of Dipole Modulation



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Go after  $\delta C_{\ell\ell+1}$  in  $2 < \ell < \ell_{\max}$  range, compare to sims  
(remove  $\ell < 100$  modes)





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Going after localized  
anomalies...

Let's look at peaks!



# Optimal (Wiener) Deconvolution



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Estimating observable from a noisy data:

$$\underbrace{o(\vec{x})}_{\text{observable}} = \underbrace{h(\vec{x}) * s(\vec{x})}_{\text{transfer}} + \underbrace{\epsilon(\vec{x})}_{\text{noise}} \quad \Rightarrow \quad \underbrace{\hat{o}(\vec{x})}_{\text{estimate}} = \underbrace{g(\vec{x}) * o(\vec{x})}_{\text{filter}} \quad \underbrace{o(\vec{x})}_{\text{observable}}$$

In Fourier domain, optimal Wiener filter is:

$$G = \frac{\bar{H} \cdot S}{|H|^2 \cdot S + N} \simeq \frac{\bar{H}}{N} \cdot S$$

Take a shortcut - whiten data using isotropic CMB+noise model!

$$G \sim C_\ell^{-\frac{1}{2}} \cdot S$$

Whiten and filter, search for peaks!

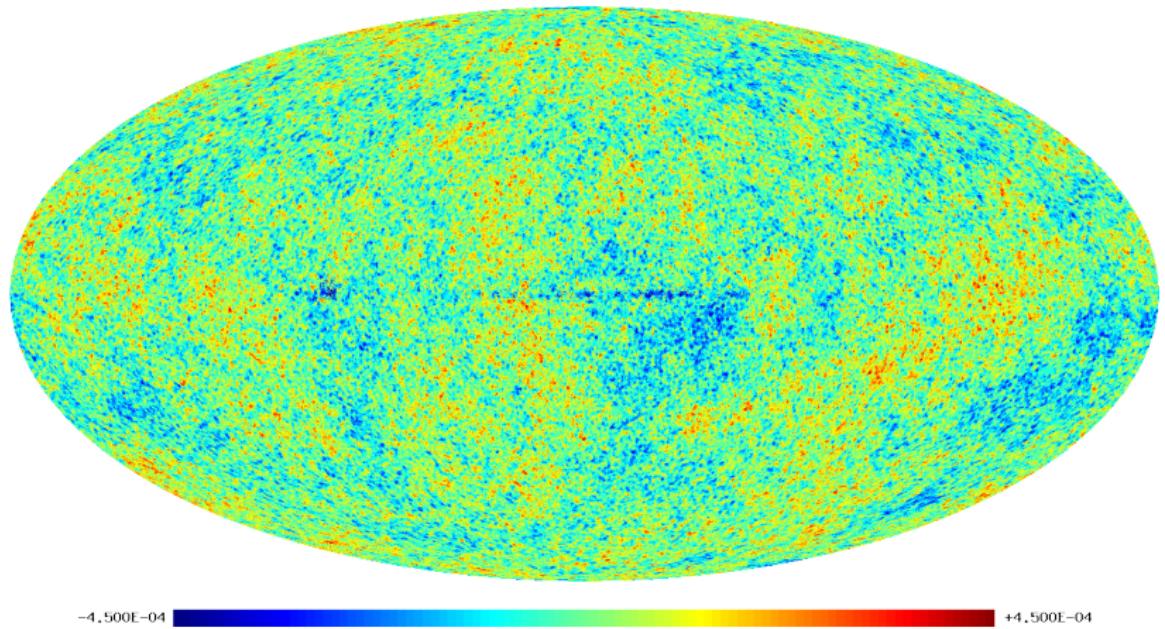


# CMB Data Analysis Pipeline

- SMICA
- Whiten
- Mask
- Filter
- Find Peaks



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Planck 2015 release [SSG84 filter at 240' FWHM]

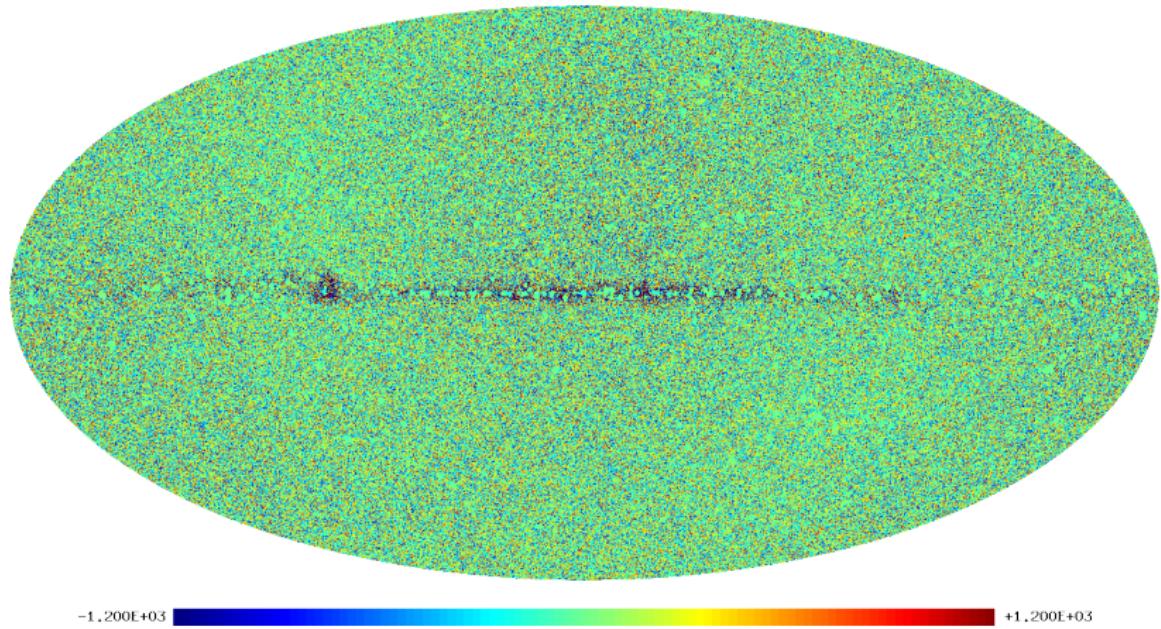


# CMB Data Analysis Pipeline

- SMICA ◦ Whiten ◦ Mask ◦ Filter ◦ Find Peaks ◦



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-1.200E+03      +1.200E+03

Planck 2015 release [SSG84 filter at 240' FWHM]

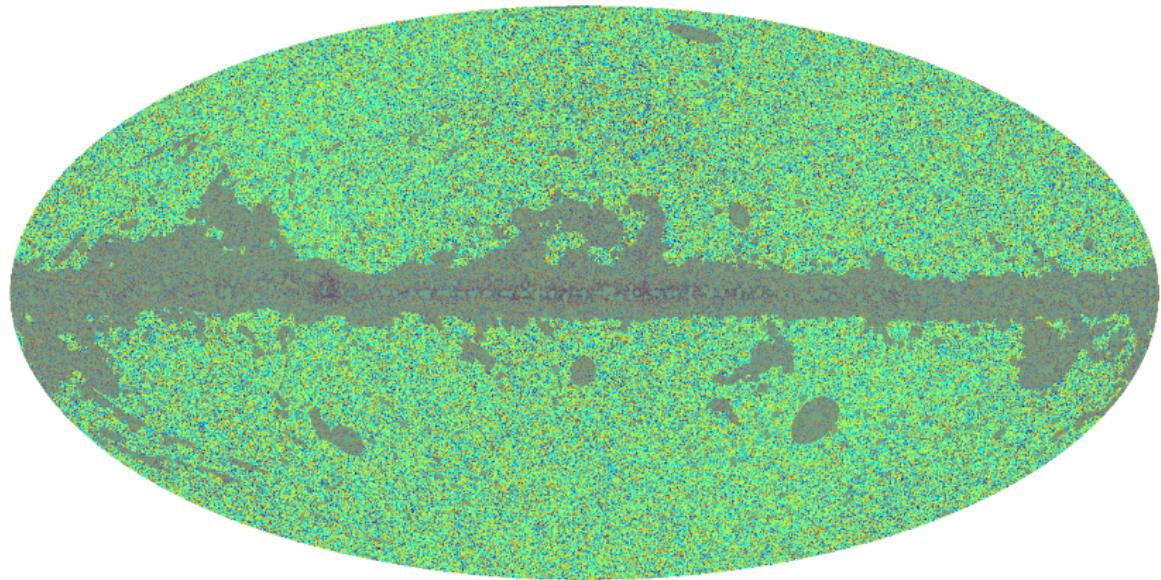


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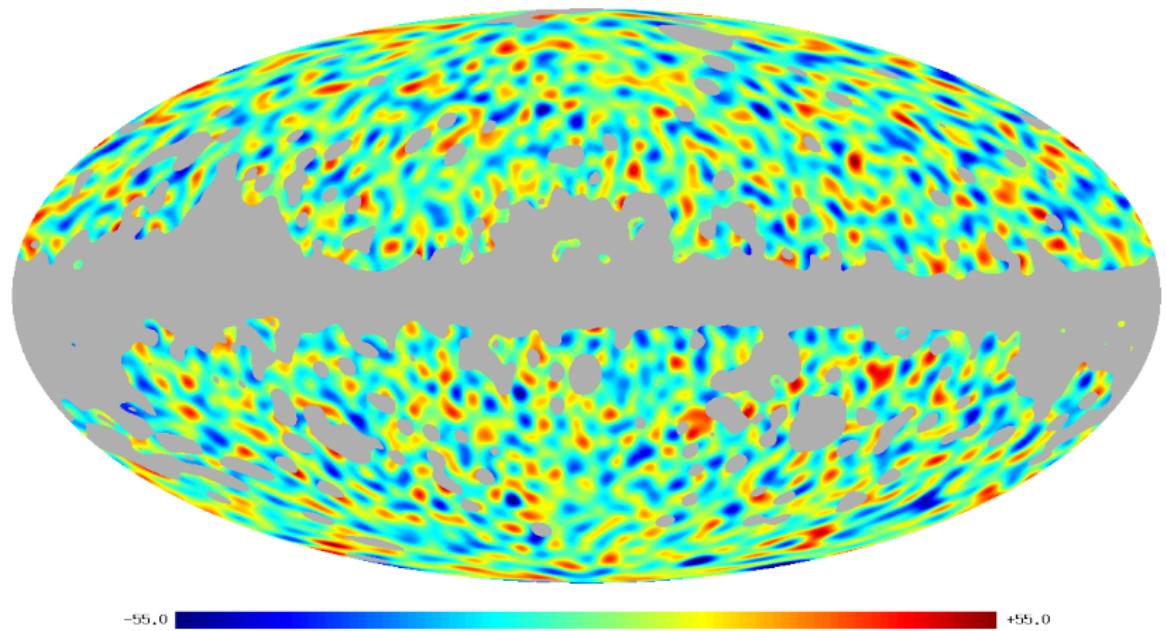


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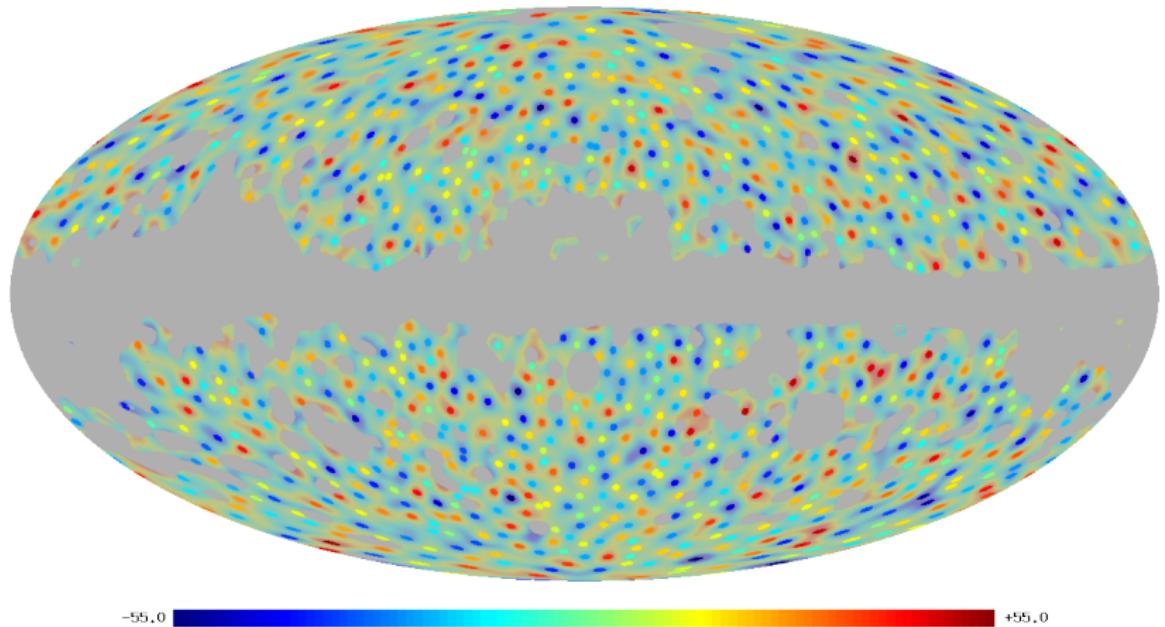


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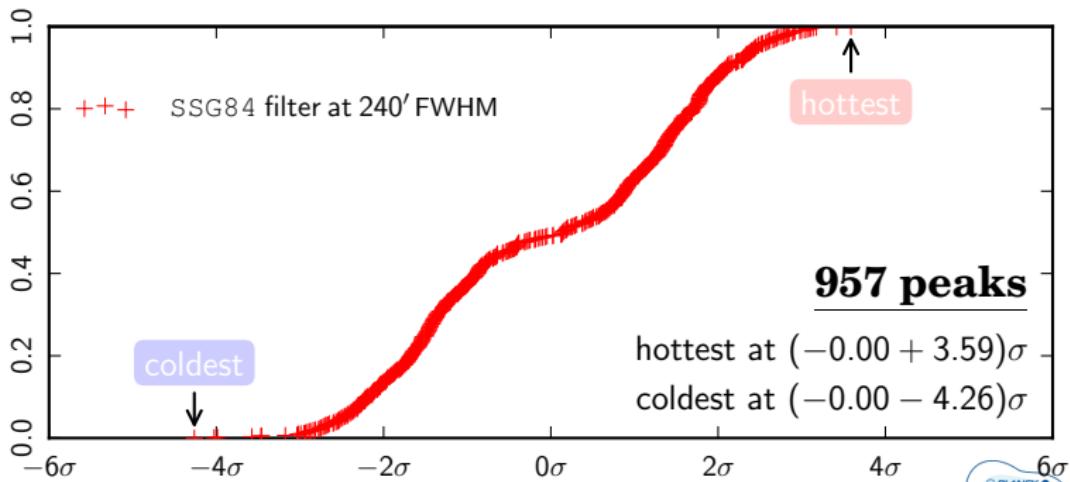


# Testing CMB Peak Statistics



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- Peak CDF • Gaussian CDF • Deviation • Simulations •



# Testing CMB Peak Statistics

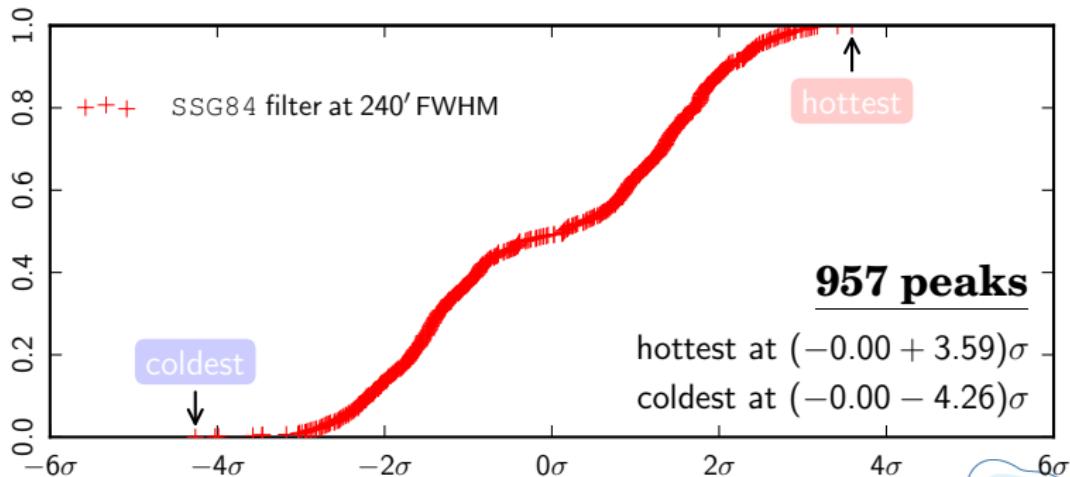


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- Peak CDF
- Gaussian CDF
- Deviation
- Simulations

Bond and Efstathiou (1987)

$$\frac{n_{\max} + n_{\min}}{n_{\text{pk}}} \left( \frac{x}{\sigma} > \nu \right) = \sqrt{\frac{3}{2\pi}} \gamma^2 \nu \exp\left(-\frac{\nu^2}{2}\right) + \frac{1}{2} \operatorname{erfc}\left[\frac{\nu}{\sqrt{2 - \frac{4}{3}\gamma^2}}\right]$$



# Testing CMB Peak Statistics

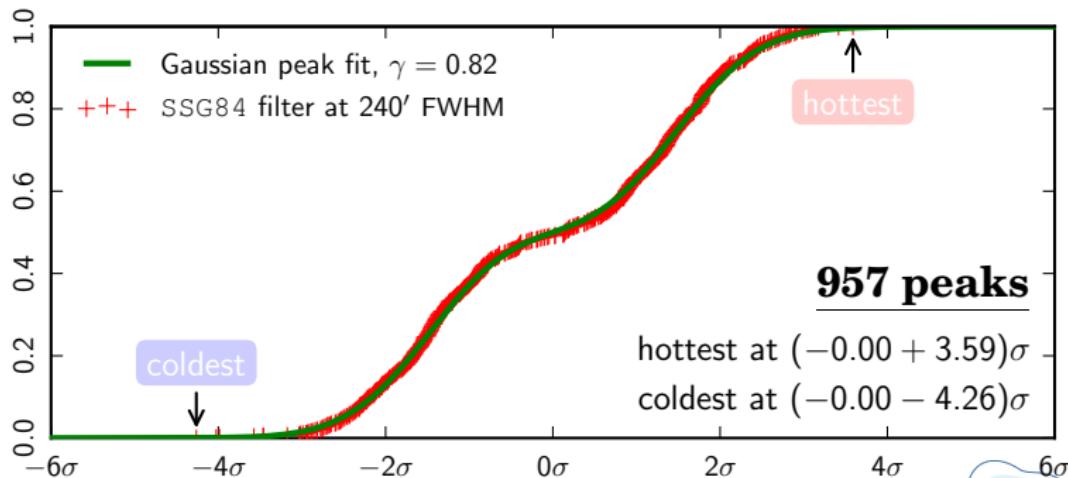


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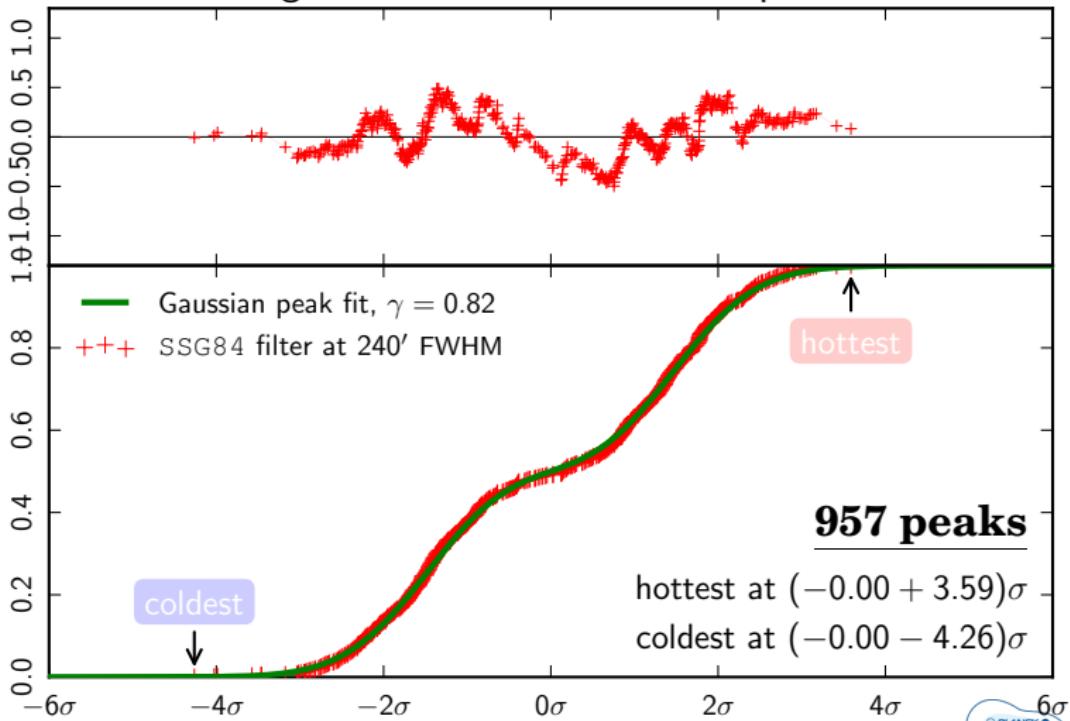


# Testing CMB Peak Statistics



- Peak CDF • Gaussian CDF • Deviation • Simulations •

Kolmogorov deviation from FFP8 peak CDF

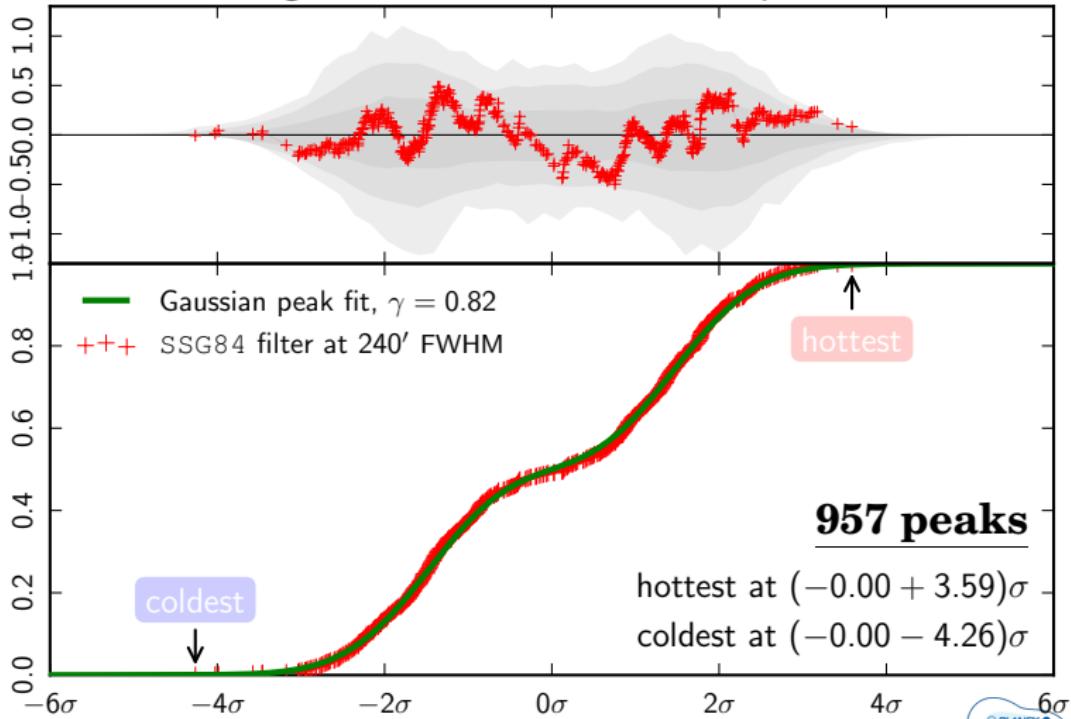


# Testing CMB Peak Statistics



- Peak CDF
- Gaussian CDF
- Deviation
- Simulations

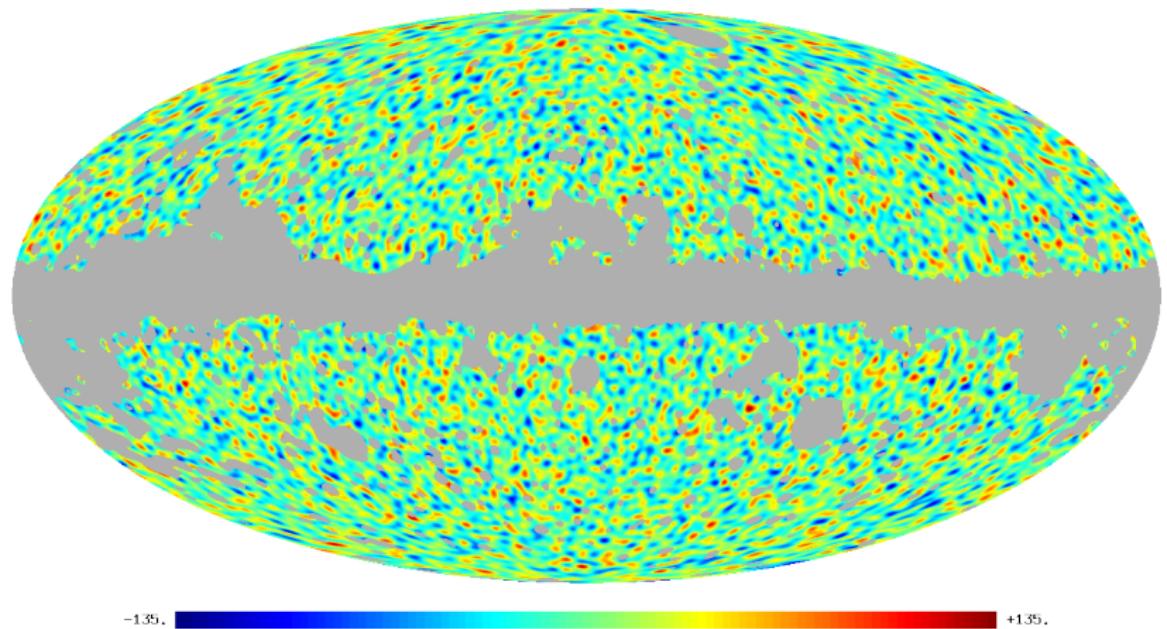
Kolmogorov deviation from FFP8 peak CDF



# SSG84 Filter Sweep



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-1.35 . . . +1.35 .

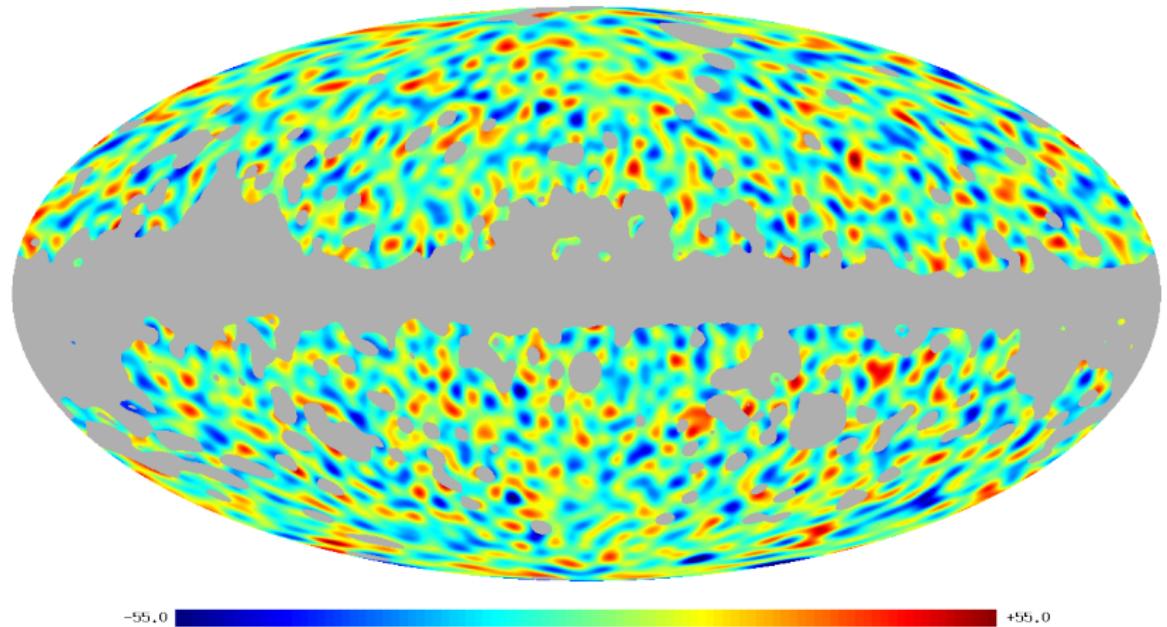
Planck 2015 release [SSG84 filter at  $120'$  FWHM]



# SSG84 Filter Sweep



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-55.0 +55.0

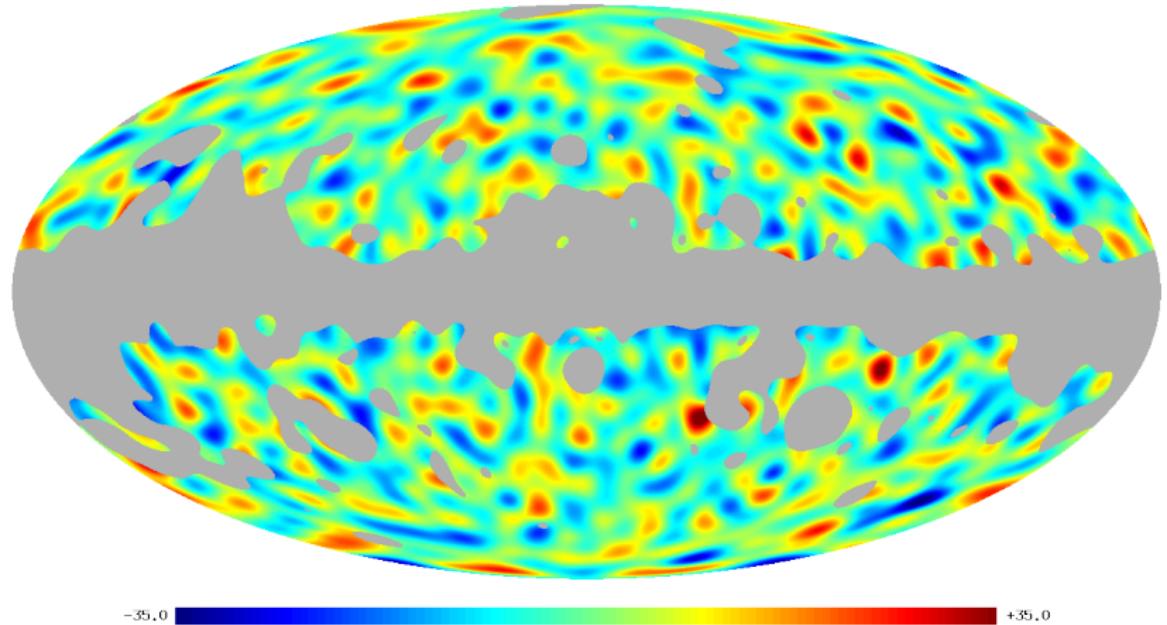
Planck 2015 release [SSG84 filter at 240' FWHM]



# SSG84 Filter Sweep



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-35.0  +35.0

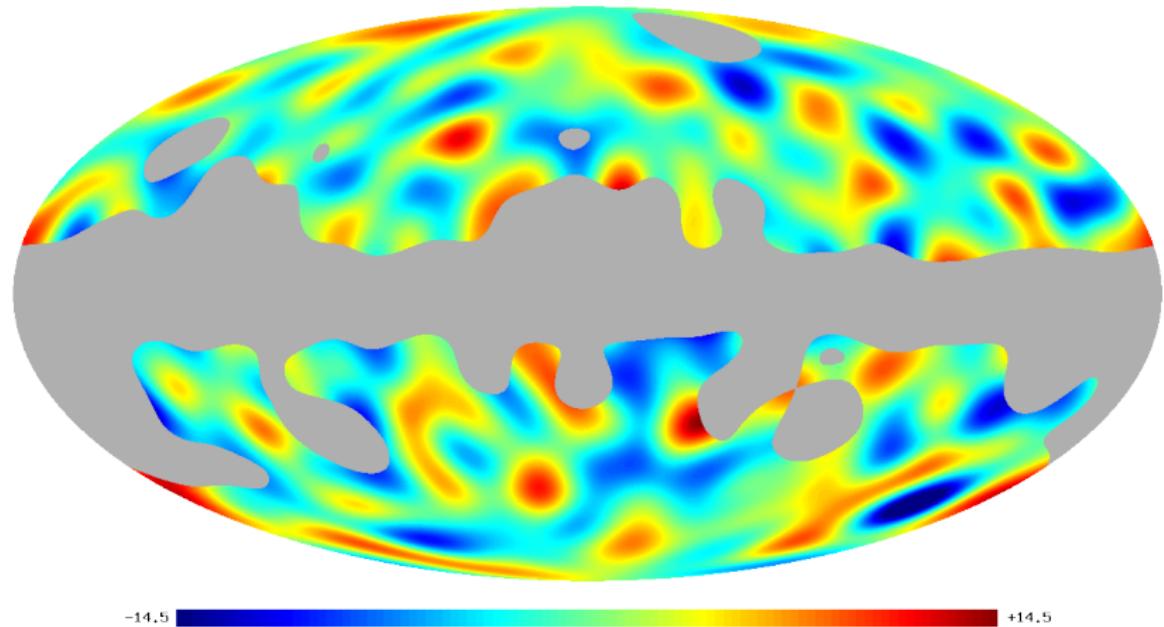
Planck 2015 release [SSG84 filter at 400' FWHM]



# SSG84 Filter Sweep



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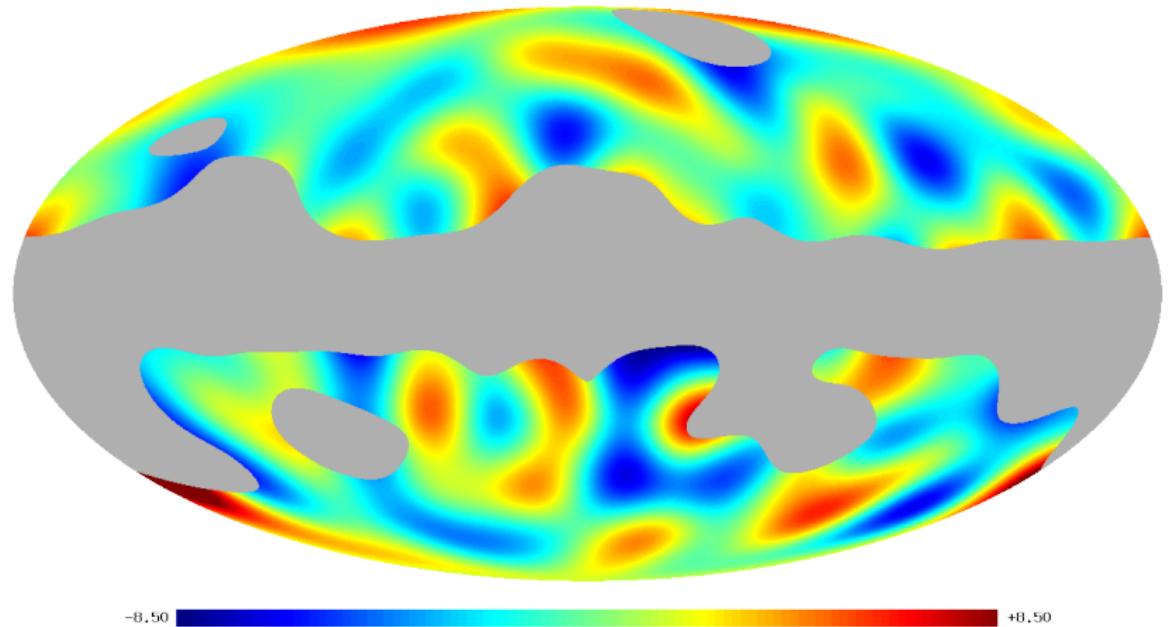
Planck 2015 release [SSG84 filter at 800' FWHM]



# SSG84 Filter Sweep



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-8.50                          +8.50

Planck 2015 release [SSG84 filter at  $1200'_{\text{FWHM}}$ ]

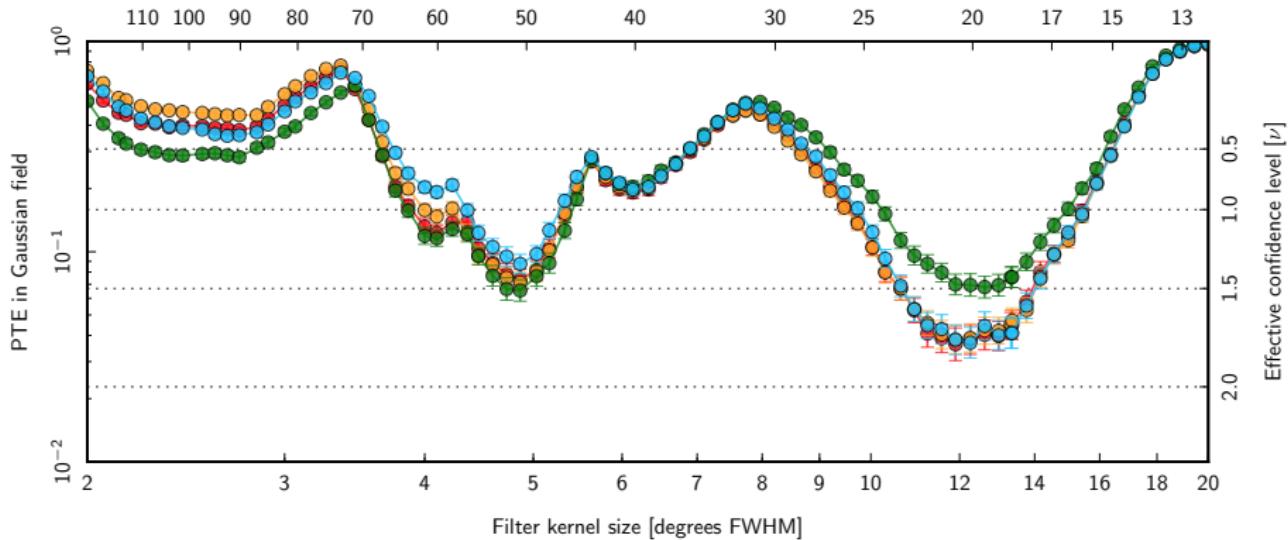


# Significance of Cold Spot



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- Whiten Savitzky-Golay
- Mexican Hat Wavelet



Significance evaluated by counting simulations which exceed observed value –

For full details see Isotropy and Statistics paper.

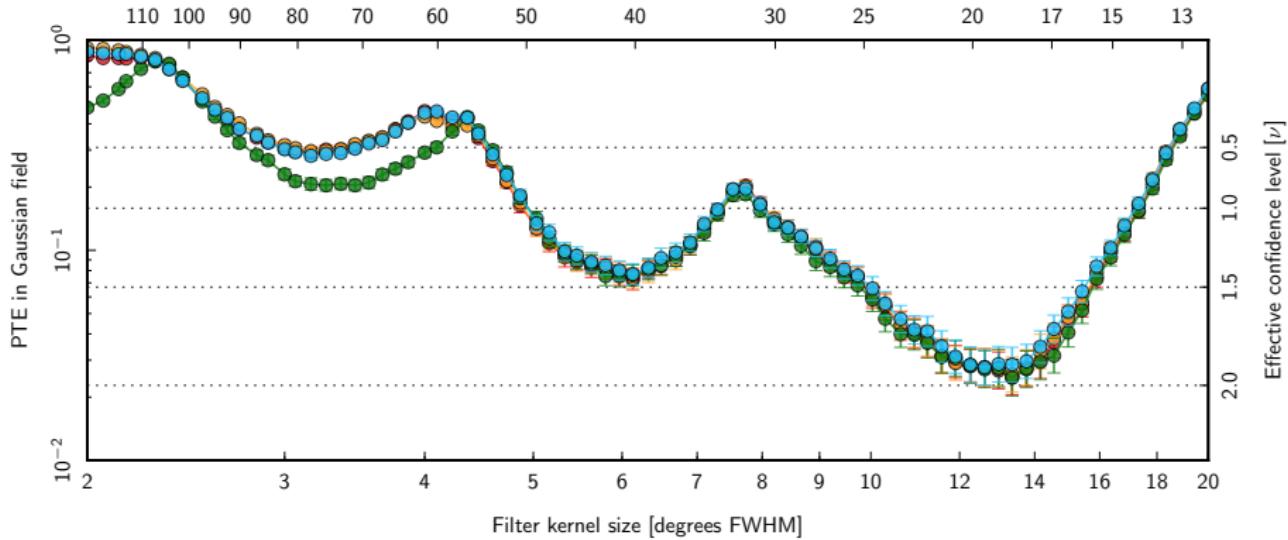


# Significance of Cold Spot



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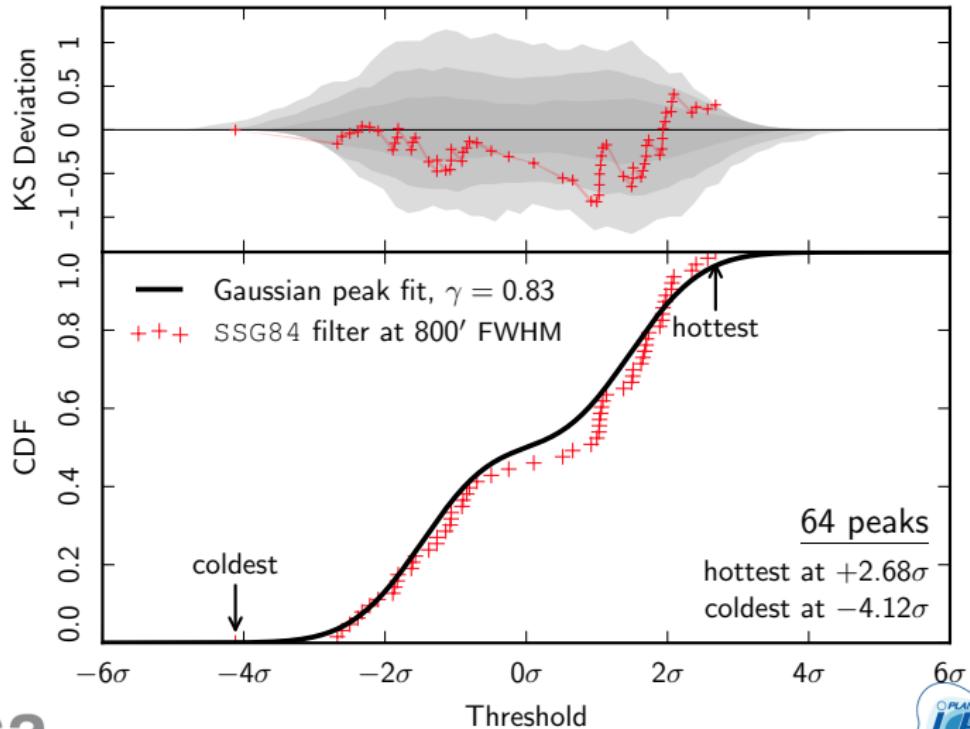


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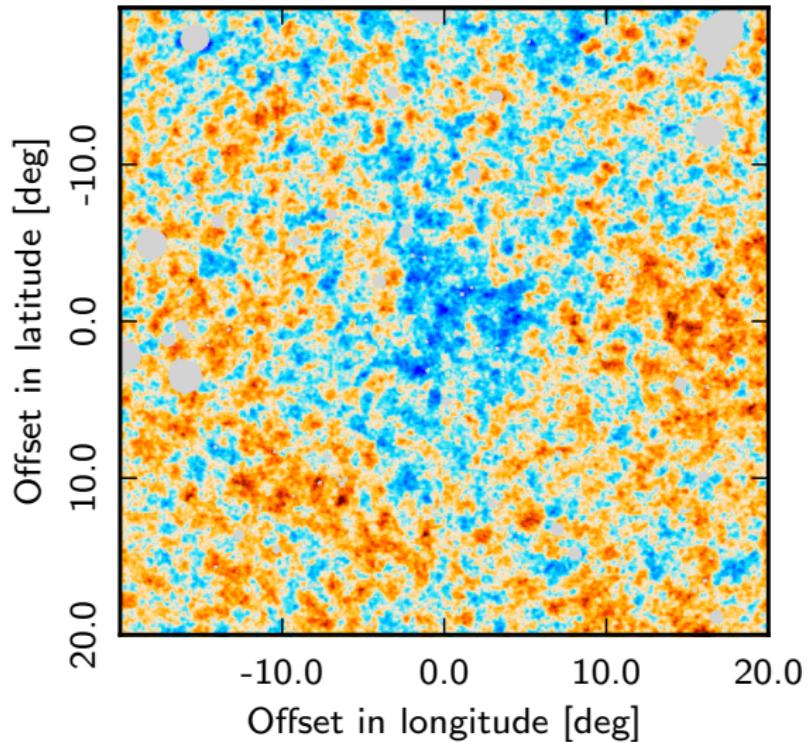
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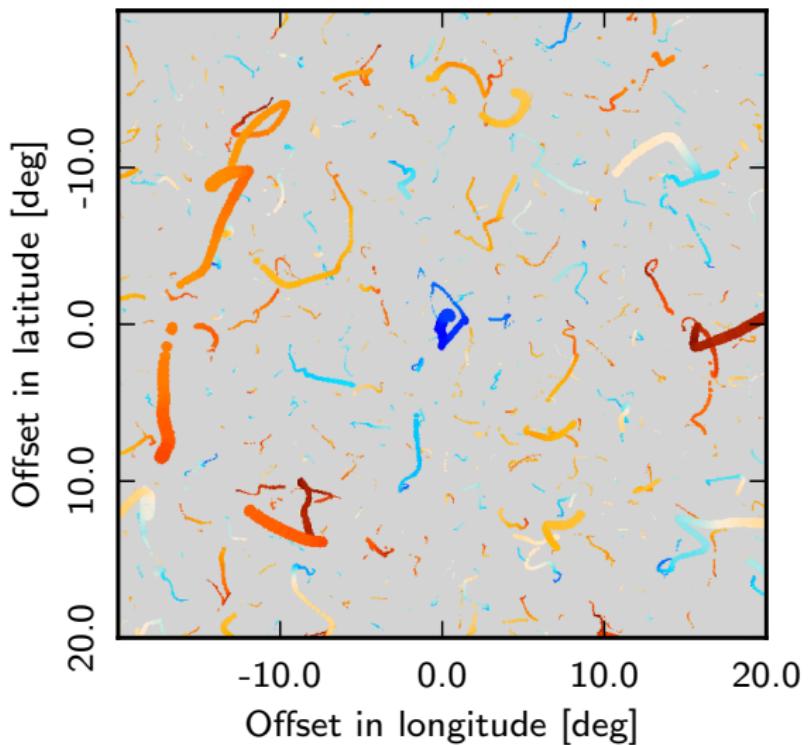
# Cold Spot is Fairly Cold!



# A Closer View at the Cold Spot



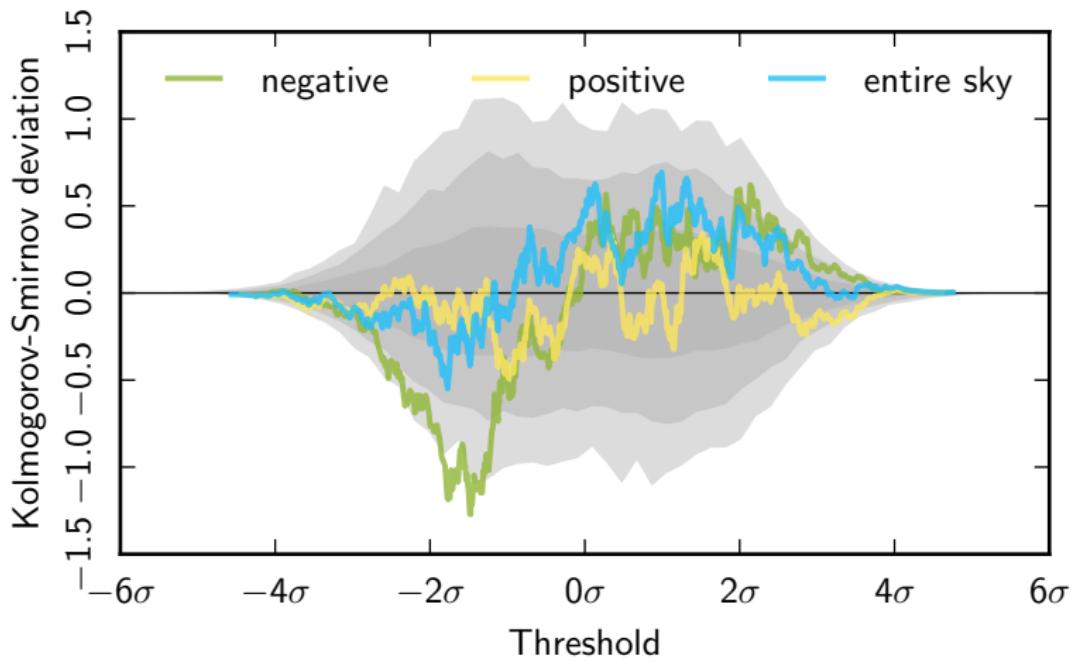
# A Closer View at the Cold Spot



# Asymmetry in Peak Distributions



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peak distributions are also different in two hemispheres!

(pre-whitened GAUSS filter at 40'full-width half-max)





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How does a neighbourhood  
of a peak look like?  
Let's do some stacking!



# The Stacking Family



Three key elements:

- A What to stack? (cosmic field  $u$ )
- B Where to stack? (selection of patches, e.g., peaks)
- C How to stack? (patch orientations)

“where” and “how” give constrained parameter(s)  $q$ ;

	WMAP & Planck 2013	Planck 2015
What	$T, Q, U, Q_r, U_r$	$T, Q, U, Q_r, U_r, E, B, Q_T, U_T, \zeta_{dv}, \dots$
Where	$T$ peaks	$T, E, B, Q^2 + U^2, Q_T^2 + U_T^2, \zeta_{dv} \dots$ peaks
How	unoriented	oriented and unoriented

For Gaussian fields,

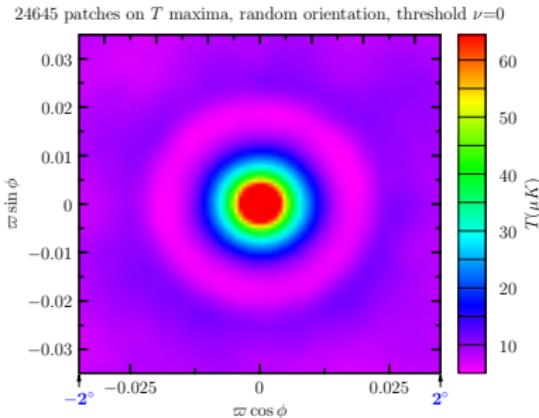
$$\langle u|q; \text{peak, orientation}\rangle = \langle u q^\dagger \rangle \langle q q^\dagger \rangle^{-1} \langle q|\text{peak, orientation}\rangle.$$

# Planck 2015: Stacking Temperature

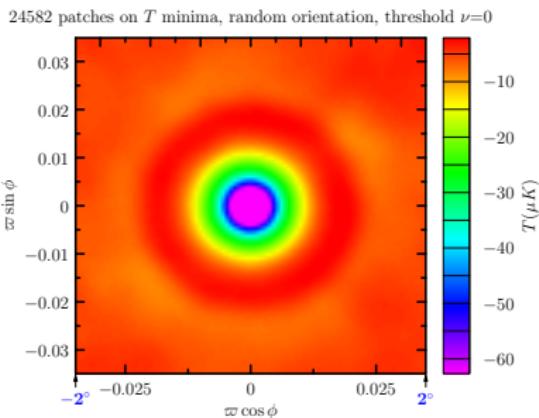


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$T$  on hot spots



$T$  on cold spots



resolution: FWHM 15 arcmin

Peaks are selected above a threshold  $|T_{\text{peak}}| > \nu \sqrt{\langle T^2 \rangle}$  ( $\nu=0$  here).

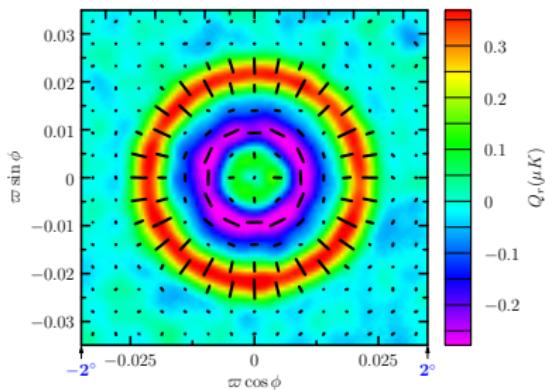
Full statistics in Isotropy and Statistics paper!

# Planck 2015: Stacking Polarization



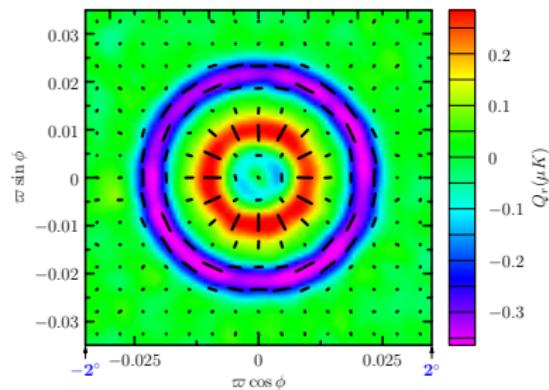
## $Q_r$ on hot spots

33214 patches on  $T$  maxima, random orientation, threshold  $\nu=0$



## $Q_r$ on cold spots

33126 patches on  $T$  minima, random orientation, threshold  $\nu=0$



resolution: FWHM 15 arcmin

Peaks are selected above a threshold  $|T_{\text{peak}}| > \nu \sqrt{\langle T^2 \rangle}$  ( $\nu=0$  here).

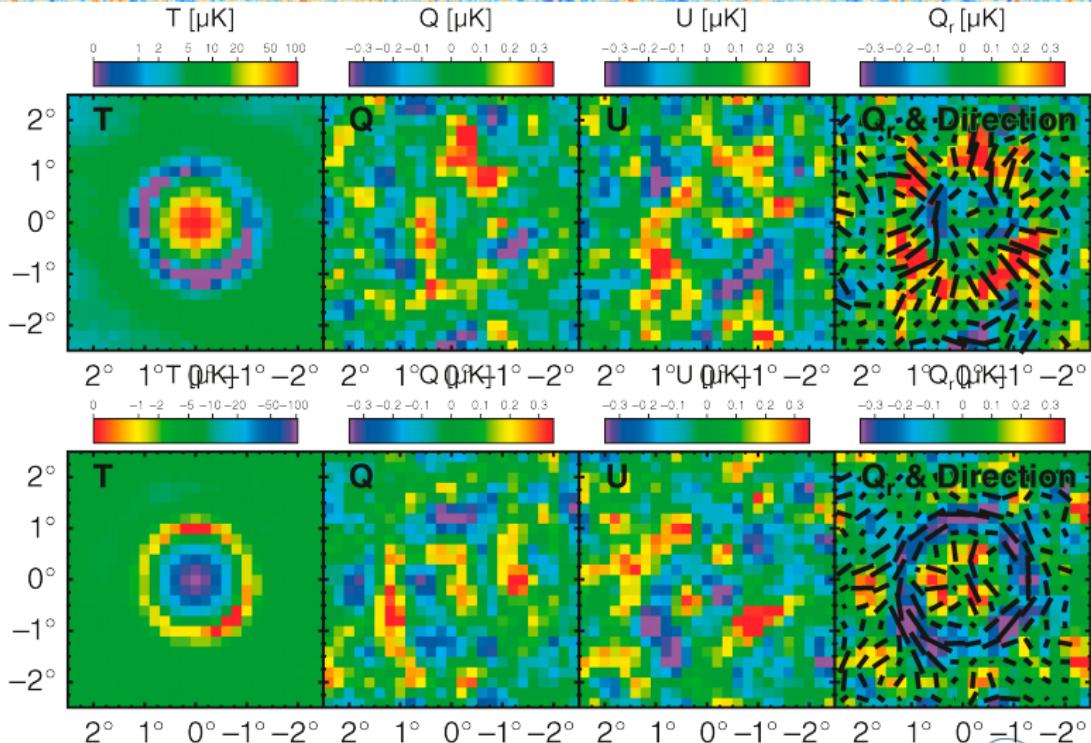
Full statistics in Isotropy and Statistics paper!



# WMAP-7: Stacking $T$ & $Q_1$



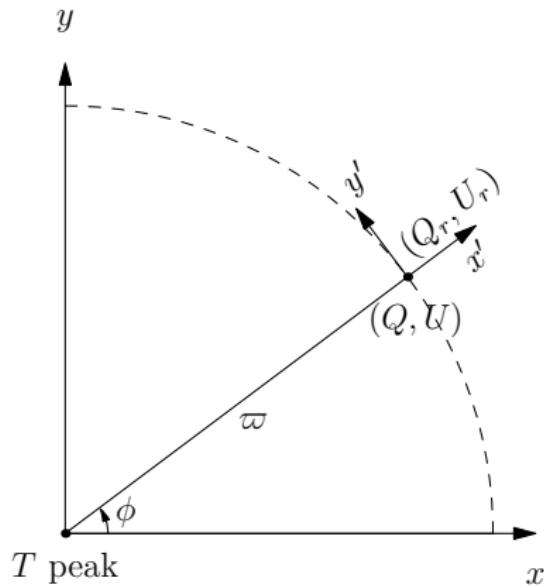
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# How to Rotate the Polarization Field



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flat-sky polar coor. ( $\varpi, \phi$ ):

$$\varpi = 2 \sin \frac{\theta}{2}$$

$$Q_r = -Q \cos 2\phi - U \sin 2\phi$$

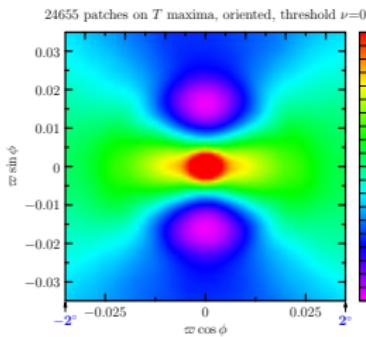
$$U_r = -U \cos 2\phi + Q \sin 2\phi$$

# Oriented Stacking: $T$ on $T$ peaks

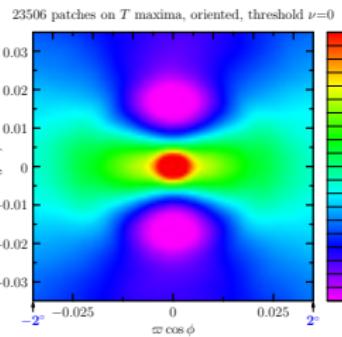


peak threshold  $\nu = 0$ , resolution FWHM 15 arcmin:

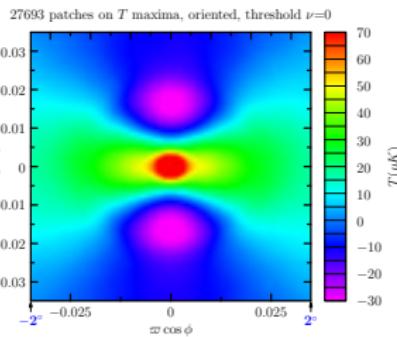
Planck 2015



FFP8



noise-free sims



Angular dependence ( $\cos m\phi$ ,  $m = 0, 2$ )

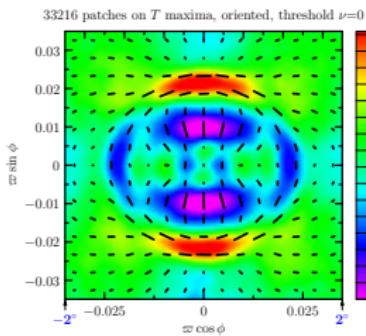
Noise has no noticeable impact.

# Oriented Stacking: $Q$ on $T$ peaks

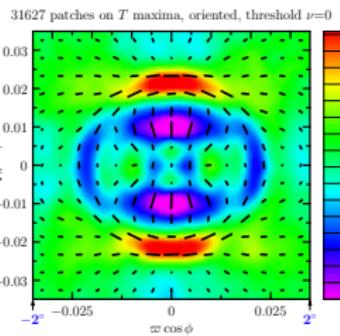


peak threshold  $\nu = 0$ , resolution FWHM 15 arcmin:

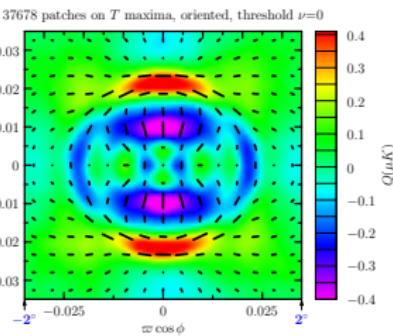
Planck 2015



FFP8



noise-free sims



Angular dependence ( $\cos m\phi$ ,  $m = 0, 2, 4$ )

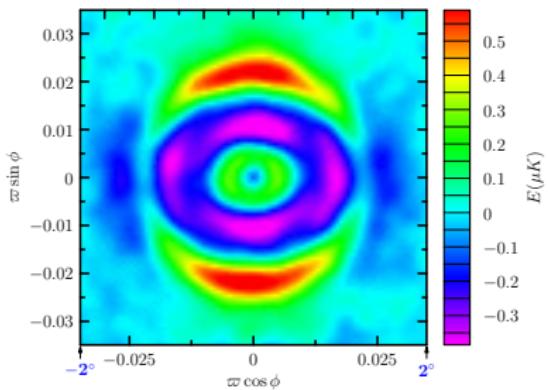
Again noise has no noticeable impact.

# Oriented Stacking of Polarization



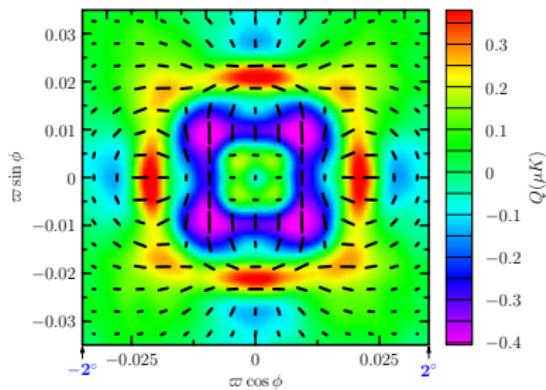
$E$  on oriented  $T$  peaks

33216 patches on  $T$  maxima, oriented, threshold  $\nu=0$



$Q$  on oriented  $Q_T^2 + U_T^2$  peaks

58099 patches on  $P_T$  maxima, oriented, threshold  $\nu=0$



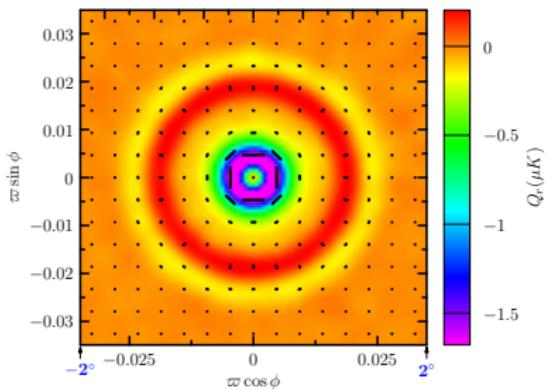
Planck 2015 (peak threshold  $\nu=0$ ; resolution FWHM 15 arcmin)

# Stacking on Polarization Peaks



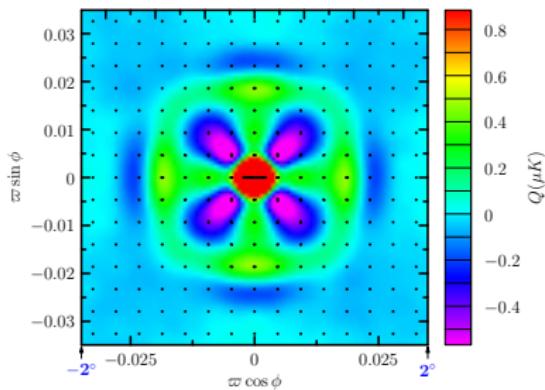
$Q_r$  on unoriented  $E$  peaks

99529 patches on  $E$  maxima, random orientation, threshold  $\nu=0$



$Q$  on oriented  $Q^2 + U^2$  peaks

196910 patches on  $P$  maxima, oriented, threshold  $\nu=0$



Planck 2015 (peak threshold  $\nu=0$ ; resolution FWHM 15 arcmin)

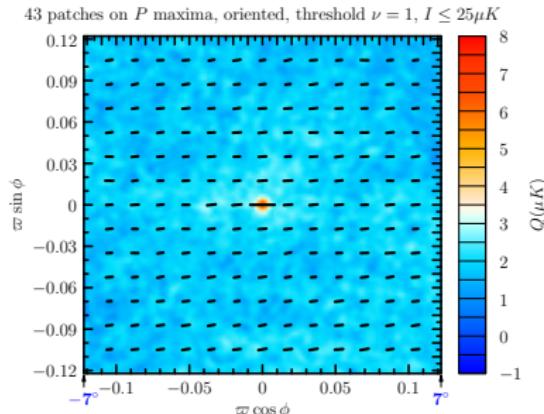
# Stacking Polarized Dust



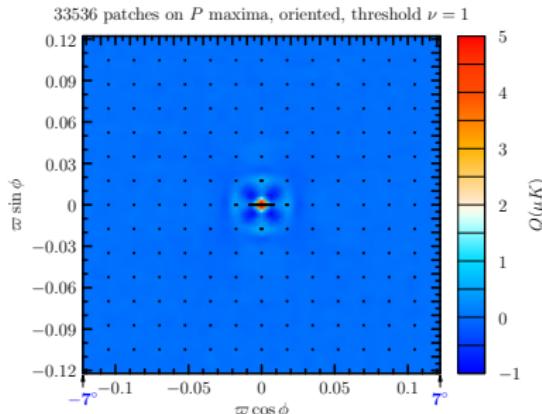
planck

## Planck 2015 Component Separated Commander Dust Map

### Dust Component, $T < 25\mu K$



### CMB Component



$Q$  stacked on  $Q^2 + U^2$  oriented peaks (oriented s.t.  $U$  vanishes in the centre).

Patch size:  $\varpi \leq 7^\circ$ ; threshold  $\nu = 1$

$T$  map FWHM  $2^\circ$ ;  $Q, U$  maps FWHM 15 arcmin.



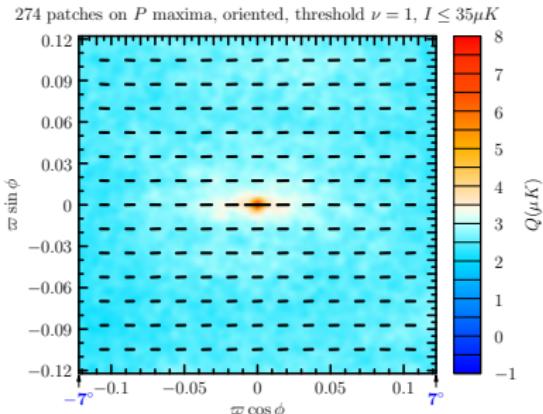
# Stacking Polarized Dust



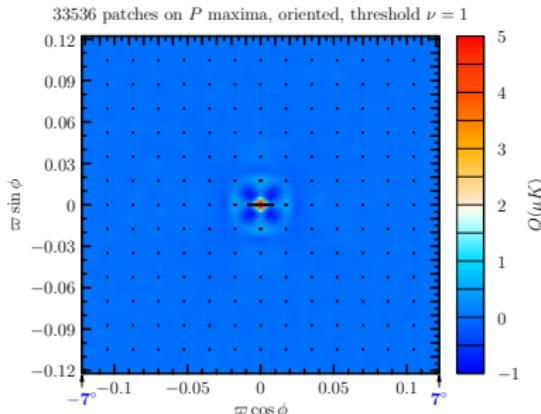
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## Planck 2015 Component Separated Commander Dust Map

### Dust Component, $T < 35\mu K$



### CMB Component



$Q$  stacked on  $Q^2 + U^2$  oriented peaks (oriented s.t.  $U$  vanishes in the centre).

Patch size:  $\varpi \leq 7^\circ$ ; threshold  $\nu = 1$

$T$  map FWHM  $2^\circ$ ;  $Q, U$  maps FWHM 15 arcmin.



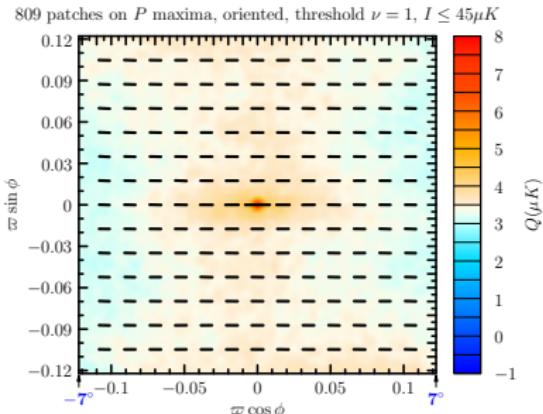
# Stacking Polarized Dust



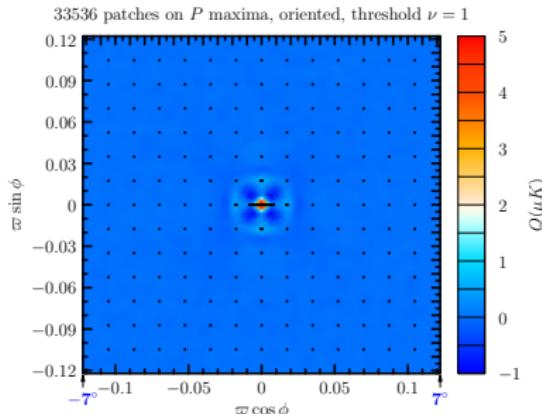
planck

## Planck 2015 Component Separated Commander Dust Map

### Dust Component, $T < 45\mu K$



### CMB Component



$Q$  stacked on  $Q^2 + U^2$  oriented peaks (oriented s.t.  $U$  vanishes in the centre).

Patch size:  $\varpi \leq 7^\circ$ ; threshold  $\nu = 1$

$T$  map FWHM  $2^\circ$ ;  $Q, U$  maps FWHM 15 arcmin.



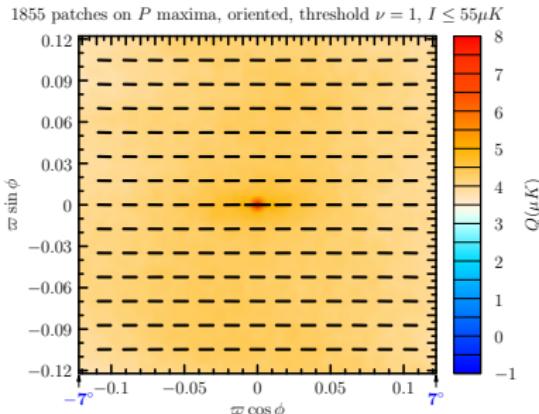
# Stacking Polarized Dust



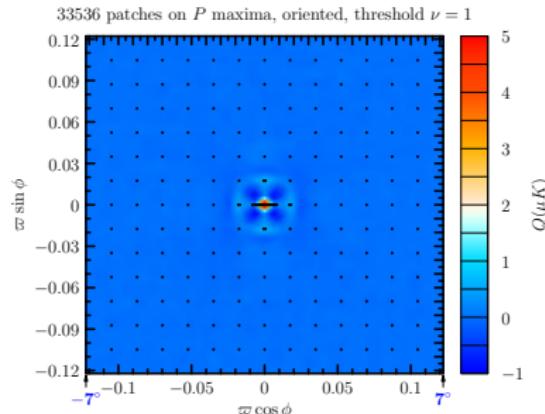
planck

## Planck 2015 Component Separated Commander Dust Map

### Dust Component, $T < 55\mu K$



### CMB Component



$Q$  stacked on  $Q^2 + U^2$  oriented peaks (oriented s.t.  $U$  vanishes in the centre).

Patch size:  $\varpi \leq 7^\circ$ ; threshold  $\nu = 1$

$T$  map FWHM  $2^\circ$ ;  $Q, U$  maps FWHM 15 arcmin.

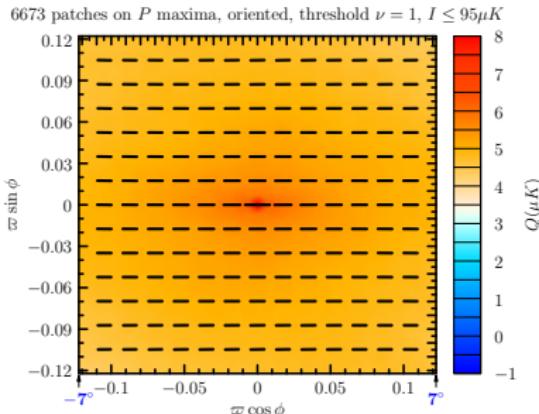


# Stacking Polarized Dust

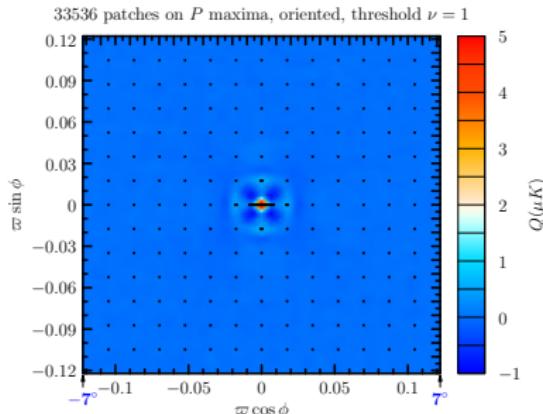


## Planck 2015 Component Separated Commander Dust Map

### Dust Component, $T < 95\mu K$



### CMB Component



$Q$  stacked on  $Q^2 + U^2$  oriented peaks (oriented s.t.  $U$  vanishes in the centre).

Patch size:  $w \leq 7^\circ$ ; threshold  $\nu = 1$

$T$  map FWHM  $2^\circ$ ;  $Q, U$  maps FWHM 15 arcmin.



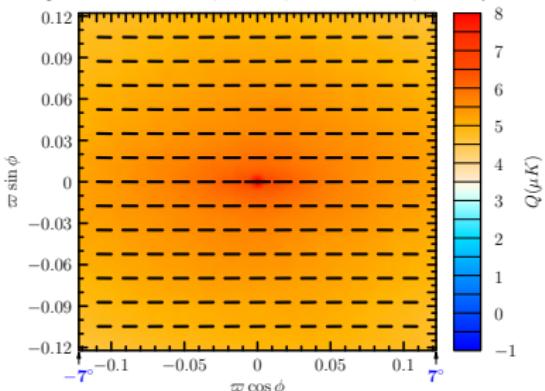
# Stacking Polarized Dust



## Planck 2015 Component Separated Commander Dust Map

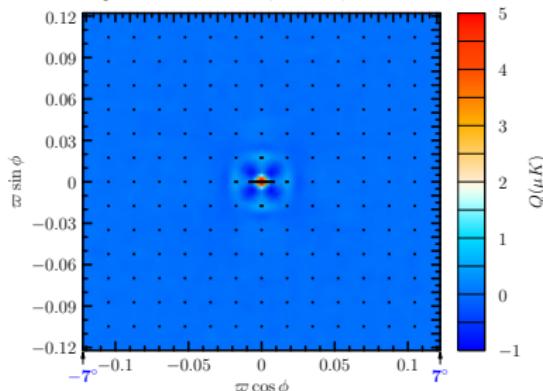
### Dust Component, $T < 115\mu K$

8531 patches on  $P$  maxima, oriented, threshold  $\nu = 1$ ,  $I \leq 115\mu K$



### CMB Component

33536 patches on  $P$  maxima, oriented, threshold  $\nu = 1$



$Q$  stacked on  $Q^2 + U^2$  oriented peaks (oriented s.t.  $U$  vanishes in the centre).

Patch size:  $\varpi \leq 7^\circ$ ; threshold  $\nu = 1$

$T$  map FWHM  $2^\circ$ ;  $Q, U$  maps FWHM 15 arcmin.



# Conclusions



- A lot more and better processed and analyzed data.
- As in 2013, base  $\Lambda$ CDM continues to be a good fit to the Planck data, **including polarization**.
- Polarization has a degeneracy lifting capability often comparable to BAO.
- No convincing evidence for any simple extensions. Scalar fluctuations consistent with pure adiabatic modes with a featureless tilted spectrum.
- 2015 statistics: mostly Gaussian, but with similar anomalies than 2013. Many new methods explored, including of novel oriented stacking and peak statistics methods.
- Stacking and peak statistics give a complimentary approach for probing hemispherical asymmetry and component separation tests.



# Conclusions



2015 papers and data are released!

+ more to come...



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.



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DTU Space  
National Space Institute

Science & Technology  
Facilities Council



National Research Council of Italy



Deutsches Zentrum  
für Luft- und Raumfahrt e.V.

UK SPACE  
AGENCY



HFI PLANCK  
a look back to the birth of Universe



INAF - IASF BO  
ISTITUTO NAZIONALE  
DI ASTROFISICA  
ISTITUTO NAZIONALE DI FISICA COSMICA  
DI ROMA

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.



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# 16th Canadian Conference on General Relativity and Relativistic Astrophysics

6-8 July 2016, SFU Segal Building, Vancouver



<http://www.sfu.ca/physics/cosmology/CCGRRA-16/>



# Appendix: Technical Details



# Generalized Savitzky-Golay Filters



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Generalized Savitzky-Golay filter kernel:

$$F_{n,k}(x) = \left( \sum_{i=0}^{n/2} a_i x^{2i} \right) (1-x^2)^k$$

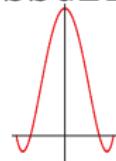
Orthogonal to polynomials up to order  $n$ :

$$\int_0^1 x F_{n,k}(x) dx = 1, \quad \int_0^1 x^{i+1} F_{n,k}(x) dx = 0$$

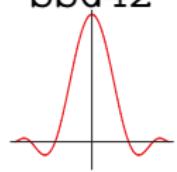
*Savitzky and Golay (1964)*

*locate peaks in noisy spectra – topcite in Analytical Chemistry!*

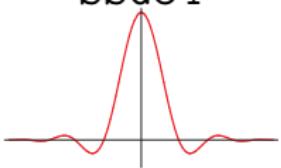
SSG21



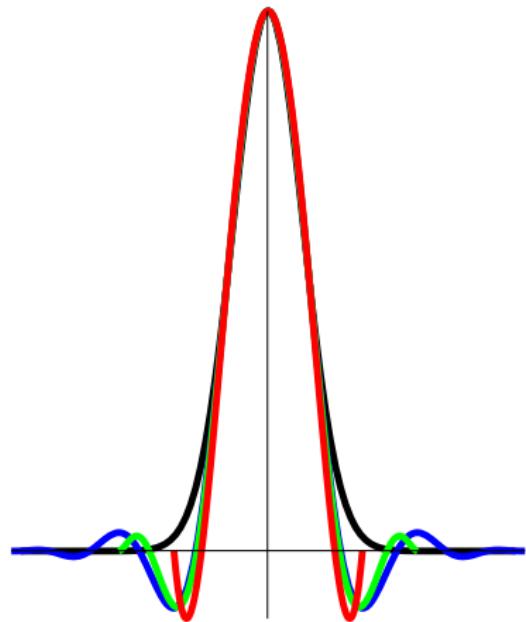
SSG42



SSG84

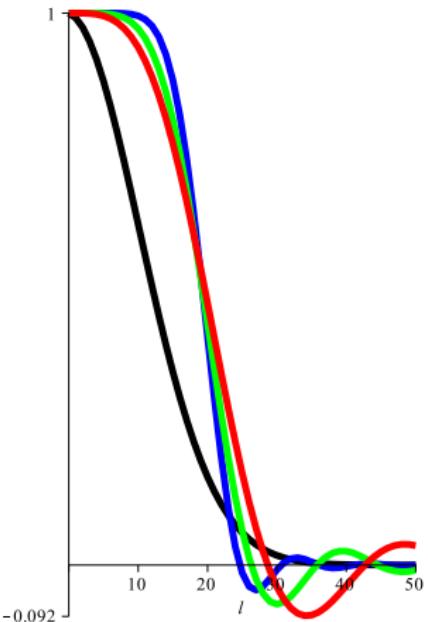


# Filter Kernels in Harmonic Space



real space

[compact support]



harmonic space

[low-pass filter]



# How to Orient a Patch around a Peak



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First derivative vanishes on the peak. Need to use the 2nd derivatives.

Intuitively (flat-sky limit):

$$Q_T \equiv \nabla^{-2}(\partial_y^2 - \partial_x^2)T, \quad U_T \equiv -2\nabla^{-2}(\partial_x \partial_y)T$$

Slightly non-intuitive (on the sphere):

$$Q_T(\mathbf{n}) \pm iU_T(\mathbf{n}) \equiv \sum_{l,m} \left[ \int T(\mathbf{n}') Y_{lm}^*(\mathbf{n}') d^2\mathbf{n}' \right]_{\pm 2} Y_{lm}(\mathbf{n})$$

Orient the patch such that  $U_T$  **vanishes in the centre**.

$\langle u | q; \text{peak, orientation} \rangle(\varpi, \phi)$  decomposes to  $\cos m\phi$ ,  $m = 0, 2, 4$ .