Detection of the ISW effect and corresponding dark energy constraints (astro-ph/0602398)

### Jason McEwen<sup>1</sup>

with P. Vielva<sup>2,3</sup>, M. P. Hobson<sup>1</sup>, E. Martinez-González<sup>2</sup> and A. N. Lasenby<sup>1</sup>

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Rencontres de Moriond :: 23 March 2006

# Outline

- Integrated Sachs-Wolfe (ISW) effect
  - Physical origin
  - Detecting the effect
- 2 The continuous spherical wavelet transform (CSWT)
  - Dilations and mother wavelets on the sphere
  - Transform
- 3 Cross-correlation in wavelet space
  - Wavelet covariance estimator
  - Comparison of wavelets
  - Analysis procedure
- 5 Results
  - Detections
  - Dark energy constraints



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- Evolution of potential during photon propagation
   → net change in photon energy
- Large scale phenomenon (cosmic variance limited → require full-sky maps)
- Only present in non-flat universes or flat universes with dark energy

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$$\frac{\delta T}{T} = 2 \int \frac{\dot{\Phi}}{c^2} \frac{\mathrm{d}\ell}{c}$$

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- Detections used to place constraints on dark energy
- Previous works
  - Real space angular correlation function (e.g. Boughn & Crittenden 2002)
  - Harmonic space cross-angular power spectrum (e.g. Afshordi et al. 2004)
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### Spherical wavelet transform Anisotropic dilation on the sphere

- Spherical wavelet transform (Antoine and Vandergheynst 1998; Wiaux et al. 2005)
- Stereographic projection Π
- Anisotropic dilation on the sphere

 $\mathcal{D}(a,b) = \Pi^{-1} d(a,b) \Pi$ 

$$[\mathcal{D}(a,b)s](\omega) = [\lambda(a,b,\theta,\phi)]^{1/2} s(\omega_{1/a,1/b})$$

where

$$\begin{split} \omega_{a,b} &= (\theta_{a,b}, \phi_{a,b}), \\ \tan(\theta_{a,b}/2) &= \tan(\theta/2) \sqrt{a^2 \cos^2 \phi + b^2 \sin^2 \phi} \\ \tan(\phi_{a,b}) &= \frac{b}{a} \tan(\phi) \end{split}$$

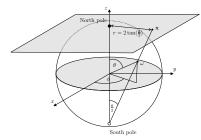
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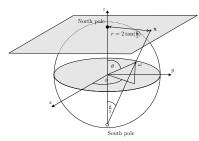
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#### Spherical wavelet transform Mother wavelets on the sphere

 Stereographic projection of admissible Euclidean mother wavelets

$$\psi(\omega) = [\Pi^{-1}\psi_{\mathbb{R}^2}](\omega)$$

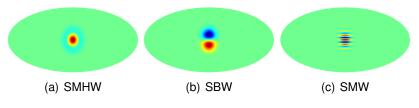


Figure: Spherical wavelets at scale a = b = 0.2.

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# Spherical wavelet transform

• Motion on the sphere ( $\equiv$  rotation)

$$[R(\rho)s](\omega) = s(\rho^{-1}\omega), \ \rho \in SO(3)$$

• Multi-resolution basis on the sphere

$$\{\psi_{a,b,
ho}\equiv R(
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ho\in\mathrm{SO}(3);\ a,b\in\mathbb{R}^+_*\}$$

• Spherical wavelet transform

$$W_{\psi}(a,b,
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# Wavelet covariance estimator

- Suitability of wavelets for detecting cross-correlations
- Wavelet covariance

$$\hat{X}_{\psi}^{\mathrm{NT}}(a,b,\gamma) = \frac{1}{N_{\alpha\beta}} \sum_{\alpha,\beta} \nu_{\alpha\beta} W_{\psi}^{\mathrm{N}}(a,b,\alpha,\beta,\gamma) W_{\psi}^{\mathrm{T}}(a,b,\alpha,\beta,\gamma)$$

Average over orientations

$$\hat{X}_{\psi}^{\mathrm{NT}}(a,b) = rac{1}{N_{\gamma}} \sum_{\gamma} \hat{X}_{\psi}^{\mathrm{NT}}(a,b,\gamma)$$

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$$X_{\psi}^{ ext{NT}}(\pmb{a},\pmb{b},\gamma) = \sum_{\ell=0}^{\infty} \left. \pmb{p}_{\ell}^2 \left. \pmb{b}_{\ell}^{ ext{N}} \left. \pmb{b}_{\ell}^{ ext{T}} \left. \pmb{C}_{\ell}^{ ext{NT}} \sum_{m=-\ell}^{\ell} \left| (\psi_{\pmb{a},\pmb{b}})_{\ell m} 
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# Comparison of wavelets

Compare predicted signal-to-noise ratio

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#### Comparison of wavelets SNR plots

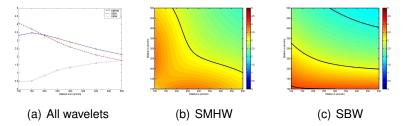


Figure: Expected SNR of the wavelet covariance estimator of CMB and radio source maps

• Don't consider SMW further (actually considered; as expected not effective)

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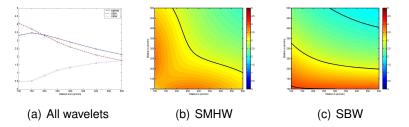


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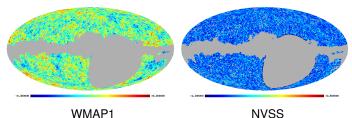
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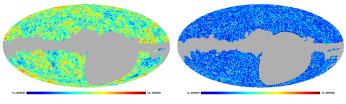
#### Data



- Analysis (scales; masks)
- Simulations
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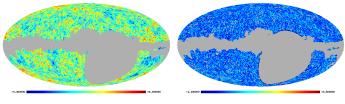
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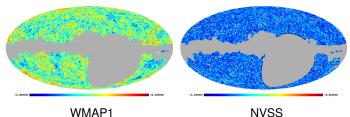
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# Scales and detections

#### Scales

Scale	1	2	3	4	5	6	7
Dilation a	100'	150'	200′	250'	300'	400′	500'
Size on sky 1	282'	424'	565'	706′	847′	1130′	1410'
Size on sky 2	31.4′	47.1′	62.8′	78.5′	94.2'	126′	157'

• Wavelet covariance plots

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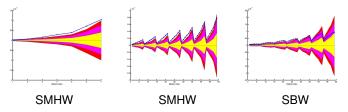
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## Wavelet covariance plots



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# Significance of detections

- Most significant detections
  - Wavelet covariance statistics appear Gaussian
    - ightarrow  $N_{\sigma}$  direct indication of significance of detections
  - symmetric SMHW:  $3.6\sigma$ ; elliptical SMHW:  $3.9\sigma$ ; SBW:  $3.9\sigma$
- $N_{\sigma}$  plots (2 and  $3\sigma$  contours)

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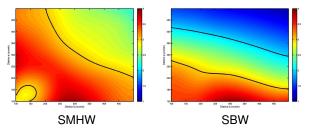
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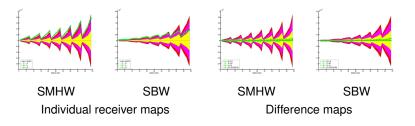
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## Systematics and foregrounds

- Systematics: individual WMAP receiver maps
  - $\rightarrow$  systematics not likely source of detection
- Foregrounds: foreground dominated difference maps
   → foregrounds not likely source of detection



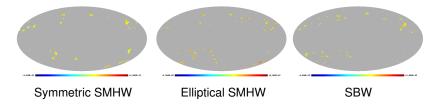
# Localised regions

- Wavelets inherently provide spatial localisation (in addition to scale localisation)
- Threshold wavelet coefficient product maps to localise most likely sources

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# Localised regions

- Wavelets inherently provide spatial localisation (in addition to scale localisation)
- Threshold wavelet coefficient product maps to localise most likely sources

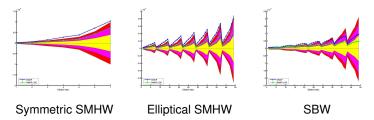


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## Localised regions Removal

 Remove localised regions → ISW detection remains (Agrees with findings of Boughn and Crittenden 2004)



Examined localised regions in closer detail

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## Dark energy constraints

 Compute theoretical wavelet covariance for range of models (*w*, Ω<sub>Λ</sub>)

(assume concordance model for other parameters; bias b = 1.6)

• Compare theoretical predictions with observations

 $\chi^{2}(W,\Omega_{\Lambda}) = \Delta^{\mathrm{T}} C^{-1} \Delta$ 

where

$$\Delta = [\hat{X}_{\psi}^{\mathrm{NT}}(a, b, \gamma) - X_{\psi}^{\mathrm{NT}}(a, b, \gamma | w, \Omega_{\Lambda})]$$

Compute likelihood

$$\mathcal{L}(w,\Omega_{\Lambda})\propto \exp[-\chi^2(w,\Omega_{\Lambda})/2]$$

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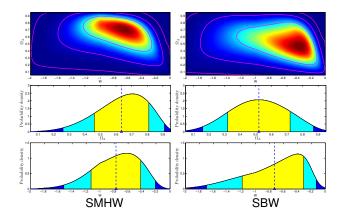
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Compute likelihood

$$\mathcal{L}(\textbf{\textit{w}},\Omega_{\Lambda}) \propto \exp[-\chi^2(\textbf{\textit{w}},\Omega_{\Lambda})/2]$$

## Dark energy constraints Likelihood surfaces

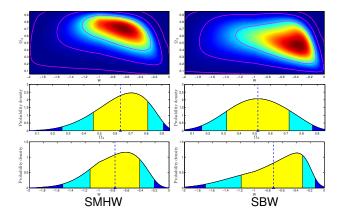


• Parameter estimates from mean of marginalised distributions

- $\Omega_{\Lambda} = 0.63^{+0.18}_{-0.17}$ ;  $w = -0.77^{+0.35}_{-0.36}$  using SMHW
- $\Omega_{\Lambda} = 0.52^{+0.20}_{-0.20}$ ;  $w = -0.73^{+0.42}_{-0.46}$  using SBW

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## Dark energy constraints Likelihood surfaces

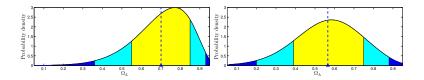


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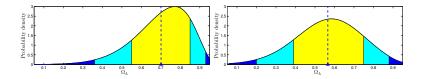
## Dark energy constraints Parameter estimates



- Also considered case w = -1
  - $\Omega_{\Lambda} = 0.70^{+0.15}_{-0.15}$  using SMHW
  - $\Omega_{\Lambda} = 0.57^{+0.18}_{-0.18}$  using SBW
- Reject  $\Omega_{\Lambda} = 0$  at > 99% significance
  - $\Omega_{\Lambda} > 0.1$  at 99.9% using SMHW
  - $\Omega_{\Lambda} > 0.1$  at 99.7% using SBW

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## Dark energy constraints Parameter estimates



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  - Ω<sub>Λ</sub> > 0.1 at 99.7% using SBW

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## Outline

- Integrated Sachs-Wolfe (ISW) effect
  - Physical origin
  - Detecting the effect
- 2 The continuous spherical wavelet transform (CSWT)
  - Dilations and mother wavelets on the sphere
  - Transform
- 3 Cross-correlation in wavelet space
  - Wavelet covariance estimator
  - Comparison of wavelets
- 4 Analysis procedure
- 5 Results
  - Detections
  - Dark energy constraints

6 Summary

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## Summary

- Used spherical wavelets to detect ISW effect
- Detection of ISW effect made at almost 4σ
   → effectiveness of wavelets
- Foregrounds and systematics *not* likely source of detection
- Independent evidence of dark energy
- Consistent constraints on dark energy
  - Good consistency check with direct estimates from other approaches
  - Wavelets of similar performance for constraining dark energy as other ISW techniques

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