

# Power spectrum estimation: lessons from CMB polarization

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From giant arcs to CMB lensing; IAP 6 July 2007

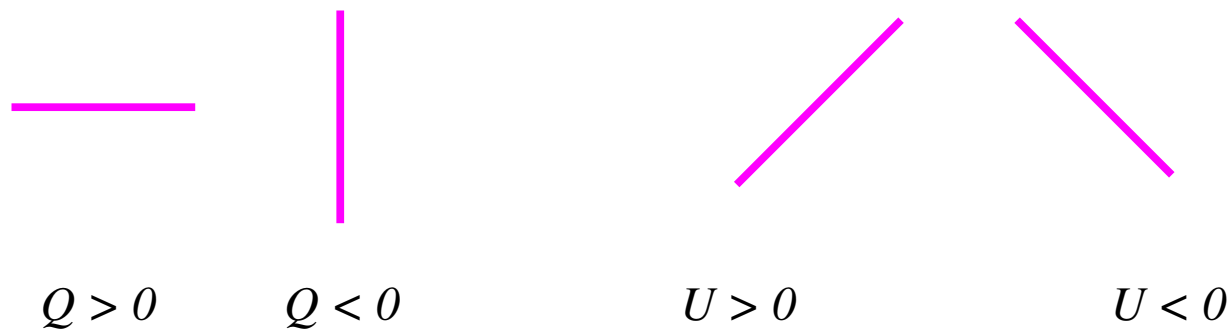
# LINEAR POLARIZATION

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- Linear polarization described by transverse, STF tensor

$$\mathcal{P}_{ab} \equiv \begin{pmatrix} \frac{1}{2}\langle E_x^2 - E_y^2 \rangle & \langle E_x E_y \rangle \\ \langle E_x E_y \rangle & -\frac{1}{2}\langle E_x^2 - E_y^2 \rangle \end{pmatrix} \equiv \frac{1}{2} \begin{pmatrix} Q & U \\ U & -Q \end{pmatrix}$$

- C.f. shear tensor:  $Q \leftrightarrow \gamma_1$ ,  $U \leftrightarrow \gamma_2$



- Under right-handed rotation of  $x$  and  $y$  through  $\psi$  about propagation direction ( $z$ )

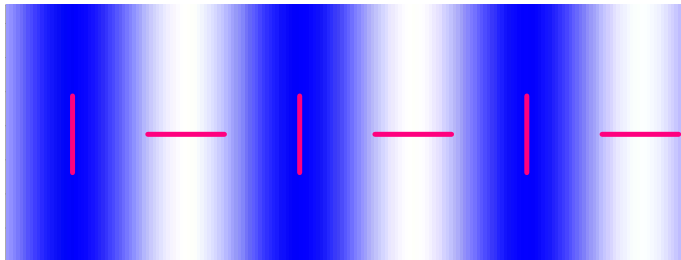
$$Q \pm iU \rightarrow (Q \pm iU)e^{\mp 2i\psi} \Rightarrow Q + iU \text{ is spin -2}$$

## $E$ - AND $B$ -MODES OF POLARIZATION

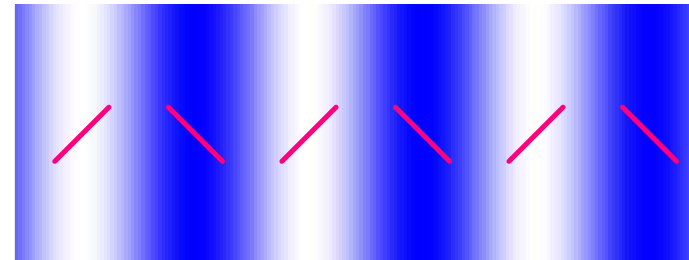
- Unique decomposition of  $\mathcal{P}_{ab}(\hat{\mathbf{n}})$  on sphere into  $P_E$  electric (gradient) part and  $P_B$  magnetic (curl) part:

$$\mathcal{P}_{ab}(\hat{\mathbf{n}}) = \nabla_{\langle a} \nabla_{b \rangle} P_E + \epsilon^c_{(a} \nabla_{b)} \nabla_c P_B$$

Pure  $E$  mode



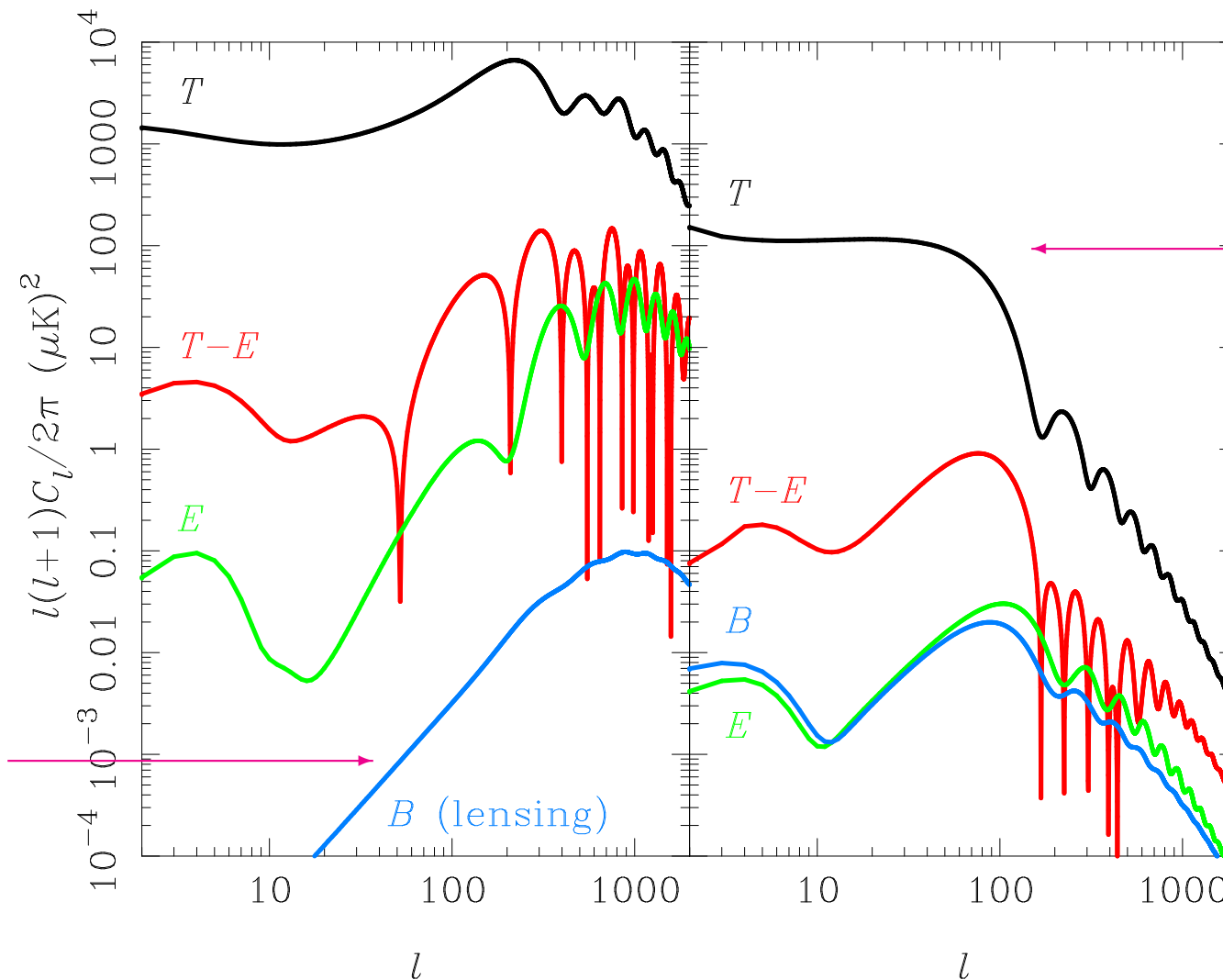
Pure  $B$  mode



- Linear scalar fluctuations produce only  $E$ -mode polarization (Kamionkowski et al. 1997; Seljak & Zaldarriaga 1997)
- Gravity waves produce roughly equal  $E$  and  $B$ 
  - C.f. cosmic shear:  $B$ -modes are from systematics (and second-order effects)

# PHYSICS OF CMB POLARIZATION

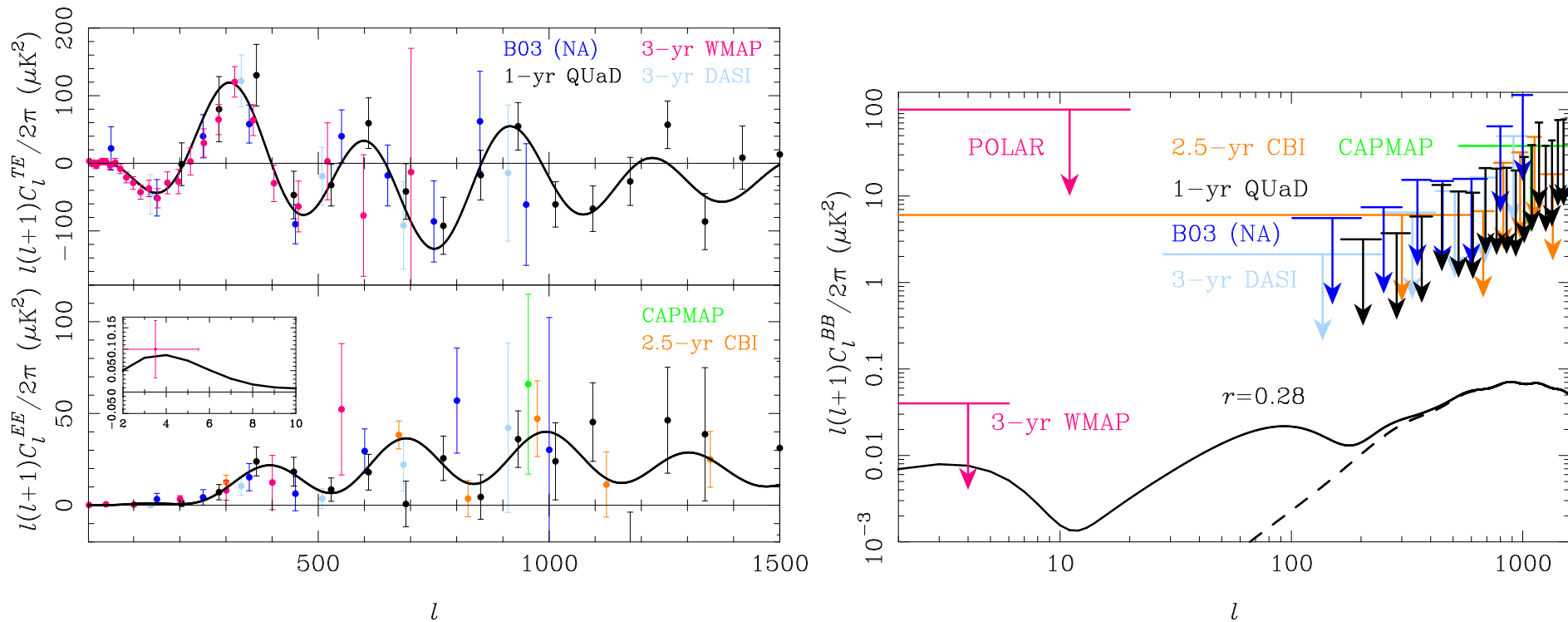
Lens-induced  $B$  modes  
 $(\sqrt{C_l^B} \approx 1.3 \text{ nK})$



Effects only on large scales  
 since gravity waves damp  
 inside horizon

- Pol.  $\sim 5 \mu\text{K}$  generated at recombination and (on large scales) at reionization

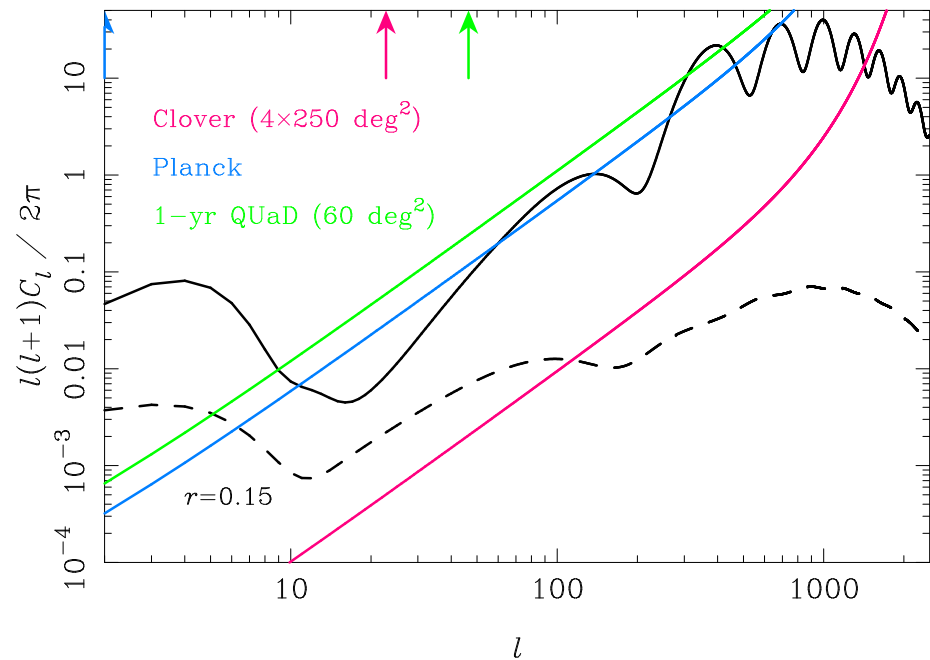
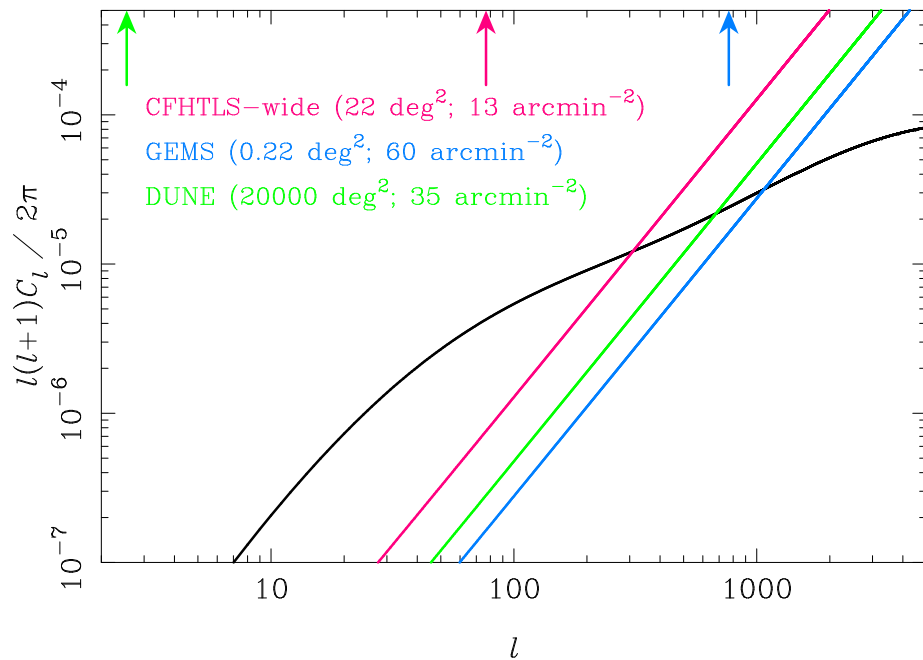
# CURRENT RESULTS



- Large-angle  $E$ -modes  $\Rightarrow \tau = 0.09 \pm 0.03$  (Page et al. 2006)
- 95% limit  $r < 0.28$  from CMB and LSS (Spergel et al. 2006)  $\Rightarrow$  r.m.s. of primordial  $B$ -modes  $< 200$  nK

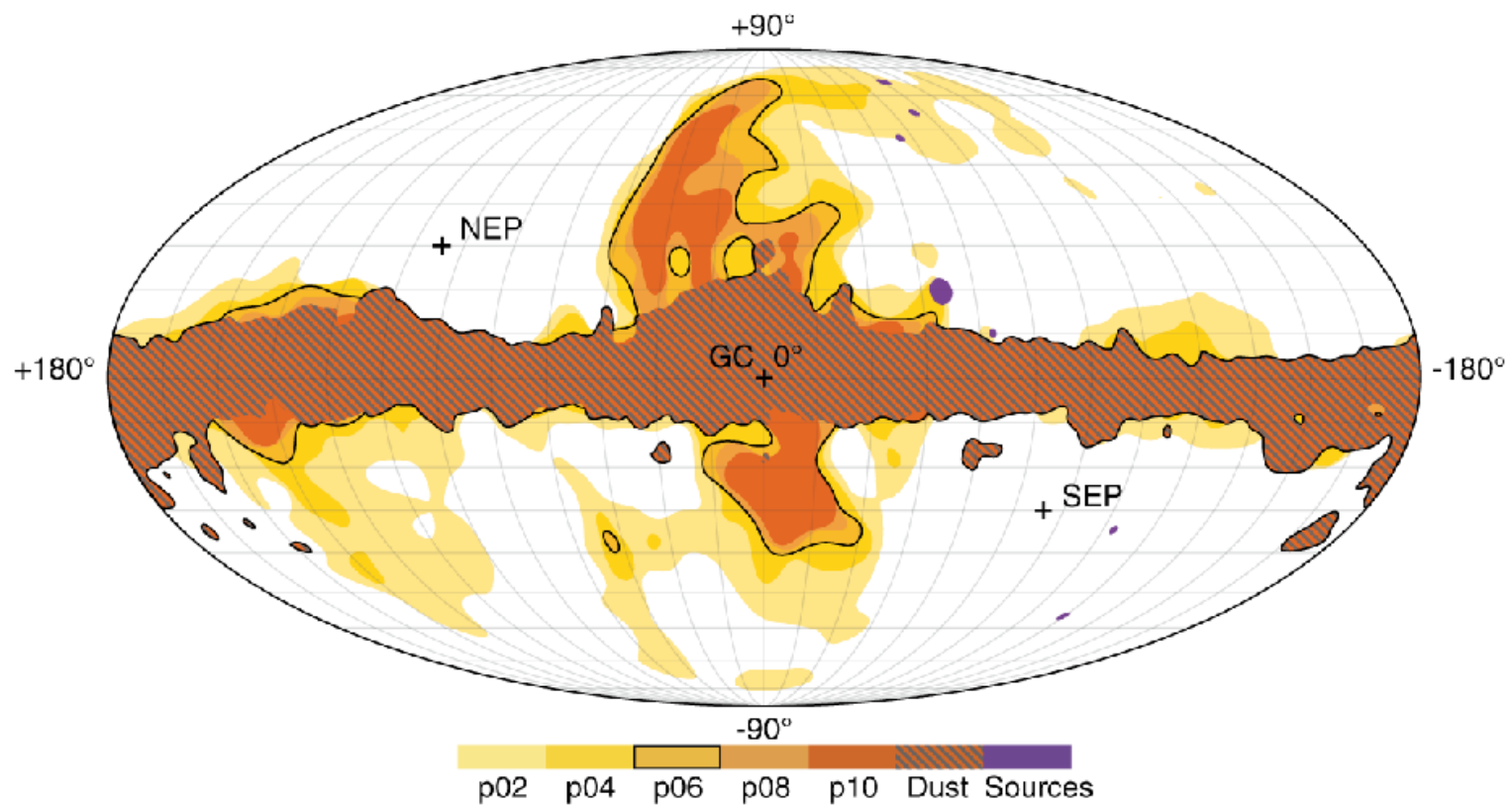
# SPECTRAL COMPARISONS

- Both lensing and CMB  $E$ -mode spectra very blue
- CMB not yet sample-variance limited; c.f. cosmic shear
- Non-linearities important for cosmic shear below  $\sim 10$  arcmin before shot noise dominates (c.f. lens-induced  $B$ -modes)



## SURVEY GEOMETRY

- Mask Galactic foregrounds and bright extragalactic sources



# MAXIMUM-LIKELIHOOD POWER SPECTRUM ESTIMATION: I\*

- Pixelised noisy data:  $\mathbf{x} \equiv \{(Q + iU)(\hat{\mathbf{n}}_1), (Q - iU)(\hat{\mathbf{n}}_1), \dots, (Q - iU)(\hat{\mathbf{n}}_{N_{\text{pix}}})\}$  with covariance  $\mathbf{C} = \mathbf{S} + \mathbf{N}$  where signal correlation  $\mathbf{S}$

$$\langle (Q + iU)(\hat{\mathbf{n}}_1)(Q + iU)(\hat{\mathbf{n}}_2) \rangle = \frac{1}{2} e^{-2i(\alpha + \gamma)} \sum_l \frac{2l+1}{4\pi} b_l p_l (C_l^E - C_l^B) d_{2-2}^l(\beta)$$

$$\langle (Q - iU)(\hat{\mathbf{n}}_1)(Q + iU)(\hat{\mathbf{n}}_2) \rangle = \frac{1}{2} e^{2i(\alpha - \gamma)} \sum_l \frac{2l+1}{4\pi} b_l p_l (C_l^E + C_l^B) d_{2-2}^l(\beta)$$

- Spherical generalisation of usual flat-sky results in cosmic shear
- Locate maximum of Gaussian  $\mathcal{L}$  by N-R or one-step QML (Tegmark 1997):

$$\hat{C}_l^R = \frac{1}{2} F_{(lR)(l'S)}^{-1} \text{trace} \left[ \mathbf{C}^{-1} \frac{\partial \mathbf{C}}{\partial C_{l'}^S} \mathbf{C}^{-1} (\mathbf{x} \mathbf{x}^\dagger - \mathbf{N}) \right]$$

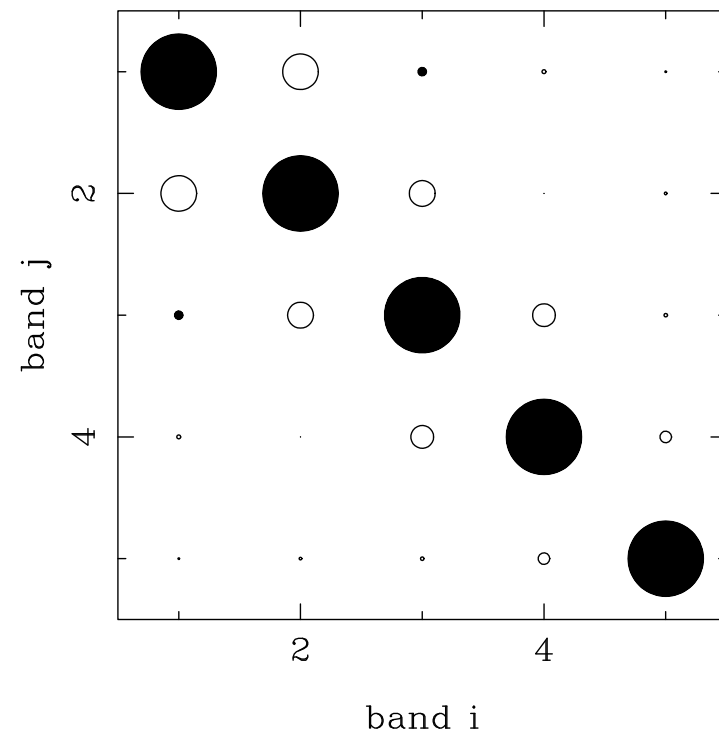
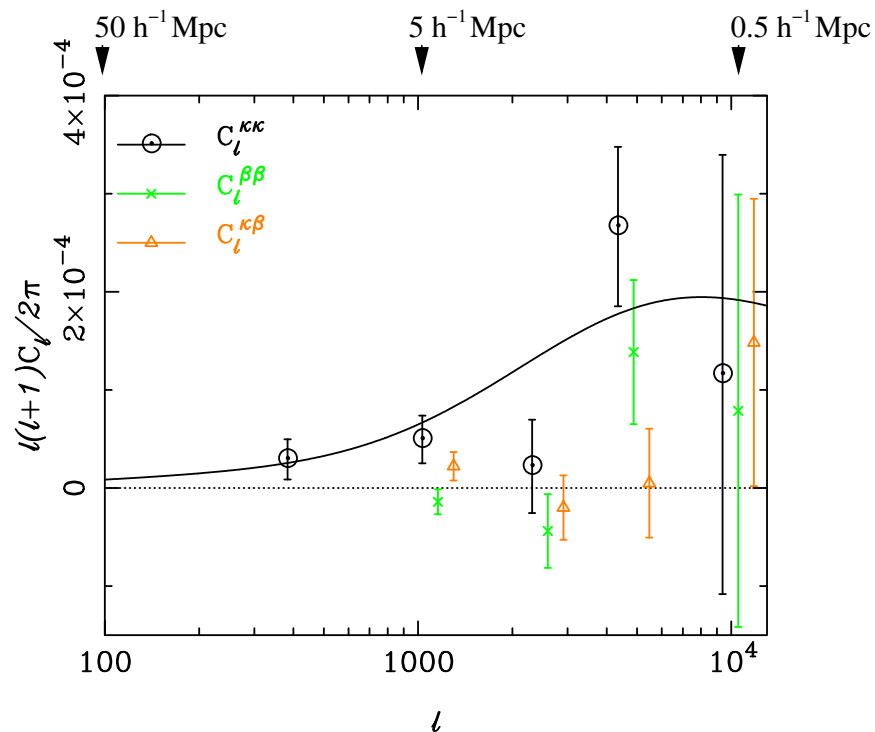
- Fisher matrix  $F_{(lR)(l'S)} \equiv \frac{1}{2} \text{trace} \left[ \mathbf{C}^{-1} \frac{\partial \mathbf{C}}{\partial C_l^R} \mathbf{C}^{-1} \frac{\partial \mathbf{C}}{\partial C_{l'}^S} \right]$  approximates inverse errors for Gaussian fields
- QML requires fiducial  $\mathbf{S}$  but *unbiased* for any choice

\*CMB – Bond, Jaffe & Knox (1998); cosmic shear – Hu & White (2001)



# MAXIMUM-LIKELIHOOD POWER SPECTRUM ESTIMATION: II

- Advantages: optimal on all scales; accounts properly for survey geometry and variation of sampling densities; isolation of  $E$  and  $B$  modes; errors (at least on large and small scales); “uncorrelated” bandpowers
- Disadvantages: slow [ $O(N_{\text{pix}}^3)$ ]
- CMB: interferometers (CBI – Sievers et al. 2006 – and DASI – Leitch et al. 2005); and imaging arrays (MAXIPOL – Wu et al. 2006 –  $O(2000)$  pixels)
- Cosmic shear: e.g. COMBO-17 (Brown et al. 2003) and GEMS (Heymans et al. 2005)



## PSEUDO- $C_l$ ESTIMATORS\*

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- Fast [ $O(N_{\text{pix}}^{3/2})$ ], robust and widely used
- Unbiased and close to optimal for  $l \gg 1/R$  or where noise dominates
- QML: spherical transform and naive spectrum of  $C^{-1}\mathbf{x} \rightarrow$  remove noise bias  $\rightarrow$  deconvolve survey geometry
- $PC_l$  replaces optimal  $C^{-1}$  weighting with some diagonal  $w(\hat{\mathbf{n}})$ 
  - Extract *pseudo-multipoles*,  $\tilde{E}_{lm}$  and  $\tilde{B}_{lm}$  of weighted data and compress to  $\tilde{C}_l$ :

$$\tilde{C}_l^E \equiv \frac{1}{2l+1} \sum_m |\tilde{E}_{lm}|^2 \quad , \quad \tilde{C}_l^B \equiv \frac{1}{2l+1} \sum_m |\tilde{B}_{lm}|^2$$

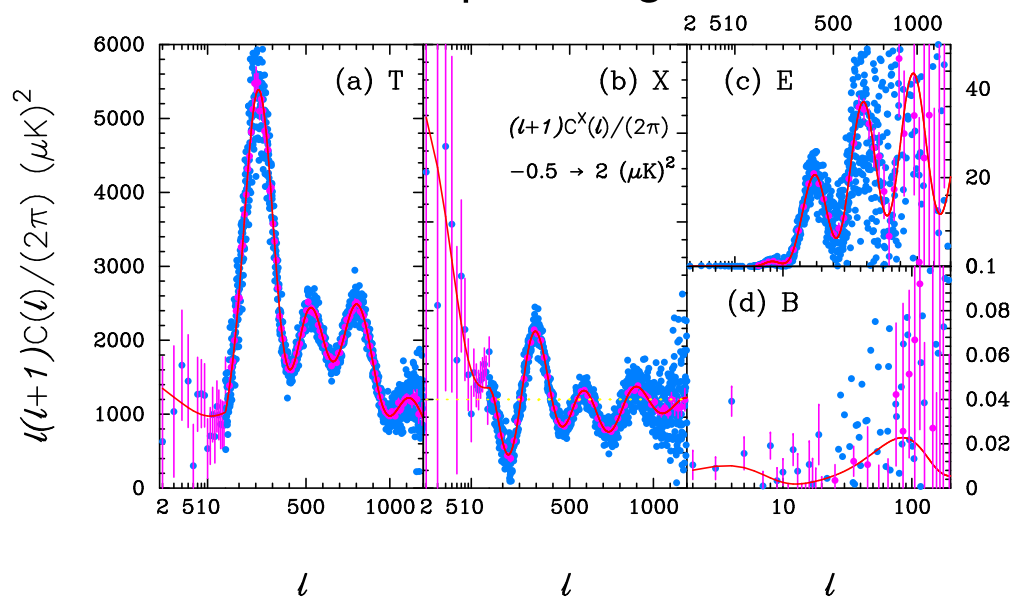
- Subtract off mean noise level (Monte-Carlo for complicated noise)
- Deconvolve by inverting analytic coupling matrices (e.g. bandpowers)

\*CMB: Wandelt et al. 2001; Hivon et al. 2002

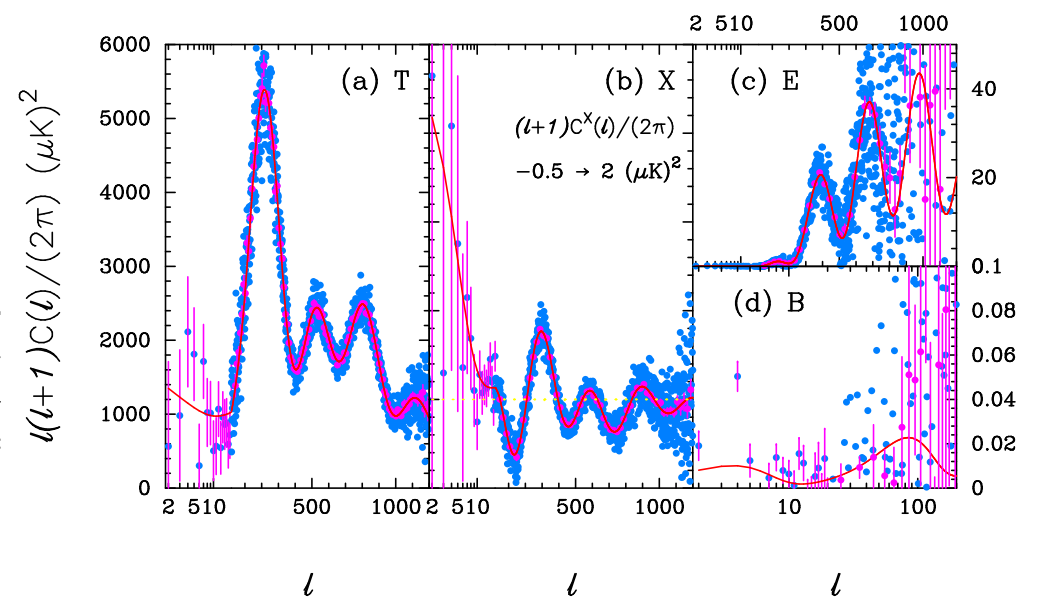
# CHOICE OF WEIGHT FUNCTION\*

- Uniform where signal dominated
- Inverse variance where noise-dominated
  - But regularise/smooth sharp features (e.g. Planck ecliptic poles)

Equal weight



Inverse-variance



\*Efstathiou (2004)

## RELATION OF PSEUDO- $C_l$ AND CORRELATION FUNCTIONS\*

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- Correlation functions with pair-weighting  $w(\hat{n}_1)w(\hat{n}_2)$  directly related to  $\tilde{C}_l$ :

$$\hat{\xi}_{\bar{Q}\bar{Q}}(\beta) = A(\beta) \sum_l (2l + 1) \left[ \frac{1}{2}(d_{22}^l + d_{2-2}^l)(\beta) \tilde{C}_l^E + \frac{1}{2}(d_{22}^l - d_{2-2}^l)(\beta) \tilde{C}_l^B \right]$$

$$\hat{\xi}_{\bar{U}\bar{U}}(\beta) = A(\beta) \sum_l (2l + 1) \left[ \frac{1}{2}(d_{22}^l - d_{2-2}^l)(\beta) \tilde{C}_l^E + \frac{1}{2}(d_{22}^l + d_{2-2}^l)(\beta) \tilde{C}_l^B \right]$$

where  $A^{-1}(\beta) \equiv \sum_l (2l + 1) P_l(\cos \beta) w_l$  involves power spectrum of  $w(\hat{n})$

- $\tilde{C}_l$  route faster [ $O(N_{\text{pix}}^{3/2})$ ] than direct evaluation [ $O(N_{\text{pix}}^2)$ ]
- Naturally interpolates over all pair separations in survey

\*Chon, AC et al. (2004)

## ISOLATING $E$ AND $B$ POWER: I

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$$\langle \tilde{C}_l^{E/B} \rangle = \sum_{l'} \left( P_{ll'} C_{l'}^{E/B} + M_{ll'} C_{l'}^{B/E} \right)$$

- $E$ - and  $B$ -mode power mixed in  $pC_l$

- For  $l \gg 1/R$  mixing of power suppressed by  $1/(lR)^2$  (AC & Chon 2005):

$$\sum_{l'} P_{ll'} \approx \frac{1}{4\pi} \int w^2(\hat{n}) d\hat{n} \quad , \quad \sum_{l'} M_{ll'} \approx -\frac{1}{2\pi l(l+1)} \int (\nabla w)^2(\hat{n}) d\hat{n}$$

- Invert  $pC_l$  to  $C_l$  with:

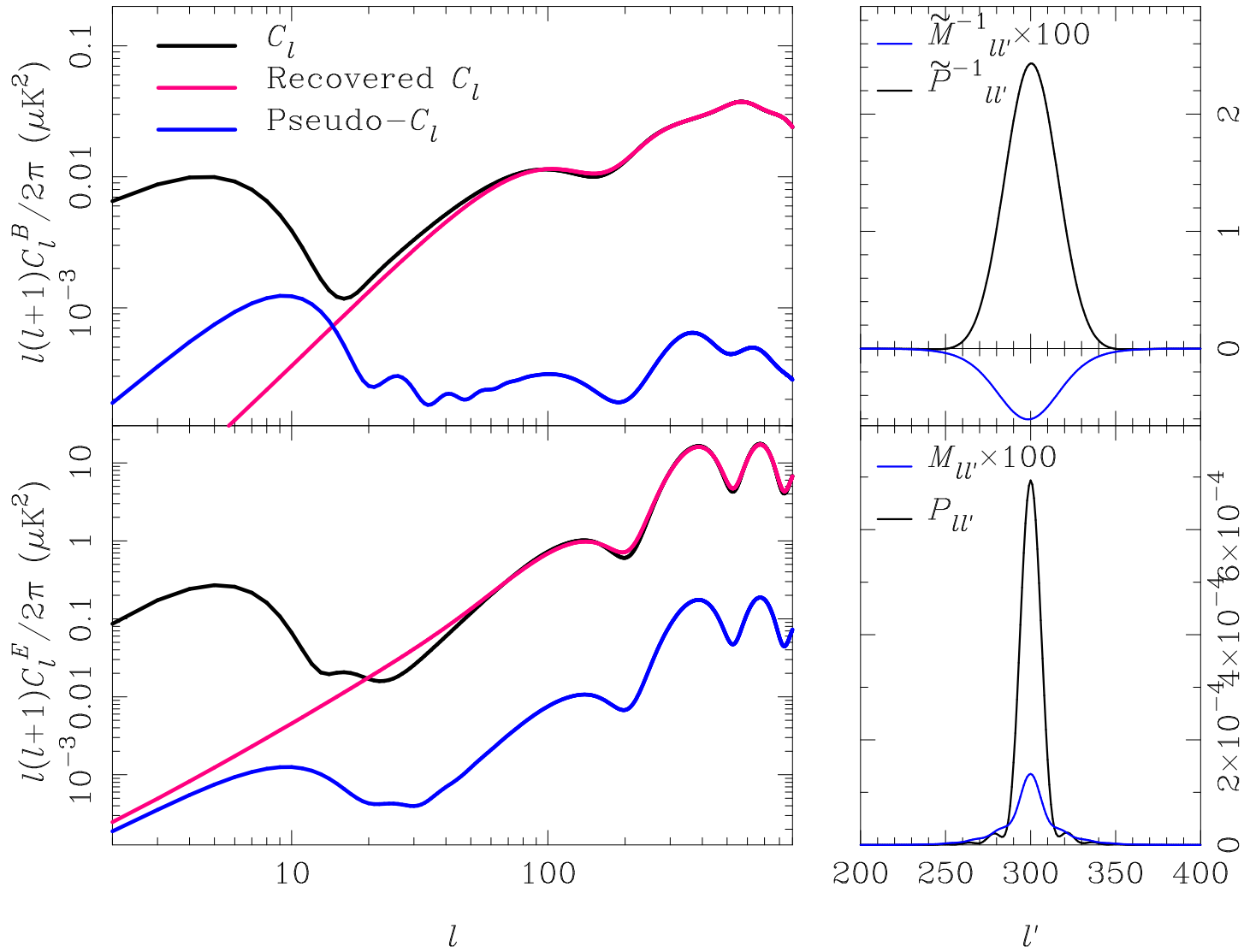
- Direct inversion of  $P \pm M$  if enough sky  $\Rightarrow$  unbiased (e.g. WMAP)

- Inversion with bandpowers (e.g. BOOMERanG, QUaD)

- Via correlation functions (e.g. SPICE)

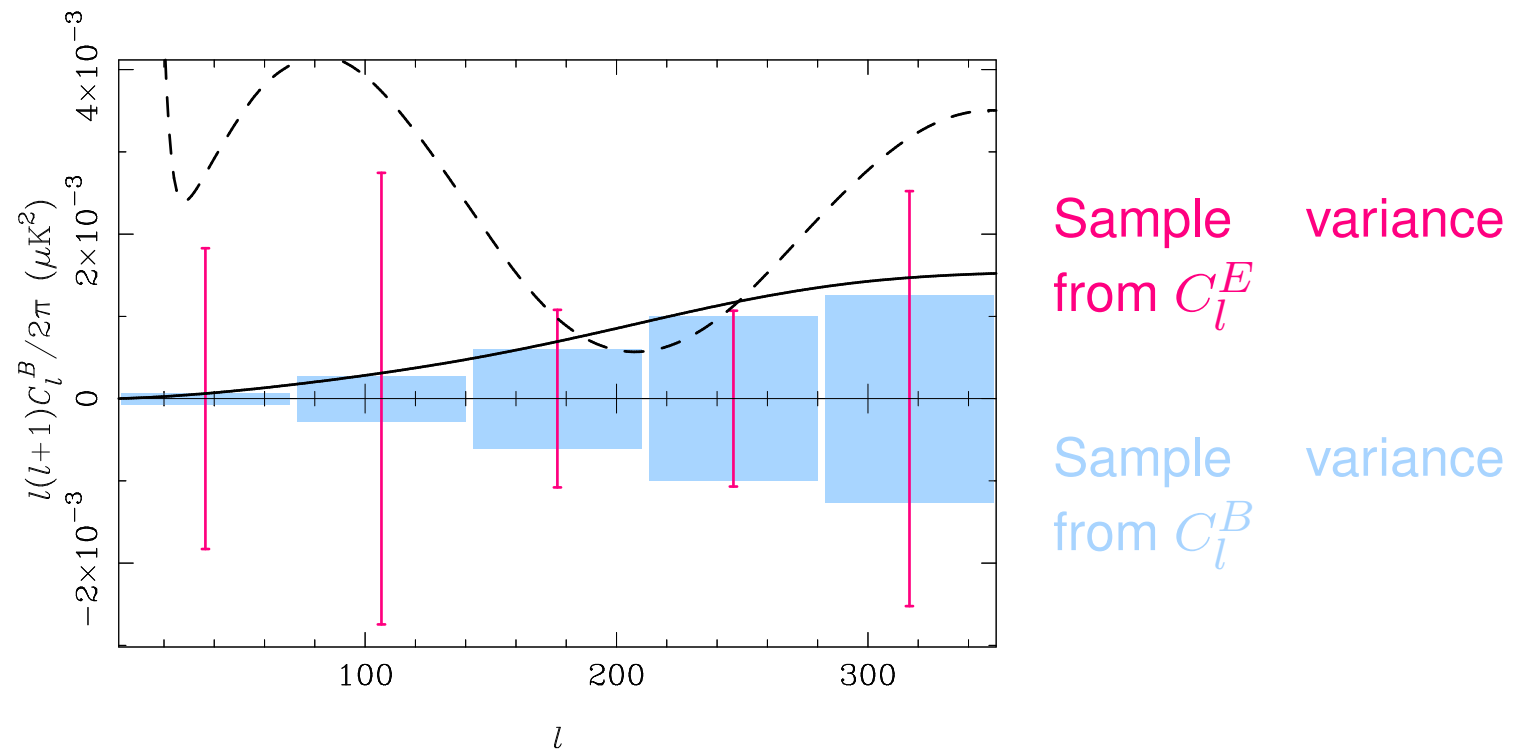
- Crittenden et al. (2002) and Schneider et al. (2002) post-processing of  $\xi_{\bar{Q}\bar{Q}}$  and  $\xi_{\bar{U}\bar{U}}$  to isolate  $E$  and  $B$ -modes also generalises to spherical geometry (Chon et al. 2004)

# ISOLATING $E$ AND $B$ POWER: EXAMPLE



# ESTIMATOR VARIANCE AND AMBIGUOUS MODES\*

- $PC_l$  estimators *do not* coherently separate  $E$  and  $B$ -modes
  - Excess *estimator variance* on large scales
  - For surveys of 1–2% of sky (Clover, QUIET etc.) estimator limits minimum-detectable  $r \sim 0.05$



\*AC & Chon (2005)

## ISOLATING $B$ -MODES IN MAPS\*

- $E$ - $B$  non-unique over part of sky because kernel of  $\nabla^2(\nabla^2 + 2)$  not empty
- Recover part of *pure-mode* component with  $B$ -mode ‘aperture mass’:

$$M_{\perp}(\vartheta) \equiv \int_0^{\vartheta} d \cos \theta \int_0^{2\pi} d\phi U(\theta, \phi) w(\theta; \vartheta) \quad \begin{array}{l} \text{Kaiser 1995} \\ \text{Schneider 1996} \end{array}$$

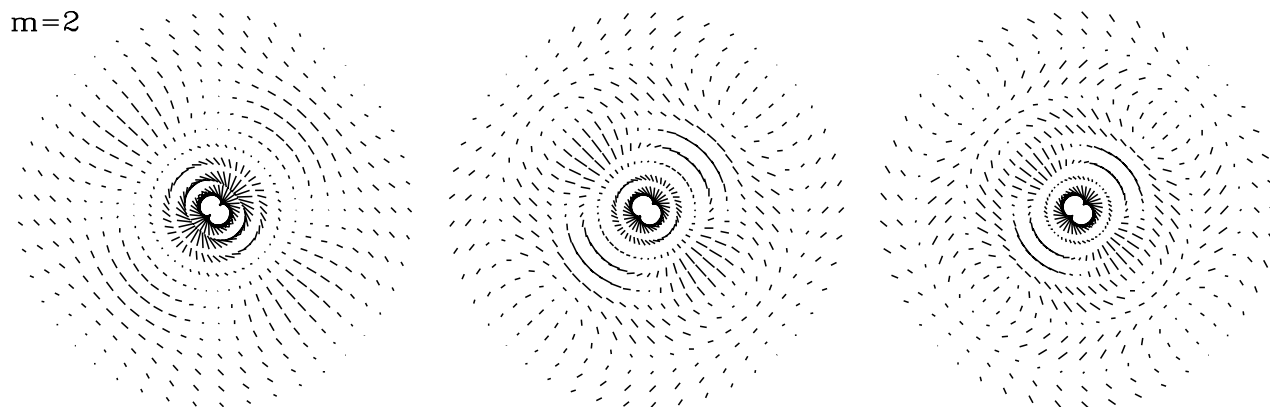
- Can extend to get all *pure* information for arbitrary geometries:

$$\int d^2 \hat{n} \mathcal{P}^{ab} Y_{ab}^B[\psi] \quad \text{where} \quad Y_{ab}^B[\psi] \equiv \epsilon^c_{(a} \nabla_{b)} \nabla_c \psi$$

and  $\psi$  and  $\nabla_a \psi$  *vanish on boundary*

- N.b. polarization defined by  $Y_{ab}^B[\psi]$  is at 45 deg to boundary

- $\langle M_{\perp}(\vartheta)^2 \rangle$  usually estimated from  $\zeta_{tt}$  and  $\zeta_{rr} \Rightarrow$  *retains* estimator-induced variance



\*Lewis, AC & Turok 2002; Bunn et al. 2003



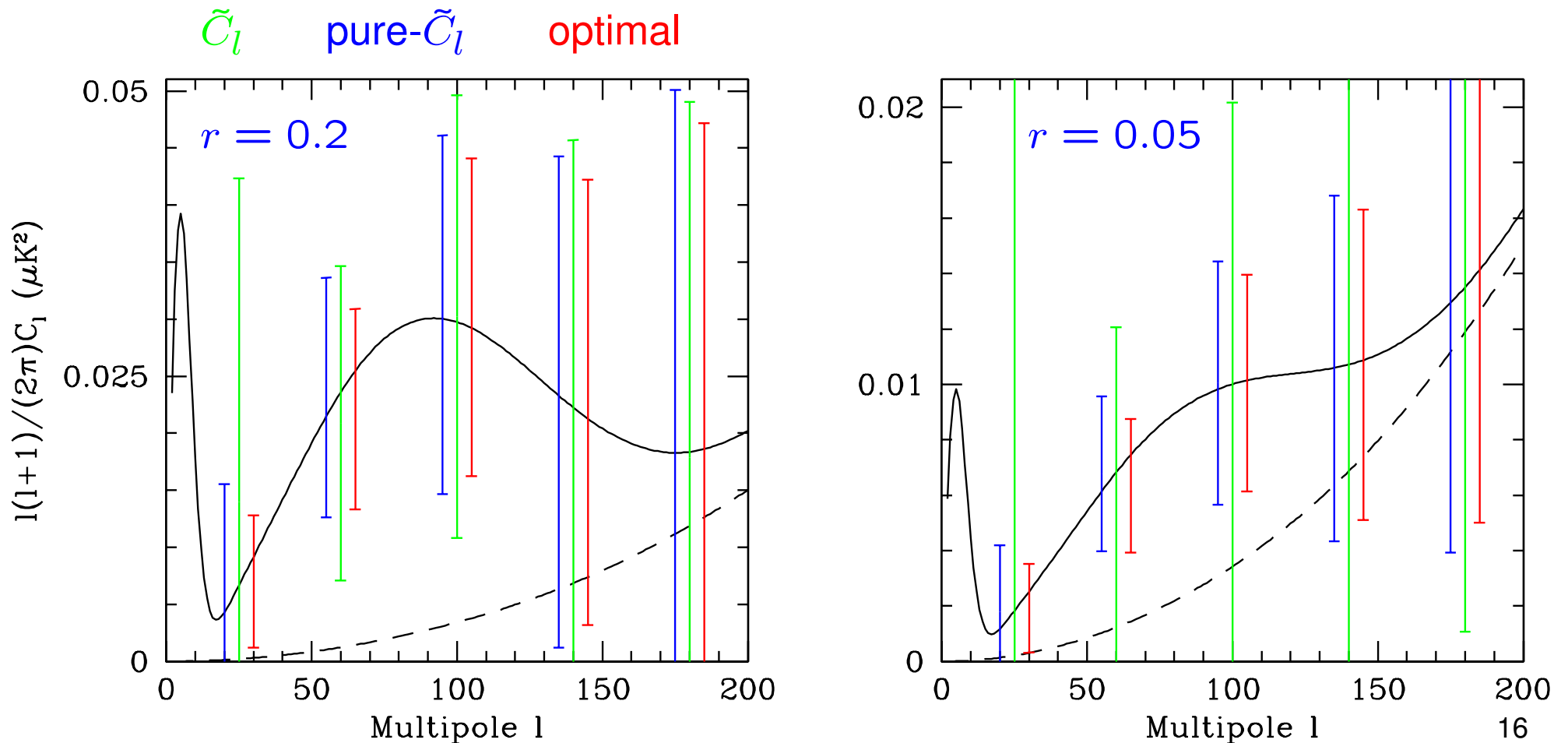
# EFFICIENT ESTIMATION OF 'PURE-MODE' POWER SPECTRA

- In  $pC_l$  estimation, replace (Smith 2006)

$$\tilde{B}_{lm} \propto \int d^2\hat{n} w(\hat{n}) \mathcal{P}^{ab} Y_{ab}^B [Y_{lm}] \quad \text{with} \quad \int d^2\hat{n} \mathcal{P}^{ab} Y_{ab}^B [wY_{lm}]$$

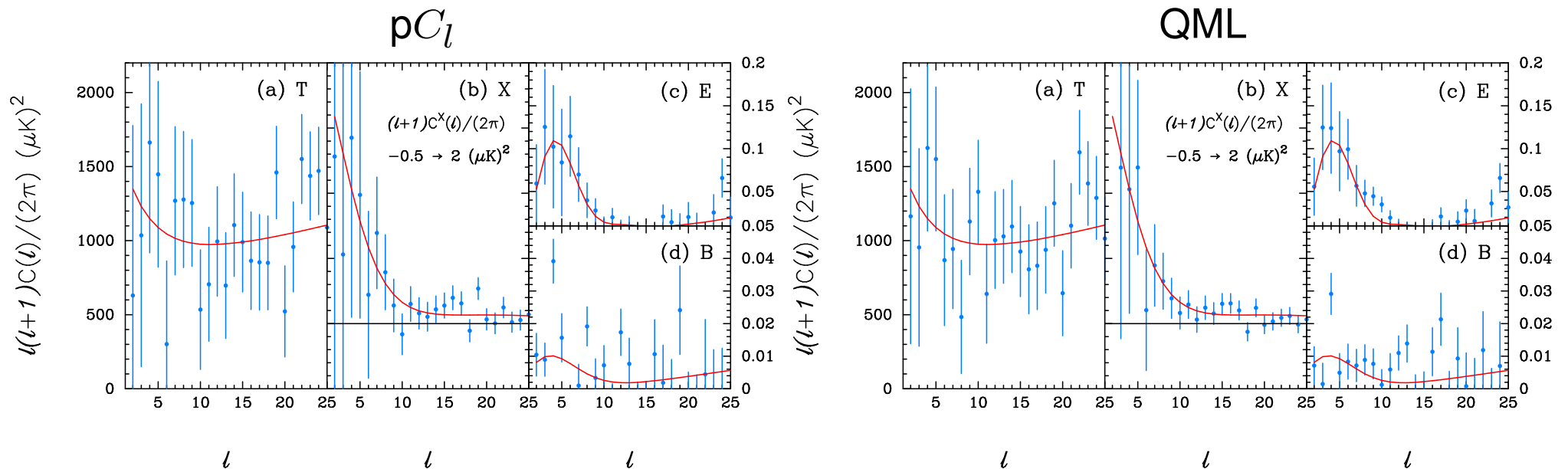
with  $w = 0 = \nabla_a w$  on boundary for pure  $\tilde{C}_l^B$

- Retains speed of  $pC_l$  but eliminates excess variance from  $E$ - $B$  mixing



# EFFICIENT MAXIMUM-LIKELIHOOD ESTIMATION: HYBRID METHODS\*

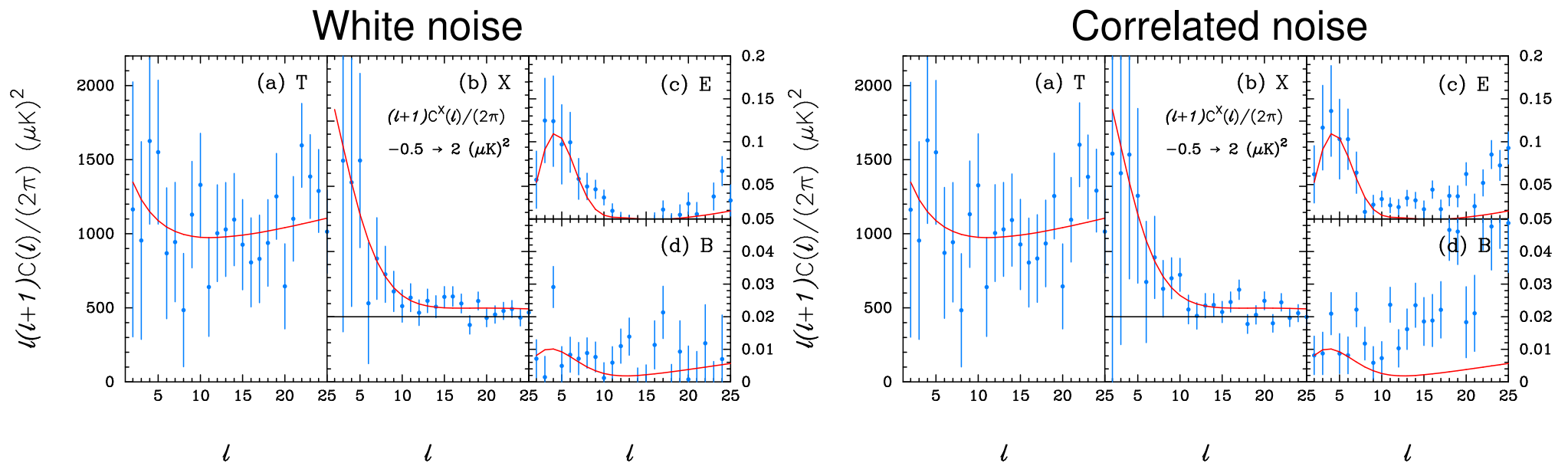
- M-L only beneficial on large scales when signal-dominated
  - Use QML on large scales and  $pC_l$  on small scales joining smoothly
- Smooth maps, repixelise and apply QML to coarse-pixel maps
  - Noise requires care since correlated in smoothed maps



\*Efstathiou (2004; 2006)

## CORRELATED NOISE?

- Accurate noise bias subtraction critical for all estimators when noise-dominated
- Irreducible ‘stripes’ for Planck must be corrected for on large scales in  $EE$  and  $BB$
- Analogous to  $B$ -modes from intrinsic alignments in cosmic shear



## LESSONS LEARNED FROM CMB POLARIZATION

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- Interpretation of power spectrum simpler than correlation functions
  - E.g. uncorrelated bandpower measurements
  - But CMB naturally pixelised; not so cosmic shear
- Spherical sky methods (already developed for CMB) will be required for future large cosmic shear surveys
- Faster clustering analysis ( $pC_l$ -based correlation functions) may be worth considering for billion-galaxy surveys
- Worth adopting more careful weighting on large scales where sample variance dominant
- Scope for improved  $B$ -mode isolation on large scales  $\Rightarrow$  tighter monitoring of systematics
- Error analysis more difficult for cosmic shear on small scales before shot noise dominates (c.f. non-Gaussian lens-induced  $B$ -modes for CMB)
- Considerable synergy but mostly disparate communities of analysts!
- No time: likelihood issues and full Bayesian approaches