



# TA Interestical Astrophysics Computational Issues L'institut canadien d'astrophysique theorique Computational Issues In CMB Analysis, Now & Then (aka CMB Stuff with Bob & Doug eh!) Dick Bond & all CMBers on McKenzie

# Analysis = Theory + Simulation + Experiment + Phenomenology

CMB experimental timeline

CMB Pipelines, Now (e.g. CBI – some new results, Boomerang (~month), Acbar (~month), WMAP2/3 (sigh, ~month) & Then (QuAD/Bicep, ACT/SPT, Quiet, Planck, Spider)

Computational costs, now & projected then (e.g. the case for large HPC@CITA)

**Theoretical Simulations & Monte Carlo analyses:** 

Early Universe – Acceleration Histories & the Inflation Landscape; Preheating to reheating; defects; topology

Nonlinear Secondary Anisotropies: inhomogeneous reionization; point sources- ULIRGs, radio galaxies ..; tSZ, kSZ (cluster/gp web); lensing - but homogeneous & isotropic

Galactic Foregrounds: template based; polarization frontier; CMB, IRAS/DIRBE, HI, HII, IGPS ...; synchrotron, bremsstrahlung, dust - vibrating, spinning, in HVCs, local ...

# **CMBers on McKenzie**

### CITA

- Bond
- Contaldi
- Lewis
- Pogosyan (U Alberta)
- Prunet (IAP France)
- Sievers
- Myers (NRAO)
- Pen

### then@cita ~ Cdn\$30M?

8,100 dual-CPU nodes (2GB/node) and 1PB of storage

nodes arranged in 90x90, 2D-mesh as in McKenzie using GigE

### **UofT**

- Netterfield
- MacTavish



### **Others**

- Crill (Caltech)
- Hivon (Caltech)
- Jones (Caltech)
- Montroy (Case Western)
- Kisner (Case Western)

# now@cita, Cdn\$0.9M CMB analysis ~ 25%

264 compute nodes
 528 CPUs (2.4GHz Xeons); 35TB of usable local scratch
 285 GB RAM

 nodes logically arranged in 2D mesh (See Fig 1) each node connected to two switches each node acts as a router

maximum one hop through a compute node for any message

• networking cost < 10% of entire budget (\$900K)



SN1: Oct04 ~100	) @ z ~ .37		LIGO1		LIGO2	LISA
~ 10	<b>a</b> z ~ 1-1	.5 ~3	80		2008-12	2013
CFHT-Legacy on	going to 08	(165 spec, 70	0 in can)	~400+ SN/5	yr	
ESSENCE ongoin	ng to 06+	~150 \$	SN/5yr			
WEAK LENSING	:				Pan-ST	ARRS
Oct04: RCS1 53	sq deg, Virn	nos-Descart 1	1 sq deg	+	L	SST
2003	20	005	2	007		2017
2004	ļ	2006	5		2008	
Deep Lens Surve	ey ongoing	28 sq deg				JDEM
CFHT-Legacy on	going to 08	(first great rea	sults 05)	140 sq deg		space
RCS2 ongoing SDSS ongoing	1000	sq deg	KIDS	(960 sq deg	), UKIDS	
CLUSTER/GROUP	system in t	he Cosmic We	b			
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**GW/scalar curvature**: current from CMB+LSS: r < 0.7 or < 0.36 95% CL; good shot at 0.03 95% CL with **BB polarization** BUT fgnds/systematics??

# some CMB ANALYSIS PIPELINES

from Timestreams or Visibilities (time-chunked interferometers) through generalized maps to bandpowers++ to parameters (via Monte Carlo, MCMC)

Signal-noise separator of ToD & Maps: via mapcumba (B98), MADnes, MADmap; jiqu (B03), newsky (B03), sky2naive (B98,B03}, gridder of uv visibilities (CBI)

Bandpowers via near-optimal isotropized MC QUADest: MASTER (pseudo-CL); SPICE, polspice; FASTER/XFASTER (B98, B03); optimal quadest: BJK, MADCAP (B98), Mlikely/MPIlikely (CBI); hybrids;

Spice, XFaster, Gridder/Mlikely extended to polarization (B03, CBI)

**banded higher point stats (B98, CBI, CBIpol, WMAP)** 

USE healpix or alternative (e.g. ice), fast spherical harmonic transform

**Parameters** of all sorts via **Monte Carlo Markov Chain feasible** e.g. **COSMOMC** (Lewis); fixed adaptive grids for some parameter mappings

# some CMB Analysis Actions

**Compressing**: time ordered data to generalized maps to bandpowers etal to cosmic parameters

**Mocking**: from naïve forecasts to full simulation end-to-end through the CMB pipelines

**Forecasting**: power spectrum errors, cosmic parameter errors, usual homogeneous sky coverage in the continuum limit

**Constraining Theories**: power spectra, parameters, non-Gaussian higher order statistics and pattern indicators. Feedback to early/late Universe, dark matter/energy theorizing, etc.

**Cleaning & Separating**: cleaning **systematics**; separating **foregrounds**, **secondary and primary backgrounds**, finding & understanding the **residuals** in the data. fully characterized separated maps (mean plus correlated errors).

**Comparing**: One data set or subset to another, often internal to an expt, with different pix, sky coverage, beams, frequencies, jackknifes of all sorts – data-halves, channel-splits, etc. sometimes "Interpolating theory" used, e.g. Gaussian best fit model. Are the sets compatible? If not, why not? The residual hunt.

# some CMB PIPELINE COMPUTERS

**B98,B03,CBI CITA:** 538-CPU. 256-node xeons 1.5 Tflops ; (cf.16-CPU wildfire SMP) ~25% of all McKenzie cycles have gone to CMB projects

**WMAP:** 6 32-node origin 300s, 1 16-node origin 2000, 3 16-node altix itanium SMPs; 12-node linux dedicated to beam; use 3 map-makers (one Wright one)

Planck: UK Cosmos: 2 64-node altix itanium SMPs connected as 128-node; France ~ 100 nodes + ; Germany (MPA++), Spain (++), ...

**US NERSC**: in 04-05, 0.5-1 ExaFlop = 0.2-0.35 Tflop/s; ExaFlop = 10<sup>18</sup> flops

Planck USPDA estimate of 14 Tflop/s (41 ExaFlop) dedicated in 2009. ~ 3100 CPUs/yr

Spider (balloon borne CMB polarization on large scales) will need equivalent of 2700 CPUs/result/year (assuming small efficiency factor); ACT 6200 CPUs/ result/yr

"efficiency" fudge factor, 10 as a minimum cf. B03 ~ 200, CBI ~ 50

i.e., dedicated access to ~10000 CPUs needed for Planck, Spider, ACT etal. analyses

### **CMB** Analysis Pipelines

•Step 1 : Time stream filtering ,cleaning, deconvolution, calibration, noise estimation, pointing determination etc...

•Step 2 : Map making 
$$\begin{aligned} \mathbf{d_t} &= \mathbf{P_{tp}} \boldsymbol{\Delta_p} + \mathbf{n_t} \\ \chi^2 &= (\mathbf{d} - \mathbf{P} \boldsymbol{\Delta})^\dagger \mathbf{N}^{-1} (\mathbf{d} - \mathbf{P} \boldsymbol{\Delta}) \\ \tilde{\boldsymbol{\Delta}} &= \left( \mathbf{P}^\dagger \mathbf{N}^{-1} \mathbf{P} \right)^{-1} \mathbf{P}^\dagger \mathbf{N}^{-1} \mathbf{d} \end{aligned}$$

•Step 3 : Power Spectrum estimation

$$ln L = \grave{a} \frac{1}{2} f \acute{E} ^{y} C^{\grave{a}} \stackrel{1}{\acute{E}} + Tr[ln C]g$$
$$W_{tot} = C^{-1} = (C_{N} + C_{T} + C_{K} + C_{res})^{-1}, \quad C_{K} = \gamma K^{-1} \gamma^{t}$$

into time chunks to treat non-stationary and non-Gaussian & bad data Gap filling because of non-whiteness

# templates y = modes

(temporal, spatial, frequency, polarization dependent) e.g. systematic modes in data, YLM patterns, measured foreground templates, source patterns to be projected out, pixels in "position space", in "momentum space" (interferometry), splines, ...

extension to polarization: same algorithms, larger matrices

d<sub>cpt</sub>, P<sub>cptx</sub>, N<sub>cpt,c'p't'</sub>,

c = channel, p= T,E,B pol, t=time-bit, x="pixel" aka mode/template

channel-channel cross-correlations

polarization cross-correlations TT, EE, BB, TE, TB, EB – leakage

# **CMB Statistics: Beyond Isotropic Bandpowers**

In compression stages loss of information that is not essential for some is crucial to others. e.g. statistical anisotropy of foregrounds & topology cf. isotropized power spectra for inflation - highly reduced quadratic (data V data) space. Full pixel-pixel covariance for topology: e.g. SOCCER BALL Universe.



# **Cosmic Background Imager Polarization**

- 13 element interferometer @ 30GHz
- 5000m Atacama Plateau, Chile
- Polarizers in Oct02. HEMTs RL pol
- 2+ yrs of data collected (to Jan05 +40%) Compact array optimized L~600-800

















interferometry primer Measures visibilities = intensities in baseline-dependent Fourier mode convolved with the dish antenna-pattern.



(99-14) Viena (50 samblege)



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### uncorrelated noise

$$C_{kk^{\circ}} = h V_k V_k^{?} \dot{a} + 2 \hat{u}_k^2 \hat{i}_{kk^{\circ}}$$

We compress onto a coarse-grained (u,v)-plane lattice.

# **Polarization – Stokes parameters**

- CBI receivers can observe either RCP or LCP
  - cross-correlate RR, RL, LR, or LL from antenna pair

$$\begin{pmatrix} \left\langle e_{R} e_{R}^{*} \right\rangle \\ \left\langle e_{R} e_{L}^{*} \right\rangle \\ \left\langle e_{L} e_{R}^{*} \right\rangle \\ \left\langle e_{L} e_{L}^{*} \right\rangle \end{pmatrix} = \begin{pmatrix} I + V \\ (Q + iU)e^{-i2\psi} \\ (Q - iU)e^{i2\psi} \\ I - V \end{pmatrix} = \begin{pmatrix} 1 & 0 & 0 & 1 \\ 0 & e^{-i2\psi} & ie^{-i2\psi} & 0 \\ 0 & e^{i2\psi} & -ie^{i2\psi} & 0 \\ 1 & 0 & 0 & -1 \end{pmatrix} \begin{pmatrix} I \\ Q \\ U \\ V \end{pmatrix}$$

- $\dot{C}MB$  not circularly polarized, ignore V (RR = LL = I)
- parallel hands RR, LL measure intensity I
- cross-hands RL, LR measure complex polarization R-L phase gives electric vector position angle

 $\psi = \tan^{-1}(U/Q)$ 

– rotates with parallactic angle of detector  $\psi$  on sky

Decompose polarization signal into "gradient" and "curl modes" – E and B

$$\widetilde{Q}(\mathbf{v}) + i\widetilde{U}(\mathbf{v}) = \left[\widetilde{E}(\mathbf{v}) + i\widetilde{B}(\mathbf{v})\right]^{i_{2}\div_{\mathbf{v}}}$$

 $\chi_{\mathbf{v}} = \tan^{-1}(v/u)$ E & B response smeared by phase variation over aperture A  $V_{ijv}^{RL}(\mathbf{u}_{ijv}) = \int d^2 \mathbf{v} P_{ijv}(\mathbf{v}) [\widetilde{E}(\mathbf{v}) + i \, \widetilde{B}(\mathbf{v})] e^{i2(\chi_v - \psi_{ij})} + e_{ijv}^{RL}$ 

interferometer "directly" measures (Fourier transforms of) E & B!

# **CBI 2004 Polarization results**

• 2<sup>nd</sup> measurement of the E-type CMB polarization spectrum, best so far (DASI02, CBI04, DASI04, CAPmap04 @ COSMO04) & WMAP1 '03 TE

• Now 40% more data analyzed – cbi9



[Readhead et al. Science Nov 2004, , v306]

# First Year Polarization Results EE



[Readhead et al. astro-ph/0409569]

CBI ~300 nights fall 2002 – Jan 2005 in three 4deg by 4deg mosaics and a 4deg by 45' deep strip. measure spectrum using a maximum likelihood estimator (CITA McKenzie cluster). EE detected with high significance (10.7-\_), most to date; TE with moderate significance (3.6-\_). TT is consistent with previous measurements. BB consistent with zero. as expected.





### **CBI : Compress onto coarse Q-grid & Brute force Power Spectrum**



- N<sub>vis</sub> ~ 10000K (was 100K, finer chunks): reduced onto a gridded set of uv estimators. ~4K sources [MPIGridder]
- N<sub>pix</sub> ~ 10K (coarse-grid), 40K fine-grid: Sufficiently small to allow brute force search for maximum likelihood using a full iterative (~10) quadratic estimator [MPILikely]
- Storage :  $(N_{pix} \times 3)^2 \times N_b / 2 \sim 30 \text{ Gb}$
- Scaling :  $N_{run} \sim (N_{pix} \times 3)^3 \times N_b \sim 2560$  cpu hours
- Codes are parallelized using MPI and use the scaLAPACK (MPI) linear algebra library to solve for x = M<sup>-1</sup> y [www.netlib.org]

hours + hours in both at 32 McKenzie nodes per field - scale as Area<sup>3</sup> 'Efficiency' prefactor ~  $2\% \rightarrow \underline{total \ production \ time ~ 128,000 \ cpu \ hours}$ 

dn<sub>s</sub>/dlnk  $\mathbf{A}_{\mathbf{s}} \mathbf{n}_{\mathbf{s}}$ d**n**<sub>t</sub>/dln**k**  $\omega_{\rm b} \omega_{\rm c}$ dw<sub>DE</sub> /dlna  $\begin{array}{cccc} \Omega_{DE} \tau_{C} & A_{t} & n_{t} & W_{DE} \\ & \Omega_{K} & \omega_{v} & & d^{2}W_{DE} & /dlna^{2} \\ & & iso \end{array}$ isocurvature & other subdominant 6 + 1 + 2 + 1 + (1+1) + 1 + (1,2) + 1 + (3+1) + many many more parameters Any acceleration trajectory for early & late inflation is a priori allowed, restricted only by the observed data (including "anthropic data" – heat/light, life) e.g. "blind" search for patterns in the primordial power spectrum : 1+q(ln a), H e.g. "blind" search for evolution of the dark energy equation of state  $w(z) : q(\ln a)$ cf. "guided" searches with theory priors: the cost of barogueness CMB futures ~2008++: Planck1+WMAP4+SPT/ACT/Quiet+Bicep/QuAD/Quiet; Planck2.5+Spider parameter eigenmodes: 6/9 to 1%, rest to 10% + Blind-ish search for primordial patterns: 10/35 to 1%, 10/35 to 2%, 9/35 to 10%

**Polarization is fundamental to the blind pattern search: T** >> **E** >> **B modes** 

# Phase recognition in EE

• In the standard, scale invariant, pure adiabatic model the phase of the scalar EE spectrum is fully correlated with that of the TT

• Polarization sourced by the velocity term at last scattering  $\rightarrow$  peaks are in phase with dips (doppler contribution) in TT

CBI polarization results have begun to test this prediction



# <u>Ò</u> - An Independent test of origin of perturbations Ò







# Are there any isocurvature modes?

• Perturbation of the entropy (in one or more species e.g. baryons, CDM, photons etc...) as opposed to perturbation in the curvature

$$\hat{i} = \hat{i}_R + \hat{i}_S$$

• Lots of models allow for isocurvature modes e.g. multiple-field inflation, curvaton models etc. Data does not allow for too much isocurvature contribution however a subdominant component will bias standard model parameters

• Overall contribution to even/odd peaks depends on species perturbed. Isocurvature modes and adiabatic modes can be correlated!!



$$C_{x}^{\text{tot}} = C_{x}^{\text{SS}} + C_{x}^{\text{RR}} + C_{x}^{\text{RS}}$$



Sample CBI results: Subdominance of isocurvature mode cf. inflationary curvature modes even with just the polarization data

CBI 2000+2001, WMAP, ACBAR, BIMA



Acbar05: very nice TT, release soon05. parameters & new excess analysis as SZ

# Non-Gaussianity

- Decompose data into uncorrelated S/N eigenmodes for each bin.
- Pick out modes expected to have signal
- Check distribution for non-Gaussianity
- Keep total of 5500 modes TT, 3800 EE – everything consistent with Gaussian
- First check of EE Gaussianity



# Non-Gaussianity cont.

- Check non-Gaussianity in each bin
- Might show ldependent effect (such as foreground)
- Individual bins consistent with Gaussian.



# Foregrounds – CBI Radio Sources

### Project ~3500 sources in TT,

### ~550 in polarization

Located in NVSS at 1.4 GHz,

VLA at 8.4 GHz

Predominant on long baselines

No evidence for contribution of sources in polarization – very conservative approach

"masking" out much of sky – need GBT measurements to reduce the number of sources projected

e.g., lead-trail radio sources in CBI mosaic field cf. TT image



# **B03: BOOMERANG Jan03 flight**





CMT 2003 Jan 21 06:55:00 LDB\_Antarctics\_Boomerang

# **B03: PSBs for Polarization**

# B03: TT very good, TE, EE good detections. Release Jun05 Masi etal 05, Montroy etal 05, Piacentini etal 05, Jones etal 05, MacTavish etal 05

Contaldi etal 05 XFASTER



### **Boomerang : Monte Carlo Methods**



•  $N_t \sim 3x10^7$ : reduced onto a map pixelized at 3.5' pixels (HEALPIX nside=1024) with  $N_{pix} \sim 200,000$  x 3. (JIQU : CG linear iteration) ~ 2 hours, single node run

Storage : single precision pixels ~ 25 Mb/map

• Monte Carlo the full scan strategy to estimate the biases of pseudo- $C_1$  due to noise and filtering. Requires ~ 1000 simulations of the experimental time stream and runs of the iterative map-maker [MASTER, XFASTER, ...]

• Scaling :  $N_{maps} \ge 2$  hrs  $\ge 2 \sim 1600$  cpu hours, for a standard test run

'Efficiency' prefactor ~ 0.2 % → total development time ~ 800,000 cpu hours
(Jan04-Jan05: PBS recorded 360,000 cpu hrs on Boomerang jobs, more since)





### tensor (gravity wave) power to curvature power, a direct measure of (q+1), q=deceleration parameter during inflation

**q** may be highly complex (scanning inflation trajectories)

many inflaton potentials give the same curvature power spectrum, but the degeneracy is broken if gravity waves are measured

(q+1) =~ 0 is possible - low scale inflation – upper limit only

Very very difficult to get at this with direct gravity wave detectors – even in our dreams

Response of the CMB photons to the gravitational wave background leads to a unique signature within the CMB at large angular scales of these GW and at a detectable level. Detecting these B-modes is the new "holy grail" of CMB science.



# the Terrain for Planck in the CMB Landscape

Synchrotron Free-Free Thermal Dust

![](_page_38_Picture_3.jpeg)

 $\Delta T = \delta f/(df_{cmb}/dT)$  in deg K, linear in sqrt( $\Delta T$ ), 1K threshold

![](_page_39_Figure_0.jpeg)

![](_page_40_Figure_0.jpeg)

### Planck Software Development (huge effort at many centres)

# Level 0, Level 1, Level 2, Level 3, Level S, Level 4

### Planck HFI & LFI DPCs

Quick Look Analysis. rapid ToD; PITOU rapid visualizer of maps on spheres

MADnes/ MADmap & MAPCUMBA similar algorithms. Outgrowth of original B98 & Maxima optimal separator. cf. JIQU/Newsky - also similar.

PolSpice (cut sky via corr fns) cf. XFASTER

MCMC methods .. Quadratic .. Hybrids (Maxima, Hanson, Gorski, Hivon 03, Efstathiou 04, WMAP)

Stompor, Borrill estimate of cost for one full end-to-end analysis ofPlanck: 3.3 ExaFlop times 15 or so. Needs of 40+ ExaFlop by 09

# SPIDER collaboration (NASA/CSA)

Institute	Responsibilities		
Caltech-JPL	detector arrays, optics, receiver assembly/testing		
Cardiff University	filters, optics		
Case Western Reserve University	cooled _ wave plates and rotating mechanisms, optics		
CEA (Grenoble)	He3 refrigerator		
Imperial College	data analysis, theory		
NIST	SQUID Multiplexers		
University of Toronto-CITA	Gondola, tracking, data analysis		
University of British Columbia	Readout electronics		

### SPIDER LDB 09: Antenna-Coupled bolometer array + rotating half-wave plate

![](_page_43_Picture_1.jpeg)

![](_page_43_Picture_2.jpeg)

Figure 12: 4-inch-diameter wafer with  $8 \times 8$  spatial pixels (left) and a closeup on a released TES and four antenna pairs at  $50 \times$  magnification (right).

Observing		Beam	Number of		Single-Detector	Instrument
Band	Bandwidth	FWHM	Spatial	Number of	Sensitivity	Sensitivity
(GHz)	(GHz)	$(\operatorname{arcmin})$	Pixels	Detectors	$(\mu K_{\rm CMB} \ {\rm s}^{1/2})$	$(\mu K_{CMB} s^{1/2})$
40	10	145	32	64	130	16.3
84		69	128	256		
92	33	63	128	256	60	3.8
100		58	128	256		
145	32	40	256	512	80	3.5
220	40	26	256	512	150	6.6

Table 1: Observing bands, pixel and detector counts, and single-detector and instrument sensitivities. The latter is obtained by dividing the single-detector sensitivity by  $\sqrt{N_{det}}$ . A total of 1856 detectors are distributed between the six telescopes.

![](_page_44_Figure_0.jpeg)

![](_page_45_Figure_0.jpeg)

# SUMMARY of CMB Computing Challenges, with Current Algorithms

McKenzie 1.5 Tflops - 201 on the Nov04 list (Current top 3 are 71, 52 and 36 Tflops) 20-25% of all McKenzie cycles have gone to CMB projects CITA-HEP "plan" 8100 dual-CPU nodes. with 2.8GHz CPUs 90 Tflops.

Planck USPDA estimate of 14 Tflop/s (41 ExaFlop) dedicated in 2009. ~ 3100 CPUs/yr Spider (balloon borne CMB polarization on large scales) will need equivalent of 2700 CPUs/result/year (assuming small efficiency factor); ACT 6200 CPUs/ result/yr

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i.e., dedicated access to ~10000 CPUs needed for Planck, Spider, ACT etal. analyses