



Flattening the Sky with HEALPix

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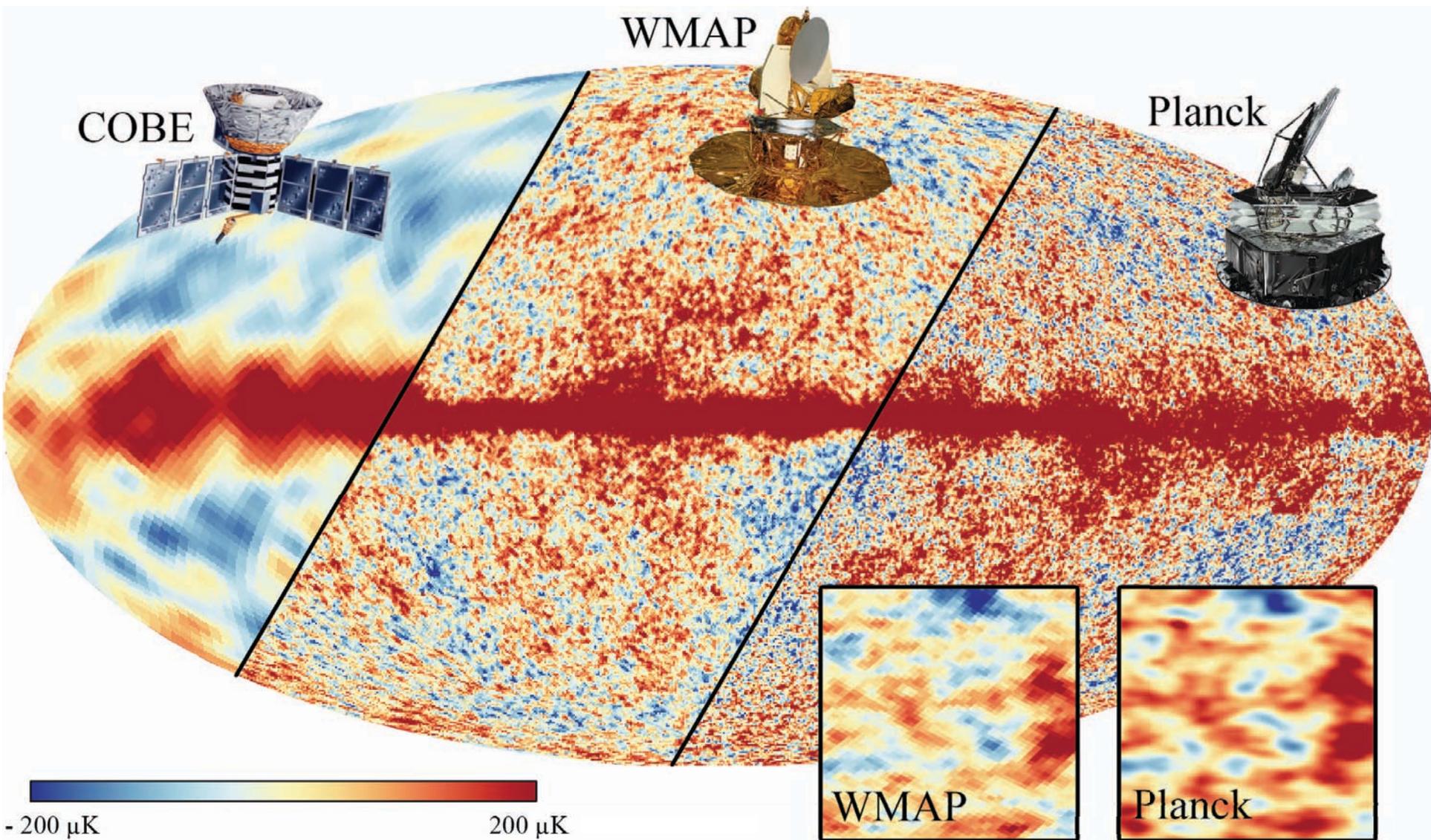
&

Astronomical Observatory, Warsaw University, Poland

- Hierarchical Equal Area iso-Latitude Pixelization
- HEALPix was constructed to support:
 - Hierarchical structure of the data base for data objects distributed on the sphere
 - Exactly equal area of pixels - resolution elements of the tessellation
 - Iso-latitude distribution of pixel centers, which constitute the point-set for numerical quadrature on the sphere to enable fast spherical harmonic transforms [$P_{lm}(\theta)$ only need to be evaluated once per latitude, hence overall complexity of harmonic transform evaluations is $\sim N_{\text{pix}}^{3/2}$, where N_{pix} is the total number of pixels on the sky]
- HEALPix was invented (~16 years ago!) by **K.M. Górski** (then in Copenhagen), and developed and supported by KMG (now at JPL/Caltech), **Eric Hivon** (IAP, France), **A.J. Banday** (MPA Garching, Germany), **B.D. Wandelt** (UIUC, IL), **M. Reinecke** (MPA Garching, Germany)
- HEALPix software is a suite of Fortran90, IDL, C, C++, Python, and Java programs for data digitization, manipulation, and mathematical analysis, including fast spherical harmonic synthesis/analysis transforms, with documentation and user manuals
- HEALPix is the data structure for WMAP, and Planck; it is an adopted data standard in FITS, etc.
- Distributed through the web-site <http://healpix.sourceforge.net>
(<http://healpix.jpl.nasa.gov>)
- Contact: krzysztof.m.gorski@jpl.nasa.gov & healpix-support@lists.sourceforge.net

Almost 50 years since the discovery of the CMB,
after scores of suborbital CMB experiments,
and two decades of ~~3~~ dedicated satellite missions

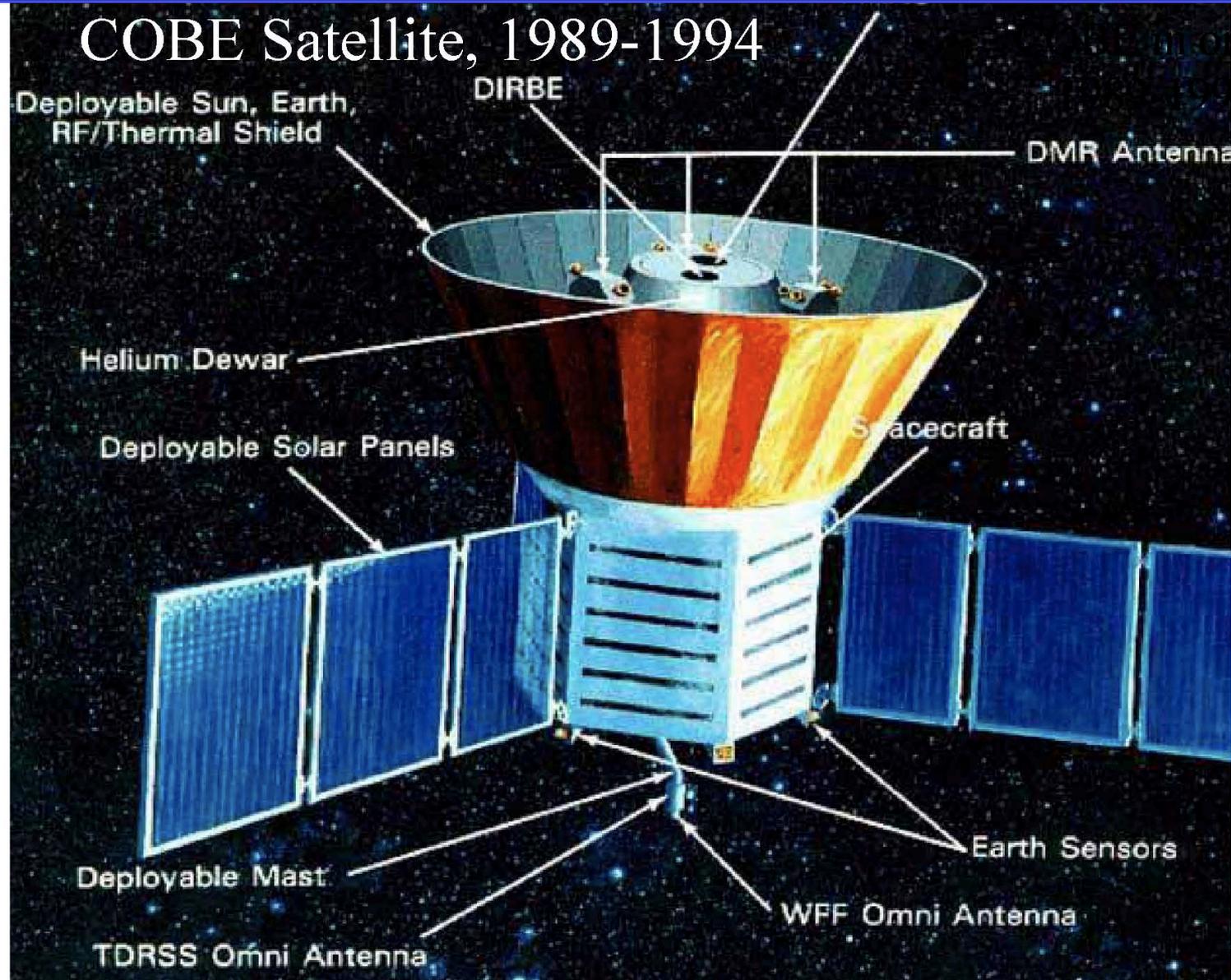
we reached a **REMARKABLE** moment, but **why are we doing this?**



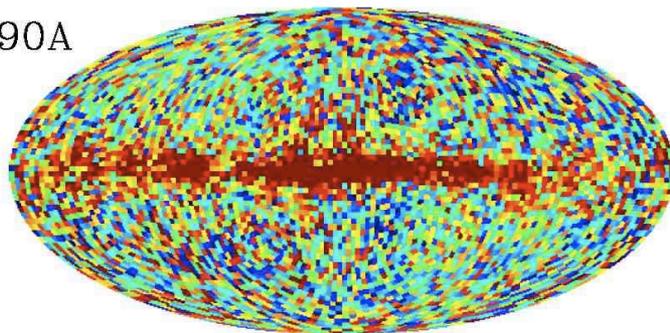


COBE

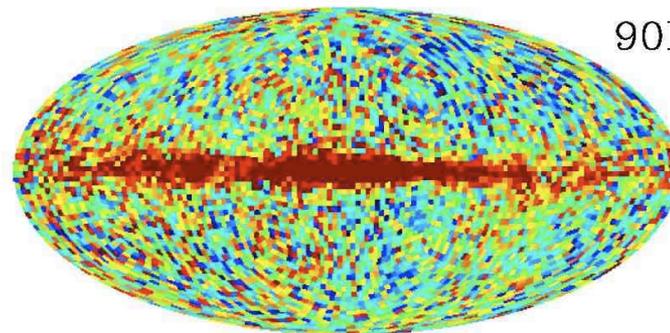
COBE Satellite, 1989-1994



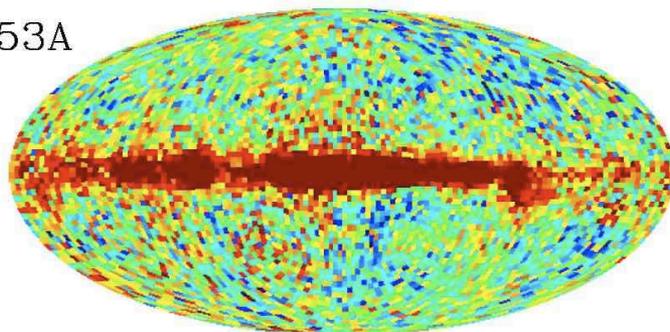
90A



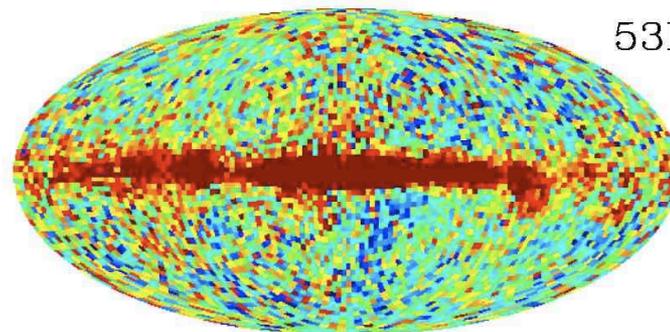
90B



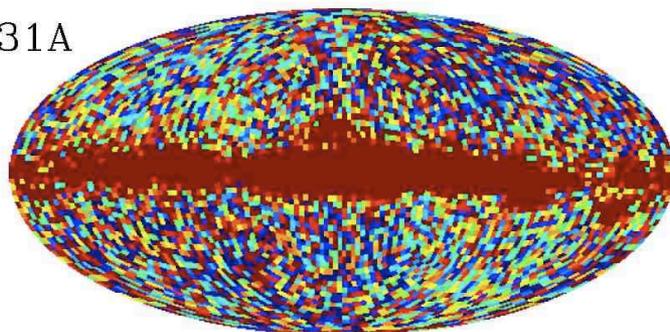
53A



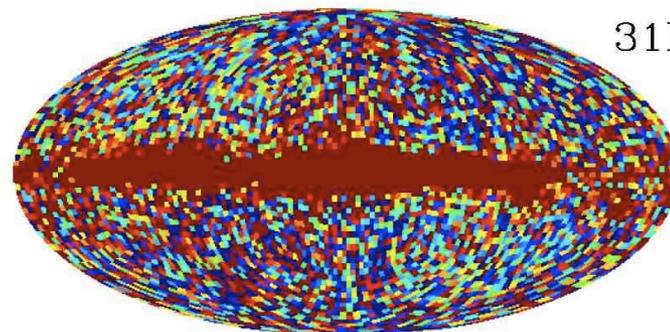
53B



31A

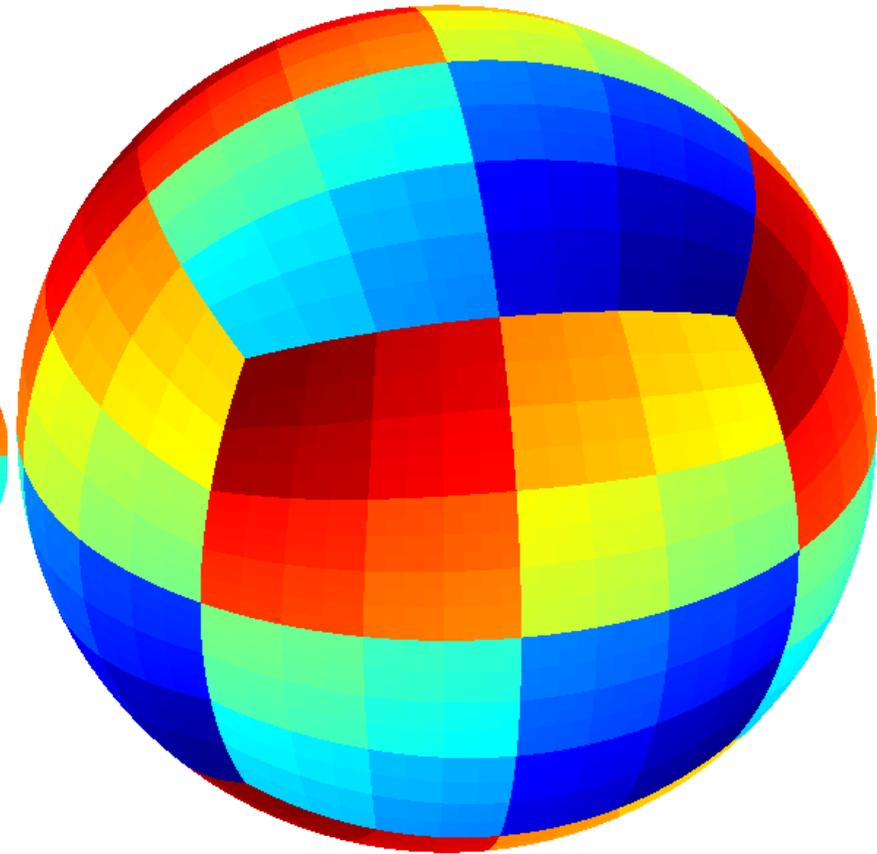
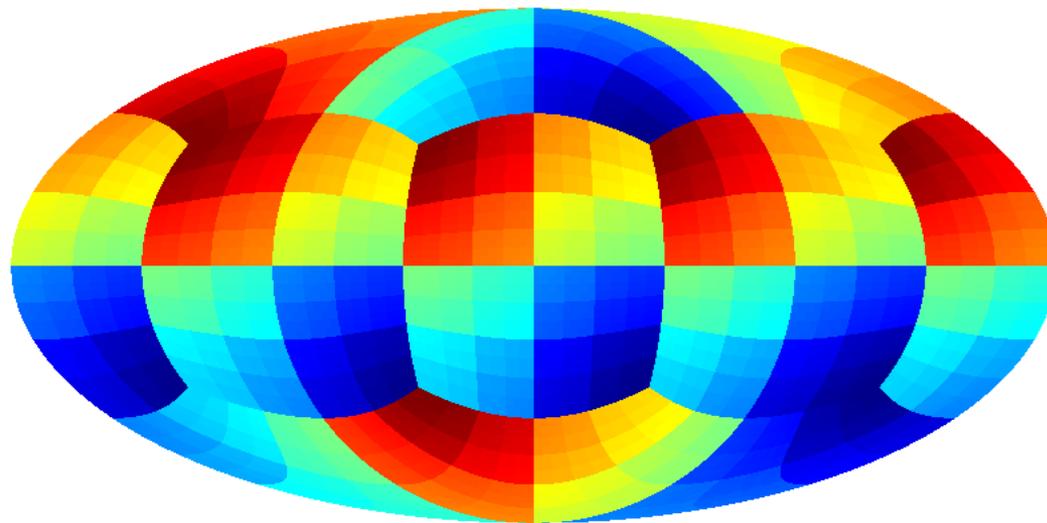


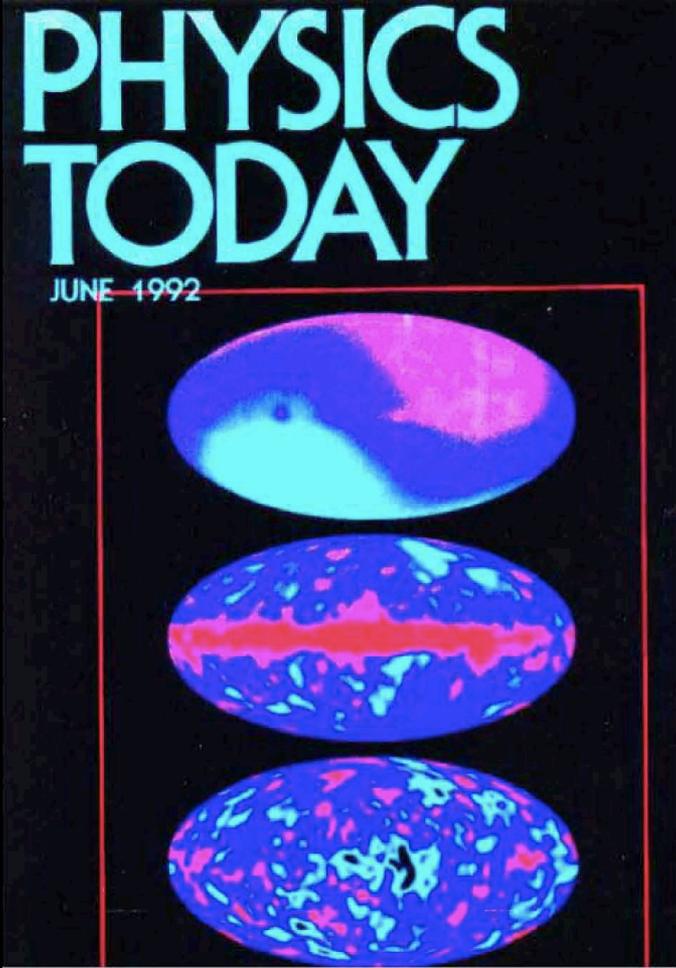
31B





Quadrilateralized Spherical Cube ...





PHYSICS TODAY
JUNE 1992

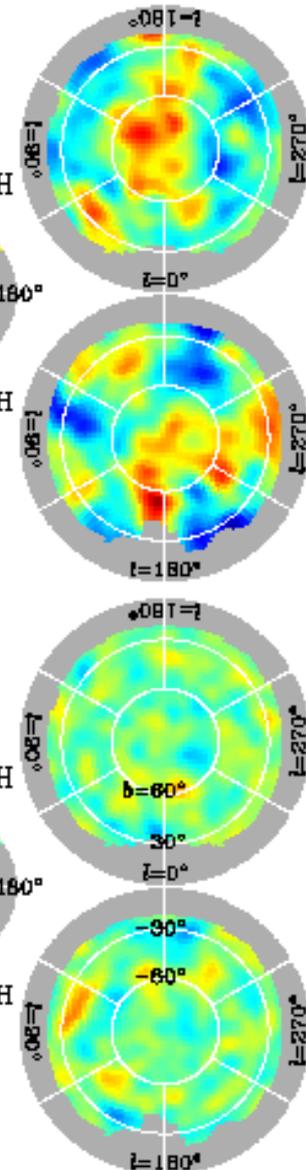
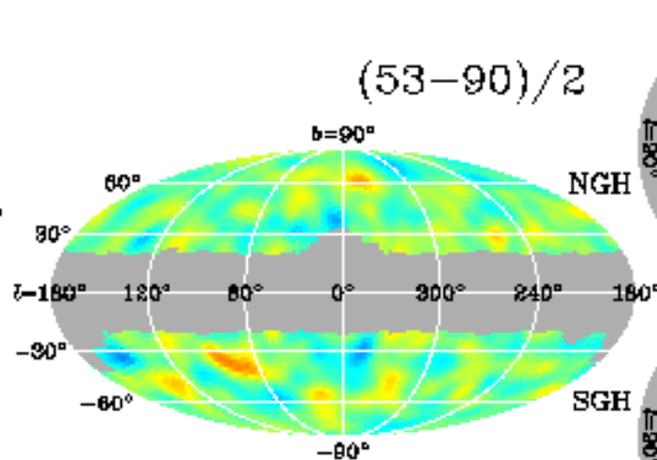
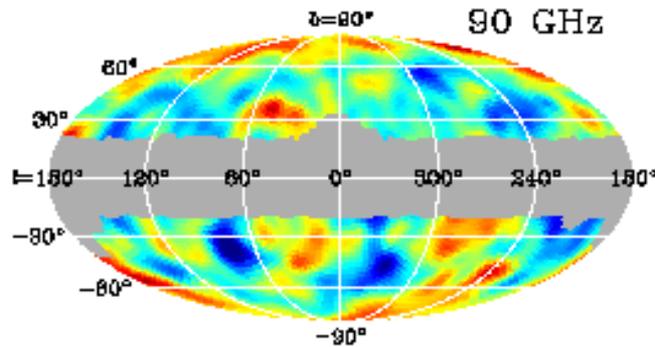
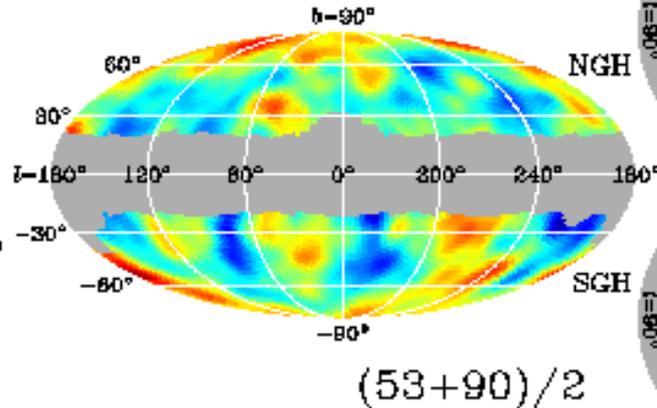
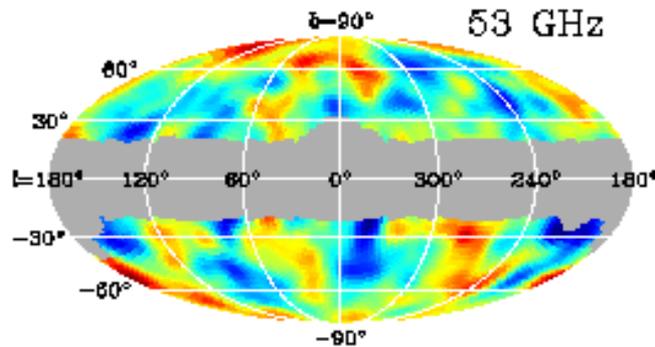
Sky map from DMR,
 $2.7 \text{ K} \pm 0.003 \text{ K}$

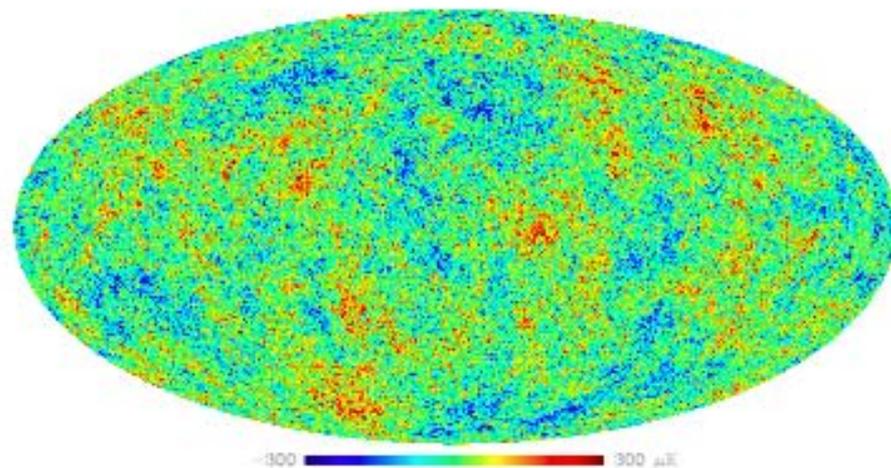
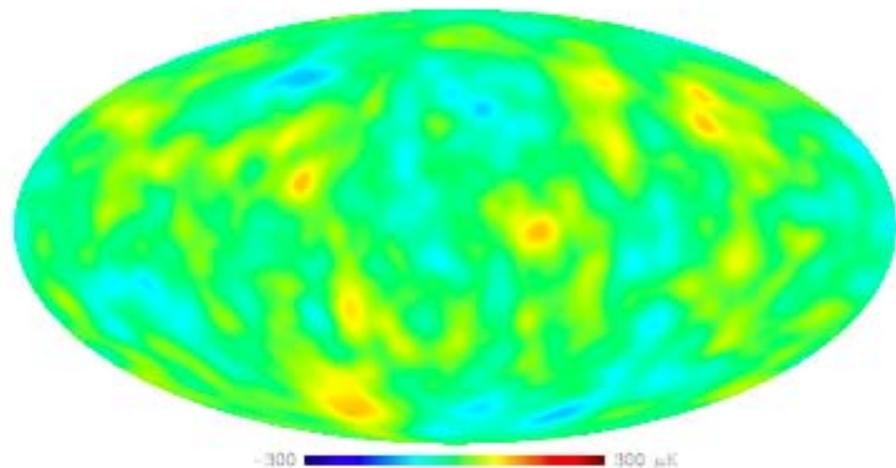
Doppler Effect of Earth's
motion removed ($v/c = 0.001$)

Cosmic temperature/density
variations at 389,000 years,
 $\pm 0.00003 \text{ K}$

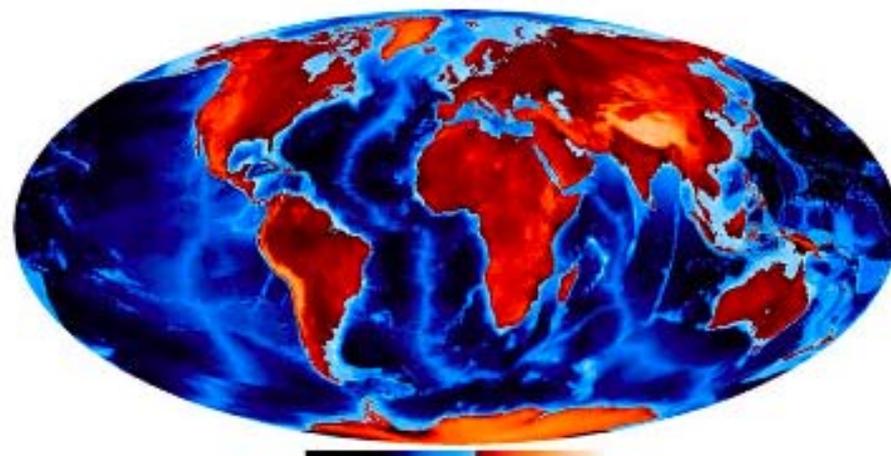
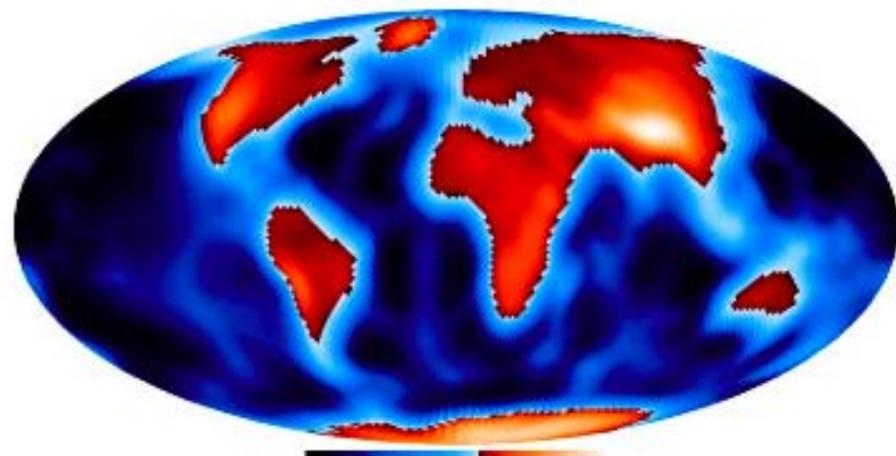
ecture 2006 52

COBE-DMR 4-Year PE-Filtered Sky Maps



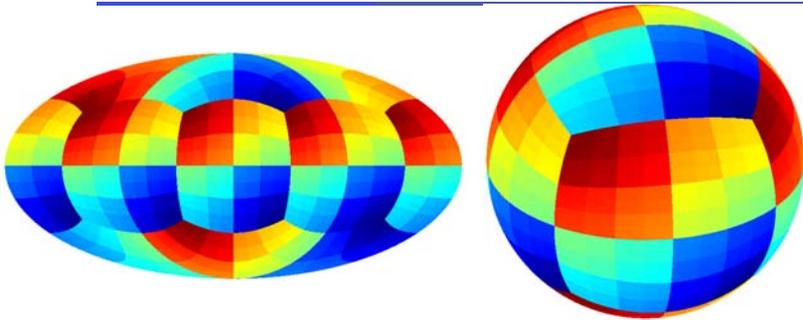


After COBE – Quickly increased appetite, we wanted more, much more ...

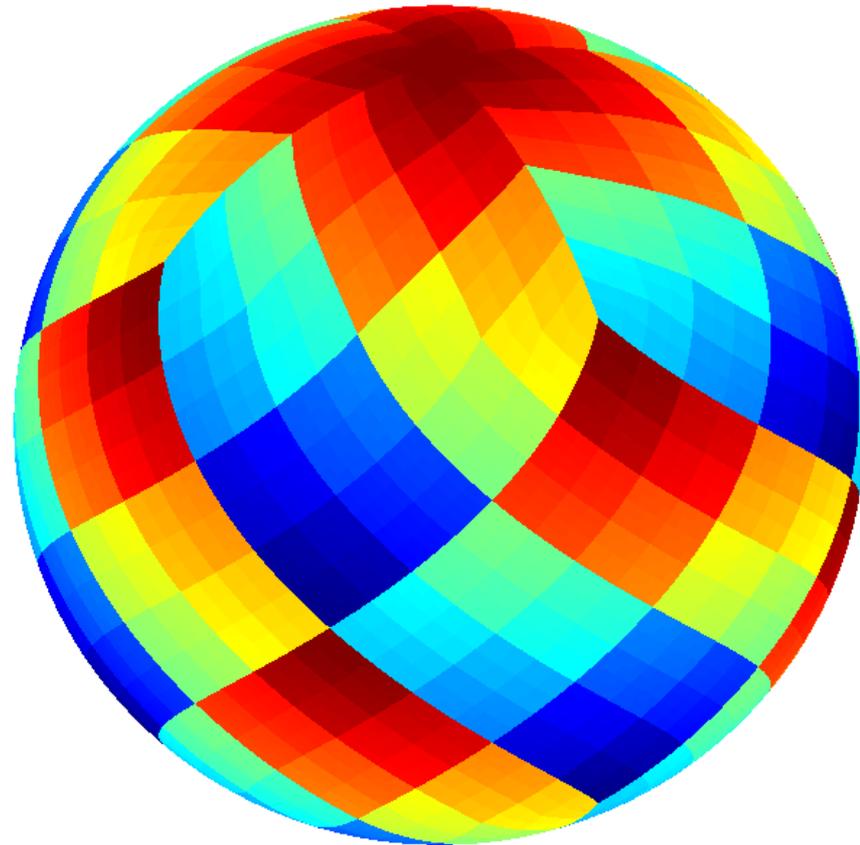
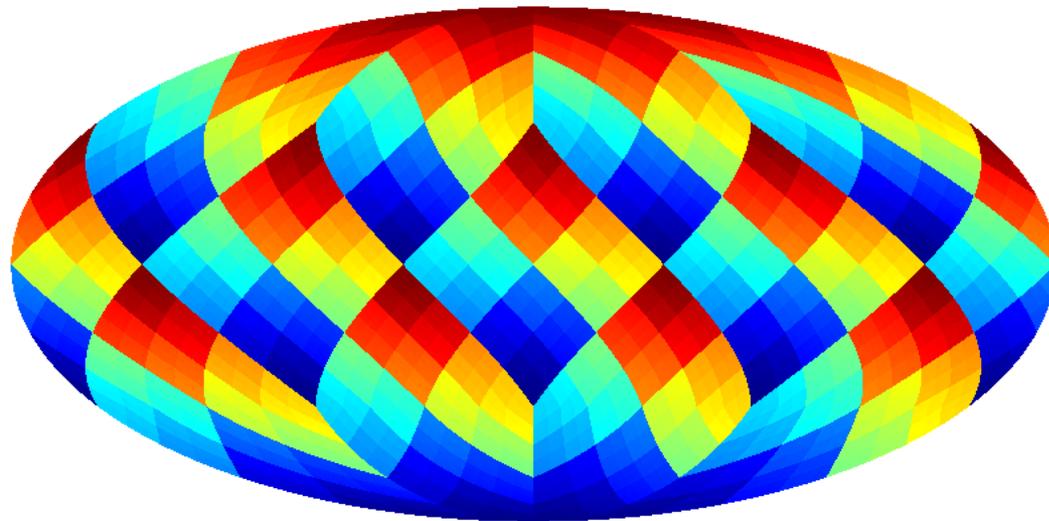




Data Structure of the HEALPix Sky Maps

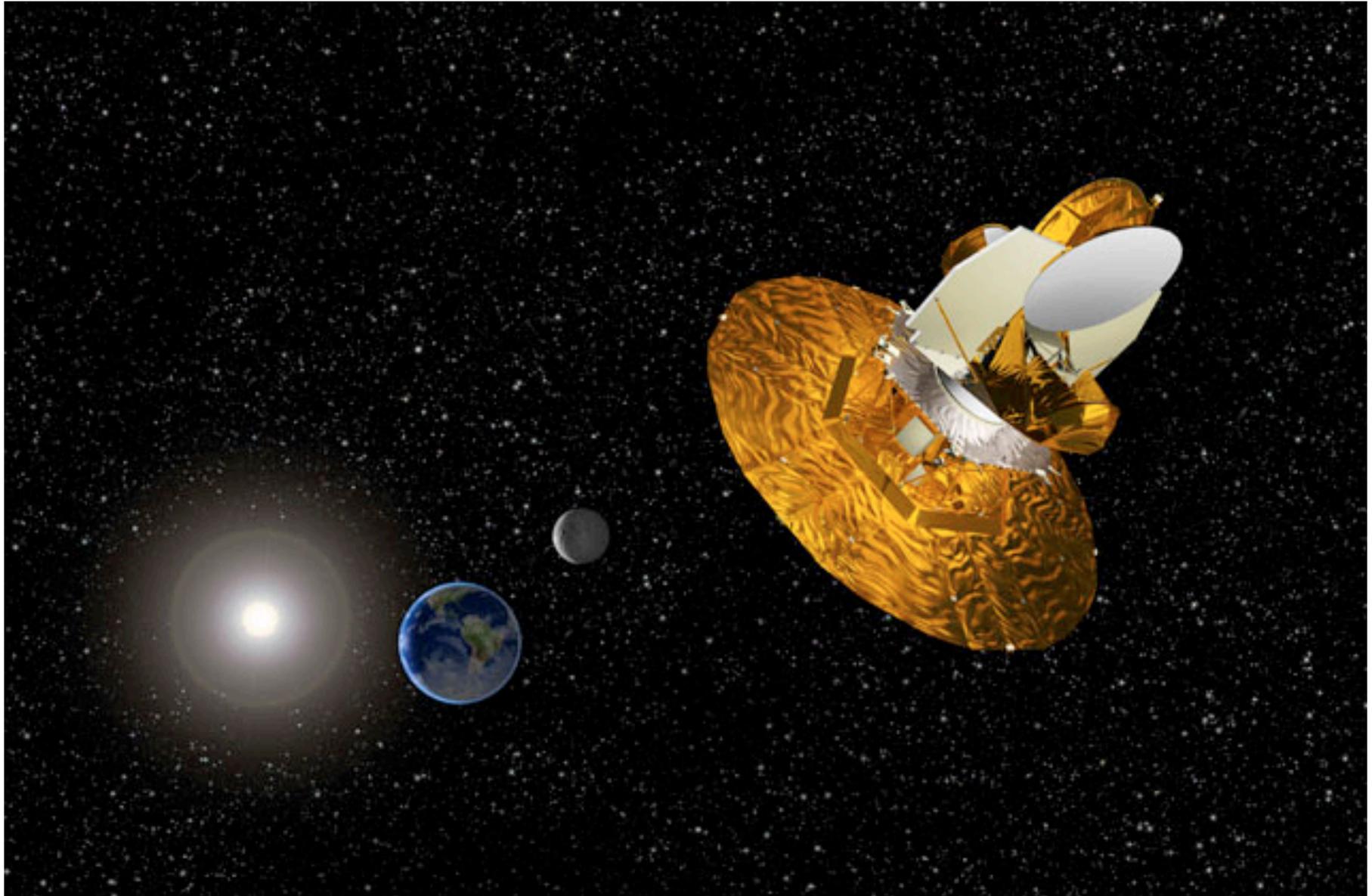


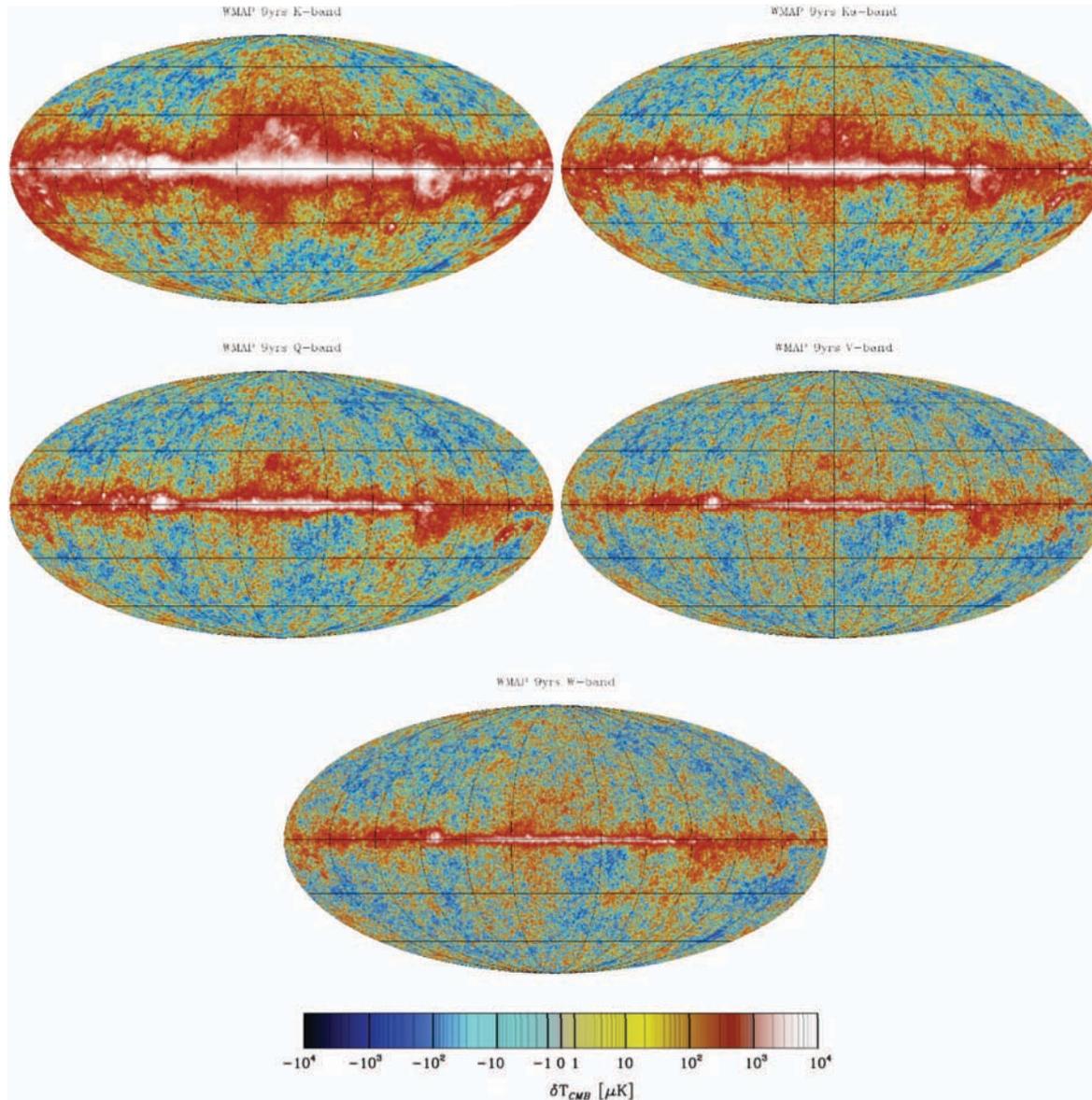
Novelty was required to make it possible to swallow “much more” ...





WMAP





**Pre-Planck
microwave
sky**

**the great
WMAP
mission
and its
sky maps
at
22-94 GHz**



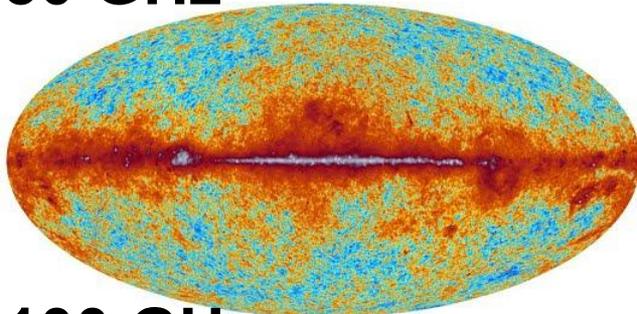
Planck



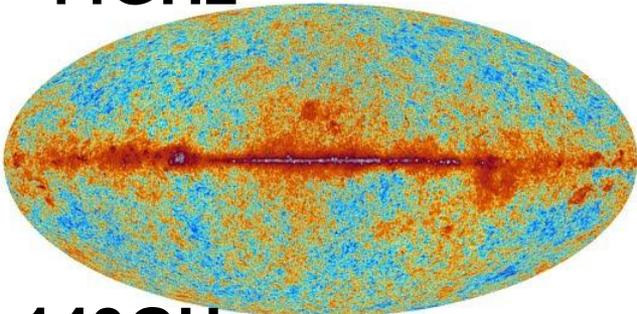
**Planck
ready to go
in French Guyana**



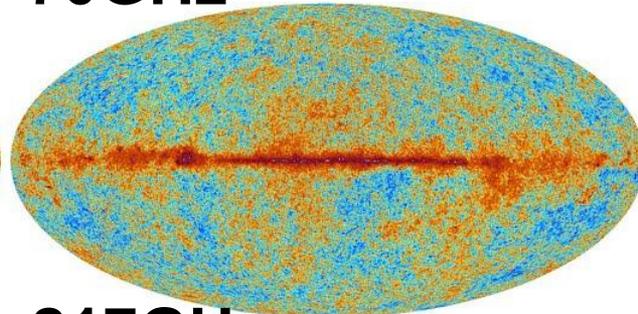
30 GHz



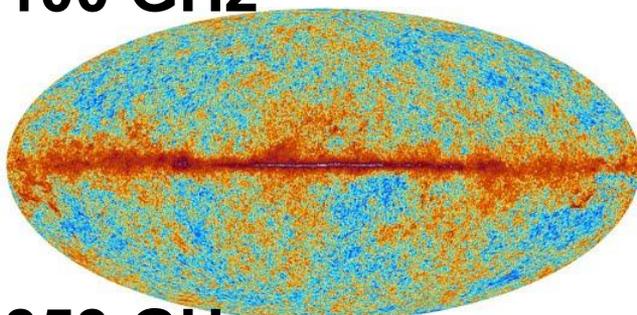
44GHz



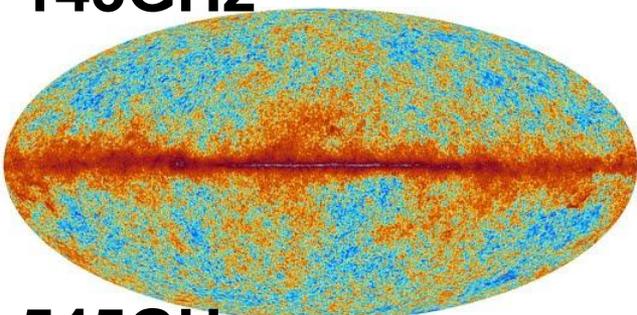
70GHz



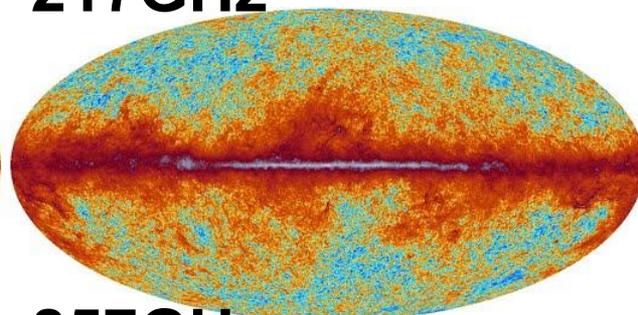
100 GHz



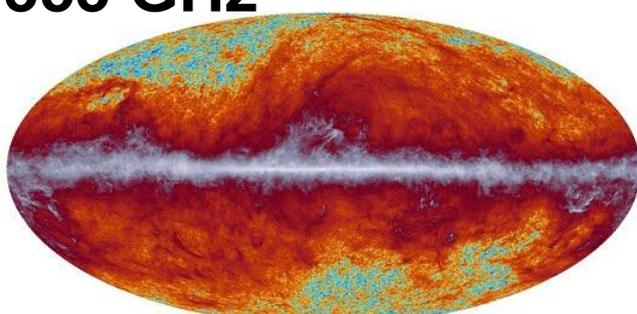
143GHz



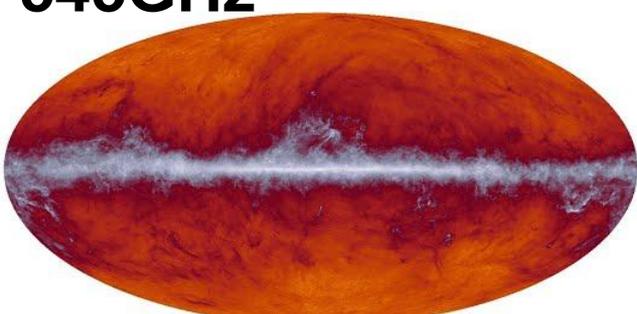
217GHz



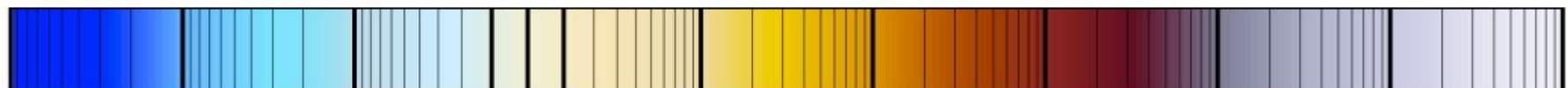
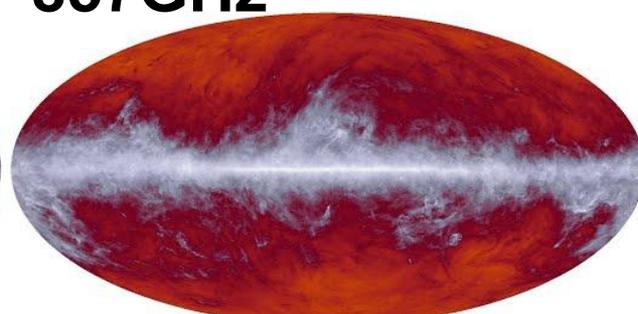
353 GHz



545GHz



857GHz

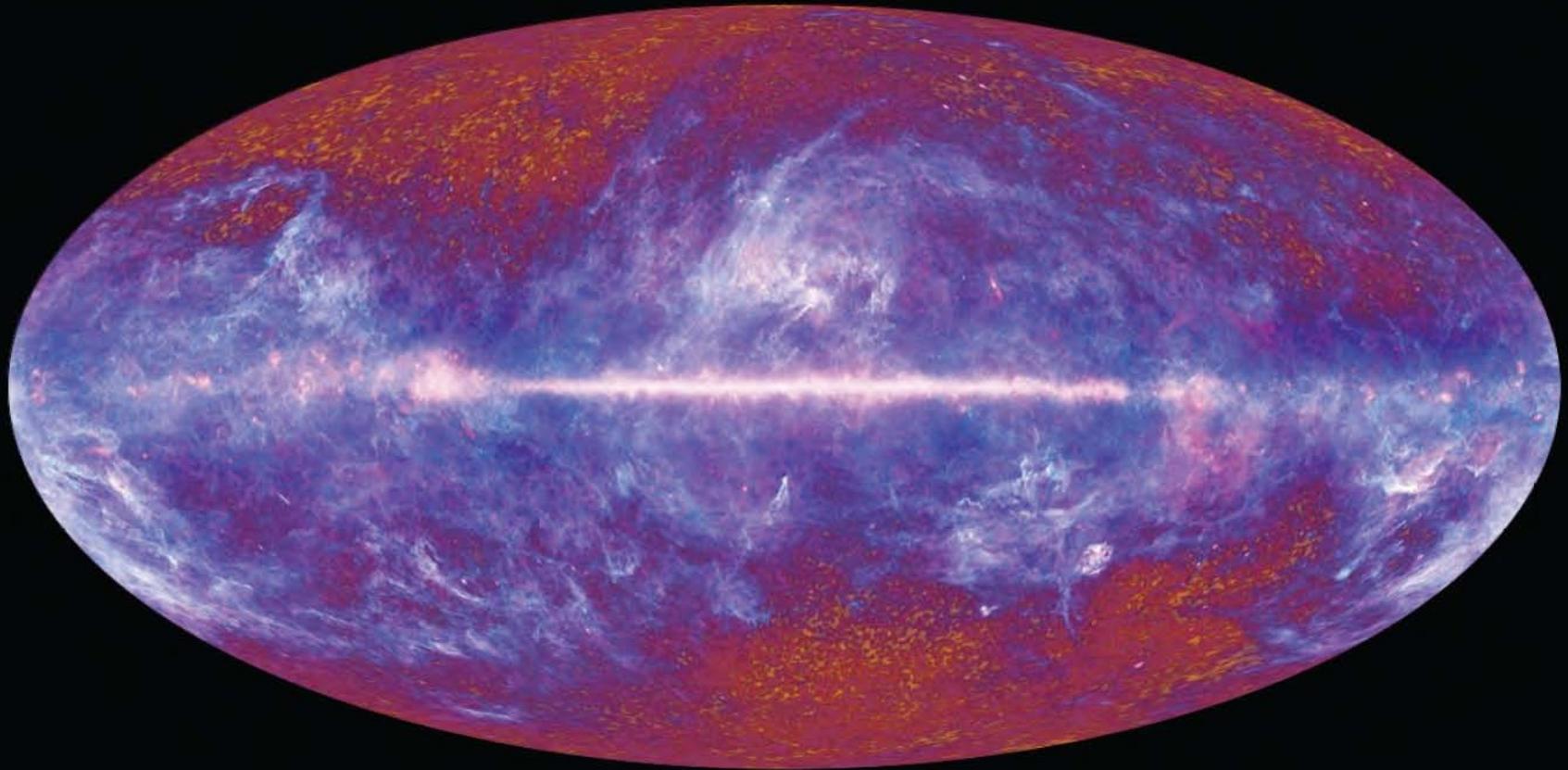


-10^3 -10^2 -10 -1 0 1 10 10^2 10^3 10^4 10^5 10^6

30–353 GHz: δT [μK_{CMB}]; 545 and 857 GHz: surface brightness [kJy/sr]



Planck's Universe



The Planck one-year all-sky survey



(c) ESA, HFI and LFI consortia, July 2010



HEALPix

Some context

Before pushing ahead let's take a look at the #2 and #1 roundest man-made objects:

The Avogadro project's
1 kg of Si²⁸ 93.6 mm ball



$\Delta r/r \sim 3.7 \times 10^{-7}$, $\Delta r \sim 35$ nm

(~2.8 m "hills" on the surface of the Earth)

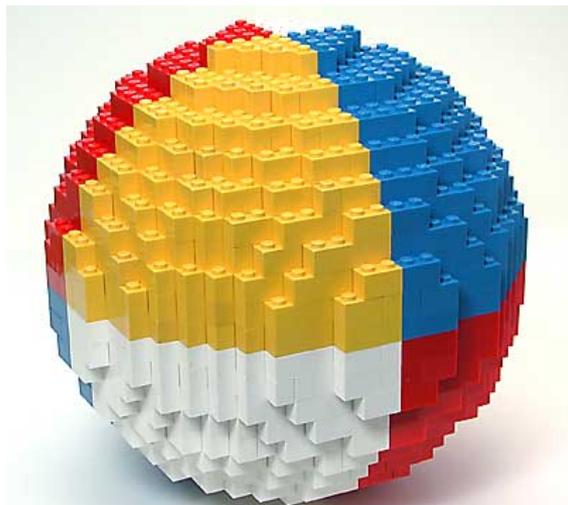
Gravity Probe B gyroscope
38.1 mm fused-quartz ball



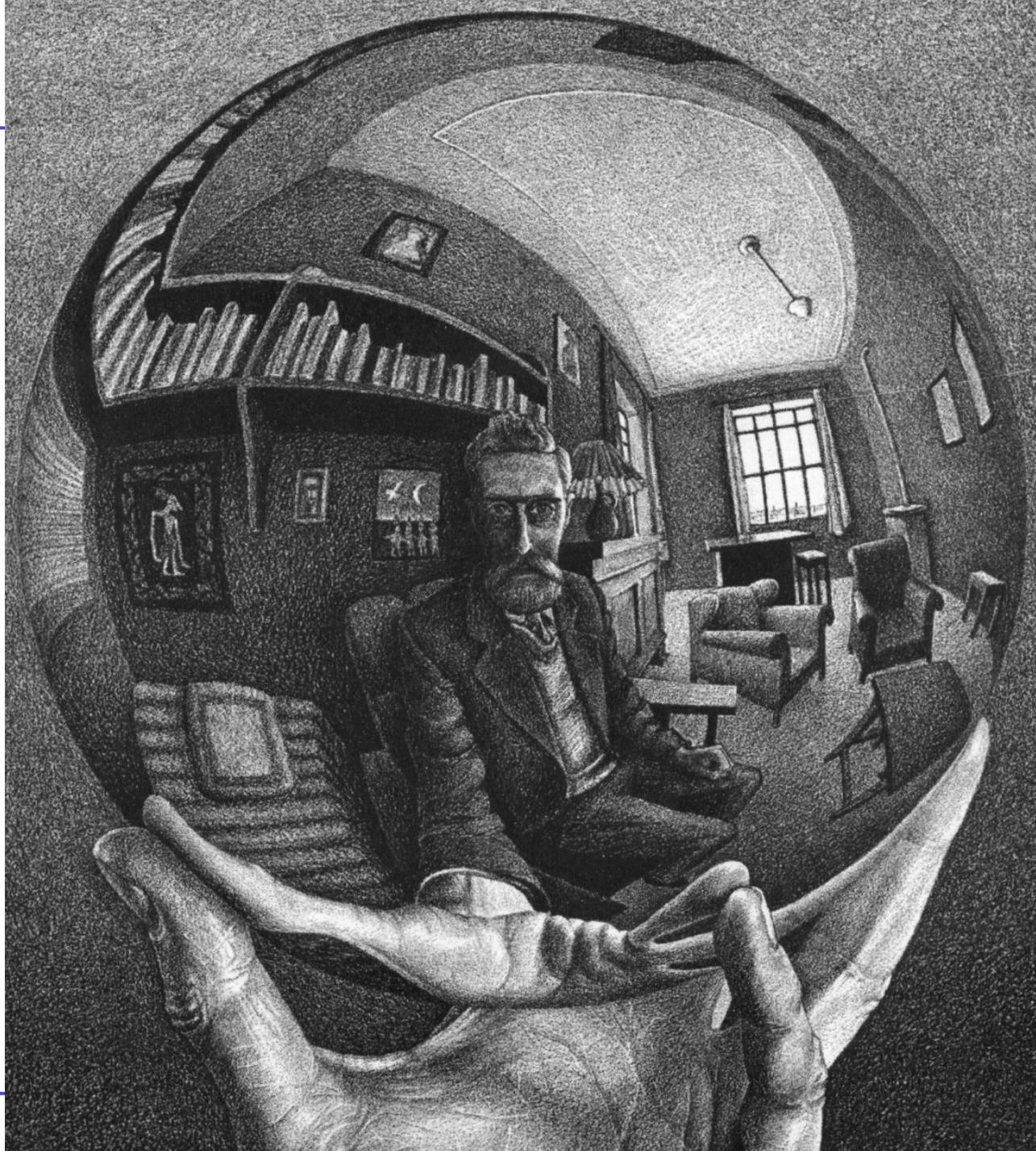
$\Delta r/r \sim 1.8 \times 10^{-7}$, $\Delta r \sim 3.4$ nm

(~1.4 m "hills" on the surface of the Earth)

**Studying
Sphericity
one can be
sophisticated,
like Escher's
(well, at least one can try),
or
simplified, as with LEGO,**



BUT IT IS ALWAYS FUN

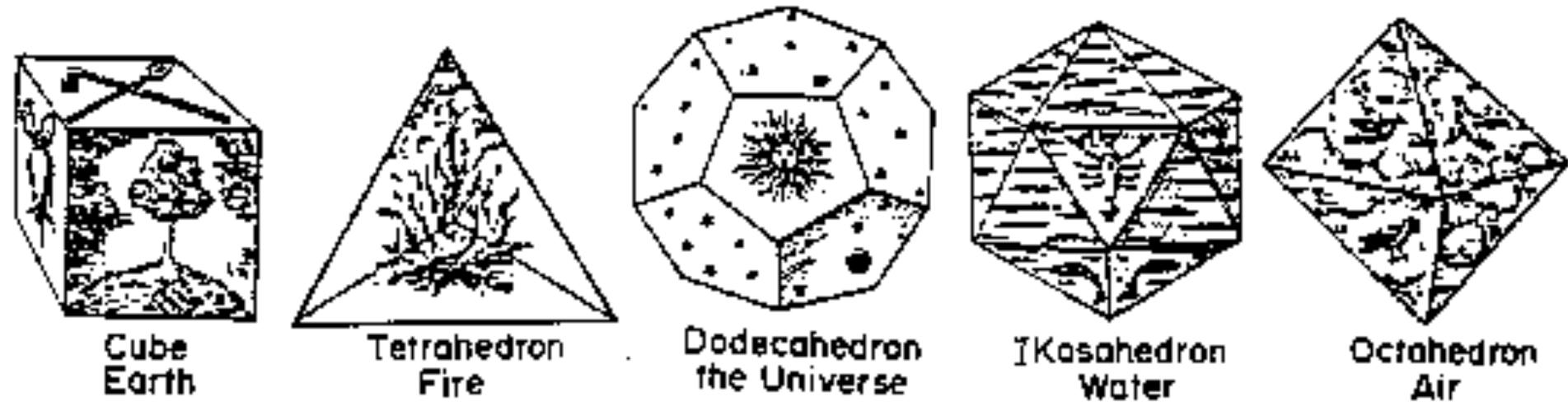




When and where? 1997 in Copenhagen



- Drawing from Kepler's *Mysterium Cosmographicum*

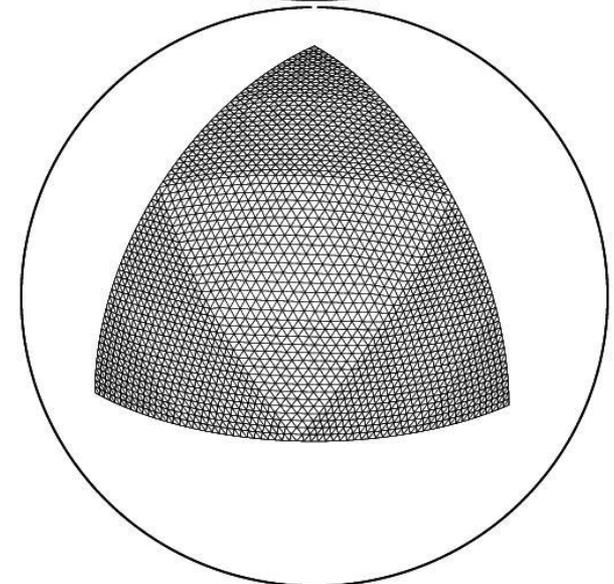
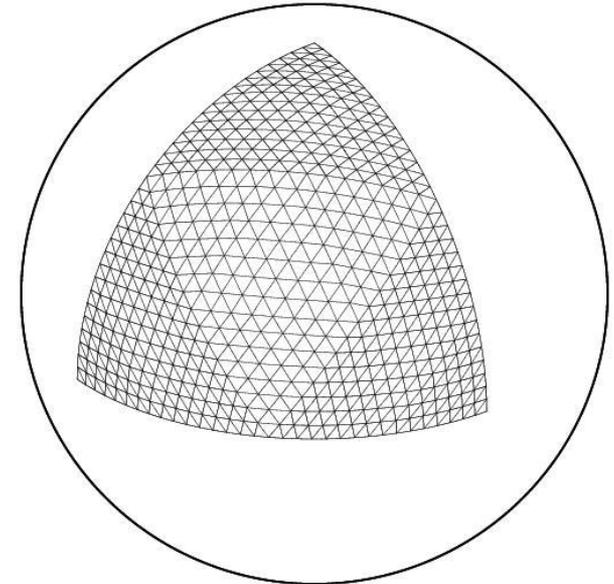
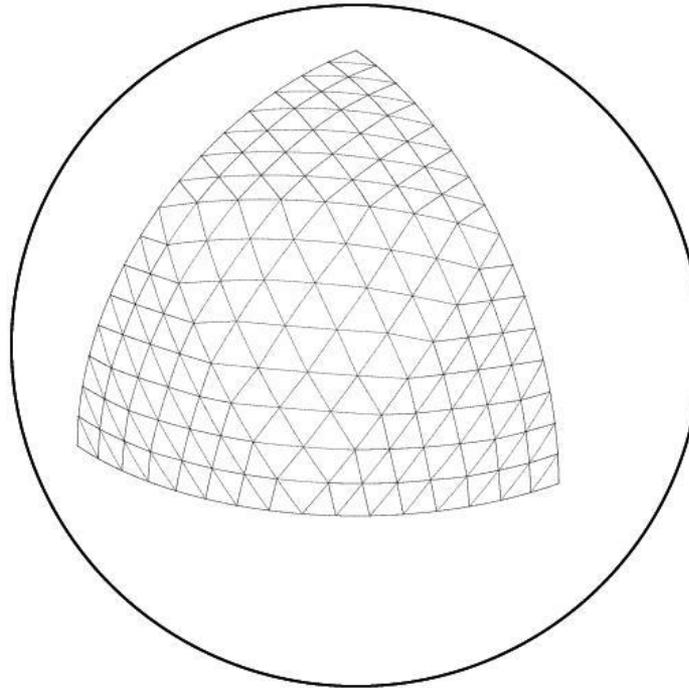


Icosahedral Dome, Epcot Center, Disneyworld, Florida



HTM Hierarchical Triangular Mesh

Used
extensively
in
SDSS
Archive



Discoball

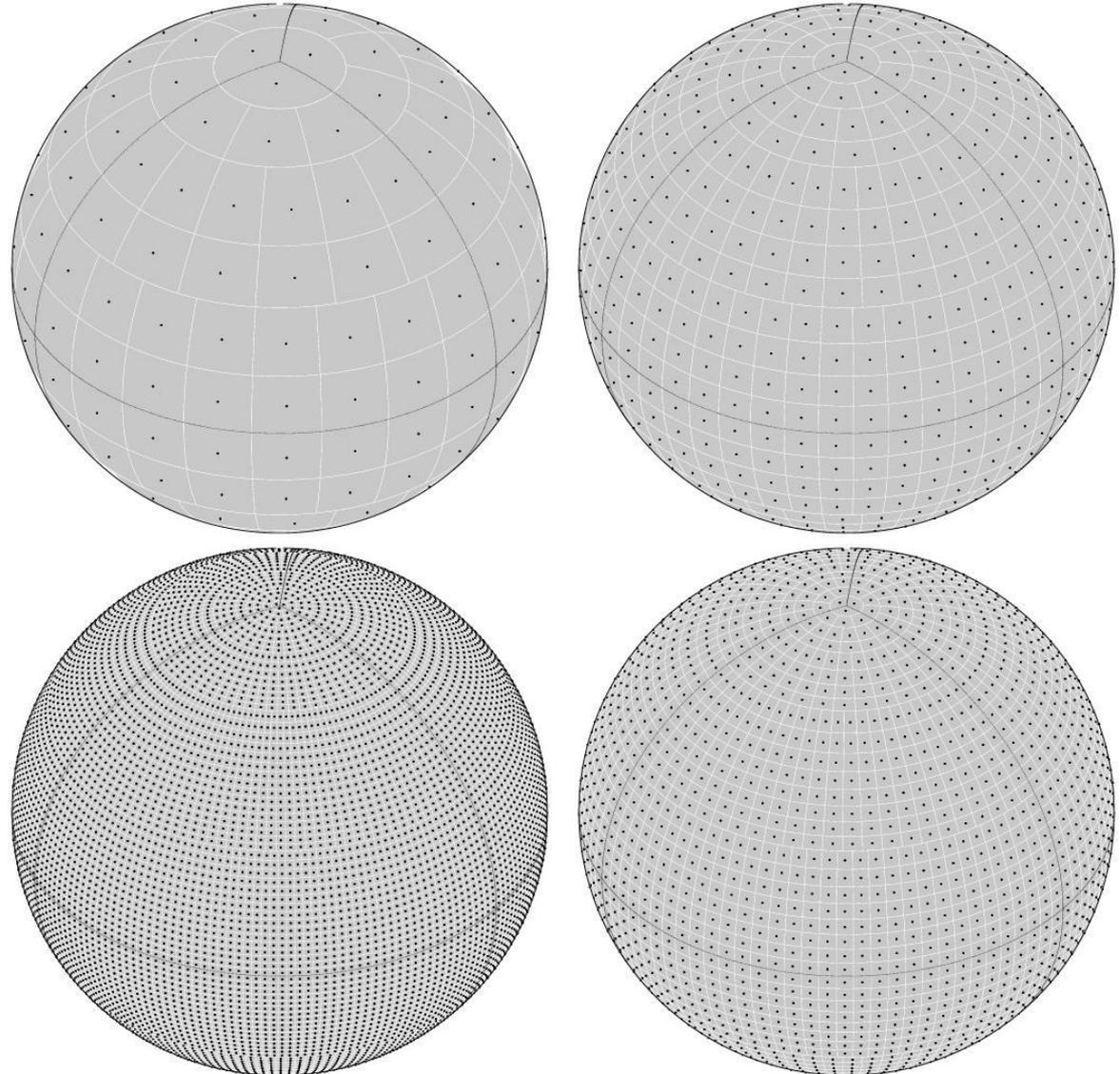
- Used extensively in discos



IGLOO

Crittenden
and
Turok

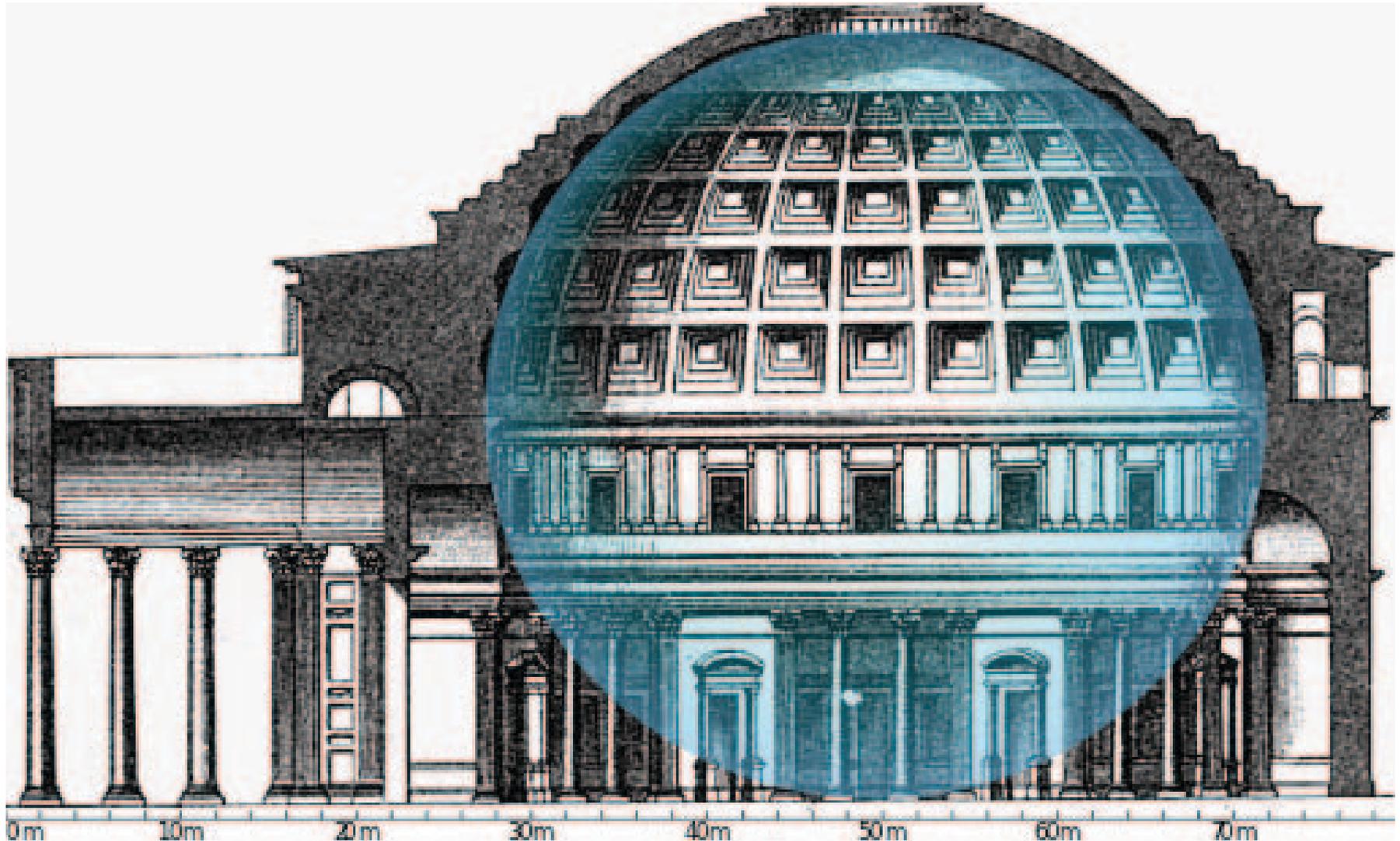
Used extensively
in the Arctic ...



- Built in 124 AD!
- 43m dome
- The largest in the world until the XXth century!!!



Pantheon – Spherical Magic

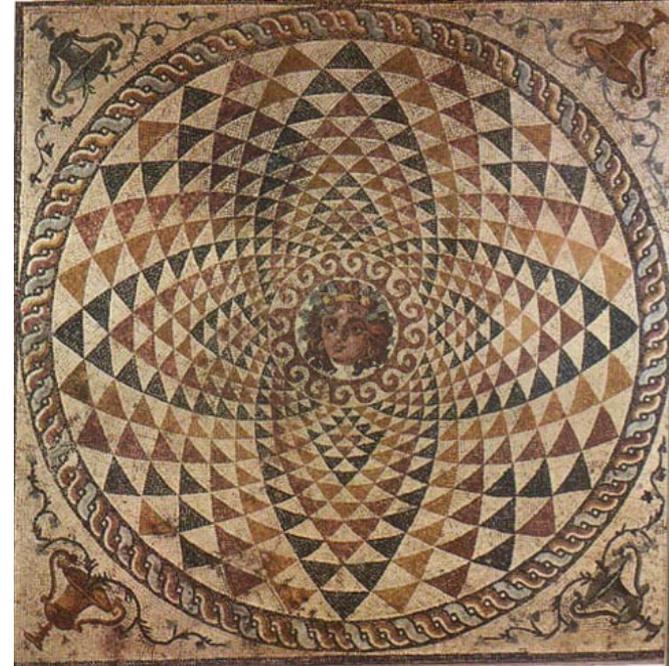
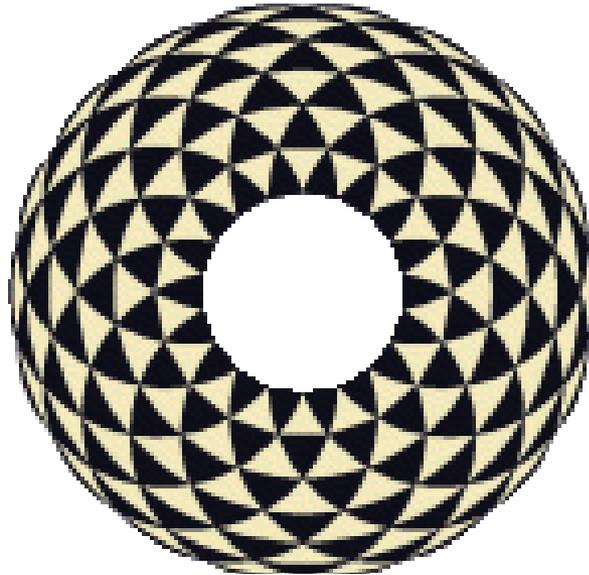


Temple of Venus and Roma

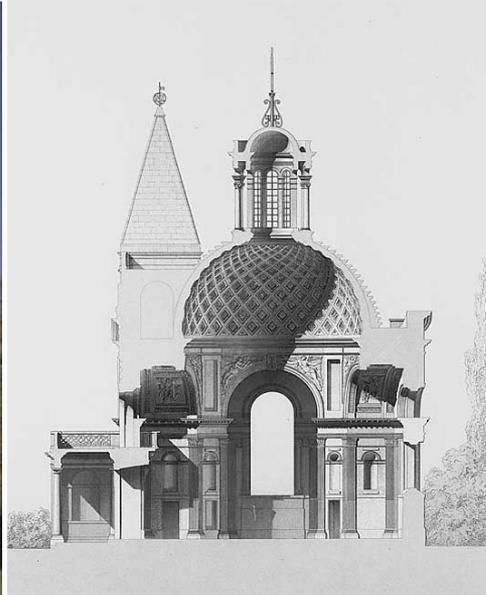
- On Forum Romanum, across the road from the Colosseum

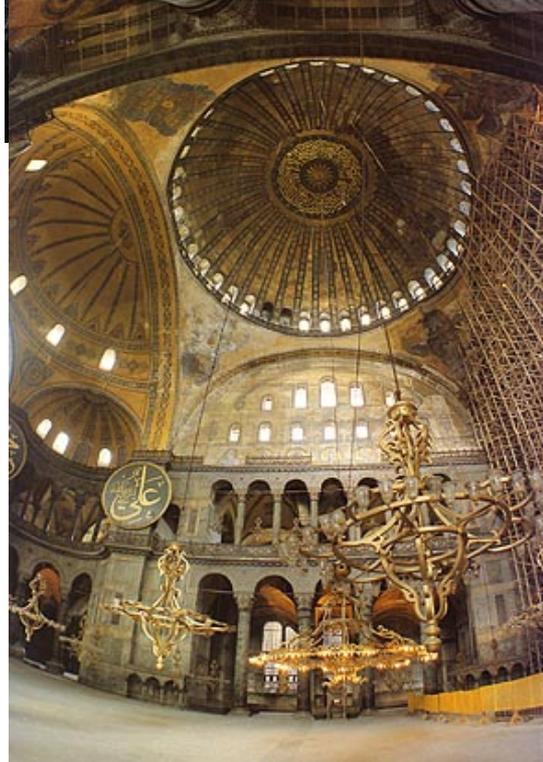


Roman Floor Mosaics



Chapelle d'Anet, P. De l'Orme, XVI c.





**San
Pietro
Rome
42m
1593 AD**

The Next Four

**Hagia
Sophia
Istanbul
32m
537 AD**

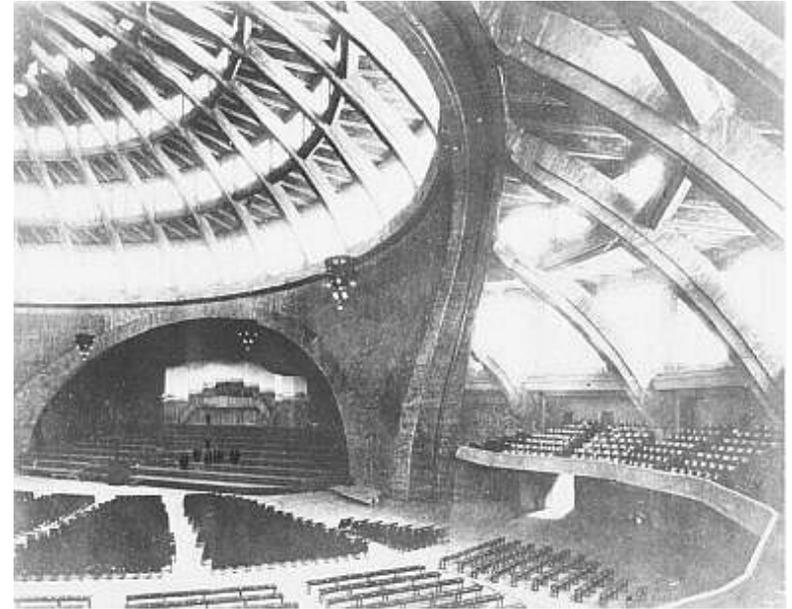
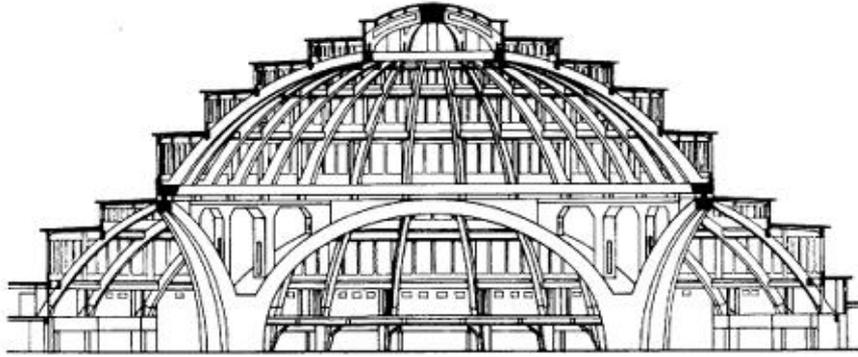


**Santa
Maria
del Fiore
Florence
42m
1420 AD**

**St. Paul's
London
33m
1710 AD**



Jahrhunderthalle by Max Berg, 1913. Breslau; 69m

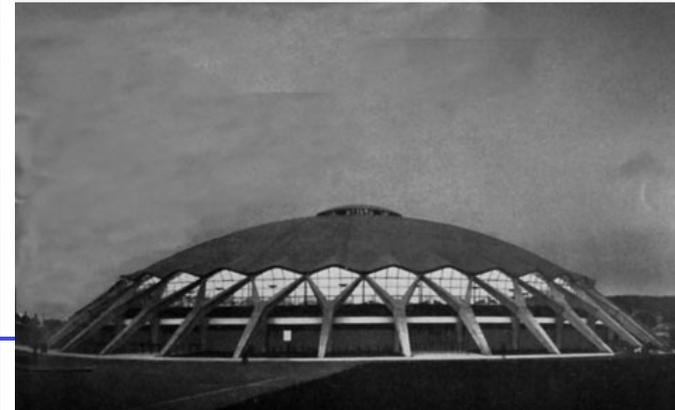
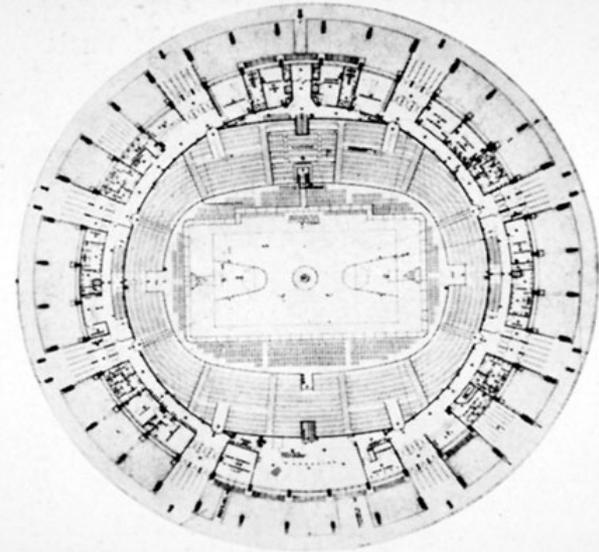


**Italian God of
Concrete –
Pier Luigi Nervi**

**Pallazetto dello
Sport
Rome, 1957**

61 m

**(‘assembled’ in 40
days!)**





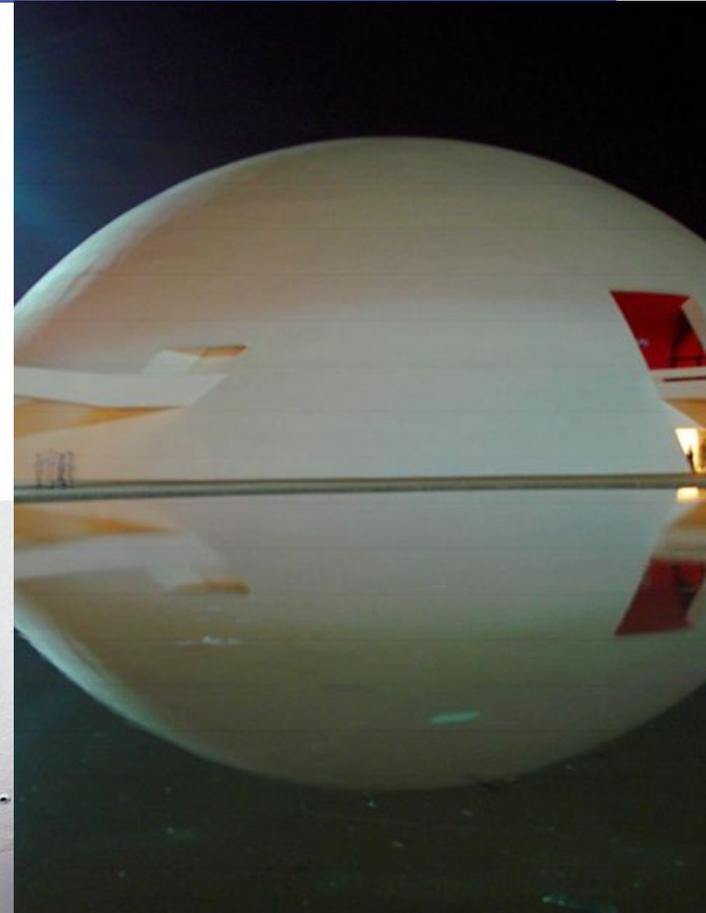




Norfolk Scope



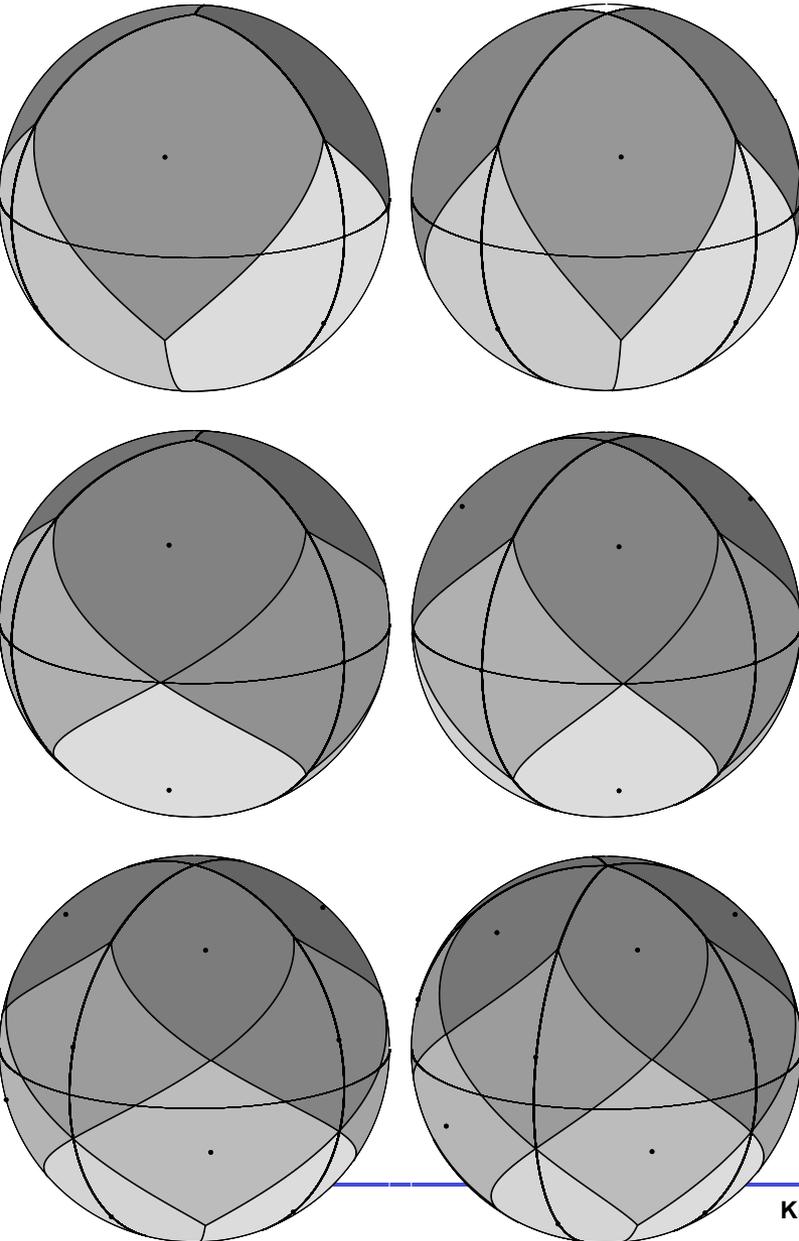
Museu Nacional da República



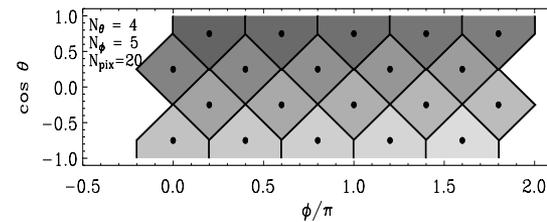
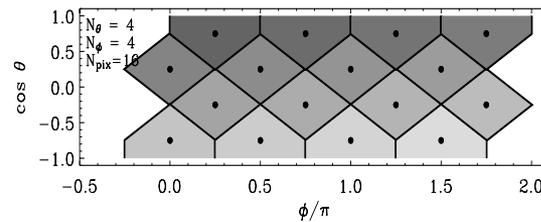
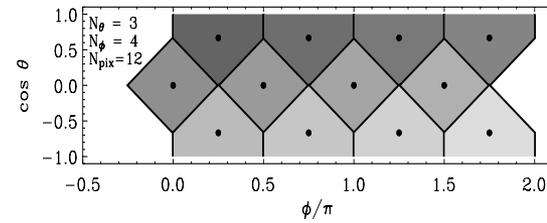
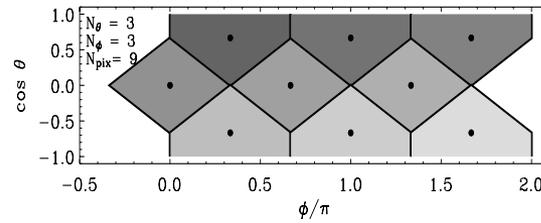
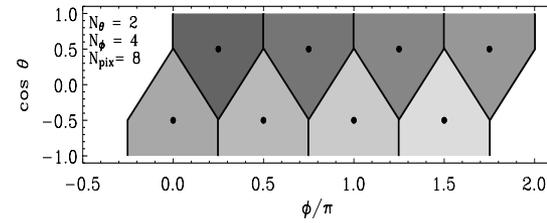
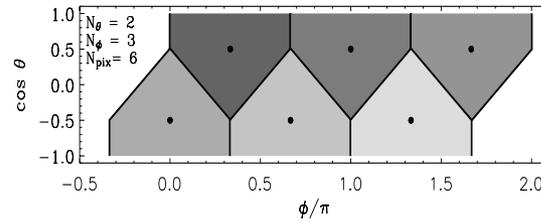


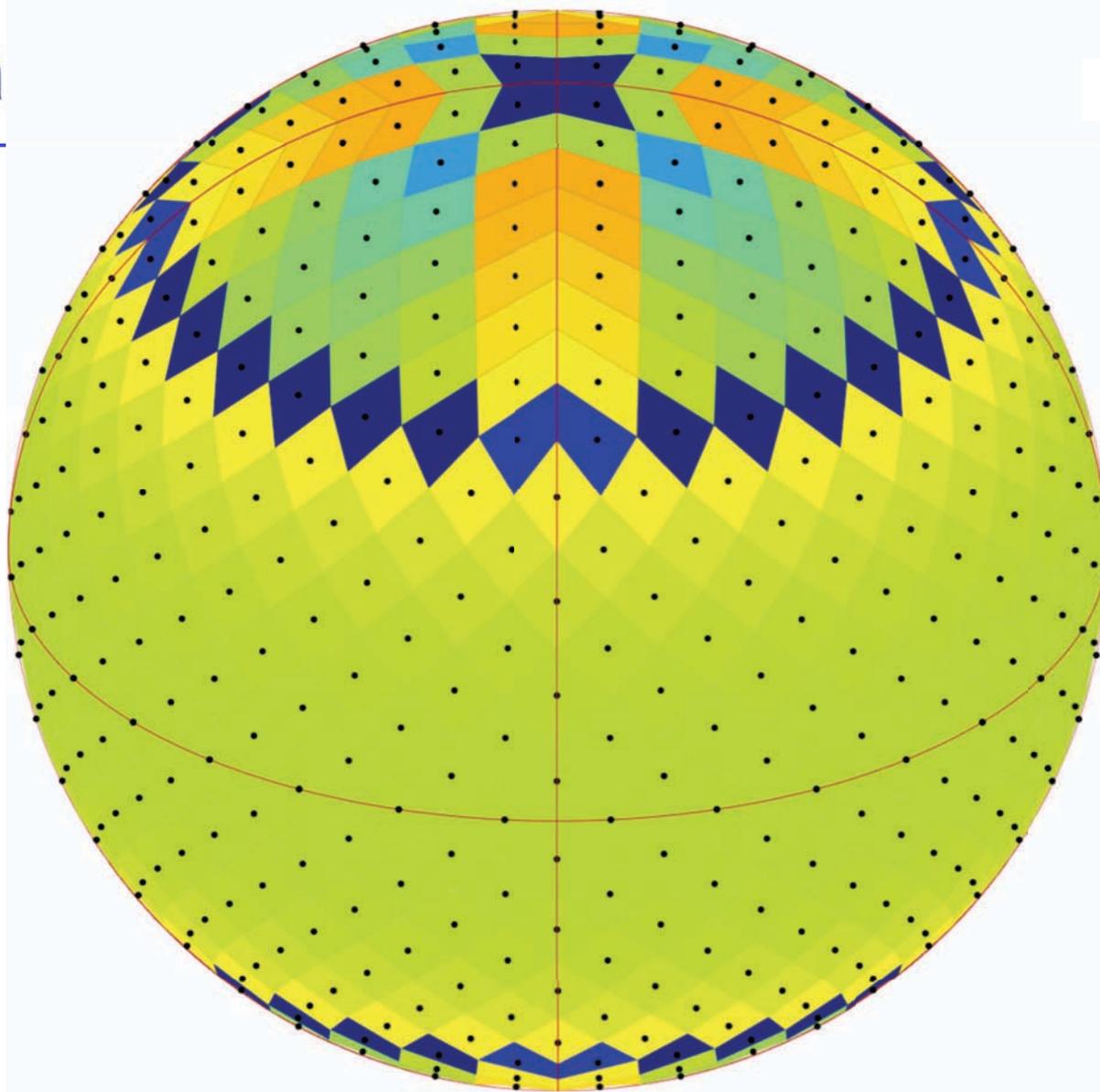
HEALPix

- **What do we want from an acceptable scheme for discretization of the sphere?**
 - **Isolatitude pointset (to support effective harmonic analysis), “a la Pantheon”, but ...**
 - **Hierarchical subdivisibility (to support efficient data handling – e.g. region definitions, data selection, map resolution changes, etc.), inherited from QuadCube, and**
 - **Uniformity of pixel size (to preserve photometric integrity of the maps), like QuadCube (or indeed better)**



**Figuring this out was essential
for the eventual emergence of HEALPix**





**Early stage
plot, before
we figured
out the
analytical
description
of pixel
boundaries**

0.98



1.02

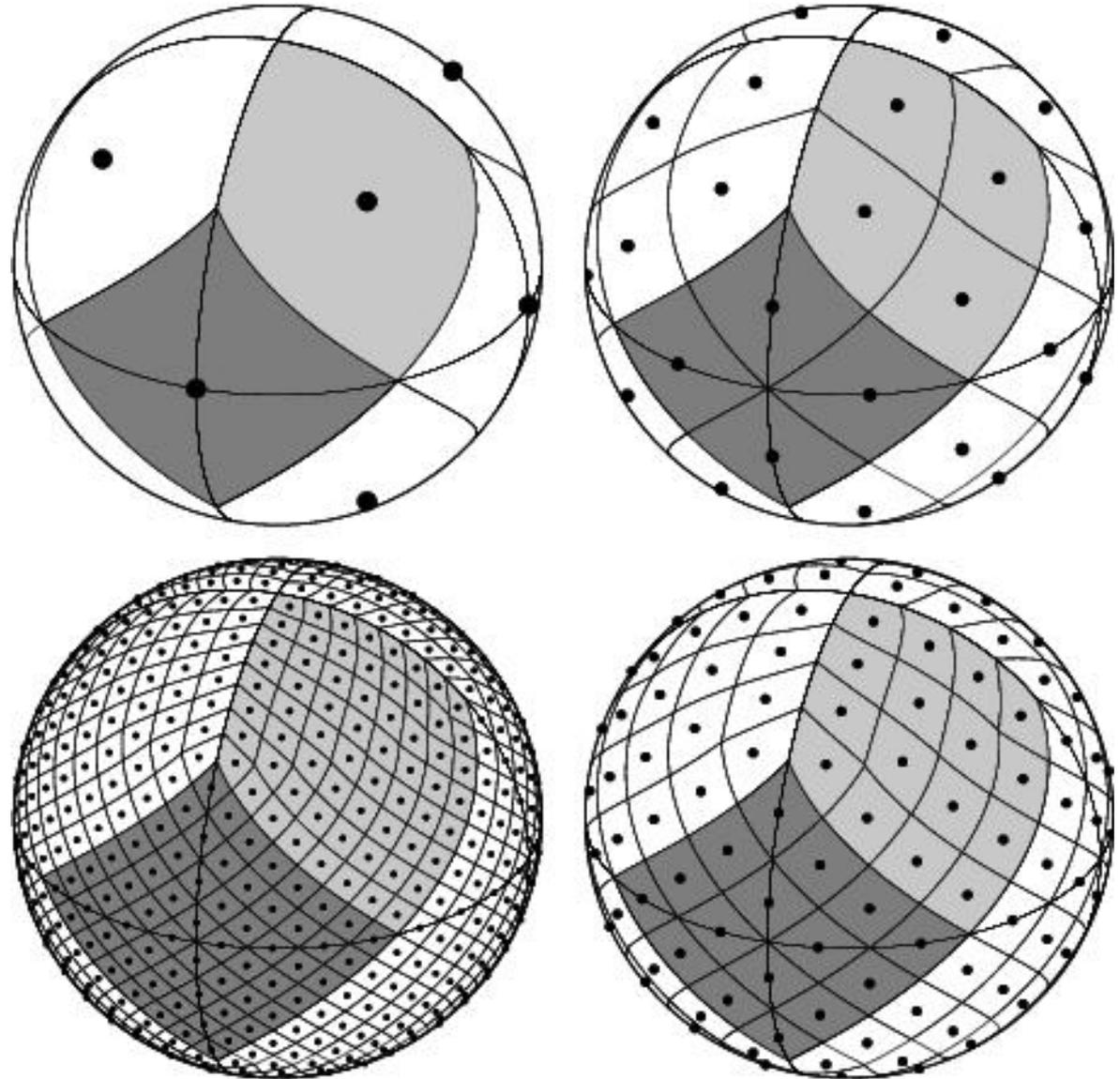
- **H**ierarchical
- **E**qual **A**rea
- **I**so-**L**atitude
- **P**ixelization

<http://healpix.jpl.nasa.gov>

Freely available, GNU-licensed software library (F90, C++, C, IDL) for discretization, synthesis, analysis, etc. of functions on the sphere;

Developed and supported since 1997; Used by WMAP and Planck; also Boomerang, Archeops, and other suborbital experiments;

Gorski, Hivon, Banday, Reinecke, Wandelt, Hansen, ...



k	$N_{\text{side}} = 2^k$	$N_{\text{pix}} = 12N_{\text{side}}^2$	$\theta_{\text{pix}} = \Omega_{\text{pix}}^{1/2}$
0.....	1	12	58°6
1.....	2	48	29°3
2.....	4	192	14°7
3.....	8	768	7°33
4.....	16	3072	3°66
5.....	32	12,288	1°83
6.....	64	49,152	55'0
7.....	128	196,608	27'5
8.....	256	786,432	13'7
9.....	512	3,145,728	6'87
10.....	1024	12,582,912	3'44
11.....	2048	50,331,648	1'72
12.....	4096	201,326,592	51''5
13.....	8192	805,306,368	25''8
14.....	2^{14}	3.22×10^9	12''9
15.....	2^{15}	1.29×10^{10}	6''44
16.....	2^{16}	5.15×10^{10}	3''22
17.....	2^{17}	2.06×10^{11}	1''61
⋮	⋮	⋮	⋮
29.....	2^{29}	3.46×10^{18}	$3''93 \times 10^{-4}$

NOTES.—Currently, the use of 32 bit signed integers for the pixel indexing restricts the resolution accessible to $N_{\text{side}} \leq 8192$. The use of 64 bit signed integers will allow a value $N_{\text{side}} = 2^{29}$ to be achieved. Note that k corresponds to the “resolution parameter” referred to by the *WMAP* team.

**What
range of
angular
scales can
be handled
by the
HEALPix
software?**

1. Pixel Position

For a resolution parameter N_{side} $4N_{\text{side}}-1$ isolatitude rings. Pixel centers are located on
($z=\cos\theta$, ϕ)

North Polar Spur, ring index, $i < N_{\text{side}}$ and pixel-in-ring index, $1 \leq j \leq 4i$

$$\phi = \frac{\pi}{2i} \left(j - \frac{s}{2} \right), \quad s = 1$$

$$z = 1 - \frac{i^2}{3N_{\text{side}}^2}$$

$$j = p + 1 - 2i(i-1), \quad i = I\left(\sqrt{p_h} - \sqrt{I(p_h)}\right) + 1, \quad p_h = (p+1)/2$$

North Equatorial Belt, ring index, $2N_{\text{side}} \geq i \geq N_{\text{side}}$ and pixel-in-ring index, $1 \leq j \leq N_{\text{side}}$

$$\phi = \frac{\pi}{2N_{\text{side}}} \left(j - \frac{s}{2} \right), \quad s = (i - N_{\text{side}} + 1) \bmod(2)$$

$$z = \frac{4}{3} - \frac{2i}{3N_{\text{side}}}$$

$$j = p' \bmod(4N_{\text{side}}) + 1, \quad i = I(p'/4N_{\text{side}}) + N_{\text{side}}, \quad p' = p - 2N_{\text{side}}(N_{\text{side}} - 1)$$

Pixel centers in southern hemisphere are obtained by the mirror-symmetry of the grid with respect to the equator.

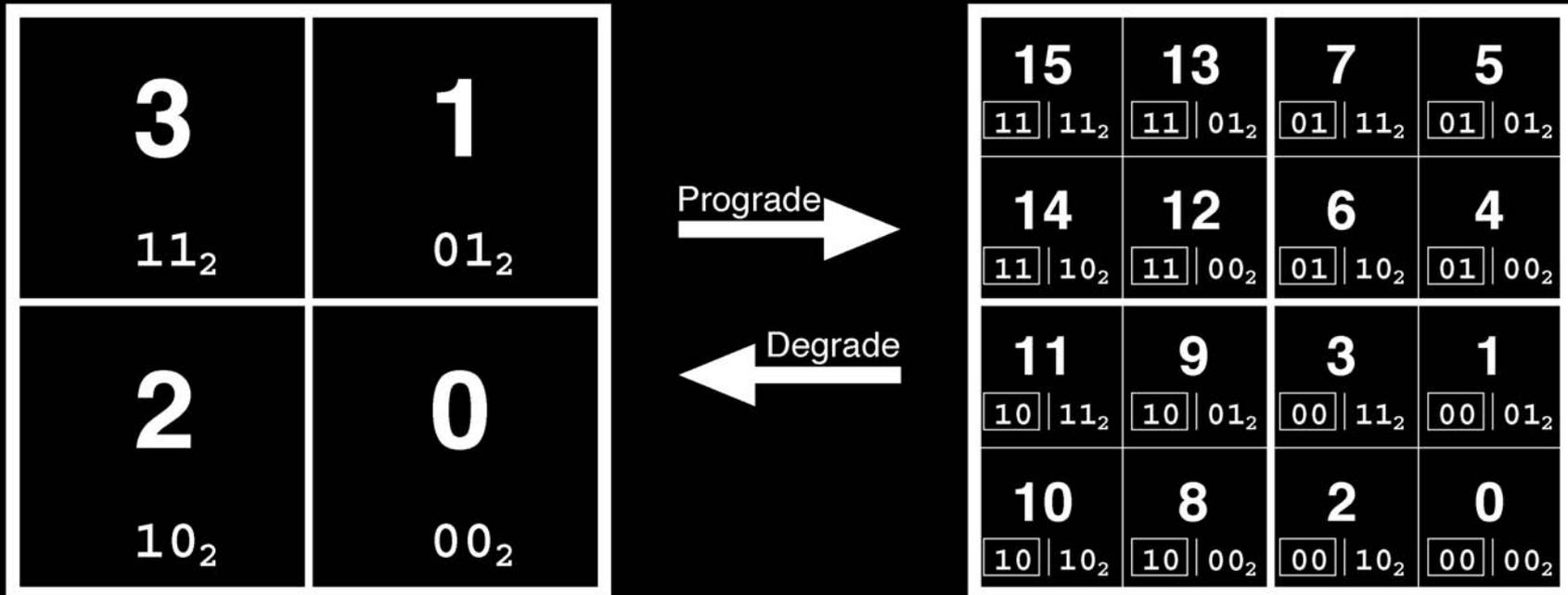
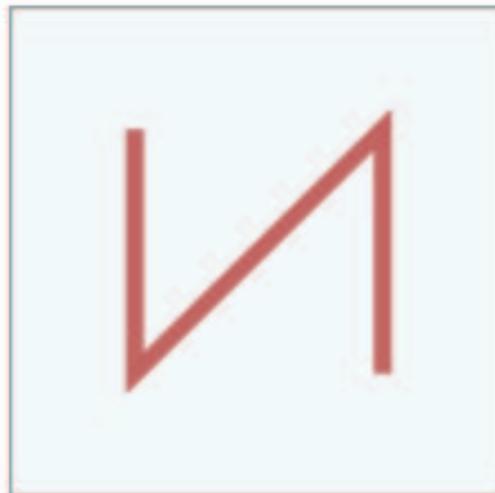
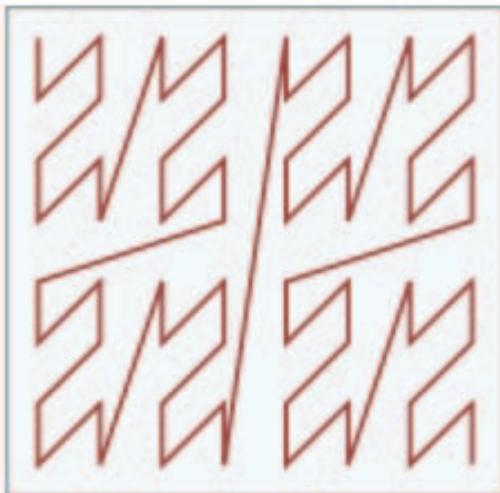
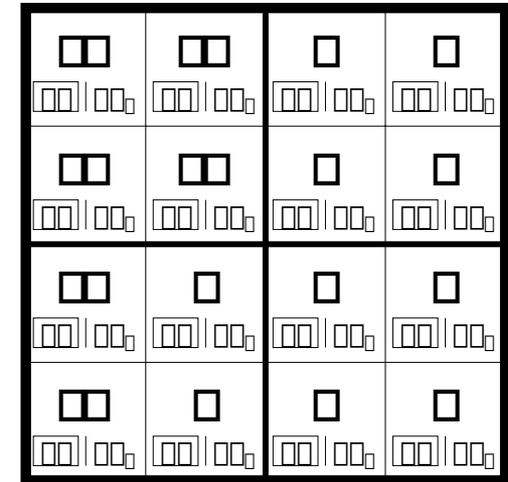
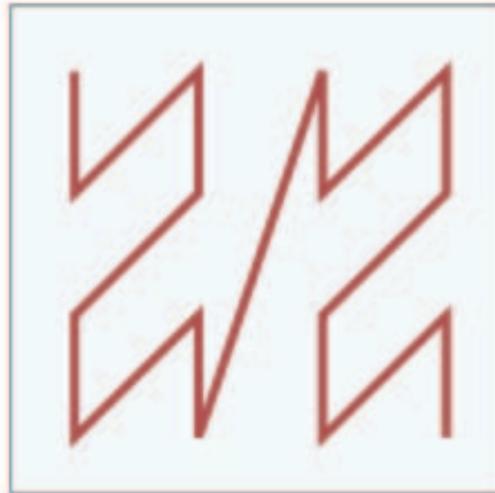
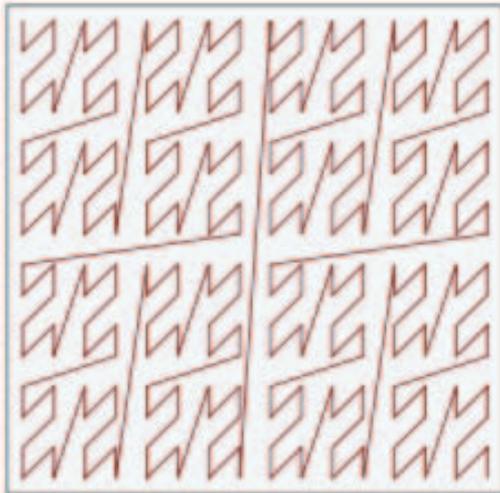
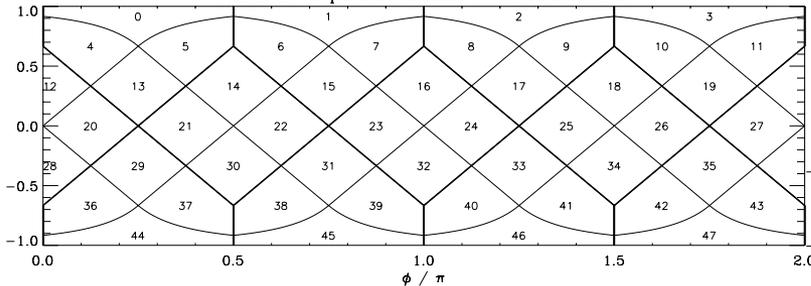


Figure 1: Quadrilateral tree pixel numbering. The coarsely pixelised coordinate patch on the left consists of four pixels. Two bits suffice to label the pixels. To increase the resolution, every pixel splits into 4 daughter pixels shown on the right. These daughters inherit the pixel index of their parent (boxed) and acquire two new bits to give the new pixel index. Several such curvilinearly mapped coordinate patches (12 in the case of **HEALPix**, and 6 in the case of the *COBE* quad-sphere) are joined at the boundaries to cover the sphere. All pixels indices carry a prefix (here omitted for clarity) which identifies which base-resolution pixel they belong to.

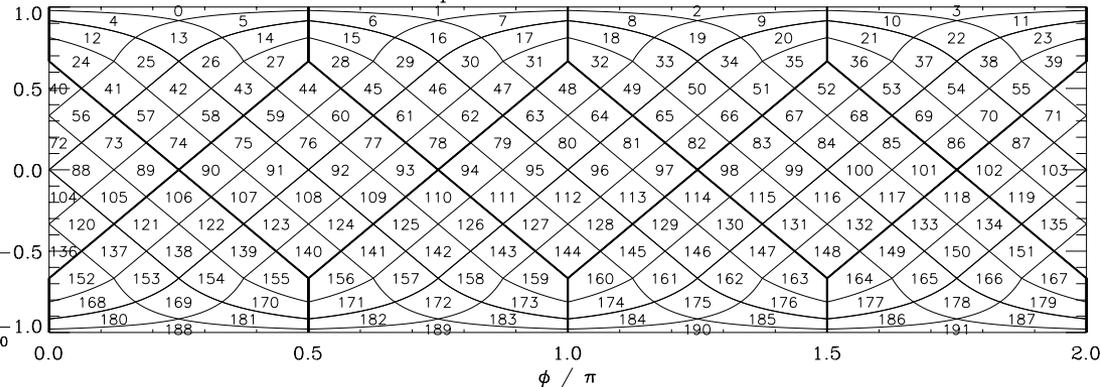


Z-order, Morton order, or Morton code is a function which maps multidimensional data to one dimension while preserving locality of the data points.

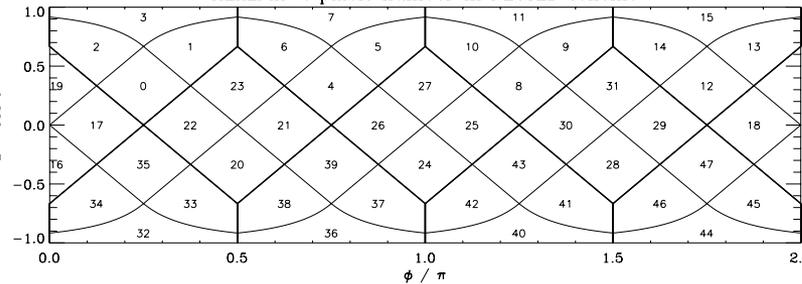
HEALPIX-2 pixels number in RING scheme



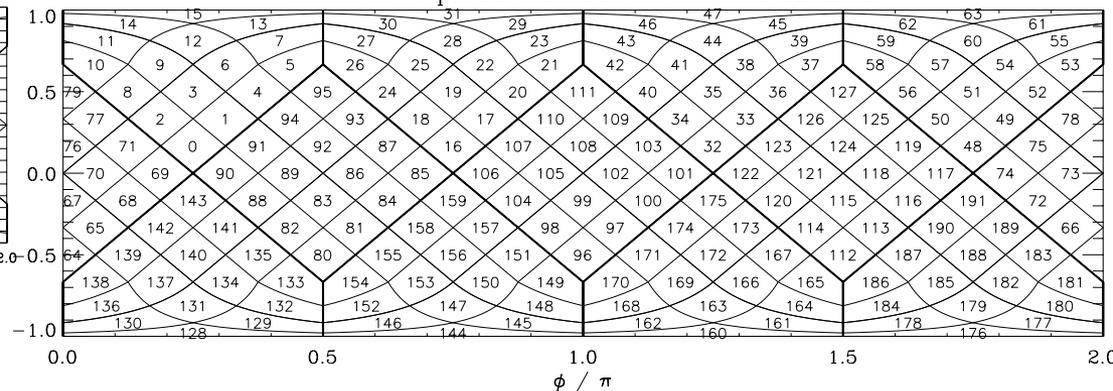
HEALPIX-4 pixels number in RING scheme



HEALPIX-2 pixels number in NESTED scheme



HEALPIX-4 pixels number in NESTED scheme



**Again, 1-d data representation
of the 2-d configuration space that preserves
proximity in both spaces**

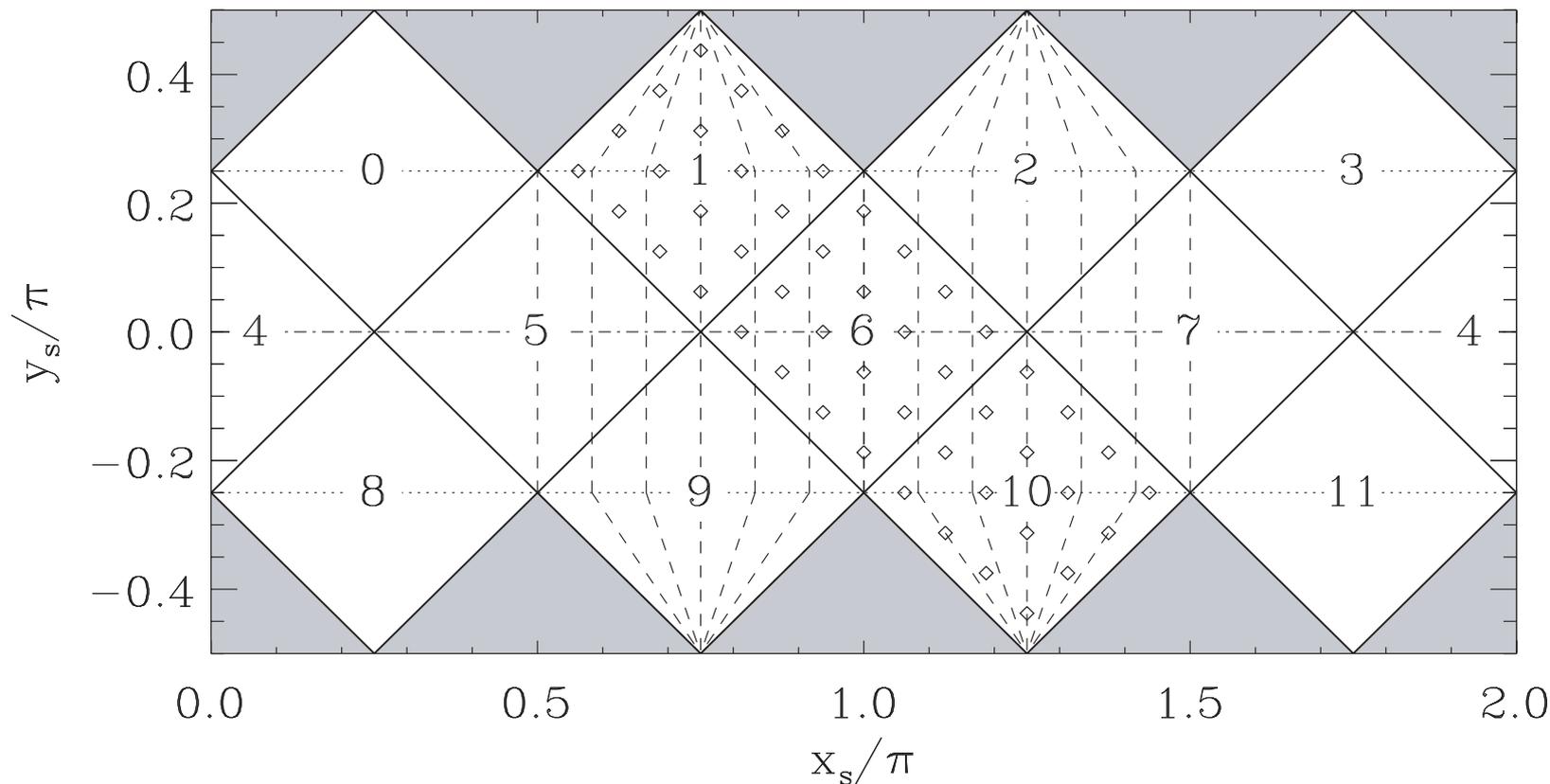
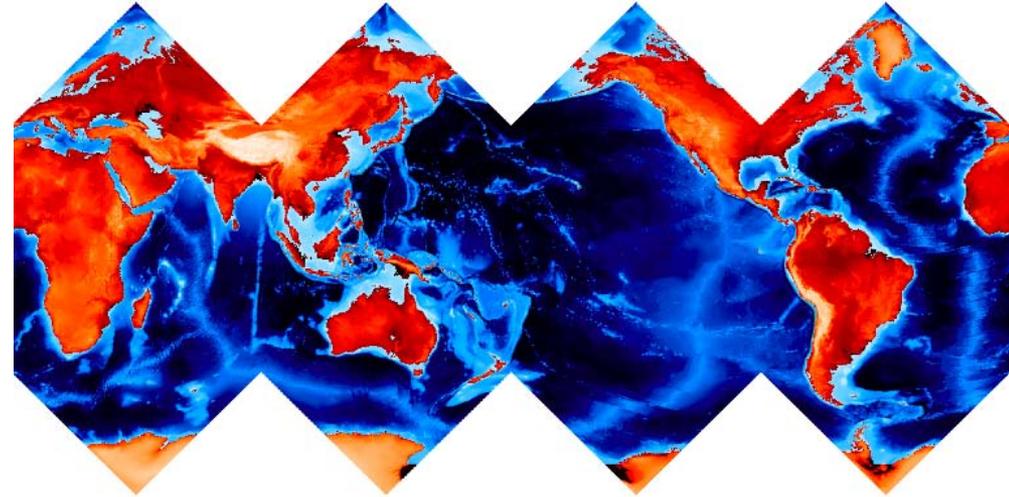
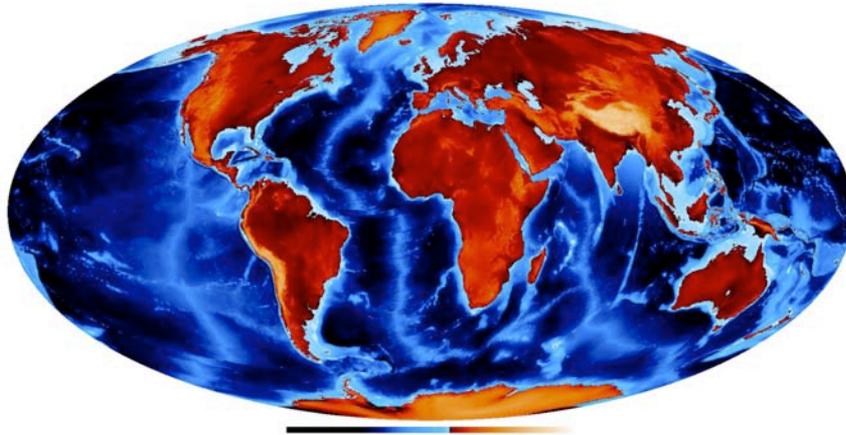


FIG. 5.—Spherical HEALPix projection onto the plane. Base-resolution HEALPix pixels (indexed here from 0 to 11, as in the HEALPix software) project into 12 identical square pixels in the plane. Hierarchical subdivision of the HEALPix grid generates identical square pixel images over the entire planar image of the HEALPix tessellation ($N_{\text{side}} = 4$ pixel centers are shown within the base pixels 1, 6, and 10). Constant-latitude lines map into horizontal lines on the plane (*dashed lines*), and the HEALPix spherical projection mapping of meridians on one hemisphere is shown by the dashed lines.



- Old subject in cartography - Flattening the Earth
- **Górski, K.M., Hivon, E., Banday, A.J., Wandelt, B.D., Hansen, F.K., Reinecke, M., Bartelmann, M., 2005, Ap.J., 622, pp. 759-771, "HEALPix: A Framework for High-Resolution Discretization and Fast Analysis of Data Distributed on the Sphere"**
 - Description of "HEALPix projection" from the sphere to the plane
- **Calabretta, M.R., and Roukema, B.F., 2007, MNRAS, 381, pp. 865-872, "Mapping on the HEALPix grid"**
 - HEALPix - a hybrid of the cylindrical equal area (equatorial region), and interrupted Collignon (polar regions) cartographic projections

The HEALPix Projection

HEALPix, **H**ierarchical **E**qual **A**rea and iso**L**atitude **P**ixelisation (Górski and others, 1999), is a collection of standards and resources for efficient storage and processing of large sets of data for astronomical and cosmological research. At discrete points ("pixels") covering a conceptual celestial sphere surrounding the Earth, satellite probes detect incoming radiation, like gamma rays and the cosmic microwave background; the measured values are saved on a raster grid for further analysis.

HEALPix defines a family of hybrid interrupted pseudocylindrical projections mapping from the celestial sphere to the plane. A HEALPix map comprises H lobes; in each lobe in the normal aspect, the equatorial band is mapped to a square using Lambert's equal-area cylindrical projection; the polar areas are mapped to two right isosceles triangles using a rescaled, interrupted form of Collignon's projection. The boundary parallels, approximately $41^{\circ}48'37''$ N and S, are chosen in order to make the triangular regions cover 1/3 of the total area.

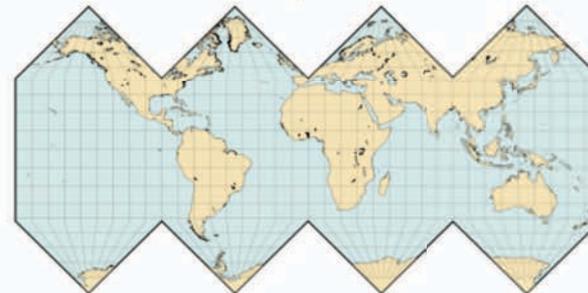
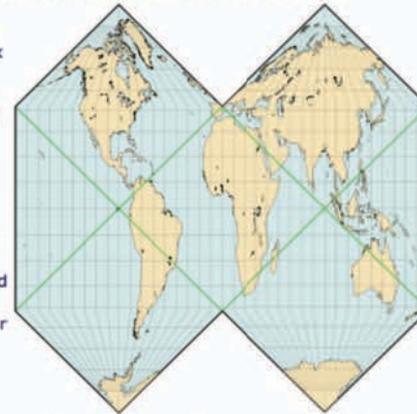
For a special case, with $H = 2$ and dispensing with the equatorial band, the result is an interrupted Collignon map in two squares. In general, changing H affects the unscaled aspect ratio (much like in variations of Lambert's projection) and the parallel of least shape distortion; the most common case, $H = 4$, can be trivially folded into a cube, like polyhedral projections.

The whole map may be divided into $3H$ identical facets, each a square with vertical and horizontal diagonals; a single facet is split along the boundary opposite the central meridian, but this can be fixed moving one half to the opposite side of the map, leaving all facets whole in a herringbone lay-out. Further, each facet may be recursively divided into 4 smaller squares. This hierarchical organization allows data processing in different levels of detail. In the last level, pixels are also squares with horizontal and vertical diagonals; this unorthodox orientation may be fixed by the artifice of rotating the entire map by 45 degrees. Since the overall result is equal-area, raster computation yields consistent results. The pseudocylindrical property provides uniform pixel distribution along parallels. Another favorable feature for large data sets is the easily predictable number and location of neighbor pixels.

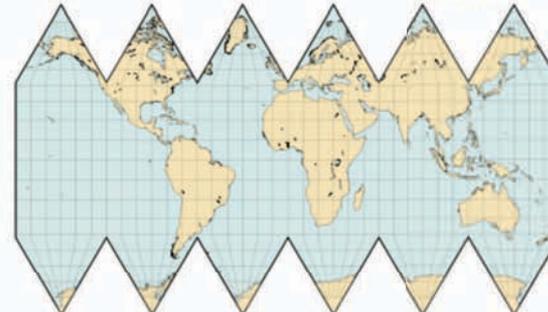
World maps in the HEALPix projection

Although the main purpose of HEALPix is not cartographical, using its projection for world maps shows some interesting properties.

This HEALPix map with $H = 2$ has facet edges marked in green. Each facet can be further hierarchically subdivided into smaller squares.



HEALPix map with $H = 4$. Compared with the map above, facets are still square, but the overall aspect ratio differs.



HEALPix map with $H = 6$, rescaled in order to show facets as equilateral triangles. Each facet may be subdivided into four triangles.

- Current measurements are quite consistent with the primary fluctuations in the CMB being a Gaussian random field.
- The primary fluctuations in the CMB are thus well described by their angular power spectrum.

$$\frac{\Delta T}{T} \equiv \sum_{\ell m} a_{\ell m} Y_{\ell m}(\theta, \phi)$$

Curved sky analogue of FT

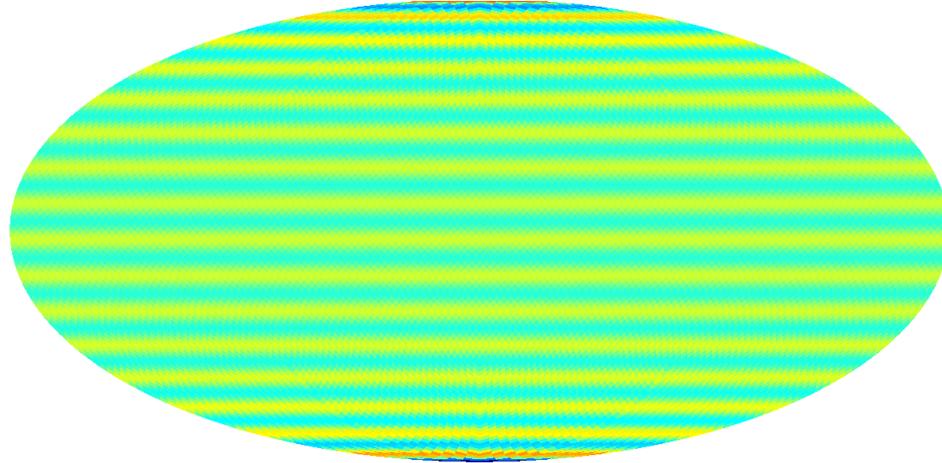
$$\langle a_{\ell m} a_{\ell' m'} \rangle = C_{\ell} \delta_{\ell \ell'} \delta_{m m'}$$

Statistical isotropy

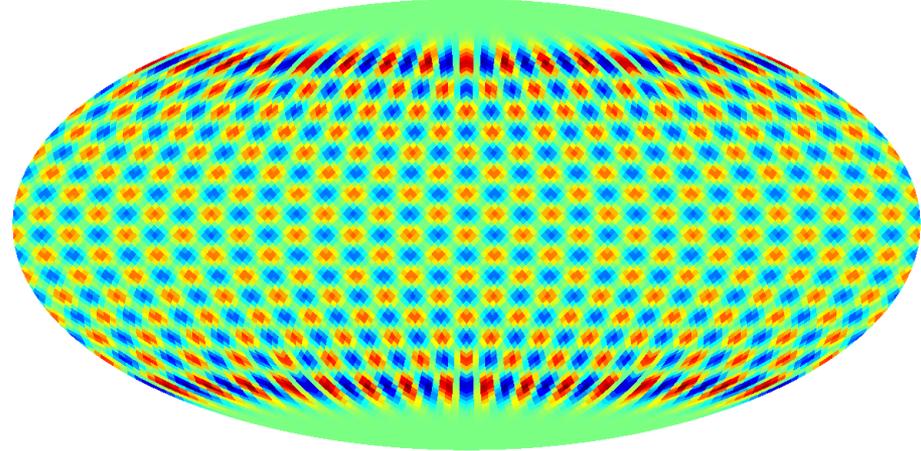
Rotational invariance



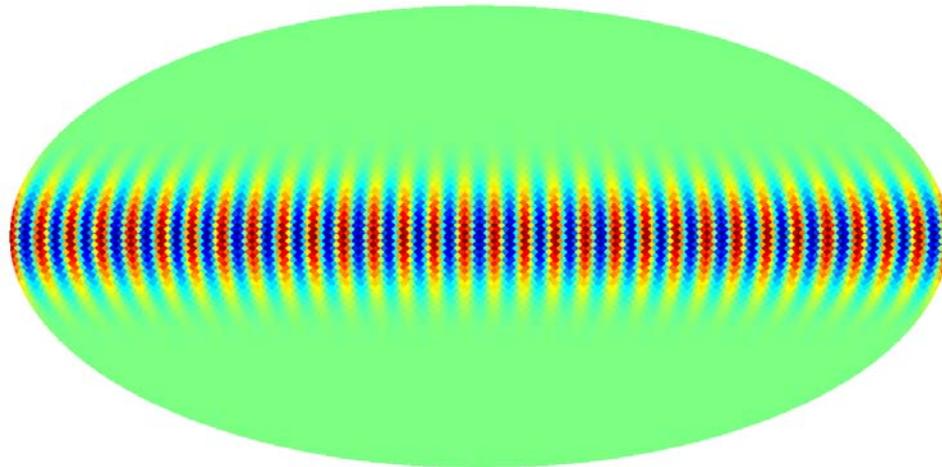
$l=31$ $m=0$



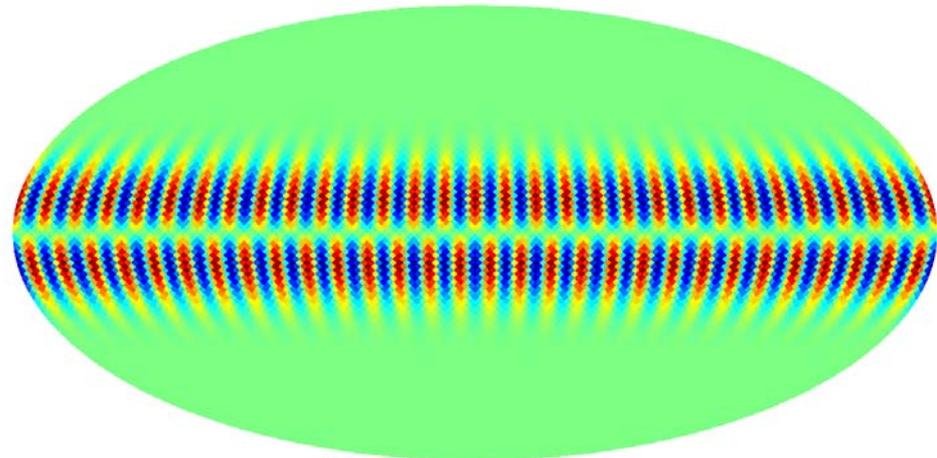
$L=31$ $m=16$



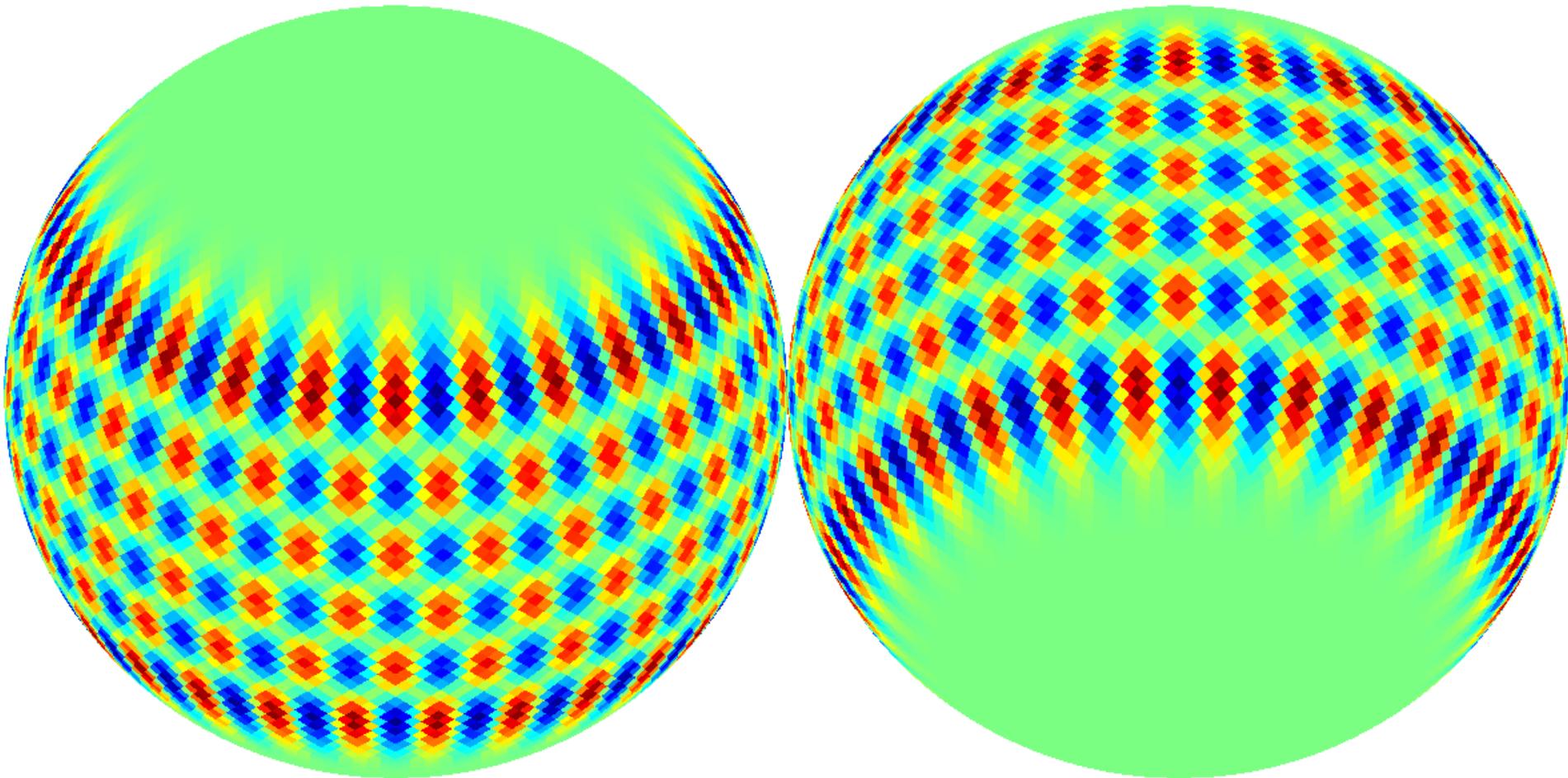
$l=31$ $m=31$



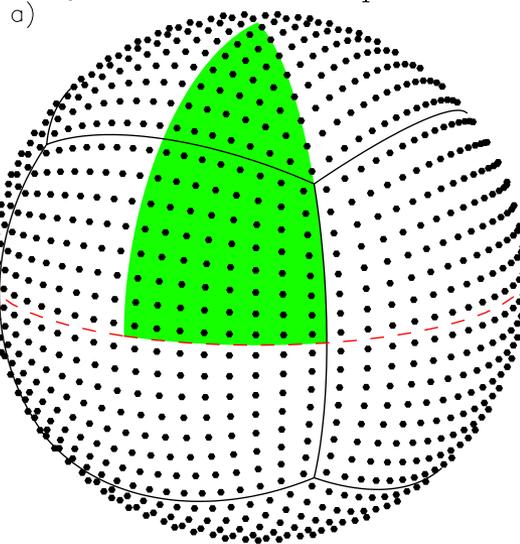
$L=31$ $m=30$



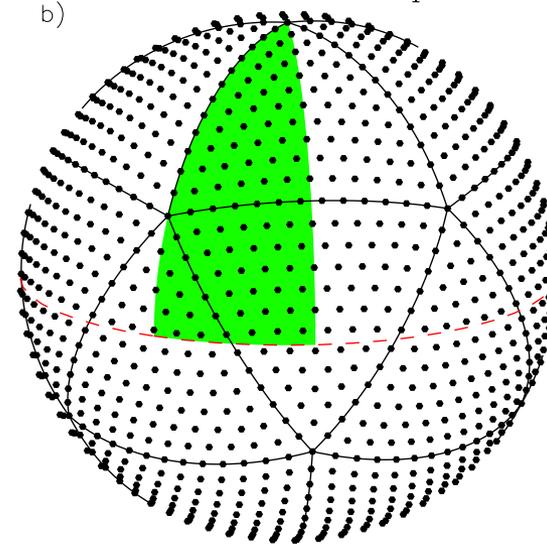
$l=31$ $m=16$



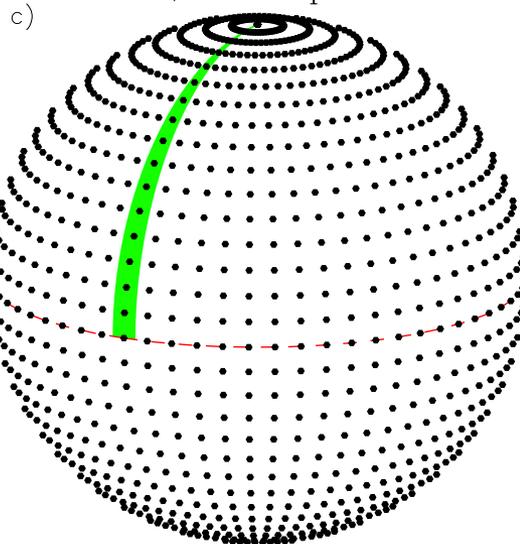
QuadCube, 1536 pixels



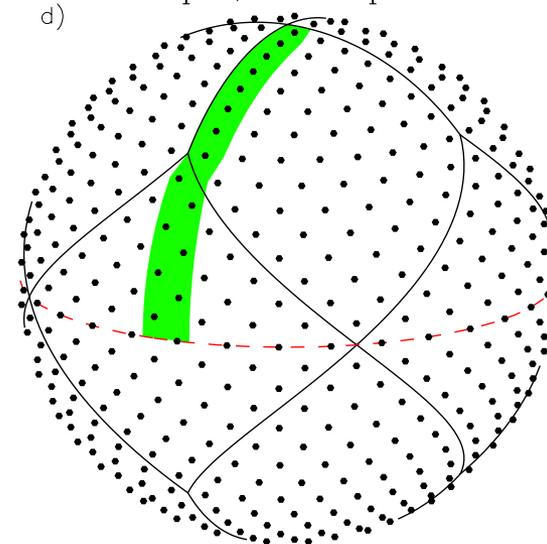
Icosahedron, 1692 pixels



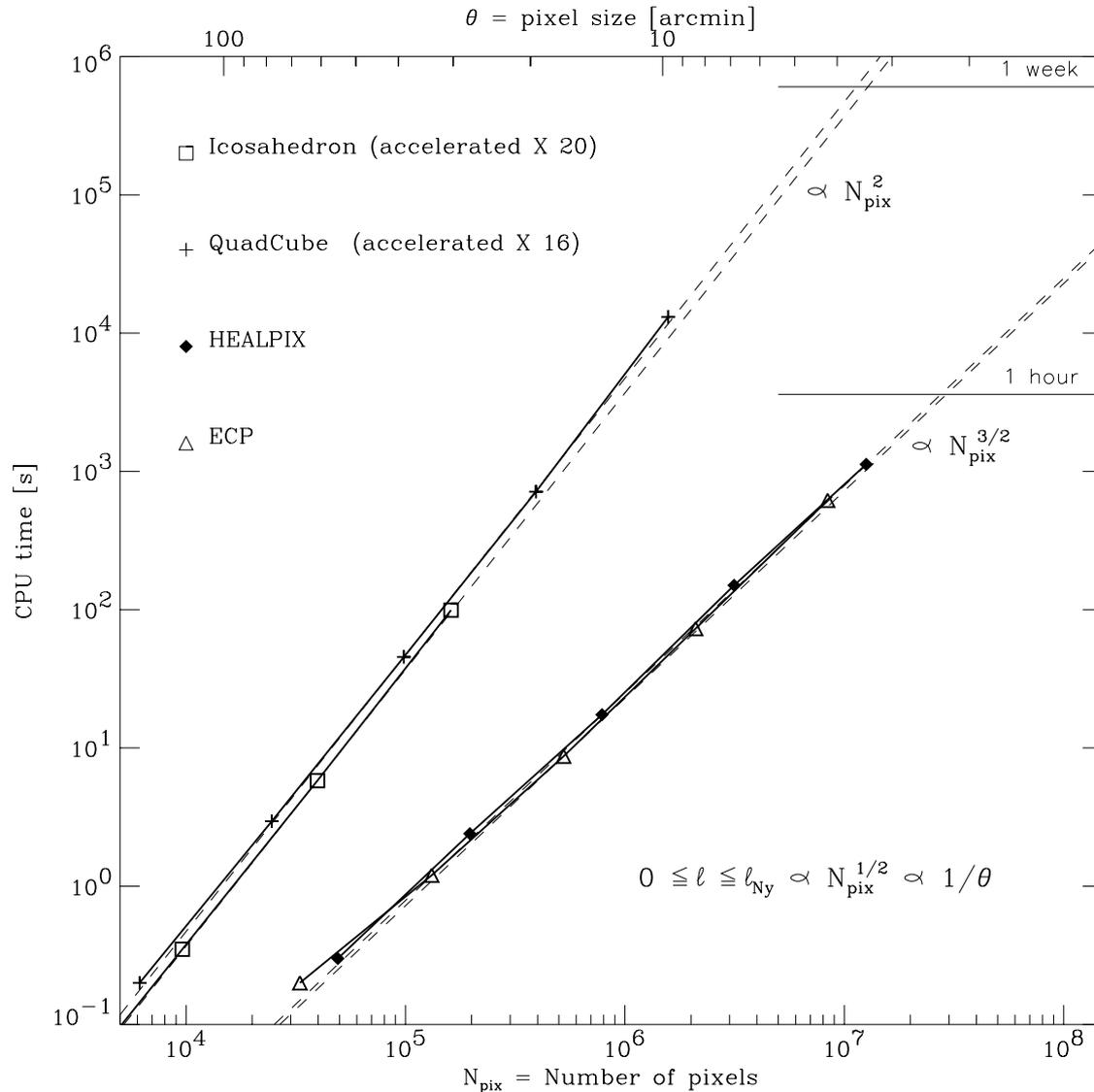
ECP, 2112 pixels



Healpix, 768 pixels

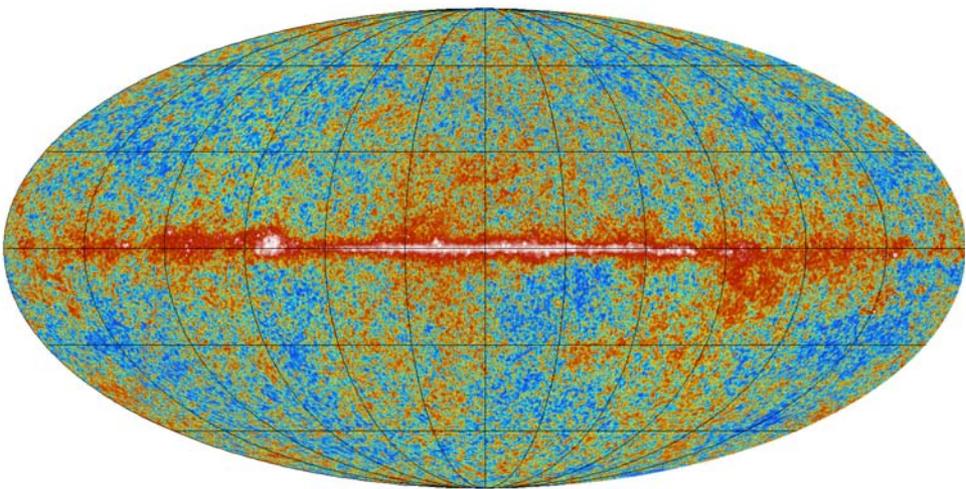


Map Making from Power Spectrum

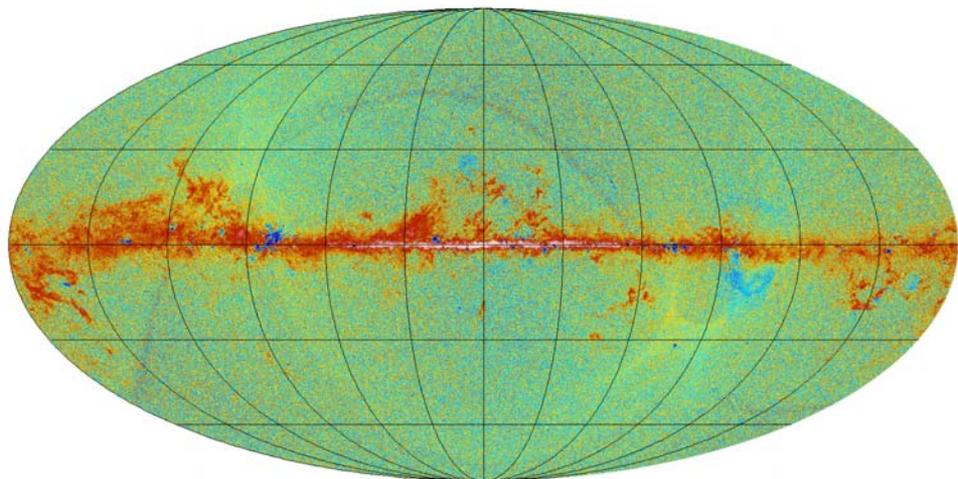


Quick look at large and intermediate angular scales: 70 vs. 100 GHz

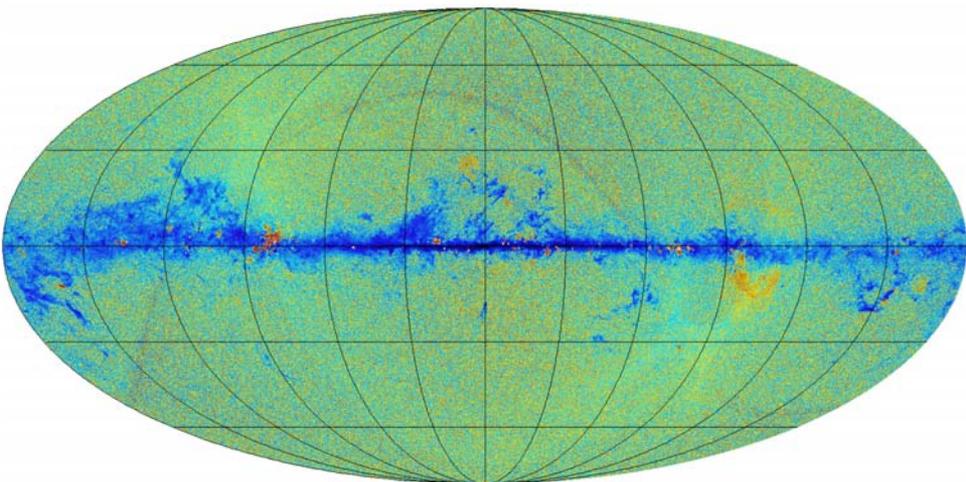
Planck Nominal Mission LFI 70 GHz



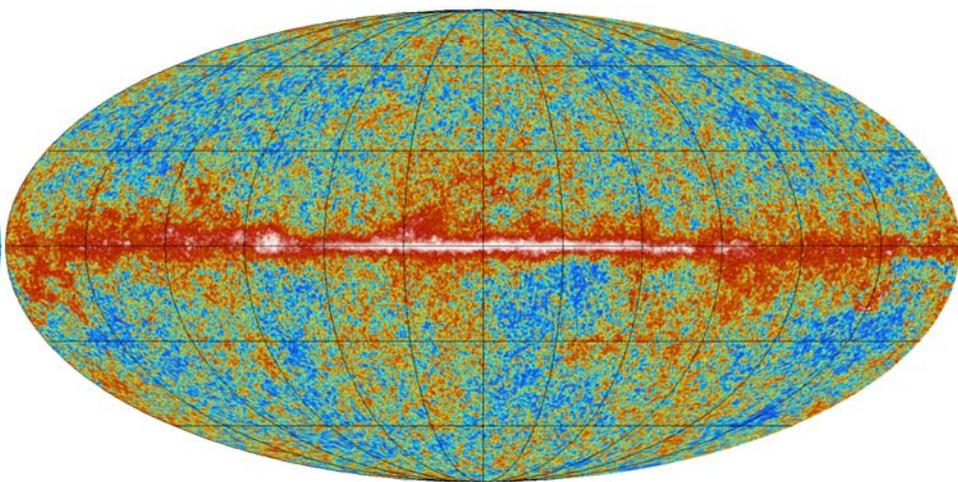
Planck Nominal Mission "100-70"



Planck Nominal Mission "70-100"



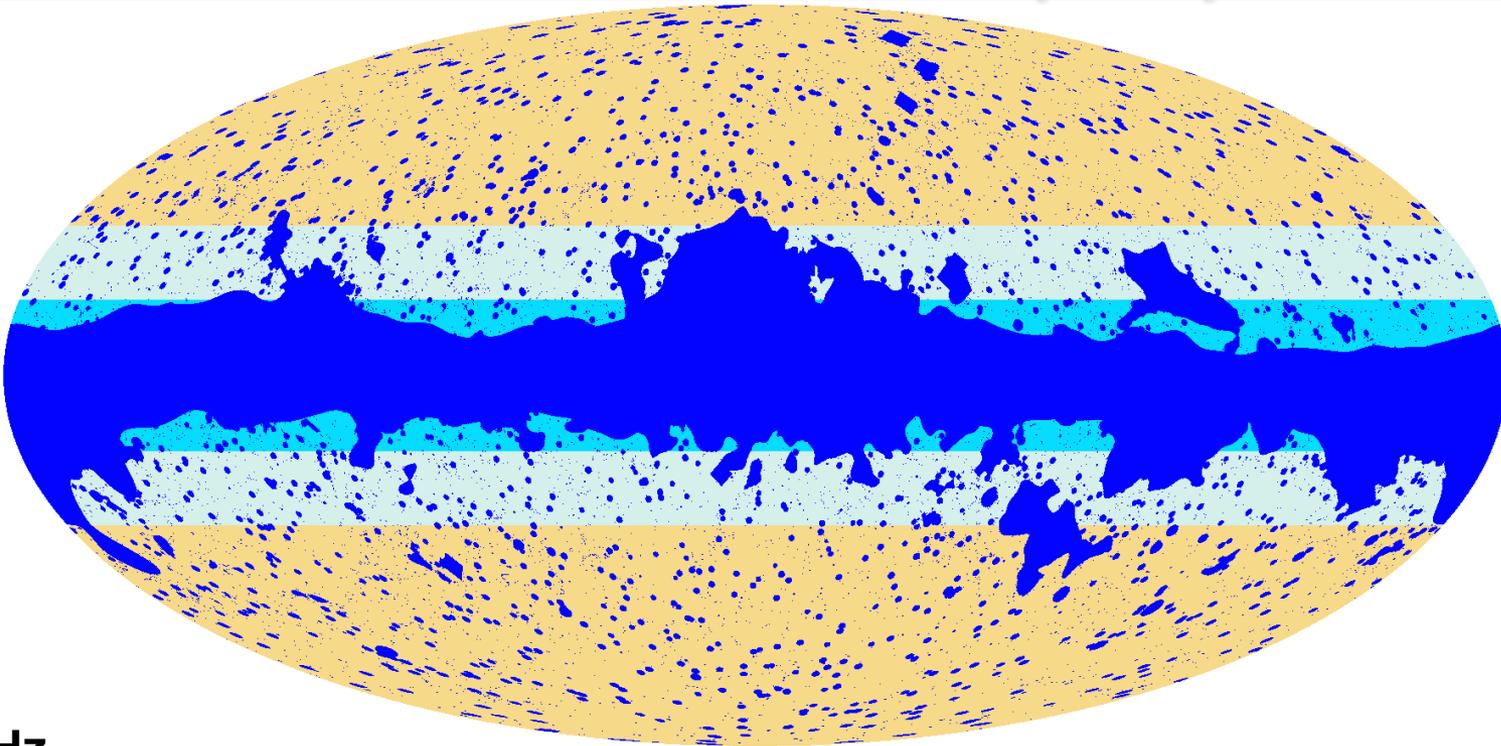
Planck Nominal Mission HFI 100 GHz



$\delta T_{CMB} [\mu K]$



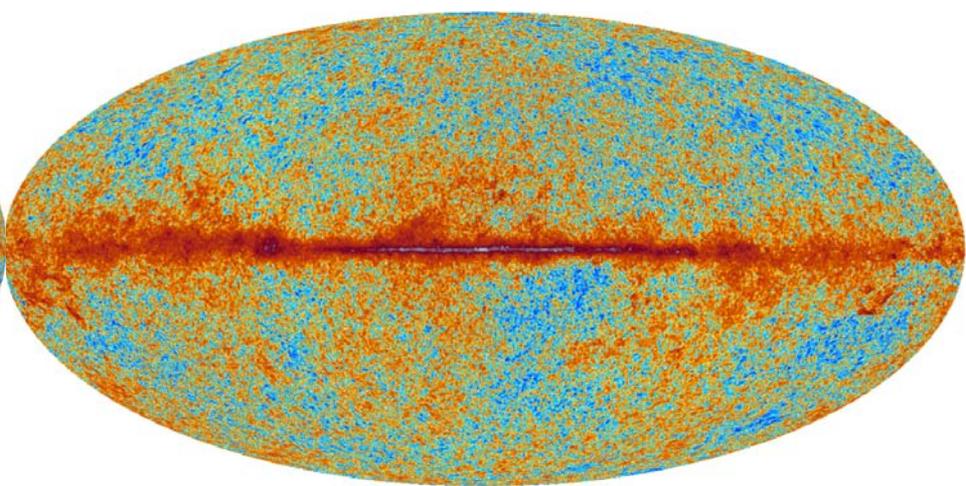
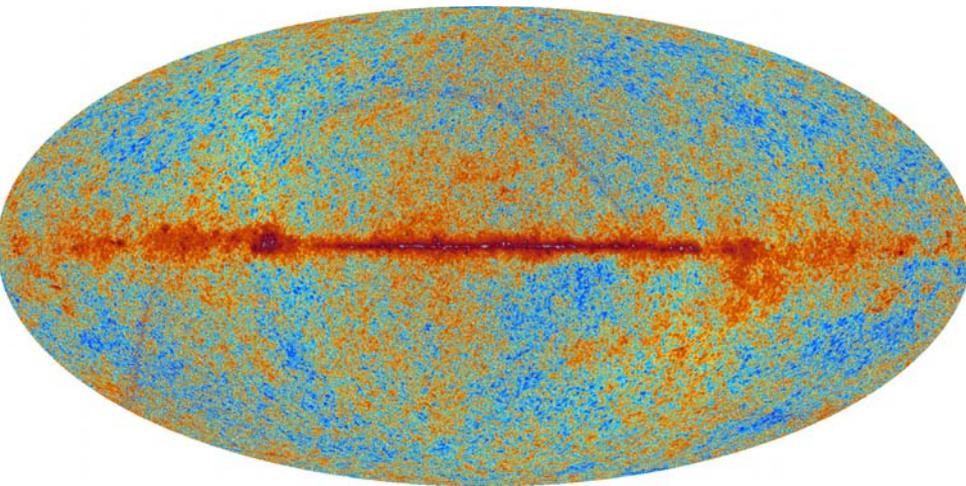
Some masks that we use for *Planck* vs. WMAP consistency analysis



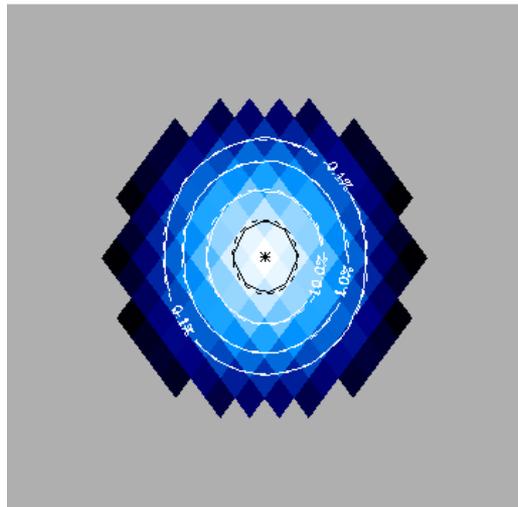
Union
of
WMAP
kq85
and
Planck
comp-
sep
mask

70 GHz

100 GHz

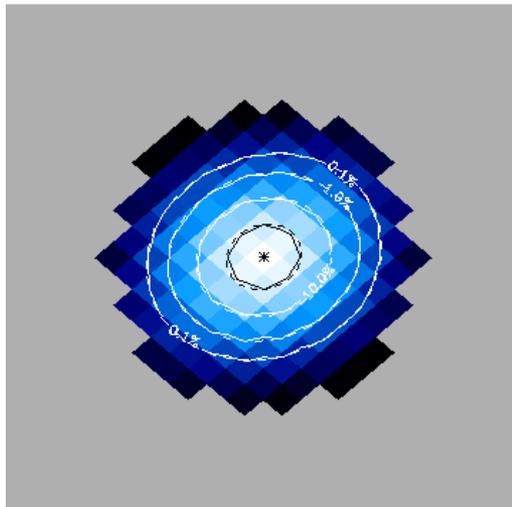


CoP_dx5 EG 100 survey1 PSF : pix #1017
 Fit: $\theta_{FWHM}=9.75'$, $e=1.168$, $\psi_{eff}=4.7^\circ$, $\Delta_{MUSE}=0.72\%$



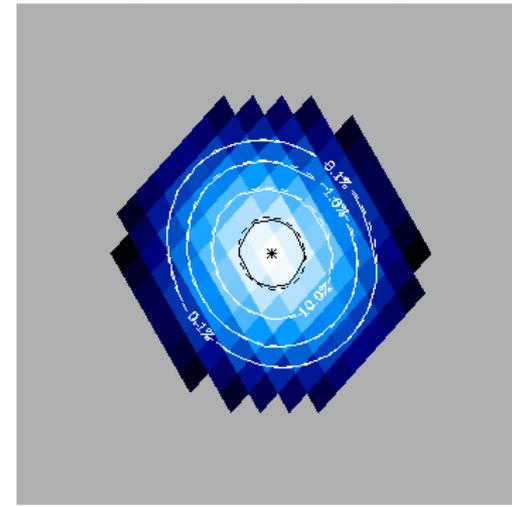
-1.0 5.0 Log ()
 (86.1, -38.2) Galactic

CoP_dx5 EG 100 survey1 PSF : pix #692
 Fit: $\theta_{FWHM}=9.77'$, $e=1.173$, $\psi_{eff}=-68.4^\circ$, $\Delta_{MUSE}=1.71\%$



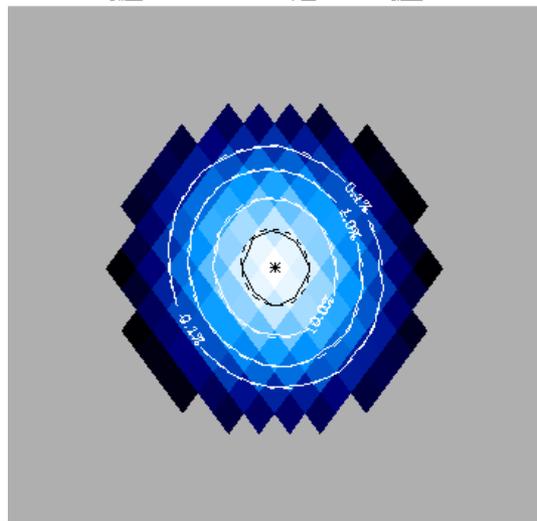
-1.0 5.0 Log ()
 (184.6, -5.8) Galactic

CoP_dx5 EG 100 survey1 PSF : pix #1018
 Fit: $\theta_{FWHM}=9.80'$, $e=1.152$, $\psi_{eff}=23.5^\circ$, $\Delta_{MUSE}=1.07\%$



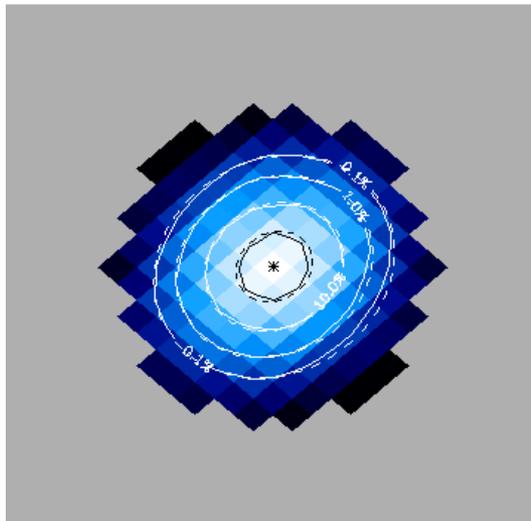
-1.0 5.0 Log ()
 (305.1, 57.1) Galactic

CoP_dx5 EG 100 survey2 PSF : pix #1017
 Fit: $\theta_{FWHM}=9.79'$, $e=1.183$, $\psi_{eff}=14.9^\circ$, $\Delta_{MUSE}=2.57\%$



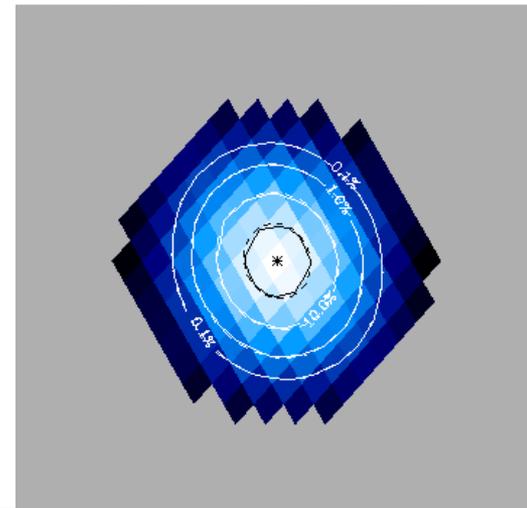
-1.0 5.0 Log ()
 (86.1, -38.2) Galactic

CoP_dx5 EG 100 survey2 PSF : pix #692
 Fit: $\theta_{FWHM}=9.89'$, $e=1.180$, $\psi_{eff}=-57.3^\circ$, $\Delta_{MUSE}=3.38\%$



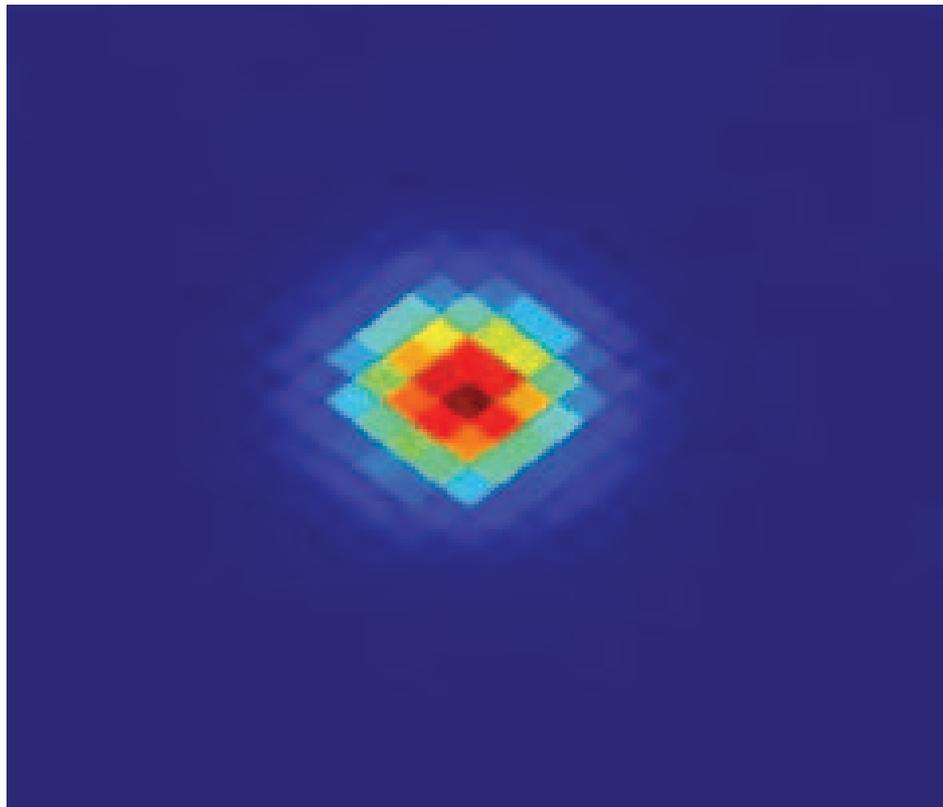
-1.0 5.0 Log ()
 (184.6, -5.8) Galactic

CoP_dx5 EG 100 survey2 PSF : pix #1018
 Fit: $\theta_{FWHM}=9.77'$, $e=1.170$, $\psi_{eff}=16.3^\circ$, $\Delta_{MUSE}=1.39\%$

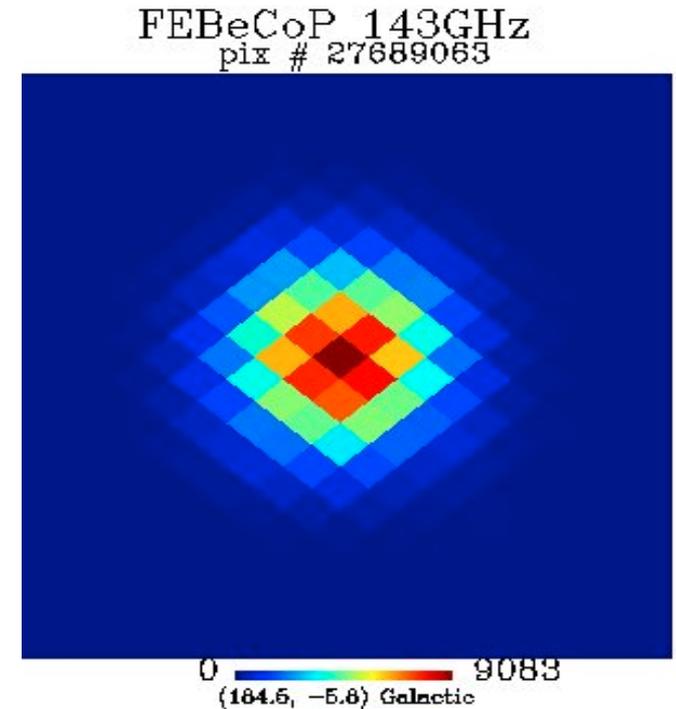


-1.0 5.0 Log ()
 (305.1, 57.1) Galactic

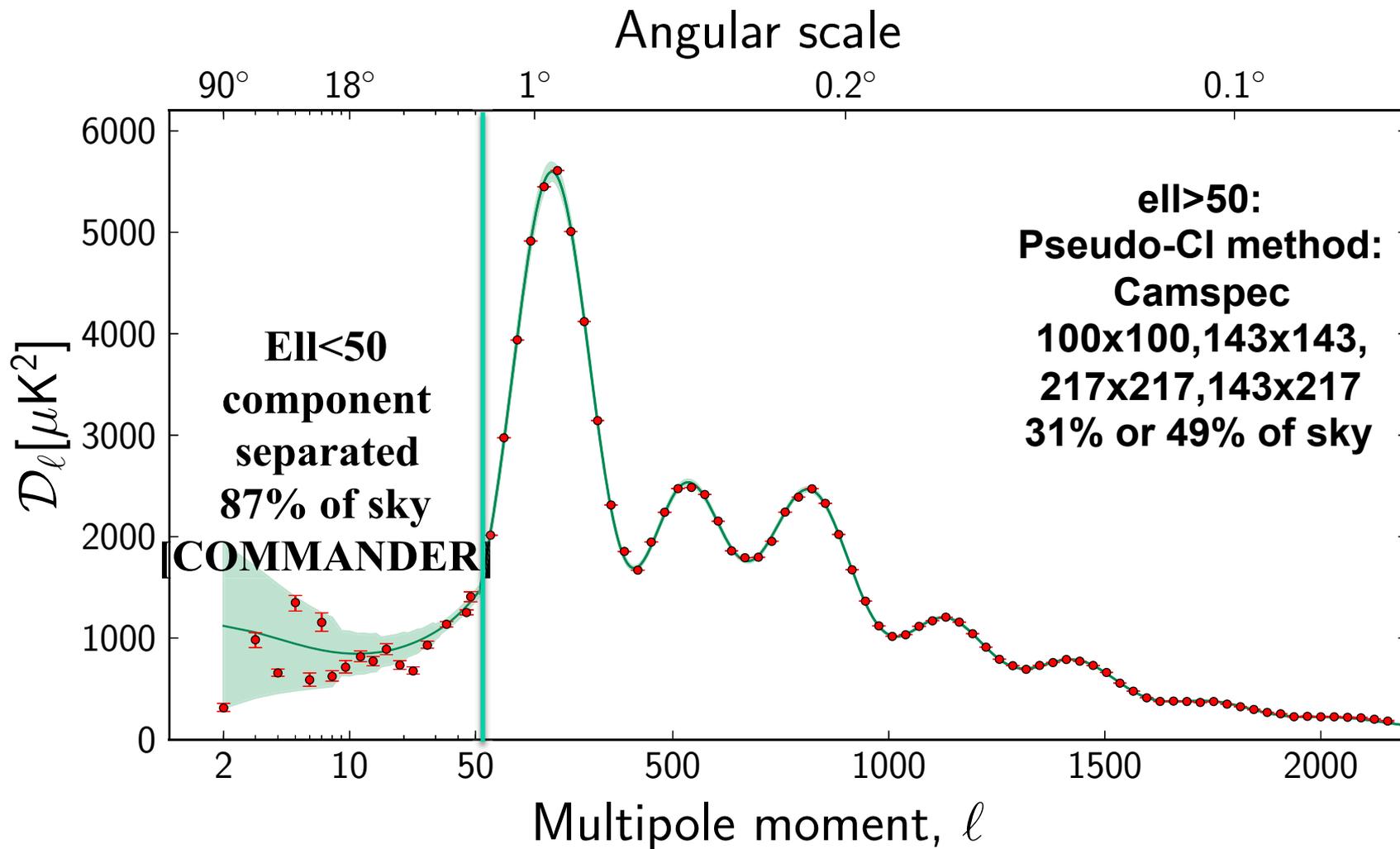
- Modeling Planck response to the sky signal, both diffuse and form discrete sources



Crab @ 143 GHz, I



FEBeCoP @ 143 GHz, I





... but that is an altogether different story

TBC

... but all of that (sky maps -> science) works with the methodology, data structure, and computing/analytical and data handling tools conceptualized and assembled in

HEALPix