

astro8405

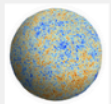
An Introduction to the Cosmic Microwave Background

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eCampus | Lernplattform der Universität Bonn



astro8405: The Cosmic Microwave Background

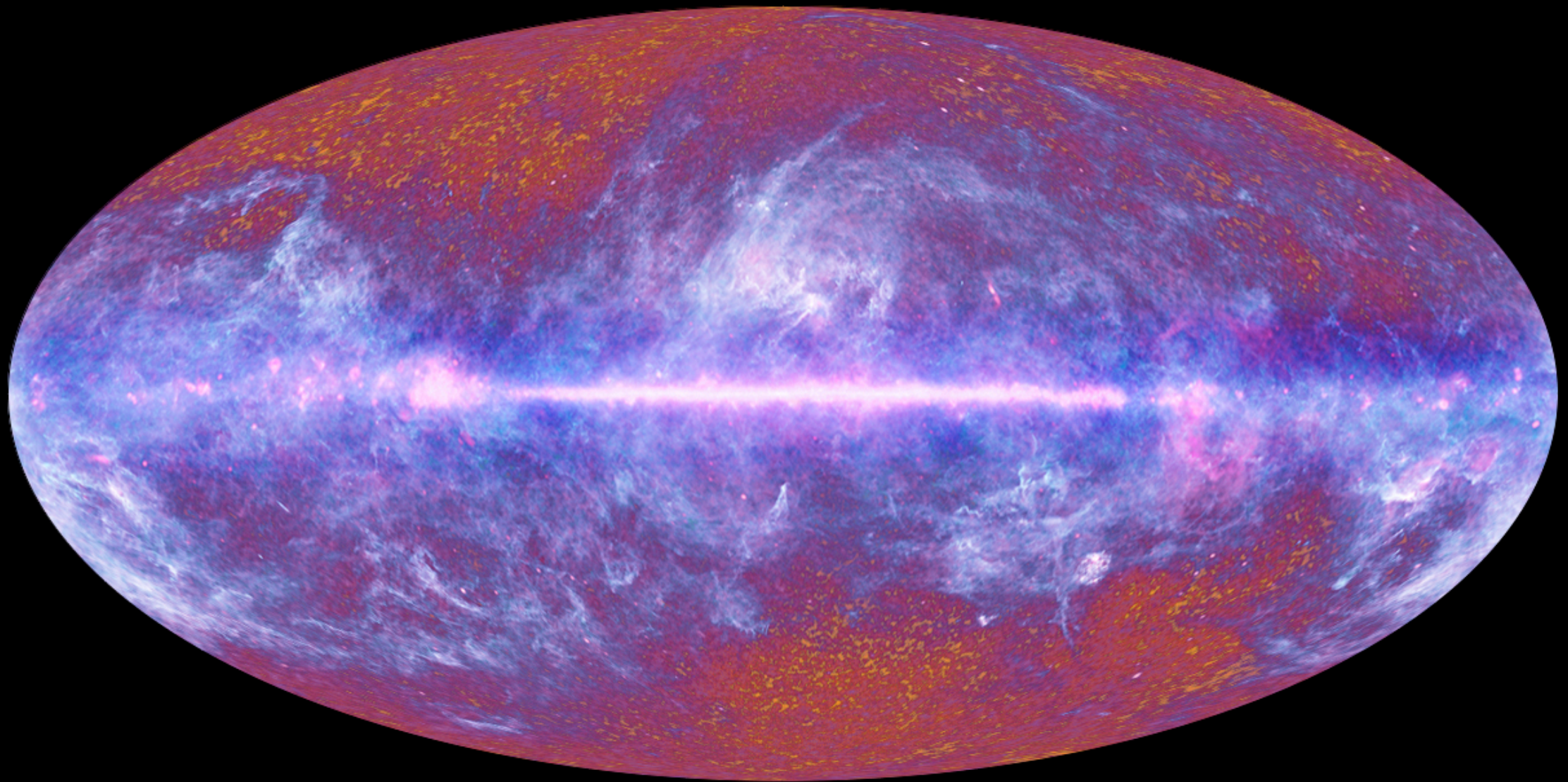
Aktionen ▼

This course intends to give you a modern and up-to-date introduction to the science and experimental techniques relating to the Cosmic Microwave Background. No prior knowledge of cosmology is necessary, your prerequisite are a basic understanding of electrodynamics and thermal physics and some familiarity with Python programming.

Lecture 10:

CMB Foregrounds and Component Separation

The “CMB sky”

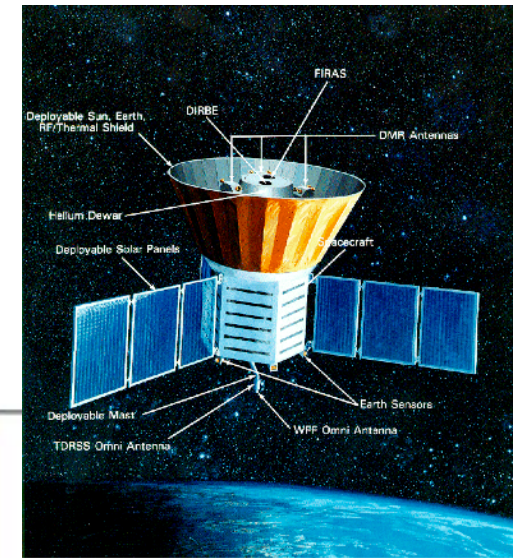
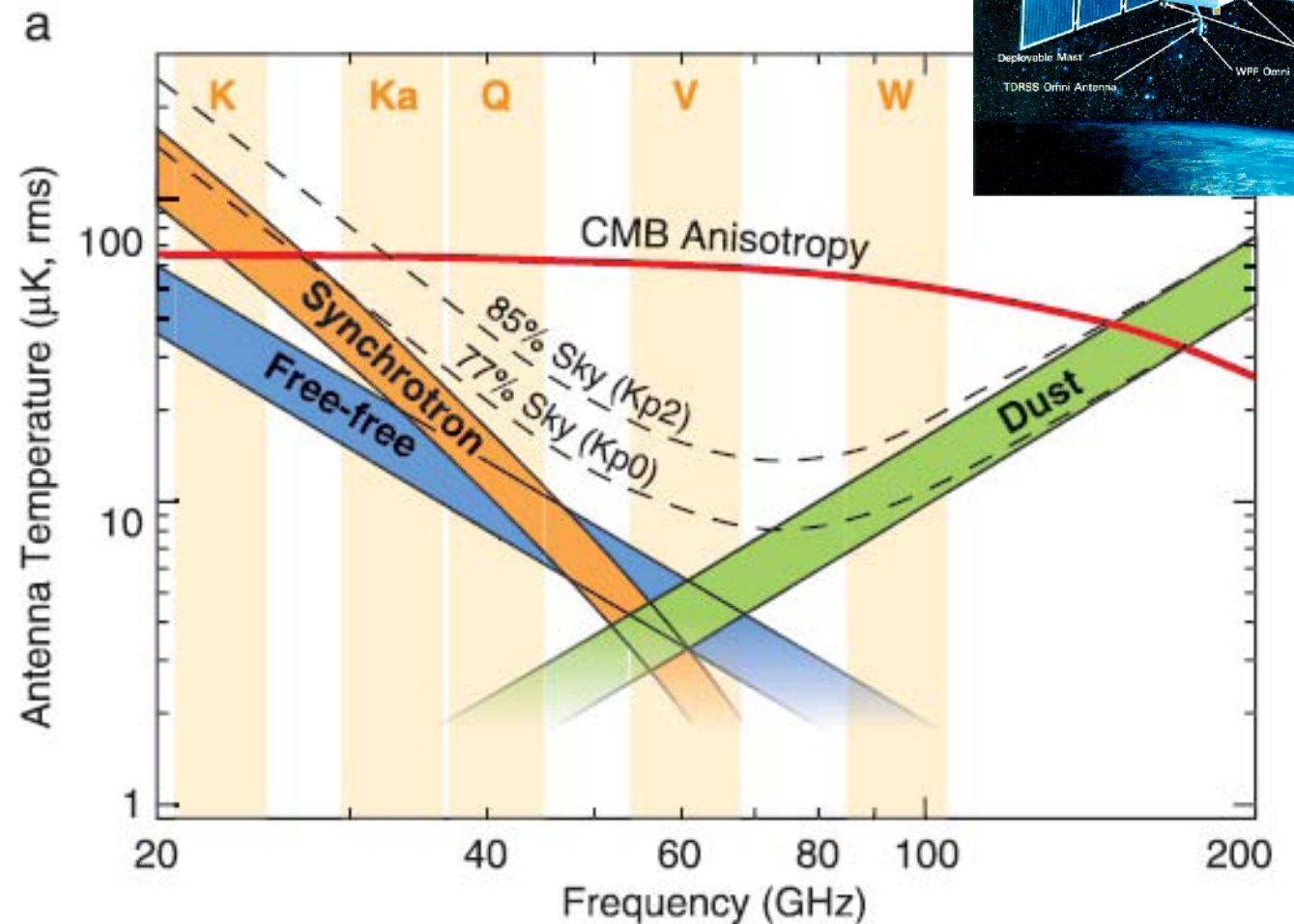
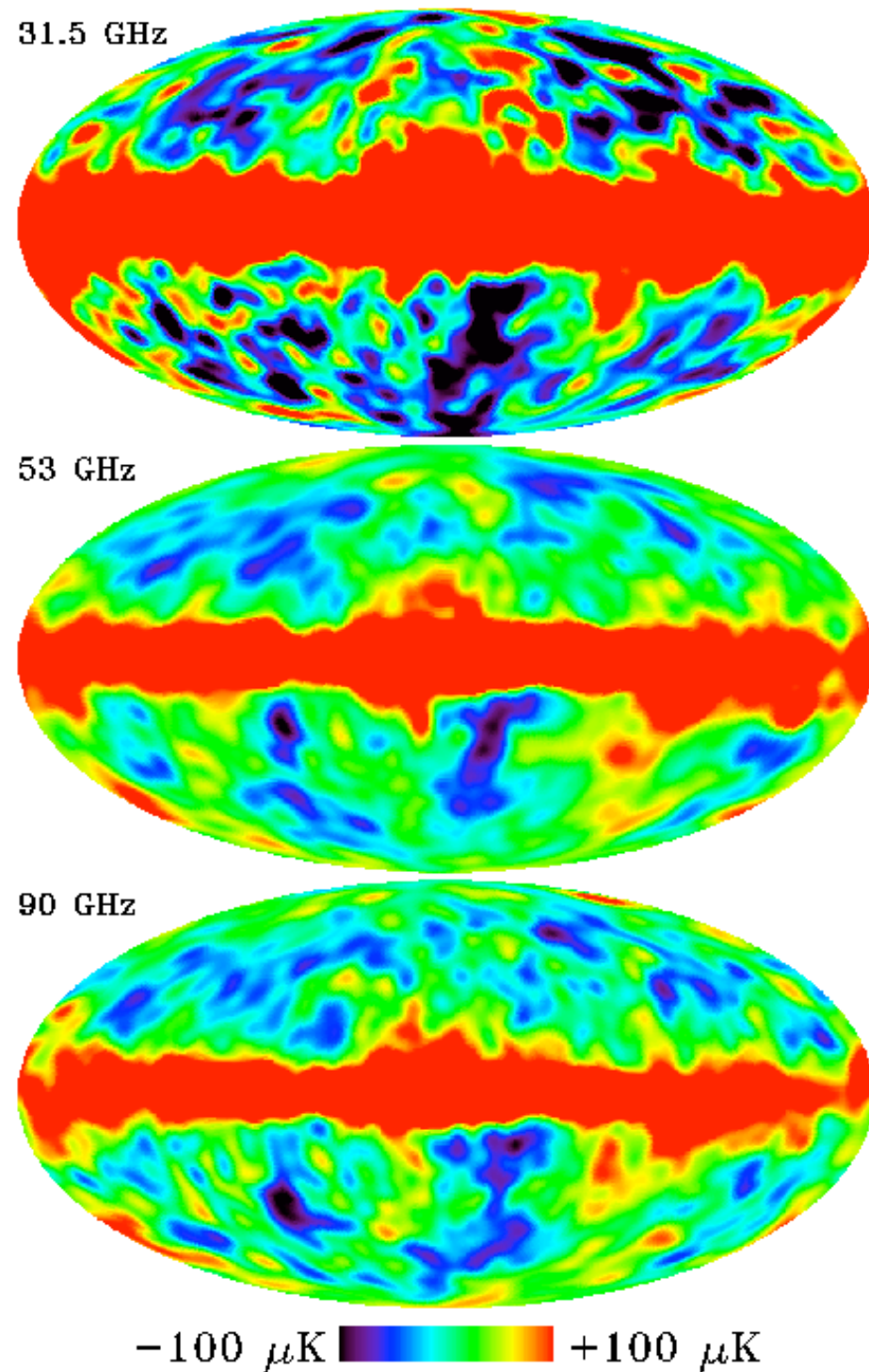


The Planck one-year all-sky survey



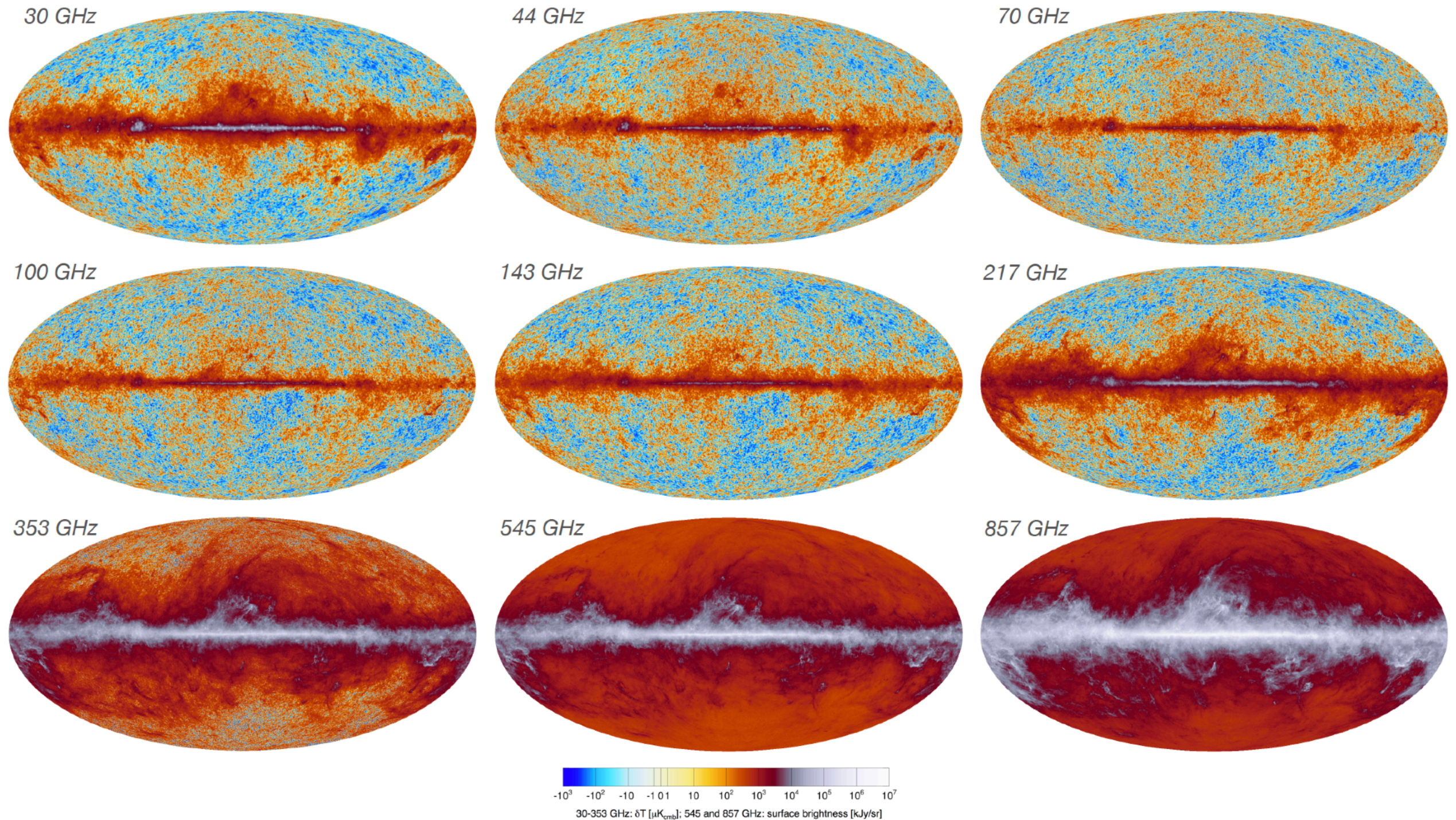
[c] ESA, HFI and LFI consortia, July 2010

The “CMB sky” in the 90s



COBE DMR channel maps
(Smoot et al. 1992)

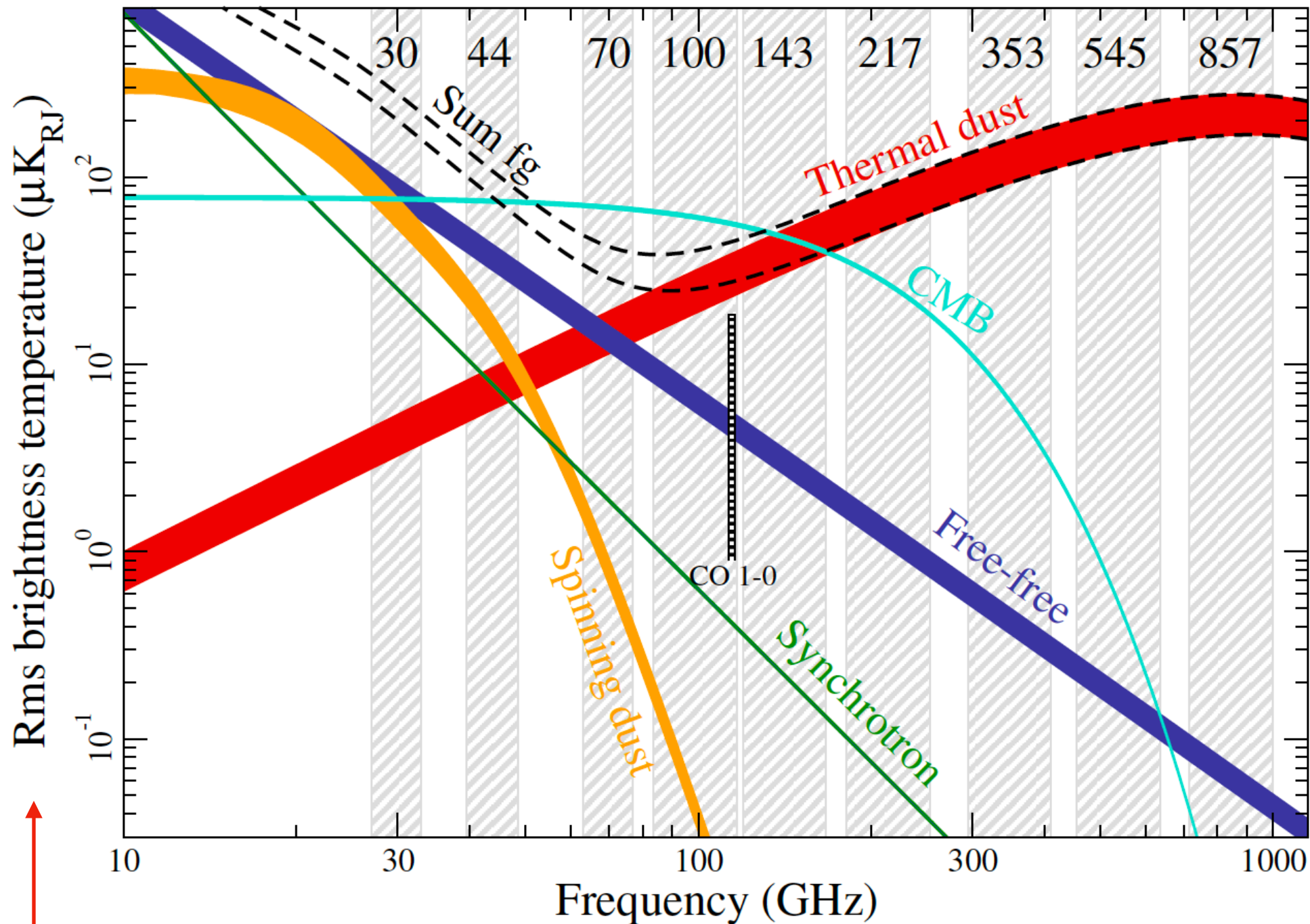
The “CMB sky” in 2020



Planck collaboration (2015)

CMB foregrounds in temperature

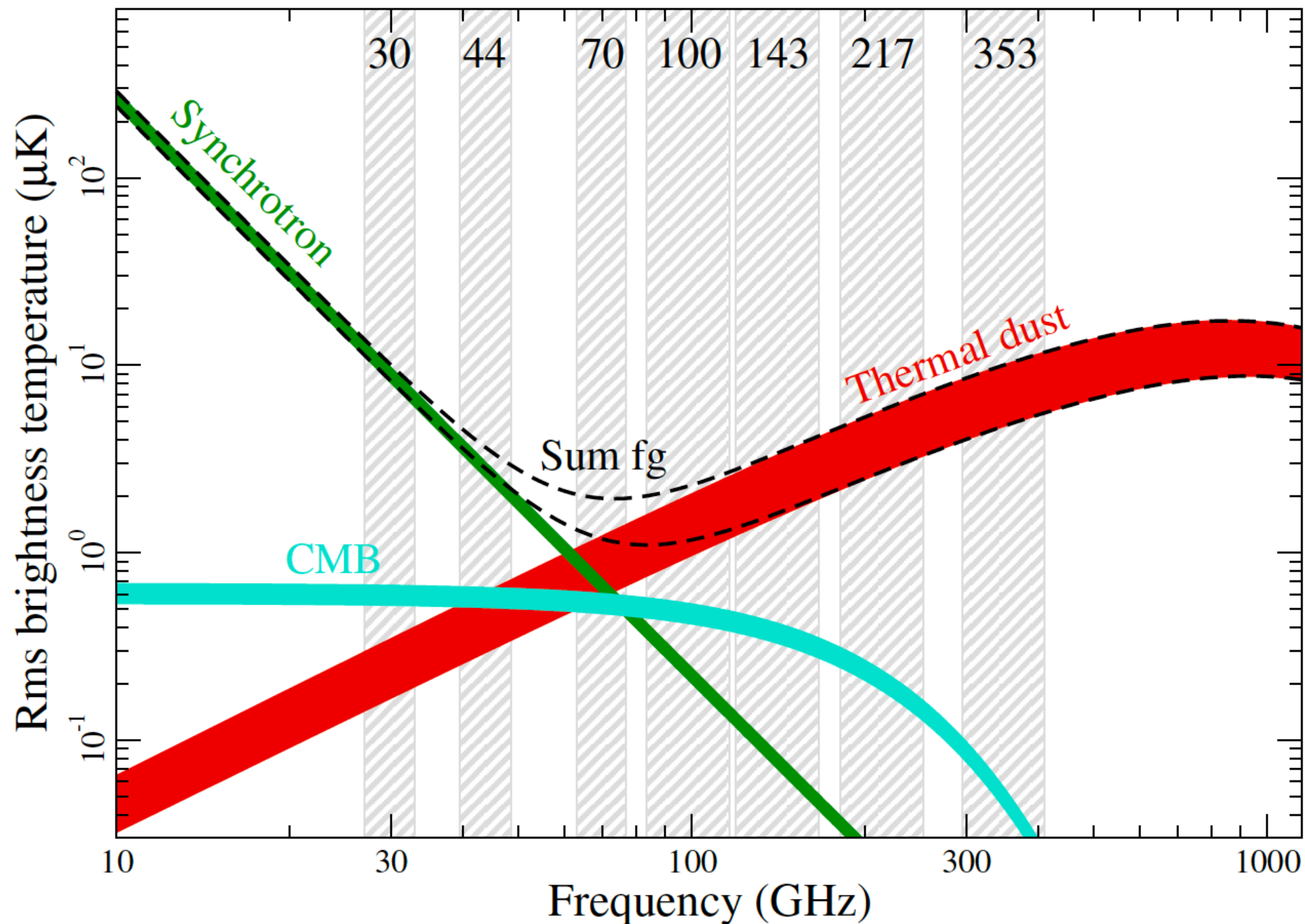
Upper and lower edges of each line define 81% and 93% of the sky, respectively.



$$\Delta T_b = (c^2 / 2k_B \nu^2) \Delta I(\nu)$$

Plotted on the Y-axis it is the **brightness temperature** (T_b) rms fluctuation, not the specific intensity (I_ν). That's why the R-J part of the CMB spectrum is flat, and power-law slopes are much steeper, since $T_b \propto I_\nu / \nu^2$

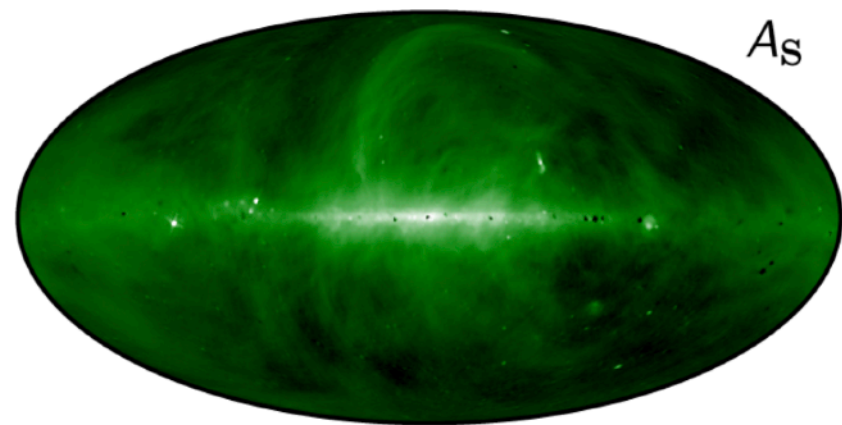
CMB foregrounds in polarization



$$\Delta T_b = (c^2 / 2k_B \nu^2) \Delta I(\nu)$$

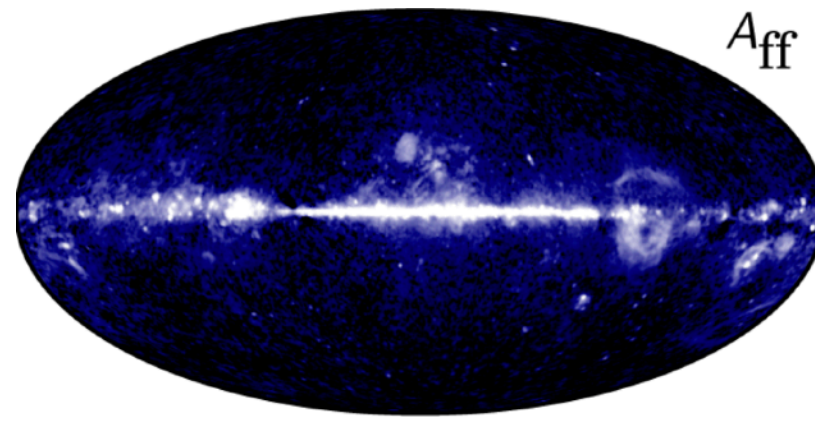
Upper and lower edges of each line define 73% and 93% of the sky, respectively.

Components of the microwave sky



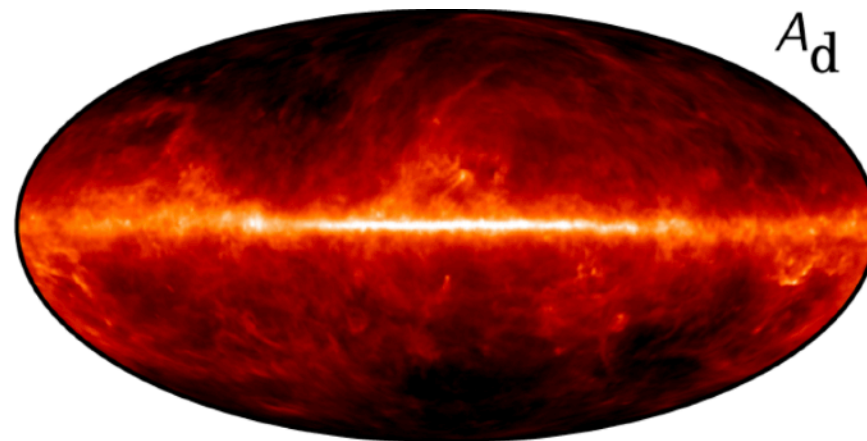
5 K @ 408 MHz 500

Synchrotron emission



0 cm⁻⁶ pc 1000

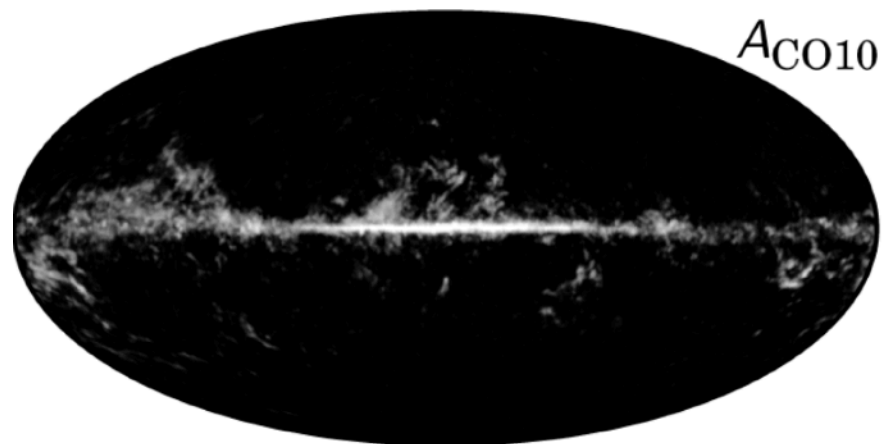
Free-free emission



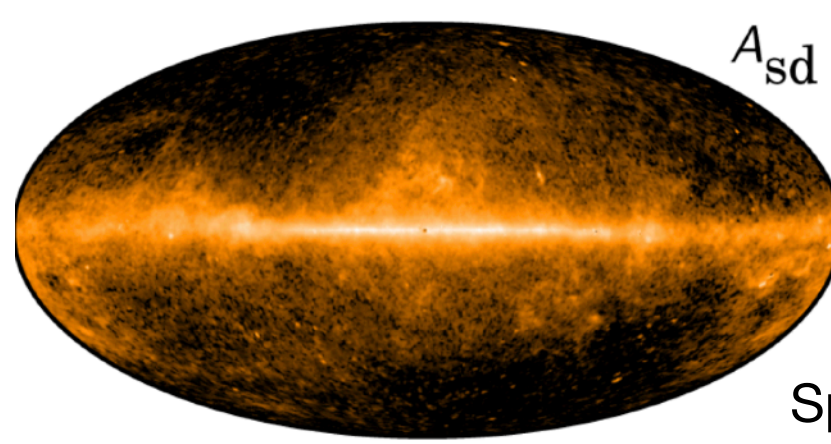
0.001 mK @ 545 GHz 10

Thermal dust emission

CO 1-0 line emission



0 K km/s 100



0.01 mK_{RJ} @ 30 GHz 10

Spinning dust emission

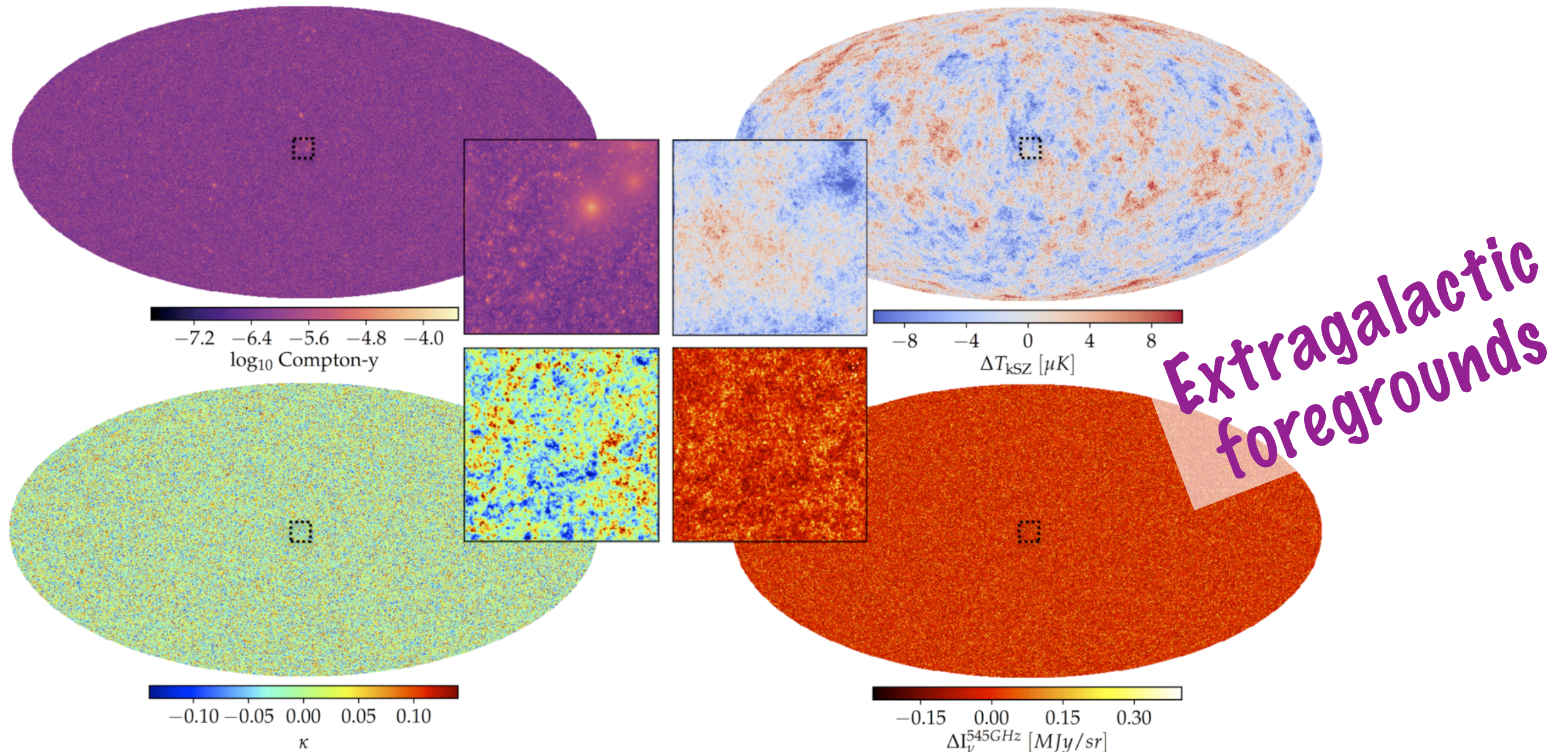
Galactic foregrounds

Credit: Planck collaboration 2018

Components of the microwave sky

Thermal SZ effect (Compton-y)

Kinematic SZ effect

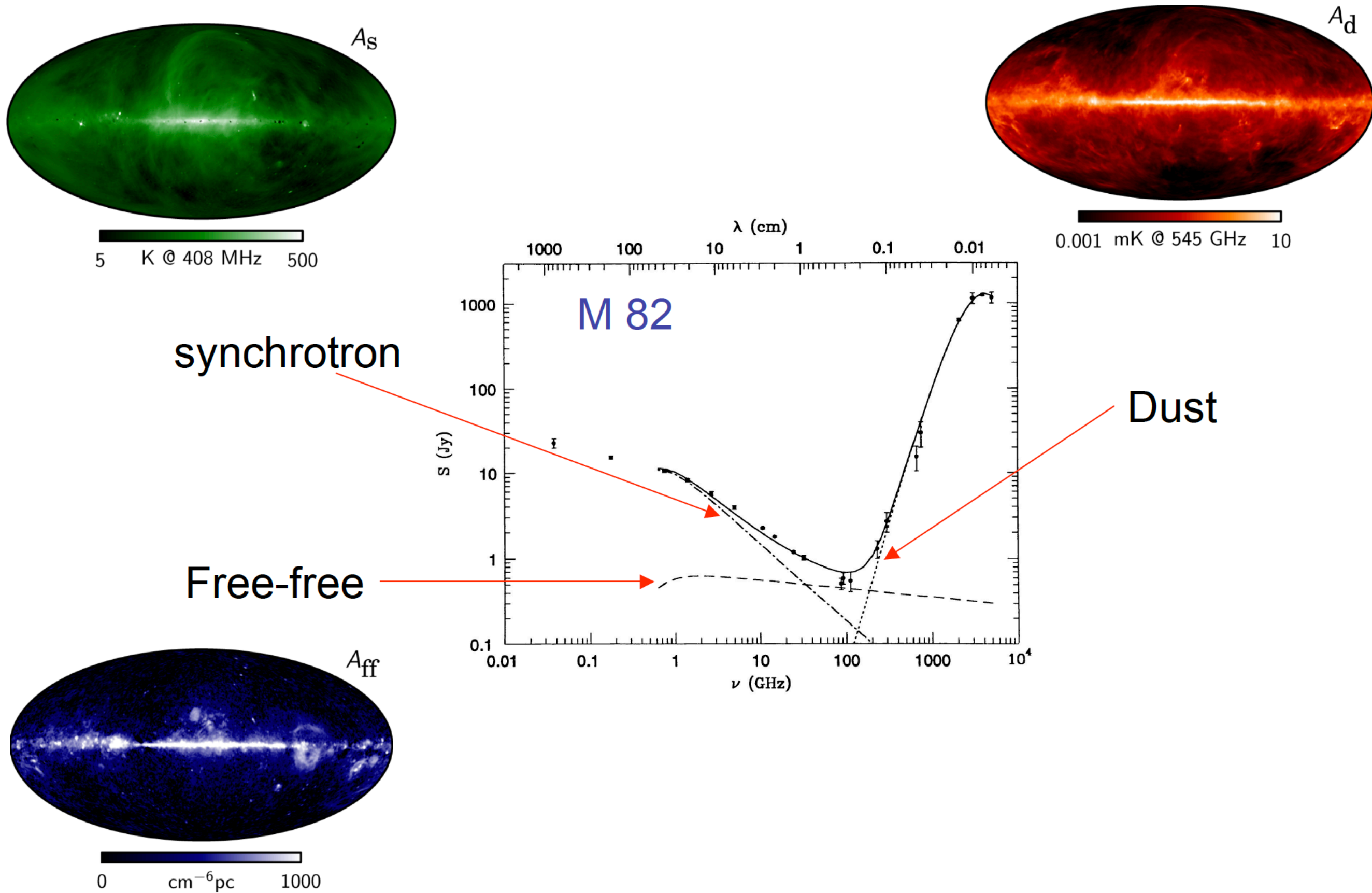


Lensing convergence map

Cosmic infrared background (CIB)

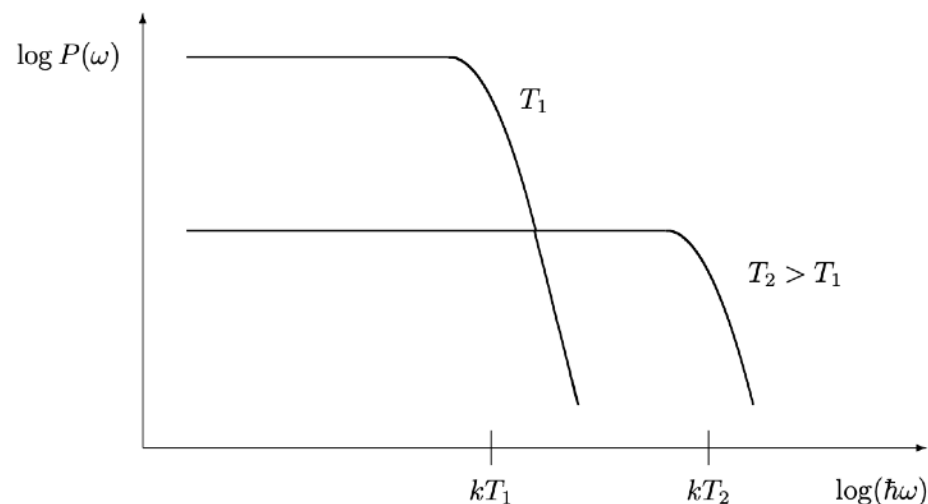
Credit: WebSky simulations (Stein et al. 2020)

SED of a typical galaxy

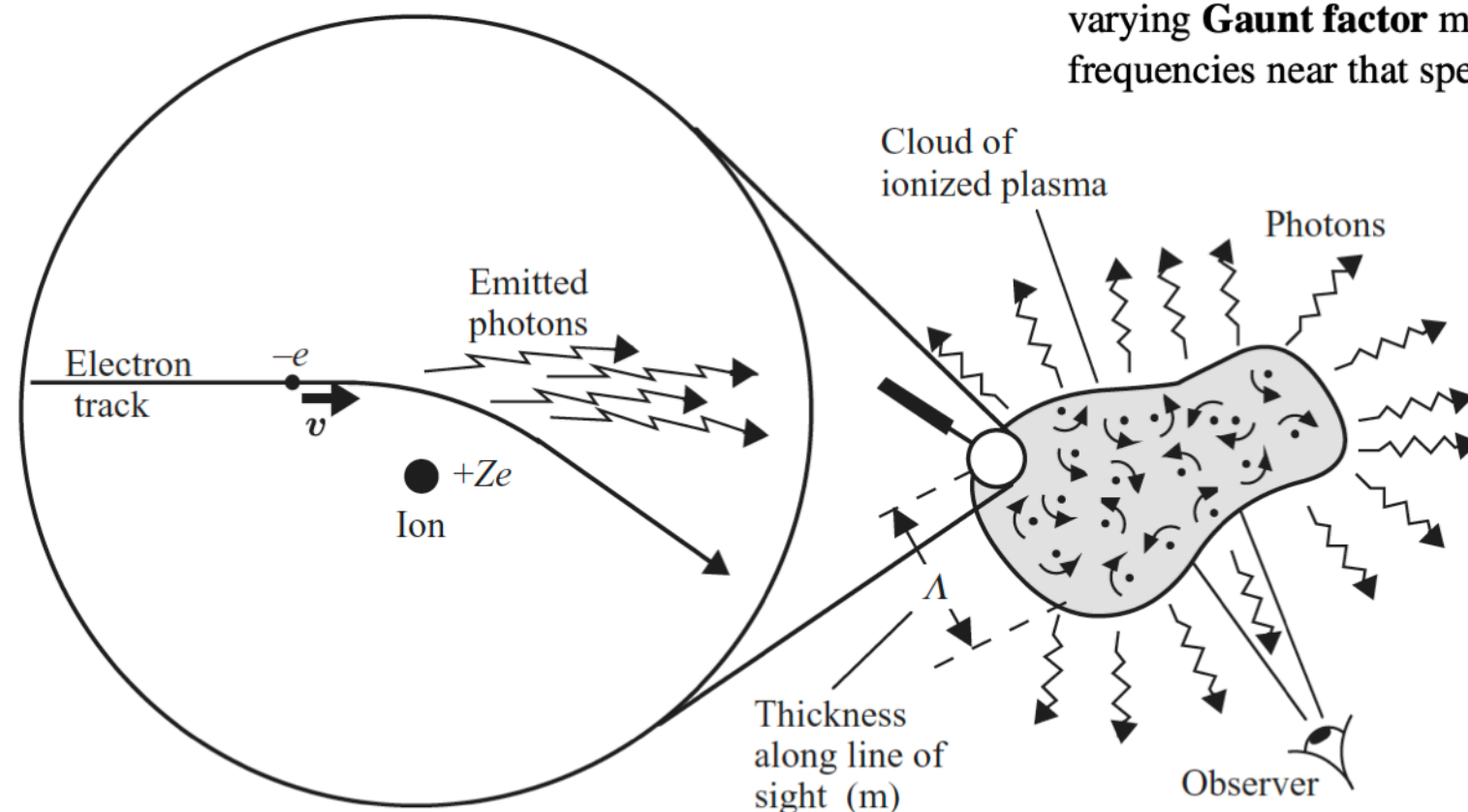


Bremsstrahlung (free-free) emission

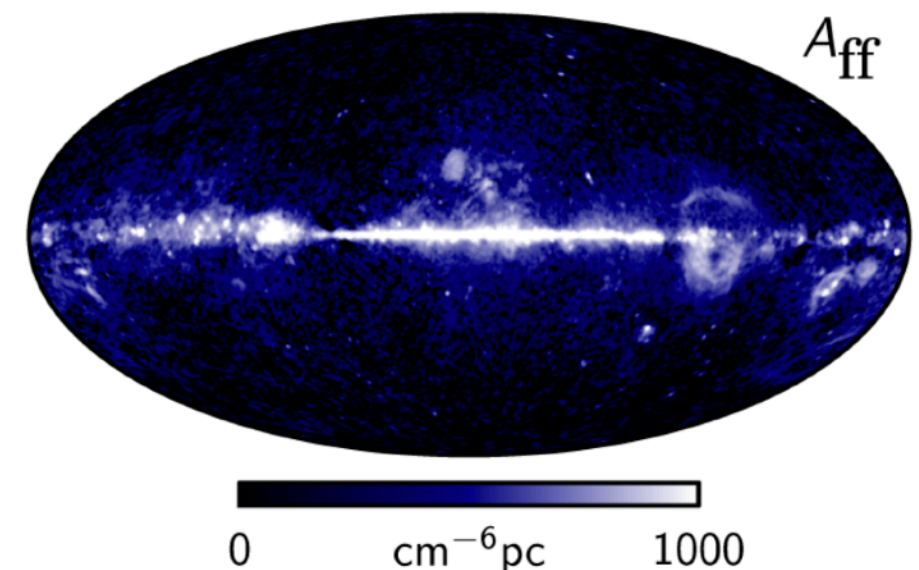
Bremsstrahlung,, or ‘braking-radiation’, also known as free-free emission, is produced by collisions between particles in hot ionized plasmas. We generally study this in optically thin cases (e.g. in the X-rays), but in the radio regime the emission can be optically thick.



A **hot plasma** of ionized atoms emits radiation through the **Coulomb collisions** of the electrons and ions. The electrons experience **large accelerations** in the collisions and thus efficiently radiate photons, which escape the plasma if it is **optically thin**. The energy Q radiated in a single collision is obtained from **Larmor's formula**. The characteristic frequency of the emitted radiation is estimated from the duration of the collision, which, in turn, depends on the **electron speed** and its **impact parameter** (projected distance of closest approach to the ion). Multiplication of Q by the electron flux and **ion density** and integration over the range of speeds in the **Maxwell-Boltzmann distribution** yield the **volume emissivity** $j_\nu(\nu)$ ($\text{W m}^{-3} \text{Hz}^{-1}$), the power emitted from unit volume into unit frequency interval at frequency ν as a function of frequency. It is proportional to the product of the electron and ion densities and is approximately **exponential** with frequency. A slowly varying **Gaunt factor** modifies the spectral shape somewhat. Most of the power is emitted at frequencies near that specified by $h\nu \approx kT$.



Free-free emission from our Galaxy



Bremsstrahlung emission spectrum

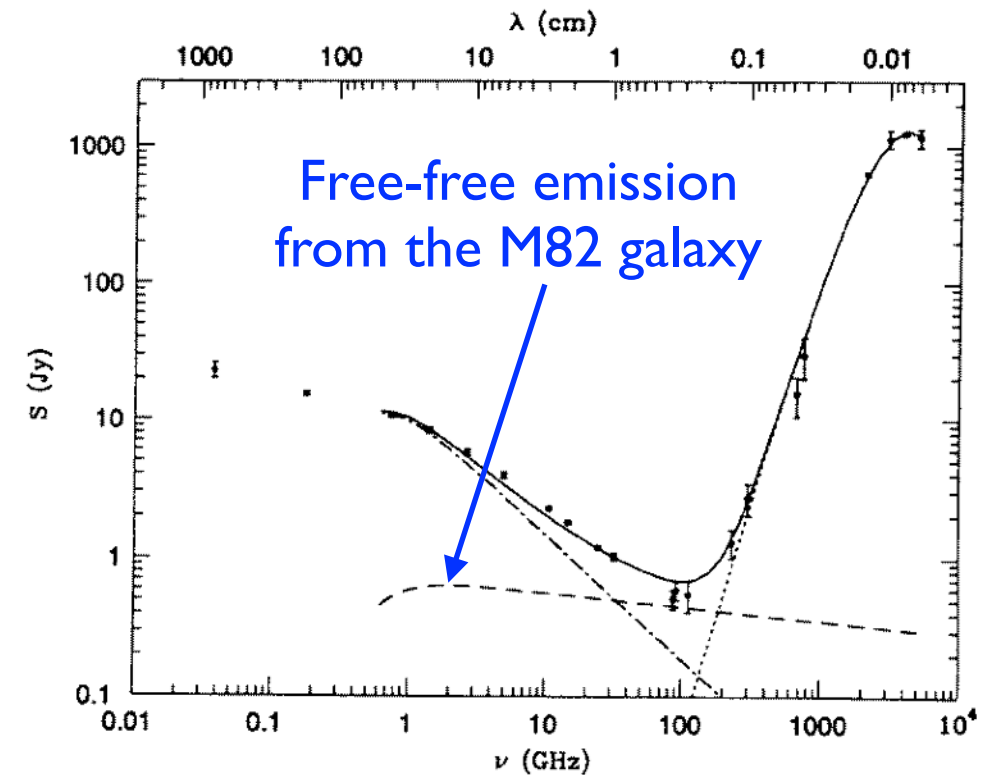
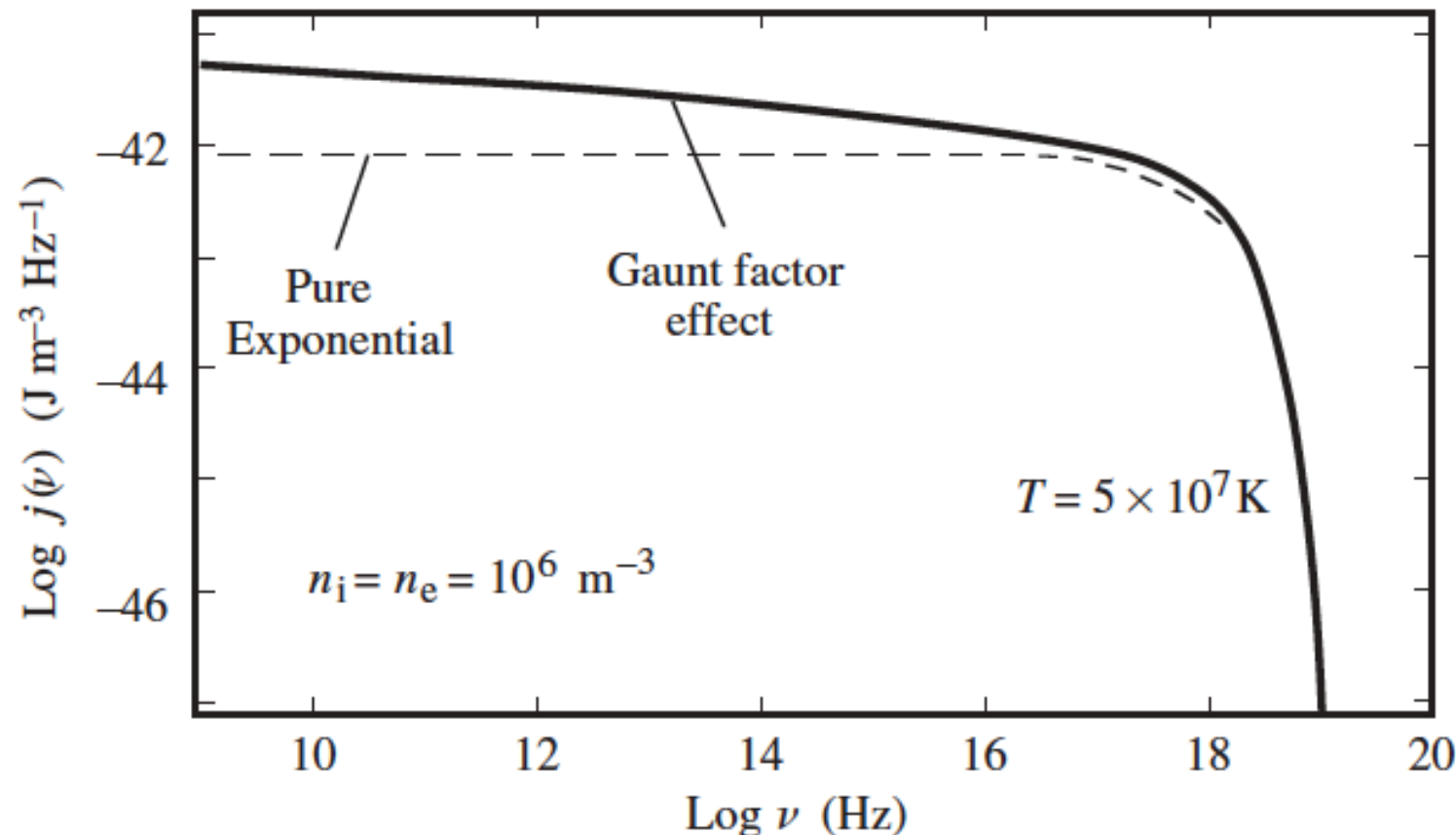
For thermal plasma, the velocity distribution is Maxwell-Boltzmann:

$$\mathcal{P}(v) = \left(\frac{m}{2\pi kT} \right)^{3/2} \exp \left(-\frac{mv^2}{2kT} \right)$$

Leading to the well-known expression for free-free emission

$$j_\nu(\nu) d\nu = g(\nu, T, Z) \frac{1}{(4\pi\epsilon_0)^3} \frac{32}{3} \left(\frac{2}{3} \frac{\pi^3}{km^3} \right)^{1/2} \frac{Z^2 e^6}{c^3} n_e n_i \frac{e^{-h\nu/kT}}{T^{1/2}} d\nu.$$

(Volume emissivity; W/m³ at ν in $d\nu$)



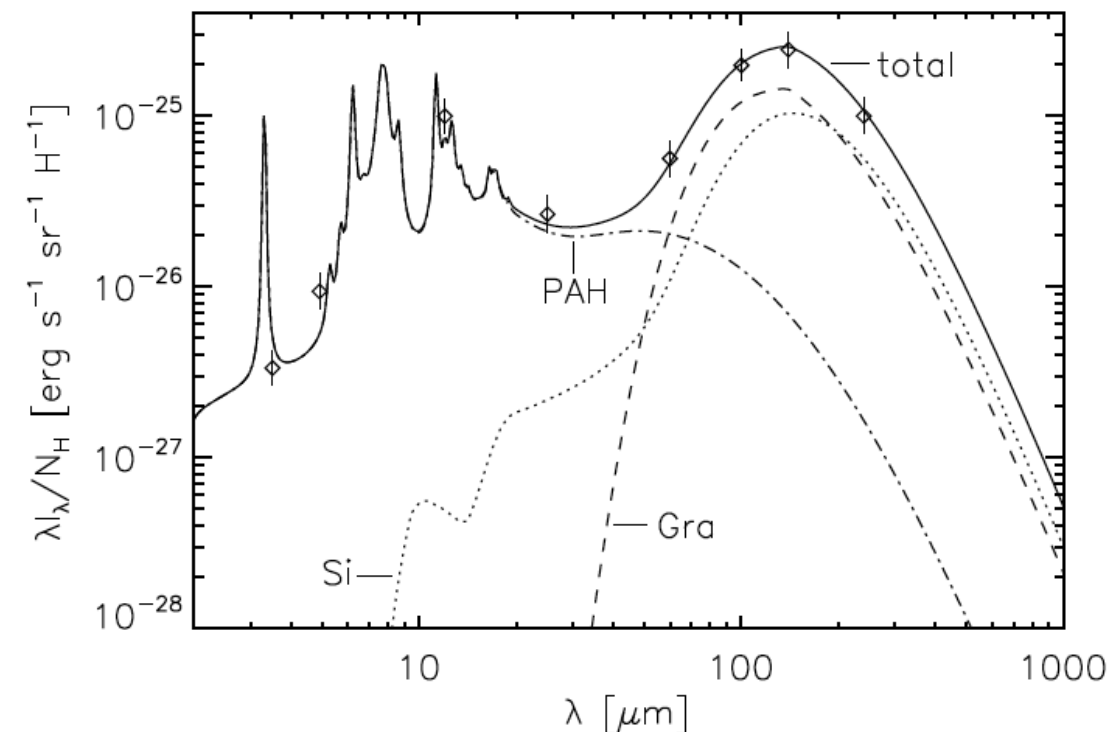
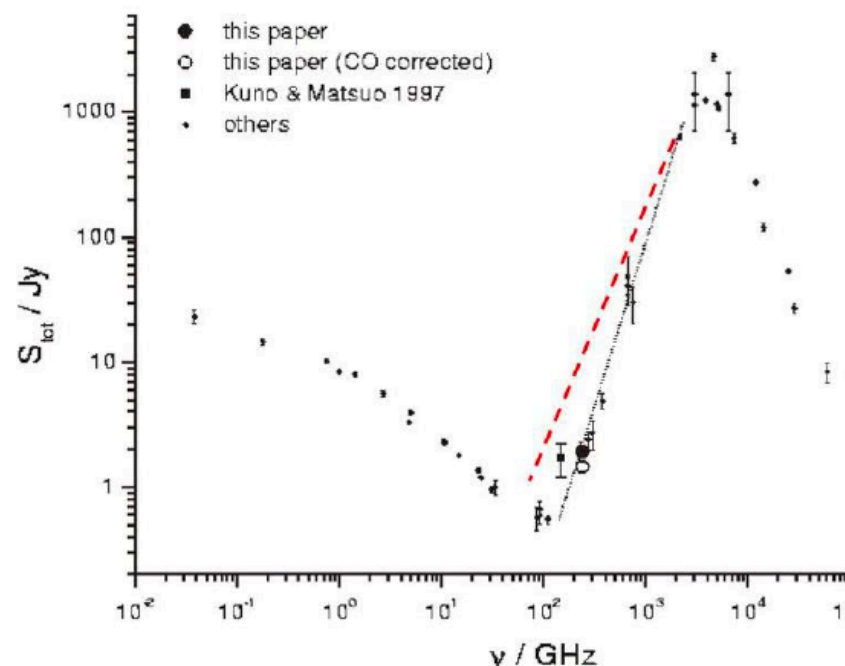
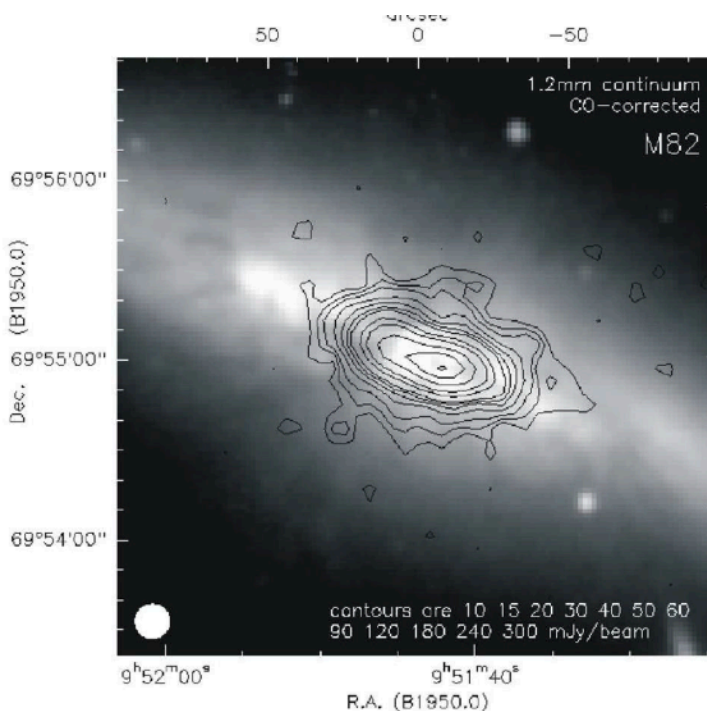
Thermal emission from interstellar dust

Dust grains follow Kirchhoff's law for opaque bodies; their emission and absorption coefficients are equal when the grains are in LTE. We define a "grey body" as an emitter whose efficiency is less than 100% from that of a blackbody at any frequency.

In the Rayleigh–Jeans part of the spectrum, emission coefficient $\epsilon(\nu) \propto \nu^2$ would mean a blackbody radiation, so an inefficient emitter has $\epsilon(\nu) \propto \nu^{2+\beta}$, where $1 < \beta < 2$. Thus the RJ part is "bluer" than a blackbody and signifies optically thin emission.

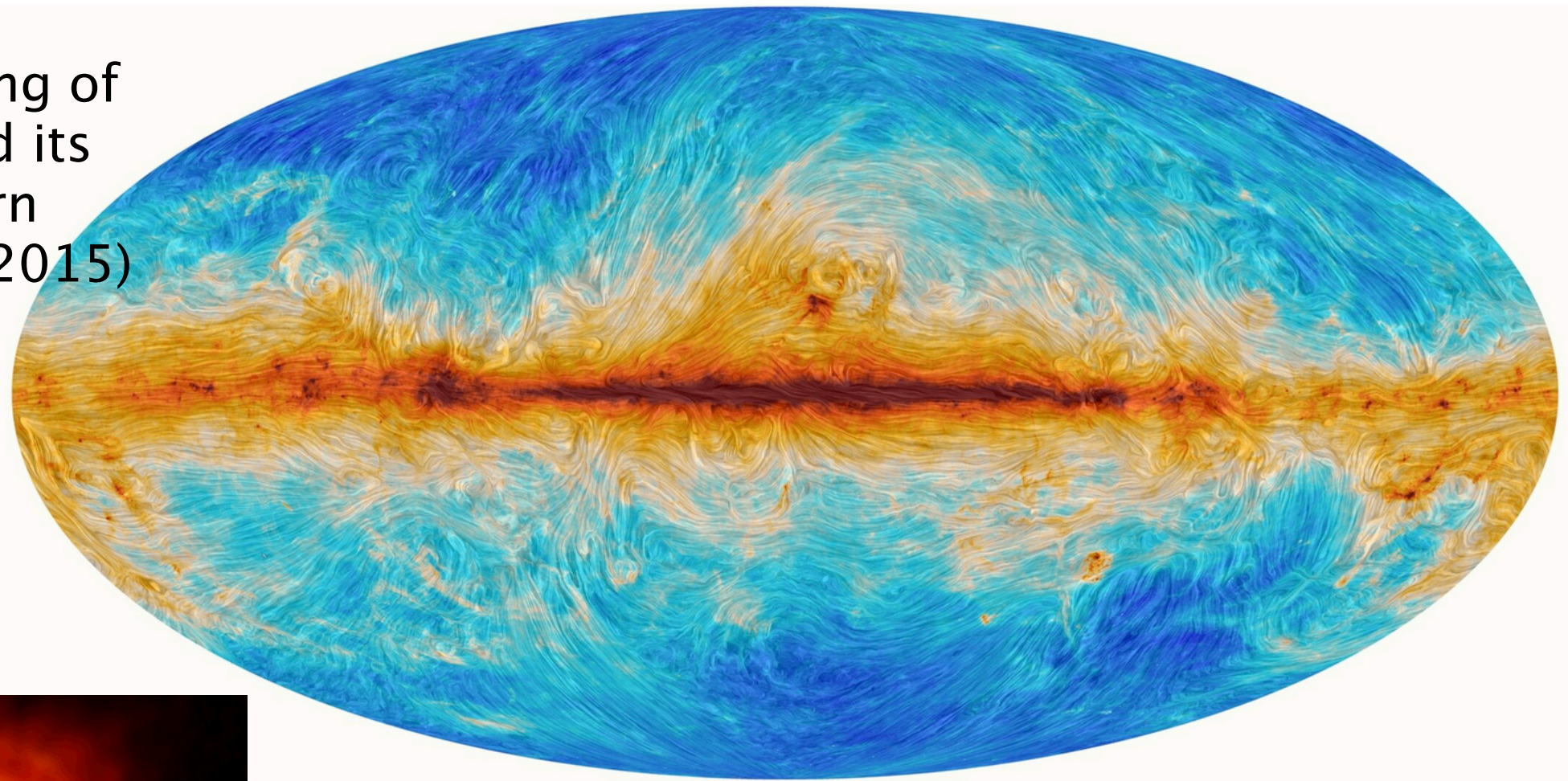
$$S_\nu \sim \nu^\beta \cdot B_\nu(T_d)$$

$\beta \sim 1.5$ for interstellar dust at $T_d \sim 20$ K.

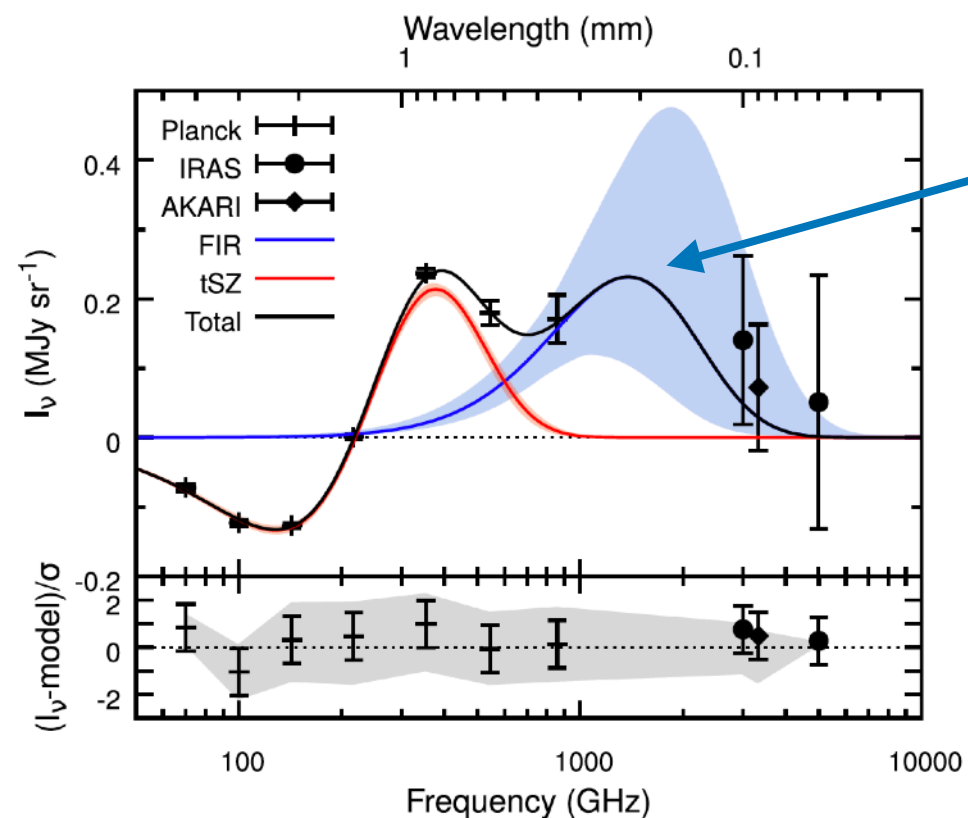
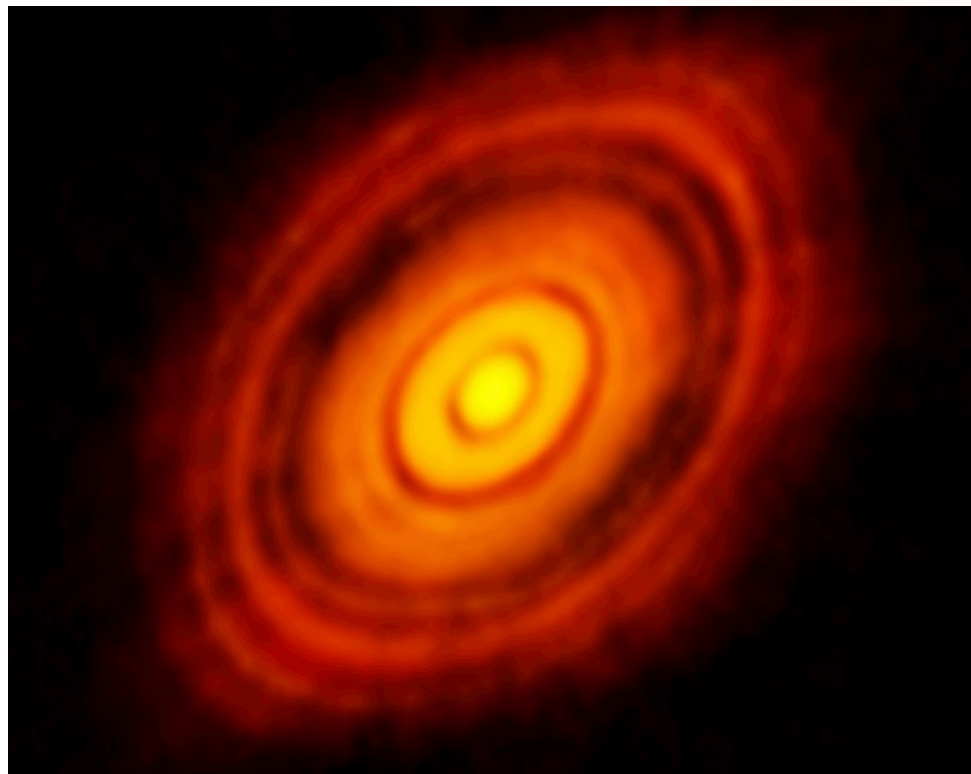


Dust emission examples

Planck satellite imaging of
the Galactic dust and its
polarization pattern
(Planck collaboration 2015)

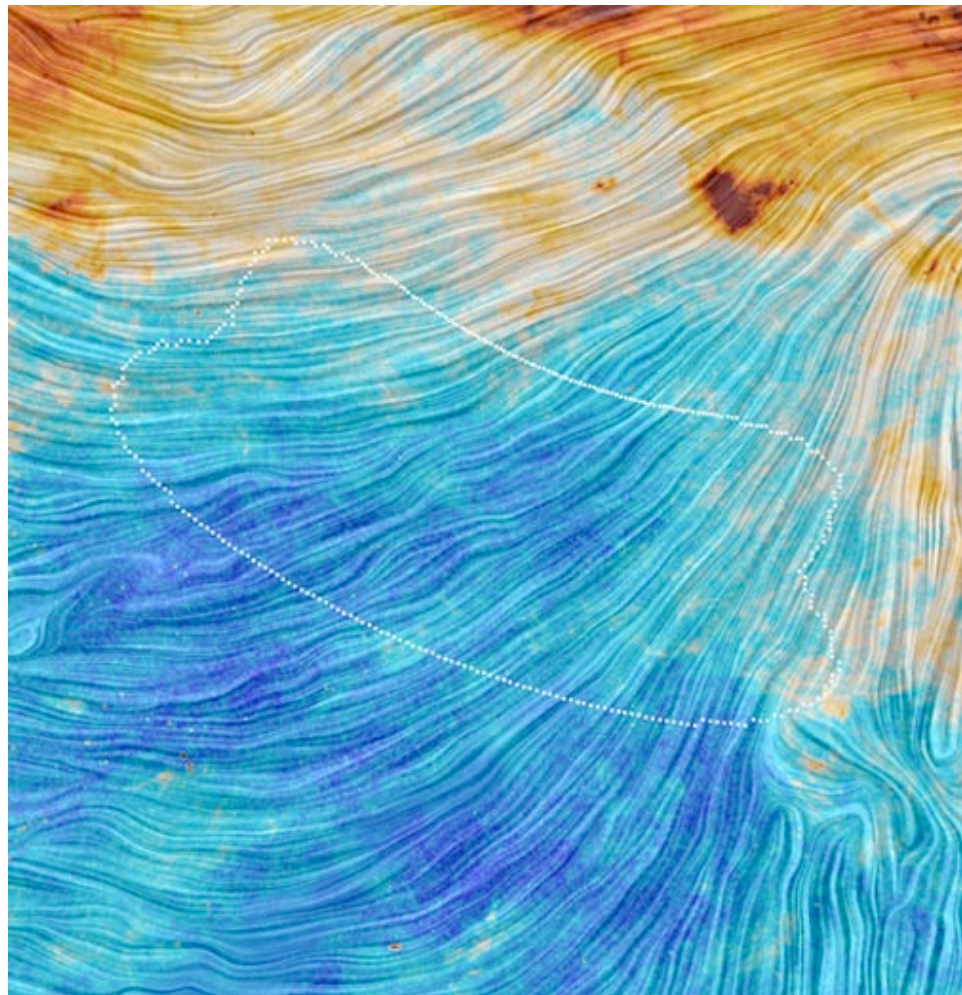


Dust emission from the
protoplanetary disk of
HL Tau (ALMA data,
Brogan et al.)



Thermal dust
emission
coming from
intergalactic
dust within
galaxy clusters
(Erler+ 2018)

Polarized dust emission in our Galaxy

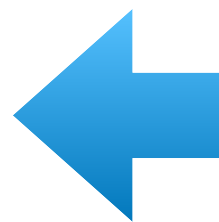
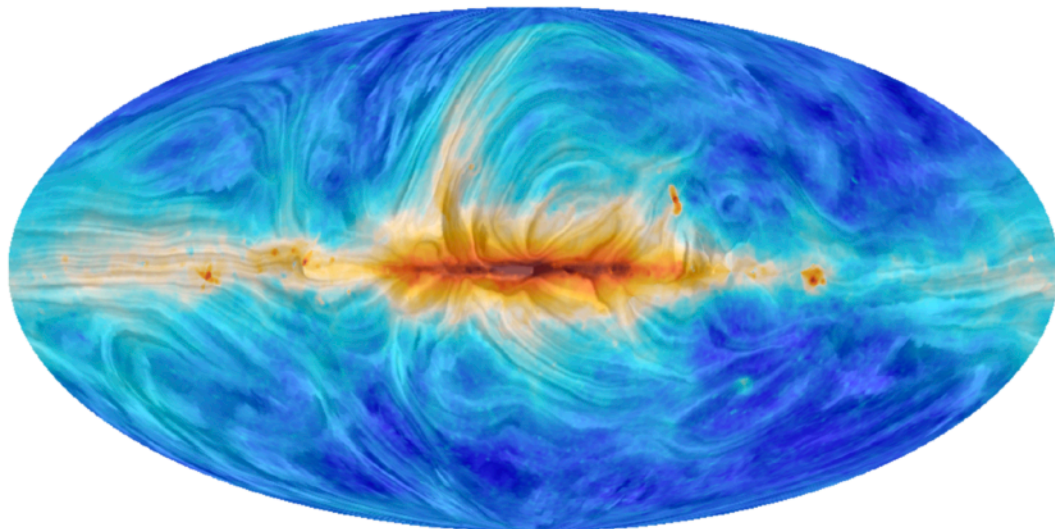


Polarized dust emission originates due to (partial) alignment of the vibrating dust grains in an ambient magnetic field. This creates a preferred orientation of the radiation electric field vector.



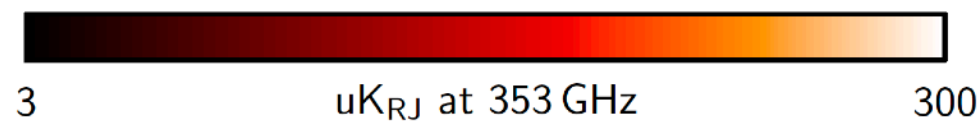
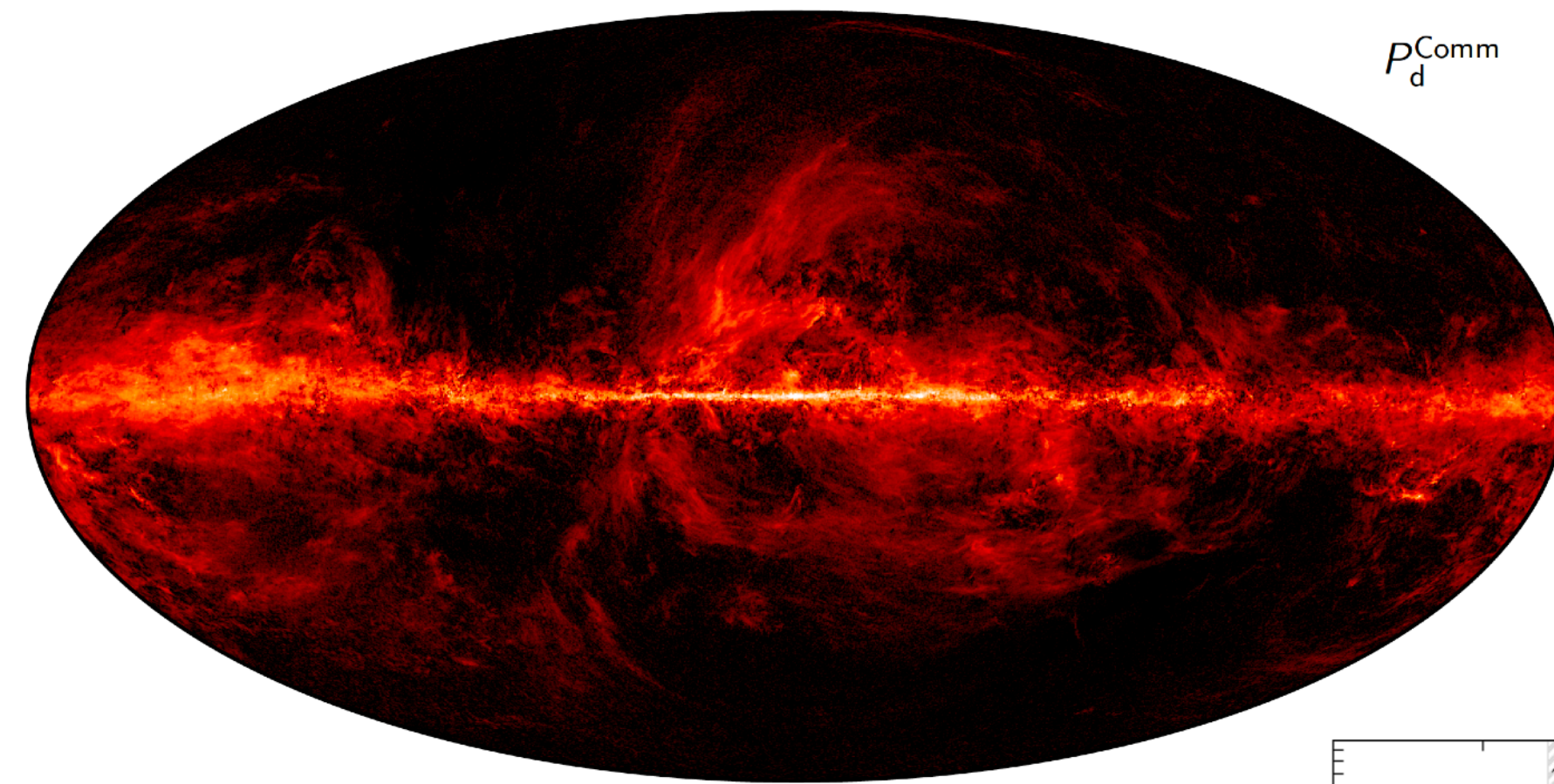
This is similar to the polarization of starlight extinction, observed in the optical. It picks up the magnetic field component in the plane of the sky, where the direction of polarization is orthogonal to the magnetic field direction.

Multiple field alignment will also cause *depolarization*.



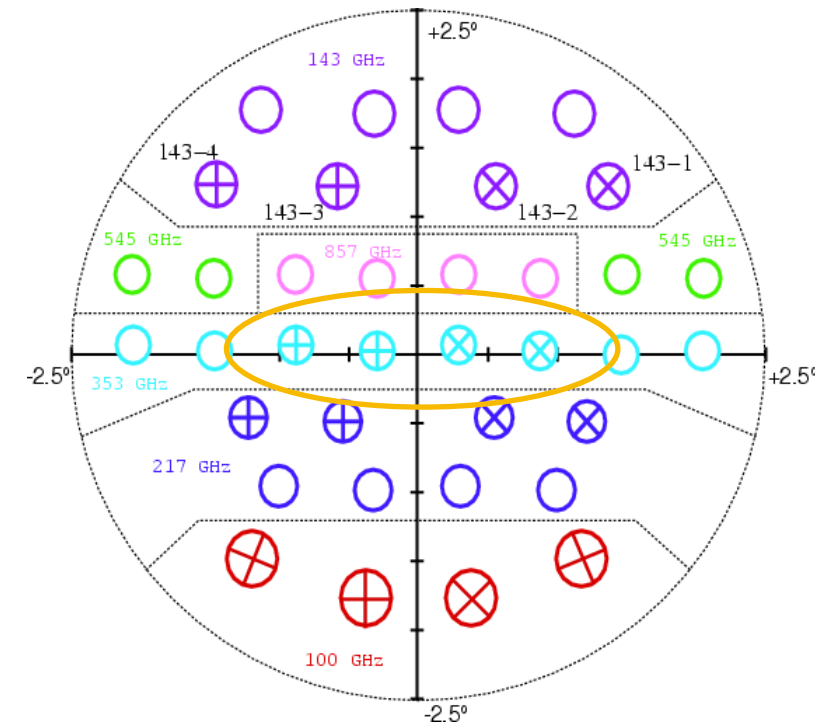
Images on left: Polarized dust emission in our Galaxy, as measured by the **Planck satellite**. Above: the BICEP-2 field in the south, below: the full sky.

Current knowledge on dust polarization

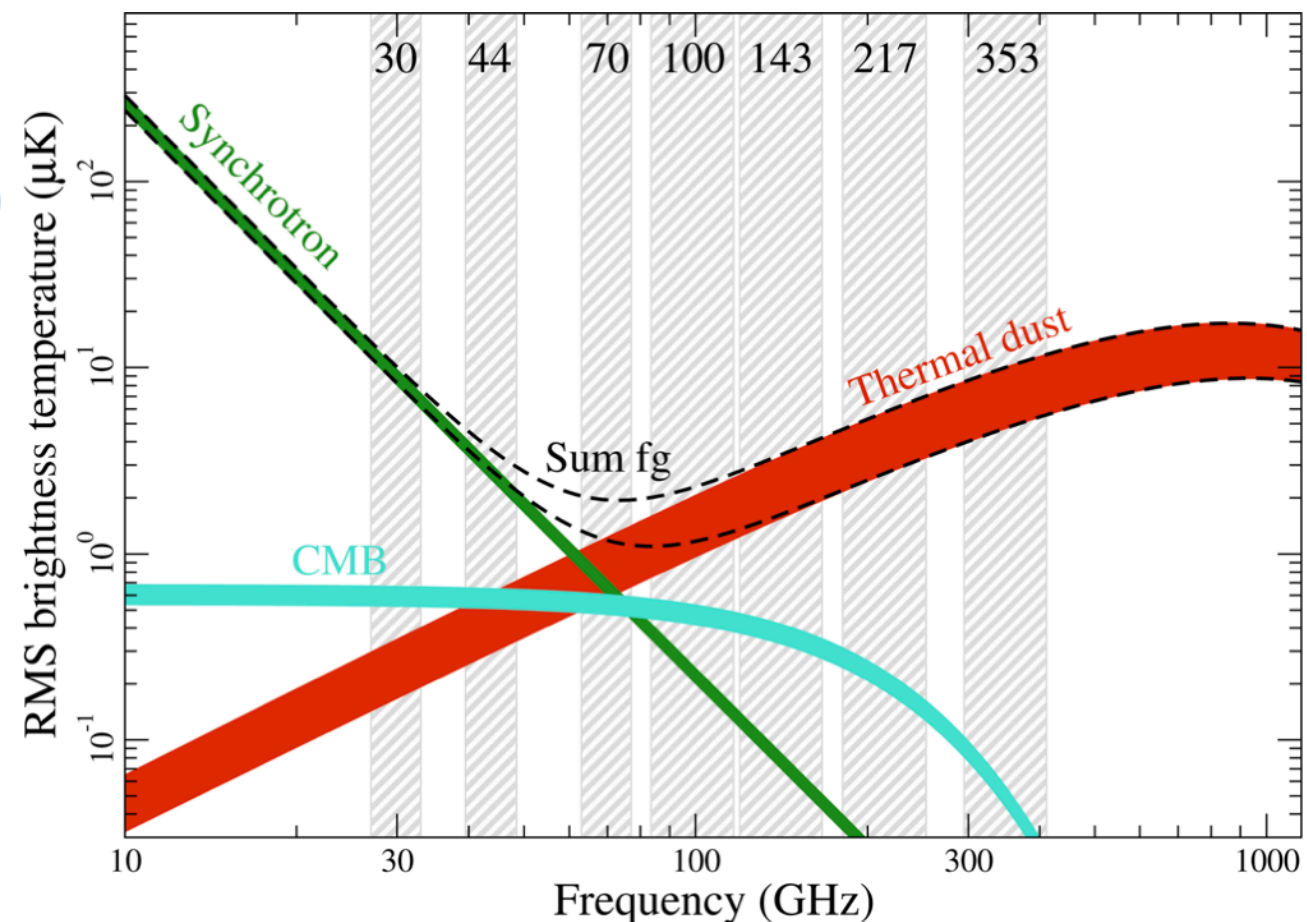


Polarized dust intensity map from Planck 2015 data (10' resolution), the detector assembly in the Planck focal plane, and the spectral uncertainty in the polarized dust emission.

p_d^{Comm}



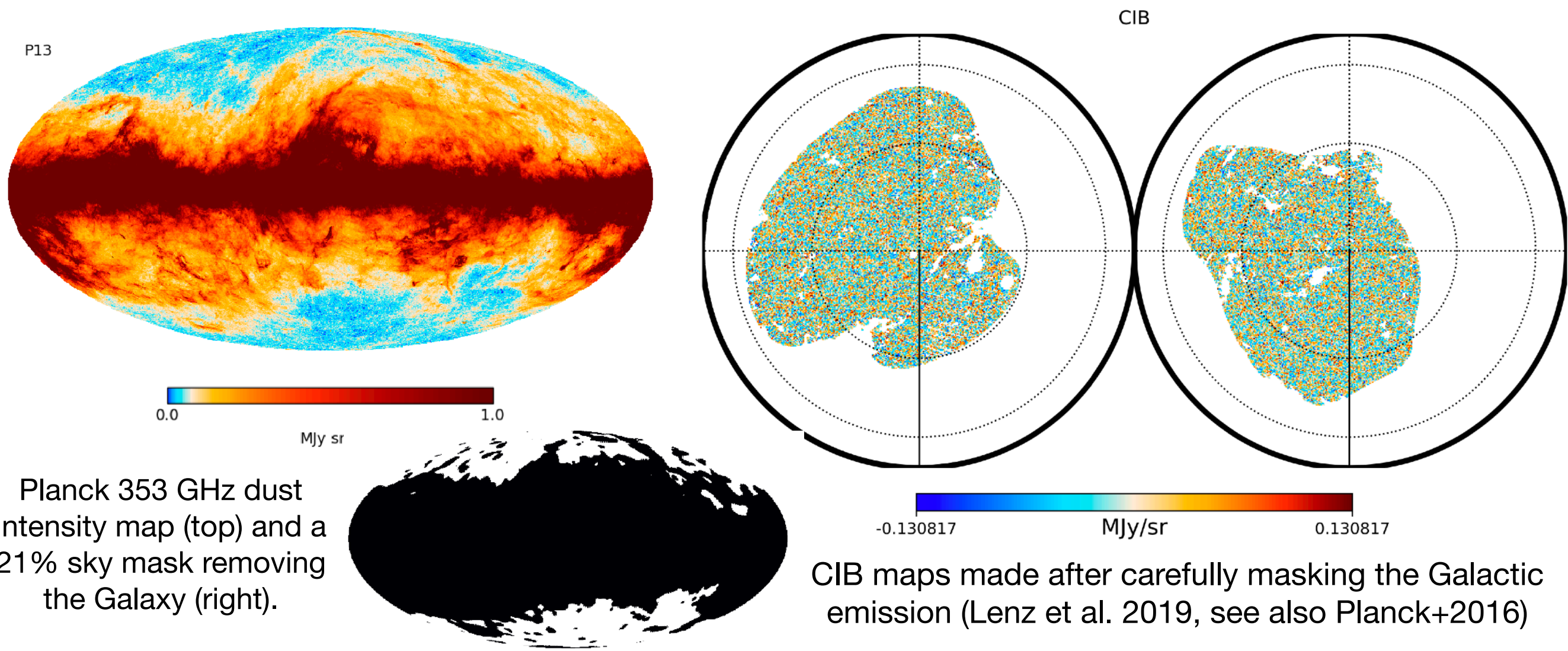
Focal plane array of Planck detectors



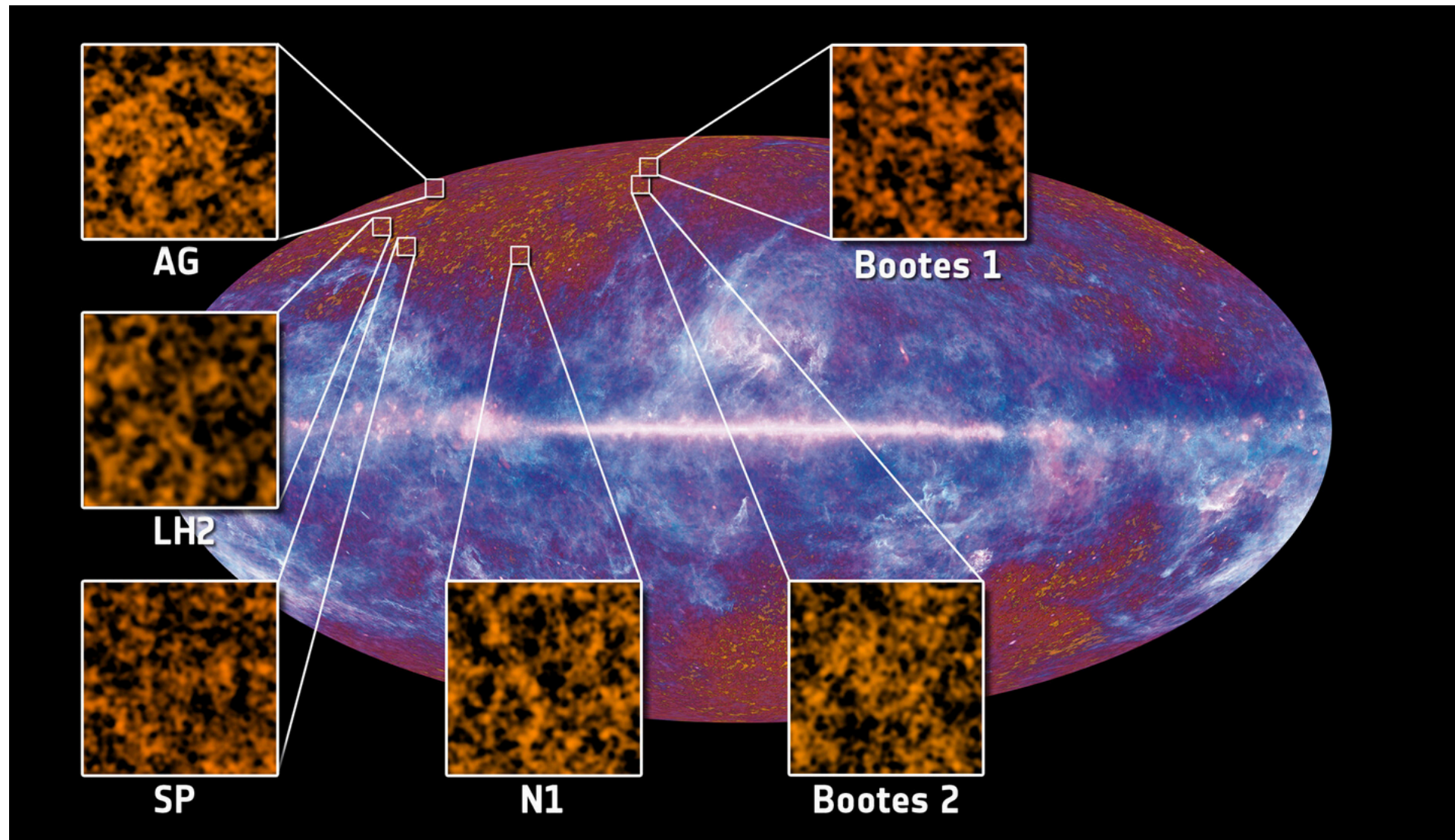
The Cosmic Infrared Background

The Cosmic Infrared Background (CIB) is the thermal dust emission from all the extragalactic objects. Mainly, it is dominated by star-forming galaxies at redshifts $z \sim 1-2$. There are still significant uncertainties on the spectrum and its spatial variations (since we are approximating a very complex process with a simple modified blackbody spectrum of the form $I_\nu(dust) \sim \nu^{3+\beta}/(\exp(h\nu/kT_{dust}) - 1)$).

The separation of the CIB and Galactic dust is done by careful spatial templates.



The Cosmic Infrared Background

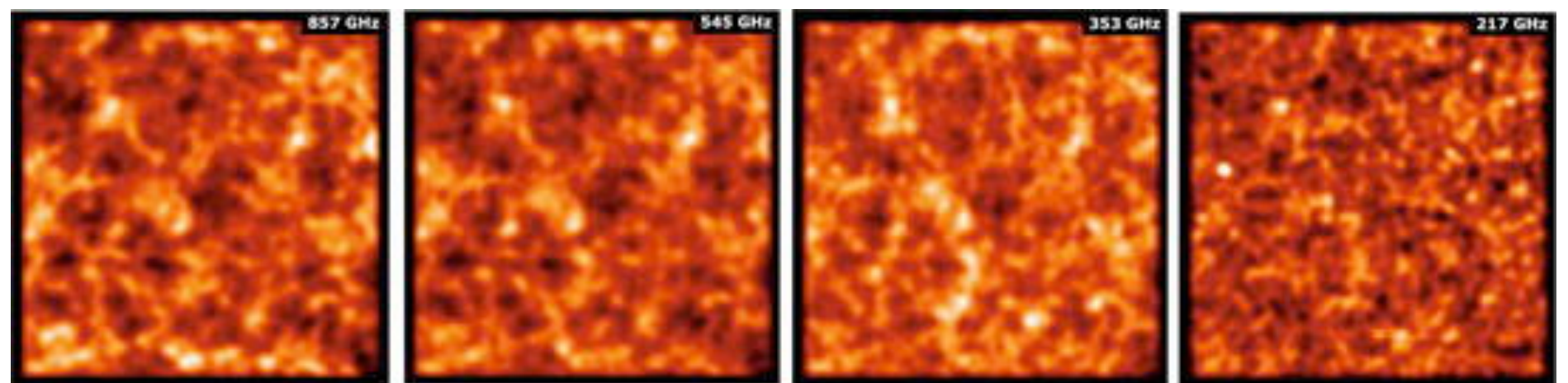


Unlike the Galactic dust, the CIB is practically unpolarized (polarization angles gets averaged out).

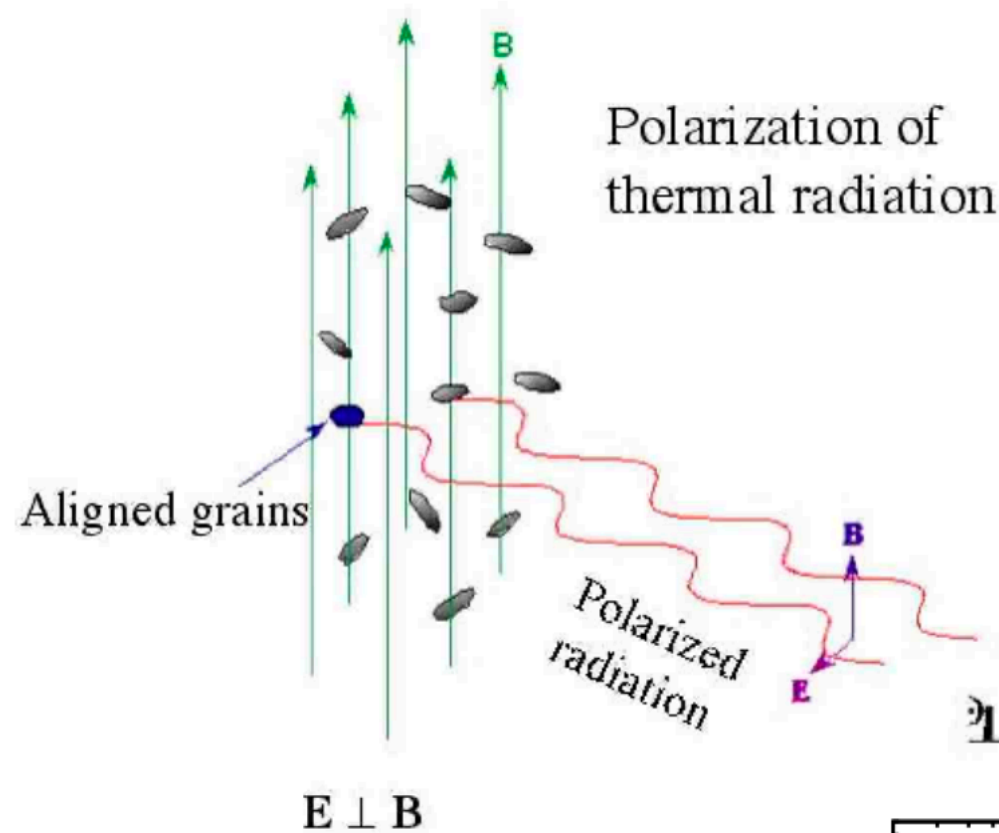
(Left) Location of the six fields used to study the Cosmic Infrared Background using Planck data

Credit: ESA / Planck Consortium

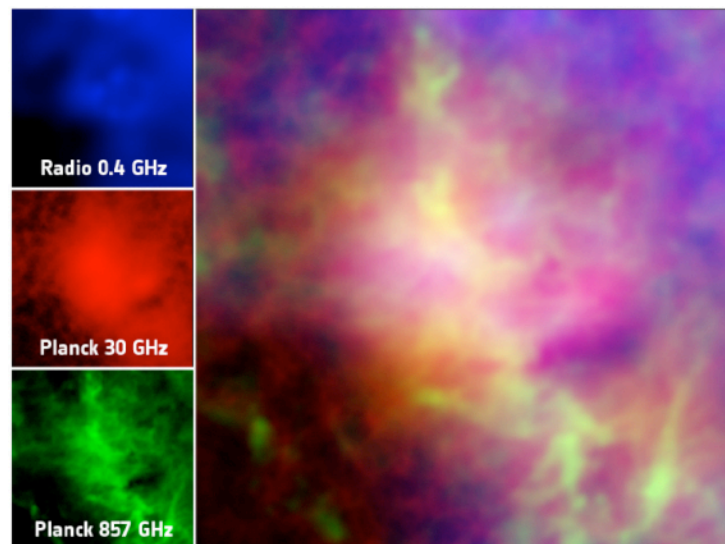
Simulations for the CIB at four of the Planck frequencies



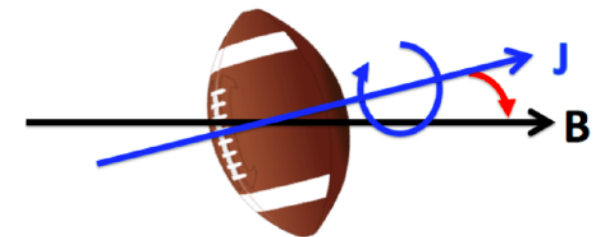
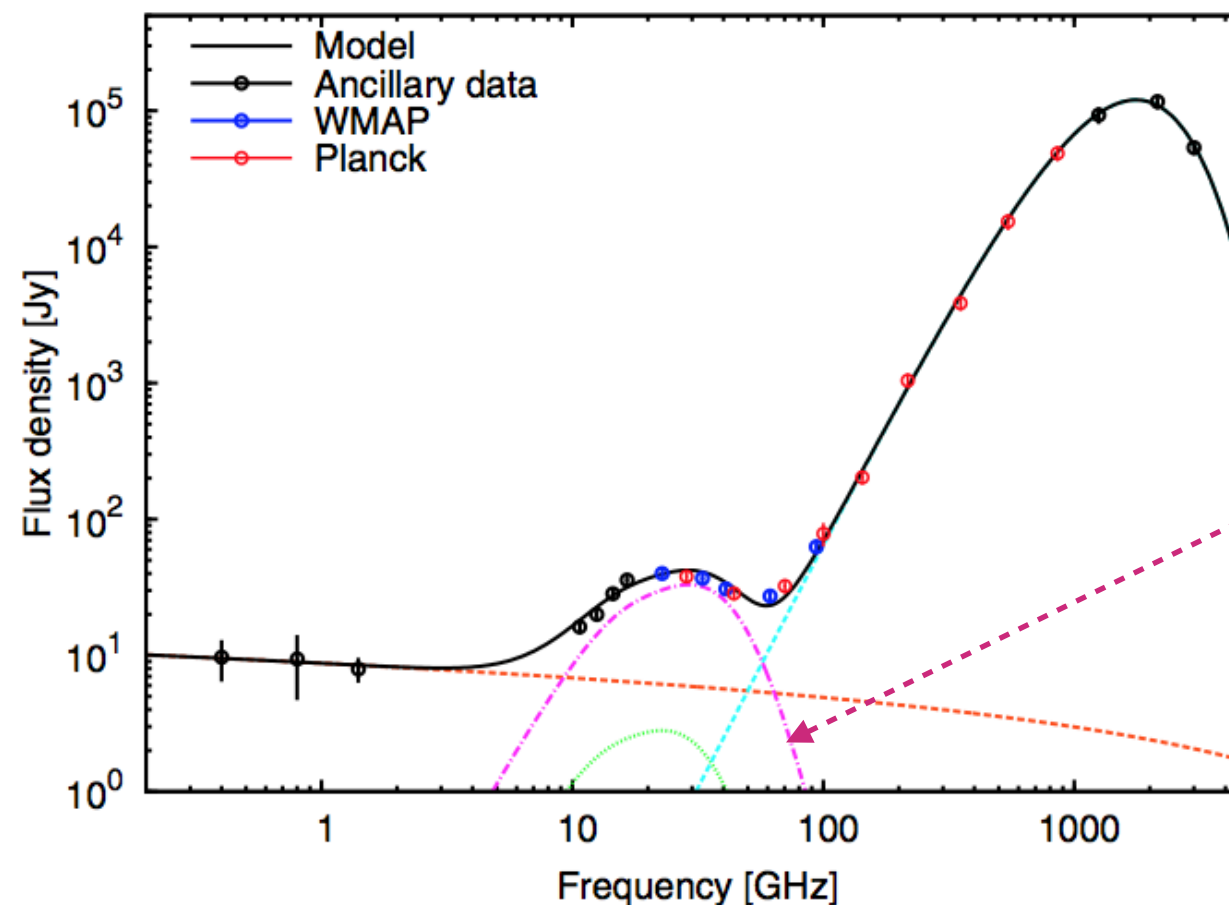
Anomalous dust emission (spinning dust)



Anomalous dust emission often goes hand-in-hand with the regular dust emission

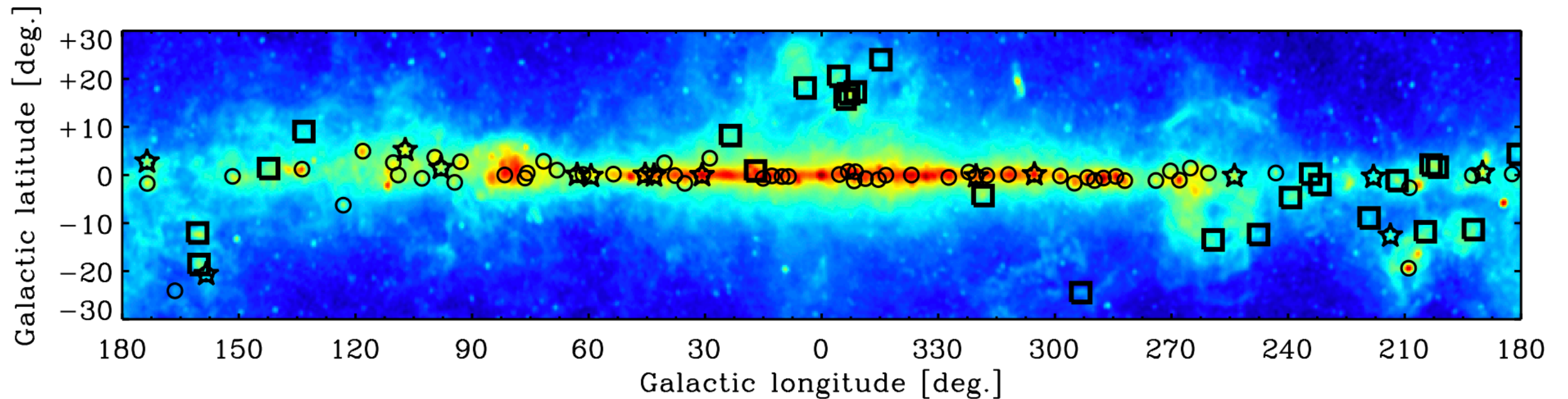


There is yet another type of dust emission, discovered relatively recently (from WMAP data, in the 1990s), that shows up as a continuum emission in the 30–90 GHz frequency range. The most common conjecture is that this is due to **spinning dust** particles! The signal is a weak “bump” of emission around 20–30 GHz.

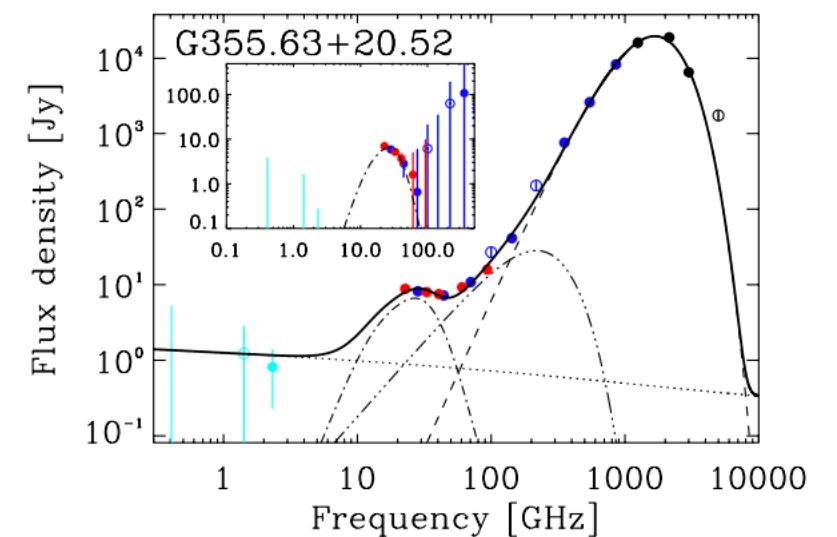
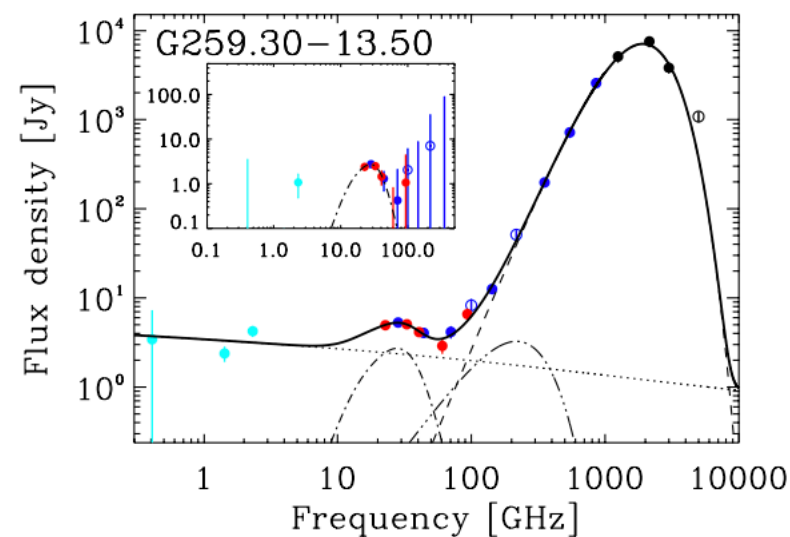
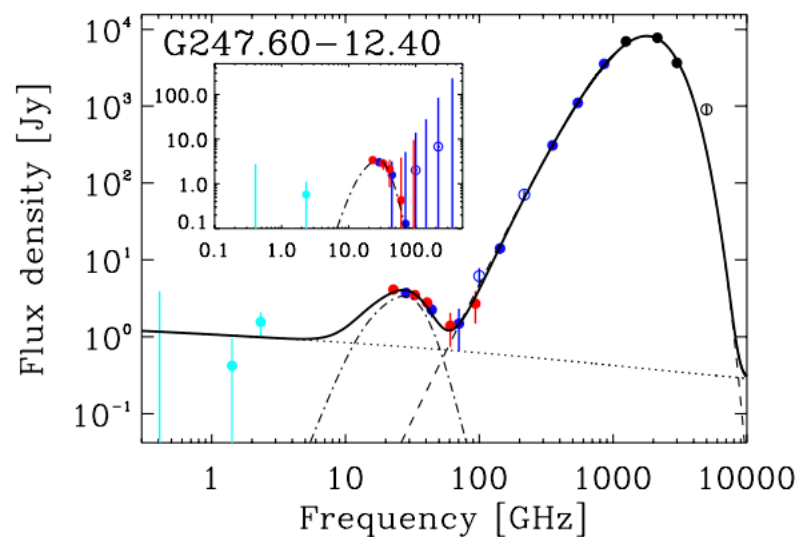


Electric dipole radiation from very rapidly spinning (30–60 GHz), extremely small dust grains.

Anomalous dust emission (spinning dust)



Regions of very significant anomalous dust emission in the Galactic plane (marked by squared on the above figure) and some representative spectra (below). Credit: Planck collaboration (2014).



The exact nature of the AME sources and their abundance in the high Galactic latitudes are not well understood.

Thermal dust emission summary

The thermal emission from interstellar dust grains is a “grey body” or “modified blackbody” spectrum. The same spectrum is used to describe the cosmic infrared background (CIB), where it follows almost the same mean values as the Galactic dust.

$$I_{\nu}^{\text{dust}} = A \left(\frac{\nu}{\nu_0} \right)^{\beta} B_{\nu}(T_d)$$

A = How much dust?

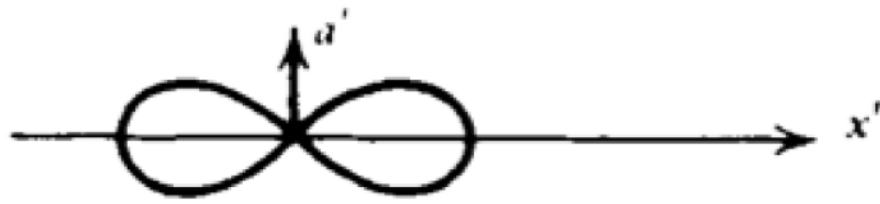
T_d = How hot is the dust?

β = What is the dust made of?

Thermal dust emission from the Galaxy is the main foreground at frequencies >100 GHz. This emission is partially polarized, due to the alignment of the dust grains in Galactic magnetic fields. At low frequencies (~ 30 GHz) there is an additional (and polarized) component of spinning dust emission, roughly confined to star-forming regions in the Galactic plane.

The alignment of dust grains in an ambient magnetic field is a new tool to probe the Galactic field structures, especially in regions far from the Galactic plane. But it is a major headache for cosmologists looking for the gravitational wave signature from inflation, expected to be imprinted on CMB B-modes.

Cyclotron and synchrotron radiation

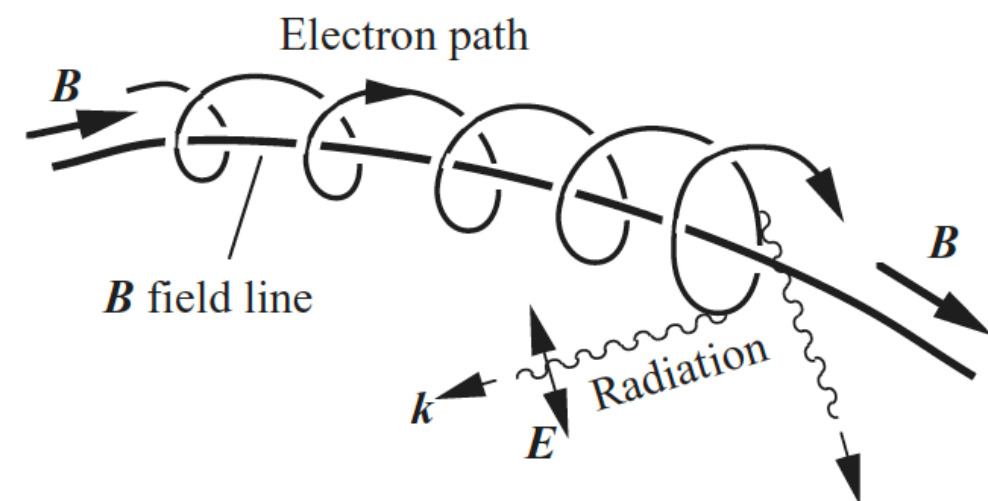
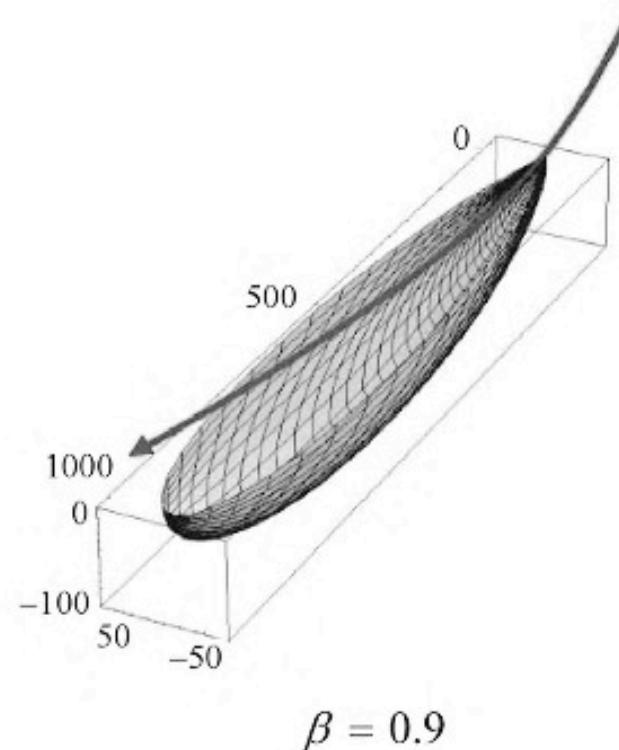
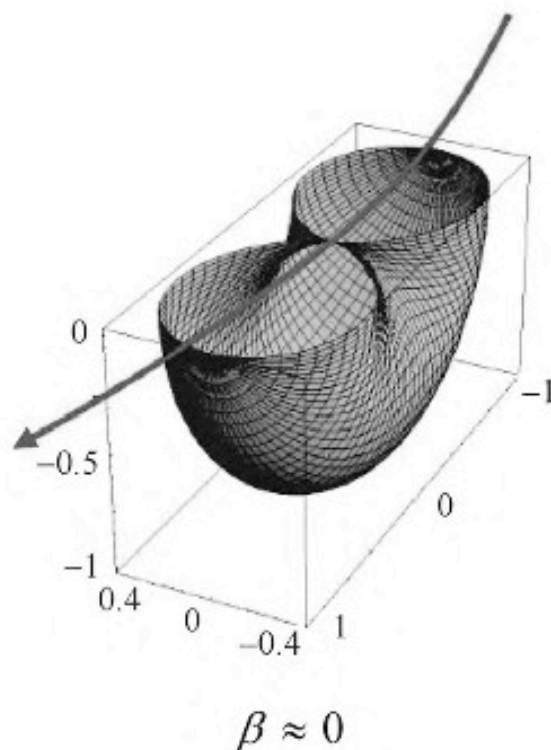


Charged particles moving in a magnetic field experience an acceleration perpendicular to the direction of their motion.

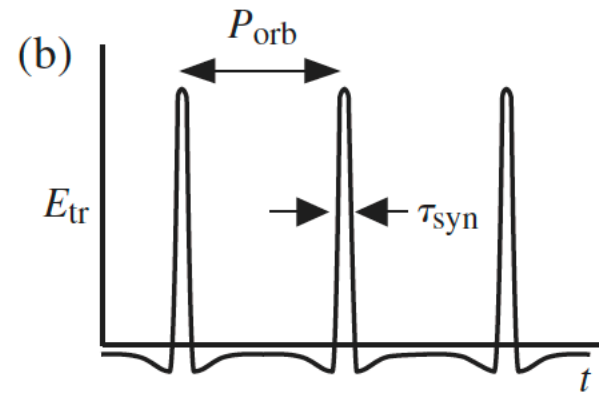
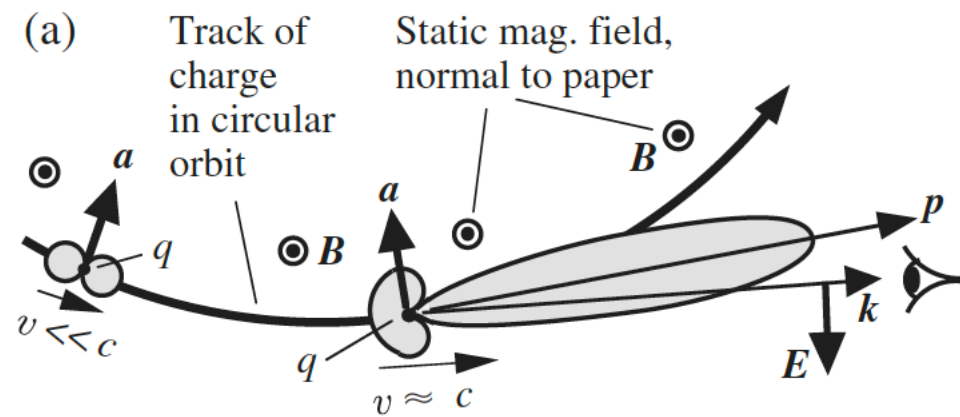
In the non-relativistic limit ($\beta \approx 0$) we get cyclotron radiation, with symmetric angular dependence of radiation: $(1 - \sin^2\theta \cos^2\phi)$.



In the relativistic limit ($\beta \approx 1$) there is strong beaming effect in the forward direction! The emitted power now becomes a strong function of electron energy. This is the synchrotron radiation.



Synchrotron spectrum of a single electron



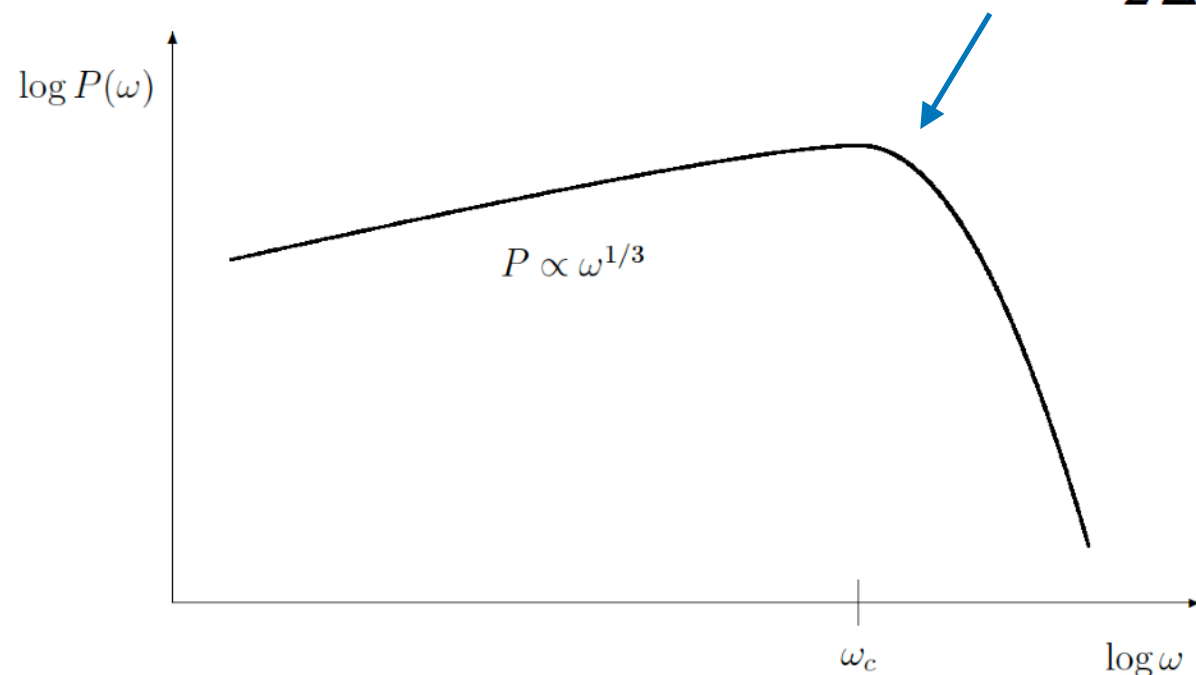
The spectrum of a single electron is essentially a series of pulses. Each pulse has a finite time width, which is the “sweeping time” of the beam.

$$\Delta t_p = \frac{2}{\gamma \omega_B 2\gamma^2} = \frac{1}{\gamma^3 \omega_B} = \frac{1}{\gamma^2 \omega_G}$$

$$\boxed{\omega_G \equiv \frac{qB}{mc}} \quad (\text{Cyclotron angular frequency; rad/s})$$

Therefore, the frequency spectrum (=Fourier transform of the time pulse) for single electron’s emission is a continuum, with a maximum around the frequency

$$\nu_{\max} \approx \frac{1}{2 \Delta t_p} \approx \pi \gamma^2 \nu_G \sin \alpha \propto \gamma^2 B_{\perp}.$$



The power is relatively flat below this frequency, with a logarithmic slope of 1/3, and drops off rapidly above.

We can assume most of the radiation coming at this peak frequency $\nu_{\max}$.

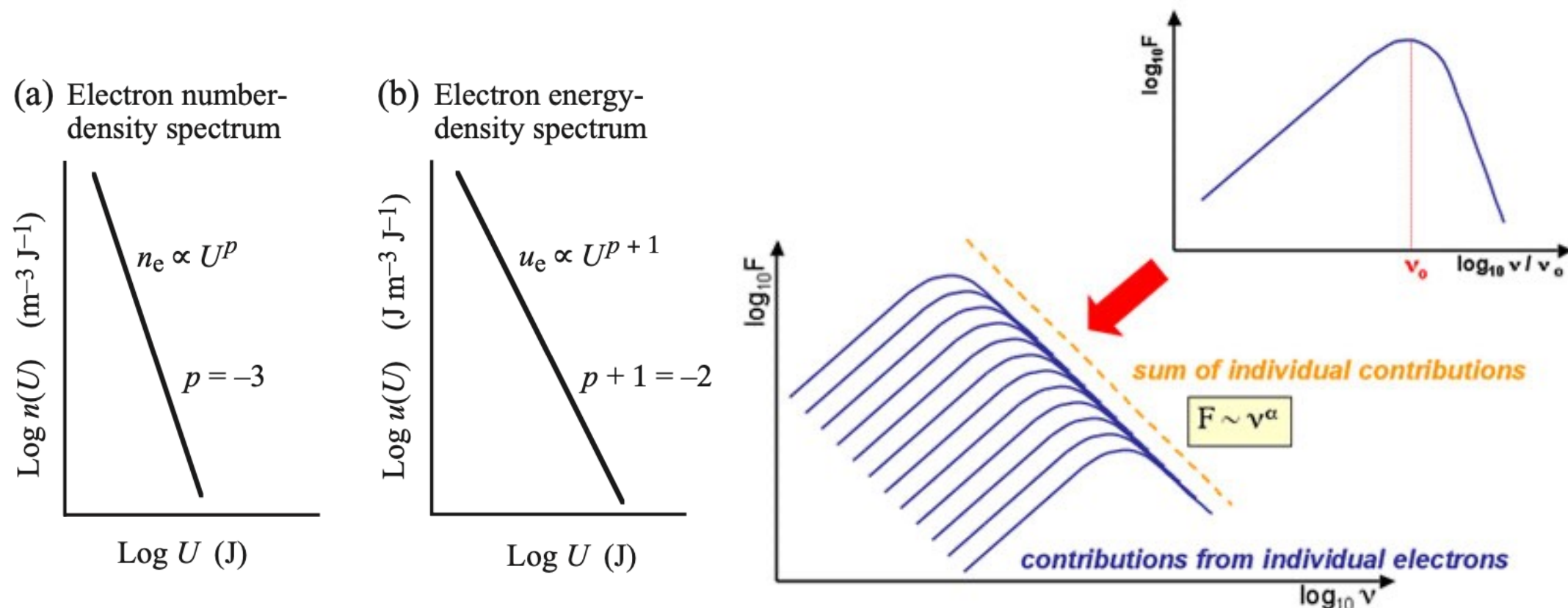
Note the $\gamma^2 B_{\perp}$ dependence.

Spectrum from power-law electrons

The most interesting (and astrophysically relevant) application, of course, comes from the radiation when the electrons have a power-law distribution.

The spectrum can be calculated to good accuracy by assuming that each electron radiates all of its available energy, $P = -\frac{dE}{dt} = \frac{4}{3} \sigma_T \beta^2 \gamma^2 c U_B$ at the single frequency $\nu \approx \gamma^2 \nu_G$, (which is close to the critical frequency).

This leads to a power-law spectrum if the electron energies themselves follow a power-law distribution.



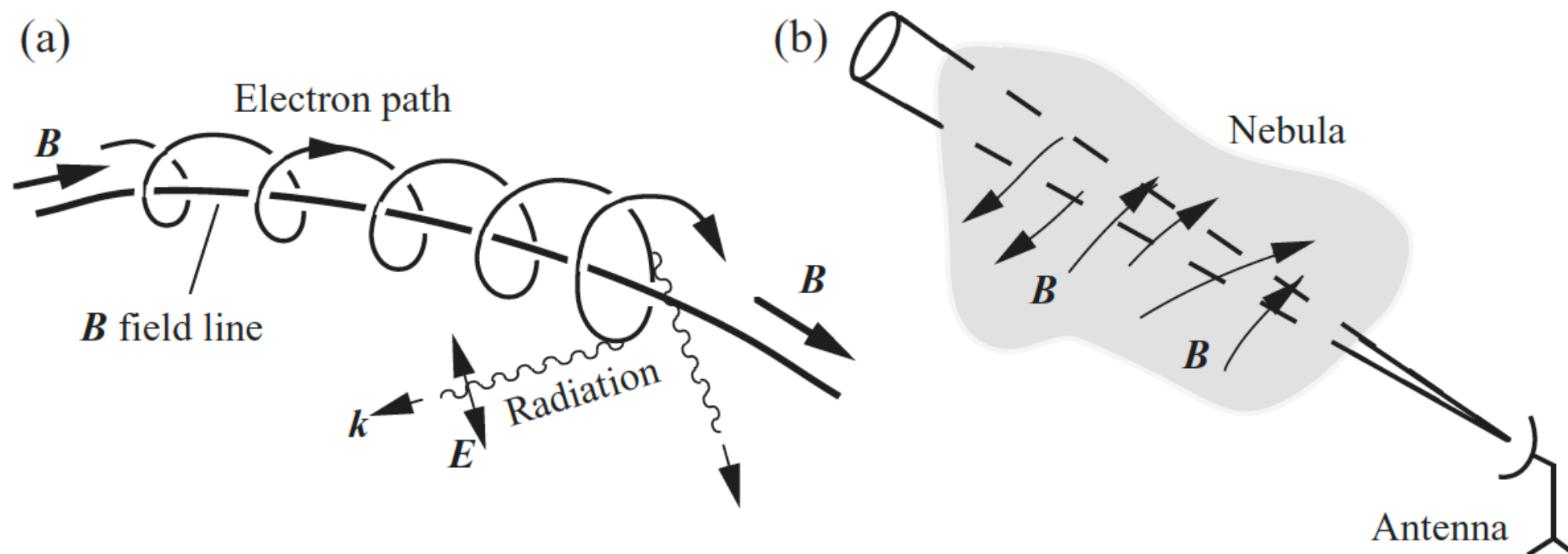
$$n(U) dU \propto U^p dU$$

Synchrotron radiation is polarized

Synchrotron emission is always polarized, because the emitting electrons have a strong directionality forced upon them by the magnetic field.

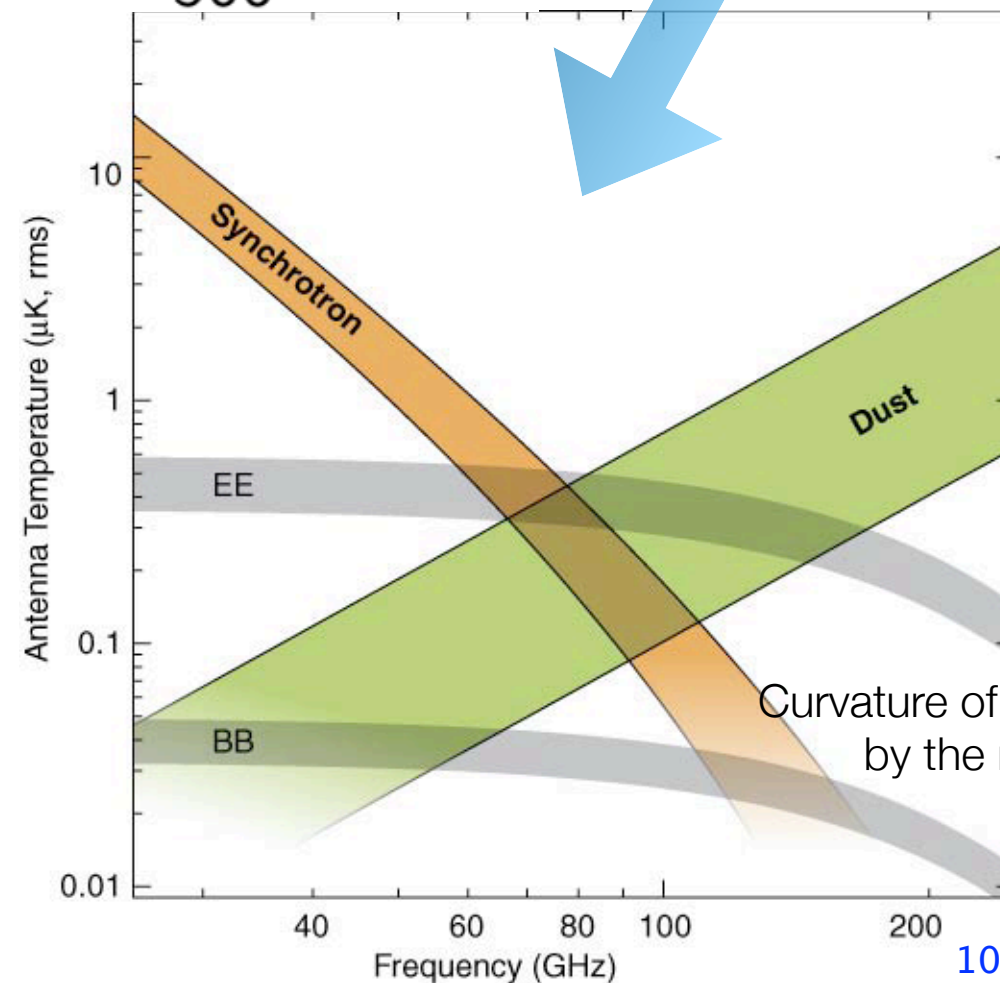
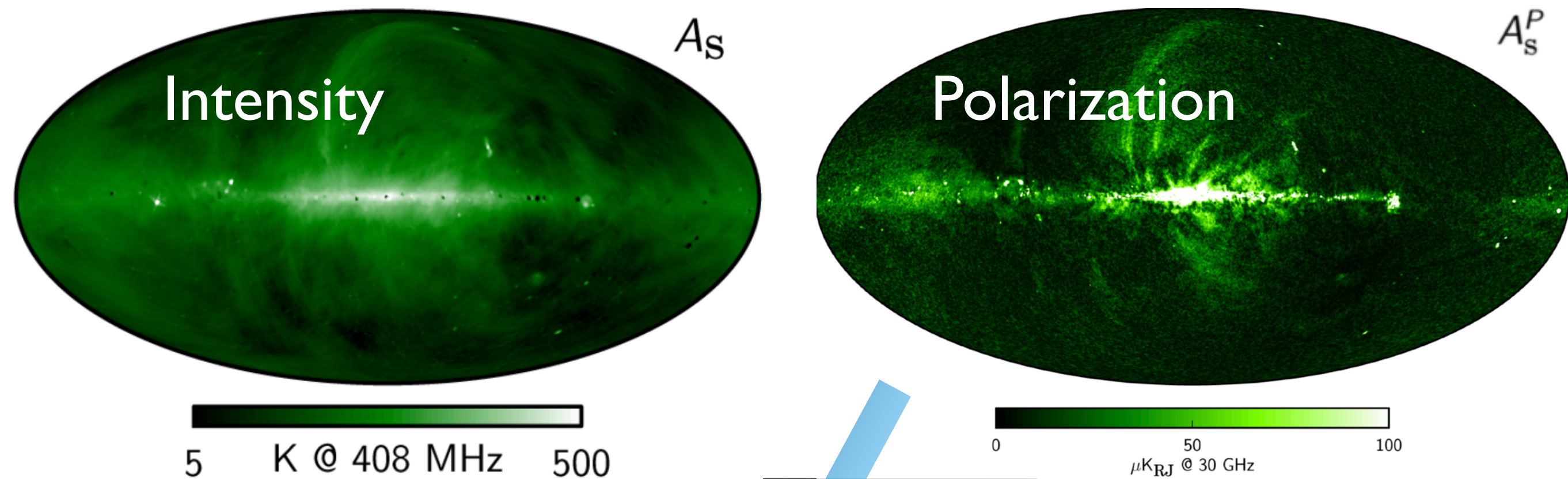
Radiation from single electrons are elliptically polarized, but in an ensemble of particles, the transverse components cancel out and we get a linear polarization, roughly in a plane perpendicular to the magnetic field.

This fact is utilized also in measuring Faraday rotation, to determine the line-of-sight component of interstellar magnetic fields using a background source.



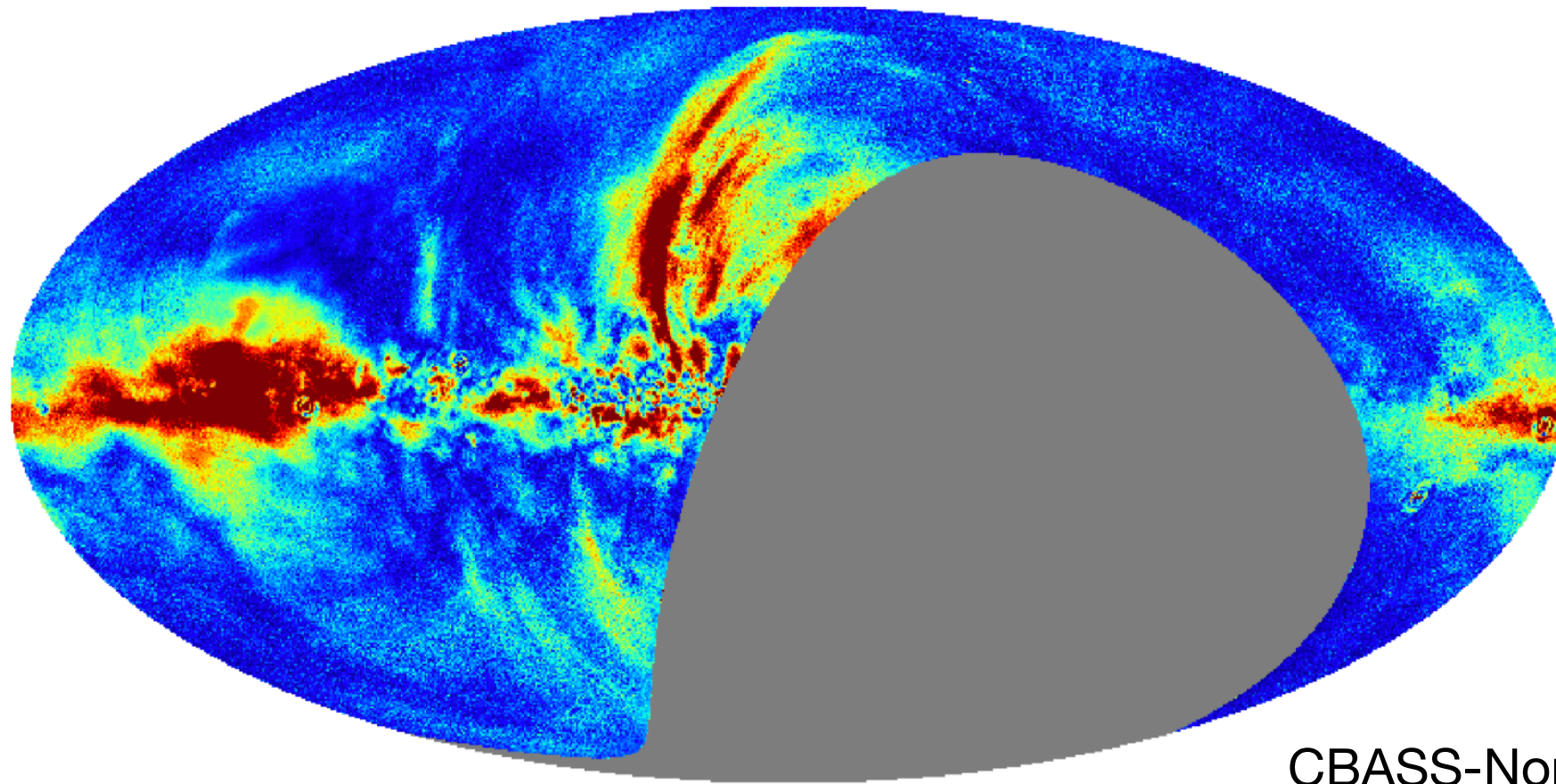
(a) Electrons emitting polarized synchrotron emission by spiralling along magnetic field lines. (b) Line of sight through a nebula with partially ordered magnetic field lines.

Synchrotron emission from the Galaxy



Curvature of the synchrotron spectrum is caused by the mixing of many different power-laws.

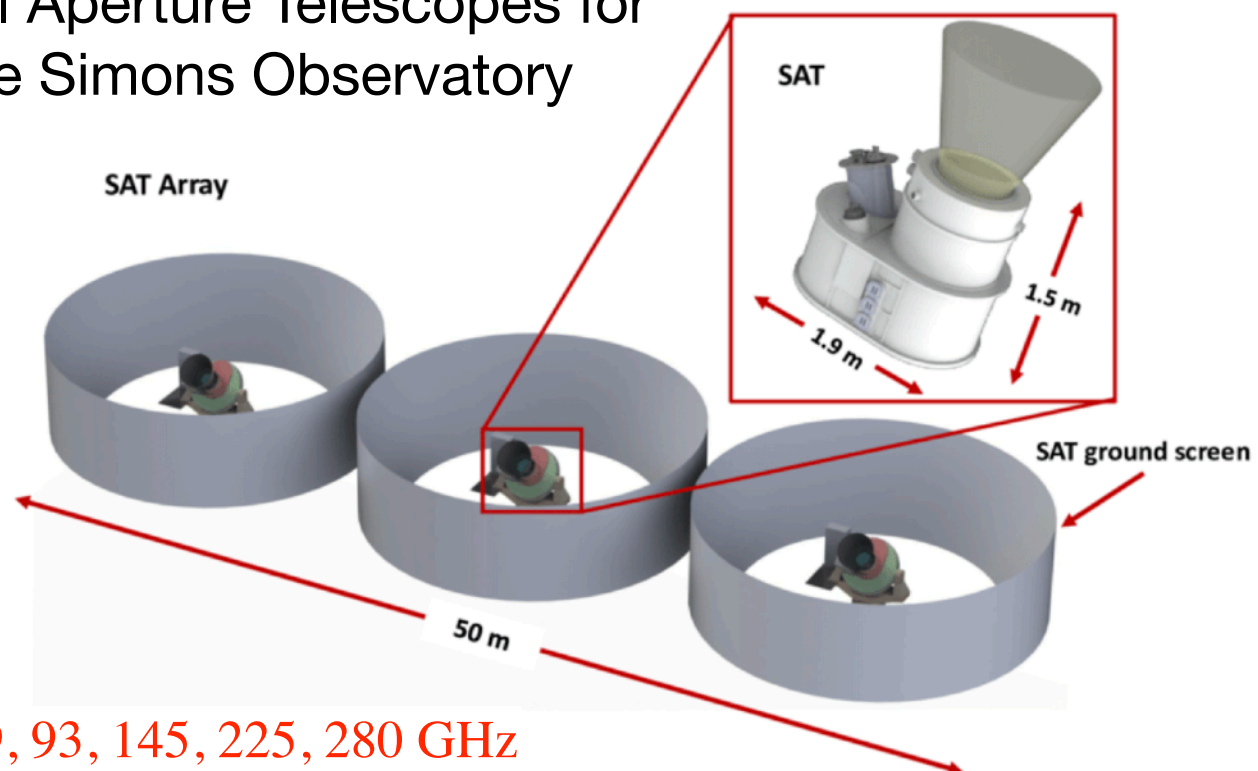
Synchrotron pathfinders for the B-mode



Preliminary map of all-sky polarization amplitude from the CBASS-North.

CBASS-North experiment in California

Small Aperture Telescopes for the Simons Observatory



CCAT-prime for dust polarization

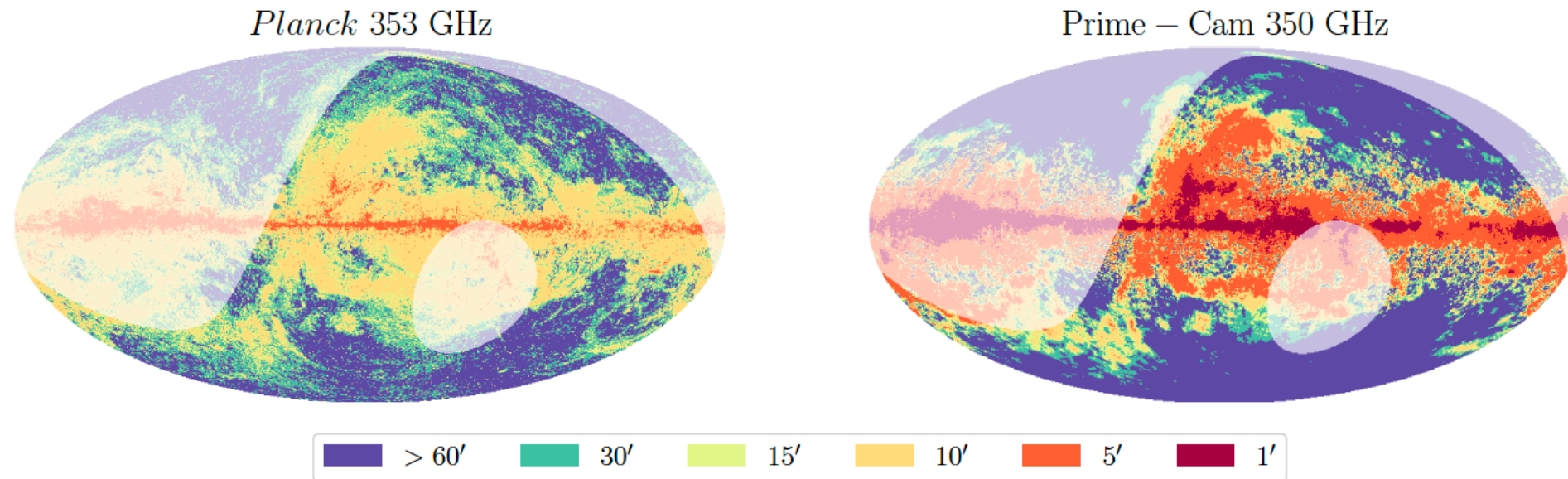
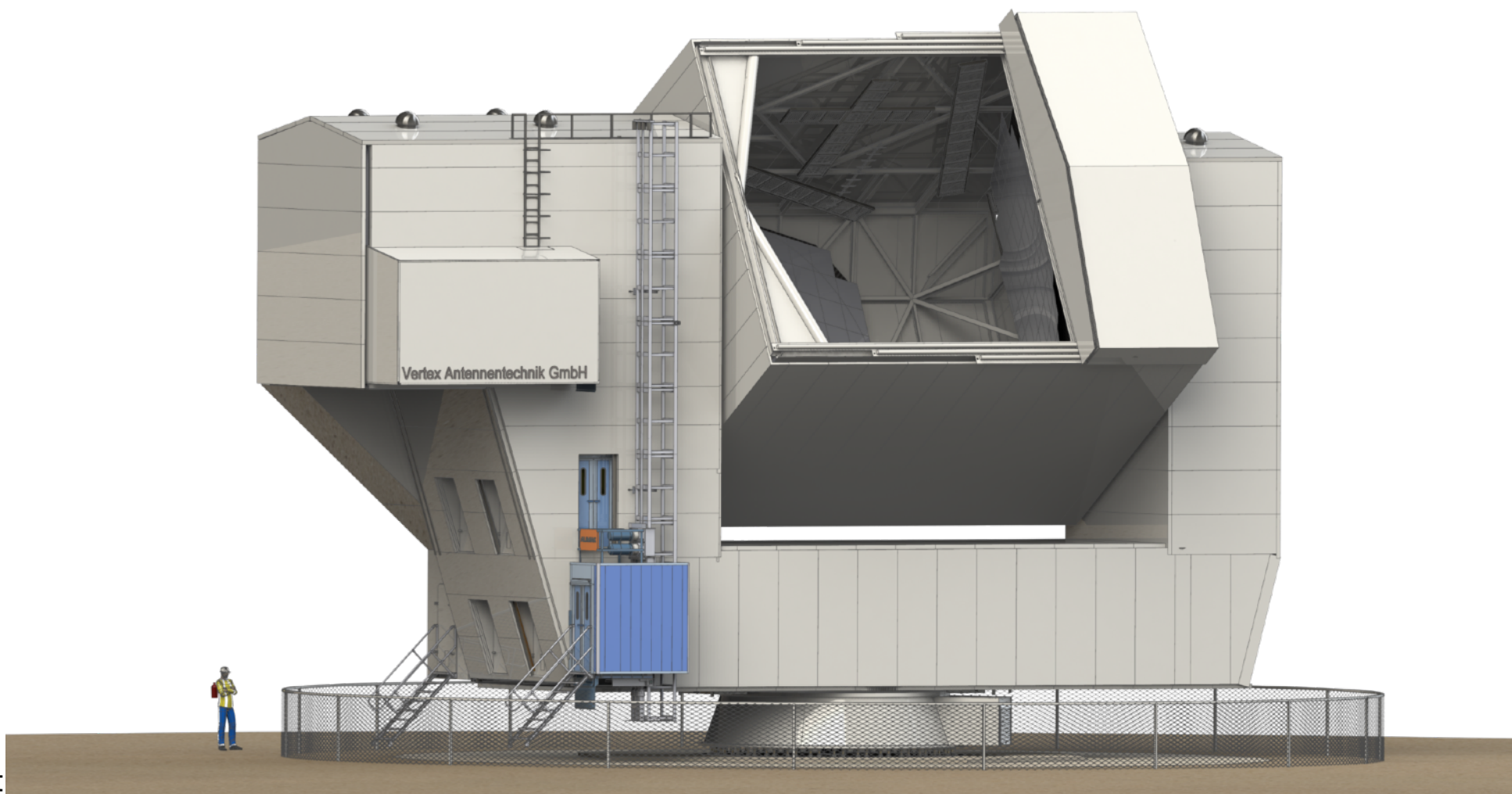
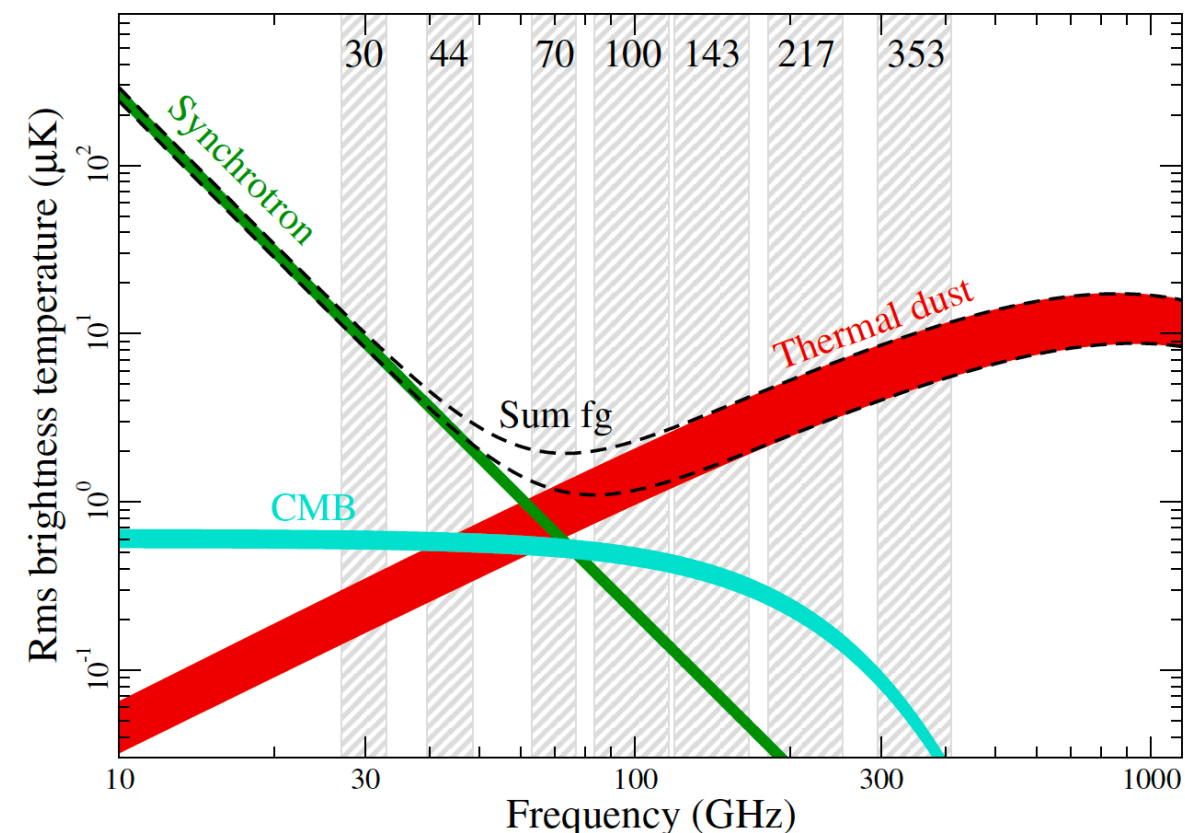
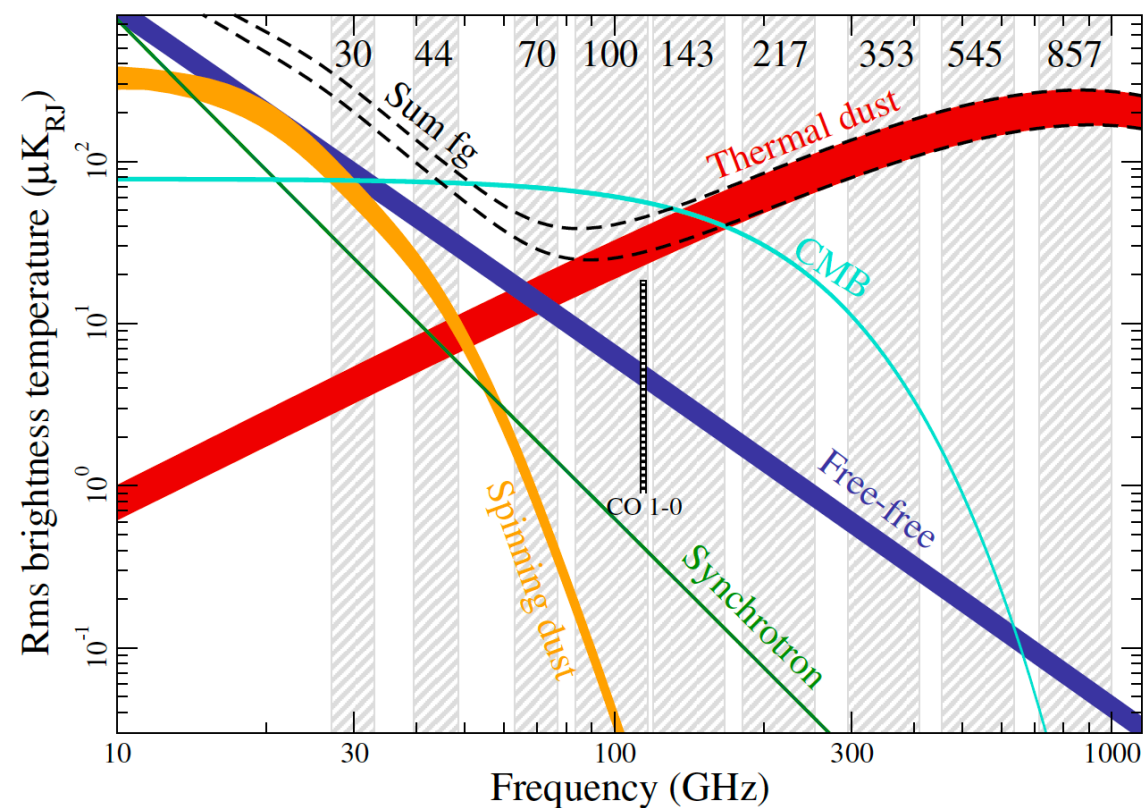


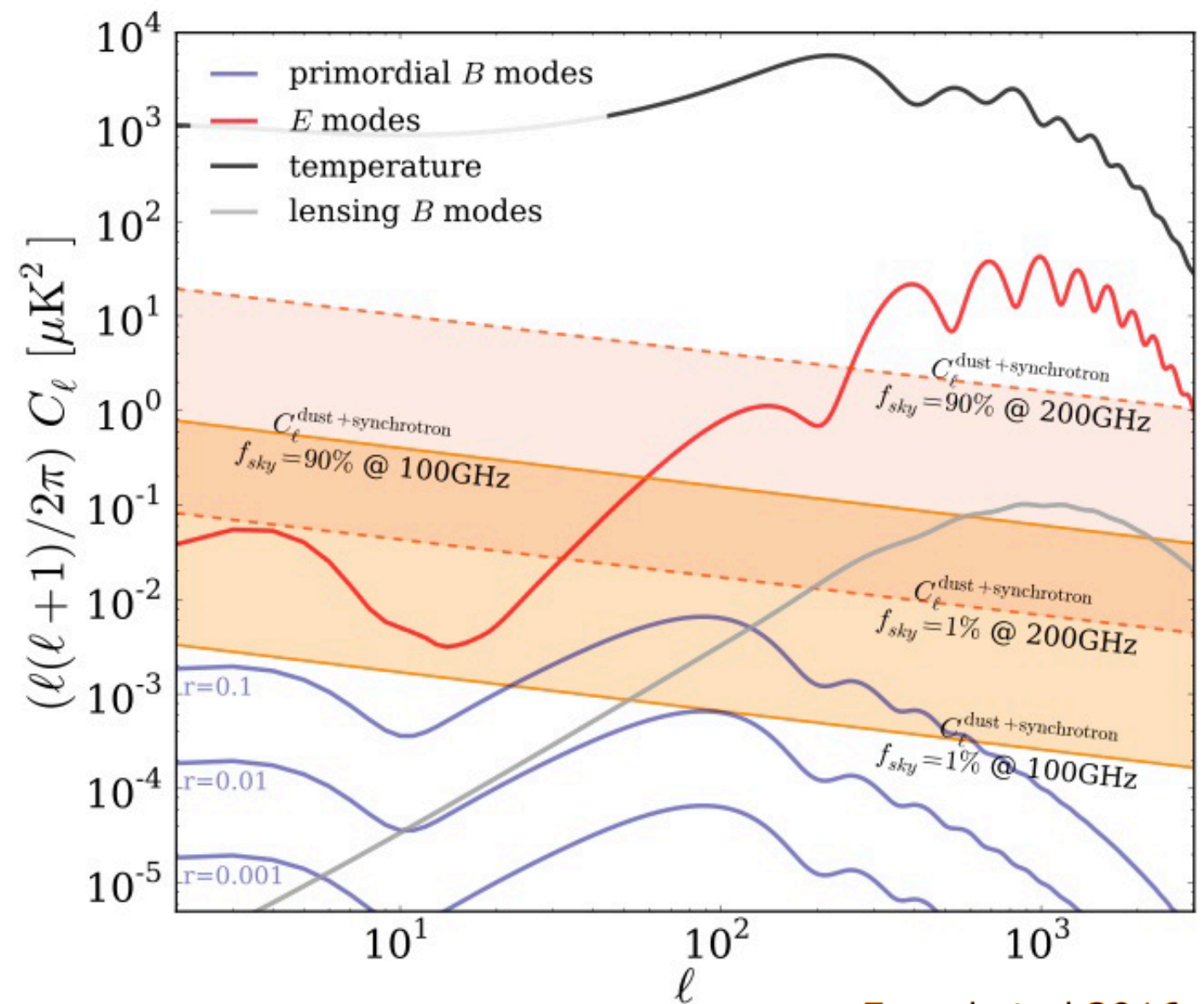
Figure 8. Effective resolution for $\text{SNR} > 3$ measurements of dust polarized intensity with *Planck* at 353 GHz (left) and FYST/Prime-Cam at 350 GHz (right), for the 4000 hour Wide Field Survey (WFS) at different levels of spatial resolution. Translucent contours indicate the boundaries of the FYST observable region.



CMB foregrounds summary

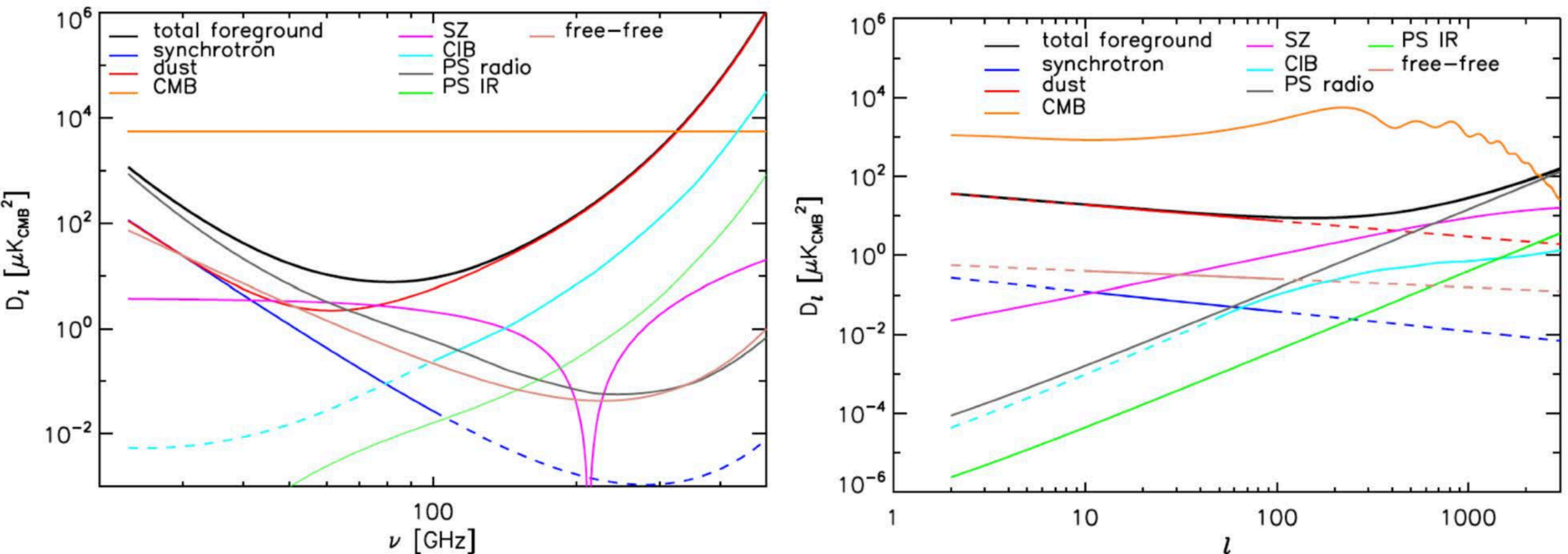


Galactic foregrounds are more relevant at large angular scales, whereas extragalactic ones (e.g. CIB) roughly follows the same shape as noise power spectrum. The Galactic foreground power spectrum amplitudes are higher if more sky area is included (more contamination by the Galaxy).



Errard et al 2016

CMB foregrounds summary



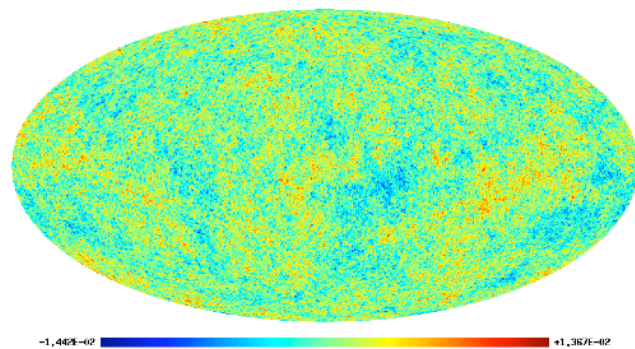
The figure above (from Planck collaboration 2013) summarizes our knowledge of the CMB temperature foregrounds. **Left:** The frequency spectra of various foregrounds at fixed $\ell = 200$ (position of the first acoustic peak). **Right:** The angular power spectra of these foregrounds, at fixed $\nu = 100$ GHz.

Solid lines mark where the spectra are estimated from data, and dashed lines where they are extrapolated. For Galactic foregrounds, a 2-point Gaussian statistic (power spectrum) would be very far from the actual situation, anyway!

Separating the Components

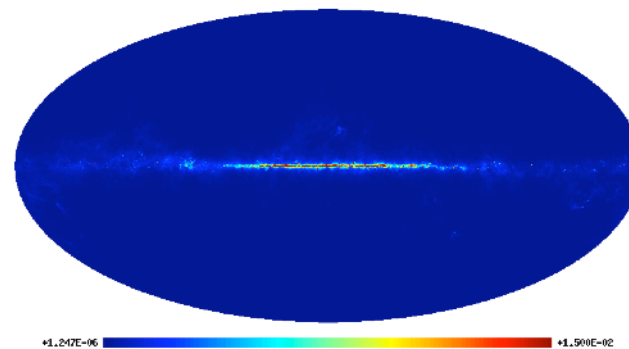
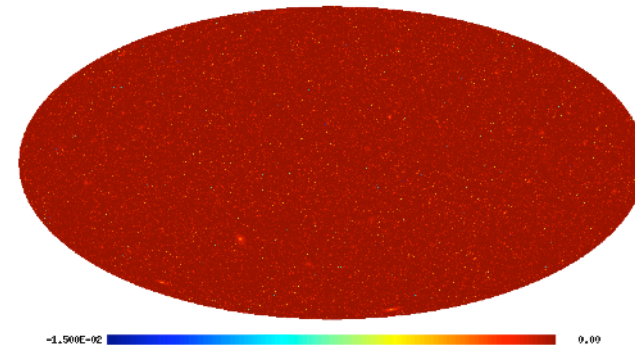
How to remove CMB foregrounds?

CMB



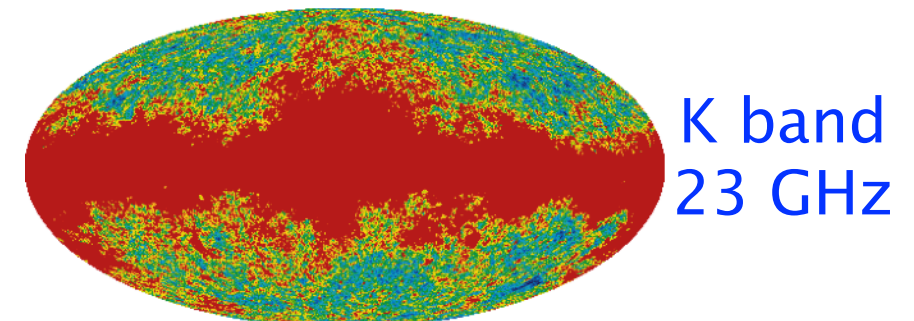
+

Foregrounds

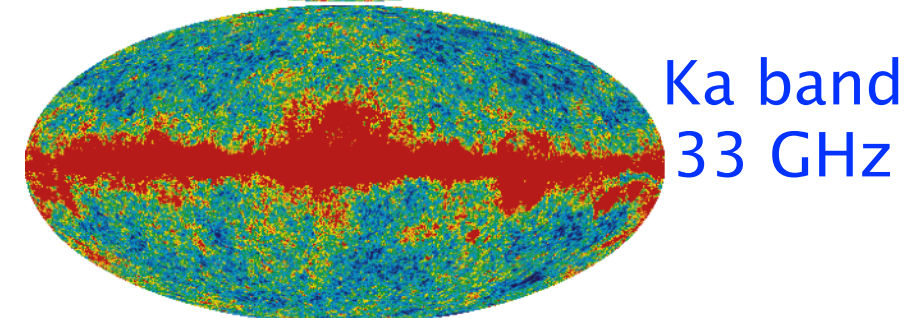


=

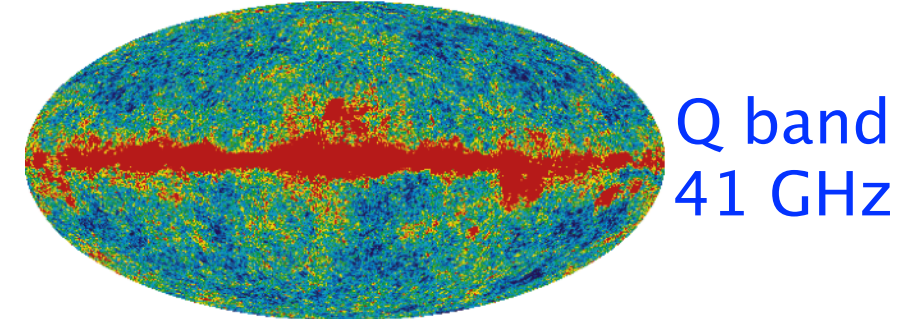
Observation



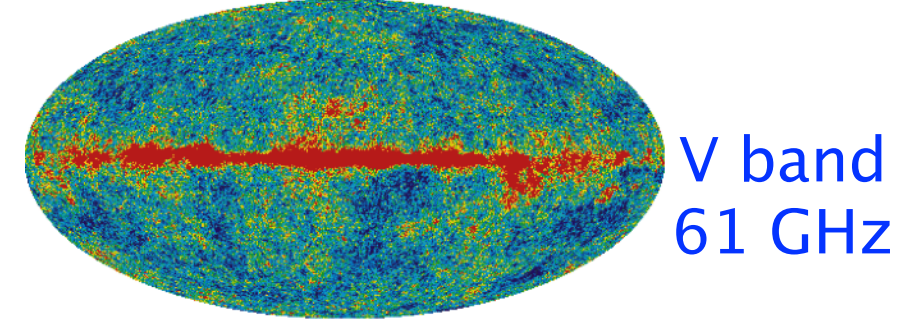
K band
23 GHz



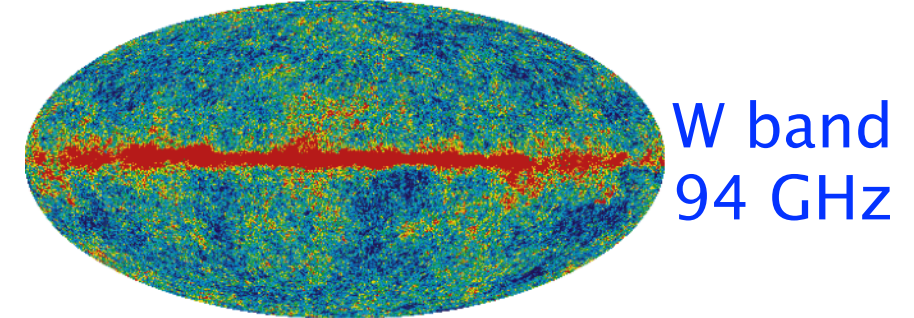
Ka band
33 GHz



Q band
41 GHz



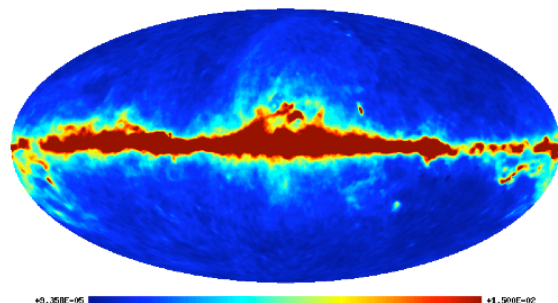
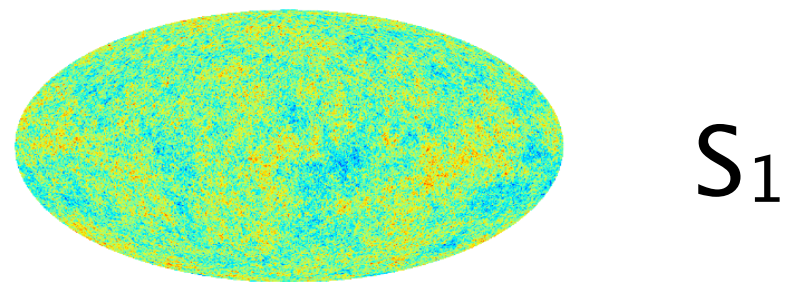
V band
61 GHz



W band
94 GHz

Credit: L. Colombo

Component Separation: In general it's an inversion problem



Two observing frequencies: ν_1, ν_2

$$x_1 = a_{11} s_1 + a_{12} s_2 + n_1$$

$$x_2 = a_{21} s_1 + a_{22} s_2 + n_2$$

$$\begin{aligned}
 x_1 &= a_{11} \text{ (map)} + a_{12} \text{ (map)} + n_1 \\
 x_2 &= a_{21} \text{ (map)} + a_{22} \text{ (map)} + n_2
 \end{aligned}$$

$$\mathbf{x} = \mathbf{A} \mathbf{s} + \mathbf{n}$$

Invert for $\mathbf{s}$

However, in real life, it is extremely difficult to determine this matrix $\mathbf{A}$. But we can make progress even without having as many channels as components or without having detailed information on all the foregrounds.

Component separation: The ILC method

The **Internal Linear Combination (ILC)** method aims to combine different frequency maps with specific weights, such that contributions from all the contaminating signals (plus instrument noise) are minimized in the sought-after signal (map). This is the principle of a **minimum variance unbiased estimator**.

This works especially well when we have poor knowledge of the foregrounds. **But we must have a precise knowledge of the spectrum of the signal that we're interested in.** Also, ILC should be used separately on different spatial scales for better results (using masks or wavelet filters).

The term “internal” refers to the fact that no prior information or auxiliary data from other observations are needed. The ILC method is one of the most assumption-free map making tools available! It only requires the following two assumptions:

- The observed maps represent a linear mixture of astrophysical components and noise.
- All components are uncorrelated.

ILC method formalism (I)

From the assumption that observed maps are a linear mixture of astrophysical components and noise, we can write

$$T_i(p) = a_i s(p) + n_i(p),$$

where a_i are the components of a “mixing vector” which contains the spectrum of interest and has as many components as frequencies. $s_i(p)$ and $n_i(p)$ are the signal and noise components in each channel maps. In vector form:

$$\vec{T}(p) = \vec{a}s(p) + \vec{n}(p).$$

By forming a linear combination $s_{\text{ILC}}(p) = \vec{\omega}^T \vec{T}(p)$, the ILC method provides an estimation $s_{\text{ILC}}(p)$ of the desired signal $s(p)$. Here ω_i are the “weights”, or the desired ILC coefficients.

$$s_{\text{ILC}}(p) = \vec{\omega}^T \vec{a}s(p) + \vec{\omega}^T \vec{n}(p).$$

The goal is to find these weights ω_i **which will minimize the variance in the reconstructed map, $s_{\text{ILC}}(p)$** . Following Eriksen (2004) et al., the map variance is calculated from

$$\text{VAR}(s_{\text{ILC}}(p)) = \text{VAR}(s(p)) + \text{VAR}(\vec{\omega}^T \vec{n}(p)) = \vec{\omega}^T \hat{C} \vec{\omega},$$

where **C is the frequency-to-frequency covariance matrix** of the maps (computed empirically from the actual multi-frequency data).

ILC method formalism (II)

The condition of minimization of the variance means that

$$\frac{\partial}{\partial \omega_i} [\vec{\omega}^T \hat{C} \vec{\omega}] = 0. \quad \textcircled{1}$$

In addition, we have a normalization condition to preserve the sum total of the signal of interest:

$$\vec{\omega}^T \vec{a} = \vec{a}^T \vec{\omega} = 1. \quad \textcircled{2}$$

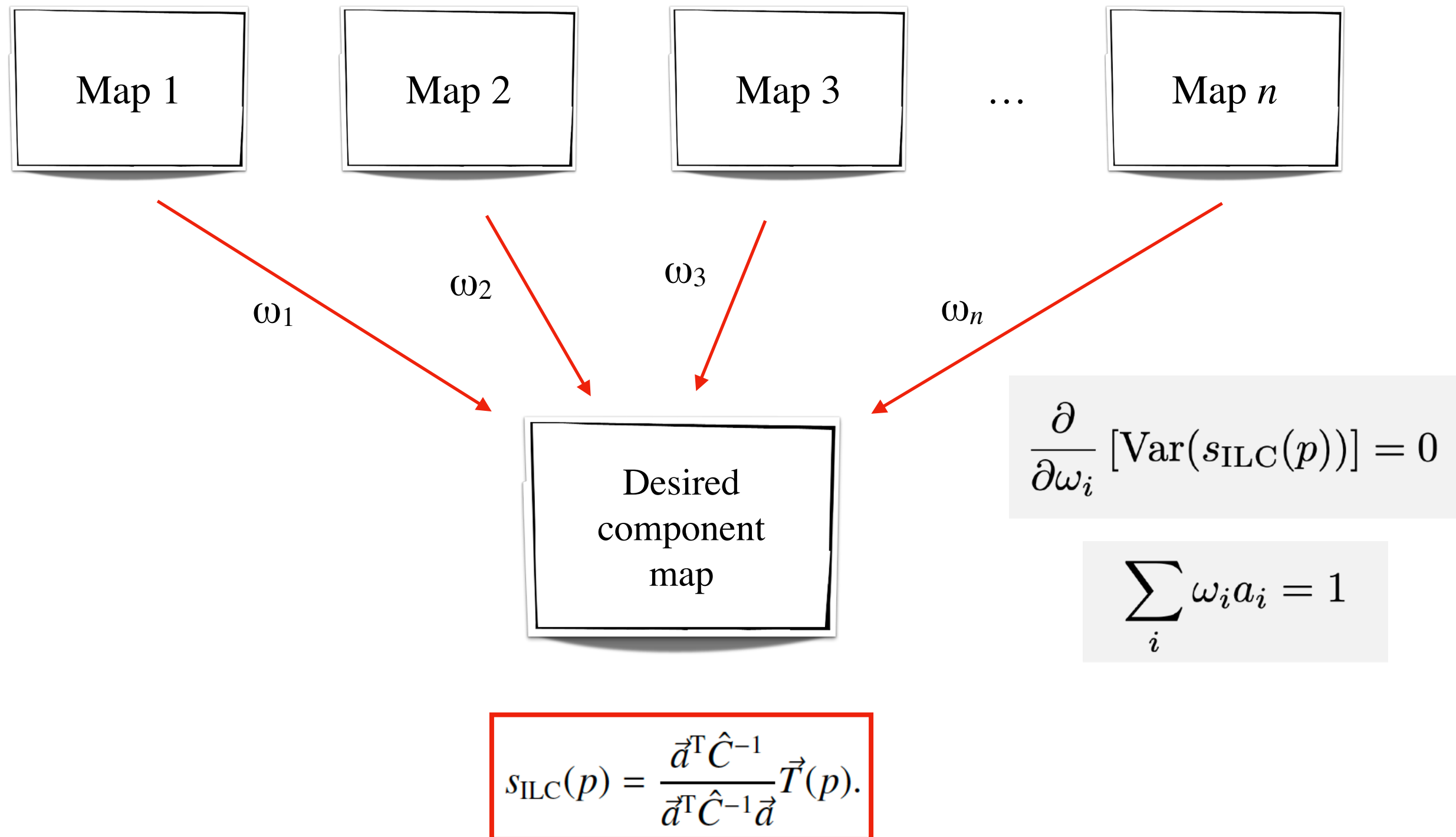
It is straight-forward to solve equations 1 and 2 for the weights, in terms of the mixing vector (usually done by employing Lagrange-multiplier technique). The solution is

$$\vec{\omega} = \frac{\hat{C}^{-1} \vec{a}}{\vec{a}^T \hat{C}^{-1} \vec{a}}.$$

Therefore, the estimated map $s_{\text{ILC}}(p)$ of our component of interest is given by

$$s_{\text{ILC}}(p) = \frac{\vec{a}^T \hat{C}^{-1}}{\vec{a}^T \hat{C}^{-1} \vec{a}} \vec{T}(p).$$

How ILC method works



ILC method formalism (the maths..)

Here are the maths of the intermediate steps. We start by writing each (observed) frequency maps as a linear combination of the signal and noise, written in vector form:

$$T_i(p) = \sum_j A_j s_j(p) + n_i(p), \quad \vec{T}(p) = \vec{A}s(p) + \vec{n}$$

The ILC method gives an estimate of the component of interest, $s(p)$, as an weighted sum of the observed frequency maps. The variance of this ILC-estimated map is computed as the following:

$$s_{\text{ILC}}(p) = \vec{\omega}^T \vec{T}(p) \quad \text{VAR}(s_{\text{ILC}}(p)) = \text{VAR}(s(p)) + \text{VAR}(\vec{\omega}^T \vec{n}(p)) = \vec{\omega}^T \hat{\mathbf{C}} \vec{\omega},$$

$$\begin{aligned} \text{Var}(s_{\text{ILC}}(p)) &= \langle s_{\text{ILC}}(p)^2 \rangle - \langle s_{\text{ILC}}(p) \rangle^2 \\ &= \frac{1}{N_{\text{pix}}} \sum_{p=1}^{N_{\text{pix}}} \left[\sum_{i=1}^{N_{\text{obs}}} \omega_i T_i(p) \right]^2 - \left\{ \frac{1}{N_{\text{pix}}} \sum_{p=1}^{N_{\text{pix}}} \left[\sum_{i=1}^{N_{\text{obs}}} \omega_i T_i(p) \right] \right\}^2 \\ &= \sum_{i=1}^{N_{\text{obs}}} \sum_{j=1}^{N_{\text{obs}}} \omega_i \omega_j \left[\frac{1}{N_{\text{pix}}} \sum_{p=1}^{N_{\text{pix}}} T_i(p) T_j(p) \right] - \left\{ \sum_{i=1}^{N_{\text{obs}}} \omega_i \left[\frac{1}{N_{\text{pix}}} \sum_{p=1}^{N_{\text{pix}}} T_i(p) \right] \right\}^2 \\ &= \sum_{i=1}^{N_{\text{obs}}} \sum_{j=1}^{N_{\text{obs}}} \omega_i \omega_j \left\{ \frac{1}{N_{\text{pix}}} \sum_{p=1}^{N_{\text{pix}}} T_i(p) T_j(p) - \left[\frac{1}{N_{\text{pix}}} \sum_{p=1}^{N_{\text{pix}}} T_i(p) \right] \left[\frac{1}{N_{\text{pix}}} \sum_{p=1}^{N_{\text{pix}}} T_j(p) \right] \right\} \\ &= \vec{\omega}^T \hat{\mathbf{C}} \vec{\omega} \end{aligned}$$

The weights are computed by solving these two equations: $\frac{\delta}{\delta \omega_i} [\vec{\omega}^T \hat{\mathbf{C}} \vec{\omega}] = 0, \quad \vec{\omega}^T \vec{A} = \vec{A}^T \vec{\omega} = 1.$

Solution is obtained by using the Lagrange multiplier technique: $\frac{\delta}{\delta \omega_i} [\vec{\omega}^T \hat{\mathbf{C}} \vec{\omega} + \lambda(1 - \vec{\omega}^T \vec{A})] = 0$

$$\begin{pmatrix} 2\hat{\mathbf{C}} & -\mathbf{1} \\ \mathbf{1} & 0 \end{pmatrix} \begin{pmatrix} \vec{\omega} \\ \vec{\lambda} \end{pmatrix} = \begin{pmatrix} 0 \\ 1 \end{pmatrix} \Rightarrow \vec{\omega} = \frac{\hat{\mathbf{C}}^{-1} \vec{a}}{\vec{a}^T \hat{\mathbf{C}}^{-1} \vec{a}}.$$

Dumb ILC example: signal + noise

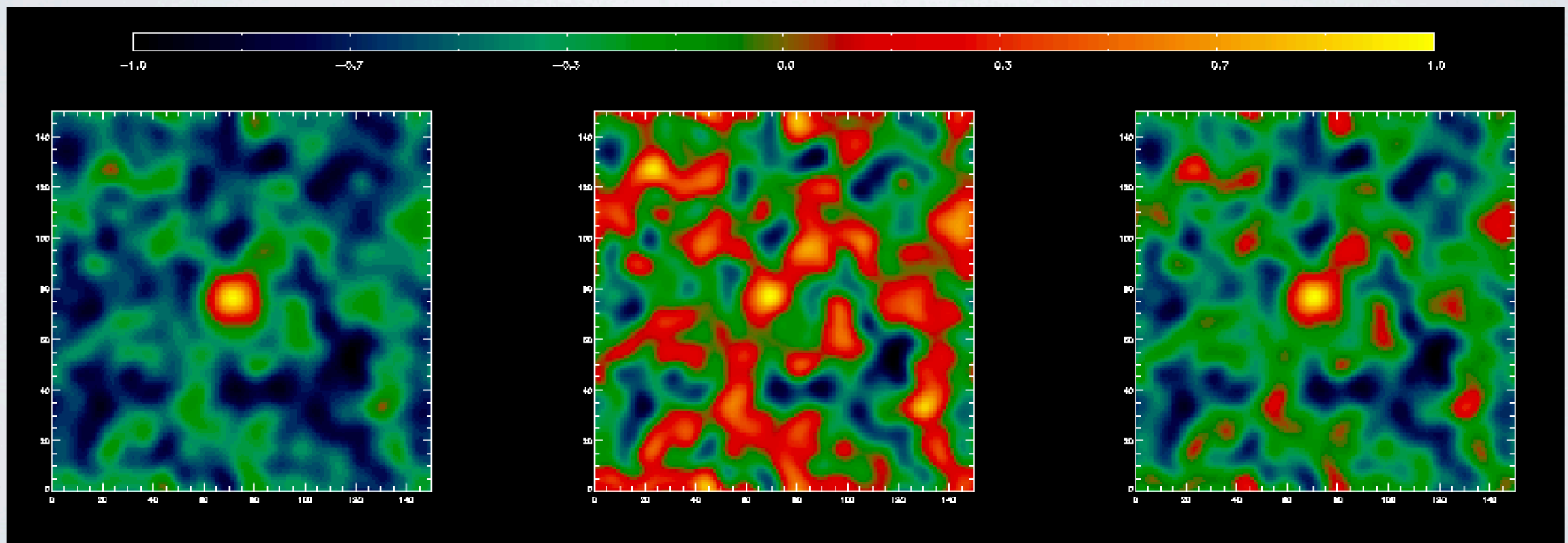
We have two maps, with signal and noise. The covariance matrix for observations is

$$\mathbf{C} = \begin{bmatrix} S + N_1 & S \\ S & S + N_2 \end{bmatrix}$$

$$\mathbf{C}^{-1} = \frac{1}{\det(\mathbf{C})} \begin{bmatrix} S + N_2 & -S \\ -S & S + N_1 \end{bmatrix}$$

The ILC weights are simply: $\omega_1 = N_2 / (N_1 + N_2)$ and $\omega_2 = N_1 / (N_1 + N_2)$.

This is same as weighting each map i proportionally to $1/N_i$.

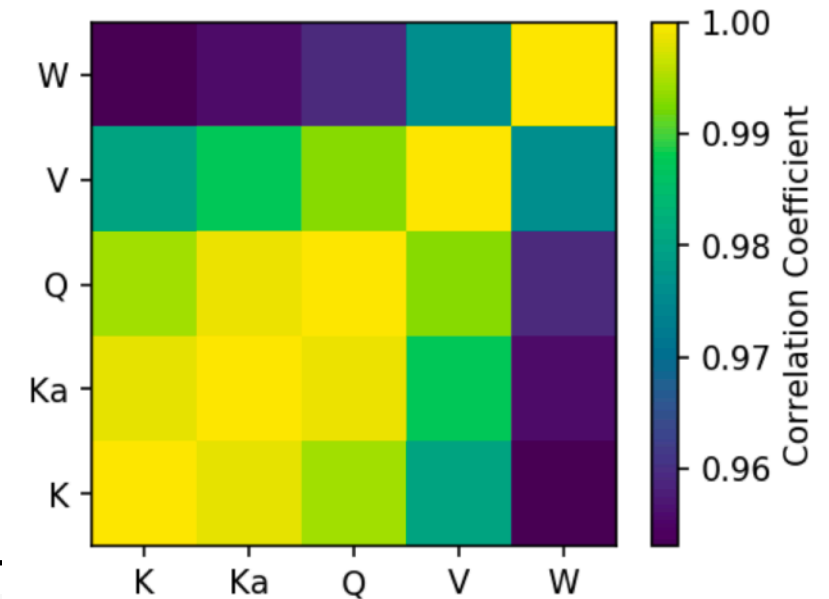
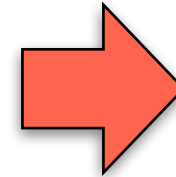
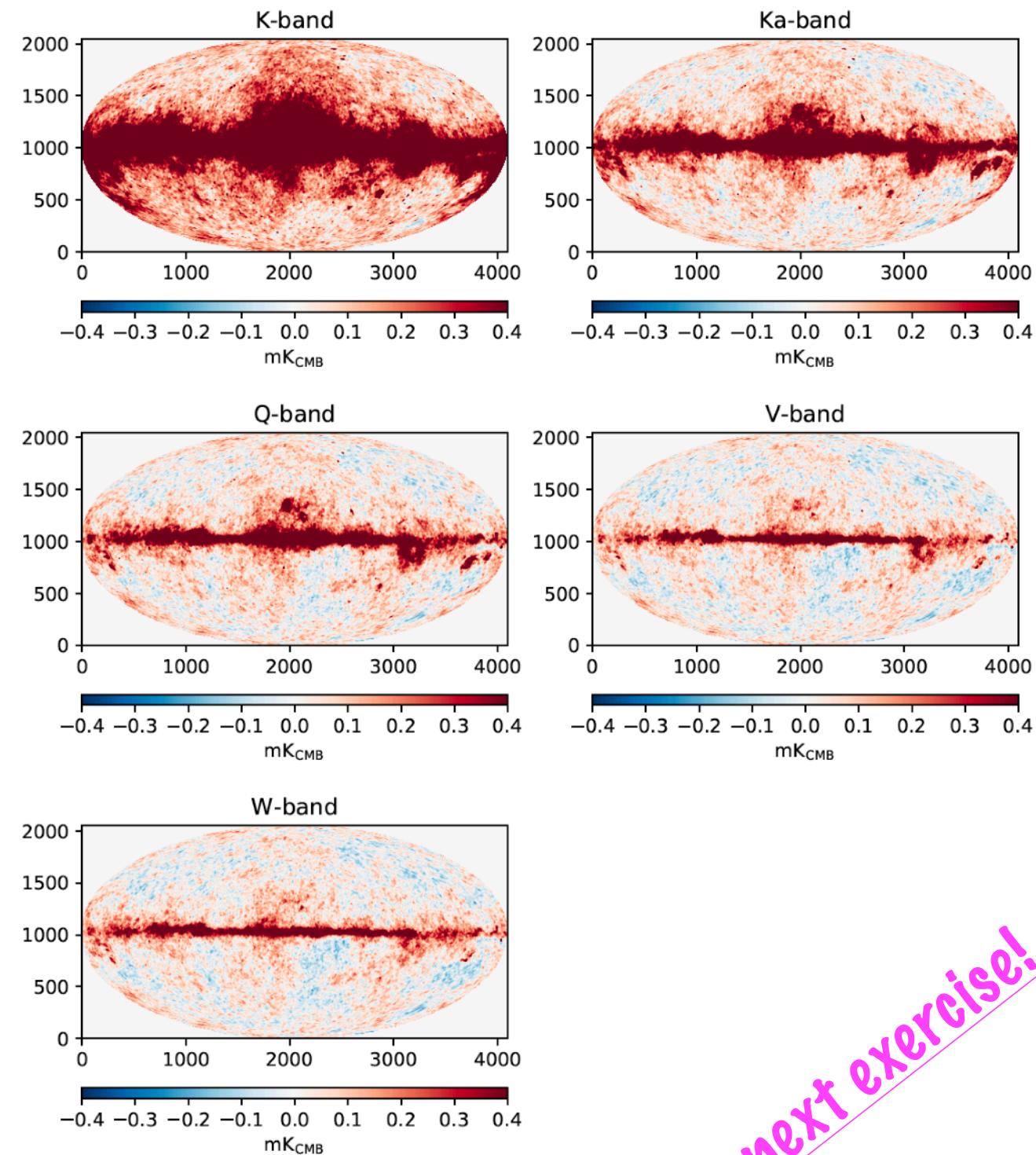


Map 1

Map 2

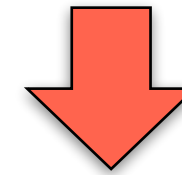
ILC map

Real ILC example: WMAP CMB all-sky

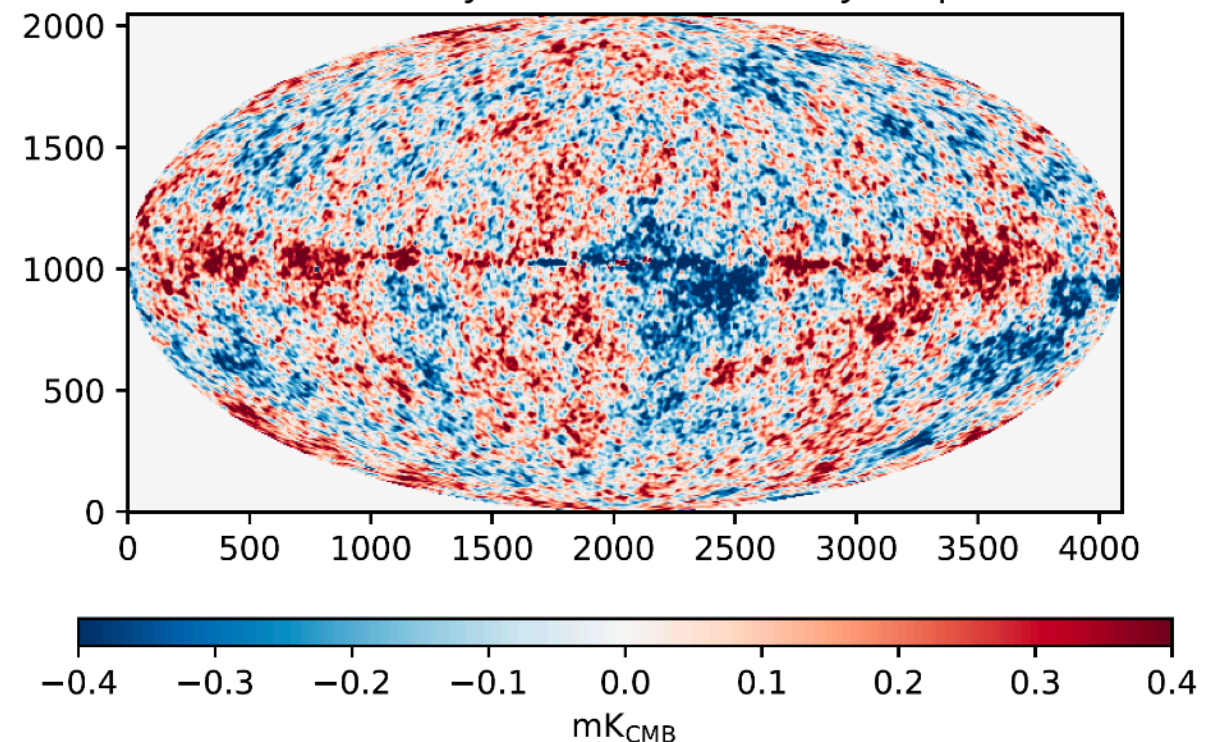


```
print(weights)
```

```
[-0.05499771 -0.03971103 -1.7916735  4.63774311 -0.02586087]
```



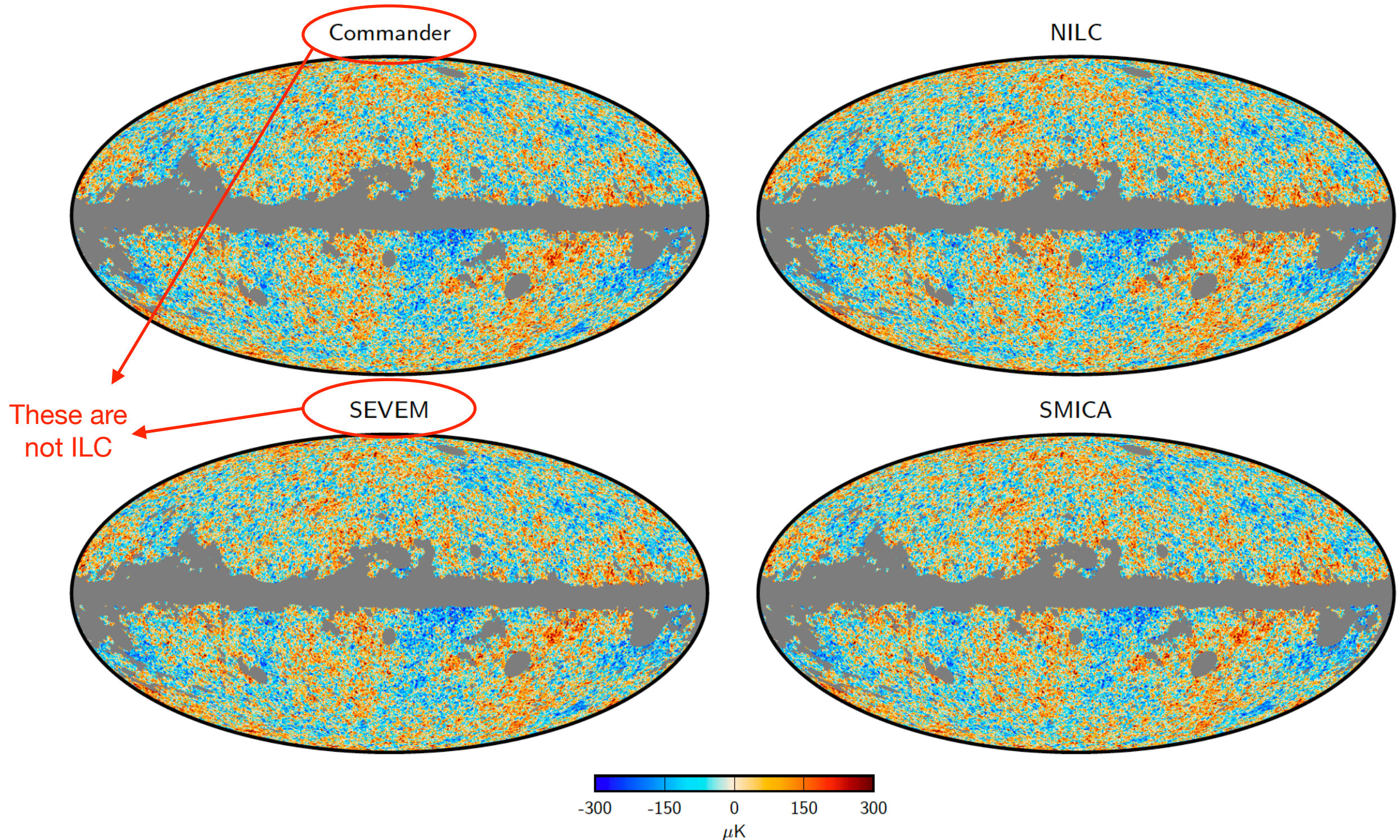
WMAP 5 year ILC CMB all-sky map



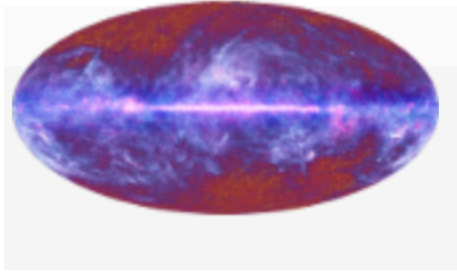
Your next exercise!

Planck CMB maps from the ILC method

Planck all-sky CMB maps from variants of the **ILC** method
(Planck 2015 results, Diffuse component separation, A&A 594, A9)



Planck component separation techniques



Page [Discussion](#)

CMB and astrophysical component maps

NILC [\[edit\]](#)

Principle

The Needlet-ILC (hereafter NILC) CMB map is constructed from all Planck channels from 44 to 857 GHz and includes multipoles up to $\ell = 3200$. It is obtained by applying the Internal Linear Combination (ILC) technique in needlet space, that is, with combination weights which are allowed to vary over the sky and over the whole multipole range.

SMICA [\[edit\]](#)

Principle

SMICA produces a CMB map by linearly combining all Planck input channels (from 30 to 857 GHz) with weights which vary with the multipole. It includes multipoles up to $\ell = 4000$.

SEVEM [\[edit\]](#)

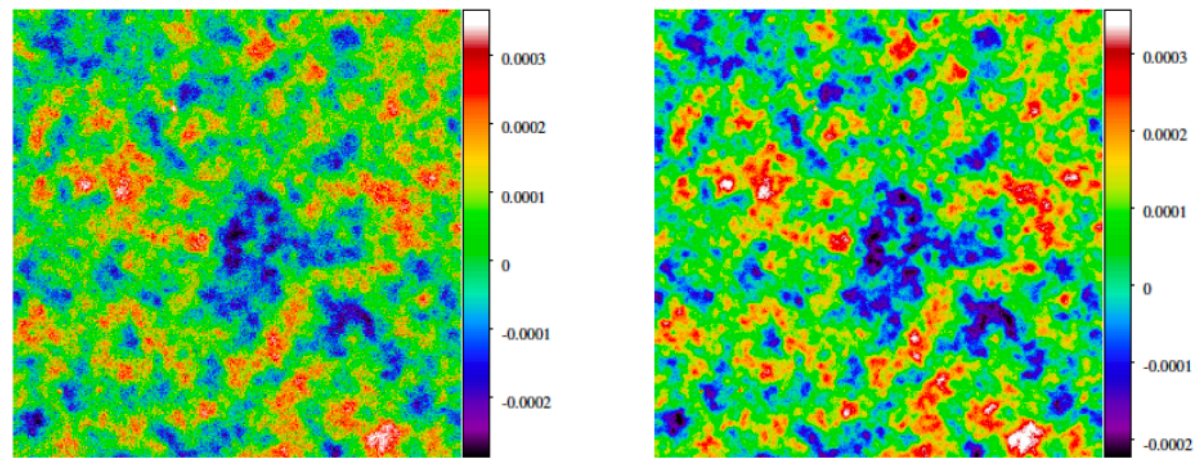
The aim of SEVEM is to produce clean CMB maps at one or several frequencies by using a procedure based on template fitting. The templates are internal, i.e., they are constructed from Planck data, avoiding the need for external data sets, which usually complicates the analyses and may introduce inconsistencies. The method has been successfully applied to Planck simulations^[2] and to WMAP polarisation data^[3]. In the cleaning process, no assumptions about the foregrounds or noise levels are needed, rendering the technique very robust.

COMMANDER-Ruler [\[edit\]](#)

COMMANDER-Ruler is the Planck software implementing a pixel based parametric component separation. Amplitude of CMB and the main diffuse foregrounds along with the relevant spectral parameters for those (see below in the Astrophysical Foreground Section for the latter) are parametrized and fitted in single MCMC chains conducted at $N_{\text{side}}=256$ using COMMANDER, implementing a Gibbs Sampling. The CMB amplitude which is obtained in these runs corresponds to the delivered low resolution CMB component from COMMANDER-Ruler which has a FWHM of 40 arcminutes.

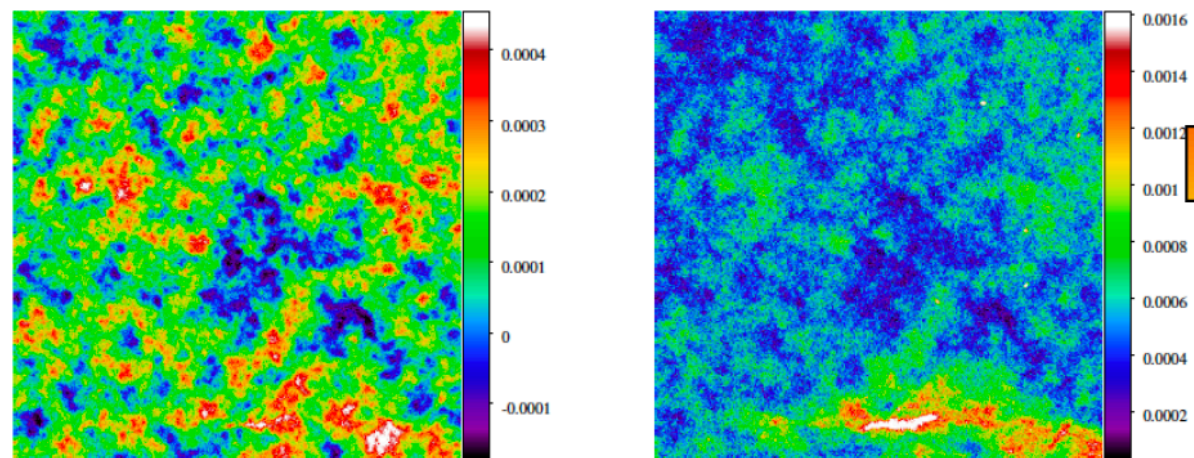
(Example for Coma cluster's SZ signal)

ILC implementation



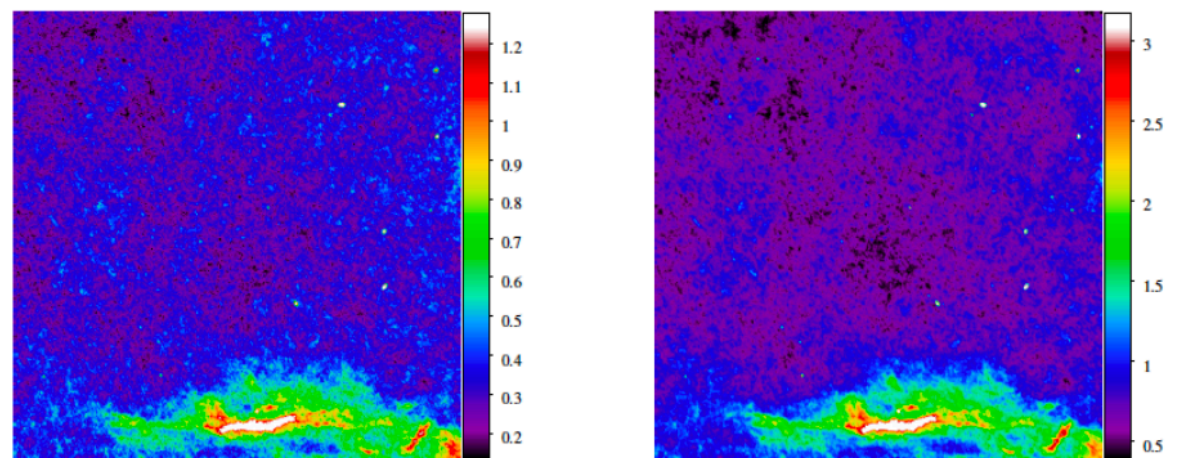
(a) 100 GHz

(b) 143 GHz



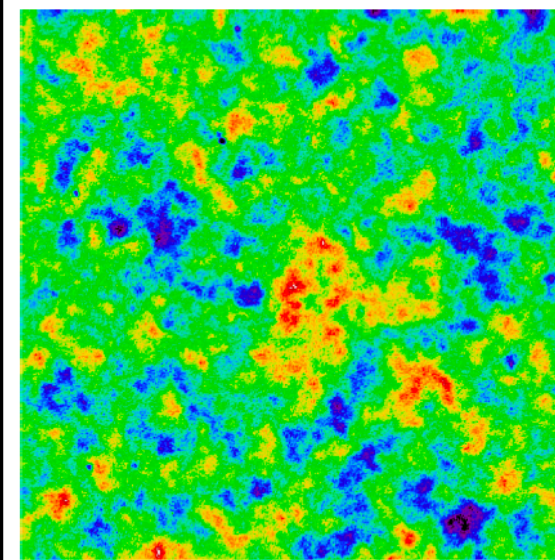
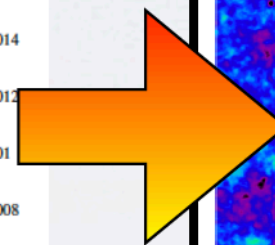
(c) 217 GHz

(d) 353 GHz

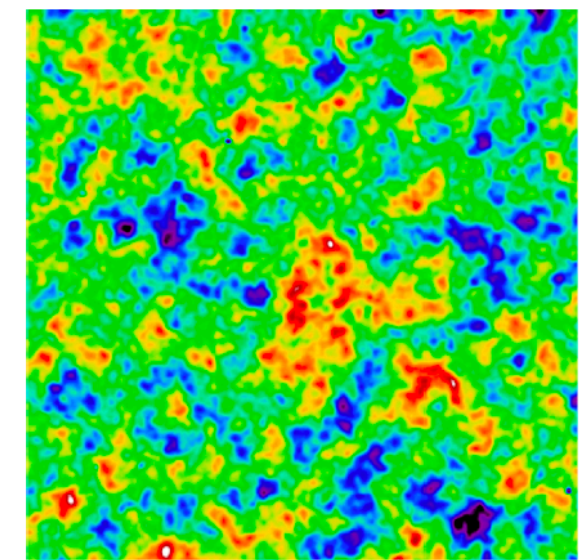


(e) 545 GHz

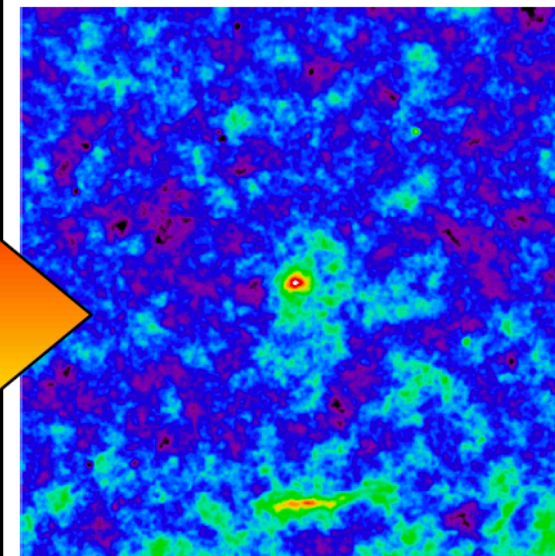
(f) 857 GHz



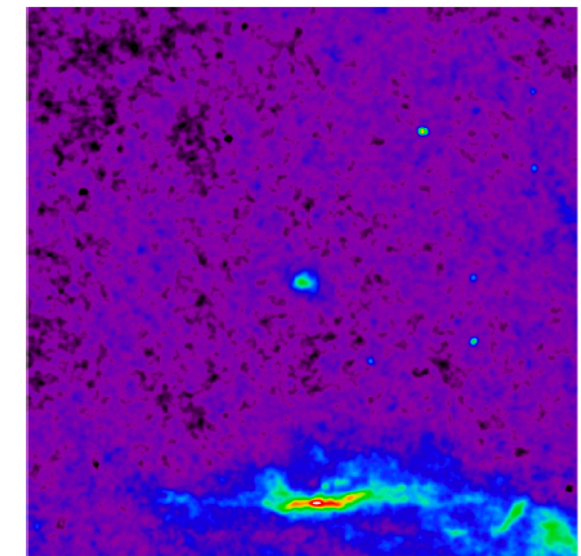
(a) $\omega_{100} \cdot T_{100}$



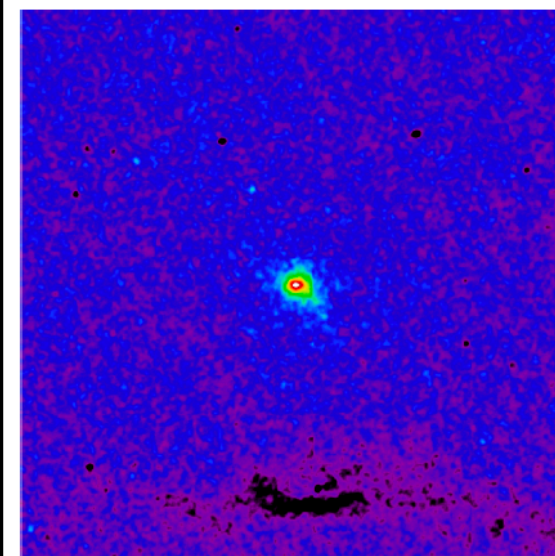
(b) $\dots + \omega_{143} \cdot T_{143}$



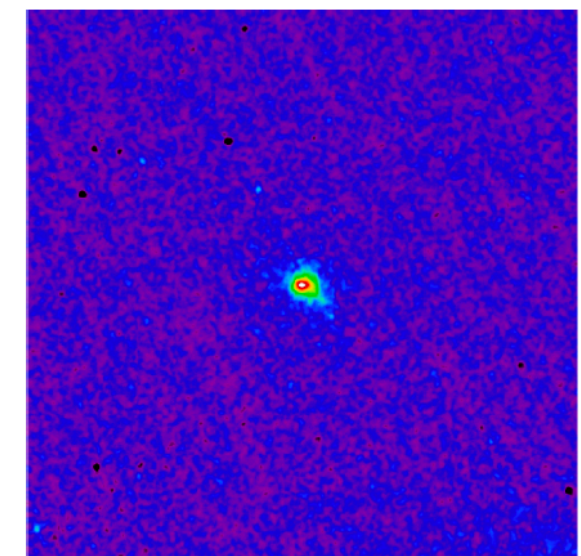
(c) $\dots + \omega_{217} \cdot T_{217}$



(d) $\dots + \omega_{353} \cdot T_{353}$



(e) $\dots + \omega_{545} \cdot T_{545}$



(f) $\dots + \omega_{857} \cdot T_{857}$

(Master's thesis work by Jens Erler)

ILC summary: Example using CMB and SZ

$$\underbrace{d(\nu, \vec{\theta})}_{\text{Planck frequency maps}} = \underbrace{a(\nu)}_{\text{CMB fluctuations}} s_{\text{CMB}}(\vec{\theta}) + \underbrace{b(\nu)}_{\text{Thermal SZ fluctuations}} s_{\text{TSZ}}(\vec{\theta}) + \underbrace{N(\nu, \vec{\theta})}_{\text{foregrounds + noise}}$$

- ILC = weighted linear combination of frequency maps:

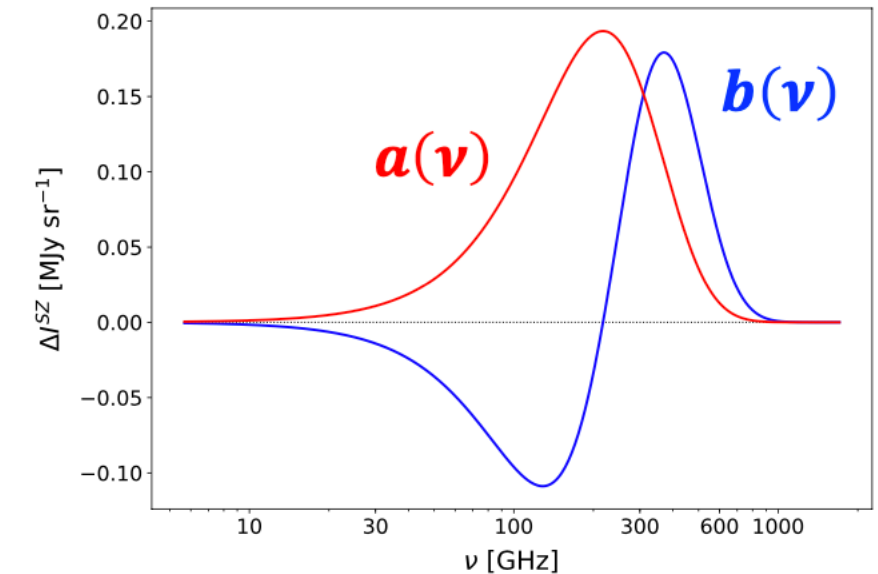
$$\hat{s}(\vec{\theta}) = \sum_{\nu} w(\nu) d(\nu, \vec{\theta})$$

such that $\begin{cases} \langle \hat{s}^2 \rangle = w^t \langle dd^t \rangle w & \text{minimum} & (1) \\ \sum_{\nu} w(\nu) a(\nu) = 1 & & (2) \end{cases}$

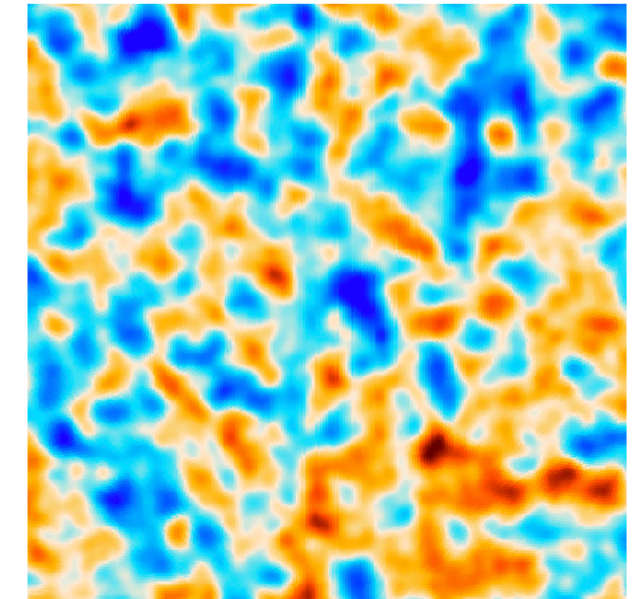
- ILC weights : $w^t = \frac{a^t c^{-1}}{a^t c^{-1} a} \quad (c \equiv \langle dd^t \rangle)$

$$\Rightarrow \hat{s}(\vec{\theta}) = \underbrace{s_{\text{CMB}}(\vec{\theta})}_{\substack{\text{recovered} \\ \text{signal} \\ (2)}} + \underbrace{w^t b s_{\text{TSZ}} + w^t N}_{\substack{\text{minimized} \\ \text{residuals} \\ (1)}}$$

Benett et al, 2003
Tegmark et al, 2003
Eriksen et al, 2004
Delabrouille et al, 2009
Remazeilles et al 2011, 2013



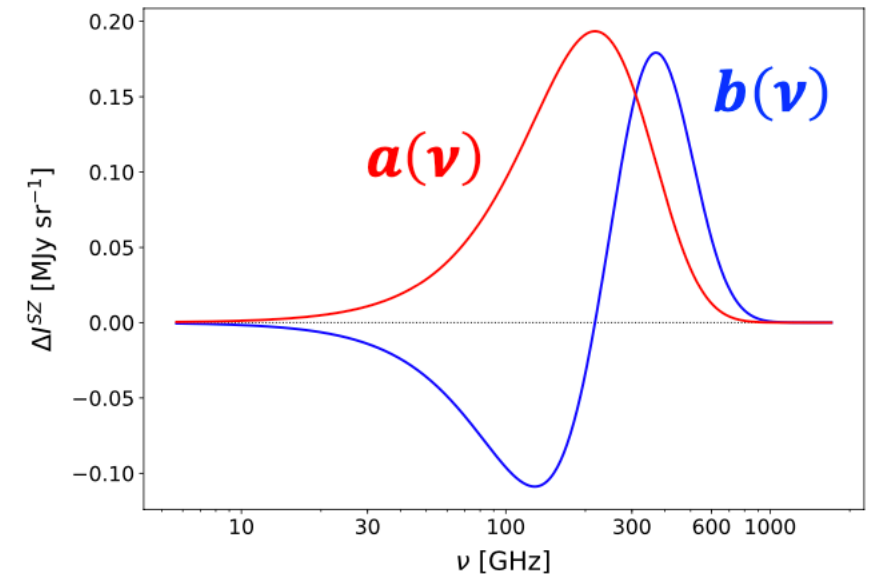
Reconstructed CMB



Slide credit: M. Remazeilles

ILC summary: Example using CMB and SZ

$$\underbrace{d(\nu, \vec{\theta})}_{\text{Planck frequency maps}} = \underbrace{a(\nu)}_{\text{CMB fluctuations}} s_{CMB}(\vec{\theta}) + \underbrace{b(\nu)}_{\text{Thermal SZ fluctuations}} s_{TSZ}(\vec{\theta}) + \underbrace{N(\nu, \vec{\theta})}_{\text{foregrounds + noise}}$$



- ILC = weighted linear combination of frequency maps:

$$\hat{s}(\vec{\theta}) = \sum_{\nu} w(\nu) d(\nu, \vec{\theta})$$

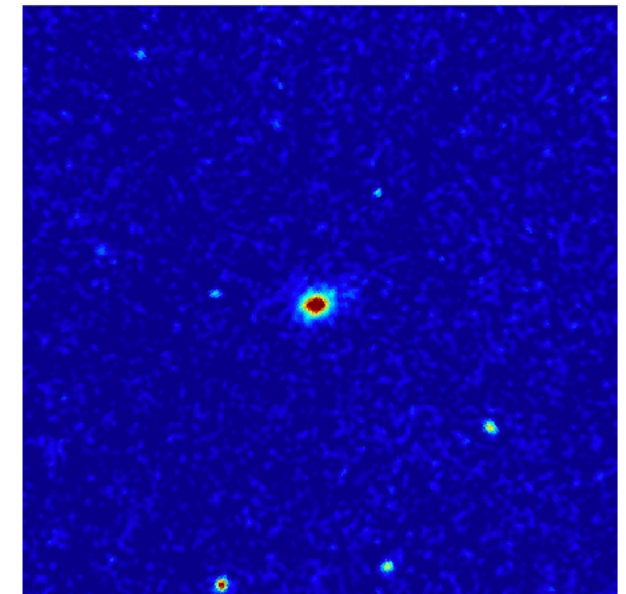
such that $\begin{cases} \langle \hat{s}^2 \rangle = \mathbf{w}^t \langle \mathbf{d} \mathbf{d}^t \rangle \mathbf{w} & \text{minimum} & (1) \\ \sum_{\nu} w(\nu) b(\nu) = 1 & & (2) \end{cases}$

- ILC weights : $\mathbf{w}^t = \frac{b^t \mathbf{C}^{-1}}{b^t \mathbf{C}^{-1} b}$ ($\mathbf{C} \equiv \langle \mathbf{d} \mathbf{d}^t \rangle$)

$$\Rightarrow \hat{s}(\vec{\theta}) = \underbrace{s_{TSZ}(\vec{\theta})}_{\substack{\text{recovered} \\ \text{signal} \\ (2)}} + \underbrace{\mathbf{w}^t a s_{CMB} + \mathbf{w}^t N}_{\substack{\text{minimized} \\ \text{residuals} \\ (1)}}$$

Benett et al, 2003
Tegmark et al, 2003
Eriksen et al, 2004
Delabrouille et al, 2009
Remazeilles et al 2011, 2013

Reconstructed SZ



Slide credit: M. Remazeilles

Questions?



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in our **eCampus Forum**