## Foreground Modeling and Estimation

Justin Lazear

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#### 1 Introduction

Let us construct a very simple foreground as a toy example for use in our explorations. Since we are working only on simulated data and we are more interested in the general properties of our methods rather than the precise details of the results, a toy model is sufficient.

#### 2 Thermal Dust Foreground

At high frequencies and large angular scales, dust dominates the foreground (Fig. 1) in intensity. With this in mind, we will begin by constructing a foreground map that comprises only dust.

Let us model the thermal dust emission as a power law,

$$I_{\nu}(p) = I_{\nu_0}(p) \left(\frac{\nu}{\nu_0}\right)^{\beta} \tag{1}$$

where  $I_{\nu}$  is the spectral intensity in MJy/sr,  $I_{\nu_0}$  is some reference amplitude map at the reference frequency  $\nu_0$ , and  $\beta$  is the spectral index. So given a map  $I_{\nu_0}(p)$  at frequency  $\nu_0$ , we may construct a map of the thermal dust emission at an arbitrary frequency by scaling it by  $\left(\frac{\nu}{\nu_0}\right)^{\beta}$ . We ignore more sophisticated models that involve modeling the dust as particles at a particular temperature with a particular emissivity.

Let us use the Planck thermal dust component map<sup>1</sup>[5] at 353 GHz as our reference map (Fig. 2). We may then construct a thermal dust emission foreground map at an arbitrary frequency by scaling the reference map using Eq. (1) with  $\nu_0 = 353 \,\text{GHz}$ .

Some pixels in the Planck dust emission map have a negative intensity. These can potentially cause problems and are not physically realizable, so we replace the value of such pixels with 0.

<sup>&</sup>lt;sup>1</sup>This map is produced by the Planck team by using a parameterized CMB + Foreground model and an MCMC solver to minimize the  $\chi^2$  of the model given the data, the Commaner-Ruler algorithm. The map generated by only one component of the model, using the optimal parameters, is the component map. In particular, we use only the intensity (I) component of the  $N_{\text{side}} = 256$  map.

The map is available from the Planck Legacy Archive under Maps  $\rightarrow$  Foreground maps  $\rightarrow$  Dust  $\rightarrow$  COM\_CompMap\_dust-commrul\_0256\_R1.00.fits.

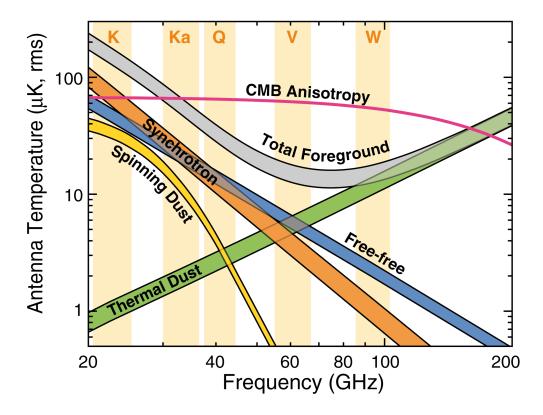


Figure 1: Frequency spectra of CMB temperature anisotropies and foregrounds. Above 80 GHz, the thermal dust is the dominant contributor. From Bennett et al 2009 [1].

We note that our power law is not in thermodynamic temperature units, but is rather in MJy/sr. This is incompatible with our sky maps, which are typically in thermodynamic temperature units (K). The conversion between spectral intensity  $I_{\nu}$  and thermodynamic temperature T is

$$I_{\nu} = B_{\nu}(T) = \frac{2h\nu^3}{c^2} \frac{1}{\exp(h\nu/k_B T) - 1}$$
 (2)

$$I_{\nu} = B_{\nu}(T) = \frac{2h\nu^{3}}{c^{2}} \frac{1}{\exp(h\nu/k_{B}T) - 1}$$

$$T = B_{\nu}^{-1}(I_{\nu}) = \frac{h\nu}{k_{B}} \frac{1}{\log(1 + \frac{2h\nu^{3}}{I_{\nu}c^{2}})}$$
(3)

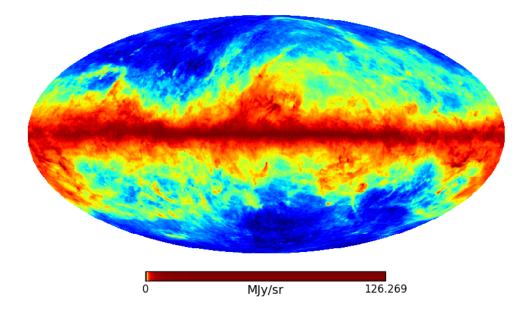


Figure 2: Planck thermal dust emission component map (from Commander-Ruler algorithm) at 353 GHz. From COM\_CompMap\_dust-commrul\_0256\_R1.00.fits intensity field. Histogram is equalized. Pixels that had a negative value in the original map have had their value replaced with 0.

so our power law (Eq. (1)) gives us the transformation

$$T = B_{\nu}^{-1} \left( I_{\nu_0} \left( \frac{\nu}{\nu_0} \right)^{\beta} \right)$$

$$T = \frac{h\nu}{k_B} \frac{1}{\log \left( 1 + \frac{2h\nu^{3-\beta}}{c^2\nu_0^{-\beta}} \frac{1}{I_{\nu_0}} \right)}$$
(4)

$$T = \frac{h\nu}{k_B} \frac{1}{\log\left[1 + \left(\frac{\nu}{\nu_0}\right)^{3-\beta} \left(\exp\frac{h\nu_0}{k_B T_0} - 1\right)\right]}$$
 (5)

# 3 Polarized Dust Intensity

As a simple estimate of the polarized dust intensity, let us suppose that there is a constant polarization fraction of the thermal dust intensity,

$$p = \frac{I_p}{I} = \frac{\sqrt{Q^2 + U^2 + V^2}}{I} \tag{6}$$

where  $I_p$  is the polarized intensity, Q, U, and V are the polarized components of the Stokes vector, and I is the total intensity. Planck estimates that maximum polarization fraction is  $p_{\text{max}} = 20\%[2]$ , so we will use that as a pessimistic limit across the whole sky. In reality, we expect the polarization fraction to be smaller than this, especially in the galactic plane, where Planck reports the polarization fraction to typically be closer to 5%.

We may then construct a polarized intensity map

$$I_p(p) = p_{\text{max}} I_{\nu}(p) \tag{7}$$

where p here is the pixel index and  $p_{\text{max}} = 20\%$  is the maximum polarization fraction. Note that this procedure should be done in spectral intensity units rather than thermodynamic temperature units, since the conversion is nonlinear,  $B_{\nu}^{-1}(p_{\text{max}}I_{\nu}) \neq p_{\text{max}}B_{\nu}^{-1}(I_{\nu})$ .

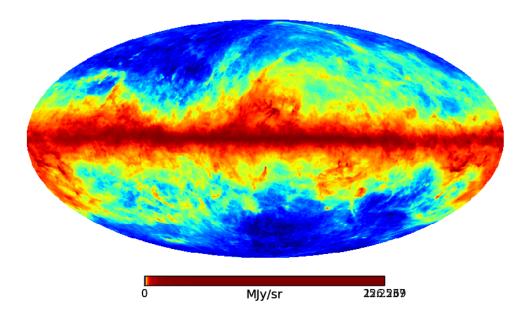


Figure 3: Naive polarized dust intensity  $I_p = pI$ . Uses a constant polarization fraction  $p = p_{\text{max}} = 0.2$  to construct a map from the thermal dust intensity map.

## 4 Polarized Dust Components

The polarized dust intensity map does not contain all of the information about the polarized radiation. We note from the definition of  $I_p$ ,

$$I_p = \sqrt{Q^2 + U^2 + V^2} \tag{8}$$

that at each frequency and in each pixel, we must specify 3 numbers Q, U, and V (equivalently, the E-field vector components in some coordinate system,  $E_x$  and  $E_y$ , and the phase between the E-field components,  $\phi \equiv \theta_x - \theta_y$ )[3] to fully specify the polarized light.

We assume that the circularly polarized component V is small[4], so we will set it to 0 and ignore it. This leaves us 2 numbers that we need to specify. Since we do not know the true values, we will randomly select a combination of Q and U that agrees with the polarized intensity map. Then an ensemble of such realizations will describe all possible Q and U maps that combine to construct the particular  $I_p$  map. If there is no physical phenomenon that would bias the true Q and U maps, then we can assume that our particular sky is one such realization of our ensemble and that the properties of the ensemble will estimate the properties of the true phenomena.

We must generate an unbiased ensemble by sampling Q and U in a symmetric way. We note that we have 2 unknowns (Q and U) and 1 constraint equation, so we must sample 1 random number to fully specify each realization. A simple uniform sampling of either Q or U does not uniformly sample the space of possible  $\{Q,U\}$  values. Q and U describe a circle with radius  $I_p$ , so the space of possible choices of Q and U is a circle, which has only a single free parameter, the angle  $\theta$ . In radial coordinates,

$$Q + iU = I_p e^{i\theta}. (9)$$

Since  $|d\theta|$  is invariant under reflection  $(\theta \to -\theta)$  and translation  $(\theta \to \theta + \theta_0)$ , a uniform sampling of  $\theta$  will uniformly sample the  $\{Q, U\}$  space.

Let  $\Theta \sim \mathcal{U}(0, 2\pi)$  be a uniformly distributed random variable over the range 0 to  $2\pi$ . Then a number  $\theta$  drawn from  $\Theta$  can be used to construct Q and U from  $I_p$  for each pixel p,

for 
$$\theta(p) \in \Theta \sim \mathcal{U}(0, 2\pi)$$
,  $Q(p) = I_p \cos \theta(p) = p_{\max} I_{\nu} \cos \theta(p)$   
 $U(p) = I_p \sin \theta(p) = p_{\max} I_{\nu} \sin \theta(p)$  (10)

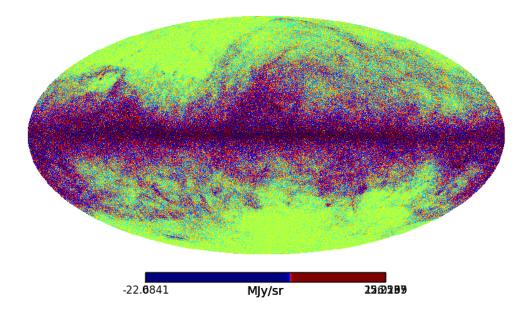
for  $p = 1, ..., N_{pix}$ . One such realization of Q and U maps is shown in Fig. 4.

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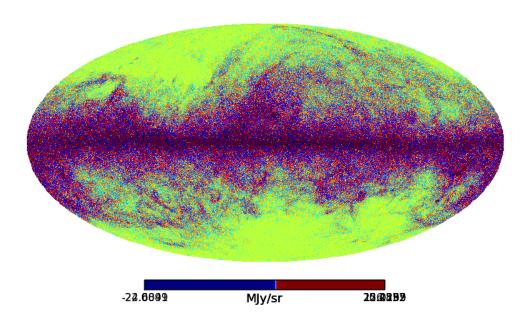


Figure 4: Top: One realization of a Q map in which each pixel has an independent angle  $\theta$  that is uniformly sampled from 0 to  $2\pi$ , and  $Q(p) = I_p \cos \theta(p)$ . Bottom: A U map that matches the above Q map.