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# Mitigating systematics by mapmaking

Extensions of the destriping principle

#### Definitions

- \* *Mapmaking*: Projecting Time-Ordered Data (TOD) into maps.
- \* *Destriping*: Solving and subtracting long and intermediate time scale (seconds to hours) noise fluctuations from the TOD.
- \* *Filtering* or *deprojection*: Removing or suppressing modes in the TOD that are contaminated by systematics.
- \* *Extended destriping*: Combines noise offsets with systematics templates to optimally clean the TOD.
- Systematics: Any component of the TOD that is not sky signal nor noise. The boundary between noise and systematics is fluid.

# Linear regression

 Standard tool in data analysis toolbox that all mapmaking can be traced back to:

$$\vec{y} = X\vec{\beta} + \vec{\varepsilon}$$

Ordinary least squares:

$$(\mathbf{X}^{\mathrm{T}}\mathbf{X})\,\vec{\boldsymbol{\beta}} = \mathbf{X}^{\mathrm{T}}\vec{y}$$

\* Generalized least squares:

$$(\mathbf{X}^{\mathrm{T}} \mathbf{\Omega}^{-1} \mathbf{X}) \, \vec{\beta} = \mathbf{X}^{\mathrm{T}} \mathbf{\Omega}^{-1} \vec{y}, \quad \mathbf{\Omega} = \langle \vec{\epsilon} \vec{\epsilon}^{\mathrm{T}} \rangle$$

## Mapmaking

 Mapmaking can be cast as a linear regression problem where the pixel values are the template coefficients

$$\vec{d} = P\vec{m} + \vec{n}$$

 And the maximum likelihood map follows from generalized least squares:

$$(\mathbf{P}^{\mathrm{T}}\mathbf{N}^{-1}\mathbf{P})\,\vec{m} = \mathbf{P}^{\mathrm{T}}\mathbf{N}^{-1}\vec{d}, \quad \mathbf{N} = \langle \vec{n}\vec{n}^{\mathrm{T}} \rangle$$

## Destriping

\* Destriping adds another set of templates and template coefficients we call *baseline offsets*:

$$\vec{d} = \mathbf{P}\vec{m} + \mathbf{F}\vec{a} + \vec{n}$$

\* If the residual noise is white, it is possible to solve exclusively for these additional templates:  $(\mathbf{F}^{T}\mathbf{N}^{-1}\mathbf{Z}\mathbf{F})\vec{a} = \mathbf{F}^{T}\mathbf{N}^{-1}\mathbf{Z}\vec{d}$ 

where

*Keihänen et al (2004, 2005, 2010)* 

 $\mathbf{Z} = \mathbf{I} - \mathbf{P} \left( \mathbf{P}^{\mathrm{T}} \mathbf{N}^{-1} \mathbf{P} \right)^{-1} \mathbf{P}^{\mathrm{T}} \mathbf{N}^{-1}$ 



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*Keihänen et al (2004, 2005, 2010)* 

# Filtering

- Ground experiments typically *filter* or *deproject* compromised modes out of the TOD. This is pure linear regression.
- Filtering enables batch processing so only a fraction of the data are kept in memory at a time.
- Filtering suppresses signal and systematics alike and reduces S/N. Further analysis is complicated by introduced biases.

# Extended destriping

 There is no formal restriction for the shape of destriping templates.

$$\vec{d} = \vec{P}\vec{m} + \vec{F}\vec{a} + \vec{n}$$

 A deprojection template makes a great destriping template!

$$\left(\mathbf{F}^{\mathrm{T}}\mathbf{N}^{-1}\mathbf{Z}\mathbf{F}\right)\vec{a} = \mathbf{F}^{\mathrm{T}}\mathbf{N}^{-1}\mathbf{Z}\vec{d}$$

#### Extended destriping (continued)





## Systematics

- \* Orbital dipole
- Gain fluctuations
- Bandpass mismatch
- Far side lobe pickup
- Transfer function residuals
- \* Zodiacal light
- Crosstalk
- \* Errors in pointing, beams and polarization efficiency
- HWP synchronous signal

#### To conclude

- \* It is possible to *cast the mapmaking* problem in the very familiar *language of linear regression*.
- It is possible to *solve* for *general systematics* templates using the mapmaking formalism and *in map-orthogonal subspaces* of the full TOD domain.
- It is more than likely that extended mapmaking methods will couple with filtering to reach the ultimate sensitivity.

$$N_{pp'} = \langle \delta m \delta m^{T} \rangle = (P^{T} N^{-1} P)^{-1}$$

$$N_{aa'} = \langle \delta a \delta a^{T} \rangle = (F^{T} N^{-1} Z F)^{-1}$$

$$N_{pp'} = N_{pp'}^{wn} + N_{pp'}^{wn} P^{T} N^{-1} F N_{aa'} F^{T} N^{-1} P N_{pp'}^{wn}$$

$$Tristram et al (2011)$$

$$N_{pp'}^{tot} = N_{pp'} + B \mathscr{N} B^{T}$$

N

$$\mathcal{N} = \langle \delta y \delta y^{\mathrm{T}} \rangle, \quad \mathbf{B} = \left( \mathbf{P}^{\mathrm{T}} \mathbf{N}^{-1} \mathbf{P} \right)^{-1} \mathbf{P}^{\mathrm{T}} \mathbf{N}^{-1}$$