### Simplifying coil sets using efficientlyplaced windowpane coils

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Well-placed windowpanes for shaping Engineeringly feasible open-access coil set

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How do we determine windowpane coil shape, location, and current?

Well-placed windowpanes for shaping

### Current potentials are magnetic-surface-generating stream functions

To generate a magnetic surface, find current sheet I  $\mathbf{I} = \nabla \Phi \times \hat{\mathbf{n}}$ 

by solving underdetermined least-squares problem

 $\min\left(||\mathbf{A} \cdot \mathbf{x} - \mathbf{b}||_2\right) \quad \begin{array}{l} \textbf{A: Normal fluxes from non-secular } \Phi_j \\ \textbf{b: Normal fluxes from the secular part of } \Phi \end{array}\right)$ **x**: Vector  $\Phi_i$ 

### $\Phi$ is known as current potential (CP)

 $\Phi = \Phi_{SV} + \frac{I\theta}{2\pi} + \frac{G\zeta}{2\pi}$ 

 $\Phi_{SV}$ : Degrees of freedom I: Set by toroidal flux G: modular/helical switch

Current potentials are typically in Fourier basis

$$\Phi_{SV} = \sum_{m,n} \Phi_{m,n}^{s} \sin(m\theta - n\varsigma) + \Phi_{m,n}^{c} \cos(m\theta - n\varsigma)$$



## Current potentials are magnetic-surface-generating stream functions

If the toroidal flux is supplied externally – say by modular or helical coils, the leftover field may be represented by a single-valued current potential (I=0,G=0)



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## Contours of single-valued current potential provide initial windowpane coil guesses

Quick example showing windowpane coil generation from an HSX CP:





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# For good access properties, windowpane currents should be concentrated in crucial shaping locations

The underdetermined formulation of the least-squares problem allows for regularization techniques to influence current potential properties

$$\min(||\boldsymbol{A}\cdot\boldsymbol{x}-\boldsymbol{b}||_2+\lambda|\boldsymbol{\chi}_K|_n)$$

**A:** Normal fluxes from non-secular 
$$\Phi_j$$
  
**b**: Normal fluxes from the secular part of  $\Phi$   
**x**: Vector  $\Phi_j$ 

Current density **K** 

ty **K**  $\chi_K = \int |\boldsymbol{K}(\boldsymbol{\theta},\boldsymbol{\zeta})|_n d^2 a$ 

**<u>n=2</u>**: Tikhonov (or L2) regularization, produces smooth distributed currents (REGCOIL)

**n=1**: Sparse optimization (or L1 regularization), produces concentrated currents at crucial locations, low currents elsewhere

**<u>n</u>=0**: Sharp, sparse optimization (L0 regularization). Concentrated currents at certain locations, 0 elsewhere. Often NP-hard.

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λ: Regularization parametern: Norm number

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**n=0**: Sharp, sparse optimization (L0 regularization). Concentrated currents at certain locations, 0 elsewhere. Often NP-hard.

 $\rightarrow$  L1 and L0 regularization should be pursued to find open-access current configurations

# Sparse optimization of current potentials was attempted, and failed due to Fourier basis

#### L1-regularized |K|2 on HSX winding surface



Patchiness due to Fourier terms "fighting" sparsity: Fourier basis likes diffuse, smooth functions – L1 regularization promotes sharp features



Along CP contours (candidates for coils), current density from L1-regularized **K** varies up to 500% (bad!)

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### Magnetic dipoles provides quick finite-element-like basis

Current potentials are distributions of magnetic dipoles (Merkel 1988)

This provides a finite-element-like basis to work from  $\boldsymbol{d} = \boldsymbol{\widehat{n}} \iint \Phi_{SV} \, da$ 

Dipole strengths found via least-squares solution

$$\boldsymbol{M}\cdot\boldsymbol{d}=B_n$$

Supports "sharp" current distributions

This approach differs from permanent magnet work in that the dipole strength is unlimited as the gradient of dipole strengths gives current densities



### FEM CPs produce field shaping with open access properties

#### Method:

- 1. Compute dipole strengths using full winding surface
- 2. Eliminate dipoles with strength less than some magnitude
- 3. Re-compute new dipole strengths using fraction of winding surface area
- 4. Reduce fraction of surface used until 0.1% error achieved

Average residual  $B_{norm} = 1.45e-07 T$ Maximum residual  $B_{norm} = 1.85e-06 T$ pRes 6 wRes 6 Rcond 10^{-10} using 100.0% of dipoles





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#### **Current potential analog (dipole strengths)**



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#### **Current potential analog (dipole strengths)**



→ Truncated SVD retaining only most efficient singular values may eliminate short-wavelength features

### Truncated SVD analysis may yield simple, sparse FEM current potentials

 $10^{-1}$ 

 $10^{-2}$ 

10

 $10^{-}$ 

 $10^{-5}$ 

**b**<sup>Fourier</sup>

 $\mathbf{B}_n$ 

Dipole strengths found via LSS

 $\boldsymbol{M}\cdot\boldsymbol{d}=B_n$ 

M: Dipole transfer matrix

d: Dipole strengths

 $B_n$ : Error field

#### Method:

- 1. Fourier decompose  $B \cdot \hat{n}$ , M matrix to relate current potential patches to global error fields
- 2. Compute SVD of  $M = USV^h$ , retain singular values only up to a condition number between 1-10 for feasible current distributions
- 3. Proceed with fractional solves:
  - 1. Eliminate dipoles with strengths less than some magnitude
  - 2. Re-compute new dipole strengths using fraction of winding surface area
  - 3. Reduce fraction of surface used until 0.1% error achieved



### First few singular vectors surprisingly localized, not smooth



First few singular values typically have simple features, though this FEM-like basis yields singular vectors with some complexity

### Fractional area required to produce field to 0.1% accuracy decreases with increasing condition number



Surface plots of dipole strengths analogous to current potentials. Contours are potential windowpane coils.

Amplitudes of larger singular eigenvectors larger, still have short-wavelength features which are undesirable for coil production

### Fractional area required to produce field to 0.1% accuracy decreases with increasing condition number

% of surface required to produce 0.1% field error **Condition Number** 

Fractional area required to produce field to specified accuracy saturates quickly w.r.t. condition number

### Summary

Attempting to generate sparse current potentials using a finite-element-method-like basis and L0,L1 regularization. This could be used for efficient windowpane coil placement, yielding simple open-access stellarator coil configurations. Method can be improved by:

- Minimizing the appearance of short-wavelength features, perhaps by regularization w.r.t dipole amplitude gradient
- Moving to an actual, not approximate FEM basis and enforcing smoothness via regularization
- Any suggestions?