Computational helioseismology How to get our hands on the interior of the Sun

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C04: Correlations of solar oscillations: modeling and inversions

CRC 1456 Opening Symposium, March 17, 2022

Structure of the talk

Helioseismological data

- Observed data
- Preprocessed data

The forward solver

Input: excitations/parameters in the Sun Task: compute velocity (on the surface)

- Interior PDE model and discretization
- Boundary conditions for the Sun

The inverse problem

Input: measurements on the surface Task: compute excitation/parmeters in the Sun

Iterative holography (advertisement)



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More details? → C04 poster presentation (after plenary)

Helioseismological data



What is helioseismology?

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Oxford dictionary

"The study of the Sun's interior by the observation and analysis of oscillations at its surface."

global helioseismology

- input: frequencies of resonances (eigenmodes)
- yields radially symmetric (reference) model of the Sun

Aims:

Space weather prediction

local helioseismology

- input: travel times / correlations of oscillations
- inverse boundary value problems, typically in the frequency domain
- 2D/3D imaging of Sun (farside/interior)
- Understanding the solar cycle

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Observed data

Dopplergrams from decades

Images of the line-of-sight velocities at the solar surface computed from Doppler shifts of certain (atomic) spectral lines.

Location	Instrument	Time	Spatial resol.	temporal resol.
SDO satellite	HMI: Helioseismic & Magnetic Imager	05/2010 – now	4096 ²	45s
SOHO satellite	MDI: Michelson Doppler Imager	05/1996 - 04/2011	1024 ²	60s
GONG ground based	Fourier Tachometer	1995 – now	839 ²	60s





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Origin of oscillations



- The outer 28% of the solar interior form the solar convection zone.
- Turbulence effectively acts as random perturbation.
- Waves propagate from here to the surface where they can be observed.





Preprocessed data



Correlations







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Correlations

- Consider line-of-sight velocities $\psi(\mathbf{r}_i, t) \ i = 1, 2$.
- Cross covariance between a point r₁ at the equator and r₂ at a latitude of 40°.





Correlations



Cross covariance between a point r₁ at the equator and r₂ at a latitude of 40°.

Waves are refracted due to rapid sound speed increase

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Correlation data



Cross-correlations in frequency domain

- $\psi(\mathbf{r}_1, t) \rightarrow \hat{\psi}(\mathbf{r}_i, \omega)$
- Cross-correlations

$$C(\mathbf{r}_1,\mathbf{r}_2,\omega)=\hat{\psi}(\mathbf{r}_1,\omega)^*\hat{\psi}(\mathbf{r}_2,\omega)$$

- **r**₁ and **r**₂ are any points of 4096 \times 4096 $\Rightarrow \approx 10^{13}$ cross-correlations per frequency
- \blacksquare Correlation data is extremely noisy \Rightarrow averaging in spatial and frequency domain

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Cross-covariance in time-distance diagram:





Time-distance helioseismology³:

Reduce high-dimensional correlation data to smaller number of travel-times.

²L. Gizon, A. C. Birch, H. C. Spruit. Local helioseismology: Three-dimensional imaging of the solar interior. ARAA, 2010.

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³T. Duvall Jr., S. Jefferies, J. Harvey, M. Pomerantz. Time-distance helioseismology. Nature, 1993.

The forward solver: Interior PDE model and discretization



Equations of solar oscillations

- Assume there is a smooth stationary equilibrium $(\overline{\cdot})$ to the equations of conservation of momentum and mass and gravitational potential (no magnetic field vet)
- Trajectory of a particle at **x** after perturbation: $X(\mathbf{x}, t) = \overline{X}(\mathbf{x}, t) + \boldsymbol{\xi}(\mathbf{x}, t)$

- Consider Lagrangian perturbation of conservation of momentum and mass $R(\mathbf{x} + \boldsymbol{\xi}(\mathbf{x}, t), t) - \overline{R}(\mathbf{x}, t)$
- Eulerian perturbation of equations for gravitational potential $R(\mathbf{x},t) - \overline{R}(\mathbf{x},t)$
- and time-harmonic ansatz $\boldsymbol{\xi}(\mathbf{x}, t) = Re(\boldsymbol{\xi} \exp(-i\omega t))$

⁴D. Lynden-Bell, J. Ostriker. On the stability of differentially rotating bodies. Monthly Not. Roy. Astr. Soc., 1967 DRG-ALIGUST-UNIVERSITÄT CRC 1456 Opening Symposium, March 17, 2022 – C. Lehrenfeld – Computational helioseismology

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Equations of solar oscillations

We arrive at the following "monster":



 $\rho \underbrace{(-i\omega + \mathbf{u} \cdot \nabla + \Omega \times)^{2} \boldsymbol{\xi} - \nabla (\rho c_{s}^{2} \nabla \cdot \boldsymbol{\xi}) + (\nabla \cdot \boldsymbol{\xi}) \nabla \rho - \nabla (\nabla \rho \cdot \boldsymbol{\xi})}_{=:\mathcal{D}} + (\operatorname{Hess}(\rho)\boldsymbol{\xi} - \rho \operatorname{Hess}(\phi))\boldsymbol{\xi} - i\boldsymbol{\gamma}\rho \omega \boldsymbol{\xi} + \rho \nabla \varphi = \mathbf{s} \quad \text{in} \quad D, \\ -\frac{1}{4\pi G} \Delta \varphi + \nabla \cdot (\rho \boldsymbol{\xi}) = \mathbf{0} \quad \text{in} \quad \mathbb{R}^{3}.$

- $\pmb{\xi}$: Lagrangian displacement: difference between perturbed/unperturbed position,
- φ : perturbation of gravitational potential,
- *c_s*: sound speed,
- u: background velocity,
- ϕ : gravitational background potential,
- ω : frequency,

- ho: density,
- Ω : angular velocity,
- γ : damping,
- p: pressure
- + boundary conditions

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 $^{^{5}}$ H. Galbrun. Propagation d'une onde sonore dans l'atmosphère et théorie des zones de silence. 1931

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Discretization?

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⁵H. Galbrun. Propagation d'une onde sonore dans l'atmosphère et théorie des zones de silence. 1931

Helmholtz-type decomposition







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⁷M. Halla, T. Hohage. On the well-posedness of [...] and the equations of stellar oscillations. SIMA, 2021

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Helmholtz-type decomposition

- straight-forward (DG) discretizations fail⁶
- Let's consider the leading order terms (for $\boldsymbol{\xi}$):



 $+\rho(-i\omega + \mathbf{u} \cdot \nabla + \Omega \times)^2 \boldsymbol{\xi} - \nabla(\rho c_s^2 \nabla \cdot \boldsymbol{\xi}) - i\rho \gamma \omega \boldsymbol{\xi} + \dots = f$



⁷M. Halla, T. Hohage. On the well-posedness of [...] and the equations of stellar oscillations. SIMA, 2021

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• crucial in the analysis⁷ is a Helmholtz-type decomposition of solution space $\mathbb{V} = \{ \boldsymbol{\xi} \in \mathbf{L}^2(D) : \nabla \cdot \boldsymbol{\xi} \in L^2(D), (\mathbf{u} \cdot \nabla) \boldsymbol{\xi} \in \mathbf{L}^2(D), \nu \cdot \boldsymbol{\xi} = 0 \text{ on } \partial D \} = \mathbb{X} \oplus \mathbb{Y} \oplus \mathbb{Z}$

with

- X: (generalized) divergence-free functions
- \mathbb{Y} : gradients (compactly emb. in L^2) with $\|\nabla \cdot \mathbf{y}\|_0 + \|\mathbf{y}\|_0 \gtrsim \|\mathbf{y}\|_{\mathbb{V}}$ for all $\mathbf{y} \in \mathbb{Y}$
- \blacksquare $\mathbb Z:$ a finite dimensional subspace

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Discretizations with Helmholtz-type decomposition





Finite Element Methods

- based in calculus of variation
 - \rightarrow solve variational formulation over finite dimensional space
- approximate solution using polynomials on each mesh element





Discretizations with Helmholtz-type decomposition





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Choice of discretization (space)?

- natural choice: $\mathbb{V}_h \subset H(div)$
- $\mathbb{V}_h \subset H(div) \rightsquigarrow$ Helmholtz-type decomposition
- but: many more choices are possible...



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A simple model problem

Simplified version (real, with artificial reaction term): Find $\boldsymbol{\xi} \in \mathbb{V}$, s.t.



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 $\forall \boldsymbol{\eta} \in \mathbb{V}.$

Generic discretization $(\mathbb{V} \rightsquigarrow \mathbb{V}_h, \nabla \cdots \nabla_h, a(\cdot, \cdot) \rightsquigarrow a_h(\cdot, \cdot))$: Find $\boldsymbol{\xi}_h \in \underline{\mathbb{V}}_h$, s.t.

 $\langle c_s^2 \rho \nabla \cdot \boldsymbol{\xi}, \nabla \cdot \boldsymbol{\eta} \rangle - (\langle \rho(\mathbf{u} \cdot \nabla) \boldsymbol{\xi}, (\mathbf{u} \cdot \nabla) \boldsymbol{\eta} \rangle + \|\mathbf{u}\|_{\infty} \langle \rho \boldsymbol{\xi}, \boldsymbol{\eta} \rangle) = \langle f, \boldsymbol{\eta} \rangle$

 $\langle c_s^2 \rho \underline{\nabla_h} \cdot \boldsymbol{\xi}_h, \underline{\nabla_h} \cdot \boldsymbol{\eta}_h \rangle - \underline{a_h}(\boldsymbol{\xi}_h, \boldsymbol{\eta}_h) = \langle f, \boldsymbol{\eta}_h \rangle \ \forall \boldsymbol{\eta}_h \in \underline{\mathbb{V}_h}.$

 $a(\boldsymbol{\xi},\boldsymbol{n})$

ORG-AUGUST-UNIVERSITÄT ⁸T. Alemán. Robust Finite Element Discretizations for a PDE arising in Helioseismology. Master's thesis. 2022

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 $a(\boldsymbol{\xi},\boldsymbol{n})$

Discrete Helmholtz decomposition

 $\mathbb{X}_{h} = \{ \boldsymbol{\xi}_{h} \in \underline{\mathbb{V}_{h}} : \underline{\nabla_{h}} \cdot \boldsymbol{\xi}_{h} = 0 \} \qquad \mathbb{Y}_{h} = \mathbb{X}_{h}^{\perp} = \{ \boldsymbol{\xi}_{h} \in \mathbb{V}_{h} : \underline{a_{h}}(\boldsymbol{\xi}_{h}, \boldsymbol{\eta}_{h}) = 0 \quad \forall \boldsymbol{\eta}_{h} \in \mathbb{X}_{h} \}$

and $c \|\mathbf{y}_h\|_{\mathbb{V},h} \leq \|\underline{\nabla}_h \cdot \mathbf{y}_h\|_0 \quad \forall \mathbf{y}_h \in \mathbb{Y}_h, \quad c \neq c(h, c_s).$

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$$\langle c_s^2 \rho \nabla \cdot \boldsymbol{\xi}, \nabla \cdot \boldsymbol{\eta} \rangle - \underbrace{(\langle \rho(\mathbf{u} \cdot \nabla) \boldsymbol{\xi}, (\mathbf{u} \cdot \nabla) \boldsymbol{\eta} \rangle + \|\mathbf{u}\|_{\infty} \langle \rho \boldsymbol{\xi}, \boldsymbol{\eta} \rangle)}_{a(\boldsymbol{\xi}, \boldsymbol{\eta})} = \langle f, \boldsymbol{\eta} \rangle \quad \forall \boldsymbol{\eta} \in$$

Generic discretization $(\mathbb{V} \rightsquigarrow \mathbb{V}_h, \nabla \cdot \rightsquigarrow \nabla_h \cdot, a(\cdot, \cdot) \rightsquigarrow a_h(\cdot, \cdot))$: Find $\boldsymbol{\xi}_h \in \underline{\mathbb{V}}_h$, s.t.

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Good news: This is achieved by every inf-sup stable Stokes element! \rightsquigarrow Choose \mathbb{V}_h , ∇_h , $a_h(\cdot, \cdot)$ suitable for a Stokes(-type) problem.

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⁸T. Alemán. Robust Finite Element Discretizations for a PDE arising in Helioseismology. Master's thesis. 2022 CRC, 1456. Opening. Symposium. March 17, 2022 – C. Lehrenfeld – Computational helioseismology.

Numerical example for simplified problem



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Numerical example for simplified problem





Convergence analysis for full problem

Numerics for full problem

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Numerical example for simplified problem





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- Convergence analysis for full problem
- Numerics for full problem

boundary conditions?

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The forward solver: Boundary conditions for the Sun



Boundary conditions for helioseismology

Simplified scalar model:

 $u = c_s \nabla \cdot \boldsymbol{\xi}$, current working horse (no gravity effects):

$$\left(\sqrt{\rho}\Delta(\rho^{-\frac{1}{2}})-\frac{(\omega+i\gamma)^2}{c_s^2}\right)u-\Delta u=f$$

Atmosphere: No flows, spherically symmetric sound speed $c_s(r)$ and density $\rho(r)$ (separability).

Transparent bound. cond. are needed to truncate simulations close to surface! Std. approaches (PML, loc. b.c.) fail due to rapidly changing material params.





Tensor-product type boundary conditions

Many popular transparent b.c. follow (inherently sparse) ansatz for discretization of exterior diff. op:





- $\begin{bmatrix} A_{\Gamma\Gamma} & A_{\Gamma E} \\ A_{E\Gamma} & A_{EE} \end{bmatrix} \otimes \underbrace{\mathcal{M}}_{\approx \mathsf{Id}_{\Gamma}} + \begin{bmatrix} B_{\Gamma\Gamma} & B_{\Gamma E} \\ B_{E\Gamma} & B_{EE} \end{bmatrix} \otimes \underbrace{\mathcal{K}}_{\approx -\Delta_{\Gamma}}$
- Here, $A, B \in \mathbb{C}^{(N+1)\times(N+1)}$ small matrices which encode the discrete transparent b.c.. How to choose them?





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Observation (assuming discretization in radial direction only)

- The \mathcal{DtN} map (representing the exterior solution operator) can be characterized by (computable) numbers $dtn(\lambda)$ ($\lambda \in \Delta_{\Gamma}$)
- The discrete exterior solution operator can be characterized by numbers $dtn_N(\lambda) = f(\lambda, A, B) \ (\lambda \in \Delta_{\Gamma})$

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Idea of learned infinite elements⁹:

Optimize A and B to match known (computable) dtn!

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Learned infinite elements ⁹





Approx. results for realistic chromospheric model

Solve rational approximation problem ($\omega_{\ell} \ge 0$)

 $\min_{A,B\in\mathbb{C}^{(N+1)\times(N+1)}}\sum_{\ell}\omega_{\ell}^{2}|dtn(\lambda_{\ell})-dtn_{N}(\lambda_{\ell})|^{2}.$

- Minimizers A and B represent local element matrices of learned infinite elements.
- Error analysis guarantees¹⁰ exponential convergence on finite intervals using only $\mathcal{O}(N)$ DOFs.

⁹T. Hohage, C.L., J. Preuß, Learned infinite elements, SISC 2021.

¹⁰J. Preuß, Learned infinite elements for helioseismology, PhD thesis. 2021.

Comparison

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Time distance diagrams with diff. exterior domain models



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Comparison

Time distance diagrams with diff. exterior domain models



Learned infinite elements are flexible w.r.t. to atmospheric model!

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 $^{^{10}\,}$ J. Preuß, Learned infinite elements for helioseismology, PhD thesis. 2021.

The inverse problem: Iterative holography (advertisement)









Forward problem: $\mathcal{L}\psi = r + s$,

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r, s: (stochastic) sources (bnd./int.), ψ wave field

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^{TAT} ¹¹C. Lindsey, D. C. Braun. Seismic imaging of the sun's far hemisphere and its applications in space weather forecasting. Space Weather. 2017 CRC 1456 Opening Symposium, March 17, 2022 – C. Lehrenfeld – Computational helioseismology



Seismic waves propagating to/from solar surface¹¹.



- Forward problem: $\mathcal{L}\psi = r + s$.
 - r. s: (stochastic) sources (bnd./int.), ψ wave field
- Solve similar problem (backwards): $\mathcal{L}\phi = \psi$, where ψ takes the role of *r* (available data).

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- Alternative. Hologram:

$$\Phi^{\omega}_{lpha}(x) = \int_{\mathcal{A}} H^{\omega}_{lpha}(x,r')\psi(r',\omega)dr',$$

 H^{ω}_{α} : wave (back)propagator, A: observed part of surface

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- Holography has been successfully used (farside imaging)
- But: Holography is not a guantitative method

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¹¹ C. Lindsev. D. C. Braun. Seismic imaging of the sun's far hemisphere and its applications in space weather forecasting. Space Weather. 2017 CRC 1456 Opening Symposium, March 17, 2022 – C. Lehrenfeld – Computational helioseismology





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Can we turn holography into a quantitative method?

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Can we turn holography into a quantitative method?

Yes! holographic backpropagation can be understood as adjoint of covariance operator

- \rightsquigarrow allows to applied standard iterative inverse solvers
- \Rightarrow quantitative helioseismic holography (by iteration)
- \Rightarrow Helioseismic inversion without setup of full correllation data.

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 \rightsquigarrow details: poster session C04

Conclusion

Data

- Large data sets (> 20 years, cadence $\approx 1 \text{ min}$, 4096² pixel)
- Correlation data is even larger (~→ travel times)

Forward solver

- Scalar equation is working horse (does not capture gravity)
- Learned infinite elements allow us to deal with complex atmosphere
- Vector PDE is challenging (robust discretizations & efficiency)

Inversion

- so far: time distance helioseismology and helioseismic holography
- holography made quantitative (by iteration)



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Conclusion

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- Scalar
- Vector PDE is challenging ails discretizations & efficiency, rsion MORE details

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