# Efficient Wavefield Simulators Based on Krylov Model-Order Reduction Techniques

From Resonators to Open Domains

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# Thanks

A special thanks to

- Mikhail Zaslavsky, Schlumberger-Doll Research
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# Happy birthday

• Happy birthday Vladimir!



# Introduction

- Back in the day (late 80s, early 90s)
  - SLDM: Spectral Lanczos Decomposition Method
  - Fast convergence for parabolic (diffusion) equations
  - Applicable to lossless (hyperbolic) wave equation as well
  - Not many advantages compared with explicit time-stepping (FDTD)

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# Main research question

- What happens if we include losses?
- Lossy wavefield systems
- Perfectly Matched Layers (PML, after 1994)

# Basic equations

• First-order lossless wavefield system

$$(\mathcal{D}+\mathcal{M}\partial_t)\mathcal{F}=-w(t)\mathcal{Q}$$

- Plus initial conditions
- Dirichlet boundary conditions (no PML) included
- Lossy wavefield system

$$(\mathcal{D} + \mathcal{S} + \mathcal{M}\partial_t)\mathcal{F} = -w(t)\mathcal{Q}$$

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### Maxwell's equations

#### • Field vector

$$\mathcal{F} = [E_x, E_y, E_z, H_x, H_y, H_z]^T$$

Source vector

$$\mathcal{Q} = [J_x^{\mathsf{sp}}, J_y^{\mathsf{sp}}, J_z^{\mathsf{sp}}, K_x^{\mathsf{sp}}, K_y^{\mathsf{sp}}, K_z^{\mathsf{sp}}]^{\mathcal{T}}$$

## Maxwell's equations

• Medium matrices

$$\mathcal{M} = \begin{pmatrix} \varepsilon & \mathbf{0} \\ \mathbf{0} & \mu \end{pmatrix}$$
$$\mathcal{S} = \begin{pmatrix} \boldsymbol{\sigma} & \mathbf{0} \\ \mathbf{0} & \mathbf{0} \end{pmatrix}$$

and

## Maxwell's equations

• Differentiation matrix

$$\mathcal{D} = egin{pmatrix} \mathbf{0} & -\mathbf{
abla} imes \ \mathbf{
abla} imes & \mathbf{0} \end{pmatrix}$$

• Signature matrix

$$\delta^- = {\sf diag}(1,1,1,-1,-1,-1)$$

# Basic equations

Spatial discretization

$$(D+S+M\partial_t)f=-w(t)q$$

- Order of this system can be very large especially in 3D
- Discretized counterpart of  $\delta^-$  is denoted by  $d^-$

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# Basic equations

- Medium matrices (isotropic media)
  - S diagonal and semipositive definite
  - *M* diagonal and positive definite
- Differentiation matrix
  - W step size matrix = diagonal and positive definite
  - Symmetry property

$$D^T W = -WD$$

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#### Basic equations

- System matrix for lossless media:  $A = M^{-1}D$
- System matrix for lossy media:  $A = M^{-1}(D + S)$
- Evolution operator =  $\exp(-At)$

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# Basic equations

- Lossless media: A is skew-symmetric w.r.t. WM
- Evolution operator is orthogonal w.r.t. WM
- Inner product and norm

$$\langle x, y \rangle = y^H WMx$$
  $||x|| = \langle x, x \rangle^{1/2}$ 

• Stored field energy in the computational domain

$$\frac{1}{2}\|f\|^2$$

• Initial-value problem: norm of f is preserved

### Lanczos algorithms

- Lossless media: construct SLDM field approximations via Lanczos algorithm for skew-symmetric matrices
- FDTD can be written in a similar form as Lanczos algorithm

recurrence relation for FDTD

recurrence relation for Fibonacci polynomials

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#### Lanczos algorithms

- Lanczos recurrence coefficients:  $\beta_i$
- Comparison with FDTD:  $1/\beta_i$  = time step of Lanczos
- Automatic time step adaptation no Courant condition

#### Lanczos algorithms

- Lossy media: system matrix A = M<sup>-1</sup>(D + S) is no longer skew-symmetric
- Introduce

$$d^{\mathsf{p}} = rac{1}{2}(I+d^{-})$$
 and  $d^{\mathsf{m}} = rac{1}{2}(I-d^{-})$ 

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#### Lanczos algorithms

• Special case: 
$$S = \xi d^p$$

 $\sigma(\mathbf{x}) = \xi \varepsilon(\mathbf{x})$  for all  $\mathbf{x}$  belonging to computational domain

- Exploit shift invariance of Lanczos decomposition
- Basis for lossless media can be used to describe wave propagation for lossy media (in this special case)

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# Lanczos algorithms

- Not possible for general lossy media
- Matrix D is symmetric with respect to Wd<sup>-</sup>

$$D^T W d^- = W d^- D$$

• System matrix A is symmetric w.r.t. WMd<sup>-</sup>

## Lanczos algorithms

• System matrix A is symmetric w.r.t. bilinear form

$$\langle x, y \rangle = y^H W M d^- x$$

• Free-field Lagrangian

$$\frac{1}{2}\langle f,f\rangle$$

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### Lanczos algorithms

- Write f = f(q) to indicate that the field is generated by a source q
- Reciprocity:
  - Source vector:  $q = d^{p}q$ , receiver vector  $r = d^{p}r$

$$\langle f(q), r \rangle = \langle q, f(r) \rangle$$

• Source vector:  $q = d^{p}q$ , receiver vector  $r = d^{m}r$ 

$$\langle f(q), r \rangle = -\langle q, f(r) \rangle$$

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# Lanczos algorithms

• SLDM field approximations for lossy media can be constructed via modified Lanczos algorithm

Modified Lanczos algorithm

Lanczos algorithm for symmetric matrices with inner product replaced by bilinear form

- Modified Lanczos algorithm can also be obtained from two-sided Lanczos algorithm
- Can the modified Lanczos algorithm breakdown in exact arithmetic?

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# PML

- No outward wave propagation has been included up to this point
- Implementation via Perfectly Matched Layers (PML)
- Coordinate stretching (Laplace domain)

$$\partial_k \longleftrightarrow \chi_k^{-1} \partial_k \qquad k = x, y, z$$

Stretching function

$$\chi_k(k,s) = \alpha_k(k) + \frac{\beta_k(k)}{s}$$

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# PML

• Stretched first-order system

$$ig[\mathcal{D}(s)+\mathcal{S}+s\mathcal{M}ig]\hat{\mathcal{F}}=-\hat{w}(s)\mathcal{Q}$$

• Direct spatial discretization

$$\left[D(s)+S+sM
ight]\hat{f}=-\hat{w}(s)q$$

 ${\, \bullet \,}$  Leads to nonlinear eigenproblems for spatial dimensions > 1

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# PML

- Linearization of the PML
- Spatial finite-difference discretization using *complex* PML step sizes

$$(D_{cs}+S+sM) f_{cs}=-w(s)q$$

• System matrix

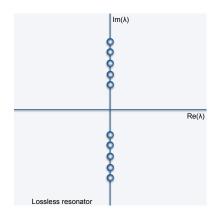
$$A_{\rm cs}=M^{-1}(D_{\rm cs}+S)$$

- V. Druskin and R. F. Remis, "A Krylov stability-corrected coordinate stretching method to simulate wave propagation in unbounded domains," SIAM J. Sci. Comput., Vol. 35, 2013, pp. B376 – B400.
- V. Druskin, S. Güttel, and L. Knizhnerman, "Near-optimal perfectly matched layers for indefinite Helmholtz problems," SIAM Rev. 58-1 (2016), pp. 90 – 116.

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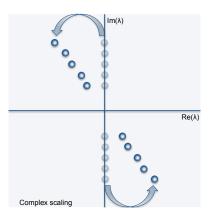
# PML

• What about the spectrum of the system matrix?



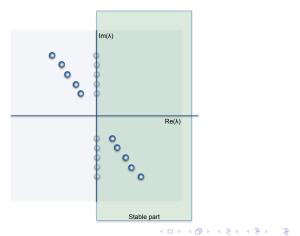
# PML

• Eigenvalues move into the complex plane



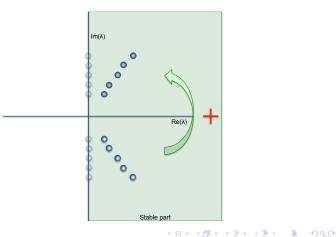
# PML

• Stable part of the spectrum



# PML

• Stability correction



Stability-Corrected Wave Function

• Time-domain stability-corrected wave function

$$f(t) = -w(t) * 2\eta(t) \operatorname{Re}[\eta(A_{cs}) \exp(-A_{cs}t)q]$$

• Complex Heaviside unit step function

$$\eta(z) = egin{cases} 1 & \operatorname{\mathsf{Re}}(z) > 0 \ 0 & \operatorname{\mathsf{Re}}(z) < 0 \end{cases}$$

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# Stability-Corrected Wave Function

Frequency-domain stability-corrected wave function

$$\hat{f}(s) = -\hat{w}(s) \big[ r(A_{\mathsf{cs}},s) + r(ar{A}_{\mathsf{cs}},s) \big] q$$

with

$$r(z,s)=\frac{\eta(z)}{z+s}$$

 Note that f(s) = f(s) and the stability-corrected wave function is a nonentire function of the system matrix A<sub>cs</sub>

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Stability-Corrected Wave Function

- Symmetry relations are preserved
- With a step size matrix W that has complex entries
- These entries correspond to PML locations

Stability-Corrected Wave Function

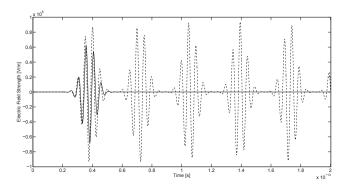
- Stability-corrected wave function cannot be computed by FDTD
- SLDM field approximations via modified Lanczos algorithm
- Reduced-order model

 $f_m(t) = -w(t) * 2 \|M^{-1}q\|\eta(t)\operatorname{Re}\left[V_m\eta(H_m)\exp(-H_mt)e_1\right]$ 

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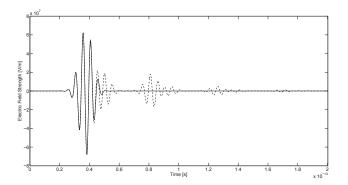
#### Stability-Corrected Wave Function

• *m* = 300



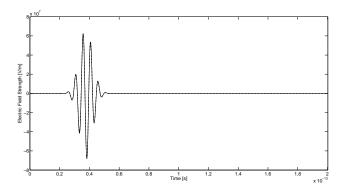
# Stability-Corrected Wave Function

• *m* = 400



# Stability-Corrected Wave Function

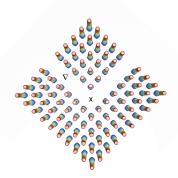
• m = 500



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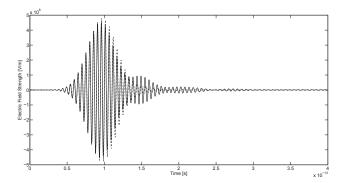
# Stability-Corrected Wave Function

• Photonic crystal



# Stability-Corrected Wave Function

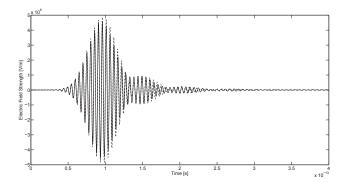
#### • m = 1000 vs. 8200 FDTD iterations



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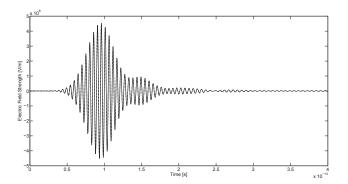
# Stability-Corrected Wave Function

#### • m = 2000 vs. 8200 FDTD iterations



# Stability-Corrected Wave Function

#### • m = 3000 vs. 8200 FDTD iterations



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### Extensions

- Approach has been extended for dispersive media in
  - J. Zimmerling, L. Wei, H. Urbach, and R. Remis, A Lanczos model-order reduction technique to efficiently simulate electromagnetic wave propagation in dispersive media, *Journal of Computational Physics*, Vol. 315, pp. 348 362, 2016.
- Extended Krylov subspace implementations are discussed in
  - V. Druskin, R. Remis, and M. Zaslavsky, *Journal of Computational Physics*, Vol. 272, pp. 608 618, 2014.

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### Current and future work

- Rational Krylov field approximations No stability-correction required
- Phase-preconditioned rational Krylov methods Large travel times
- More on this in the coming week!

# Thank you for your attention!

