

The waveguide eigenvalue problem and Tensor infinite Arnoldi

Giampaolo Mele

KTH Royal Institute of technology
Dept. Math, Numerical analysis group

27 August 2015

Joint work with Elias Jarlebring and Olof Runborg

BIT Circus 2015 at Umeå University

The waveguide
eigenvalue problem
and Tensor infinite
Arnoldi

Giampaolo
Mele



WEP

TIAR

Combination

Simulations

Conclusions

Outline

The waveguide
eigenvalue problem
and Tensor infinite
Arnoldi

Giampaolo
Mele



- ▶ WEP: Waveguide Eigenvalue Problem
- ▶ TIAR: Tensor infinite Arnoldi
- ▶ Specialization of TIAR to WEP and numerical simulations

WEP

TIAR

Combination

Simulations

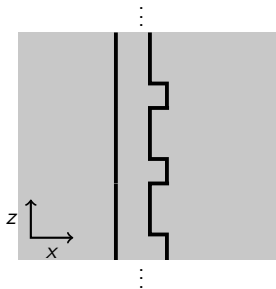
Conclusions

WEP: the waveguide
eigenvalue problem

Helmholtz equation (single-periodic coefficients):

$$\Delta u(x, z) + \kappa(x, z)^2 u(x, z) = 0 \text{ when } (x, z) \in \mathbb{R} \times \mathbb{R}$$
$$u(x, \cdot) \rightarrow 0 \text{ as } x \rightarrow \pm\infty$$

- ▶ $\kappa(x, z)$ periodic z -direction.
- ▶ $\kappa(x, z)$ constant for $(x, z) \notin [x_-, x_+] \times \mathbb{R}$.



Some related computational works: [Tausch, Butler '02], [Engström, Hafner, Schmidt '09, Engström '10], [Schmidt, Hiptmair '13], [Spence, Poulton '05], [Cox, Stevens '99], ...

The waveguide
eigenvalue problem
and Tensor infinite
Arnoldi

Giampaolo
Mele



WEP

TIAR

Combination

Simulations

Conclusions

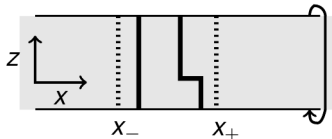
We look for normal modes (Bloch solutions)

$$\begin{aligned}u(x, z) &= e^{\lambda z} v(x, z) \\v(x, z) &= v(x, z + 1) \quad \Rightarrow\end{aligned}$$

Periodic PDE-eigenvalue problem on a strip

Find $v \in C^1(\mathbb{R} \times [0, 1], \mathbb{R})$ and λ such that:

$$\begin{aligned}\Delta v + 2\lambda v_z + (\lambda^2 + \kappa(x, z)^2)v &= 0 \\v(\cdot, z) &\rightarrow 0 \text{ as } x \rightarrow \pm\infty \\v(x, z) &= v(x, z + 1)\end{aligned}$$



Solutions of most interest: $\lambda \in \mathbb{C}_-$ close to imaginary axis.



DtN (Dirichlet to Neumann) equivalence

Under generic conditions, equivalent in a weak sense

$$\begin{aligned}\Delta v + 2\lambda v_z + (\lambda^2 + \kappa(x, z)^2)v &= 0, \quad (x, z) \in [x_-, x_+] \times [0, 1] \\ v(x, z) &= v(x, z + 1) \\ v_x(x_-, \cdot) &= \mathcal{T}_{-, \lambda}(v(x_-, \cdot)) \\ v_x(x_+, \cdot) &= \mathcal{T}_{+, \lambda}(v(x_+, \cdot))\end{aligned}$$

$\mathcal{T}_{\pm, \lambda}(\cdot)$ has nonlinear dependence in λ .

Discretized problem

A particular type of FEM discretization leads to

$$M(\lambda)v = \begin{pmatrix} Q(\lambda) & C_1(\lambda) \\ C_2^T & R^H P(\lambda) R \end{pmatrix} v = 0$$

$P(\lambda)$ nonlinear and non polynomial in λ .



The nonlinear eigenvalue problem

Find $\lambda \in \mathbb{C}$, $v \neq 0$ such that

$$M(\lambda)v = 0$$

where M analytic in a disk $\Omega \subset \mathbb{C}$.

Selection of interesting works

[Ruhe '73], [Mehrmann, Voss '04], [Lancaster '02],
[Tisseur, et al. '01], [Voss '05], [Unger '50], [Mackey, et al. '09],
[Kressner '09], [Bai, et al. '05], [Meerbergen '09], [Breda, et al.
'06], [Betcke, et al. '04, '10], [Asakura, et a. '10], [Beyn '12],
[Szyld, Xue '13], [Hochstenbach, et al. '08], [Neumaier '85],
[Gohberg, et al. '82], [Effenberger '13], [Van Beeumen, et al '15]

...

WEP

TIAR

Combination

Simulations

Conclusions

TIAR: tensor infinite Arnoldi



Properties / features of infinite Arnoldi method

- ▶ Equivalent to Arnoldi's method on a companion matrix, for any truncation parameter N with $N > k$
- ▶ Equivalent to Arnoldi's method on an operator \mathcal{B}
- ▶ Convergence theory (?)
- ▶ Requires adaption of computation of y_0 . For Taylor version:

$$y_0 = M(\hat{\lambda})^{-1}(M'(\hat{\lambda})x_1 + \dots + M^{(k)}(\hat{\lambda})x_k)$$

- ▶ Complexity of orthogonalization at step k : $O(k^2n)$

Described in: [Jarlebring, et al. '11, '12, '15]

Observation: The basis matrix has a structure



The waveguide
eigenvalue problem
and Tensor infinite
Arnoldi

Giampaolo
Mele



Theorem (Implicit representation of the basis matrix [Jarlebring, M., Runborg '15])

There exists $Z = [z_1, \dots, z_k] \in \mathbb{C}^{n \times k}$ and tensor $[a_{i,j,\ell}]_{i,j,\ell=1}^k$, such that the blocks in the basis matrix generated by k steps of infinite Arnoldi method can be factorized as

$$q_{i,j} = \sum_{\ell=1}^k a_{i,j,\ell} z_{\ell}$$

WEP

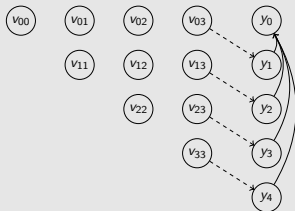
TIAR

Combination

Simulations

Conclusions

Observation: The basis matrix has a structure



The waveguide
eigenvalue problem
and Tensor infinite
Arnoldi

Giampaolo
Mele



Theorem (Implicit representation of the basis matrix
[Jarlebring, M., Runborg '15])

There exists $Z = [z_1, \dots, z_k] \in \mathbb{C}^{n \times k}$ and tensor $[a_{i,j,\ell}]_{i,j,\ell=1}^k$, such that the blocks in the basis matrix generated by k steps of infinite Arnoldi method can factorized as

$$q_{i,j} = \sum_{\ell=1}^k a_{i,j,\ell} z_{\ell}.$$

WEP

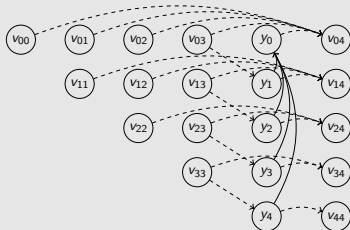
TIAR

Combination

Simulations

Conclusions

Observation: The basis matrix has a structure



Theorem (Implicit representation of the basis matrix [Jarlebring, M., Runborg '15])

There exists $Z = [z_1, \dots, z_k] \in \mathbb{C}^{n \times k}$ and tensor $[a_{i,j,\ell}]_{i,j,\ell=1}^k$, such that the blocks in the basis matrix generated by k steps of infinite Arnoldi method can be factorized as

$$q_{i,j} = \sum_{\ell=1}^k a_{i,j,\ell} z_{\ell}.$$

The waveguide
eigenvalue problem
and Tensor infinite
Arnoldi

Giampaolo
Mele



WEP

TIAR

Combination

Simulations

Conclusions

Key ideas of TIAR

- ▶ Rephrase IAR using implicit representation of basis matrix as a $Z \in \mathbb{C}^{n \times k}$ and $[a_{i,j,\ell}]_{i,j,\ell=1}^k$.
- ▶ Maintain orthogonality of Z for numerical stability

TIAR vs IAR

- ▶ TIAR involves less memory $\mathcal{O}(nm^2)$ vs. $\mathcal{O}(nm)$,
- ▶ Complexity for m steps: $\mathcal{O}(nm^3)$ for both,
- ▶ TIAR involves less data and is much faster due to modern CPU-caching issues

Other literature with compact representations

- ▶ TOAR: [Zhang, Su, '13], [Kressner, Roman '14]
- ▶ CORK: [V. Beeumen, et al '15]

The waveguide
eigenvalue problem
and Tensor infinite
Arnoldi

Giampaolo
Mele



WEP

TIAR

Combination

Simulations

Conclusions

Specialization of TIAR to WEP and numerical simulations

Recall WEP:

$$M(\lambda) = \begin{pmatrix} Q(\lambda) & C_1(\lambda) \\ C_2^T & R^H P(\lambda) R \end{pmatrix}$$

and $Q(\lambda) = A_0 + A_1\lambda + A_2\lambda^2$

and $C_1(\lambda) = C_{1,0} + C_{1,1}\lambda + C_{1,2}\lambda^2$

$$P(\lambda) = \text{diag}(s_{-, -p}(\lambda), \dots, s_{-, p}(\lambda), s_{+, -p}(\lambda), \dots, s_{+, p}(\lambda))$$

where

$$s_{\pm, k}(\lambda) = \rho_k \sqrt{((\lambda + 2i\pi k) + i\kappa_{\pm})((\lambda + 2i\pi k) - i\kappa_{\pm})}.$$

Bad news: $\mathcal{O}(\sqrt{n})$ branch-point singularities

Good news: All singularities are on $i\mathbb{R}$

Solution

Cayley transformation brings all singularities to unit circle.

Apply algorithm to Cayley transformed problem.

The waveguide
eigenvalue problem
and Tensor infinite
Arnoldi

Giampaolo
Mele



WEP

TIAR

Combination

Simulations

Conclusions

In order to implement IAR or TIAR: We need an efficient way to compute

$$y_0 = M(0)^{-1}(M'(0)x_1 + \dots + M^{(k)}(0)x_k)$$

Compute by exploiting structure

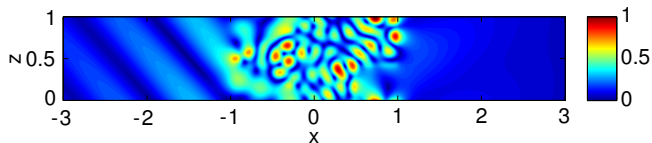
- ▶ Derivatives of $\sqrt{a\lambda^2 + b\lambda + c}$ after Cayley transformation computable with Gegenbauer polynomials (inspired by [Tausch, Butler 02'])
- ▶ Use FFT-for dense (2,2)-block
- ▶ Higher order derivatives have $\mathcal{O}(\sqrt{n})$ non-zero elements (reduces dominant $\mathcal{O}(n)$ -term to $\mathcal{O}(\sqrt{n})$)
- ▶ Use Schur complement and LU-factorization of (1, 1)-block



Simulations for a (more difficult) variant of the waveguide in
[Tausch, Butler '02]



One of the eigenfunctions of interest



Largest problem with our approach: $n \approx 10^7$.

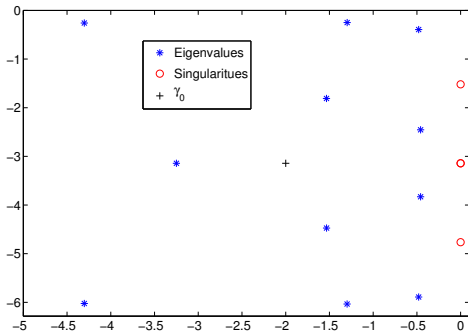
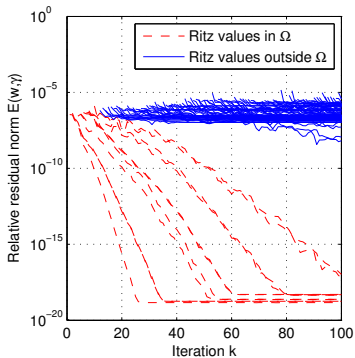
WEP

TIAR

Combination

Simulations

Conclusions



n	n_x	n_z	CPU time		storage of Q_m	
			IAR	WTIAR	IAR	TIAR
462	20	21	8.35 secs	2.58 secs	35.24 MB	7.98 MB
1,722	40	41	28.90 secs	2.83 secs	131.38 MB	8.94 MB
6,642	80	81	1 min and 59 secs	4.81 secs	506.74 MB	12.70 MB
26,082	160	161	8 mins and 13.37 secs	13.9 secs	1.94 GB	27.52 MB
103,362	320	321	out of memory	45.50 secs	out of memory	86.48 MB
411,522	640	641	out of memory	3 mins and 30.29 secs	out of memory	321.60 MB
1,642,242	1280	1281	out of memory	15 mins and 20.61 secs	out of memory	1.23 GB

Using different computer: $n = 9,009,002$, several hours CPU-time.



WEP

TIAR

Combination

Simulations

Conclusions

CONCLUSIONS

New contributions

- ▶ A structured discretization of a waveguide eigenvalue problem (WEP)
- ▶ A new algorithm: TIAR
- ▶ Specialization of TIAR to WEP

Online material:

- ▶ Preprint:
<http://arxiv.org/abs/1503.02096>
- ▶ Software:
<http://www.math.kth.se/~gmele/waveguide>