# Non-polynomial methods for the Helmholtz equation 

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## Polynomials or not?

## Goal:

Numerical approximation of BVPs for the Helmholtz eq. $\Delta u+\kappa^{2} u=0$.
Classical FEM \& BEM use piecewise-polynomial approximants.
Why polynomials?

- Easy \& cheap to evaluate, manipulate, differentiate, integrate. . .
- Approximation properties:
- Can approximate all functions
- Complete theory, convergence rates, only depend on smoothness

Why not polynomials?

- Can we do better?

Classical methods at large frequencies are not very satisfactory

- Not adapted to Helmholtz: polynomials are general-purpose tool
- Main goal: more accuracy for fewer DOFs

Everything can/might be extended to time-harmonic electromagnetic and elastic waves.

## Outline

- FEM-type methods:
- Trefftz methods
- Meshless methods, method of fundamental solutions (MFS)
- Partition of unity (PUM)
- Trefftz discontinuous Galerkin (TDG/UWVF)
- Quasi-Trefftz
- Approximation properties
- Instability and possible remedy
- BEM-type methods:
(discretise BIE on $\partial \Omega$ )
Hybrid-numerical asymptotics BEM (HNA BEM) (talk by F. Ecevit)

See also talk by T. Chaumont-Frelet on approximation by "Gaussian coherent states".


## Part 1

## FEM-type methods

## Treffiz methods

HiptMair, M., Perugia 2016, A survey of Trefftz methods for the Helmholtz eq.
A Trefftz method is a finite-element-type scheme where all discrete functions are solutions of the PDE to be approximated in each element of a mesh.

Named after Erich Trefftz's 1926 paper.
E.g.: piecewise harmonic polynomials for Laplace equation $\Delta u=0$.

Main point: expect more accuracy for fewer DOFs.
Homogeneous Helmholtz eq. does not admit polynomial solutions: Trefftz methods for Helmholtz are non-polynomial.

## Trefftz bases



Typical basis: (propagative) plane waves (PPWs):

$$
\mathbf{x} \mapsto \mathrm{e}^{\mathrm{i} \kappa \mathbf{d} \cdot \mathbf{x}} \quad \mathbf{d} \in \mathbb{R}^{n} \quad \mathbf{d} \cdot \mathbf{d}=1
$$

PPWs are just complex exponentials:
as easy \& cheap to manipulate, evaluate, differentiate, integrate. . . as polynomials
$\rightarrow$ Usually preferred to other choices of Trefftz bases, e.g.:
circular waves
$J_{\ell}(\kappa r) \mathrm{e}^{\mathrm{i} \ell \theta}, \ell \in \mathbb{Z}$
corner waves
$J_{\xi}(\kappa r) \mathrm{e}^{\mathrm{i} \xi \theta}, \xi \notin \mathbb{Z}$
fundamental sol. wavebands
$\Phi_{\kappa}\left(\mathbf{x}, \mathbf{y}_{j}\right)$


$$
\int_{\varphi_{1}}^{\varphi_{2}} \mathrm{e}^{\mathrm{i} \kappa \mathbf{x} \cdot(\cos \sin \varphi)} \mathrm{d} \varphi
$$



## Meshless methods and MFS

Trefftz basis functions cannot be "glued" across mesh elements. $\nabla$

- Solution \#1: meshless methods.

Herrera, Zieliński, Zienkiewicz. . . since 1970s. Includes "Fokas transform method".

Prominent example:
Method of fundamental solutions (MFS)
Solution $u$ approximated by

$$
u_{M F S}(\mathbf{x})=\sum_{j=1}^{N} a_{j} H_{0}^{(1)}\left(\kappa\left|\mathbf{x}-\mathbf{y}_{j}\right|\right)
$$

(Barnett, Betcke 2008)
Nodes $\mathbf{y}_{j}$ on a curve exterior to domain.
Coefficients $a_{j}$ computed by minimising error vs boundary conditions.

+ Simple, highly accurate, bounded or unbounded domains
- Delicate choice of nodes $\mathbf{y}_{j}$, little analysis, mostly 2D, instability.

Related: "Lightning method" for polygons (Gopal, Trefethen 2019).

## Partition of unity method

Trefftz basis functions cannot be "glued" across mesh elements.

- Solution \#2: Partition of unity method (PUM/PUFEM)
(Melenk, Babuška, 1995-97)
Multiply
- Trefftz basis $\left\{\mathrm{e}^{\mathrm{i} \kappa \mathbf{d}_{m} \cdot \mathbf{x}}\right\}_{m=1, \ldots, M}$
- partition of unity $\left\{\varphi_{j}\right\}_{j=1, \ldots, J} \subset H^{1}(\Omega) \quad \rightarrow \quad \begin{aligned} & M \cdot J \text { TOfFs } \\ & \text { non Trefftz }\end{aligned}$

Simple choice of PU:

$V_{P U M}=\operatorname{span}\left\{\mathrm{e}^{\mathrm{i} \kappa \mathbf{d}_{m} \cdot \mathbf{x}} \varphi_{j}(\mathbf{x})\right\} \subset H^{1}(\Omega)$ : can use classical variational form.:
e.g. $\int_{\Omega}\left(\nabla u \cdot \nabla \bar{v}-\kappa^{2} u \bar{v}\right)+\mathrm{i} \kappa \int_{\partial \Omega} u \bar{v}=\int_{\partial \Omega} g v \quad \forall v \in V_{P U M} \subset H^{1}(\Omega)$

## Trefftz DG methods

Trefftz basis functions cannot be "glued" across mesh elements.

## - Solution \#3:

Allow discrete functions to be discontinous across mesh face: discontinuous Galerkin (DG) method.

Variational formulation weakly enforces continuity and boundary conditions.


Examples: UWVF, TDG/PWDG, DEM, VTCR, WBM, LS, FLAME, . . .
NGSolve code by P. Stocker: https://paulst.github.io/NGSTrefftz

A concrete Trefftz methods depends on 2 choices:

- DG formulation
- discrete space



## TDG: sketch of the derivation

Consider Helmholtz equation with impedance (Robin) b.c.:

$$
\begin{aligned}
-\Delta u-\kappa^{2} u=0 & \text { in } \Omega \subset \mathbb{R}^{n} \text { bdd., Lip., } n=2,3 \\
\nabla u \cdot \mathbf{n}+\mathbf{i} \kappa u=g & \in L^{2}(\partial \Omega) ;
\end{aligned}
$$

(1) Partition $\Omega$ with a mesh $\mathcal{T}_{h}$, choose discrete Trefftz space $V_{p}\left(\mathcal{T}_{h}\right)$

2 Multiply with test $v$, integrate by parts twice on element $K \in \mathcal{T}_{h}$
("ultraweak" formulation): $\quad \forall v_{p} \in V_{p}\left(\mathcal{T}_{h}\right)$

$$
\int_{K} u_{p} \underbrace{\overline{\left(-\Delta v_{p}-\kappa^{2} v_{p}\right)}}_{=0} \mathrm{~d} V+\int_{\partial K}\left(-\partial_{\mathbf{n}} u_{p} \overline{v_{p}}+u_{p} \overline{\partial_{\mathbf{n}} v_{p}}\right) \mathrm{d} S=0
$$

3 Replace traces on $\partial K$ with "numerical fluxes" to weakly enforce inter-element continuity and BCs:

$$
\begin{aligned}
u_{p} & \rightarrow\left\{\left\{u_{p}\right\}-\frac{\beta}{\mathbf{i} \kappa} \llbracket \nabla_{h} u_{p} \rrbracket_{N} \quad \alpha, \beta>0\right. \\
\nabla u_{p} & \rightarrow\left\{\left\{\nabla_{h} u_{p}\right\}\right\}-\alpha \mathbf{i} \kappa \llbracket u_{p} \rrbracket_{N}
\end{aligned}
$$


$\{\cdot\}=$ averages, $\quad \llbracket \cdot \rrbracket_{N}=$ normal jumps on the interfaces

## TDG quasi-optimality

Summing over $K$ we get variational formulation:

$$
\begin{gathered}
\text { find } u_{p} \in V_{p}\left(\mathcal{T}_{h}\right) \quad \text { s.t. } \quad \mathcal{A}_{h}\left(u_{p}, v_{p}\right)=\mathcal{F}\left(v_{p}\right) \quad \forall v_{p} \in V_{p}\left(\mathcal{T}_{h}\right) \\
V_{p}\left(\mathcal{T}_{h}\right) \subset T\left(\mathcal{T}_{h}\right):=\left\{v \in L^{2}(\Omega):-\Delta v-\kappa^{2} v=0 \text { in each } K \in \mathcal{T}_{h}\right\}
\end{gathered}
$$

$$
\forall v, w \in T\left(\mathcal{T}_{h}\right):
$$

$\Rightarrow \quad$ Well-posedness \&

$$
\operatorname{Im} \mathcal{A}_{h}(v, v)=\| \| v\| \|_{\mathcal{F}_{h}}^{2}
$$ quasi-optimality:

$$
\left.\left|\mathcal{A}_{h}(w, v)\right| \leq 2\left|\|w\|_{\mathcal{F}_{h}^{+}}\right|\|v\|_{\mathcal{F}_{h}}\right\}\left|\left\|u-u_{p}\left|\left\|_{\mathcal{F}_{h}} \leq 3 \inf _{v_{p} \in V_{p}\left(\mathcal{T}_{h}\right)}\left|\left\|u-v_{p} \mid\right\|_{\mathcal{F}_{h}^{+}}\right.\right.\right.\right.\right.
$$

Holds for all discrete Trefftz spaces $V_{p}\left(\mathcal{T}_{h}\right) \subset T\left(\mathcal{T}_{h}\right)$

$$
\begin{aligned}
& \|v\|\left\|_{\mathcal{F}_{h}}^{2}:=\frac{1}{\kappa}\right\| \sqrt{\beta} \llbracket \nabla_{h} v \rrbracket_{N}\left\|_{\mathcal{F}_{h}^{I}}^{2}+\kappa\right\| \sqrt{\alpha} \llbracket v \rrbracket_{N}\left\|_{\mathcal{F}_{h}^{I}}^{2}+\frac{1}{\kappa}\right\| \sqrt{\delta} \partial_{\mathbf{n}} v\left\|_{\partial \Omega}^{2}+\kappa\right\| \sqrt{1-\delta} v \|_{\partial \Omega}^{2} \\
& \|v\|_{\mathcal{F}_{h}^{+}}^{2}:=\|v\|\left\|_{\mathcal{F}_{h}}^{2}+\kappa\right\| \beta^{-1 / 2}\{v\}\left\|_{\mathcal{F}_{h}^{I}}^{2}+\frac{1}{\kappa}\right\| \alpha^{-1 / 2}\left\{\nabla_{h} v\right\}\left\|_{\mathcal{F}_{h}^{I}}^{2}+\kappa\right\| \delta^{-1 / 2} v \|_{\partial \Omega}^{2}
\end{aligned}
$$

Duality technique of (MONK, WANG 1999) allows to control $L^{2}$ norm of the error: $\quad\left\|u-u_{p}\right\|_{L^{2}(\Omega)} \leq C(\kappa)\left\|u-u_{p}\right\| \|_{\mathcal{F}_{h}}$

Part II

Approximation in Trefftz spaces

## Best approximation estimates

The analysis of any plane wave Trefftz method requires best approximation estimates:

$$
\begin{gathered}
-\Delta u-\kappa^{2} u=0 \quad \text { in } D \in \mathcal{T}_{h}, \quad u \in H^{k+1}(D) \\
\operatorname{diam}(D)=h, \quad p \in \mathbb{N}, \quad \mathbf{d}_{1}, \ldots, \mathbf{d}_{p} \in \mathbb{S}^{N-1}
\end{gathered}
$$

$$
\inf _{\vec{\alpha} \in \mathbb{C}^{p}}\left\|u-\sum_{\ell=1}^{p} \alpha_{\ell} \mathrm{e}^{\mathrm{i} \kappa \mathbf{d}_{\ell} \cdot \mathbf{x}}\right\|_{H^{j}(D)} \leq C \epsilon(h, p)\|u\|_{H^{k+1}(D)}
$$

Want to study convergence rate: $\quad \epsilon(h, p) \xrightarrow[p \rightarrow \infty]{h \rightarrow 0} 0$
2 techniques:

- Show that $\forall u \in T\left(\mathcal{T}_{h}\right), \exists u_{p} \in V_{p}(K)$ with the same Taylor polynomial at a given $\mathbf{x}_{K}$
(Cessenat, Després 1998)
- Vekua theory
(Melenk 1995, M., Hiptmair, Perugia 2011)


## Approximation by plane waves: Vekua theory

Analytical tool from (VekUA 1942, 1967)
Allows to reduce approximation of Helmholtz solution by plane and circular waves $\downarrow$
approximation of harmonic functions by harmonic polynomials (Melenk 1995, Moiola 2011 )


## Vekua operators

$D \subset \mathbb{R}^{n}$ star-shaped wrt. $\mathbf{0}$.
Define two continuous functions:

$$
\begin{array}{rlr}
M_{1}(\mathbf{x}, t) & =-\frac{\kappa|\mathbf{x}|}{2} \frac{\sqrt{t}^{n-2}}{\sqrt{1-t}} J_{1}(\omega|\mathbf{x}| \sqrt{1-t}) & M_{1}, M_{2}: D \times[0,1] \rightarrow \mathbb{R} \\
M_{2}(\mathbf{x}, t)=-\frac{i \kappa|\mathbf{x}|}{2} \frac{\sqrt{t}^{n-3}}{\sqrt{1-t}} J_{1}(i \omega|\mathbf{x}| \sqrt{t(1-t)}) & J_{1}=\text { Bessel } \mathrm{f} . \\
& V[\phi](\mathbf{x}):=\phi(\mathbf{x})+\int_{0}^{1} M_{1}(\mathbf{x}, t) \phi(t \mathbf{x}) \mathrm{d} t & \\
& V_{2}[\phi](\mathbf{x}):=\phi(\mathbf{x})+\int_{0}^{1} M_{2}(\mathbf{x}, t) \phi(t \mathbf{x}) \mathrm{d} t & \mathbf{x} \in D
\end{array}
$$

$V: C^{0}(D) \rightarrow C^{0}(D)$ is linear operator such that:

- $V_{2}=V^{-1}$
- $\Delta \phi=0 \quad \Longleftrightarrow \quad\left(-\Delta-\kappa^{2}\right) V[\phi]=0$
- $P=\underset{\text { polynomial }}{\text { harmonic }} \Longleftrightarrow V[P]=\begin{gathered}\text { circular/spherical } \\ \text { wave }\end{gathered}$
- $V, V^{-1}$ continuous in Sobolev norms, explicit in $\kappa\left(H^{j}(D), W^{j, \infty}(D)\right)$


## Approximation by circular/spherical waves

Approximation of $u$ by

$$
\begin{array}{ll}
\operatorname{span}\left\{J_{\ell}(\kappa|\mathbf{x}|) \mathrm{e}^{\mathrm{i} \ell \theta}\right\}_{|\ell| \leq L} & 2 \mathrm{D} \\
\operatorname{span}\left\{\mathrm{j}_{\ell}(\kappa|\mathbf{x}|) Y_{\ell}^{m}\left(\frac{\mathbf{x}}{|\mathbf{x}|}\right)\right\}_{0 \leq \ell \leq L,|m| \leq \ell} & \text { 3D }
\end{array}
$$

$$
\underset{\substack{\inf \\ \text { parmonic } \\ \text { of degnomialis }}}{ }\|\underbrace{u-V[P]}_{=V\left[V^{-1}[u]-P\right]}\|_{j, \kappa, D} \leq C \inf _{P}\left\|V^{-1}[u]-P\right\|_{j, \kappa, D} \quad \text { contin. of } V,
$$

$$
\begin{array}{ll}
\leq C \epsilon(h, L)\left\|V^{-1}[u]\right\|_{k+1, \kappa, D} & \begin{array}{c}
\text { harmonic } \\
\text { approx. results, }
\end{array} \\
\leq C \epsilon(h, L)\|u\|_{k+1, \kappa, D} & \text { contin. of } V^{-1} .
\end{array}
$$

$\Rightarrow$ Orders of convergence for Helmholtz-by-CWs are the same as harmonic functions-by-harmonic polynomials:

$$
\epsilon(h, L) \sim L^{\lambda(k+1-j)} h^{k+1-j}
$$

The constant $C$ depends explicitly on $\kappa h$ :

$$
C=C \cdot(1+\kappa h)^{j+6} \mathrm{e}^{\frac{3}{4} \kappa h}
$$

## Approximation of circular waves by plane waves

Link between plane waves and circular/spherical waves: Jacobi-Anger expansion


We need the other way round:
circular wave $\approx$ linear combination of plane waves

- truncation of J-A expansion
- careful choice of directions (in 3D)
- solution of a linear system
$\rightarrow$ explicit error bound
- residual estimates


## Final approximation by plane waves

$\forall u \in H^{k+1}(D), \quad-\Delta u-\kappa^{2} u=0, \quad D \subset \mathbb{R}^{n}, \quad n \in\{2,3\}$,

$$
\inf _{\vec{\alpha} \in \mathbb{C}^{p}}\left\|u-\sum_{\ell=1}^{p} \alpha_{\ell} \mathrm{e}^{\mathrm{i} \kappa \mathbf{x} \cdot \mathbf{d}_{\ell}}\right\|_{H^{j}(D)} \leq C(\kappa h) h^{k+1-j} p^{-\frac{\lambda(k+1-j)}{n-1}}\|u\|_{H^{k+1}(D)}
$$

$h=\operatorname{diam}(D), \quad p=$ PPW space dimension,$\quad D=$ mesh element
Better rates than polynomials!
If $u$ extends outside $D$ : exponential convergence.

## Smooth-coefficient PDEs: quasi-Trefftz methods

All this is for constant-coefficients Helmholtz eq.: $\quad \Delta u+\kappa^{2} u=0$.
What about $\quad \mathcal{L} u=\nabla \cdot(a(\mathbf{x}) \nabla u)+\kappa^{2} n(\mathbf{x}) u=0$ ?
We don'† know exact solutions $\rightarrow$ no Trefftz method possible.
Quasi-Trefftz idea:
(Imbert-GÉRARD 2014-. . .) use discrete functions that are approximate PDE solutions, $\mathcal{L} u_{h} \approx 0$.

More precisely, degree- $q$ Taylor polynomial (centred at a given $\mathbf{x}_{K}$ ) of $\mathcal{L} v_{h}$ is 0 :
$T_{\mathbf{x}_{K}}^{q+1}\left[\mathcal{L} u_{h}\right]=0 \quad \Rightarrow$ Small residual: $\quad \mathcal{L} v_{h}(\mathbf{x})=\mathcal{O}\left(\left|\mathbf{x}-\mathbf{x}_{K}\right|^{q+1}\right), \quad \mathbf{x} \in K$
Can construct quasi-Trefftz spaces

- with polynomials, or
- with generalised plane waves: $\mathrm{e}^{\mathrm{i} \kappa P(\mathbf{x})}$

Basis construction and $h$-approximation properties are available

## PPW instability

Plane-wave-based Trefftz-DG methods

- have great approximation properties
- are quasi-optimal ( $\rightarrow$ convergence is guaranteed)
- are simple (exponential basis)


## So why isn'† everybody using plane waves?

The issue is "instability". Increasing \# of PPWs, at some point convergence stagnates.

Discrete space contains an accurate approximation, but linear system cannot find it.


Numerical phenomenon: due to computer arithmetic+cancellation.
PPW instability already observed in all PPW-based Trefftz methods. Usually described and treated as ill-conditioning issue.

## Part III

## PPW instability and evanescent PWs

E. Parolin, D. Huybrechs, A. Moiola
arXiv:2202.05658
Stable approximation of Helmholtz solutions by evanescent plane waves Julia code on:
https://github.com/EmileParolin/evanescent-plane-wave-approx

## Adcock-Huybrechs theory

Ben Adcock, DaAn Huybrechs, SiRev 2019 \& JFAA 2020, "Frames and numerical approximation I \& II"

Goal: Approximate some $v \in V$ with linear combination of $\left\{\phi_{m}\right\} \subset V$.
Result: If there exists $\sum_{m=1}^{M} a_{m} \phi_{m}$ with good approximation of $v$,

- small coefficients $a_{m}$,
then the approximation of $v$ in computer arithmetic is stable, if one uses oversampling and SVD regularization.

Denoting $P_{\left\{\phi_{m}\right\}}^{\epsilon}$ the truncated SVD projection with truncation $\epsilon$,

$$
\left\|v-P_{\left\{\phi_{m}\right\}}^{\epsilon} v\right\|_{V} \leq \inf _{\mathbf{a} \in \mathbb{C}^{M}}\left(\left\|v-\sum_{m=1}^{M} a_{m} \phi_{m}\right\|_{V}+\sqrt{\epsilon}\|\mathbf{a}\|_{\mathbb{C}^{M}}\right)
$$

(Improvement: $\sqrt{\epsilon} \rightarrow \epsilon$ using oversampling.)
Stability does not depend on (LS, Galerkin,... ) matrix conditioning.

## Fourier-Bessel basis on the disc

Let us focus on the unit disc $B_{1} \subset \mathbb{R}^{2}$.
Separable solutions in polar coordinates:

$$
b_{p}(r, \theta):=\beta_{p} J_{p}(\kappa r) \mathrm{e}^{\mathrm{i} p \theta} \quad \forall p \in \mathbb{Z}, \quad(r, \theta) \in B_{1}
$$

$\beta_{p}=$ normalization, e.g. in $H^{1}\left(B_{1}\right)$ norm.

$$
\beta_{p} \sim \kappa\left(\frac{2|p|}{\mathrm{e} \kappa}\right)^{|p|} \text { as } p \rightarrow \infty .
$$



Propagative mode


$$
p=32=2 \kappa
$$

Evanescent mode
$\left\{b_{p}\right\}_{p \in \mathbb{Z}}$ is orthonormal basis of $\quad \mathcal{B}:=\left\{u \in H^{1}\left(B_{1}\right):-\Delta u-\kappa^{2} u=0\right\}$

## Stable PPW approximation is impossible

The Jacobi-Anger expansion relates PPWs and circular waves $b_{p}$ :

$$
\mathrm{PW}_{\varphi}(\mathbf{x}):=\mathrm{e}^{\mathrm{i} \kappa \mathbf{d} \cdot \mathbf{x}}=\sum_{p \in \mathbb{Z}}\left(\mathrm{i}^{p} \mathrm{e}^{-\mathrm{i} p \varphi} \beta_{p}^{-1}\right) b_{p}(r, \theta)
$$




Modulus of Fourier coefficient
$\left|\mathrm{i}^{p} \mathrm{e}^{-\mathrm{i} p \varphi} \beta_{p}^{-1}\right|=\left|\beta_{p}^{-1}\right| \sim|p|^{-|p|} \quad$ indep. of $\varphi$.
Approximation of $u=\sum_{p} \widehat{u}_{p} b_{p} \in \mathcal{B}$ requires exponentially large coefficients.
$u \in H^{s}\left(B_{1}\right), s \geq 1 \quad \Longleftrightarrow \quad\left|\widehat{u}_{p}\right| \sim o\left(|p|^{-s+\frac{1}{2}}\right)$ but $\left|\beta_{p}^{-1}\right| \sim|p|^{-|p|}$ is much smaller!

$$
\underset{\substack{\forall p \in \mathbb{Z} \\ \forall M \in \mathbb{N} \\ \forall \boldsymbol{N} \in \mathbb{C}^{M} \\ \forall \eta \in(0,1)}}{\forall M} b_{p}-\sum_{m=1}^{M} \mu_{m} \mathrm{PW}_{\frac{2 \pi m}{M}}\left\|_{\mathcal{B}} \leq \eta \quad \Longrightarrow \quad\right\| \boldsymbol{\mu} \|_{\ell^{1}\left(\mathbb{C}^{M}\right)} \geq(1-\eta) \underbrace{\left|\beta_{p}\right|}_{\sim|p||\nu|}
$$

## Evanescent plane waves

Idea: use PPWs \& evanescent plane waves (EPW)

$$
\mathrm{e}^{\mathrm{i} \kappa \mathbf{d} \cdot \mathrm{x}} \quad \mathbf{d} \in \mathbb{C}^{2} \quad \mathbf{d} \cdot \mathbf{d}=1
$$

Complex d!
Again: exponential Helmholtz solutions.

$\zeta=0$
$\zeta=0.1$
$\zeta=0.2$
$\zeta=1 \quad \kappa=16$
Parametrised by $\quad \varphi=$ direction, $\zeta=$ "evanescence". $\uparrow^{\zeta} Y$
Parametric cylinder:

$$
\mathbf{y}:=(\varphi, \zeta) \in Y:=[0,2 \pi) \times \mathbb{R} .
$$

$$
\mathbf{d}(\mathbf{y}):=(\cos (\varphi+\mathbf{i} \zeta), \sin (\varphi+\mathbf{i} \zeta)) \in \mathbb{C}^{2}
$$

## EPW modal analysis

Jacobi-Anger expansion holds also for EPWs:

$$
\mathrm{EW}_{\mathbf{y}}(\mathbf{x})=\mathrm{e}^{\mathrm{i} \kappa \mathbf{d}(\mathbf{y}) \cdot \mathbf{x}}=\sum_{p \in \mathbb{Z}}\left(\mathrm{i}^{p} \mathrm{e}^{-\mathrm{i} p \varphi} \mathrm{e}^{p \zeta} \beta_{p}^{-1}\right) b_{p}(\mathbf{x})
$$

Absolute values of Fourier coefficients $\quad\left|\mathrm{i}^{p} \mathrm{e}^{-\mathrm{i} p \varphi} \mathrm{e}^{p \zeta} \beta_{p}^{-1}\right|, \quad \kappa=16$ :


Looks promising!
We can hope to approximate large- $p$ Fourier modes with EPWs
\& small coefficients $v_{m}$ :

$$
b_{p}(\mathbf{x}) \approx \sum_{m=1}^{M} v_{m} \mathrm{EW}_{\mathbf{y}_{m}}(\mathbf{x})
$$

## Helmholtz solutions are EPW superpositions

We want to represent $u \in \mathcal{B}$ as continuous superposition of EPWs:

$$
u(\mathbf{x})=\int_{Y} \mathrm{EN}_{\mathbf{y}}(\mathbf{x}) v(\mathbf{y}) w^{2}(\mathbf{y}) \mathrm{d} \mathbf{y}=:(T v)(\mathbf{x}) \quad \mathbf{x} \in B_{1}
$$

with density $v \in L^{2}\left(Y ; w^{2}\right)$ and weight $w^{2}=\mathrm{e}^{-2 \kappa \sinh |\zeta|+\frac{1}{2}|\zeta|}$

Parametric space


Herglotz density

$$
v \in \mathcal{A}=\overline{\operatorname{span}\left\{a_{p}\right\}} \subset L^{2}\left(Y ; w^{2}\right)
$$

Physical space


Helmholtz solution

$$
u \in \mathcal{B}=\overline{\operatorname{span}\left\{b_{p}\right\}} \subset H^{1}\left(B_{1}\right)
$$

Every Helmholtz solution is (continuous) linear combination of EPWs with small coefficients: $\quad\|v\|_{\mathcal{A}} \leq \tau_{-}^{-1}\|u\|_{\mathcal{B}}$

## How to sample $\mathcal{A}$ ? How to choose $\left\{\mathbf{y}_{m}\right\}_{m} \in Y$ ?

Idea from (COhen, Migliorati 2017).

Fix $P \in \mathbb{N}$, set $\mathcal{A}_{P}:=\operatorname{span}\left\{a_{p}\right\}_{|p| \leq P} \subset \mathcal{A}$.

$$
\rho(\mathbf{y}):=\frac{w^{2}}{2 P+1} \sum_{|p| \leq P}\left|a_{p}(\mathbf{y})\right|^{2} \quad \text { on } Y
$$

Define probability density

$$
\rho^{-1}=\begin{gathered}
\text { "Christoffel } \\
\text { function" }
\end{gathered}
$$

Generate $M \in \mathbb{N}$ nodes $\left\{\mathbf{y}_{m}\right\}_{m=1, \ldots, M} \subset Y$ distributed according to $\rho$ :


We expect that any $u \in \operatorname{span}\left\{b_{p}\right\}_{|p| \leq P}$ can be approximated by EPWs with parameters $\left\{\mathbf{y}_{m}\right\}$ with small coefficients.
$\rightarrow$ Stable approx. in computer arithmetic using SVD \& oversampling.
The $M$-dimensional EPW space depends on truncation parameter $P$ : the space is tuned to approximate the Fourier modes $b_{p}$ with $|p| \leq P$.

## Approximation of $b_{p}$ by PPWs and by EPWs

$\kappa=16$,
$\epsilon=10^{-14}$,
$S=\max \{2 M, 2|p|\}$
$p=8$


$$
p=40
$$


$b_{p}, p=8$, residual $\left\|A \boldsymbol{\xi}_{\epsilon}-\mathbf{c}\right\| / /\|\mathbf{c}\|$





Mode number $p$

III-conditioning does not spoil EPW accuracy

## Approximation of general Helmholtz solution

$$
u=\sum_{|p| \leq P} \hat{u}_{p} b_{p}, \quad \hat{u}_{p} \sim(\max \{1,|p|-\kappa\})^{-1 / 2}, \quad \kappa=100, \quad P=2 \kappa, \quad M=802
$$

$$
\Re\{u\}
$$


$\|u-P P W\|_{L^{\infty}} \gtrsim 7 \cdot 10^{9}\|u-E P W\|_{L^{\infty}}$
DOFs/wavelength $=\lambda \sqrt{M /\left|B_{1}\right|} \approx 1$

## Convex polygon, same discrete space

$\kappa=16, \quad M=200, \quad u=$ fundamental solution at distance 0.25


$\Re\{u\}$

$$
|u-P P W|
$$

$$
|u-E P W|
$$



Part IV

BEM-type methods: HNA

## Hybrid numerical-asymptotic approach

- FEM/BEM approximates $u$ by a piecewise polynomial on a mesh.
- GO/GTD approximates $u$ by a sum of WKB solutions (corresponding to incident, reflected, diffracted waves):

$$
u(\mathbf{x}) \sim \sum_{j=1}^{J} v_{j}(\mathbf{x}) \mathrm{e}^{\mathrm{i} \kappa \phi_{j}(\mathbf{x})}, \quad \kappa \rightarrow \infty
$$

Phases $\phi_{j}$ and amplitudes $v_{j}$ found by ray tracing, solving ODEs along rays, and asymptotic matching.


- HNA methods use a FEM/BEM approximation space incorporating oscillatory basis functions, with GO/GTD phases and numerically computed piecewise-polynomial amplitudes.

Goal: Controllable accuracy and $O(1)$ computational cost as $\kappa \rightarrow \infty$.

## Sound-soft convex polygonal scatterer

HNA survey: (Chandler-Wilde, Graham, Langdon, Spence 2012) This setting: (CHANDLER-WILDE, LANGDON 2007)

$$
\Delta u+\kappa^{2} u=0
$$

$$
u^{\mathrm{Scat}}=u-u^{i}
$$

outgoing at infinity


Green's representation theorem:

$$
\Phi(\mathbf{x}, \mathbf{y}):=\frac{i}{4} H_{0}^{(1)}(\kappa|\mathbf{x}-\mathbf{y}|)
$$

$$
u(\mathbf{x})=u^{i}(\mathbf{x})-\int_{\Gamma} \Phi(\mathbf{x}, \mathbf{y}) \partial_{\mathbf{n}} u(\mathbf{y}) \mathrm{d} s(\mathbf{y}), \quad \mathbf{x} \in \mathbb{R}^{2} \backslash \bar{\Omega}
$$

Taking traces gives a boundary integral equation for $\partial_{\mathbf{n}} u(\mathbf{y})$, e.g.

$$
\int_{\Gamma} \Phi(\mathbf{x}, \mathbf{y}) \partial_{\mathbf{n}} u(\mathbf{y}) \mathrm{d} s(\mathbf{y})=u^{i}(\mathbf{x}), \quad \mathbf{x} \in \partial \Omega
$$

## Incident, reflected and diffracted waves

According to geometric theory of diffraction (GTD), for $\kappa \rightarrow \infty$

where $s$ is the arclength along the boundary.


Higher-order multiply-diffracted waves have the same phases $\mathrm{e}^{\mathrm{ \pm i} \mathrm{\kappa s}}$, but amplitudes $A, B$ are harder to compute.

## Hybrid numerical-asymptotic BEM

On each side $\Gamma_{j}$, HNA BEM uses the ansatz

$$
\begin{aligned}
\partial_{\mathbf{n}} u(\mathbf{x}(\mathbf{s})) & =\underbrace{\left[\begin{array}{c}
2 \partial_{\mathbf{n}} u^{i} \\
0
\end{array}\right]}_{G O}+\underbrace{v_{j}^{+}(s) \mathrm{e}^{\mathrm{i} \kappa s}+v_{j}^{-}\left(L_{j}-s\right) \mathrm{e}^{-\mathrm{i} \kappa s}}_{\text {GTD }} \quad \mathbf{x} \in \Gamma_{j} \\
& \approx\left[\begin{array}{c}
2 \partial_{\mathbf{n}} u^{i} \\
0
\end{array}\right]+w_{j}^{+}(s) \mathrm{e}^{\mathrm{i} \kappa s}+w_{j}^{-}\left(L_{j}-s\right) \mathrm{e}^{-\mathrm{i} \kappa s}=\psi_{H N A}(\mathbf{s})
\end{aligned}
$$

where $w_{j}^{ \pm}$are piecewise-polynomials.
$v_{j}^{ \pm}(s)$ are analytic in $\Re\{s\}>0$, slowly oscillating, singular only at $s=0$ :
$\rightarrow$ approximated by piecewise-polynomials $w_{j}^{ \pm}$
on two overlapping geometric meshes, graded towards the corners:

$$
\begin{gathered}
w_{j}^{-}\left(L_{j}-\mathbf{s}\right) H \\
w_{j}^{+}(\mathbf{s}) \longmapsto
\end{gathered}
$$



## Convergence of $h p-H N A ~ B E M$


(Gibbs, Hewett, Huybrechs, Parolin 2020)
" $h p$ " approximation strategy: increase polynomial degree $p$ simultaneously with the number of layers $n$ in the mesh ( $n=c p$ )

## Hewett, Langdon, Melenk 2013

$$
\left\|\partial_{\mathbf{n}} u-\psi_{H N A}\right\|_{L^{2}(\Gamma)}+\frac{\left\|u-u_{H N A}\right\|_{L^{\infty}(D)}}{\|u\|_{L^{\infty}(D)}} \leq C \kappa^{5 / 2} \mathrm{e}^{-\tau p} .
$$

\#DOFs $=\mathcal{O}(n(p+1)) \sim \log ^{2} \kappa \quad$ is enough to maintain any given accuracy for $\kappa \rightarrow \infty$
In practice, the method is $\kappa$-independent!
Analysis assumes the use of the "star-combined formulation"

## Problems treated with HNA or related methods

- Smooth scatterers
(Ecevit, Graham. ..)
- Flat screens in 2D and 3D
- Some non-convex polygons
- Multiple obstacles
- Transmission problems
- Curvilinear polygons
- ...



## Summary

- FEM-type methods:
- Trefftz methods
- Meshless methods, method of fundamental solutions (MFS)
- Partition of unity (PUM)
- Trefftz discontinuous Galerkin (TDG/UWVF)
- Quasi-Trefftz
- Approximation properties of plane/circular/spherical waves
- Instability and possible remedy, evanescent plane waves
- BEM-type methods: HNA


## Thank you!

Not discussed:

- Choice of PW directions: a priori \& a posteriori adaptivity
- Other Trefftz formulations, UWVF framework
- Virtual elements (VEM): PUM and Trefftz versions (Perugia. ..)


## Part V

## Extras

## TDG: derivation - I

1 Consider Helmholtz equation with impedance (Robin) b.c.:

$$
\begin{aligned}
&-\Delta u-\kappa^{2} u=0 \\
& \nabla u \cdot \Omega \subset \mathbb{R}^{n} \text { bdd., Lip., } n=2,3 \\
& \nabla u \cdot \mathbf{n}+\mathbf{i} \kappa u=g \in L^{2}(\partial \Omega) ;
\end{aligned}
$$

(2) introduce a mesh $\mathcal{T}_{h}$ on $\Omega$;
(3) multiply the Helmholtz equation with a test function $v$ and integrate by parts on a single element $K \in \mathcal{T}_{h}$ :

$$
\int_{K}\left(\nabla u \cdot \nabla \bar{v}-\kappa^{2} u \bar{v}\right) \mathrm{d} V-\int_{\partial K}(\mathbf{n} \cdot \nabla u) \bar{v} \mathrm{~d} S=0
$$

4 integrate by parts again: ultraweak step

$$
\int_{K}\left(-u \Delta \bar{v}-\kappa^{2} u \bar{v}\right) \mathrm{d} V+\int_{\partial K}(-\mathbf{n} \cdot \nabla u \bar{v}+u \mathbf{n} \cdot \nabla \bar{v}) \mathrm{d} S=0
$$

5 choose a discrete Trefftz space $V_{p}(K)$, denote $u_{p}$ the discrete solution;

## TDG: derivation - II

6 replace traces on $\partial K$ with numerical fluxes $\widehat{u}_{p}$ and $\widehat{\sigma}_{p}$ :

$$
u \rightarrow \widehat{u}_{p}, \quad \frac{\nabla u}{\mathbf{i} \kappa} \rightarrow \widehat{\boldsymbol{\sigma}}_{p}
$$

7 use the Trefftz property: $\forall v_{p} \in V_{p}(K)$

$$
\int_{K} u_{p} \underbrace{\overline{\left(-\Delta v_{p}-\kappa^{2} v_{p}\right)}}_{=0} \mathrm{~d} V+\underbrace{\int_{\partial K} \widehat{u}_{p} \overline{\nabla v_{p} \cdot \mathbf{n}} \mathrm{~d} S-\int_{\partial K} \mathrm{i} \kappa \widehat{\sigma}_{p} \cdot \mathbf{n} \bar{v}_{p} \mathrm{~d} S=0}_{\text {TDG eq. on } 1 \text { element }} ;
$$

8 Sum this equation over the elements $K \in \mathcal{T}_{h}$.
TDG numerical fluxes on interior faces:

$$
\left\{\begin{array}{l}
\widehat{\sigma}_{p}=\frac{1}{\mathrm{i} \kappa}\left\{\left\{\nabla_{h} u_{p}\right\}-\alpha \llbracket u_{p} \rrbracket_{N}\right. \\
\widehat{u}_{p}=\left\{\left\{u_{p}\right\}-\beta \frac{1}{\mathrm{i} \kappa} \llbracket \nabla_{h} u_{p} \rrbracket_{N}\right.
\end{array}\right.
$$


$\{\cdot\}\}=$ averages,$\quad \llbracket \cdot \rrbracket_{N}=$ normal jumps on the interfaces,
$\alpha, \beta>0$.

## Variational formulation of the TDG

The TDG method reads: $\quad$ find $u_{p} \in V_{p}\left(\mathcal{T}_{h}\right)$ s.t.

$$
\mathcal{A}_{h}\left(u_{p}, v_{p}\right)=\mathbf{i} \kappa^{-1} \int_{\partial \Omega} \delta g \overline{\nabla_{h} v_{p} \cdot \mathbf{n}} \mathrm{~d} S+\int_{\partial \Omega}(1-\delta) g \overline{v_{p}} \mathrm{~d} S
$$

$\forall v_{p} \in V_{p}\left(\mathcal{T}_{h}\right)$ where
( $\mathcal{F}_{h}^{I}=$ interior skeleton)

$$
\begin{aligned}
\mathcal{A}_{h}(u, v): & \left.\int_{\mathcal{F}_{h}^{I}} \llbracket u\right\} \rrbracket\left[\overline{\nabla_{h} v} \rrbracket_{N} \mathrm{~d} S\right. & & +\mathrm{i} \kappa^{-1} \int_{\mathcal{F}_{h}^{\prime}} \beta \llbracket \nabla_{h} u \rrbracket_{N} \llbracket \overline{\nabla_{h} v} \rrbracket_{N} \mathrm{~d} S \\
& -\int_{\mathcal{F}_{h}^{I}}\left\{\nabla_{h} u\right\} \cdot \llbracket \bar{v} \rrbracket_{N} \mathrm{~d} S & & +\mathrm{i} \kappa \int_{\mathcal{F}_{h}^{I}} \alpha \llbracket u \rrbracket_{N} \cdot \llbracket \bar{v} \rrbracket_{N} \mathrm{~d} S \\
& +\int_{\partial \Omega}(1-\delta) u \overline{\nabla_{h} v \cdot \mathbf{n}} \mathrm{~d} S & & +\mathrm{i} \kappa^{-1} \int_{\partial \Omega} \delta \nabla_{h} u \cdot \mathbf{n} \overline{\nabla_{h} v \cdot \mathbf{n}} \mathrm{~d} S \\
& -\int_{\partial \Omega} \delta \nabla_{h} u \cdot \mathbf{n} \bar{v} \mathrm{~d} S & & +\mathrm{i} \kappa \int_{\partial \Omega}(1-\delta) u \bar{v} \mathrm{~d} S .
\end{aligned}
$$

$\alpha, \beta>0,0<\delta<1$ are parameter functions.
Notation: $\quad\{\cdot\}=$ averages, $\quad \llbracket \cdot \rrbracket_{N}=$ normal jumps on the interfaces $u_{p} \mapsto\left(\operatorname{Im} \mathcal{A}_{h}\left(u_{p}, u_{p}\right)\right)^{\frac{1}{2}}$ is a norm on the Trefftz space $\Rightarrow \exists!u_{p}$.

## Evanescent plane waves

$$
\mathrm{e}^{\mathrm{i} / \mathrm{d} \cdot \mathbf{x}} \quad \mathbf{d} \in \mathbb{C}^{2} \quad \mathbf{d} \cdot \mathbf{d}=1
$$

Parametrised by $\quad \varphi=$ direction, $\quad \zeta=$ "evanescence".
Parametric cylinder:

$$
\mathbf{y}:=(\varphi, \zeta) \in Y:=[0,2 \pi) \times \mathbb{R} .
$$

$$
\mathbf{d}(\mathbf{y}):=(\cos (\varphi+\mathbf{i} \zeta), \sin (\varphi+\mathbf{i} \zeta)) \in \mathbb{C}^{2}
$$

$$
\begin{aligned}
\mathrm{EW}_{\mathbf{y}}(\mathbf{x}) & :=\mathrm{e}^{\mathrm{i} \kappa \mathbf{d}(\mathbf{y}) \cdot \mathbf{x}} \\
& =\mathrm{e}^{\mathrm{i} \kappa(\cosh \zeta) \mathbf{x} \cdot \mathbf{d}(\varphi)} \mathrm{e}^{-\kappa(\sinh \zeta) \mathbf{x} \cdot \mathbf{d}^{\perp}(\varphi)},
\end{aligned}
$$

oscillations along

$$
\mathbf{d}(\varphi):=(\cos \varphi, \sin \varphi)
$$

$$
\text { decay along } \quad \mathbf{d}^{\perp}(\varphi):=(-\sin \varphi, \cos \varphi)
$$

## Weighted $L^{2}(Y)$ space $\mathcal{A}$

Weighted $L^{2}$ space on parametric cylinder \& orthonormal basis:

$$
\begin{aligned}
w(\mathbf{y}) & :=\mathrm{e}^{-\kappa \sinh |\zeta|+\frac{1}{4}|\zeta|} \quad \mathbf{y}=(\varphi, \zeta) \in Y \\
\|v\|_{\mathcal{A}}^{2} & :=\|v\|_{L^{2}\left(Y ; w^{2}\right)}^{2}=\int_{Y}|v(\mathbf{y})|^{2} w^{2}(\mathbf{y}) \mathrm{d} \mathbf{y} \\
a_{p}(\mathbf{y}) & :=\alpha_{p} \mathrm{e}^{p(\zeta+\mathrm{i} \varphi)} \\
\mathcal{A} & :={\overline{\operatorname{span}\left\{a_{p}\right\}_{p \in \mathbb{Z}}} \|^{\prime \cdot \|_{\mathcal{A}}} \subsetneq L^{2}\left(Y ; w^{2}\right)}^{\alpha_{p}>0 \text { normalization in }\|\cdot\|_{\mathcal{A}}, p \in \mathbb{Z}} \varphi
\end{aligned}
$$

Jacobi-Anger:


$$
\mathrm{EW}_{\mathbf{y}}(\mathbf{x})=\sum_{p \in \mathbb{Z}} \mathrm{i}^{p} J_{p}(\kappa r) \mathrm{e}^{\mathrm{i} p(\theta-[\varphi+\mathrm{i} \zeta])}=\sum_{p \in \mathbb{Z}} \tau_{p} \overline{a_{p}(\mathbf{y})} b_{p}(\mathbf{x}), \quad \tau_{p}:=\frac{\mathrm{i}^{p}}{\alpha_{p} \beta_{p}}
$$

From asymptotics \& choice of $w$ :

$$
0<\tau_{-} \leq\left|\tau_{p}\right| \leq \tau_{+}<\infty \quad \forall p \in \mathbb{Z}
$$

$\forall \mathbf{x} \in B_{1}, \quad \mathbf{y} \mapsto \mathrm{EW}_{\mathbf{y}}(\mathbf{x}) \in \mathcal{A} \quad\left(\right.$ not true for $\left.\mathbf{x} \in \partial B_{1}\right)$

## Boundary sampling method

Given (PPW, EPW,...) approximation set $\operatorname{span}\left\{\phi_{m}\right\}_{m=1, \ldots, M}$, how do we approximate $u \in \mathcal{B}$ in practice?

We use boundary sampling on $\left\{\mathbf{x}_{s}=\binom{r=1}{\theta_{s}=\frac{2 \pi s}{S}}\right\}_{s=1, \ldots, S} \subset \partial B_{1}$ :
$A \xi=\mathbf{c} \quad$ with $\quad \begin{gathered}A_{s, m}:=\phi_{m}\left(\mathbf{x}_{s}\right), \\ c_{s}:=u\left(\mathbf{x}_{s}\right)\end{gathered} \quad \begin{gathered}s=1, \ldots, S \\ m=1, \ldots, M\end{gathered} \rightarrow \quad u_{M}=\sum_{m} \xi_{m} \phi_{m} \approx u$.
Choose $\kappa^{2} \neq$ Laplace-Dirichlet eigenvalue on $B_{1}$.
Could use instead: $\left\{\begin{array}{l}\text { sampling in the bulk of } B_{1}, \\ \text { impedance trace, } \\ \mathcal{B} / L^{2}\left(B_{1}\right) / L^{2}\left(\partial B_{1}\right) \text { projection... }\end{array}\right.$

- Oversampling: $S>M$
- SVD regularization, threshold $\epsilon$ : $\}$
required by Adcock-Huybrechs

$$
A=U \operatorname{diag}\left(\sigma_{1}, \ldots, \sigma_{M}\right) V^{*}, \quad \Sigma_{\epsilon}:=\operatorname{diag}\left(\left\{\sigma_{m}>\epsilon \max _{m^{\prime}} \sigma_{m^{\prime}}\right\}\right),
$$

$$
\boldsymbol{\xi}_{\epsilon}=V \Sigma_{\epsilon}^{\dagger} U^{*} \mathbf{c}
$$

## EPW approximation: probability measure on $Y$

Probability density $\rho$ \& cumulative d.f. as functions of evanescence $\zeta$ :


Cumulative density $\Upsilon_{N}(\kappa=4)$



Cumulative density $\Upsilon_{N}(\kappa=16)$



Cumulative density $\Upsilon_{N}(\kappa=64)$


They depend on $P$ : target functions in $\operatorname{span}\left\{b_{p}\right\}_{|p| \leq P}$. Modes at $\zeta \approx \pm \log (2 P / \kappa)$.
Computation of $\rho$ requires $\kappa$-dependent normalisation factors $\alpha_{p}$.

## Parameter samples in the cylinder $Y$








Samples computed on $(0,1)^{2}$ \& uniform prob., mapped to $Y$ by $\Upsilon^{-1}$.

## Approximation by PPWs

Approximation of circular waves $\left\{b_{p}\right\}_{p}$ by equispaced PPWs

$$
\kappa=16, \quad \epsilon=10^{-14}, \quad S=\max \{2 M, 2|p|\}, \quad \text { residual } \mathcal{E}=\frac{\left\|A \xi_{\epsilon}-\mathbf{c}\right\|}{\|\mathbf{c}\|}
$$



Mode number $p$


- Propagative modes $|p| \lesssim \kappa$ : $\mathcal{O}(\epsilon)$ error $\forall M, \quad \mathcal{O}(1)$ coeff.'s
- Evanescent modes $|p| \gtrsim 3 \kappa$ : $\mathcal{O}(1)$ error $\forall M$, large coeff.'s Condition number is irrelevant!


## Approximation by EPWs

Approximation of $\left\{b_{p}\right\}, \quad P=4 \kappa, \quad \kappa=16, \quad \Delta M=4 P, \quad \Delta M=8 P$



Discrete EPW space approximates all $b_{p}$ s for $|p| \leq P$ !

## Approximation by EPWs

Approximation of $\left\{b_{p}\right\}$,
$\Delta M=4 P, \quad M=8 P$
$P=4 \kappa, \kappa=16$


Sobol


Stability $\left\|\boldsymbol{\xi}_{S, \epsilon}\right\|_{\ell^{2}}$


## Random



Stability $\left\|\boldsymbol{\xi}_{S, \epsilon}\right\|_{\ell^{2}}$


## Approximation of general (truncated) $u$

Evanescent PW approximation of rough $u$ :
$(S=2 M, \kappa=16)$

$$
u=\sum_{|p| \leq P} \hat{u}_{p} b_{p}, \quad \hat{u}_{p} \sim(\max \{1,|p|-\kappa\})^{-1 / 2}
$$

EPWs constructed assuming that $P$ is known. Deterministic sampling. Convergence for $M \nearrow \quad$ plotted against $\frac{M}{2 P+1}=\frac{\operatorname{dim}(\text { approx. space) }}{\operatorname{dim}(\text { solution space) }}$ :



Error is $P$-independent.

## Singular values of the matrix $A$



Comparable condition numbers, larger $\epsilon$-rank for EPWs. Can further increase $\epsilon$-rank by raising $P$.

