

# Challenges in fast solvers for highly oscillatory problems

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5/26/22

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\* this is a collection of opinions, not a complete review (apologies if I omit an area)

## Tasks: frequency-domain wave BVPs

Helmholtz  $(\Delta + k(\mathbf{x})^2)u = g$  in  $\Omega \subset \mathbb{R}^d$ ,  $d = 1, 2, 3$  acoustic, quantum, 2D EM

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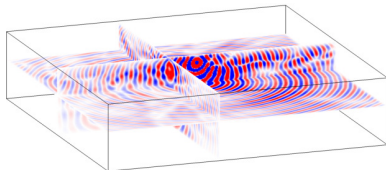
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Piecewise-const  $k(\mathbf{x})$ :

eg  $(\Delta + k^2)u = 0$  in  $\mathbb{R}^d \setminus \bar{\Omega}$

$u = f$  on  $\partial\Omega$  or  $\partial u/\partial n$ , Robin, etc

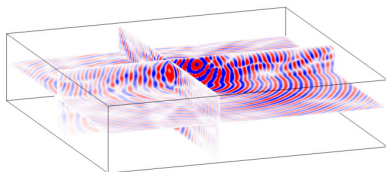
or transmission matching conditions

$k_i$  in  $\Omega_i$ ,  $i = 1, \dots, n_{\text{media}}$

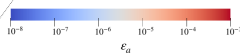
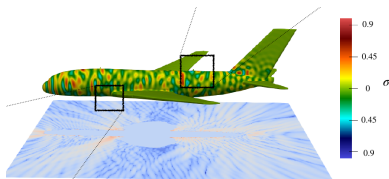
Scattering:  $f$  cancels incident wave

Methods: potential theory  $\rightarrow$  Boundary IEs  $\rightarrow$

Nyström/Galerkin BEM; MPS, MFS



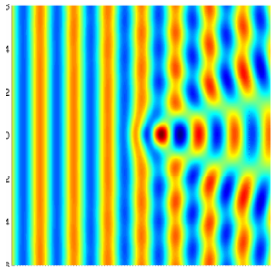
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(Greengard, O'Neil, Rachh, Vico '21)

# Three regimes

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$$k(\mathbf{x}) \approx k_0, \quad u_{\text{scatt}} \ll u_{\text{inc}}$$

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1st-ord. pert. th:

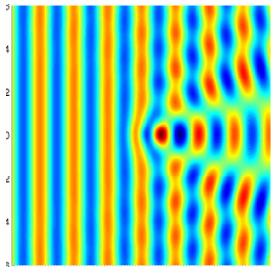
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optically "thin," microscopy,

Fourier imaging

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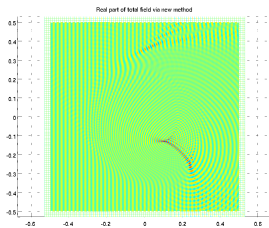
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bending ray/beam

refractive index  $k(\mathbf{x})/k_{\text{inc}}$

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plane-waves

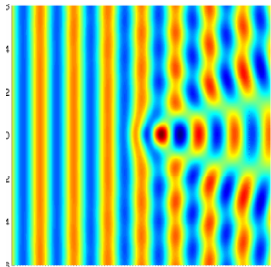
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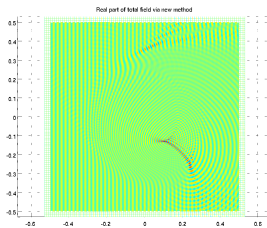
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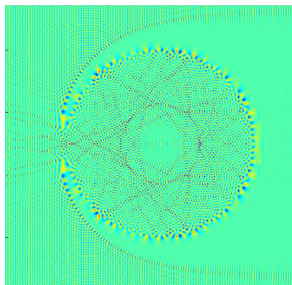
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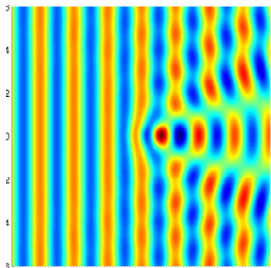
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rapid changes in  $u$  w.r.t.  $k_{\text{inc}}$

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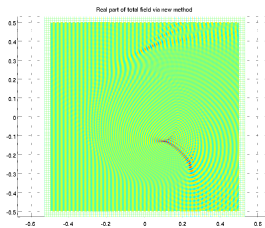
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Hard regime is  $k \sim 10^2$  to  $10^4$ ; beyond this, geom. optics sometimes ok

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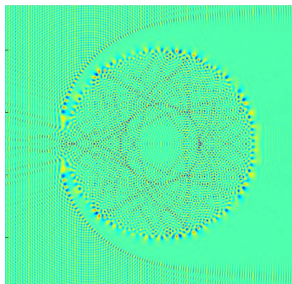


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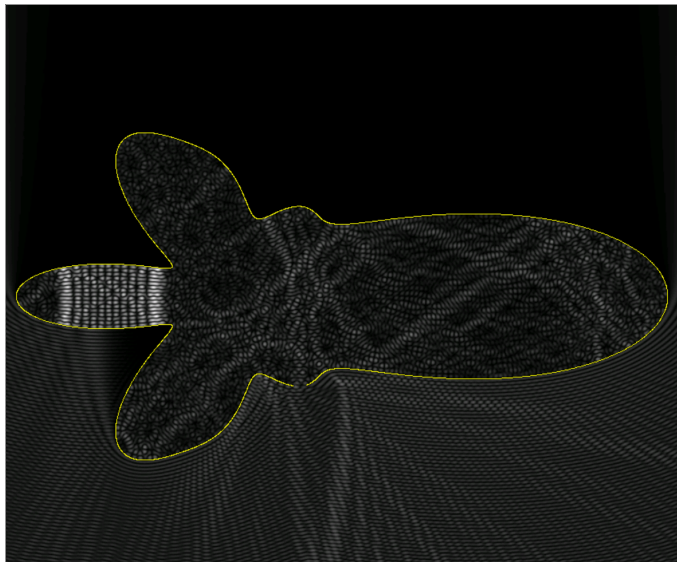
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Boundary conditions generally induce strong scattering:

(unless convex)



cavity open arc Dirichlet Helmholtz 2D,  $k_{\text{inc}}$  hitting a resonance

(Lintner–Bruno '12)

## CHALLENGE 1: degrees of freedom ( $N$ )

usual discr. (even high order) needs  $\geq$  few points per wavelength Nyquist

- Vol discr:  $N \sim k^d$       wavelength  $\lambda = 2\pi/k$     eg  $100\lambda$  in 3d:  $N \sim 10^9$
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IDEA i) For 1D  $k(x)$  smooth (osc. 2nd-ord ODE): solve *phase function*

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effort indep of  $k$ . Challenge: automate, adaptive/switching

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single scattering

bases inspired by geom. optics: then  $N$  grows v. weakly (eg  $k^{1/9}$ )

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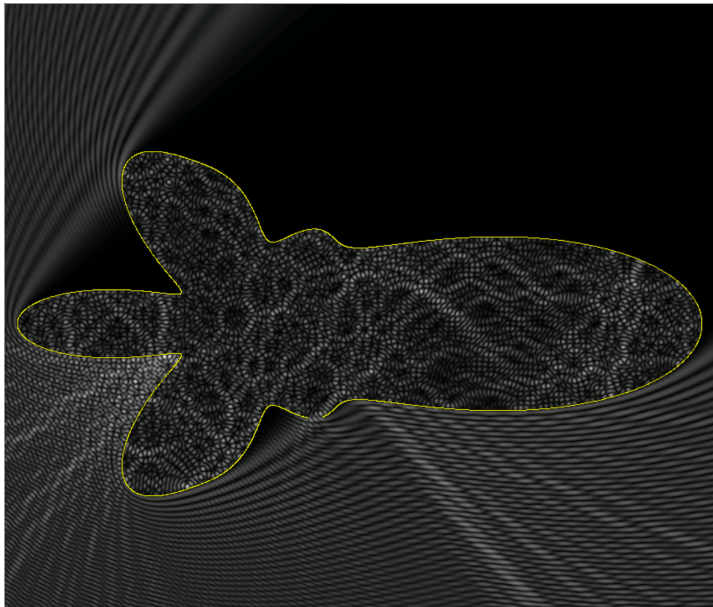
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IDEA iii) Soln. in  $\Omega$  only  $\sim k^{d-1}$  *effective* unknowns, scales like bdry  $\partial\Omega$

eg, DtN map describes  $\Omega$  response at freq  $k$     eg, exploited by HPS

Strong scatt  $\rightarrow$  waves going in all directions  $\rightarrow$  can't beat it (?)

Reminder that resonant cavity has waves traveling in all directions:



density on bdry contains all spatial freqs from 0 to  $k_{inc}$ , can't reduce  $N$

## CHALLENGE 2: Failure of iterative solvers

Vol. discr. (FD/FEM): multigrid precondition fails for  $k \gg 1$

Poisson Greens kernel  $k = 0$  was scale-invar/smoothing

- shifted Laplacian precondition. has some claims eg only  $\mathcal{O}(k^{1/3})$  iter growth

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BIE/BEM: resonant (eg, cavity): formally 2nd-kind but GMRES  $k^{d-1}$  iterations

- BIE operator  $\frac{1}{2} - D_k - i\eta S_k$  has eigenvalue density  $\mathcal{O}(k^{d-1})$  at origin
- we will hear more about this today (analysis: Spence, Marchand...)

Challenge: new BIE precondition. to remove (many?) resonances

Challenge: exploit/interpolate slow  $k$ -dep. of BIE operator eigenvalues?



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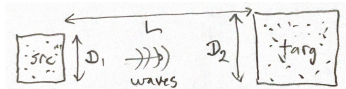
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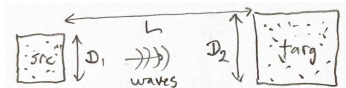
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Compression/inversion: solvers research phase (randomized lin alg, etc)

Challenge to interface to application users

(but see butterflyPACK, Liu)

## Assorted CHALLENGES

4) Imposing Sommerfeld or “interesting media” radiation conditions

- for vol. discr: PMLs poor near corners, grazing rays; BIE op too big
- for BIE: half-space or multilayer media (Green’s funcs/FMMs)  
photonic crystals (“half-space matching” method) (Fliss)

5) HPS: top-level merges  $n \sim k^{d-1}$ , dense inverse  $S_{\text{glue}}^{-1}$  takes  $\mathcal{O}(n^3)$

- Idea: HPS merge at leaf (low) levels but iterate on high levels  
(Lucero-Lorca, Gillman)
- Challenge: can’t use HODLR/HBS  $\rightarrow$  butterfly compress  $S_{\text{glue}}$  ?

6) Ill-conditioning for  $k \gg 1$  of Lippman–Schwinger VIE

GMRES poor

## CHALLENGE 7: Resonances and $k$ -dependent information

Multiple reflections  $\rightarrow$  resonances  $\rightarrow$  rapid  $k$ -dependence of soln

...  $\rightarrow$  annoyingly fine  $k$ -sampling needed

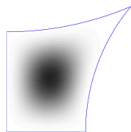
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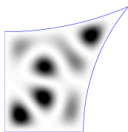
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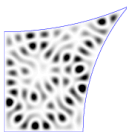
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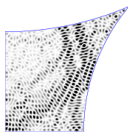
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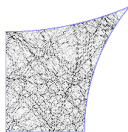
$j = 10$



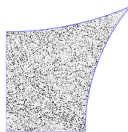
$j = 100$



$j = 10^3$



$j = 10^4$



$j = 10^5$

Sometimes  $\mathcal{O}(N)$  speedup by linearize in  $k$  ... apply to scattering?

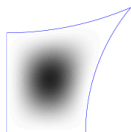
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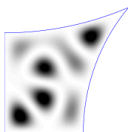
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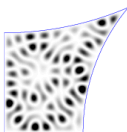
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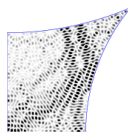
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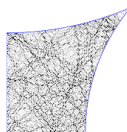
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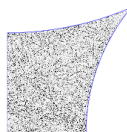
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Conclusion: Highly-osc BVPs is a great place for numerics/software/analysis/applications to meet!