Advanced Computational Methods for electromagnetic modeling, simulation and design

> Oscar P. Bruno Caltech





Pure Frequencies

(Time Harmonic Waves)



 $\Delta\psi(\mathbf{r}) + k^2\psi(\mathbf{r}) = 0$

Electromagnetic $\nabla \times E = i\omega\mu H$ $\nabla \times H = -i\omega\varepsilon E$

Simple integral equation example

Iterative linear algebra solution...

Well-posed Integral Equation Formulations CFIE-R

$$\frac{\mathbf{J}}{2} + \mathcal{K}\mathbf{J} + \xi k \ (\mathbf{n} \times \mathcal{R}) \circ \mathcal{T}\mathbf{J} = \mathbf{n} \times \mathbf{H}^{i} - \xi k \ (\mathbf{n} \times \mathcal{R})(\mathbf{n} \times \mathbf{E}^{i})$$

 $\begin{array}{l} \underline{\text{Theorem}} \ (\text{General surface, arbitrary wavenumber } k): \\ \overline{\text{Using } \mathcal{R}} = S_{iK}, \ K = ik/2 \ \text{we have} \\ \end{array} \qquad \left(S\psi(\mathbf{x}) = \int_{\Gamma} G_k(\mathbf{x} - \mathbf{x}')\psi(\mathbf{x}')d\sigma(\mathbf{x}') \right) \end{array}$

- CFIE-R are uniquely solvable;
- CFIE-R \leftrightarrow Invertible diagonal operator + Compact operator
- <u>Small iteration numbers</u>

Bruno, Elling, Paffenroth and Turc, J. Comput. Phys. [2009]

Chebyshev <u>rectangular-polar</u> integration plus compressed FFT-acceleration

Polynomial refinement in rectangular region about singular or near-singular points



Geometry Handling



DarkStar





CAD-to-EM Solver



Submarine Acoustics









- Interpolated Factored Green Function (IFGF): FFT-free acceleration algorithm

- OpenMP on 28-core server and MPI on 1680 cores
- Metamaterials: large computer cluster, photonics modeling
- Time-domain frequency-time hybrid solver
- Long-range time-domain propagation over terrain
- Long-range propagation: Screened WKB













Topics

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Simplest example. Discretizing the integral...

$$\int_{S} G_k(\mathbf{r}, \mathbf{r}') \mu(\mathbf{r}') dS' = -\psi^{\mathrm{inc}}(\mathbf{r}) \quad \mathbf{r} \in S$$

...means to combine the result of many source points x_m^S onto target points x_ℓ^T .



Accelerated Scattering evaluation: Interpolated Factored Green Function (IFGF)

$$G(x,x') = \frac{e^{ik|x-x'|}}{|x-x'|}$$

$$G(x,x_m^S) = \frac{e^{ik|x-x_m^S|}}{|x-x_m^S|} = \left(\frac{e^{ik|x|}}{|x|}\right) \underbrace{g_S(x,x_m^S)}_{\text{(slow radial variation)}}$$
Centered Factor = $G(x,0)$

... to evaluate an N_S -source field $I_S(x)$ at N_T positions x_ℓ^T

$$I_S(x_{\ell}^T) = \sum_{m=1}^{N_S} a_m^S G(x_{\ell}^T, x_m^S), \quad \ell = 1, \dots, N_T.$$



Slow variation! Instead of evaluating every single source at every target, we can just evaluate at a few points and then interpolate!

IFGF Factorization in detail

• Green Function Factorization:

$$\frac{e^{\imath\kappa|x-x'|}}{|x-x'|} = \left(\frac{e^{\imath\kappa|x|}}{|x|}\right) \left(\frac{|x|}{|x-x'|}e^{\imath\kappa\left(|x-x'|-|x|\right)}\right)$$

- First factor is a common factor (independent of the source position x')
- Second factor is slowly oscillatory (and more and more so for large |x|: analytic at ∞ !)
- Second factor is nonsingular (finite) even as $x, x' \rightarrow 0$, as long as $x' \leq \eta x$, $(0 < \eta < 1)$



Example

Error remains constant across levels as the cost is optimized

(First installment: derivatives of the analytic factor g_S)

Theorem. For $0 \le s \le \eta < 1$ and for $\xi = s$, $\xi = \theta$ and $\xi = \varphi$, we have

$$\left|\frac{\partial^n g_S}{\partial \xi^n}\right| \le M(\eta, n) \max\left\{(\kappa H)^n, 1\right\}.$$



Error remains constant across levels as the cost is optimized (Second installment: Interpolation bounds)

Theorem. For $0 \le s \le \eta < 1$ and for $\xi = s, \xi = \theta$ and $\xi = \varphi$, we have

$$\left. \frac{\partial^n g_S}{\partial \xi^n} \right| \le M(\eta, n) \max\left\{ (\kappa H)^n, 1 \right\}.$$

Theorem.

 $|g_{S}(\mathbf{x}(s,\theta,\varphi),x') - I_{P_{\mathrm{ang}}}^{\varphi}I_{P_{\mathrm{ang}}}^{\theta}I_{P_{\mathrm{s}}}^{s}g_{S}(\mathbf{x}(s,\theta,\varphi),x')| \leq$ $C\left[(\Delta_s)^{P_{\rm s}} \left\| \frac{\partial^{P_s} g_S}{\partial s^{P_s}} \right\|_{L^2} + (\Delta_\theta)^{P_{\rm ang}} \left\| \frac{\partial^{P_{\rm ang}} g_S}{\partial \theta^{P_{\rm ang}}} \right\|_{L^2} + (\Delta_\varphi)^{P_{\rm ang}} \left\| \frac{\partial^{P_{\rm ang}} g_S}{\partial \varphi^{P_{\rm ang}}} \right\|_{L^2} \right].$

> Chebyshev interpolation in φ , θ and s

$$kH \ge 1 \leq C' \left[(kH\Delta_s)^{P_{\rm s}} + (kH\Delta_\theta)^{P_{\rm ang}} + (kH\Delta_\varphi)^{P_{\rm ang}} \right]$$

Conclusion: for $kH \geq 1$ keep error constant by letting

$$\Delta_s \to \Delta_s/2, \quad \Delta_\theta \to \Delta_\theta/2 \quad \text{and} \quad \Delta_\varphi \to \Delta_\varphi/2 \quad \text{as} \quad H \to 2H!$$

For kH < 1 keep Δ_s , Δ_{θ} and Δ_{φ} unchanged.

Cost reduction: interpolate only to <u>cousin surface points</u> and <u>parent interpolation points</u>!

 Only interpolate to cousin surface points (non-neighboring children of the parent's neighbors)

• Points close are either covered directly or by levels with smaller boxes

 Points farther away are covered by levels with larger boxes: the information is carried over via the parent interpolation points!



Cousin boxes to the box $B_{(2,1)}^4$ in gray



Error remains constant across levels precisely as the cost is optimized!



As we move from one level to the next larger level...

... cost per level remains constant!

- E.g. for $kH \ge 1$ (case kH < 1 is analogous but less expensive):
- $H \rightarrow 2H$
- $-\Delta_s \to \Delta_s/2, \, \Delta_\theta \to \Delta_\theta/2 \text{ and } \Delta_\varphi \to \Delta_\varphi/2$
- Relevant boxes: $|\mathcal{R}_B| \to |\mathcal{R}_B|/4$
- Relevant cone segments per box: $|\mathcal{R}_C| \to 4|\mathcal{R}_C|$
- Cousin points (interpolation): $|\mathcal{V}| \to 4|\mathcal{V}|$
- Parent cone interpolation points (interpolation): $|\mathcal{P}| \rightarrow 4|\mathcal{P}|$

- $-\log N$ levels
- N operations per level
- $\mathcal{O}(N \log N)$ overall operations

Simple!

```
Algorithm 1 IFGF Method
 1: \\Initialization.
 2: for d = 1, ..., D do
          Determine relevant boxes \mathcal{R}_B^d and cone segments \mathcal{R}_C^d.
  3:
 4: end for
 5:
 6: \\Direct evaluations on the lowest level.
 7: for B_{\mathbf{k}}^{D} \in \mathcal{R}_{B}^{D} do
          for x \in \mathcal{U}B^D_{\mathbf{k}} \cap \Gamma_N do
                                                                    ▷ Direct evaluations onto neighboring surface points
 8:
               Evaluate I^D_{\mathbf{k}}(x)
 9:
         end for
10:
         for C^{D}_{\mathbf{k};\gamma} \in \mathcal{R}_{C}B^{D}_{\mathbf{k}} do
for x \in \mathcal{X}C^{D}_{\mathbf{k};\gamma} do
11:
                                                                          \triangleright Evaluate F at all relevant interpolation points
12:
                    Evaluate and store F_{\mathbf{k}}^{D}(x).
13:
               end for
14:
          end for
15:
16: end for
17:
18: \\Interpolation onto surface discretization points and parent interpolation points.
19: for d = D, ..., 3 do
          for B_{\mathbf{k}}^d \in \mathcal{R}_B^d do
20:
               for x \in \mathcal{V}B^d_{\mathbf{k}} \cap \Gamma_N do
21:
                                                                                          \triangleright Interpolate at cousin surface points
                    Evaluate I^d_{\mathbf{k}}(x) by interpolation
22:
23:
               end for
               if d > 3 then
                                                                                 \triangleright Evaluate F at parent interpolation points
24:
                    Determine parent B_{\mathbf{i}}^{d-1} = \mathcal{P}B_{\mathbf{k}}^{d}
25:
                    for C_{\mathbf{j};\gamma}^{d-1} \in \mathcal{R}_C B_{\mathbf{j}}^{d-1} do
26:
                         for x \in \mathcal{X}C_{\mathbf{i};\gamma}^{d-1} do
27:
                              Evaluate and add F_{\mathbf{k}}^{d}(x)G(x, x_{\mathbf{k}}^{d})/G(x, x_{\mathbf{i}}^{d-1})
28:
                         end for
29:
                    end for
30:
               end if
31:
          end for
32:
33: end for
```

Ubiquitous use of FFTs in previous integral acceleration methods

- FFTs make parallelization challenging: well-known problem for massive parallelization.
- Obvious impact of FFT in equivalent-source methods. FMM methods also rely on FFT.
- References [1], [2] indicate that

"the top part of the [FMM] octree is a bottleneck".

- Reference [3] calls parallelization "bottleneck" the part of the FMM relying on FFTs, as it suffers from "lowest arithmetic intensity" and "likely suffering from bandwidth contention".
- Reference [4] mentions two alternatives to use of FFT in the FMM which, however, it discards as less efficient than an FFT-based procedure.
- B. Engquist and L. Ying. Fast directional multilevel algorithms for oscillatory kernels. Journal of Scientific Computing, 29(4):1710–1737, 2007.
- [2] L. Ying, G. Biros, D. Zorin, and M. H. Langston. A new parallel kernel-independent fast multipole method. Proceedings of the ACM/IEEE SC2003 Conference on Supercomputing (SC'03), 2003.
- [3] A. Chandramowlishwaran, S. Williams, L. Oliker, I. Lashuk, G. Biros, and R. Vuduc. Optimizing and tuning the fast multipole method for state-of-the-art multicore architectures. In 2010 IEEE International Symposium on Parallel Distributed Processing (IPDPS), pages 1–12, 2010.
- [4] N. A. Gumerov and R. Duraiswami. Fast Multipole Methods for the Helmholtz Equation in Three Dimensions. Elsevier Science, 2004.

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IFGF-based full solvers



IFGF- vs. FMM-based full solvers

	Sample Stats. (per iter.)	N	Size	ε	T (s)	# Comput. Cores
2	IFGF/Rect-Polar	$14,\!155,\!776$	128 λ	3.8×10^{-4}	443	28
Ś	FMM/QBX	$\approx 14,000,000$	64λ	$2.5 imes 10^{-3}$	2,500	20

Rect-Polar, Bruno and Garza, JCP [2020] FMM accelerated QBX, Wala and Klöckner, JCP [2019] IFGF/Rect-Polar Jimenez, Bauinger and Bruno, arXiv:2112.06316 [2022]

Comparison of BEMFMM and IFGF: acceleration of matrix-vector multiply

$$I(x_{\ell}) = \sum_{m=1}^{N} a_m G(x_{\ell}, x_m), \quad \ell = 1, \dots, N.$$

Comparison vs. BEMFMM authors' code download, in our computer cluster. (Only small test provided → low speedup.)



<u>Parallel IFGF</u>: C. Bauinger and O. Bruno, JCP [2023] <u>BEMFMM</u>: "Extreme scale solver..." Abduljabbar, Keyes et. al. SISC [2019]

Comparison of BEMFMM and IFGF: acceleration of matrix-vector multiply



BEMFMM, SISC [2019]. Sphere problem. (Acoustic size not specified.)



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Adjoint Optimization (gradient descent; one solve per full gradient)

0	0	0	0	0
0	0	0	0	0
0	0	0	0	0
0	0	0	0	0
0	0	0	0	0



Wavelength Splitting Grating Coupler

GOAL: Maximize/minimize (resp. minimize/maximize) the amount of 1.3μ light (resp. 1.55μ light) going to the right/left (resp. left/right)



Single solve requires <u>6.4 min in Lumerical</u> (commercial FDTD solver) Vs. <u>10 sec in our solver</u> (at comparable accuracy). Optimization is not available in Lumerical.

Left-right symmetric performance, as desired!



O. Bruno, E. Garza, C. Sideris, [2018]

Negligible termination errors Windowed Green Function (WGF)

 $\lambda = 1.55 \mu$

 $\lambda = 1.3\mu$



Design method: Sideris, Garza, Bruno [2019]

Scattering in presence of layered media

$$\bigcap_{I+T} \Omega$$

$$(I+T) J = f^{inc}$$

Windowed Green Function (WGF) method Preliminary idea: solve $(\tilde{I} + Tw) J = f^{inc}$ instead









...red beams are not accounted for!

Idea: approximate the exact equation $(\tilde{I} + Tw)J = f^{inc} - T(1 - w)J$ $(\tilde{I} + Tw)J = f^{inc} - T(1 - w)J^{plane}$ Closed form + bounded integral!

Bruno, Lyon, Perez-Arancibia, Turc [2016]

WGF method: two-layer problem

Solution times compared to Sommerfeld-integral layer-Green function approach

	Solution	times	incidence angle $\alpha = \pi/32$	
k_+	Sommerfeld Int.	WGF	Max error	
1.0	0.883962 secs.	0.285474 secs	. 9.44E-05	
3.0	2.850011 secs.	0.239336 secs	• 9.58E-05	
10.0	84.728028 secs.	0.769704 secs	9.48E-05	
20.0	146.709174 secs.	1.348077 secs	. 8.47E-05	

Error	depend	lence	on	the	angle	of	incid	ence
	acpenta	Chec	011	circ	angre	01	nicia	CHCC

Errors for fixed window size and fixed integration parameters

lpha	Relative error
$\pi/4$	8.492047E-06
$\pi/16$	9.632631E-06
$\pi/64$	7.274729E-06
$\pi/256$	7.176513E-06
$\pi/1024$	7.170516E-06

Error dependence on the window size

Errors for fixed incidence angle and fixed integration parameters

W	Relative error
4λ	1.582366E-02
8λ	9.460171E-05
16λ	2.121492E-07
32λ	1.077599E-09

super algebraic convergence

Efficient Solver Strategy Based on Windowed Subproblem Decomposition

Optimization requires **multiple efficient direct** solutions

Windowed solvers

(a)

 $3\mu m$

- Partition large or even infinite domains leading to efficient concurrent solves
- Minimize edge effects through smooth windowing

Objective gradient calculation:

• Adjoint integral method



Sideris, Garza, Bruno [2019]

Grating Coupler Wavelength Demultiplexer

Fabrication and Measurement: Hajimiri's lab (Caltech)

(Sideris, Bruno et al.)

Design method: Sideris, Garza, Bruno







Minimum feature size: 160 nm (suitable for scalable standard foundry process. e beam lithography not required.)





 $\theta_{z} = 0$, CM2 1310nm

 $\theta_{z} = 0, CM2 1550nm$

Absolute insertion losses: 3.77dB for 1310nm port and 4.7dB for the 1510nm port. Isolation: ~10dB at each frequency (measured power at the correct port divided by measured power at the wrong port).

Sideris, Bruno et al., Nature Commun. Phys. [2022]

 V(b)
 HV
 ourr
 VVD
 det
 mode
 HWV

 4(2)
 20.00 kV
 40.pA
 9.0 mm
 ETO
 SE
 14.9 µm

 0/2 = 0, CM1 1550mm
 2
 25
 0
 20
 20

 -0
 -0
 20
 -2
 15
 15

Waveguide Taper / Mode Converter



- -<u>15 min</u> single core run
- 99% efficiency



Bruno, Garza and Sideris [2019]

Reference: Yablonovitch et. al [2018]

- FDTD-based
- <u>35.7 hr</u> single core equivalent
- 99% efficiency
- (2hr 33min on 14-core)



Adjoint Optimization (gradient descent; one solve per full gradient)

0	0	0	0	0
0	0	0	0	0
0	0	0	0	0
0	0	0	0	0
0	0	0	0	0


Adjoint Optimization Array of Elliptical Cylinders (gradient descent; two solves per full gradient)

0	0	0	0	0
0	0	0	0	0
0	0	0	0	0
0	0	0	0	0
)	\cap	\sim	0	0





Objective Function: Weighted sum of point intensities: $I[\alpha] = w_b |u_b(\mathbf{x}_b)|^2 + w_g |u_g(\mathbf{x}_g)|^2 + w_r |u_r(\mathbf{x}_r)|^2$

Single-Objective Optimization

SiO₂ nanoposts in transparent matrix



Bruno, Fernandez-Lado, Garza, [2018]





4,178 (λ_{int})³= 1,315.3 (λ_{ext})³

1,671 (λ_{int})³= 540.5 (λ_{ext})³

Multi-objective Wavelength and Polarization Splitter

 TiO_2 nanoposts in SiO₂ matrix. Array size: 2,439 (λ_{int})³

X polarization \longrightarrow



Y polarization \longrightarrow

(Arbitrary color code)

Multiobjective Optimization: Single array achieves both words















Double Wavelength Lens

 λ_0 = 780 nm a-Si posts, ref. index = 3.66 Fused silica substrate, ref. index = 1.453

 λ_0 = 915 nm a-Si posts, ref. index = 3.554 Fused silica substrate, ref. index = 1.453



40x40x1.7 microns 2 layers x 10,261 posts = 20,522 posts





(Device design courtesy of Prof. Amir Arbabi.)

OpenMP IFGF-Accelerated Dielectric Simulation: single node (28 cores) (Previously run in a 30-node 56 core/node computer cluster. Preliminary results; work in progress) $\lambda = 915 \text{ nm}$









780 nm light focused at (0,-10,91.425) microns

Two-layer 20k-post geometry: run time: 2.6 hr/iter, 28-cores, 78.8 million unknowns,20 GMRES iter, total memory: 146 GB

C. Bauinger, O. Bruno and E. Jimenez, [2021]

Complete Hybrid OpenMP/MPI Solvers: 41k-post geometry (Preliminary results; work in progress)



L 109 UN L 109

420 um

 $66\mu m \times 66\mu m \times 1.1\mu m$

Complete Hybrid OpenMP/MPI Solvers: 82k-post geometry





420 um

(28-cores/threads per node, 448 total cores),

94x94x1.1 microns

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"Hybrid" Time-domain from frequency domain

Time-parallel, time-leaping, wave equation/Maxwell solver



Windowing and recentering High-frequency time integration

Anderson, Bruno and Lyon, SISC [2020]

Smooth Incident-Field Time Partitioning



- Use a partition of unity to decompose the long duration signal $u^{inc}(x,t)$ into multiple relatively short duration signals which require only a fixed discretization in frequency space.

$$F_k(\omega) = \int_{-T}^T w_k(t) u^{inc}(x,t) e^{i\omega t} dt = \int_{t_k-h}^{t_k+h} w_k(t) u^{inc}(x,t) e^{i\omega t} dt$$

$$= e^{i\omega t_k} \int_{-h}^{h} w_k(t+t_k) u^{inc}(x,t+t_k) e^{i\omega t} dt$$





 Using the same discretization in frequency space for each timewindowed problem, the Helmholtz solutions at each frequency may be reused.

$$\int_{-h}^{h} w_k(t+t_k) u^{inc}(x,t+t_k) e^{i\omega t} dt \longrightarrow \hat{G}_k(x,\omega)$$

Time evolution via FFT-based "scaled convolution"

After time windowing and recentering, $u^{inc}(x, \omega)$, and thus, the solution $u(x, \omega)$, become a slowly varying, approximately band-limited functions of ω :

$$u(x,t) = \int_{-\infty}^{\infty} u(x,\omega) e^{-i\omega t} d\omega \approx \int_{-W}^{W} u(x,\omega) e^{-i\omega t} d\omega$$

Higher frequency integration for larger t! Substitute $u(x, \omega)$ by its truncated Fourier Series approximation in ω :

$$u(x,t) \approx \sum_{m=-N/2}^{N/2-1} c_m(x) \int_{-W}^{W} e^{i\frac{\pi}{W}(m-\frac{W}{\pi}t)\omega} d\omega = \sum_{m=-N/2}^{N/2-1} c_m(x) (2W \operatorname{sinc}(\alpha t - m))$$

Then, discretizing in t we obtain a "scaled convolution":

$$u(x, t_{\ell}) \approx \sum_{-N/2}^{N/2-1} c_m b_{\beta\ell-m}, \text{ where } b_q = 2W \operatorname{sinc}(q)$$

Use FFT-accelerated *Fractional Fourier Transform*-based scaled discrete convolutions

Benefits

- Overall cost: linear in time and proportional to the cost of the frequency domain solver. Less expensive asymptotics than FDTD.
- No time-domain numerical dispersion error (!!).
- Natural Parallelism for frequency-domain solutions.
- Natural Parallelism in time! (cf. P. L. Lions "para-real" algorithm).
- Time- and Space-Leaping (!!).
- O(1) cost for solution sampling at arbitrarily large times (!!)
- Use of absorbing boundaries, PML, etc., not necessary.
- High-order accuracy (periodic time integration).

Example: High-altitude glider NASA's X-24A Lifting Body





Utilizing frequency-domain solutions...





(Bruno and Garza, "Rectangular-polar integral solver", arXiv [2018])

...the Fast-Hybrid method produces solutions in the time domain



Anderson, Bruno and Lyon [2018]

Cost comparisons** with...

...time-domain integral equations and convolution quadrature

Significant advantages even for short (Gaussian) incident pulses

(worst case for hybrid method)



	$ e _{\infty}$	CPU Time (hrs)	Mem (GB)
Hybrid method (unaccel.)	$2.2 \cdot 10^{-4}$	4.3	1.6
[BK14] (accel.)	$2.1 \cdot 10^{-3}$	40.1	56.8

	$ e _{\infty}$	Wall Time (mins)	Mem (GB)
Hybrid method (unaccel.)	$1.6 \cdot 10^{-7}$	4.1	1.2
[BGH19] (unaccel.)	$\approx 10^{-7}$	101.75	290

[BK14]: L. Banjai and M. Kachanovska, *Fast convolution quadrature for the wave equation in three dimensions*, JCP, (2014) **[BGH19]:** A. H. Barnett, L. Greengard, and T. Hagstrom, *High-order discretization of a stable time-domain integral equation for 3d acoustic scattering*, JCP, (2020)

**For full details concerning these comparisons see the arXiv publication
[ABL20] T. G. Anderson, O. P. Bruno and M. Lyon, *High-order, Dispersionless* ``Fast-Hybrid'' Wave Equation Solver. Part I: O(1) Sampling Cost via Incident-Field Windowing and Recentering, SISC, (2020)

Challenges Re. near-resonant cavities: Part 1





Large increases in GMRES iterations as the apertures tend to close

Frequency-domain resonant scattering problems (Obtained by experimentation)





Bruno and Lintner, Radio Science [2012]



A menagerie of eigenfunctions (Interior problems) Dirichlet case $\Delta u = -k^2 u, \qquad x \in \Omega$ > > > >

3 3 %

3 💥 🎽

 $u = 0, \qquad x \in \Gamma$ $G_{\Gamma} G_k(x,y)\phi(y)ds_y = 0 \quad \text{for } x \in \Gamma$

Real singular k (integral): eigenvalues



Complex singular k (integral): scattering poles









Akhmetgaliev, Bruno and Nigam JCP [2015]

New approach

(Interior and exterior problems, including cavities with apertures)

$$F_k[\psi](x) = \int_{\Gamma} G_k(x, y)\psi(y)ds_y, \quad x \in \Gamma$$
$$S(k) = u^T F_k^{-1}v, \quad \text{where} \quad u, v \in \mathbb{C}^n \quad \text{are fixed random vectors}.$$

Eigenvalues/scattering poles are poles of S(k)

Obtain AAA rational interpolants. Their poles closely approximate eigenvalues/scattering poles!



Bruno, Santana and Trefethen, in preparation [2024] (Available in arXiv soon)

Cavities with apertures (Exterior problems!)



Trial and error scattering frequency (Bruno and Lintner, [2012]) k = 400



Actual scattering pole (Bruno, Santana and Trefethen [2024]) k = 399.969480881

Multiple-scattering time-domain methods

Near-resonant cavities can take many GMRES iterations to converge, which impacts the computational cost of the frequency-domain solutions.

Partitioning the cavity boundary into multiple non-resonant parts can speed up frequency-domain solutions.



A "multiple-scattering" methodology can be used to recover the correct time-domain behavior from the partitioned boundary segments (see numerical examples next slide)

Bruno and Yin [2022]

Multiple-scattering techniques for interior-like problems



0

10

8

 Γ^{2}_{12}

Bruno and Yin, Math. Comp. [2023]

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Time-domain scattering in presence of *terrain*

Radar system illuminates airborne target in presence of terrain



View of terrain toward radar source from aircraft











Windowed Green function!



Note that the strategy relies on windowing in space and time (The time-windowing is accompanied by re-centering.)

Time-domain scattering in presence of *terrain*

Radar system illuminates airborne target in presence of terrain



Combine Frequency Domain solutions to recover Time Domain



Bruno and Voss, In progress

Comparison to experiment: NIST 5G compatibility study for Aircraft carrier-based AN/SPN-43 ATC radar @ 3.55 GHz





Additional secondary scatterer (large ship)





Bruno and Voss, in progress
Topics

- IFGF Parallelization approach: space-filling Z-curves and cone-segment parallelization
- OpenMP on 28-core server and MPI on 1680 cores
- Metamaterials: near cm-scale photonics modeling, optimization and design
- Time-domain frequency-time hybrid solver
- Long-range time-domain propagation over terrain
- Long-range propagation: Screened WKB (S-WKB).

<u>EM propagation</u>. E.g. f = 0.3 GHz—100 GHz $\rightarrow \lambda \approx (3 \cdot 10^5 \text{ km/s}) / f = 100 \text{ cm} - 0.3 \text{ cm}$

[E.g. 40 km at C-band ($\lambda = 5 \text{ cm}$) \rightarrow 800,000 λ .]

 $10^4 \lambda - 10^7 \lambda$





Schematic: Tepecik and Navruz, Int. J. Electron. Commun [2018]

<u>3D ocean acoustics</u>. E.g. 4 Hz—100 Hz $\rightarrow \lambda \approx (1500 \text{ m/s}) / f = 15 \text{ m} - 400 \text{ m}$



<u>3D seismology</u>. E.g. 20 Hz—50 Hz $\rightarrow \lambda = 250$ m—40 m



v (m/s)	f (Hz)	λ (m)
2000	50	40
3000	40	75
4000	30	133
5000	20	250

Abgrall and Benamou, "Big ray-tracing and eikonal solver on unstructured grids..." Geophysics [1999]



Millions of wavelenths in electrical/acoustic size

Emblematic example: Simple geometry, medium-size electromagnetic atmospheric propagation problem. Smooth refractivity variations n = n(x, z).



- Direct numerical simulation: unfeasible in 2D, and even more so in 3D
- Physical Optics and WKB (Wentzel, Kramers, Brillouin [1926] and Jeffreys [1923], Keller et al. [1956], Born and Wolf [1959], Babič [1963], Kravtsov (1964), Maslov [1965], Ludwig [1966], Arnold [1967], Hörmander [1971], Leray [1972], Thom [1972], Berry [1975]...): Ray tracing and energy transport. Uniform expansions (in free-space, based on multiple derivatives of the unknown generalized phase). More later.
- Parabolic Equation (Leontovich & Fock [1944], many subsequent versions and improvements, including Wide angle parabolic approximation following Tappert [1973]): Factors out forward incident beam and eliminates back-propagation in finite-difference and Fourier-based contexts.
- Phase-Screen Method (Wu [1998]): Assumes constant refractivity along each vertical volumetric *z*-screen.
- Gaussian Beams (Babič and Buldreyev 1960's, Hörmander [1971], Babič and Pankratova [1973], Ralston [1976, 1982], Popov [1982], Tanushev, Engquist, Tsai, [2009]): Some details later.
- Kinetic formulation: (P.-L. Lions and Paul [1993], Markowich and Mauser [1993], Ryzhik, Papanicolaou and Keller [1996], Engquist and Runborg [1996]): Some details later.
- Dynamic Surface Extension: (Steinhoff, Fan, and Wang [2000], Ruuth, Merriman, and Osher [2000]):
 Eulerian-Lagrangian grid-centric algorithm. Some details later.

Cusp, swallowtail and butterfly catastrophes (out of the seven Thom's Elementary catastrophes)



 $\Delta z \leq \lambda/4, \ \Delta x \sim (2-50) \cdot \Delta z$ ($\Delta x \lesssim 12.5\lambda$) Finite differences (dispersion), or Fourier (lowest order, narrow).

Second-order phase approximation.

Particle density.

Grid-centric algorithm.

Classical WKB Approximation

 $\Delta u(\mathbf{r}) + k^2 \varepsilon(\mathbf{r}) u(\mathbf{r}) = 0$

WKB Ansatz:

$$u(\mathbf{r}) = e^{ik\psi(\mathbf{r})} \left(A_1(\mathbf{r}) + \frac{A_2(\mathbf{r})}{ik} + \frac{A_3(\mathbf{r})}{(ik)^2} + \dots \right)$$

$$\rightarrow \qquad \log - \log
(ik)^{+2} \left[(\nabla \psi)^2 - \varepsilon(\mathbf{r}) \right]
+ (ik)^{+1} \left[2\nabla \psi \cdot \nabla A_1 + A_1 \nabla^2 \psi \right]
+ (ik)^{+0} \left[2\nabla \psi \cdot \nabla A_2 + A_2 \nabla^2 \psi + \nabla^2 A_1 \right]
+ (ik)^{-1} \left[2\nabla \psi \cdot \nabla A_3 + A_3 \nabla^2 \psi + \nabla^2 A_2 \right] + \dots = 0$$

 $(\nabla \psi)^2 = \varepsilon(\mathbf{r})$ Eikonal Eq $2\nabla \psi \cdot \nabla A_1 + A_1 \nabla^2 \psi = 0$ Energy Trace $2\nabla \psi \cdot \nabla A_2 + A_2 \nabla^2 \psi + \nabla^2 A_1 = 0$ Higher-ord

. .

Eikonal Equation (Rays) Energy Transport Equation

Higher-order Transport

Curved rays as a broken line limit



The main cause of breakdown of the geometrical ray approximation is caustics $(A_1 = \infty)$, [...] interfaces, critical points and shadows. Higher-order terms in the asymptotic ray series are of little use [...]

C. Chapman, "Fundamentals of Seismic Wave Propagation," [2004].



Acuña and Bruno, "Efficient high-order WKB implementation", in progress

Difficulties at Caustics



Kravtsov and Orlov, "Caustics, Catastrophes and Wave Fields," [1993]

- Cross-section of a ray tube vanishes \rightarrow infinite intensity predicted. Unphysical!
- Ray field continues to span a region beyond a caustic, and so does the amplitude, which is given in terms of the Jacobian J of the ray mapping.
- After a caustic the field requires a correction: beyond a caustic the amplitude must be corrected by the factor $(-i)^m$.
- The approximation still breaks down at caustics, and is inaccurate near caustics.
- <u>The KMAH index m</u>—after Keller, Maslov, Arnol'd and Hörmander—encodes the <u>number and type</u> of caustics the ray has traversed. Caustic type needs to be determined. Generally not used in practice.
- Extensive literature. Focus on classification. Unclear how implementation of these ideas could be accomplished to simulate realistic configurations.

Difficulties at Caustics: catastrophes

A "catastrophe" is a qualitative and jumpwise variation of the state of the system.

In geometrical optics, catastrophes occur as a change in the number of rays coming into a given point of space.



Kravtsov and Orlov, "Caustics, Catastrophes and Wave Fields," [1993]

Proposed approach: Screened WKB (S-WKB).

Produce accurate field values, including at and around caustics, by avoiding WKB caustics.

The Screened-WKB Method





- Compute (*z*-dependent) incidence angles, one for each mode e^{imz} (using Eikonal equation at $x = x_0$)

$$u^{inc} \approx \sum_{m=-M/2+1}^{M/2} a_m e^{im \cdot z + i(k^2 n^2(z) - m^2)^{1/2} \cdot (x - x_0)} (\text{to first order in } (x - x_0))$$



- Propagate each mode separately via WKB
- Use local intensity for each ray
- Sum the series at present screen (requires interpolation)
- Repeat: Obtain FFT along screen...

The modes do not suffer from caustics... in neighborhoods of fixed width around every screen. Irrespective of whether the screen is far, close to, or intersecting a physical caustic.

O. Bruno and M. Maas, [2023] (arxiv.org/abs/2301.03814)

Test case: Exact Solution Separation of variables, assuming n(x,z) = n(z)

Propagation across a "smooth dielectric waveguide"

 $n(x,z) = n(z) = 1 + ae^{bz^2}$ with values such as e.g. $a = b = 10^{-4}$. (Refractivity $N = (n-1) \times 10^6 \sim \mathcal{O}(10^2)$.)

- Exact solution obtained by separation of variables and numerical solution of Sturm-Liouville eigenvalue problem in z with oscillatory exponential variation in x.
- C-band radar ($\lambda = 0.05$ m)
- E.g. 400 m in height $(8,000\lambda)$ and 200 Km in range $(4,000,000\lambda)$.



Typical range of atmospheric variation





40 km, C-band ($\lambda = 5 \ cm$), 800,000 λ

Screened-WKB Solution (intensity)



Intensity and Rays

Exact Solution (intensity)



Screened-WKB

40 km, C-band ($\lambda = 5 cm$), 800,000 λ Maximum Rel Error: 10^{-5}

O. Bruno and M. Maas, [2023] (arxiv.org/abs/2301.03814)

Berry, "Waves and Thorn's theorem" Adv. in Ph. [1965] Experiment



Similar features in the exact and S-WKB solutions

S-WKB

No attempts were made to precisely represent the experimental setup

Previous ray-optics evaluation of such post-caustic features?

Multiple Caustics

Multiple Caustics



Bouncing back and forth...



Same setup; C-Band propagation across 200 Km in range



One screen per kilometer (1 km = 20,000 λ)

 $a = 10^{-4}$ $b = 10^{-3}$

4 million wavelengths,		
Maximum Rel		
Error: 0.1%		
(4 min in single-core)		

Essentially constant error



Lens: Propagation along refractivity gradient

 $\begin{array}{l} 250 \ \lambda \times 250 \ \lambda \\ (closeup \ shown) \end{array}$ Valid even for relatively slow variations



Parabolic Equation, SoA

(Example selected to "illustrate the full potential of numerical PE solutions to complex acoustic problems") Jensen, "Computational Ocean Acoustics" [2011]

S-WKB 250 $\lambda \times 250 \lambda$



Mentioned earlier: Gaussian beams $u(\mathbf{r}) = e^{ik\psi(\mathbf{r})} \left(A_1(\mathbf{r}) + \frac{A_2(\mathbf{r})}{ik} + \frac{A_3(\mathbf{r})}{(ik)^2} + \dots \right)$

- Gaussian beams: additional approximation, by seeking the phase ψ in the form of a quadratic polynomial, with a Hessian matrix that is evolved along the ray. (Babič and Buldreyev 1960's, Hörmander [1971], Babič and Pankratova [1973], Ralston [1976, 1982], Popov [1982], Tanushev, Engquist, Tsai, [2009].)
 - Eliminates ray-bunching at caustics. Intensity remains bounded at caustics.

1.5

0.5

- $k \rightarrow \infty$ convergence has not been established theoretically, and is believed to be slow.
- Initial beam representation is a challenging optimization problem, as illustrated in the graphs below:



Numerical illustrations from: Tanushev, Engquist, Tsai, JCP [2009]

Tanushev, Tsai, Fomel and Engquist, SEG Meeting [2011]

Mentioned earlier: Dynamic Surface Extension (DSE)

Wave-front surface is propagated on a Cartesian discretization. Introduced in [SFW]

Algorithm elements ([SFW] version)

- 1. Eulerian-Lagrangian grid-centered algorithm for propagation of variables at each time step.
- 2. Uniform Cartesian grid.
- 3. Surface point closest to Cartesian grid point associated to grid point.
- 4. Evolve per the given velocity distribution.



[SFW] Steinhoff, Fan, Wang, JCP [2000]

Algorithm elements ([RMO] version)

- 1. Use a uniform Cartesian grid.
- 2. For each x in the grid, initially set an associated tracked point to equal the closest point on the surface.
- 3. Evolve the tracked point according to the local dynamics.
- 4. Reset each tracked point to equal to the closest point on the updated surface (defined to be the locus of all tracked points)
- 5. Update normals.



DSE does not produce field values or amplitudes ([RMO] evaluates the amplitude as inversely proportional to curve "expansion ratio" (stretching))

Mentioned earlier: Kinetic formulation

View each ray tracing equation as describing the motion of a "particle" (e.g. photon, phonon)

- Density of particles f(t, x, p) propagated along rays. (p = direction of propagation of particle at x.)
- Liouville equation
- Difficulty: the correct initial condition (and solution) is the "Wigner measure": a δ -function that vanishes for "incorrect" directions p.
- Physical field intensities: use of integral moments.

(Smooth) Point-source test. No caustics.



Lens. Error estimates not provided for configs. w/ caustics.

$$n(x,y) = \begin{cases} 1 & d^2 > 1, \\ \left(\frac{4}{3 - \cos(\pi d^2)}\right)^2 & d^2 \le 1, \\ d^2 = \left(\frac{x - 0.5}{0.2}\right)^2 + \left(\frac{y - 1}{0.8}\right)^2 \end{cases}$$



Lens: amplitude rendering (N = 3) not provided



Engquist, Runborg, Acta Numerica [2003]

 $[n \times (4n) \text{ spatial discretization used}]$

Screened WKB





Forthcoming work

Time domain. Interior domains. Sparse screen resolution. Multiple cross-ray screens. Bottom- and top-surfaces / refractivity discontinuities. Parallelization, Atmospheric/Oceanic/Seismological/Quantum applications.

O. Bruno and M. Maas, (arxiv.org/abs/2301.03814)



- Interpolated Factored Green Function (IFGF): FFT-free acceleration algorithm

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- Metamaterials: large computer cluster, photonics modeling
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