

# Fast Solvers and Inverse Design Algorithms for Nanophotonic and Radio-Frequency Devices

Constantine Sideris

January 8, 2025

AFOSR EM 2025 PI Review, Dr. Arje Nachman

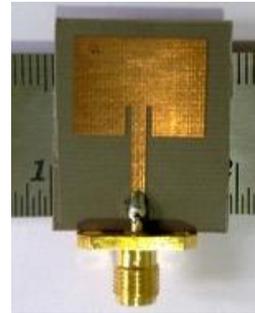
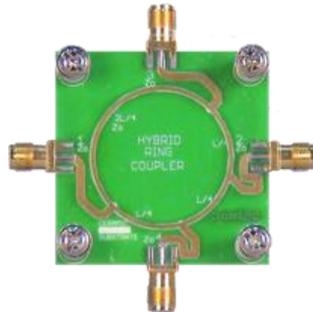
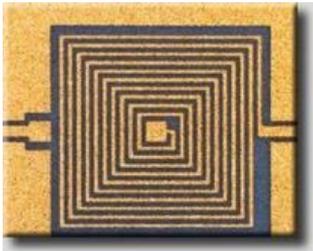


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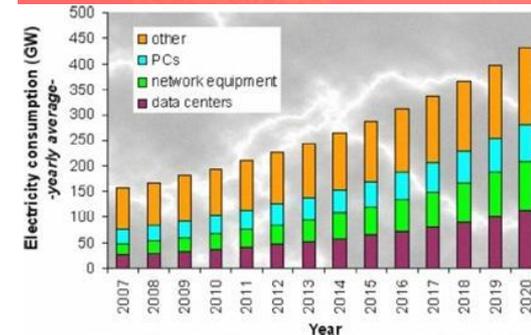
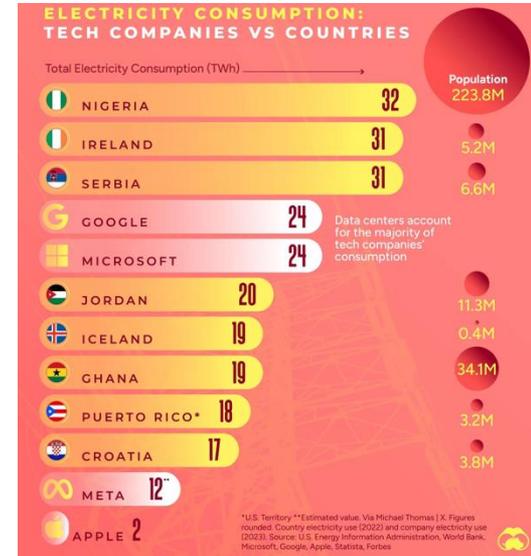
# Electromagnetic Device Simulation and Optimization

- Maxwell's equations for EM devices:
  - Nanophotonics
  - Radio-Frequency Devices (antennas, waveguide couplers, passives)



- Analytical solutions: Exist for very few problems
- Optimal design given target metrics usually not intuitive

Increasing networking and communication demands necessitate highly-optimized, energy-efficient technology down to the device level



# Outline

1. Introduction
2. **The Multi-Level Interpolated Green Function (IFGF) Method for 3D Maxwell**
3. Corner Regularized Combined Field Integral Equations (CR-CFIE) for Scattering from Objects with Geometric Singularities
4. The Precomputed Numerical Green Function (PNGF) Method for Ultra-fast Inverse Design
  - a) Introduction to PNGF
  - b) Applications to metallic RF devices
  - c) Applications to dielectric nanophotonic devices
5. Conclusions

# BIE and High-Order Nyström Methods

- ◆ Meshing **surfaces** vs volumes:  $O(N^2)$  unknowns vs  $O(N^3)$

- ◆ Solve for Integral Equation over scattering surface

$$\frac{1}{2}\bar{\varphi}(\mathbf{r}) + \int_{\Gamma} \left( \frac{\partial G(\mathbf{r}, \mathbf{r}')}{\partial \mathbf{n}(\mathbf{r}')} - ikG(\mathbf{r}, \mathbf{r}') \right) \bar{\varphi}(\mathbf{r}') d\sigma(\mathbf{r}') = -u^{\text{inc}}(\mathbf{r}), \quad \mathbf{r} \in \Gamma$$

- ◆ **Frequency-domain**

- ◆ Dispersion-free

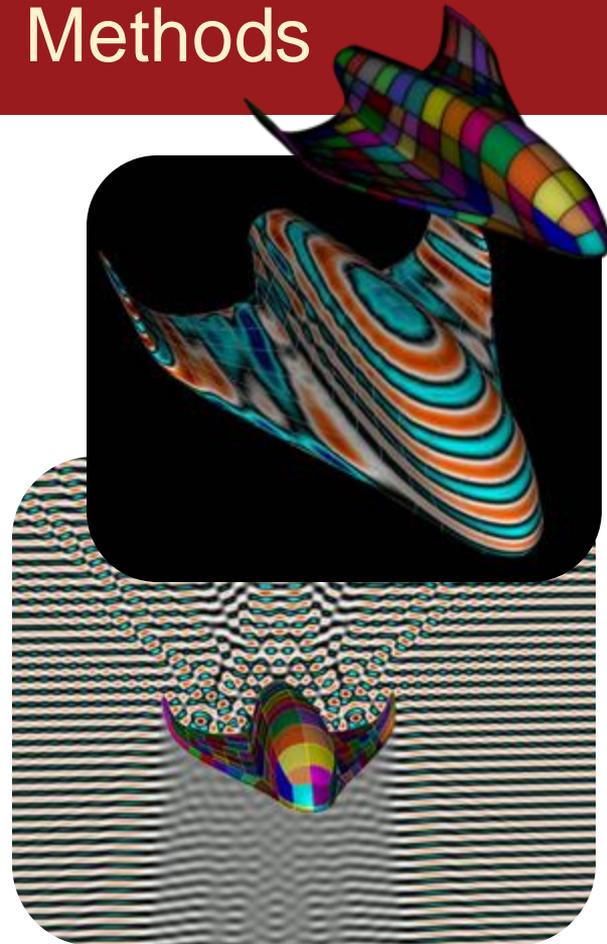
- ◆ Small linear system solved with LU decomposition

- ◆ Iterative methods (e.g. GMRES) for large problems

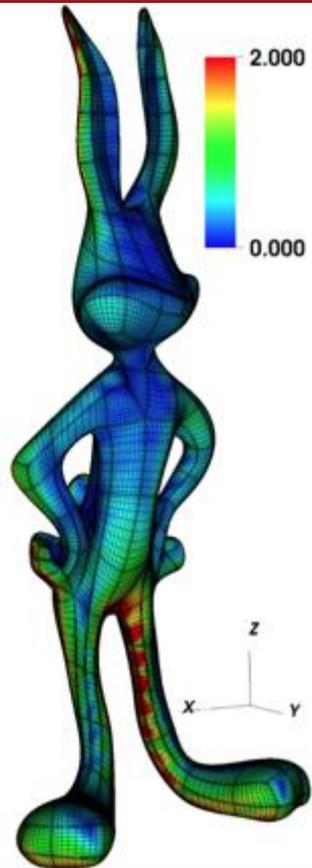
- ◆ Nyström

- ◆ **High-order** numerical convergence

- ◆ 5 points per wavelength can outperform FDTD at 50 points per wavelength resolution



# Chebyshev-Based Boundary Integral Equations (CBIE)

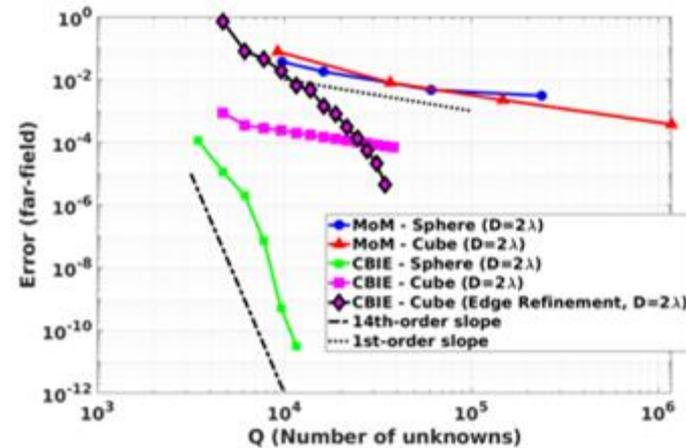
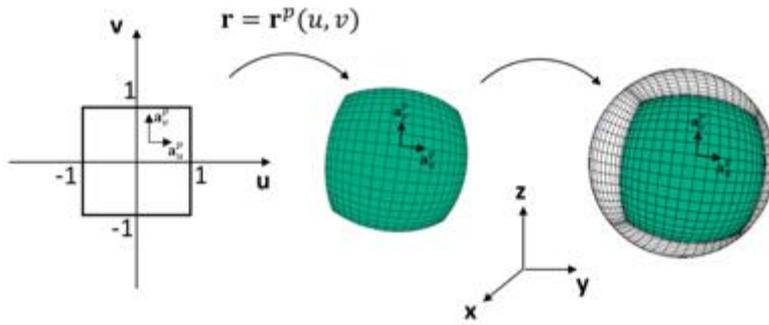


Mesh geometry on  
Chebyshev grid

Precompute  
singular  
integrals

Solve BIE  
iteratively

Compute  
fields



Hu, J., Garza, E., and **Sideris, C.** "A Chebyshev-based high-order-accurate integral equation solver for Maxwell's equations." *IEEE Transactions on Antennas and Propagation* 69.9 (2021): 5790-5800.

Garza, E., Hu, J., and **Sideris, C.** "High-order Chebyshev-based Nyström Methods for Electromagnetics." *2021 International Applied Computational Electromagnetics Society Symposium (ACES)*. IEEE, 2021.

# IFGF for Maxwell's Equations

- ◆ Unaccelerated BIE methods:  $O(N^2)$  time complexity.
- ◆ Numerous algorithmic acceleration approaches exist (e.g., FMM, Butterfly, AIM), but they are either specialized for low-frequency problems or require FFTs which are challenging to parallelize.
- ◆ Interpolated Factored Green's Function (IFGF) introduced for acoustic scattering in 2021 by Bauinger and Bruno\*.
- ◆ Single-level IFGF:  $O(N^{3/2})$ , Multi-level IFGF:  $O(N \log N)$  time complexity
- ◆ Completely FFT free: Parallelizes very easily across many CPUs.
- ◆ Simple approach: Interpolate a properly factored Green's function kernel using low-order Chebyshev polynomials.

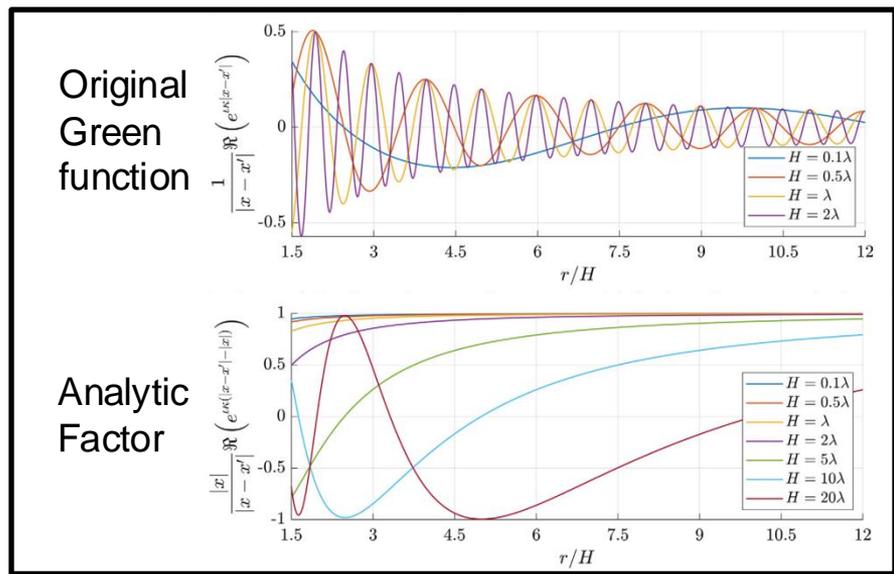
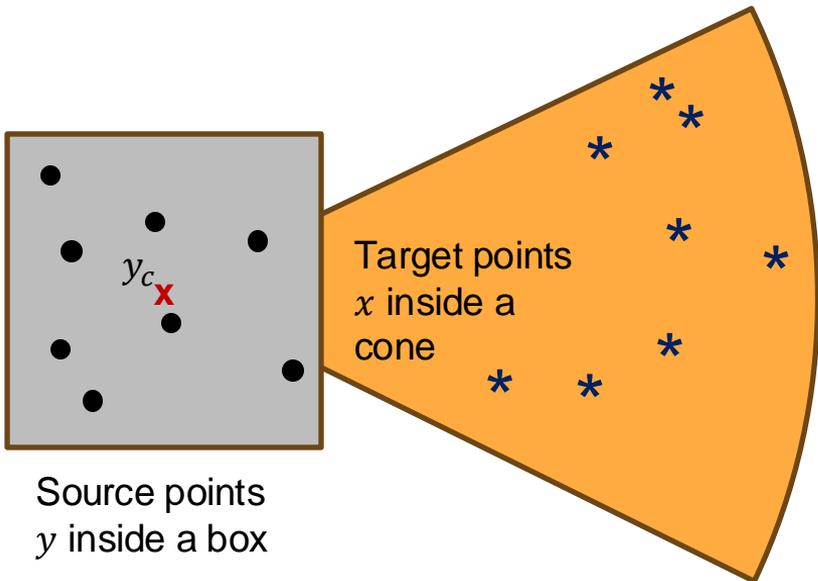
# IFGF Concept

◆ Factor out “centered” factor:

◆ Analytic factor:  $\frac{r e^{ik(|x-y|-r)}}{|x-y|}$

$$\frac{e^{ik|x-y|}}{|x-y|} = \underbrace{\frac{e^{ikr}}{r}}_{\text{Green function kernel}} \underbrace{e^{ikr \left( \frac{|x-y_c|}{r} - \frac{|y-y_c|}{r} - 1 \right)}}_{\text{Centered Factor}} \underbrace{\frac{1}{\left| \frac{x-y_c}{r} - \frac{y-y_c}{r} \right|}}_{\text{Analytic Factor}}$$

Slowly oscillating due to factoring out centered factor (easily approximated by polynomial interpolation)

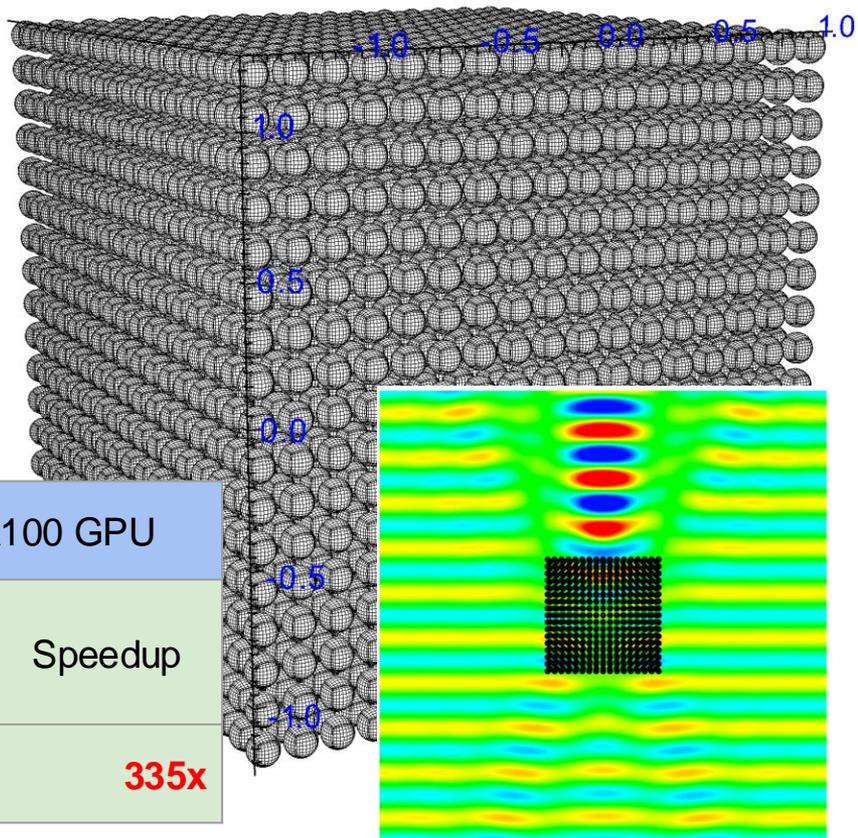


# Single-level IFGF Complexity Analysis (Last Year)

- ◆  $N$  total points,  $M$  boxes,  $\frac{N}{M}$  points per box.
- ◆ Near interactions cost:  $O\left(\frac{N^2}{M}\right)$
- ◆ Far interactions cost:  $O(MN)$
- ◆ Set them equal and solve for optimal  $M$  to minimize cost:  $MN = \frac{N^2}{M}$
- ◆ Optimal  $M = \sqrt{N}$
- ◆ Resulting asymptotic time complexity:  $O\left(N^{\frac{3}{2}}\right)$

# Single-level IFGF: PEC Sphere Array (Last Year)

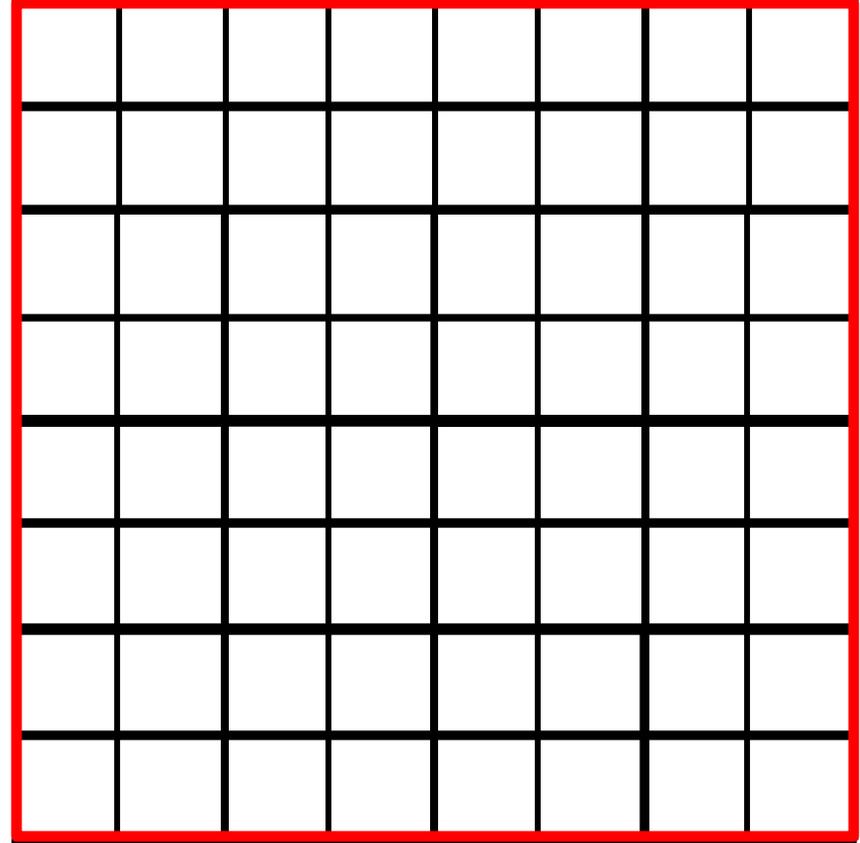
- ◆ 17x17x17 array of PEC spheres
- ◆ ( $D = 0.125\lambda$ , spacing =  $0.148\lambda$ )
- ◆ **5,895,600** unknowns: 4913 spheres \* 6 patches per sphere \*  $10 \times 10$  \* 2 unknowns per point
- ◆ Solved with MFIE: 46 GMRES iterations to reach residual  $9 \times 10^{-4}$
- ◆ Total solution time (GPU-IFGF): **656 sec (~11min)**



Problem Size (# unknowns)	Dual AMD 7763 (128 cores @ 2.45 GHz) + A100 GPU				
	CPU Direct	CPU IFGF	Speedup	GPU IFGF	Speedup
<b>5,895,600</b>	4586 sec	394 sec	<b>11.6x</b>	13.7 sec	<b>335x</b>

# Multi-Level IFGF

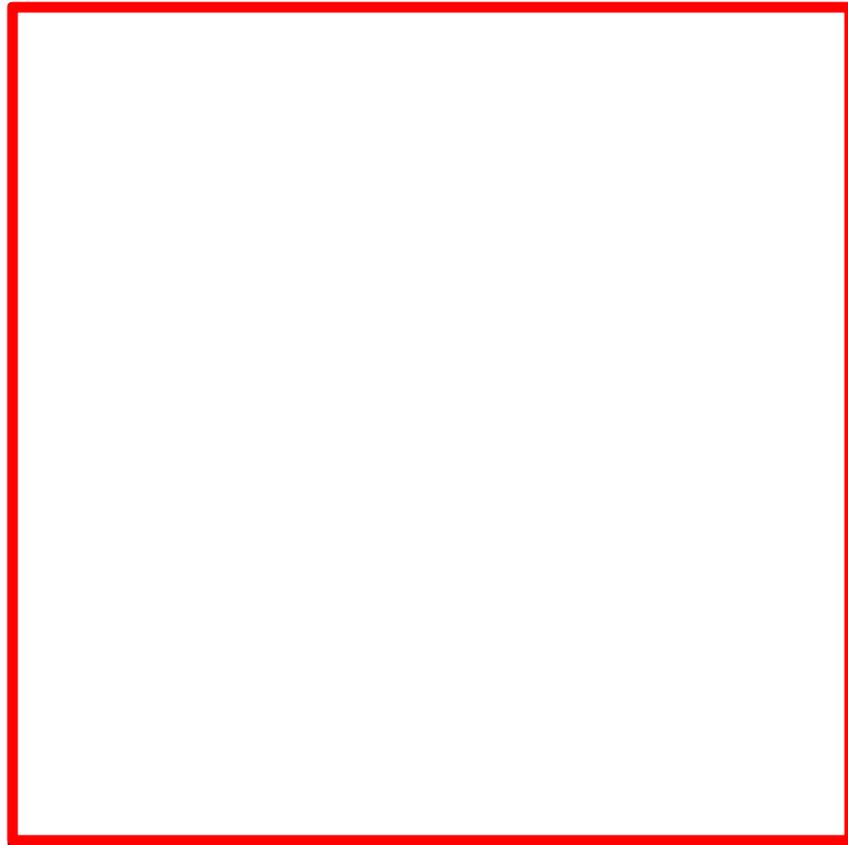
- ◆ How can we go from  $O(N^{\frac{3}{2}})$  to  $O(N \log N)$ ?



# Multi-Level IFGF

- ◆ How can we go from  $O(N^{\frac{3}{2}})$  to  $O(N \log N)$ ?
- ◆ Build an octree and use nested interpolation.

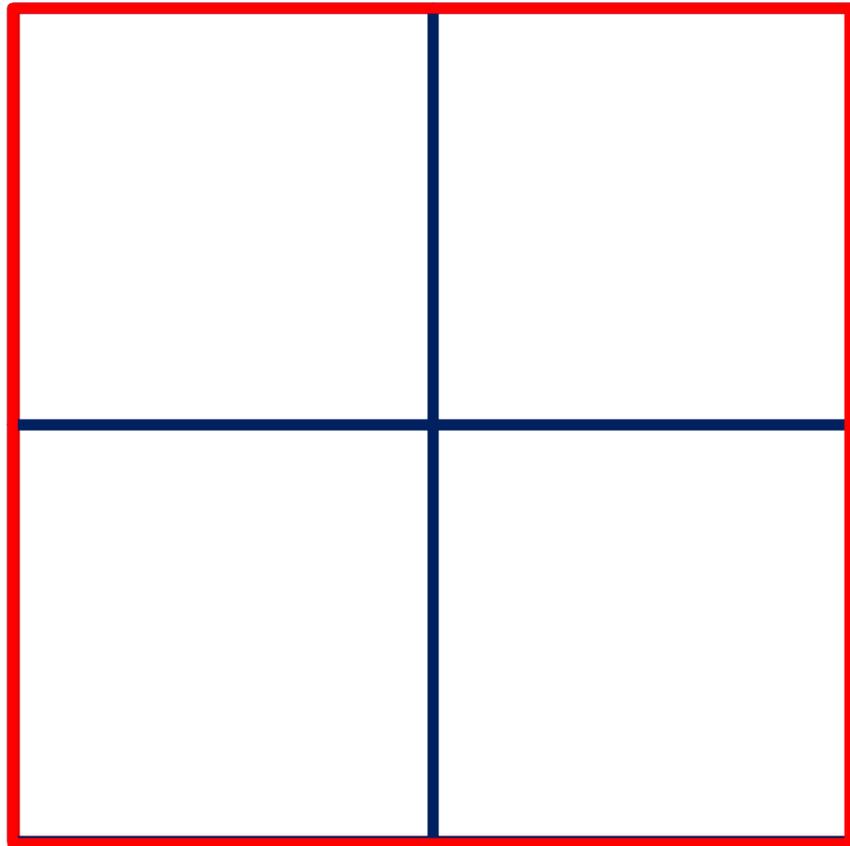
Level: d=1



# Multi-Level IFGF

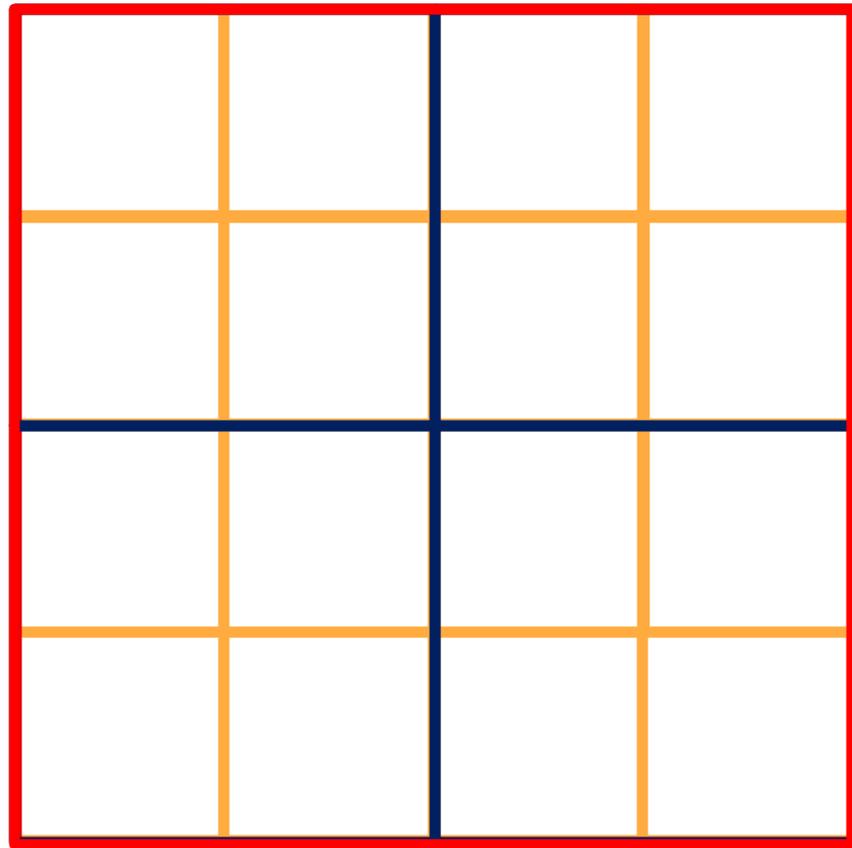
- ◆ How can we go from  $O(N^{\frac{3}{2}})$  to  $O(N \log N)$ ?
- ◆ Build an octree and use nested interpolation.

Level: d=2



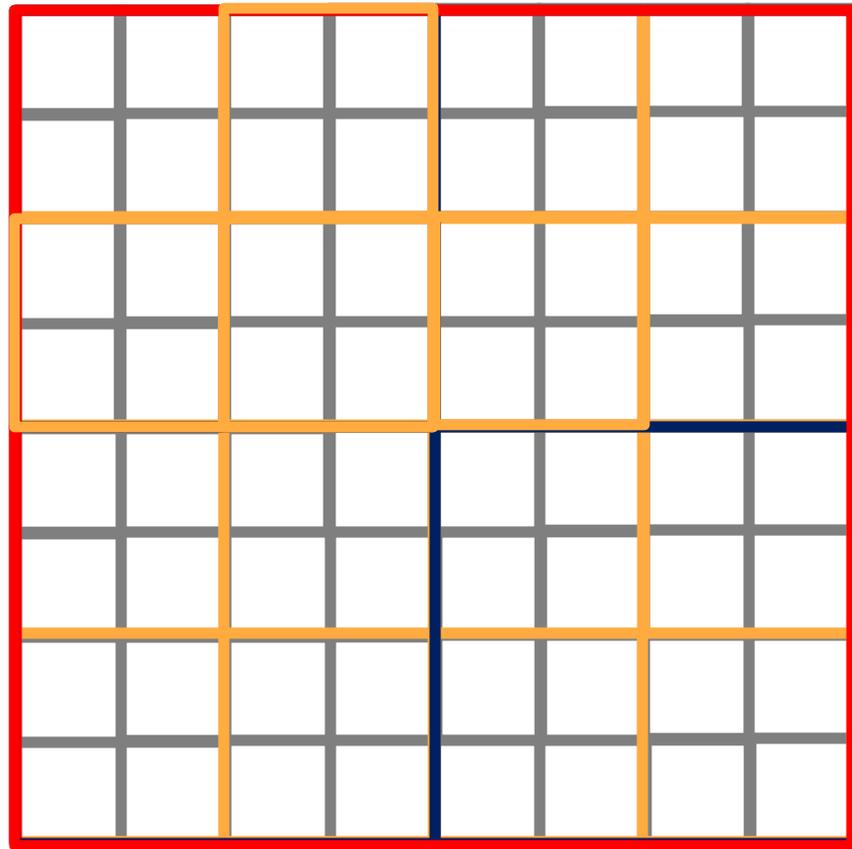
# Multi-Level IFGF

- ◆ How can we go from  $O(N^{\frac{3}{2}})$  to  $O(N \log N)$ ?
- ◆ Build an octree and use nested interpolation.



# Multi-Level IFGF

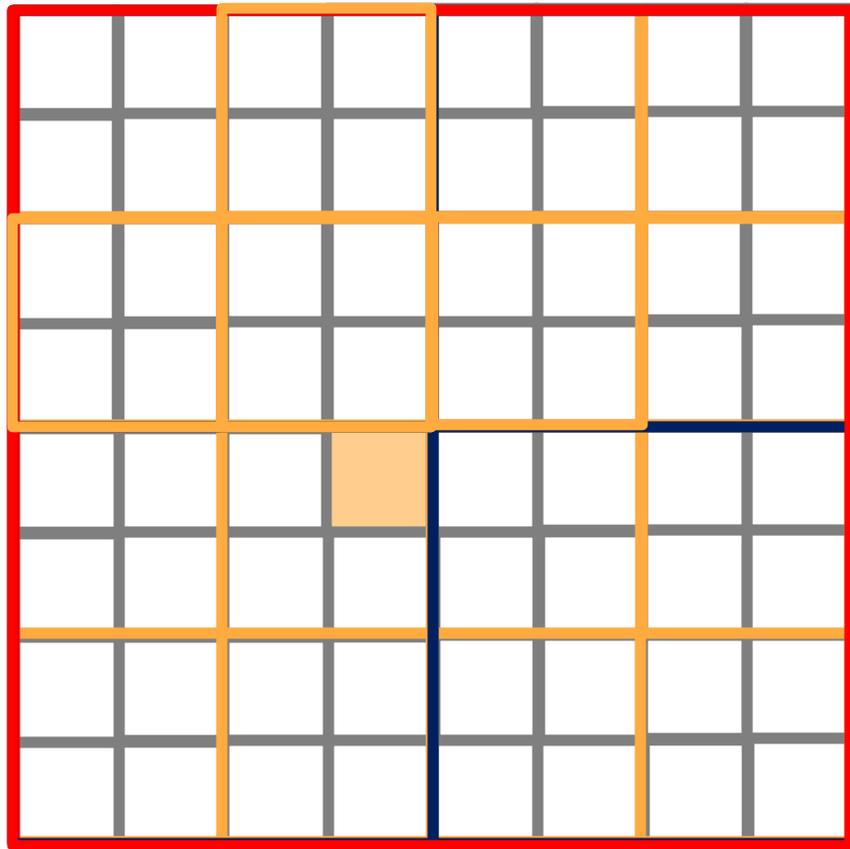
- ◆ How can we go from  $O(N^{\frac{3}{2}})$  to  $O(N \log N)$ ?
- ◆ Build an octree and use nested interpolation.



Level: d=4

# Multi-Level IFGF

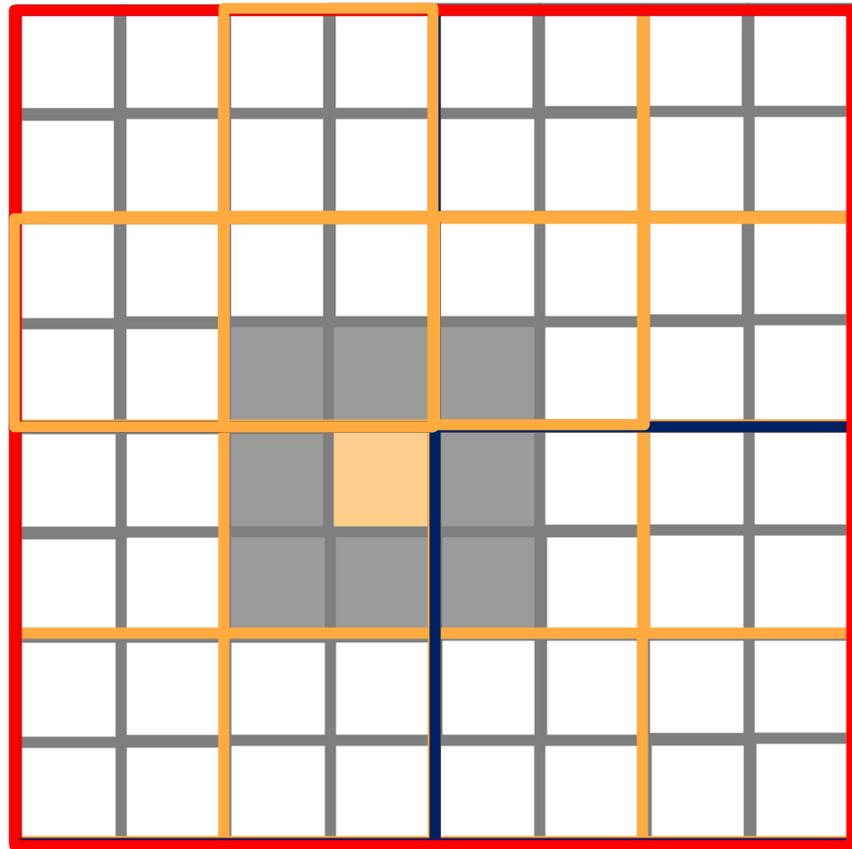
- ◆ How can we go from  $O(N^{\frac{3}{2}})$  to  $O(N \log N)$ ?
- ◆ Build an octree and use nested interpolation.
- ◆ Start from lowest level (in this example,  $d=4$ )



# Multi-Level IFGF

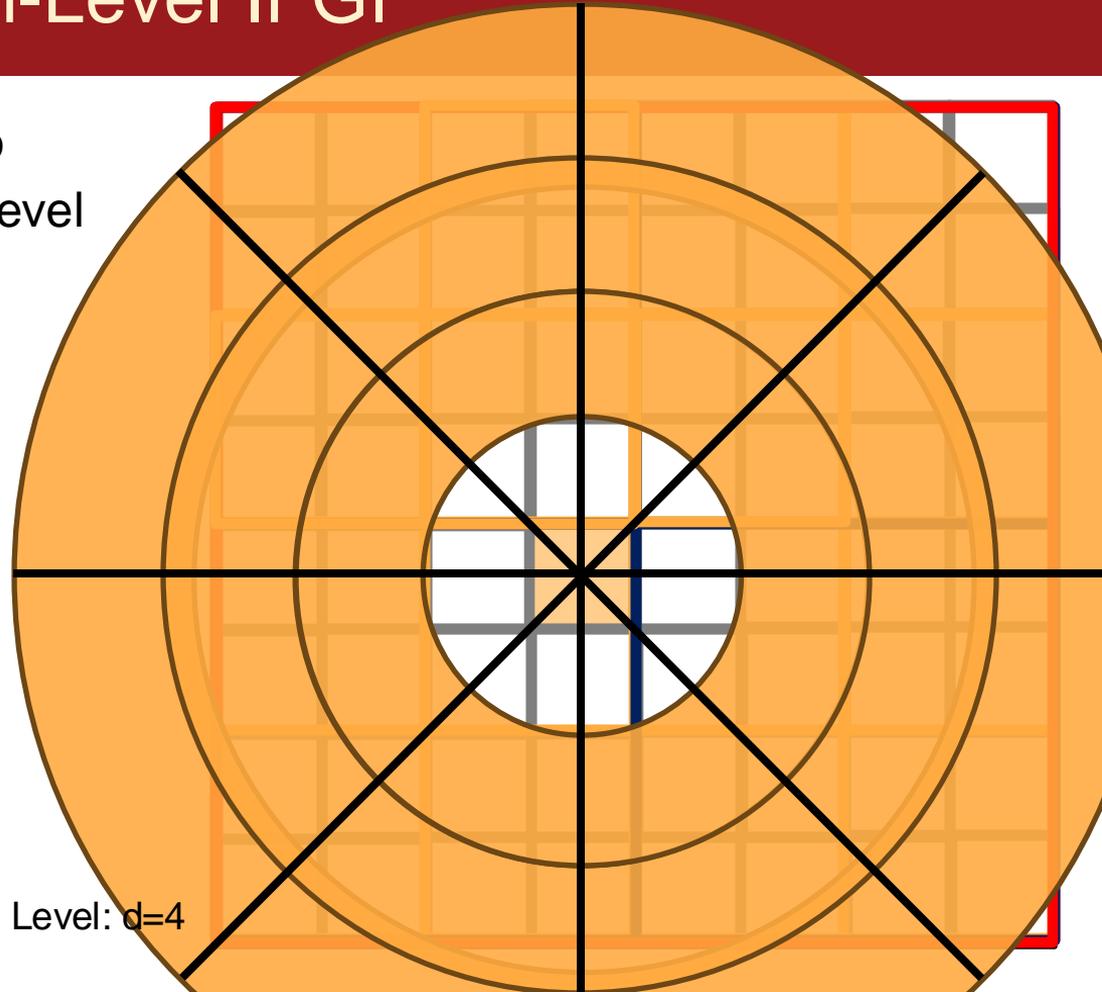
- ◆ How can we go from  $O(N^{\frac{3}{2}})$  to  $O(N \log N)$ ?
- ◆ Build an octree and use nested interpolation.
- ◆ Start from lowest level (in this example,  $d=4$ ) and use direct computation for all target points in neighboring boxes.

Level:  $d=4$



# Multi-Level IFGF

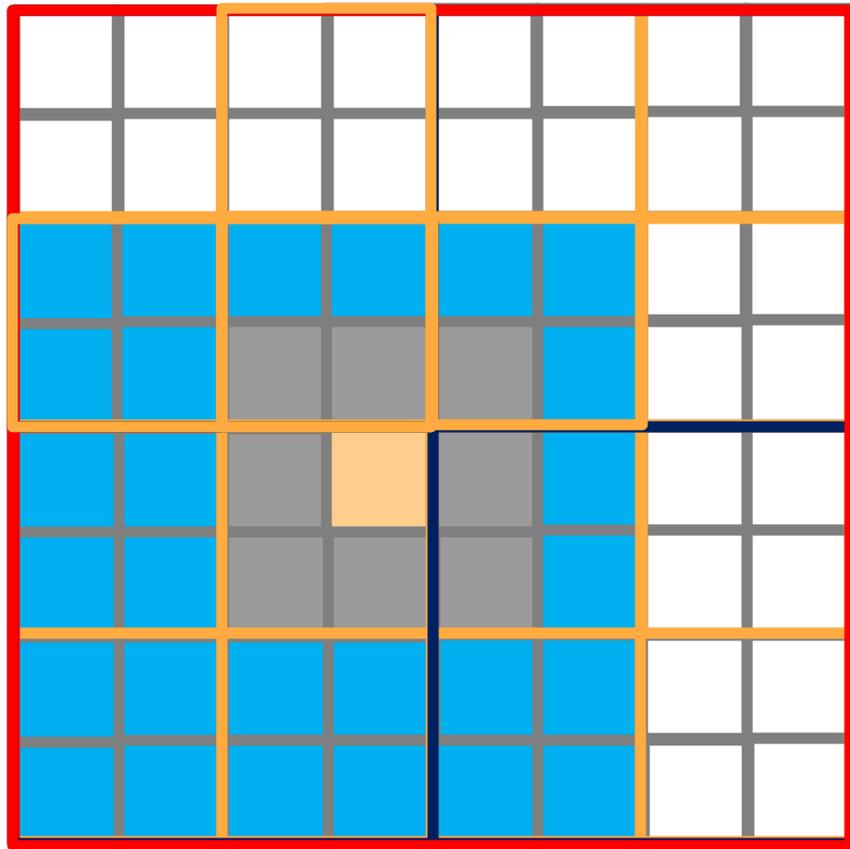
- ◆ Next use direct computation to compute cone interpolants at level  $d=4$ .



# Multi-Level IFGF

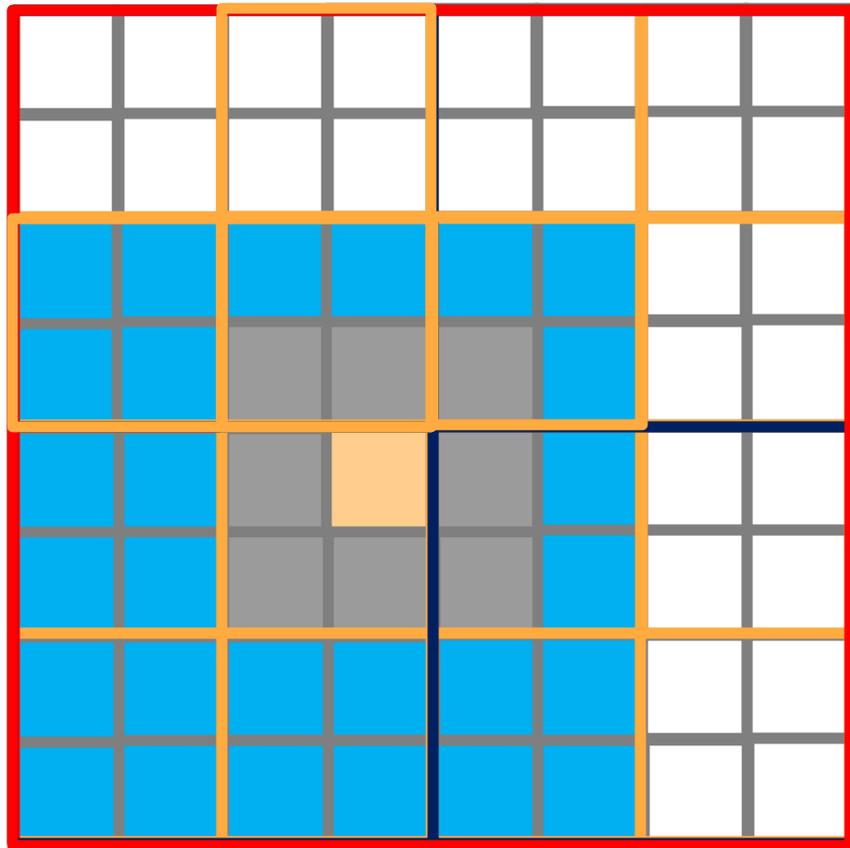
- ◆ Next use direct computation to compute cone interpolants at level  $d=4$ .
- ◆ Use these cone interpolants to compute the values of target points in "cousin" boxes: A "cousin" box is box on the same level that is NOT a neighbor but is a child of a neighbor of the parent of the current box.
- ◆ Do **NOT** compute any more target points at this level for further away boxes— higher levels can be used for this.

Level:  $d=4$



# Multi-Level IFGF

- ◆ Instead, use cone interpolants at level  $d$  to compute points needed to compute the cone interpolants for the next level up  $d-1$  (in this case  $d=3$ ).
- ◆ 8x cones one level higher, but 8x fewer boxes, so approx. constant  $O(N)$  operations per level
- ◆  $\sim \log_2 N$  levels due to octree splitting
- ◆  $O(N \log N)$  overall complexity after traversing through all levels



# Maxwell's Equations: PEC and Dielectric Case

- ◆ Consider the Magnetic Field Integral Equation (MFIE) for PECs:
- ◆  $\frac{J}{2} + \mathcal{K}[J] = \mathbf{n} \times \mathbf{H}^{inc}$  with  $\mathcal{K}[\mathbf{a}](\mathbf{r}) = -\mathbf{n}(\mathbf{r}) \times \nabla \times \int_{\Gamma} G(\mathbf{r}, \mathbf{r}') \mathbf{a}(\mathbf{r}') d\sigma(\mathbf{r}')$
- ◆  $\mathcal{K}$  can be rewritten in terms of the single layer as:
- ◆ 
$$\mathcal{K}[\mathbf{a}](\mathbf{r}) = \frac{\partial}{\partial \mathbf{n}} \mathcal{S}[\mathbf{a}](\mathbf{r}) - \left( \mathbf{e}^1(\mathbf{r}) \left[ \mathbf{n}(\mathbf{r}) \cdot \frac{\partial}{\partial u} \right] + \mathbf{e}^2(\mathbf{r}) \left[ \mathbf{n}(\mathbf{r}) \cdot \frac{\partial}{\partial v} \right] \right) \mathcal{S}[\mathbf{a}](\mathbf{r})$$
- ◆ Similarly, N-Muller formulation for dielectrics can also be broken down into evaluations of the single layer and its normal derivative.
- ◆ Single layer  $\mathcal{S}[\mathbf{a}](\mathbf{r}) = \int_{\Gamma} G(\mathbf{r}, \mathbf{r}') \mathbf{a}(\mathbf{r}') d\sigma(\mathbf{r}')$  straightforward to accelerate with IFGF: Create an interpolant for each Cartesian component of the density.
- ◆ What about the normal derivative?

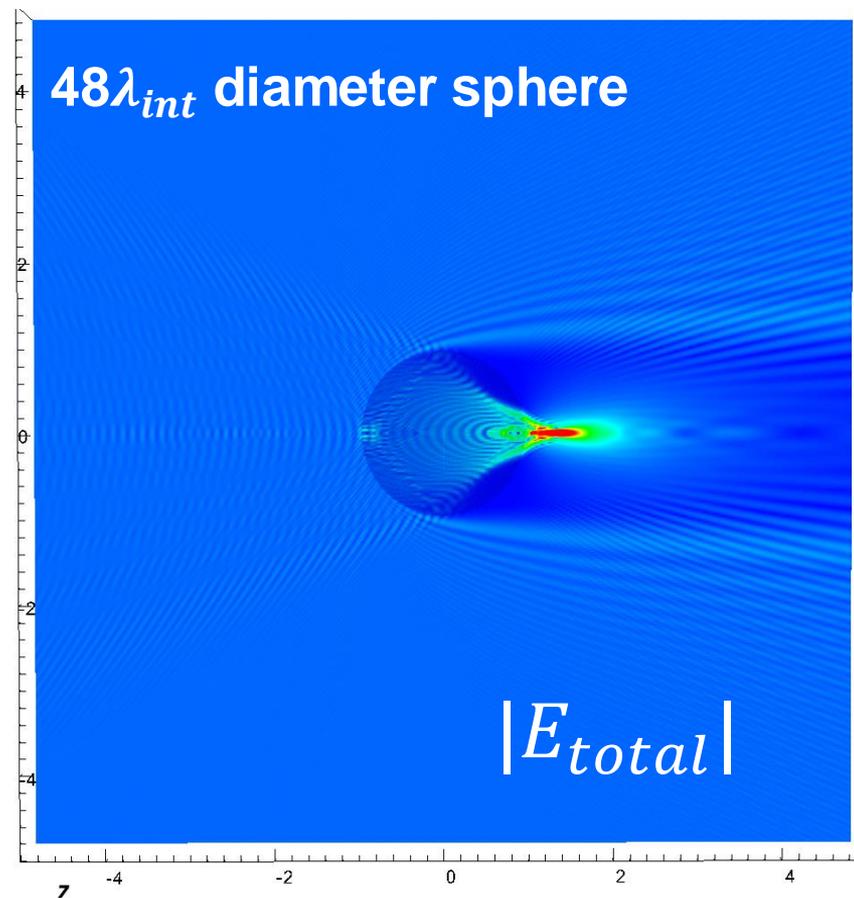
# Maxwell's Equations: PEC and Dielectric Case

- ◆ IFGF cones comprise 3D Chebyshev polynomial approximations of the single layer operator within their spatial support:  $g_s(u, v, w) = \sum_i \sum_j \sum_k \alpha_{ijk} T_i(u) T_j(v) T_k(w)$
- ◆  $\mathcal{S} = (\text{centered factor}) * g_s = G(\mathbf{x}, \mathbf{y}_c) * g_s$
- ◆  $\frac{\partial}{\partial \mathbf{n}} \mathcal{S} = \lim_{h \rightarrow 0} \frac{\mathcal{S}(\mathbf{x} + \hat{\mathbf{n}}h) - \mathcal{S}(\mathbf{x})}{h} \approx \frac{\mathcal{S}(\mathbf{x} + \hat{\mathbf{n}}h) - \mathcal{S}(\mathbf{x})}{h}$  for  $h > 0$ .
- ◆ Easily computed with one additional IFGF single layer evaluation a distance  $h$  away from the target point  $\mathbf{x}$  in the normal direction.
- ◆ Faster than analytically computing derivatives of the IFGF Chebyshev expansions and no accuracy impact for small enough  $h$ .

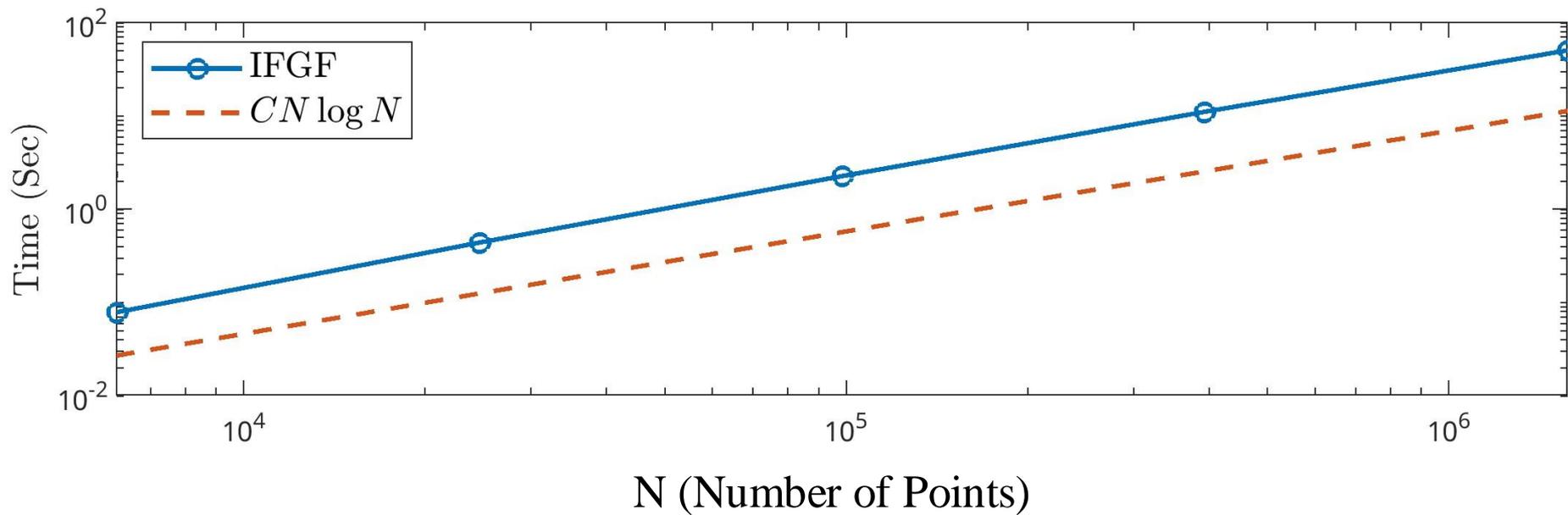
# Multi-Level IFGF: Dielectric Sphere

$$\epsilon_{ext} = 1.0, \epsilon_{int} = 2.25$$

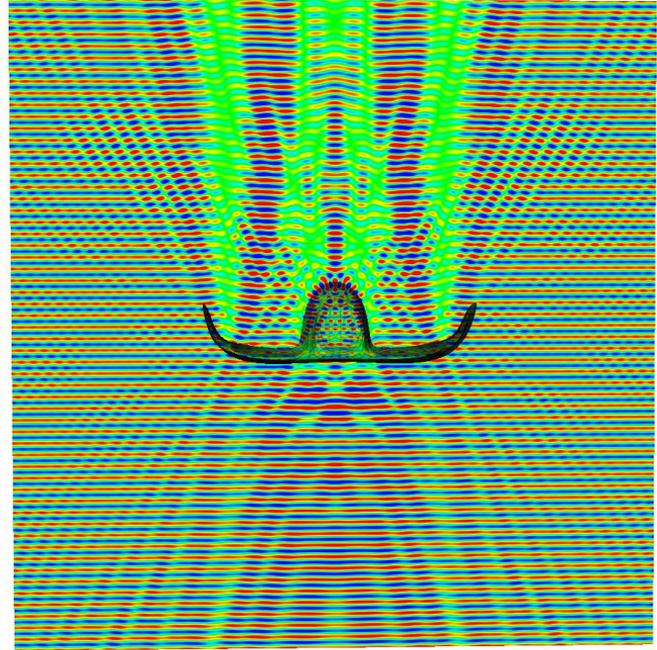
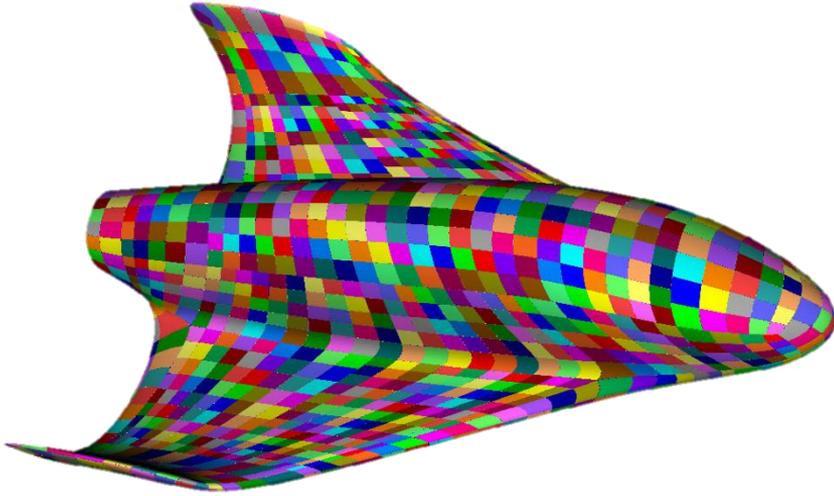
Problem Size (# unknowns)	Dual AMD 7763 (128 cores @ 2.45 GHz)			
	$k_{interior}$	CPU Direct (sec)	CPU IFGF	Speedup
24,576	$3\pi$	0.064	0.076	X
98,304	$6\pi$	0.909	0.440	2.1x
393,216	$12\pi$	13.05	2.25	5.8x
1,572,864	$24\pi$	151.05	10.85	13.9x
6,291,456	$48\pi$	2463.5	50.14	49.1x



# Multi-Level IFGF: Dielectric Sphere

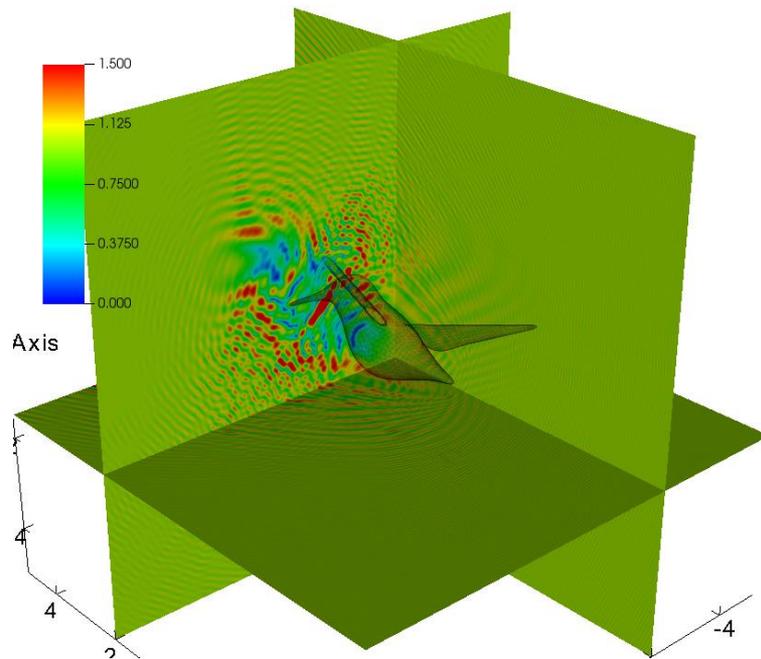
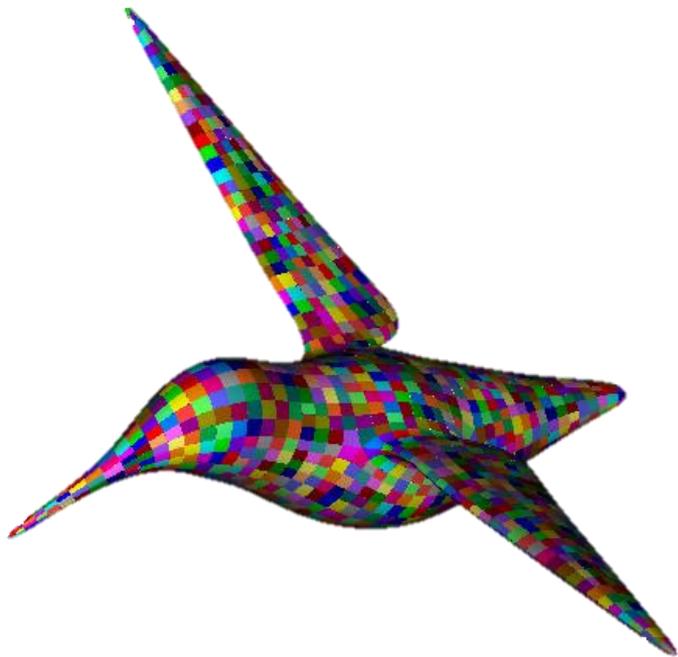


# Additional Examples: Glider



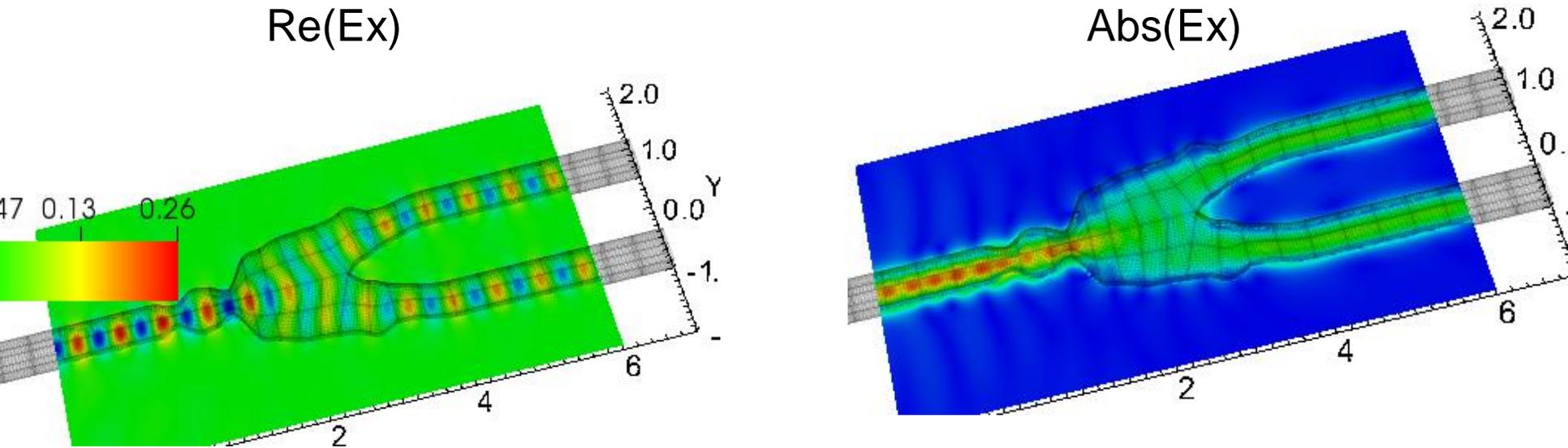
- ◆ 45-wavelength in longest dimension ( $\epsilon_r^e = 1, \epsilon_r^i = 2.16; k_e = 25.1, k_i = 36.9$ )
- ◆  $N = 1,281,600$  unknowns
- ◆ 9 sec for forward map using IFGF vs. 110 without acceleration (**12.2x speedup**)

# Additional Examples: Hummingbird



- ◆ 77-wavelength wingspan ( $\epsilon_r^e = 1, \epsilon_r^i = 2.16; k_e = 50.3, k_i = 73.9$ )
- ◆  $N = 2,723,328$  unknowns
- ◆ 27 sec for forward map using IFGF vs. 588 without acceleration (**22x speedup**)

# Additional Examples: Nanophotonic Power Splitter



- ◆ 77-wavelength wingspan ( $\epsilon_r^e = 2.08, \epsilon_r^i = 12.08; k_e = 5.85, k_i = 14.09$ )
- ◆  $N = 161,280$  unknowns
- ◆ 0.5 sec for forward map using IFGF vs. 2.5 without acceleration (**5x speedup**)

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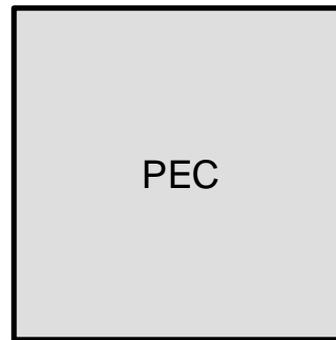
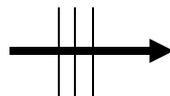
# Introduction: Corner Regularized Integral Equations

- ◆ Fields at edges/corners for PECs tend to infinity or 0 algebraically.
- ◆ Near the corner, the behavior is well modeled by quasistatic fields and the exponent is dependent on the angle<sup>[1]</sup>
- ◆ Polynomial basis functions are poor approximators of these singular fields
- ◆ Convergence of high-order methods significantly suffers for non-smooth geometries with sharp edges or corners.

TM Mode ( $H_z$ ,  $E_x$ ,  $E_y$ )

Sideris, C., Aslanyan, D., and Bruno, O.  
“High-order-accurate Solution of Scattering  
Integral Equations with Unbounded  
Solutions at Corners”. In preparation.

$$H_z^{inc} = e^{ik_0x}$$

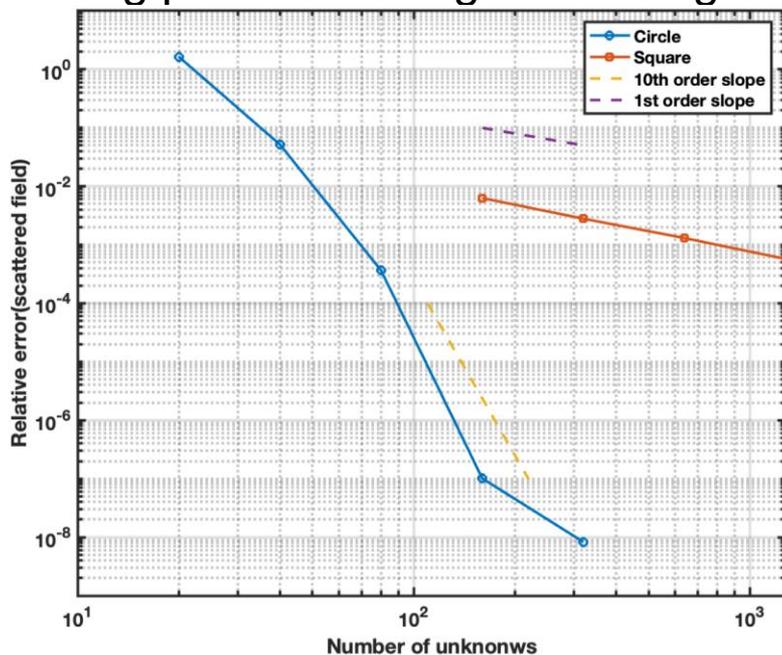


[1] Zargaryan SS, Mazya VG (1984) The asymptotic form of the solutions of integral equations of potential theory in the neighborhood of the corner points of a contour. Prikl Mat Mekh 48:169–174

# CBIE Convergence: PEC Circle vs. Square Geometry

◆  $u^{scat}(\mathbf{r}) = \sum_p \int_{\Gamma^p} \int_{-1}^1 \frac{dG(\mathbf{r}, \mathbf{r}'(\theta))}{dn(\mathbf{r})} \phi^p(\mathbf{r}'(\theta)) \tau(\theta) d\theta = \sum_p \mathcal{K}[\phi^p]$  with  $\tau = \frac{d\ell}{d\theta}$  being the line element and the density on each patch:  $\phi^p(\theta) = \sum_n \alpha_n^p T_n(\theta)$

◆ Test using point-matching on same grid as unknowns:  $\left[ \frac{I}{2} - K \right] \phi = \frac{dH_z^{inc}}{dn(\mathbf{r})}$

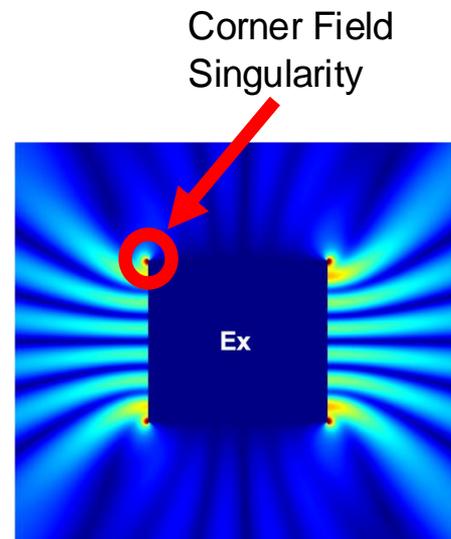
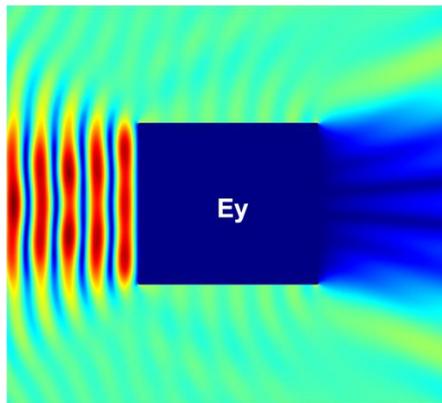
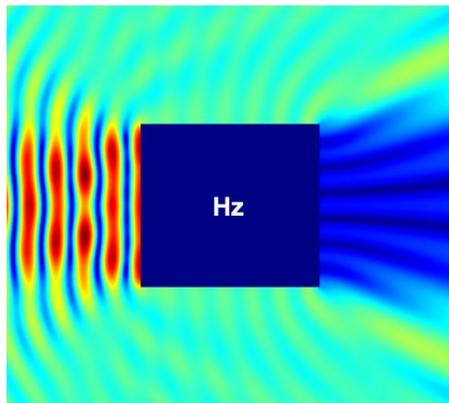


- Zero centered circle (D=2) and square (edge length = 2)
- $\lambda_0 = 0.628$
- Incident field:  $H_z^{inc} = e^{ik_0 x}$
- N=10 points patch
- Target point for comparison: (1.5, 1.5).
- Circle achieves expected 10<sup>th</sup> order convergence slope.
- Square suffers from poor 1<sup>st</sup> order convergence.

# Last Year: PEC Objects with Sharp Edges: MFIE

- ◆ Consider TM case with incident plane wave excitation:  $H_z^{inc} = e^{ik_0x}$
- ◆ Representation theorem:  $H_z^{scat} = \int_{\Gamma} G(r, r') \phi(r') d\ell(r')$
- ◆ MFIE satisfying Neumann boundary conditions:  $\frac{dH_z^{scat}}{dn} + \frac{dH_z^{inc}}{dn} = 0$
- ◆ Corresponding integral equation:

$$\diamond \frac{1}{2} \phi(r) + \frac{d}{dn(r)} \int_{\Gamma} G(r, r') \phi(r') d\ell(r') = - \frac{dH_z^{inc}}{dn(r)}$$



# Last Year: Modified CBIE Approach for MFIE

- ◆ BIEs with Neumann boundary conditions have operators similar to the 3D case (e.g., hypersingular operator, target point normal derivatives, etc.)
- ◆ Introduce 1:1 change of variables (CoV) for patches with corners, e.g.:  $s(\theta) = \theta^p$ .
- ◆ Integral for source patch  $q'$  with CoV with target point on patch  $q$  becomes:

$$\int_0^1 \frac{dG_k(\tilde{\mathbf{r}}_q(\theta), \tilde{\mathbf{r}}_{q'}(\theta'))}{dn(\tilde{\mathbf{r}}_q(\theta))} \phi_{q'}(\theta') \tilde{L}_{q'}(\theta') d\theta' \text{ where } \tilde{\mathbf{r}}_q(\theta) = \mathbf{r}_q(s_q(\theta)) \text{ and } \tilde{L}_{q'}(\theta') = \frac{d\ell}{ds_q} \frac{ds_q(\theta')}{d\theta'} = L_{q'}(s(\theta')) \frac{ds_q(\theta')}{d\theta'} \text{ is}$$

the new line element.

- ◆ **NOTE:**  $p - 1$  derivatives of  $s(\theta)$  are 0 at  $\theta = 0$ , may cancel the singularity in  $\phi$
- ◆ MFIE with CoV for system with M patches becomes:

$$-\frac{1}{2} \phi_q(\boldsymbol{\theta}) + \sum_{q'=1}^M \int_0^1 \frac{dG(\tilde{\mathbf{r}}_q(\theta), \tilde{\mathbf{r}}_{q'}(\theta'))}{dn(\tilde{\mathbf{r}}_q(\theta))} \phi_{q'}(\theta') \tilde{L}_{q'}(\theta') d\theta' = -\frac{dH_z^{inc}}{dn(\tilde{\mathbf{r}}_q(\theta))}$$

# Last Year: Modified Approach for MFIE (Cont.)

◆ Multiply integral equation through by target point line element,  $\tilde{L}_q(\theta)$ :

$$\diamond -\frac{1}{2}\tilde{L}_q(\theta)\phi_q(\theta) + \tilde{L}_q(\theta)\sum_{q'=1}^M\int_0^1\frac{dG(\tilde{\mathbf{r}}_q(\theta),\tilde{\mathbf{r}}_{q'}(\theta'))}{dn(\tilde{\mathbf{r}}_q(\theta))}\phi_{q'}(\theta')\tilde{L}_{q'}(\theta')d\theta' = -\frac{dH_z^{inc}}{dn(\tilde{\mathbf{r}}_q(\theta))}\tilde{L}_q(\theta)$$

◆ Define new unknown:  $\psi_q(\theta) = \phi_q(\theta)\tilde{L}_q(\theta)$  and solve for:

$$-\frac{1}{2}\psi_q(\theta) + \tilde{L}_q(\theta)\sum_{q'=1}^M\int_0^1\frac{dG(\tilde{\mathbf{r}}_q(\theta),\tilde{\mathbf{r}}_{q'}(\theta'))}{dn(\tilde{\mathbf{r}}_q(\theta))}\psi_{q'}(\theta')d\theta' = -\frac{dH_z^{inc}}{dn(\tilde{\mathbf{r}}_q(\theta))}\tilde{L}_q(\theta)$$

◆  $\psi_q(\theta)$  is easier to approximate using polynomials than the original  $\phi$  density since the  $\tilde{L}_q(\theta)$  line element due to the CoV makes it (and p-1 of its derivatives) go to 0 at  $\theta = 0$  where the field singularity is located.

◆ Multiplication by line element forces the incident field(RHS) to go to zero at the corners  density also tends to 0 at the corner due to identity.

# PEC Objects with Sharp Edges: CFIE

◆ The TM MFIE equation has resonances and is not uniquely solvable

◆ Consider the representation theorem<sup>[7,8,9]</sup>:  $H_z^{scat}(\mathbf{r}) = -i \int_{\Gamma} G_k(\mathbf{r}, \mathbf{r}') \phi(\mathbf{r}') d\ell(\mathbf{r}') + \int_{\Gamma} \frac{dG_k(\mathbf{r}, \mathbf{r}')}{dn(\mathbf{r}')} \phi(\mathbf{r}') d\ell(\mathbf{r}')$

◆ TM CFIE satisfying Neumann boundary conditions:  $\frac{dH_z^{scat}}{dn} + \frac{dH_z^{inc}}{dn} = 0$

◆ Corresponding combined field integral equation:

$$\underbrace{\frac{i\eta}{2} \phi(\mathbf{r}) - i\eta T_1[\phi](\mathbf{r})}_{\text{MFIE}} + \underbrace{k^2 T_2[\phi](\mathbf{r}) + T_3[\phi](\mathbf{r})}_{\text{EFIE}} = -\frac{dH_z^{inc}}{dn(\mathbf{r})}$$

◆  $T_1[\phi](\mathbf{r}) = \int_{\Gamma} \frac{dG_k(\mathbf{r}, \mathbf{r}')}{dn(\mathbf{r}')} \phi(\mathbf{r}') d\ell(\mathbf{r}')$

◆  $T_2[\phi](\mathbf{r}) = \int_{\Gamma} G_k(\mathbf{r}, \mathbf{r}') (\mathbf{n}(\mathbf{r}) \cdot \mathbf{n}'(\mathbf{r}')) \phi(\mathbf{r}') d\ell(\mathbf{r}')$

◆  $T_3[\phi](\mathbf{r}) = \partial_{\tau(\mathbf{r})} \int_{\Gamma} G_k(\mathbf{r}, \mathbf{r}') \partial_{\tau(\mathbf{r}')} \phi(\mathbf{r}') d\ell(\mathbf{r}')$

CFIE system is badly conditioned due to the hypersingular kernel of EFIE operator

[7] Burton, A., Miller J., The application of integral equation methods to the numerical solution of some exterior boundary-value problems, Proc. Royal Soc. London 323 (1971), 201-210

[8] Burton, A., Numerical solution of acoustic radiation problems, NPL Contract Rept. OC5/S35 National Physical Laboratory, Teddington, Middlesex, (1976).

[9] Brackhage H, Werner P. Über das Dirichletsche aussenraumproblem für die Helmholtzsche schwingungsgleichung. Archiv der Mathematik 1965; 16:325–329.

# Modified CBIE Approach: CR-CFIE

- ◆ We can add a regularization operator to the EFIE<sup>[11]</sup>:

$$R[\phi] = \int_{\Gamma} G_{ik}(\mathbf{r}, \mathbf{r}'') \phi(\mathbf{r}'') d\ell(\mathbf{r}'')$$

- ◆ Then the EFIE part will take the form:

$$k^2 \int_{\Gamma} G_k(\mathbf{r}, \mathbf{r}') (\mathbf{n}(\mathbf{r}) \cdot \mathbf{n}(\mathbf{r}')) R[\phi] d\ell(\mathbf{r}') + \frac{d}{d\tau(\mathbf{r})} \int_{\Gamma} G_k(\mathbf{r}, \mathbf{r}') \frac{d}{dr'} R[\phi] d\ell(\mathbf{r}') = -\frac{dH_z^{inc}}{dn(\mathbf{r})}$$

- ◆ Parameterize and consider the 1:1 change of variables (CoV) for patches with corners like before, the discretized regularization operator takes the form:

$$R[\phi](\tilde{\mathbf{r}}_{q'}(\theta')) = \sum_{q'=1}^M \int_0^1 G_{ik}(\tilde{\mathbf{r}}_{q'}(\theta'), \tilde{\mathbf{r}}_{q''}(\theta'')) \phi_{q''}(\tilde{\mathbf{r}}_{q''}(\theta'')) \tilde{L}_{q''}(\theta'') d\theta''$$

- ◆ NOTE: Regularization introduces the line element  $\tilde{L}_{q''}(\theta'')$  next to the density which can be absorbed into the unknowns

# The Corner Regularized CFIE: CR-CFIE

- ◆ Multiplying through by the line element  $\tilde{L}_q(\theta)$  as was done for the MFIE and replacing the unknown with  $\psi$ , the final CR-CFIE is obtained:

$$\frac{i\eta}{2}\psi_q(\theta) - i\eta\tilde{L}_q(\theta) \sum_{q'=1}^M \int_0^1 \frac{dG_k(\tilde{\mathbf{r}}_q(\theta), \tilde{\mathbf{r}}_{q'}(\theta'))}{dn(\tilde{\mathbf{r}}_q(\theta))} \psi_{q'}(\theta') d\theta'$$

$$+ k^2\tilde{L}_q(\theta) \sum_{q'=1}^M \int_0^1 G_k(\tilde{\mathbf{r}}_q(\theta), \tilde{\mathbf{r}}_{q'}(\theta')) \left( \mathbf{n}(\tilde{\mathbf{r}}_q(\theta)) \cdot \mathbf{n}(\tilde{\mathbf{r}}_{q'}(\theta')) \right) \tilde{L}_{q'}(\theta') R[\psi] d\theta'$$

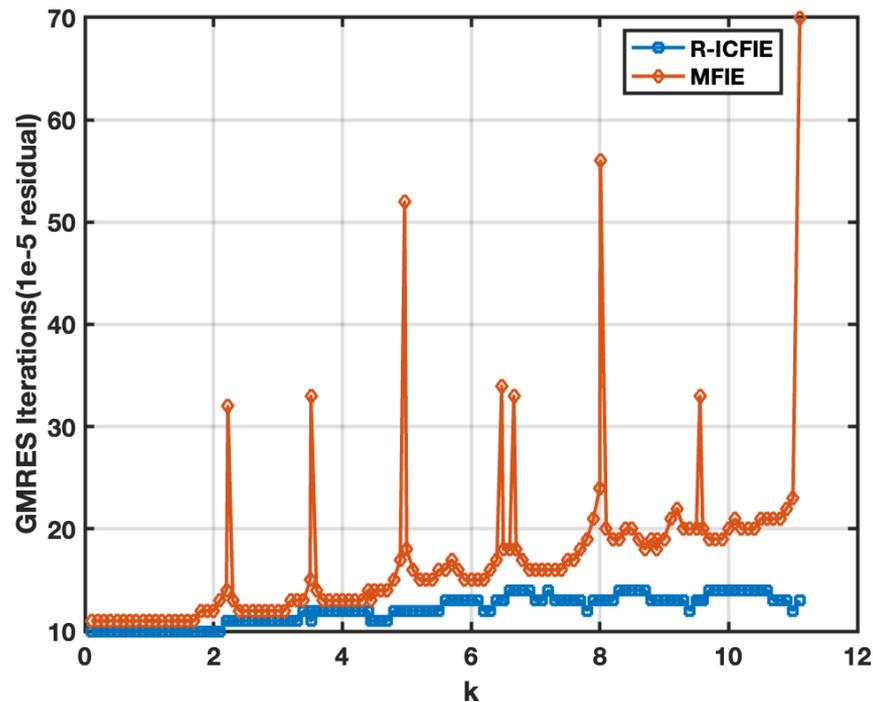
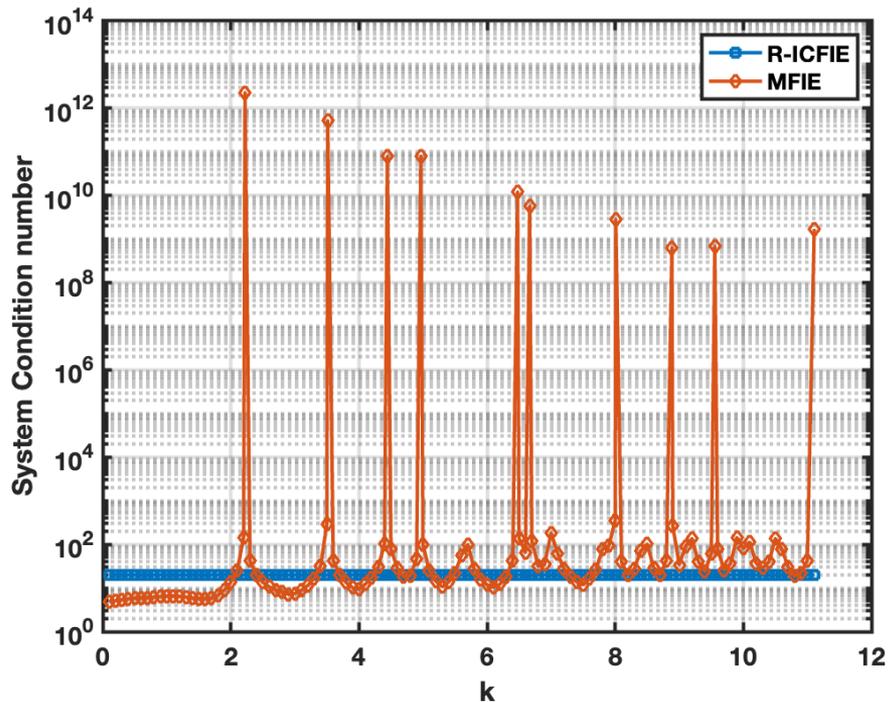
$$+ \frac{\partial}{\partial\theta} \sum_{q'=1}^M \int_0^1 G_k(\tilde{\mathbf{r}}_q(\theta), \tilde{\mathbf{r}}_{q'}(\theta')) \frac{\partial}{\partial\theta'} R[\psi] d\theta' = -\frac{dH_z^{inc}}{dn(\tilde{\mathbf{r}}_q(\theta))} \tilde{L}_q(\theta)$$

} CR-MFIE

} CR-EFIE

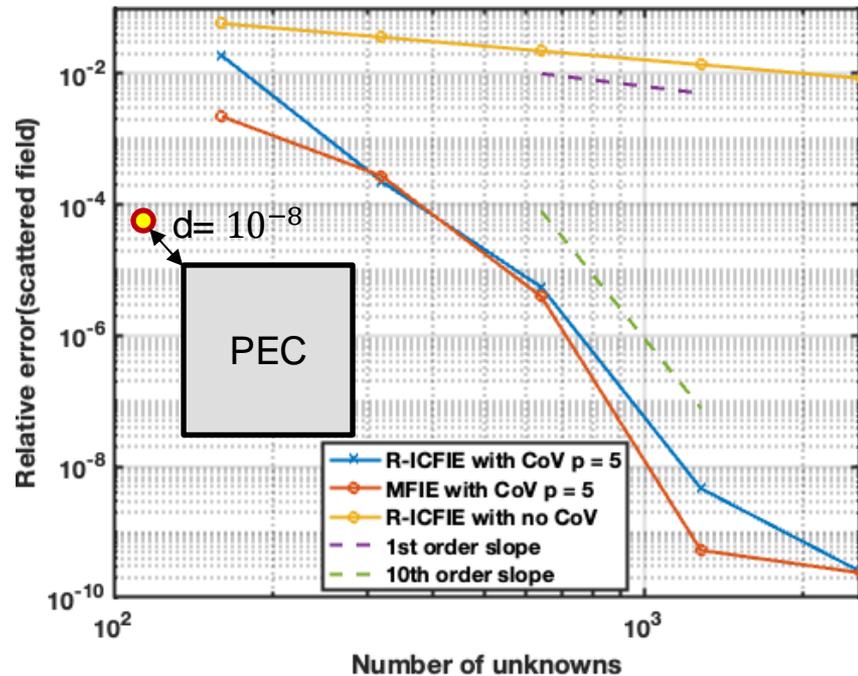
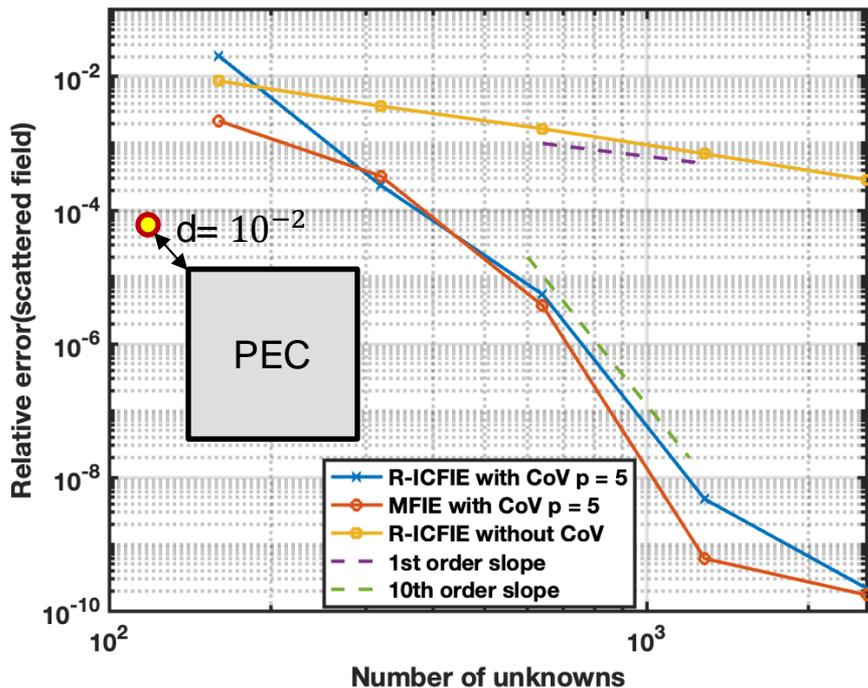
# Comparison: TM MFIE vs TM R-ICFIE on a Square

- ◆ The TM MFIE equation has resonances and is not uniquely solvable, however the CFIE does not have resonances and is uniquely solvable



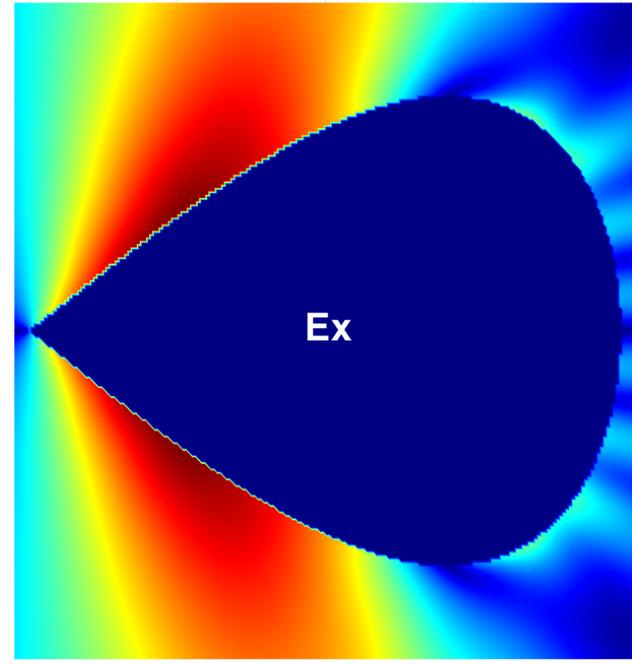
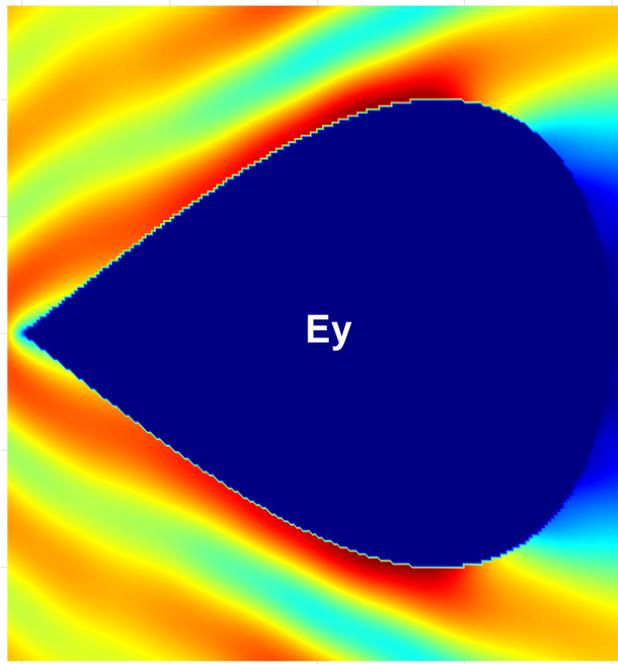
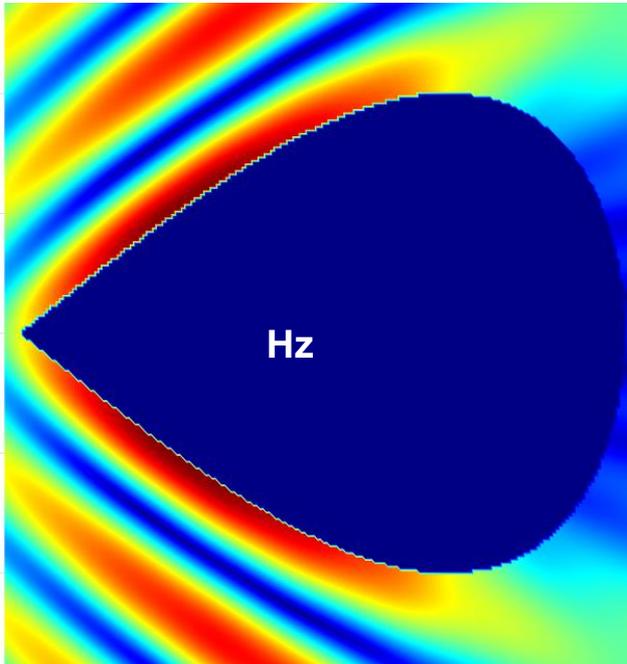
# Numerical Results: Square

- ◆ Comparison of scattered field convergence for a point near the corner:  $d = 10^{-2}$  (left) and  $d = 10^{-8}$  (right),  $k_0 = 10$  ( $\lambda_0 = 0.63$ )



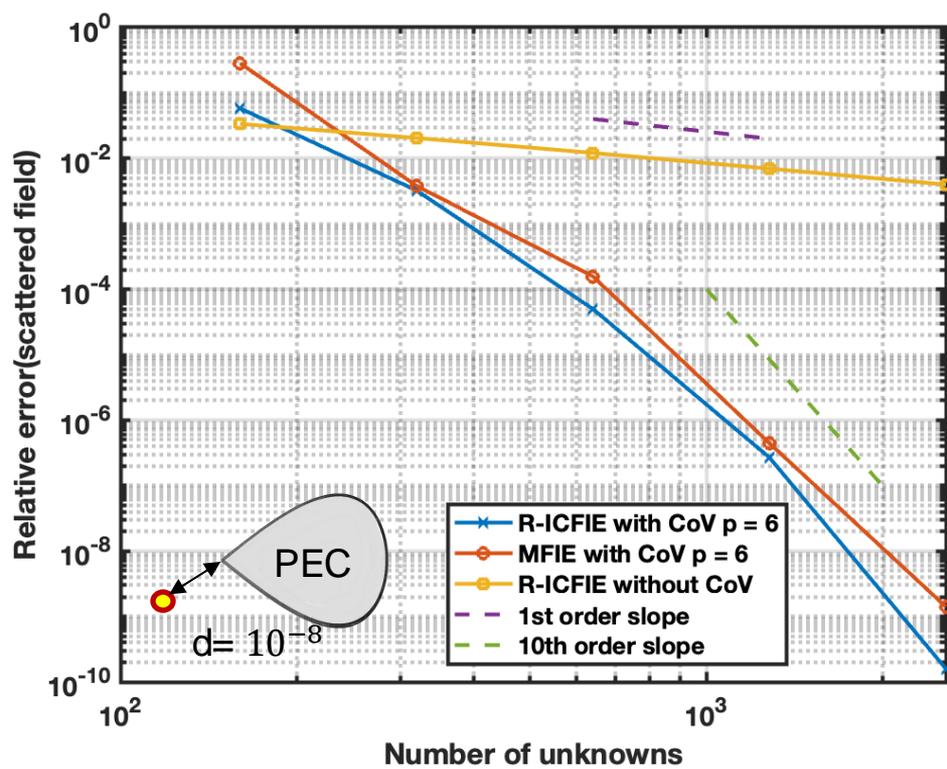
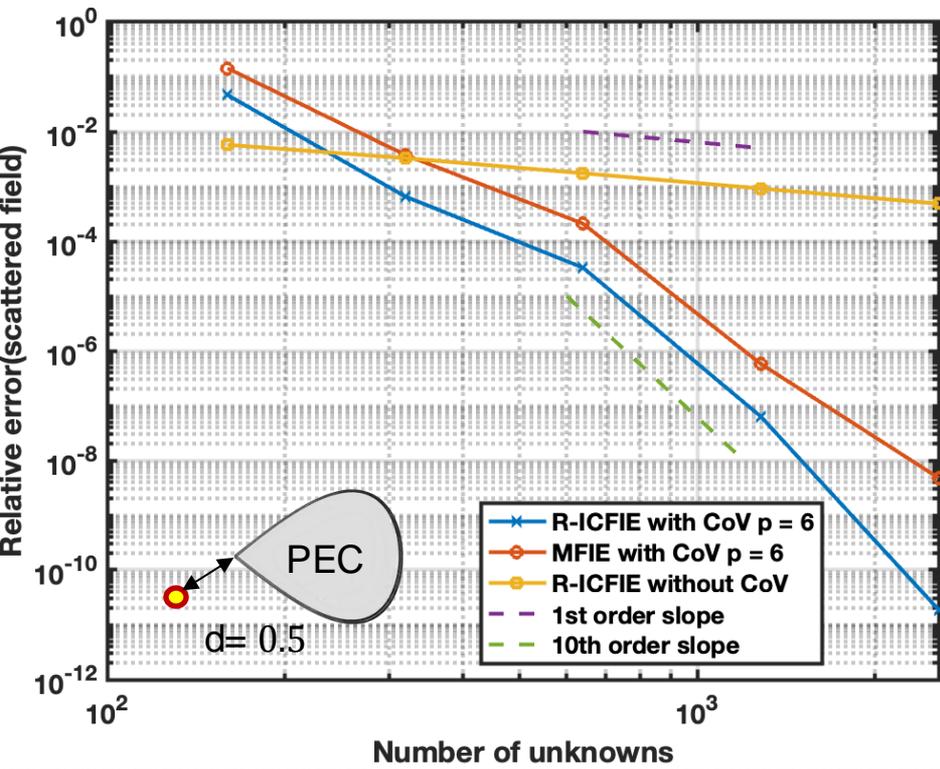
# Numerical Results: Teardrop

- ◆ TM mode Total(Incident + Scattered) field distribution: Incident Plane wave excitation, PEC scatterer in the form of a Teardrop,  $k_0 = 10$  ( $\lambda_0 = 0.63$ )



# Numerical Results: Teardrop

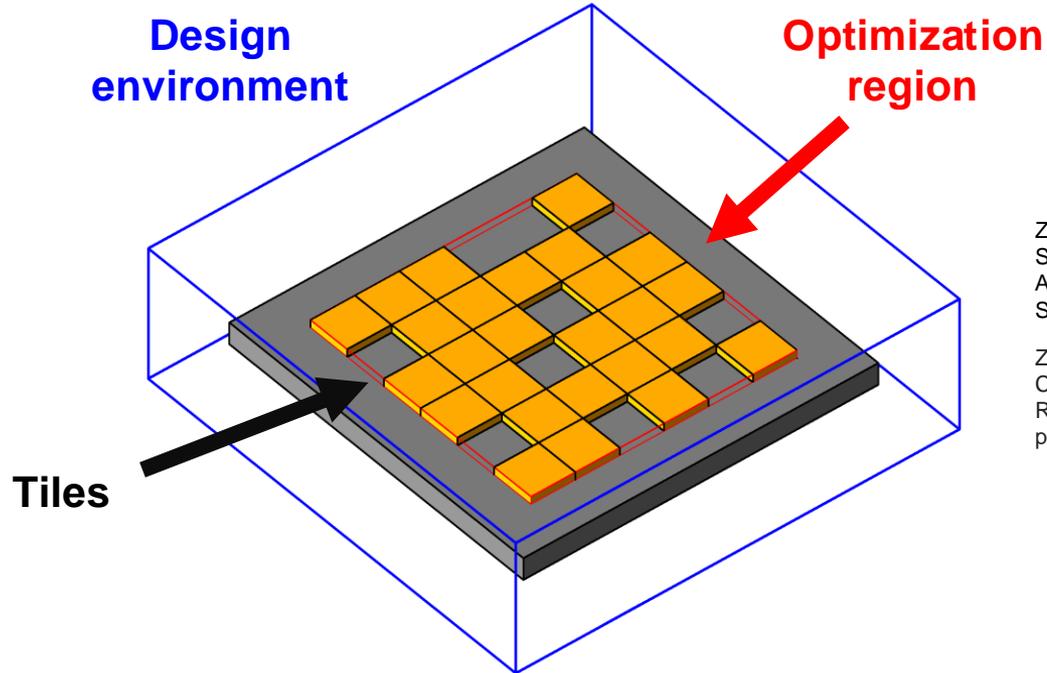
- ◆ Comparison of scattered field convergence for a point near the corner:  $d = 0.5$  (left) and  $d = 10^{-8}$  (right),  $k_0 = 10$  ( $\lambda_0 = 0.63$ )



# Outline

1. Introduction
2. The Multi-Level Interpolated Green Function (IFGF) Method for 3D Maxwell
3. Corner Regularized Combined Field Integral Equations (CR-CFIE) for Scattering from Objects with Geometric Singularities
4. **The Precomputed Numerical Green Function (PNGF) Method for Ultra-fast Inverse Design**
  - a) Introduction to PNGF
  - b) Applications to metallic RF devices
  - c) Applications to dielectric nanophotonic devices
5. Conclusions

# From Last Year: Ultra-fast Antenna Design

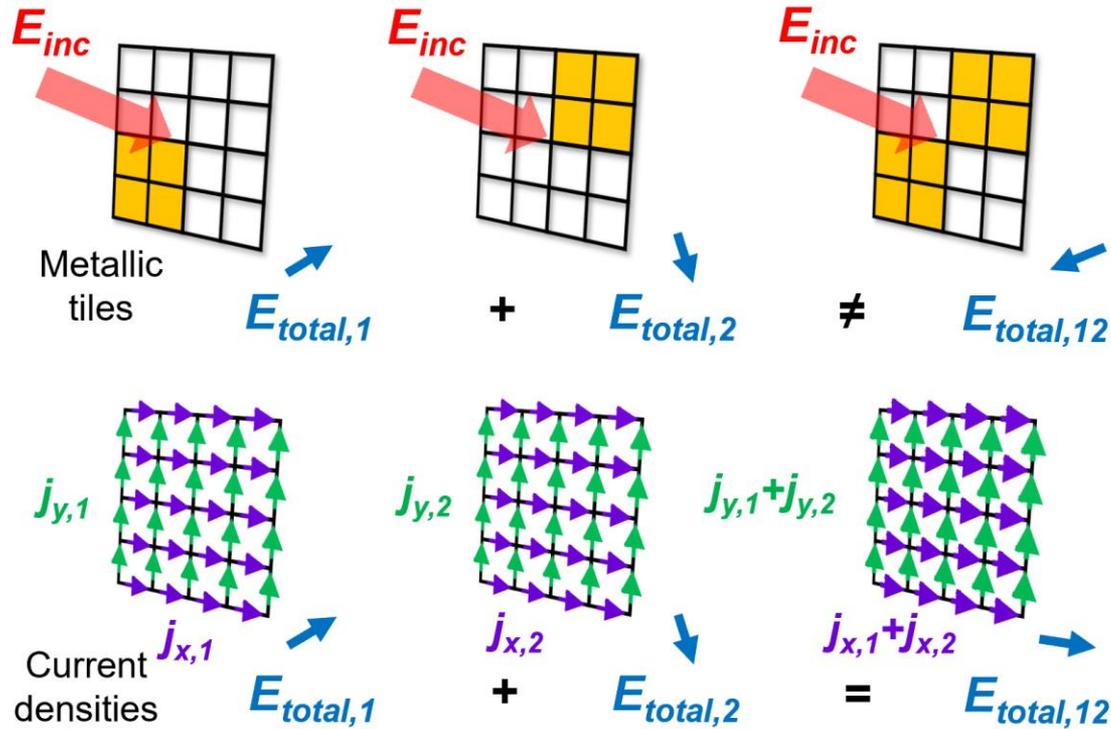


Zheng, Y. and **Sideris, C.** "Ultra-fast Simulation and Inverse Design of Metallic Antennas". IEEE International Microwave Symposium (2023).

Zheng, Y., Elswaf, M., Hung, J., Lin, H.-C., Hsu, C.W., **Sideris, C.** "Ultra-fast Inverse Design of Radio-Frequency Electromagnetic Devices". In preparation.

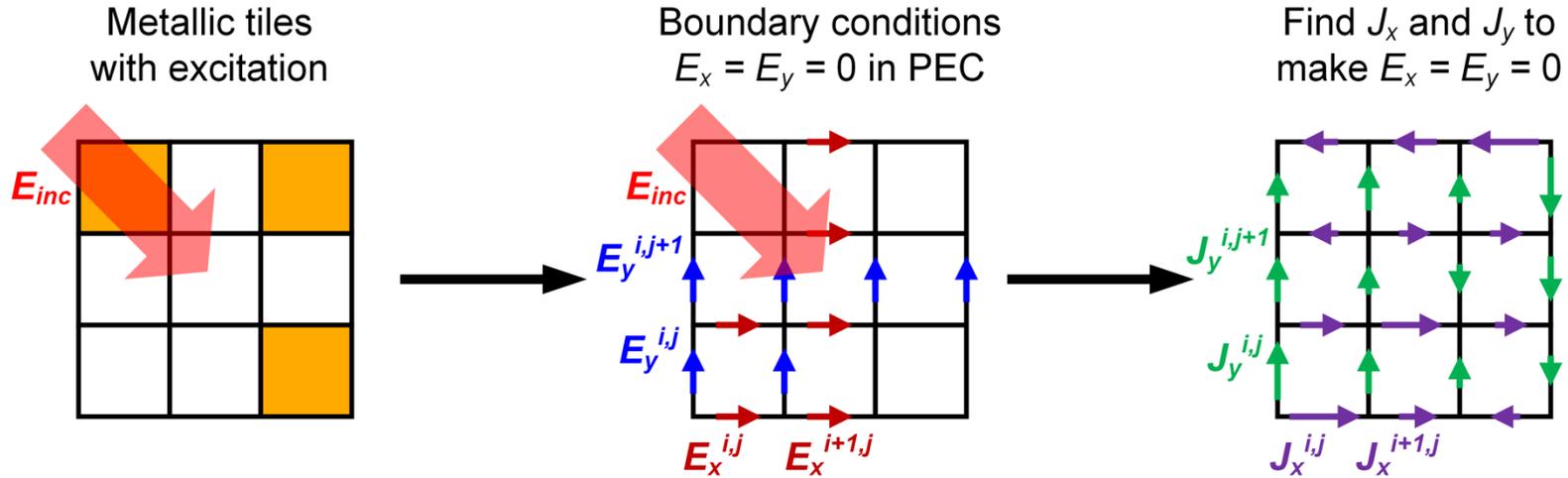
- ◆ Pixelated electromagnetic structures made up of a grid of tiles, each of which is either filled with metal or left empty, in a predefined optimization region

# Current Equivalence Principle



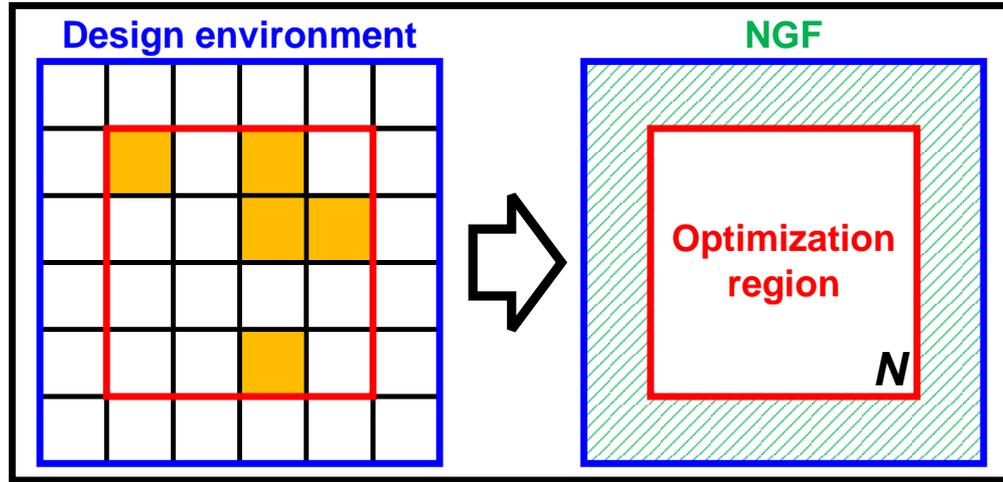
- ◆ Fields due to scattering from metals do not satisfy additivity
- ◆ However, tiles can be replaced with equivalent current densities

# Leveraging Current Equivalence



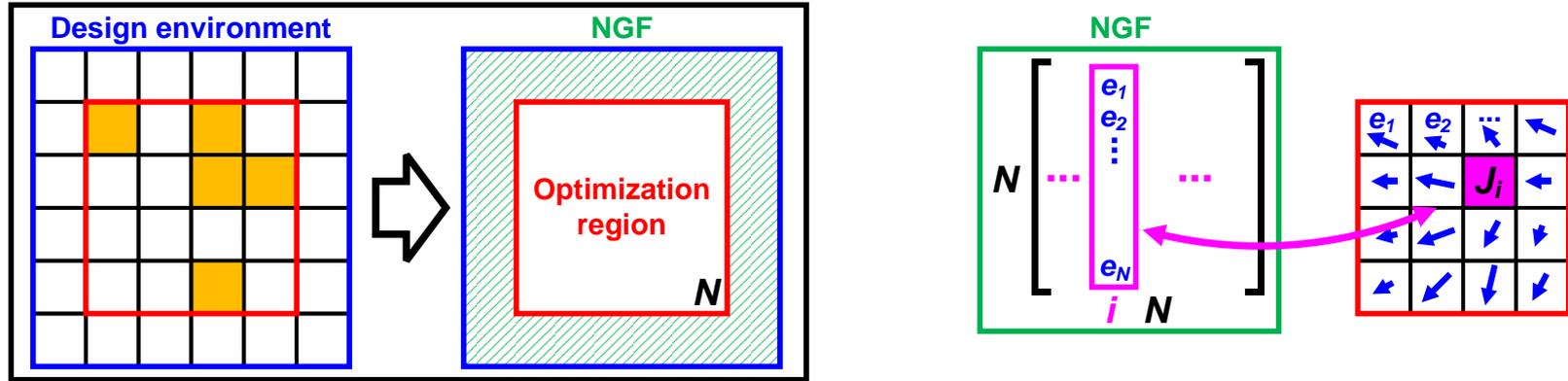
- ◆ Choose values for surface  $j$ 's to enforce  $E_{tan} = 0$  over desired PEC region
- ◆ Find a **numerical Green function** (NGF)  $G: J_{surf} \rightarrow E_{tan}$  that maps equivalent currents in the optimization region to corresponding electric fields in the same region

# Numerical Green Function



- ◆ NGF incorporates effect of the static environment outside the optimization region
- ◆ Allows candidate designs to be evaluated by solving a linear system over the optimization region only, as opposed to the entire design environment
- ◆ **Ultra-fast approach:** Timescale of **milliseconds to seconds** for objective function evaluation on personal computer

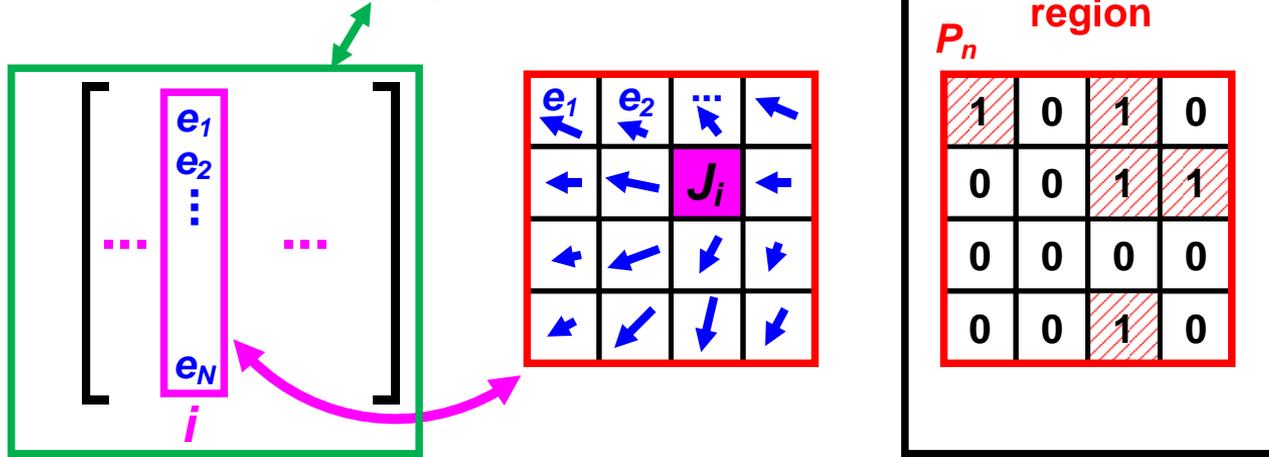
# Precomputations



- ◆ NGF is *precomputed* once for the design environment and can be used for any number of subsequent optimizations
- ◆ Need to solve system for all  $J_x^{i,j}$  and  $J_y^{i,j}$  source excitations in design region and record collocated tangential  $E_x^{i,j}$  and  $E_y^{i,j}$  fields and  $EH_{obj}$  fields needed for computing objective function at each frequency of interest.

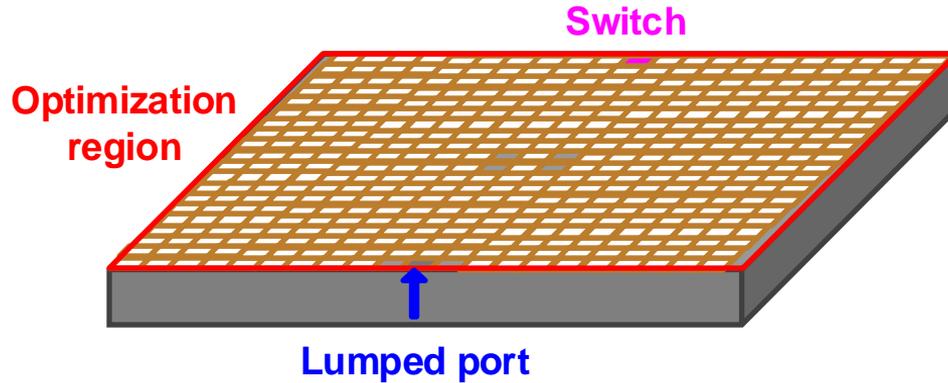
# Optimization with NGF

$$C_n \mathbf{j} = [(I - P_n) + P_n G] \mathbf{j} = P_n \mathbf{e}_{inc}$$



- ◆ Represent candidate design with diagonal (0, 1)-matrix  $P_n$
- ◆ Solve for  $C_n^{-1}$  to find the equivalent currents
- ◆ **Direct binary search optimization:** only one tile is changed at once
- ◆ Leverage this *low-rank update* to the system to further accelerate evaluation

# Example: Switched Beam 5G Antenna Optimization



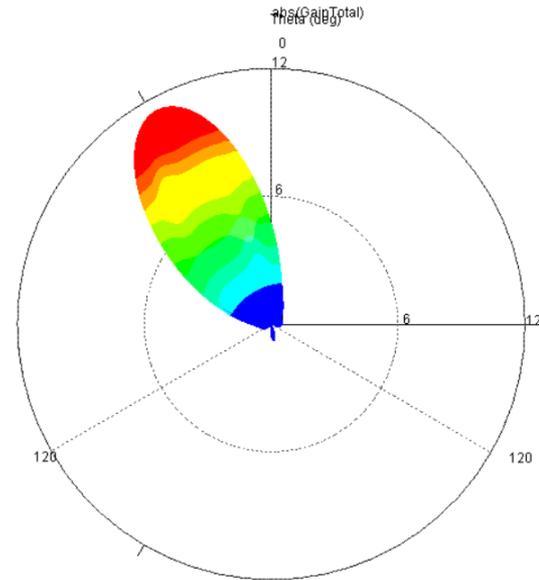
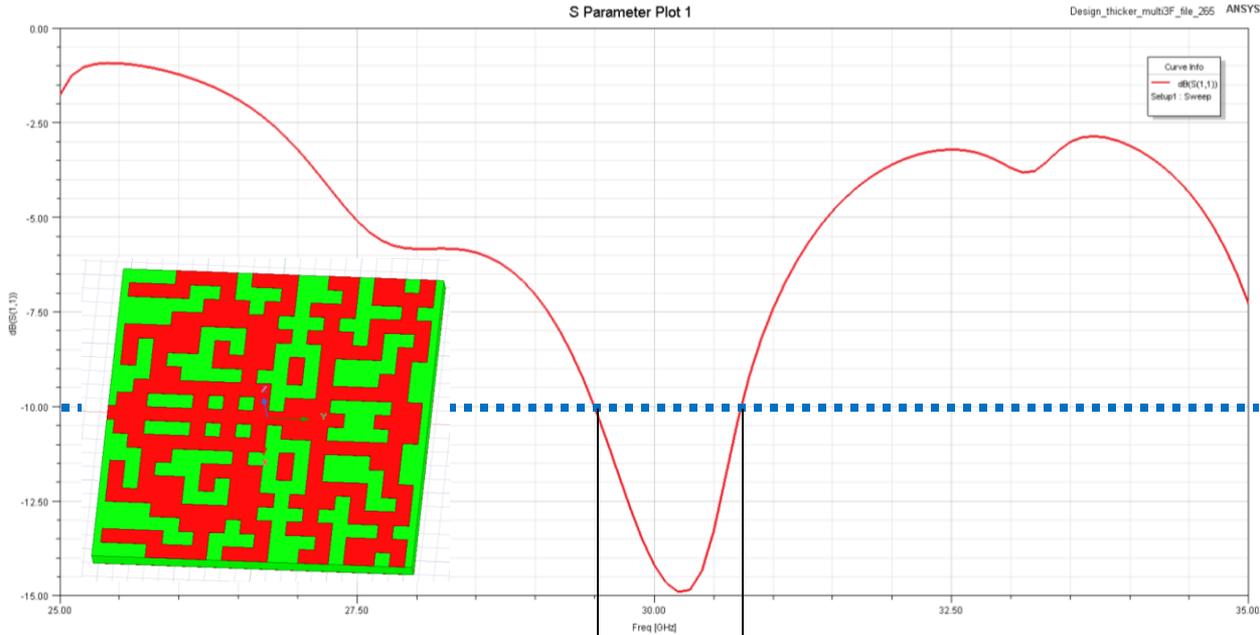
- ◆ 0.5mm thick, 10.5 x 10.5mm Rogers RO3035 ( $\epsilon_r = 3.5$ ) dielectric substrate with metal ground plane.
- ◆ 50-ohm lumped port at edge and RF switch on other side for switching antenna beam.
- ◆ 21x20 tiles on surface (can either be empty or set to metal).

## Inverse Design Goals:

- ◆ Better than -10dB S11 input matching
- ◆ 2) When switch is **ON**: Maximize gain at  $\theta, \phi = 45^\circ, 270^\circ$  and minimize at  $\theta, \phi = 45^\circ, 90^\circ$ .
- ◆ 3) When switch is **OFF**: Minimize gain at  $\theta, \phi = 45^\circ, 270^\circ$  and maximize at  $\theta, \phi = 45^\circ, 90^\circ$ .

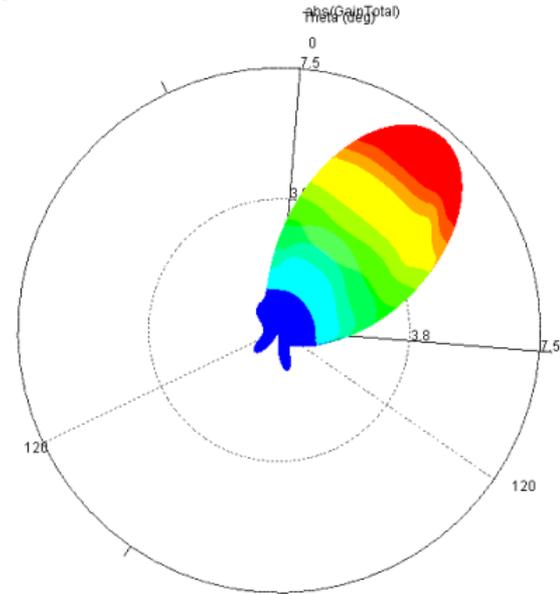
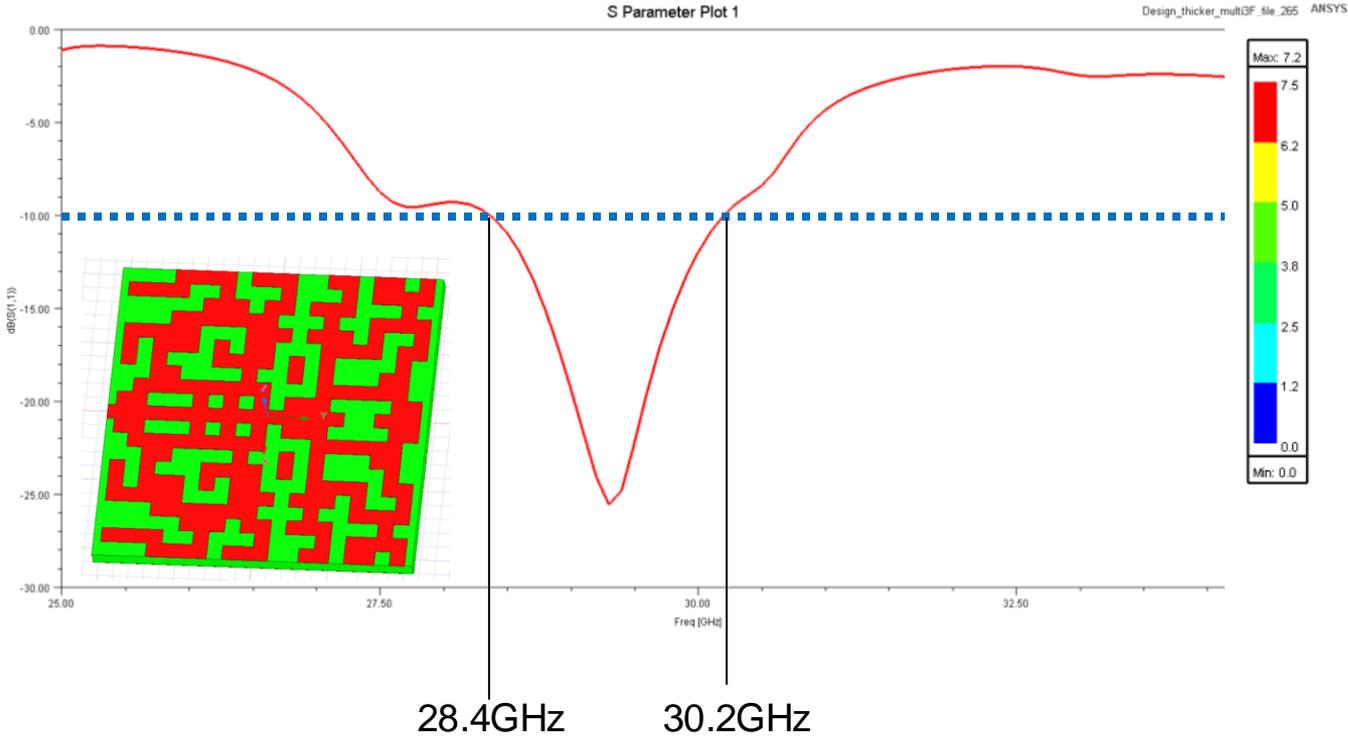
# Results (Switch ON)

**Switch ON:** 1.3GHz impedance bandwidth centered at 30GHz and 11.4 directional gain at  $\theta, \phi = 45^\circ, 270^\circ$

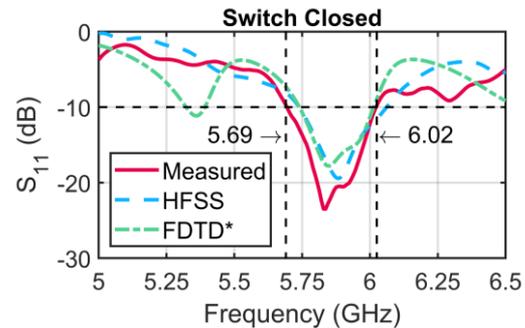
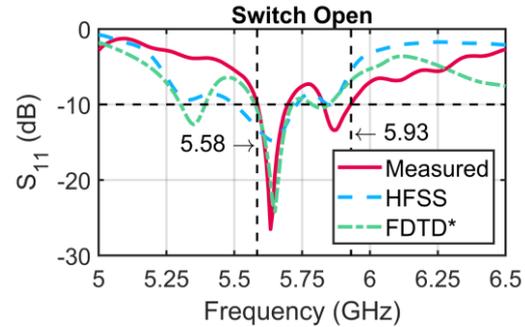
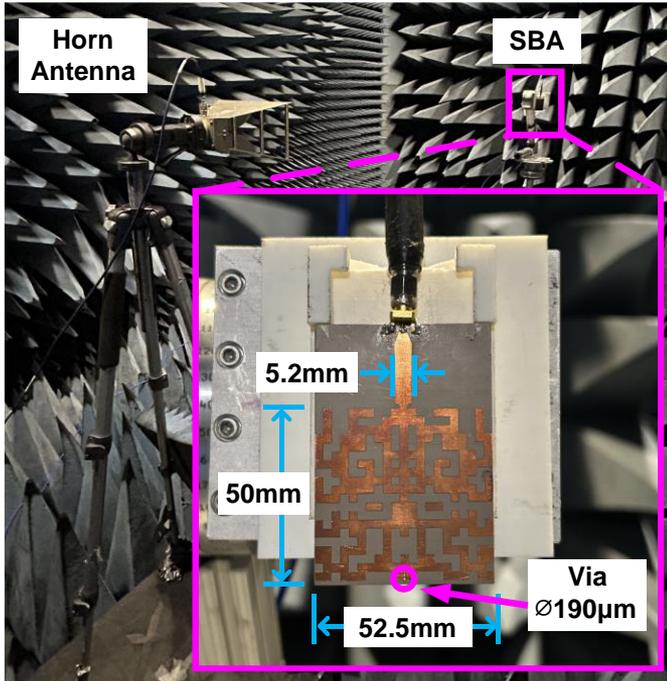


# Results (Switch OFF)

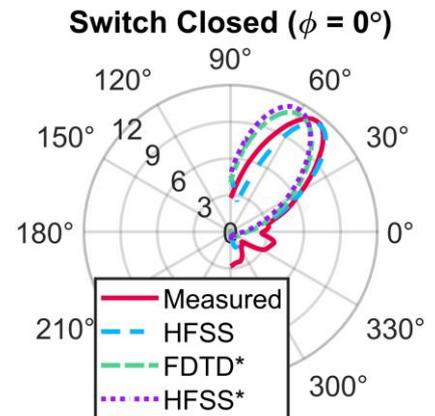
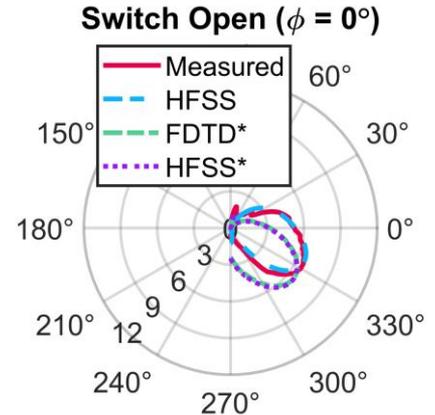
**Switch OFF:** 2.2GHz impedance bandwidth and 7.2 directional gain at  $\theta, \phi = 45^\circ, 90^\circ$



# Experimental Demonstration



\* Simulated without connector



- ◆ Scaled-up version with center frequency  $\sim 5.7$  GHz
- ◆ Excellent agreement with simulation results

# Experimental Demonstration

## Timings

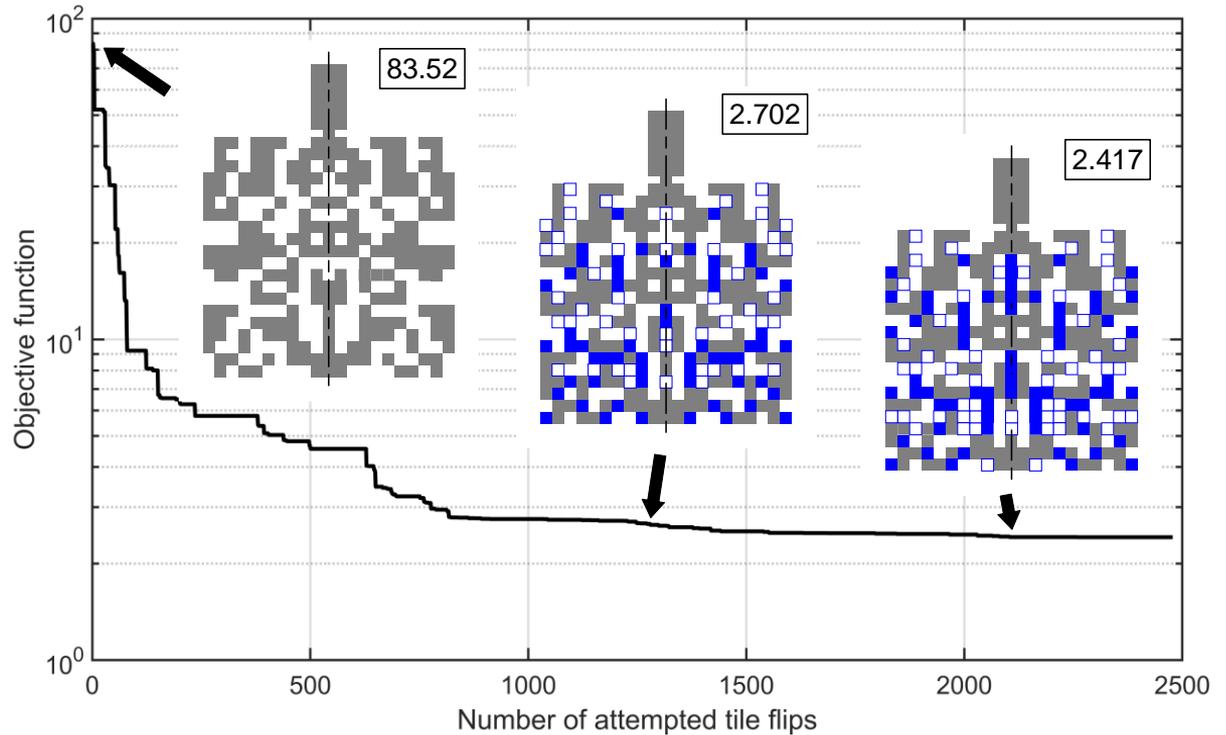
### Precomputation:

From 7.6 hr (FDTD) to  
14 min (Sparse direct  
solver)

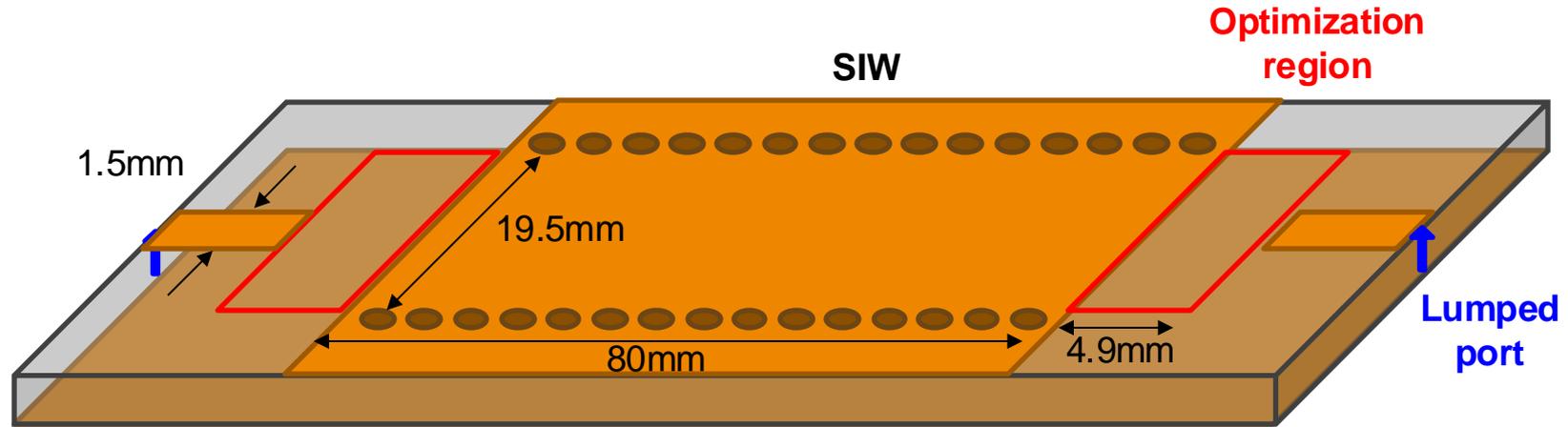
### Optimization:

2.1 hr (3s × 2500)

Speedup: 260x



# Example: Substrate-Integrated Waveguide Coupler

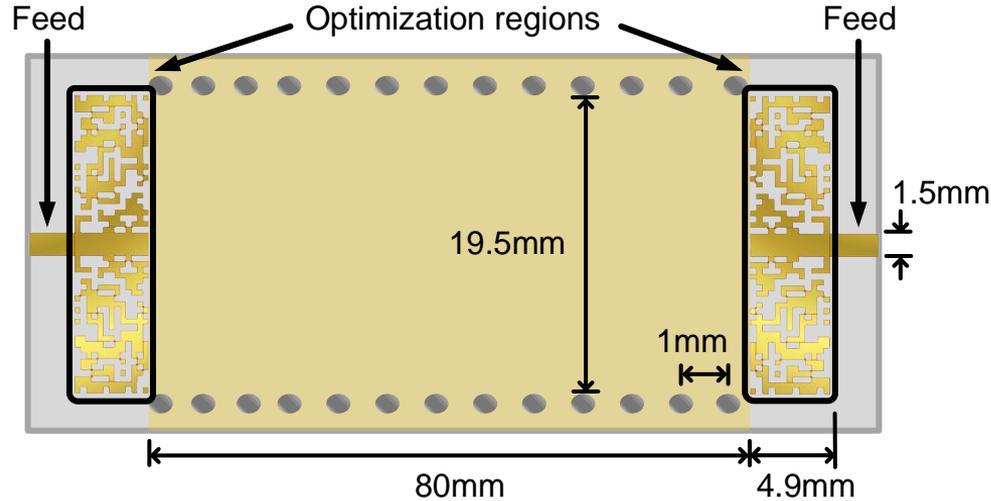


- ◆ 0.5mm thick Rogers RT/duroid 5880 ( $\epsilon_r = 2.2$ ) dielectric substrate with metal ground plane.
- ◆ 50-ohm lumped port at microstrip feeds
- ◆ 52x13 tiles on each transition, identical

## Inverse Design Goals:

- ◆ 1) Maximum -10dB S11 bandwidth
- ◆ 2) Maximize S21

# Results and Experimental Demonstration

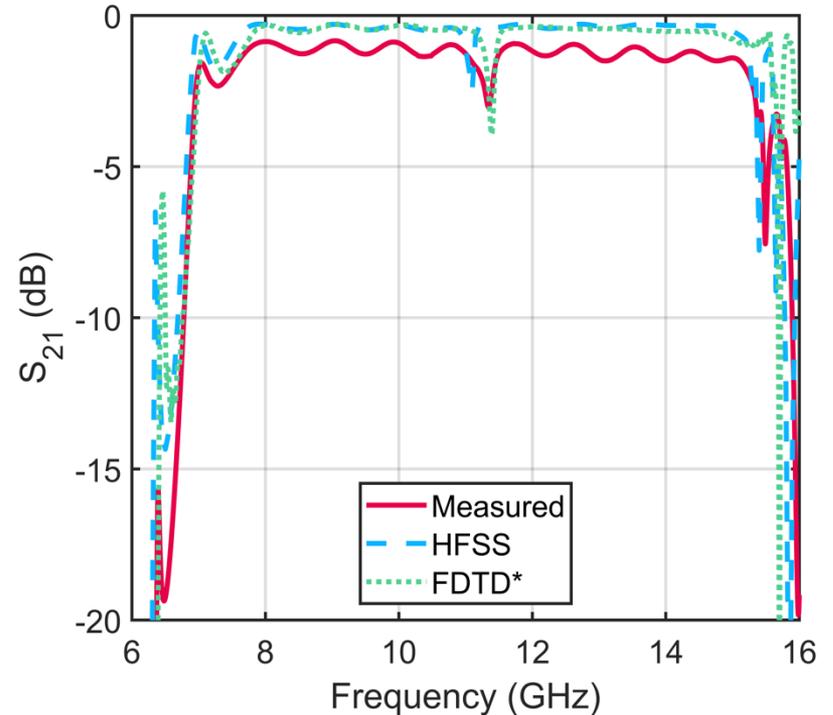
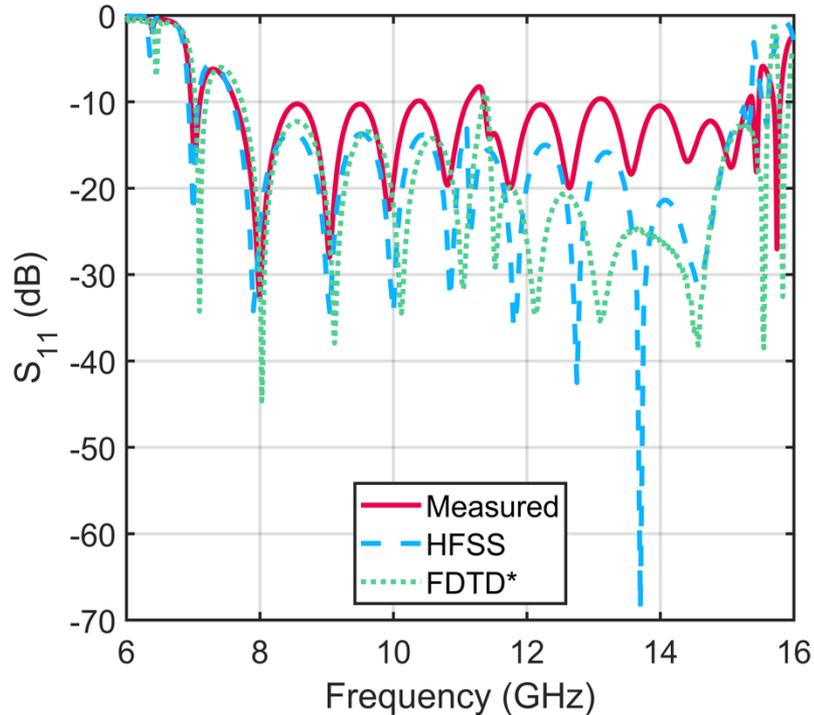


◆ Objective Function:

$$f_n = (1 - S_{21,n})^2$$

◆ Multi-frequency optimization: Minimize  $f_{obj} = \frac{1}{\sum_{n=1}^N \frac{1}{f_n}}$

# Results and Experimental Demonstration



◆ 10dB bandwidth: 7.7 GHz

\* Simulated without connectors

# Experimental Demonstration

## Timings

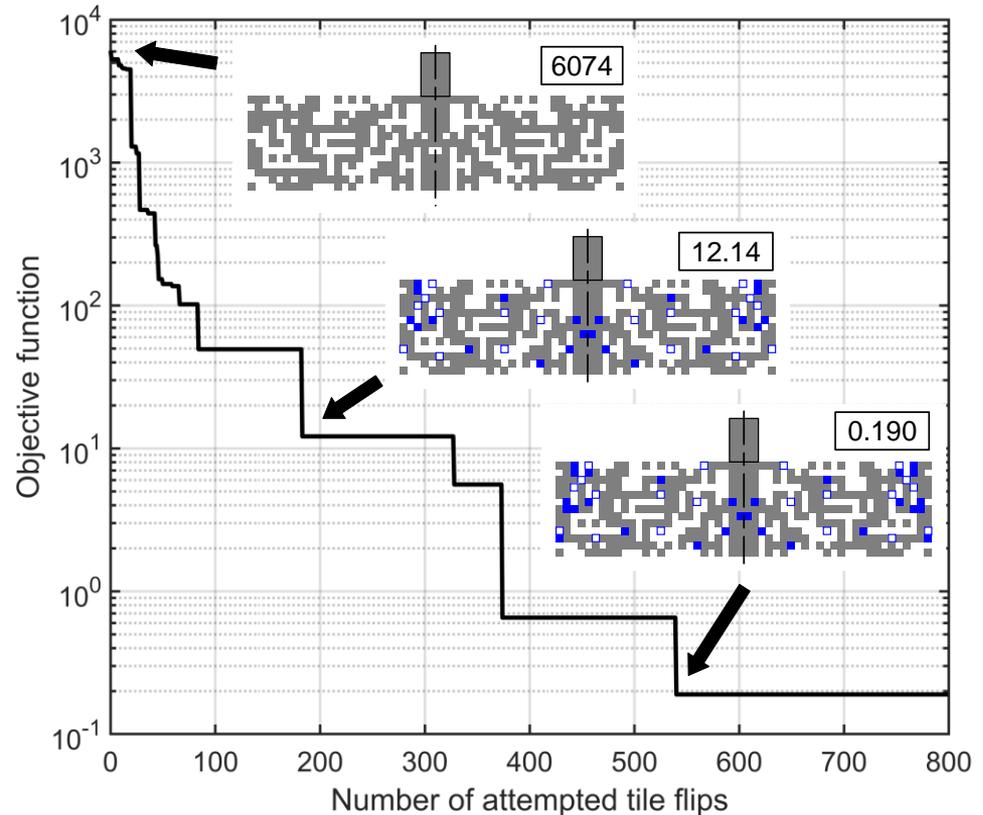
### Precomputation:

From 12.5 hr (FDTD)  
to 30 min (APF)

### Optimization:

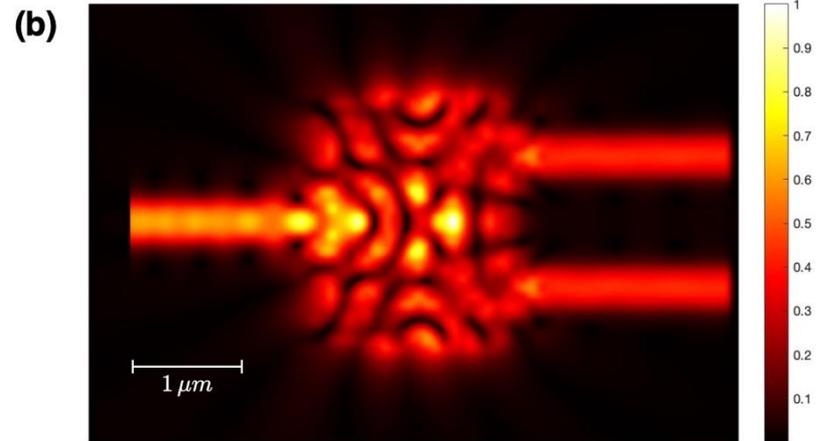
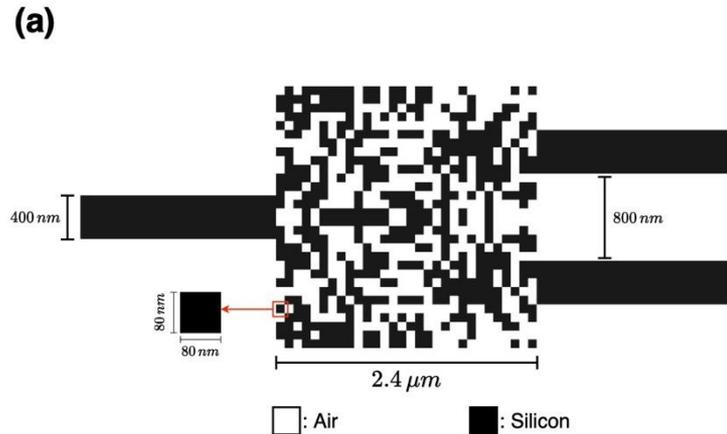
67min (5s × 880)

Speedup: 470x



# Extension to dielectrics: Nanophotonic Applications

- ◆ PNGF can be used just as effectively to represent dielectric materials as equivalent polarization densities to accelerate nanophotonic inverse design problems:



99.4% efficient 1:2 silicon power splitter

**10 seconds** to design on laptop computer (3461 flips required to converge)

**400x faster than FDFD**

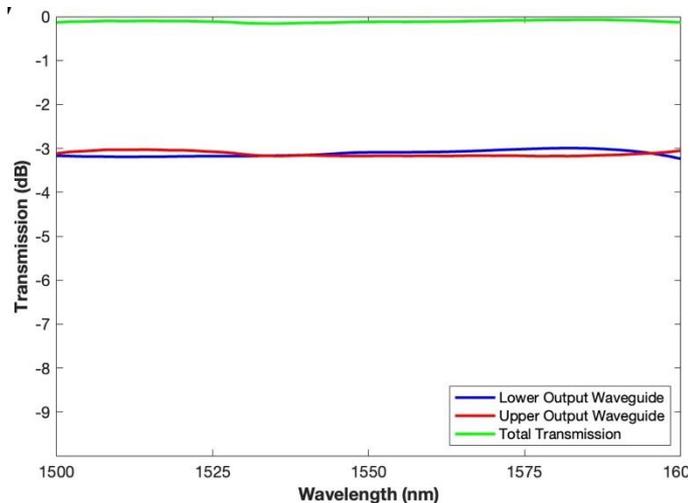
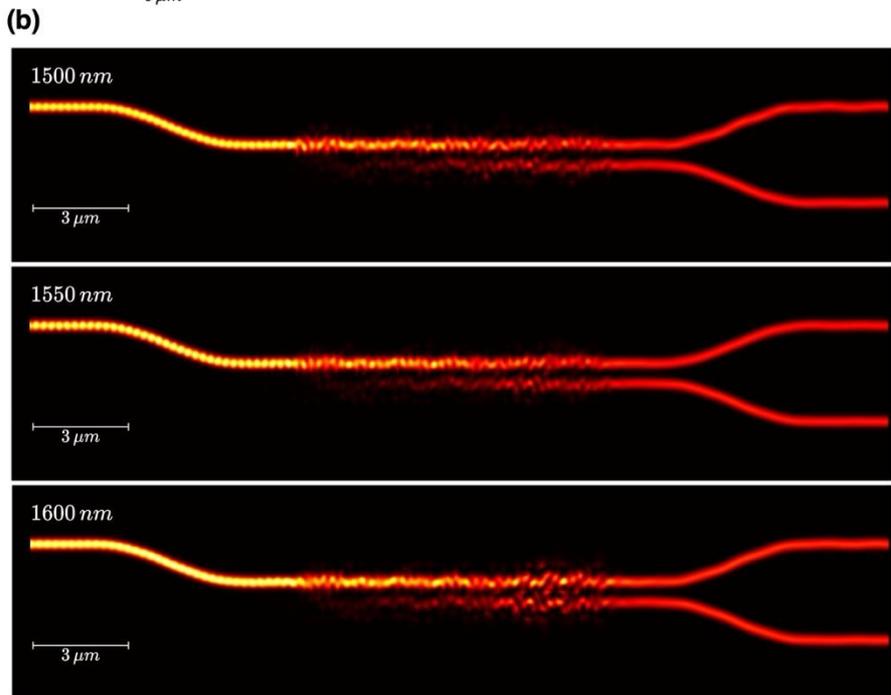
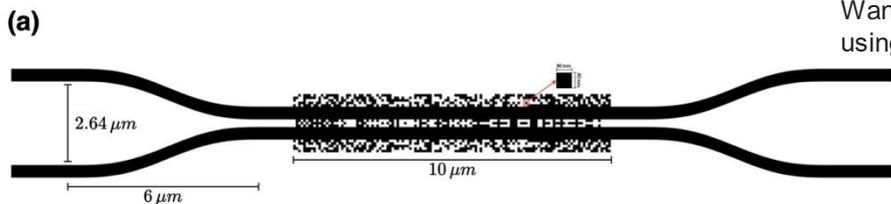
Wang, J. and Sideris, C. "Ultra-fast Simulation and Optimization of Nanophotonic Devices using Precomputed Numerical Green's Functions". In preparation.

# Extension to dielectrics: Nanophotonic Applications

Wang, J. and Sideris, C. "Ultra-fast Simulation and Optimization of Nanophotonic Devices using Precomputed Numerical Green's Functions". In preparation.

97.5% transmission broadband symmetric directional coupler with 100nm bandwidth

6 minutes to design on laptop computer (required 10,118 tile flips to converge)



# Conclusions and Future Work

◆ **Multi-level IFGF** for 3D Maxwell: >50x speedup due to  $O(N \log N)$  vs.  $O(N^2)$

◆ Corner Regularized Combined Field Integral Equations (**CR-CFIE**) for achieving high-order convergence for scattering from objects with geometric singularities

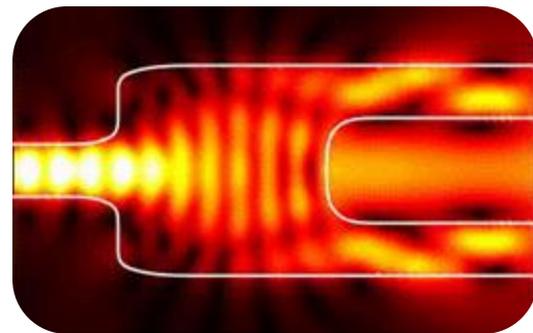
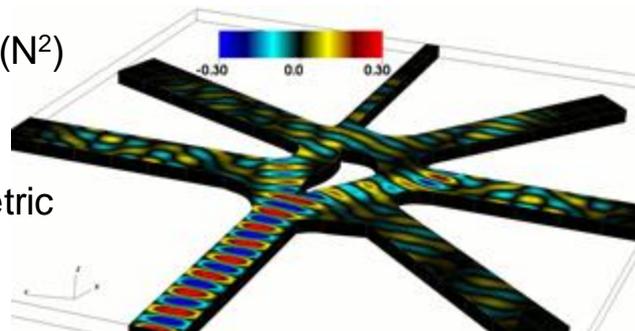
◆ **Generalized PNGF** for ultra-fast inverse design of metallic and dielectric structures

## Next Steps:

◆ Implement multi-level IFGF implementation on GPU to achieve faster performance and  $O(N \log N)$  time complexity.

◆ Extend the CR-CFIE method to 3D Maxwell problems.

◆ Extend the PNGF method for inverse designing 3D nanophotonic devices.



# Publications

- ◆ Hu, J., Garza, E., and **Sideris, C.** "A Chebyshev-based high-order-accurate integral equation solver for Maxwell's equations." *IEEE Transactions on Antennas and Propagation* 69.9 (2021): 5790-5800.
- ◆ Garza, E., Hu, J., and **Sideris, C.** "High-order Chebyshev-based Nyström Methods for Electromagnetics." *2021 International Applied Computational Electromagnetics Society Symposium (ACES)*. IEEE, 2021.
- ◆ **Sideris, C.**, Khachaturian, A., White, A., Bruno, O. P., Hajmiri, A., "Foundry-Fabricated Grating Coupler Demultiplexer Inverse-Designed via Fast Integral Methods." *Nature Communications Physics*, 2022.
- ◆ Hu, J., Sever, E., Babazadeh, O., Gholami, R., Okhmatovski, V., and **Sideris, C.** "H-Matrix Accelerated Direct Matrix Solver using Chebyshev-based Nyström Boundary Integral Equation Method". *Presented at IEEE International Microwave Symposium 2022*
- ◆ Garza, E., **Sideris, C.**, Bruno, O.P. "A boundary integral method for 3D nonuniform dielectric waveguide problems via the windowed Green function." *IEEE Transactions on Antennas and Propagation (2023)*.
- ◆ Hu, J. and **Sideris, C.** "A High-Order-Accurate 3D Surface Integral Equation Solver for Uniaxial Anisotropic Media". *IEEE Transactions on Antennas and Propagation (2023)*.
- ◆ Garza, E. and **Sideris, C.** "Fast Inverse Design of 3D Nanophotonic Devices Using Boundary Integral Methods." *ACS Photonics (2022)*.
- ◆ Zheng, Y. and **Sideris, C.** "Ultra-fast Simulation and Inverse Design of Metallic Antennas". *IEEE International Microwave Symposium (2023)*.
- ◆ Aslanyan, D. and **Sideris, C.** "An Adaptive Integration Technique for the Chebyshev-based Boundary Integral Equation Method." *ACES 2023*.
- ◆ Babazadeh, O., Sever, E., Gholami, R., Jeffrey, I., **Sideris, C.**, and Okhmatovski, V. "Towards Fast Error-Controllable Solution of CFIE on PEC Targets with H-matrix Accelerated Locally Corrected Nystrom Method" *URSI EMTS 2023*.
- ◆ Aslanyan, D., Hu, J., and **Sideris, C.** "Nanophotonic Simulation and Inverse Design using Fast High-order Chebyshev-based Nyström Methods". *International Conference on Electromagnetics in Advanced Applications (ICEAA) 2023*.
- ◆ Huang, J.-Y., Molisch, A.F., **Sideris, C.** "Concurrent Dual Polarization Dielectric Waveguide Interconnect using Inverse Designed Dual-Mode Surface Antenna Launcher". *IEEE International Symposium on Antennas and Propagation (2023)*.
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