# Nonlocal UFL: Finite elements for Helmholtz equations with a nonlocal boundary condition

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25 March 2021

#### Order of Presentation

Motivating Problem: Helmholtz scattering

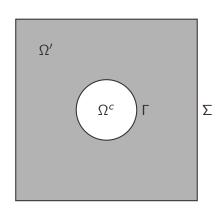
A nonlocal boundary condition

Nonlocal UFL

**Numerical Results** 

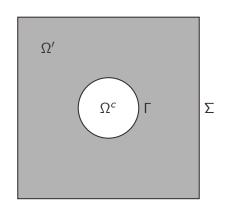
#### Thanks to...

- NSF 1525697, 1909176
- ► The U.S. Department of Energy, Office of Science, Office of Advanced Scientific Computing Research, Department of Energy Computational Science Graduate Fellowship under Award Number DE-SC0021110
- ► Luke Olson (UIUC)



 Model waves reflecting off of obstacle Γ

$$\begin{cases} -\Delta u + \kappa^2 u = 0, & \mathbb{R}^d \setminus \Omega \\ -\frac{\partial u}{\partial n} = f, & \Gamma \end{cases}$$

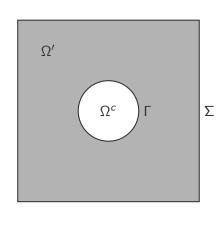


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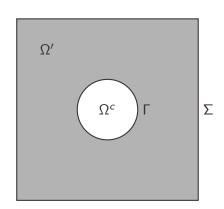
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In some finite domain of interest  $\Omega' \subseteq \mathbb{R}^d \setminus \Omega'$  bounded by  $\Sigma$ .

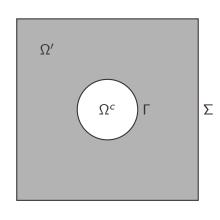
# Exterior scattering: computational problem



Problem we want to solve

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Problem we can actually solve

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With K the Green's function, the *true* solution satisfies:

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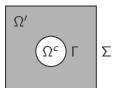
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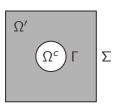
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Exact boundary conditions

$$\begin{cases} -\Delta u + \kappa^2 u = 0, & \Omega' \\ -\frac{\partial u}{\partial n} = f, & \Gamma \\ (i\kappa - \frac{\partial}{\partial n})(u - D(u) + S(f)) = 0, & \Sigma \end{cases}$$

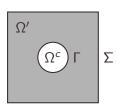


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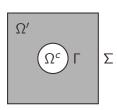
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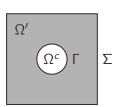
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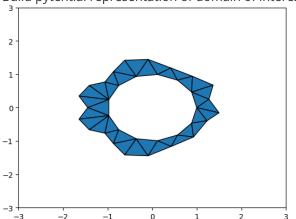
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  - Solution: Use pytential to evaluate layer potentials with fast multiple methods (FMM)

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  - √ Firedrake evaluates inner product



## Solving the system with Firedrake

Extend UFL:

$$a(u,v) = (\nabla u, \nabla v) - \kappa^2(u,v) - i\kappa \langle u,v \rangle_{\Sigma} + \langle (i\kappa - \frac{\partial}{\partial n}) D(u)v \rangle_{\Sigma}$$

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Will be written as:

#### Solving the system with Firedrake

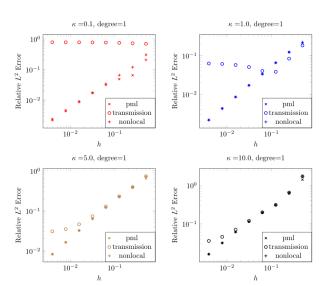
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#### Can currently be written as:

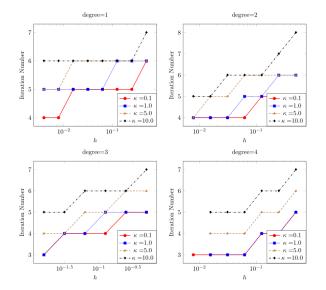
#### Numerical results: 2D

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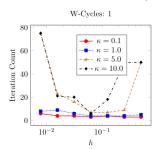


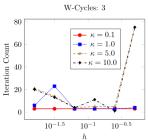
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- PyAMG: Precondition with plane waves





#### **Future work**

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#### **Future** work

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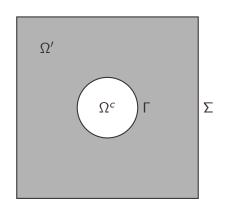
Coming soon: VolumePotentials in UFL

- Leveraging nonlocal UFL to solve more FEM-BEM problems in Firedrake!
  - Further investigation into preconditioners

## Thank you!

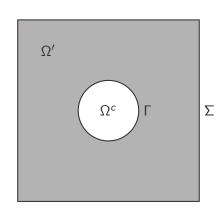
Questions?





► Perfectly Matched Layers:

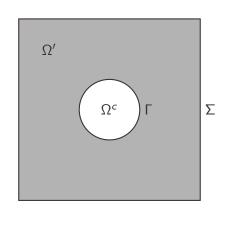
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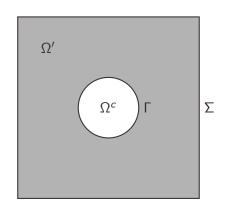
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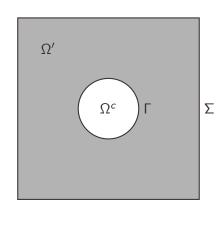
- $\Sigma \qquad \triangleright \quad \beta = I \text{ in } \Omega'$ 
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- **Solution** is right in Ω'
- Solvers are a pain!

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- ▶ *a* is a bounded bilinear form on  $H^1 \times H^1$
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- ▶ Gårding inequality. There exist M and an  $\alpha > 0$  such that

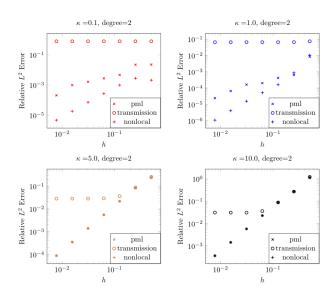
$$Re(a(u, u)) + M ||u||^2 \ge \alpha ||u||_{H^1(\Omega)}^2$$
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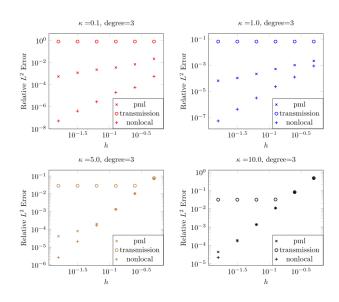
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For  $h \le h_0$ , we have optimal-order  $H^1$  and  $L^2$  error estimaes.

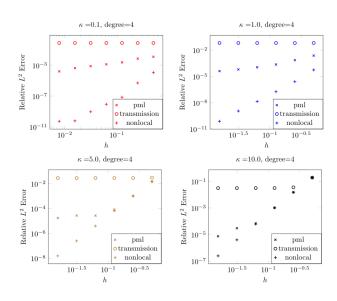
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### Numerical results: 2D, degree 3



#### Numerical results: 2D, degree 4



#### Numerical results: 3D, degree 1

