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Outline

Model problem and Introduction

Overlapping Schwarz methods

Construction of Coarse Space

Numerical Results: Iterative

Numerical Results: Krylov

Motivation

- Efficiently solve problems on perforated domains.
 - Numerous holes representing buildings and walls in urban data;
 - Can be considered a heterogeneous domain with coefficients 0, 1.
 - Expect corner singularities
 - Want to avoid global fine-scale solve.
- We begin with the linear Poisson equation before moving to nonlinear problems (Diffusive Wave model).
- Applications: flood modelling in urban areas.



Model PDE: Linear

- ▶ *D*: Open simply connected polygonal domain in \mathbb{R}^2 ;
- $(\Omega_{S,k})_k$: Finite family of perforations in *D*;

•
$$\Omega_S = \bigcup_k \Omega_{S,k}$$
 and $\Omega = D \setminus \overline{\Omega_S}$.

$$\begin{cases} -\Delta u = f & \text{in} \quad \Omega, \\ \frac{\partial u}{\partial n} = 0 & \text{on} \quad \partial \Omega \cap \partial \Omega_{S}, \\ u = 0 & \text{on} \quad \partial \Omega \setminus \partial \Omega_{S}. \end{cases}$$

With a P1 finite element discretization, this discretely becomes the linear system

$$Au = f$$
.

Domain Decomposition Approach

- 'Divide and conquer': Break up problem into subdomains;
- Two levels of discretization: 'Coarse' and 'fine';
- Local subdomain solves can be done in parallel;
- Can use overlapping Schwarz methods as iterative solver or as preconditioner for Krylov;

Idea: Solve model problem on each subdomain locally, with boundary conditions taken from adjacent subdomains when possible.

Parallel Schwarz Introduction for $\mathcal{L}u = f$: 2 subdomains

Continuously, the local classical additive Schwarz iteration is given by

$$\mathcal{L}u_1^{n+1} = f \quad \text{in} \quad \Omega_1 \qquad \mathcal{L}u_2^{n+1} = f \quad \text{in} \quad \Omega_2 \\ u_1^{n+1} = u_2^n \quad \text{on} \quad \partial\Omega_1 \cap \Omega_2 \qquad u_2^{n+1} = u_1^n \quad \text{on} \quad \partial\Omega_2 \cap \Omega_1$$

Algebraically, the global stationary (RAS) iteration becomes

$$\mathbf{u}^{n+1} = \mathbf{u}^n + \left(\sum_{j=1}^2 \mathbf{R}_j^T \mathbf{D}_j (\mathbf{R}_j \mathbf{A} \mathbf{R}_j^T)^{-1} \mathbf{R}_j\right) (\mathbf{f} - \mathbf{A} \mathbf{u}^n)$$

and the preconditioned system is given by

$$\left(\sum_{j=1}^{2} \mathbf{R}_{j}^{\mathsf{T}} \mathbf{D}_{j} (\mathbf{R}_{j} \mathbf{A} \mathbf{R}_{j}^{\mathsf{T}})^{-1} \mathbf{R}_{j}\right) \mathbf{A} \mathbf{u} = \left(\sum_{j=1}^{2} \mathbf{R}_{j}^{\mathsf{T}} \mathbf{D}_{j} (\mathbf{R}_{j} \mathbf{A} \mathbf{R}_{j}^{\mathsf{T}})^{-1} \mathbf{R}_{j}\right) \mathbf{f}$$

 R_j notation allows for global iteration, algebraic definition, overlapping subdomains.

1D example- Restriction, POU matrices

Given set of indices $\mathcal{N} = \{0, 1, 2, 3, 4\}$: partitioned into $\mathcal{N}_1 = \{0, 1, 2, 3\}$ and $\mathcal{N}_2 = \{2, 3, 4\}$, restriction and partition of unity matrices are given as

$$\mathbf{R}_1 = \begin{bmatrix} 1 & 0 & 0 & 0 & 0 \\ 0 & 1 & 0 & 0 & 0 \\ 0 & 0 & 1 & 0 & 0 \\ 0 & 0 & 0 & 1 & 0 \end{bmatrix} \qquad \mathbf{R}_2 = \begin{bmatrix} 0 & 0 & 1 & 0 & 0 \\ 0 & 0 & 0 & 1 & 0 \\ 0 & 0 & 0 & 0 & 1 \end{bmatrix}$$

and

$$\mathbf{D}_{1} = \begin{bmatrix} 1 & 0 & 0 & 0 \\ 0 & 1 & 0 & 0 \\ 0 & 0 & \frac{1}{2} & 0 \\ 0 & 0 & 0 & \frac{1}{2} \end{bmatrix} \qquad \mathbf{D}_{2} = \begin{bmatrix} \frac{1}{2} & 0 & 0 \\ 0 & \frac{1}{2} & 0 \\ 0 & 0 & 1 \end{bmatrix}$$

$$\mathbf{D}_{2} = \begin{bmatrix} \frac{1}{2} & 0 & 0 \\ 0 & \frac{1}{2} & 0 \\ 0 & 0 & 1 \end{bmatrix}$$

Need for coarse correction

- Coarse corrections allows for global communication between all subdomains.
- Coarse correction (two-level methods) necessary for scalability for large number of subdomains.
- Generally, without coarse correction: Iterations scale with *N*.

2-level RAS iteration: N Subdomains

Combine (multiplicitavely) the 1-level RAS iteration

$$M_{RAS,1}^{-1} = \sum_{j=1}^{N} \mathbf{R}_{j}^{T} \mathbf{D}_{j} (\mathbf{R}_{j} \mathbf{A} \mathbf{R}_{j}^{T})^{-1} \mathbf{R}_{j}$$

with the coarse approximation

$$M_0^{-1} = \mathbf{R}_0^T (\mathbf{R}_0 \mathbf{A} \mathbf{R}_0^T)^{-1} \mathbf{R}_0.$$

and solve

$$\begin{split} \mathbf{u}^{n+\frac{1}{2}} &= \mathbf{u}^n + M_{RAS,1}^{-1}(\mathbf{f} - \mathbf{A}\mathbf{u}^n), \\ \mathbf{u}^{n+1} &= \mathbf{u}^{n+\frac{1}{2}} + M_0^{-1}(\mathbf{f} - \mathbf{A}\mathbf{u}^{n+\frac{1}{2}}), \end{split}$$

R_j : Correspond to overlapping subdomains.

The 2-level preconditioner for Krylov

Combine (additively) the 1-level RAS iteration

$$M_{RAS,1}^{-1} = \sum_{j=1}^{N} \mathbf{R}_{j}^{T} \mathbf{D}_{j} (\mathbf{R}_{j} \mathbf{A} \mathbf{R}_{j}^{T})^{-1} \mathbf{R}_{j}$$

with the coarse approximation

$$M_0^{-1} = \mathbf{R}_0^T (\mathbf{R}_0 \mathbf{A} \mathbf{R}_0^T)^{-1} \mathbf{R}_0.$$

to give

$$M_{RAS,2}^{-1} = M_0^{-1} + M_{RAS,1}^{-1}.$$

and solve

$$M_{RAS,2}^{-1}\mathbf{A}\mathbf{u}=M_{RAS2}^{-1}\mathbf{f}.$$

(Some) existing overlapping Schwarz coarse spaces

- Nicolaides: Piecewise constant by subdomain;
- Spectral spaces (eigenvalue problems): DtN, GenEO, SHEM (spectrally enriched MSFEM);
- Energy-minimizing spaces: GDSW, AGDSW, RGDSW;
- Multi-scale FEM: MsFEM
 - Numerically compute harmonic basis functions.
 - Used to approximate solution on coarse grid, but can use as DD coarse space!

Choice of coarse space

- Idea: want to take advantage of a-priori location of perforations (buildings/walls);
- Want robustness with respect to perforation size/location (even along subdomain interfaces);
- Want to choose a coarse space with approximation properties to improve convergence;
- Choose: Local harmonic basis functions occuring at intersection of a perforation with the coarse skeleton.
 - Think of as 'enriching' MsFEM coarse space.
 - Works on nonoverlapping subdomains Ω'_i.

Coarse-cell conforming triangulation

Mesh generation process:

- ▶ Larger $N \rightarrow$ more basis functions, larger coarse matrix ;
- Triangulate after nonoverlapping coarse cell partitioning Ω'_i ;
- Overlap subdomains by layers of triangles for RAS.





 $2{\times}2$ subdomains

 $8{\times}8$ subdomains

Coarse grid nodes for coarse space basis functions

- Nonoverlapping skeleton:
 - $\Gamma = \bigcup_{j \in \{1, \dots, N\}} \partial \Omega'_j;$
- (e_k)_{k=1,...,N_e}: Partitioning of Γ;
 - each "coarse edge" e_k is an open planar segment;
- Set of coarse grid nodes: $\bigcup_{k=1,\ldots,N_e} \partial e_k$
- (φ_s)_{s∈{1,...,N_x}} : Locally harmonic basis functions for each coarse grid node.
- # of coarse grid nodes is automatically generated.



Basis functions: boundary conditions

For each coarse grid node \mathbf{x}_s , define $g_s : \Gamma \rightarrow [0, 1]$ as: for $i = 1, \dots N_{\mathbf{x}}$,

$$g_s(\mathbf{x}_i) = \begin{cases} 1, & s = i, \\ 0, & s \neq i, \end{cases}$$

- g_s is linearly extended on the remainder of Γ.
- Can also include higher-order polynomials on coarse edges.



Basis functions: Harmonic local solutions

For all nonoverlapping $(\Omega'_j)_{j\in\{1,\dots,N\}}$ and $s=1,\dots,N_x$, to obtain $\phi_{s,j}=\phi_s|_{\Omega_j}$, solve

$$\left\{ \begin{array}{rrrr} -\Delta\phi_{s,j}&=&0\quad \text{in}\quad \Omega_j',\\ -\frac{\partial\phi_{s,j}}{\partial n}&=&0\quad \text{on}\quad \partial\Omega_j'\cap\partial\Omega_S,\\ \phi_{s,j}&=&g_s\quad \text{on}\quad \partial\Omega_j'\setminus\partial\Omega_S. \end{array} \right.$$



supp(φ_s) = { ⋃_j Ω'_j | x_s is a coarse grid node belonging to ∂Ω'_j}.
 Continuously, the coarse space is given by

$$V_H = \operatorname{span}\{\phi_s\}.$$

Approximation properties: Coarse approximation

Discretely, given

$$M_0^{-1} = \mathbf{R}_0^T (\mathbf{R}_0 \mathbf{A} \mathbf{R}_0^T)^{-1} \mathbf{R}_0.$$

the coarse approximation is the solution of

$$\mathbf{u}_H = M_0^{-1}\mathbf{f}.$$

Can use u_H as initial iterate for iteration, Krylov methods.

Experiment 1: Iterative RAS, L-shaped domain



- Provide iterative RAS results for preliminary L-shaped domain;
 - L-shaped domain: Square domain with one perforation;
 - Allows us to compare to analytical solution.
 - Perform additional refinement at the singularity to improve convergence and FE error;
- Keep N constant, vary h and improve FE error;
- In spirit of iterative methods.

Numerical Results: Iterative RAS (L-shaped domain)



- SD error: Error from algebraic single domain FE solution;
- True error: Error from analytical true solution.

Edge refinement





Orig. coarse grid nodes

- Improves coarse approximation;
- No changes to coarse skeleton Γ.
- Idea from MHM literature.

Additional edge refinement

Numerical Results: Iterative RAS (L-shaped domain) Edge refinement



- Vary $H = max_{k=1,...,N_e}|e_k|$, keep h constant;
- Edge refinement provides additional acceleration (better coarse approx., steeper slope).

Experiment 2: Iterative+Krylov, real data set



- Provide same iterative convergence curves as L-shaped domain;
- Also provide convergence curves for preconditioned GMRES;
- Multiple singularities and no analytical solution available.

Numerical Results: Iterative RAS (Real data)



- SD error: Error from algebraic single domain FE solution;
- True error: Error from fine FE solution.

Numerical Results: Krylov



Experiment 3: Krylov Scalability, large real data set



 \approx 300K DOFS in FE triangulation.

- Want to show scalability:
- "Strong" scalability tests: Keep model domain and h constant, vary N.

Numerical Results: Krylov (table)

	Trefftz		
	it.		dim. (rel)
N	min	$\frac{H}{20}$	
16	56	22	400 (16.0)
64	56	26	880 (10.9)
256	59	30	1912 (6.6)
1024	61	28	4253 (3.9)

- ► Relative dimension (rel): Compared to would-be homogeneous domain, $\frac{\dim(R_0)}{(\sqrt{N}+1)^2}$.
- Relative dimension reduces as N increases;
- Trefftz-like space produces scalable, accelerated iterations.

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- Achieve fine-scale error in a small number of iterations, limited by finite element error;
- Krylov: Trefftz is **Robust** with respect to number of subdomains on a fixed total domain size, and provides an additional **acceleration** in terms of Krylov iteration count.
- However, the dimension of the Trefftz-like coarse space is large and controlled by the model geometry.

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