

# A Memory Efficient BDDC Algorithm for Higher Order Elements

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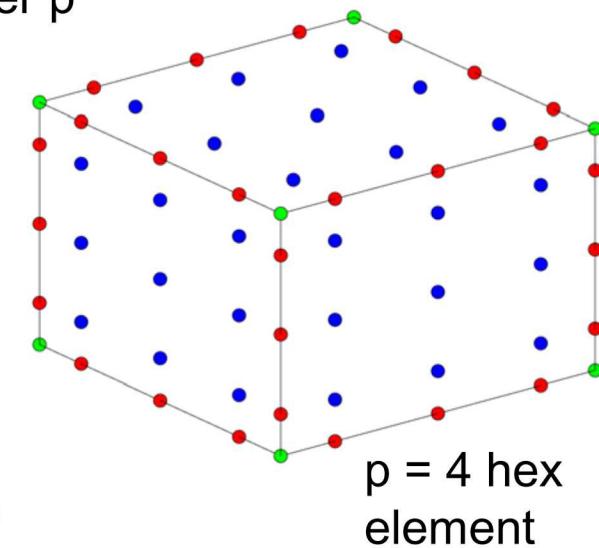
# Outline

- **Background:**
  - Some basics
  - A case for BDDC
  - Related work
- **Approach:**
  - Avoid dense matrices
  - Allow for inexact solvers
  - Work and memory estimates
- **Numerical Results**
- **Recap**

# Background

- **Some basics:**

- Focus on 3D elements (degree  $p$ )
  - $O(p^3)$  degrees of freedom,  $O(p^6)$  matrix entries
  - Matrix storage may be prohibitive for larger  $p$ 
    - Interest in matrix-free approaches
- Simple approach:
  - $O(p^9)$  operations for element matrix
  - $O(p^6)$  for matrix-vector products
- Optimized approaches:
  - Sum factorization method (Orszag, 1980)
    - See refs for tensor product and simplicial elements
  - $O(p^6)$  operations for matrix (optimal)
  - $O(p^4)$  for matrix-vector products



# Background

- **A case for BDDC:**
  - Treat each higher order element as a subdomain
    - Challenging computations isolated to individual elements
  - Coarse problem involves assembly of lower order elements
    - We know how to solve this problem
  - Existing theory available and promising numerical results
- **So what's the challenge?**
  - Dirichlet & Neumann problems at subdomain level involve large dense matrices, leading to memory & computational concerns
- **What to do?**
  - Develop BDDC preconditioner for easier problem that avoids large dense matrices & use in Krylov method for original problem

# Background

- **Related work\*:**

- Pavarino (2007):
  - Theory, 2D examples, exact solvers, single element subdomains
- Klawonn, Pavarino, Rheinbach (2008):
  - Theory, 2D focus, exact & inexact FETI-DP solvers
- Pavarino, Widlund, Zampini (2010)
  - Theory, 3D focus, almost incompressible elasticity, exact solvers
- Isogeometric analysis: BCPS13, BPSWZ14
- Bertoluzza, Pennacchio, Prada (2017)
  - Virtual element method, 2D only, theory for triangular elements
- Discontinuous Galerkin

- **Talk today:**

- Focus on memory efficiency & inexact solvers

\*see Chapter 7 of TW05 for a nice discussion of earlier non-BDDC work

# Approach

- Let's get our feet wet

- Exact solvers for dense element matrices (not memory friendly)
- BDDC coarse space based on edge averages

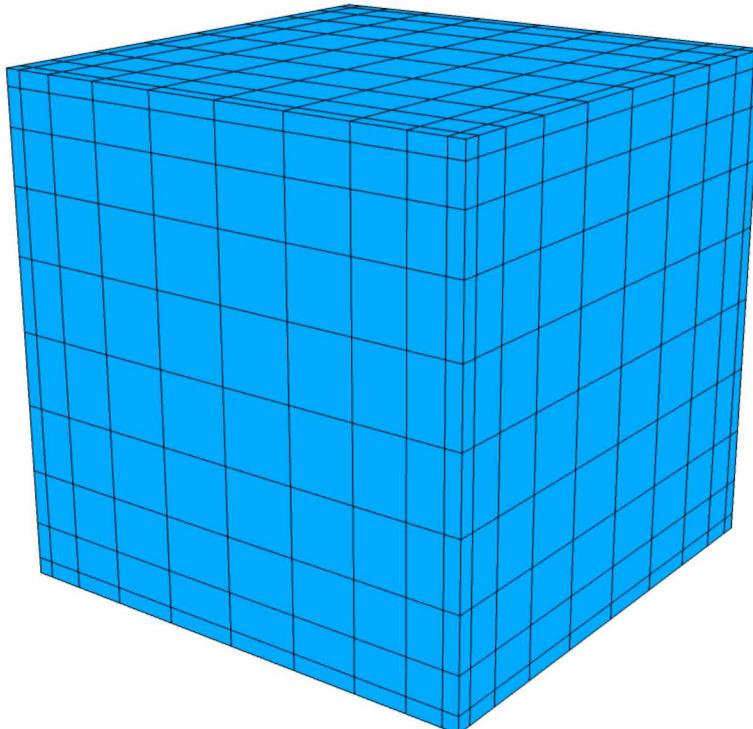
<b>p</b>	<b>4x4x4 hex mesh</b>		<b>6x6x6 hex mesh</b>		<b>8x8x8 hex mesh</b>	
	iter	cond	iter	cond	iter	cond
<b>2</b>	10	2.0	11	2.1	11	2.2
<b>3</b>	9	1.7	10	1.8	10	1.8
<b>4</b>	12	2.4	13	2.5	13	2.6
<b>5</b>	13	2.7	14	2.8	14	2.8

<b>p</b>	<b>4x4x4 tet mesh</b>		<b>6x6x6 tet mesh</b>		<b>8x8x8 tet mesh</b>	
	iter	cond	iter	cond	iter	cond
<b>2</b>	12	2.3	13	2.4	13	2.5
<b>3</b>	20	8.5	21	8.5	21	8.5
<b>4</b>	29	15.2	29	15.1	29	15.1
<b>5</b>	35	21.3	35	21.3	36	21.3

Takeaway: Hex mesh results look great  $\Rightarrow$  focus on them for remainder of talk

# Approach

- **How to avoid dense matrices?**
  - Use old idea from Orszag (1980)
  - See Chapter 7 of TW05 for discussion and other applications



	$K_p$ (dense)	$K_h$ (sparse)
Memory	$O(p^6)$	$O(p^3)$
Factorization work	$O(p^9)$	$O(p^6)$
Factorization memory	$O(p^6)$	$O(p^{4/3})$
AMG initialization		$O(p^3)$
AMG memory		$O(p^3)$

Recall optimized matrix-vector products require  $O(p^4)$  work

- It's been said “A good preconditioner of a good preconditioner remains a good preconditioner”

# Approach

- **Just how good is this preconditioner?**
  - Calculate min and max eigenvalues of  $K_h x = \lambda K_p x$
  - Gauss-Lobatto integration for  $K_p$
  - Gauss-Lobatto integration for each constituent linear element of  $K_h$  gave better results than standard Gauss quadrature

$p$	$\lambda_{min}$	$\lambda_{max}$	$\lambda_{max}/\lambda_{min}$
2	0.42	2.25	5.3
4	0.50	2.51	5.01
6	0.49	2.64	5.35
8	0.48	2.69	5.60
10	0.47	2.72	5.79

Takeaway: Pretty good approximation, but no need for super accurate inexact solvers

# Approach

- **Overview:**

- Construct BDDC preconditioner  $M^{-1}$  for  $A_h$ 
  - $A_h$  obtained from assembly of  $K_h$  matrices
  - Each  $K_h$  matrix treated as its own subdomain
- Use either sparse direct solver or AMG preconditioner for local Dirichlet and Neumann problems of BDDC
  - Either way, no longer solving an interface problem
- Care needed for inexact solution of Neumann problems
  - Neumann problems used to construct coarse matrices
  - Inexact solvers should satisfy a null space property (see D07)
- Solve linear system  $A_p x = b$  using a Krylov method with  $M^{-1}$  as the preconditioner

# Numerical Results

- First step: How well does  $M^{-1}$  precondition  $A_h$ ?

Unit cube, 64 subdomains, DBC on one side, solver tol  $10^{-6}$ , edge-based coarse space, sparse direct subdomain solvers

<b>p</b>	<b>iterations</b>	<b>condition #</b>
2	7	1.4
3	8	1.7
4	10	2.2
5	12	2.7
6	14	3.2
7	15	3.8
10	19	5.6

- How well should  $M^{-1}$  precondition  $A_p$ ?

- Corollary C.2 of TW05:  $\kappa(M^{-1}A_p) \leq \kappa(M^{-1}A_h)\kappa(A_h^{-1}A_p)$

# Numerical Results

Same problem but now BDDC preconditioner for original higher order problem (sparse direct or AMG subdomain solvers\*)

p	sparse direct		AMG	
	iterations	condition #	iterations	condition #
2	17	5.6	17	5.7
3	15	5.1	18	5.7
4	17	7.0	20	7.4
5	21	9.9	24	10.8
6	23	13.5	27	14.3
7	25	17.8	31	18.6

\*V-cycle, single pre/post smoothing step, max coarse size 10, semi-coarsening

# Recap

- Effective BDDC preconditioner for higher order elements
  - Challenging computations isolated to elements
    - Problem looks like standard one after first level of coarsening
  - Memory:
    - $O(p^4)$  for sparse direct subdomain solvers
    - $O(p^3)$  memory for AMG subdomain preconditioners
    - Note: there are order  $p^3$  unknowns in the problem
  - Work (per iteration):
    - sparse direct subdomain solvers
      - »  $O(p^6)$  initialization phase,  $O(p^4)$  solve phase
    - AMG subdomain preconditioners
      - »  $O(p^3)$  for both initialization and solve phases
  - Looks promising for direct solvers & AMG preconditioners

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