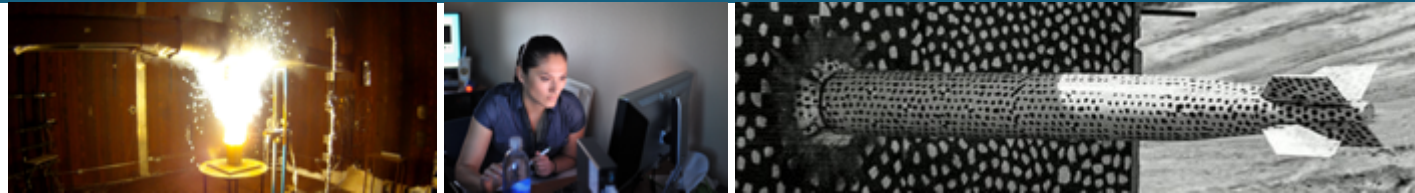


Algebraic Multigrid for mixed finite element discretizations of the Stokes Equations



PRESENTED BY

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[°] University of Illinois

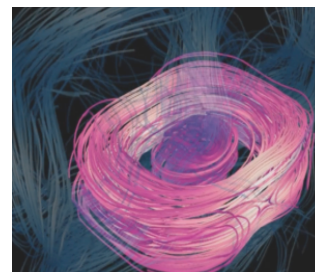
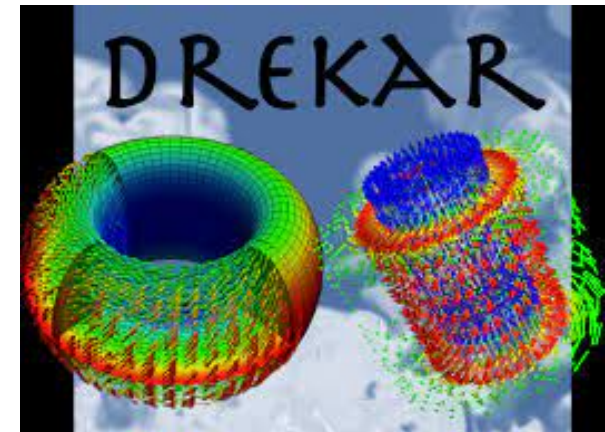
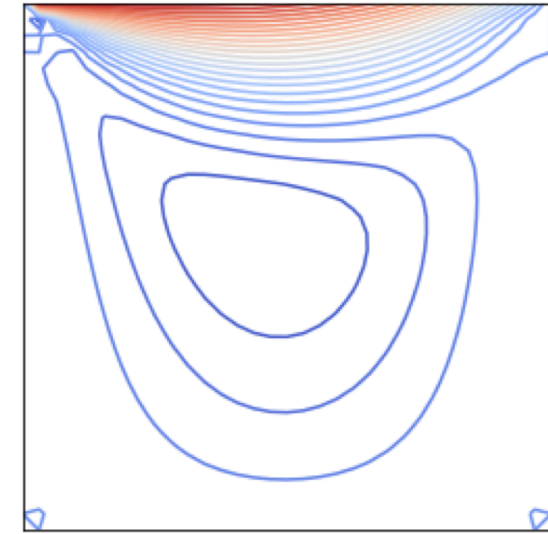
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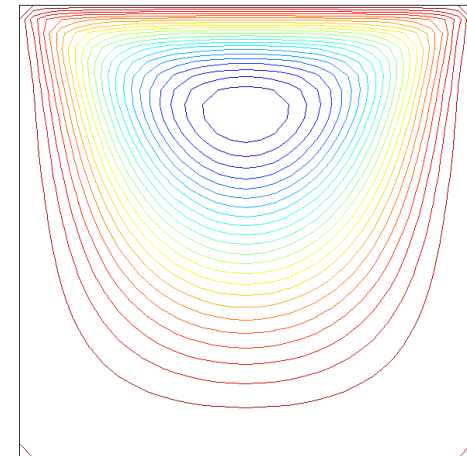
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- Stokes Equations & mixed finite elements
 - Inf-sup stability
- AMG: scalar PDEs $\rightarrow$ PDE systems
- AMG challenges for mixed FE discretizations
- Defect correction & auxiliary preconditioning methods
- A geometric MG preconditioner for Q_2/Q_1 Stokes
 - Q_1 iso Q_2/Q_1 discretization
- AMG for Q_2/Q_1 QStokes
 - aggregation & inf-sup stability?
 - guarantees?
- Conclusions



Stokes Equations

$$\begin{aligned}-\nabla^2 \vec{u} + \nabla p &= \vec{f} \\ -\nabla \cdot \vec{u} &= 0\end{aligned}$$

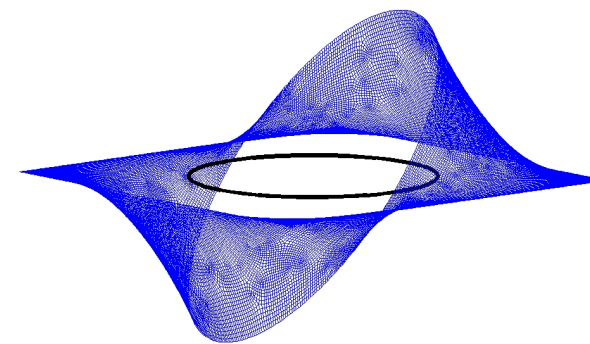
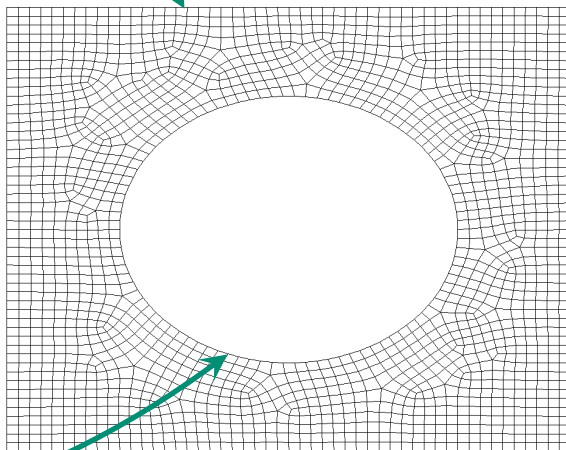


Simplification of Navier-Stokes when advective forces are negligible (or viscosities are large)

Dirichlet BCs

velocities = 0
on exterior boundary

tangent velocity of 1
on circle



computed horizontal velocity

Stokes Equations & mixed finite elements

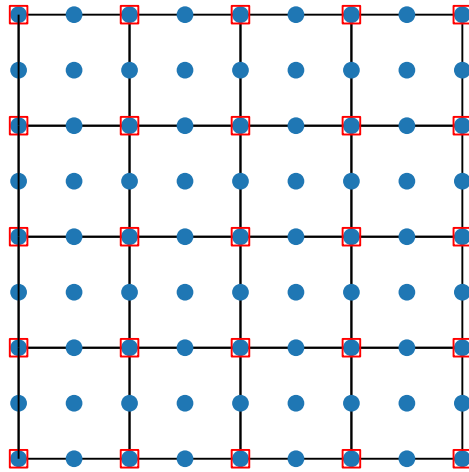


$$\begin{aligned} -\nabla^2 \vec{u} + \nabla p &= \vec{f} \\ -\nabla \cdot \vec{u} &= 0 \end{aligned} \quad \xrightarrow[\text{using Taylor-Hood elements}]{\text{Stable Mixed FE Assembly}} \quad Ax = \begin{bmatrix} G & B^T \\ B & 0 \end{bmatrix} \begin{bmatrix} \vec{u} \\ p \end{bmatrix} = \begin{bmatrix} \vec{f} \\ 0 \end{bmatrix}$$

$\mathbb{Q}_2/\mathbb{Q}_1$

Bases

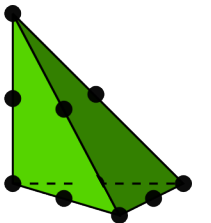
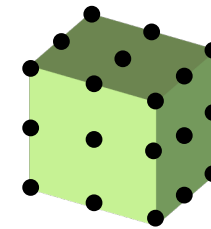
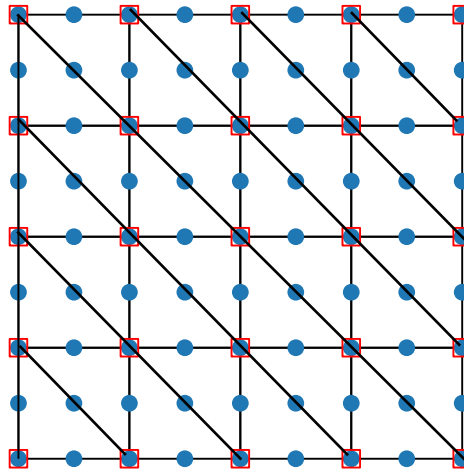
- Biquadratic for velocity
- Bilinear for pressure



$\mathbb{P}_2/\mathbb{P}_1$

Bases

- quadratic for velocity
- linear for pressure



Sandia interest: MHD (magnetohydrodynamics)

- Fluids & electro-magnetics (Navier-Stokes & Maxwell)

e.g.,

$$\frac{\partial \mathbf{u}}{\partial t} + \mathbf{u} \cdot \nabla \mathbf{u} - \nabla \cdot \nu \nabla \mathbf{u} + \nabla p + \nabla \cdot \left(-\frac{1}{\mu_0} \mathbf{B} \otimes \mathbf{B} + \frac{1}{2\mu_0} \|\mathbf{B}\|^2 \mathbf{I} \right) = 0$$

$$\nabla \cdot \mathbf{u} = 0$$

$$\frac{\partial \mathbf{B}}{\partial t} - \nabla \times (\mathbf{u} \times \mathbf{B}) + \nabla \times \frac{\eta}{\mu_0} \nabla \times \mathbf{B} + \nabla r = 0$$

$$\nabla \cdot \mathbf{B} = 0$$

$\mathbf{u}$: velocity, p : pressure,

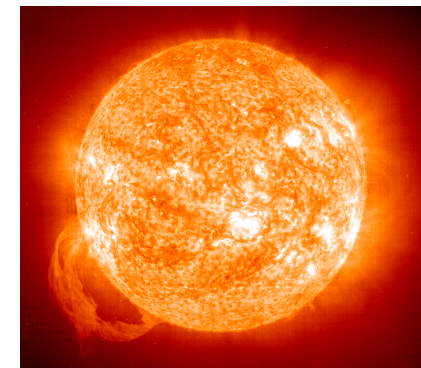
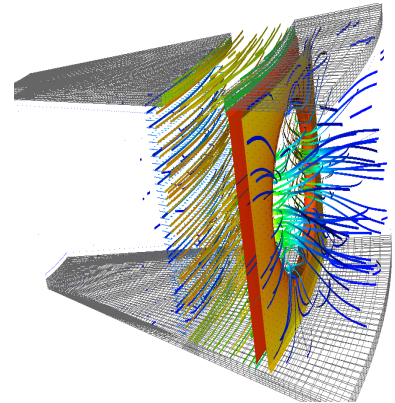
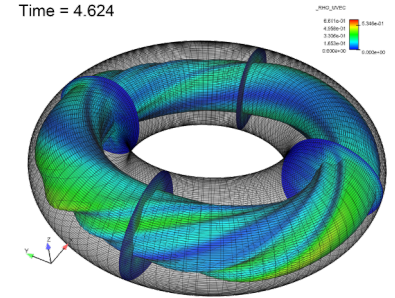
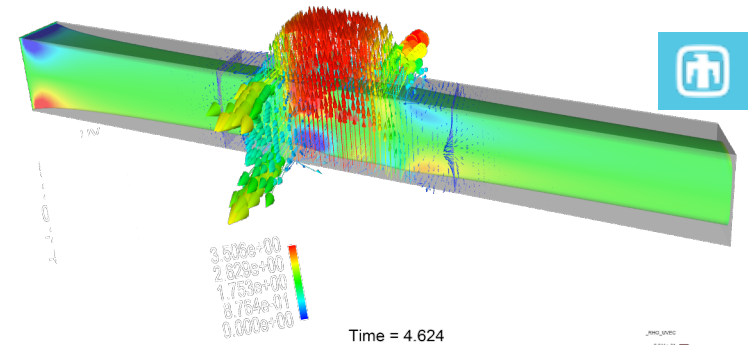
μ : viscosity,

$\mathbf{B}$: magnetic induction,

η : resistivity,

μ_0 : magnetic permeability of
free space

$$\begin{bmatrix} J_u & B_u^T & Z \\ B_u & S_p & \\ Y & & \end{bmatrix} \begin{bmatrix} \delta u \\ \delta p \\ \delta b \\ \delta r \end{bmatrix} = rhs$$



Sandia often uses standard equal order FEs, but is also interested in mixed FE.

Advantages of mixed finite elements



- when greater accuracy needed for some components
 - preserve a property of discrete system (e.g., edge elements to represent curl operators)
 - satisfy inf-sup or LBB (Ladyzhenskaya–Babuška–Brezzi) condition & avoid stability issues arising in some PDE systems
- ⇒ unique solution to saddle point system that depends continuously on input without artifacts such as spurious oscillations

Unstable Example

$u_{xx} = f$ with periodic BCs

reformulated as 1st order system

$$u_x = v \quad \&. \quad v_x = f$$

& discretize with linear nodal FE

$$\begin{pmatrix} I & -B^T \\ B & 0 \end{pmatrix} \begin{pmatrix} v_h \\ u_h \end{pmatrix} = \begin{pmatrix} 0 \\ f_h \end{pmatrix}$$

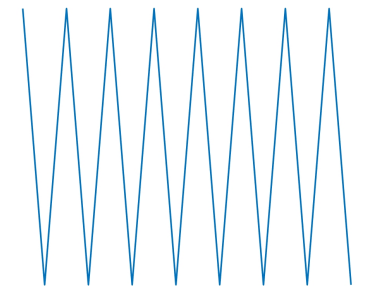
Schur complement is BB^T

stencil B is $\begin{matrix} -1 & 0 & 1 \end{matrix}$

stencil BB^T is $\begin{matrix} -1 & 0 & 2 & 0 & -1 \end{matrix}$

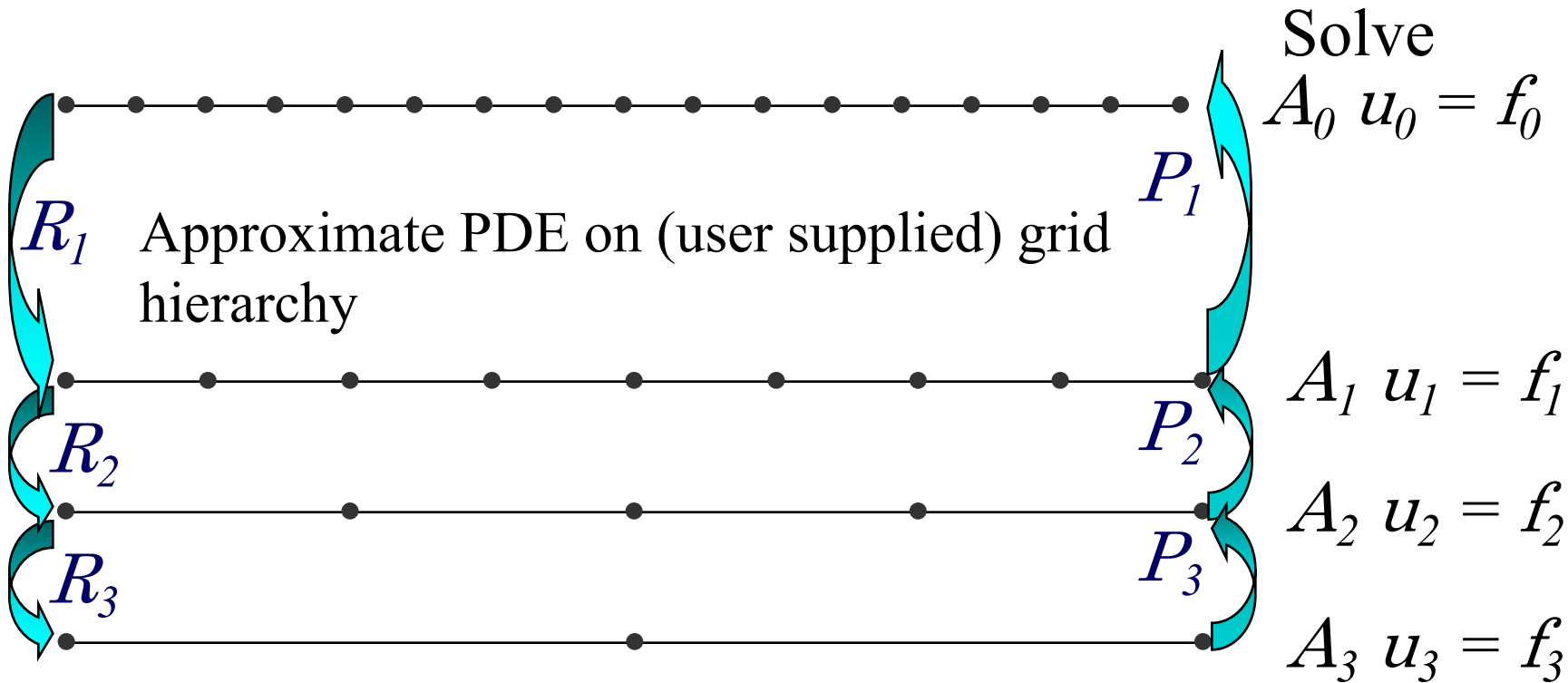
$$BB^T q = 0$$

where $q =$



⇒ unstable

Geometric Multigrid



Develop relaxation methods (approximate solve on a level)
Jacobi, Gauss-Seidel, CG, etc.

Develop grid transfers (e.g. linear interpolation)

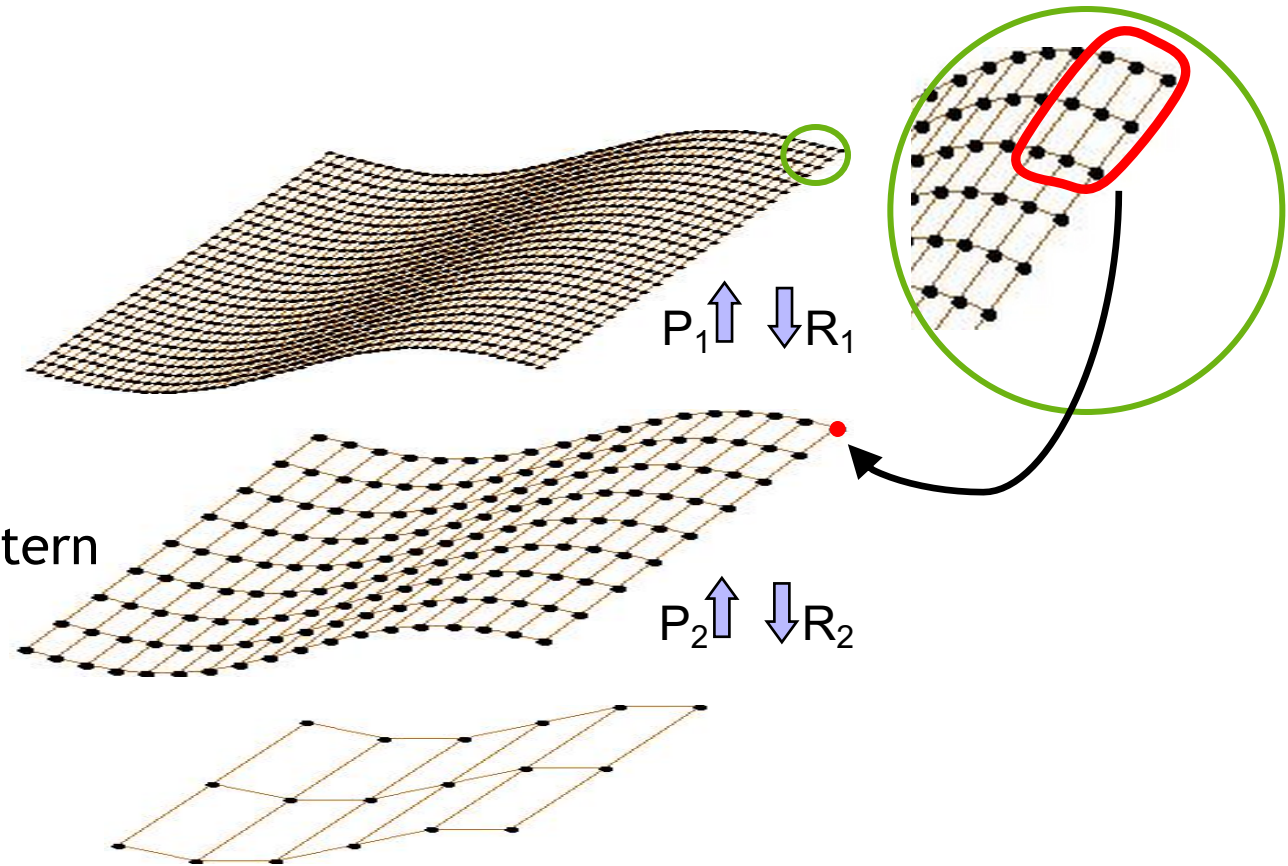
Use coarse A_k 's to accelerate convergence for A_0

Algebraic Multigrid (AMG)



Solve $A_0 u_0 = f_0$

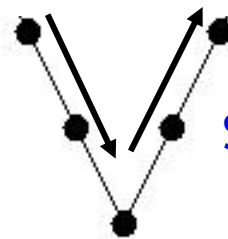
- Construct Graph & Coarsen
- Determine P_i & R_i sparsity pattern
- Determine P_i & R_i 's coefs
- Project: $A_i = R_i A_{i-1} P_i$



Relax $A_0 u_0 = f_0$. Set $f_1 = R_1 r_0$

Relax $A_1 u_1 = f_1$. Set $f_2 = R_2 r_1$

Solve $A_2 u_2 = f_2$ directly.



Set $u_0 = u_0 + P_1 u_1$. Relax $A_0 u_0 = f_0$

Set $u_1 = u_1 + P_2 u_2$. Relax $A_1 u_1 = f_1$

Algebraic MG behavior

- High & low frequencies not available algebraically.

These notions are replaced with $\| \cdot \|_{A_k}$ or $\| \cdot \|_{A_k^2}$

$\| e_k \|_{A_k}$ or $\| e_k \|_{A_k^2}$ small $\Rightarrow$ low frequency

$\| e_k \|_{A_k}$ or $\| e_k \|_{A_k^2}$ large $\Rightarrow$ high frequency

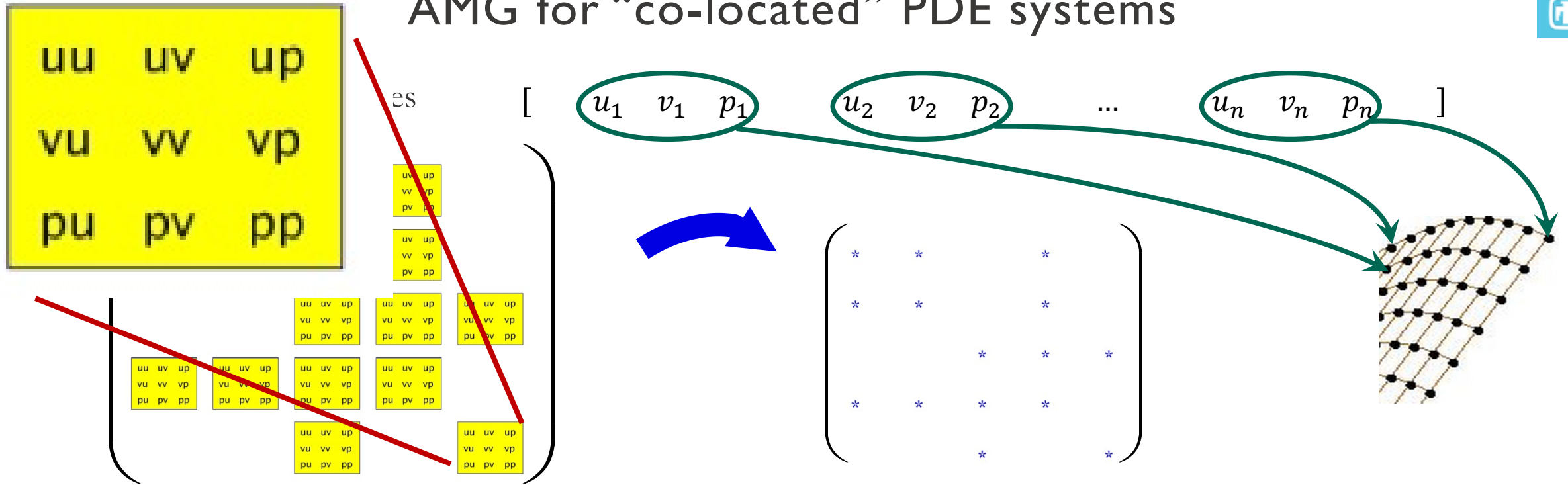
Properties of AMG methods

- relaxation smooths errors with high energy ($\| e_k \|_{A_k}$ large).
- P_k must accurately interpolate low energy errors (small $\| e_k \|_{A_k}$).
- P_k must interpolate errors not damped by smoothing.

Note:

$$\| v \|_A = \sqrt{v^T A v}$$

AMG for “co-located” PDE systems



- Most AMG software is setup in this block way & most PDE systems employing AMG are solved in this block way
- Transform point matrix graph to block matrix graph
- Coarsen block matrix graph
- Determine grid transfer sparsity pattern based on block matrix graph
- Grid transfer coefficients based on point matrix information

AMG challenges specific to mixed finite elements



- Cannot apply “co-located” approach to mixed FE system
- Inf-sup stability on coarse level A_i ’s ?
- Most AMG methods don’t *like* 0 ’s on matrix diagonal
 - e.g., • smoothed aggregation AMG performs a $[diag(A_i)]^{-1} A_i$ step, which is not defined when $diag(A_i)$ has zeros
 - classical AMG theory based on M-matrices, which we are far from
- AMG methods *tend* to generate interpolation *resembling* linear basis functions
- AMG methods *tend* to more aggressively coarsen dense rows
 - ⇒ velocities coarsen more rapidly than pressure

Auxiliary matrix & defect correction

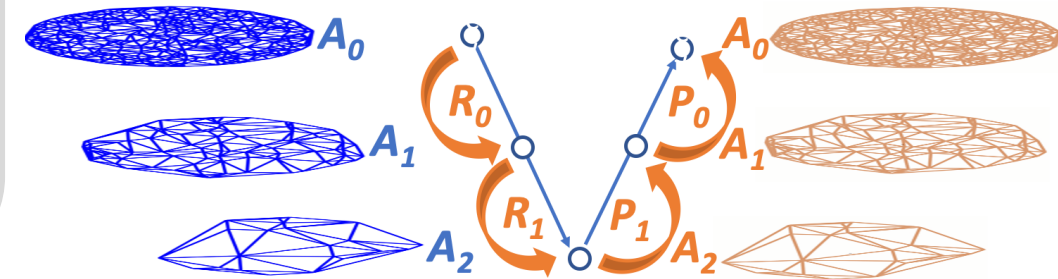
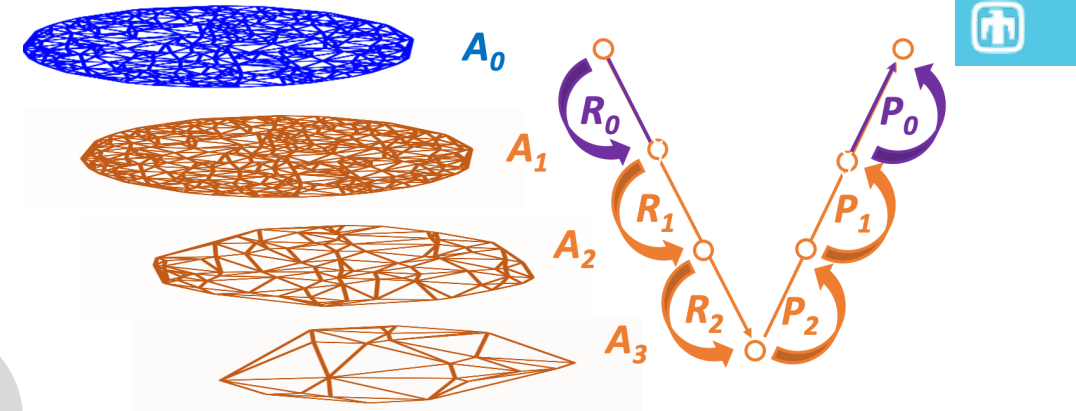
Since AMG prefers matrices based on low order discretizations, consider an auxiliary matrix approach ...

Auxiliary Methods

- 1) Devise preconditioner for A_0 by applying AMG to auxiliary operator A_1
- 2) Devise preconditioner for A_0 by generating AMG components (e.g., R_i or P_i) via algorithms applied to auxiliary operator A_0

Premise: Auxiliary operator is more amenable to AMG ideas than A_0

Not a new idea, e.g. high order discretizations (via defect correction methods), shifted Laplacians for Helmholtz & H-curl/H-div solvers



● Primary or projected matrix

● Special grid transfers: primary ↔ auxiliary

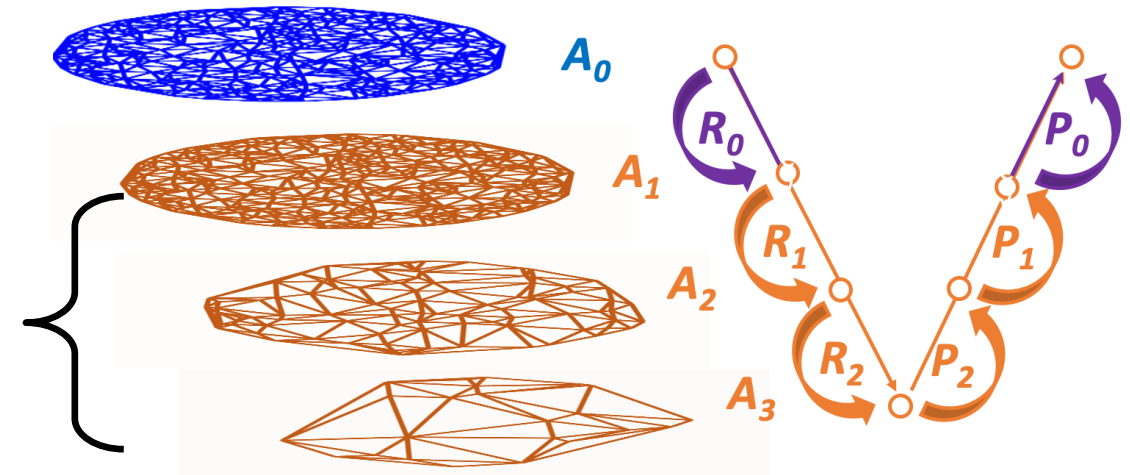
● Auxiliary or projected auxiliary matrix, grid transfer derived from auxiliary

Precondition via low-order FE discretization

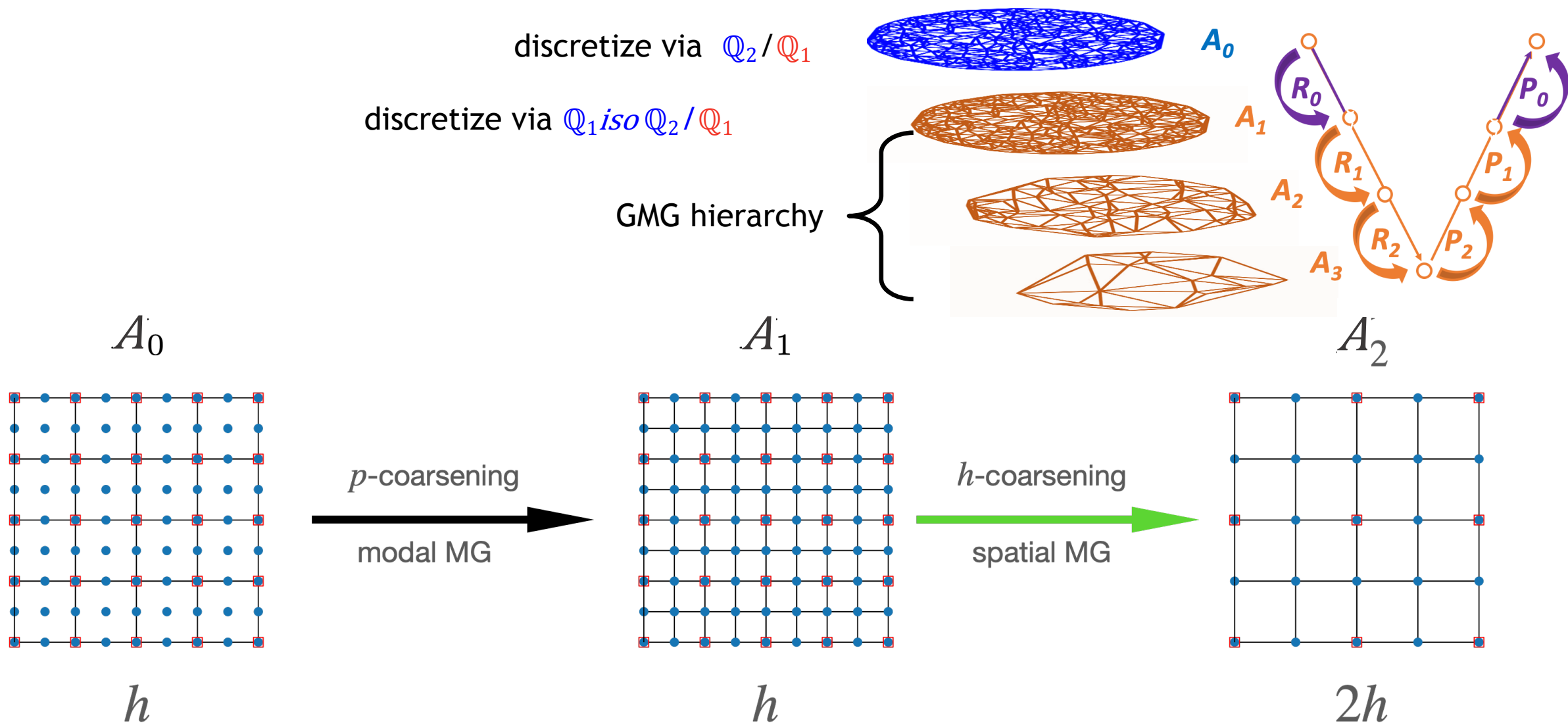


discretize via $\mathbb{Q}_2 / \mathbb{Q}_1$

discretize via $\cancel{\mathbb{Q}_1} / \mathbb{Q}_1$



1st Step: investigate idea via GMG



$$R_0 = I, P_0 = I, A_1 = \mathbb{Q}_1 \text{iso } \mathbb{Q}_2/\mathbb{Q}_1 \text{ Stokes discretization} \neq R_0 A_0 P_0$$

$$P_k \text{ based on linear interpolation for } k > 0, R_k = (P_k)^T \text{ \& } A_{k+1} = R_k A_k P_k \text{ for } k \geq 0$$

Q_2/Q_1 preconditioned via $Q_1 \text{iso } Q_2/Q_1 + \text{GMG}$



Need MG relaxation procedures

- Inexact Braess-Sarazin
- Additive Vanka

Special saddle point incompressible flow relaxation procedures that employ damping parameters

⇒ Fourier analysis to obtain damping parameters



$$A \delta x = \begin{bmatrix} G & \\ B & -S \end{bmatrix} \begin{bmatrix} I & G^{-1}B^T \\ & I \end{bmatrix} \begin{bmatrix} \delta_{\vec{u}} \\ \delta_p \end{bmatrix} = \begin{bmatrix} r_{\vec{u}} \\ r_p \end{bmatrix}$$

Solve

$$S\delta_p = BD^{-1}r_{\vec{u}} - \alpha \cdot r_p$$



Solved via weighted Jacobi iteration

$$\delta_{\vec{u}} = \frac{1}{\alpha} D^{-1} (r_{\vec{u}} - B^T \delta_p)$$



Solved via direct computation

introduces
Jacobi damping
factor, β

where

$$D = \text{diag}(G)$$

$$S = BD^{-1}B^T$$

correction damped via ω (i.e., $x \leftarrow x + \omega \delta x$)

$$A \delta x = \begin{bmatrix} G & B^T \\ B & 0 \end{bmatrix} \begin{bmatrix} \delta \vec{u} \\ \delta p \end{bmatrix} = \begin{bmatrix} r_{\vec{u}} \\ r_p \end{bmatrix}$$

$$\delta x = \sum_{i=1}^{N_p} (V_i^T W_i A_i^{-1} V_i) r,$$

where

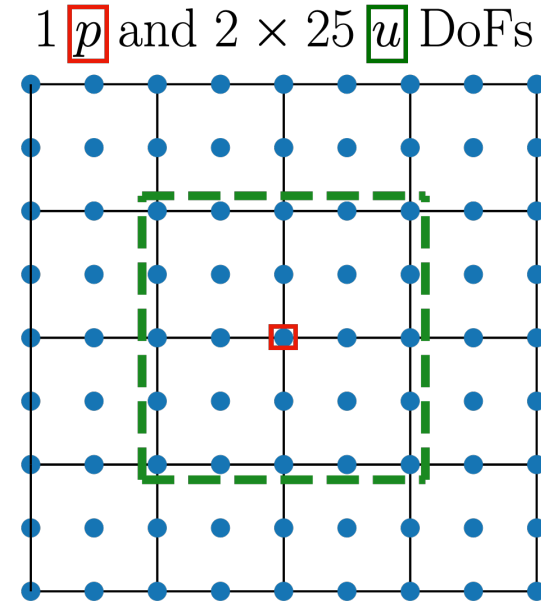
$$A_i = V_i A V_i^T$$

$$V_i = \{\text{Global DoF to } i^{\text{th}} \text{ patch restriction}\}$$

$$W_i = \{\text{diagonal weighting matrix}\}$$

$$w_i = 1 / (\# \text{ patches containing DoF } i)$$

correction damped via ω (i.e., $x \leftarrow x + \omega \delta x$)

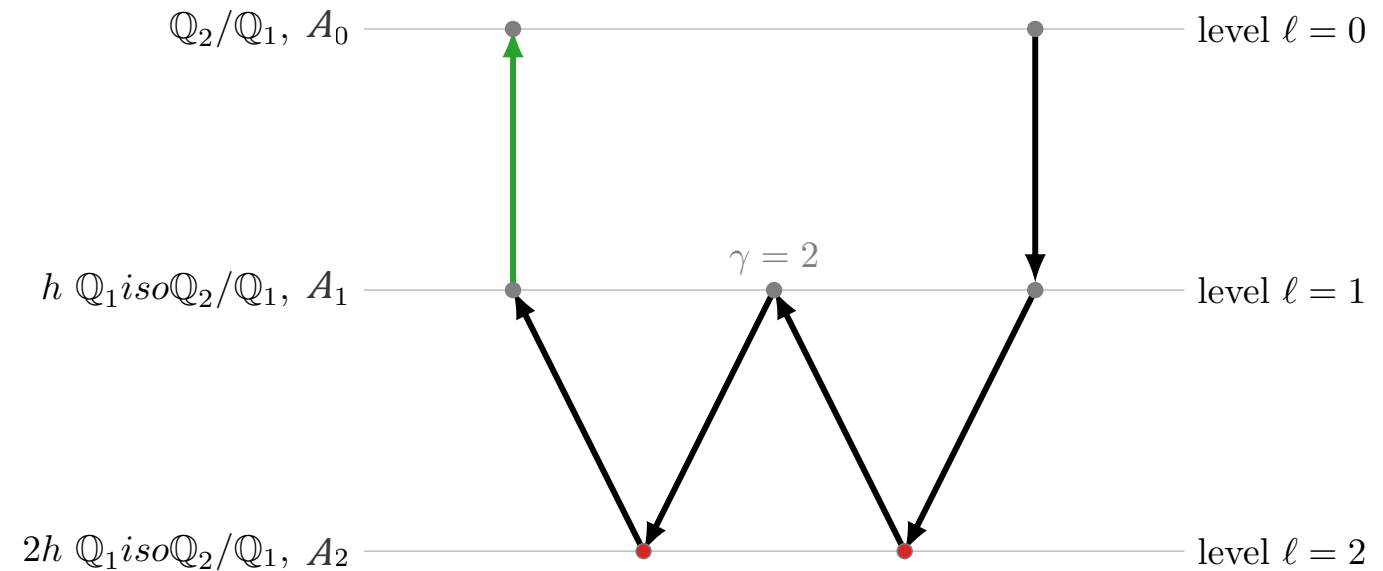




$$E = (I - \omega_0 M_0^{-1} A_0)^{\nu_2} (I - \tau (I - Z_1^\gamma) A_1^{-1} A_0) (I - \omega_0 M_0^{-1} A_0)^{\nu_1}$$

$$Z_1 = (I - \omega_1 M_1^{-1} A_1) (I - P A_2^{-1} R A_1) (I - \omega_1 M_1^{-1} A_1)$$

- Pre/Post relaxation (ν_1, ν_2)
- h -GMG cycles: γ
- Solution updates: τ , ω_0 and ω_1
- Relaxation for Q_2/Q_1 and $Q_1 \text{iso} Q_2/Q_1$
 - Braess-Sarazin: α , β



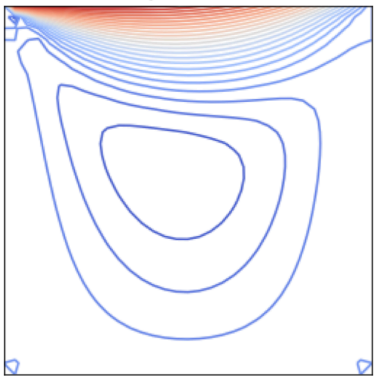
Use Local Fourier Analysis to find optimal parameters for 2-grid convergence

Q_2/Q_1 preconditioned via $Q_1 iso Q_2/Q_1$ + multilevel GMG

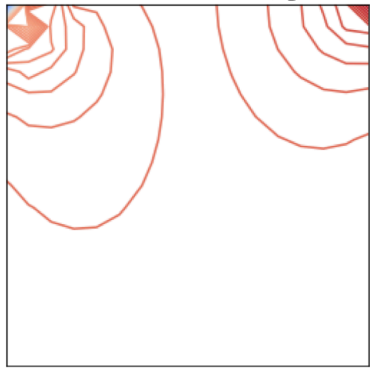


Lid Driven Cavity

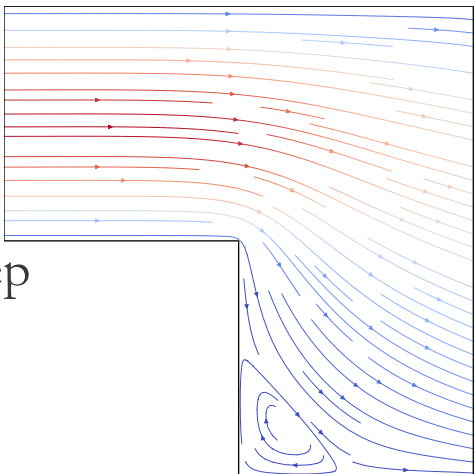
Velocity field, $\vec{u}$



Pressure field, p



Backward Facing Step



velocity field stream-plot

(ν_1, ν_2, γ)		ρ_{LFA}	Cycle	Measured		GMG		w/ FGMRES	
				ρ^P	ρ^D	m^P	m	m^P	m
BS	(1, 0, 1)	.18	V	.17	.20	13	14	12	12
			W	.17	.17	13	13	12	12
	(1, 1, 1)	.09	V	.25	.55	13	33	9	11
			W	.08	.08	9	10	8	9
V	(1, 0, 2)	.21	V	.19	.20	14	14	10	11
			W	.19	.20	14	14	10	10
	(1, 1, 1)	.29	V	.99	.53	100+	30	24	17
			W	.33	.30	18	17	15	15

FGMRES iterations for Method, (ν_1, ν_2, γ)					
		BS, $(1, 1, 1)$		V, $(1, 0, 2)$	
DoFs	GMG levels	V-cycle	W-cycle	V-cycle	W-cycle
515	2	10	10	11	11
1891	3	10	10	11	11
7235	4	11	10	11	11
28 291	5	12	10	11	11
111 875	6	13	9	12	11
444 931	7	14	9	12	11

Toward AMG for Q_1 *iso* Q_2/Q_1 preconditioners to Q_2/Q_1



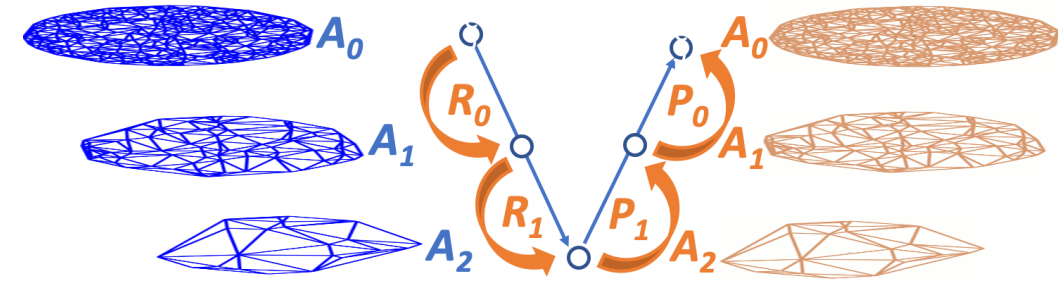
- Cannot apply “co-located” approach to mixed FE system
- Inf-sup stability on coarse level A_i ’s ?
- Most AMG methods don’t *like* 0 ’s on matrix diagonal
- ✓ ~~AMG methods *tend* to generate interpolation *resembling* linear basis functions~~
- ✓ ~~Velocities coarsen more rapidly than pressure~~
- Fourier analysis not directly applicable to AMG

wrap smoothers within GMRES to choose damping parameters (at least good for Vanka).
Could use Chebyshev smoothing.

AMG for Q_1 iso Q_2/Q_1 preconditioner to Q_2/Q_1



- Cannot apply “co-located” approach to mixed FE system
- Inf-sup stability on coarse level A_i ’s ?
- Most AMG methods don’t like 0’s on matrix diagonal



Recall 2nd auxiliary approach ...

Devise preconditioner for A_0 by generating AMG component (e.g., R_i or P_i) via algorithms applied to aux. op. A_i

For **only** the purpose of generating grid transfer operators apply AMG to

$$\begin{pmatrix} \bar{G} \\ W \end{pmatrix}$$

where

$\bar{G}$ is (1,1) block of A_1 (Q_1 discretization of velocities on refined mesh)

$W = B B^T$ or $W = A_p$ (pressure Laplacian)

GMRES + AMG applied to lid driven cavity Stokes on Quad mesh

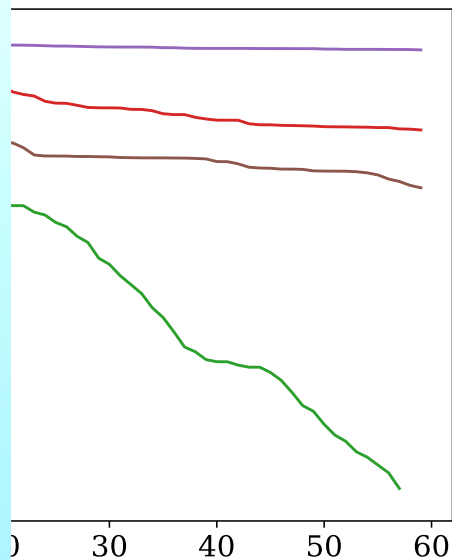


preliminary

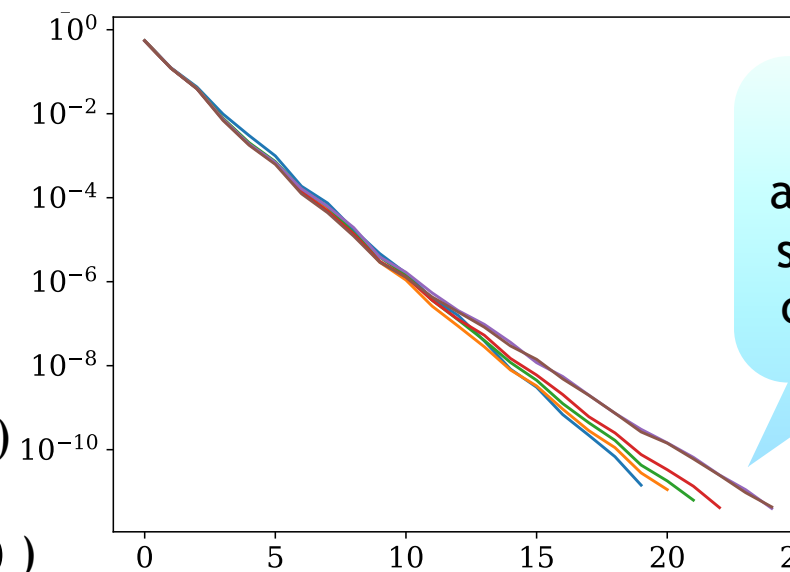
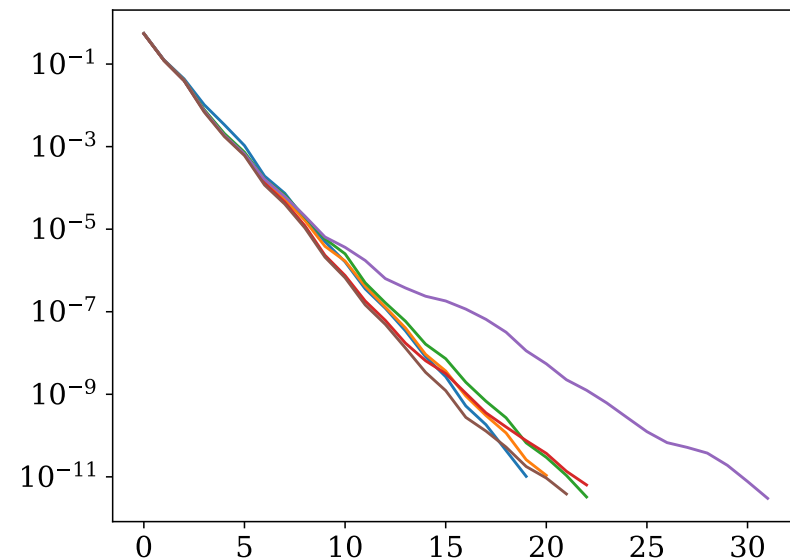
$$BG^{-1}B^T q = \lambda Q_p q$$

level	λ_1	$\lambda_{\max}$
0	$\approx 1/5$	1.
1	.157	.95
2	.003	.69
3	≈ 0	.38

Q_2/Q_1



$Q_1 \text{ iso } Q_2/Q_1$



Different aggregation scheme for coarsening

- NEx=64, $\#v_x/\#p = [4.0, 2.1]$
- NEx=128, $\#v_x/\#p = [4.0, 2.1, 0.7]$
- NEx=256, $\#v_x/\#p = [4.0, 2.2, 0.7]$
- NEx=512, $\#v_x/\#p = [4.0, 2.2, 0.7, .3]$
- NEx=600, $\#v_x/\#p = [4.0, 2.2, 0.7, .3]$

Algo. Details

pressure: aggregation uses A_p , interp coefficients via Emin-AMG($B B^T$)

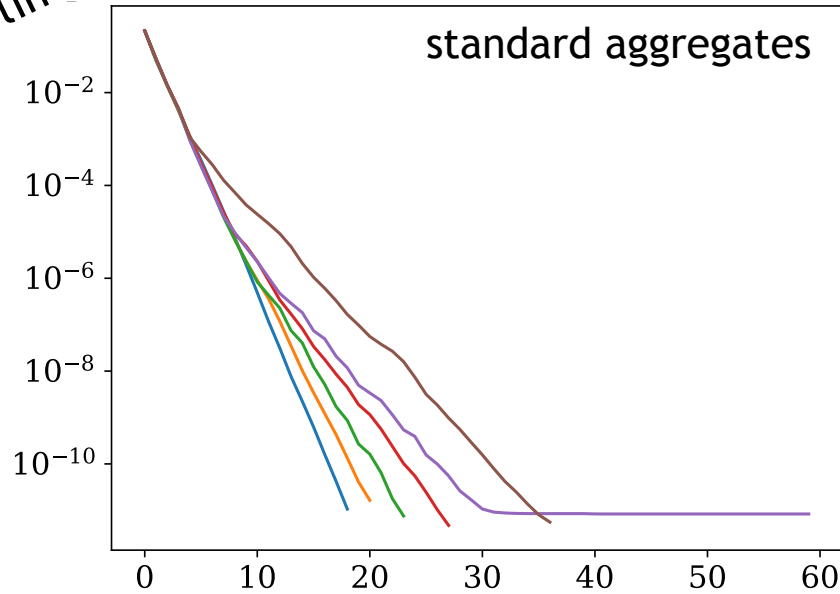
velocity: aggregation uses $\bar{G}$, interp coefficients via SA-AMG ($\bar{G}$)

V(2,2) cycle, 2 its of GMRES(Vanka with $\omega = .77$ (left) or $.35$ (right))

FGMRES(AMG($\mathbb{P}_1$ iso $\mathbb{P}_2/\mathbb{P}_1$)): Triangular Element

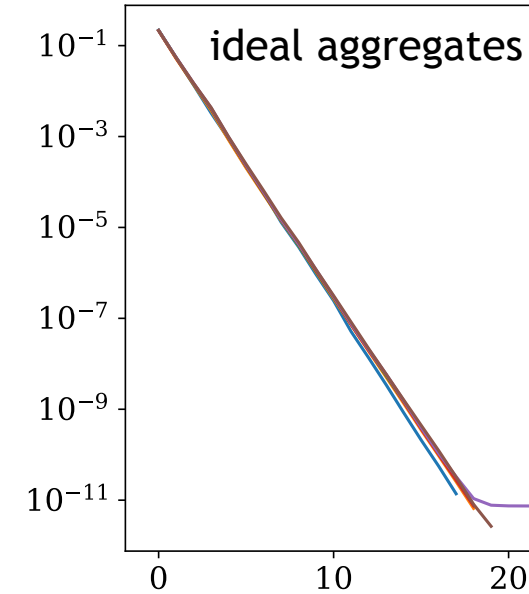


preliminary

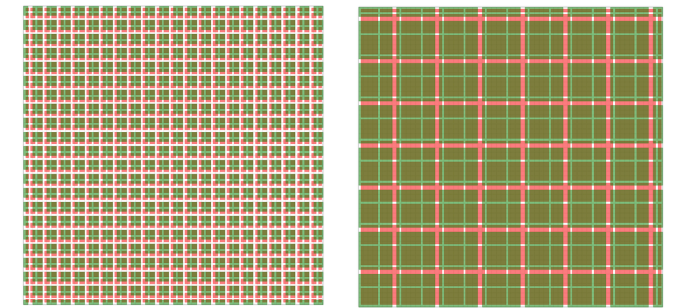


- NEx=32, $\#v_x/\#p = [4.0, 3.5]$
- NEx=64, $\#v_x/\#p = [4.0, 3.8, 3.0]$
- NEx=128, $\#v_x/\#p = [4.0, 3.9, 3.3]$
- NEx=256, $\#v_x/\#p = [4.0, 4.0, 3.3, 2.3]$
- NEx=512, $\#v_x/\#p = [4.0, 4.0, 3.3, 2.3]$
- NEx=600, $\#v_x/\#p = [4.0, 4.0, 3.3, 2.4]$

different aggregation schemes



- NEx=32, $\#v_x/\#p = [4.0, 4.0]$
- NEx=64, $\#v_x/\#p = [4.0, 3.8, 3.5]$
- NEx=128, $\#v_x/\#p = [4.0, 4.0, 3.7]$
- NEx=256, $\#v_x/\#p = [4.0, 4.0, 3.9, 3.6]$
- NEx=512, $\#v_x/\#p = [4.0, 4.0, 4.0, 4.0, 3.4]$
- NEx=600, $\#v_x/\#p = [4.0, 4.0, 4.0, 3.8, 3.5]$



Algo. Details

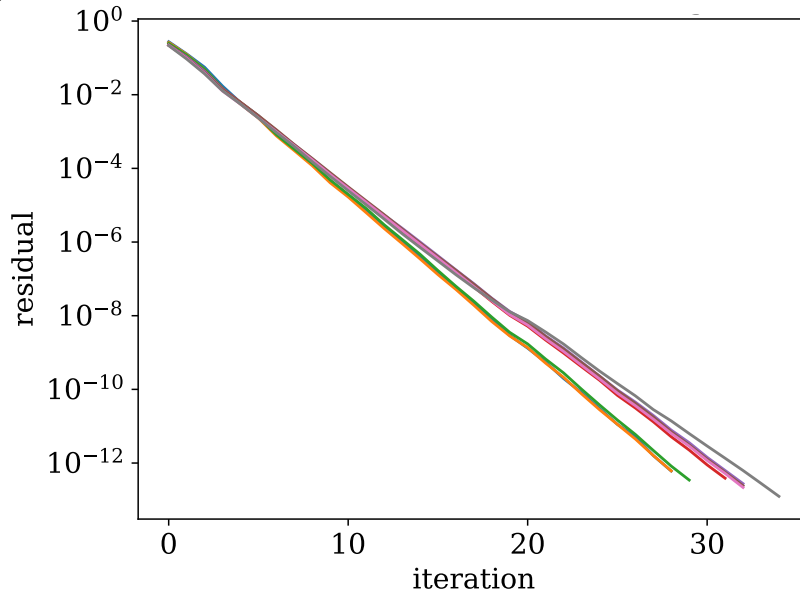
pressure: aggregation uses A_p , interp coefficients via Emin-AMG($B B^T$)

velocity: aggregation uses $\bar{G}$, interp coefficients via SA-AMG ($\bar{G}$)

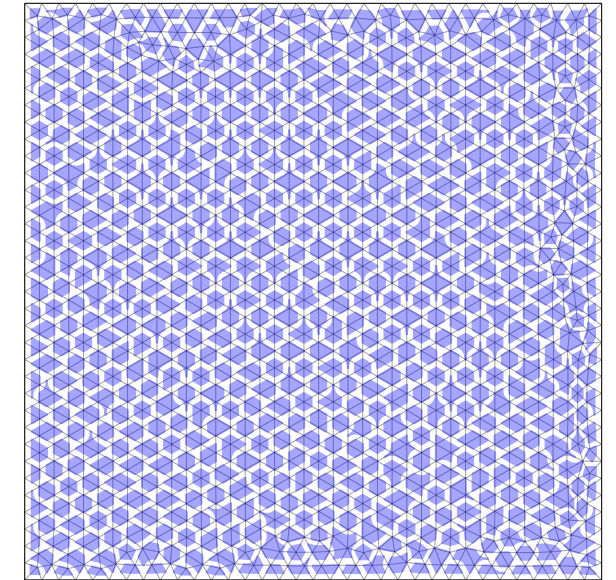
V(2,2) cycle, Vanka relaxation



some cherry picking
involved



DoFs=4442,mg(lvls=2)	DoFs=132469,mg(lvls=3)
DoFs=12655,mg(lvls=2)	DoFs=214256,mg(lvls=3)
DoFs=26720,mg(lvls=2)	DoFs=418577,mg(lvls=3)
DoFs=105637,mg(lvls=3)	DoFs=1164451,mg(lvls=4)



sample aggregates

Algo. Details

pressure: aggregation uses A_p , interp coefficients via SA-AMG($B B^T$), evolution strength measure (tuned)

velocity: aggregation uses $\bar{G}$, interp coefficients via Emin-AMG ($\bar{G}$), sym. evolution strength measure (tuned)

V(2,2) cycle, Vanka with $\omega = .29$

Conclusion



- Direct application of AMG to $\mathbb{Q}_2/\mathbb{Q}_1$ is problematic
 - Loss of mesh independent convergence
- Use of $\mathbb{Q}_1\text{iso}\mathbb{Q}_2/\mathbb{Q}_1$ system to precondition $\mathbb{Q}_2/\mathbb{Q}_1$ formulation facilitates AMG use
 - Not perfect, but much closer to mesh independence
- Some issues remain with applying AMG to $\mathbb{Q}_1\text{iso}\mathbb{Q}_2/\mathbb{Q}_1$ system
- Careful examination of aggregation algorithms may help improve scalability
 - Should aggregation of pressure dofs & velocity dofs be correlated?
- Inf-sup guarantees would be nice on coarse grids ...