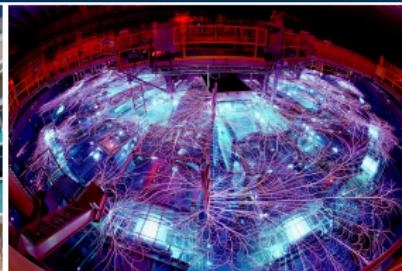


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SAND2017-1892C



Multiphysics Preconditioning with the MueLu Multigrid Library

Tobias Wiesner, R.S. Tuminaro, E.C. Cyr, J. Shadid, J.J. Hu

February 20, 2017

Motivation

What is the problem?

- **Multiphysics problems:** *application-specific* with *increasing complexity* through new types of physics and/or discretizations
- No resource-efficient *general* black-box solver available

What can we do about this?

Flexible software framework for iterative solvers/preconditioners

- Modular design for application-specific solver layouts
- Usability through simplified user interfaces for non-experts

Representation of fully-coupled multiphysics problems

Blocked linear operator

- Single-field problems represented by diagonal blocks

Example: 3×3 blocked operator

$$A = \begin{pmatrix} \text{dark red} & \text{white} & \text{white} \\ \text{white} & \text{dark red} & \text{white} \\ \text{white} & \text{white} & \text{dark red} \end{pmatrix}$$

Representation of fully-coupled multiphysics problems

Blocked linear operator

- Single-field problems represented by diagonal blocks
- Coupling represented by off-diagonal blocks

Example: 3×3 blocked operator

$$A = \begin{pmatrix} \text{dark red} & \text{light gray} & \text{light gray} \\ \text{light gray} & \text{dark red} & \text{light gray} \\ \text{light gray} & \text{light gray} & \text{light red} \end{pmatrix}$$

Representation of fully-coupled multiphysics problems

Blocked linear operator

- Single-field problems represented by diagonal blocks
- Coupling represented by off-diagonal blocks
- Nested blocked operators for hierarchical dependencies

Example: 2×2 blocked operator with nested 2×2 blocked operator

$$A = \begin{pmatrix} \text{Red} & \text{Grey} & \text{Grey} \\ \text{Grey} & \text{Red} & \text{Grey} \\ \text{Grey} & \text{Grey} & \text{Red} \end{pmatrix}$$

Representation of fully-coupled multiphysics problems

Blocked linear operator

- Single-field problems represented by diagonal blocks
- Coupling represented by off-diagonal blocks
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Example: 2×2 blocked operator with nested 2×2 blocked operator

$$A = \begin{pmatrix} \text{Red} & \text{Grey} & \text{Grey} \\ \text{Grey} & \text{Red} & \text{Grey} \\ \text{Grey} & \text{Grey} & \text{Red} \end{pmatrix}$$

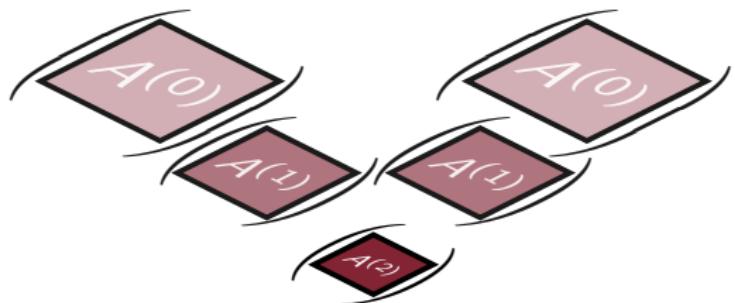
How to design efficient multigrid preconditioners for multiphysics problems?

Idea of Algebraic Multigrid Methods

Multigrid method

Transfer operators + Level smoothers

- Generate **coarse representations** $A^{(i)}$ of fine level problem $A^{(0)}$

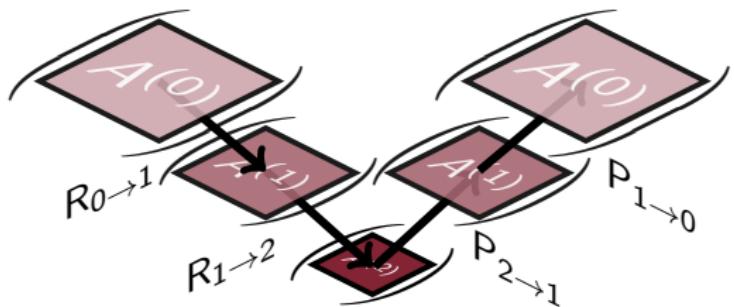


Idea of Algebraic Multigrid Methods

Multigrid method

Transfer operators + Level smoothers

- Generate **coarse representations** $A^{(i)}$ of fine level problem $A^{(0)}$ using $A^{(i+1)} = R_{i \rightarrow (i+1)} A^{(i)} P_{(i+1) \rightarrow i}$
- Rectangular transfer operators $P_{(i+1) \rightarrow i}$ and $R_{i \rightarrow (i+1)}$

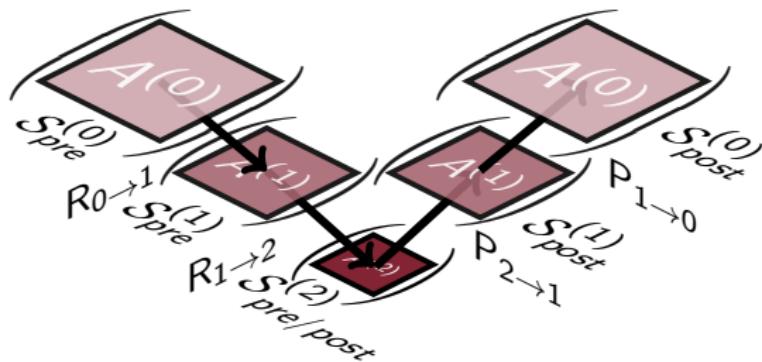


Idea of Algebraic Multigrid Methods

Multigrid method

Transfer operators + **Level smoothers**

- Generate **coarse representations** $A^{(i)}$ of fine level problem $A^{(0)}$ using $A^{(i+1)} = R_{i \rightarrow (i+1)} A^{(i)} P_{(i+1) \rightarrow i}$
- Rectangular **transfer operators** $P_{(i+1) \rightarrow i}$ and $R_{i \rightarrow (i+1)}$
- **Level smoothers** $S^{(i)}$ damp high-oscillatory error modes



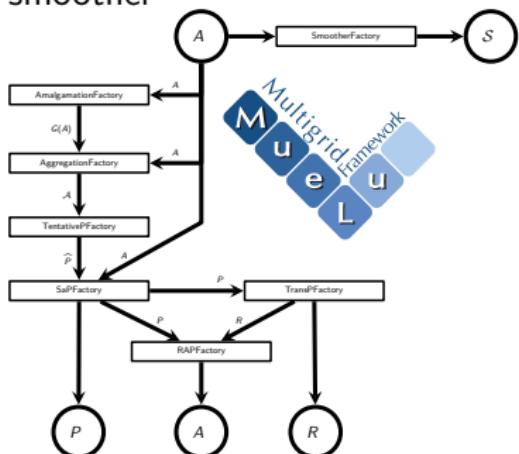
MueLu – The Trilinos Multigrid framework

MueLu multigrid framework:

- Extensible software layout
 - Modularity: Preconditioner layout defined by small building blocks
 - Logic: Building blocks connected through logical data dependencies
- Flexible user input system through XML files
- Designed for next-generation HPC systems

www.trilinos.org/packages/muelu

Example: Building blocks for transfer operators and level smoother

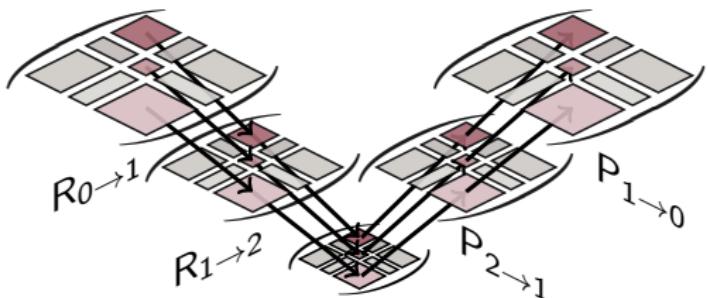


Multigrid preconditioner layout for multiphysics

Multigrid for multiphysics

Transfer operators + Level smoothers + Coupling

- Segregated transfer operators P and R to keep algebraic blocks separate on coarse levels

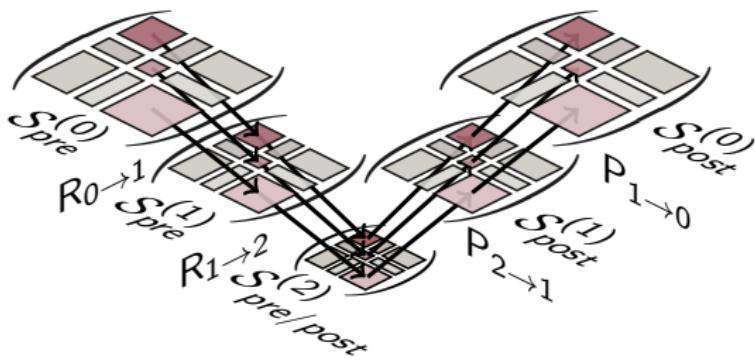


Multigrid preconditioner layout for multiphysics

Multigrid for multiphysics

Transfer operators + **Level smoothers** + **Coupling**

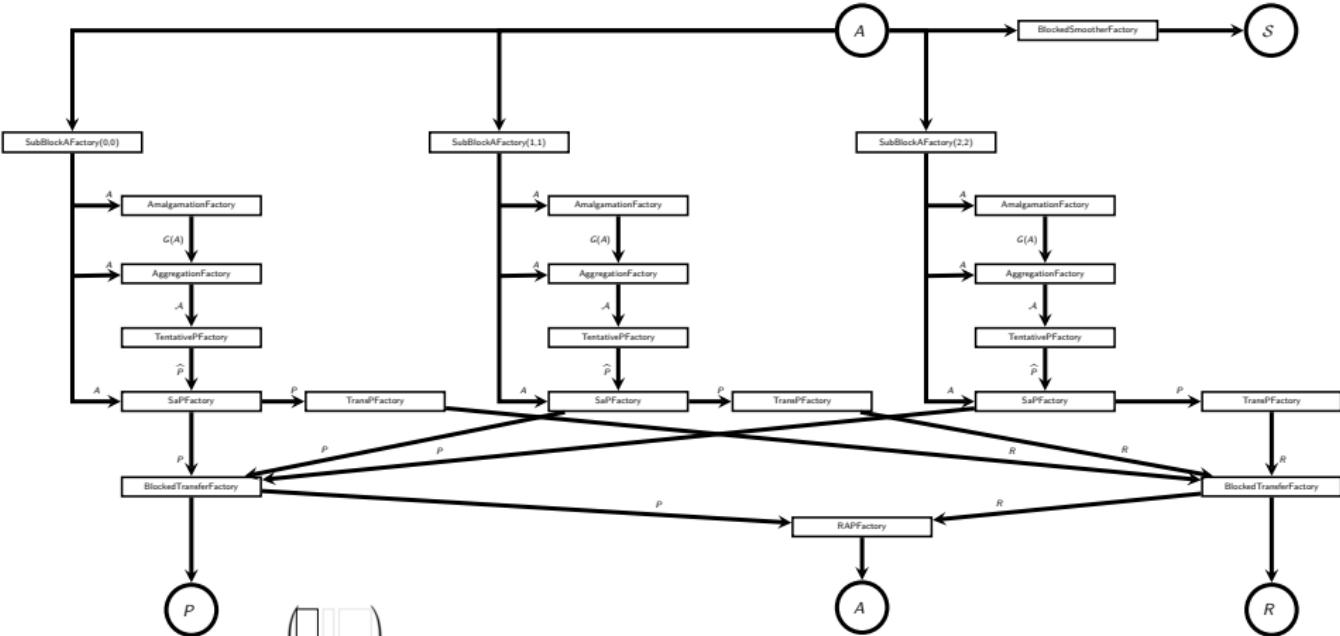
- Segregated transfer operators P and R to keep algebraic blocks separate on coarse levels
- Nested block smoothers consider coupling of different fields



Segregated transfer operators

Transition from level i to $i + 1$:

$$A_i = \begin{pmatrix} \text{Red} & \text{Grey} & \text{Grey} \\ \text{Grey} & \text{Red} & \text{Grey} \\ \text{Grey} & \text{Grey} & \text{Red} \end{pmatrix}$$



$$P_{(i+1) \rightarrow i} = \begin{pmatrix} \text{Red} & \text{Grey} & \text{Grey} \\ \text{Grey} & \text{Red} & \text{Grey} \\ \text{Grey} & \text{Grey} & \text{Red} \end{pmatrix}$$

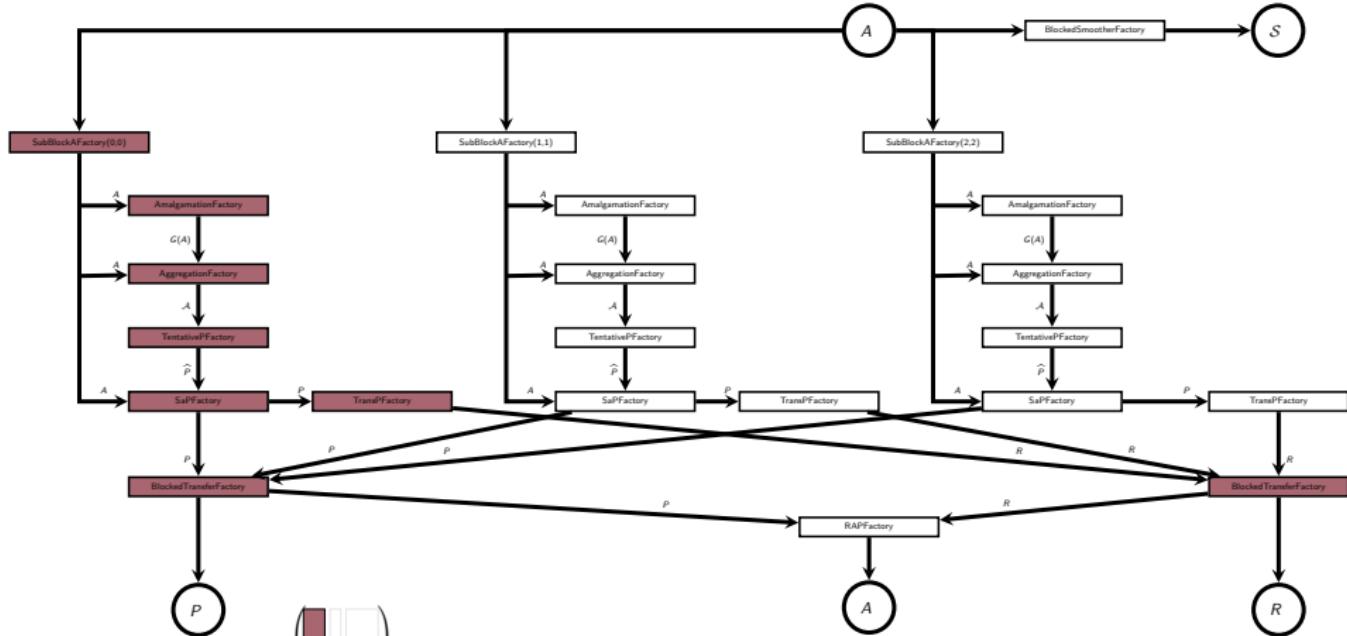
$$A_{i+1} = \begin{pmatrix} \text{Red} & \text{Grey} & \text{Grey} \\ \text{Grey} & \text{Red} & \text{Grey} \\ \text{Grey} & \text{Grey} & \text{Red} \end{pmatrix}$$

$$R_{i \rightarrow (i+1)} = \begin{pmatrix} \text{Red} & \text{Grey} & \text{Grey} \\ \text{Grey} & \text{Red} & \text{Grey} \\ \text{Grey} & \text{Grey} & \text{Red} \end{pmatrix}$$

Segregated transfer operators

Transition from level i to $i + 1$:

$$A_i = \begin{pmatrix} \text{Red} & \square & \square \\ \square & \square & \square \\ \square & \square & \square \end{pmatrix}$$



$$P_{(i+1) \rightarrow i} = \begin{pmatrix} \text{Red} & \square & \square \\ \square & \square & \square \\ \square & \square & \square \end{pmatrix}$$

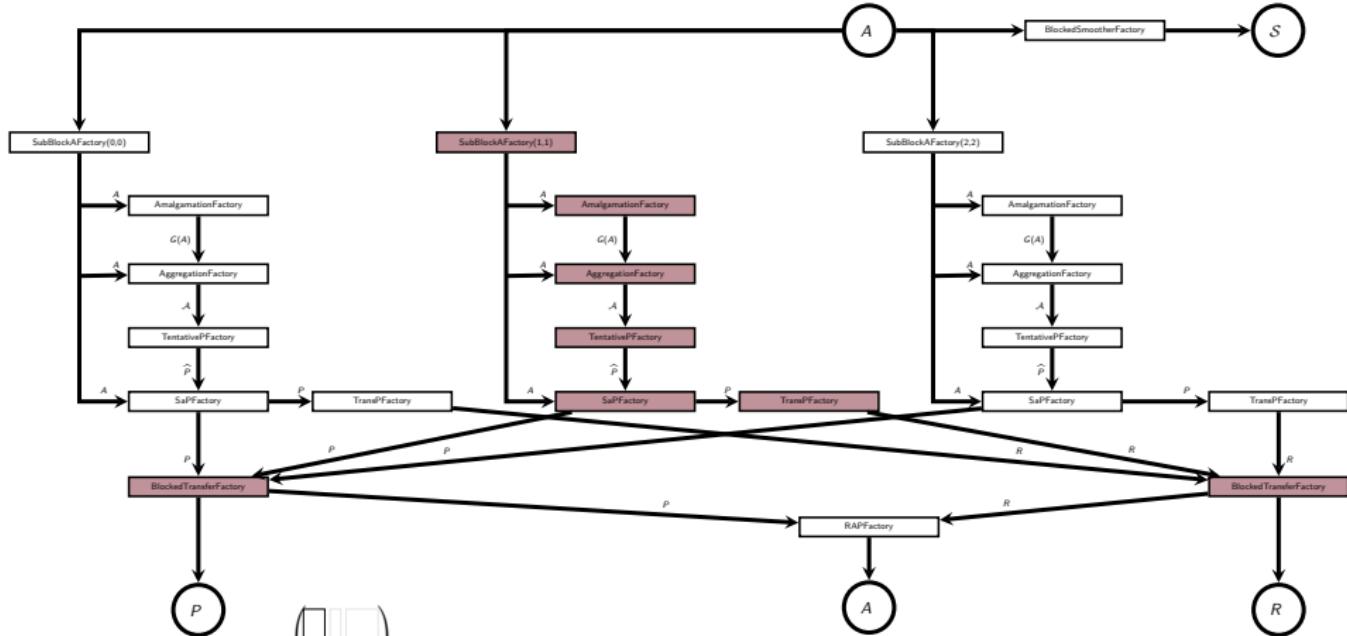
$$A_{i+1} = \begin{pmatrix} \text{Red} & \text{Red} & \square \\ \text{Red} & \text{Red} & \square \\ \square & \square & \square \end{pmatrix}$$

$$R_{i \rightarrow (i+1)} = \begin{pmatrix} \text{Red} & \square & \square \\ \square & \square & \square \\ \square & \square & \square \end{pmatrix}$$

Segregated transfer operators

Transition from level i to $i + 1$:

$$A_i = \begin{pmatrix} \square & \square & \square \\ \square & \blacksquare & \square \\ \square & \square & \square \end{pmatrix}$$



$$P_{(i+1) \rightarrow i} = \begin{pmatrix} \square & \square & \blacksquare \\ \square & \square & \square \\ \square & \square & \square \end{pmatrix}$$

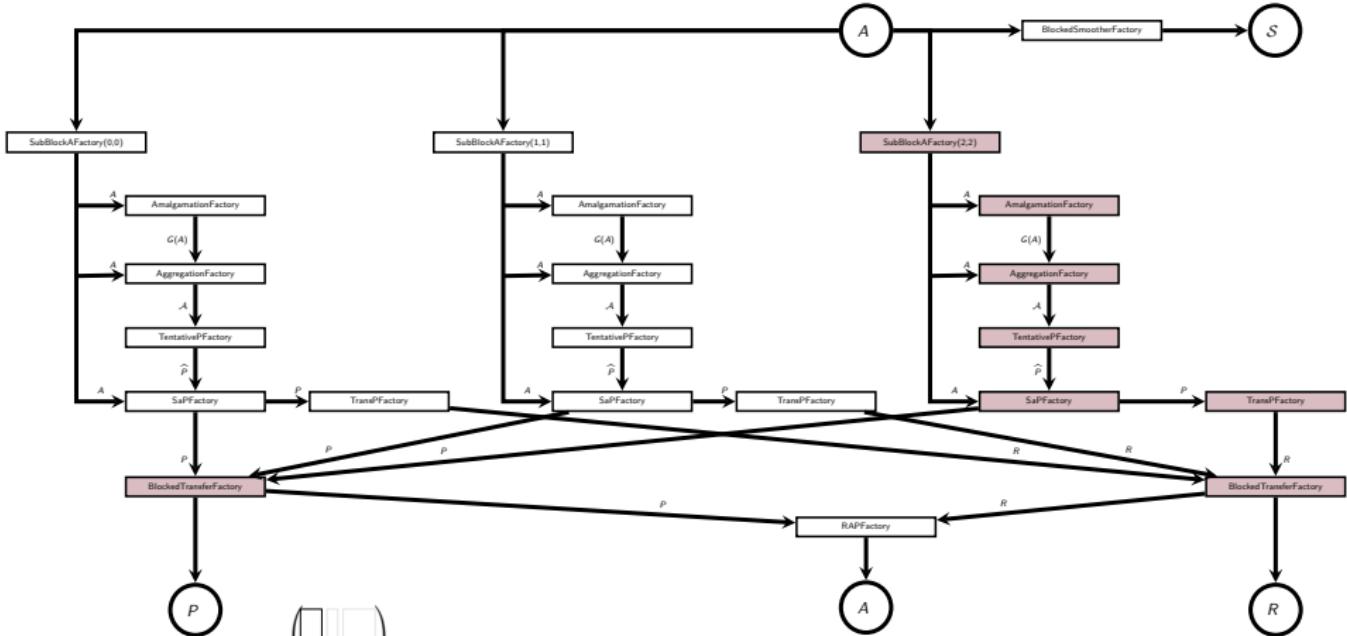
$$A_{i+1} = \begin{pmatrix} \square & \square & \square \\ \square & \blacksquare & \square \\ \square & \square & \square \end{pmatrix}$$

$$R_{i \rightarrow (i+1)} = \begin{pmatrix} \square & \square & \square \\ \square & \blacksquare & \square \\ \square & \square & \square \end{pmatrix}$$

Segregated transfer operators

Transition from level i to $i + 1$:

$$A_i = \begin{pmatrix} \square & \square & \square \\ \square & \square & \square \\ \square & \square & \square \end{pmatrix}$$



$$P_{(i+1) \rightarrow i} = \begin{pmatrix} \square & \square & \square \\ \square & \square & \square \\ \square & \square & \square \end{pmatrix}$$

$$A_{i+1} = \begin{pmatrix} \square & \square & \square \\ \square & \square & \square \\ \square & \square & \square \end{pmatrix}$$

$$R_{i \rightarrow (i+1)} = \begin{pmatrix} \square & \square & \square \\ \square & \square & \square \\ \square & \square & \square \end{pmatrix}$$

Block smoothers

Pool of block smoothers

- General $n \times n$ block systems: Blocked Gauss-Seidel smoother
- General 2×2 block systems: SIMPLE, Uzawa, Braess-Sarazin
- Physics-based block smoothers from the Teko package

Build your application-specific block smoother

- Consider the coupling blocks when designing the block smoother

$$A = \begin{pmatrix} \text{Red block} & \text{Grey block} & \text{Grey block} \\ \text{Grey block} & \text{Red block} & \text{Grey block} \\ \text{Grey block} & \text{Grey block} & \text{Red block} \end{pmatrix}$$

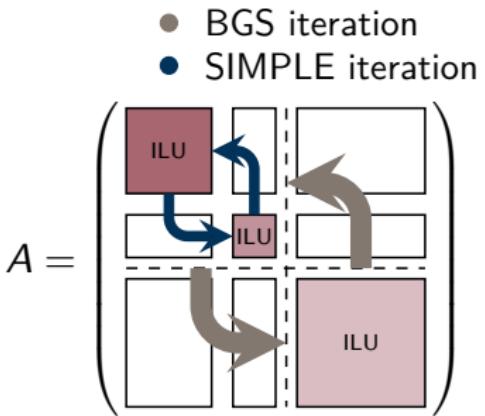
Block smoothers

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- General $n \times n$ block systems: Blocked Gauss-Seidel smoother
- General 2×2 block systems: SIMPLE, Uzawa, Braess-Sarazin
- Physics-based block smoothers from the Teko package

Build your application-specific block smoother

- Consider the coupling blocks when designing the block smoother
- Use nested block smoothers:
 - 1 BGS (0.5)
 - 1 SIMPLE (0.8)
 - ILU(0), ov=1
 - ILU(0), ov=1
 - ILU(0), ov=1



Resistive Magnetohydrodynamics

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

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

with appropriate initial and boundary conditions.

Discretization

Stabilized discretization of MHD equations using equal order piecewise bilinear elements on hexahedrons

Reference solver

Discretization

Stabilized discretization of MHD equations using equal order piecewise bilinear elements on hexahedrons

⇒ Collocated solution unknowns ($\mathbf{u}_x, \mathbf{u}_y, \mathbf{u}_z, p, \mathbf{B}_x, \mathbf{B}_y, \mathbf{B}_z, r$) on each mesh node

Reference solver

- Preconditioned GMRES (from Belos or AztecOO package)
- Fully-coupled MueLu multigrid preconditioner
 - 8 DOFs per node
 - Level smoother: Additive Schwarz (overlap=1) with ILU(0)
 - Non-smoothed transfer operators

P.T. Lin, J.N. Shadid, R.S. Tuminaro, M. Sala, G.L. Hennigan, R.P. Pawlowski; *A parallel fully coupled algebraic multilevel preconditioner applied to multiphysics PDE applications: Drift-diffusion, flow/transport/reaction, resistive MHD*; Int. J. Numer. Meth. Fluids, 64,1148-1179; 2010

J.N. Shadid, R.P. Pawlowski, E.C. Cyr, R.S. Tuminaro, L. Chacon, P.D. Weber; *Scalable implicit incompressible resistive MHD with stabilized FE and fully-coupled Newton-Krylov-AMG*; Comput. Methods Appl. Mech. Engrg., 304, 1-25; 2016

Block multigrid preconditioner

Incompressible resistive MHD equations:

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

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

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

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

Block structure of linear systems after discretization:

$$A = \begin{pmatrix} \text{Red Block} & \text{Grey Block} \\ \text{Grey Block} & \text{Red Block} \end{pmatrix}$$

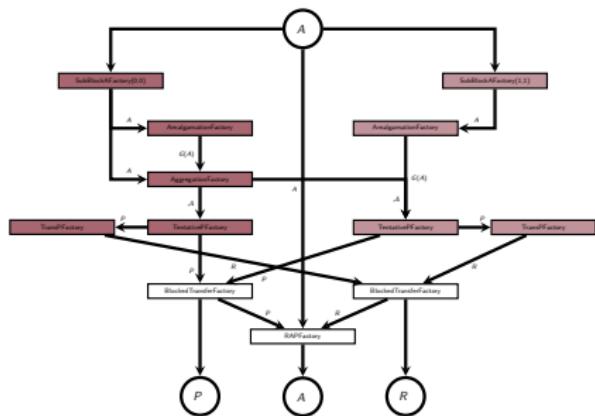
- 2×2 block system with 4 DOFs per node each block
- Solution variables: $(\mathbf{u}_x, \mathbf{u}_y, \mathbf{u}_z, p)$ and $(\mathbf{B}_x, \mathbf{B}_y, \mathbf{B}_z, r)$

Block multigrid preconditioner for MHD

Design principles:

- Preserve coincidence of MHD unknowns on coarse levels
- Reduce memory footprint by avoiding global ILU smoothers
- Performance through ILU as single-field smoothers

Solver layout:



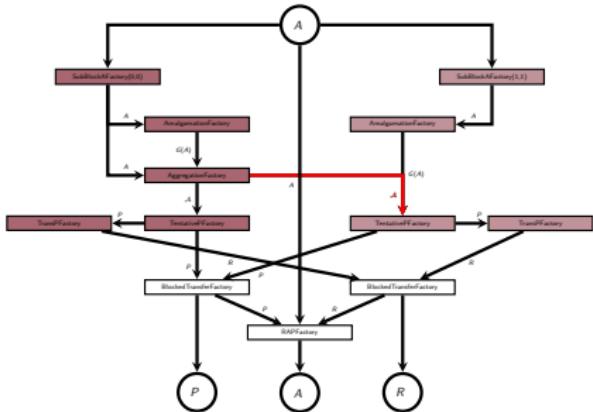
- Reuse aggregates \mathcal{A} from Navier-Stokes part for magnetics part
- Non-smoothed transfer ops.
- Block smoother: n BGS(ω)
 - ILU(0), ov=1
 - ILU(0), ov=1

Block multigrid preconditioner for MHD

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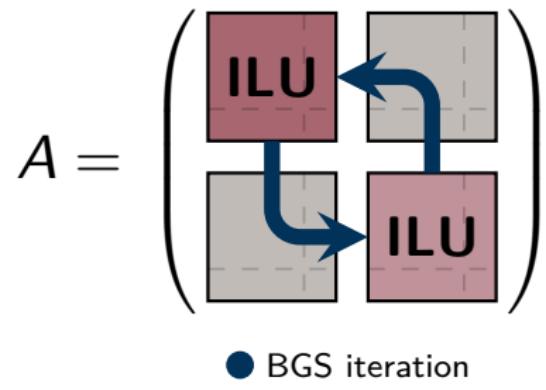
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Block multigrid preconditioner for MHD

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Block smoother:



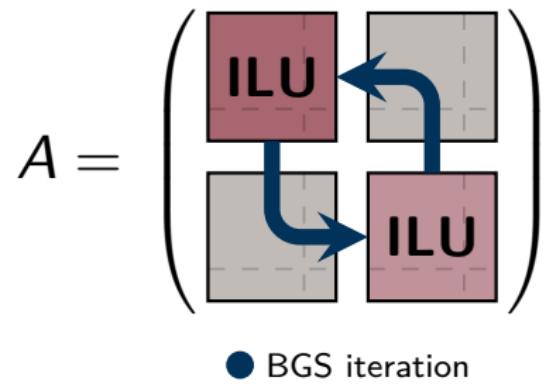
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Block multigrid preconditioner for MHD

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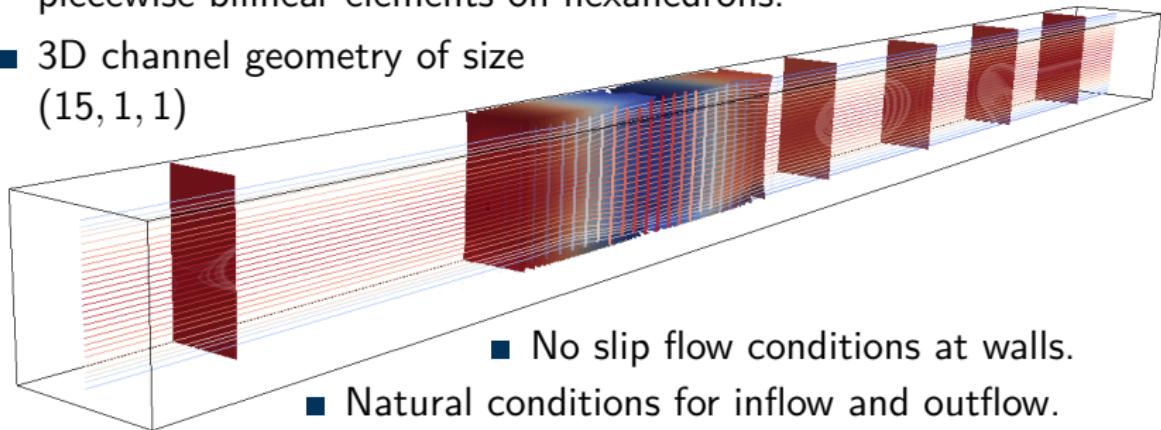
Block smoother:



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- Non-smoothed transfer ops.
- Block smoother:
 n BGS(ω)
 - ILU(0), ov=1
 - ILU(0), ov=1

MHD generator problem

- Stabilized discretization of MHD equations using equal order piecewise bilinear elements on hexahedrons.
- 3D channel geometry of size (15, 1, 1)



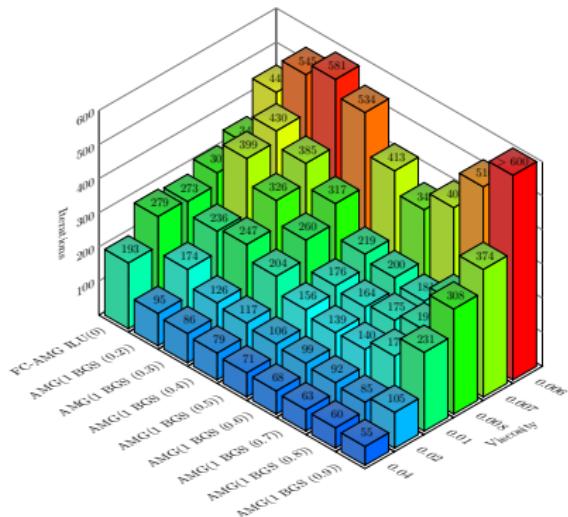
$$\begin{bmatrix} B_x \\ B_y \\ B_z \end{bmatrix} = \begin{bmatrix} 0 \\ \frac{1}{2}B_0(\tanh(x - x_0)/\Delta - \tanh(x - x_f)/\Delta) \end{bmatrix}$$

with $x_0 = 4.0$, $x_f = 6.0$, $\Delta = 0.5$ and $B_0 = 3.354$.

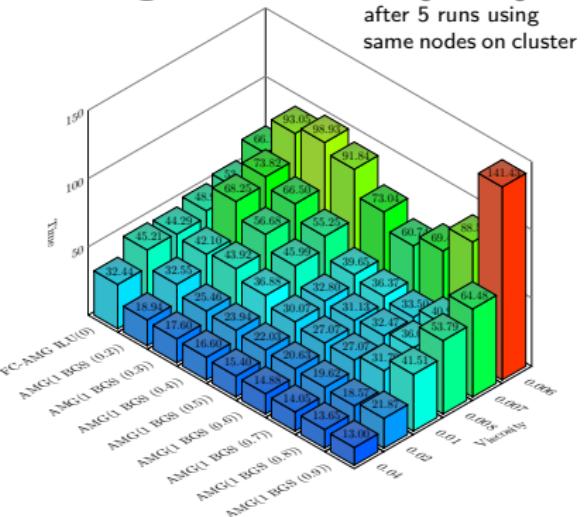
MHD generator problem – results

$240 \times 16 \times 16$ mesh on 32 processors

Iterations:



Timings:



Multigrid hierarchy:

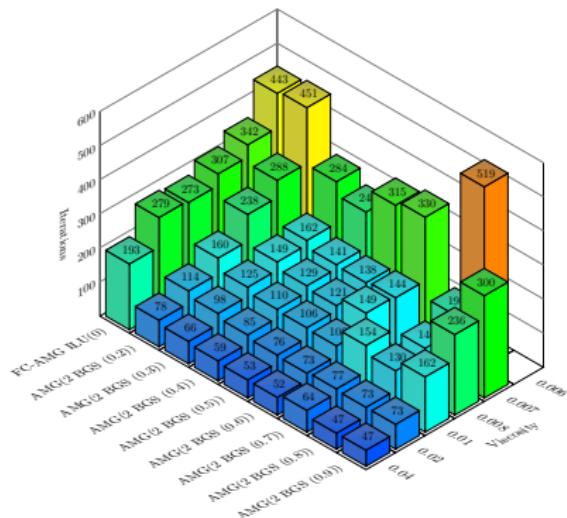
Relative linear solver tolerance:
 $\varepsilon = 1 \cdot 10^{-5}$

ℓ	rows	nnz	nnz/row	c ratio	procs	smoother
0	491,520	97,234,432	197.82		32	1 BGS (ω)
1	23,040	3,024,896	131.29	21.33	32	1 BGS (ω)
2	1,280	95,872	74.90	18.00	5	direct

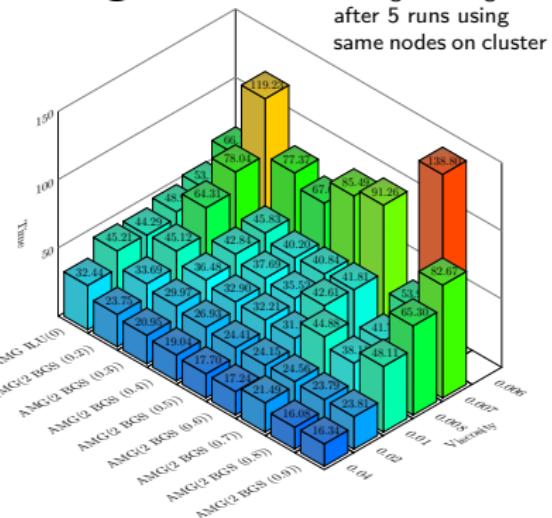
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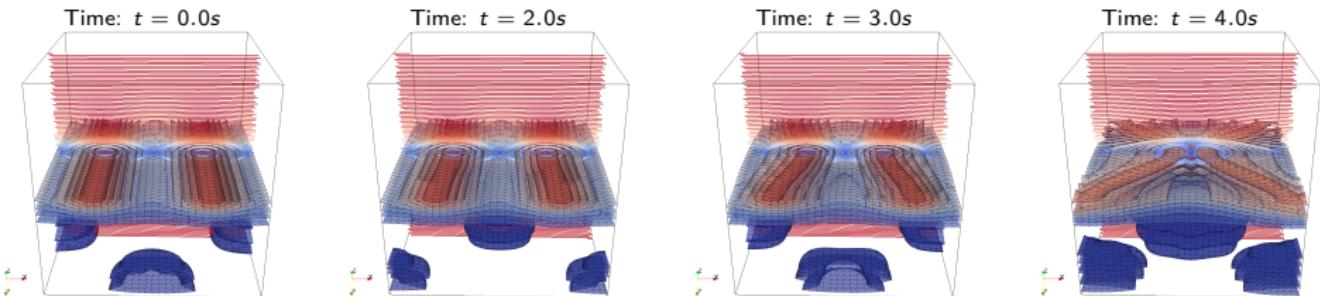
Multigrid hierarchy:

Relative linear solver tolerance:
 $\varepsilon = 1 \cdot 10^{-5}$

ℓ	rows	nnz	nnz/row	c ratio	procs	smoother
0	491,520	97,234,432	197.82		32	2 BGS (ω)
1	23,040	3,024,896	131.29	21.33	32	2 BGS (ω)
2	1,280	95,872	74.90	18.00	5	direct

Island coalescence problem

- Stabilized discretization of MHD equations using equal order piecewise bilinear elements on hexahedrons.
- 3D cube geometry of size $(2, 2, 2)$
- 2 magnetic islands as initial condition
- Viscosity: $\nu = 10^{-4}$
- Timestep size: $\Delta t \in \{0.05, 0.025, 0.0125\}$
- Relative linear solver tolerance: $\varepsilon = 10^{-5}$



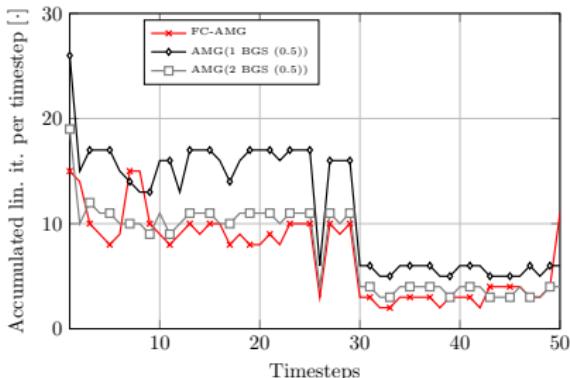
Island coalescing example

CFL = 3.2

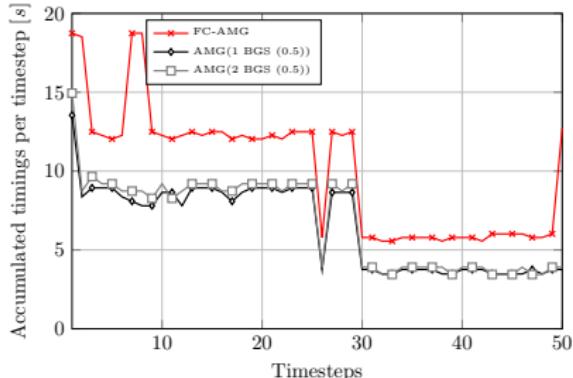
$32 \times 32 \times 32$ mesh

$\Delta t = 0.05s$

Iterations:



Timings:



Multigrid hierarchy:

ℓ	rows	nnz	nnz/row	c ratio	procs	smoother
0	246,016	52,032,384	211.50		8	n BGS(0.5)
1	10,736	1,855,392	172.82	22.92	8	n BGS(0.5)
2	560	80,976	144.60	19.17	2	direct

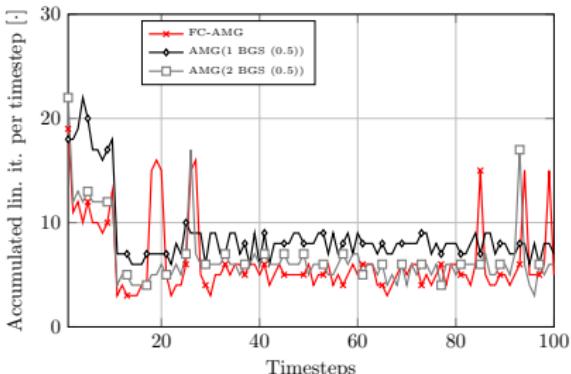
Island coalescing example

CFL = 3.2

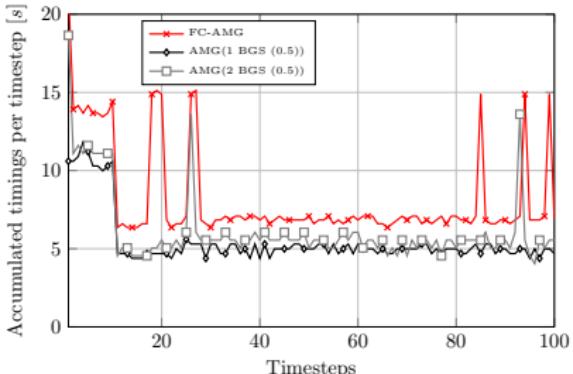
$64 \times 64 \times 64$ mesh

$\Delta t = 0.025s$

Iterations:



Timings:



Multigrid hierarchy:

ℓ	rows	nnz	nnz/row	c ratio	procs	smoother
0	2,032,128	434,367,360	213.75		64	n BGS(0.5)
1	90,528	15,788,304	174.40	22.45	64	n BGS(0.5)
2	4,768	721,728	151.37	18.99	18	n BGS(0.5)
3	416	48,720	117.12	11.46	1	direct

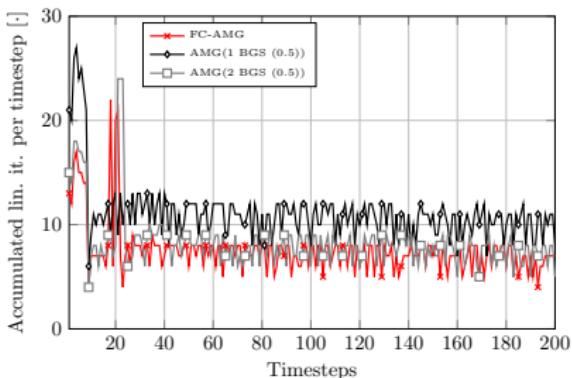
Island coalescing example

CFL = 3.2

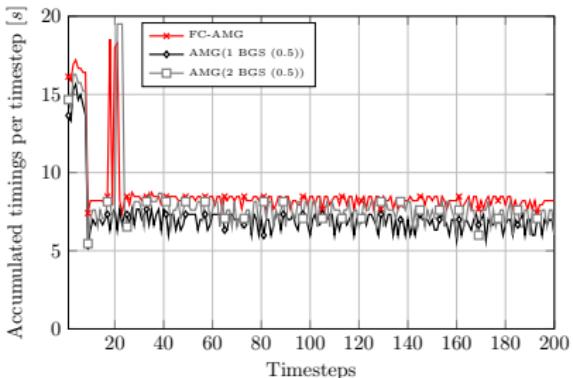
$128 \times 128 \times 128$ mesh

$\Delta t = 0.0125s$

Iterations:



Timings:



Multigrid hierarchy:

ℓ	rows	nnz	nnz/row	c ratio	procs	smoother
0	16,516,096	3,548,896,128	214.88		512	n BGS(0.5)
1	742,976	130,015,536	174.99	22.23	512	n BGS(0.5)
2	39,488	6,090,336	154.23	18.82	154	n BGS(0.5)
3	4,000	511,056	127.76	9.87	15	n BGS(0.5)
4	384	42,784	111.42	10.42	1	direct

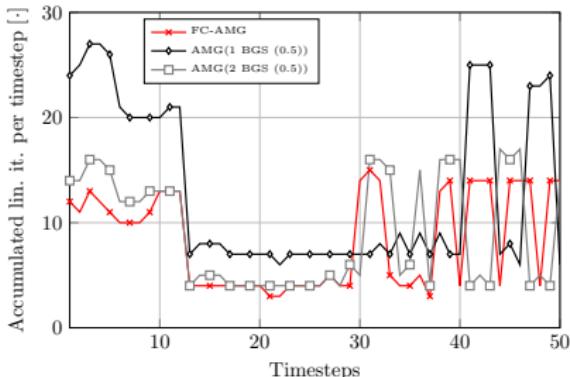
Island coalescing example

CFL = 6.4

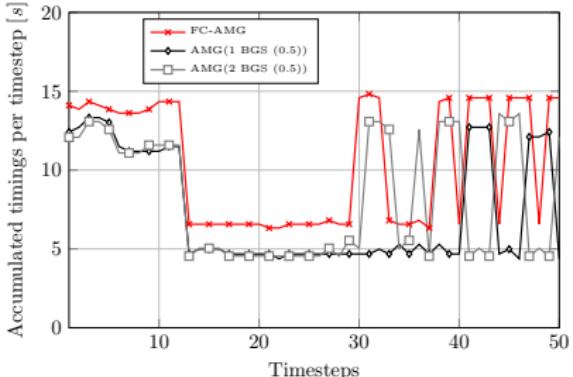
$64 \times 64 \times 64$ mesh

$\Delta t = 0.05s$

Iterations:



Timings:



Multigrid hierarchy:

ℓ	rows	nnz	nnz/row	c ratio	procs	smoother
0	2,032,128	434,367,360	213.75		64	n BGS(0.5)
1	90,528	15,788,304	174.40	22.45	64	n BGS(0.5)
2	4,768	721,728	151.37	18.99	18	n BGS(0.5)
3	416	48,720	117.12	11.46	1	direct

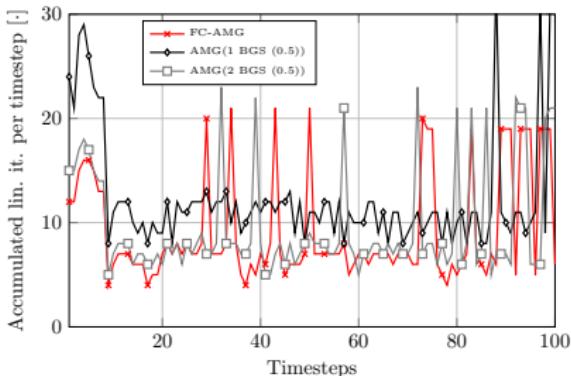
Island coalescing example

CFL = 6.4

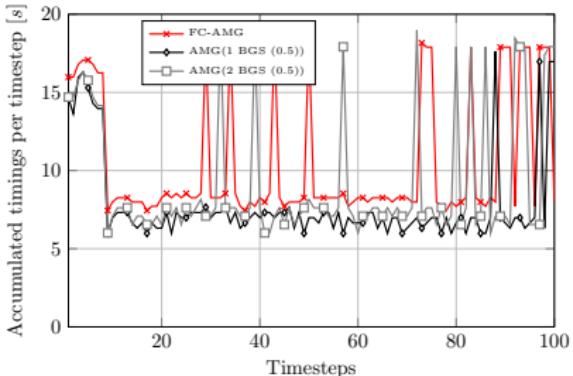
$128 \times 128 \times 128$ mesh

$\Delta t = 0.025s$

Iterations:



Timings:



Multigrid hierarchy:

ℓ	rows	nnz	nnz/row	c ratio	procs	smoother
0	16,516,096	3,548,896,128	214.88		512	n BGS(0.5)
1	742,976	130,015,536	174.99	22.23	512	n BGS(0.5)
2	39,488	6,090,336	154.23	18.82	154	n BGS(0.5)
3	4,000	511,056	127.76	9.87	15	n BGS(0.5)
4	384	42,784	111.42	10.42	1	direct

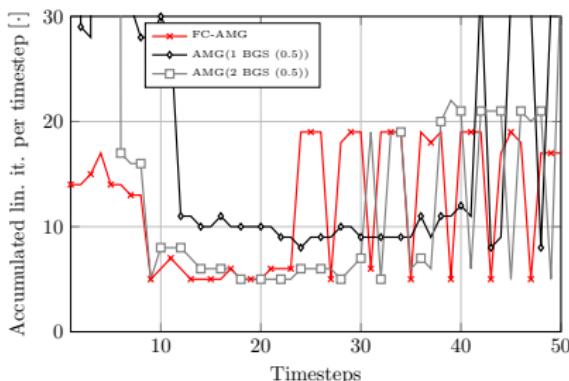
Island coalescing example

CFL = 12.8

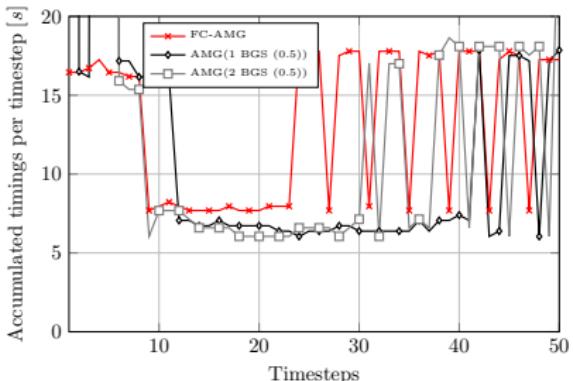
$128 \times 128 \times 128$ mesh

$\Delta t = 0.05s$

Iterations:



Timings:

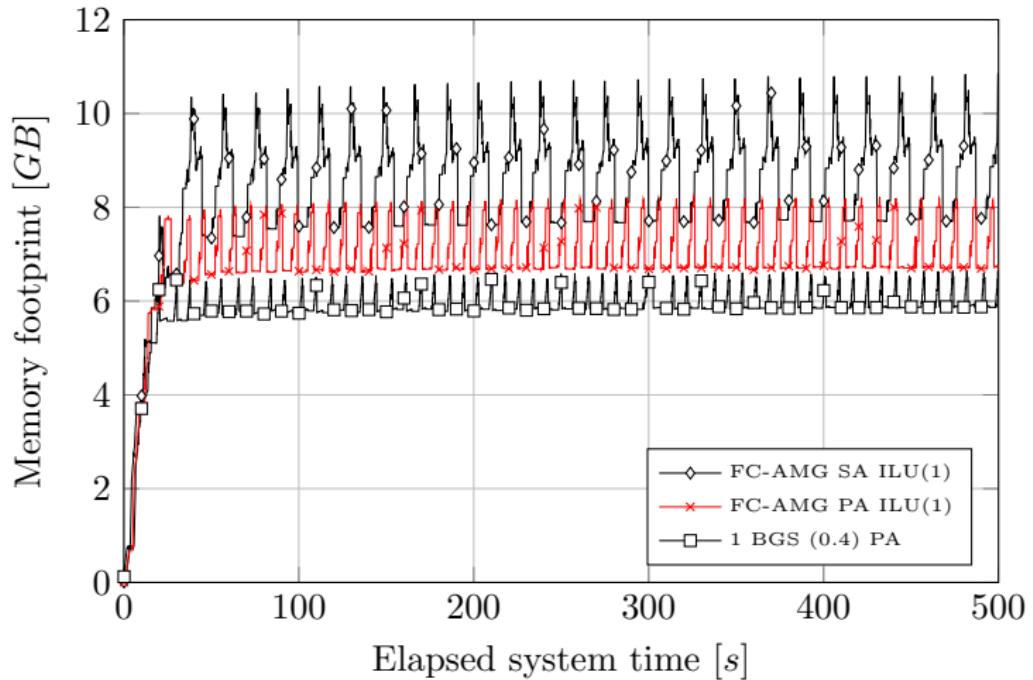


Multigrid hierarchy:

ℓ	rows	nnz	nnz/row	c ratio	procs	smoother
0	16,516,096	3,548,896,128	214.88		512	n BGS(0.5)
1	742,976	130,015,536	174.99	22.23	512	n BGS(0.5)
2	39,488	6,090,336	154.23	18.82	154	n BGS(0.5)
3	4,000	511,056	127.76	9.87	15	n BGS(0.5)
4	384	42,784	111.42	10.42	1	direct

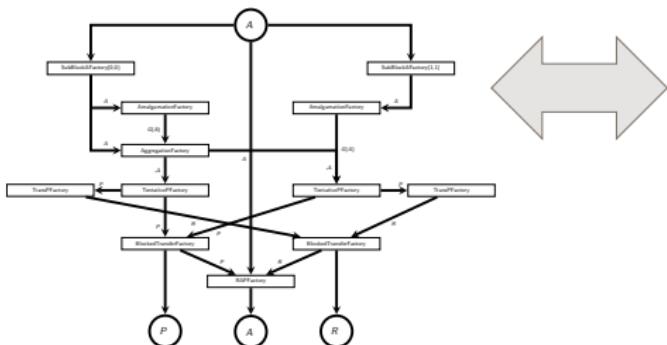
Island coalescing – memory

$64 \times 64 \times 64$ mesh on 64 procs



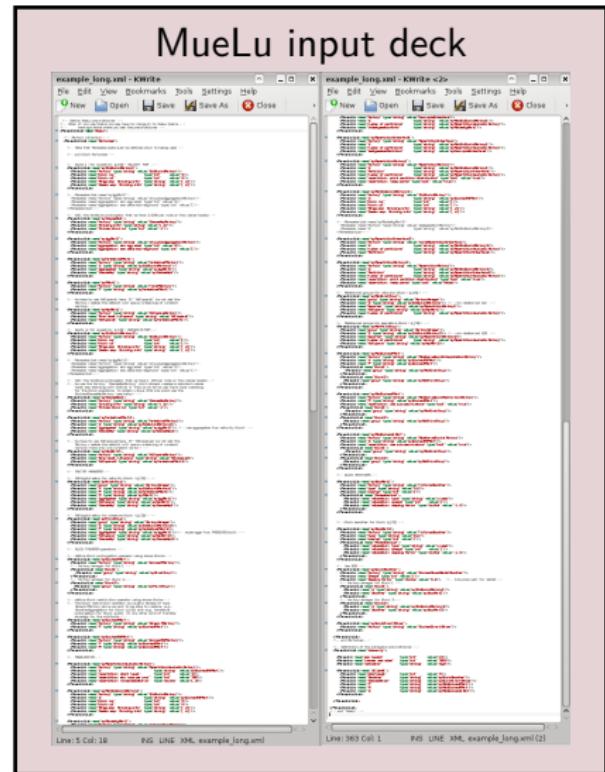
User interface

- Flexible framework for multiphysics preconditioners
 - Modular through building blocks
 - XML based input deck for defining preconditioner layout
- Flexible modular input deck **not** user friendly



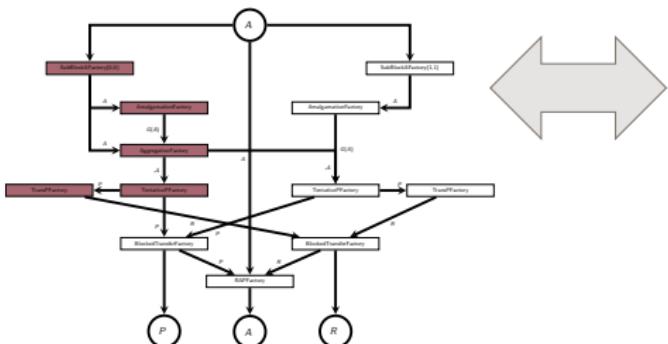
⇒ Facade Classes:

application-specific simplified user interfaces

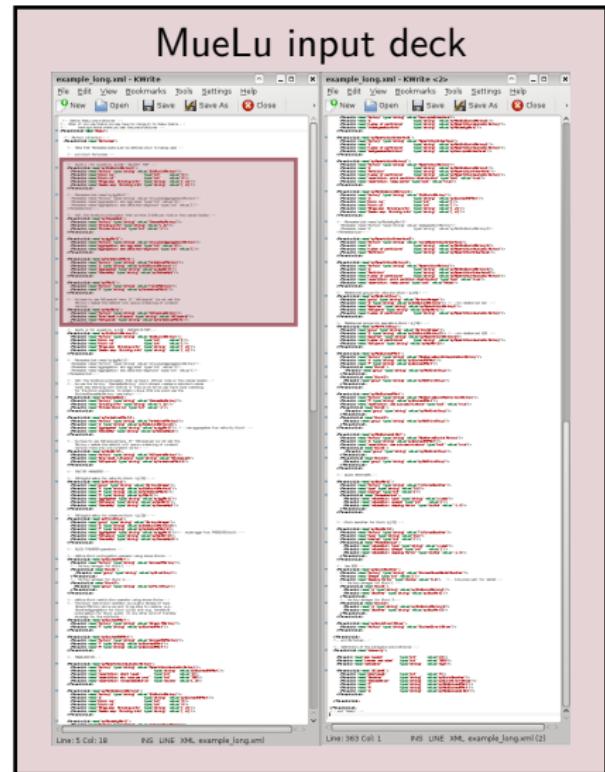


User interface

- Flexible framework for multiphysics preconditioners
 - Modular through building blocks
 - XML based input deck for defining preconditioner layout
- Flexible modular input deck **not** user friendly

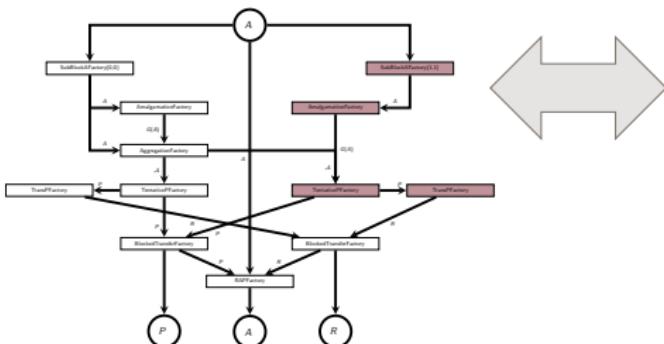


⇒ **Facade Classes:**



User interface

- Flexible framework for multiphysics preconditioners
 - Modular through building blocks
 - XML based input deck for defining preconditioner layout
- Flexible modular input deck **not** user friendly



⇒ Facade Classes:

application-specific simplified user interfaces

MueLu input deck

example_long.xml - KWrite

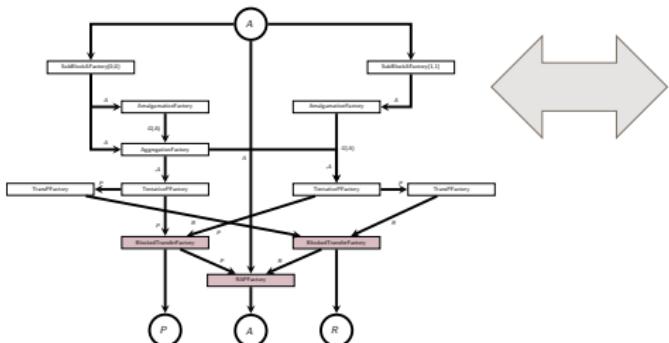
example_jlong.xml - KWrite

Line: 5 Col: 10 RIS LINE: X94, example_long.xml

Line: 363 Col: 1 RIS LINE: XML, example_jlong.xml (2)

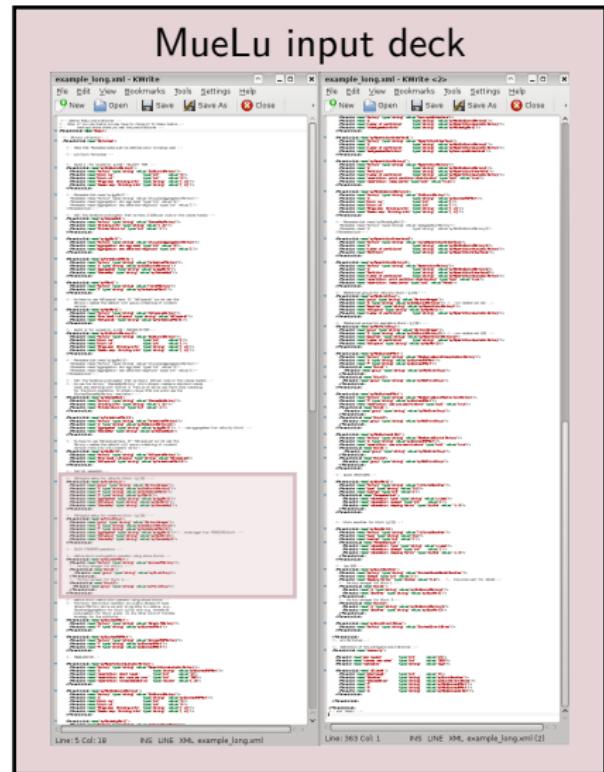
User interface

- Flexible framework for multiphysics preconditioners
 - Modular through building blocks
 - XML based input deck for defining preconditioner layout
- Flexible modular input deck **not** user friendly



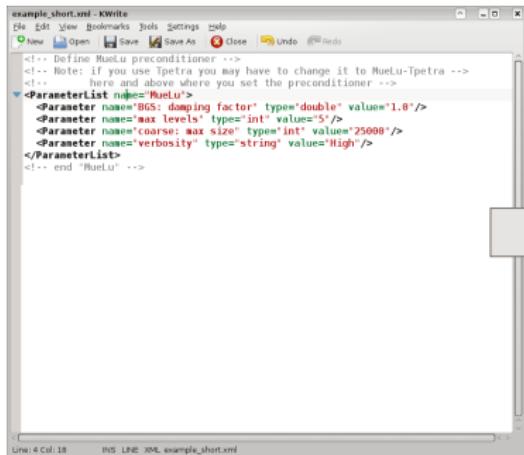
⇒ Facade Classes:

application-specific simplified user interfaces



User interface

- Expert provides simplified (minimal) user interface in an application-specific FacadeClass

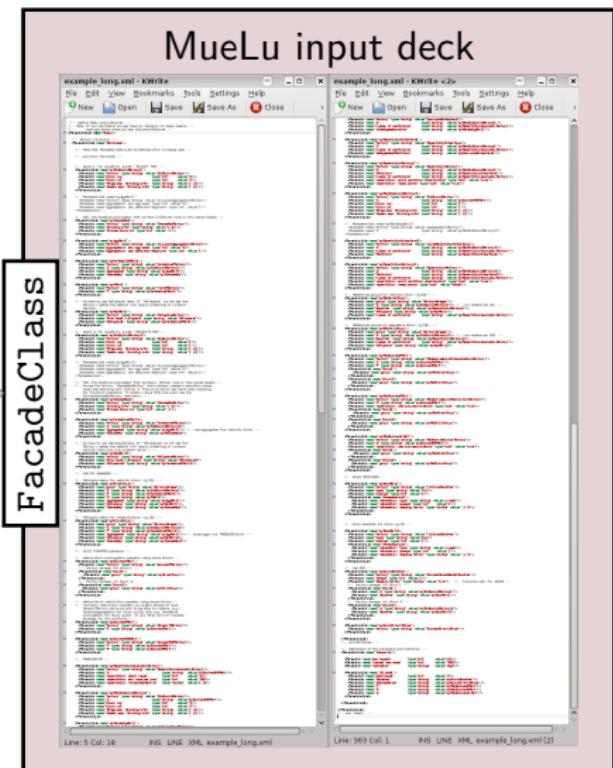


```

example_short.xml - KWrite
File Edit View Bookmarks Tools Settings Help
New Open Save Save As Close Undo Redo
example_short.xml
<!-- Define MueLu preconditioner -->
<!-- Note: if you use Tpetra you may have to change it to MueLu-Tpetra -->
<!-- here and above where you set the preconditioner -->
<ParameterList name="MueLu">
  <Parameter name="BGS: damping factor" type="double" value="1.0"/>
  <Parameter name="max levels" type="int" value="5"/>
  <Parameter name="coarse: max size" type="int" value="25000"/>
  <Parameter name="verbosity" type="string" value="High"/>
</ParameterList>
<!-- end "MueLu" -->

```

Line: 4 Col: 18 INS LINE XML example_short.xml



MueLu input deck

```

example_short.xml - KWrite
File Edit View Bookmarks Tools Settings Help
New Open Save Save As Close Undo Redo
example_short.xml
<!-- Define MueLu preconditioner -->
<!-- Note: if you use Tpetra you may have to change it to MueLu-Tpetra -->
<!-- here and above where you set the preconditioner -->
<ParameterList name="MueLu">
  <Parameter name="BGS: damping factor" type="double" value="1.0"/>
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  <Parameter name="coarse: max size" type="int" value="25000"/>
  <Parameter name="verbosity" type="string" value="High"/>
</ParameterList>
<!-- end "MueLu" -->

```

Line: 4 Col: 18 INS LINE XML example_short.xml

example_long.xml - KWrite
File Edit View Bookmarks Tools Settings Help
New Open Save Save As Close Undo Redo
example_long.xml
<!-- Define MueLu preconditioner -->
<!-- Note: if you use Tpetra you may have to change it to MueLu-Tpetra -->
<!-- here and above where you set the preconditioner -->
<ParameterList name="MueLu">
 <Parameter name="BGS: damping factor" type="double" value="1.0"/>
 <Parameter name="max levels" type="int" value="5"/>
 <Parameter name="coarse: max size" type="int" value="25000"/>
 <Parameter name="verbosity" type="string" value="High"/>
</ParameterList>
<!-- end "MueLu" -->

Line: 363 Col: 1 INS LINE XML example_long.xml

FacadeClass

The FacadeClass

- takes the simplified user parameters
- expands them to a full MueLu input deck

Questions?

In collaboration with

- John N. Shadid (SNL)
- Eric C. Cyr (SNL)
- Jonathan J. Hu (SNL)
- Raymond S. Tuminaro (SNL)

References

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- P.T. Lin, J.N. Shadid, R.S. Tuminaro, M. Sala, G.L. Hennigan, R.P. Pawlowski; *A parallel fully coupled algebraic multilevel preconditioner applied to multiphysics PDE applications: Drift-diffusion, flow/transport/reaction, resistive MHD*; *Int. J. Numer. Meth. Fluids*, 64,1148-1179; 2010
- J.N. Shadid, R.P. Pawlowski, E.C. Cyr, R.S. Tuminaro, L. Chacon, P.D. Weber; *Scalable implicit incompressible resistive MHD with stabilized FE and fully-coupled Newton-Krylov-AMG*; *Comput. Methods Appl. Mech. Engrg.*, 304, 1-25; 2016

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