Stabilized Finite Element Multigrid Techniques for Space-Time Parallelism in Convection-Diffusion Problems Parallel-in-time algorithms for exascale applications 2025 - Edinburgh, Scotland

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- PinT methods offer a pathway to exploit modern HPC system, but require solvers that are:
  - robust across varying diffusion coefficients and long time intervals
  - efficiently parallelizable in space and time

- Standard Galerkin methods can exhibit non-physical oscillations in convection-dominated regimes
- Stabilization techniques are required to improve numerical behavior and maintain physical fidelity

# Outline

### 1 Discretization and Stabilization

- Model Problem
- Galerkin Discretization
- Variational Multiscale (VMS) Stabilization

### 2 Parallel-in-Time Multigrid Methods

- Space-Time Multigrid
- Multigrid Waveform Relaxation
- Numerical Studies

### **3** Combined Approach: Space-Time Parallelization

- Multigrid Properties
- Numerical Studies

### 4 Conclusion and Outlook

d-dimensional convection-diffusion problem

Find  $u: \Omega \times (0,T) \to \mathbb{R}$  such that

$$\begin{split} \partial_t u(x,t) - \varepsilon \Delta u(x,t) + \nabla \cdot (\boldsymbol{v}(x,t)u(x,t)) &= f(x,t) & \text{ in } \Omega \times (0,T), \\ u(x,t) &= 0 & \text{ on } \partial \Omega \times (0,T), \\ u(x,0) &= u^0(x) & \text{ in } \Omega, \end{split}$$

where  $\Omega \subset \mathbb{R}^d, T > 0$ , diffusion coefficient  $\varepsilon > 0$  and velocity field v.

- **Diffusion:** leads to a smoothing of the concentration distribution (high to low concentration)
- **Convection:** Transports the concentration with the flow (displacement without spreading in purely convective models)
- **Combined:** Diffusion smooths, while convection shifts the profile (spreading and transport), the balance between the two effects captured by:  $Pe = \frac{vL}{\varepsilon}$

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$$\begin{split} \partial_t u(x,t) &- \varepsilon \partial_{xx} u(x,t) + \frac{1}{2} \partial_{xx} u(x,t)^2 = f(x,t) & \text{ in } (0,3) \times (0,T), \\ u(x,0) &= u^0(x) & \text{ in } (0,3), \end{split}$$

where T > 0, diffusion coefficient  $\varepsilon > 0$ .



• "less" smooth solution:  $u(x,t) = \frac{1}{\tanh(\eta)} (\tanh(\eta \sin(2\pi(x-t))) + \tanh(\eta))$ , where  $\eta = 5$ 

• velocity field v = u and corresponding source term f.

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where T > 0, diffusion coefficient  $\varepsilon > 0$ .



"more" smooth solution: u(x,t) = 1/(tanh(η)) (tanh(ηsin(2π(x - t))) + tanh(η)), where η = 1
 velocity field v = u and corresponding source term f.

$$\begin{split} \partial_t u(x,t) &- \varepsilon \partial_{xx} u(x,t) + \frac{1}{2} \partial_{xx} u(x,t)^2 = f(x,t) & \text{ in } (0,3) \times (0,T), \\ u(x,0) &= u^0(x) & \text{ in } (0,3), \end{split}$$

where T > 0, diffusion coefficient  $\varepsilon = 10^{-1}$ .



• "more" smooth solution:  $u(x,t) = \frac{1}{\tanh(\eta)} (\tanh(\eta \sin(2\pi(x-t))) + \tanh(\eta))$ , where  $\eta = 1$ 

• velocity field v = u and corresponding source term f,  $Pe_l < 1$ .

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where T > 0, diffusion coefficient  $\varepsilon = 10^{-2}$ .



• "more" smooth solution:  $u(x,t) = \frac{1}{\tanh(\eta)} (\tanh(\eta \sin(2\pi(x-t))) + \tanh(\eta))$ , where  $\eta = 1$ 

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• "more" smooth solution:  $u(x,t) = \frac{1}{\tanh(\eta)} (\tanh(\eta \sin(2\pi(x-t))) + \tanh(\eta))$ , where  $\eta = 1$ 

• velocity field v = u and corresponding source term f,  $Pe_l \gg 1$ .

Problem at hand

$$\partial_t u - \varepsilon \Delta u + \nabla \cdot (\boldsymbol{v} u) = f \text{ in } \Omega \times (0, T)$$

#### Semi-discrete variational problem

$$egin{aligned} &(\partial_t u_h, arphi_h) + arepsilon (
abla u_h, arphi_h) + (
abla \cdot (oldsymbol{v} u_h), arphi_h) \ &+ lpha_{\mathsf{VMS}} [(
abla u_h, 
abla arphi_h) - (oldsymbol{g}_h, 
abla arphi_h)] = (f, arphi_h), & orall arphi_h \in V_h \ & (oldsymbol{g}_h - 
abla u_h, arphi_h) = 0 & orall oldsymbol{\psi}_h \in (V_h)^d \end{aligned}$$

Variational multiscale (VMS) method<sup>1</sup>: add diffusive and compensation term with stabilization parameter  $\alpha_{\rm VMS} \ge 0$ 

higher order stabilization

stabilization term vanishes in the continuous setting ightarrow consistence

<sup>1</sup>John, Kaya, Layton (2006); Lohmann et al. (2017).

Problem at hand

$$\partial_t u - \varepsilon \Delta u + \nabla \cdot (\boldsymbol{v} u) = f \text{ in } \Omega \times (0, T)$$

Semi-discrete variational problem

$$\begin{aligned} (\partial_t u_h, \varphi_h) + \varepsilon (\nabla u_h, \nabla \varphi_h) + (\nabla \cdot (\boldsymbol{v} u_h), \varphi_h) \\ + \alpha_{\mathsf{VMS}} [(\nabla u_h, \nabla \varphi_h) - (\mathbf{g}_h, \nabla \varphi_h)] &= (f, \varphi_h), \quad \forall \varphi_h \in V_h \\ (\mathbf{g}_h - \nabla u_h, \psi_h) &= 0 \qquad \quad \forall \psi_h \in (V_h)^d \end{aligned}$$

Variational multiscale (VMS) method<sup>1</sup>: add diffusive and compensation term with stabilization parameter  $\alpha_{\rm VMS} \geq 0$ 

- higher order stabilization
- $\blacksquare$  stabilization term vanishes in the continuous setting  $\rightarrow$  consistence

<sup>1</sup>John, Kaya, Layton (2006); Lohmann et al. (2017).

# 1D Finite Differences Interpretation

- Inear finite elements, uniform grid with mesh size h and N spatial unknowns, quadrature based mass-lumping, v=1
- semi-discrete formulation in matrix form:  $m{M} \sim \mathsf{id}, m{B} \sim \; \mathsf{grad}, m{B}^ op \sim \; \mathsf{div}$

$$\boldsymbol{M}\partial_t \boldsymbol{u}(t) + \varepsilon \boldsymbol{L} \boldsymbol{u}(t) + \boldsymbol{K} \boldsymbol{u}(t) + \alpha_{\mathsf{VMS}}(\underbrace{\boldsymbol{L} - \boldsymbol{B}^\top \boldsymbol{M}^{-1} \boldsymbol{B}}_{(=:\boldsymbol{W})}) \boldsymbol{u}(t) = \boldsymbol{f}(t)$$

Stabilization matrix  $\boldsymbol{W}$  in FD

$$\begin{split} \boldsymbol{M}^{-1}\boldsymbol{L} &\sim -\frac{1}{h^2}[1,-2,1] & \rightsquigarrow \text{Taylor:} \quad \frac{1}{h^2}(h^2 u_{xx} + Ch^4 u_{xxxx} + O(h^6)) \\ \boldsymbol{M}^{-1}\boldsymbol{B}^\top \boldsymbol{M}^{-1}\boldsymbol{B} &\sim -\frac{1}{(2h)^2}[1,0,-2,0,1] & \rightsquigarrow \text{Taylor:} \quad \frac{1}{4h^2}(4h^2 u_{xx} + 2^4Ch^4 u_{xxxx} + O(h^6)) \\ & \underline{\qquad} & \underline{$$

$$\implies \quad \boldsymbol{M}^{-1}\boldsymbol{W} \sim \frac{1}{(2h)^2}[1, -4, 6, -4, 1] \quad \rightsquigarrow \text{ Taylor:} \qquad \qquad \tilde{C}h^2 u_{xxxx} + O(h^4)$$

Stabilization term corresponds to scaled biharmonic operator  $\Rightarrow$  second order of accuracy

# VMS Stabilization in Convection-Dominated Cases



$h=\delta t$	$\alpha_{\rm VMS}=0$	0.1	$\alpha_{VMS}(x,t)$
1/32	$1.9 \cdot 10^{-1}$	$1.4 \cdot 10^{-1}$	$3.1 \cdot 10^{-1}$
1/64	$8.6 \cdot 10^{-2}$	$4.5 \cdot 10^{-2}$	$1.2 \cdot 10^{-1}$
1/128	$2.1 \cdot 10^{-2}$	$1.6 \cdot 10^{-2}$	$4.2 \cdot 10^{-2}$
1/256	$5.3 \cdot 10^{-3}$	$5.8 \cdot 10^{-3}$	$1.5 \cdot 10^{-2}$
1/512	$1.3\cdot10^{-3}$	$2.1\cdot10^{-3}$	$4.9 \cdot 10^{-3}$

Discrete  $L_2$ -error at final time  $T = 3, \varepsilon = 10^{-3}$ .

Implicit Theta scheme,  $\theta \in (0,1]$ , time steps  $t^0, ..., t^K$ , fixed time step size  $\delta t$ 

$$Au^m + Bu^{m-1} = \delta t \left( \theta f^m + (1-\theta) f^{m-1} \right) = \tilde{f}^m, \quad m = 1, ..., K,$$

 $\text{where} \quad \boldsymbol{A} := \boldsymbol{M} + \theta \delta t(\varepsilon \boldsymbol{L} + \boldsymbol{K}) + \delta t \alpha_{\text{VMS}} \boldsymbol{W}, \quad \boldsymbol{B} := -\boldsymbol{M} + (1-\theta) \delta t(\varepsilon \boldsymbol{L} + \boldsymbol{K})$ 

Special characteristic: Fully implicit treatment of stabilization<sup>2</sup>

- considered for Crank-Nicolson scheme, i.e.,  $\theta = \frac{1}{2}$
- reduces computational effort
- no loss of accuracy (2nd order)
- very effective regarding the solver

<sup>&</sup>lt;sup>2</sup>D., Turek, Lohmann (2024)

# Preliminaries

Blocking the unknowns in two different ways...

N spatial nodes  $x_1,...,x_N$  , K time steps  $t^1,...,t^K$ 

time-major ordering

space-major ordering





# Parallel-in-Time Multigrid Methods



Smoothing: (damped) block Jacobi method:  $x^{(\nu)} = x^{(\nu-1)} + \omega D^{-1} (f - Sx^{(\nu-1)})$ number of pre-smoothing and post-smoothing steps:  $\nu_1$  and  $\nu_2$ 

### Space-Time Multigrid (STMG)

- Gander & Neumüller (2016)
- Parallelization in time (and space)
- Solves the full space-time problem on a space-time grid
- Approximates D with multigrid in space  $(tol_{rel} = 10^{-1})$



### Multigrid Waveform Relaxation (WRMG)

- Lubich & Ostermann (1987)
- Enhances parallelization in space
- Solves "space-only" problem with vector-valued unknowns for each spatial node → applied simultaneously across all time steps
- Standard coarsening in space for each time step:  $P_{2h,\delta t}^{h,\delta t} = P_{2h}^{h} \otimes I_{K}$ ,  $R_{h,\delta t}^{2h,\delta t} = (P_{\delta t,2h}^{\delta t,h})^{\top}$



Numerical Studies:  $\alpha_{VMS} = 0$ 



Numerical Studies:  $\varepsilon = 10^{-3}, \alpha_{VMS} = 0$ 



Stabilization parameter in multigrid:

$$\alpha_{\rm VMS} \left(\frac{h}{H}\right)^2$$

h: mesh size of fine level, H: mesh size of current level

- Preferred choices:  $\alpha_{VMS} = 0.1$  fix or  $\alpha_{VMS}(x,t)$
- Solve the same continuous problem on each level, but less stabilization on coarser levels<sup>3</sup>

$$\alpha_{\rm VMS} \left(\frac{h}{H}\right)^2 \boldsymbol{M}^{-1} \boldsymbol{W} \boldsymbol{u} \sim \alpha_{\rm VMS} \left(\frac{h}{H}\right)^2 \tilde{C} H^2 u_{xxxx} = \alpha_{\rm VMS} h^2 \tilde{C} u_{xxxx}$$

<sup>3</sup>D., Turek, Lohmann (2023)

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# Combined Approach: Space-Time Parallelization

STMG(t) and WRMG(s) offer powerful tools - but may be limited when used alone.

Challenges:

- small  $\varepsilon$
- number of iterations low and bounded
- large time intervals

### Main idea and aims:

- introduce geometric multigrid in time (and space), coupled with WRMG as an inner block smoother → enhanced space parallelism
- $\blacksquare$  split time interval into subintervals for smoothing purposes  $\rightarrow$  time parallelism by independent treatment of subintervals
- ensure small coarse-grid problems via coarsening in both space and time
- scalable space-time parallelism to unlock more potential for extreme-scale computing

Split global time interval into I subintervals

$$oldsymbol{x}^{( ilde{
u})} = oldsymbol{x}^{( ilde{
u}-1)} + \omega ilde{oldsymbol{M}}^{-1}( ilde{oldsymbol{f}} - ilde{S}oldsymbol{x}^{( ilde{
u}-1)})$$

- $\blacksquare$  compute residual  $\boldsymbol{\tilde{r}}\coloneqq(\boldsymbol{\tilde{f}}-\boldsymbol{\tilde{S}}\boldsymbol{x}^{(\tilde{\nu}-1)})$
- split global time interval into I subintervals
- solve  $M_i s_i = r_i, i = 1, ..., I$  on each subinterval, or, approximate  $M_i$  with WRMG(tol<sub>rel</sub> = 10<sup>-1</sup>)

• correction 
$$oldsymbol{x}^{( ilde{
u})} = oldsymbol{x}^{( ilde{
u}-1)} + \omega oldsymbol{ ilde{s}}$$



Split global time interval into I subintervals

$$oldsymbol{x}^{( ilde{
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• correction 
$$x^{( ilde{
u})} = x^{( ilde{
u}-1)} + \omega ilde{s}$$



Restriction (forward in time) and prolongation:

$$oldsymbol{R}_{\delta t,h}^{2\delta t,h} = oldsymbol{R}_{\delta t}^{2\delta t} \otimes oldsymbol{I}_N, \quad oldsymbol{P}_{2\delta t,h}^{\delta t,h} = (oldsymbol{R}_{\delta t,h}^{2\delta t,h})^ op$$

- **Pro:** Processors correspond to fixed subintervals  $\rightarrow$  reduces communication costs
- Con: Maximum number of levels depends on the number of time steps per sub interval on the fine level

In numerical studies: 32 time steps per subinterval on fine level  $\to$  computing time of coarse grid solver <1%

**Note:** Fixing the number of time steps = 1 per interval when coarsening leads to STMG.

Numerical Studies:  $\varepsilon = 10^{-1}, \alpha_{VMS} = 0.$ 



Numerical Studies:  $\varepsilon = 10^{-2}, \alpha_{VMS} = 0$ 



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Numerical Studies:  $\varepsilon = 10^{-3}, \alpha_{VMS} = 0$ 

 $\begin{array}{c} -\bullet & h = \delta t = 1/32 \\ -\bullet & h = \delta t = 1/64 \\ -\bullet & h = 1/32, \\ \delta t = 1/64 \\ -\bullet & h = 1/32, \\ \delta t = 1/256 \end{array}$ 









Numerical Studies:  $\varepsilon = 10^{-3}, \alpha_{VMS}(x, t)$ 





screte  $L_2$ -error at final time  $T = \delta t I$  $\alpha_{VMS}(x, t).$  Discrete  $L_2$ -error at final time  $T = \delta t K$ ,  $\alpha_{\rm VMS} = 0.$ 

- Stabilization can improve solution accuracy and solver performance in convection-dominated scenarios
- Combined method shows encouraging results for various ε and large time intervals
- Extension to 2D and 3D problems
- Studies on computational and parallel efficiency



Cost ratio estimation: sequential vs. MG, V-cycle, FGMRES(2+2),  $\varepsilon = 10^{-1}$ , coarsening in space and time.

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Cost ratio estimation: sequential vs. MG, V-cycle, FGMRES(2+2),  $\varepsilon = 10^{-3}$ ,  $\alpha_{\rm VMS}(x,t)$ , coarsening in space and time.

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## Backup: Fully Implicit Treatment of Stabilization

• stabilization matrix  $oldsymbol{W}\coloneqqoldsymbol{L}-oldsymbol{B}^{ op}oldsymbol{M}^{-1}oldsymbol{B}$ 

stabilized FE discretization of problem at hand

$$\boldsymbol{A}\boldsymbol{u}^m + \boldsymbol{B}\boldsymbol{u}^{m-1} = \boldsymbol{\tilde{f}}^m$$

where

$$\begin{split} \boldsymbol{A} &\coloneqq \quad (\boldsymbol{M} + \alpha_{\mathsf{VMS}} \frac{\delta t}{2} \boldsymbol{W}) + \frac{\delta t}{2} (\varepsilon \boldsymbol{L} + \boldsymbol{K} + \alpha_{\mathsf{VMS}} \boldsymbol{W}), \\ \boldsymbol{B} &\coloneqq - (\boldsymbol{M} + \alpha_{\mathsf{VMS}} \frac{\delta t}{2} \boldsymbol{W}) + \frac{\delta t}{2} (\varepsilon \boldsymbol{L} + \boldsymbol{K} + \alpha_{\mathsf{VMS}} \boldsymbol{W}). \end{split}$$

corresponds to the CN discretization of

$$(\boldsymbol{M} + \alpha_{\mathsf{VMS}} \frac{\delta t}{2} \boldsymbol{W}) \partial_t \boldsymbol{u}(t) + (\varepsilon \boldsymbol{L} + \boldsymbol{K} + \alpha_{\mathsf{VMS}} \boldsymbol{W}) \boldsymbol{u}(t) = \boldsymbol{f}(t)$$
  
$$\Leftrightarrow \quad \boldsymbol{M} \partial_t \boldsymbol{u}(t) + (\varepsilon \boldsymbol{L} + \boldsymbol{K}) \boldsymbol{u}(t) + \alpha_{\mathsf{VMS}} \boldsymbol{W}(\frac{\delta t}{2} \partial_t \boldsymbol{u}(t) + \boldsymbol{u}_h(t)) = \boldsymbol{f}(t)$$

variational formulation of VMS stabilization in d dimensions

$$\begin{aligned} (\partial_t u_h, \varphi_h) + \varepsilon (\nabla u_h, \nabla \varphi_h) + \nabla \cdot (\boldsymbol{v} u_h, \varphi_h) \\ + \alpha_{\mathsf{VMS}} [(\nabla [u_h + \frac{\delta t}{2} \partial_t u_h], \nabla \varphi_h) - (\mathbf{g}_h, \nabla \varphi_h)] &= (f_h, \varphi_h) \quad \forall \varphi_h \in V_h, \\ (\mathbf{g}_h - \nabla [u_h + \frac{\delta t}{2} \partial_t u_h], \boldsymbol{\psi}_h) &= 0 \quad \forall \boldsymbol{\psi}_h \in (V_h)^c \end{aligned}$$