

# A Space-Time Multigrid Solver for Optimal Distributed Control of Incompressible Fluid Flow

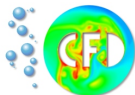
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Distributed Control of the nonstationary Navier-Stokes equation with tracking-type functional for a given  $z$ :

$$J(y, u) = \frac{1}{2} \|y - z\|_Q^2 + \frac{\alpha}{2} \|u\|_Q^2 + \frac{\gamma}{2} \|y(T) - z(T)\|_\Omega^2 \rightarrow \min!$$

on  $Q = \Omega \times [0, T]$  such that

$$\begin{aligned} y_t - \nu \Delta y + (y \nabla) y + \nabla p &= u & \text{in } Q \\ -\nabla \cdot y &= 0 & \text{in } Q \end{aligned} \quad + \text{BC}$$

No constraints (for simplicity).

## Aim:

- Discretisation with modern CFD techniques
- Solver with optimal complexity:

costs for optimisation =  $O(N)$

$$\frac{\text{costs for optimisation}}{\text{costs for simulation}} \leq C \approx 10 - 50$$

## In the following:

- 1.) Discretisation
- 2.) Solver design
- 3.) Numerical examples

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Corresponding KKT-System (unconstrained case):

$$\begin{aligned}
 y_t - \nu \Delta y + (y \nabla) y + \nabla p &= u && \text{in } Q \\
 -\nabla \cdot y &= 0 && \text{in } Q \\
 \\ 
 -\lambda_t - \nu \Delta \lambda - (y \nabla) \lambda + (\nabla y)^t \lambda + \nabla \xi &= (y - z) && \text{in } Q \\
 -\nabla \cdot \lambda &= 0 && \text{in } Q \\
 \\ 
 u &= -\frac{1}{\alpha} \lambda && \text{in } Q
 \end{aligned}$$

+ boundary conditions

+ initial condition

+ terminal condition  $\lambda(T) = \gamma(y(T) - z(T))$  in  $\Omega$

'Reduced' KKT-System (unconstrained case):

$$y_t + N(y)y + \nabla p = -\frac{1}{\alpha}\lambda \quad \text{in } Q$$

$$-\lambda_t + N^*(y)\lambda + \nabla \xi = (y - z) \quad \text{in } Q$$

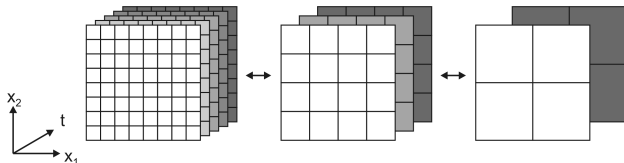
- + incompressibility ( $-\nabla \cdot y = -\nabla \cdot \lambda = 0$  in  $Q$ )
- + initial/boundary conditions
- + terminal condition  $\lambda(T) = \gamma(y(T) - z(T))$  in  $\Omega$

Observation:

- KKT-system  $\rightarrow$  elliptic BVP in space/time ( $-y_{tt} + \Delta^2 y + \dots$ )

Idea:

- Apply 'optimal'  $O(N)$  ingredients from CFD to this BVP!
  - $\rightarrow$  unstructured meshes, FEM in space, implicit time-stepping
  - $\rightarrow$  monolithic Multigrid + Newton solver techniques
- In particular: Solve on a space-time hierarchy



Discretization in time ( $\theta$ -scheme) leads to a system

$$F(x) = A(x)x = b$$

in the form (here e.g. for 2 timesteps, IE in time):

$$A(x)x =$$

$$\left( \begin{array}{ccc|ccc} \frac{l}{\Delta t} + N & & \nabla & & & \\ -l & \frac{l}{\Delta t} + N^* & \nabla & & & \\ -\nabla \cdot & & 0 & & -\frac{1}{\Delta t} & \\ \hline & & & & & \\ -\frac{1}{\Delta t} & & & \frac{l}{\Delta t} + N & \frac{l}{\Delta t} + N^* & \nabla \\ & & & -l & \frac{l}{\Delta t} + N^* & \nabla \\ & & & -\nabla \cdot & & 0 \\ \hline & & & & & \\ & & & -\frac{1}{\Delta t} & & \\ & & & & \frac{l}{\Delta t} + N & \frac{l}{\Delta t} + N^* \\ & & & & -c(\gamma, \Delta t)l & \frac{l}{\Delta t} + N^* \\ & & & & -\nabla \cdot & \nabla \\ & & & & & 0 \\ & & & & & 0 \end{array} \right) \begin{pmatrix} y_0 \\ \lambda_0 \\ \rho_0 \\ \xi_0 \\ y_1 \\ \lambda_1 \\ \rho_1 \\ \xi_1 \\ y_2 \\ \lambda_2 \\ \rho_2 \\ \xi_2 \end{pmatrix}$$

→ Sparse, (block) tridiagonal system



- Nonlinearity: Newton method for quadratic convergence

$$x^{i+1} = x^i + F'^{-1}(x^i)(b - A(x^i)x^i)$$

- Linear subproblems: space-time MG solver (complexity  $O(N)$ )  
→ using Block-Jacobi/Block-SOR smoothing techniques
- Linear subproblems in space: Monolithic Multigrid solver  
→ using 'local Pressure-Schur complement' techniques  
in each timestep for the coupled Navier–Stokes subproblems

## Essential multigrid components:

- Mesh hierarchy for a space-time cylinder  $Q = \Omega \times [0, T]$ :  
Choose arbitrary space-time coarse mesh and refine!
- Prolongation/Restriction in space + time.  
Combination of FE in space & FD in time.
- An efficient smoother! E.g. with  $\tilde{A} := A(x^i)$ :

$$\tilde{A}v = d \quad \Rightarrow \quad v^{j+1} = v^j + \omega P^{-1}(d - \tilde{A}v^j)$$

What to use as preconditioner  $P$ ?

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What to use as preconditioner  $P$ ?

$\tilde{A}$  in compressed form (omitting  $\nabla$  and  $\nabla \cdot$  here):

$$\begin{pmatrix} I + N & & & & \\ -I & \frac{I}{\Delta t} + N^* & & -\frac{I}{\Delta t} & \\ -\frac{I}{\Delta t} & & \frac{I}{\Delta t} + N & \frac{I}{\alpha_j} + N^* & \\ & & -I & \frac{I}{\Delta t} + N^* & -\frac{I}{\Delta t} \\ & & -\frac{I}{\Delta t} & & \frac{I}{\Delta t} + N & \frac{I}{\alpha_j} + N^* & -\frac{I}{\Delta t} \\ & & & & -I & \frac{I}{\alpha_j} + N^* & -\frac{I}{\Delta t} \\ & & & & & \dots & \dots \end{pmatrix}$$

$\Rightarrow$  Block-Jacobi preconditioner:

$$P := P_{Jac} := \begin{pmatrix} I + N & & & & \\ -I & \frac{I}{\Delta t} + N^* & & & \\ & & \frac{I}{\Delta t} + N & \frac{I}{\alpha_j} + N^* & \\ & & -I & \frac{I}{\Delta t} + N^* & \\ & & & & \frac{I}{\Delta t} + N & \frac{I}{\alpha_j} + N^* \\ & & & & -I & \frac{I}{\alpha_j} + N^* \\ & & & & & \dots \end{pmatrix}$$

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$\Rightarrow$  Block-Jacobi preconditioner:

$$P := P_{Jac} := \begin{pmatrix} I + N & & & & \\ -I & \frac{I}{\Delta t} + N^* & & & \\ \hline & & \frac{I}{\Delta t} + N & & \\ & & -I & \frac{I}{\alpha_j} + N^* & \\ \hline & & & & \\ & & & \frac{I}{\Delta t} + N & \\ & & & -I & \frac{I}{\alpha_j} + N^* & \\ & & & & & \dots \end{pmatrix}$$

# Space-time discretisation and preconditioner

$\tilde{A}$  in compressed form (omitting  $\nabla$  and  $\nabla \cdot$  here):

$$\left( \begin{array}{c|c|c|c} I + N & & & \\ \hline -I & \frac{I}{\Delta t} + N^* & -\frac{I}{\Delta t} & \\ \hline -\frac{I}{\Delta t} & \frac{I}{\Delta t} + N & \frac{I}{\alpha_j} + N^* & \\ \hline & -\frac{I}{\Delta t} & \frac{I}{\Delta t} + N & -\frac{I}{\Delta t} \\ \hline & & -I & \frac{I}{\alpha_j} + N^* \\ \hline & & & -\frac{I}{\Delta t} \\ \hline & & & \dots \\ \hline & & & \dots \end{array} \right)$$

$\Rightarrow$  Block-Gauß-Seidel preconditioner:

$$P := P_{GS} := \left( \begin{array}{c|c|c|c} I + N & & & \\ \hline -I & \frac{I}{\Delta t} + N^* & & \\ \hline -\frac{I}{\Delta t} & \frac{I}{\Delta t} + N & \frac{I}{\alpha_j} + N^* & \\ \hline & -\frac{I}{\Delta t} & \frac{I}{\Delta t} + N & \frac{I}{\alpha_j} + N^* \\ \hline & & & \dots \\ \hline & & & \dots \end{array} \right)$$

$\tilde{A}$  in compressed form (omitting  $\nabla$  and  $\nabla \cdot$  here):

$$\begin{pmatrix} I + N & & & & \\ -I & \frac{I}{\Delta t} + N^* & & & \\ \frac{I}{\Delta t} + N & \frac{I}{\alpha_j} + N^* & & & \\ -I & \frac{I}{\Delta t} + N^* & & & \\ & -I & \frac{I}{\Delta t} + N & & \\ & & -I & \frac{I}{\alpha_j} + N^* & \\ & & & \dots & \dots \end{pmatrix}$$

$\Rightarrow$  Reversed Block-Gauß-Seidel preconditioner:

$$P := P_{GS}^r := \begin{pmatrix} I + N & & & & \\ -I & \frac{I}{\Delta t} + N^* & & & \\ & \frac{I}{\Delta t} + N & \frac{I}{\alpha_j} + N^* & & \\ & -I & \frac{I}{\Delta t} + N^* & & \\ & & & \frac{I}{\Delta t} + N & \frac{I}{\alpha_j} + N^* \\ & & & -I & \frac{I}{\alpha_j} + N^* \\ & & & & \dots \end{pmatrix}$$

In each timestep:

$$A_{ii}(x)x_i = \left( \begin{array}{cc|c} \frac{I}{\Delta t} + N_i & \frac{I}{\Delta t} & \nabla \\ -I & \frac{\alpha I}{\Delta t} + N_i^* & \nabla \\ \hline -\nabla \cdot & & 0 \\ & -\nabla \cdot & 0 \end{array} \right) \begin{pmatrix} y_i \\ \lambda_i \\ p_i \\ \xi_i \end{pmatrix} = \begin{pmatrix} \text{rhs}_i^y \\ \text{rhs}_i^\lambda \\ \text{rhs}_i^p \\ \text{rhs}_i^\xi \end{pmatrix}$$

- Saddle-point character
- Application of  $A_{ii}^{-1}$ :
  - monolithic Multigrid solver in space
  - 'local Pressure-Schur complement' techniques

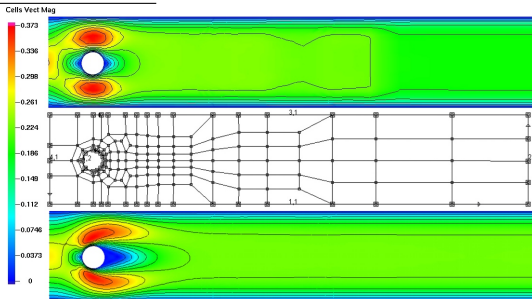
Discretisation:

- Finite Elements ( $\rightarrow$  FeatFlow)



## Flow-around-cylinder

- Target flow  $z$ : Stationary Stokes flow



Stokes, Target

Mesh

uncontrolled Nav.St.,  
Initial condition

- Optimal control problem: Navier–Stokes,  $Re = 20$ ,  $t \in [0, 0.3]$ .
- Coarse mesh: Standard DFG benchmark  
→ 1404 DOF's in space, 16 timesteps,  $\Delta t := 3/160$   
⇒ 23 868 DOF's,  $\times 8$  per level

## Convergence of the Newton solver

	Simulation			Optimisation			
lv.	#NL	#MG	$T_{sim}$	#NL	#MG	$T_{opt}$	$\frac{T_{opt}}{T_{sim}}$
2	3	11	2	5	16	112	56
3	3	11	15	5	27	1258	83
4	3	13	161	5	28	10226	63
5	3	15	1771	5	29	91529	52

- Nonlinear solver gained 8 digits
- Linear Solver: Space-Time-MG; gained 2 digits per step
- Space-preconditioner gained 2 digits per step
- $\alpha = 0.01$ ,  $\gamma = 0.0$ , FBSimSmoother

## Pure single-grid solver

lv.	Opt. with MG			Opt. without MG		
	#NL	#MG	$T_{opt}$	#NL	#ite	$T_{opt}$
2	5	16	112	5	72	80
3	5	27	1258	5	160	1303
4	5	28	10226	5	360	23242

- Nonlinear solver gained 8 digits
- Space-time linear solver gained 2 digits per step
- Space-preconditioner gained 2 digits per step
- $\alpha = 0.01, \gamma = 0.0$ , FBSimSmoother

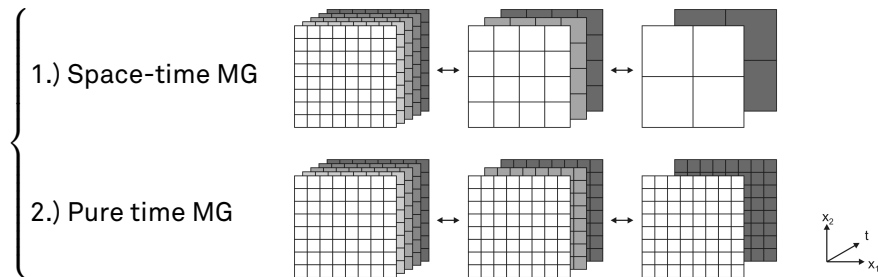
⇒ Multigrid necessary

**Choice of the MG cycle + hierarchy is crucial for the complexity!**

Example (for simplicity): Heat equation

$$y_t - \Delta y = -\frac{1}{\alpha} \lambda \quad \text{in } Q$$
$$-\lambda_t - \Delta \lambda = (y - z) \quad \text{in } Q$$

Discr.: Space= $Q_1$ , Time=IE or CN. Refinement/Coarsening:



- Time for NSM smoothing steps on level  $n$ :  $T_s^n$ .
- Total time for smoothing per MG step on level  $2, \dots, n$ :
  - a) V-cycle:  $T_s(2, \dots, n) = T_s^n + T_s^{n-1} + T_s^{n-2} + \dots + T_s^2$
  - b) W-cycle:  $T_s(2, \dots, n) = T_s^n + 2T_s^{n-1} + 4T_s^{n-2} + \dots + 2^{n-2}T_s^2$
- Relationship of smoother time between levels (2D):
  - a) Full space-time multigrid:  $T_s^{n-1} \approx 1/8 T_s^n$
  - b) Time-multigrid:  $T_s^{n-1} \approx 1/2 T_s^n$
- Total numerical effort for smoothing  $T_s(2, \dots, n)$ :

	space-time MG	pure time-MG
V-cycle	$\leq 8/7 T_s^n$	$\leq 2 T_s^n$
W-cycle	$\leq 4/3 T_s^n$	$\approx (n-1) T_s^n$

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- Total time for smoothing per MG step on level  $2, \dots, n$ :
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- Total numerical effort for smoothing  $T_s(2, \dots, n)$ :

	space-time MG	pure time-MG
V-cycle	$\leq 8/7 T_s^n$	$\leq 2 T_s^n$
W-cycle	$\leq 4/3 T_s^n$	$\approx (n-1) T_s^n$

# The role of the MG cycle

In practise:

- $\Omega = [0, 1]^2$ ,  $[0, T] = [0, 1]$ ,  $\alpha = 0.001$ ,  $\gamma = 1000$ .
- analyt. solution:  $y = t^2(1 - t)^2 x_1$ .  $\lambda$ ,  $z$  appropriately.
- space= $Q_1$ , time=IE
- MG-solver with BiCGStab(Block-GS)-smoother.

	Full space-time MG				Time-MG			
	V-cycle		W-cycle		V-cycle		W-cycle	
	#ite	time	#ite	time	#ite	time	#ite	time
$T_s(5, \dots, 5)$	4	245	4	245	3	181	3	182
$T_s(4, \dots, 5)$	4	268	4	291	3	272	3	366
$T_s(3, \dots, 5)$	4	269	4	298	3	320	3	531
$T_s(2, \dots, 5)$	4	270	4	300	3	345	3	663
	$8/7 \approx \frac{270}{245}$		$4/3 \approx \frac{300}{245}$		$2 \approx \frac{345}{181}$		$n - 1 \approx \frac{663}{182}$	

## Shown:

- Concept and realisation of an optimal control flow solver with optimal complexity

## Key points:

- linear complexity (due to MG techniques)
- flexible (due to FEM approach, higher order + 3D possible)
- robust (FEM-stab. possible, e.g. EO-FEM/interior penalty)
- generalisation to more complex problems possible  
(Non-Newtonian + Non-isothermal flow,  
boundary control, constraint control)





**Choice of the MG cycle + hierarchy is crucial for the complexity!**

Example (for simplicity): Heat equation

$$y_t - \Delta y = -\frac{1}{\alpha} \lambda \quad \text{in } Q$$
$$-\lambda_t - \Delta \lambda = (y - z) \quad \text{in } Q$$

- Discr.: Space= $Q_1$ , Time=IE or CN. Refinement/Coarsening:

Variant 1: Full space-time MG

lv.	#steps	#DOF
1	5	50
2	10	162
3	20	578
4	40	2178
5	80	8450

Variant 2: Pure time MG

lv.	#steps	#DOF
1	5	8450
2	10	8450
3	20	8450
4	40	8450
5	80	8450

## Convergence of the Newton solver

lv.	Simulation			Optimisation			$\frac{T_{opt}}{T_{sim}}$
	#NL	#MG	$T_{sim}$	#NL	#MG	$T_{opt}$	
2	3	11	4	4	8	308	73
3	3	11	24	4	8	1727	72
4	3	13	208	5	11	15355	74

- Nonlinear solver gained 8 digits
- Linear Solver: Space-Time-MG; gained 2 digits per step
- Space-preconditioner gained 2 digits per step
- $\alpha = 0.01, \gamma = 0.0$ , **BiCGStab(FBGSSmoothe)**

## Convergence of the Newton solver

	Simulation			Optimisation			
lv.	#NL	#MG	$T_{sim}$	#NL	#MG	$T_{opt}$	$\frac{T_{opt}}{T_{sim}}$
2	3	11	2	4	5	51	25
3	3	11	15	4	6	455	30
4	3	13	161	4	7	4483	28
5	3	15	1771	4	7	39925	23

- Nonlinear solver gained 8 digits
- Linear Solver: **Time-MG**; gained 2 digits per step
- Space-preconditioner gained 2 digits per step
- $\alpha = 0.01$ ,  $\gamma = 0.0$ , FBSimSmoother

## Convergence for different $\alpha/\gamma$

$\alpha$	1.0			0.1			0.01		
$\gamma$	#NL	#MG	Time	#NL	#MG	Time	#NL	#MG	Time
0.0	4	11	516	4	15	705	5	27	1258
0.1	4	14	653	4	17	800	5	36	1675
0.5	4	15	701	4	23	1082	div	div	div
1.0	4	17	795	4	24	1123	div	div	div

- Nonlinear solver gained 8 digits
- Linear Solver: Space-Time-MG; gained 2 digits per step
- Space-preconditioner gained 2 digits per step
- Space/time level 3, FBSimSmoother

## Convergence for different $\alpha/\gamma$

$\alpha$	1.0			0.1			0.01		
$\gamma$	#NL	#MG	Time	#NL	#MG	Time	#NL	#MG	Time
0.0	3	4	303	3	4	309	4	6	454
0.1	4	6	437	4	6	455	4	5	382
0.5	4	6	440	4	6	465	div	div	div
1.0	4	6	440	4	6	463	div	div	div

- Nonlinear solver gained 8 digits
- Linear Solver: **Time-MG**; gained 2 digits per step
- Space-preconditioner gained 2 digits per step
- Space/time level 3, FBSimSmoother

## Convergence for different $\alpha/\gamma$

$\alpha$	1.0			0.1			0.01		
$\gamma$	#NL	#MG	Time	#NL	#MG	Time	#NL	#MG	Time
0.0	4	5	1260	4	7	1757	5	10	2519
0.1	4	6	1490	4	9	2215	4	9	2247
0.5	3	5	1295	4	10	2445	4	11	2711
1.0	3	6	1499	4	11	2719	4	11	2743

- Nonlinear solver gained 8 digits
- Linear Solver: Space-Time-MG; gained 2 digits per step
- Space-preconditioner gained 2 digits per step
- Space/time level 3, **BiCGStab(FBGSSmoothing)**

⇒ Much more stable, but much slower!