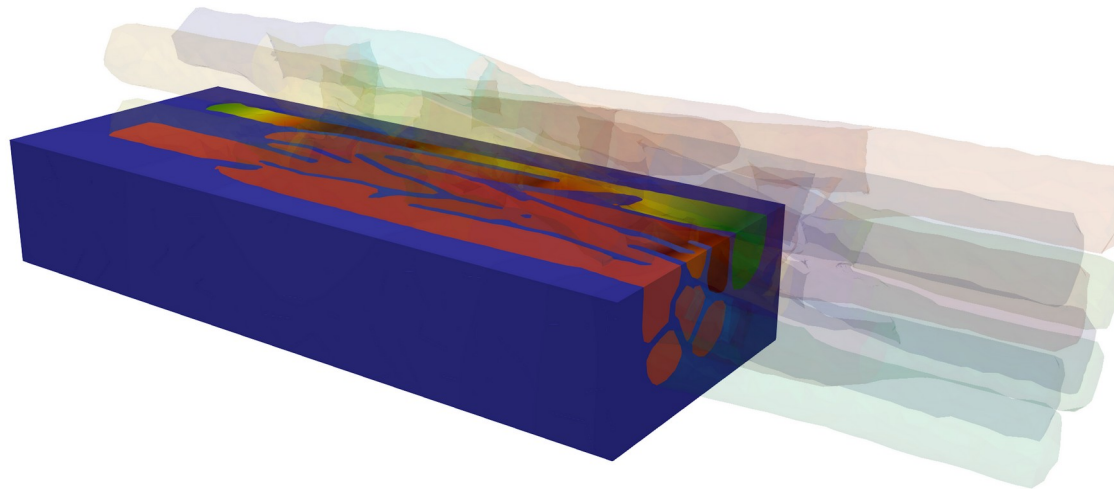


Adaptive higher-order time integration and BDDC preconditioning; EMI in openCARP

F. Chegini, M. Weiser

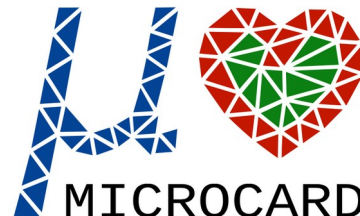


SPONSORED BY THE



Federal Ministry
of Education
and Research

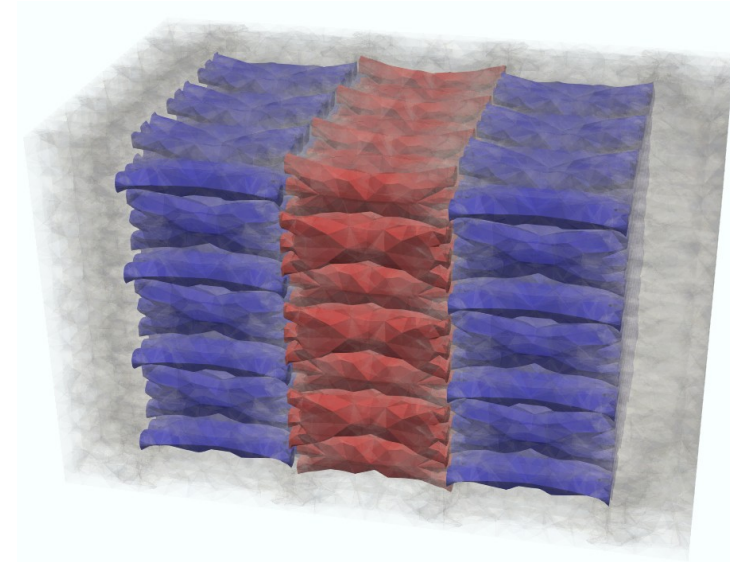
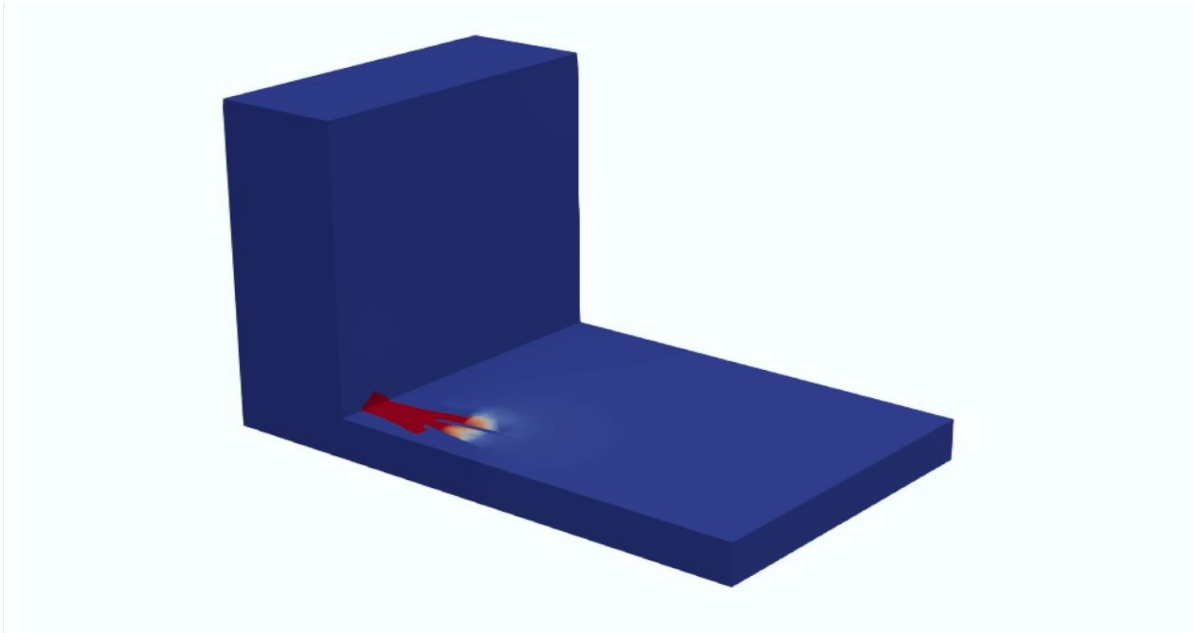
EuroHPC
Joint Undertaking

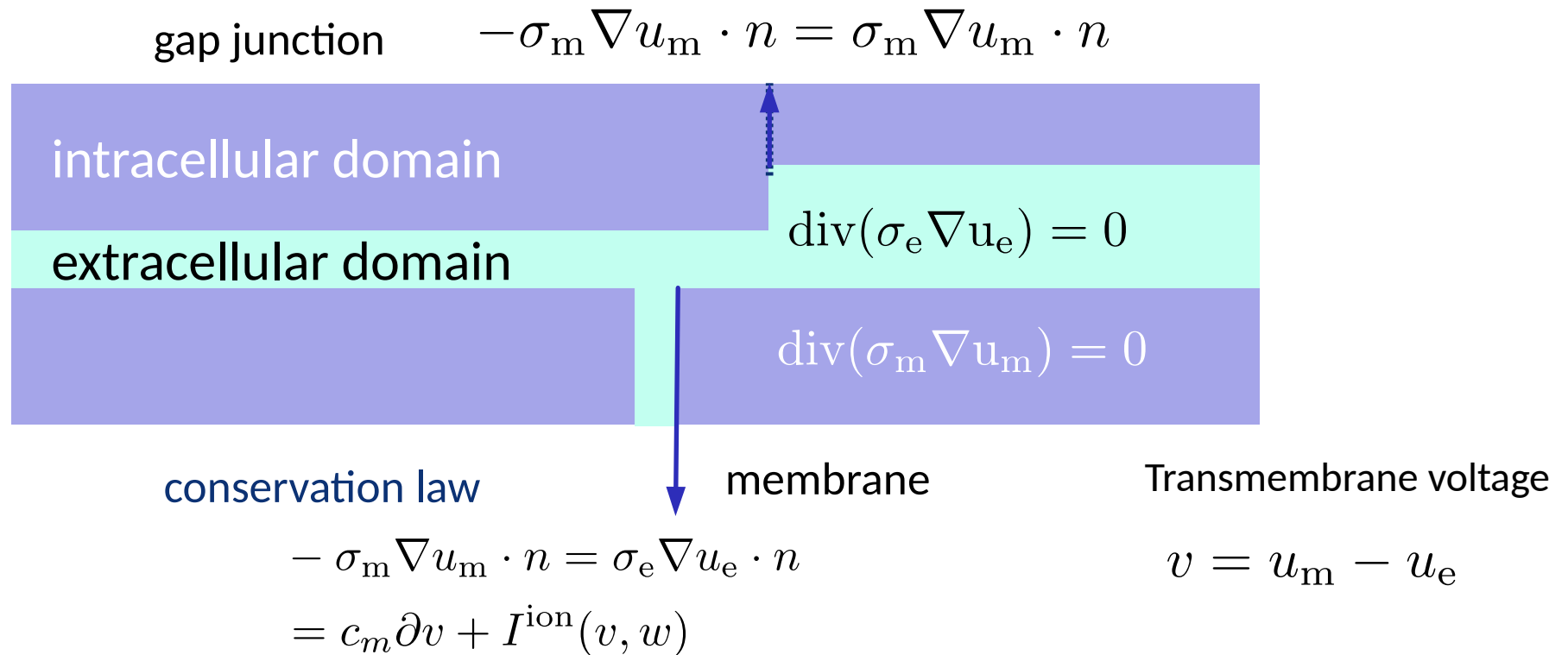


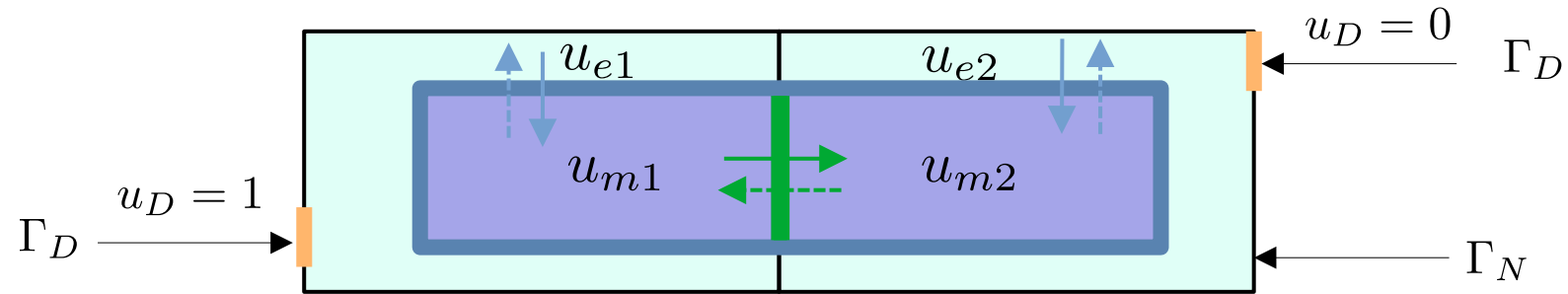
04.07.2023

The project leading to this application has received funding from the European High-Performance Computing Joint Undertaking (JU) under grant agreement No 955495. The JU receives support from the European Union's Horizon 2020 research and innovation programme and France, Italy, Germany, Austria, Norway, Switzerland

- EMI formulation
- An efficient higher order time integration method
- Sub-matrices for BDDC preconditioner
- EMI implementation in openCarp



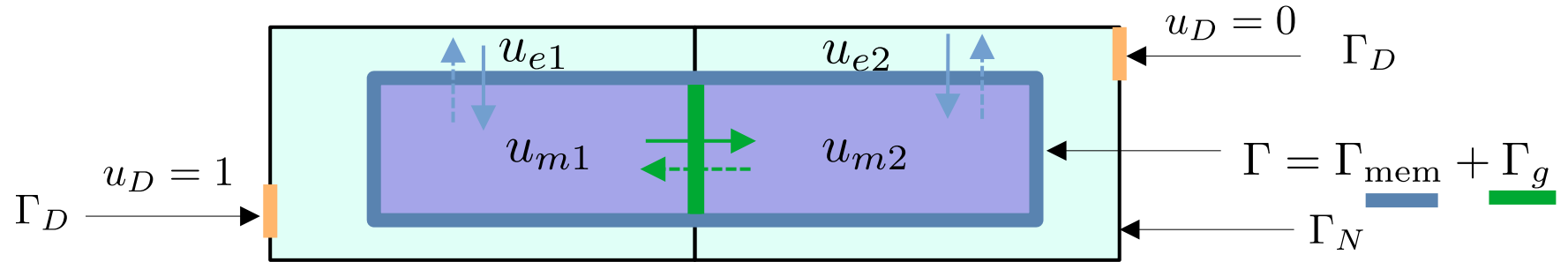




$$\underline{\Gamma_N + \Gamma_D = \Gamma_e}$$

$$\underline{\sigma_e \nabla u_e \cdot n_e + \gamma(u_e - u_D) = 0} \quad \text{on } \Gamma_e$$

$$\gamma = \begin{cases} \gg 1 & \text{on } \Gamma_D \\ 0 & \text{on } \Gamma_N \end{cases}$$



$$\begin{aligned}
 u_e &\in H^1(\Omega_e), \quad \text{where } e = 1, \dots, s_e \\
 u_m &\in H^1(\Omega_m), \quad \text{where } m = 1, \dots, s_m
 \end{aligned}$$

Number of subdomain
in extra or myocytes

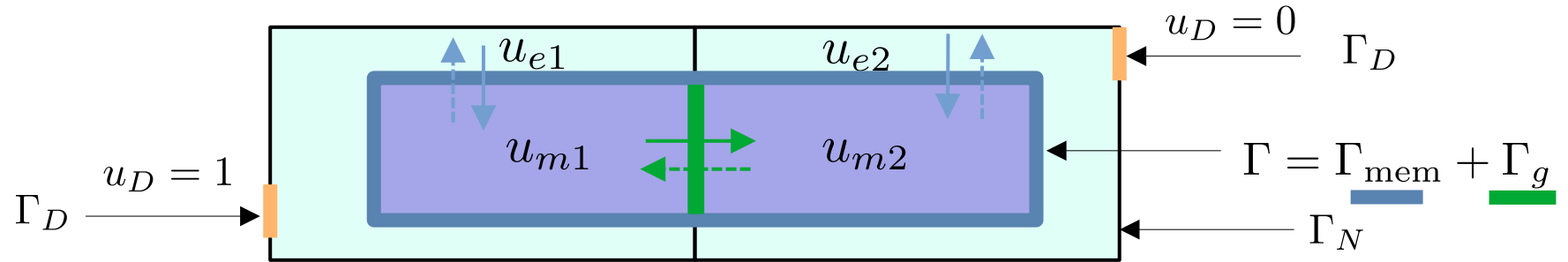
$$\begin{aligned}
 \operatorname{div}(\sigma_e \nabla u_e) &= 0 \quad \text{in } \Omega_e \\
 \operatorname{div}(\sigma_m \nabla u_m) &= 0 \quad \text{in } \Omega_m
 \end{aligned}$$

$$-\sigma_m \nabla u_m \cdot n = \sigma_e \nabla u_e \cdot n = c_m \partial v + I^{\text{ion}}(v, w)$$

$$\partial_t w = f(v, w)$$

$$v = u_m - u_e$$

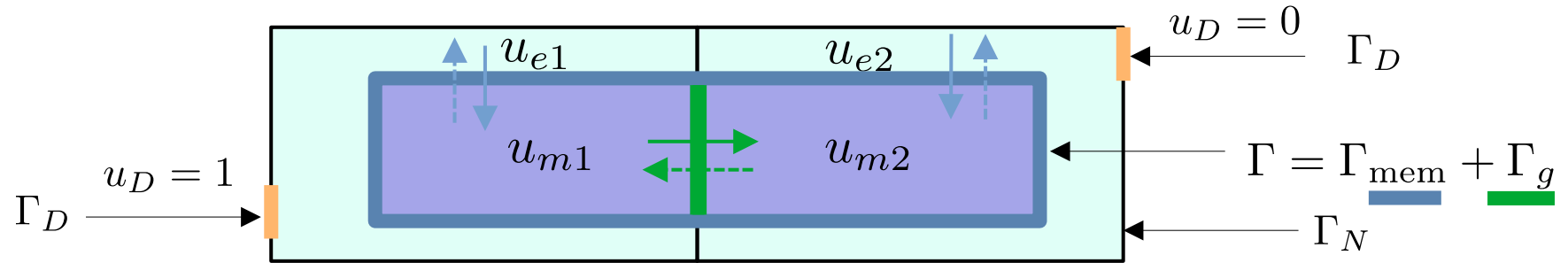
$$\begin{aligned}
 \Gamma_N + \Gamma_D &= \Gamma_e \\
 \sigma_e \nabla u_e \cdot n_e + \gamma(u_e - u_D) &= 0 \quad \text{on } \Gamma_e \\
 \gamma &= \begin{cases} \gg 1 & \text{on } \Gamma_D \\ 0 & \text{on } \Gamma_N \end{cases}
 \end{aligned}$$



Variational Formulation

$$\text{on } \Gamma_{ij} = \overline{\Omega_i} \cap \overline{\Omega_j} \quad \left\{ \begin{array}{l} v_{ij} = u_i - u_j = -v_{ji} \\ n_i^T \sigma_i \nabla u_i = -I_{ij}(v_{ij}) \quad \text{incoming current density into } \Omega_i \\ I_{ij} = C\dot{v}_{ij} + I_{ij}^{\text{ion}}(v_{ij}, w) \end{array} \right.$$

$$I_{ij} = \begin{cases} C\dot{v}_{ij} + I_{ij}^{\text{m}}(v_{ij}, w) & \text{on } \Gamma_{\text{mem}} \\ C\dot{v}_{ij} + I_{ij}^{\text{g}}(v_{ij}, 0) & \text{on } \Gamma_g \end{cases}$$



Variational Formulation

$$\int_{\Omega} \nabla \cdot \sigma_i \nabla u_i \phi_i dx = 0$$

$$\begin{aligned} 0 &= - \int_{\Omega_i} \nabla \phi_i^T \sigma_i \nabla u_i dx + \int_{\partial \Omega_i} n_i^T \sigma_i \nabla u_i \phi_i ds \\ &= - \underbrace{\int_{\Omega_i} \nabla \phi_i^T \sigma_i \nabla u_i dx}_{\text{[Bécue, Potse, Coudière 2018, Jæger, Tveito 2021]}} + \sum_{j \neq i} \int_{\Gamma_{ij}} -(C \dot{v}_{ij} + I_{ij}^{\text{ion}}(v_{ij})) \phi_i ds. \end{aligned}$$

[Bécue, Potse, Coudière 2018, Jæger, Tveito 2021]

$$v_{ij} = u_i - u_j$$

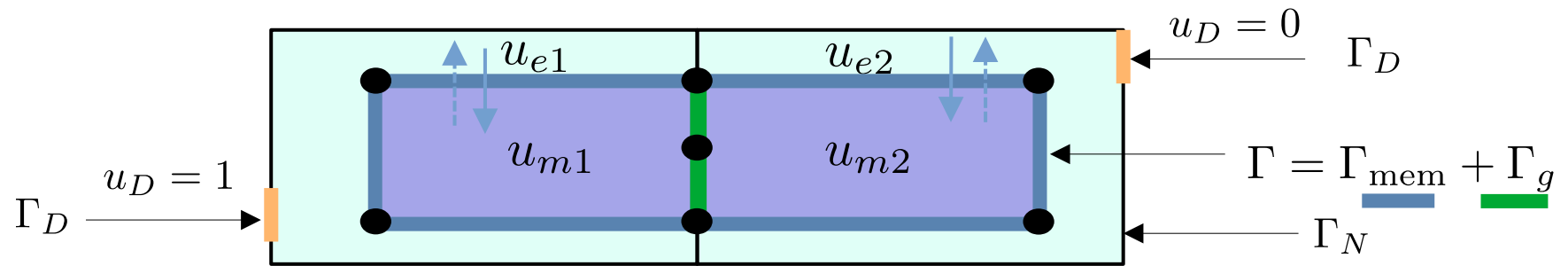
$$\text{on } \Gamma_{ij} = \overline{\Omega_i} \cap \overline{\Omega_j}$$

In total

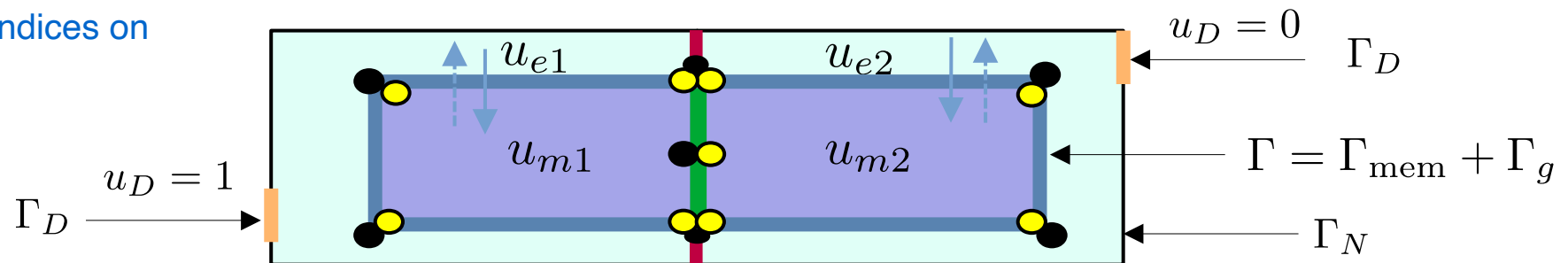
$$\int_0^T \left(\int_{\Omega_e} \sigma_e \nabla u_e \cdot \nabla \phi_e dx + \int_{\Omega_m} \sigma_m \nabla u_m \cdot \nabla \phi_m dx + \int_{\Gamma_{ij}(i \neq j)} (C \dot{v}_{ij} + I_{ij}^{\text{ion}}(v_{ij}, w_{ij})) \varphi dx \right) dt = 0$$

Discontinuity on the interfaces

original

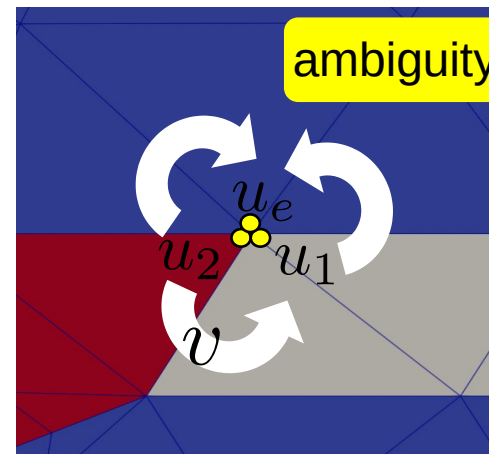
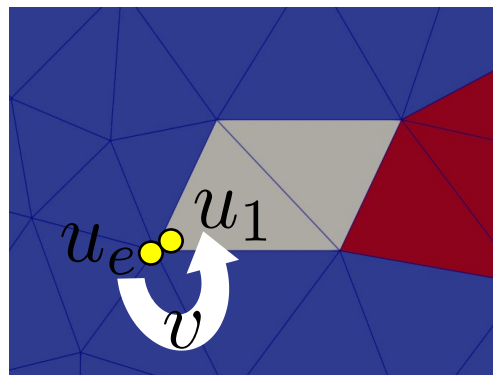
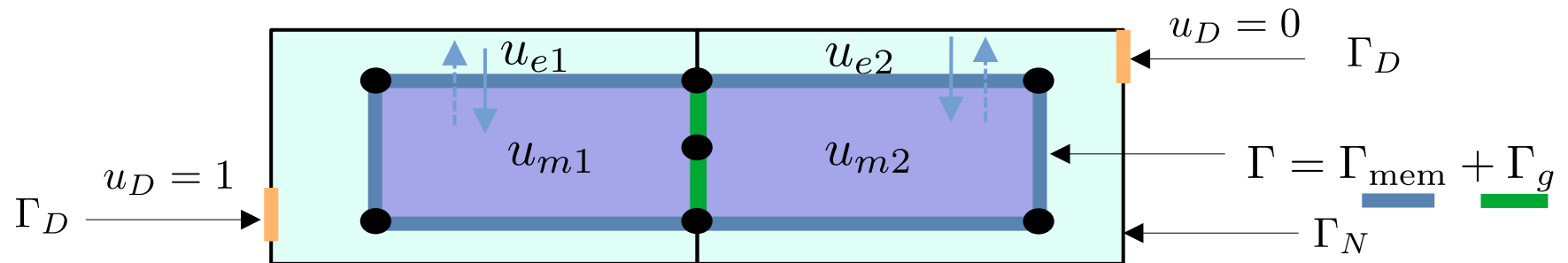


define dof indices on interfaces

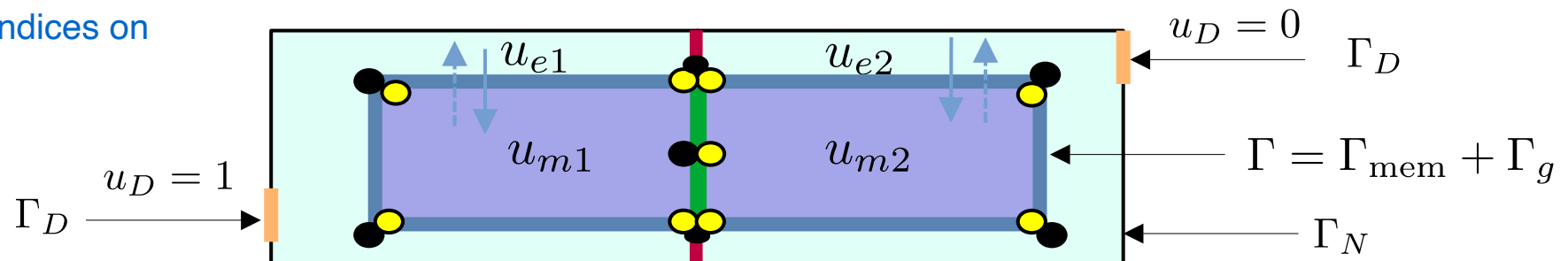


Discontinuity on the interfaces

original

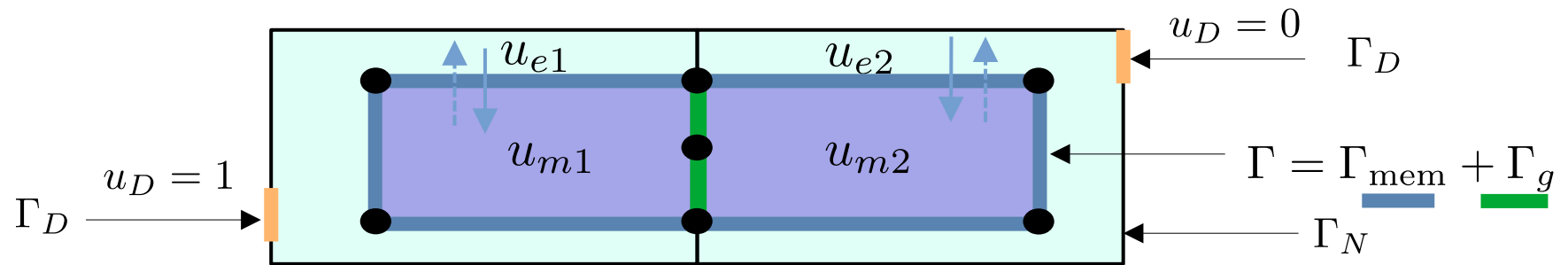


define dof indices on interfaces

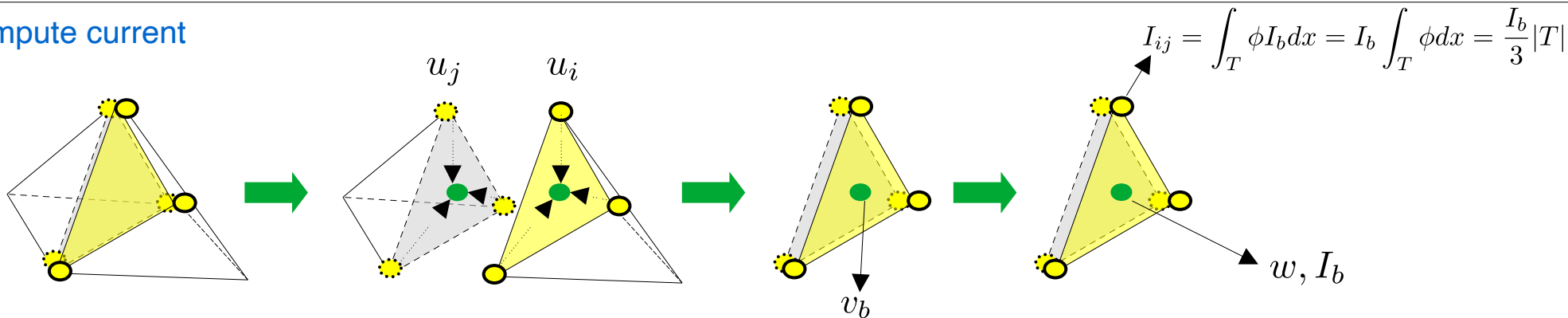


Current computation

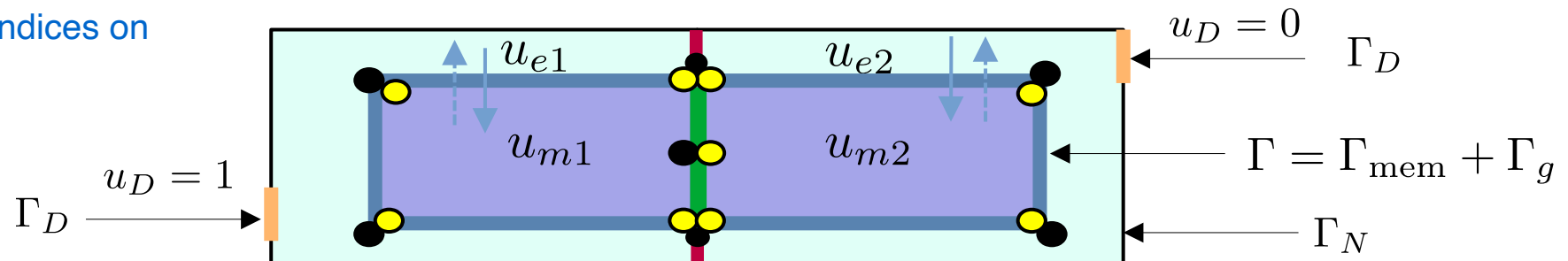
original



Compute current

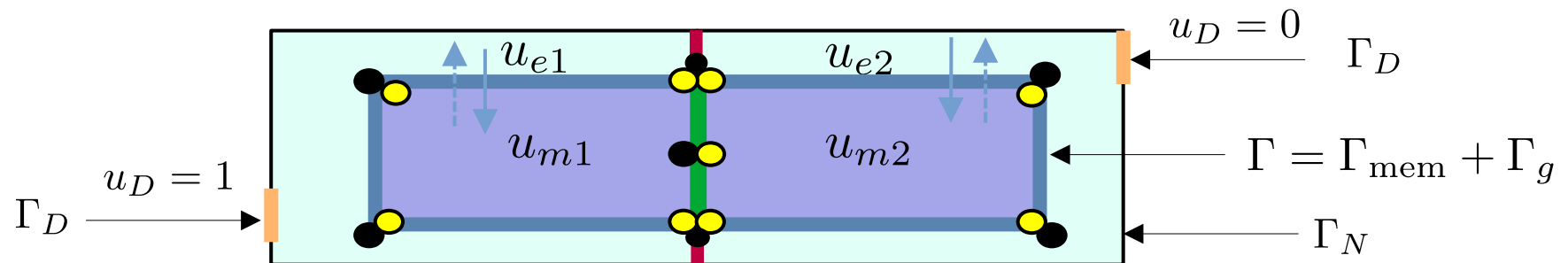


define dof indices on interfaces



	I_{e1}	Γ_{e1}	I_{e2}	Γ_{e2}	I_{m1}	Γ_{m1}	I_{m2}	Γ_{m2}	u	rhs
I_{e1}	K_{II}	$K_{I\Gamma}$							u_{e1}	
Γ_{e1}	$K_{\Gamma I}$			$K_{\Gamma\Gamma}$		$-M_{\Gamma\Gamma}$	$-M_{\Gamma\Gamma}$			
I_{e2}			K_{II}	$K_{I\Gamma}$		$K_{\Gamma\Gamma} + M_{\Gamma\Gamma}$			u_{e2}	
Γ_{e2}		$K_{\Gamma\Gamma}$	$K_{\Gamma I}$			$-M_{\Gamma\Gamma}$	$-M_{\Gamma\Gamma}$			
I_{m1}					K_{II}	$K_{I\Gamma}$			u_{m1}	
Γ_{m1}		$-M_{\Gamma\Gamma}$	$-M_{\Gamma\Gamma}$		$K_{\Gamma I}$		$-M_{\Gamma\Gamma}$			
I_{m2}							K_{II}	$K_{I\Gamma}$	u_{m2}	
Γ_{m2}		$-M_{\Gamma\Gamma}$	$-M_{\Gamma\Gamma}$		$-M_{\Gamma\Gamma}$	$K_{\Gamma I}$				

=

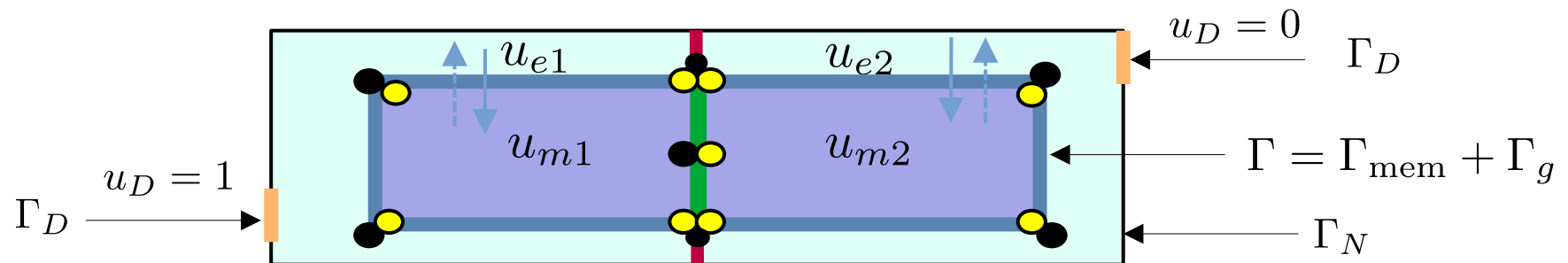


	I_{e1}	Γ_{e1}	I_{e2}	Γ_{e2}	I_{m1}	Γ_{m1}	I_{m2}	Γ_{m2}
I_{e1}	K_{II}	$K_{I\Gamma}$						
Γ_{e1}	$K_{\Gamma I}$			$K_{\Gamma\Gamma}$	$-M_{\Gamma\Gamma}$	$-M_{\Gamma\Gamma}$		
I_{e2}			K_{II}	$K_{I\Gamma}$	$K_{\Gamma\Gamma} + M_{\Gamma\Gamma}$			
Γ_{e2}			$K_{\Gamma I}$		$-M_{\Gamma\Gamma}$	$-M_{\Gamma\Gamma}$		
I_{m1}					K_{II}	$K_{I\Gamma}$		
Γ_{m1}					$K_{\Gamma I}$		$-M_{\Gamma\Gamma}$	
I_{m2}							K_{II}	$K_{I\Gamma}$
Γ_{m2}							$K_{\Gamma I}$	



	I_{e1}	Γ_{e1}	I_{e2}	Γ_{e2}	I_{m1}	Γ_{m1}	I_{m2}	Γ_{m2}
I_{e1}	K_{II}	$K_{I\Gamma}$						
Γ_{e1}	$K_{\Gamma I}$			$K_{\Gamma\Gamma}$	$-\frac{1}{2}M_{\Gamma\Gamma}$	$-\frac{1}{2}M_{\Gamma\Gamma}$		
I_{e2}			$K_{II} + \frac{1}{2}M_{\Gamma\Gamma}$					
Γ_{e2}			$K_{\Gamma I}$					
I_{m1}								
Γ_{m1}								
I_{m2}								
Γ_{m2}								

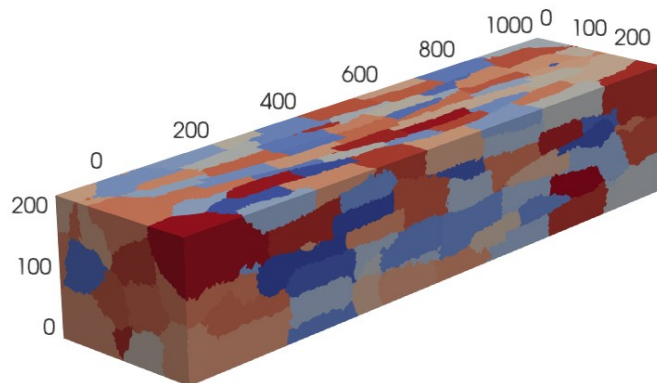
submatrix



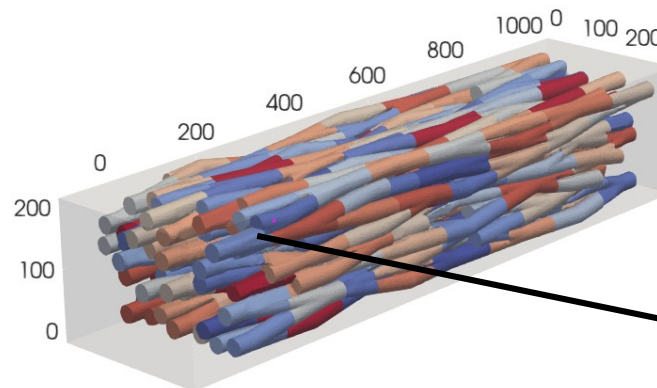
$$\int_0^T \left(\underbrace{\int_{\Omega_e} \sigma_e \nabla u_e \cdot \nabla \phi_e dx}_{K_e} + \underbrace{\int_{\Omega_m} \sigma_m \nabla u_m \cdot \nabla \phi_m dx}_{K_m} + \int_{\Gamma_{ij(i \neq j)}} (C \dot{v}_{ij} + I_{ij}^{\text{ion}}(v_{ij}, w_{ij})) \varphi dx \right) dt = 0$$

Integration over elements
Integration over faces

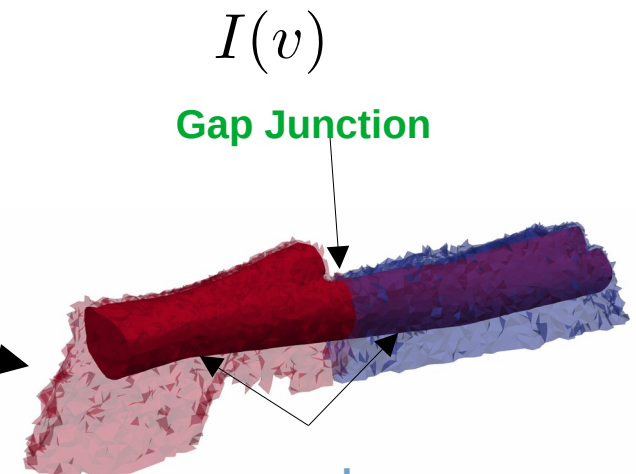
Ionic model ★
 Gap Junction ★



mesh



myocytes



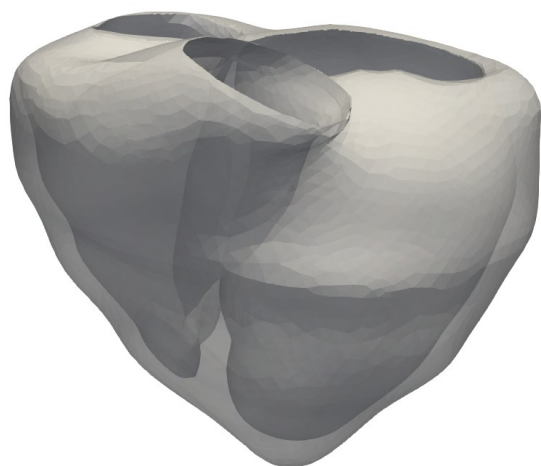
membrane

[Mark Potse, et al. Mmg]

$I(v)$
 Gap Junction
 $I(v, w)$
 $\dot{w} = f(v, w)$

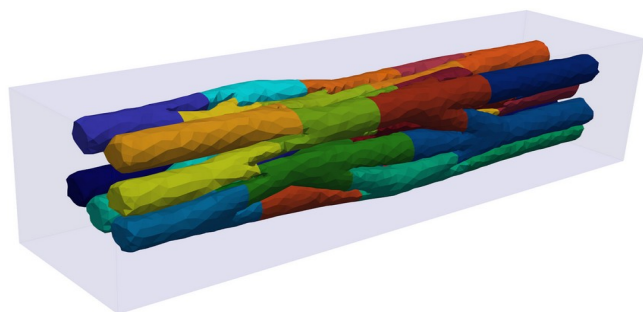
Efficient adaptivity for simulating cardiac electrophysiology with spectral deferred correction methods

Electrophysiological models



Bidomain model

mesh width:	$\sim 100\mu\text{m}$	heart diameter:	10cm
time step:	$\sim 100\mu\text{s}$	heart beat:	1s



EMI model

mesh width:	$< 10\mu\text{m}$	heart diameter:	10cm
time step:	$\sim 10\mu\text{s}$	heart beat:	1s



factor 10,000
larger than bidomain

Efficient adaptivity approach

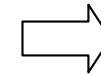
Discretization

space: finite elements, finite differences, finite volumes

time: IMEX Euler/RK, Rush-Larsen

Challenge

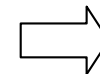
- spatially local structures → fine grids
- fast dynamics → small time steps



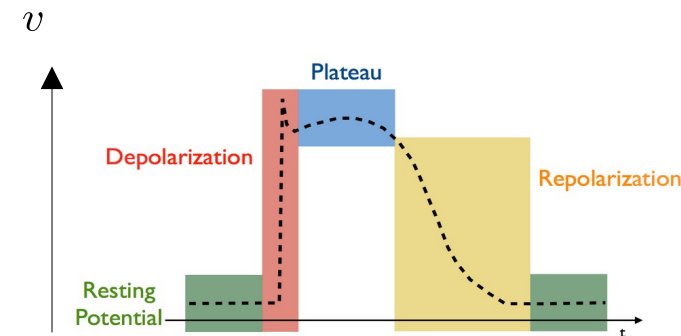
huge
computational effort

Approach

- massive parallelization
- space-time discretization
- model selection & coupling
- mesh & time step adaptivity
- Error estimation,
frequent mesh refinement & coarsening



Classical adaptivity fails to
provide high efficiency



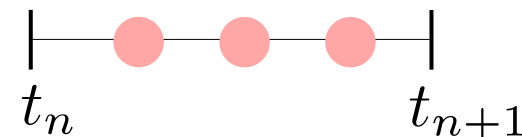
Wish list

- **Higher convergence** order
- **Adaptive coarsening** to the **algebraic level**
 - Avoid mesh modification & reassembly
 - Reduced the computational time

Spectral Deferred Correction Methods

Problem

$$M \dot{z} = L(z)$$



time grid

$$0 = \tau_0 < \tau_1 < \dots < \tau_m = \tau$$

e.g., Radau, Gauss, Lobatto

approximate rhs

$$\tilde{z} \in \mathbb{P}_m, \quad z_i = z(\tau_i)$$

Integrate Picard equation

$$M(z_{i+1} - z_i) = \int_{\tau=\tau_i}^{\tau_{i+1}} L(z) d\tau, \quad i = 0, \dots, m-1$$

$$\approx \sum_{j=0}^m S_{ij} L(z_j).$$

Fixed point iteration

$$M(\delta z_{i+1}^k - \delta z_i^k) - \sum_{j=0}^n S_{ij} L'(z_j^k) \delta z_j^k$$

Collocation points

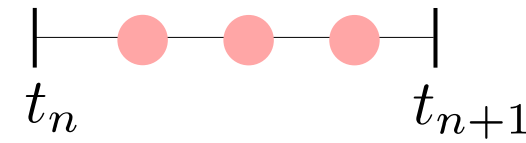
$$\tau_0, \dots, \tau_{m-1}$$

$$= -M(z_{i+1}^k - z_i^k) + \underbrace{\sum_{j=0}^n S_{ij} L(z_j^k)}_{\text{high-order quadrature on a collocation time grid}}$$

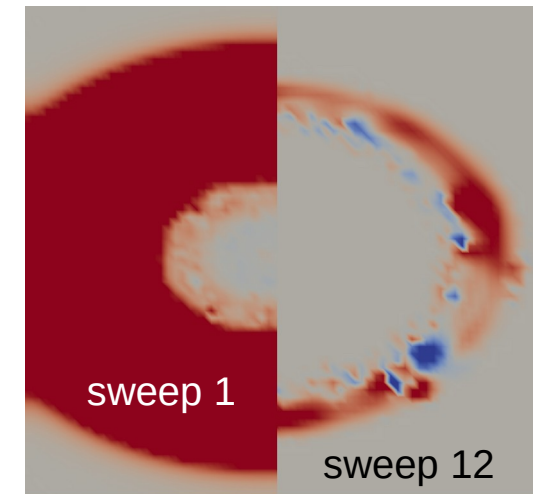
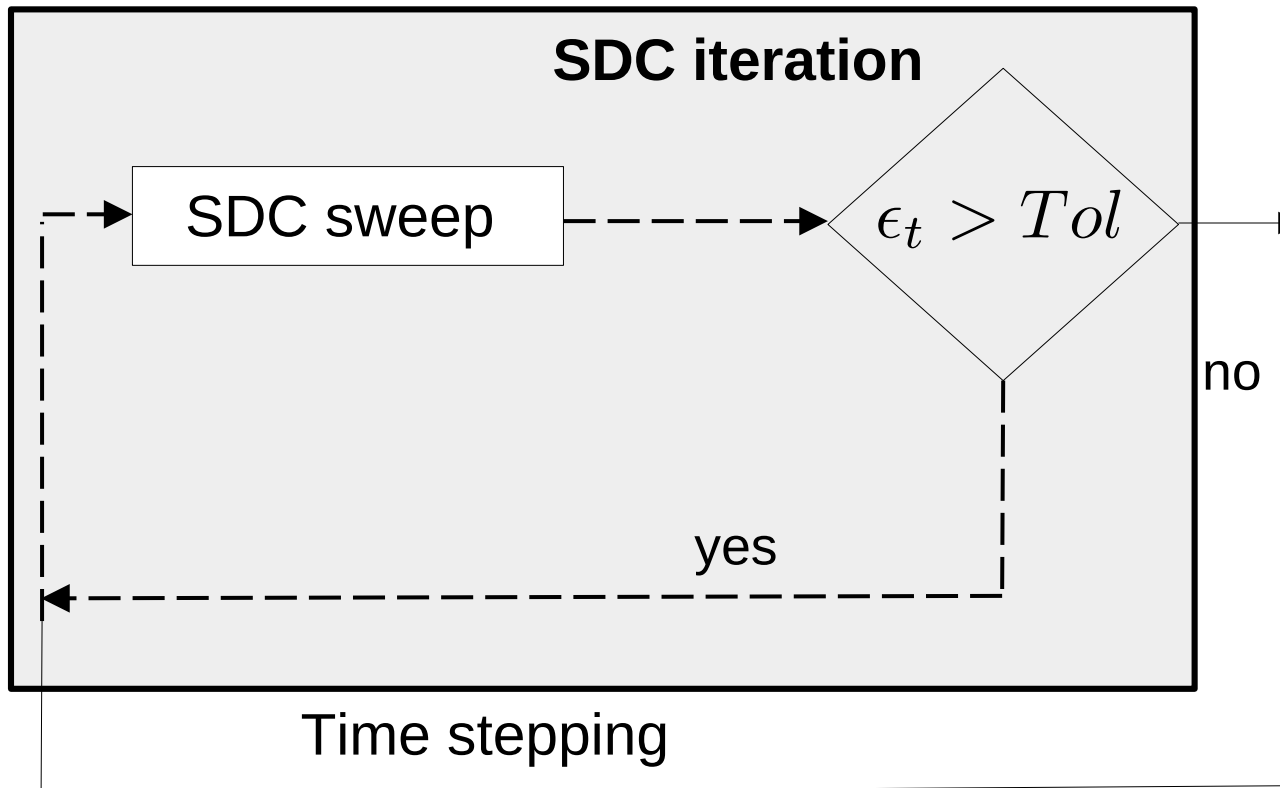
$$z^{k+1} = z^k + \delta z^k$$

high-order quadrature
on a collocation time grid

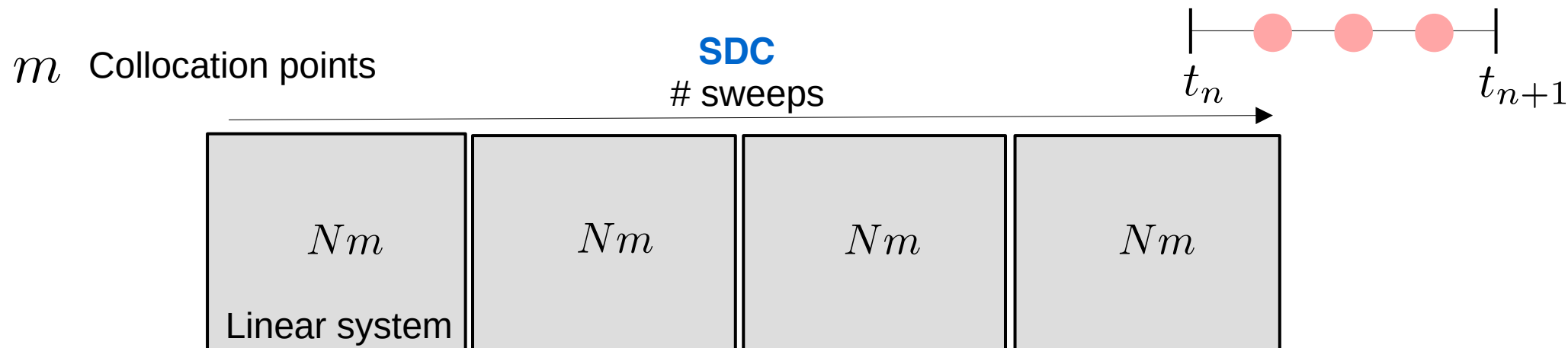
[Dutt, Greengard, Rokhlin 2000, Auzinger et al. 2003, Layton, Minion 2007, Weiser 2015, Speck, Ruprecht, Minion, Emmett, Krause 2016]



e.g., Radau, Gauss, Lobatto



SDC Correction Structure



SDC Correction Structure

m Collocation points

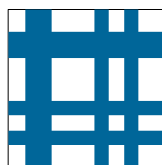
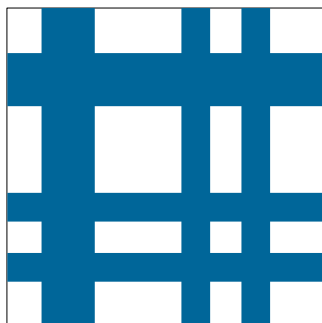
SDC
sweeps

t_n t_{n+1}



SDC + Algebraic adaptivity

Extracted Nested sub-matrices



Algebraic adaptivity

Higher order with
degree of freedom subset selection

Realization

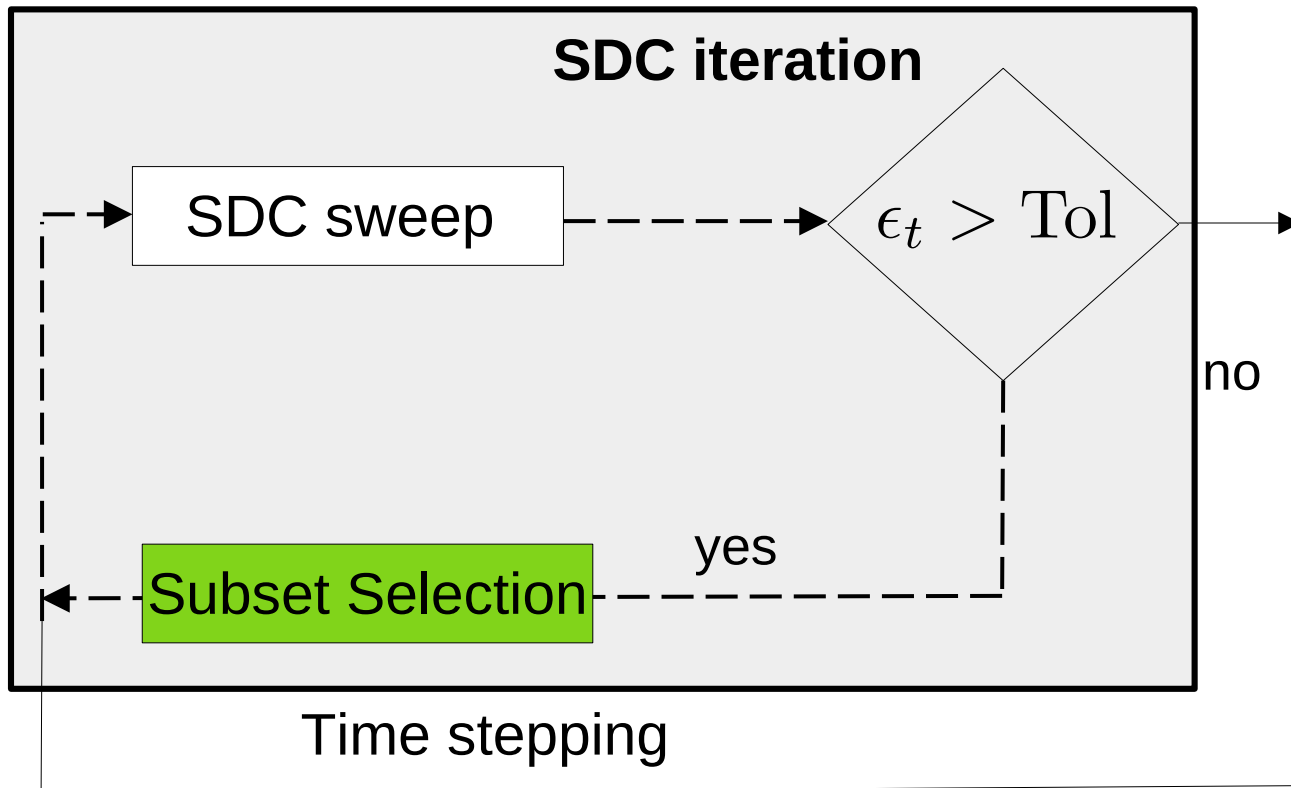
- cheap submatrix extraction
- nested approximation spaces

+ BDDC preconditioner

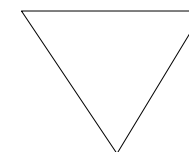
Applied nested sub-matrices for preconditioner

Multirate integration SDC

algebraic DOF subset selection during SDC sweeps Spatial multirate: algebraic adaptivity



limit SDC improvements
to spatial regions
with significant dynamics
by selecting DoFs



impose homogeneous Dirichlet
b.c. for SDC **corrections**

$$\tilde{\Omega}_k = \{x \in \Omega \mid |\delta u^k(x)| \geq T_{\text{drop}}\}$$

drop node if error estimate below drop tolerance

SDC update with Algebraic Adaptivity

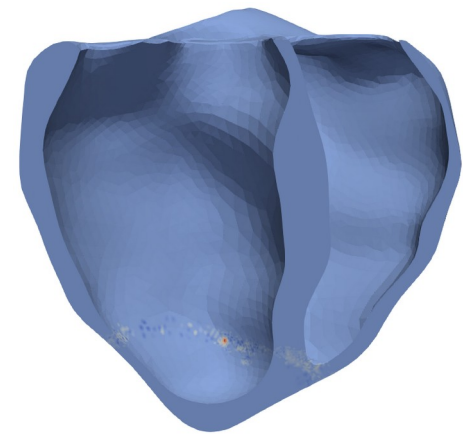
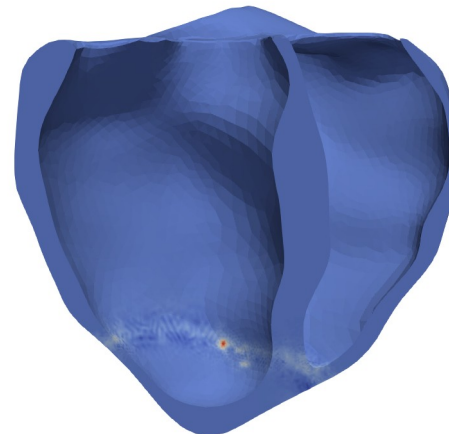
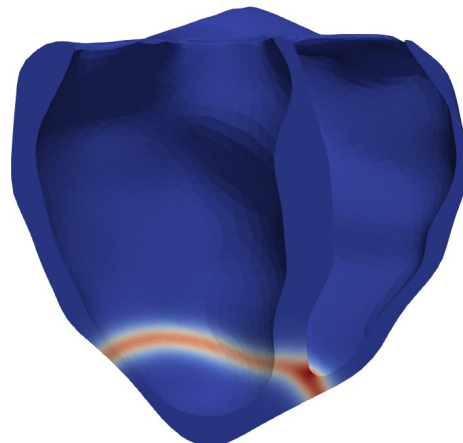
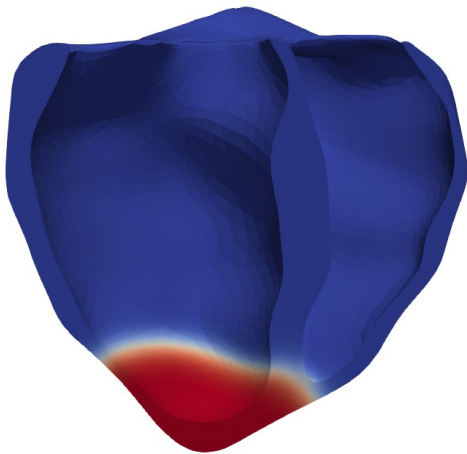
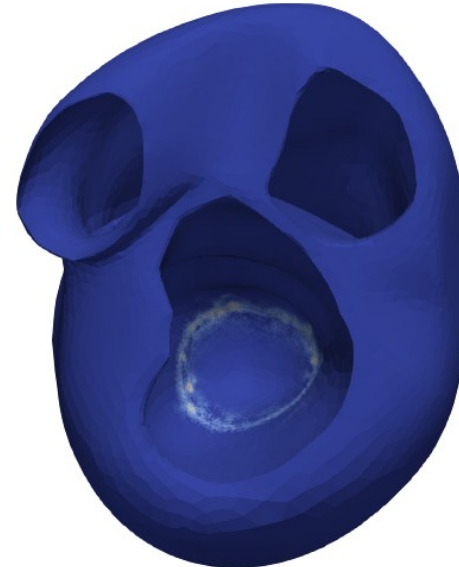
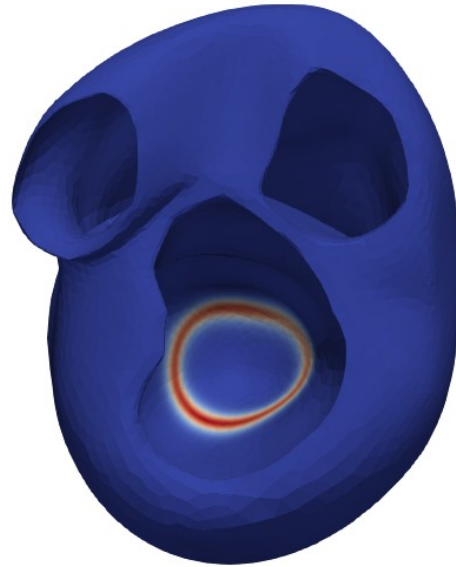
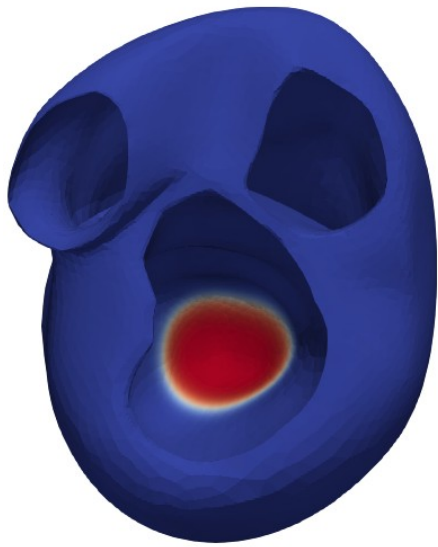
monodomain model

646 166

3283

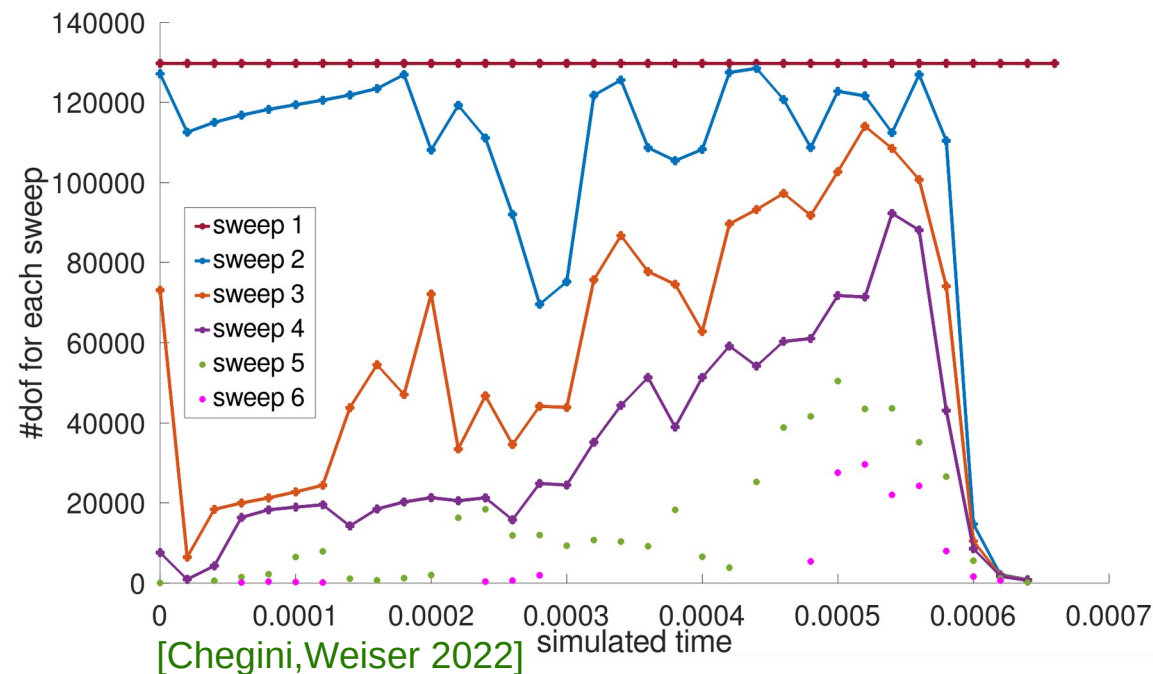
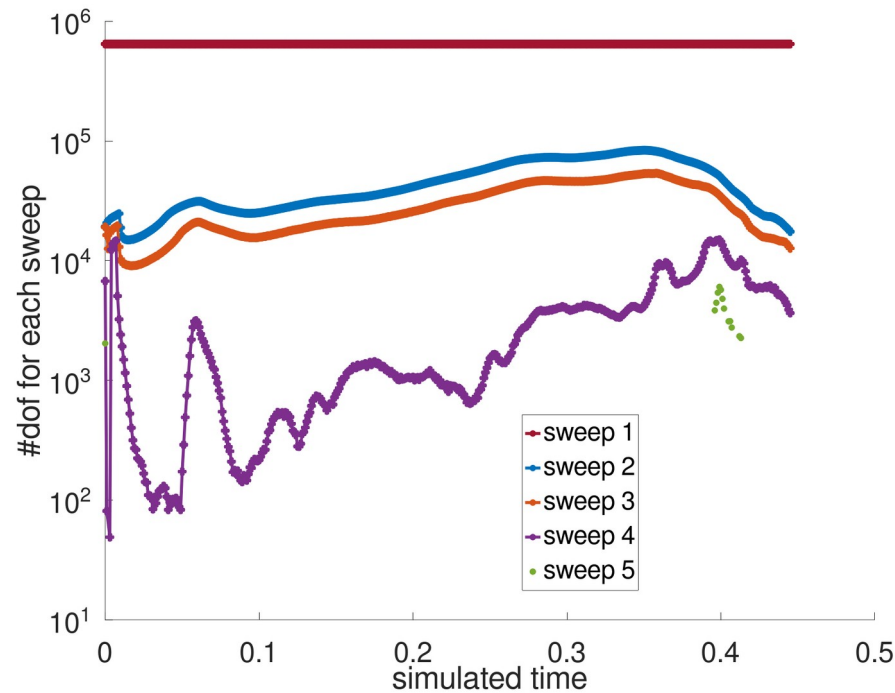
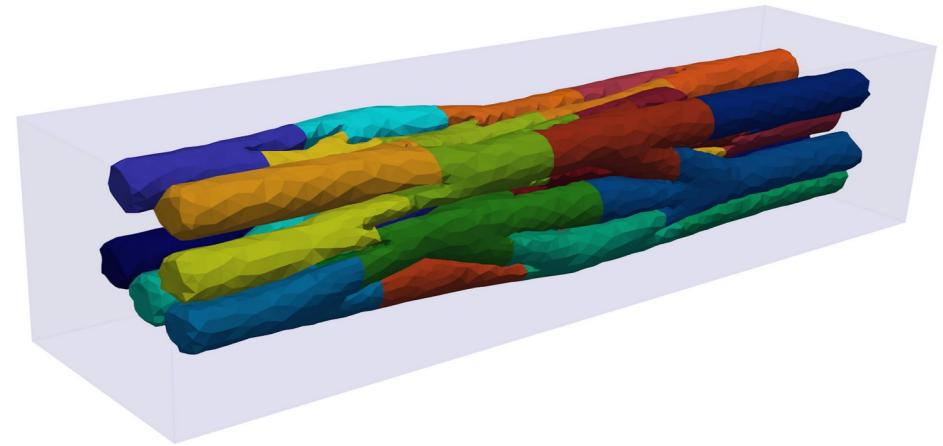
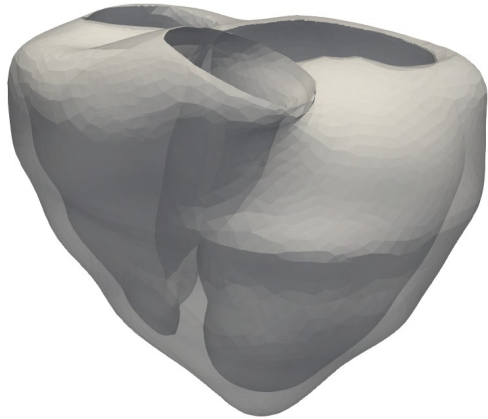
425

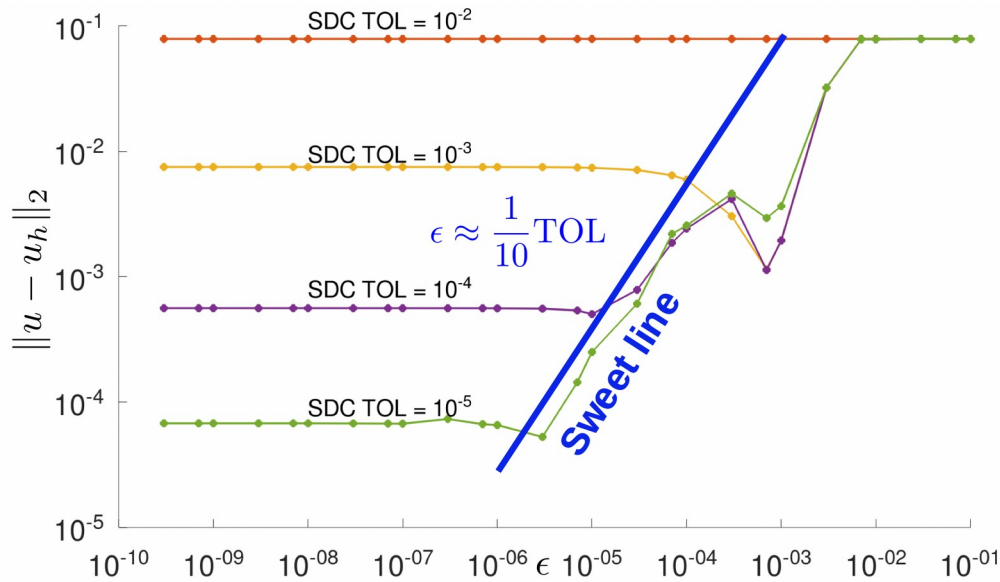
58



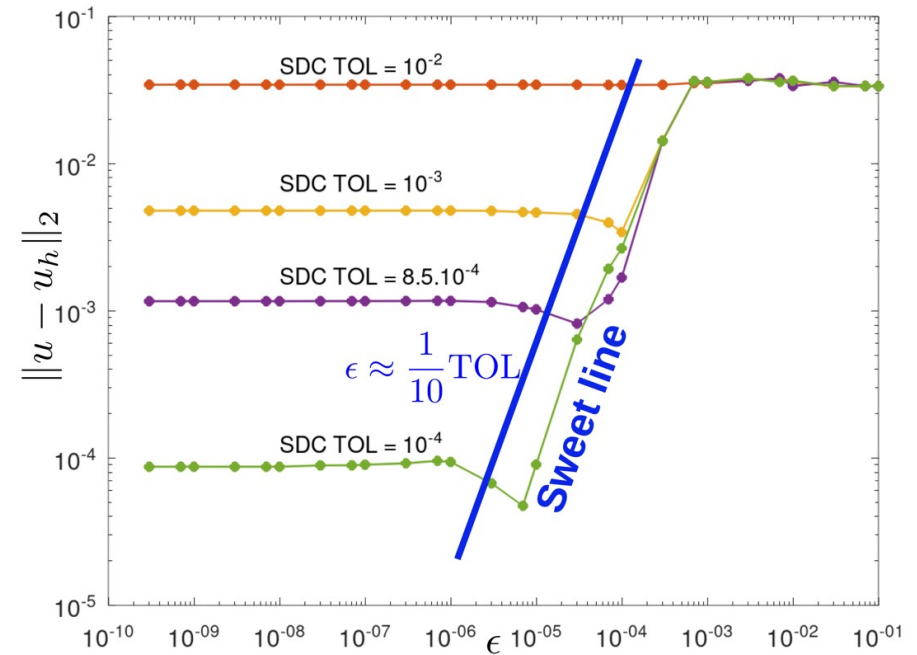
Number of active dofs in each sweep

Monodomain model & EMI model





Monodomain model



EMI model

	monodomain	EMI
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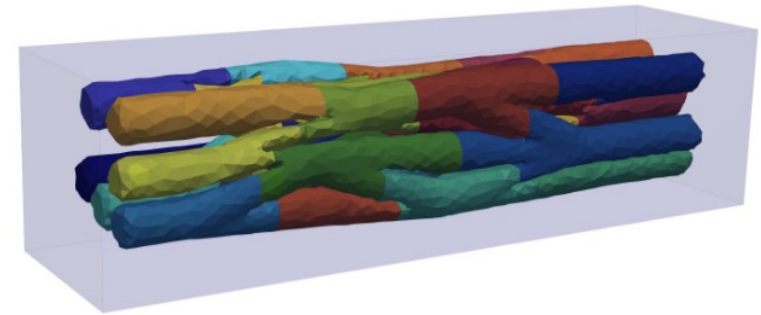
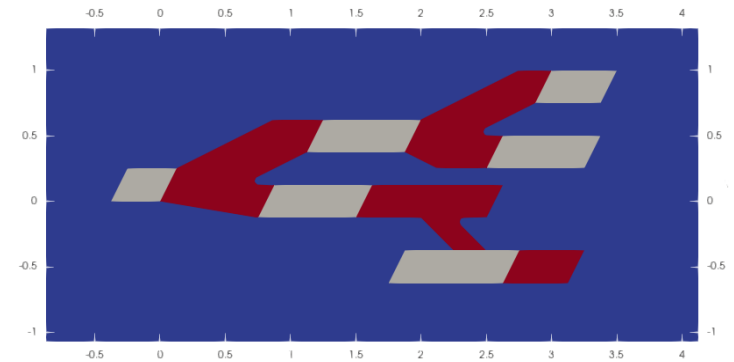
2D	2.13	3.336
----	------	-------

3D	3.29	4.344
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Using SDC w/o algebraic adaptivity

[Chegini,Steinke,Weiser 2022]

EMI domain



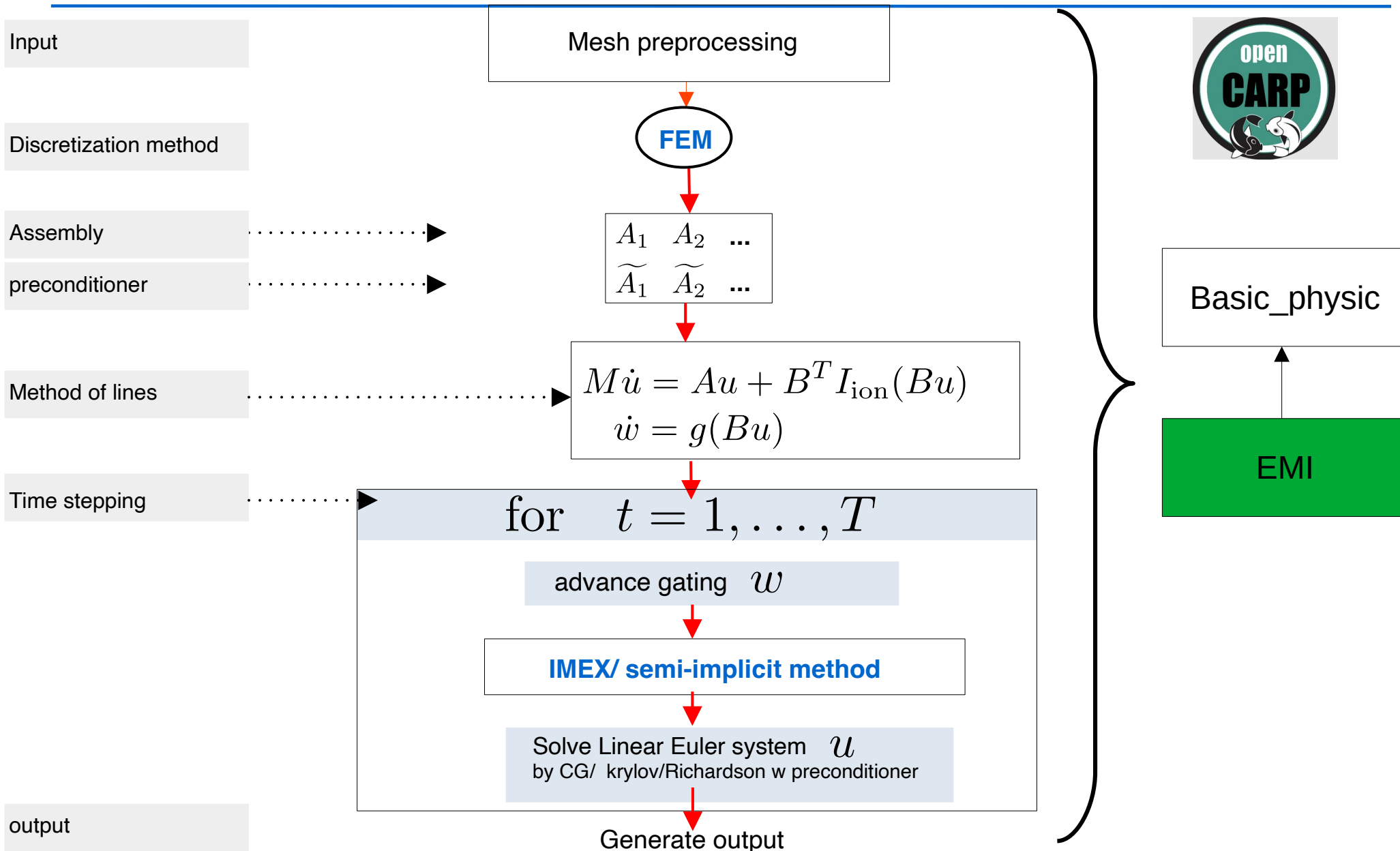
KAS
KADE 7

- a great match – multirate integration and SDC methods play exceedingly well together
- multirate SDC is a cheap and simple way to do adaptive cardiac simulations
 - cheap submatrix extraction

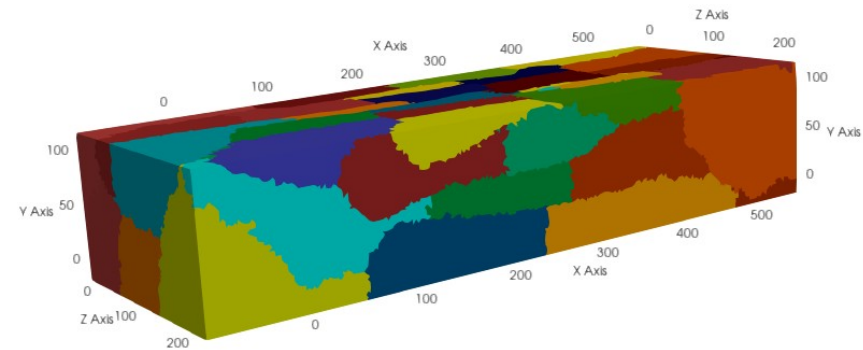
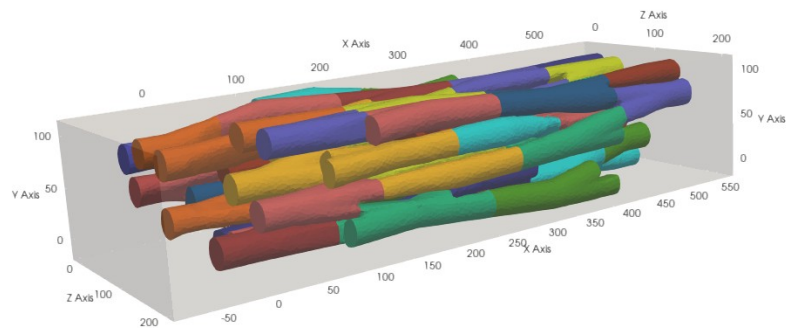
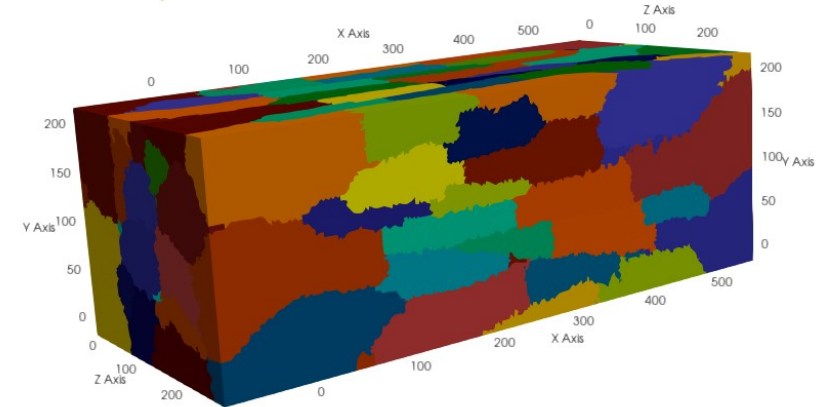
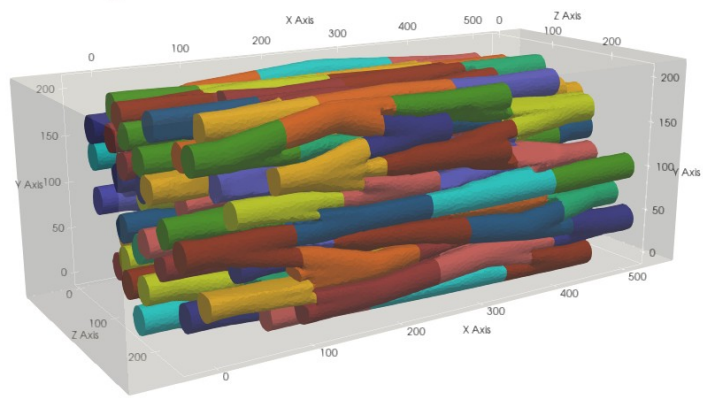
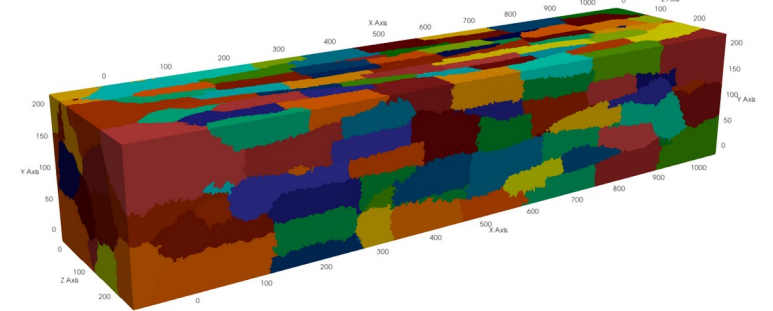
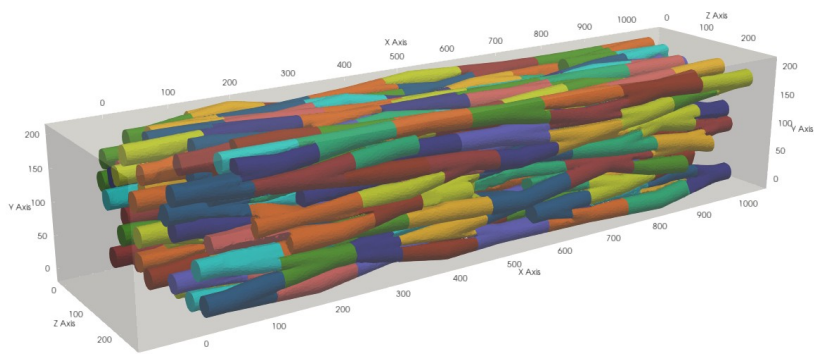
Notes:

- adaptive selection of drop tolerance
- cheap restriction of preconditioners → preconditioners/factorizations need to be recomputed
 - a conjugate gradient method with block Jacobi preconditioner
 - Applied nested sub-matrices for BDDC preconditioner
- load imbalance in distributed simulations of large scale problems
- reducing the energy consumption of large scale simulations.

Top level steps

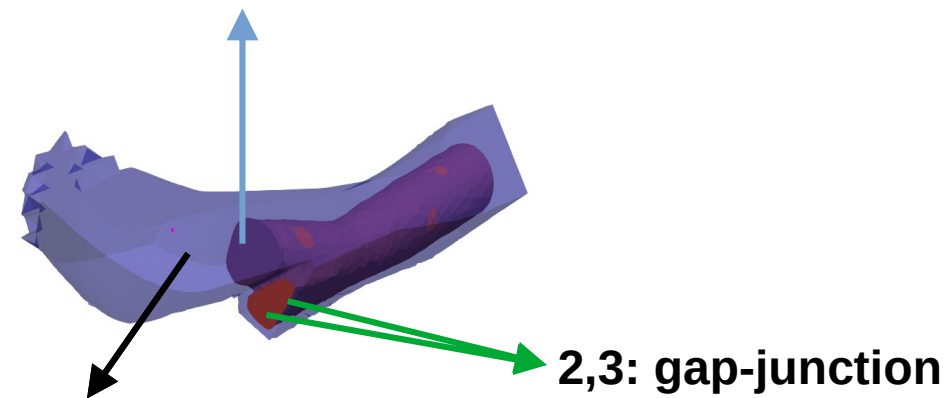


Mesh



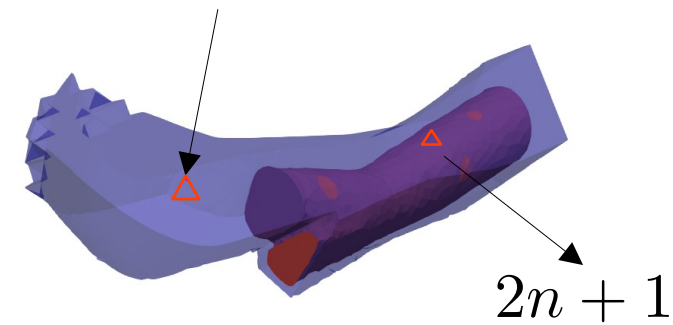
Mesh data in EMI

1: membrane

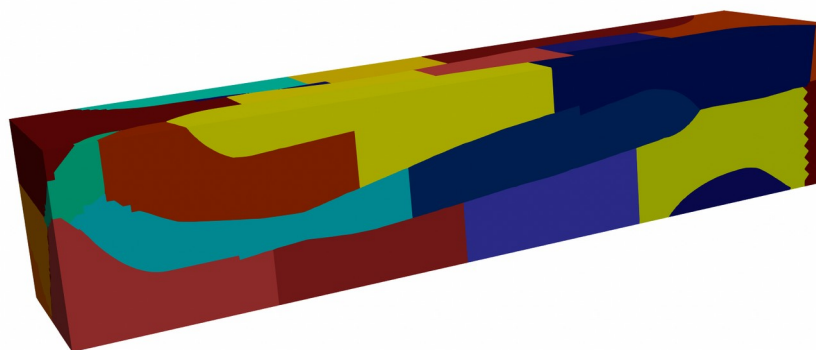
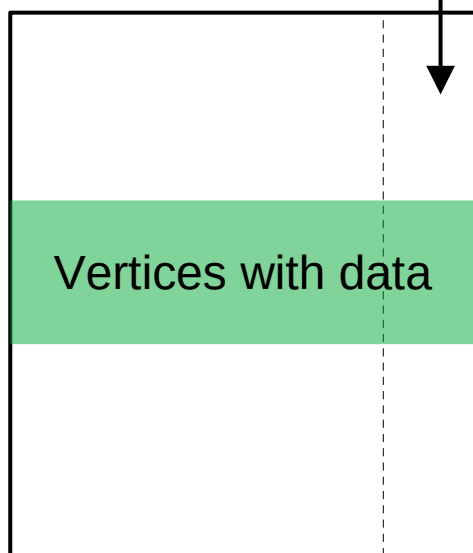


0: Inner domain

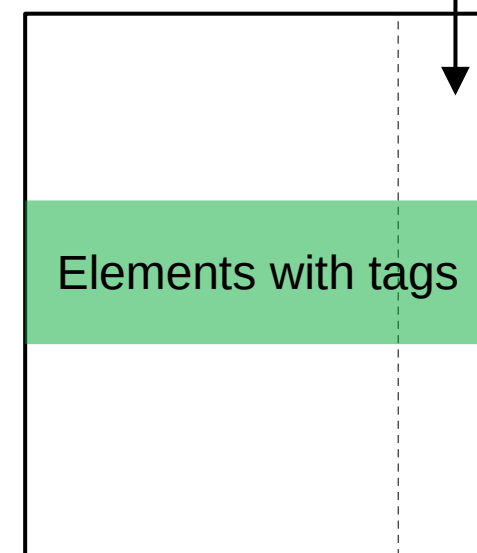
$2n$



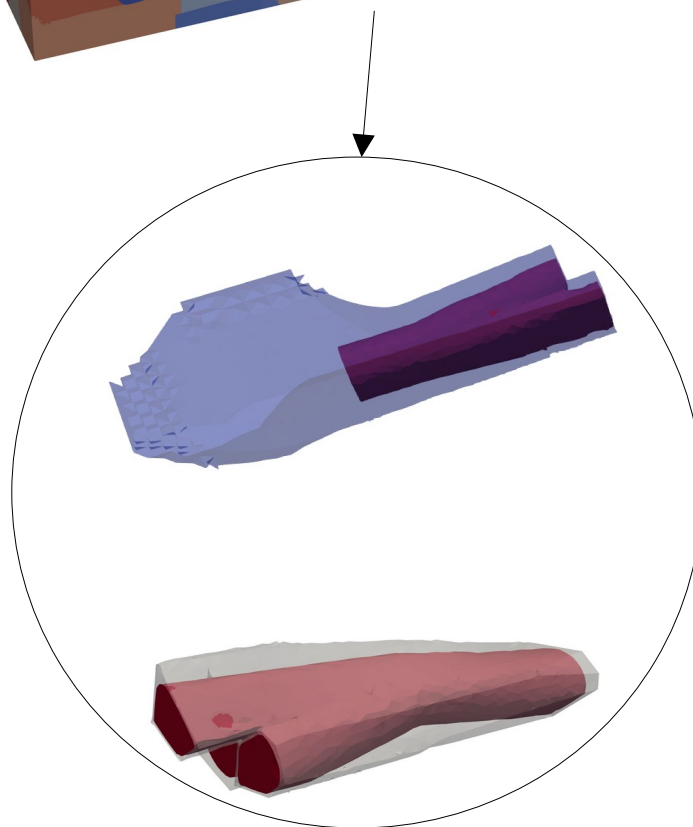
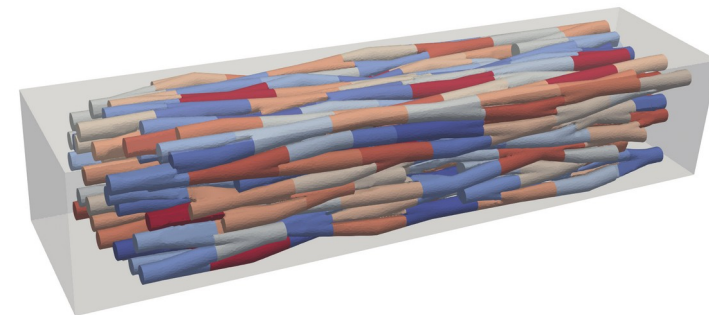
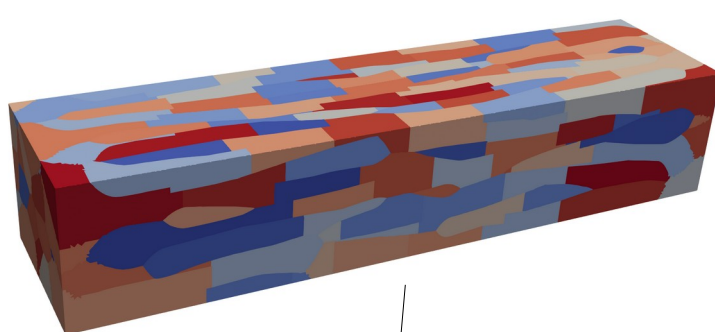
*.pts {0, 1, 2, 3}



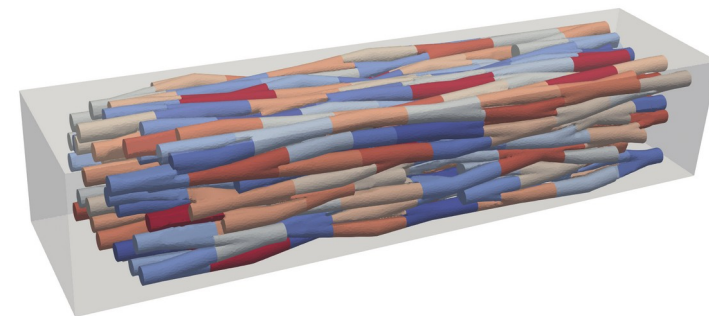
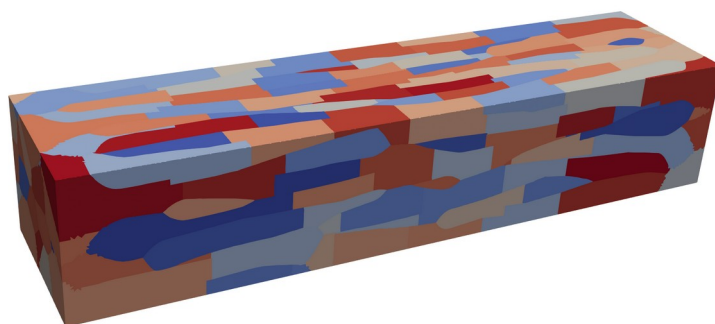
*.elem Tag



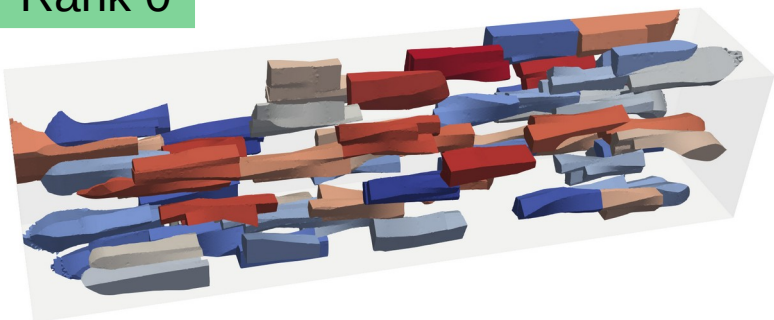
Mesh distribution



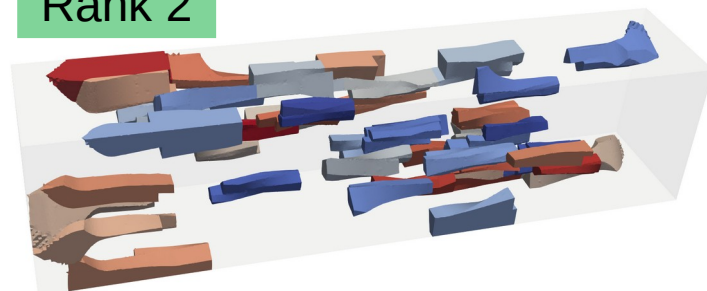
Mesh distribution



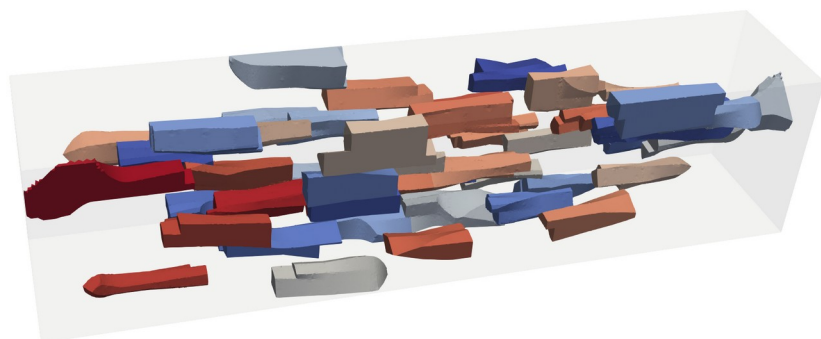
Rank 0



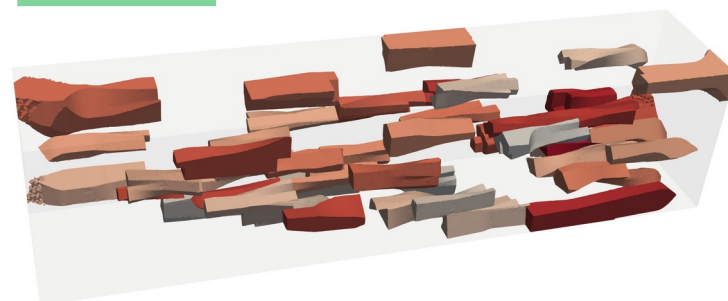
Rank 2



Rank 1

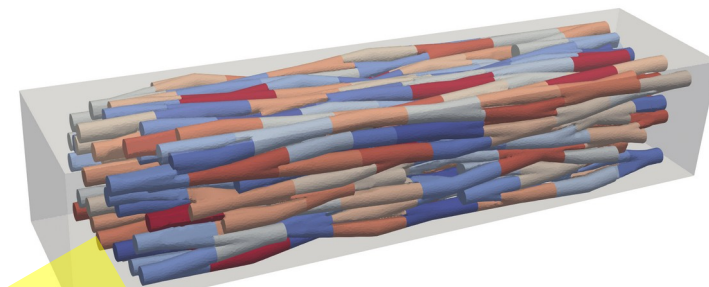
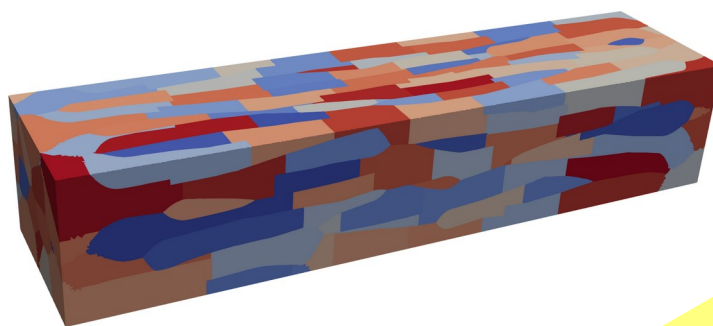


Rank 3

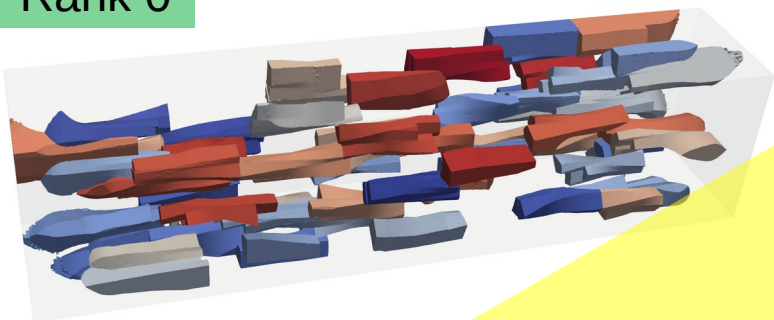


Mesh distribution

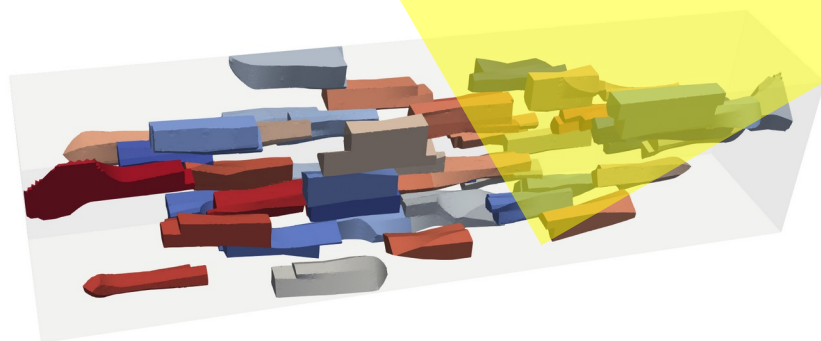
Mesh distribution



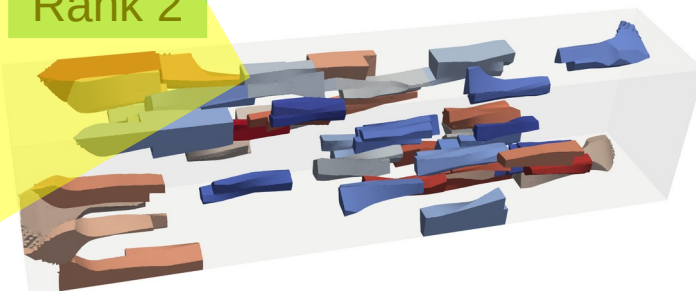
Rank 0



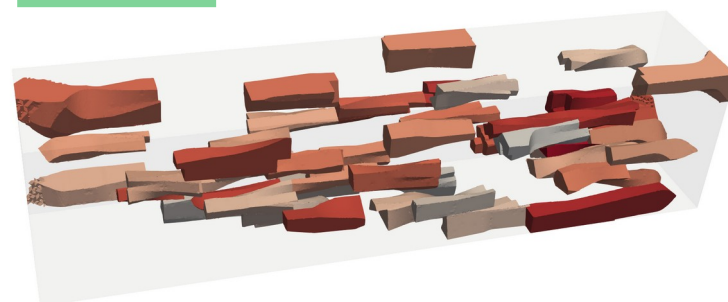
Rank 1



Rank 2

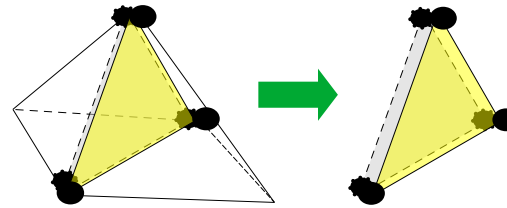


Rank 3



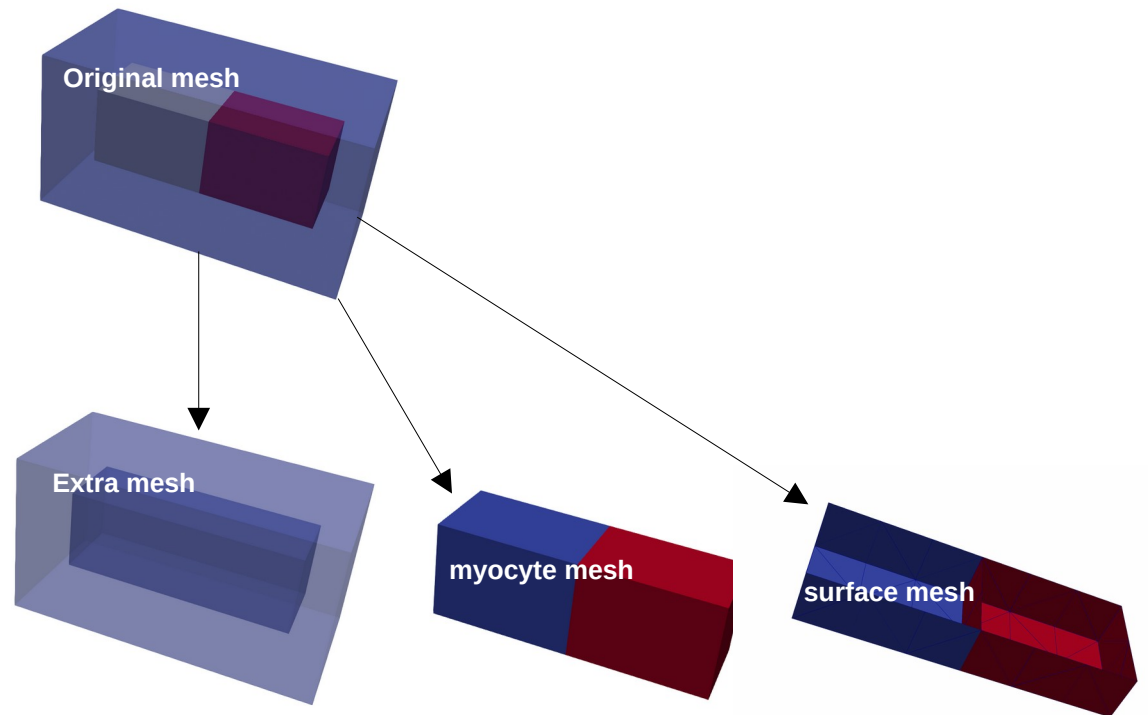
Graph coloring

Extract interfaces

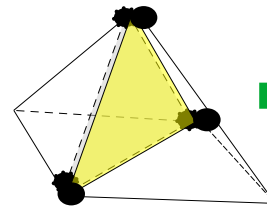


Original mesh

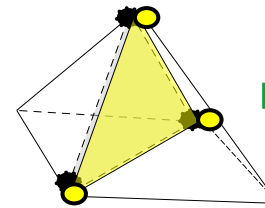
surface mesh



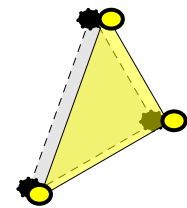
Define dof indices



Original mesh



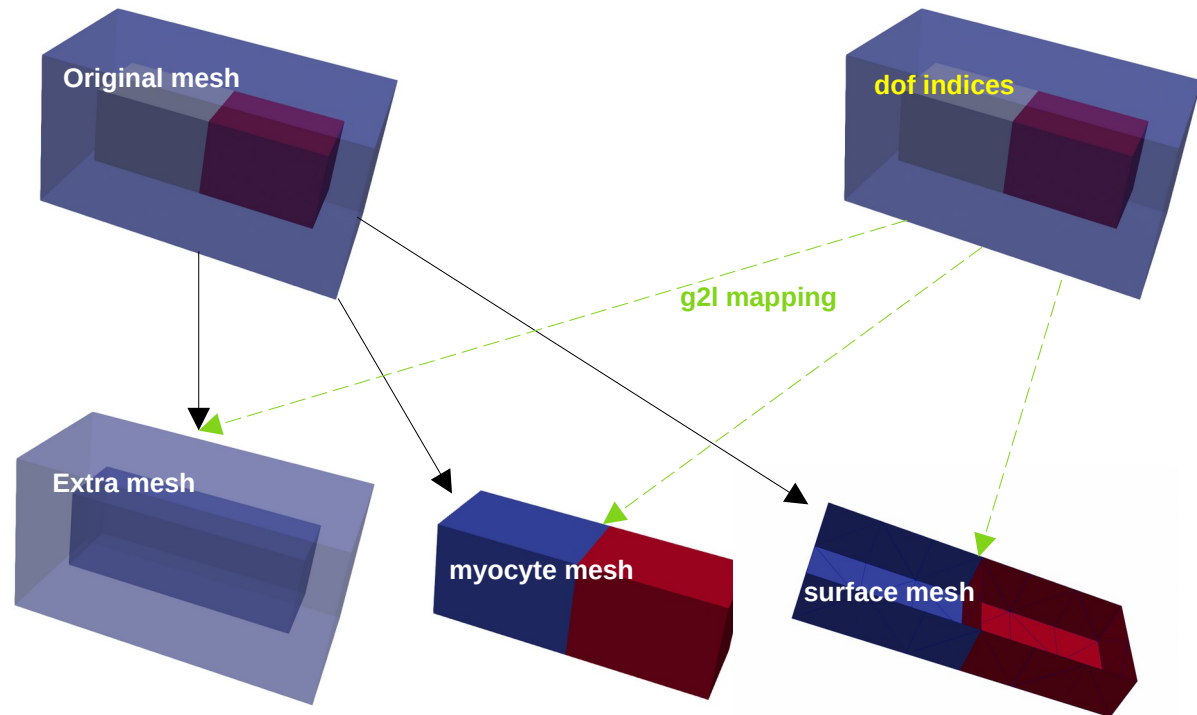
dof indices



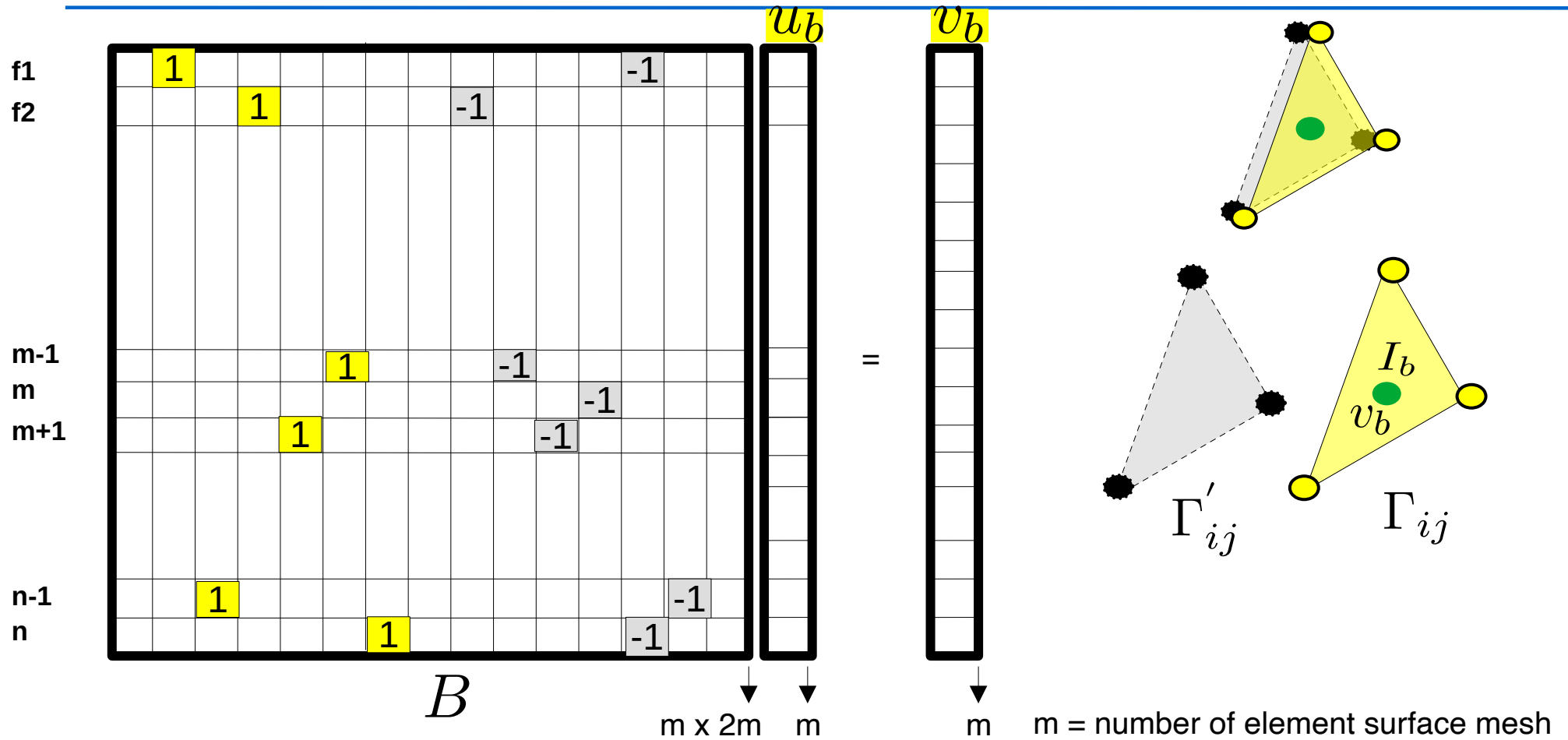
Surface mesh

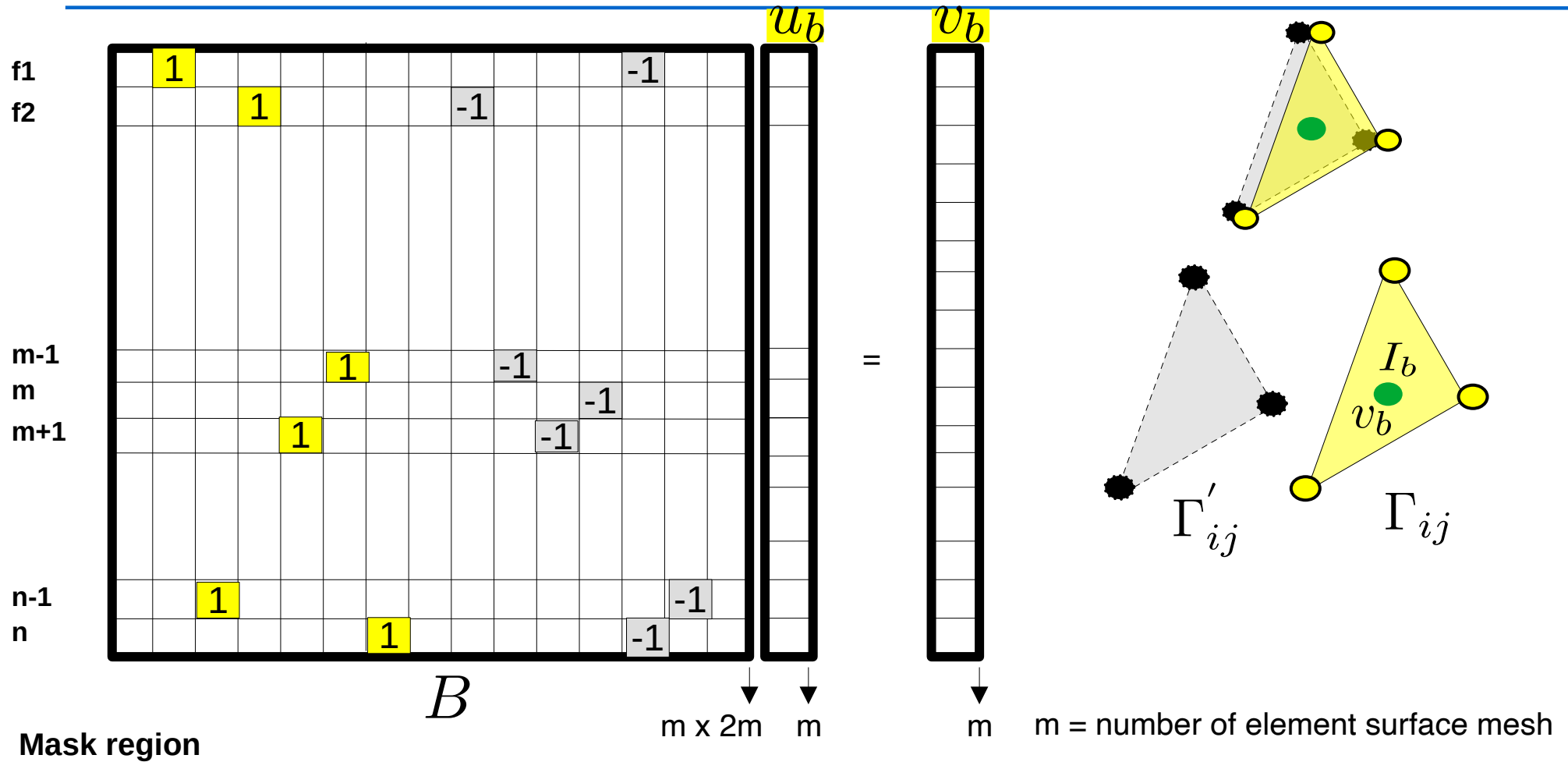
Extract submeshes

$(\text{Idx}_{\text{old}}, \text{tag}) \rightarrow (\text{Idx}_{\text{new}}, \text{tag})$



Operator B

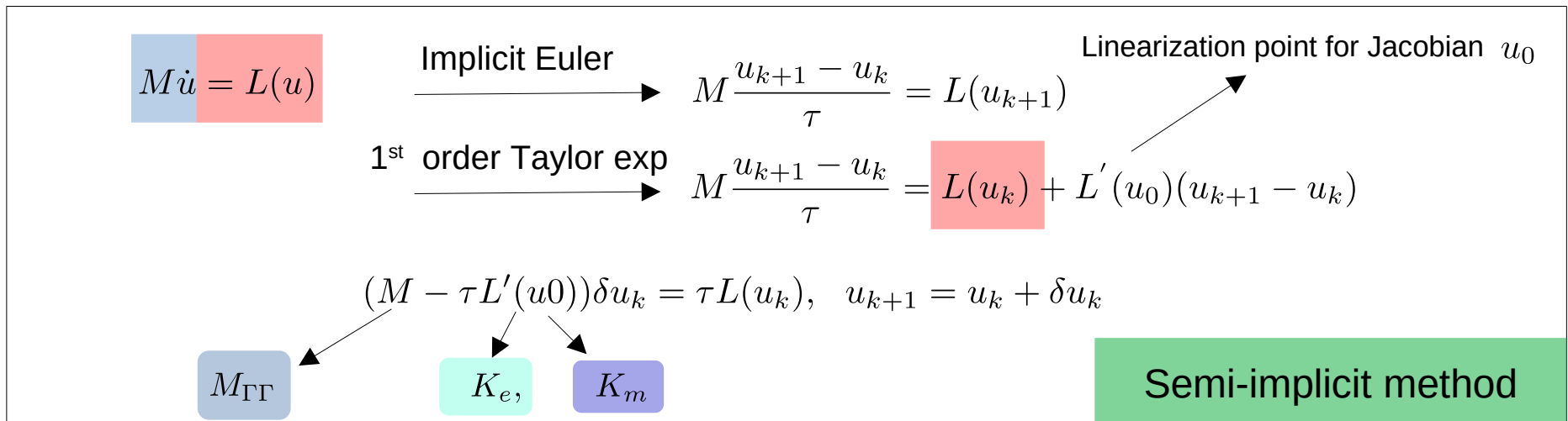
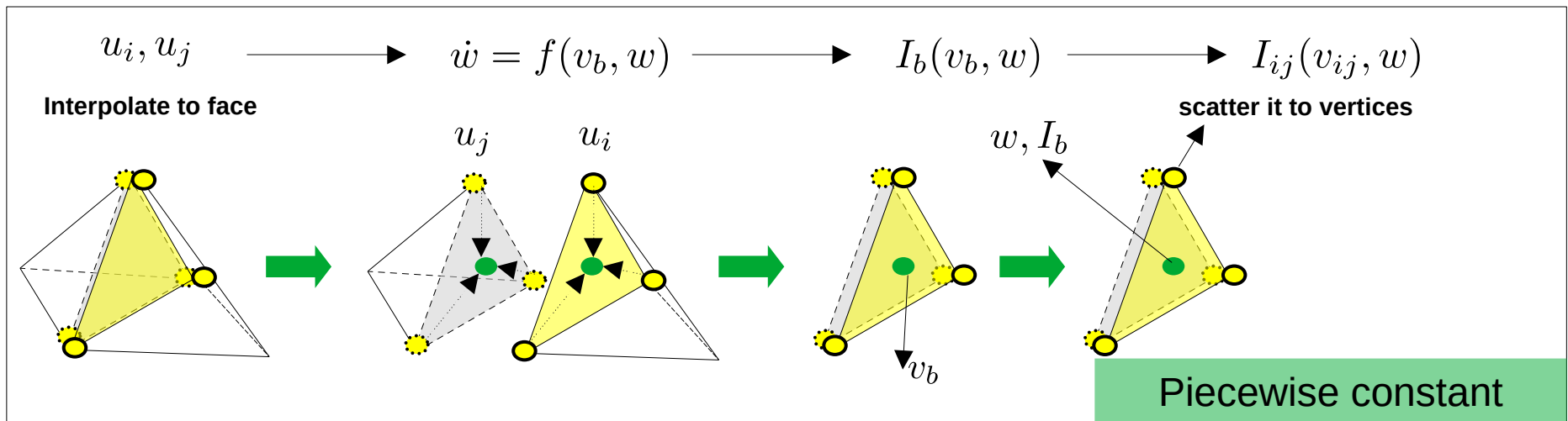




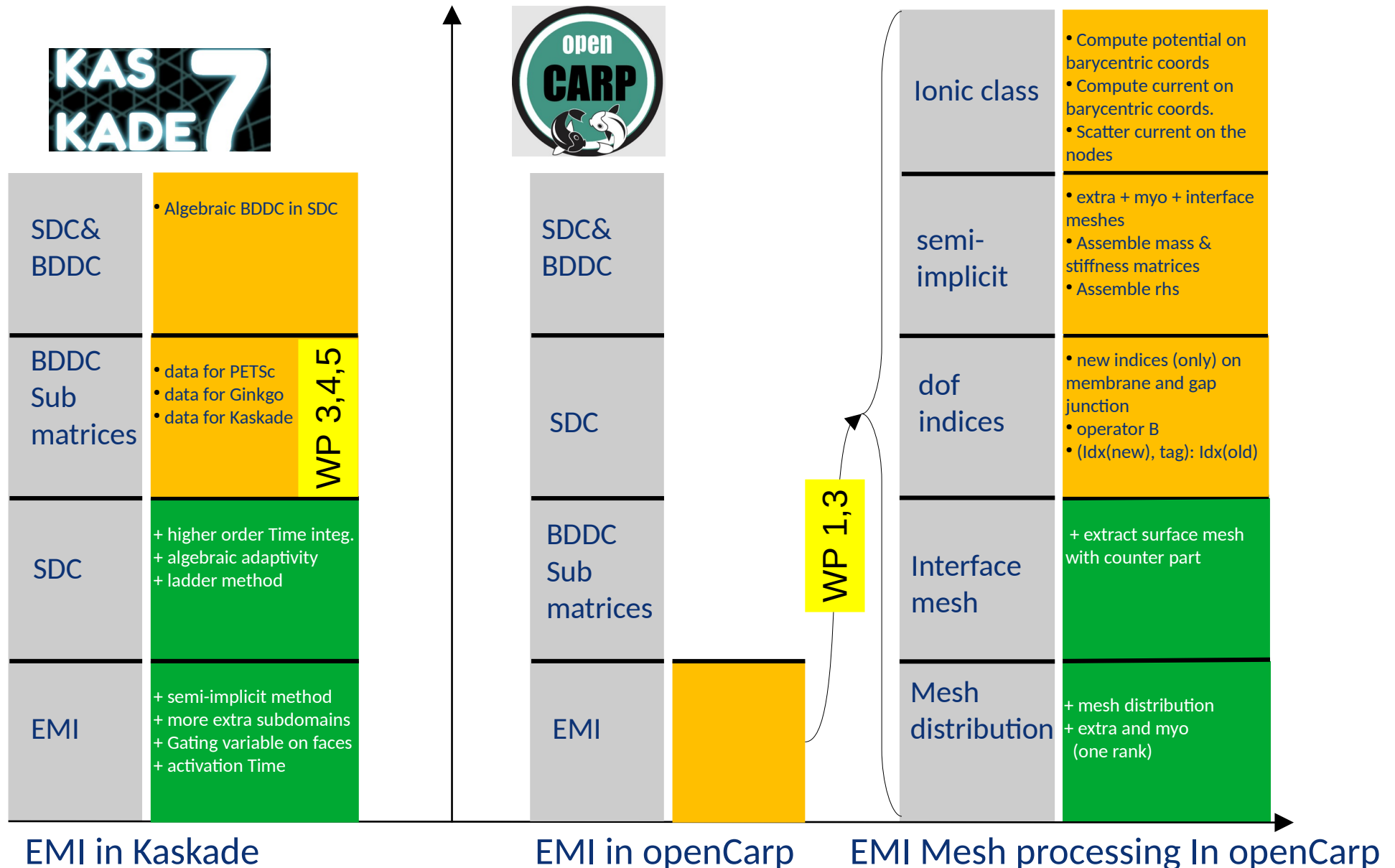
$$I_{ij}^{\text{ion}}(v_{ij}, w_{ij}) = \begin{cases} I_m(v_{ij}, w_{ij}) & \Gamma_m = \{\Gamma_{ij}, \Gamma'_{ij}\} \\ I_g(v_{ij}) = \frac{v_{ij}}{R_g}, & w_{ij} = 0 \quad \Gamma_g = \{\Gamma_{ij}, \Gamma'_{ij}\} \end{cases}$$

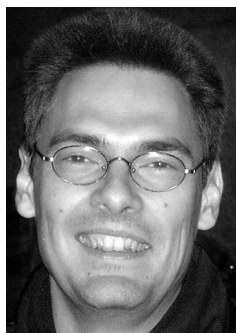
Time integration method

$$\int_0^T \left(\int_{\Omega_e} \sigma_e \nabla u_e \cdot \nabla \phi_e dx + \int_{\Omega_m} \sigma_m \nabla u_m \cdot \nabla \phi_m dx + \int_{\Gamma_{ij(i \neq j)}} (C(\dot{u}_i - \dot{u}_j) + I_{ij}^{\text{ion}}(u_i - u_j, w_{ij})) \varphi dx \right) dt = 0$$

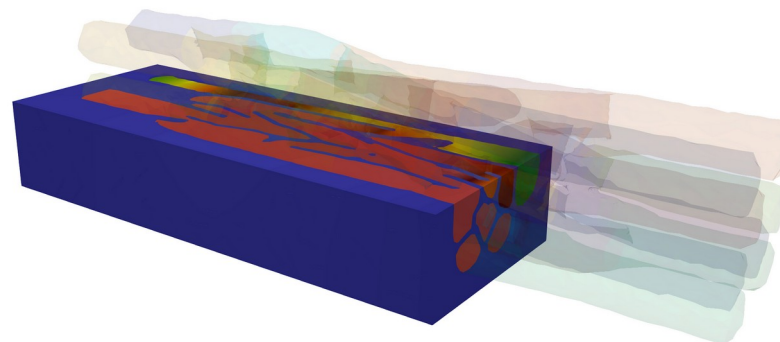


Status update





Martin Weiser(**Head of WP3**)



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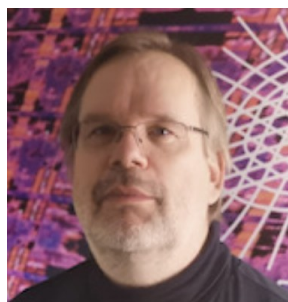


Federal Ministry
of Education
and Research



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Thank you for your attention



Thomas Steinke(**WP3**)



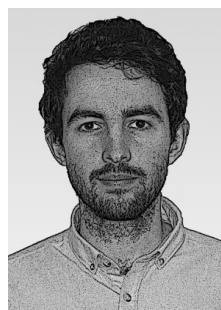
Aurel Neic(**WP1**)



Fritz Göbel(**WP4**)



Ngoc Mai Monica Huynh
(**WP5**)



Tomas Stry(**WP1**)

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