# **Different FEM approaches for the forward problem in MEG/EEG**



## **Carsten Wolters**

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- general introduction
- continuous Galerkin for EEG and MEG
- discontinuous Galerkin for EEG and MEG
- unfitted discontinuous Galerkin for EEG
- summary

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### forward problem in EEG and MEG

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where  $\mathbf{j}^{s}$  depends on the EEG forward solution u

$$\Phi = \int_{S} \mathbf{B} \cdot d\mathbf{s} = \int_{S} (\nabla \times \mathbf{A}) \cdot d\mathbf{s} = \oint_{C = \partial S} \mathbf{A} \cdot d\mathbf{c}$$

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 analytical solution out of a sphere model (Sarvas, 1987)
### the goal is to evaluate the magnetic flux $\varPhi$

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- analytical solution out of a sphere model (Sarvas, 1987)
- numerical solution once *u* is computed

### • head model:

- electrical features
- geometrical features

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#### • sensor model

• source model



### • head model:

- electrical features
- geometrical features

- sensor model
- source model
- method:
  - vast spectrum of different numerical methods

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#### A guideline for head volume conductor modeling in EEG and MEG

Johannes Vorwerk <sup>a,\*</sup>, Jae-Hyun Cho<sup>b</sup>, Stefan Rampp <sup>c</sup>, Hajo Hamer <sup>c</sup>, Thomas R. Knösche<sup>b</sup>, Carsten H. Wolters <sup>a</sup>

<sup>a</sup> Institut für Biomagnetismus und Biosignalanalyse, Westfälische Wilhelms-Universität, Münster, Germany

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#### Table 1

Overview of the compartment conductivities, the conductive features of the different head models (I is considered, - is disregarded,: is further divided, and A is anisotropic), and their resolution.

Compartment	σS/m	3CI	4CI	50	6CI	6CA	6CA_hr
Brain	0.33	1	I	:	:	:	:
Brain GM	0.33	-	-	I	1	I	1
Brain WM	0.14	-	-	I	I	A	A
CSF	1.79	-	I	I	I	I	I
Skin	0.43	1	I	I	1	I	1
Skull	0.01	1	I	I	:	:	:
Skull comp.	0.008	-	-	-	I	I	I
Skull spong.	0.025	-	-	-	1	I	I
Resolution	#Nodes	984,569	984,569	984,569	984,569	984,569	2,159,337

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# numerical methods to solve partial differential equations

- Boundary Element Method (BEM)
- Finite Element Method (FEM)
- Finite Volume Method (FVM)
- Finite Difference Method (FDM)

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- Finite Element Method (FEM)
  - Continuous Galerkin (CG)
  - Discontinuous Galerkin (DG)
  - Unfitted Discontinuous Galerkin (UDG)
  - Mixed Fomulation
  - Immersed
  - ...
- Finite Volume Method (FVM)
- Finite Difference Method (FDM)

# numerical methods

### • Boundary Element Method (BEM)

(Mosher et al., 1999; Kybic et al., 2005; Acar and Makeig, 2010; Gramfort et al., 2011; Stenroos and Sarvas, 2012)

### • Finite Element Method (FEM)

• Continuous Galerkin (CG)

(Bertrand et al., 1991; Marin et al., 1998; Schimpf et al., 2002; Drechsler et al., 2009; Pursiainen et al., 2016)

• Discontinuous Galerkin (DG)

(Engwer et al., 2017)

### • Unfitted Discontinuous Galerkin (UDG)

(Ning et al., 2016)

Mixed Fomulation

(Vorwerk et al., 2017)

#### Immersed

(Vallaghé et al., 2008)

• ...

### • Finite Volume Method (FVM)

(Cook and Koles, 2006)

### Finite Difference Method (FDM)

(Wendel et al., 2008; Vatta et al., 2009; Montes-Restrepo et al., 2014)

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Strong Formulation

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 $\downarrow$ 

Strong Formulation

# Weak (Variational) Formulation

### Strong Formulation

### Weak (Variational) Formulation

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### Weak (Variational) Formulation

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### Discrete Weak (Variational) Formulation





Formulation





Discrete Weak Formulation



Discrete Weak Formulation




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Lagrange-type elements: d.o.f. node-based, shape functions are continuous  $L^2$  - conforming elements: d.o.f. cell-based, continuity

across element interfaces is not required



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Lagrange-type elements: d.o.f. node-based, shape functions are continuous CONTINUOUS GALERKIN (CG)  $L^2$  - conforming elements: d.o.f. cell-based, continuity across element interfaces is not required DISCONTINUOUS GALERKIN (DG)





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### the goal is to evaluate the electric potential u

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split u and  $\sigma$ 

$$u = u^{\infty} + u^{corr}$$

$$\sigma = \sigma^{\infty} + \sigma^{corr}$$

where  $u^{\infty}$  is solution of Poisson equation in an unbounded and homogeneous domain with conductivity  $\sigma^{\infty}$ 

when multiplying with a test function  $v_h \in V_h$  and integrating by parts we obtain the *weak formulation:* 

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$$CG - FEM (Drechsler et al., 2009)$$
  
find  $u_h^{corr} \in V_h \subset H^1$  s.t.  
$$\int_{\Omega} \sigma \nabla u_h^{corr} \cdot \nabla v_h dx = -\int_{\Omega} \sigma^{corr} \nabla u^{\infty} \cdot \nabla v_h dx - \int_{\partial \Omega} \sigma^{\infty} \nabla u^{\infty} \cdot \mathbf{n} v_h ds)$$

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(the solution exists and it is unique) (derivation of the weak form on the smart board)

$$\mathbf{B}(\mathbf{r}) = \mathbf{B}^{p}(\mathbf{r}) + \mathbf{B}^{s}(\mathbf{r})$$
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$$\mathbf{B}^{s}(\mathbf{r}) = \frac{\mu_{0}}{4\pi} \int_{\Omega} \left( \sigma \nabla u^{\infty}(\mathbf{r}') + \sigma \nabla u^{corr}(\mathbf{r}') \right) \times \frac{\mathbf{r} - \mathbf{r}'}{|\mathbf{r} - \mathbf{r}'|^{3}} d^{3}\mathbf{r}'$$

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# the Discontinuous Galerkin method in **EEG** [Engwer et al., SIAM J. Scientific Comp., 2017]



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- C<sub>0</sub>: skull (very low conductivity)
- *C*<sub>1</sub>: CSF
- C<sub>2</sub>: skin



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## schematization: CG FEM

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### conservation of charge

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where

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$$\mathbf{j}^{corr} = \sigma \nabla u^{corr}$$
  
•  $f^{corr} = -\nabla \cdot \sigma^{corr} \nabla u^{\infty}$ 

 in general, a conforming discretization does not guarantee this property

### triangulation and h

A triangulation  $\mathcal{T}(\Omega)$  of a domain  $\Omega$  is:

- a finite set of disjoint open sets  $E_e$
- $\bullet\,$  forms a partition of  $\Omega\,$

*h* denotes the mesh width,  $h \coloneqq maxdiam(E)|E \in \mathcal{T}(\Omega)$ 

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*h* denotes the mesh width,  $h \coloneqq maxdiam(E)|E \in \mathcal{T}(\Omega)$ 

### Broken polynomial spaces

piecewise polynomial spaces on a triangulation of  $\boldsymbol{\Omega}$ 

$$V_h^k := \left\{ v \in L^2(\Omega) : v|_E \in \mathbb{P}^k(E) 
ight\},$$

where  $\mathbb{P}^k$  denotes the space of polynomial functions of degree k

#### triangulation and h

A triangulation  $\mathcal{T}(\Omega)$  of a domain  $\Omega$  is:

- a finite set of disjoint open sets  $E_e$
- forms a partition of  $\Omega$

h denotes the mesh width,  $h \coloneqq maxdiam(E)|E \in \mathcal{T}(\Omega)$ 

### Broken polynomial spaces

piecewise polynomial spaces on a triangulation of  $\boldsymbol{\Omega}$ 

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ight\},$$

where  $\mathbb{P}^k$  denotes the space of polynomial functions of degree k

### jump and average operators

$$\llbracket u \rrbracket := u|_{E_e} \mathbf{n}_e + u|_{E_f} \mathbf{n}_f, \ u := \frac{\sigma_f}{\sigma_e + \sigma_f} u|_{E_e} + \frac{\sigma_e}{\sigma_e + \sigma_f} u|_{E_f}$$

find  $u_h^{corr} \in V_h^k$  s.t.

$$a(u_h^{corr}, v_h) + J(u_h^{corr}, v_h) = I(v_h), \forall v_h \in V_h^k$$

find 
$$u_h^{corr} \in V_h^k$$
 s.t.  
 $a(u_h^{corr}, v_h) + J(u_h^{corr}, v_h) = I(v_h), \forall v_h \in V_h^k$   
Ihs=

$$= \int_{\Omega} \sigma \nabla u_h^{corr} \cdot \nabla v_h dx - \int_{\Gamma_{int}} \sigma \nabla u_h^{corr} \llbracket v_h \rrbracket ds \\ - \int_{\Gamma_{int}} \sigma \nabla v_h \llbracket u_h^{corr} \rrbracket ds + \eta \int_{\Gamma_{int}} \frac{\hat{\sigma}_{\gamma}}{h_{\gamma}} \llbracket u_h^{corr} \rrbracket \llbracket v_h \rrbracket ds$$

find 
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Ihs=

$$= \int_{\Omega} \sigma \nabla u_{h}^{corr} \cdot \nabla v_{h} dx - \int_{\Gamma_{int}} \sigma \nabla u_{h}^{corr} \llbracket v_{h} \rrbracket ds$$
$$- \int_{\Gamma_{int}} \sigma \nabla v_{h} \llbracket u_{h}^{corr} \rrbracket ds + \eta \int_{\Gamma_{int}} \frac{\hat{\sigma}_{\gamma}}{h_{\gamma}} \llbracket u_{h}^{corr} \rrbracket \llbracket v_{h} \rrbracket ds$$

rhs =

$$-\int_{\Omega}\sigma^{corr}\nabla u^{\infty}\cdot\nabla v_{h}dx+\int_{\partial\Omega}\sigma^{\infty}\nabla u^{\infty}\cdot\mathbf{n}vds+\int_{\Gamma_{int}}\sigma^{corr}\nabla u^{\infty}\llbracket v_{h}\rrbracket ds$$

find 
$$u_h^{corr} \in V_h^k$$
 s.t.  
 $a(u_h^{corr}, v_h) + J(u_h^{corr}, v_h) = I(v_h), \forall v_h \in V_h^k$   
Ihs=

$$= \int_{\Omega} \sigma \nabla u_h^{corr} \cdot \nabla v_h dx - \int_{\Gamma_{int}} \sigma \nabla u_h^{corr} [\![v_h]\!] ds$$
$$- \int_{\Gamma_{int}} \sigma \nabla v_h [\![u_h^{corr}]\!] ds + \eta \int_{\Gamma_{int}} \frac{\hat{\sigma}_{\gamma}}{h_{\gamma}} [\![u_h^{corr}]\!] [\![v_h]\!] ds$$

rhs =

$$-\int_{\Omega}\sigma^{corr}\nabla u^{\infty}\cdot\nabla v_{h}dx+\int_{\partial\Omega}\sigma^{\infty}\nabla u^{\infty}\cdot\mathbf{n}vds+\int_{\Gamma_{int}}\sigma^{corr}\nabla u^{\infty}\llbracket v_{h}\rrbracket ds$$

#### Theorem

for  $\eta>$  0 sufficiently large, the SIPG discretization has a unique solution; consistent with the strong problem

#### Lemma

the SIPG discretization fulfills a discrete conservation property, with

• 
$$\vec{j}^{corr} = \{\sigma \nabla_h u_h^{corr}\} - \eta \frac{\hat{\sigma}_{\gamma}}{\hat{h}_{\gamma}} \llbracket u_h^{corr} \rrbracket$$
  
•  $f^{corr} = -\nabla \cdot \sigma^{corr} \nabla u^{\infty}$ 

## schematization: DG FEM

- C<sub>0</sub>: skull (very low conductivity)
- *C*<sub>1</sub>: CSF
- C<sub>2</sub>: skin




• fulfills the property of conservation of charge

• fulfills the property of conservation of charge



• in a DG-FEM both.

• fulfills the property of conservation of charge



- in a CG-FEM discretization only j<sup>s,NONcons</sup> can be reppresented,
- in a DG-FEM both.
- $\bullet \rightarrow {\rm curing}$  "skull leakage" effects

• fulfills the property of conservation of charge



- in a CG-FEM discretization only j<sup>s,NONcons</sup> can be reppresented,
- in a DG-FEM both.
- $\bullet \ \rightarrow \ {\rm curing} \ \ {\rm ``skull \ leakage''} \ \ {\rm effects}$
- uses directly voxel-based representation of the head

- convergence and comparison CG DG
- leaky scenarios analysis

#### • 4 layer spherical head model

compartment	outer radius	conductivity
brain	78 mm	0.33 S/m
CSF	80 mm	1.79 S/m
skull	86 mm	0.01 S/m
skin	92 mm	0.49 S/m

Table: head model features

- hexahedral meshes with different resolutions (1mm, 2mm, 4mm)
- 10 randomly distributed sources for 10 different eccentricities
- relative difference measure:

$$RDM(u, v) = ||\frac{u}{||u||_2} - \frac{v}{||v||_2}||_2$$

logarithmic magnitude error:

$$InMAG(u, v) = In\left(\frac{||u||_2}{||v||_2}\right)$$



Figure: convergence - RDM



Figure: convergence - InMAG

## leaky scenario statistics

	skull thickness	num leaks
seg_2_res_2_r82	2	10,080
seg_2_res_2_r83	3	1,344
seg_2_res_2_r84	4	0

Table: leaky head models: 428,185 nodes; 407,907 elements





Figure: leaky - RDM



Figure: leaky - InMAG

### skull leakages of volume current - 4



### the Discontinuous Galerkin method in MEG

[Piastra et al., Frontiers in Neuroscience, 2018]

effects of fulfilling the property of conservation of charge?

### effects of fulfilling the property of *conservation of charge*? how is the general DG-FEM behavior?

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•  $\mathbf{B}^{s,NONcons}(\mathbf{r}) = \frac{\mu_0}{4\pi} \int_{\Omega} \mathbf{j}^{s,NONcons}(\mathbf{r}') \times \frac{\mathbf{r}-\mathbf{r}'}{|\mathbf{r}-\mathbf{r}'|^3} d^3\mathbf{r}'$ 

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### simulation in a sphere model with leakages

# the Discontinuous Galerkin method in **MEG**

[Piastra et al., Frontiers in Neuroscience, 2018]

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simulation tool

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#### simulation tool

• C++ open source library for solving partial differential equations (PDEs)



http://dune-project.org/

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- C++ open source library for solving partial differential equations (PDEs)
- solving PDEs in **Neuroscience**
- integration of duneuro in FieldTrip







### the Discontinuous Galerkin method in MEG

[Piastra et al., Frontiers in Neuroscience, 2018]

summary
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summary

• a conservative representation of the flux increases the accuracy of DG-FEM results in MEG

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- a conservative representation of the flux increases the accuracy of DG-FEM results in MEG
- for the finest mesh resolution of 1 mm, sources with a distance of 1.59 mm from the brain-CSF surface, DG-FEM yielded mean RDM% of 1.5% and mean MAG% of 0.1% for the magnetic field

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- skull leakages do not play a role for the MEG modality
- in a combined EEG and MEG (EMEG) source reconstruction analysis is desirable to employ the same forward model for both EEG and MEG data
- DG-FEM complements, and in some cases as the skull leakage scenarios, outperforms CG-FEM in EEG or combined EMEG

[Piastra et al., Frontiers in Neuroscience, 2018;12:30]

proof of concept:







- general introduction
- continuous Galerkin for EEG and MEG
- discontinuous Galerkin for EEG and MEG
- unfitted discontinuous Galerkin for EEG
- summary

good conservative properties of the DG-FEM

- good conservative properties of the DG-FEM
- uses hexahedral meshes

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- obtains same accuracy as DG-FEM in tetrahedral model
- ouperforms DG-FEM in hexahedral model
- controlled computational costs





- general introduction
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- SIPG (DG) FEM fulfills conservation law, it has the same accuracy as CG-FEM and voxel-based representations can be used directly (Engwer et al., 2017)
- UDG-FEM use level set function directly and outperforms DG-FEM on hexahedral meshes (Nüßing et al., 2016)



- Validation of different FEM forward approaches in TES and EEG
- CutFEM
- Mixed FEM

# [Vogenauer, Master Thesis in Mathematics, 2019] [Piastra,..., Wolters, *Frontiers in Neurosci.*, 2018] [Engwer, Vorwerk, Ludewig & Wolters, *SIAM J. Sci. Comp.*, 2017] **Validation and evaluation of new FEM forward approaches**



nultilayer sphere verification. From left to right, the images show the *DG-tet-1447k*, *DG-hex-3057k*, and different conductivity values (a) Conforming totrahedral mask (b) Conforming havehodral mask (c) Cut

ODG-1555k models. The different colors represent the different conductivity values. (a) Conforming tetrahedral mesh. (b) Conforming hexahedral mesh. (c) Cut cell mesh.

[Vogenauer, Master Thesis in Mathematics, 2019]

# **TES: Validation and evaluation of surface-based tetrahedral FEM**



Figure 5.3.: The numerical solution in the tet-4layer-434k sphere model for tES forward problem (a) in the whole volume conductor and (b) just the brain compartment. Visualization of the (c) relative error and (d) the absolute error between numerical and analytical solution in the brain compartment.

# [Vogenauer, Master Thesis in Mathematics, 2019] [Piastra,..., Wolters, *Frontiers in Neurosci.*, 2018] [Engwer, Vorwerk, Ludewig & Wolters, *SIAM J. Sci. Comp.*, 2017] **Validation and evaluation of new FEM forward approaches**



UDG-1335k models. The different colors represent the different conductivity values. (a) Conforming tetrahedral mesh. (b) Conforming hexahedral mesh. (c) Cut cell mesh.

# TES: Validation of Continuous Galerkin (CG) and Discontinuous Galerkin (DG) FEM in 2 mm hexahedral meshes with 4 mm skull thickness



Figure 5.9.: Numerical results for hex-res-2mm-r84 sphere model CG-FEM (left) and DG-FEM (right). First, the potential solution is shown (a) in the sphere model. Then visualizations of the relative error (b) in the whole volume conductor and (c) only in the brain compartment are shown.

# TES: Validation of Continuous Galerkin (CG) and Discontinuous Galerkin (DG) FEM in 2 mm hexahedral meshes with 2 mm skull thickness



Figure 5.11.: Numerical results for hex-res-2mm-r82 sphere model CG-FEM (left) and DG-FEM (right). First, the potential solution is shown (a) in the sphere model. Then visualizations of the relative error (b) in the whole volume conductor and (c) only in the brain compartment are shown.

# "Skull leakages" when using standard FEM in insufficiently resolved hexahedral models



CG-FEM: Unphysical current flow through an FE node

# **Discontinuous Galerkin- (DG-) FEM in hexahedral models**



DG-FEM:

Continuous radial current flow component over tissue boundaries Discontinuous potential over tissue boundaries [Vogenauer, Master Thesis in Mathematics, 2019] [Piastra,..., Wolters, Frontiers in Neurosci., 2018] [Engwer, Vorwerk, Ludewig & Wolters, SIAM J. Sci. Comp., 2017] Validation and evaluation of new FEM forward approaches



Fig. 3. Sections of the different meshes used in the multilayer sphere verification. From left to right, the *UDG-1335k* models. The different colors represent the different conductivity values. (a) Conforming tetrahedral mesh. (b) Conforming hexahedral mesh. (c) Cut cell mesh.

# **EEG: Validation of Unfitted DG (UDG) FEM**



# **EEG: Validation of Unfitted DG (UDG) FEM**





- Validation of different FEM forward approaches in TES and EEG
- CutFEM
- Mixed FEM

#### [Erdbrügger, Master thesis in Maths, 2021] [Nüßing, PhD thesis in Maths, 2018]

# Level sets and cut elements



a) Reconstruction of one cut element([Nüß18])



b) Reconstruction of a multilayer sphere model.

Fig. 4.7.: a) Reconstruction of a single square cut by a level-set. The grey area indicates the inside of the domain, reconstructed into 5 cut-cells, 3 of which are inside the domain. The red points indicate quadrature points for the domain, the green are for the outside area. b) Reconstruction of a multilayer sphere model. Accurate depiction of the curvature of the sphere is achieved while maintaining a low fundamental mesh resolution.

# **CutFEM for tDCS and EEG**

# **Definition 4.4 (weak tDCS-/EEG CutFEM formulation)** Find $u_h \in V_h$ such that

$$a(u_h, v_h) + a_{n/s}^N(u_h, v_h) + a^G(u_h, v_h) = l(v_h) \ \forall v_h \in V_h$$
(4.23)

with

- $l(v_h) = \int_{\partial \Omega} I v_h dS$  for tDCS and
- $l(v_h) = -\sum_i \int_{\Omega_i} \nabla J^p v_h^i dx$  for EEG.

$$a(u_h, v_h) = \sum_i \int_{\Omega_i} \sigma \nabla u_h^i \nabla v_h^i dx$$

In total, the Nitsche coupling terms with Symmetric Weighted Interior Penalty Galerkin (SWIPG) are stated as

$$a_{s}^{N}(u_{h}, v_{h}) := -\int_{\Gamma} \{\sigma \nabla u_{h}\} [\![v_{h}]\!] - \int_{\Gamma} \{\sigma \nabla v_{h}\} [\![u_{h}]\!] dS + \gamma \nu_{k} \int_{\Gamma} \frac{\hat{\sigma}}{\hat{h}} [\![u_{h}]\!] [\![v_{h}]\!] dS, \qquad (4.18)$$

or in the Non-Symmetric (NWIPG) case as

$$a_n^N(u_h, v_h) := -\int_{\Gamma} \{\sigma \nabla u_h\} \llbracket v_h \rrbracket + \int_{\Gamma} \{\sigma \nabla v_h\} \llbracket u_h \rrbracket dS + \gamma \nu_k \int_{\Gamma} \frac{\hat{\sigma}}{\hat{h}} \llbracket u_h \rrbracket \llbracket v_h \rrbracket dS, \qquad (4.19)$$

the two only differing in one sign.

Then the Ghost-penalty term can be stated as

$$a^{G}(u_{h}, v_{h}) = \gamma_{G} \int_{\hat{\Gamma}} \hat{h} \llbracket \sigma \nabla u_{h} \rrbracket \llbracket \nabla v_{h} \rrbracket dS$$
# **Comparing CutFEM and CG-FEM**

In total, CutFEM features several differences compared to standard CG-FEM.

- Using the level-set function directly allows for a very accurate representation of the head geometry.
- No possibly complicated mesh generation as in the tetrahedral case is necessary. Misshapen cut-cells are taken care of through Ghost-penalties.
- Ansatzfunctions are defined on the fundamental mesh. This can be chosen coarser than a CG-mesh while maintaining a similar level of accuracy. Thus the number of Degrees of Freedom (i.e. number of Ansatzfunctions) is smaller.
- Most mesh-generators cannot deal with holes in the compartments, which occur for example in the CSF when brain and skull touch.
- A possible downside is the dependence on the penalty parameters  $\gamma, \gamma_G$  which can strongly influence the result as will be seen in the evaluations.

# **Comparing CutFEM and CG-FEM**



Fig. 6.1.: Depiction of the 4-layer-sphere model used. The layers from red to blue are scalp, skull, CSF and brain. The brain is shifted to the right, thus shares exactly one point with the skull.

# **Comparing CutFEM and CG-FEM for EEG**



Fig. 6.14.: Overview of different EEG-errors for 3- and 4-layer CG- and CutFEM. Top: Errors for tangential source directions. Bottom: Errors for radial source directions. Errors are in percent and grouped by eccentricities. The green line marks optimal error values, the circle represents the average error.

# **Comparing CutFEM and CG-FEM for TES**



Fig. 6.15.: Overview of different tDCS-errors for 3- and 4-layer CG- and CutFEM. Right: Vector Magnitude differences in percent. The green lines indicate optimal values, the circle depicts the average error per category.

# **Comparing CutFEM and CG-FEM for TES**



a) CutFEM

b) CG-FEM

Fig. 6.18.: Comparison of absolute MAG errors for Cut- and CGFEM. Left: CutFEM. Right: CG-FEM. Fundamental mesh cells are colorised by MAG at the center. For a clearer comparison, the CG-errors stem from the nearest tetrahedral center, the MAG error at that point was then used to colorize the fundamental cell. Brightest color is reached at 3 percent. Scalp cells are ignored to improve clarity. Instead, the entire scalp area is depicted as single color sphere. Black dots indicate stimulation electrodes.

# **Comparing CutFEM and CG-FEM for TES**



Fig. 6.19.: Overview of different tDCS-errors for 3- and 4-layer CG- and CutFEM taken at element centers. Right: Vector Magnitude differences in percent. The green lines indicate optimal values, the circle depicts the average error per category.



- Validation of different FEM forward approaches in TES and EEG
- CutFEM
- Mixed FEM

Applying the quasistatic approximation of Maxwell's equations [18], [19], the forward problem of EEG is commonly formulated as a second-order PDE with homogeneous Neumann boundary condition

$$\nabla \cdot (\sigma \nabla u) = \nabla \cdot \mathbf{j}^p \quad \text{in } \Omega, \tag{1a}$$

$$\sigma \partial_{\mathbf{n}} u = 0 \quad \text{on } \partial \Omega = \Gamma. \tag{1b}$$

Here, *u* denotes the electric potential,  $\mathbf{j}^p$  the source current, and  $\sigma$  the conductivity distribution in  $\Omega$ . In (1), the electric current  $\mathbf{j}$  is already eliminated as an unknown. For our purpose, we start at the previous step in the derivation of the quasistatic approximation and keep the electric current as an unknown.

Thus, our starting point is the system of first-order PDEs

$$\mathbf{j} + \sigma \,\nabla u = \mathbf{j}^p \tag{2a}$$

$$\nabla \cdot \mathbf{j} = 0 \quad \text{in } \Omega, \tag{2b}$$

$$\langle \mathbf{j}, \mathbf{n} \rangle = \langle \mathbf{j}^p, \mathbf{n} \rangle$$
 on  $\partial \Omega = \Gamma$ . (2c)

Since the source current  $\mathbf{j}^p$  in general fulfills  $\langle \mathbf{j}^p, \mathbf{n} \rangle = 0$ on  $\Gamma$ , as supp  $\mathbf{j}^p \subset \Omega^\circ$  for physiological reasons (there are no sources in the skin), (2c) can be simplified to  $\langle \mathbf{j}, \mathbf{n} \rangle = 0$  on  $\Gamma$ . The Mixed-FEM formulation for the EEG forward problem is now derived from (2), instead of discretizing (1) as would be done for the CG-FEM.

 $\mathbf{j} + \sigma \nabla u = \mathbf{j}^{p}$ (2a)  $\nabla \cdot \mathbf{j} = 0 \text{ in } \Omega,$ (2b)  $\langle \mathbf{j}, \mathbf{n} \rangle = \langle \mathbf{j}^{p}, \mathbf{n} \rangle \text{ on } \partial \Omega = \Gamma.$ (2c)

$$H(\operatorname{div}; \Omega) = \left\{ \mathbf{q} \in L^2(\Omega)^3 : \nabla \cdot \mathbf{q} \in L^2(\Omega) \right\} \quad H_0(\operatorname{div}, \Omega) = \{ \mathbf{q} \in H(\operatorname{div}; \Omega) : \langle \mathbf{q}, \mathbf{n} \rangle = 0 \text{ on } \partial \Omega \}$$

Now, we can introduce a weak formulation of (2)

$$\int_{\Omega} \langle \sigma^{-1} \mathbf{j}, \mathbf{q} \rangle \, \mathrm{d}x - \int_{\Omega} \nabla \cdot \mathbf{q}u \, \mathrm{d}x = \int_{\Omega} \langle \sigma^{-1} \mathbf{j}^{p}, \mathbf{q} \rangle \, \mathrm{d}x \quad \text{for all } \mathbf{q} \in H_{0}(\text{div}, \Omega), \qquad (6a)$$
$$\int_{\Omega} \nabla \cdot \mathbf{j}v \, \mathrm{d}x = 0 \quad \text{for all } v \in L^{2}(\Omega). \qquad (6b)$$

Now, we can introduce a weak formulation of (2)  $\int_{\Omega} \langle \sigma^{-1} \mathbf{j}, \mathbf{q} \rangle \, dx - \int_{\Omega} \nabla \cdot \mathbf{q} u \, dx = \int_{\Omega} \langle \sigma^{-1} \mathbf{j}^{p}, \mathbf{q} \rangle \, dx \quad \text{for all } \mathbf{q} \in H_{0}(\text{div}, \Omega), \qquad (6a)$   $\int_{\Omega} \nabla \cdot \mathbf{j} v \, dx = 0 \quad \text{for all } v \in L^{2}(\Omega). \qquad (6b)$ 

$$a(\mathbf{p}, \mathbf{q}) = (\sigma^{-1} \mathbf{p}, \mathbf{q})_{L^2(\Omega)^3}, \qquad (7a)$$

$$b(\mathbf{p}, v) = (\nabla \cdot \mathbf{p}, v)_{L^2(\Omega)}$$
(7b)

and the functional

$$l(\mathbf{q}) = (\sigma^{-1} \mathbf{j}^p, \mathbf{q})_{L^2(\Omega)^3}$$
(7c)

for  $\mathbf{p}, \mathbf{q} \in H_0(\operatorname{div}, \Omega), v \in L^2(\Omega), \mathbf{j}^p \in L^2(\Omega)^3, \sigma \in L^\infty(\Omega), \sigma > 0$ . Therefore, to solve (6) is to find  $(u, \mathbf{j}) \in L^2(\Omega) \times H_0(\operatorname{div}, \Omega)$ , such that

$$a(\mathbf{j}, \mathbf{q}) + b(\mathbf{q}, u) = l(\mathbf{q}) \text{ for all } \mathbf{q} \in H_0(\text{div}, \Omega), \quad (8a)$$
$$b(\mathbf{j}, v) = 0 \text{ for all } v \in L^2(\Omega). \quad (8b)$$

find  $(u, \mathbf{j}) \in L^2(\Omega) \times H_0(\operatorname{div}, \Omega)$ , such that  $a(\mathbf{j}, \mathbf{q}) + b(\mathbf{q}, u) = l(\mathbf{q})$  for all  $\mathbf{q} \in H_0(\operatorname{div}, \Omega)$ , (8a)  $b(\mathbf{j}, v) = 0$  for all  $v \in L^2(\Omega)$ . (8b)

We can now choose the space  $P_0$  of piecewise constant functions on each element as a discrete subspace of  $L^2(\Omega)$ :

$$P_0(\mathcal{T}_h) = \left\{ v \in L^2(\Omega) : v |_T \equiv c_T, \ c_T \in \mathbb{R} \text{ for all } T \in \mathcal{T}_h \right\}.$$

For  $H_0(\text{div}, \Omega)$ , we start by defining the space  $RT_0$  of the lowest-order Raviart-Thomas elements on a single, regular hexahedron T [25], [26]:

 $RT_0(T) = \mathcal{P}_{1,0,0}(T) \times \mathcal{P}_{0,1,0}(T) \times \mathcal{P}_{0,0,1}(T),$ 

where  $\mathcal{P}_{i,j,k}(T)$  denotes the set of polynomial functions defined on T of degrees i, j, and k in  $x_1$ ,  $x_2$ , and  $x_3$ .

$$Aj + B^T u = b \tag{13a}$$

$$Bj = 0, \tag{13b}$$

we can left-multiply  $A^{-1}$  to (13a) and solve for j, i.e.,  $j = A^{-1}(b - B^T u)$ . Substituting this representation of j into (13b) leads to

$$Bj = BA^{-1}(b - B^{T}u) = 0$$
  
$$\Leftrightarrow BA^{-1}B^{T}u = BA^{-1}b.$$
(14)

 $S = BA^{-1}B^{T}$  is the so-called *Schur complement*,  $m_{S} = n_{s} =$ #elements. *S* is positive semidefinite (if ker(*B*) = {0} positive definite) and since *A* is symmetric, also *S* is symmetric [22]. Thus, with  $h = BA^{-1}b$ , solving (10) is reduced to solving

$$Su = h. \tag{15}$$

(15) could now be solved using the (conjugated) Uzawa-iteration [22], [24], [36].

[Vorwerk, Engwer, Pursiainen & Wolters, IEEE Trans Med Imag, 2017]

# **Comparing mixed FEM and CG-FEM for EEG**



Fig. 7. Geometry of leaky four-layer sphere model (left, compartments from in- to outside/bottom left to top right are brain, CSF, skull, skin, and air) and visualization of strength (only skull and skin, in  $\mu$ A/mm<sup>2</sup>) and direction of volume currents for CG-FEM (middle) and Mixed-FEM simulation (right).

[Vorwerk, Engwer, Pursiainen & Wolters, IEEE Trans Med Imag, 2017]

# **Comparing mixed FEM and CG-FEM for EEG**

 TABLE III

 REALISTIC HEAD MODEL PARAMETERS

	Mesh width $(h)$	#vertices	#elements	#faces
6C_hex_1mm	1 mm	3,965,968	3,871,029	11,707,401
6C_hex_2mm	2 mm	508,412	484,532	1,477,164
6C_tet_hr	_	2,242,186	14,223,508	27,314,610



Fig. 3. Visualization of realistic six-compartment hexahedral (6C\_hex\_2mm, left) and high-resolution reference head model (6C\_tet\_hr, right).

[Vorwerk, Engwer, Pursiainen & Wolters, IEEE Trans Med Imag, 2017]

# **Comparing mixed FEM and CG-FEM for EEG**



Fig. 8. Cumulative relative errors of RDM (top) and InMAG (bottom) for EEG in realistic six-layer head model. The horizontal lines indicate the 5th and 95th percentile (lower and upper lines, respectively).

# Summary

- BEM forward approaches In 3-compartment headmodels are the current standard, but FEM models allow inclusion of further inhomogeneity or anisotropy, which might be important (-> talk of Maria Carla Piastra)
- Different FEM approaches are available in DUNEuro and it is intructive in applications to check sensitivity to different forward approaches
- Fitted (CG- or DG-FEM) and unfitted FEM (UDG or CutFEM) show accurate results, their choice should mainly depend on the mesh properties
- While mixed FEM and DG-FEM are "current preserving", CG-FEM is not, but this seems only relevant, if thin compartments with considerably different conductivities have to be modeled with limited resolution
- Unfitted FEM, especially CutFEM
  - showed less deviation in the 3-layer/4-layer test case scenarioand thus facilitates modeling of "touching skull and brain surfaces" and might thus facilitate mesh generation
  - outperformed CG-FEM in most categories for both EEG and tDCS
  - needs less degrees of freedom and thus less memory
  - is more expensive for matrix setup (which has to be done only once)

# Future outlook: Project PerEpi (funded by ERA PerMed)

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PERsonalized diagnosis and treatment for refractory focal paediatric and adult EPIlepsy (PerEpi)



#### Thank you for your attention!



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