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# Discontinuous Galerkin discretization of magnetic convection

Term paper

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## Abstract

The main aim of this paper is a numeric solution to magnetic convection equation in 3 dimensions. Since Discontinuous Galerkin Finite Element method leads to an unstable variational problem, upwinding technique is used. For the sake of simplicity (and ease of implementation), the upwind numerical flux is rewritten using the usual average combined with a jump penalty [BMS04]. Even though on conventional non-parallel architectures the curse of dimensionality limits the accuracy of the numerical solution, the results were sufficient for simple error analysis. In most cases, improvements in convergence rates for higher polynomial degree were observed. All numerical experiments were implemented using FEniCS finite element library; a brief motivational description of its features is also provided.

**Keywords:** magnetic convection, Discontinuous Galerkin, hyperbolic equations, jump-stabilization, upwind.

**AMS Subject Classification:** 65N12 65N22 65N30

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## Introduction

Let  $M$  be a smooth manifold embedded into Euclidean space  $\mathbb{R}^d$ . For a smooth vector field  $v \in C^\infty(M, \mathbb{R}^d)$ , the *Lie derivative* w.r.t.  $v$  of a  $p$ -form  $\alpha \in \Omega^k(M)$  for  $0 < p < d$  is again a  $p$ -form defined as:

$$\mathcal{L}_v \alpha = d(\iota_v \alpha) + \iota_v d\alpha \quad (0.1)$$

where:

- $\iota_v : \Omega^p(M) \rightarrow \Omega^{p-1}(M)$  is the contraction w.r.t.  $v$  (an **algebraic** operation)
- $d : \Omega^p(M) \rightarrow \Omega^{p+1}(M)$  is the exterior derivative

Rigorous definitions and additional properties of contraction map and exterior derivative can be found in [Hit03].

PDEs of the form (0.1) show up in variational formulations of magnetic convection problems. In particular, interesting cases in the 3 dimensional Euclidean space occur for  $p = 1$ , i.e. for Lie derivatives of a 1-form.

For dimension  $d = 3$ , the exterior derivatives are consistent with the conventional differential operators:

$$d : \Omega^0(M) \xrightarrow{\text{grad}} \Omega^1(M) \xrightarrow{\text{curl/rot}} \Omega^2(M) \xrightarrow{\text{div}} \Omega^3(M) = \Omega^0(M) \quad (0.2)$$

Hence, for  $d = 3$  and  $p = 1$  identity (0.1) becomes:

$$\mathcal{L}_v \alpha \stackrel{(0.1),(0.2)}{=} d(\underbrace{\alpha \cdot v}_{0\text{-form}}) + \iota_v \underbrace{\text{curl } \alpha}_{2\text{-form}} \stackrel{(0.2)}{=} \text{grad}(\alpha \cdot v) + \text{curl } \alpha \times v \quad (0.3)$$

Here we leave the differential geometry setting aside and continue with numerical analysis of the boundary value problem associated with the differential operator in the equation (0.3).

# 1 Preliminaries

## 1.1 Problem statement

For a bounded Lipschitz domain  $\Omega \in \mathbb{R}^3$  with boundary  $\Gamma := \partial\Omega$ , given a velocity field  $v \in C^1(\overline{\Omega}, \mathbb{R}^3)$  and a function  $c \in C(\Omega, \mathbb{R})$ , consider a stationary PDE for a 1-form  $A \in \Omega^1(\overline{\Omega})$ :

$$\left. \begin{aligned} cA + \mathcal{L}_v A = cA + \text{grad}(A \cdot v) + \text{curl } A \times v &= 0 & \text{in } \Omega \\ A \times \eta &= h & \text{on } \Gamma_- \\ A \cdot v &= g & \text{on } \Gamma_- \end{aligned} \right\} \quad (1.1)$$

where  $\Gamma_- \subset \partial\Omega$  is the *inflow boundary* defined as:

$$\Gamma_- := \{x \in \partial\Omega : \eta(x) \cdot v(x) < 0\} \subset \Gamma \quad (1.2)$$

For the completeness of notations, also define the *outflow boundary* as:

$$\Gamma_+ := \{x \in \partial\Omega : \eta(x) \cdot v(x) \geq 0\} \subset \Gamma \quad (1.3)$$

*Remark:* zero order term  $cA$  with a uniformly bounded sufficiently large  $c$  is required to ensure ellipticity. General CG and DG theory regarding well-posedness of continuous and discrete variational problems is available in [HS08].

*Remark:* notation  $\Omega^1(M)$  denotes the space of 1-forms on a manifold  $M$  and is **not** related to  $\Omega$  which is used to denote the domain for PDE.

## 1.2 Primal variational formulation

For simplicity and ease of notation, assume that  $\Omega$  is a polygonal domain. Then let  $\mathcal{M}$  be the discretization of  $\Omega$  into open tetrahedra. Notice, that then  $\Gamma$  coincides with triangulation boundary  $\overline{\partial\mathcal{M}}$  (which is not always the case for arbitrary non-polygonal domains).

Fix conventional notations:

- $\mathcal{F}(\mathcal{M})$  - set of all facets of mesh  $\mathcal{M}$
- $\mathcal{F}^o(\mathcal{M})$  - set of all interior facets of mesh  $\mathcal{M}$
- $\mathcal{F}^\partial(\mathcal{M})$  - set of all exterior (boundary) facets of mesh  $\mathcal{M}$

Additional notations:

- $\mathcal{F}_-^\partial(\mathcal{M})$  - set of all exterior inflow boundary facets of mesh  $\mathcal{M}$

$$\mathcal{F}_-^\partial(\mathcal{M}) := \{f \in \mathcal{F}^\partial(\mathcal{M}) : f \subset \Gamma_-\} \quad (1.4)$$

- $\mathcal{F}_+^\partial(\mathcal{M})$  - set of all exterior outflow boundary facets of mesh  $\mathcal{M}$

$$\mathcal{F}_+^\partial(\mathcal{M}) := \mathcal{F}^\partial(\mathcal{M}) \setminus \mathcal{F}_-^\partial(\mathcal{M}) \quad (1.5)$$

Let  $K \in \mathcal{M}$ . Choose the local shape functions to be polynomials of degree  $p \geq 0$ . Since **discontinuous** Galerkin discretization is of particular interest for this paper, the global shape functions for test space are **discontinuous** piece-wise polynomials  $A'_N \in (\mathcal{P}_p(\mathcal{M}))^3$ , i.e.:

$$\forall K \in \mathcal{M} \implies A'_N|_K \in (\mathcal{P}_p(K))^3 \quad (1.6)$$

Multiplying equation (1.1) by such test function  $A'_N$  and integrating over  $\Omega$  gives the following variational formulation:

seek  $A \in \Omega^1(\mathbb{R}^3)$  such that  $\forall A'_N \in (\mathcal{P}_p(\mathcal{M}))^3$ :

$$\sum_{K \in \mathcal{M}} \int_{\Omega} (cA + \text{grad}(A \cdot v) + \text{curl} A \times v) \cdot A'_N dx = 0 \quad (1.7)$$

Using integration by parts, every  $\text{grad}(A \cdot v)$  term of the summands in (1.7) can be rewritten as:

$$\int_K \text{grad}(A \cdot v) \cdot A'_N dx = - \int_K (A \cdot v) \text{div} A'_N dx + \int_{\partial K} (A \cdot v)(A'_N \cdot \eta) dS \quad (1.8)$$

Likewise, the  $\text{curl} A \times v$  term can be rewritten as:

$$\begin{aligned} \int_K (\text{curl} A \times v) \cdot A'_N dx &= \int_K (v \times A'_N) \cdot \text{curl} A dx = \\ &= \int_K \text{curl}(v \times A'_N) \cdot A dx - \int_{\partial K} (A \times \eta) \cdot (v \times A'_N) dS \end{aligned} \quad (1.9)$$

**Definition 1.2.1** (Jumps and averages). *Let  $K_+, K_- \in \mathcal{M}$  be adjacent,  $\varphi_i : K_i \rightarrow \mathbb{R}$ ,  $B_i : K_i \rightarrow \mathbb{R}^3$ ,  $\eta_i$  - the unit normal vector to  $K_i$ ;  $i \in \{+, -\}$ . Define the following maps on interface facet  $f = K_+ \cap K_- \in \mathcal{F}^o(\mathcal{M})$ :*

(1) *Averages:*

$$\{\varphi\} := \frac{1}{2}(\varphi_+ + \varphi_-), \quad \{B\} := \frac{1}{2}(B_+ + B_-);$$

(2) *Jumps:*

$$[[\varphi]] := \varphi_+ - \varphi_-, \quad [[B]] := B_+ - B_-$$

(3) *Jumps w.r.t. normal:*

$$[[\varphi]]_\eta := \varphi_+ \eta_+ + \varphi_- \eta_-, \quad [[B]]_\eta := B_+ \cdot \eta_+ + B_- \cdot \eta_-;$$

(4) *Tangential jumps w.r.t. normal:*

$$[[B]]_\times := B_+ \times \eta_+ + B_- \times \eta_-;$$

On the boundary facets, the corresponding values of functions are defined as:

$$\begin{aligned} \{\varphi\} &:= \varphi_+, \quad \{B\} := B_+, \quad [[\varphi]]_\eta := \varphi_+ \eta_+, \quad [[B]]_\eta := B_+ \cdot \eta_+, \\ [[\varphi]] &:= \varphi_+, \quad [[B]] := B_+, \quad [[B]]_\times := B_+ \times \eta_+. \end{aligned}$$

*Note:* Justification for jumps w.r.t. normal ( $[[\cdot]]_\eta$  and  $[[\cdot]]_\times$ ) is the invariance under choice of cell  $K$ : interchanging  $K_+$  and  $K_-$  produces the same result. Reference: [DAM01].

**Proposition 1.2.1** (Magic DG formulas). *Let  $\mathcal{M}$  be some bounded mesh in  $\mathbb{R}^3$ ,  $\eta$  - normal outward vector to  $K \in \mathcal{M}$ .*

(1) *Let  $A : \mathcal{M} \rightarrow \mathbb{R}^3$ ,  $\varphi : \mathcal{M} \rightarrow \mathbb{R}$ , then:*

$$\sum_{K \in \mathcal{M}} \int_{\partial K} (A \cdot \eta) \varphi dS = \sum_{f \in \mathcal{F}^o(\mathcal{M})} \int_f \{A\} \cdot [[\varphi]]_\eta dS + \sum_{f \in \mathcal{F}(\mathcal{M})} \int_f [[A]]_\eta \{\varphi\} dS \quad (1.10)$$

(2) *Let  $A, B : \mathcal{M} \rightarrow \mathbb{R}^3$ , then:*

$$\sum_{K \in \mathcal{M}} \int_{\partial K} (A \times \eta) \cdot B dS = - \sum_{f \in \mathcal{F}^o(\mathcal{M})} \int_f \{A\} \cdot [[B]]_\times dS + \sum_{f \in \mathcal{F}(\mathcal{M})} \int_f [[A]]_\times \cdot \{B\} dS \quad (1.11)$$

*Proof.* Straightforward algebraic manipulations using identity:

$$(a \times b) \cdot c = (b \times c) \cdot a \quad (1.12)$$



(1) set  $LHS := (A_1 \cdot \eta_1)\varphi_1 + (A_2 \cdot \eta_2)\varphi_2$ , then:

$$\begin{aligned}
 2RHS &:= (A_1 + A_2) \cdot (\varphi_1\eta_1 + \varphi_2\eta_2) + \\
 &+ (A_1 \cdot \eta_1 + A_2 \cdot \eta_2)(\varphi_1 + \varphi_2) = \\
 &= (A_1 \cdot \eta_1)\varphi_1 + (A_1 \cdot \eta_2)\varphi_2 + \\
 &+ (A_2 \cdot \eta_1)\varphi_1 + (A_2 \cdot \eta_2)\varphi_2 + \\
 &+ (A_1 \cdot \eta_1)\varphi_1 + \underbrace{(A_1 \cdot \eta_1)\varphi_2}_{=-(A_1 \cdot \eta_2)\varphi_2} + \\
 &+ \underbrace{(A_2 \cdot \eta_2)\varphi_1}_{=-(A_2 \cdot \eta_1)\varphi_1} + (A_2 \cdot \eta_2)\varphi_2 = 2LHS;
 \end{aligned}$$

(2) set  $LHS := (A_1 \times \eta_1) \cdot B_1 + (A_2 \times \eta_2) \cdot B_2$ , then:

$$\begin{aligned}
 2RHS &:= (A_1 \times \eta_1 + A_2 \times \eta_2) \cdot (B_1 + B_2) - \\
 &- (A_1 + A_2) \cdot (B_1 \times \eta_1 + B_2 \times \eta_2) = \\
 &= (A_1 \times \eta_1) \cdot B_1 + (A_2 \times \eta_2) \cdot B_1 + \\
 &+ (A_1 \times \eta_1) \cdot B_2 + (A_1 \times \eta_1) \cdot B_1 - \\
 &- (B_1 \times \eta_1) \cdot A_1 - (B_2 \times \eta_2) \cdot A_1 - \\
 &- (B_1 \times \eta_1) \cdot A_2 - (B_1 \times \eta_1) \cdot A_1 = \\
 &\stackrel{((1.12))}{=} 2LHS + \\
 &+ (A_1 \times \eta_1) \cdot B_2 + (A_2 \times \eta_2) \cdot B_1 - \\
 &- \underbrace{(\eta_1 \times A_2) \cdot B_1}_{=A_2 \times \eta_2} - \underbrace{(\eta_2 \times A_1) \cdot B_2}_{=(A_1 \times \eta_1)} = 2LHS;
 \end{aligned}$$

Finally, the desired formula for both cases is achieved by integrating and summing up the identities above over internal facets  $f \in \mathcal{F}^o(\mathcal{M})$  and incorporating integrals over exterior facets  $f \in \mathcal{F}^\partial(\mathcal{M})$ .  $\square$

Combining equations (1.8) - (1.9), applying Proposition 1.2.1 we obtain:

$$\begin{aligned}
 &\sum_{K \in \mathcal{M}} \int_K cA \cdot A'_N - (A \cdot v) \operatorname{div} A'_N + \operatorname{curl}(v \times A'_N) \cdot A dx + \\
 &+ \sum_{f \in \mathcal{F}(\mathcal{M})} \int_f \{A \cdot v\} [[A'_N]]_\eta dS + \sum_{f \in \mathcal{F}^o(\mathcal{M})} \int_f [[A \cdot v]]_\eta \cdot \{A'_N\} dS + \\
 &+ \sum_{f \in \mathcal{F}^o(\mathcal{M})} \int_f \{A\} \cdot [[v \times A'_N]]_\times dS - \sum_{f \in \mathcal{F}(\mathcal{M})} \int_f [[A]]_\times \cdot \{v \times A'_N\} dS = 0
 \end{aligned} \tag{1.13}$$

Since  $A, v \in C(\Omega, \mathbb{R}^3)$  and thus  $A \cdot v \in C(\Omega)$ , the corresponding jumps vanish on the internal facets  $f \in \mathcal{F}^o(\mathcal{M})$ :

$$[[A]]_\times = 0, \quad [[A \cdot v]]_\eta = 0, \quad (1.14)$$

Hence variational formulation simplifies to:

$$\begin{aligned} & \sum_{K \in \mathcal{M}} \int_K cA \cdot A'_N - (A \cdot v) \operatorname{div} A'_N + \operatorname{curl}(v \times A'_N) \cdot A dx + \\ & \quad + \sum_{f \in \mathcal{F}(\mathcal{M})} \int_f \{A \cdot v\} [[A'_N]]_\eta dS + \\ & + \sum_{f \in \mathcal{F}^o(\mathcal{M})} \int_f \{A\} \cdot [[v \times A'_N]]_\times dS - \sum_{f \in \mathcal{F}^\partial(\mathcal{M})} \int_f [[A]]_\times \cdot \{v \times A'_N\} dS = 0 \end{aligned} \quad (1.15)$$

Remark: the idea to make use of (1.14) comes from [BMS04].

## 2 Discretization

### 2.1 Discrete variational formulation

We would like to discretize the formal variational formulation restricting  $A$  to a subspace  $(\mathcal{P}_p(\mathcal{M}))^3$ :

seek for  $A_N \in (\mathcal{P}_p(\mathcal{M}))^3$  such that  $\forall A'_N \in (\mathcal{P}_p(\mathcal{M}))^3$ :

$$\begin{aligned} & \sum_{K \in \mathcal{M}} \int_K cA_N \cdot A'_N - (A_N \cdot v) \operatorname{div} A'_N + \operatorname{curl}(v \times A'_N) \cdot A_N dx + \\ & \quad + \sum_{f \in \mathcal{F}(\mathcal{M})} \int_f \{A_N \cdot v\} [[A'_N]]_\eta dS + \\ & + \sum_{f \in \mathcal{F}^o(\mathcal{M})} \int_f \{A_N\} \cdot [[v \times A'_N]]_\times dS - \sum_{f \in \mathcal{F}^\partial(\mathcal{M})} \int_f [[A_N]]_\times \cdot \{v \times A'_N\} dS = 0 \end{aligned} \quad (2.1)$$

Unfortunately, we have  $\operatorname{curl}(v \times A'_N)$  in the expression which is not in general available as a finite element for arbitrary  $v$ . Applying integration by parts once again, we obtain:

$$\int_K \operatorname{curl}(v \times A'_N) \cdot A_N dx = \int_K (v \times A'_N) \cdot \operatorname{curl} A_N dx + \int_{\partial K} (A_N \times \eta) \cdot (v \times A'_N) dS \quad (2.2)$$

Applying Proposition 1.2.1 to the sum of boundary integrals in (2.2), it becomes:

$$- \sum_{f \in \mathcal{F}^o(\mathcal{M})} \int_f \{A_N\} \cdot [[v \times A'_N]]_\times dS + \sum_{f \in \mathcal{F}(\mathcal{M})} \int_f [[A_N]]_\times \cdot \{v \times A'_N\} dS \quad (2.3)$$

Notice, that when plugged into the discrete variational formulation, the following terms cancel out:

$$\sum_{f \in \mathcal{F}^o(\mathcal{M})} \int_f \{A_N\} \cdot [[v \times A'_N]]_\times dS \quad \text{and} \quad \sum_{f \in \mathcal{F}^\partial(\mathcal{M})} \int_f [[A_N]]_\times \cdot \{v \times A'_N\} dS$$

Therefore, the final expression for discrete variational formulation with already incorporated boundary conditions from (1.1) is of the following form:

$$\begin{aligned} & \sum_{K \in \mathcal{M}} \int_K c A_N \cdot A'_N - (A_N \cdot v) \operatorname{div} A'_N + (v \times A'_N) \cdot \operatorname{curl} A_N dx + \\ & + \sum_{f \in \mathcal{F}(\mathcal{M}) \setminus \mathcal{F}_-^\partial(\mathcal{M})} \int_f \{A_N \cdot v\} [[A'_N]]_\eta dS + \sum_{f \in \mathcal{F}^o(\mathcal{M})} \int_f [[A_N]]_\times \cdot \{v \times A'_N\} dS = \\ & = - \sum_{f \in \mathcal{F}_-^\partial(\mathcal{M})} \int_f g(A'_N \cdot \eta) dS \end{aligned} \quad (2.4)$$

**Lemma 2.1.1.** *For a vector field  $B$  and a vector  $\eta$  in  $\mathbb{R}^3$ , the following holds:*

$$(\eta \times (\eta \times B)) = -(\eta \cdot \eta)B + (\eta \cdot B)\eta; \quad (2.5)$$

*additionally assuming that  $n$  is a unit vector, we have the identity:*

$$B = (\eta \cdot B)\eta - (\eta \times (\eta \times B)). \quad (2.6)$$

Applying Lemma 2.1.1 to  $A_N, A'_N, v$  and  $\eta$  as in context of formulation (2.4), we obtain the relation:

$$(v \cdot \eta)(A_N \cdot A'_N) = (v \cdot A_N)(A'_N \cdot \eta) - (A_N \times \eta)(v \times A'_N) \quad (2.7)$$

Integrating identity (2.7) over  $\mathcal{F}_-^\partial(\mathcal{M})$  and adding to variational formulation

(2.4), it becomes:

$$\begin{aligned}
 & \sum_{K \in \mathcal{M}} \int_K c A_N \cdot A'_N - (A_N \cdot v) \operatorname{div} A'_N + (v \times A'_N) \cdot \operatorname{curl} A_N dx + \\
 & + \sum_{f \in \mathcal{F}(\mathcal{M})} \int_f \{A_N \cdot v\} [[A'_N]]_\eta dS + \sum_{f \in \mathcal{F}^o(\mathcal{M})} \int_f [[A_N]]_\times \cdot \{v \times A'_N\} dS - \\
 & - \sum_{f \in \mathcal{F}_-^{\partial}(\mathcal{M})} \int_f (v \cdot \eta) (A_N \cdot A'_N) dS = \tag{2.8} \\
 & = - \sum_{f \in \mathcal{F}_-^{\partial}(\mathcal{M})} \int_f g(A'_N \cdot \eta) dS + \sum_{f \in \mathcal{F}_-^{\partial}(\mathcal{M})} \int_f h \cdot (v \times A'_N) dS
 \end{aligned}$$

## 2.2 Stabilization by upwinding

The resulting numerical solution from (2.8) is only  $L^2(\mathcal{M})$ -stable. To obtain the stability in a stronger norm, the "upwinding" technique is used. More precisely,  $\{A_N \cdot v\}$  and  $[[A_N]]_\times$  in equation (2.8) are replaced with  $\{A_N\}_u \cdot v$  and  $2\{A_N\}_u \times \eta$  respectively, where:

**Definition 2.2.1.** *Setting as in the definition 1.2.1, the **upwind** value is:*

$$\{\varphi\}_u := \begin{cases} \varphi_1 & \text{if } \eta_1 \cdot v > 0, \\ \varphi_2 & \text{if } \eta_1 \cdot v < 0, \\ \{\varphi\} & \text{if } \eta_1 \cdot v = 0. \end{cases}$$

The upwind value for a vector-valued function is defined analogously.

**Definition 2.2.2.** *Weighted average is defined as:*

$$\{\varphi\}_\alpha := \alpha_+ \varphi_+ + \alpha_- \varphi_-, \tag{2.9}$$

where  $\alpha_+, \alpha_- \geq 0, \alpha_+ + \alpha_- = 1$ .

The weighted average for a vector-valued function is defined analogously.

Notice, that (also used in [Mar06]):

$$\{\varphi\}_u = \{\varphi\}_\alpha = \{\varphi\} + \frac{[[\alpha]]}{2} [[[\varphi]]] \tag{2.10}$$

for  $\alpha = (\operatorname{sign}(v \cdot \eta) + 1)/2$ .

**Remark:**  $\{\varphi\}_u = \varphi_+ + \frac{1}{2}\varphi_+ \neq \varphi_+$  on outflow boundary facets!

Recalling the notations from (1.5), the stabilized form of the discrete variational formulation (2.8) becomes:

$$\begin{aligned}
 & \sum_{K \in \mathcal{M}} \int_K c A_N \cdot A'_N - (A_N \cdot v) \operatorname{div} A'_N + (v \times A'_N) \cdot \operatorname{curl} A_N dx + \\
 & + \sum_{f \in \mathcal{F}(\mathcal{M})} \int_f (\{A_N\}_u \cdot v) [[A'_N]]_\eta dS + \sum_{f \in \mathcal{F}^o(\mathcal{M})} \int_f (2\{A_N\}_u \times \eta) \cdot \{v \times A'_N\} dS - \\
 & \qquad \qquad \qquad - \sum_{f \in \mathcal{F}^{\partial}_-(\mathcal{M})} \int_f (v \cdot \eta) (A_N \cdot A'_N) dS = \\
 & = - \sum_{f \in \mathcal{F}^{\partial}_-(\mathcal{M})} \int_f g(A'_N \cdot \eta) dS + \sum_{f \in \mathcal{F}^{\partial}_-(\mathcal{M})} \int_f h \cdot (v \times A'_N) dS
 \end{aligned} \tag{2.11}$$

Alternatively, stabilization can be done by adding term

$$\sum_{f \in \mathcal{F}^o(\mathcal{M})} \int_f c_f ([[A_N]] \cdot [[A'_N]]) dS \tag{2.12}$$

to equation (2.8), where the stabilization parameter  $c_f$  related to the full upwinding was chosen to be uniformly constant on each facet (refer to [BMS04]):

$$c_f = \frac{1}{2} |v \cdot \eta| \tag{2.13}$$

and provides us with the final variational form directly used in implementation:

$$\begin{aligned}
 & \sum_{K \in \mathcal{M}} \int_K c A_N \cdot A'_N - (A_N \cdot v) \operatorname{div} A'_N + (v \times A'_N) \cdot \operatorname{curl} A_N dx + \\
 & + \sum_{f \in \mathcal{F}(\mathcal{M})} \int_f \{A_N \cdot v\} [[A'_N]]_\eta dS + \sum_{f \in \mathcal{F}^o(\mathcal{M})} \int_f [[A_N]]_\times \cdot \{v \times A'_N\} dS - \\
 & - \sum_{f \in \mathcal{F}^{\partial}_-(\mathcal{M})} \int_f (v \cdot \eta) (A_N \cdot A'_N) dS + \sum_{f \in \mathcal{F}^o(\mathcal{M})} \int_f \frac{1}{2} |v \cdot \eta| ([[A_N]] \cdot [[A'_N]]) dS = \\
 & = - \sum_{f \in \mathcal{F}^{\partial}_-(\mathcal{M})} \int_f g(A'_N \cdot \eta) dS + \sum_{f \in \mathcal{F}^{\partial}_-(\mathcal{M})} \int_f h \cdot (v \times A'_N) dS
 \end{aligned} \tag{2.14}$$

## 3 Implementation

### 3.1 Test problems

Several test cases were available for computations. All test were conducted on the unit cube mesh  $\mathcal{M}$  in 3D (the convex hull of  $\{e_1, e_2, e_3\}$ ). For a specific test, the velocity field  $v$ , large enough (ensuring ellipticity) factor  $c$  and the desired exact solution  $A$  were fixed. Afterwards, values for  $h, g$  on  $\mathcal{F}_\partial(\mathcal{M})$  and right hand side  $f$  on  $\Omega$  were computed using two different methods:

- numerical approximation of  $f$  using `Dolfin` from FEniCS (see 3.2)
- analytic exact expression of  $f$  using *Wolfram Mathematica* symbolic software (see Appendix C)

For detailed information on test problems refer to the source code [`tests.py`] in Appendix A.

As shortly mentioned above, test problems were implemented using FEniCS (see 3.2) finite element library. The validity of the algorithm was confirmed; additionally, various error norm convergence rates were obtained and analysed.

Linear solver used: **GMRES** (**G**eneralized **M**inimum **R**esidual) with ILU (**I**ncomplete **L**U-factorization) preconditioner from **PETSc** back-end.

### 3.2 FEniCS

Key features of FEniCS:

- Python and C++ interface (can be combined with `SciPy` and `Matplotlib`)
- math-like syntax for variational forms (UFL + FFC)
- custom linear algebra back-ends:  
uBLAS, PETSc, SLEPc, Epetra, MTL4, UMFPACK
- additional mesh manipulation libraries: CGAL, SCOTCH
- visualization via VTK
- easy implementation of subdomains, boundary parts, variable coefficients
- MPI support

For more detailed information, refer to [AL10, Lan09].

## 4 Results

### 4.1 Error norms

Denote the error field by:

$$E := A_{\text{approx.}} - A_{\text{exact}} \quad (4.1)$$

**Absolute** errors were computed using two different norms:

- $(L^2(\mathcal{M}))^3$ -norm:

$$\|E\|_{(L^2(\mathcal{M}))^3} := \left( \sum_{K \in \mathcal{M}} \int_K E \cdot E dx \right)^{\frac{1}{2}} \quad (4.2)$$

- $(H(\text{curl}; \mathcal{M}))^3$ -semi-norm:

$$\|E\|_{(H(\text{curl}; \mathcal{M}))^3} := \left( \sum_{K \in \mathcal{M}} \int_K \text{curl } E \cdot \text{curl } E dx \right)^{\frac{1}{2}} \quad (4.3)$$

**Absolute** jump errors were also computed using two different norms:

- $(L^2(\mathcal{F}^o(\mathcal{M})))^3$ -norm of the jump  $[[E]]$ :

$$\|[[E]]\|_{(L^2(\mathcal{F}^o(\mathcal{M})))^3} := \left( \sum_{f \in \mathcal{F}^o(\mathcal{M})} \int_f [[E]] \cdot [[E]] dS \right)^{\frac{1}{2}} \quad (4.4)$$

- $(L^2(\mathcal{F}^\partial(\mathcal{M})))^3$ -norm of the jump  $[[E]]$ :

$$\|[[E]]\|_{(L^2(\mathcal{F}^\partial(\mathcal{M})))^3} := \left( \sum_{f \in \mathcal{F}^\partial(\mathcal{M})} \int_f [[E]] \cdot [[E]] dS \right)^{\frac{1}{2}} \quad (4.5)$$

All **error plots** are w.r.t  $1/h$ , i.e. **w.r.t. number of mesh cells in one space dimension**. Number of degrees of freedom in this case is of order  $(1/h)^3$ .

## 4.2 Plots of numerical and exact solutions

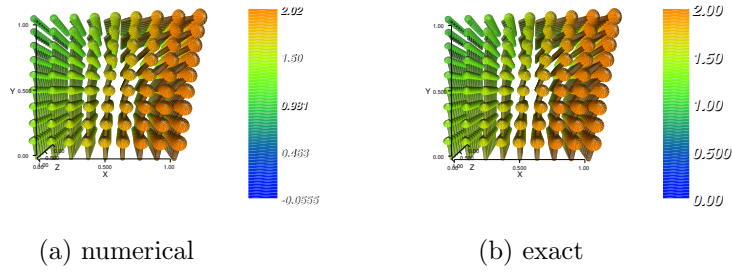


Figure 4.2.1: DG solution for polynomial  $v$  and  $A$

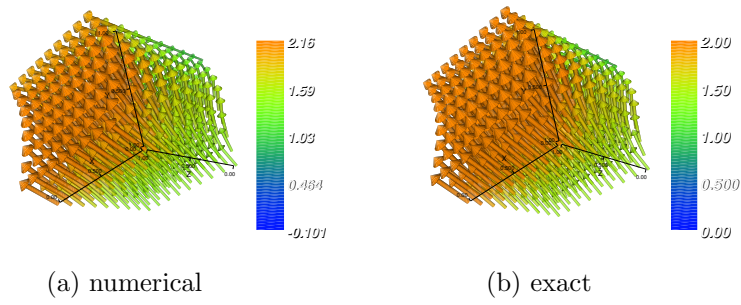


Figure 4.2.2: DG solution for non-linear  $v$  and  $A$

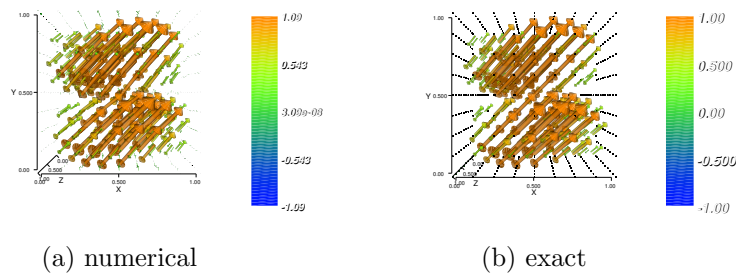


Figure 4.2.3: DG solution for zero-bc  $v$  and  $A$



### 4.3 Test: non-linear

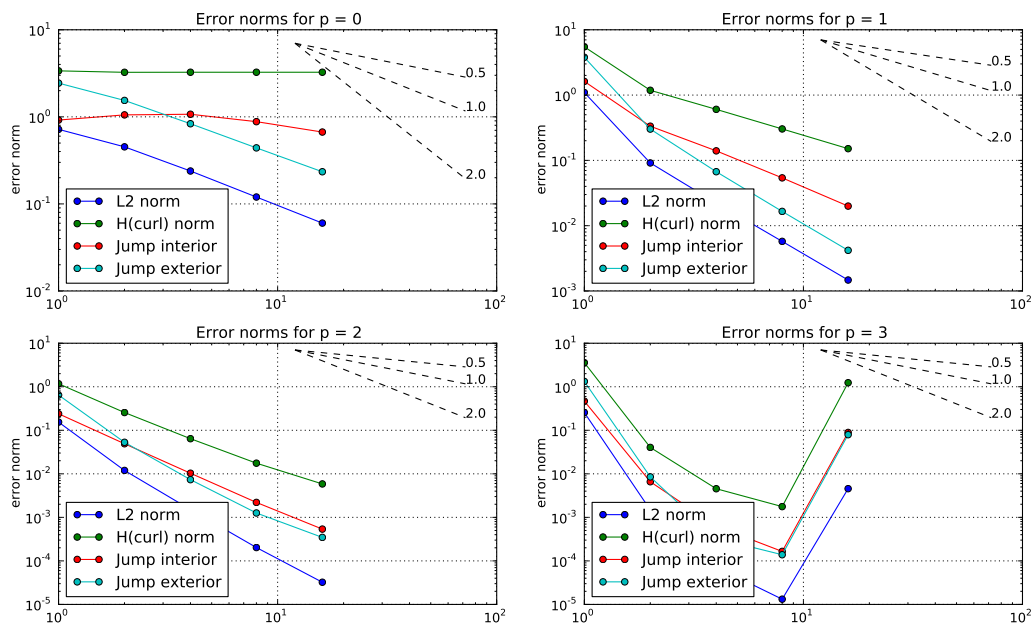


Figure 4.3.1: Error norm convergence for non-linear test

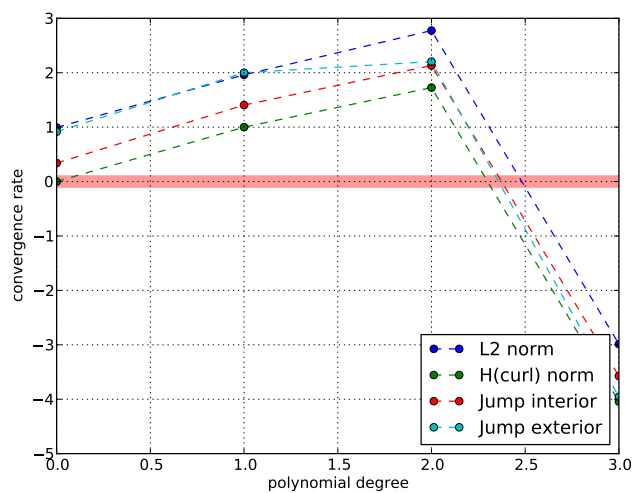


Figure 4.3.2: Convergence rates for non-linear test

### 4.4 Test: zero boundary condition

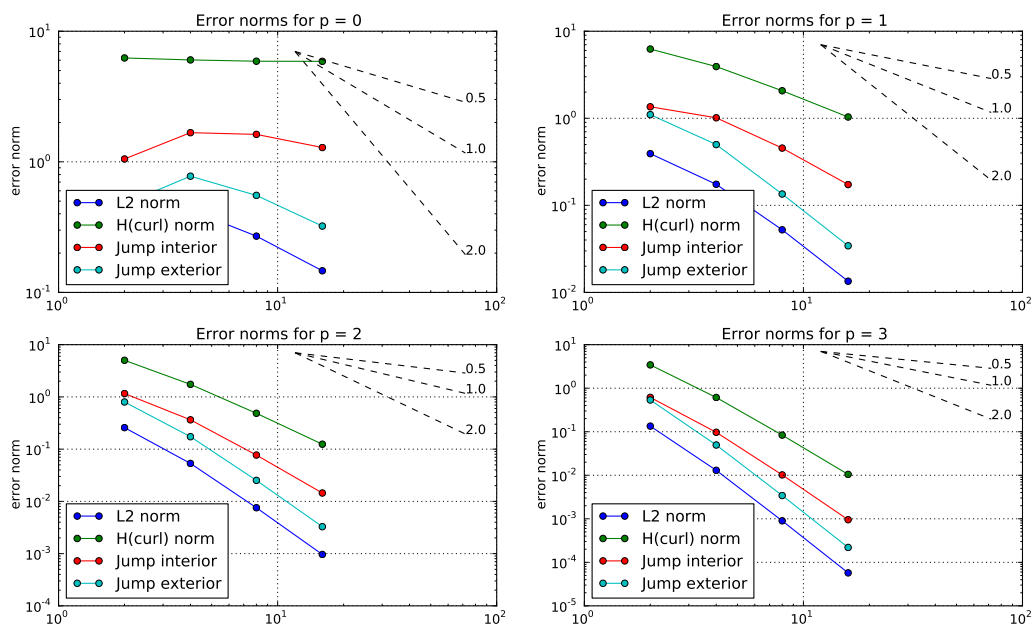


Figure 4.4.1: Error norm convergence for zero-bc test

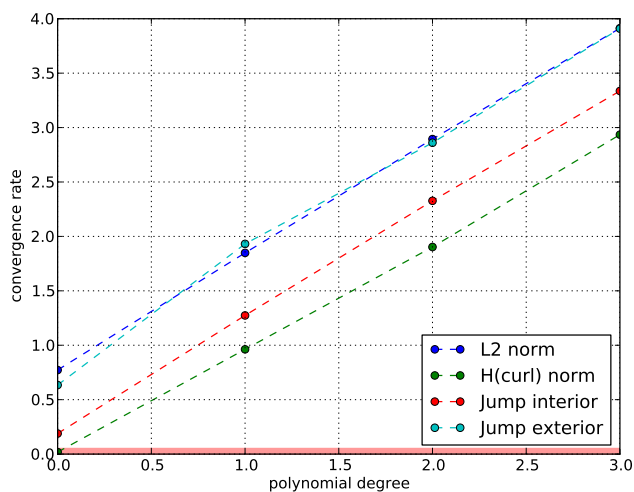


Figure 4.4.2: Convergence rates for zero-bc test

### 4.5 Asymptotic error behaviour

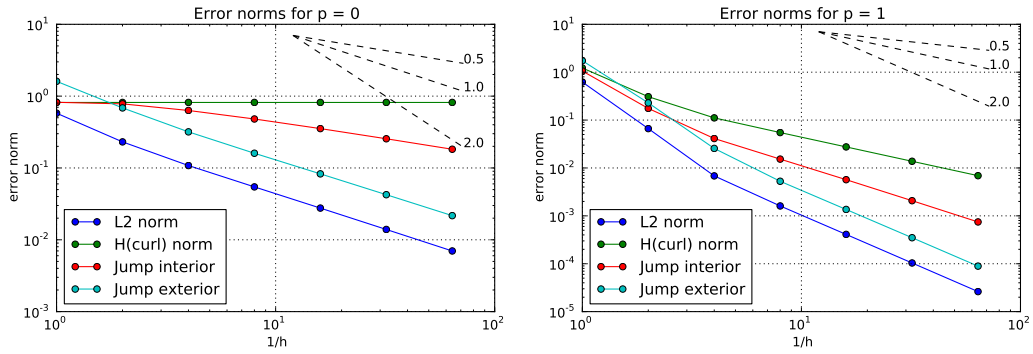


Figure 4.5.1: Error norm convergence for refined polynomial test

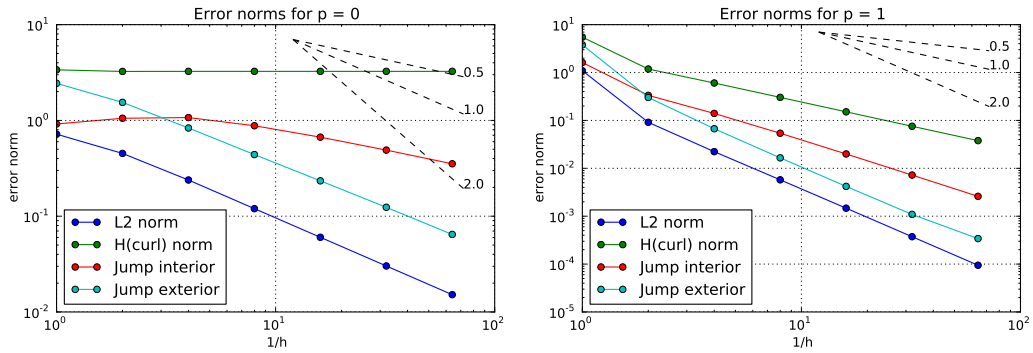


Figure 4.5.2: Error norm convergence for refined non-linear test

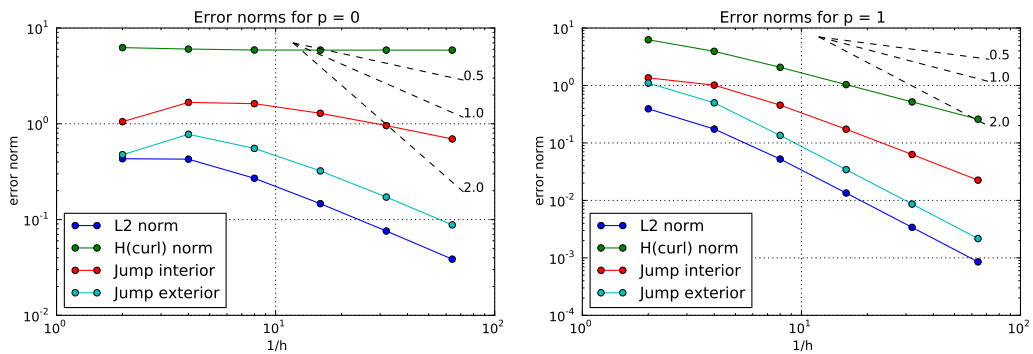


Figure 4.5.3: Error norm convergence for refined zero-bc test

### 4.6 Error behaviour for $p = 0$

Asymptotic convergence for higher polynomial degrees is hard to monitor due to curse of dimensionality and limited computing resources. Hence, we additionally elaborate a bit more on the case  $p = 0$ .

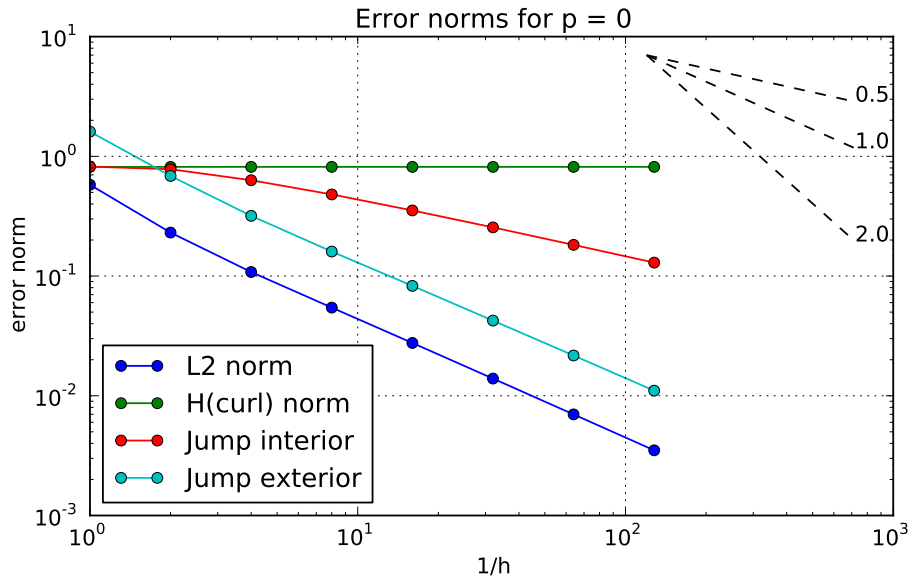


Figure 4.6.1: Error norm convergence for maximally refined polynomial test

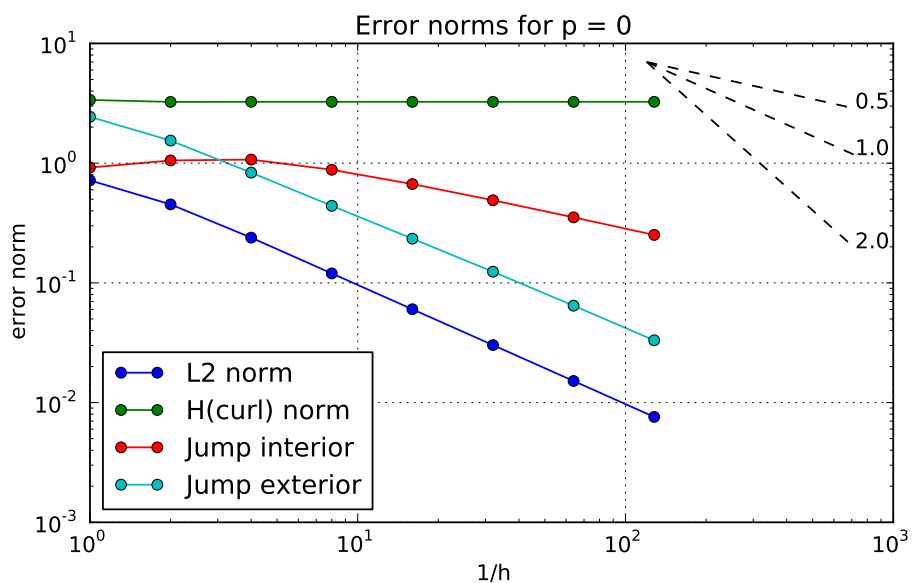


Figure 4.6.2: Error norm convergence for maximally refined non-linear test

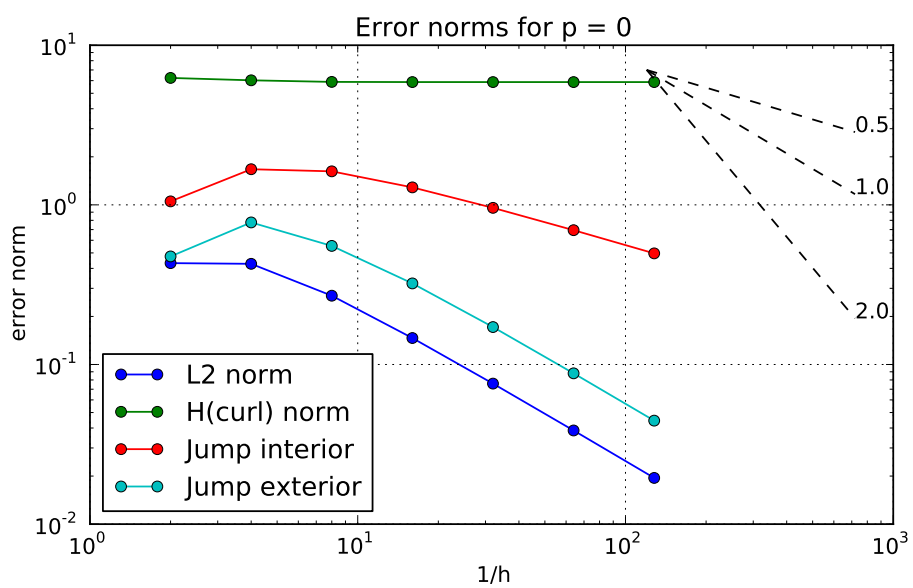


Figure 4.6.3: Error norm convergence for maximally refined zero-bc test

## 5 Conclusions

Order of convergence increases with polynomial degree  $p$  and empirical relation for every error norm is:

$(L^2(\mathcal{M}))^3$ -norm	$2p$
$(H(\text{curl}; \mathcal{M}))^3$ -semi-norm	$p$
$(L^2(\mathcal{F}^o(\mathcal{M})))^3$ -norm	$p + 1/2$
$(L^2(\mathcal{F}^\partial(\mathcal{M})))^3$ -norm	$2p$

*Remark:* The convergence rates above are w.r.t  $1/h$ , i.e. **w.r.t. number of mesh cells in one space dimension**. Dividing them by 3 gives convergence rates w.r.t. number of degrees of freedom.

## 6 Further research

- Scalability of the code. Most of the CPU time is spent on:
  - assembling matrices: finite elements can be easily distributed over nodes
  - solving linear system: configure PETSc solver as a back-end and enable its parallel capabilities
- Zero order term. Getting rid of the  $cA$  term in PDE (1.1).
- Diffusion term. Introducing additional  $\epsilon \text{curl curl } A$  term in PDE (1.1).
- Consistency. Come up with a test having load vector  $f = 0$  (not so easy for non-linear velocity fields  $v$ ) and monitor error behaviour, since  $f = 0$  shows up in magnetic convection equations.

## References

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# Appendices

## A FEniCS/Python source codes

Source code is available for download at:

[www.sukys.lt/search/label/publications](http://www.sukys.lt/search/label/publications)

Listing 1: [config.py] main configuration:

```

1 # === MAIN CONFIGURATION ===
# === PARAMETERS [ feel free to play around ] ===
test      = 'polynomial' # default test to use: polynomial, non-linear, zero-bc
6 P       = 1            # polynomial degree to be used
levels    = 3            # number of refinement levels

pylab_on  = True         # plots errors and convergence rates (using pylab)
show_fig  = True         # shows all pylab plots in xsession
11 save_fig = False      # saves all pylab plots into files

viper_on  = False        # plots the exact and approximated fields
save_viper = False       # saves all viper plots into files | set to 'False' to
    prevent HUGE files in 'viper' directory

16 errors_skip = 0        # number of first error norms to ignore when plotting
errors_slopes = [0.5, 1.0, 2.0] # slopes to be added to plots as a referece for
    convergence rates

rates_wrt  = 'hmax'      # compute convergence rates w.r.t.: 'hmax' OR 'ndofs'
rates_method = 'average' # compute convergence rates from: 'last' 2 errors OR '
    average' of all errors
21 rates_skip = 0        # number of first error norms to ignore when computing
    AVERAGE convergence rates for plots

compute_all = True       # computes solution for polynomial degress p = 0, 1, 2,
    ..., P and plots the order of convergence for every error
debug_on    = False      # includes debugging branches ( plots inflow boundary
    parts, etc. )

26 level_offset = 0      # first refinement level
stability    = 1        # stability parameter

# === CONSTANTS [ no need to modify in general ] ===
31 FE_TYPE     = 'DG'    # finite elements to use: 'DG' - Discontinuous Galerkin;
    'CG' - Continuous Galerkin
RHS_BACKEND   = 'Mathematica' # compute load vector for the right hand side using: '
    Dolfin' OR 'Mathematica'

QUAD_FACTOR   = 1        # parameters for quadrature order (for error norm
    computation)
QUAD_OFFSET   = 2        # parameters for quadrature order (for error norm
    computation)

36 FIGURE_FORMAT = 'pdf'  # default format for saving figures to files
ERRORS_FORMAT   = '%1.0e' # format string for errors
RATES_FORMAT    = '%+1.2f' # format string for convergence rates
SUFFIX_FORMAT   = '.test=%s_P=%d_levels=%d' # output file suffix format | usage:
    SUFFIX_FORMAT % (test, P, levels)

41 VIPER_PATH    = 'viper/' # default path for saving viper VTK files
PYLAB_PATH     = 'pylab/'  # default path for saving pylab plots
TEXT_PATH      = 'text/'   # default path for saving text output
DUMP_PATH      = 'dump/'   # default path for saving dumped objects

46 # === CONSISTENCY CHECKS [ do NOT modify ] ===

if FE_TYPE == 'CG':
    SUFFIX_FORMAT += '_CG' # to avoid conflicts with 'DG' FE_TYPE
151 MIN_P      = 1
else:
    MIN_P      = 0        # minimal polynomial degree for FE space

```



Listing 2: [initialization.py]: initialization routines:

```

# === INITIALIZATION ROUTINES ===
2
from config import *
from auxiliary import initializeList , getRefinements
from errors import TYPE.SIZE
import sys
7
try:
    test      = sys.argv[1]          # test to use
    P         = int(sys.argv[2])     # polynomial degree
    levels    = int(sys.argv[3])     # number of refinements
12 except:
    print '\n=== SETTING PARAMETERS FROM: [config.py] ===\n' + \
        'Alternative usage: main.py [test_name] [pol_degree] [number-of-refinements] [env]\n'

try:
17     env = sys.argv[4]              # environment: 'cluster' OR 'xsession'
except:
    env = 'xsession'

if env == 'cluster':
22     print '\n=== CLUSTER ENVIRONMENT: DISABLING VIPER & PYLAB ===\n'
        pylab_on      = False
        viper_on      = False

if RHS.BACKEND == 'Dolfin':
27     print '=== LOAD VECTOR BACKEND: DOLFIN (FEniCS) ===\n'
else: # RHS.BACKEND == 'Mathematica'
    print '=== LOAD VECTOR BACKEND: Mathematica (Wolfram) ===\n'

SUFFIX      = SUFFIX.FORMAT % (test , P, levels)
32
# initializing lists
errors      = initializeList(P+1, TYPE.SIZE)
rates       = initializeList(P+1, TYPE.SIZE)
ndofs       = initializeList(P+1, 0)
37 hmax      = initializeList(P+1, 0)
cpu_time    = initializeList(P+1, 0)

refinements = getRefinements(level_offset , levels)

```

Listing 3: [main.py] main source code:

```

"""
For the detailed explanation refer to paper:
"Discontinuous Galerkin discretization of magnetic convection"
available at: [pdf] http://sukys.lt/search/label/publications
5         [doi] !!! add link here !!!
"""

__author__  = "Jonas Sukys (sukys.jonas@gmail.com)"
__date__    = "2010-02-19 -- 2010-08-01"
10 __copyright__ = "Copyright (C) 2010 Jonas Sukys, D-MATH, ETH Zurich"
__license__ = "GNU LGPL Version 2.1"

# === IMPORTS ===
from dolfin import *
15 import sys
import time

# === LOCAL IMPORTS ===
from config import *
20 from tests import *
from errors import *
from debug import *
from auxiliary import *
from dumpload import *
25

# === INITIALIZATION ===
from initialization import *

# === BEGIN ITERATION over polynomial degrees
30 for p in range(MIN_P, P+1):

    # timer for CPU effort consumption
    cpu_time_start = time.clock()

35     # compute only for the polynomial degree p = P
    if not compute_all: p = P

```

```

# quadrature accuracy order
quad_degree = QUAD.FACTOR * p + QUAD.OFFSET
40
# === BEGIN ITERATION over refinement levels
for M in refinements:

    # === PROBLEM DATA ===

45
    # mesh and function space
    mesh = UnitCube(M, M, M)
    hmax[p].append(mesh.hmax())

50
    V = VectorFunctionSpace(mesh, FE.TYPE, p)
    ndofs[p].append(V.dim())

    # velocity field
55
    v = getVelocity(test, quad_degree)

    # ellipticity fix
    c = getZeroOrderTerm(test)

60
    # exterior normal
    n = FacetNormal(mesh)

    # inflow boundary
    class Boundary_Inflow(SubDomain):
65
        def __init__(self, normal, velocity):
            self.n = normal
            self.v = velocity
            SubDomain.__init__(self)

        def inside(self, x, on_boundary):
70
            return on_boundary and dot3D(normal3D(x), self.v(x)) < DOLFIN_EPS

    # === PROBLEM PARAMETERS ===

75
    # vector field on inflow boundary
    A_0 = getSolution(test, quad_degree)

    # marking boundary parts
    boundary_parts = MeshFunction('uint', mesh, mesh.topology().dim()-1)
    boundary_parts.set_all(1)
80
    inflow = Boundary_Inflow(n, v)
    inflow.mark(boundary_parts, 0)

    # === VARIATIONAL FORMULATION ===
85
    A_ = TestFunction(V)
    A = TrialFunction(V)

    def upwind(u, v, n):
        return avg(u) + jump((sgn(dot(v, n)) + 1)/2)/2 * jump(u)

90
    def jump_cross(u, n):
        return cross(u('+'), n('+')) + cross(u('-'), n('-'))

    c_f = stability * 0.5 * abs(dot(v('+'), n('+')))

95
    a = c*dot(A,A_)*dx - dot(A,v)*div(A_)*dx + dot(cross(v,A_), curl(A))*dx \
        + avg(dot(A,v))*jump(A_,n)*dS + dot(A,v)*dot(A_,n)*ds(0) + dot(A,v)*dot(A_,n)*ds
        (1) \
        + dot(jump_cross(A, n), avg(cross(v, A_)))*dS \
        - dot(v, n)*dot(A, A_)*ds(0) \
100
        + c_f*dot(jump(A), jump(A_))*dS

    # boundary conditions
    g = dot(A_0,v)
    h = cross(A_0,n)

105
    # source term
    if RHS.BACKEND == 'Dolfin':
        f = getRHS_Dolfin(A_0, A_, v)
    else: # RHS.BACKEND == 'Mathematica'
110
        f = dot(getRHS_Mathematica(test, quad_degree), A_)

    L = c*dot(A_0,A_)*dx + f*dx - g*dot(A_,n)*ds(0) + dot(h,cross(v, A_))*ds(0)

    problem = VariationalProblem(a, L, exterior_facet_domains=boundary_parts)

115
    # configuring solver for the linear system
    problem.parameters['linear_solver'] = 'iterative'
    itsolver = problem.parameters['krylov_solver']
    itsolver['absolute_tolerance'] = 1e-15 # default: 1e-15

```

```

120     itsolver['relative_tolerance'] = 1e-6 # default: 1e-6
        itsolver['divergence_limit'] = 10000.0 # default: 10000.0
        itsolver['gmres_restart'] = 30 # default: 30
        itsolver['monitor_convergence'] = True # default: False
        itsolver['report'] = True # default: True

125     # compute solution
        A_discrete = problem.solve()

        # === A POSTERIORI ERROR ANALYSIS ===

130     computeErrors(errors, p, A_discrete, A_0, mesh, quad.degree, FE.TYPE)

        # END ITERATION over refinement levels

        # computing convergence rates w.r.t. mesh size h
135     computeConvergenceRates(rates, errors, p, hmax, rates_wrt)

        # compute CPU effort
        cpu_time[p] = time.clock() - cpu_time_start

140     if not compute_all: break

        # END ITERATION over polynomial degrees

        # === TEXT OUTPUT to stdout and fout ===

145     output('ERRORS', errors, compute_all, cpu_time, TEXT_PATH, SUFFIX, ERRORS_FORMAT)
        output('RATES', rates, compute_all, cpu_time, TEXT_PATH, SUFFIX, RATES_FORMAT)

        # === DUMPING RESULTS to files ===

150     dump(errors, DUMP_PATH + 'ERRORS' + SUFFIX)
        dump(rates, DUMP_PATH + 'RATES' + SUFFIX)

        # === PYLAB PLOTTING & SAVING ===

155     if pylab_on:

        plotErrors(refinements, errors, compute_all, errors_skip, errors_slopes, 'Error norms'
            , show_fig, save_fig, PYLAB_PATH, SUFFIX, FIGURE_FORMAT)
        if compute_all:
160         plotConvergenceRates(rates, rates_method, rates_skip, '', show_fig, save_fig,
            PYLAB_PATH, SUFFIX, FIGURE_FORMAT)

        # === VIPER PLOTTING ===

        if viper_on:

165         plot(v, title='Velocity field', mesh=mesh, axes=True)
            if debug_on: plotInflowSurface(n, v, mesh)
            plot(A_0, title='Exact solution', mesh=mesh, axes=True)
            try:
                plot(A_discrete, title='Discrete solution', axes=True)
            except:
                print '\nERROR :: Discrete solution was not computed!\n'
                interactive()

175     # === VIPER SAVING ===

        if save_viper:

            file = File(VIPER_PATH + 'velocity' + SUFFIX + '.pvd')
180             file << interpolate(v, V)

            file = File(VIPER_PATH + 'exact' + SUFFIX + '.pvd')
            file << interpolate(A_0, V)

185             file = File(VIPER_PATH + 'discrete' + SUFFIX + '.pvd')
            file << A_discrete

```

Listing 4: [auxiliary.py]: auxiliary routines:

```

# === AUXILIARY ROUTINES ===

4     def dot3D(u,v):
        return u[0]*v[0] + u[1]*v[1] + u[2]*v[2]

        # for unit cube only!
        def normal3D(x):

9         from dolfin import DOLFIN_EPS

```

```

n = x
for i in range(0, 2):
    if abs(x[0]) < DOLFIN_EPS:
14         return (-1,0,0)
    elif abs(x[1]) < DOLFIN_EPS:
        return (0,-1,0)
    elif abs(x[2]) < DOLFIN_EPS:
        return (0,0,-1)
19     elif abs(x[0] - 1) < DOLFIN_EPS:
        return (1,0,0)
    elif abs(x[1] - 1) < DOLFIN_EPS:
        return (0,1,0)
    elif abs(x[2] - 1) < DOLFIN_EPS:
24         return (0,0,1)

def sgn(x):
    return 0 if x == 0 else x/abs(x)

29 # returns list of numbers of the form: 2**(offset + level)
def getRefinements(offset, levels):
    M_all = range(offset, offset + levels)

    for i in range(len(M_all)):
34         M_all[i] = 1 << M_all[i]

    return M_all

def initializeList(CASE_SIZE, TYPE_SIZE):
39     err = []
    for i in range(CASE_SIZE):
        err.append([])
        for j in range(TYPE_SIZE):
44             err[i].append([])

    return err

```

Listing 5: [tests.py]: tests for the solver:

```

from dolfin import *

quad_degree = 4

5 def getVelocity(test, quad_degree):
    if test == 'linear': return Expression( ('1.2', '1.4', '0.7'), degree=quad_degree )
    if test == 'polynomial': return Expression( ('0.66*(1 - pow(x[1], 2))', '0.2 + x[2]*x[0]', '0.8 - pow(x[0], 2)'), degree=quad_degree )
    if test == 'non-linear': return Expression( ('0.66*(1 - pow(x[1], 2))', '0.2 + sin(pi*x[0])', '0.8 - pow(x[0], 2)'), degree=quad_degree )
    if test == 'zero-bc': return Expression( ('1.2', '1.4', '0.7'), degree=quad_degree )
10

def getZeroOrderTerm(test):
    if test == 'linear': return 1.0
    if test == 'polynomial': return 10.0
    if test == 'non-linear': return 10.0
15 if test == 'zero-bc': return 1.0

def getSolution(test, quad_degree):
    if test == 'linear': return Expression( ('2*x[0] - 1.5*x[1] + 0.6*x[2]', '1.2*x[0] + 2.4*x[1] - 0.6*x[2]', '1.4*x[0] + 0.3*x[1] - 2.5*x[2]'), degree=quad_degree )
    if test == 'polynomial': return Expression( ('x[0]*x[1]', '1 - pow(x[1], 2)', '1 + x[2]*x[0]'), degree=quad_degree )
20 if test == 'non-linear': return Expression( ('sin(pi*x[1])', '1 - pow(x[1], 2)', '1 + pow(x[2], 2)'), degree=quad_degree )
    if test == 'zero-bc':
        sol = 'sin(pi*x[0])*sin(2*pi*x[1])*sin(3*pi*x[2])'
        return Expression( (sol, sol, sol), degree=quad_degree )

25 def getRHS-Mathematica(test, quad_degree):

    if test == 'linear': return Expression( ('0.72', '4.38', '0.35'), degree=quad_degree )

    if test == 'polynomial':
30     rhs1 = '0.2*x[0] + 0.66*x[1]*(1 - pow(x[1], 2)) - 0.8*x[2] + 2*pow(x[0], 2)*x[2] + (0.8 - pow(x[0], 2))*x[2] + (1 - pow(x[1], 2))*x[2] - 2*x[0]*(1 + x[0]*x[2])'
        rhs2 = '-0.66*x[0] - 0.66*x[0]*pow(x[1], 2) + 0.66*x[0]*(1 - pow(x[1], 2)) - 2*x[1]*(0.2 + x[0]*x[2])'
        rhs3 = 'x[0]*(0.8 - pow(x[0], 2)) + x[0]*(1 - pow(x[1], 2)) + 0.66*x[2] - 0.66*pow(x[1], 2)*x[2]'
        return Expression( (rhs1, rhs2, rhs3), degree=quad_degree )

```

```

35 if test == 'non-linear':
    rhs1 = '-2*x[0]*(1 + pow(x[2],2)) + 0.6283185307179586*cos(pi*x[1]) + pi*cos(pi*x
    [1])*sin(pi*x[0])'
    rhs2 = '-2.0734511513692637*cos(pi*x[1]) + 2.0734511513692637*pow(x[1],2)*cos(pi*x
    [1]) + 2.0734511513692637*(1 - pow(x[1],2))*cos(pi*x[1]) - 1.32*x[1]*sin(pi*x
    [1]) - 2*x[1]*(0.2 + sin(\[pi]x[0]))'
    rhs3 = '2*(0.8 - pow(x[0],2))*x[2]'
    return Expression( (rhs1 ,rhs2 , rhs3) , degree=quad_degree )
40
if test == 'zero-bc' :
    rhs1 = '6.597344572538565*cos(3*pi*x[2])*sin(pi*x[0])*sin(2*pi*x[1]) +
    8.79645943005142*cos(2*pi*x[1])*sin(pi*x[0])*sin(3*pi*x[2]) +
    3.7699111843077517*cos(pi*x[0])*sin(2*pi*x[1])*sin(3*pi*x[2])' ,
    rhs2 = '6.597344572538565*cos(3*pi*x[2])*sin(pi*x[0])*sin(2*pi*x[1]) +
    8.79645943005142*cos(2*pi*x[1])*sin(pi*x[0])*sin(3*pi*x[2]) +
    3.7699111843077517*cos(pi*x[0])*sin(2*pi*x[1])*sin(3*pi*x[2])' ,
    rhs3 = '6.597344572538564*cos(3*pi*x[2])*sin(pi*x[0])*sin(2*pi*x[1]) +
    8.79645943005142*cos(2*pi*x[1])*sin(pi*x[0])*sin(3*pi*x[2]) +
    3.7699111843077517*cos(pi*x[0])*sin(2*pi*x[1])*sin(3*pi*x[2])' ,
45 return Expression( (rhs1 ,rhs2 , rhs3) , degree=quad_degree )

def getRHS_Dolfin(A_0, A_ , v):
    return dot(cross(curl(A_0),v),A_) + graddot(A_ ,A_0,v)

50 def graddot(A_ , A_0 , v):
    return (A_ [0]*v [0] .dx(0)*A_0 [0] + A_ [0]*v [1] .dx(0)*A_0 [1] + A_ [0]*v [2] .dx(0)*A_0 [2]+ \
    A_ [1]*v [0] .dx(1)*A_0 [0] + A_ [1]*v [1] .dx(1)*A_0 [1] + A_ [1]*v [2] .dx(1)*A_0 [2]+ \
    A_ [2]*v [0] .dx(2)*A_0 [0] + A_ [2]*v [1] .dx(2)*A_0 [1] + A_ [2]*v [2] .dx(2)*A_0 [2]+ \
    A_ [0]*A_0 [0] .dx(0)*v [0] + A_ [0]*A_0 [1] .dx(0)*v [1] + A_ [0]*A_0 [2] .dx(0)*v [2]+ \
55 A_ [1]*A_0 [0] .dx(1)*v [0] + A_ [1]*A_0 [1] .dx(1)*v [1] + A_ [1]*A_0 [2] .dx(1)*v [2]+ \
    A_ [2]*A_0 [0] .dx(2)*v [0] + A_ [2]*A_0 [1] .dx(2)*v [1] + A_ [2]*A_0 [2] .dx(2)*v [2])

```

Listing 6: [errors.py]: error computation and plotting:

```

# ===| ROUTINES FOR ERROR COMPUTATION, PRINTING AND PLOTTING |===
from config import FE_TYPE

4
# initializing error types
if FE_TYPE == 'DG':
    L2, CURL, JUMP, JUMP_EXT, TYPE_SIZE = range(5)
    TYPE_NAMES = ['L2 norm', 'H(curl) norm', 'Jump interior', 'Jump exterior']
9 else: # FE_TYPE == 'CG':
    L2, CURL, TYPE_SIZE = range(3)
    TYPE_NAMES = ['L2 norm', 'H(curl) norm']

def computeErrors(errors, case, A, A_0, mesh, quad_degree, FE_TYPE):
14
    from dolfin import VectorFunctionSpace, interpolate, Function, sqrt, assemble, dot,
    curl, jump, dx, dS, ds

    # interpolation in higher degree space for better error approximation
    VE = VectorFunctionSpace(mesh, FE_TYPE, quad_degree)
    A_0_VE = interpolate(A_0, VE)
    A_VE = interpolate(A, VE)

    # computing error field
    E = Function(VE)
24 E.vector()[:] = A_VE.vector()[:] - A_0_VE.vector()[:]

    # computing error field norms

    # L2:
29 try:
    errors[case][L2].append( sqrt(assemble( dot(E,E)*dx, mesh = mesh )) )
    except: print 'Skipping L2 error...'

    # CURL:
34 try:
    errors[case][CURL].append( sqrt(assemble( dot(curl(E),curl(E))*dx, mesh = mesh )) )
    except: print 'Skipping CURL error...'

    # JUMP:
39 try:
    errors[case][JUMP].append( sqrt(assemble( dot(jump(E),jump(E))*dS, mesh = mesh )) )
    except: print 'Skipping JUMP error...'

    # JUMP_EXT:
44 try:
    errors[case][JUMP_EXT].append( sqrt(assemble( dot(E,E)*ds, mesh = mesh )) )
    except: print 'Skipping JUMP_EXT error...'

```

```

def plotErrors(refinements, err, compute_all, skip, slopes, title_text, show_fig,
save_fig, PYLAB_PATH, SUFFIX, FIGURE_FORMAT):
49
    from pylab import figure, gcf, gca, subplot, loglog, grid, legend, xlabel, ylabel,
        title, show

    if compute_all:
54
        if len(err) == 1:
            cols = 1
        else:
            cols = 2

59
        rows = (len(err) - 1) / cols + 1

        figure(figsize=(cols*8, rows*4.62))

        for p in range(len(err)):
64
            subplot(rows, cols, p + 1)

            for err_type in range(TYPE_SIZE):
                loglog(refinements[skip:], err[p][err_type][skip:], '-o')
69

            for slope in slopes:
                plotSlope(slope, gca())

74
            grid()
            legend(TYPE_NAMES, loc='lower left')

            ylabel('error norm')
            if rows == 1: xlabel('1/h')
            title(title_text + ' for p = ' + str(p))
79
        else:

            figure(figsize=(8, 4.62))

84
            p = len(err) - 1
            for err_type in range(TYPE_SIZE):
                loglog(refinements[skip:], err[p][err_type][skip:], '-o')

            for slope in slopes:
89
                plotSlope(slope, gca())

            grid()
            legend(TYPE_NAMES, loc='lower left')

94
            ylabel('error norm')
            xlabel('1/h')
            title(title_text + ' for p = ' + str(p))

            if save_fig: savefig(gcf(), PYLAB_PATH + 'ERRORS' + SUFFIX + '.' + FIGURE_FORMAT,
                FIGURE_FORMAT)
99
            if show_fig: show()

# returns the list of convergence rates
def computeConvergenceRates(rates, errors, p, ref, wrt):
104
    from math import log as ln # (log is a dolphin name too)

    for err_type in range(TYPE_SIZE):
        for i in range(1, len(errors[p][err_type])):
109
            try:
                if wrt == 'hmax':
                    rates[p][err_type].append( ln(float(errors[p][err_type][i-1])/float(errors[p][
                        err_type][i]))/ln(float(ref[p][i-1])/float(ref[p][i])) )
                elif wrt == 'ndofs':
                    rates[p][err_type].append( ln(float(errors[p][err_type][i-1])/float(errors[p][
                        err_type][i]))/ln(float(ref[p][i])/float(ref[p][i-1])) )
114
                else:
                    print 'wrt must be either \'meshsize\' or \'ndofs\''
                    return
            except:
                rates[p][err_type].append( 0.0 )

119
def plotConvergenceRates(rates, method, skip, title_text, show_fig, save_fig, PYLAB_PATH,
    SUFFIX, FIGURE_FORMAT):

    from pylab import axhline, gcf, plot, grid, legend, xlabel, ylabel, title, show

    # line splitting converge and divergence regions

```

```

124 axhline(y=0, linewidth=10, color='r', alpha=0.4, label='_nolegend_')

for err_type in range(TYPE_SIZE):
    avg_rate = []
    for case in range(len(rates)):
129         if method == 'average':
            if len(rates[case][err_type]) > skip:
                avg_rate.append( sum(rates[case][err_type][skip:]) / ( len(rates[case][err_type]) - skip ) )
            else:
                avg_rate.append( sum(rates[case][err_type]) / len(rates[case][err_type]) )
134         elif method == 'last':
            avg_rate.append( rates[case][err_type][-1] )
        else:
            print 'method must be either \'average\' or \'last\''

139     plot(range(len(rates)), avg_rate, '--o', label=TYPE_NAMES[err_type])

    grid()
    legend(loc='lower right')
    xlabel('polynomial degree')
144     ylabel('convergence rate')
    title(title_text)

    if save_fig: savefig(gcf(), PYLAB_PATH + 'RATES' + SUFFIX + '.' + FIGURE_FORMAT,
                        FIGURE_FORMAT)
    if show_fig: show()

149 # text output to stdout and fout
def output(title, data, compute_all, cpu_time, OUTPUT_PATH, SUFFIX, format_string):

    from datetime import timedelta

154     # makes array into a compactly formatted string
    def format(array, format_string):
        line = ''
        for idx in range(len(array)):
159             line += format_string % array[idx] + '\t'
        return line.rstrip()

    # writes @param line into stdout & fout
    def record(fout, line):
164         print line
        fout.write(line + '\n')

    fout = open(OUTPUT_PATH + title + SUFFIX, 'w')

169     for p in range(len(data)):

        # compute only for the value p = P
        if not compute_all: p = len(data) - 1

174         record(fout, '\n===| ' + title + ' for p = ' + str(p) + ' |=== [CPU time: ' + str(
            timedelta(seconds=round(cpu_time[p]))) + ']\n')
        for err_type in range(TYPE_SIZE):
            record(fout, str(TYPE_NAMES[err_type]) + ':')
            record(fout, format(data[p][err_type], format_string))
            record(fout, '') # adds an additional line between err_type's

179         # compute only for the value p = P
        if not compute_all: break

    fout.close()

184 # writes pylab figure to file
def savefig(fig, path, FIGURE_FORMAT):
    fig.savefig(path, dpi=None, facecolor='w', edgecolor='w', orientation='portrait',
                papertype=None, format=FIGURE_FORMAT, transparent=False)

189 # plots slopes
def plotSlope(slope, plt):

    from pylab import xlim, ylim, loglog
    from math import pow, log as ln # (log is a dolfin name too)

194     xmin, xmax = xlim()
    ymin, ymax = ylim()

    xmin = xmax / 10 * 1.2
199     xmax = 6 * xmin

    ymax = ymax * 0.7
    ymin = pow( 10, ln(ymax, 10) - slope * (ln(xmax, 10) - ln(xmin, 10)) )

```

```

204 plt.plot([xmin, xmax], [ymax, ymin], '--k', label='_nolegend_')
    plt.annotate(str(slope), xy=(xmax, ymin), xycoords='data')

```

Listing 7: [debug.py]: debugging routines:

```

# === DEBUGGING ROUTINES ===

from dolfin import *
from auxiliary import *
5
def plotInflowSurface(n, v, mesh):
    # inflow surface
    class Surface_Inflow(SubDomain):
        def __init__(self, normal, velocity):
10             self.n = normal
                self.v = velocity
                SubDomain.__init__(self)

        def inside(self, x, on_boundary):
15             return dot3D(normal3D(x), self.v(x)) < 0

    # plotting inflow surface
    surface_mesh = BoundaryMesh(mesh)
    surface_parts = MeshFunction('uint', surface_mesh, surface_mesh.topology().dim())
20    surface_parts.set_all(1)
    inflow = Surface_Inflow(n, v)
    inflow.mark(surface_parts, 0)
    plot(surface_parts, title='Inflow surface (in red)', axes=True)

```

Listing 8: [dumpload.py]: file I/O for objects:

```

# dumps obj to file
2 def dump(obj, path):
    import cPickle
    cPickle.dump(obj, open(path, 'wb'))

# loads obj from file
7 def load(path):
    import cPickle
    return cPickle.load(open(path, 'rb'))

```

Listing 9: [loadplot.py]: routines for dumped files:

```

1 # LOADS FROM FILES AND PLOTS DUMPED ERRORS AND CONVERGENCE RATES
  # ( Dolfin installation is NOT needed, Matplotlib is sufficient )

from config import *
from auxiliary import *
6 from dumpload import *
  from errors import *

import sys

11 # === QUICK CONFIG [ overrides config.py ] ===

errors_skip = 0 # number of first error norms to ignore when plotting
rates_skip = 2 # number of first error norms to ignore when computing average
                convergence rates

16 # ===

try:
    test = sys.argv[1] # test to use
    P = int(sys.argv[2]) # polynomial degree
21    levels = int(sys.argv[3]) # number of refinements
except:
    test = 'polynomial'
    P = 1
    levels = 7

26 try:
    show_fig = sys.argv[4]
    save_fig = sys.argv[5]
except:
31    show_fig = True
    save_fig = False

```



```

if test == 'zero-bc':
    errors_skip = 1
    rates_skip = 2
36
SUFFIX = SUFFIX_FORMAT % (test, P, levels)

errors = load (DUMP_PATH + 'ERRORS' + SUFFIX)
41 rates = load (DUMP_PATH + 'RATES' + SUFFIX)

plotErrors(getRefinements(level_offset, levels), errors, compute_all, errors_skip,
            errors_slopes, 'Error norms', show_fig, save_fig, PYLAB_PATH, SUFFIX, FIGURE_FORMAT)
if compute_all: plotConvergenceRates(rates, 'average', rates_skip, '', show_fig,
                                     save_fig, PYLAB_PATH, SUFFIX, FIGURE_FORMAT)

```

## B Shell scripts

Listing 10: [batch\_job.sh]: executes multiple configurations:

```

1 #!/bin/bash
# executes computations for multiple configurations

# P           : 0 1 2 3 4
# max LEVELS : 8 7 6 5 4
6 # cpu_time  : 2 2 2 2 2 // in hours per one test

ENV='cluster'

DEGREES='0 1 2 3'
11 TESTS='polynomial non-linear zero-bc'

MAX='8'
16 for P in $DEGREES
do
    LEVELS=$((MAX-$P))
    for TEST in $TESTS
    do
21     python main.py $TEST $P $LEVELS $ENV;
    done
done

```

Listing 11: [save\_figs.sh]: saves multiple pylab figures:

```

#!/bin/bashcd '/media/data/Dropbox/ETH Zurich/Lectures/Term Paper/fenics/sukysj-dgdmc'
2 # saves pylab figures for multiple configurations

DEGREES='0 1 2 3'

TESTS='polynomial non-linear zero-bc'
7 MAX='8'

SHOW_FIG='False'
SAVE_FIG='True'
12 for P in $DEGREES
do
    LEVELS=$((MAX-$P))
    for TEST in $TESTS
    do
17     python loadplot.py $TEST $P $LEVELS $SHOW_FIG $SAVE_FIG;
    done
done

```

## C Mathematica code

Listing 12: [rhs.nb]: computes  $f$  on  $\Omega$ :

```
<< VectorAnalysis <
```

```

SetCoordinates[Cartesian[x, y, z]];

Linear test :
5
a1 = 2 x - 1.5 y + 0.6 z;
a2 = 1.2 x + 2.4 y - 0.6 z;
a3 = 1.4 x + 0.3 y - 2.5 z;
A = {a1, a2, a3};

10
v1 = 1.2;
v2 = 1.4;
v3 = 0.7;
v = {v1, v2, v3};

15
CForm[Grad[A.v] + Cross[Curl[A], v]]

Polynomial test :

20
a1 = x y;
a2 = (1 - y^2) ;
a3 = (1 + z x);
A = {a1, a2, a3};

25
v1 = 0.66*(1 - y^2);
v2 = 0.2 + z x;
v3 = 0.8 - x^2;
v = {v1, v2, v3};

30
CForm[Grad[A.v] + Cross[Curl[A], v]]

Non - linear test :

35
a1 = Sin[Pi y];
a2 = (1 - y^2) ;
a3 = (1 + z^2);
A = {a1, a2, a3};

40
v1 = 0.66*(1 - y^2);
v2 = 0.2 + Sin[Pi x];
v3 = 0.8 - x^2;
v = {v1, v2, v3};

45
CForm[Grad[A.v] + Cross[Curl[A], v]]

Zero - bc test :

50
a1 = Sin[Pi x]*Sin[2 Pi y]*Sin[3 Pi z];
a2 = Sin[Pi x]*Sin[2 Pi y]*Sin[3 Pi z];
a3 = Sin[Pi x]*Sin[2 Pi y]*Sin[3 Pi z];
A = {a1, a2, a3};

55
v1 = 1.2;
v2 = 1.4;
v3 = 0.7;
v = {v1, v2, v3};

CForm[Grad[A.v] + Cross[Curl[A], v]]

```

## D Computations architecture

<b>Arch</b>	x86-64
<b>Kernel</b>	2.6.30.9-90
<b>CPU</b>	16 x Quad-Core 2.3Ghz
<b>Memory</b>	64 GB
<b>OpenMP</b>	not enabled
<b>MPI</b>	not enabled

**Usage** per test for `levels = 8 - degree`:  
**CPU:**  $\sim 2$  hours  
**Memory:**  $\sim 40$  GB

**Location:** cmath-7 node in SAM, D-MATH, ETH Zurich