



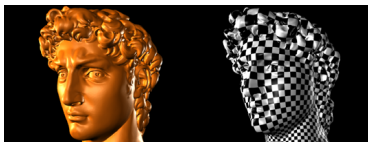
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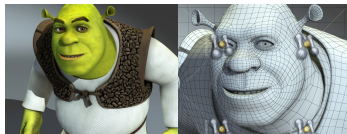
# Anisotropic Finite Element Mesh Adaptation through High-Dimensional Embeddings

Franco Dassi, Hang Si, Simona Perotto and Timo Streckenbach

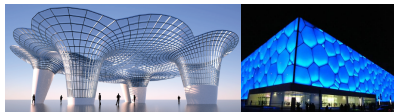
- Meshes are backbone in 3d applications.



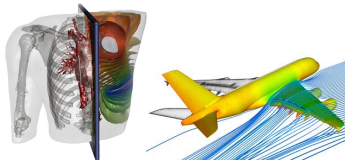
Courtesy: David Gu, Uni. Stonybrook  
Computer Graphics



Courtesy: DreamWorks Pictures  
Computer Animation

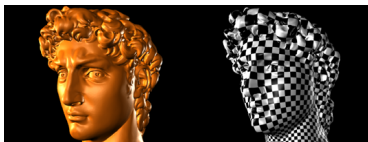


Courtesy: (L) Uni Stanford (R) Water Cube Stadium in Beijing  
Architecture Design

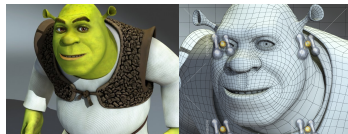


Courtesy: (L) Uni Utah (R) [www.dlr.de](http://www.dlr.de)  
Numerical Simulation

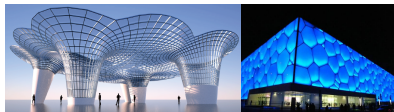
- Meshes are backbone in 3d applications.
- **The Problem:** How to generate a "good" mesh?



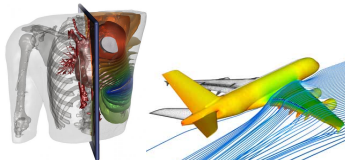
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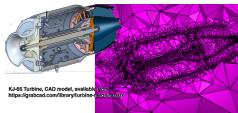
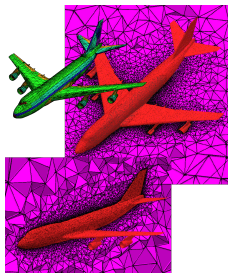
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In 2001, H. Edelsbrunner wrote:

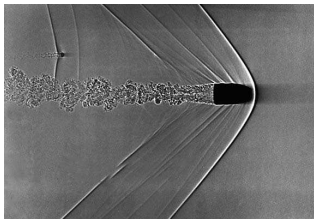
*... Mesh generation is a topic in which a meaningful combination of different approaches to problem solving is inevitable.*



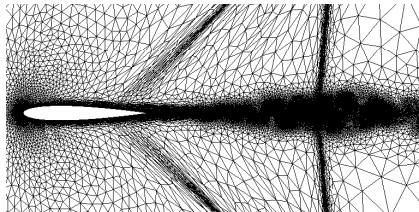
- A research project of WIAS since 2002.
- The goal is two-fold:
  - to study the underlying mathematical problems; and
  - to develop robust and efficient algorithms and softwares.
- It is freely available at <http://www.tetgen.org>.
  - latest version 1.5 (released in Nov. 2013).
  - about 10,000 downloads (Nov. 2013 - now).
  - about 20+ commercial licenses.



- **Anisotropic meshes** are very important in many numerical simulations to capture the physical behavior of a complex phenomenon at a reasonable computational cost.
- It is a very complex and challenging problem.

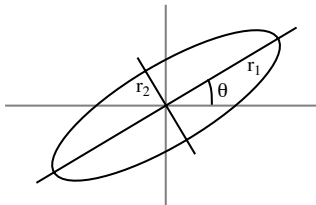


Courtesy: A. Davidhazy

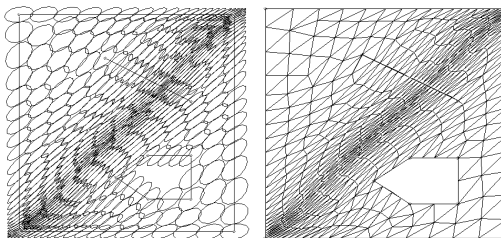


Courtesy: P. Frey

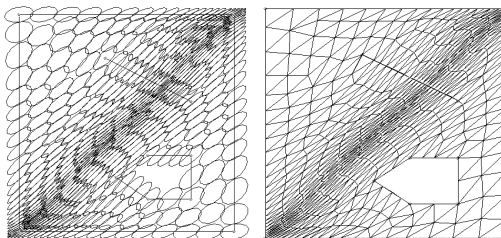
- Anisotropy is due to that the “space” is not flat, i.e., its geometry is non-Euclidean.
- Anisotropy can be described through a field  $\mathcal{M}$  of metric tensors associated with a space domain  $\Omega \subseteq \mathbb{R}^d$ , where each metric tensor  $M(\mathbf{x}) \in \mathcal{M}$ ,  $\mathbf{x} \in \Omega$  is a  $d \times d$  symmetric positive definite matrix.
- A metric tensor  $M$  can be geometrically represented by an oriented ellipse defined by its eigenvalues and eigenvectors.



- In the majority of works concerning anisotropic mesh generation, a (discrete) metric tensor field  $\mathcal{M}$  (e.g., defined on the vertices) is used to describe the anisotropic feature of the domain. Then, a *uniform mesh* with equal (geodesic) edge length with respect to the metric tensor field  $\mathcal{M}$  is sought. This will produce an anisotropic mesh of that domain.

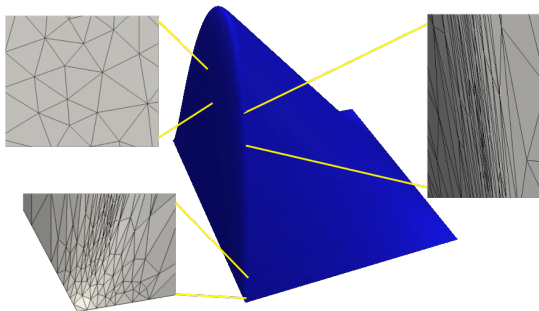


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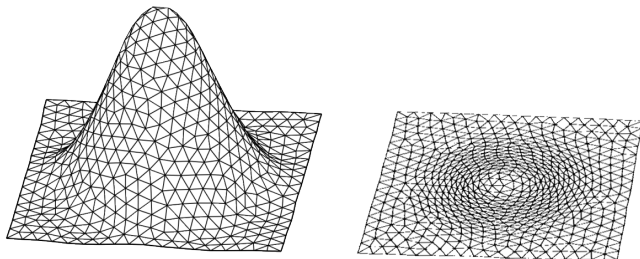


- In this work, we propose a new mesh adaptation approach, in which no metric tensor fields are involved.

**Question 1:** How to approximate a surface  $\Gamma \subset \mathbb{R}^3$  with a small number of mesh elements.



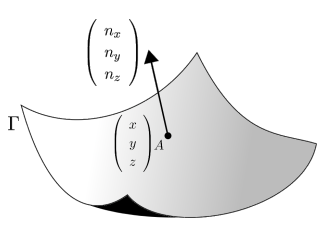
**The Idea:** Use additional dimensions to resolve the anisotropy.



(Courtesy of B. Lévy)

*This example shows that an anisotropic mesh in  $\mathbb{R}^2$  corresponds to an isotropic mesh in  $\mathbb{R}^3$ .*

Let  $\Gamma$  be a surface in  $\mathbb{R}^3$ . Let  $\phi : \Gamma \subset \mathbb{R}^3 \rightarrow \mathbb{R}^6$  be a map defined as,



The diagram shows a curved surface  $\Gamma$  in  $\mathbb{R}^3$ . A point  $A$  is marked on the surface with coordinates  $\begin{pmatrix} x \\ y \\ z \end{pmatrix}$ . A normal vector is shown at point  $A$  with components  $\begin{pmatrix} n_x \\ n_y \\ n_z \end{pmatrix}$ .

$$\phi(A) := \begin{bmatrix} x \\ y \\ z \\ sn_x \\ sn_y \\ sn_z \end{bmatrix}$$

where  $A$  is a point in surface  $\Gamma$  whose coordinates are  $x$ ,  $y$  and  $z$ , respectively, and  $n_x$ ,  $n_y$  and  $n_z$  are the components of the normal to the surface  $\Gamma$  at the point  $p$ .

The constant  $s \in (0, +\infty)$  is a parameter for capturing the anisotropy.



**Question 2:** How to generate an uniform mesh for the surface  $\phi(\Gamma)$  in  $\mathbb{R}^6$ .

- Directly generalizing the existing algorithms in  $\mathbb{R}^3$  is impractical due to the memory limitations.
- The `vorpaline` algorithm [**Lévy and Bonneel 2012**] – optimizing an  $d$ -dimensional Centroidal Voronoi Tessellation (CVT).
- ...our approach.

Define the scalar product in  $\mathbb{R}^6$  to be:

$$(A, B)_{6d} = \underbrace{x_A x_B + y_A y_B + z_A z_B}_I + s^2 \underbrace{(n_x w_x + n_y w_y + n_z w_z)}_{II}.$$

This parameter will balance the contribution of the quantities  $I$  and  $II$  on whole value of  $(A, B)_{6d}$ . Since  $I \in [-d^2, d^2]$  and  $II \in [-1, 1]$ , where  $d$  is the measure of the diagonal of the bounding box of  $\Gamma$ , we need an additional constant to make  $I$  and  $II$  almost comparable. We decide to modify  $(A, B)_{6d}$  in such a way

$$(A, B)_{6d} = x_A x_B + y_A y_B + z_A z_B + (h_\Gamma s)^2 (n_x w_x + n_y w_y + n_z w_z).$$

where

$$h_\Gamma = \frac{d_x + d_y + d_z}{3},$$

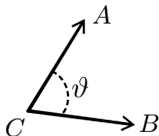
here  $d_x$ ,  $d_y$  and  $d_z$  are the dimension of the bounding box of  $\Gamma$ .

Given two points  $A$  and  $B$  that lie on the surface  $\Gamma$ , we define the length of the segment  $l_{AB}^{6d}$  as

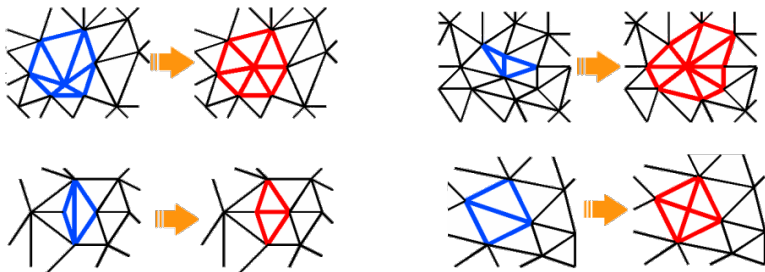
$$l_{AB}^{6d} := \|A - B\|_{6d} = \sqrt{(A - B, A - B)_{6d}}.$$

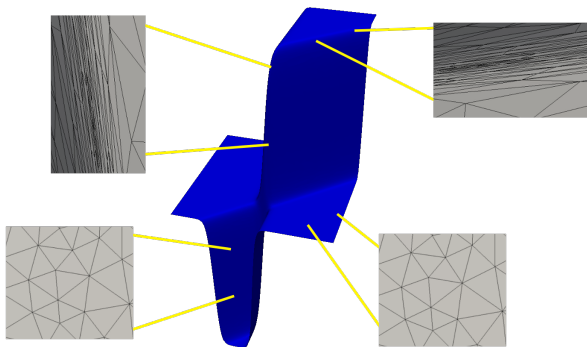
Given three points  $A, B, C \in \Gamma$  we define the **6d-angle**  $\vartheta$  as

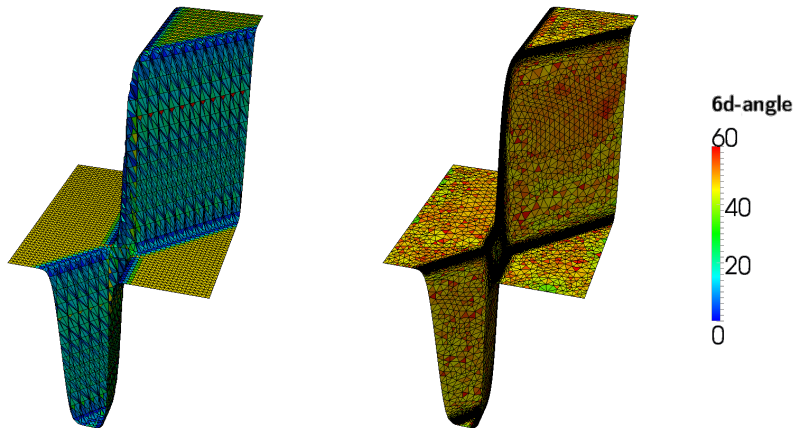
$$\cos_{6d}(\vartheta) := \frac{(A - C, B - C)_{6d}}{\|A - C\|_{6d} \|B - C\|_{6d}}$$



- Starting from an initial mesh of a surface  $\Gamma \subset \mathbb{R}^3$
- Evaluate the lengths of the angles of the triangles in  $\mathbb{R}^6$ .
- Perform the standard local mesh adaptation operations to make the mesh as uniform as possible in  $\mathbb{R}^6$ .

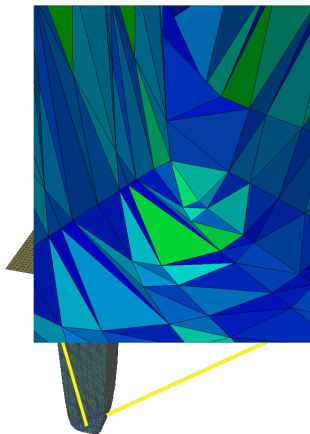




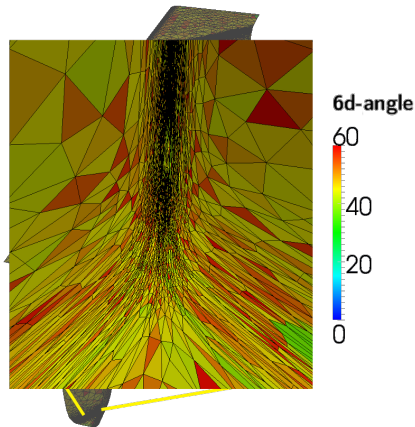


The initial mesh

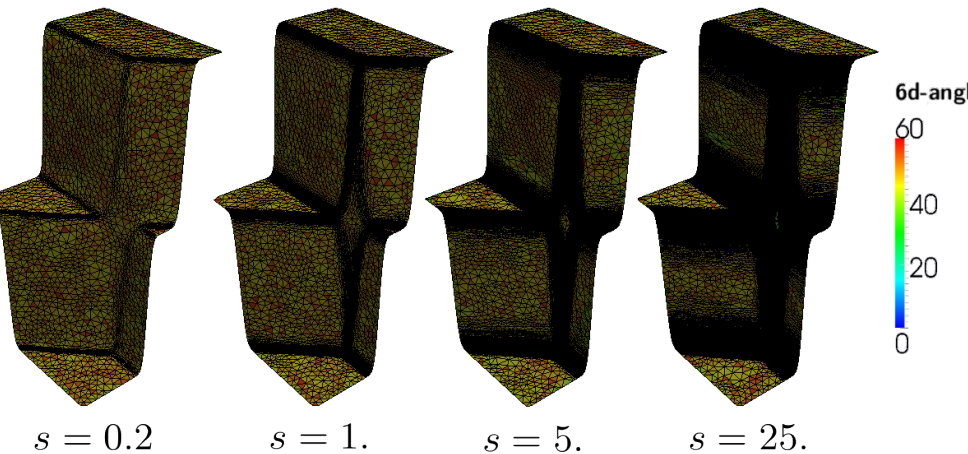
A resulting mesh



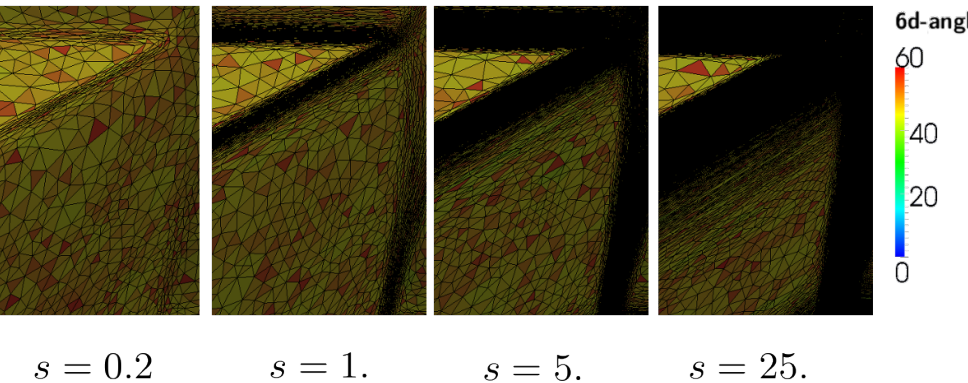
The initial mesh

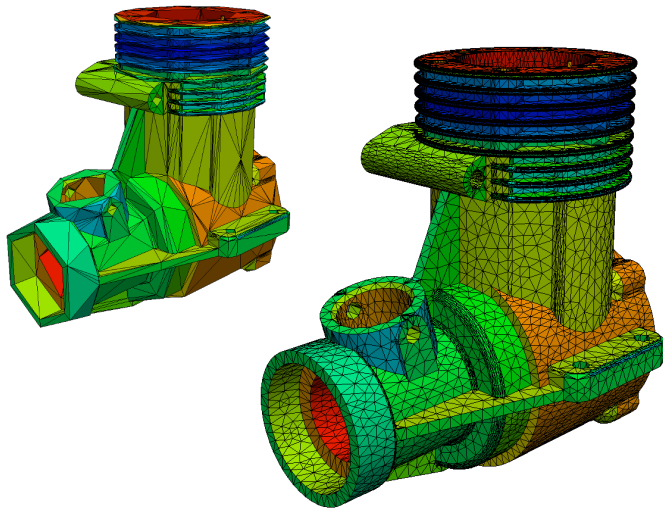


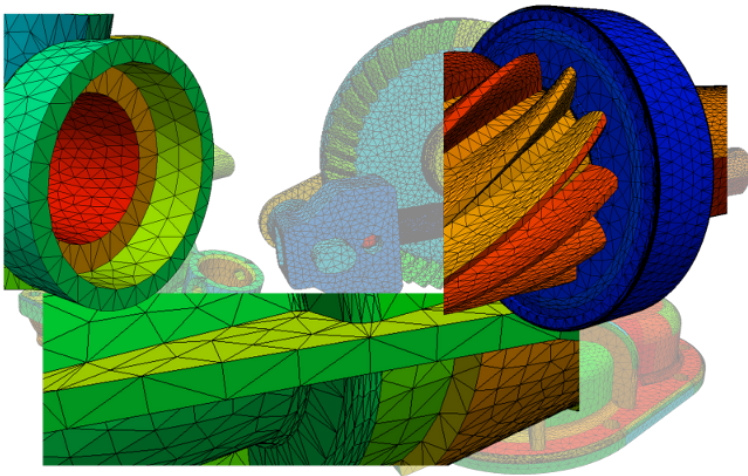
A resulting mesh











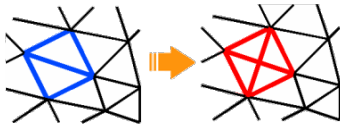
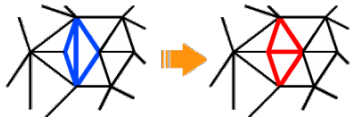
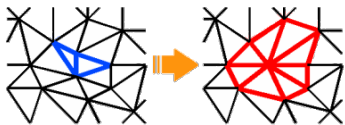
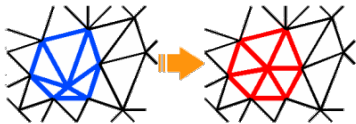


Consider a flat domain  $\Omega$  with a Lipschitz smooth boundary and a smooth function  $f : \Omega \subset \mathbb{R}^2 \rightarrow \mathbb{R}$ . We define the embedding map  $\Phi_f : \Omega \subset \mathbb{R}^2 \rightarrow \mathbb{R}^5$  as:

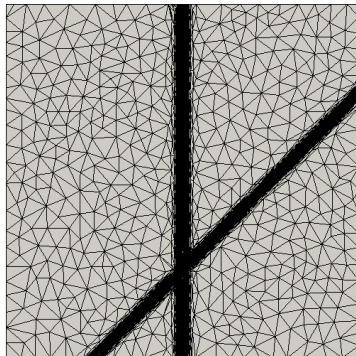
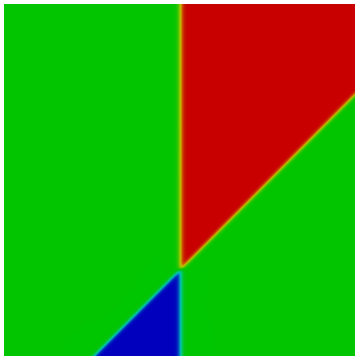
$$\Phi_f(\mathbf{x}) := (x, y, s f(x, y), s g_x(x, y), s g_y(x, y))^t, \quad (1)$$

here  $s \in [0, +\infty)$  is a user-specified parameter,  $f(x, y)$ ,  $g_x(x, y)$  and  $g_y(x, y)$  are values at the point  $(x, y)$  of the function  $f$  and its gradient components, respectively.

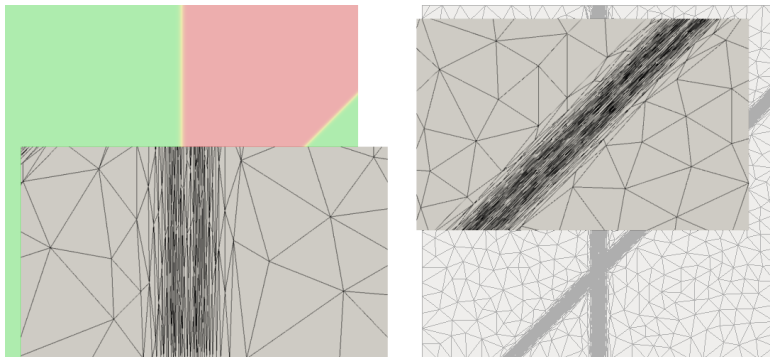
an initial mesh  $\Omega_h$             sampling  
a desired 5d-length,  $L_{5d}$       optimization            final mesh



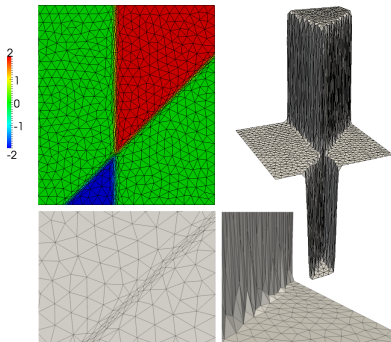
$$f_2(x, y) = \tanh(60x) - \tanh(60(x - y) - 30).$$



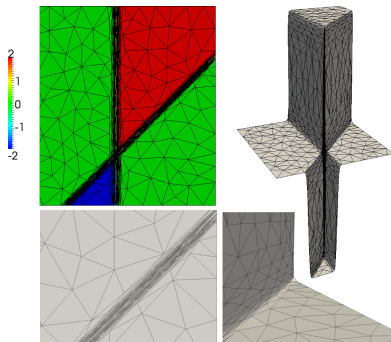
$$f_2(x, y) = \tanh(60x) - \tanh(60(x - y) - 30).$$



- Hecht, F., BAMG: Bidimensional anisotropic mesh generator.  
[www.ann.jussieu.fr/hecht/ftp/bamg](http://www.ann.jussieu.fr/hecht/ftp/bamg), Freefem++.
- Uses metric based mesh adaptation method.



BAMG



HDE



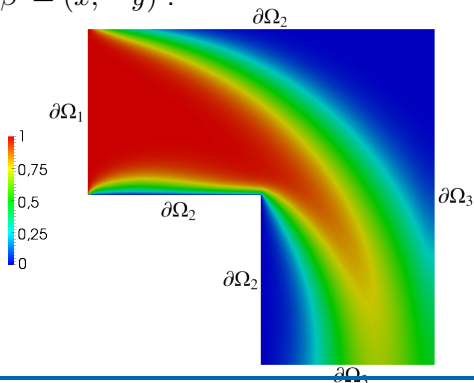
- Contrary to the classical mesh adaptation procedure, the proposed adaptation strategy in this paper does not involve both the estimation of an error and the construction of a metric field. In each iteration of the mesh adaptation, we use the following steps:

SOLVE→RECOVER GRADIENT→ADAPT,

and this process stops when it converges or a desired maximum number of iterations is reached.

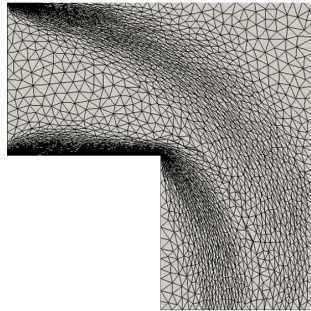
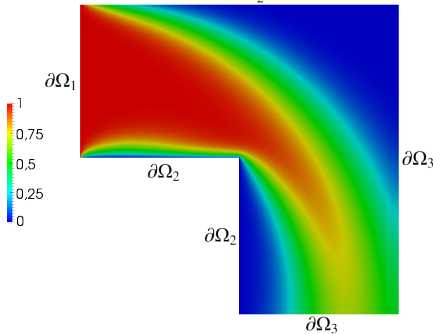
$$\left\{ \begin{array}{ll} -\mu \Delta u + \vec{\beta} \cdot \nabla u &= 0 \quad \text{in } \Omega, \\ u &= 1 \quad \text{in } \partial\Omega_1, \\ u &= 0 \quad \text{in } \partial\Omega_2, \\ \mu \frac{\partial u}{\partial n} &= 0 \quad \text{in } \partial\Omega_3, \end{array} \right.$$

here  $\mu = 0.05$ ,  $\vec{\beta} = (x, -y)^t$ .



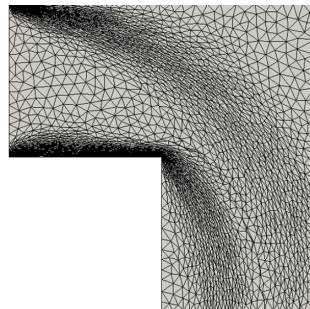
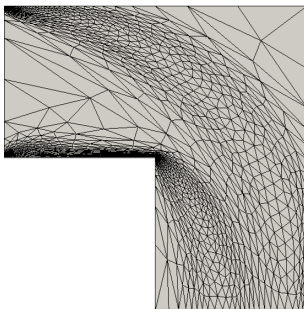
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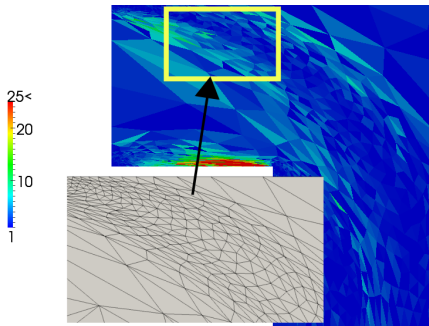
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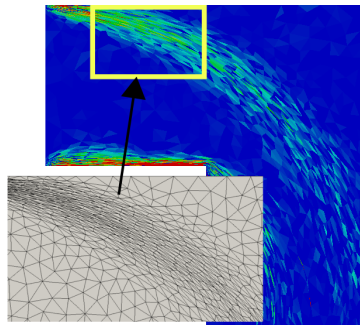
$$e_{tot} := \int_{\Omega_h} |u_h - u_{ref}|^2 dx \quad \text{and} \quad \sigma_{max} := \max_{T \in \Omega_h} \sigma_T$$

	BAMG	HDE
Ele.	4438	4337
$e_{tot}$	4.143e-03	6.650e-03
$\sigma_{max}$	6.880e+01	3.456e+02





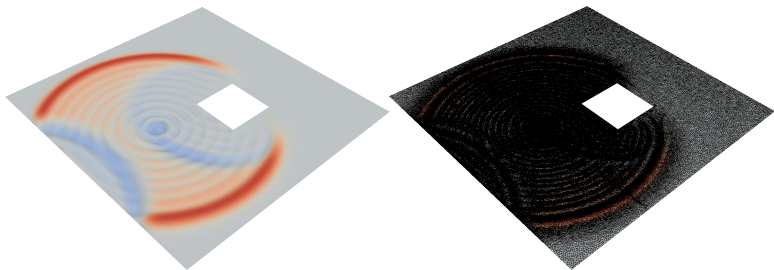
BAMG



HDE

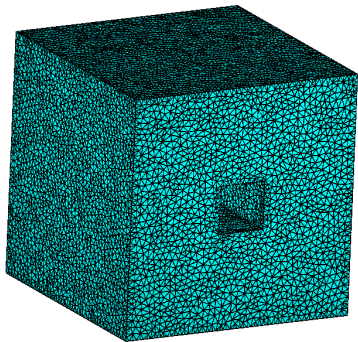
$$\begin{cases} \frac{\partial^2 u}{\partial t^2} - \mu \Delta u = f & \text{in } \Omega, \\ u = 0 & \text{in } \partial\Omega, \end{cases}$$

here  $\mu = 1.$ ,  $f$  discrete Dirac function.

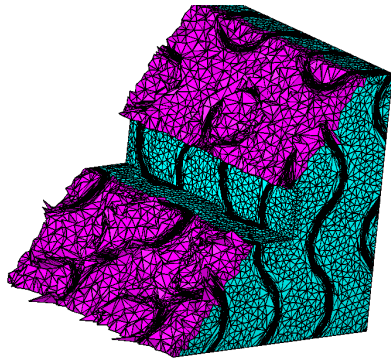


animation

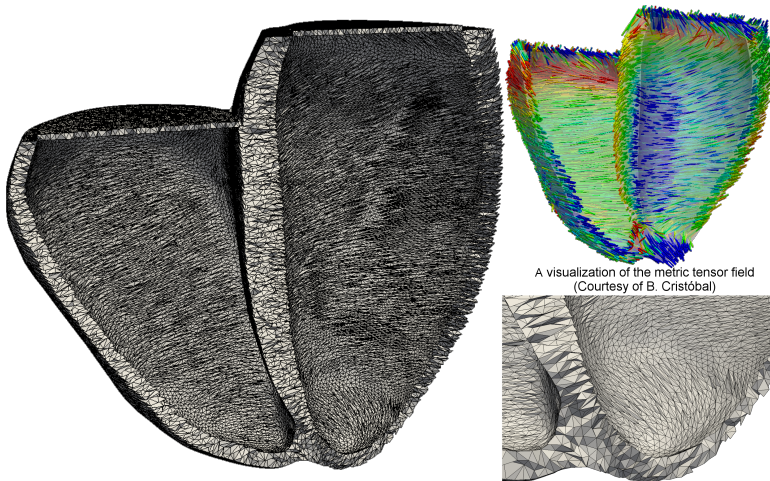
$$f(x, y, z) = \tanh(10(\sin(2\pi x) \cos(2\pi y) + \sin(2\pi y) \cos(2\pi z) + \sin(2\pi z) \cos(2\pi x)))$$



The initial mesh



An adapted mesh





- We have presented a method for anisotropic mesh adaptation based on higher dimensional embeddings (HDE).
- Experimental results showed that this method produced meshes are comparable those generated by metric-based mesh adaptation methods.
- HDE tends to capture anisotropy more accurately.
- However, HDE tends to over stretched in some area. The mesh gradation in HDE is less than metric-based method.
- Deep analysis is needed for HDE method.
- A very interesting question is how its relation with metric-based method.