

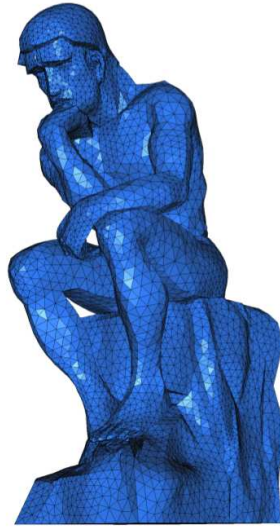
# RODIN: un projet de R&D collaborative en optimisation topologique de structures

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Résultats obtenus en collaboration avec F. Jouve (LJLL, Paris 7),  
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RODIN project



Ecole Polytechnique,  
UPMC, INRIA,  
Renault, EADS,  
ESI group, etc.

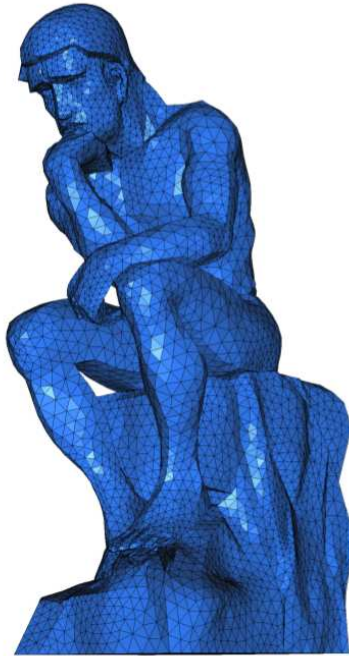
Previous academic work on the level set method for shape and topology optimization by the level set method.

What was/is missing for application in industry ?

1. **Manufacturability constraints.** (Focus today.)
2. More complex models and objective functions.
3. Implementation into "industrial" finite elements codes.
4. Connections with meshing algorithms and CAD.

# CONTENTS

RODIN project

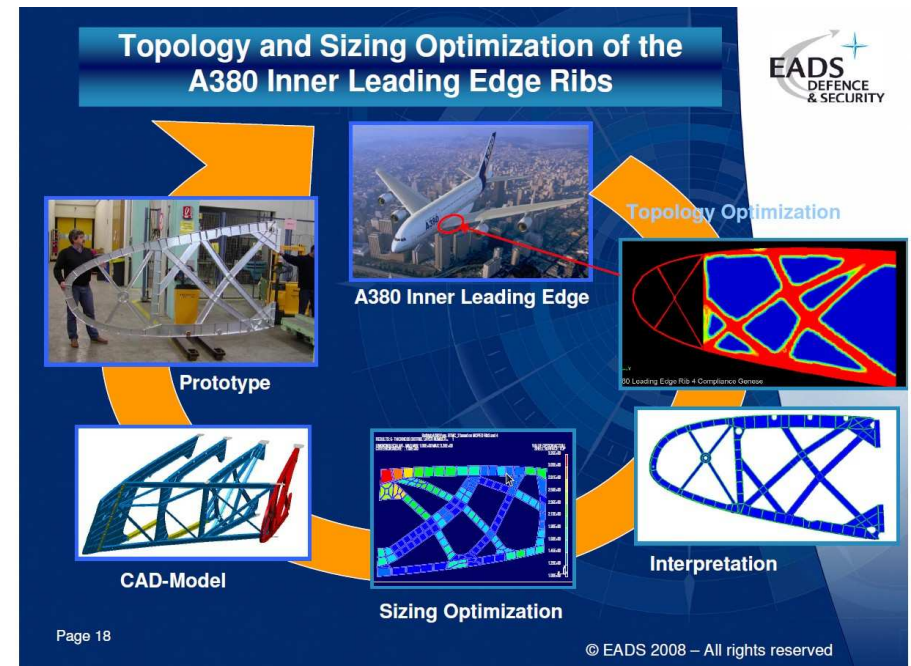
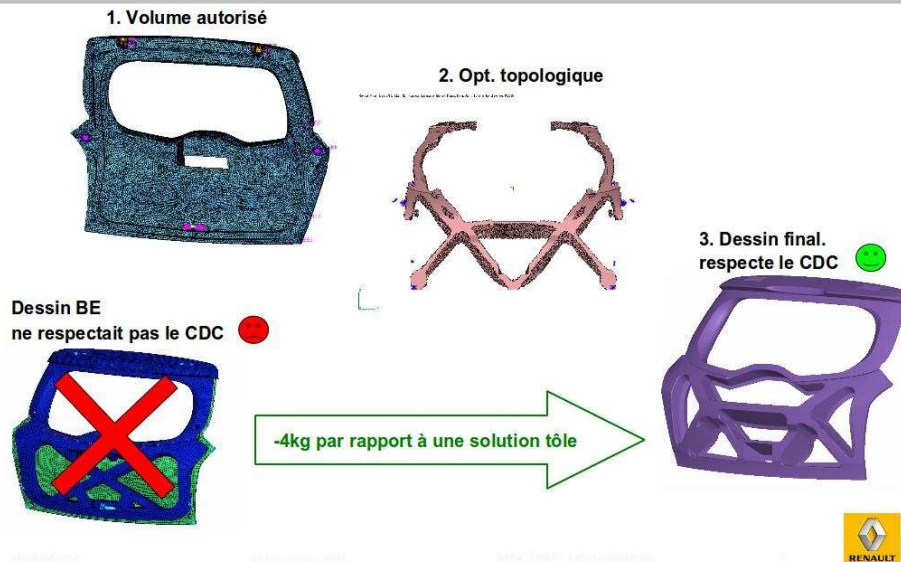


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ESI group, etc.

1. Introduction.
2. Shape and topology optimization by the level set method.
3. Geometrical constraints.
4. Numerical results.
5. Molding constraints.

# -I- INTRODUCTION

## Principe & démarche



- ➡ Tremendous progresses were achieved on academic research about shape and topology optimization.
- ➡ There are already many commercial softwares which are heavily used by industry.
- ➡ But manufacturability of the optimal shapes is not always guaranteed.

## Definition of structural optimization

**Shape optimization** : minimize an **objective function** over a set of admissibles shapes  $\Omega$  (including possible constraints)

$$\inf_{\Omega \in \mathcal{U}_{ad}} J(\Omega)$$

The objective function is evaluated through a partial differential equation (**state equation**)

$$J(\Omega) = \int_{\Omega} j(u_{\Omega}) dx$$

where  $u_{\Omega}$  is the solution of

$$PDE(u_{\Omega}) = 0 \quad \text{in } \Omega$$

**Topology optimization** : the optimal topology is unknown.

## The model of linear elasticity

Shape  $\Omega \subset \mathbb{R}^d$  with boundary  $\partial\Omega = \Gamma \cup \Gamma_N \cup \Gamma_D$ , where  $\Gamma_D$  and  $\Gamma_N$  are fixed.  
 Only  $\Gamma$  is optimized (free boundary).

For a given applied load  $g : \Gamma_N \rightarrow \mathbb{R}^d$ , the displacement  $u : \Omega \rightarrow \mathbb{R}^d$  is the solution of

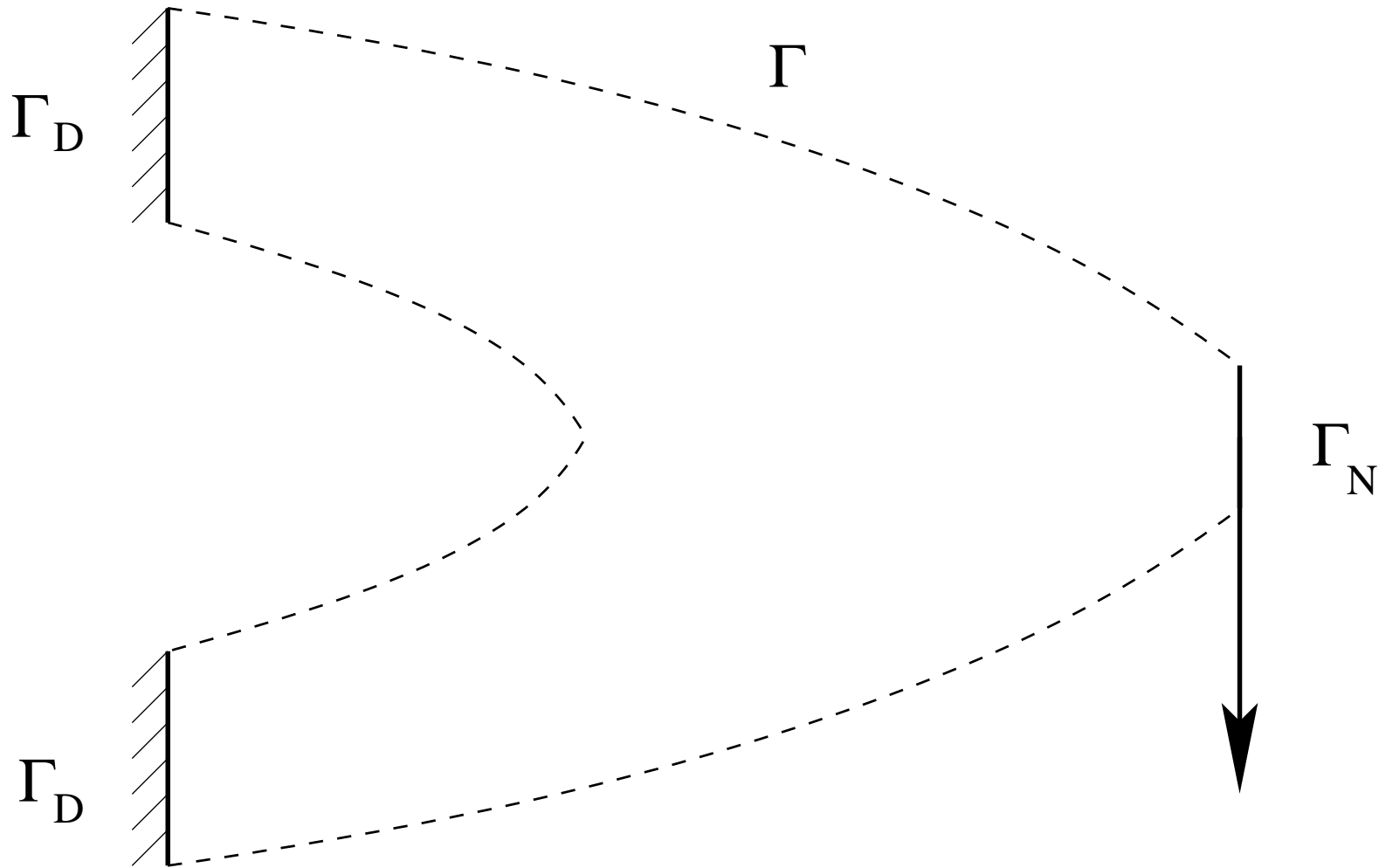
$$\begin{cases} -\operatorname{div}(Ae(u)) = 0 & \text{in } \Omega \\ u = 0 & \text{on } \Gamma_D \\ (Ae(u))n = g & \text{on } \Gamma_N \\ (Ae(u))n = 0 & \text{on } \Gamma \end{cases}$$

with the strain tensor  $e(u) = \frac{1}{2}(\nabla u + \nabla^t u)$ , the stress tensor  $\sigma = Ae(u)$ , and  $A$  an homogeneous isotropic elasticity tensor.

Typical objective function: [the compliance](#)

$$J(\Omega) = \int_{\Gamma_N} g \cdot u \, dx,$$

Example: the cantilever



## Admissible shapes

The **shape optimization** problem is

$$\inf_{\Omega \in \mathcal{U}_{ad}} J(\Omega),$$

where the set of **admissible shapes** is typically

$$\mathcal{U}_{ad} = \left\{ \Omega \subset D \text{ open set such that } \Gamma_D \cup \Gamma_N \subset \partial\Omega \text{ and } \int_{\Omega} dx = V_0 \right\},$$

where  $D \subset \mathbb{R}^d$  is a given “working domain” and  $V_0$  is a prescribed volume.

- ➡ We want to add **geometrical constraints (for manufacturability)**, i.e., constraints on  $\Omega$ , not on the state  $u_{\Omega}$ .
- ➡ The level set framework is well suited for this because it relies on the **distance function to the boundary**.



## -II- LEVEL SET METHOD

A new numerical implementation of an old idea...

- ➡ Framework of Hadamard's method of shape variations.
- ➡ **Main tool:** the level set method of Osher and Sethian (JCP 1988).
- ➡ Shape capturing algorithm.
- ➡ Fixed mesh: low computational cost.
- ➡ Can be coupled with the topological gradient.
- ➡ Some references: Sethian and Wiegmann (JCP 2000), Osher and Santosa (JCP 2001), Allaire, Jouve and Toader (CRAS 2002, JCP 2004, CMAME 2005), Wang, Wang and Guo (CMAME 2003).

## FRONT PROPAGATION BY LEVEL SET

Shape capturing method on a fixed mesh of the “working domain”  $D$ .

A shape  $\Omega$  is parametrized by a **level set** function

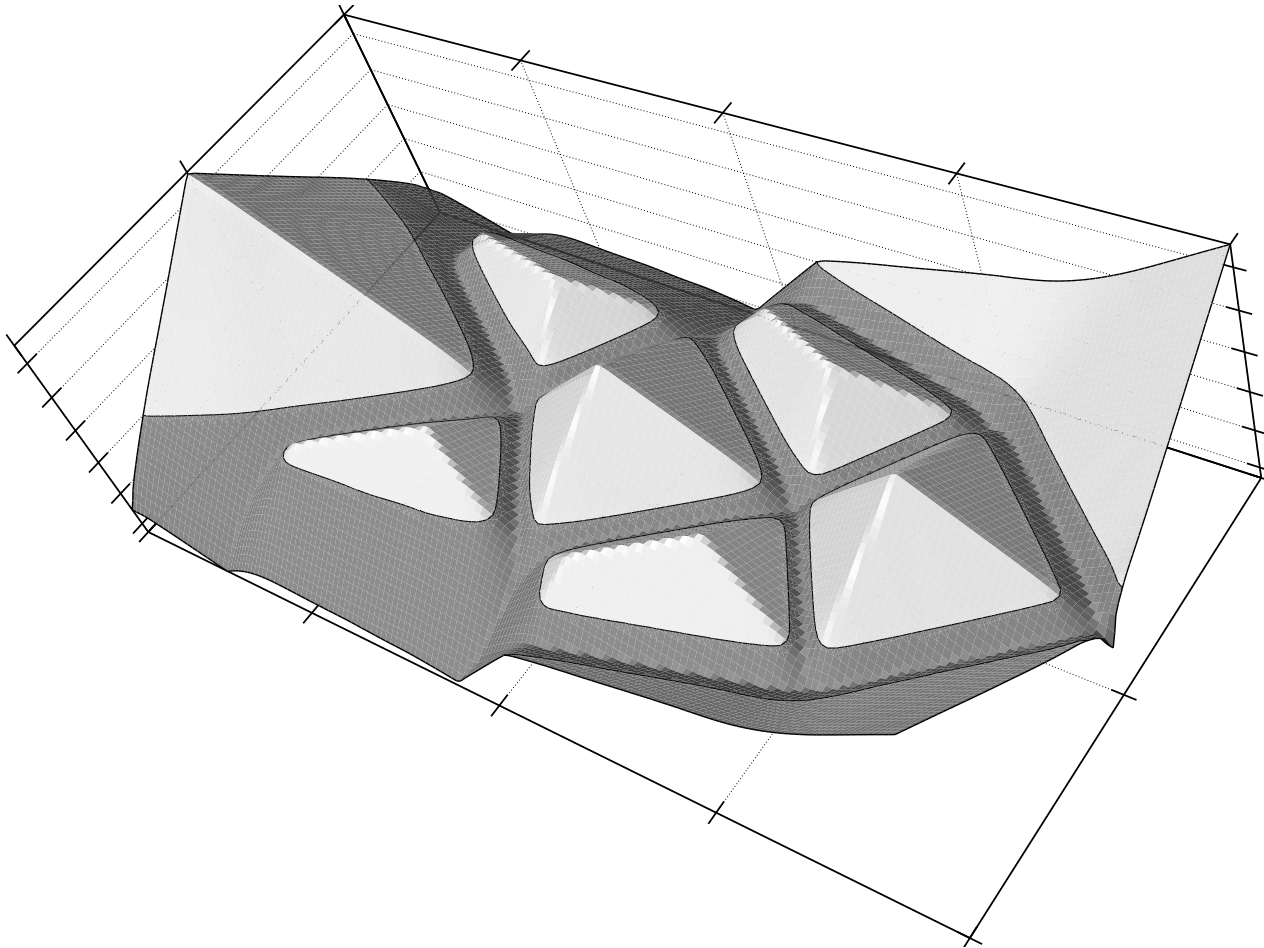
$$\begin{cases} \psi(x) = 0 & \Leftrightarrow x \in \partial\Omega \cap D \\ \psi(x) < 0 & \Leftrightarrow x \in \Omega \\ \psi(x) > 0 & \Leftrightarrow x \in (D \setminus \Omega) \end{cases}$$

Assume that the shape  $\Omega(t)$  evolves in time  $t$  with a normal velocity  $V(t, x)$ .

Then its motion is governed by the following Hamilton Jacobi equation

$$\frac{\partial\psi}{\partial t} + V|\nabla_x\psi| = 0 \quad \text{in } D.$$

## Example of a level set function



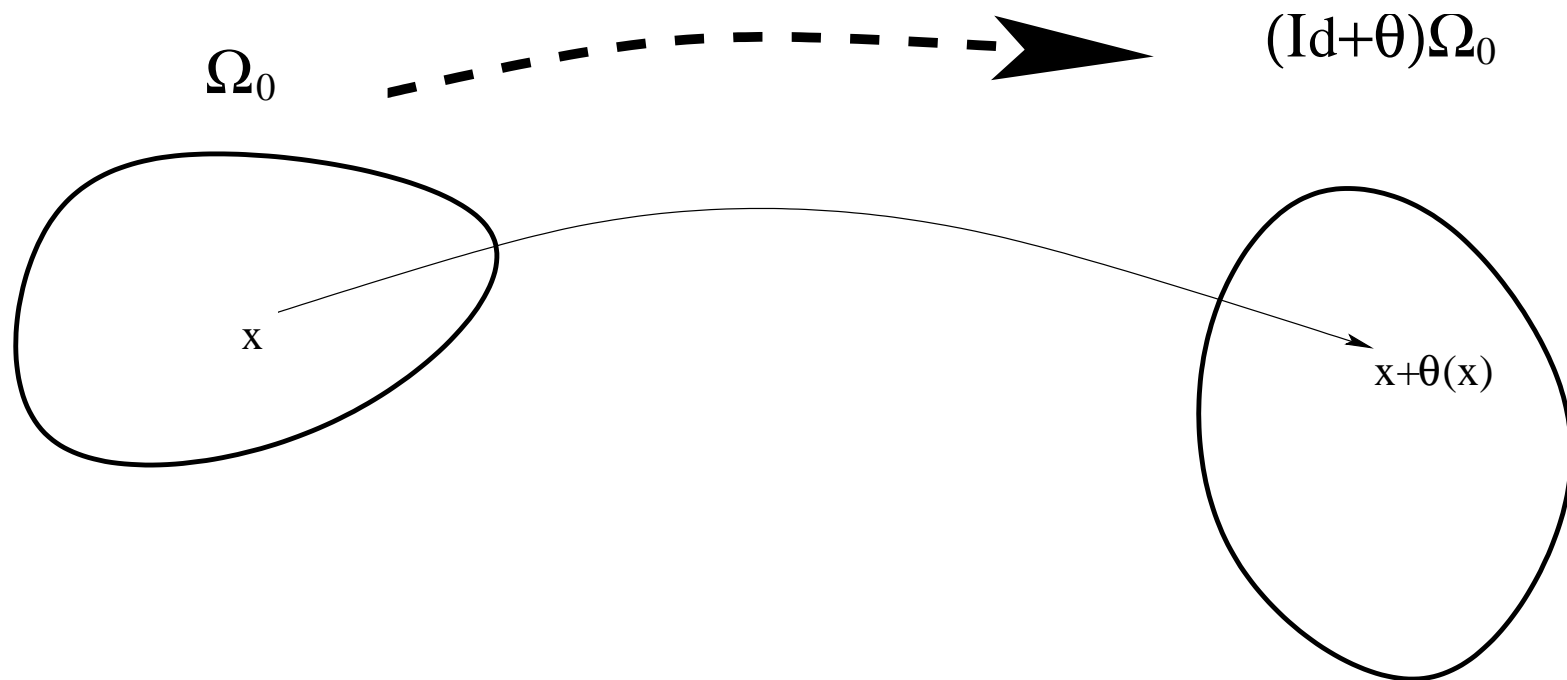
Advection velocity = shape gradient

The velocity  $V$  is deduced from the shape gradient of the objective function.

To compute this shape gradient we recall [the well-known Hadamard's method](#).

Let  $\Omega_0$  be a reference domain. Shapes are parametrized by a [vector field](#)  $\theta$

$$\Omega = (\text{Id} + \theta)\Omega_0 \quad \text{with} \quad \theta \in C^1(\mathbb{R}^d; \mathbb{R}^d).$$



## Shape derivative

**Definition:** the shape derivative of  $J(\Omega)$  at  $\Omega_0$  is the **Fréchet differential** of  $\theta \rightarrow J((\text{Id} + \theta)\Omega_0)$  at 0.

**Hadamard structure theorem:** the shape derivative of  $J(\Omega)$  can always be written (in a distributional sense)

$$J'(\Omega_0)(\theta) = \int_{\partial\Omega_0} \theta(x) \cdot n(x) j(x) ds$$

where  $j(x)$  is an integrand depending on the state  $u$  and an adjoint  $p$ .

We choose the velocity  $V = \theta \cdot n$  such that  $J'(\Omega_0)(\theta) \leq 0$ .

**Simplest choice:**  $V = \theta \cdot n = -j$  but other ones are possible (including regularization).

## SHAPE DERIVATIVE OF THE COMPLIANCE

$$J(\Omega) = \int_{\Gamma_N} g \cdot u_\Omega \, ds = \int_{\Omega} A e(u_\Omega) \cdot e(u_\Omega) \, dx,$$

where  $u_\Omega$  is the state variable in  $\Omega$ .

$$J'(\Omega)(\theta) = - \int_{\Gamma} A e(u_\Omega) \cdot e(u_\Omega) \theta \cdot n \, ds,$$

### Remarks:

1. self-adjoint problem (no adjoint state is required),
2. taking into account the volume constraint add a fixed Lagrange multiplier  $\lambda - Ae(u_\Omega) \cdot e(u_\Omega)$ .

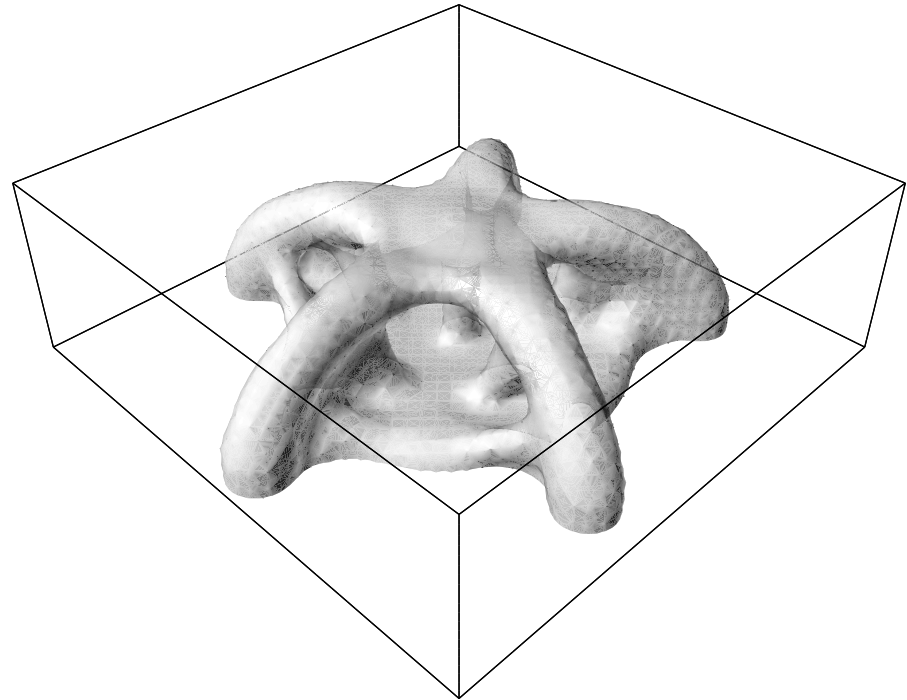
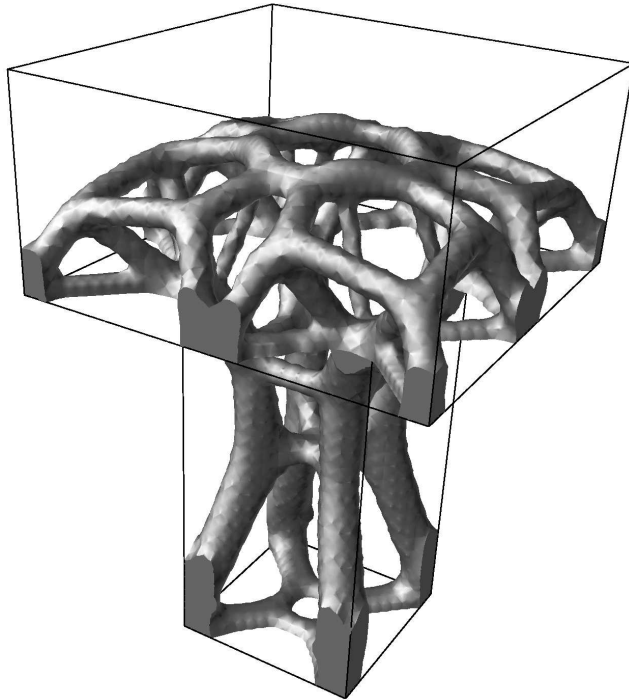
## NUMERICAL ALGORITHM

1. Initialization of the level set function  $\psi_0$  (including holes).
2. Iteration until convergence for  $k \geq 1$ :
  - (a) Compute the elastic displacement  $u_k$  for the shape  $\psi_k$ .  
Deduce the shape gradient = normal velocity =  $V_k$
  - (b) Advect the shape with  $V_k$  (solving the Hamilton Jacobi equation) to obtain a new shape  $\psi_{k+1}$ .

For numerical examples, see the web page:

[http://www.cmap.polytechnique.fr/~optopo/level\\_en.html](http://www.cmap.polytechnique.fr/~optopo/level_en.html)

## Examples of results with complex topologies





## **-III- GEOMETRICAL CONSTRAINTS**

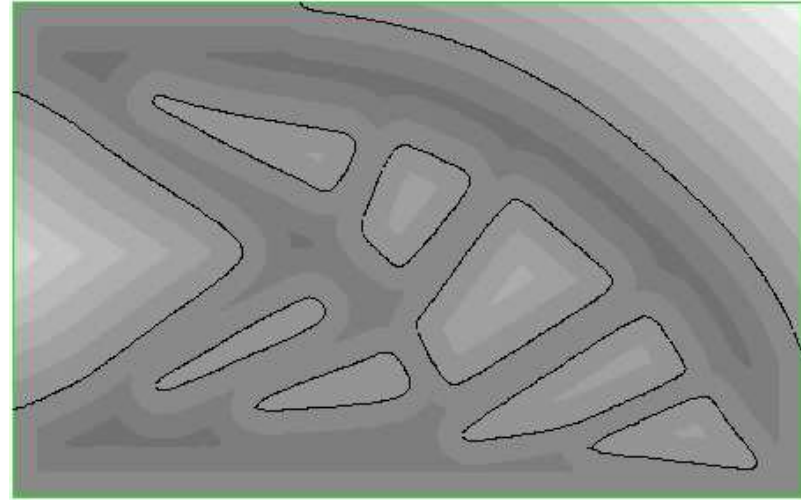
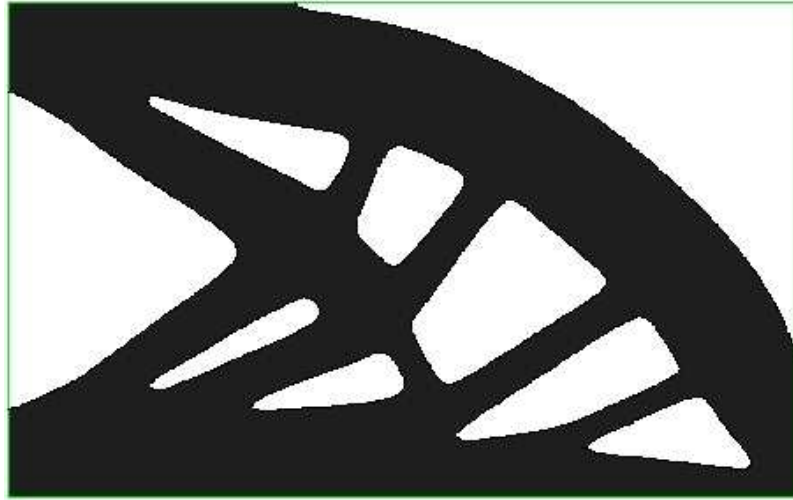
We focus on thickness control because of

- manufacturability,
- uncertainty in the microscale (MEMS design),
- robust design (fatigue, buckling, etc.).

Existing works:

- Several approaches in the framework of the **SIMP** method to ensure minimum length scale (Sigmund, Poulsen, Guest, etc.).
- In the **level-set** framework: Chen, Wang and Liu implicitly control the feature size by adding a "line" energy term to the objective function ; Alexandrov and Santosa kept a fixed topology by using offset sets.
- Many works in **image processing**.

## Signed-distance function



**Definition.** Let  $\Omega \subset \mathbb{R}^d$  be a bounded domain. The **signed distance function** to  $\Omega$  is the function  $\mathbb{R}^d \ni x \mapsto d_\Omega(x)$  defined by :

$$d_\Omega(x) = \begin{cases} -d(x, \partial\Omega) & \text{if } x \in \Omega \\ 0 & \text{if } x \in \partial\Omega \\ d(x, \partial\Omega) & \text{if } x \in \mathbb{R}^d \setminus \Omega \end{cases}$$

where  $d(\cdot, \partial\Omega)$  is the usual Euclidean distance.

## Constraint formulations

Maximum thickness.

Let  $d_{\max}$  be the maximum allowed thickness. The constraint reads:

$$d_{\Omega}(x) \geq -d_{\max}/2 \quad \forall x \in \Omega$$

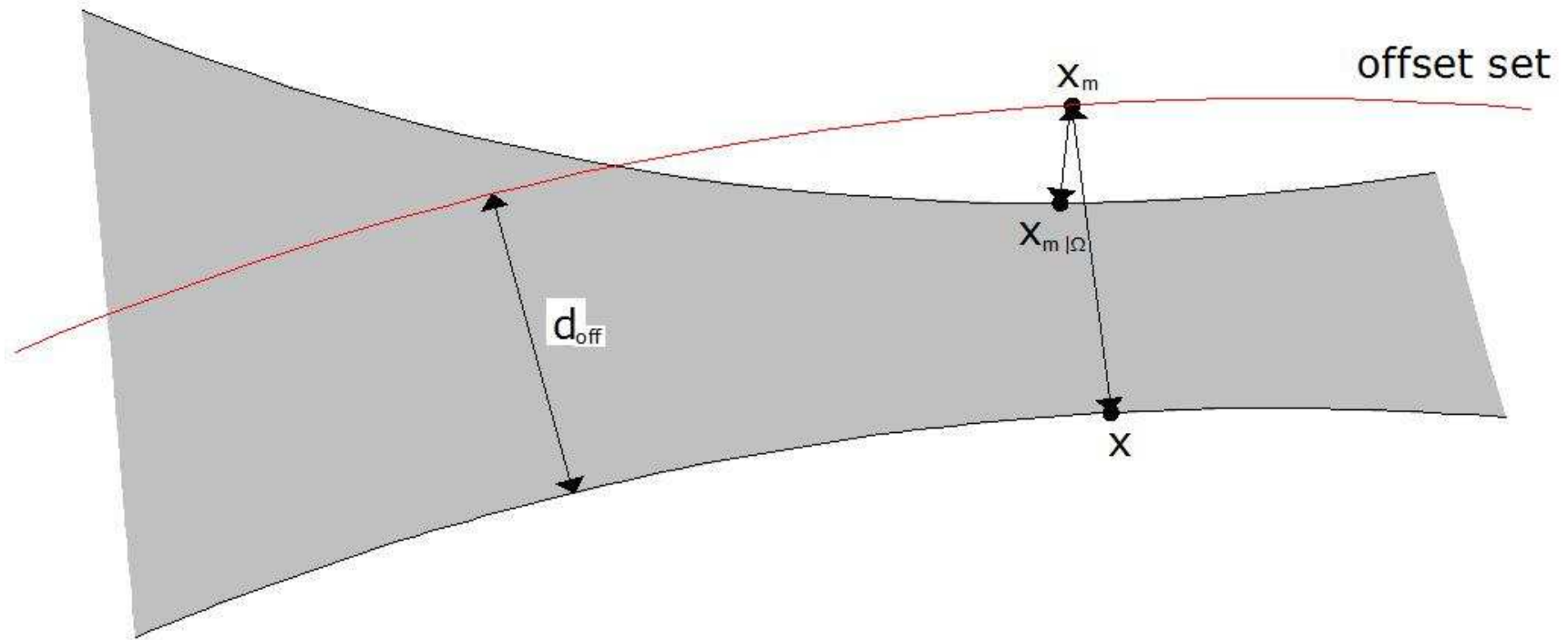
Minimum thickness

Let  $d_{\min}$  be the minimum allowed thickness. The constraint reads:

$$d_{\Omega}(x - d_{\text{off}}n(x)) \leq 0 \quad \forall x \in \partial\Omega, \quad \forall d_{\text{off}} \in [0, d_{\min}]$$

**Remark:** similar constraints for the thickness of holes.

## Offset sets



For **minimum thickness** we rely on the classical notion of **offset sets** of the boundary of a shape, defined by

$$\{x - d_{\text{off}}n(x) \quad \text{such that } x \in \partial\Omega\}$$

## Caution with minimum thickness !

Writing a constraint for a single (large) value of  $d_{\text{off}}$  does not work !



This is the reason why all values of  $d_{\text{off}}$  between 0 and  $d_{\text{min}}$  are taken into account.

## Quadratic penalty method

We reformulate the pointwise constraint into a global one denoted by  $P(\Omega)$ .

Maximum thickness

$$P(\Omega) = \int_{\Omega} \left[ (d_{\Omega}(x) + d_{\max}/2)^{-} \right]^2 dx$$

Minimum thickness

$$P(\Omega) = \int_{\partial\Omega} \int_0^{d_{\min}} \left[ (d_{\Omega}(x - d_{\text{off}}n(x)))^{+} \right]^2 dx dd_{\text{off}}$$

where  $f^{+} = \max(f, 0)$  and  $f^{-} = \min(f, 0)$ .

## Formulation of the constrained problem

The typical compliance minimization problem is

$$\inf_{\Omega \subset D} \left\{ J(\Omega) = \int_{\Gamma_N} g \cdot u \, dx \right\},$$

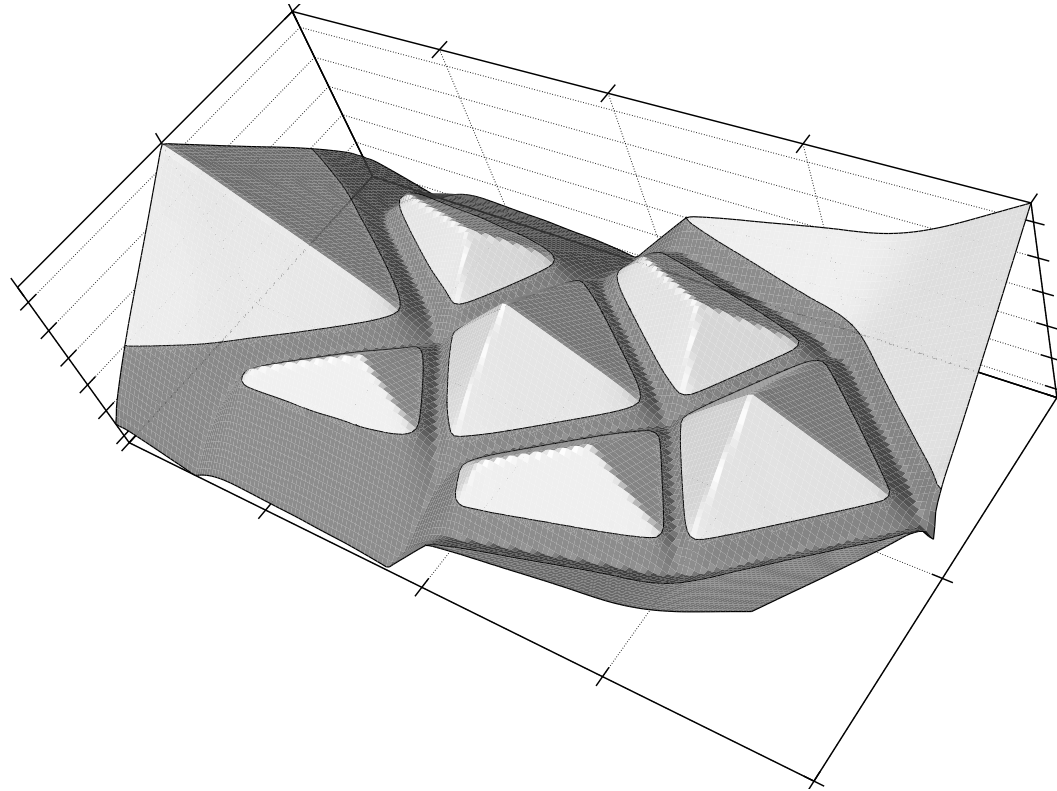
geometrically constrained by

$$\Gamma_D \cup \Gamma_N \subset \partial\Omega, \quad \int_{\Omega} dx = V_0 \quad \text{and} \quad P(\Omega) = 0.$$

To use a gradient-based numerical algorithm, we need to compute the **shape derivative** of the geometrical constraint  $P(\Omega)$ .

It requires the **shape derivative** of the distance function  $d_{\Omega}$ .

## Signed distance function and its skeleton



The signed distance function has a tent-like shape.

Thus its shape derivative is a discontinuous function at the **skeleton**.



## Shape derivative of the signed-distance function

**Lemma.** Fix  $x \in \Omega \setminus \text{Skeleton}$ . Define  $p_{\partial\Omega}(x)$  the unique point on  $\partial\Omega$  such that

$$d(x, \partial\Omega) = \|x - p_{\partial\Omega}(x)\|.$$

Then, the "pointwise" shape derivative is

$$d'_{\Omega}(\theta)(x) = (\theta \cdot n)(p_{\partial\Omega}(x)).$$

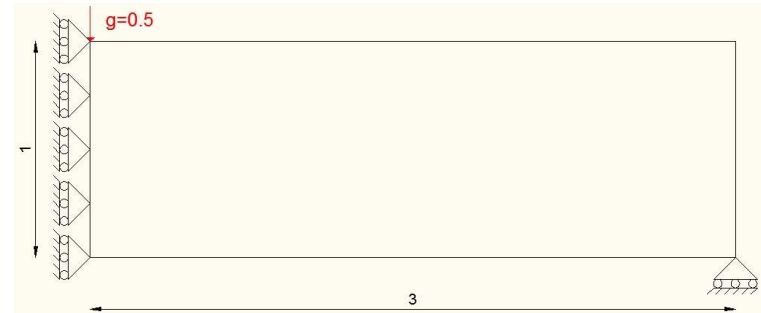
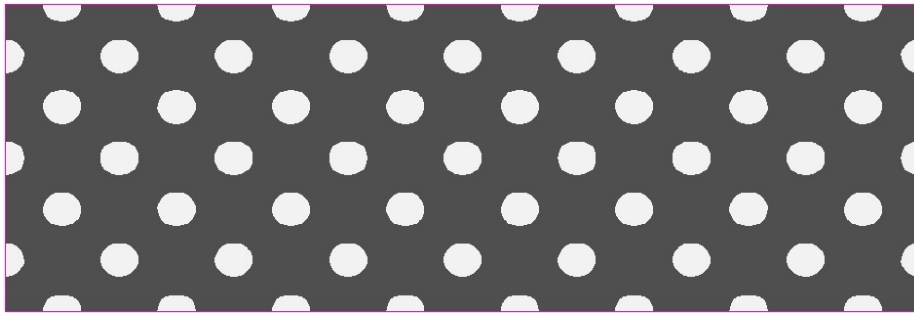
### Remarks.

- The computation of the shape derivative of the signed-distance function is classical (e.g. Delfour and Zolesio).
- By the chain rule lemma we deduce the shape derivative of the geometrical constraint  $P(\Omega)$ . An explicit formula requires a coarea formula.

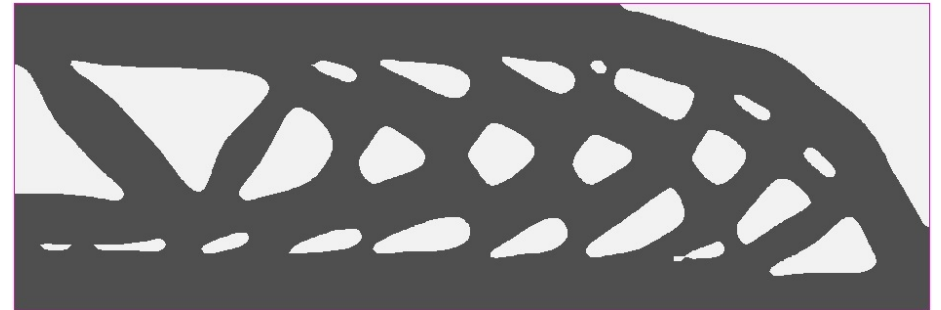
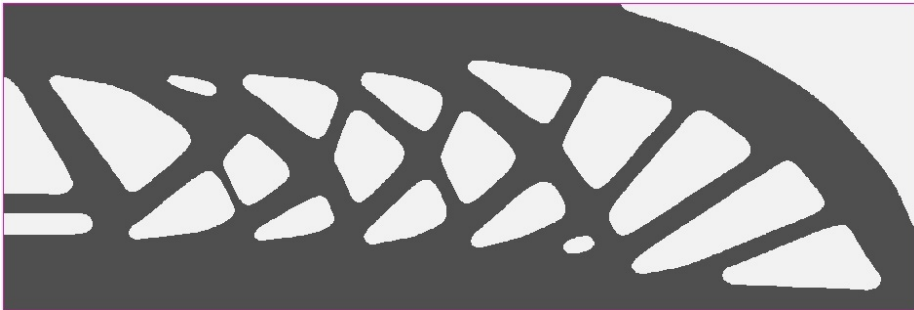
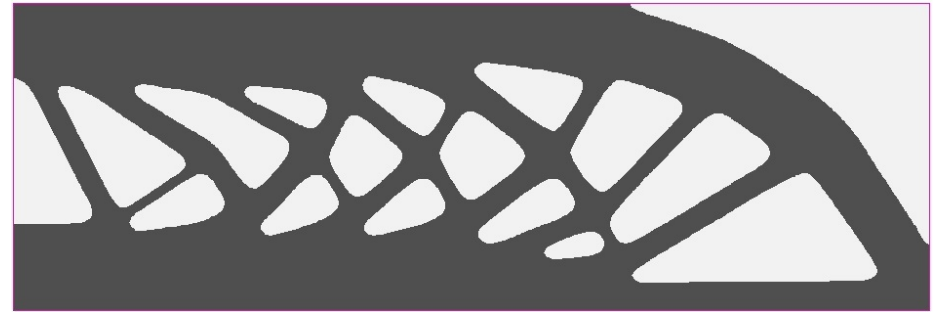
## **-IV- NUMERICAL RESULTS**

- ➡ All the geometrical computations (skeleton, offset, projection, etc.) are standard and very cheap (compared to the elasticity analysis).
- ➡ All our numerical examples are for compliance minimization (except otherwise mentioned).
- ➡ We use an augmented Lagrangian method.
- ➡ At convergence, the geometrical constraints are exactly satisfied.
- ➡ All results have been obtained with our software developed in the finite element code SYSTUS of ESI group.

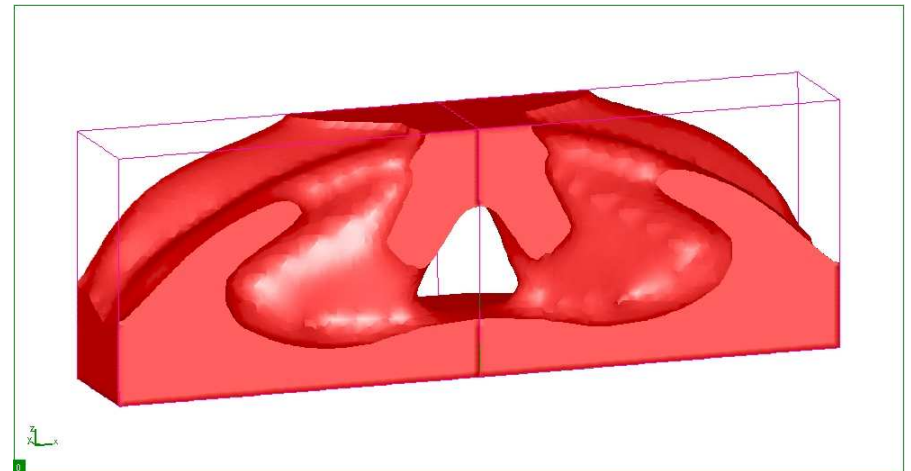
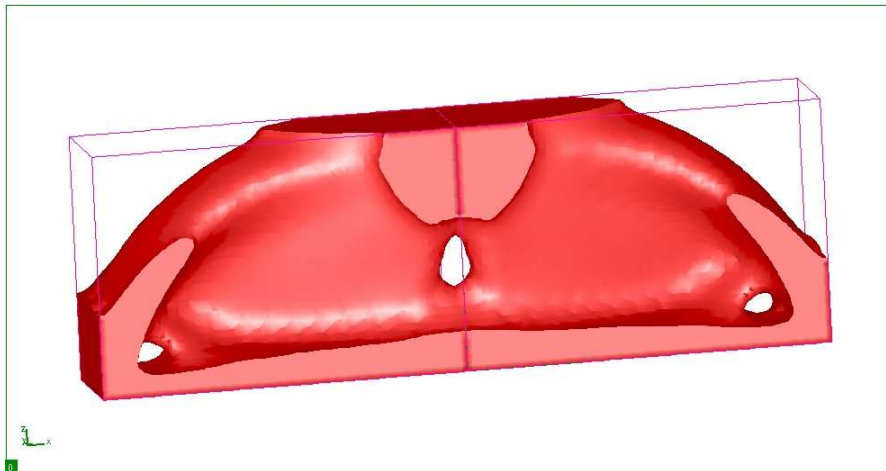
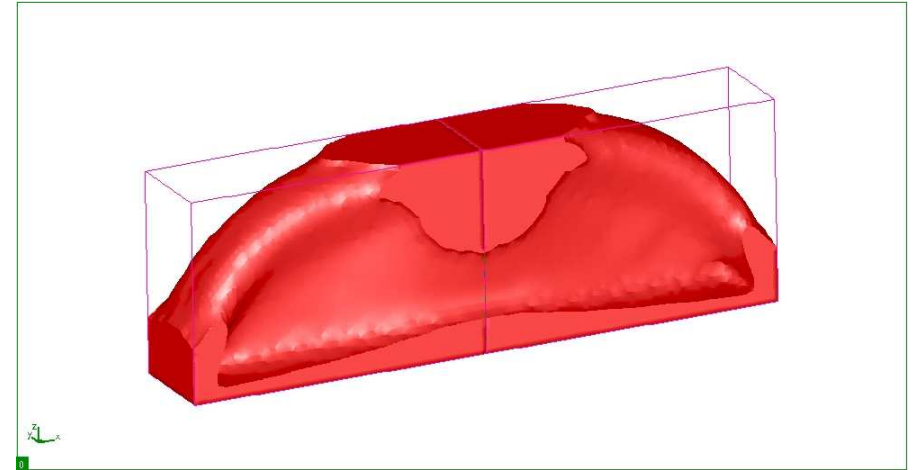
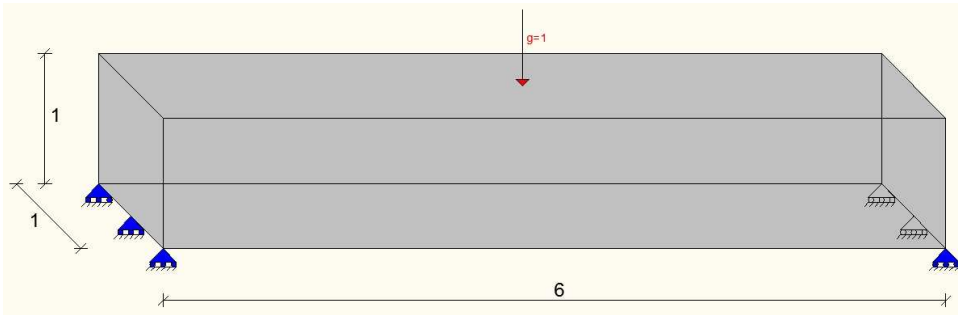
Maximum thickness (MBB, solution without constraint)



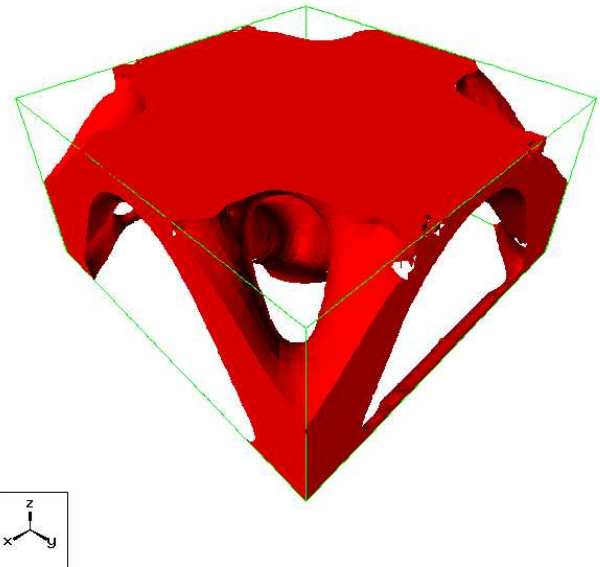
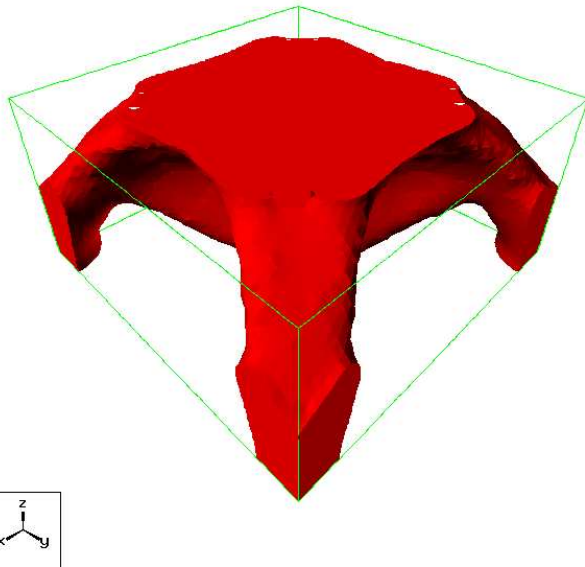
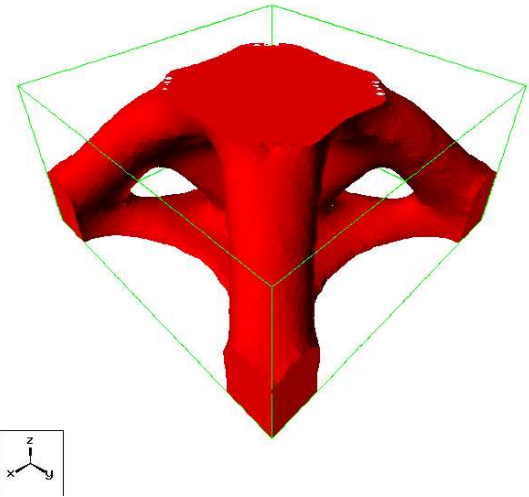
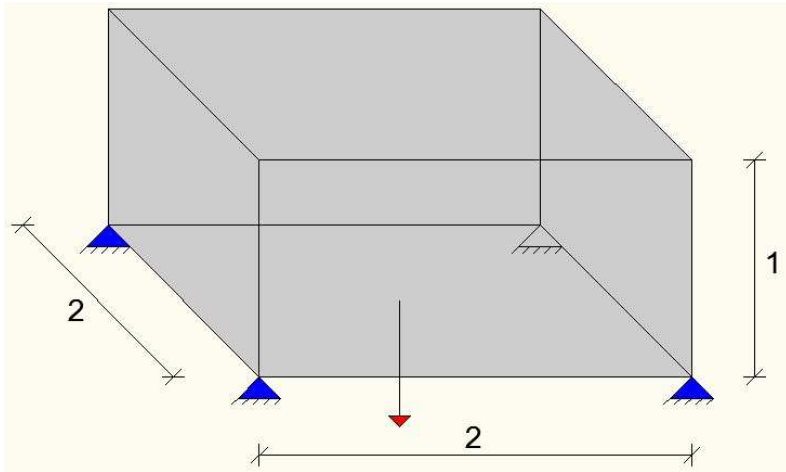
Maximum thickness (solution with increasing constraint)



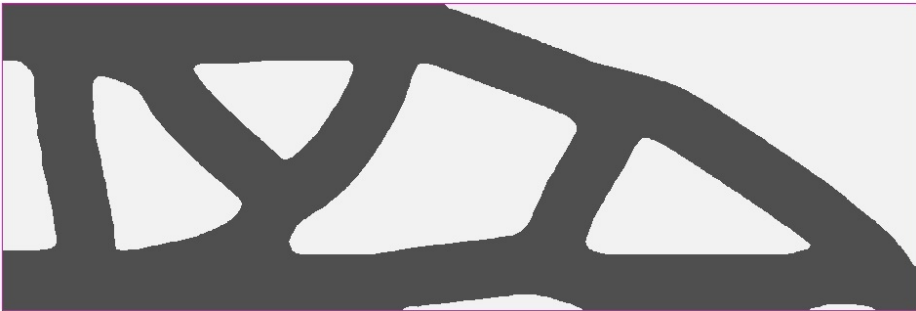
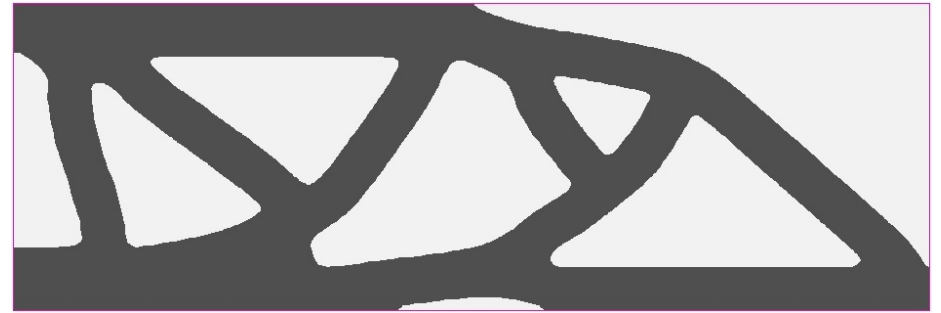
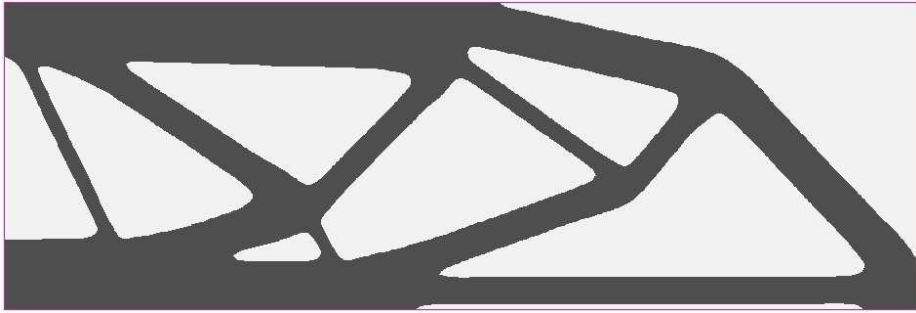
# Maximum thickness (3d MBB beam)



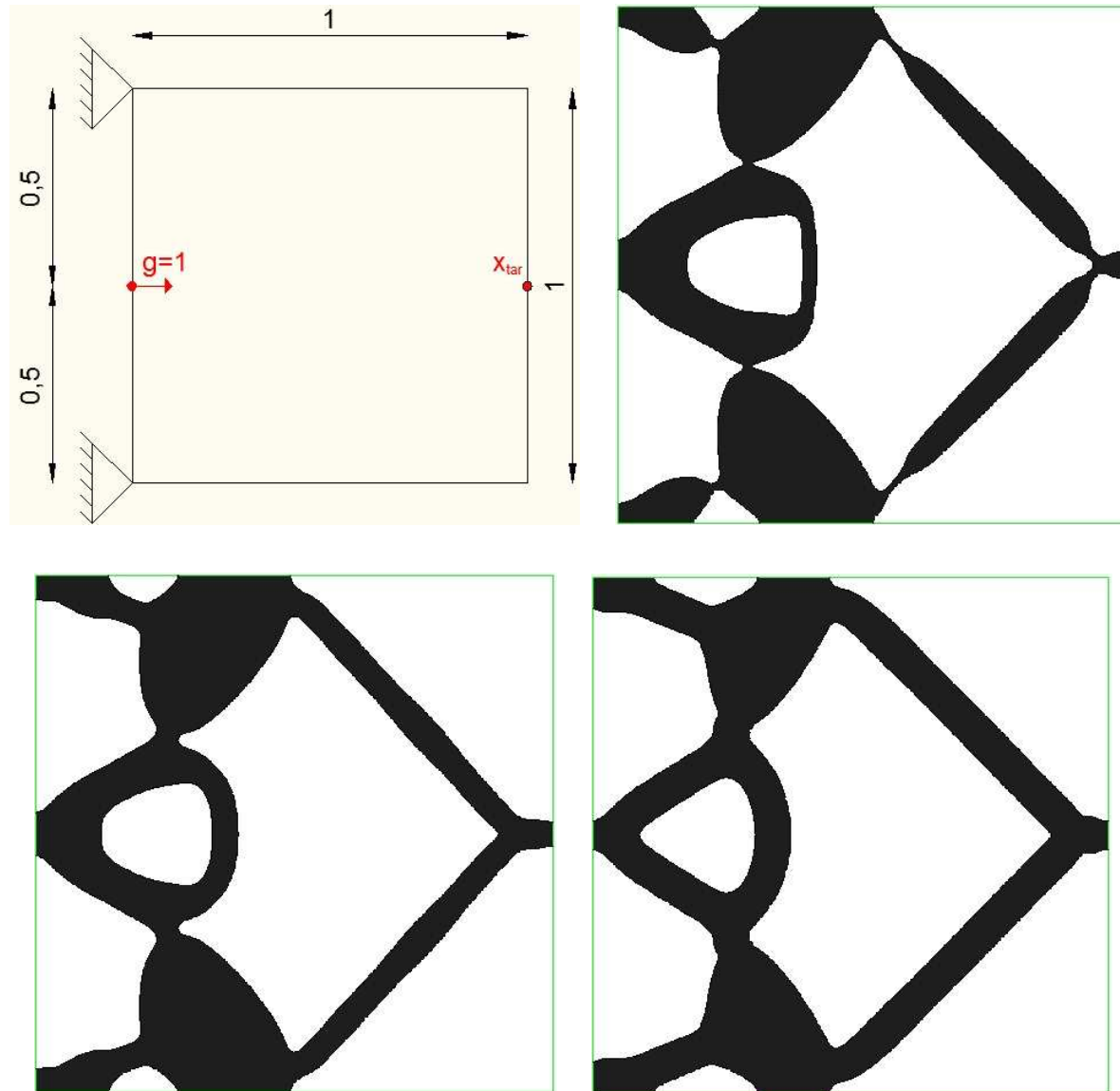
# Maximum thickness (3d Bo $\nu$ )



Minimum thickness (MBB beam)

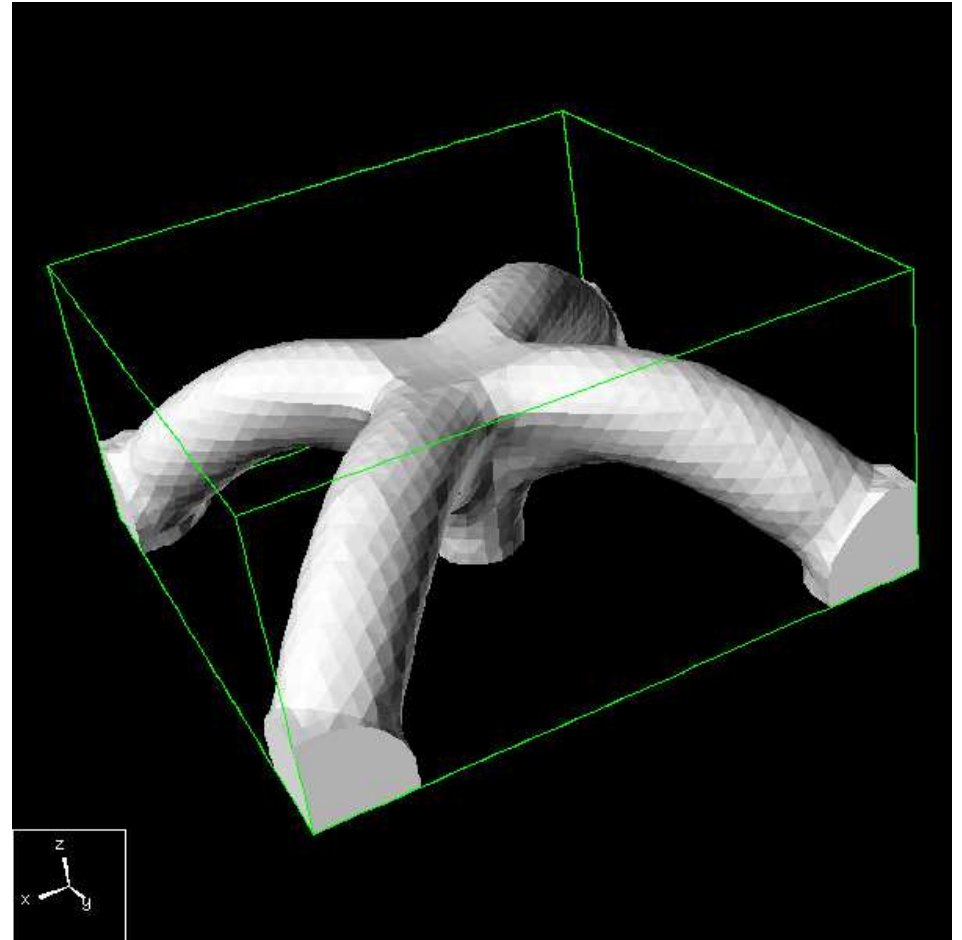
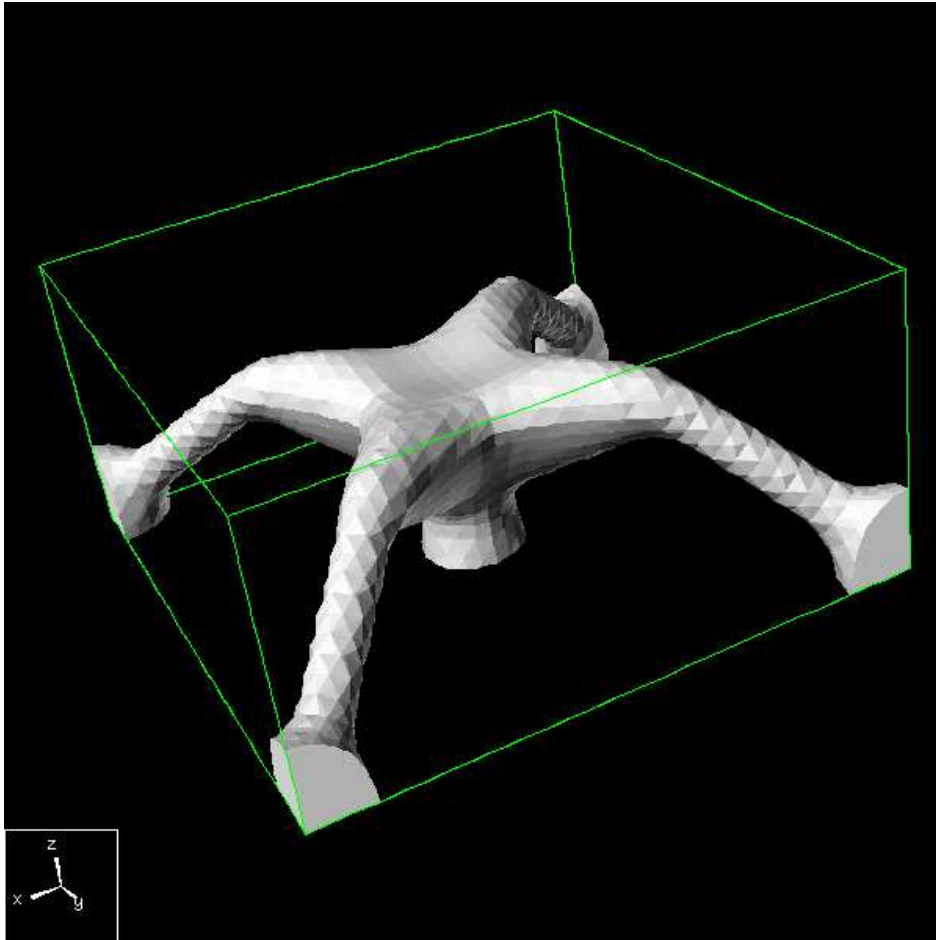


# Minimum thickness (force inverter)



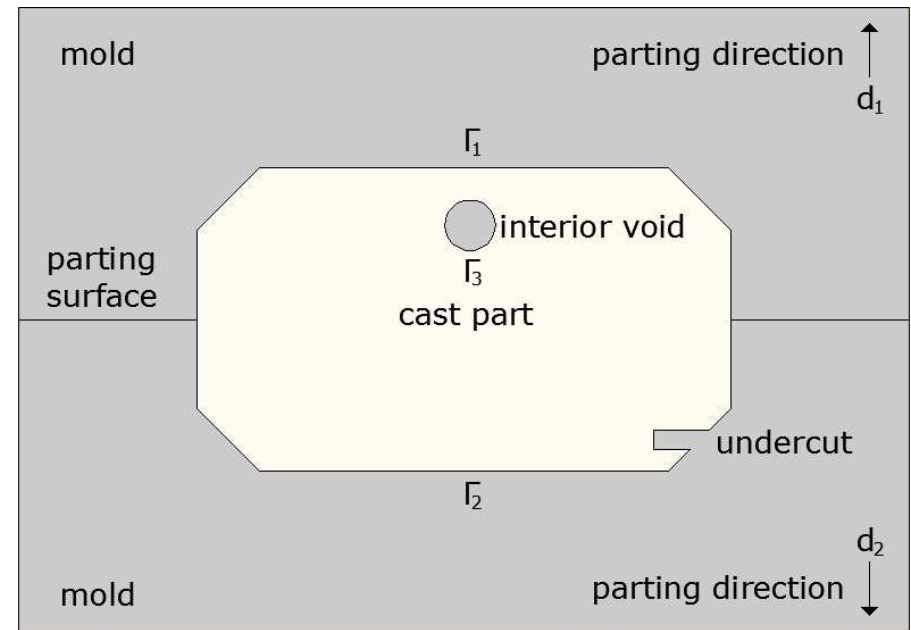
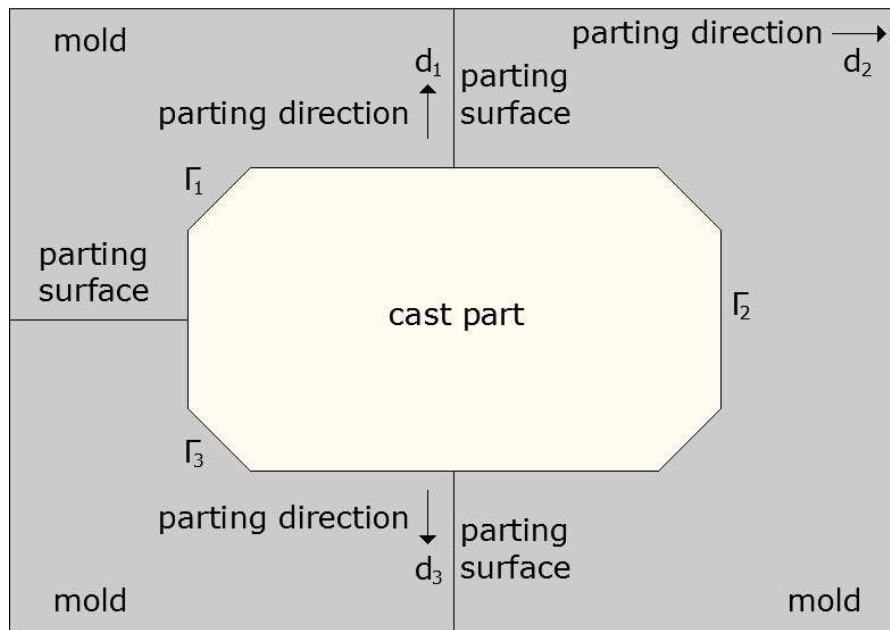


## Minimum thickness (3d)



## -V- MOLDING CONSTRAINTS

Parting surfaces  $\Gamma_i$  and draw directions  $d_i$ : castable (left), not castable (right).



Moldability condition:  $d_i \cdot n(x) \geq 0, \quad \forall x \in \Gamma_i.$

## Sufficient conditions for molding

Starting from a **castable** initial design:

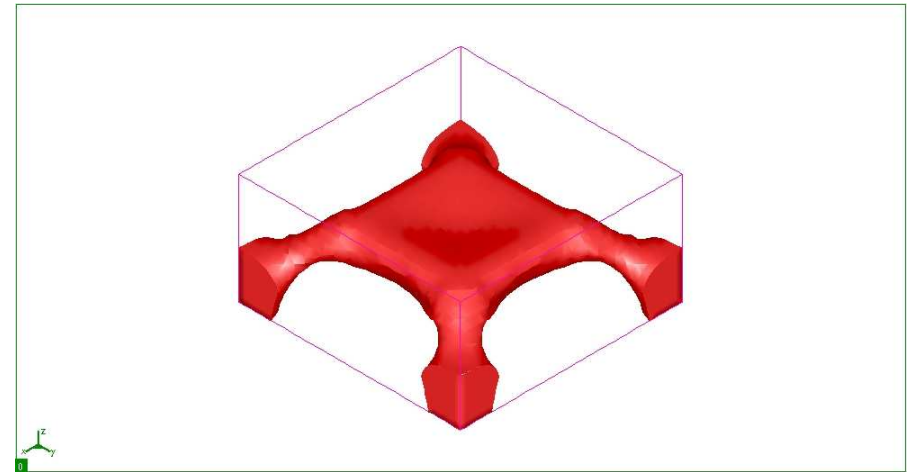
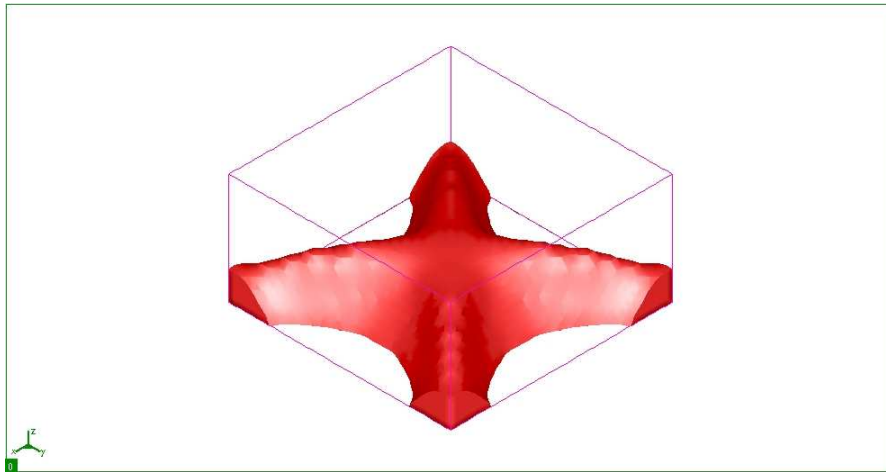
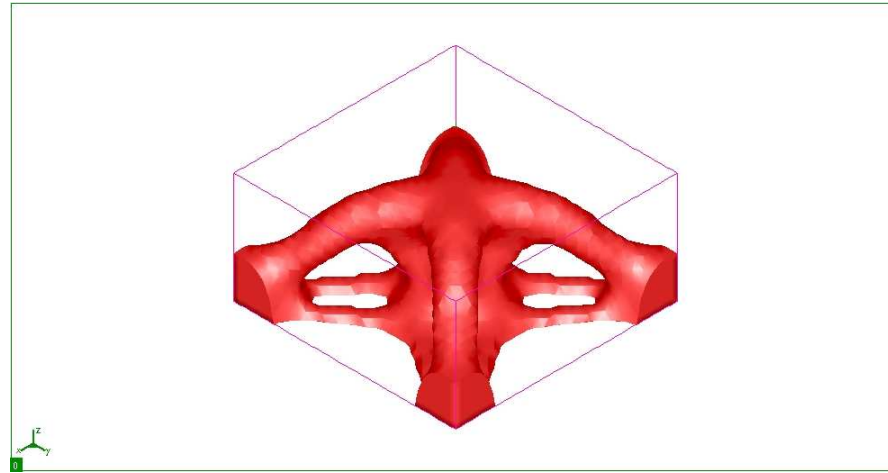
Xia et al. (SMO 2010) proposed to project the velocity

$$\theta_i(x) = \lambda(x)d_i, \quad \forall x \in \Gamma_i.$$

Starting from a **non-castable** initial design:

we suggest the constraint

$$d_\Omega(x + \xi d_i) \geq 0 \quad \forall x \in \Gamma_i, \quad \forall \xi \in [0, \text{dist}(x, \partial D)].$$



No constraint (top), vertical draw direction (bottom).

Parting surface fixed at bottom (left) and free (right).

## Conclusion

- ➡ Work still going on.
- ➡ Other penalizations of the geometrical constraints.
- ➡ Should we apply the constraints from the start or near the end ?
- ➡ What if we want to stay feasible at each iteration ?
- ➡ Handling several constraints simultaneously.
- ➡ Better optimization algorithm: sequential linear programming with trust region.