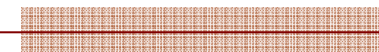


***Sensitivity in shape optimization of  
complex 3D geometries using levels-  
sets and non-conforming finite  
elements***

P. Duysinx and L. Van Miegroet  
LTAS - Automotive Engineering  
Aerospace and Mechanics Department  
University of Liège

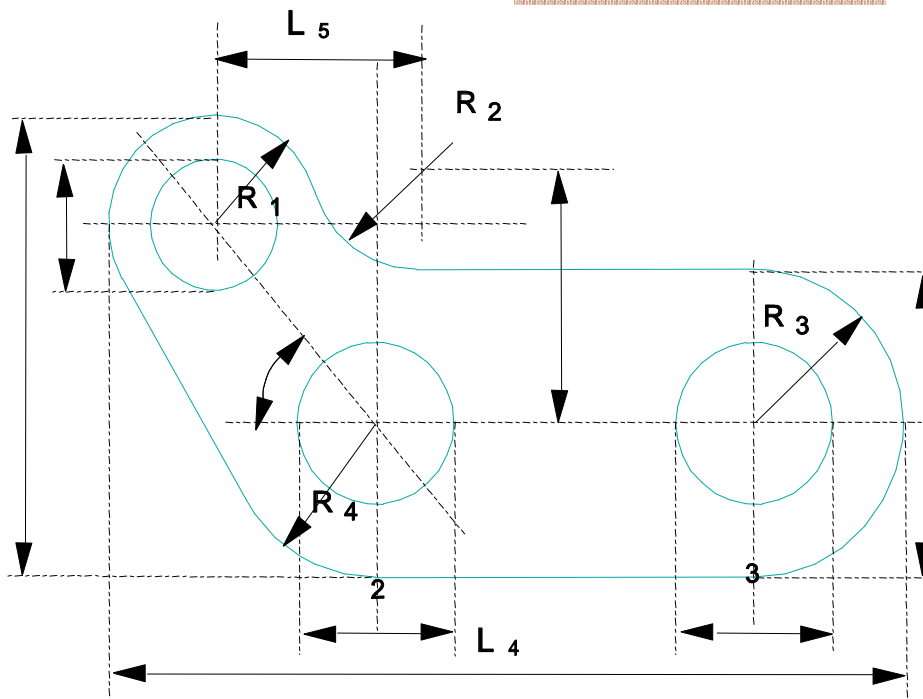


# OUTLINE

- Introduction & Motivation
- Problem Formulation
- Sensitivity Analysis
- Geometrical modeling:
  - Constructive geometry using parametric level sets
- Numerical applications
  - Plate with a hole
  - Fillet
- Conclusion & Perspectives

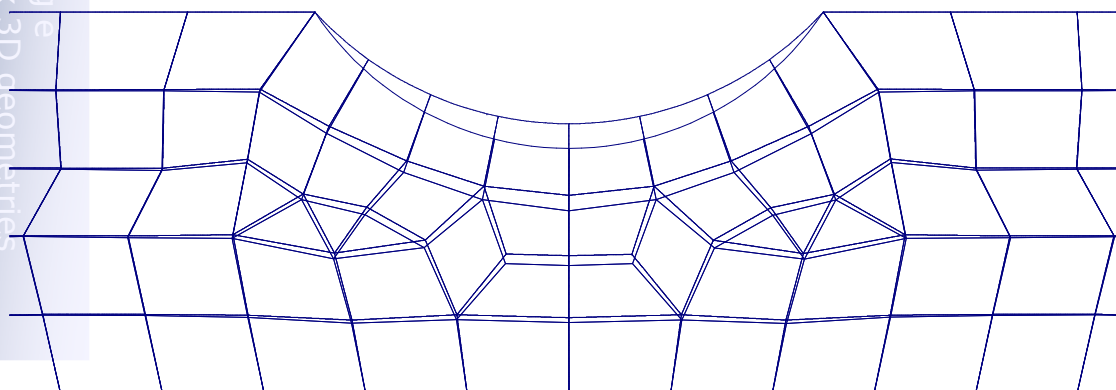
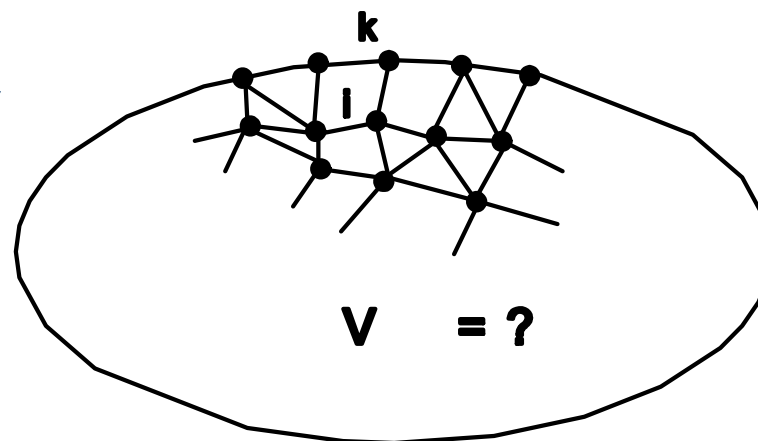
# INTRODUCTION: Shape optimization

- Modification of boundaries of CAD model
- Design variables = CAD model parameters
- Restricted number of design variables
- Regular design including many geometrical constraints
- Key issue: Velocity field
- Mesh management problems
  - Mesh modification / mesh distortion
  - Error control



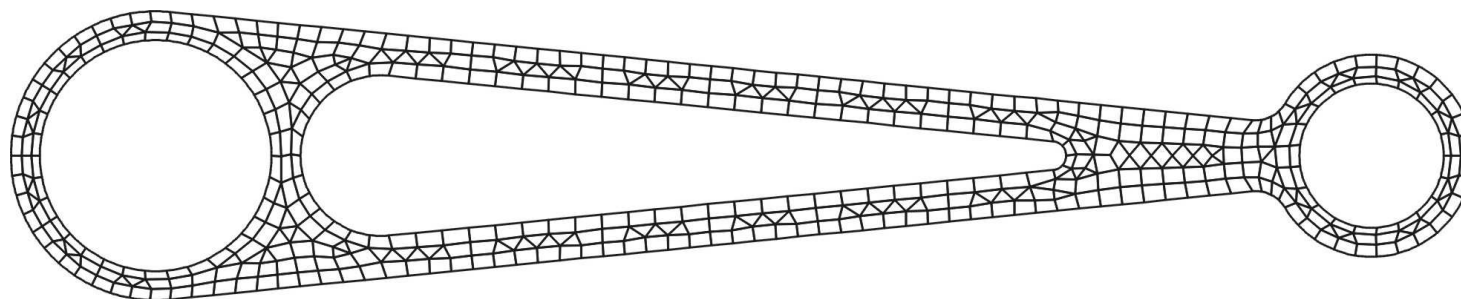
# INTRODUCTION: Shape optimization

- Key issue: Velocity field
- Practical calculation of velocity field
  - Boundary velocity field: CAD model
  - Inner field:
    - Velocity law

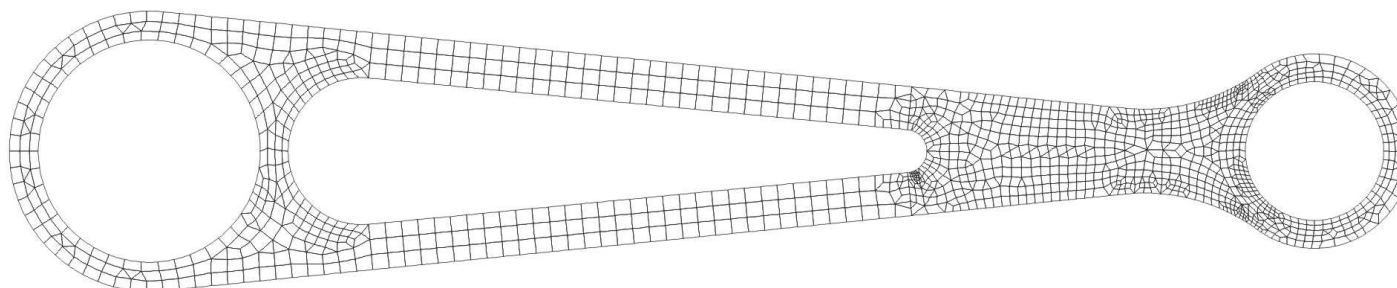


- Inner field:
  - Transfinite mapping
  - Natural / mechanical approach
  - Laplacian smoothing
  - Relocation schemes

# INTRODUCTION: Shape optimization



Without error control



With error control

- Mesh management problems
  - Mesh modification / mesh distortion
  - Error control

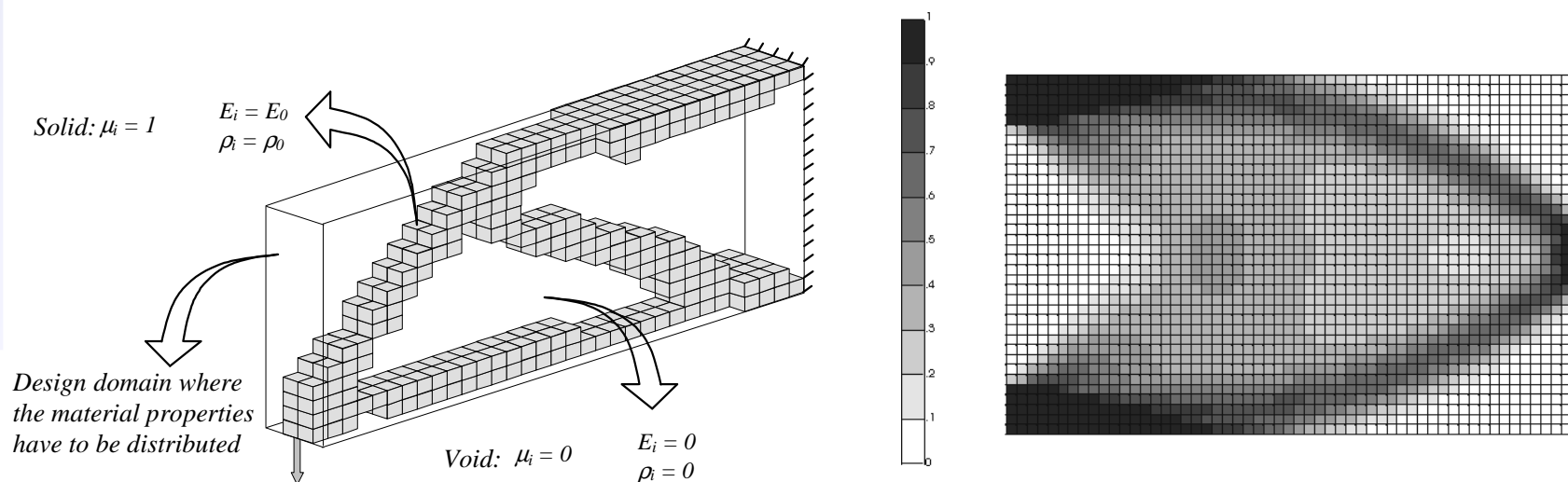
# INTRODUCTION: Topology optimization

## ■ TOPOLOGY OPTIMIZATION (Bendsøe & Kikuchi, 1988)

- Formulated as an optimal material distribution
- Optimal topology without any a priori
- Fixed mesh
- Design variables = Local density parameters
- Homogenization law for continuous interpolation of effective properties (e.g. SIMP / power law)
 

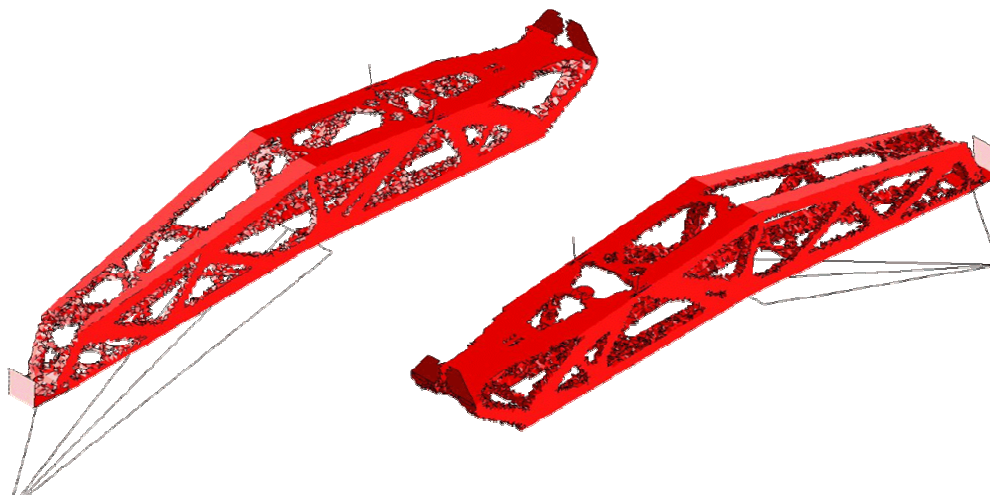
$$E = \mu^3 E_0$$

$$\rho = \mu \rho_0$$



# INTRODUCTION: Topology optimization

- TOPOLOGY OPTIMIZATION (Bendsøe & Kikuchi, 1988)
  - Simple design problem:
    - Minimum compliance s.t. volume constraint
    - Local constraints are difficult to handle
    - Geometrical constraints (often manufacturing constraints) are difficult to define and to control
  - Preliminary design: interpretation phase necessary to come to a CAD model
  - Great industrial applications



With courtesy by Samtech  
and Airbus Industries



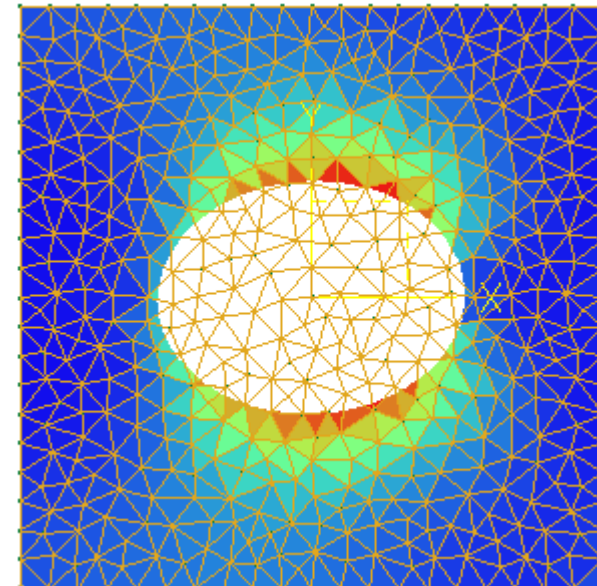
# INTRODUCTION: Level Set and XFEM

- LEVEL SET METHOD
  - Alternative description to parametric description of curves
  
- EXTENDED FINITE ELEMENT METHOD (XFEM)
  - Alternative to remeshing methods
  - Alternative to homogenization: void is void!
  
- XFEM + LEVEL SET METHODS
  - Efficient treatment of problem involving discontinuities and propagations
  - First applications to crack problems. Moës et al. (1999)
  - Early applications to topology optimisation Belytschko et al. (2003), Wang et al. (2003), Allaire et al. (2004)

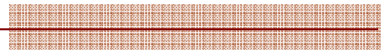


# INTRODUCTION: Level Set and XFEM

- XFEM + Level Set methods = **alternative (intermediate) approach to shape and topology optimisation**
- Level Set
  - Constructive geometry using parametric level sets
- XFEM
  - Void / solid approach
- Problem formulation:
  - Global and local constraints
  - Limited number of design variables
- Sensitivity analysis
  - Material derivative approach
  - FE implementation



# GEOMETRICAL DESCRIPTION USING LEVEL SETS



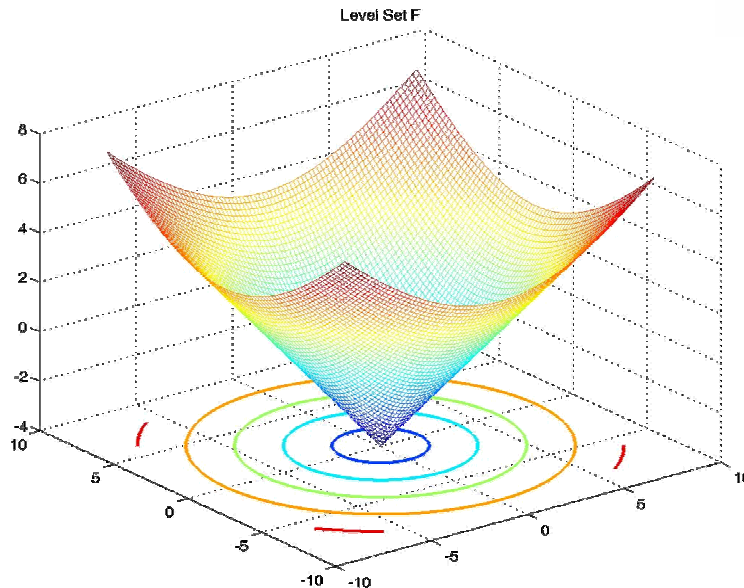
- Principle (Sethian, 1999)
  - Implicit representation by using a higher dimension surface

$$\Phi(\mathbf{x}) = 0$$

$\Phi(\mathbf{x}, s) < 0$  if material

$\Phi(\mathbf{x}, s) > 0$  if void

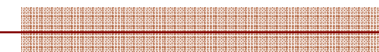
$\Phi(\mathbf{x}, s) = 0$  on boundary



- Possible practical implementation:  
Approximated on a fixed mesh by the signed distance function to curve  $\Gamma$ :

$$\Phi(\mathbf{x}) = \pm \min_{\mathbf{x}_\Gamma \in \Gamma} \|\mathbf{x} - \mathbf{x}_\Gamma\|$$

# THE LEVEL SET METHOD

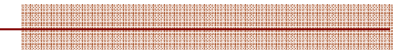


- In XFEM framework,
  - Each node has a Level Set dof
  - Interpolation using classical shape functions

$$\Phi(x, s) = \sum_{i=1}^n N_i(\mathbf{x}) \Phi_i$$

- Material assigned to a part of the Level Set (positive or negative)

# GEOMETRICAL DESCRIPTION USING LEVEL SETS

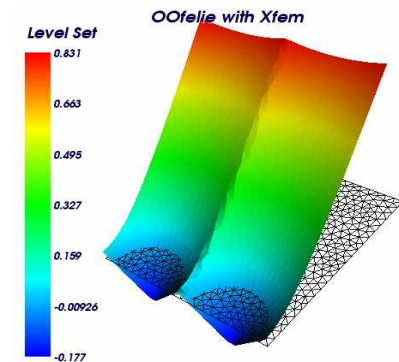


- Constructive geometry approach
  - Elaborate complex geometries using Level Sets:
    - Primitive shapes with dimension parameters

$$\Phi = \Phi(\mathbf{x}, s)$$

- Linear combinations of basic functions

$$\Phi(x, s) = \sum_{i=1}^n s_i \chi_i(\mathbf{x})$$

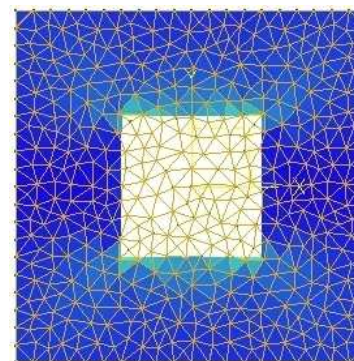
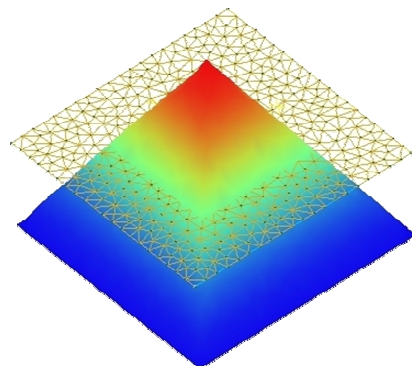


- Library of graphic primitives and features
  - Lines, circles, ellipses, rectangles, triangles
  - NURBS

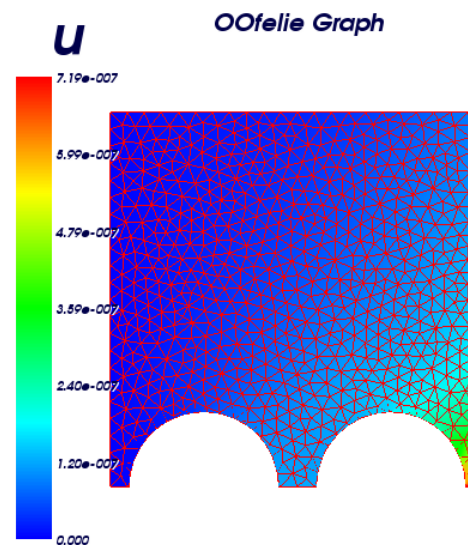
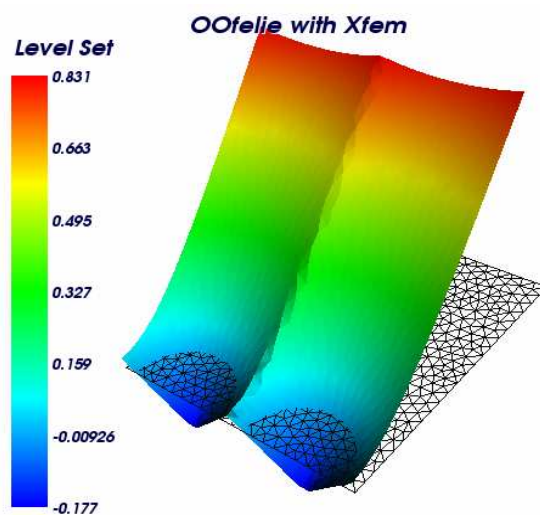
- Combine the basic levels sets using logic and Boolean operations

# GEOMETRICAL DESCRIPTION USING LEVEL SETS

- Level Set of a square hole

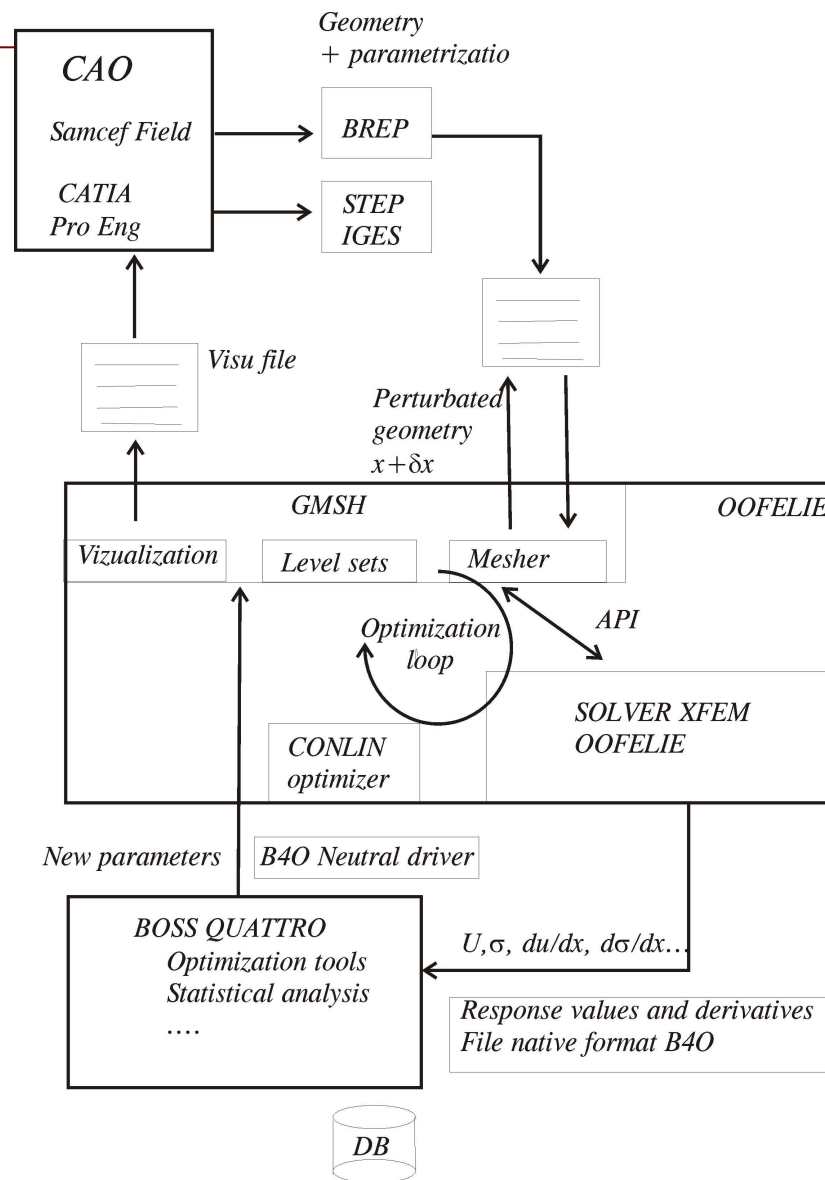


- Combination of two holes



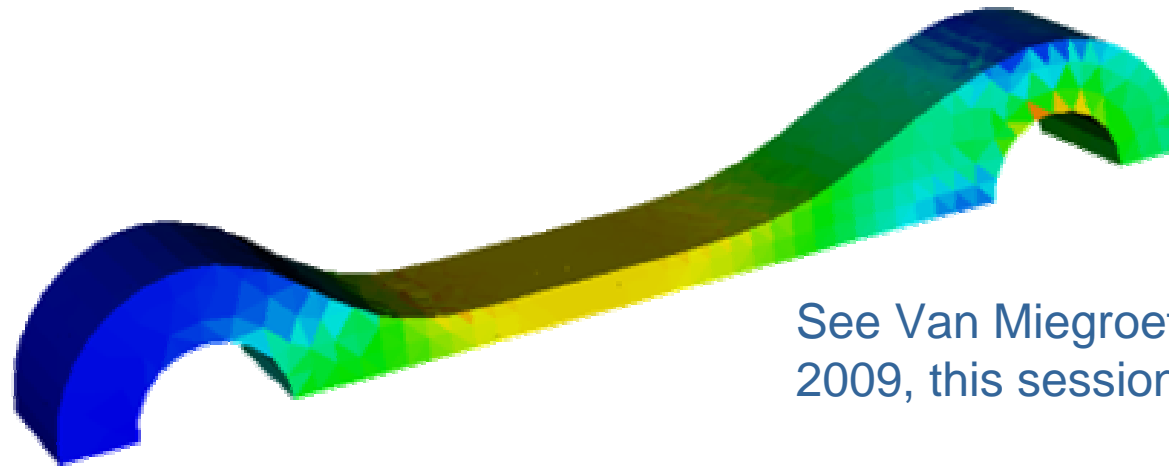
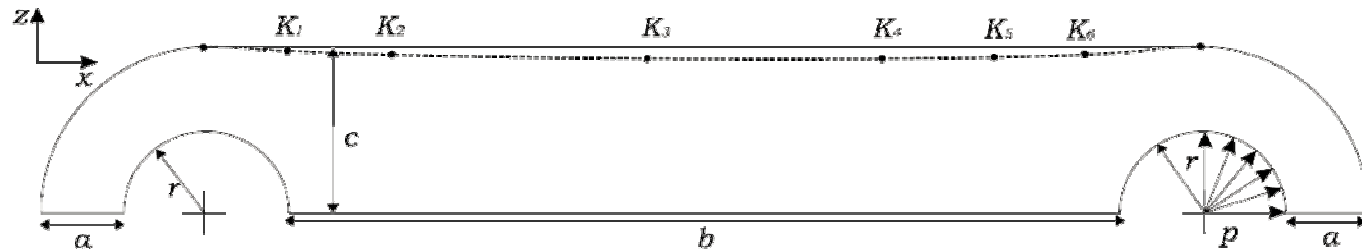
# GEOMETRICAL DESCRIPTION USING LEVEL SETS

- Under development EFCONIVO project sponsored by Walloon Region of Belgium:
  - Level Set geometrical modeling (GMSH)
  - Meshing (GMSH)
  - XFEM (OOFELIE) and non conforming numerical methods
  - Optimization (Boss Quattro)





# GEOMETRICAL DESCRIPTION USING LEVEL SETS (Van Miegroet et al., 2007)



See Van Miegroet (XFEM 2009, this session )

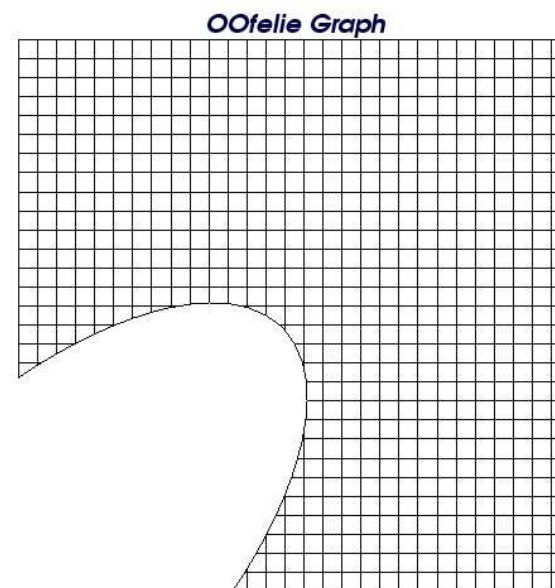
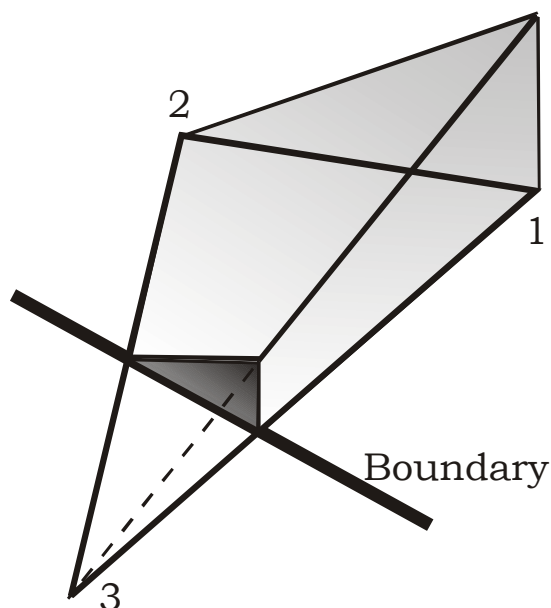
- External boundary : 3D Level Set surface defined by a Nurbs curve
- Parameters :  $K_i$  control points
- Design variable: position of control nodes in  $z$  direction



# EXTENDED FINITE ELEMENT METHOD

- Modelling void-solid boundaries using XFEM
  - No grey or artificial material
  - Using non conforming fixed mesh: avoid remeshing, mesh deformation, etc.

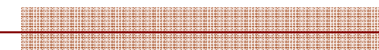
$$u = \sum_{i \in I} N_i(x) V(x) u_i \quad V(x) = \begin{cases} 1 & \text{if node} \in \text{solid} \\ 0 & \text{if node} \in \text{void} \end{cases}$$



# PROBLEM FORMULATION

- Design Problem
  - Find the best shape to minimize a given objective functions while satisfying design constraints
  
- Design variables:
  - Parameters of Level Sets
  
- Objective and constraints
  - Mechanical responses: global (compliance) or local (displacement, stress), eigenfrequencies
  - Geometrical characteristics: volume, distance
  
- Problem formulation similar to shape optimization but simplified thanks to XFEM and Level Set!

# PROBLEM FORMULATION



- Design problem is cast into a mathematical programming problem

$$\begin{array}{ll}
 \min & g_0(\mathbf{x}) \\
 \mathbf{x} & \\
 \text{s.t.:} & g_j(\mathbf{x}) \leq \bar{g}_j \quad j = 1 \dots m \\
 & \underline{x}_i \leq x_i \leq \bar{x}_i \quad i = 1 \dots n
 \end{array}$$

- Take benefit of the available efficient solvers :
  - CONLIN (Fleury, 1989); MMA (Svanberg, 1987)
  - Solution of large scale problems:
    - 100.000 design variables (topology)
    - 5.000 constraints (shape)
    - 5.000 constraints and 5.000 design variables (composite)
- Requires sensitivity (derivatives) of functions

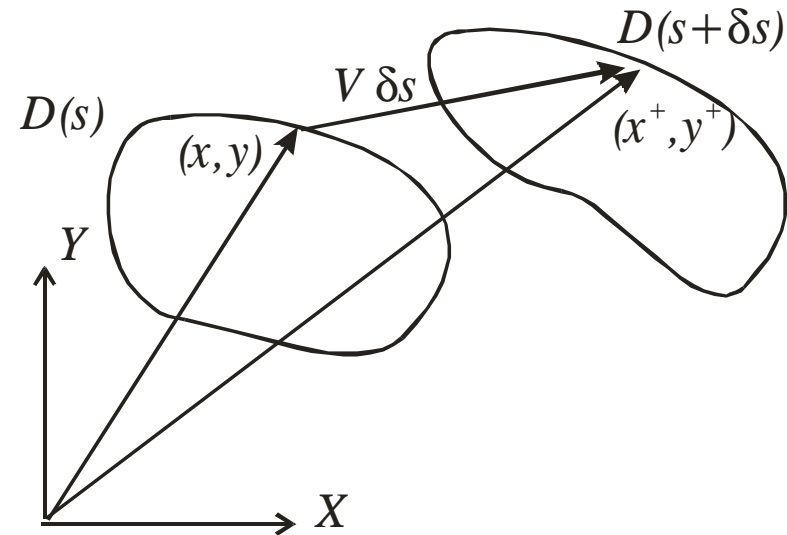
# SENSITIVITY ANALYSIS

- Position of a point after a perturbation of the design variable  $s_i$

$$x_i^+ = x_i + s V_i(x_i)$$

With the **velocity field**  $V$ ,  
 i.e. the first order derivative  
 of position field  $x$ :

$$V_i = \frac{\partial x_i}{\partial s}$$



- Material derivative of the displacement  $u$  in a given point:

$$\frac{Du(x)}{Ds} = \lim_{s \rightarrow 0} \frac{\tilde{u}_j(x) - u_j(x)}{s}$$

$$\frac{Du(x)}{Ds} = \frac{\partial u}{\partial s} + V_i \partial_i u_j$$

## SENSITIVITY ANALYSIS

- The sensitivity of integral function

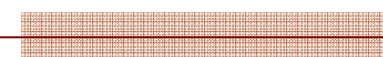
$$F = \int_{\Omega} f(\mathbf{x}) H(\Phi) d\Omega$$

- is

$$\begin{aligned} \frac{DF}{Ds} &= \int_{\Omega} \left[ \frac{\partial f}{\partial s} + \nabla f \cdot \mathbf{V} \right] H(\Phi) d\Omega \\ &\quad + \int_{\Omega} f(x) [\delta(\Phi) \nabla \Phi \cdot \mathbf{V} + H(\Phi) \operatorname{div}(\mathbf{V})] d\Omega \end{aligned}$$

$$\begin{aligned} \frac{DF}{Ds} &= \int_{\Omega} \frac{Df}{Ds} H(\Phi) d\Omega + \int_{\Omega} f(x) \operatorname{div}(H(\Phi) \mathbf{V}) d\Omega \\ &= \int_{\Omega} \frac{Df}{Ds} H(\Phi) d\Omega + \int_{\partial\Omega} f(x) H(\Phi) \mathbf{V} \cdot \mathbf{n} d\Gamma \end{aligned}$$

# SENSITIVITY ANALYSIS



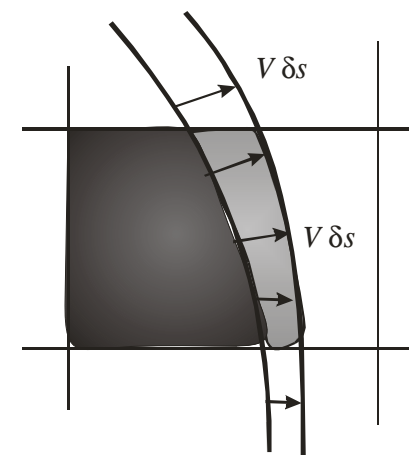
## ■ Proof

$$\frac{DF}{Ds} = \lim_{\delta s \rightarrow 0} \frac{1}{\delta s} \left\{ \int_{\Omega^{s+\delta s}} f^{s+\delta s}(x) H(\Phi^{s+\delta s}) d\Omega^{s+\delta s} - \int_{\Omega} f^s(x) H(\Phi^s) d\Omega^s \right\}$$

$$\begin{aligned} \frac{DF}{Ds} = \lim_{\delta s \rightarrow 0} \frac{1}{\delta s} \int_{\Omega} & \left( f^s(x) + \frac{\partial f}{\partial s} \delta s + \nabla f \cdot \mathbf{V} \delta s \right) \\ & \left( H(\Phi^s) + \delta(\Phi^s) \nabla \Phi \cdot \mathbf{V} \delta s \right) |J| d\Omega \\ & - \int_{\Omega} f^s(x) H(\Phi^s) d\Omega \end{aligned}$$

$$|J| \simeq 1 + \text{div}(\mathbf{V}) \delta s$$

$$\begin{aligned} \frac{DF}{Ds} = \int_{\Omega} & \left[ \frac{\partial f}{\partial s} + \nabla f \cdot \mathbf{V} \right] H(\Phi) d\Omega \\ & + \int_{\Omega} f(x) \left[ \delta(\Phi) \nabla \Phi \cdot \mathbf{V} + H(\Phi) \text{div}(\mathbf{V}) \right] d\Omega \end{aligned}$$



## SENSITIVITY ANALYSIS: DISPLACEMENT FIELD

- The sensitivity of the displacement field comes from the derivative of the state equation (virtual work principle)

$$a(u, v) = l(v) \quad \forall v \in H_1^0(\omega)$$

$$a(u, v) = \int_{\Omega} H_{ijkl} \varepsilon_{ij}(u) \varepsilon_{kl}(v) H(\Phi) d\Omega \quad l(v) = \int_{\Omega} f_i v_i + \text{div}(t_i v_i \mathbf{n}) d\Omega$$

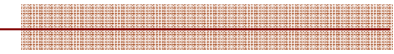
- Applying the previous result gives:

$$\begin{aligned} \frac{D}{Ds} a(u, v) &= \int_{\Omega} H_{ijkl} \frac{\partial \varepsilon_{ij}(u)}{\partial s} \varepsilon_{kl}(v) H(\Phi) d\Omega \\ &\quad + \int_{\Omega} H_{ijkl} \varepsilon_{ij}(u) \varepsilon_{kl}(v) \text{div}(H(\Phi) \mathbf{V}) d\Omega \end{aligned}$$

$$\begin{aligned} \frac{D}{Ds} l(v) &= \int_{\Omega} (f_i v_i + \text{div}(t_i v_i \mathbf{n}) \text{div}(H(\Phi) \mathbf{V})) d\Omega \\ &= \int_{\partial\Omega} \{f_i v_i + \text{div}(t_i v_i \mathbf{n})\} \mathbf{V} \cdot \mathbf{n} d\Gamma \end{aligned}$$



## SENSITIVITY ANALYSIS: DISPLACEMENT FIELD



- F.E. discretization:

$$\mathbf{u}_h = \mathbf{N} \mathbf{q} \qquad \boldsymbol{\varepsilon}(\mathbf{u}_h) = \mathbf{B} \mathbf{q}$$

- The equilibrium

$$\mathbf{K} \mathbf{q} = \mathbf{g}$$

- The stiffness matrix and the load vector

$$\mathbf{K} = \int_{\Omega} \mathbf{B}^T \mathbf{H} \mathbf{B} \, d\Omega$$

$$\mathbf{g} = \int_{\Omega} \mathbf{N}^T \mathbf{f} \, d\Omega$$

## SENSITIVITY ANALYSIS: DISPLACEMENT FIELD

- F.E. discretization of the sensitivity of the virtual work principle

$$\begin{aligned}
 & \delta \mathbf{q}^T \left[ \int_{\Omega} \mathbf{B}^T \mathbf{H} \mathbf{B} d\Omega \right] \frac{\partial \mathbf{q}}{\partial s} + \delta \mathbf{q}^T \left[ \int_{\Omega} \mathbf{B}^T \mathbf{H} \mathbf{B} \operatorname{div}(H(\Phi) \mathbf{V}) d\Omega \right] \mathbf{q} \\
 & = \delta \mathbf{q}^T \left[ \int_{\Omega} \mathbf{N}^T \mathbf{f} \operatorname{div}(H(\Phi) \mathbf{V}) d\Omega \right]
 \end{aligned}$$

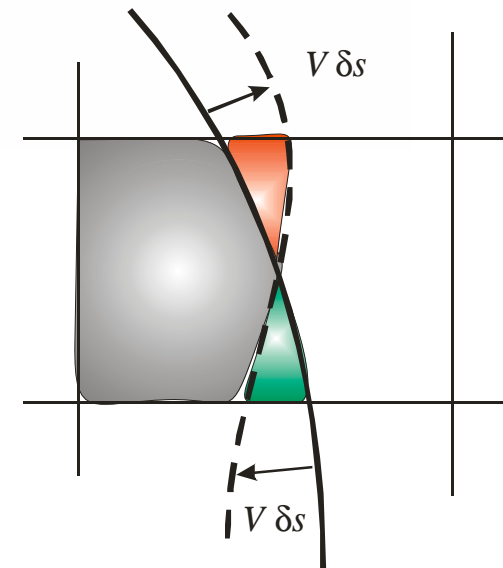
- With

$$\frac{\partial \mathbf{K}}{\partial s} = \int_{\Omega} \mathbf{B}^T \mathbf{H} \mathbf{B} \operatorname{div}(H(\Phi) \mathbf{V}) d\Omega$$

$$\frac{\partial \mathbf{g}}{\partial s} = \int_{\Omega} \mathbf{N}^T \mathbf{f} \operatorname{div}(H(\Phi) \mathbf{V}) d\Omega$$

- Gives the sensitivity of the displacements

$$\mathbf{K} \frac{\partial \mathbf{q}}{\partial s} = \left\{ \frac{\partial \mathbf{g}}{\partial s} - \frac{\partial \mathbf{K}}{\partial s} \mathbf{q} \right\}$$

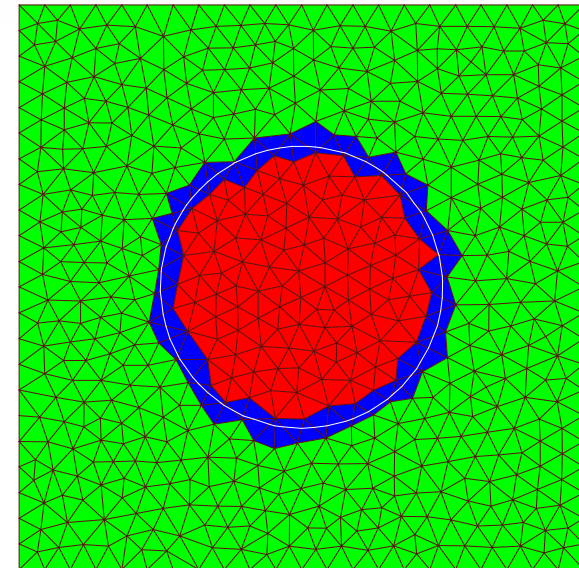


# SENSITIVITY ANALYSIS

- Generally, the sensitivity analysis is carried out using the semi-analytical approach

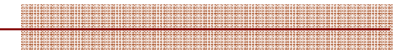
$$\frac{\partial \mathbf{K}}{\partial s} \simeq \frac{\mathbf{K}(s + \delta s) - \mathbf{K}(s)}{\delta s} \qquad \frac{\partial g}{\partial s} \simeq \frac{g(s + \delta s) - g(s)}{\delta s}$$

- The derivatives are non trivial and only evaluated in the boundary layer

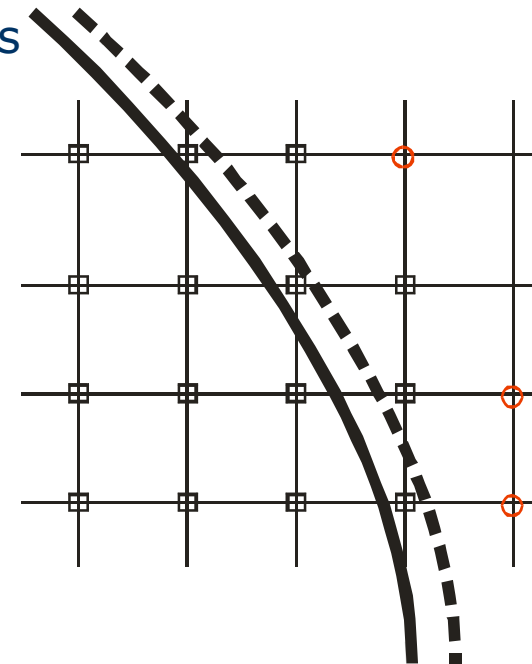


- The approach requires:
  - To **keep the same mesh** and the same FE discretization
  - To **keep the same number of degrees of freedom** including the number of extra dof.

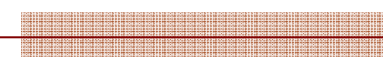
# SENSITIVITY ANALYSIS



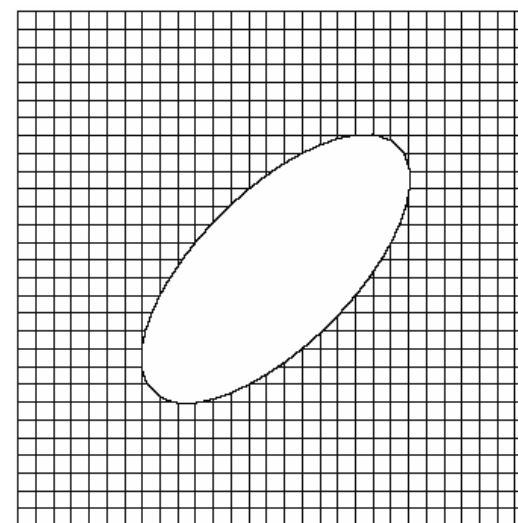
- Strategies to freeze the number of dof
  - What happens if perturbed level sets comes into new FE?
  - Ignore the new elements that become solid or partly solid
    - small errors, but minor contributions
    - practically, no problem observed
    - efficiency and simplicity
    - validated on benchmarks



# SENSITIVITY ANALYSIS – validation



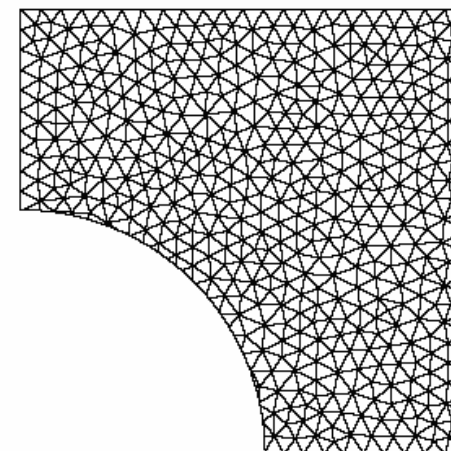
- Validation of semi-analytic sensitivity:
  - Elliptical hole
  - Parameters: major axis  $a$  and Orientation angle  $\theta$  w.r. to horizontal axis
  - Perturbation:  $\delta=10^{-4}$
  - Sensitivity of compliance



<i>Design variables</i>	<i>Finite differences</i>	<i>Semi-analytical approach</i>	<i>Relative error (%)</i>
$a = 0.6$	3698, 0000	3691, 3344	0, 1802
$\theta = \pi/4$	478, 0000	477, 0641	0, 1957
$a = 0.6$	2712, 000	2707, 328	0, 1722
$\theta = \pi/6$	523, 70000	523, 4099	0, 0553
$a = 0.6$	783, 8000	781, 3920	0, 3072
$\theta = 0$	11, 6239	11, 6235	0, 0029

# SENSITIVITY ANALYSIS – validation

OOfelie Graph

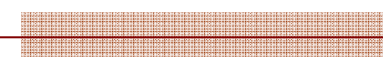


## ■ Validation of semi-analytic sensitivity:

- Elliptical hole
- Parameters: axes  $a$  and  $b$
- Perturbation:  $\delta=10^{-4}$
- Sensitivity of maximum stress

Variable	Finite difference	Semi-analytical	Relative error
$a = 0.41$	-213.2172401	-213.2279160	0.005%
$b = 0.41$	2075.6012932	2074.0930198	0.073%
$a = 0.55$	-51.9288917	-51.888882944695	0.077%
$b = 0.55$	5019.8392594	5003.5389826985	0.32%

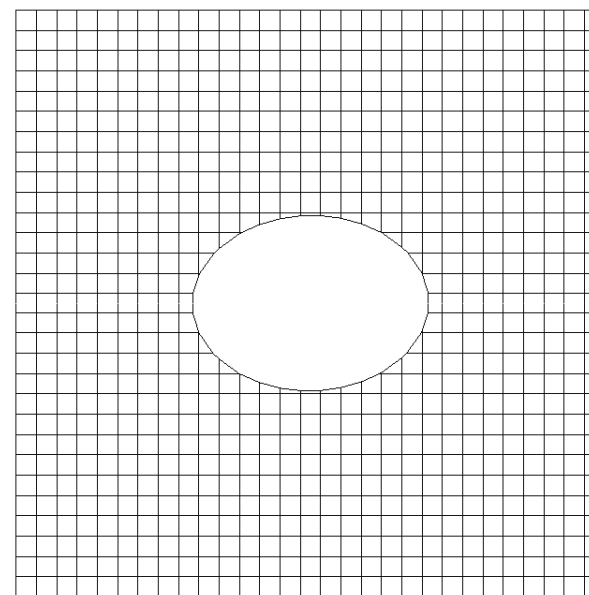
## APPLICATIONS: Elliptical hole



### CLASSICAL PROBLEM OF PLATE WITH A HOLE REVISITED

- Square plate with a hole
- Bidirectional stress field
- $\sigma_x = 2 \sigma_0$       $\sigma_y = \sigma_0$
- $E = 1 \text{ N/m}^2, \nu = 0.3$
  
- Minimize compliance
  - st volume constraint
- Design variables: major axis  $a$  and orientation  $\theta$
  
- Mesh 30 x 30 nodes

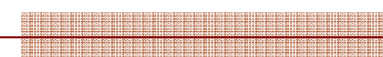
OOfelie Graph



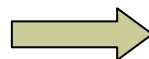
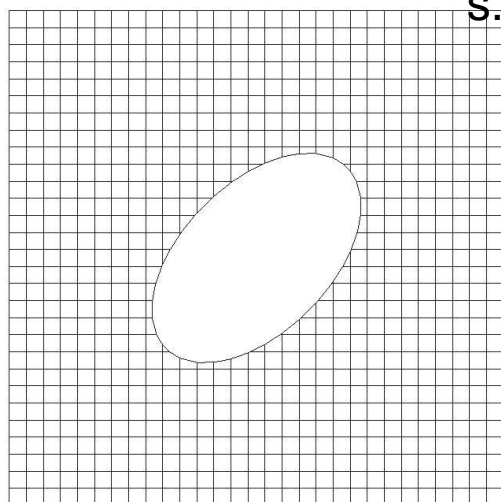
Duysinx et al. 2006



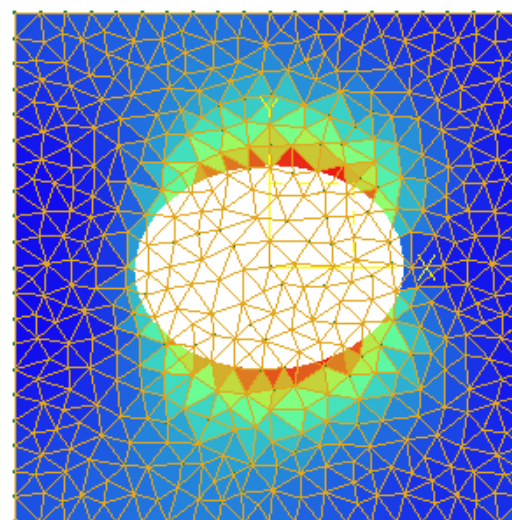
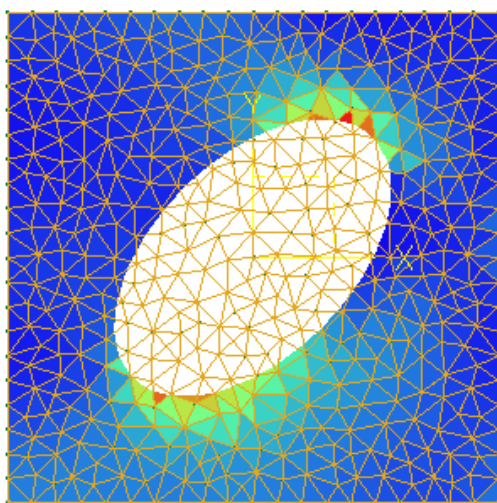
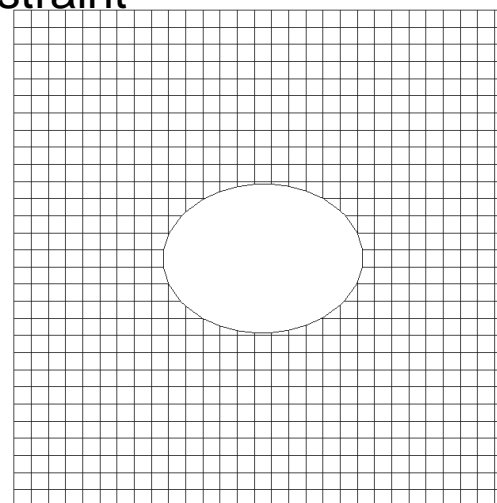
# APPLICATIONS



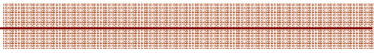
Min Compliance  
s.t. Volume constraint



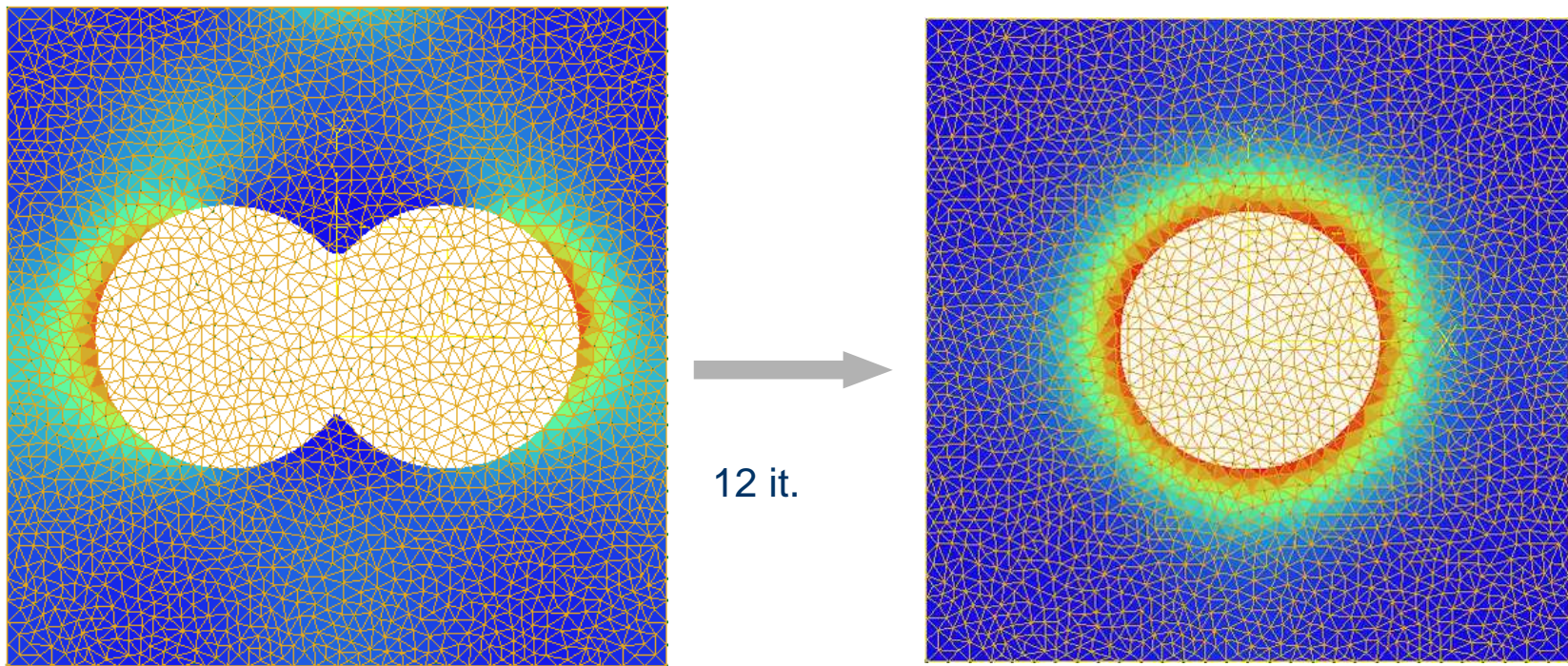
11 it.



# APPLICATIONS



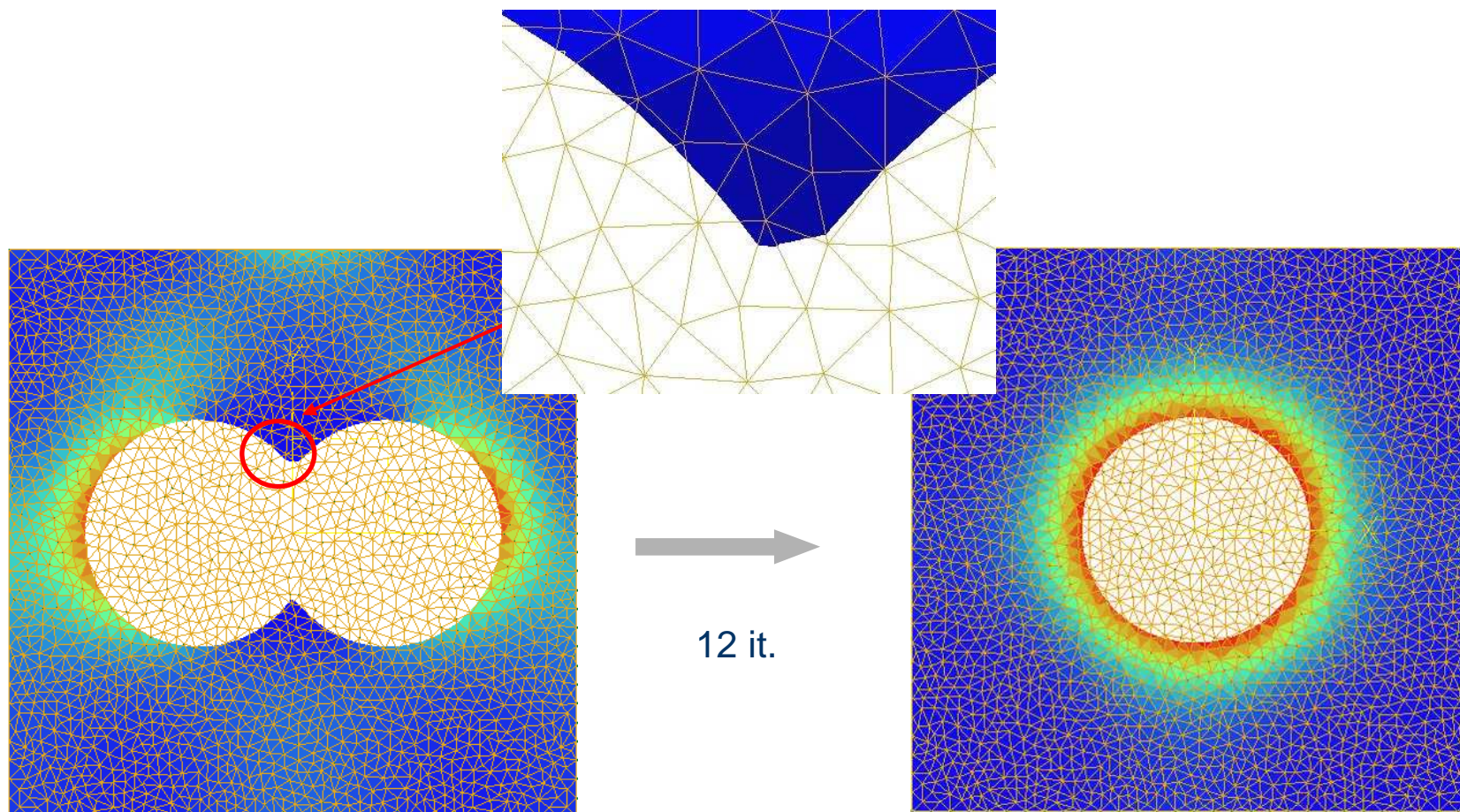
- Topology modification during optimization
  - Two variables : *center*  $x_1$ , *center*  $x_2$
  - Min. potential energy under a surface constraint
  - Uniform Biaxial loading :  $\sigma_x = \sigma_0$ ,  $\sigma_y = \sigma_0$





# APPLICATIONS

- Mesh refinement for the Level Set representation of sharp parts
- Accuracy of stresses

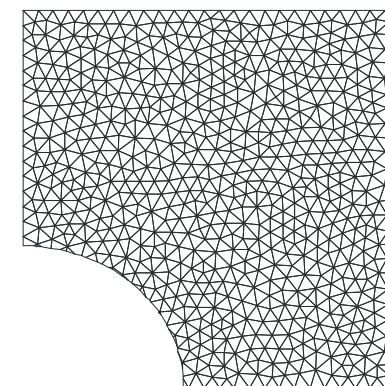
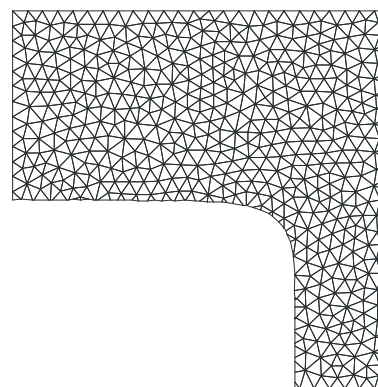
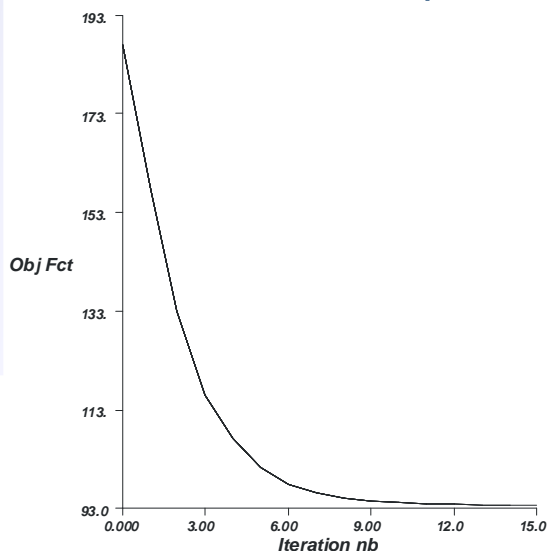


# Applications - 2D plate with a hole

## ■ Plate with generalized super elliptical hole :

- Parameters :  $2 < a, b, \eta, \alpha < 8$
- Objective: min Compliance.
- Constraint: upper bound on the Volume.
- Bi-axial Load:  $\sigma_x = \sigma_y = \sigma_0$
- Solution: perfect circle:  $a = b = 2, \eta = \alpha = 2$

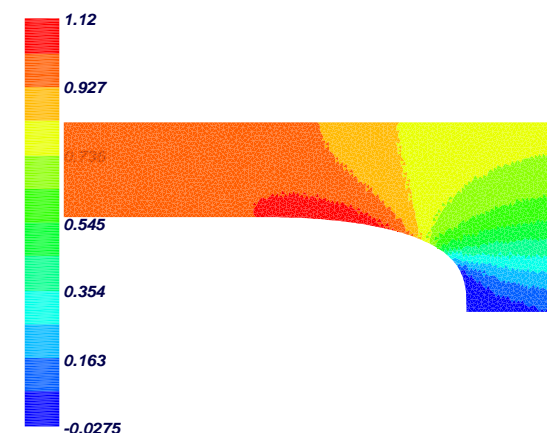
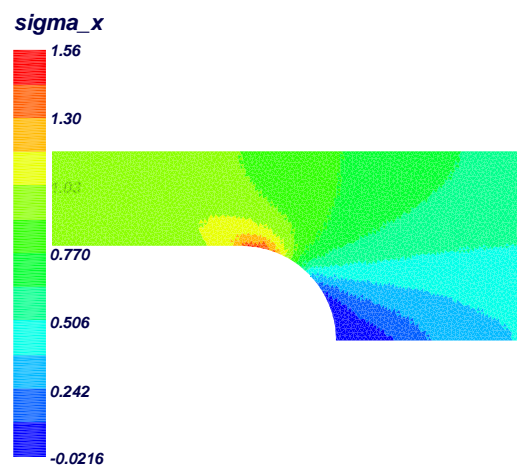
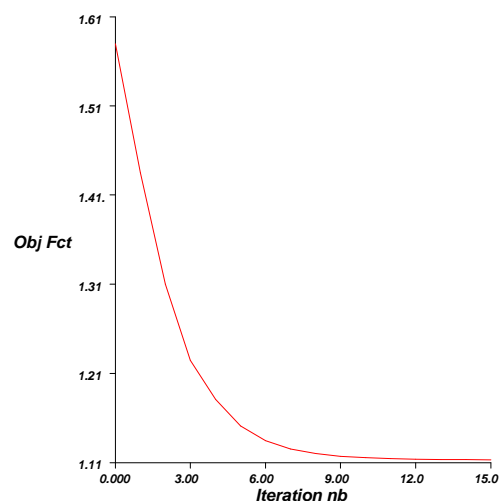
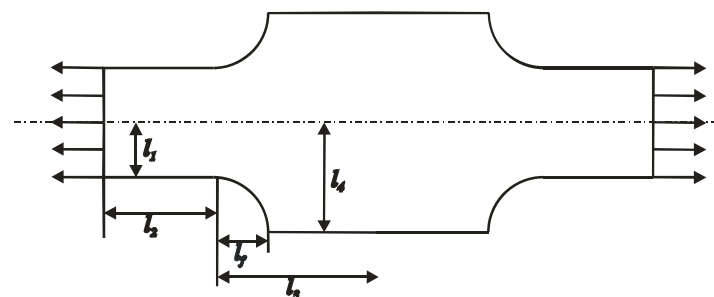
$$\frac{|x|^\alpha}{|a|} + \frac{|y|^\eta}{|b|} = r$$



Van Miegroet & Duysinx, SMO, 2007

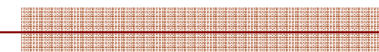
# Applications – 2D fillet in tension

- Shape of the fillet : generalized super ellipse  $\frac{|x|^\alpha}{|a|} + \frac{|y|^\eta}{|b|} = r$ 
  - Parameters :  $a, \eta, \alpha$
  - Objective: min (max Stress)
  - No Constraint
  - Uni-axial Load:  $\sigma_x = \sigma_0$
  - Solution: stress reduction of 30%



Van Miegroet & Duysinx, SMO, 2007

# CONCLUSION



- XFEM and Level Set gives rise to a generalized shape optimisation technique
  - Topology can be modified:
  - Smooth curves description
  - Void-solid description
  - Small number of design variables
  - Global or local response constraints
  - Reduce velocity field and mesh perturbation problems
  
- Sensitivity analysis
  - Compliance : OK (Allaire et al., Wang et al., Belytchko)
  - Extension to displacement and local responses i.e. stresses
    - Better understanding using material derivative concept
    - Efficient numerical implementation (semi-analytical) for applications

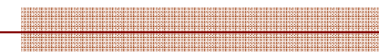


# PERSPECTIVES

- Work in progress:
  - Construction of an integrated design environment using constructive geometry and XFEM
    - EFCONIVO project
  - Local stress constraint estimation and error estimation in XFEM
  - Adaptive (but non conforming) meshing
  - Boundary conditions along non-conforming curves
  - Coupled electromechanical simulation and optimization using XFEM



# ACKNOWLEDGEMENTS



## Thank you for your attention

- This work has been partly supported by projects RW EFCONIVO, "Prototype Software for a new generation of finite element simulation and optimization in Mechanics and Electromagnetism", contract RW-616420 funded by the Walloon Region of Belgium.