

# Blending Isogeometric Analysis and local maximum- entropy approximants

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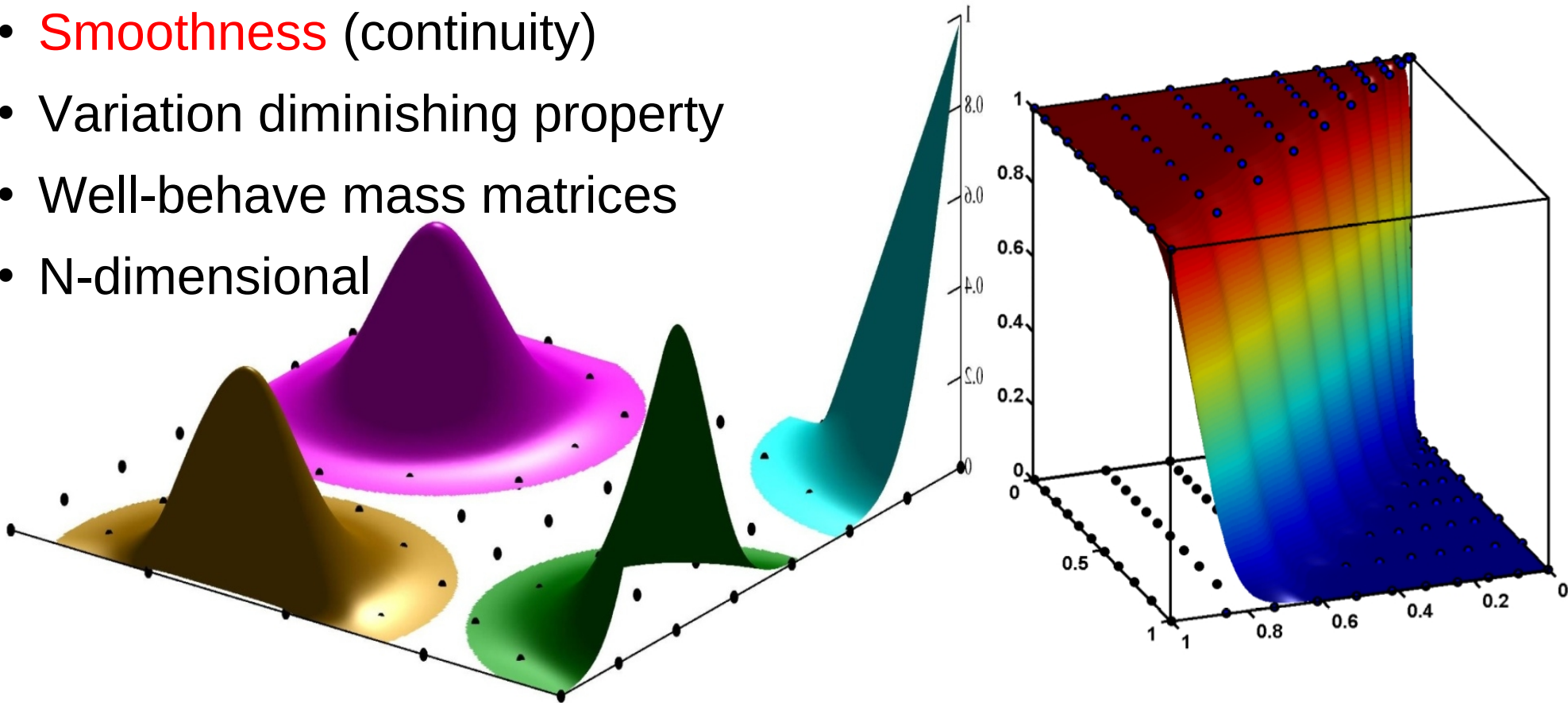
# Outline

- Briefly review of approximants selected by maximum entropy
- Isogeometric analysis and local maximum-entropy approximants

Briefly review of approximants  
selected by maximum-entropy  
approximation schemes

# Maximum-entropy approximants

- Inspired in information theory [Sukumar, 2004] [Arroyo, 2006]
- **Non-negative** basis functions
- **Kronecker-delta** property at the boundary of the convex hull
- **Smoothness** (continuity)
- Variation diminishing property
- Well-behave mass matrices
- N-dimensional



# Maximum-entropy approximants

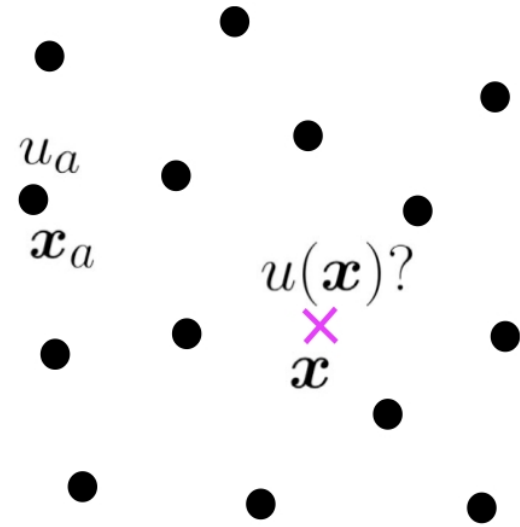
- Approximation of a function

$$u(\mathbf{x}) \approx u^h(\mathbf{x}) = \sum_{a=1}^N p_a(\mathbf{x}) u_a$$

where

- The set  $\{u_a\}_{a=1,\dots,N}$  represents the nodal data at a scattered set of points  $\{\mathbf{x}_a\}_{a=1,\dots,N}$
- The approximants  $p_a(\mathbf{x})$  are regarded as **unknowns**
- The approximants are required to be non-negative and to satisfy zeroth and first order reproducibility conditions

$$p_a \geq 0 \quad \sum_{a=1}^N p_a = 1 \quad \sum_{a=1}^N p_a \mathbf{x}_a = \mathbf{x}$$



# Maximum-entropy approximants

- Convex optimization problem

For fixed  $\mathbf{x}$  minimize  $\sum_{a=1}^N \beta_a p_a |\mathbf{x} - \mathbf{x}_a|^2 + \sum_{a=1}^N p_a \ln p_a$

subject to  $p_a \geq 0, \quad a = 1, \dots, N$

$$\sum_{a=1}^N p_a = 1, \quad \sum_{a=1}^N p_a \mathbf{x}_a = \mathbf{x}$$

- This constrained program has a **unique solution** in the convex hull
- We have to solve the problem for each evaluation point ( $\mathbf{x}$ )
  - Data: nodal coordinates, locality parameters, evaluation points
  - Unknowns: **basis functions**

# Maximum-entropy approximants

- **Duality methods** provide an almost explicit expression of the basis functions

$$p_a(\mathbf{x}) = \frac{1}{Z(\mathbf{x}, \boldsymbol{\lambda}^*(\mathbf{x}))} \exp \left[ -\beta_a |\mathbf{x} - \mathbf{x}_a|^2 + \boldsymbol{\lambda}^*(\mathbf{x}) \cdot (\mathbf{x} - \mathbf{x}_a) \right]$$

where

$$Z(\mathbf{x}, \boldsymbol{\lambda}) = \sum_{b=1}^N \exp \left[ -\beta_b |\mathbf{x} - \mathbf{x}_b|^2 + \boldsymbol{\lambda} \cdot (\mathbf{x} - \mathbf{x}_b) \right]$$

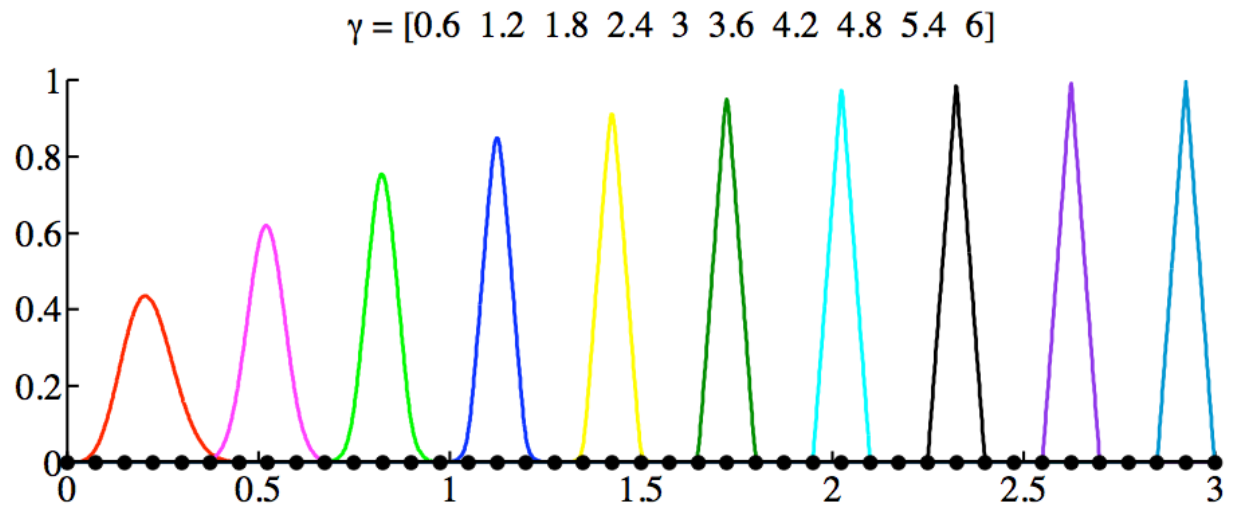
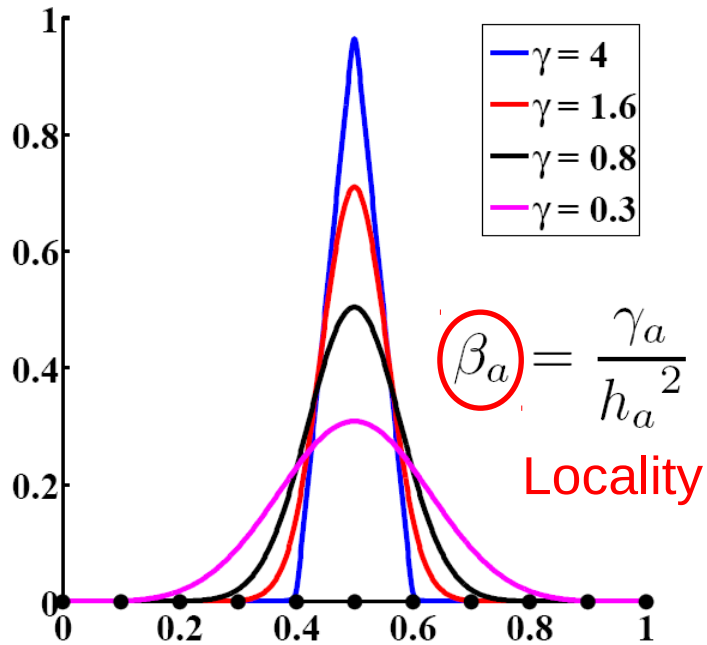
- A Lagrange multiplier must be computed for each evaluation point. It is the unique solution of the following unconstrained convex optimization problem

$$\boldsymbol{\lambda}^*(\mathbf{x}) = \arg \min_{\boldsymbol{\lambda} \in \mathbb{R}^d} \ln Z(\mathbf{x}, \boldsymbol{\lambda})$$

d: Spatial dimension

# Maximum entropy approximants

- Control of locality (**support size**)

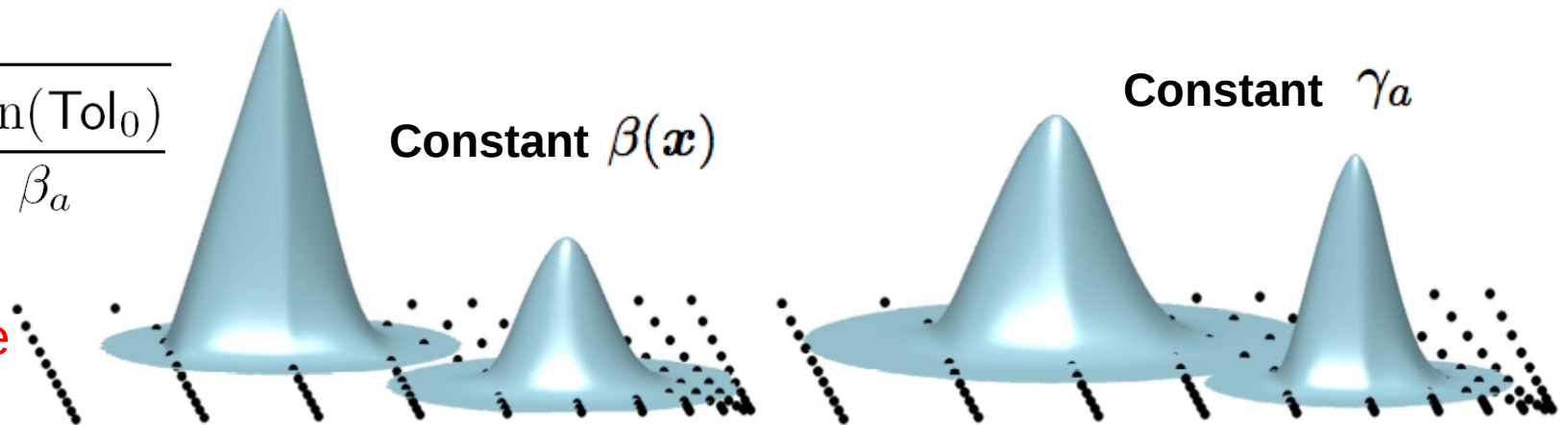


$$R_a = \sqrt{\frac{-\ln(\text{Tol}_0)}{\beta_a}}$$

Numerical support size

Constant  $\beta(x)$

Constant  $\gamma_a$

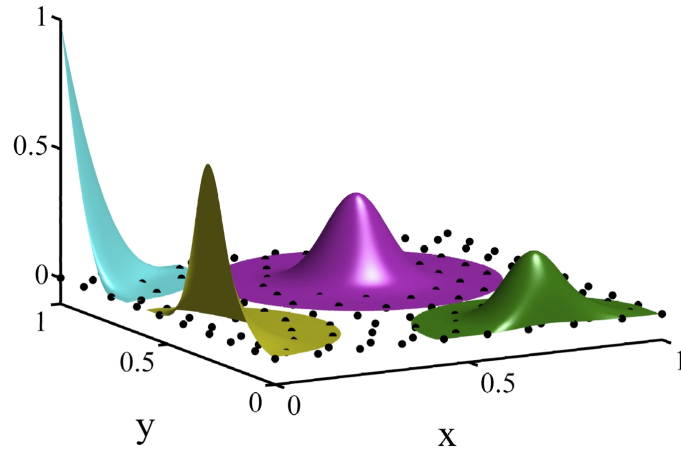




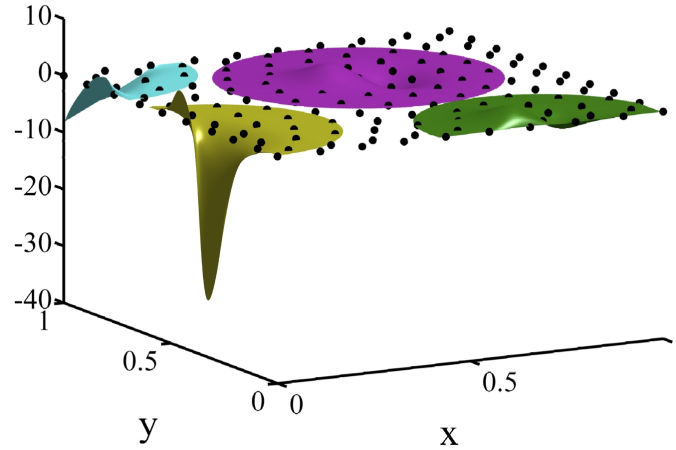
# Maximum entropy approximants

- Derivatives can be computed analytically

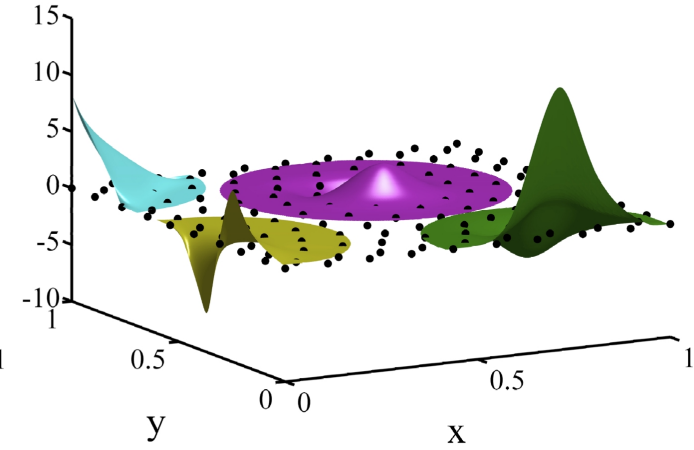
Basis functions



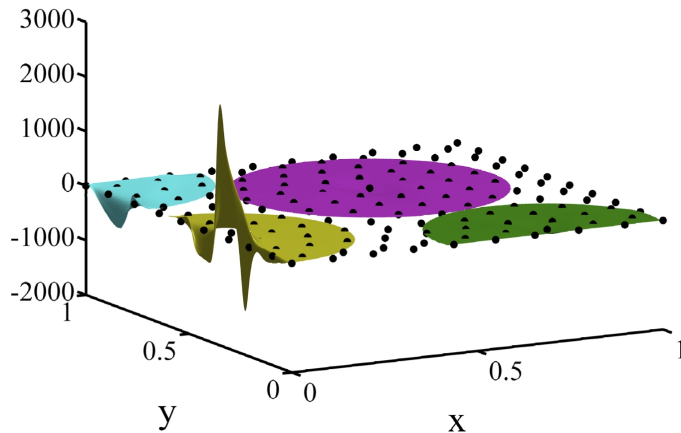
Gradient (x-component)



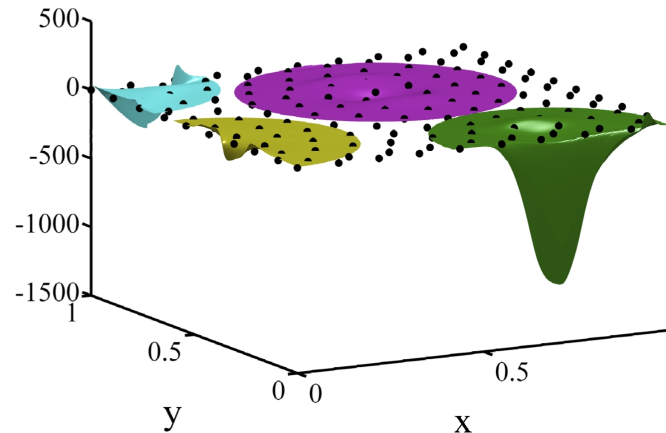
Gradient (y-component)



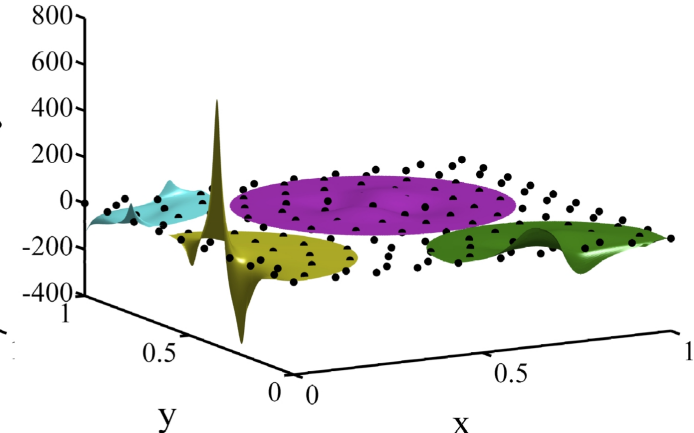
Hessian (xx-component)



Hessian (yy-component)



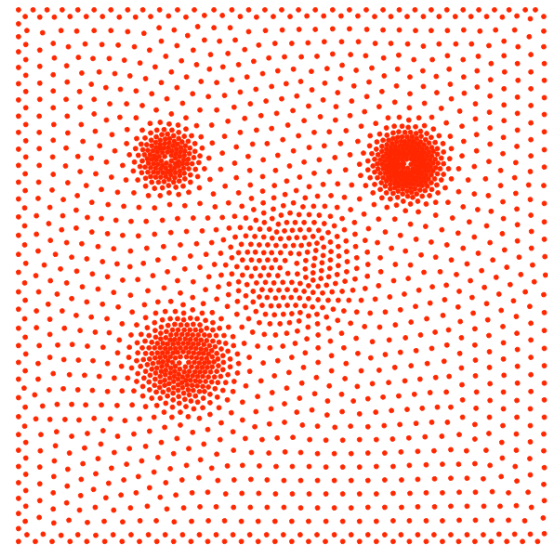
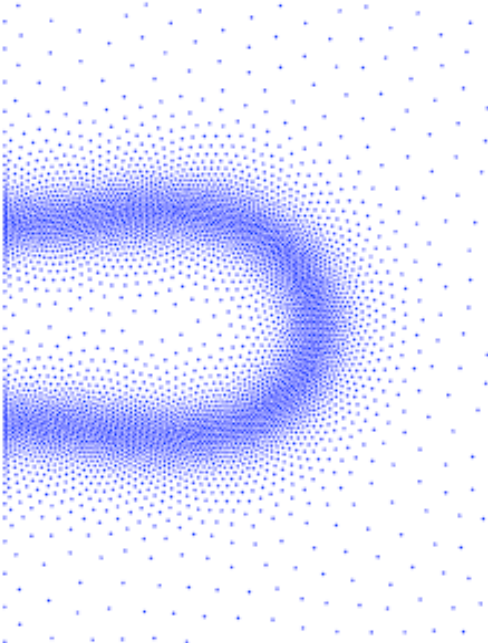
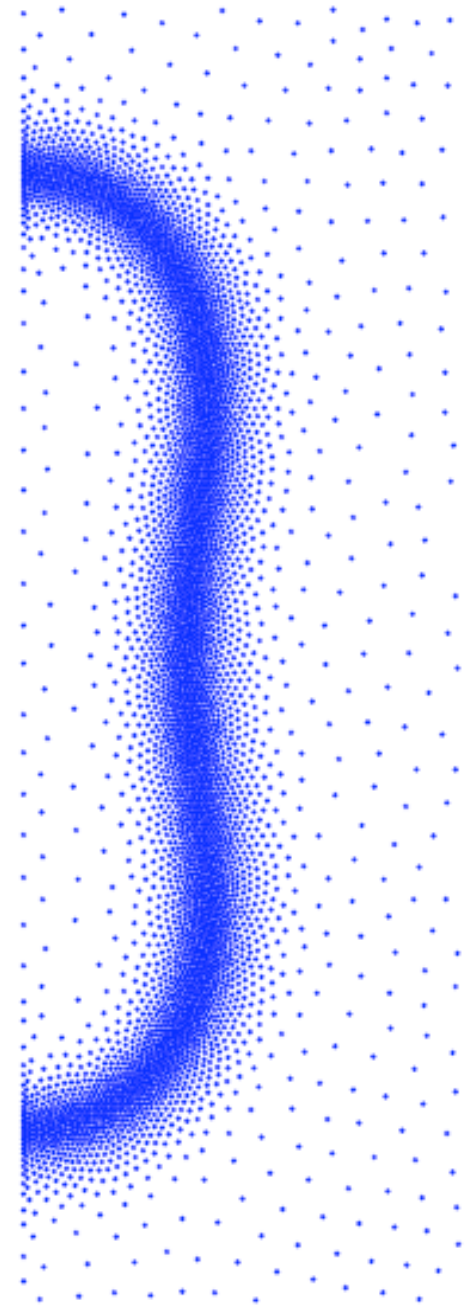
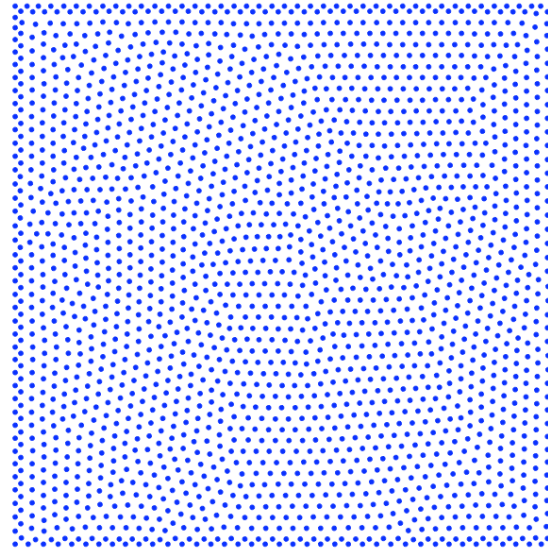
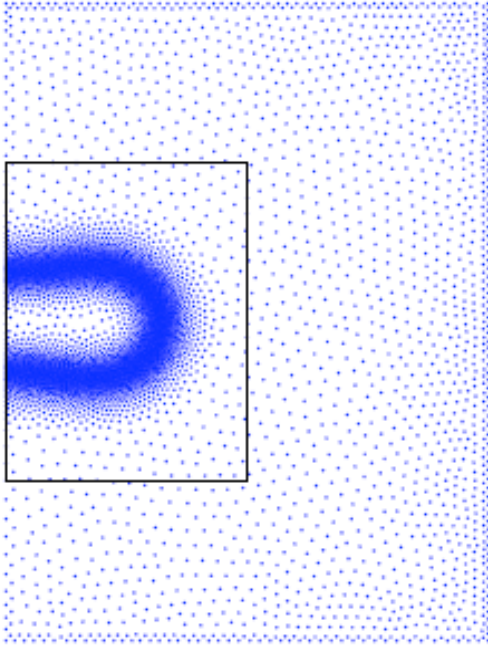
Hessian (xy-component)



# Maximum entropy approximants

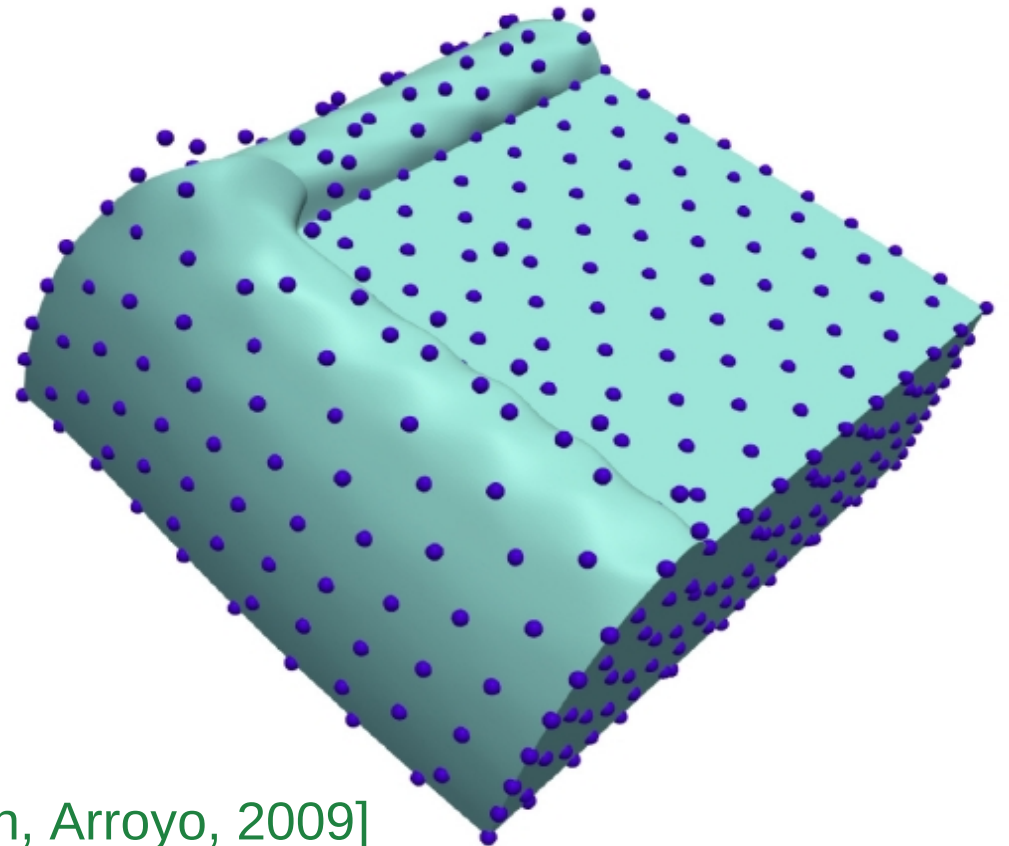
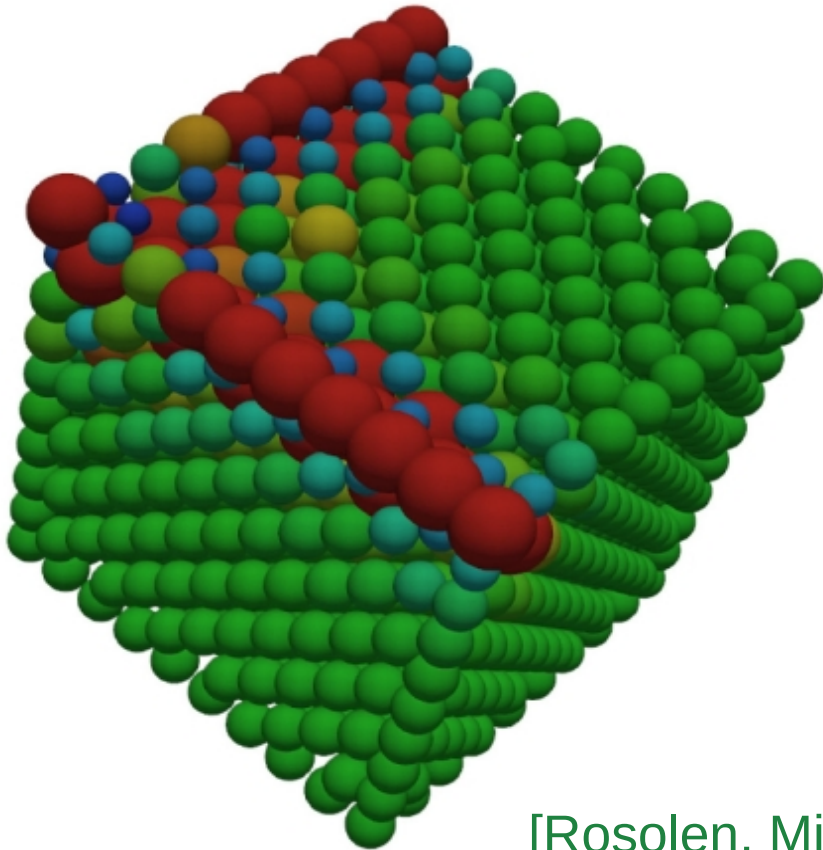
- Ability to handle **non-uniform and unstructured** set of points
- LME are **very accurate** in the calculation of problems involving high order derivatives
- Applications
  - \_ Finite deformations
  - \_ Thin-shell analysis
    - **High-order PDEs**
    - Linear and nonlinear
  - \_ Variational fracture (phase-field approach)
  - \_ Phase-field modeling of biomembranes
    - High-order PDEs
    - Statics and dynamics

# Non-uniform and unstructured set of points



# Nonlinear elasticity

- Compression of a neo-Hookean hyperelastic block (nominal stretch ratio = 0.5)

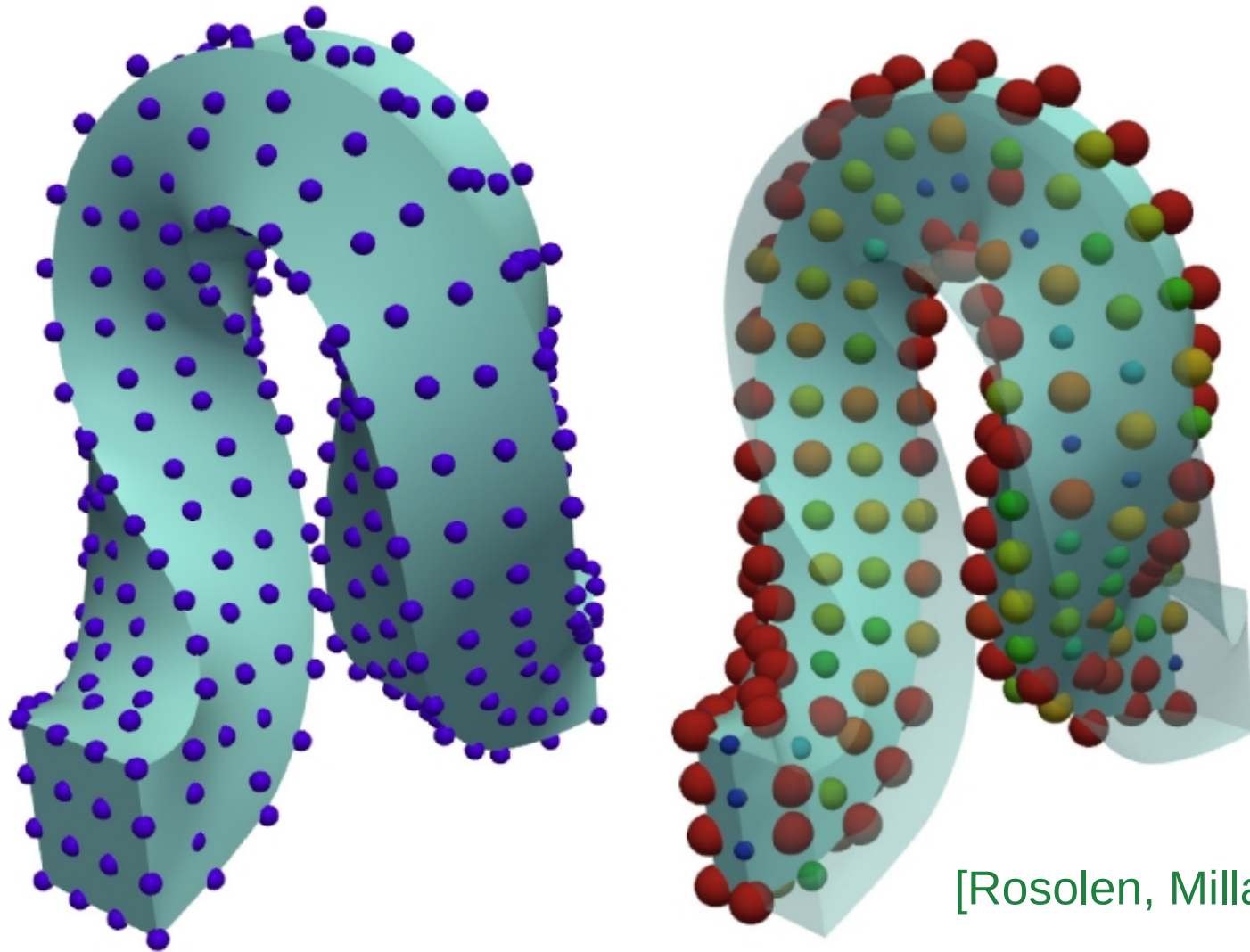


[Rosolen, Millan, Arroyo, 2009]



# Nonlinear elasticity

- Buckling of a neo-Hookean hyperelastic beam (nominal stretch ratio = 0.35)

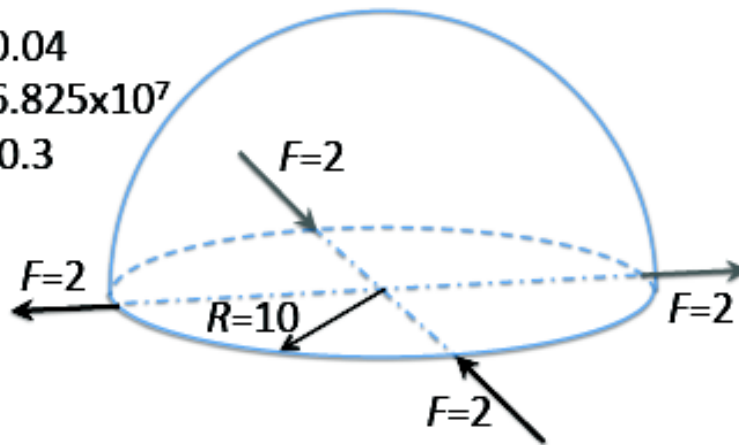


[Rosolen, Millan, Arroyo, 2009]

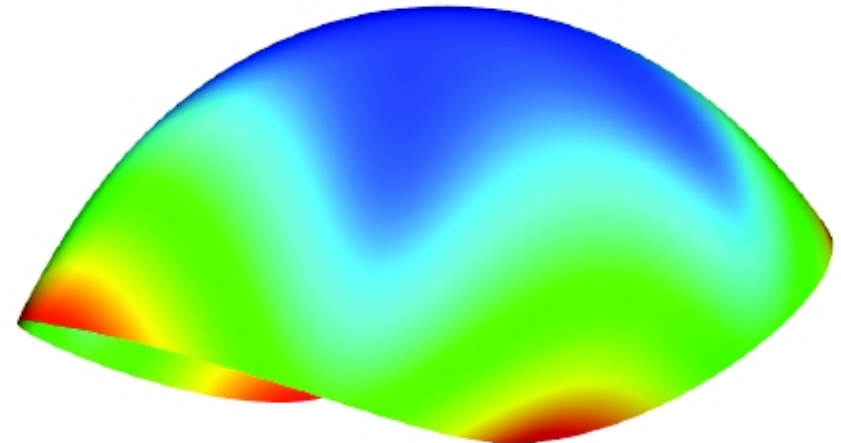
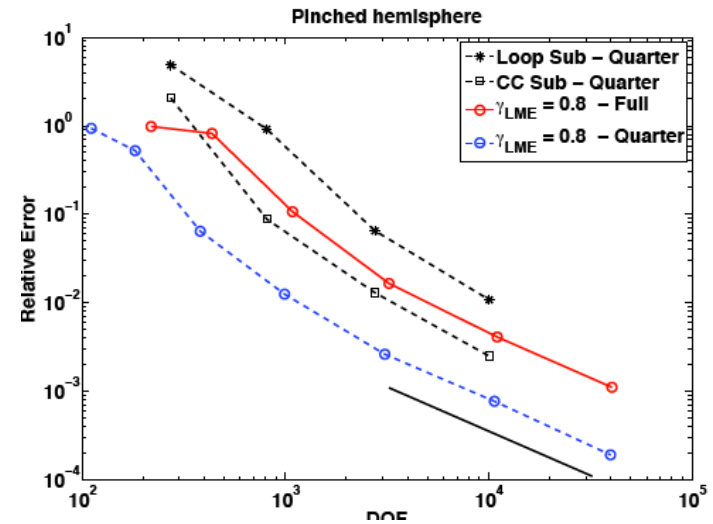
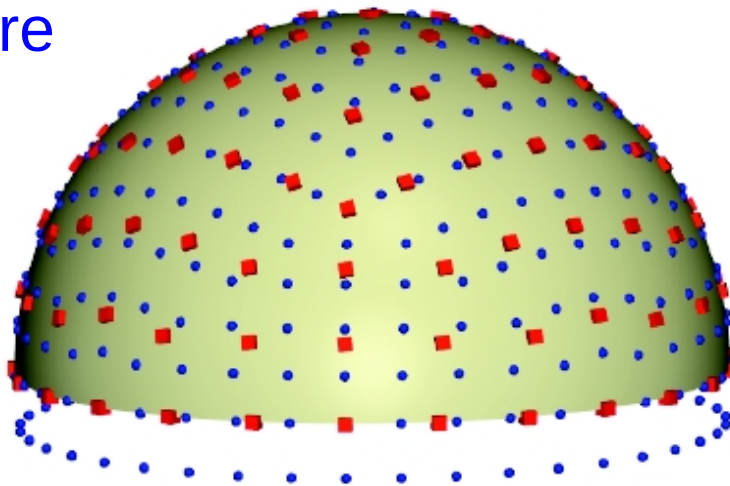
# Linear thin-shell problems

- Benchmark tests

$h=0.04$   
 $E=6.825 \times 10^7$   
 $\nu=0.3$



Pinched  
hemisphere

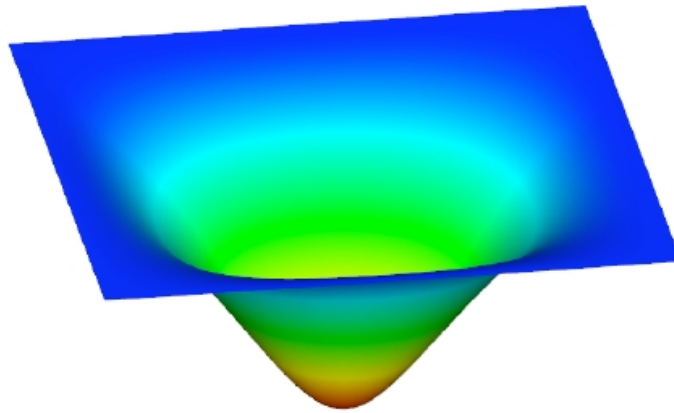
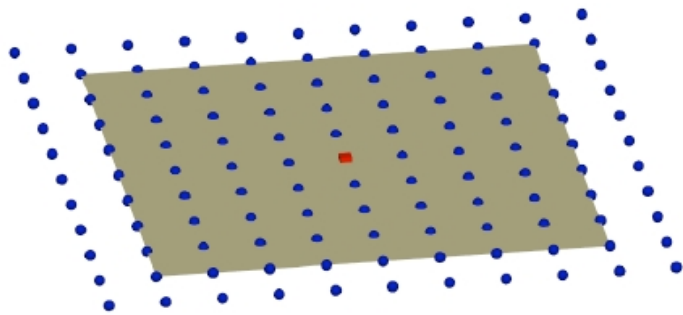


[Millan, Rosolen, Arroyo, 2011]

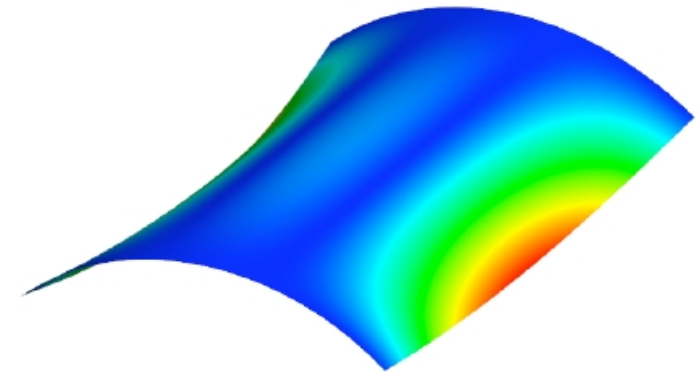
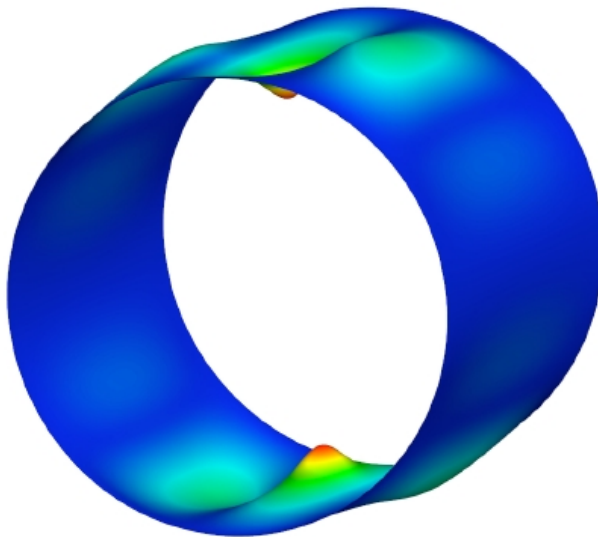
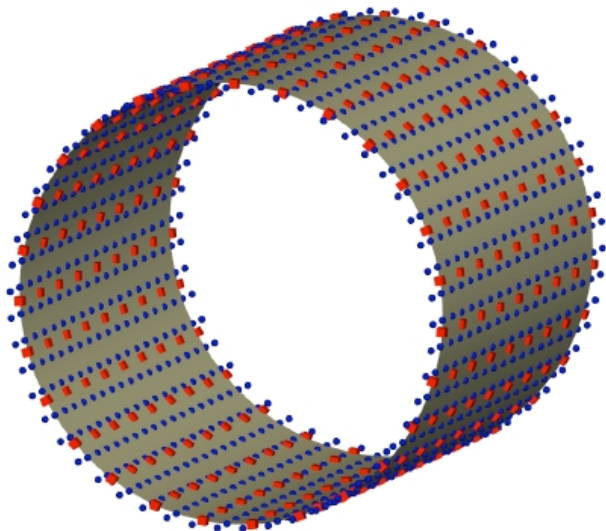
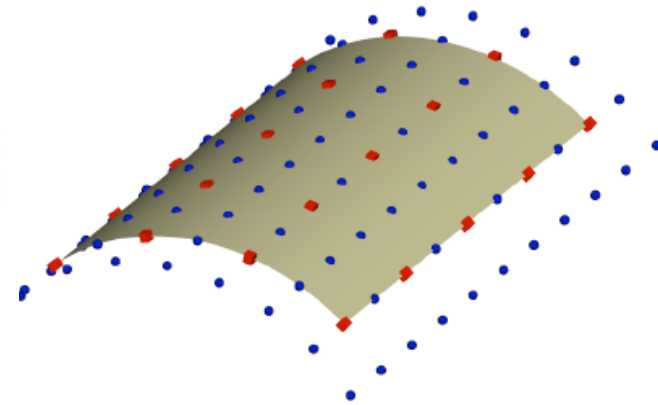
# Linear thin-shell problems

- Benchmark tests

Clamped plate



Scordelis roof



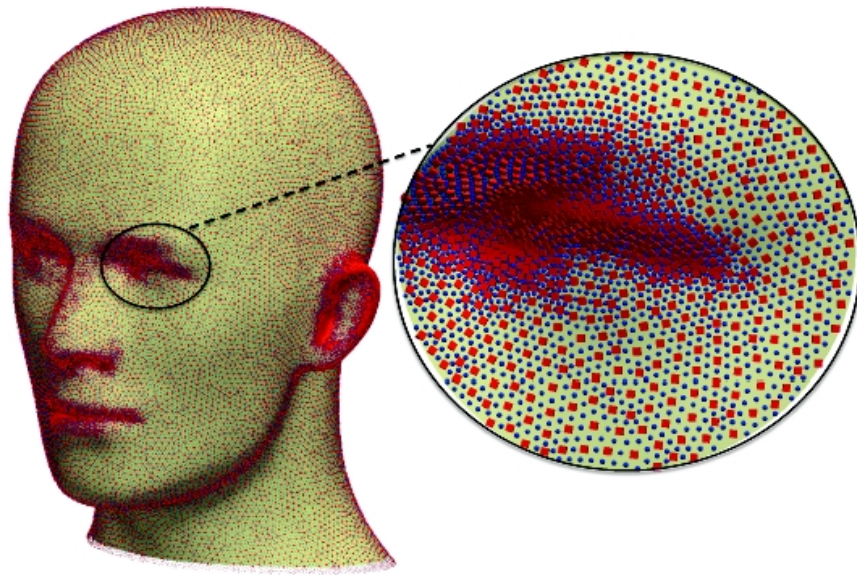
Pinched cylinder

[Millan, Rosolen, Arroyo, 2011]



# Linear thin-shell problems

- Complex geometry

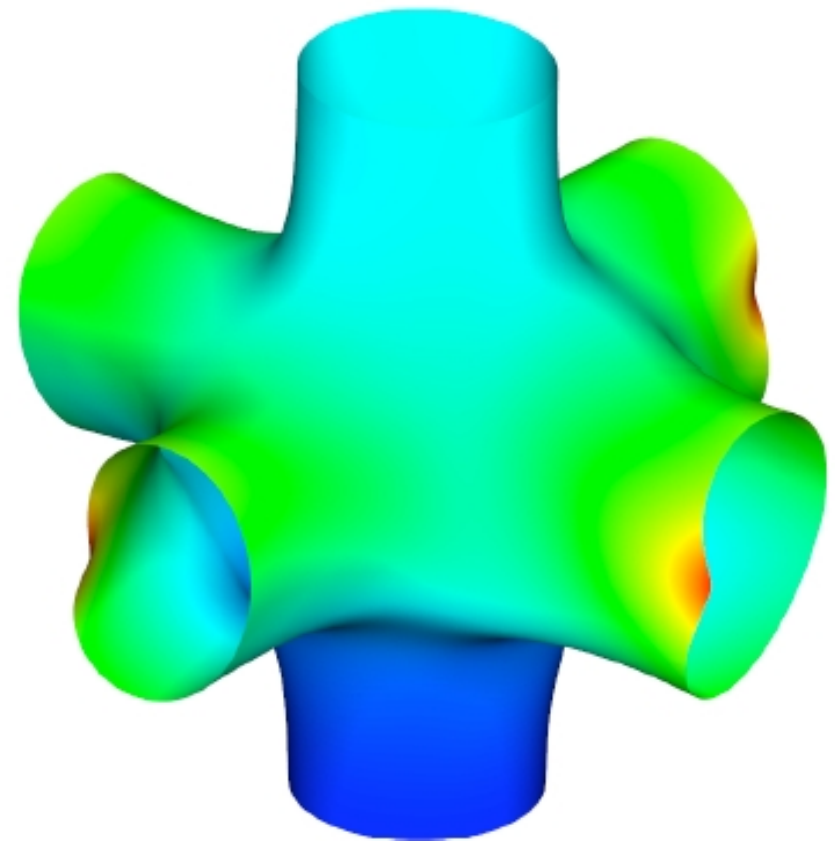
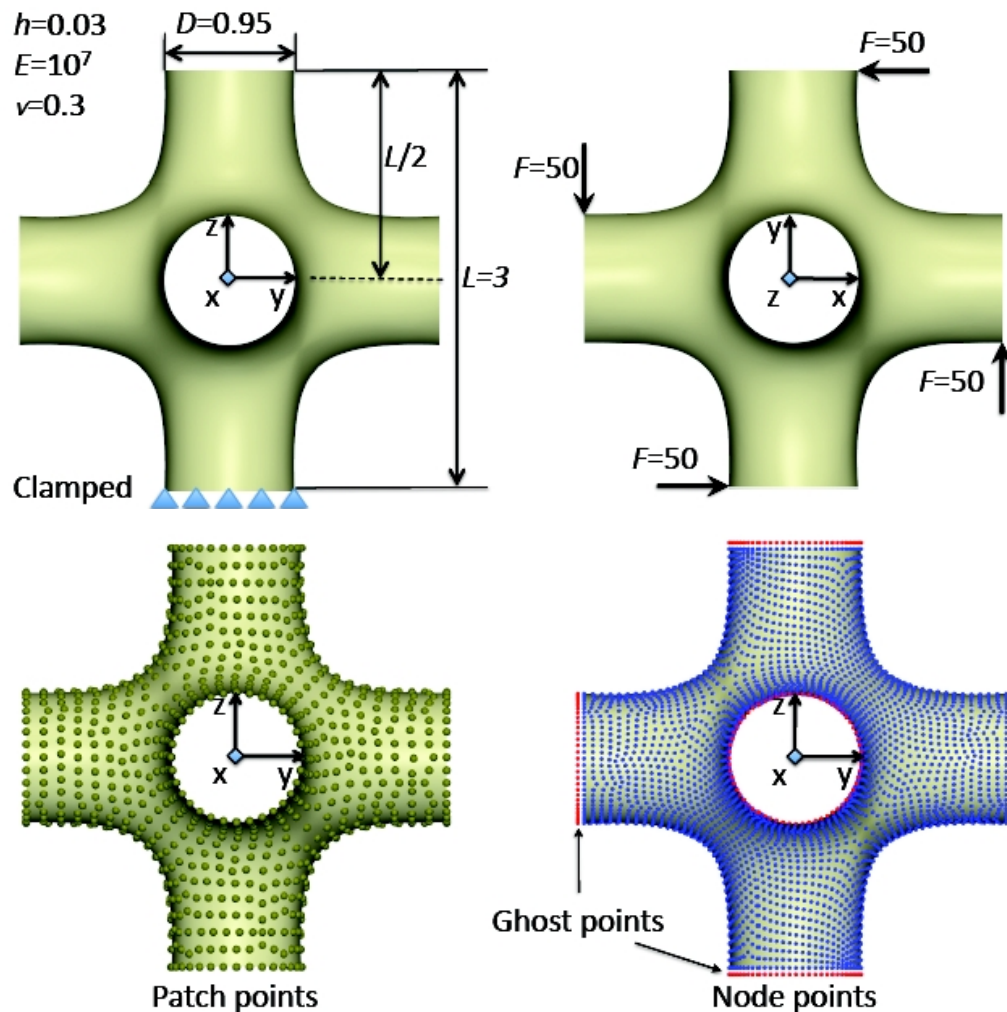


[Millan, Rosolen, Arroyo, 2011]



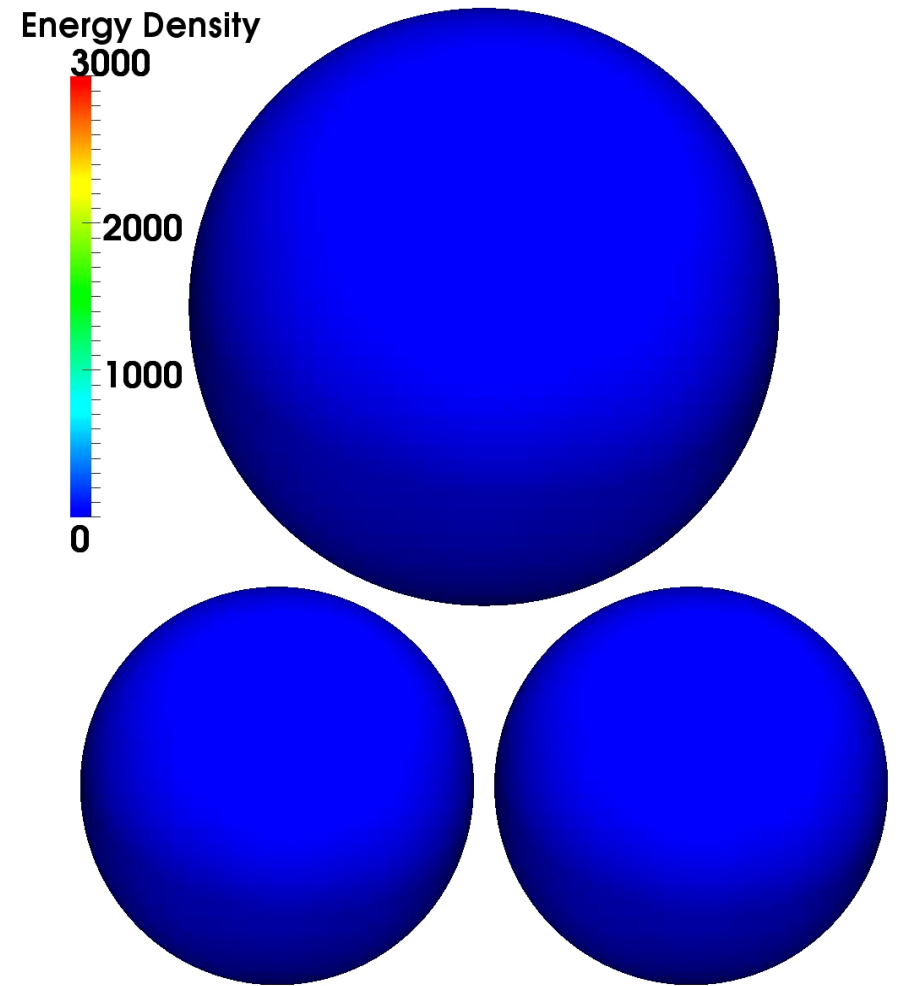
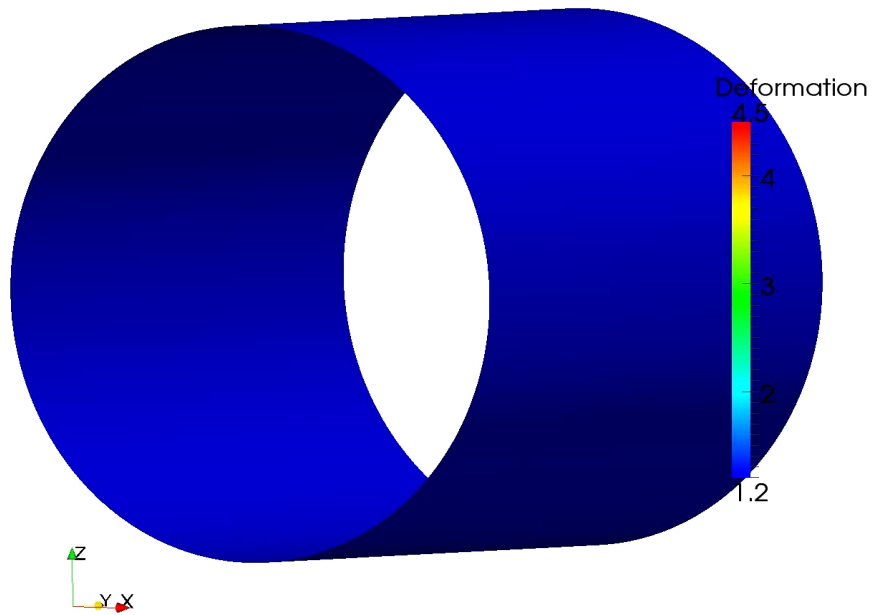
# Linear thin-shell problems

- Complex topology



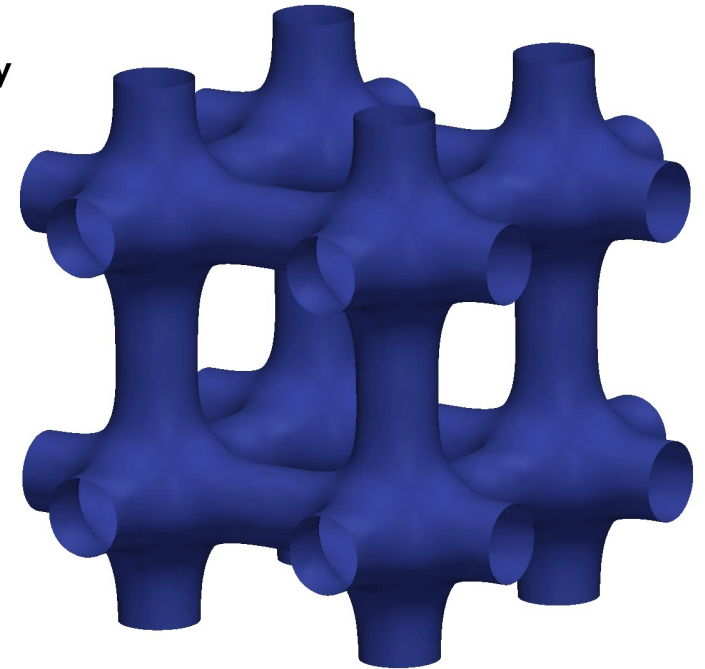
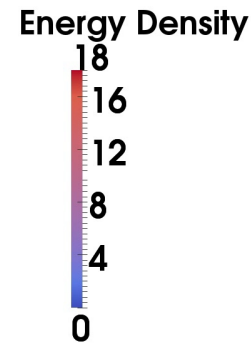
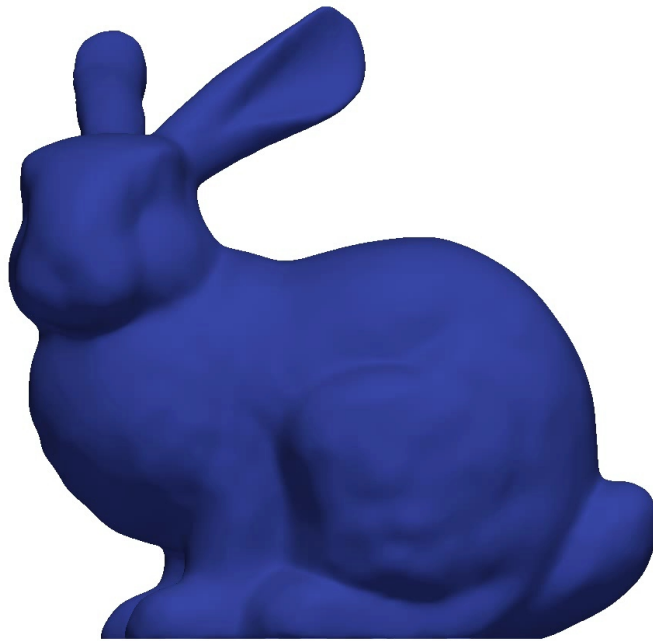
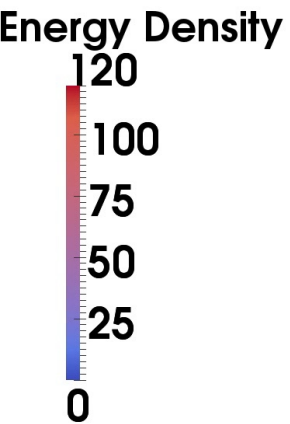
[Millan, Rosolen, Arroyo, 2011]

# Nonlinear thin-shell problems



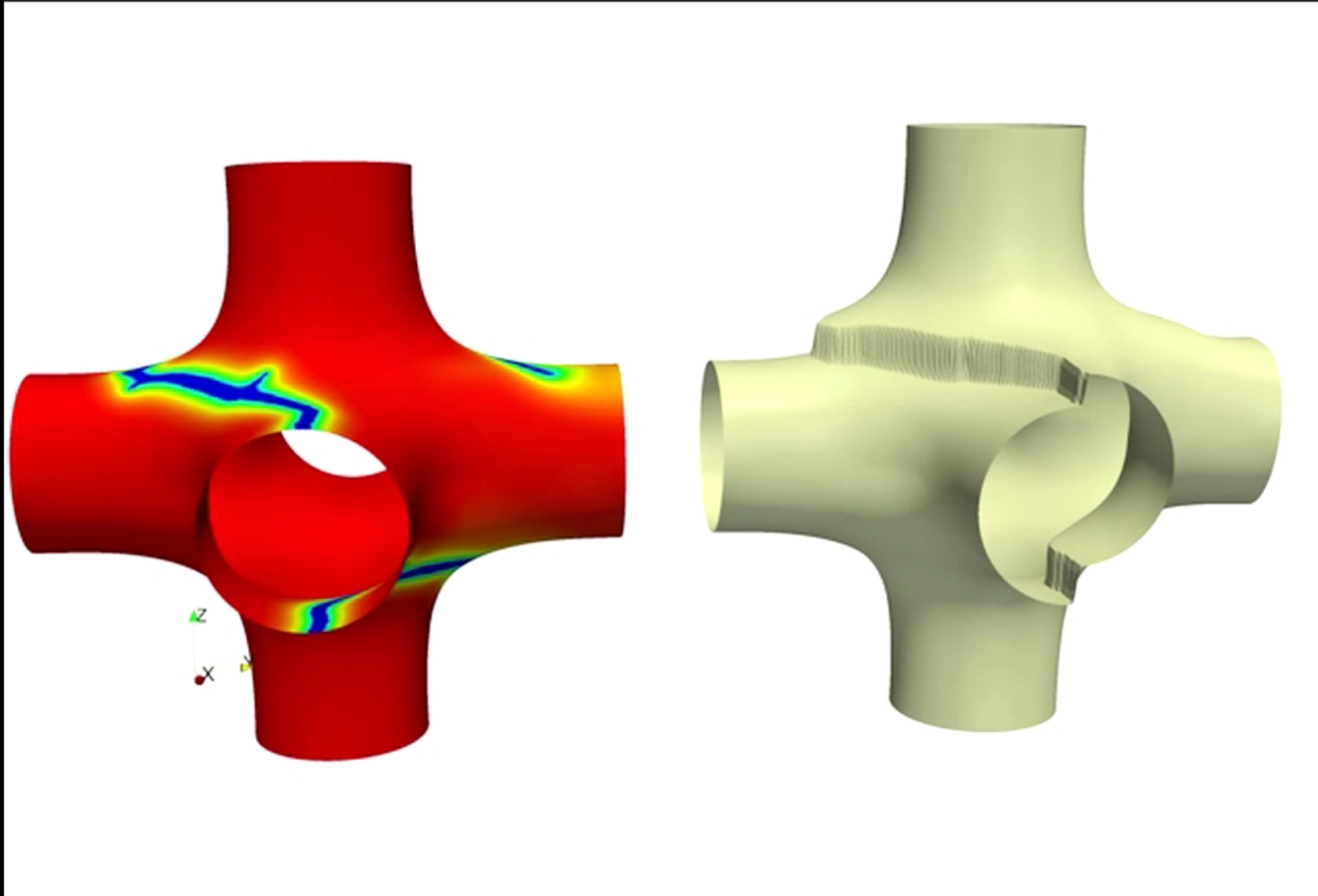
[Millan, Rosolen, Arroyo, 2012]

# Nonlinear thin-shell problems



[Millan, Rosolen, Arroyo, 2012]

# Variational Fracture (phase-field approach)



[Millan, Arroyo, et al., 2012]

# Phase-field model of biomembranes

Statics

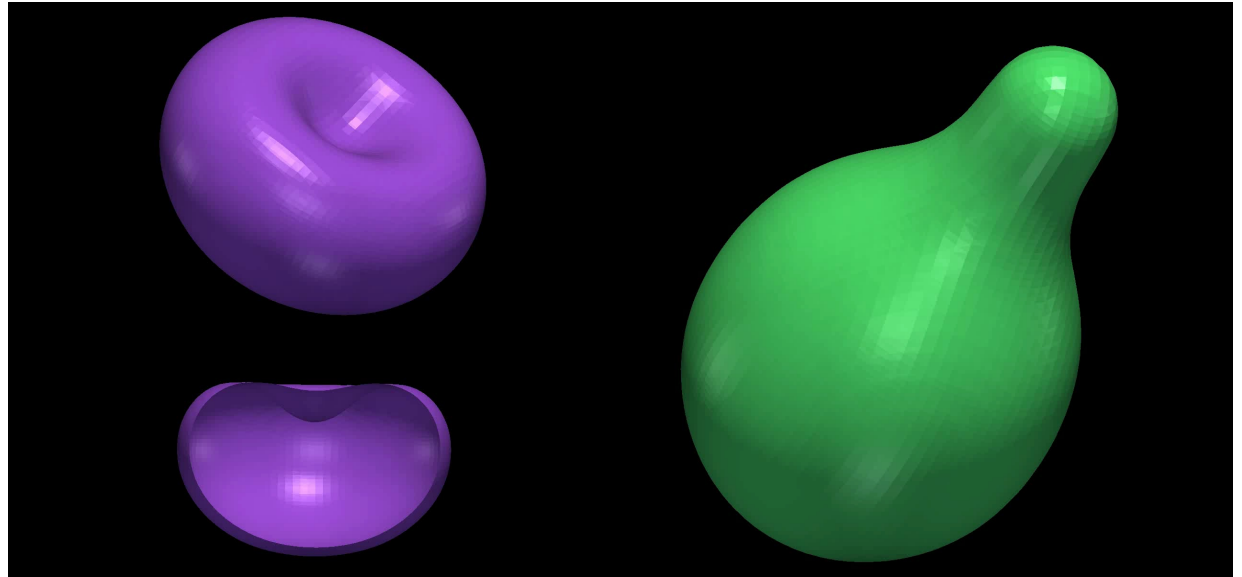
Oblate  
branch



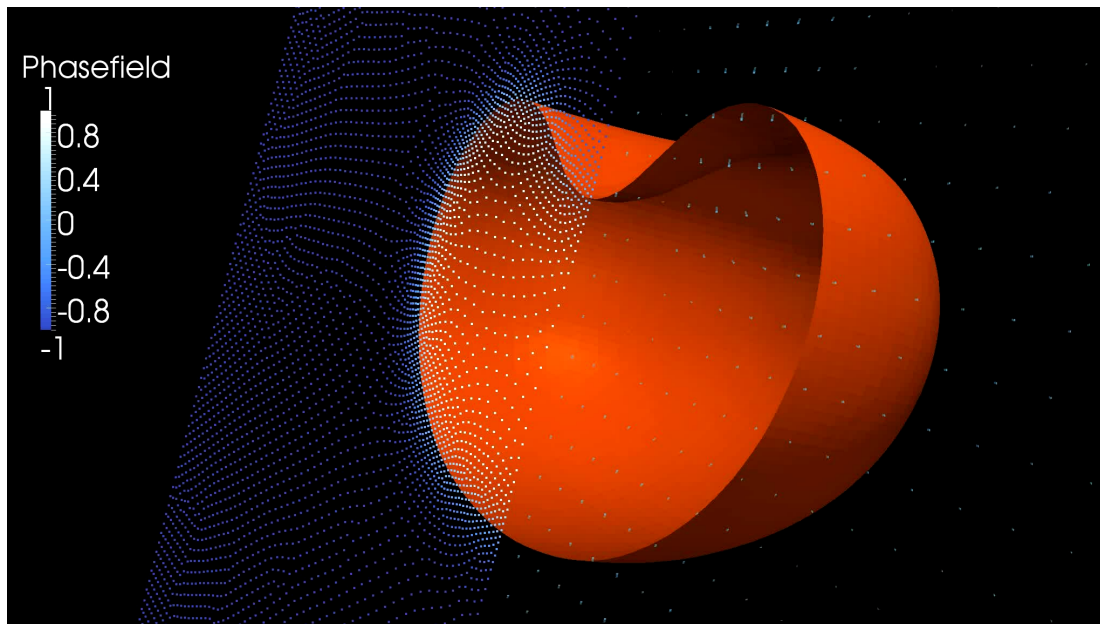
[Rosolen, Peco, Arroyo, 2012]

# Phase-field model of biomembranes

Dynamics



Pear-shaped

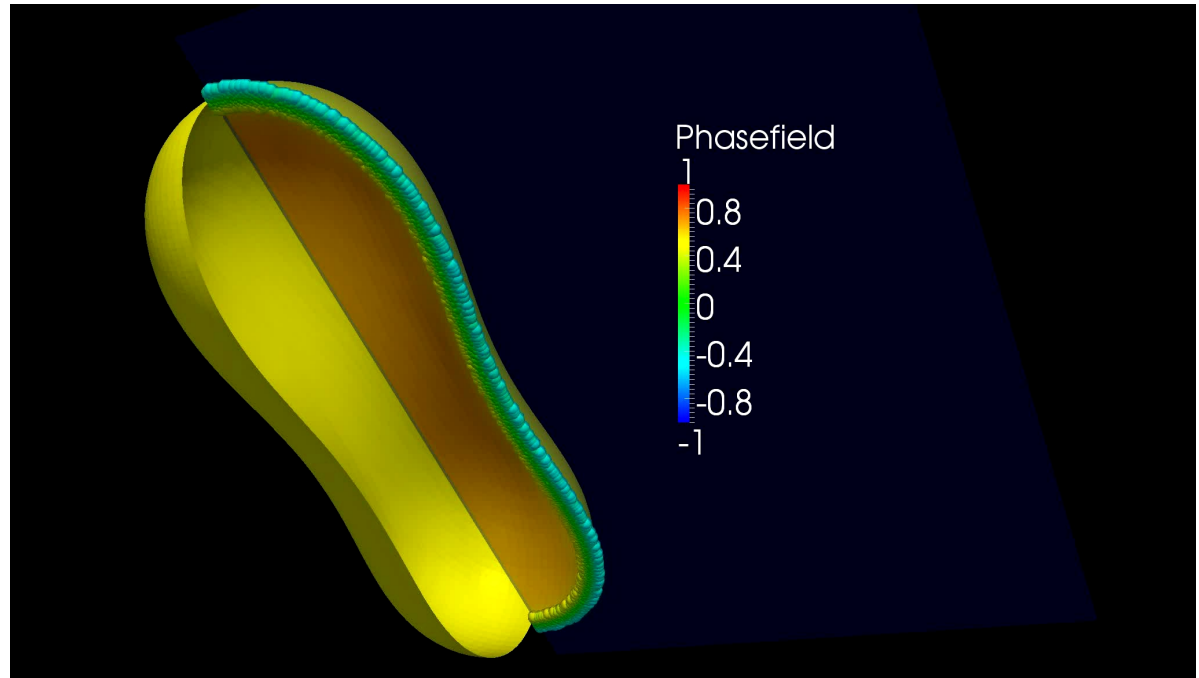


Discocyte

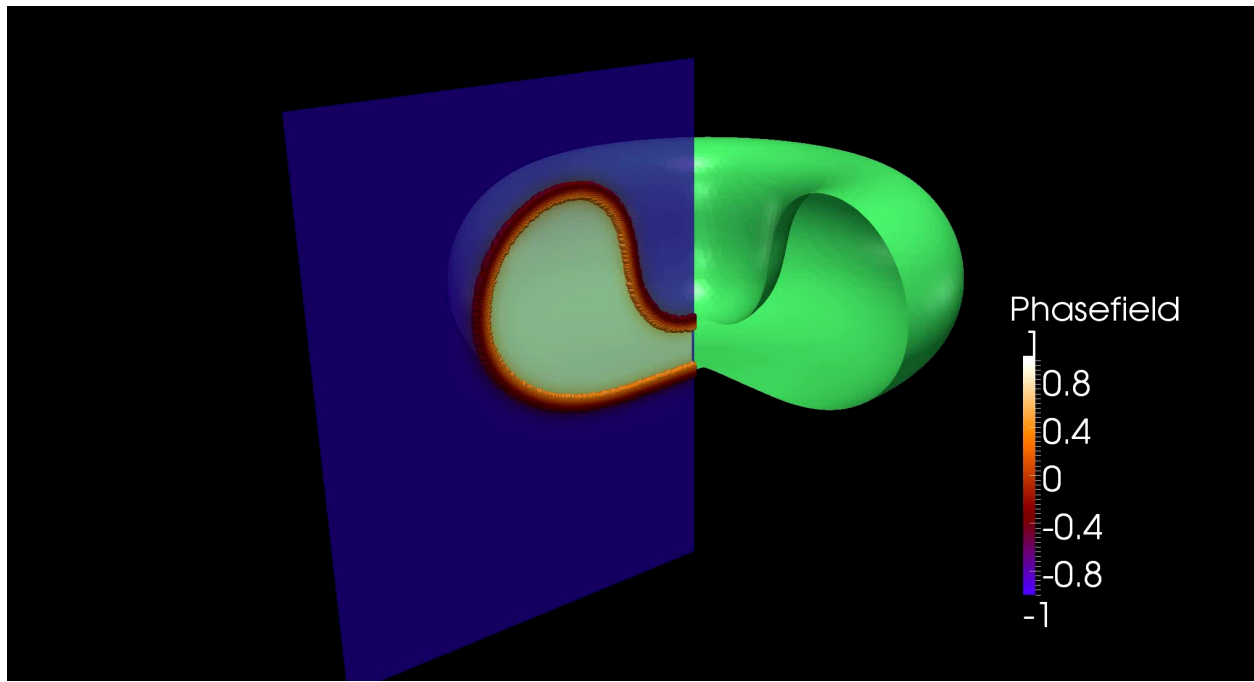
[Peco, Rosolen, Arroyo, 2012]

# Phase-field model of biomembranes

Dynamics



Dumbbell;  
Pear-shaped



Stomatocyte

[Peco, Rosolen, Arroyo, 2012]

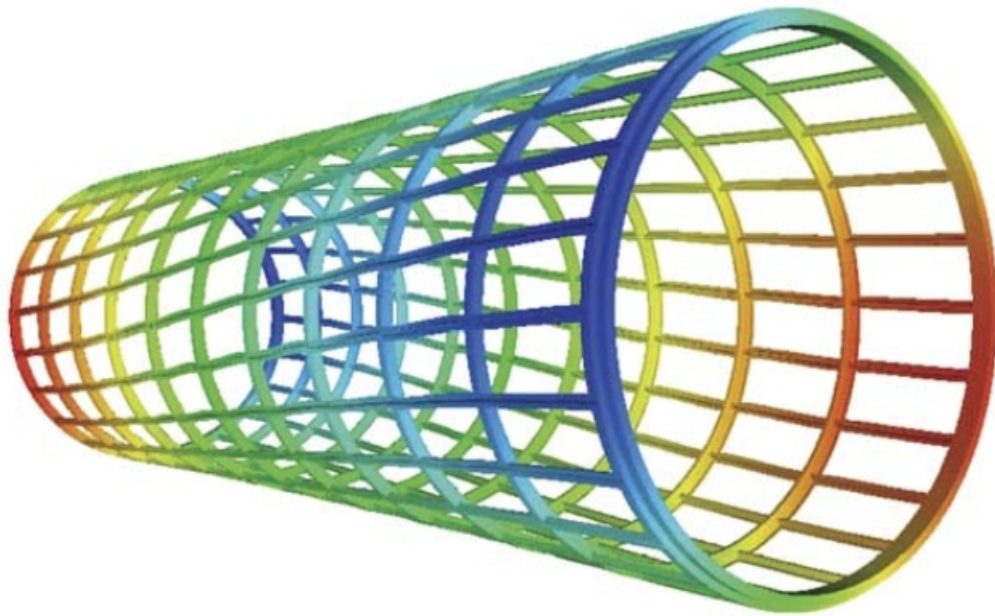
# Isogeometric Analysis and maximum-entropy approximants



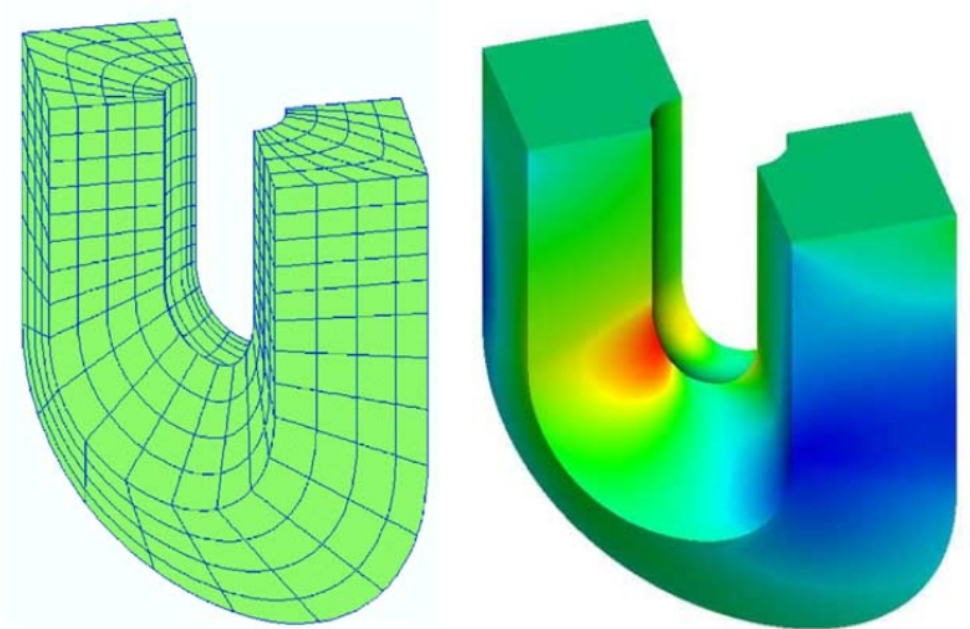
- In the last years, the excellent properties of smooth non-negative basis functions have motivated their use in the numerical solution of PDE
- **Subdivision finite elements** [Cirak et al., 2000]
  - Two dimensional approximants on unstructured grids
- **Isogeometric Analysis** [Hughes et al., 2005]
- **Maximum entropy approximation schemes**

# Isogeometric analysis

- The same basis functions are used to describe the geometry and to interpolate the physical fields



[Cottrell, CMAME, 2006]



[Hughes, CMAME, 2005]

# Isogeometric analysis

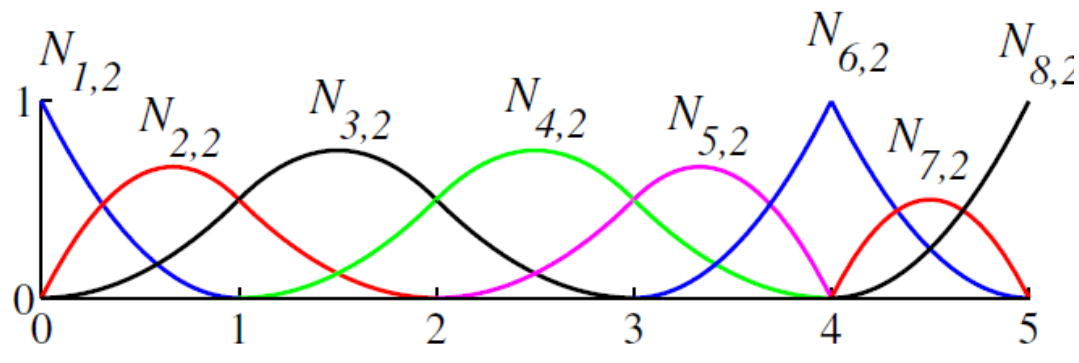
- Based on NURBS approximation schemes
- Description of the **geometry with CAD fidelity**
- (semi-)Structured grids
  - Current research in T-Splines
- **Handling multiple boundaries requires significant preprocessing and techniques to have globally smooth approximation**

# Isogeometric analysis

- Representation of a curve

$$C(\xi) = \sum_{i=1}^n N_{i,p}(\xi) B_i$$

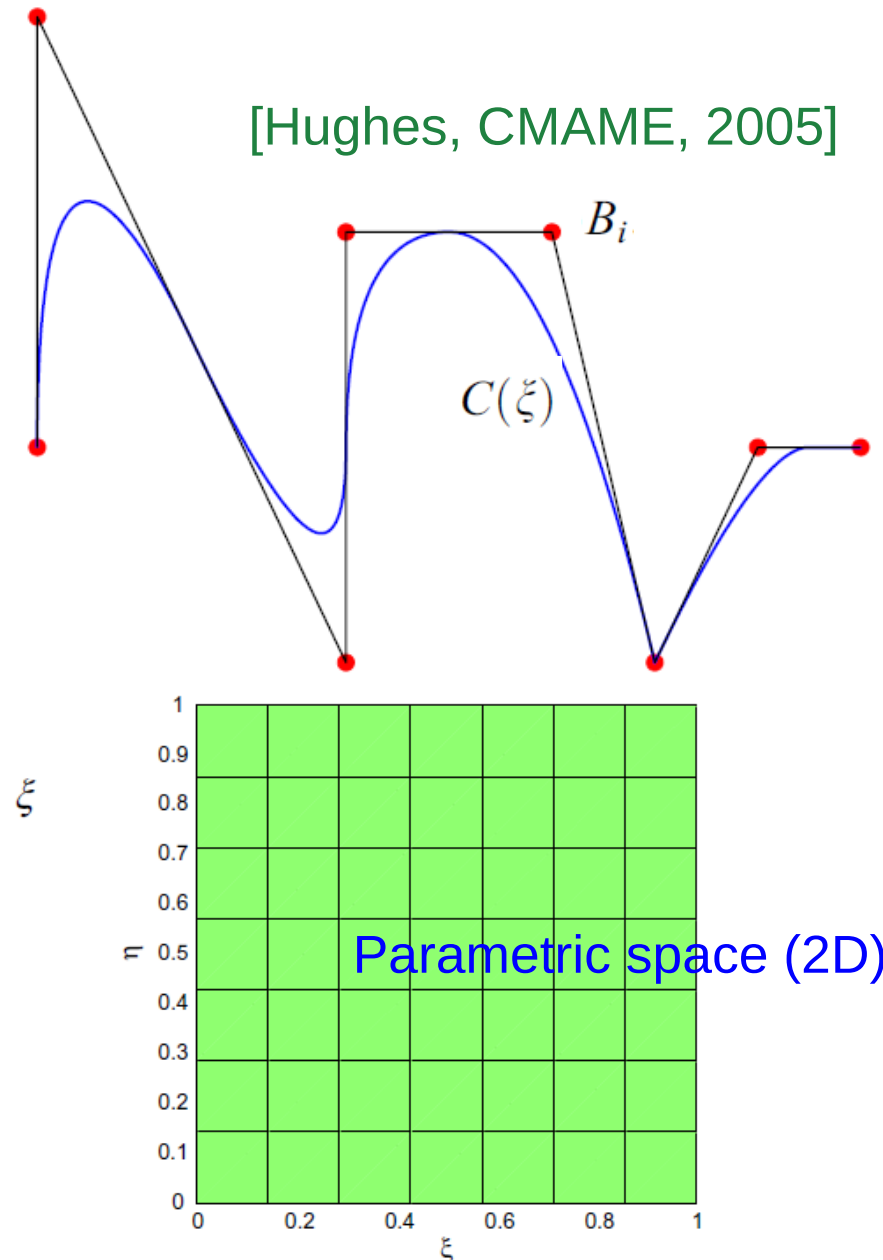
- Parametric space: the **knot vector**



$$E = \{0, 0, 0, 1, 2, 3, 4, 4, 5, 5, 5\}$$

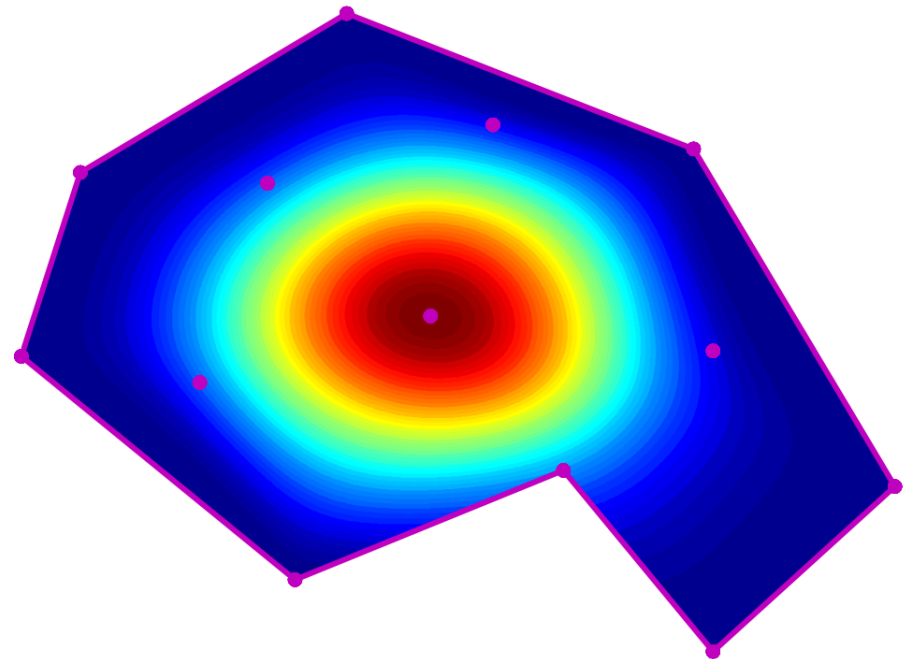
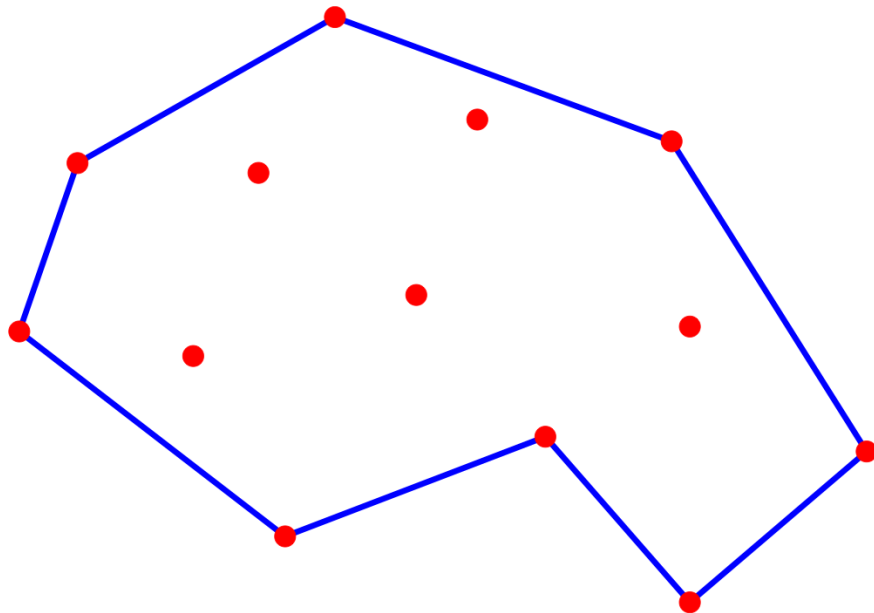
- Control points**
- Higher dimensions:
  - Parametric space is local to “patches”

[Hughes, CMAME, 2005]



# Intrinsic limitation of meshfree methods

- Solely with points, only polytopes can be represented
- Non high fidelity representation of the geometry

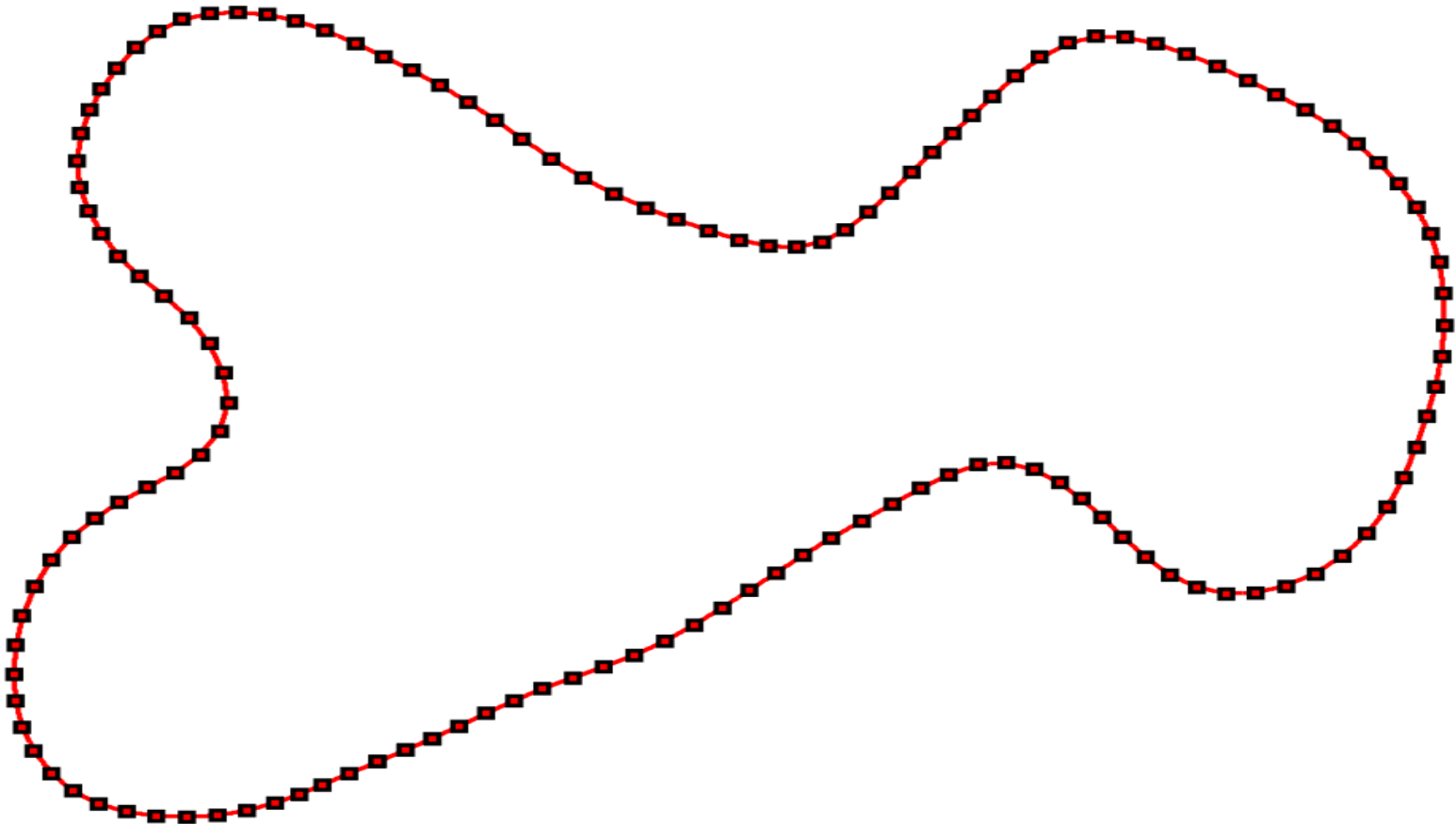


# Blending B-Splines and max-ent

- Limitations of max-ent and B-Splines are **complementary**
  - Handling of unstructured meshes
  - Description of the geometry with high fidelity
- The convex structure is shared
  - Suggests blending through a **convex optimization problem**
- Related approach: NEFEM [**Sevilla et al., 2010**]
  - High fidelity representation of the geometry
  - Coupling between NURBS and high-order FEM-DG
  - Smoothness and positivity of the basis functions is not preserved

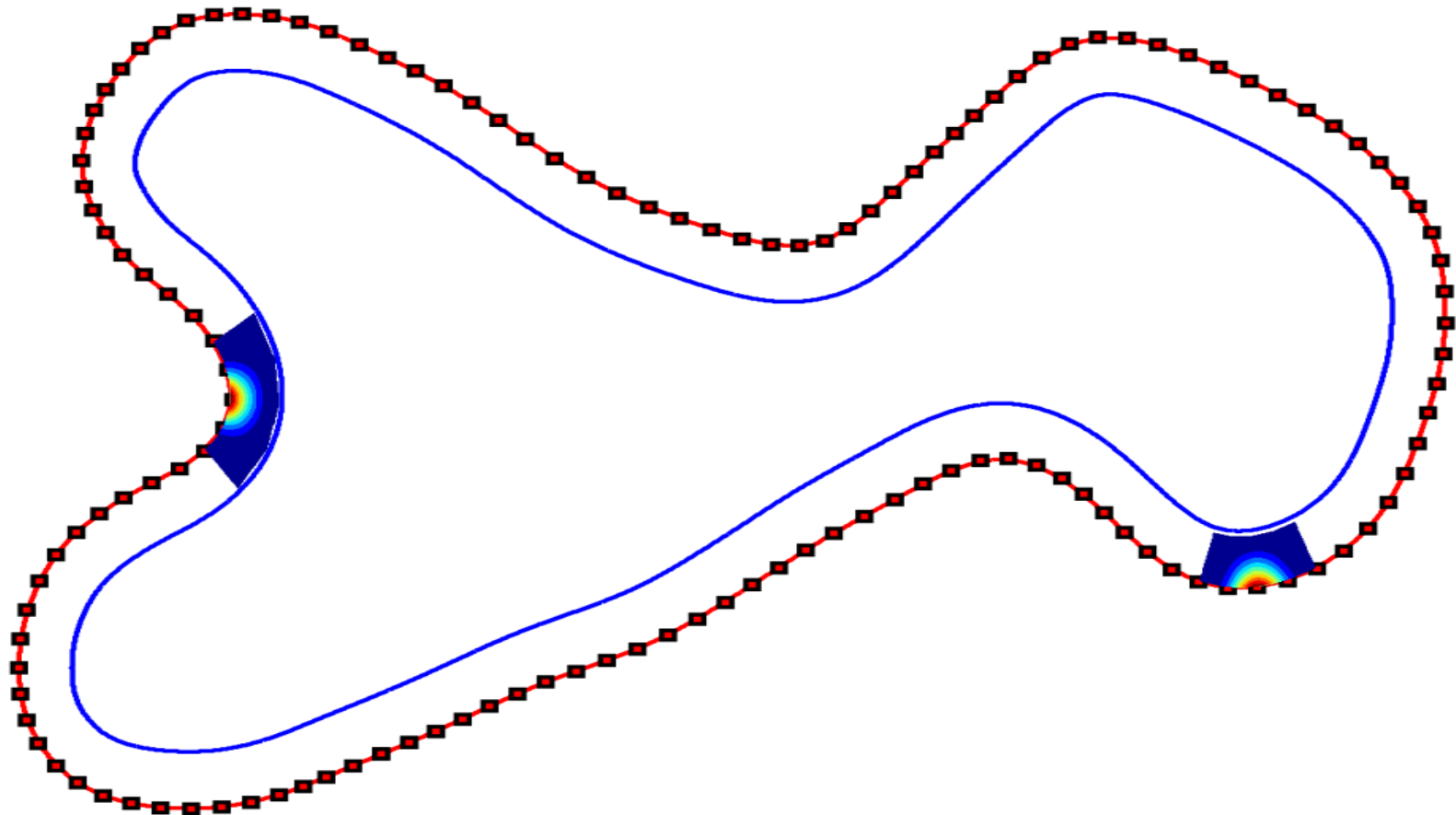
# Blending B-Splines and max-ent

- CAD description of the boundary (**B-Spline curve**)



# Blending B-Splines and max-ent

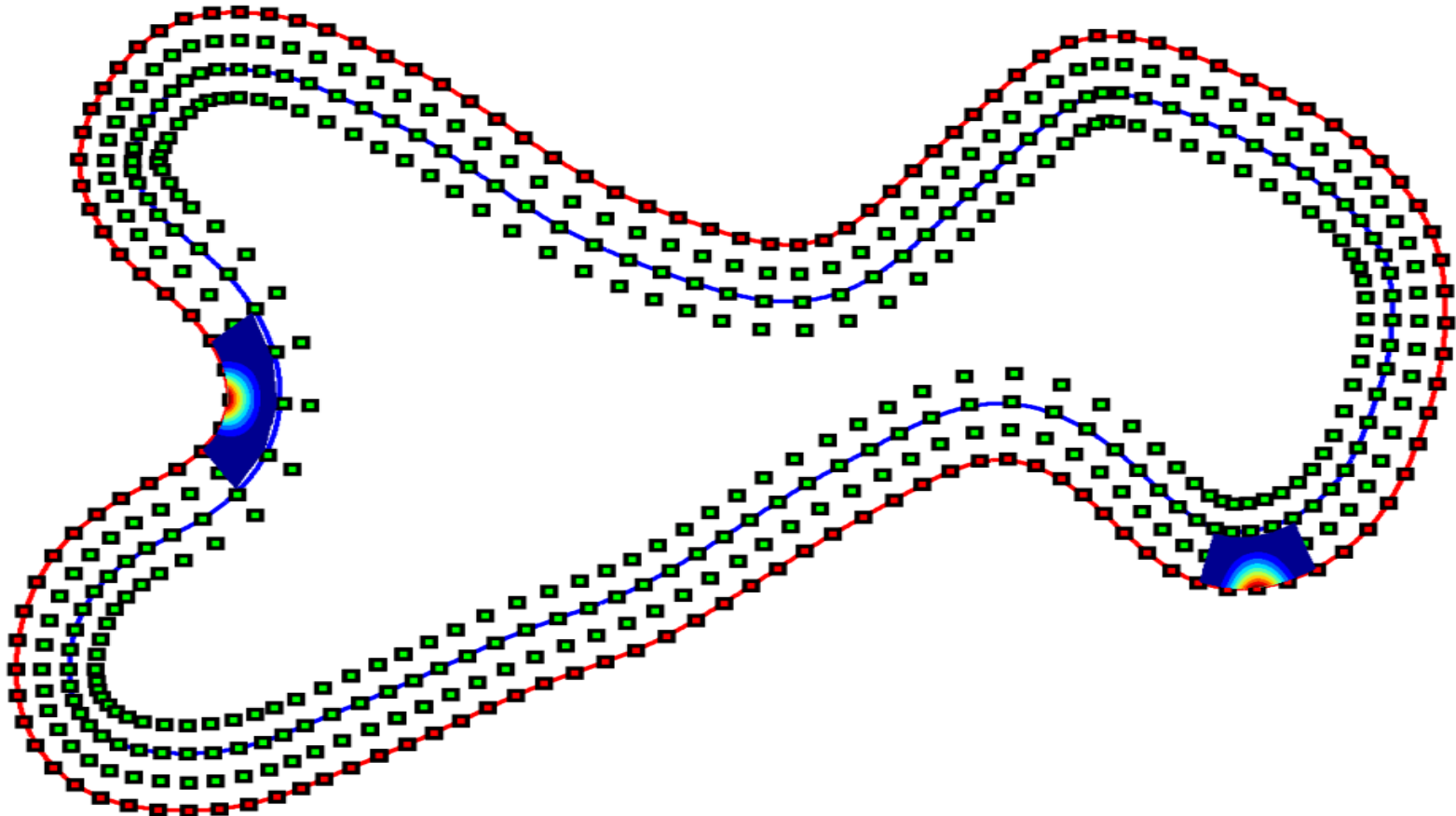
- CAD description of the boundary (B-Spline curve)
- Single layer of Isogeometric (B-Spline + isoparametric mapping) basis functions





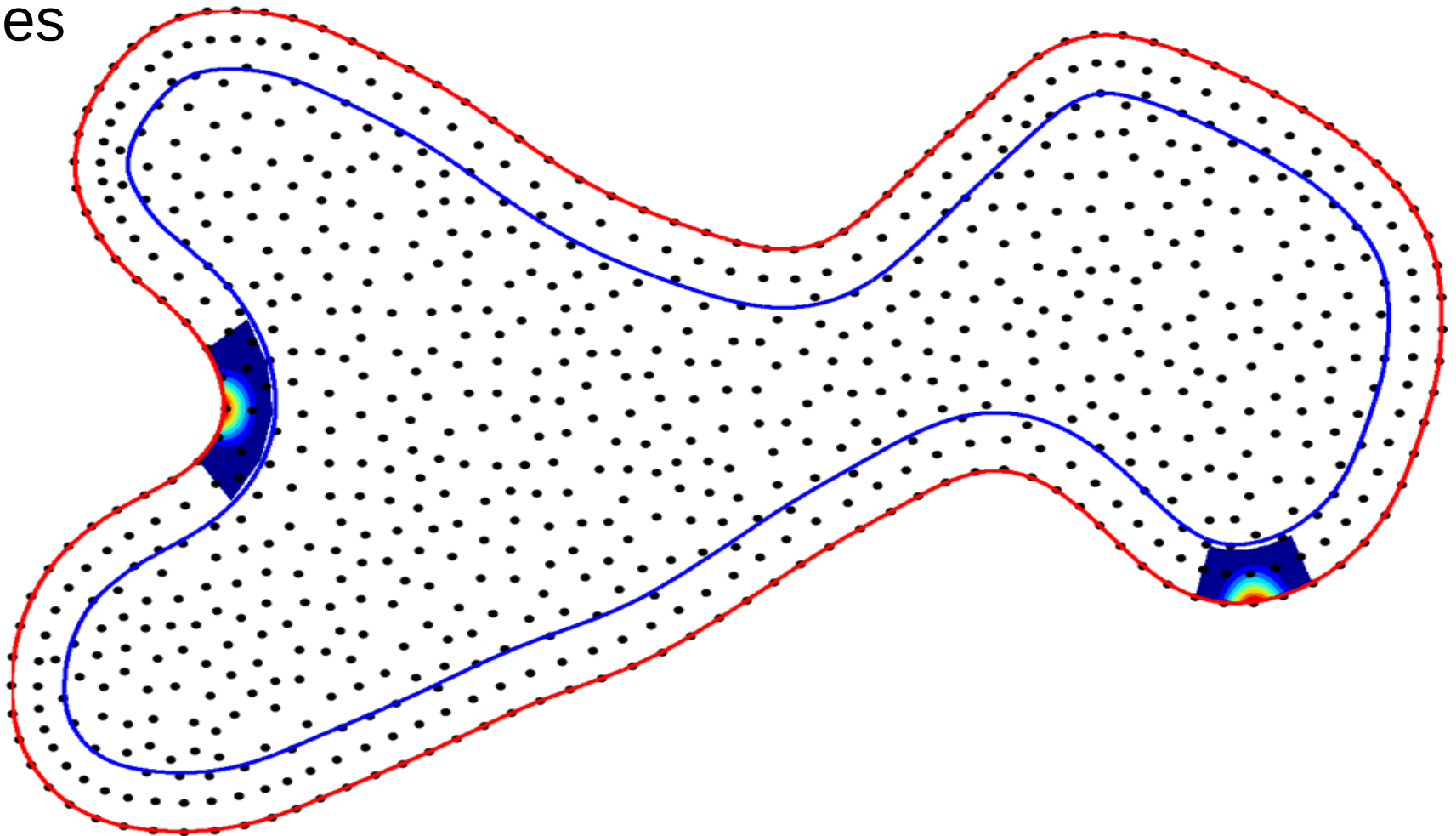
# Blending B-Splines and max-ent

- CAD description of the boundary (B-Spline curve)
- Single layer of Isogeometric (B-Spline + isoparametric mapping) basis functions
- **Isoparametric mapping** (control points involved shown in green)



# Blending B-Splines and max-ent

- The distribution of the **interior points** is unstructured
- The basis functions are purely **isogeometric for boundary nodes**



# Blending B-Splines and max-ent

- Blending scheme: convex optimization problem
  - Imposition of reproducibility conditions
  - The interior basis functions are unknown

Iso/LME basis function

For fixed  $\mathbf{x}$  minimize 
$$\sum_{a \in \mathcal{J}_{ME}} m_a \ln m_a + \sum_{a \in \mathcal{J}_{ME}} \beta_a m_a |\mathbf{x} - \mathbf{x}_a|^2$$

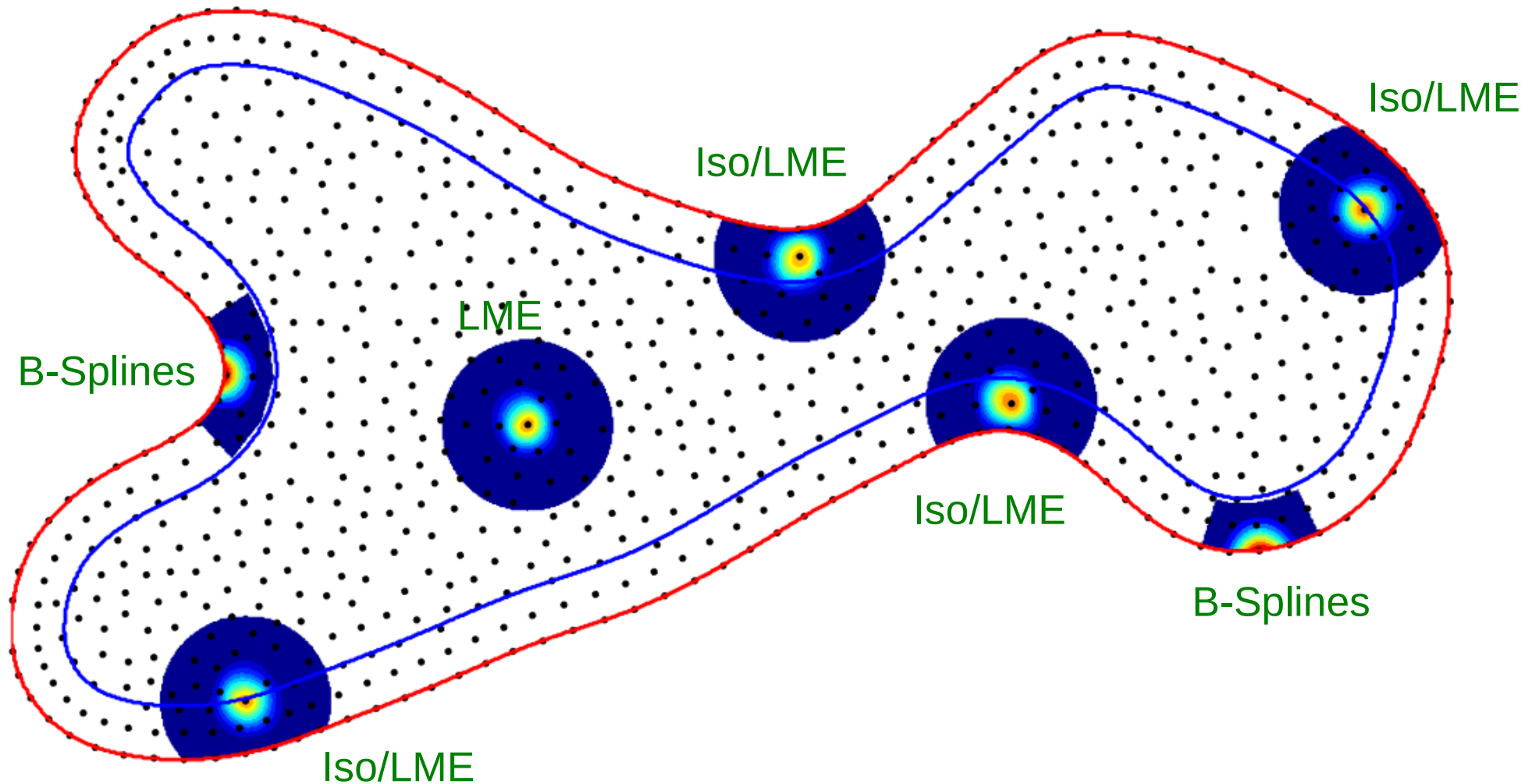
subject to  $m_a \geq 0, \quad a \in \mathcal{J}_{ME}$  B-Splines

Interior Nodes 
$$\sum_{a \in \mathcal{J}_{ME}} m_a + \sum_{b \in \mathcal{J}_{BS}} N_b(\mathbf{x}) = 1$$
 Boundary nodes

$$\sum_{a \in \mathcal{J}_{ME}} m_a \mathbf{x}_a + \sum_{b \in \mathcal{J}_{BS}} N_b(\mathbf{x}) \mathbf{x}_b = \mathbf{x}.$$

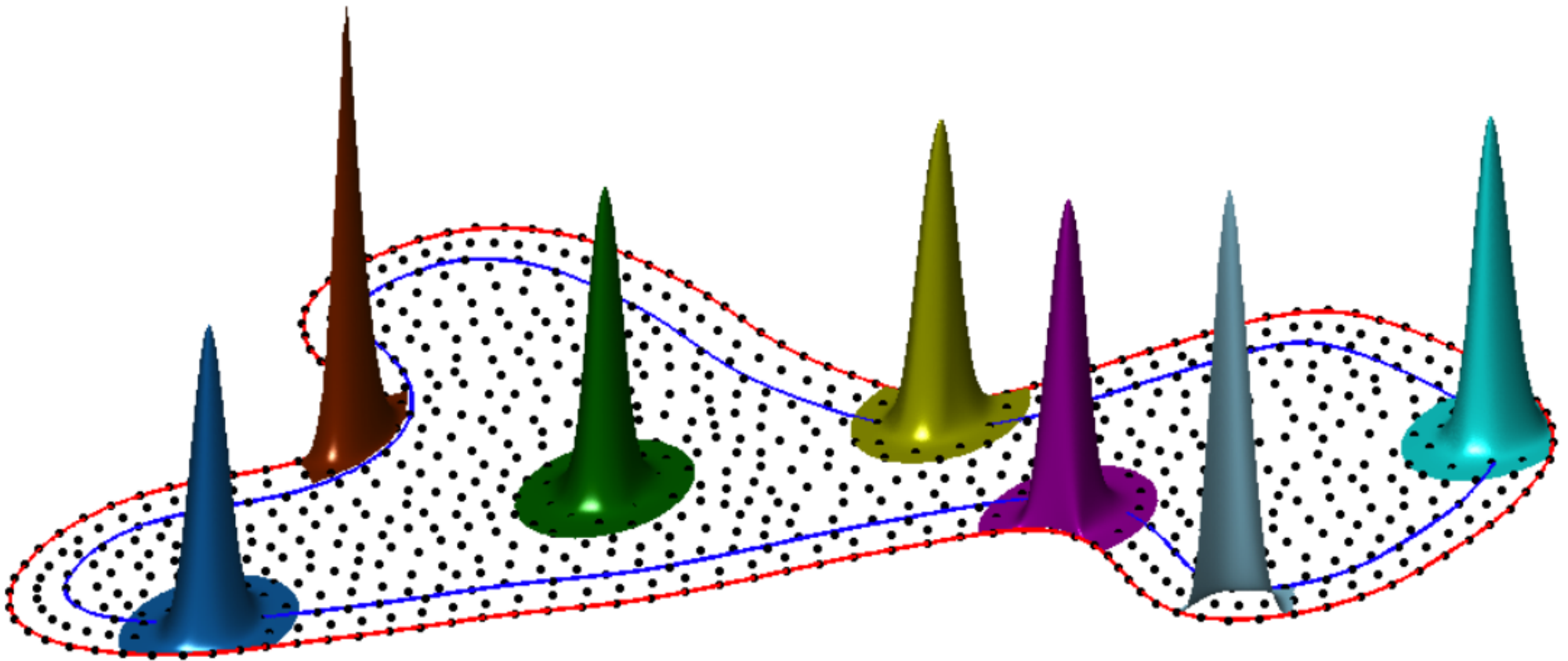
# Blending B-Splines and max-ent

- Top view of B-Splines, local maximum-entropy (LME) approximants, and isogeometric/LME basis functions



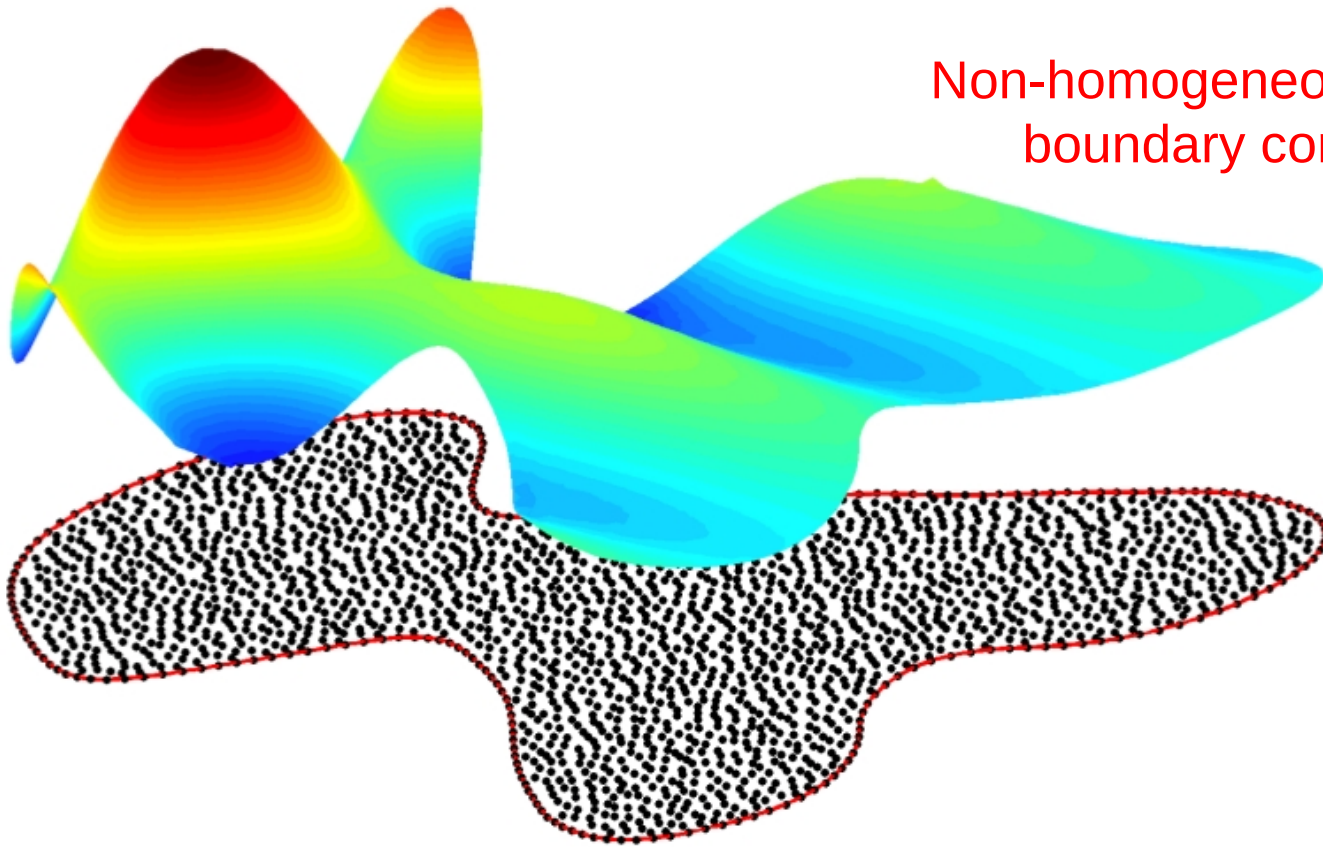
# Blending B-Splines and max-ent

- 3D view of B-Splines, local maximum-entropy (LME) approximants, and isogeometric/LME basis functions

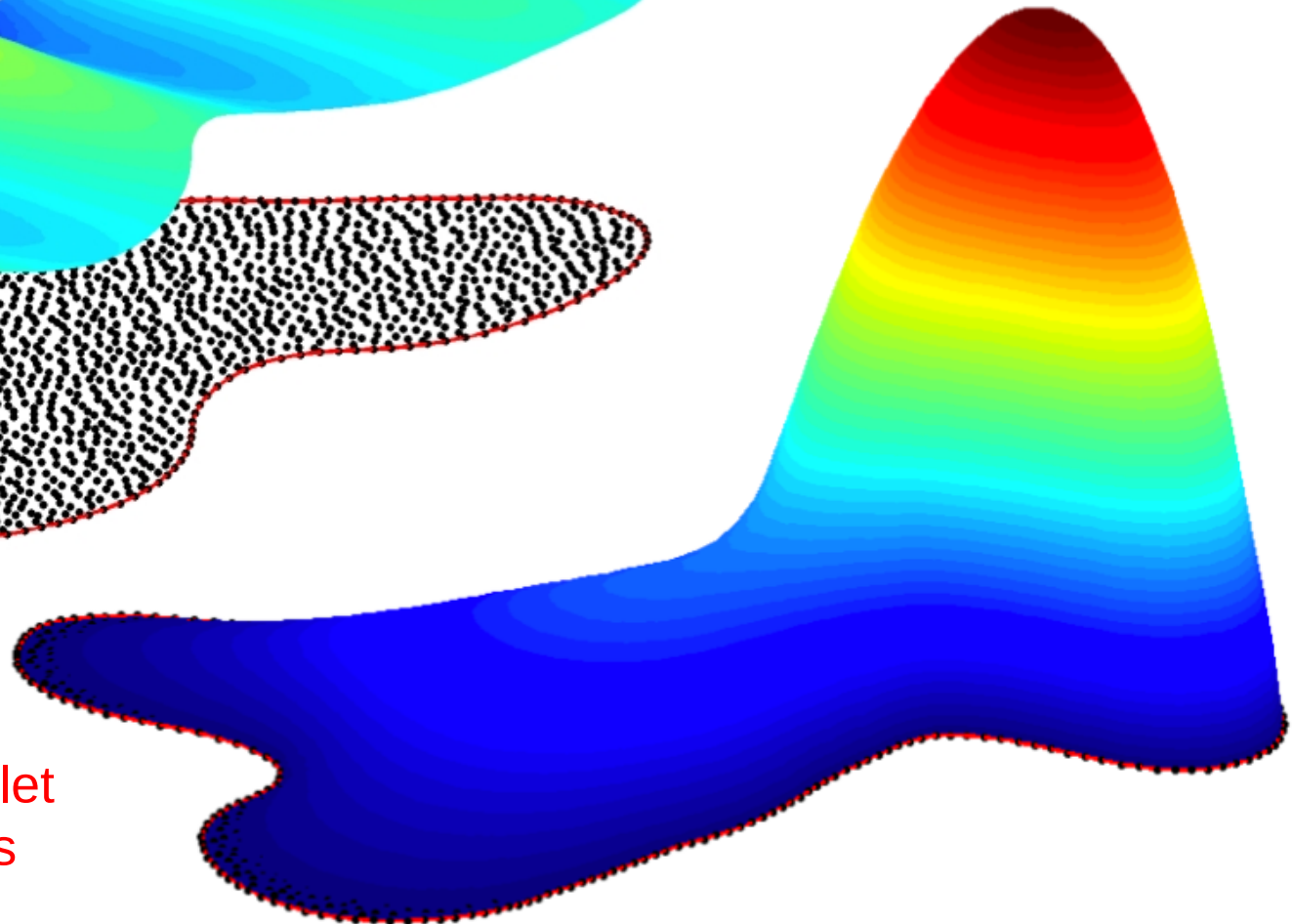


# Blending B-Splines and max-ent

Non-homogeneous Dirichlet  
boundary conditions



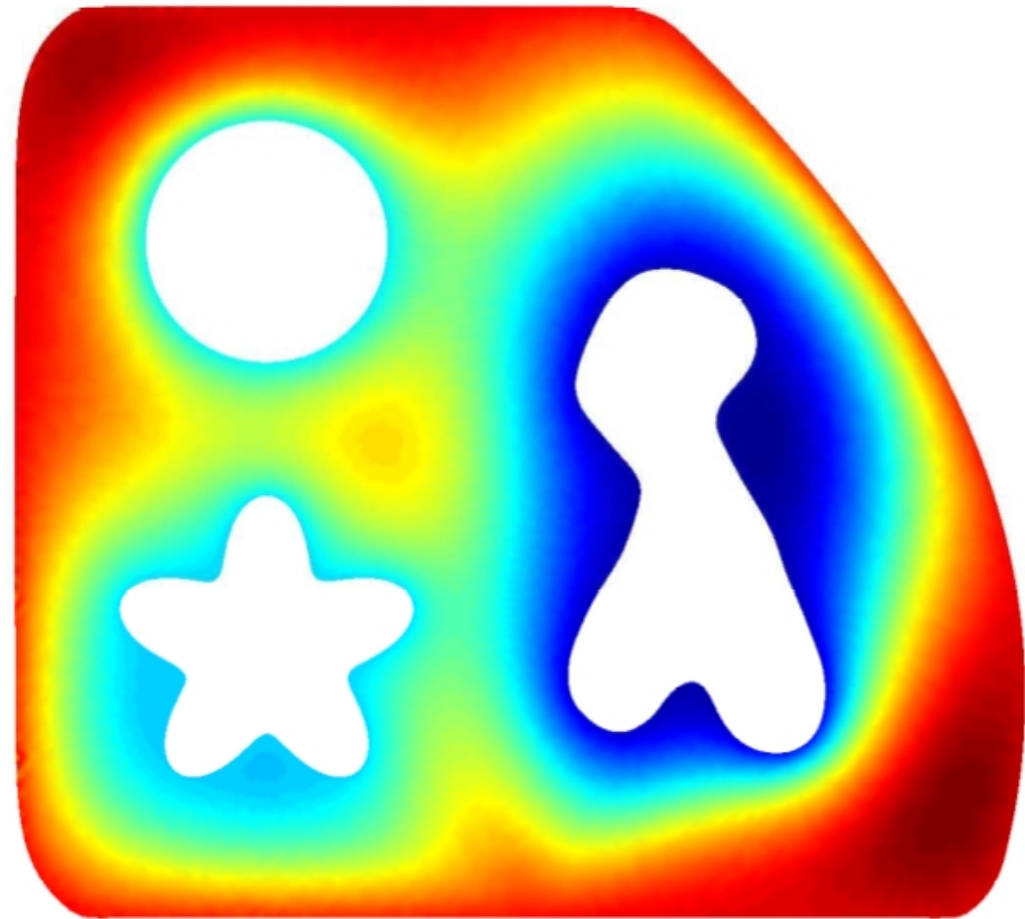
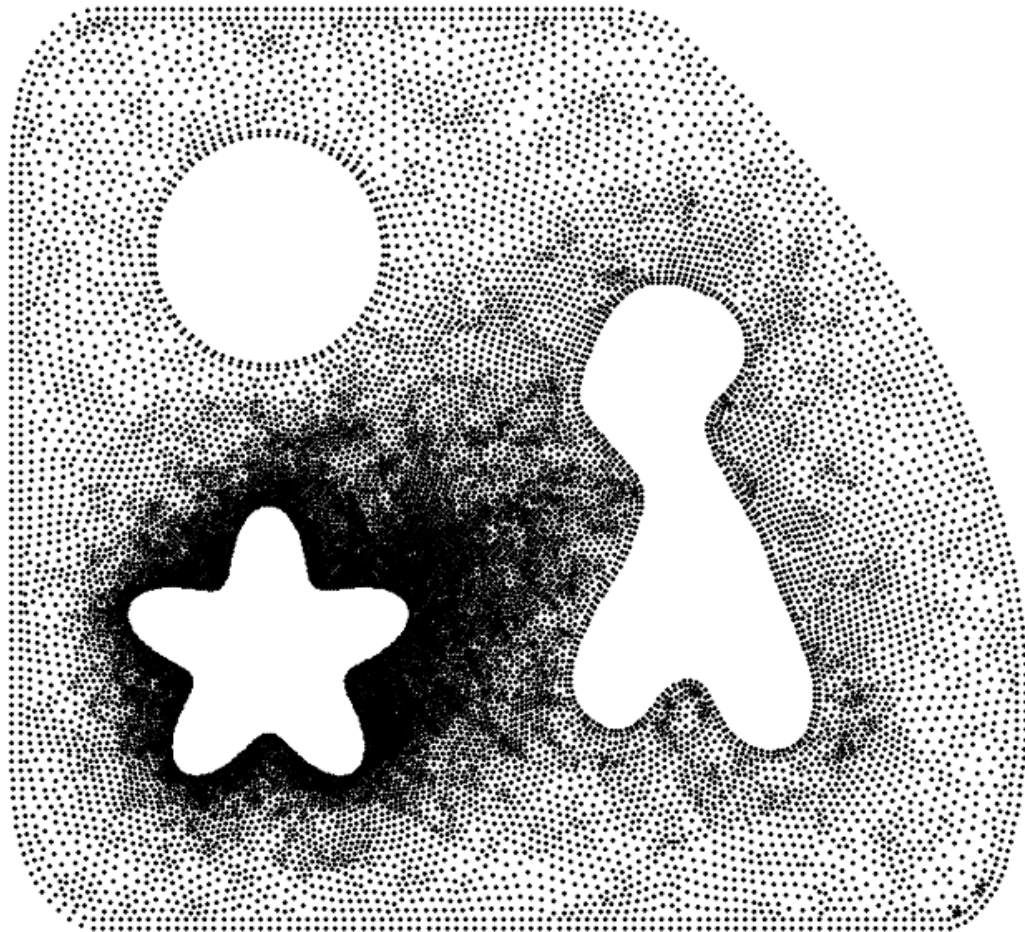
Homogeneous Dirichlet  
boundary conditions



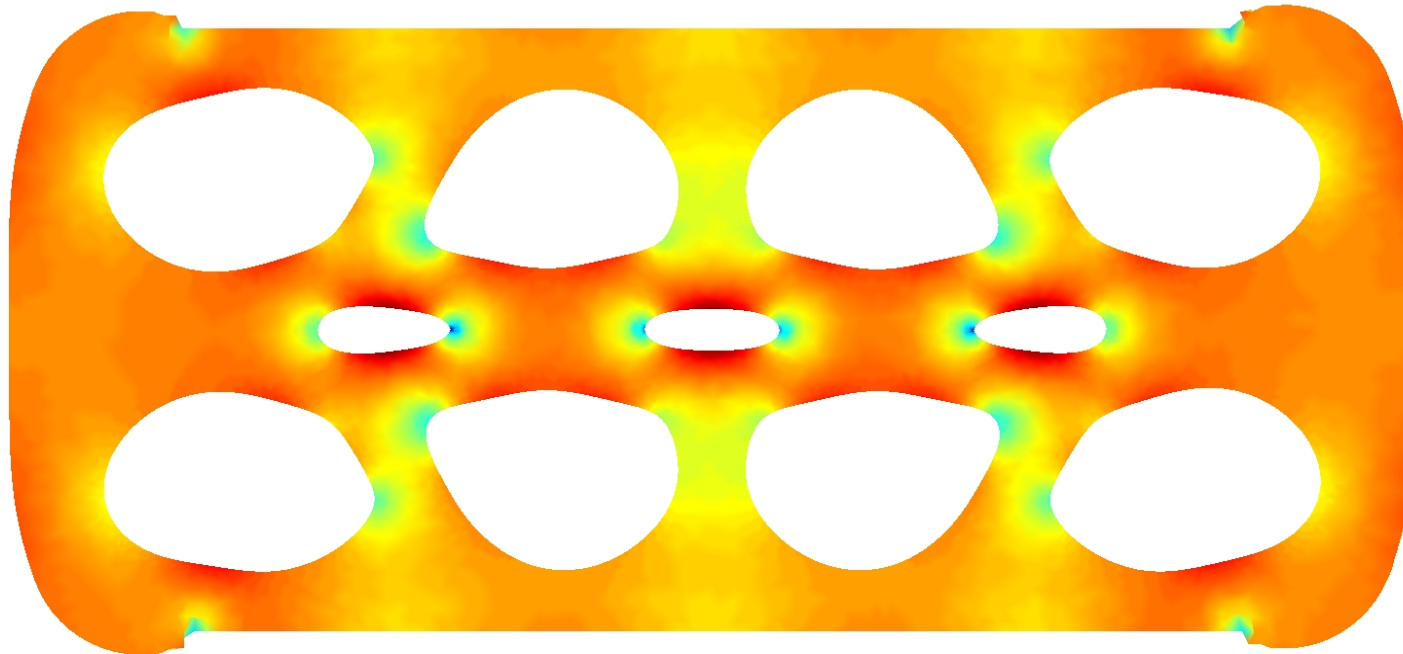
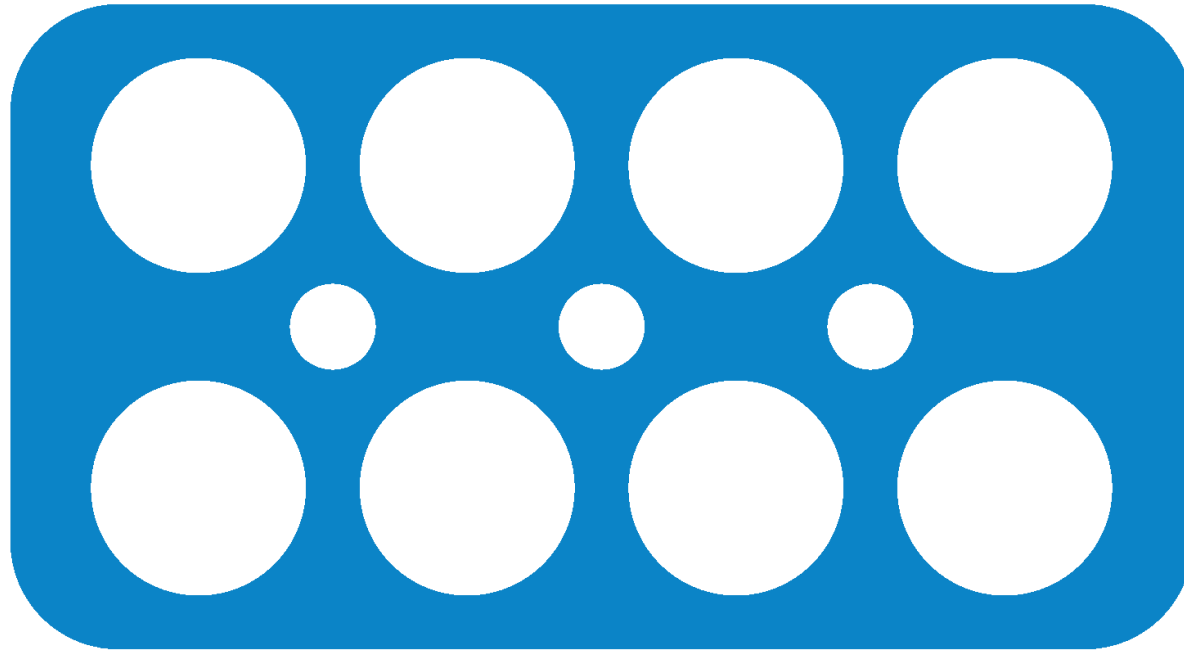


# Blending B-Splines and max-ent

- Three holes, prescribed data on the boundaries, non uniform mesh
- Isogeometric requires significant preprocessing, partitioning of the domain in patches, specialized techniques to have global smoothness



# Blending B-Splines and max-ent





# Blending B-Splines and max-ent

- Conclusions
  - We present a method to blend maximum-entropy approximants and B-Splines
  - The proposed method exploits the best features and overcomes the main drawbacks of isogeometric analysis and local maximum approximation schemes
- Open line of research
  - Developments of appropriate tools to facilitate the preprocessing work for 3D problems

Thank you for your attention