

WCSMO-8



# Topology Optimization with Polygonal Finite Elements

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# Motivation



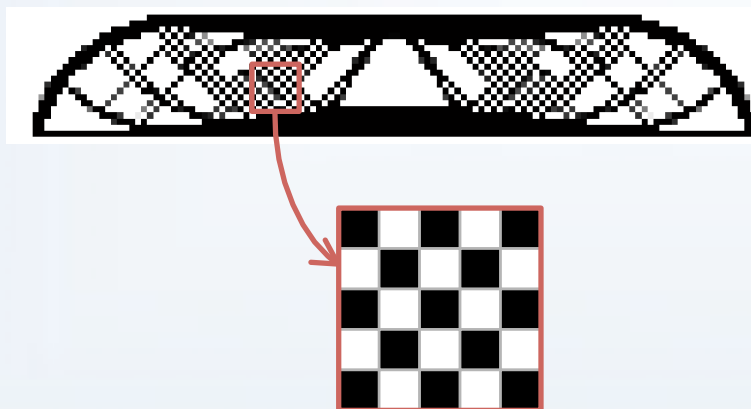
- ❖ In topology optimization, parameterization of shape and topology of the design has been traditionally carried out on uniform grids
- ❖ Conventional approaches use uniform meshes consisting of Lagrangian-type finite elements (e.g. linear quads) to simplify domain discretization and the analysis routine
- ❖ As a result of this choice, numerical artifacts such as the well-known **checkerboard** pathology and **one-node connections** may appear

# Motivation

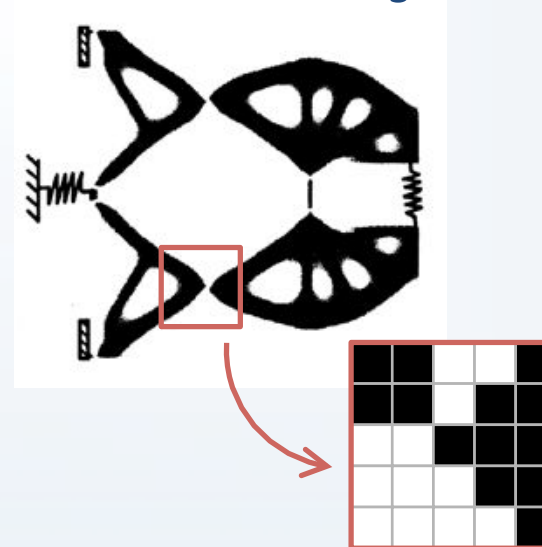


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- ❖ Conventional approaches use uniform meshes consisting of Lagrangian-type finite elements (e.g. linear quads) to simplify domain discretization and the analysis routine

*Checkerboard:*



*One-node hinges:*



# Motivation



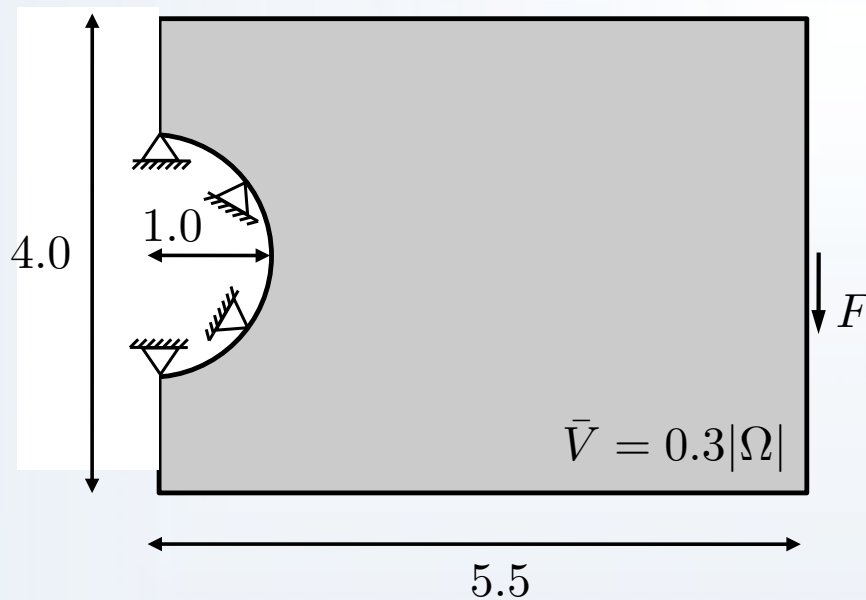
- ❖ A problem less often noted is that the **constrained geometry** of structured grids can cause bias in the orientation of members, leading to mesh-dependent sub-optimal designs

# Motivation

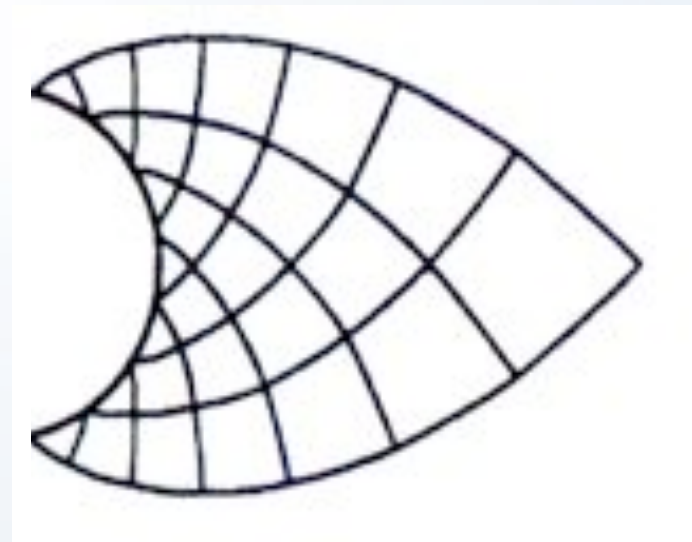


- ❖ A problem less often noted is that the **constrained geometry** of structured grids can cause bias in the orientation of members, leading to mesh-dependent sub-optimal designs

*Problem definition:*



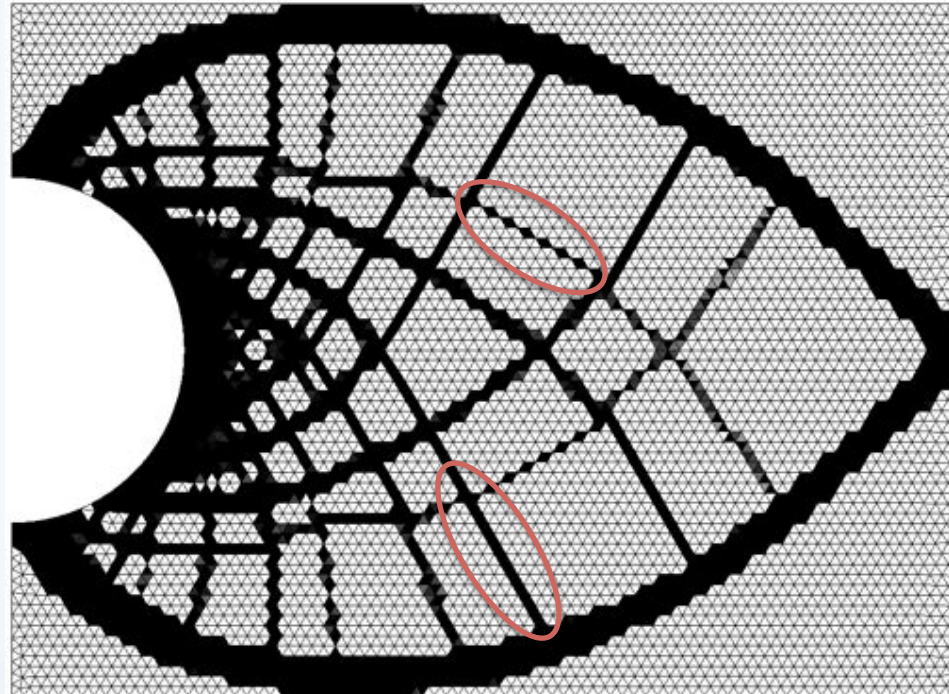
*Michell-type solution:*



# Motivation



- ❖ If the geometric attributes of the mesh are too restricting, certain characteristic patterns of the optimal solution may be excluded from the final design

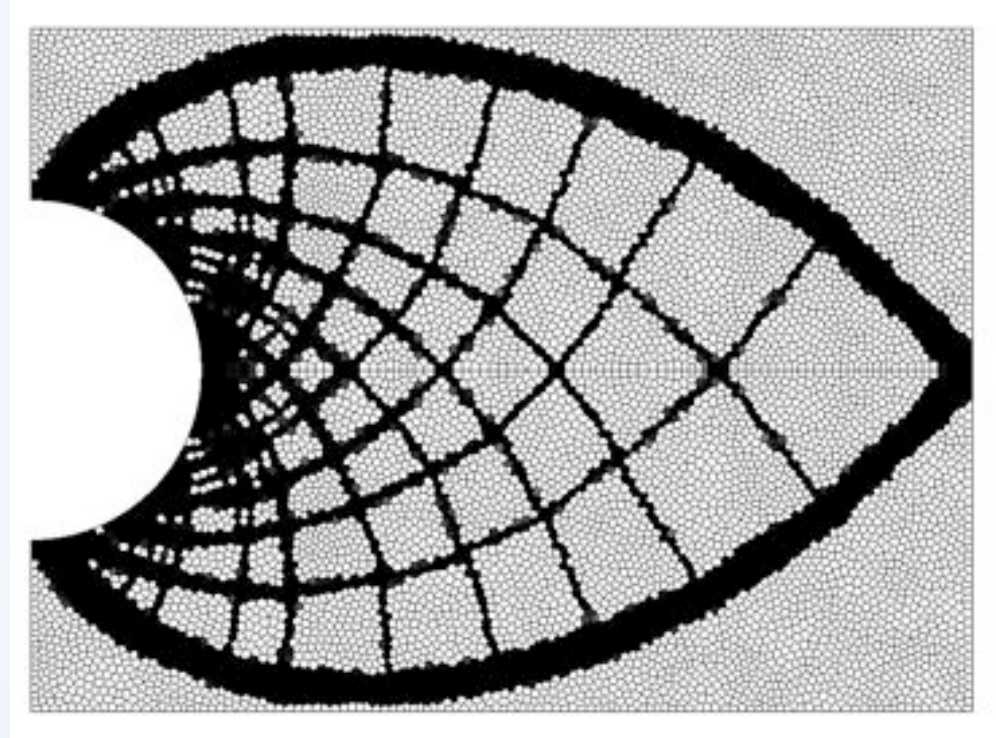


*Solution based on a structured mesh with 8584 T6 elements*

# Motivation



- ❖ In this work, we examine the use of irregular meshes consisting of convex polygons in topology optimization to address the abovementioned issues

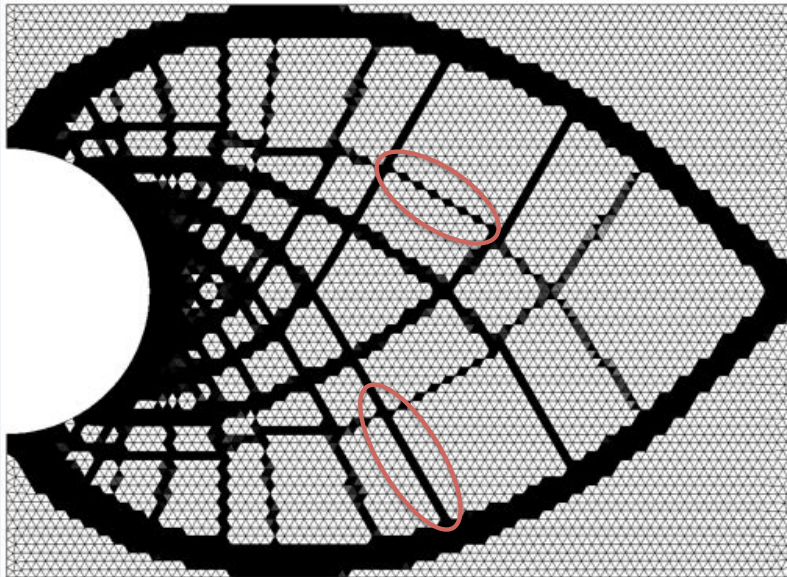


*Solution based on a Voronoi mesh with 10000 elements*

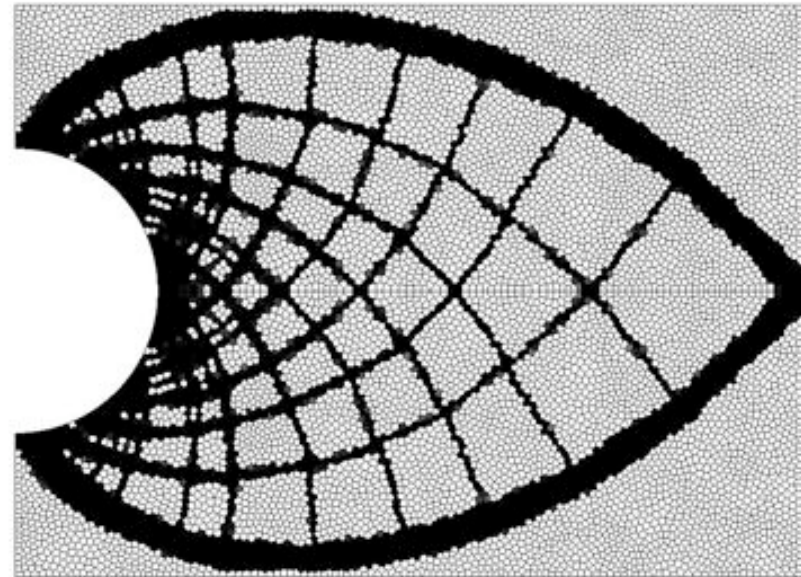
# Motivation



- ❖ In addition to possessing higher degree of geometric isotropy, these meshes allow for greater flexibility in discretizing complex domains without suffering from numerical instabilities.



*Solution based on a T6 mesh*



*Solution based on a Voronoi mesh*



# Outline



- ❖ Motivation
- ❖ Polygonal mesh generation
- ❖ Finite element scheme
- ❖ Numerical results
- ❖ Concluding remarks

# Voronoi diagrams



- ❖ Let  $P = \{p_i\}_{i=1}^n$  denote a set of points in domain  $\Omega$ . The Voronoi diagram of  $P$  corresponds to a partitioning of the domain into cells:

$$V_i = \bigcap_{\forall j, j \neq i} \{\mathbf{x} \in \Omega : \delta(\mathbf{x}, p_i) \leq \delta(\mathbf{x}, p_j)\}, \quad i = 1, \dots, n$$

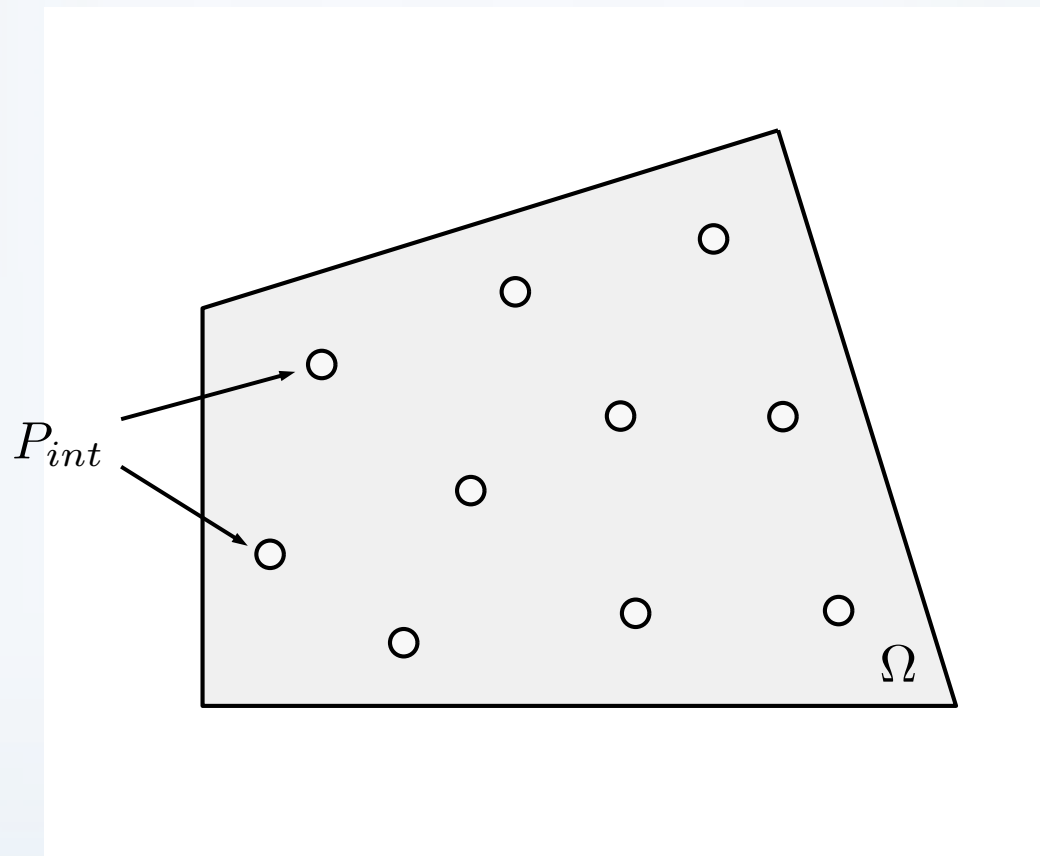
i.e., each cell consists of points closer to the corresponding seed than any other point in the set

- ❖ A polygonal discretization of  $\Omega$  can be generated from  $P$  by including additional points such that the resulting Voronoi diagram incorporates an approximation to the boundary  $\partial\Omega$

# Meshing algorithm



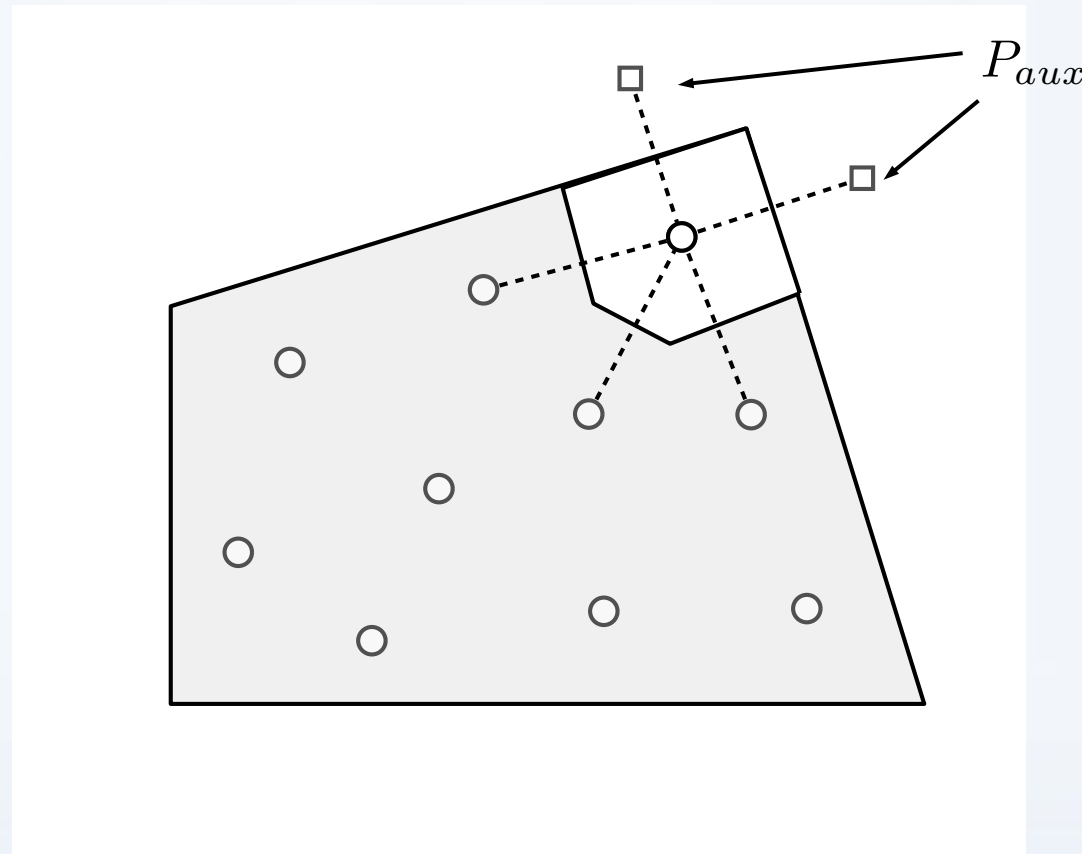
**Step 1:** The interior of  $\Omega$  is populated with a desired number of generating seeds. We denote this point set by  $P_{int}$



# Meshing algorithm



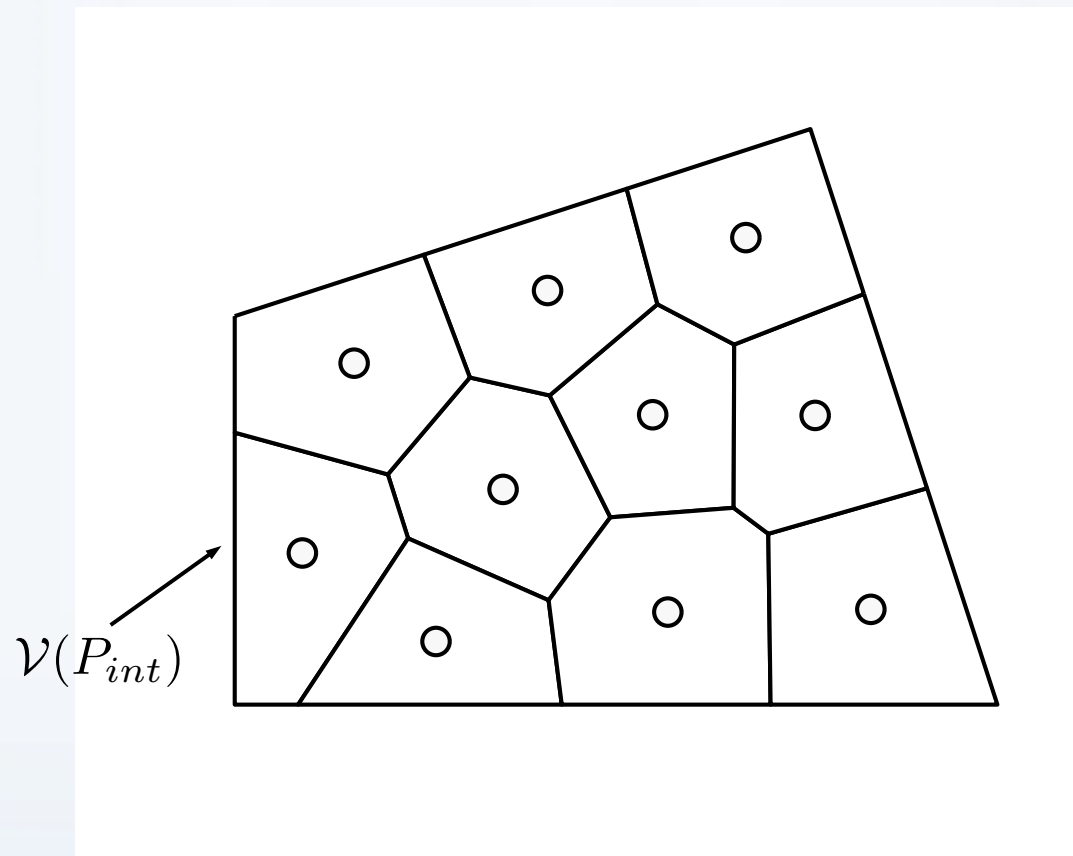
Step 2,3: The interior points are reflected about the edges of the domain and Voronoi diagram of  $P = P_{int} \cup P_{aux}$



# Meshing algorithm



Step 4: A polygonal discretization of the domain is given by the cells associated to  $P_{int}$



# Centroidal Voronoi Tessellations



- ❖ A Voronoi tessellation is **centroidal** if each generating point coincides with the centroid of the corresponding Voronoi cell:

$$p_i = \bar{p}_i \quad \forall i = 1, \dots, n \quad \text{where} \quad \bar{p}_i := \frac{\int_{V_i} \mathbf{x} \mu(\mathbf{x}) d\mathbf{x}}{\int_{V_i} \mu(\mathbf{x}) d\mathbf{x}}$$

- ❖ Alternatively, CVT can be thought of as minimizers of energy:

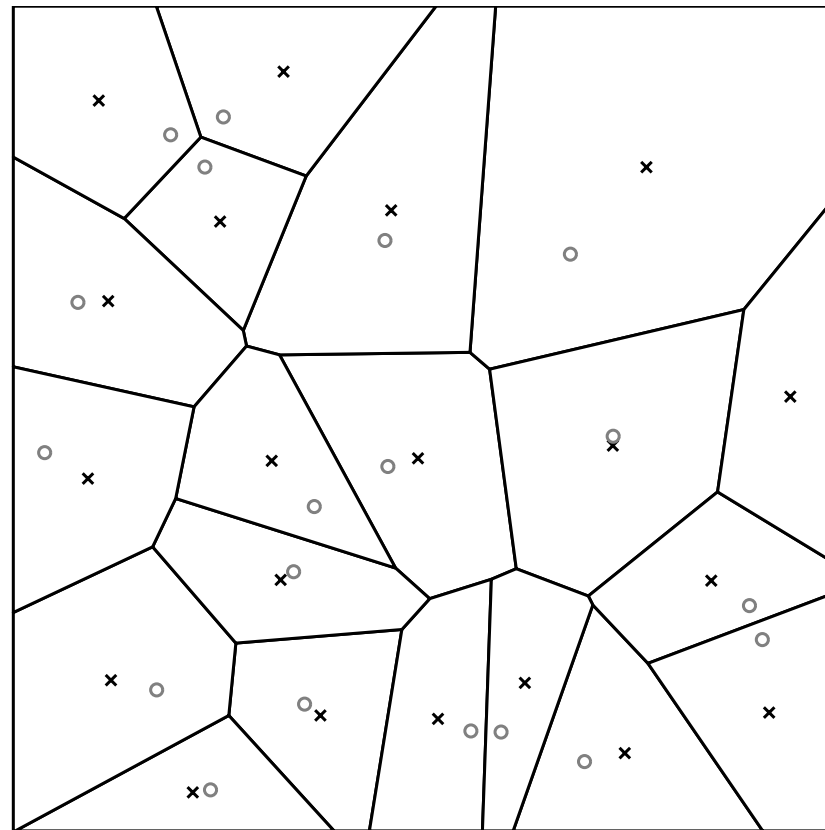
$$\mathcal{E}(P) = \sum_{i=1}^n \int_{V_i} |\mathbf{x} - p_i|^2 \mu(\mathbf{x}) d\mathbf{x}$$

- ❖ Lloyd's algorithm constructs CVTs by replacing the seeds by the centroids of the corresponding cells

# Lloyd's algorithm



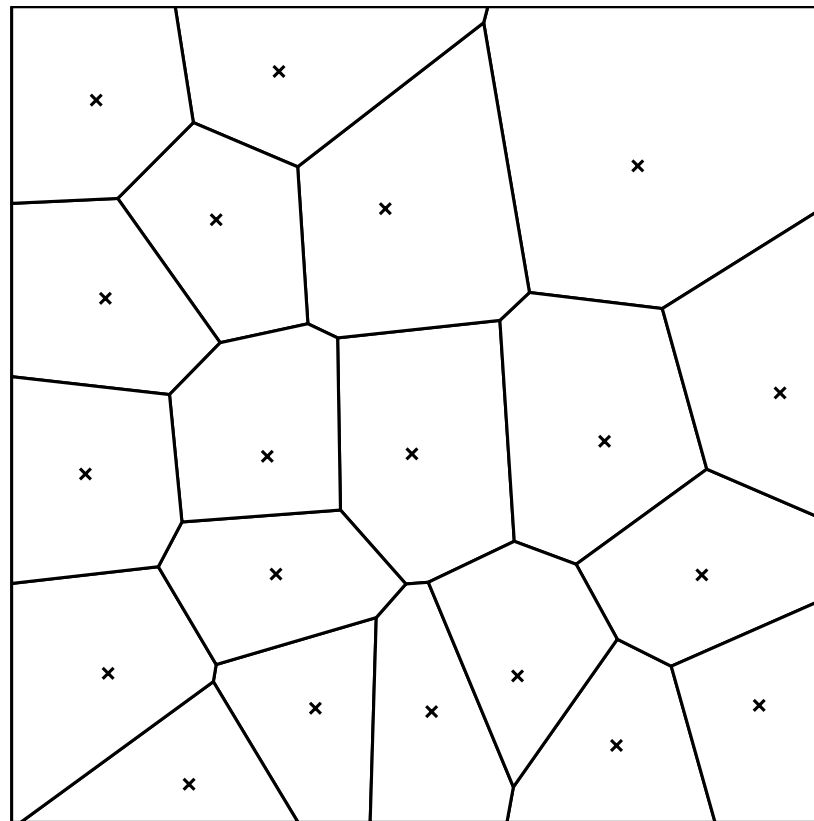
- ❖ Random seeds (o's) and centroids of the cells (x's):



# Lloyd's algorithm



- ❖ After one iteration (i.e., diagram generated by centroids)

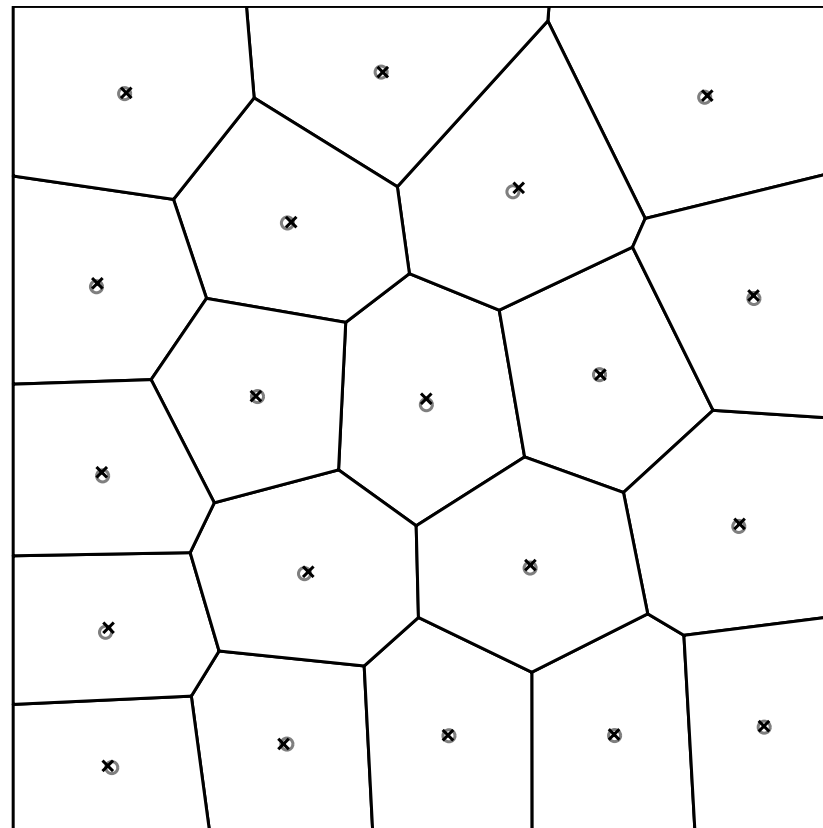




# Lloyd's algorithm



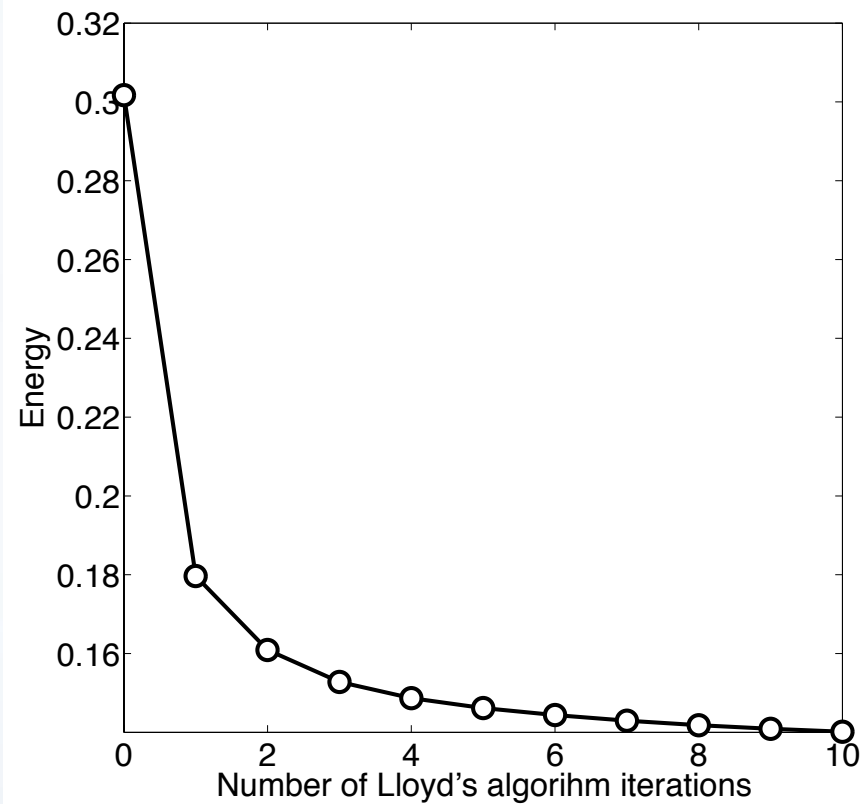
- ❖ After ten iterations, the diagram is nearly centroidal



# Lloyd's algorithm



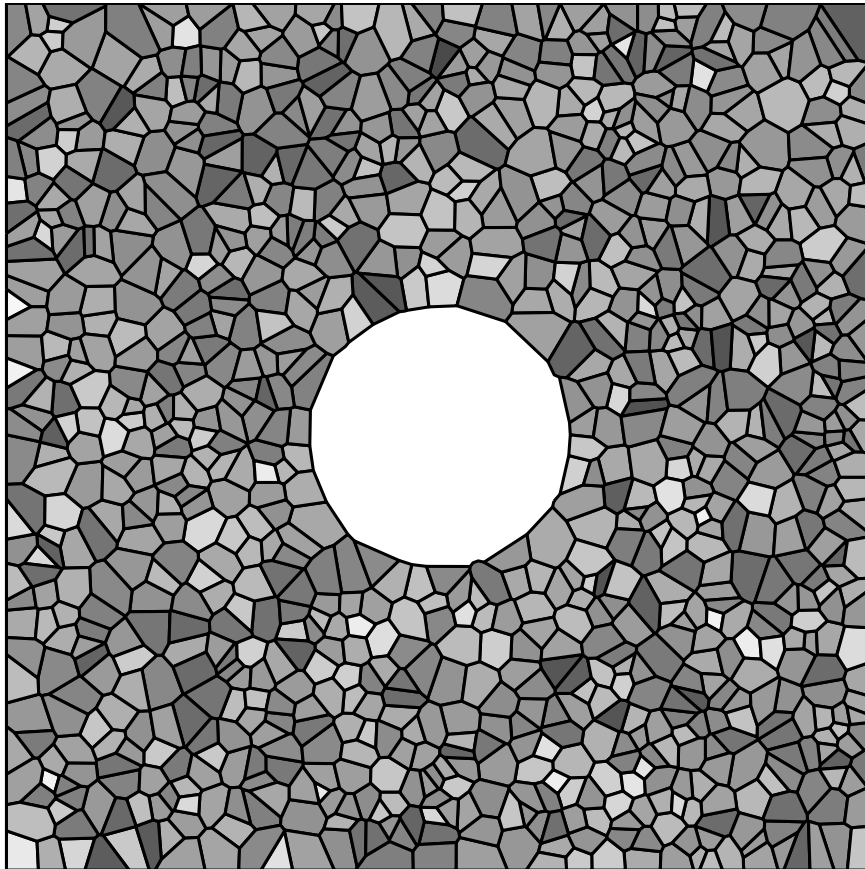
- ❖ The Lloyd's algorithm is locally convergent in energy



# Mesh quality

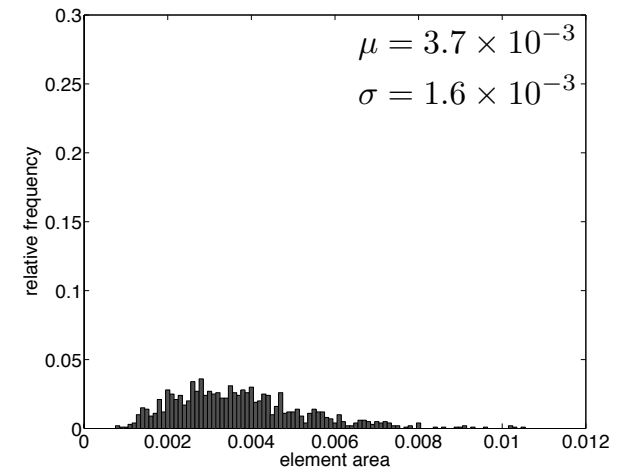


## ❖ Random

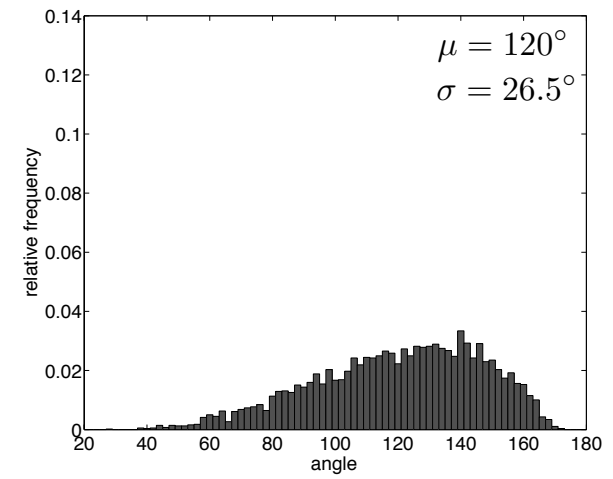


c.o.v of edge length

## element area



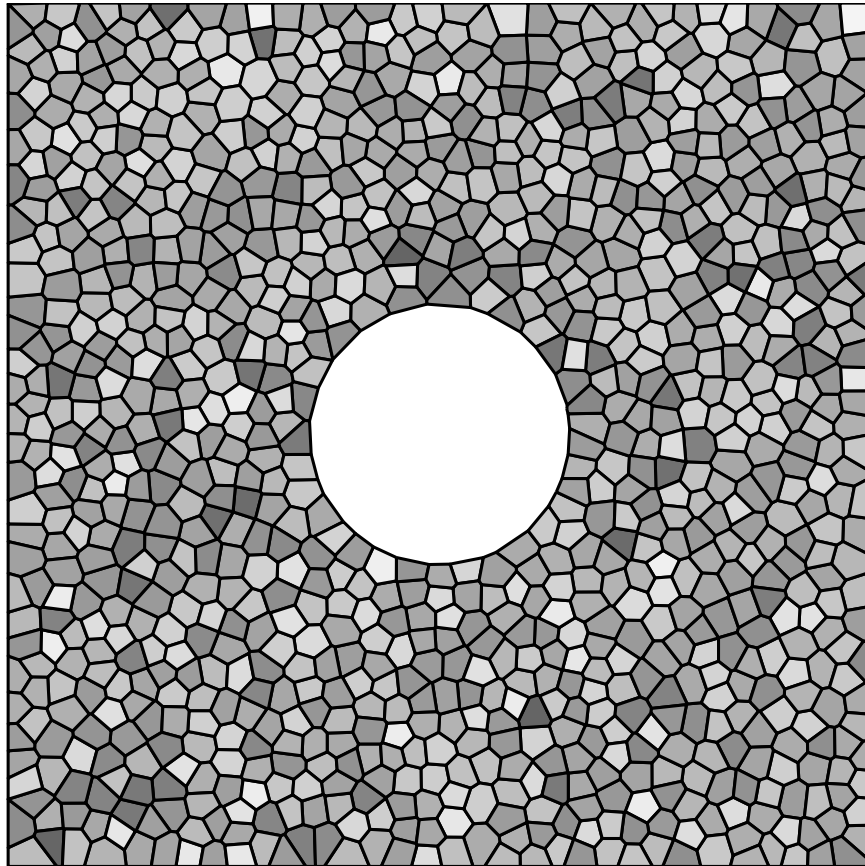
## interior angles



# Mesh quality

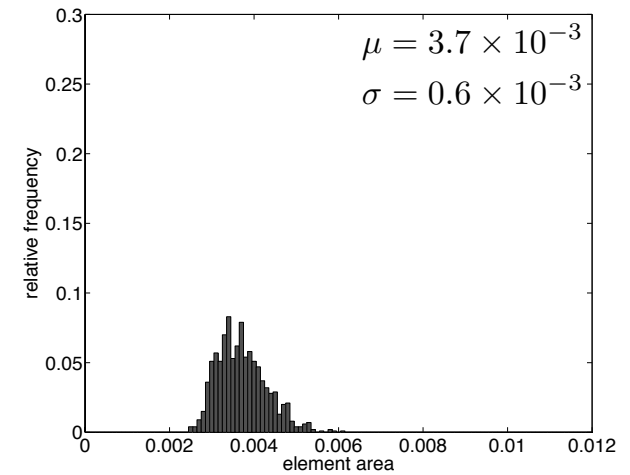


## ❖ Quasi-random

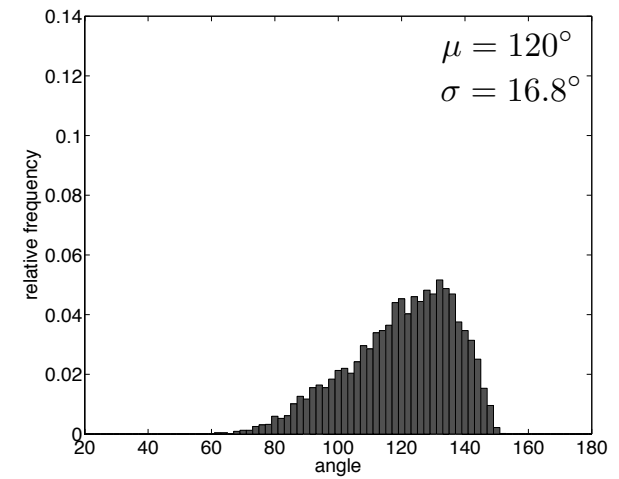


c.o.v of edge length

## element area



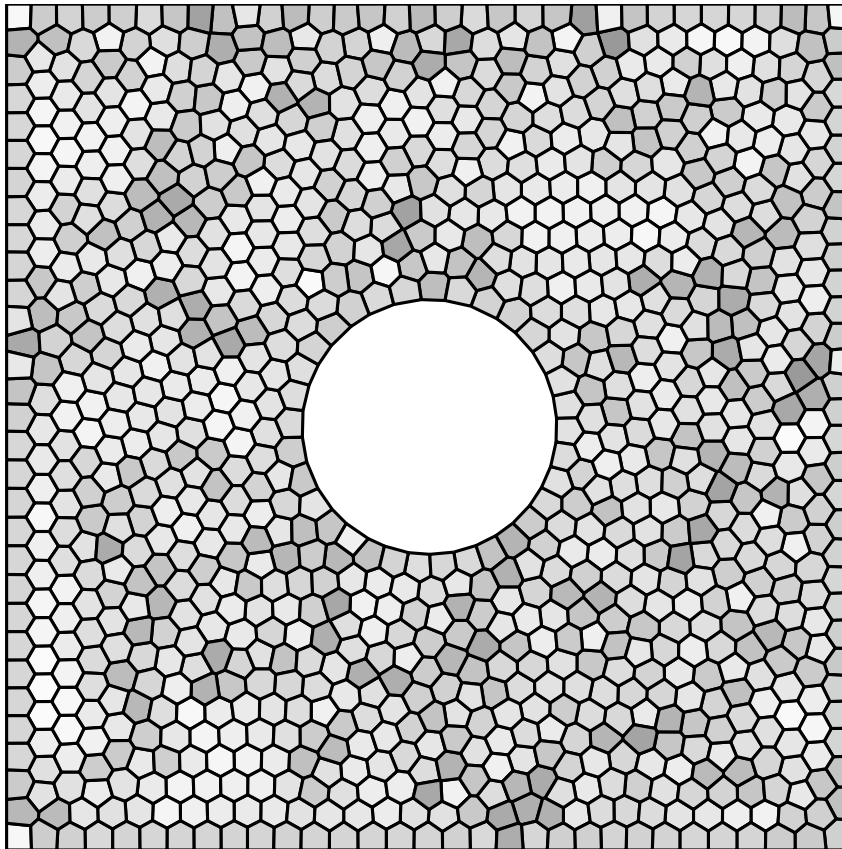
## interior angles



# Mesh quality

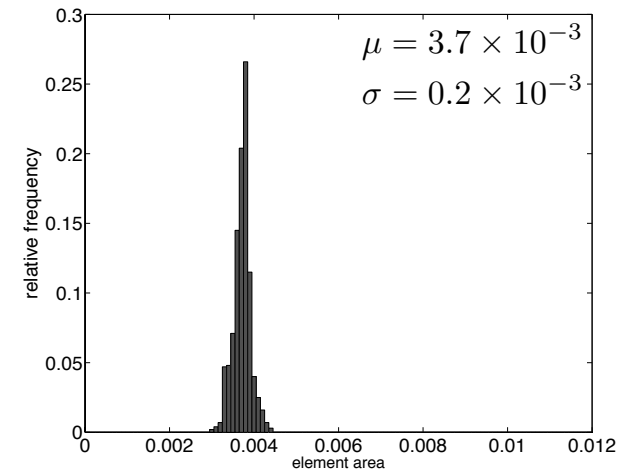


## ❖ CVT

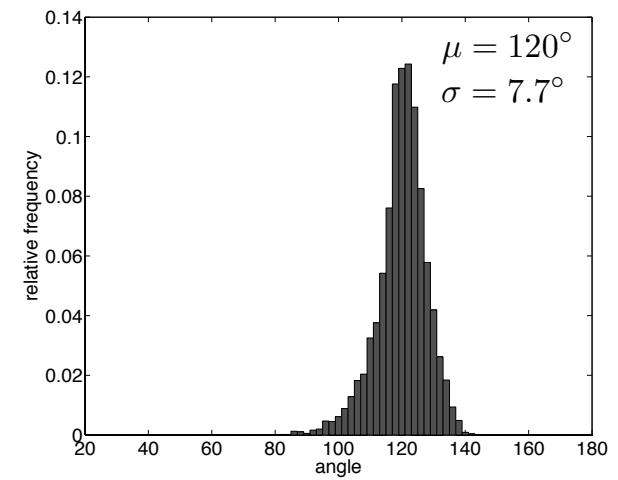


c.o.v of edge length

## element area



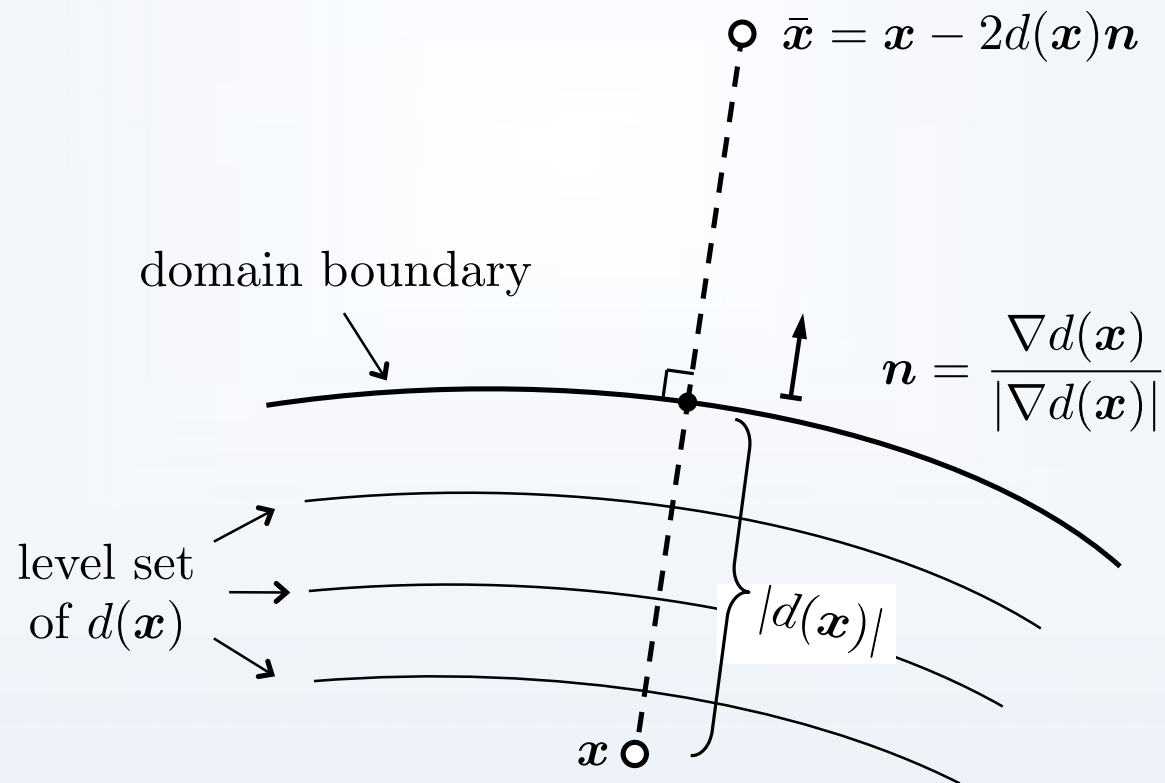
## interior angles



# Implicit description of geometry



- ❖ Placement and reflection of seeds can be carried out generically using an implicit description domain geometry
- ❖ In particular, the “signed distance” function,  $d(\mathbf{x})$ , can be used



# Construction of distance functions



- ❖ Some simple geometries and set operations:

Circle:  $d(\mathbf{x}) = |\mathbf{x} - \mathbf{x}_o| - r$

Half-plane  $x_1 \leq a$ :  $d(\mathbf{x}) = x_1 - a$

Union:  $d_{A \cup B}(\mathbf{x}) = \min(d_A(\mathbf{x}), d_B(\mathbf{x}))$

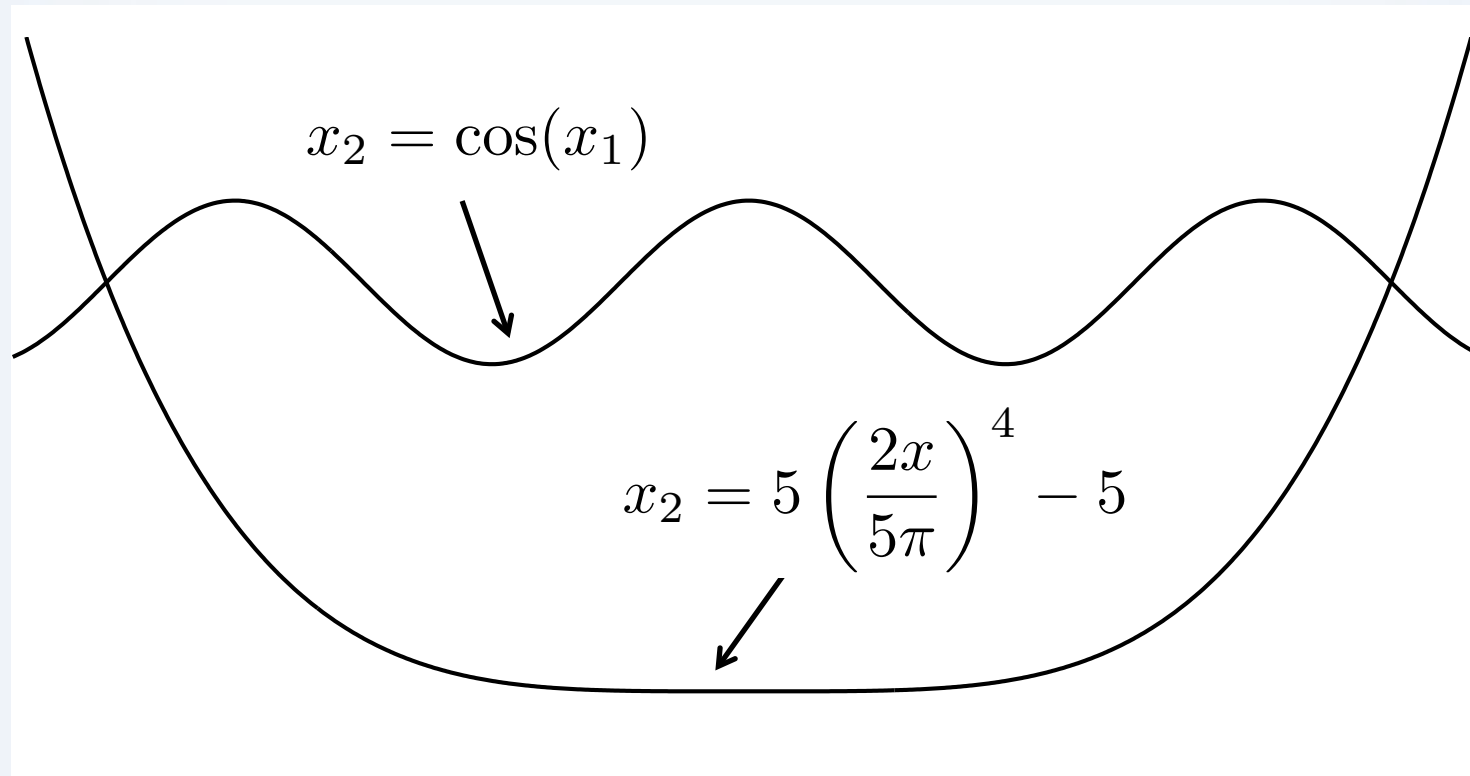
Intersection:  $d_{A \cap B}(\mathbf{x}) = \max(d_A(\mathbf{x}), d_B(\mathbf{x}))$

Difference:  $d_{A \setminus B}(\mathbf{x}) = \max(d_A(\mathbf{x}), -d_B(\mathbf{x}))$

# Implicit description of geometry



- ❖ Consider the following domain:



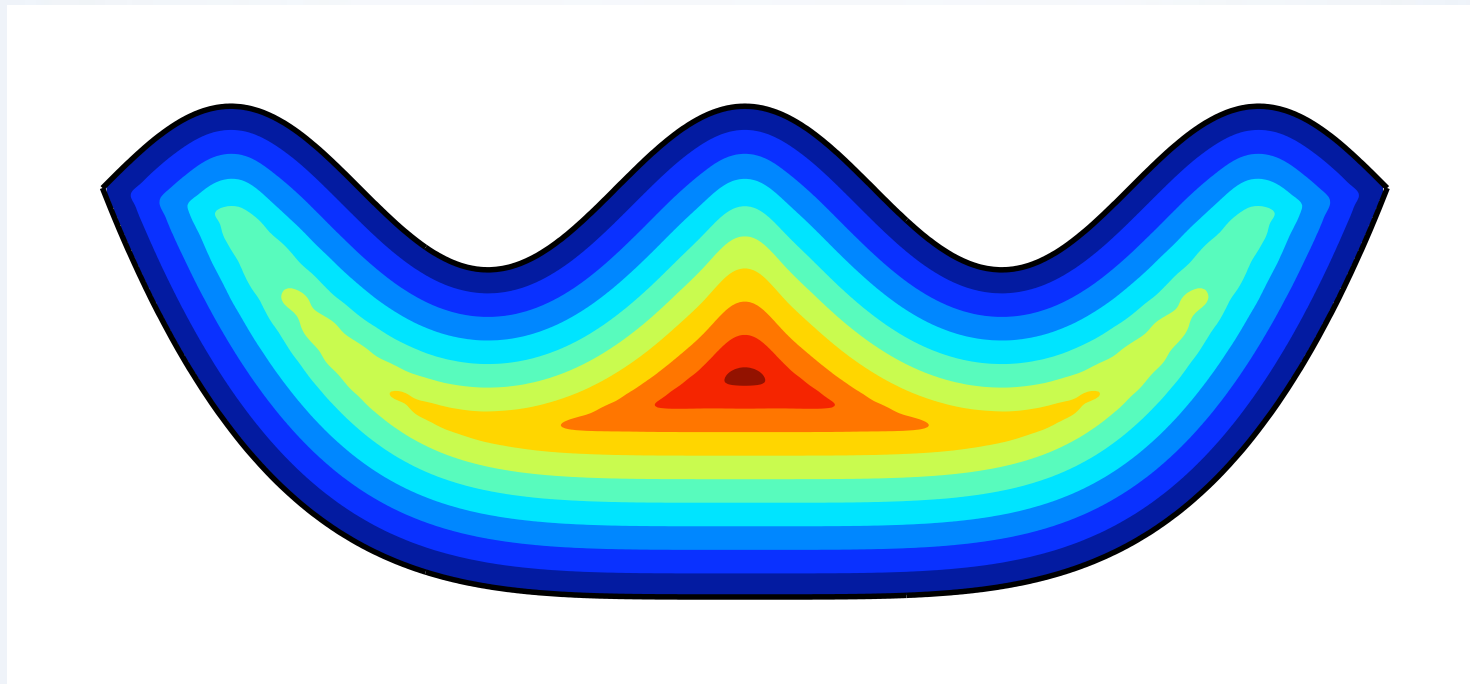
Domain boundary is the zero level set of  $f(x)$



# Implicit description of geometry



- ❖ The distance function is obtained by solving nonlinear system and basic set operations:

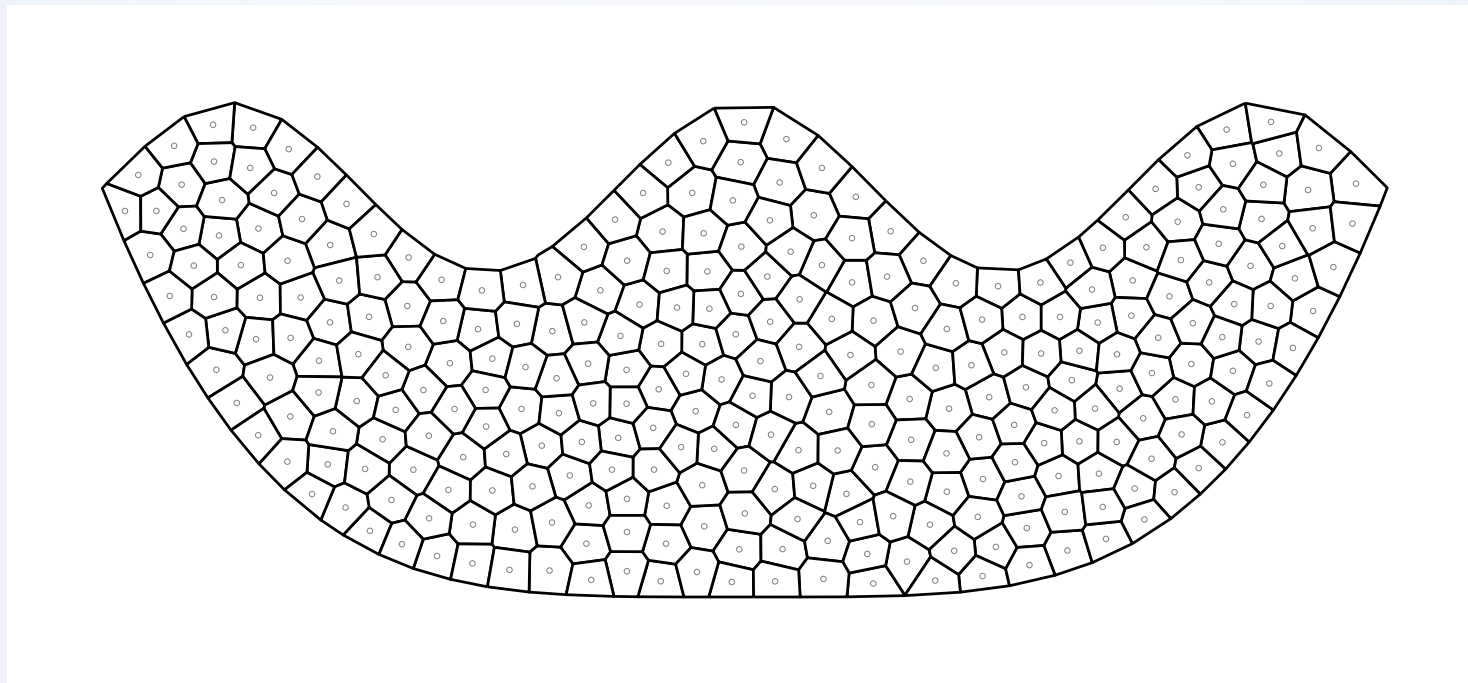


For each boundary:  $d(\mathbf{x}) = |\mathbf{x} - \mathbf{x}_p| \times \text{sgn}(f(\mathbf{x}))$

# Implicit description of geometry



- ❖ The final CVT mesh:



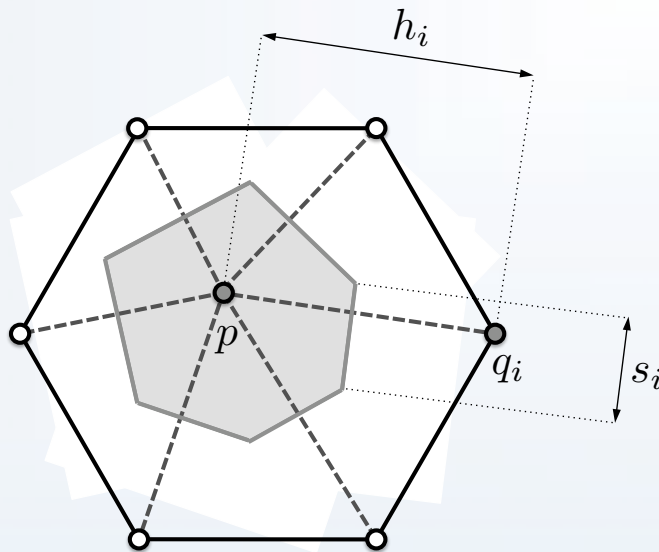
To capture the corners, seeds are reflected about both boundaries

# Finite element scheme

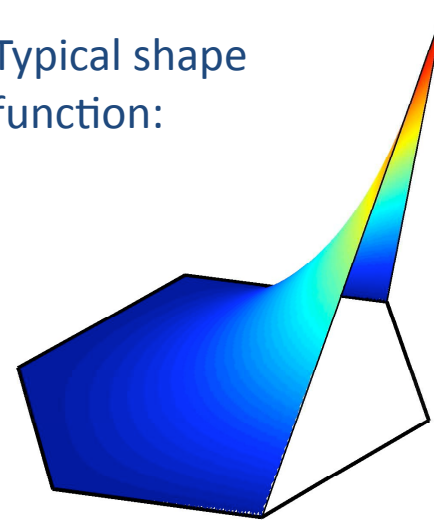


- ❖ The finite element scheme for polygonal elements is obtained based on notions of natural neighbors and natural neighbor functions
- ❖ For a convex polygon, the Laplace interpolant at an interior point is given by:

$$\phi_i(\mathbf{x}) = \frac{w_i(\mathbf{x})}{\sum_{i=1}^n w_i(\mathbf{x})} \quad \text{where} \quad w_i(\mathbf{x}) = \frac{s_i(\mathbf{x})}{h_i(\mathbf{x})}$$



Typical shape function:



# Finite element scheme



- ❖ By construction, the Laplace functions are non-negative, bounded and satisfy partition of unity:

$$0 \leq \phi_i(\mathbf{x}) \leq 1, \quad \sum_{i=1}^n \phi_i(\mathbf{x}) = 1$$

- ❖ These functions are linearly complete, thus convergence of the Galerkin method for second order partial differential equations is ensured:

$$\sum_{i=1}^n \mathbf{x}_i \phi_i(\mathbf{x}) = \mathbf{x}$$

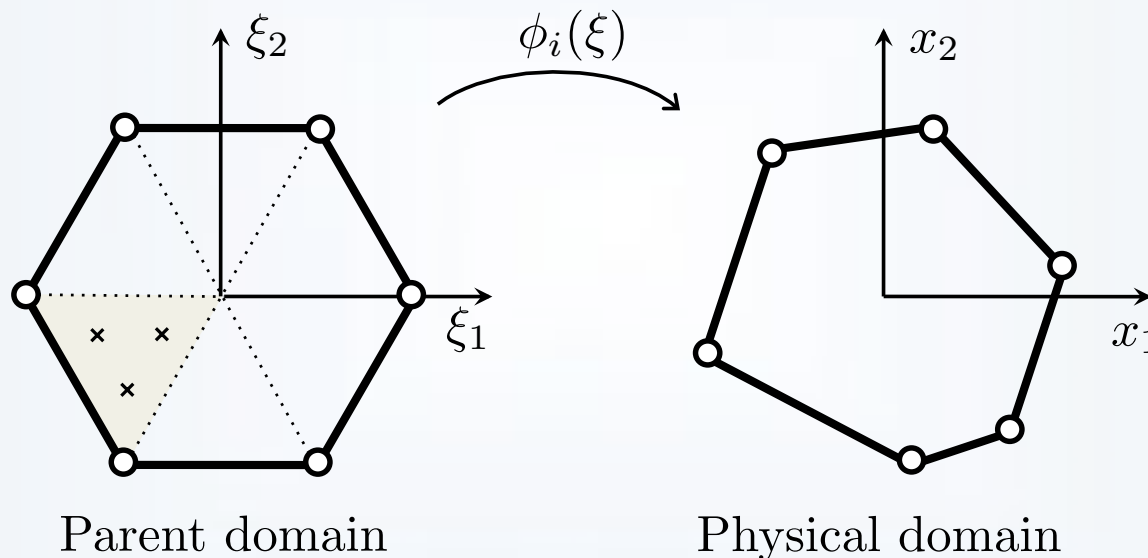
- ❖ Moreover, they are linear on the boundary of the element and satisfy the Kronecker-delta property:

$$\phi_i(\mathbf{x}_j) = \delta_{ij}$$

# Finite element scheme



- ❖ The affine mapping defined by the shape functions can represent any convex polygon, and thus the Voronoi meshes can be supported by the set of reference regular  $n$ -gons.

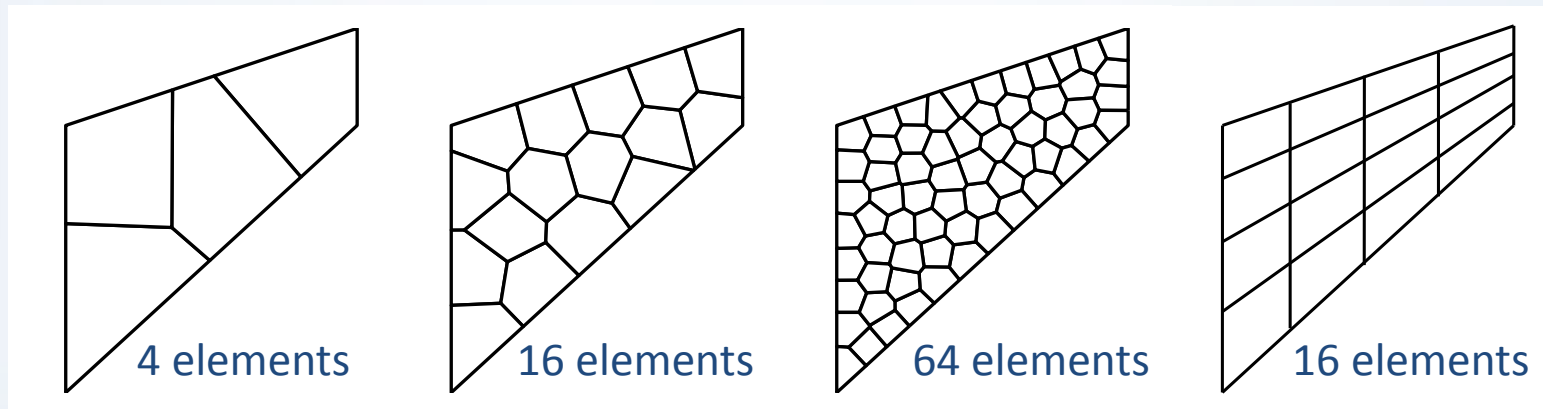
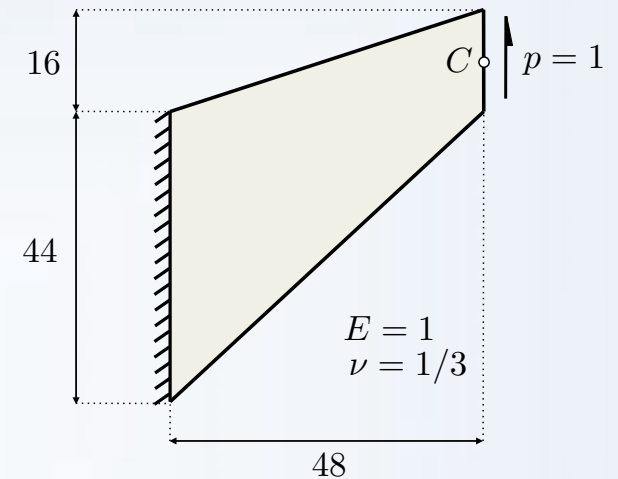


- ❖ The resulting finite elements for  $n = 3$  and  $n = 4$  are identical to popular constant strain triangles and bilinear quadrilateral, respectively.

# Performance of Polygonal FEM



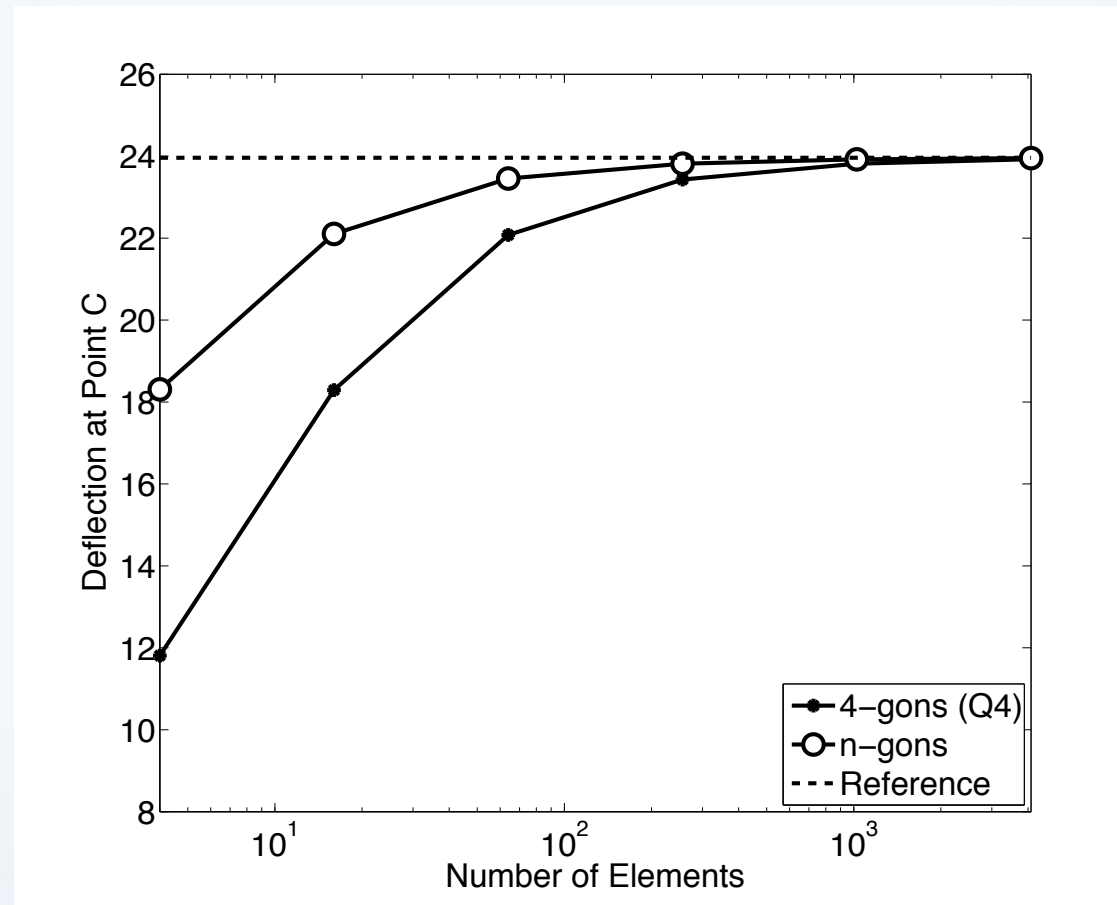
- ❖ Consider Cook's problem consisting of a tapered swept panel subjected to uniform shear loading:
- ❖ Quantity of interest is the tip deflection at mid-depth of the panel tip (point  $C$ )
- ❖ The results using quadrilateral (progressive refinement) and polygonal (independent refinement) discretizations are compared



# Performance of Polygonal FEM



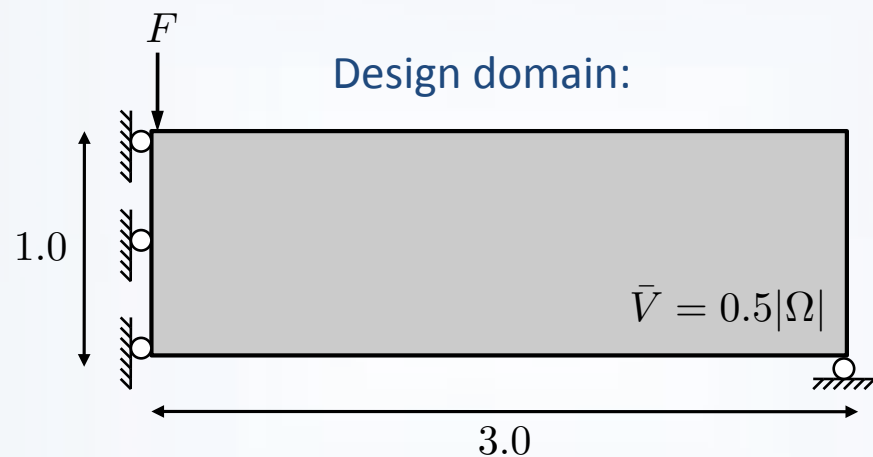
- ❖ Polygonal elements are not as stiff as the quadrilateral elements and produce more accurate results, especially with coarser meshes



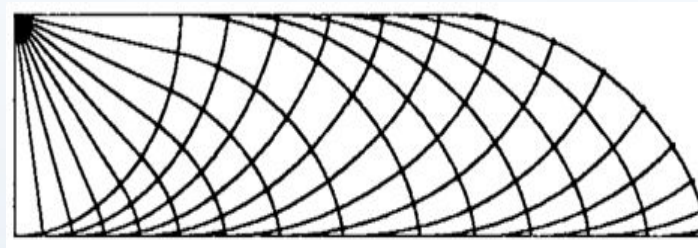
# Topology Optimization Results



- ❖ The results are presented for minimum compliance problem based on SIMP formulation and MMA as the solver



Michell-type solution:

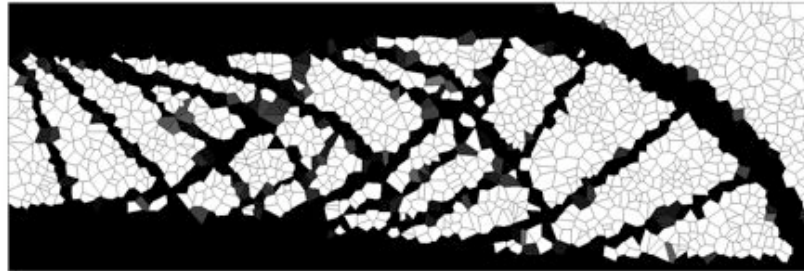




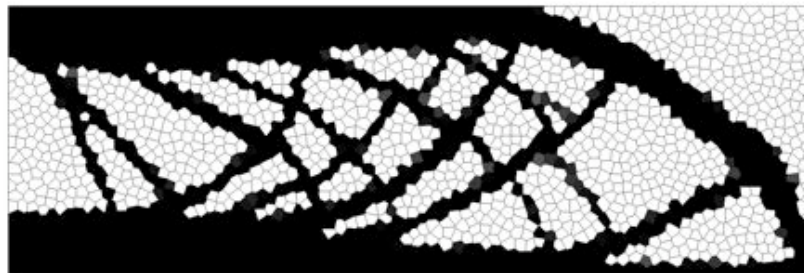
# Topology Optimization Results



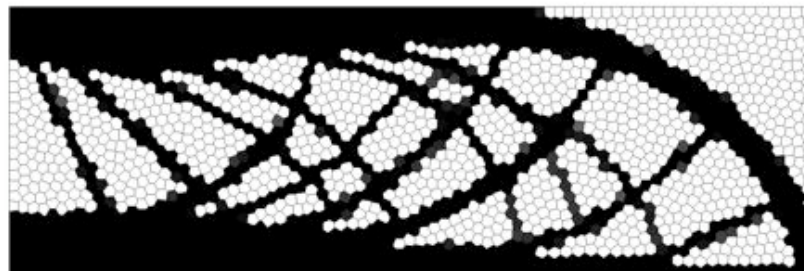
- ❖ Results based on different levels of mesh regularity



Random mesh  
Final compliance = 188.19



Quasi-random mesh  
Final compliance = 188.25

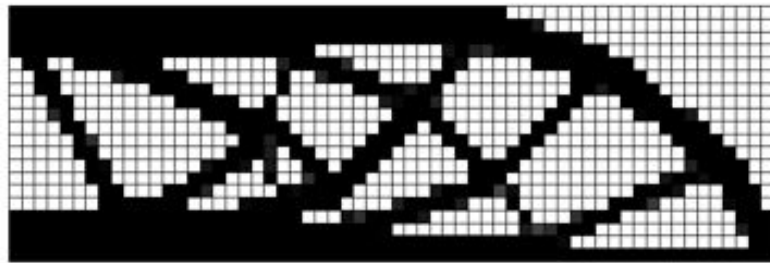


CVT mesh  
Final compliance = 187.30

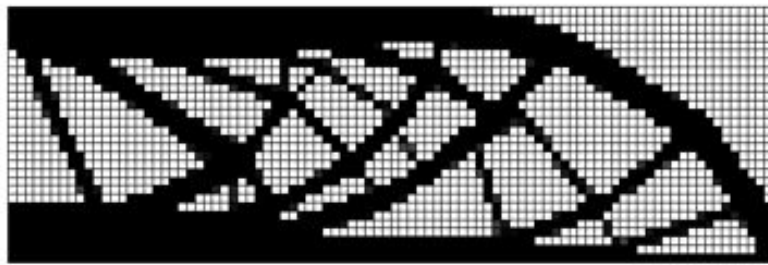
# Topology Optimization Results



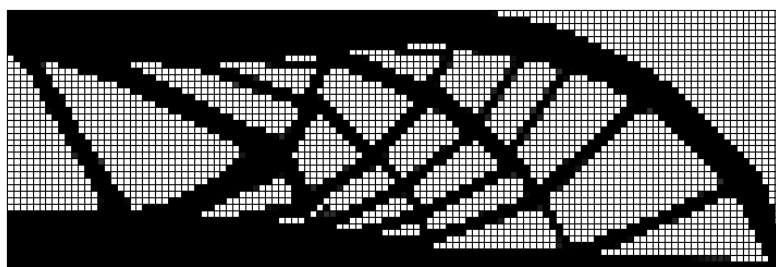
*Q8 mesh:*



1200 elements, 3761 nodes

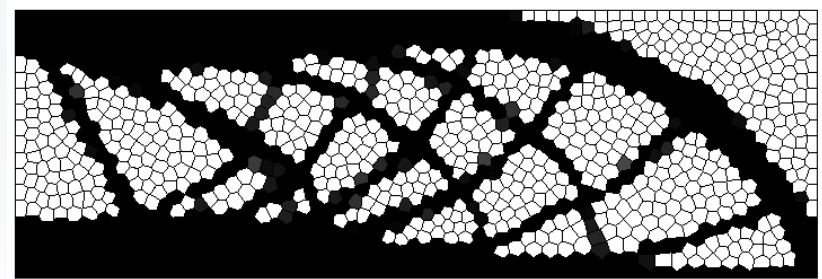


2700 elements, 8341 nodes

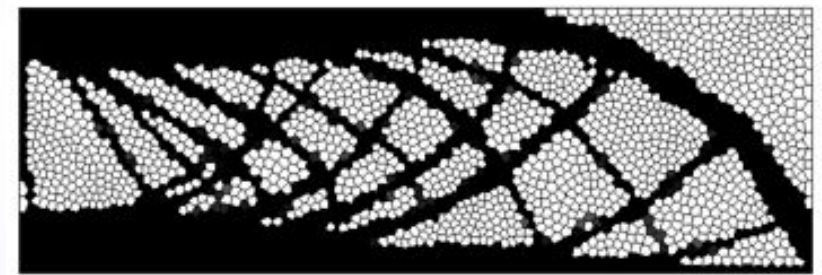


4800 elements, 14721 nodes

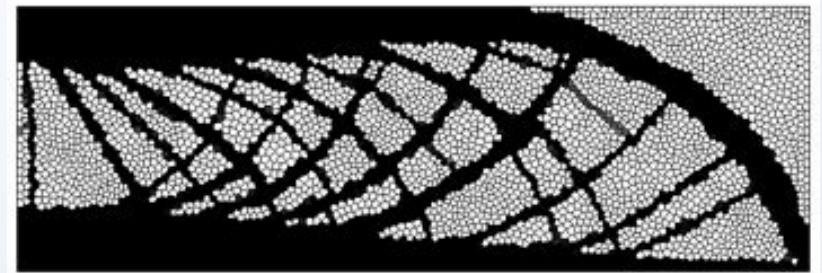
*Voronoi mesh:*



1336 elements, 2674 nodes



2869 elements, 5740 nodes

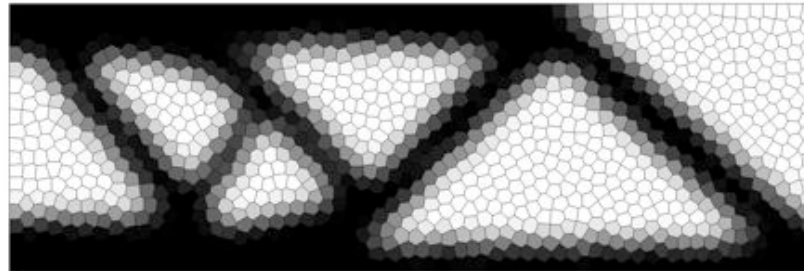


5062 elements, 10126 nodes

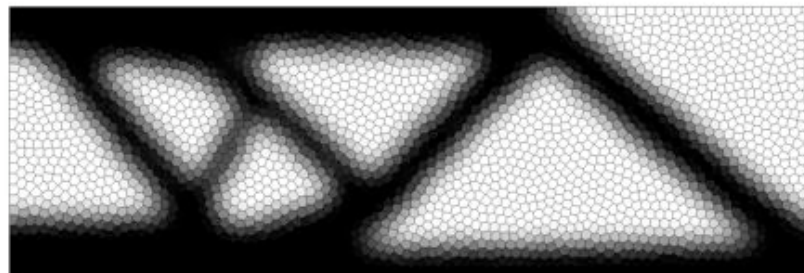
# Topology Optimization Results



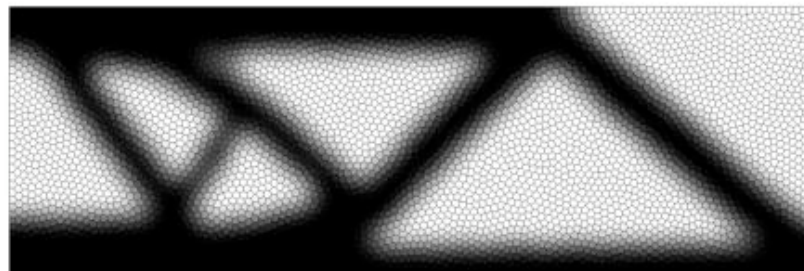
- ❖ Results using projection method:



1200 elements  
Final compliance = 260.56



2700 elements  
Final compliance = 257.43



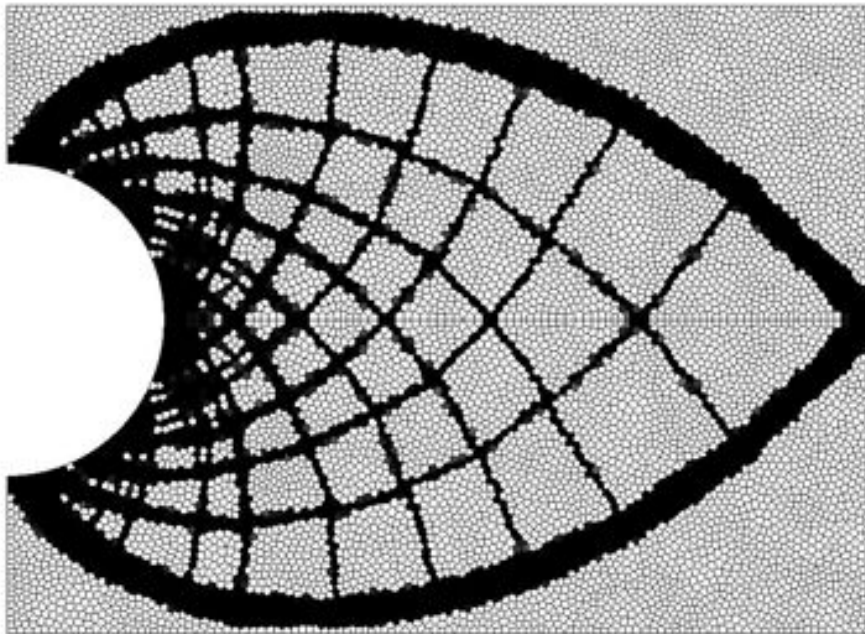
4800 elements  
Final compliance = 257.99

# Topology Optimization Results



- ❖ Michell cantilever beam with circular support

*Voronoi mesh:*



Number of nodes = 19973  
Number of elements = 10000

*T6 mesh:*



Number of nodes = 17441  
Number of elements = 8584

# Concluding remarks



- ❖ Solutions of discrete topology optimization problems with fixed mesh representation include a form of mesh dependency that stems from the geometric features of the spatial discretization
- ❖ To address this problem, we employ fully unstructured meshes to reduce the influence of the simplex geometry on topology optimization solutions
- ❖ To this end, we propose a meshing algorithm for generating arbitrary polygonal discretization that enjoy higher levels of directional isotropy and good finite element quality