

# PolyMesher: A General-Purpose Mesh Generator for Polygonal Elements Written in Matlab

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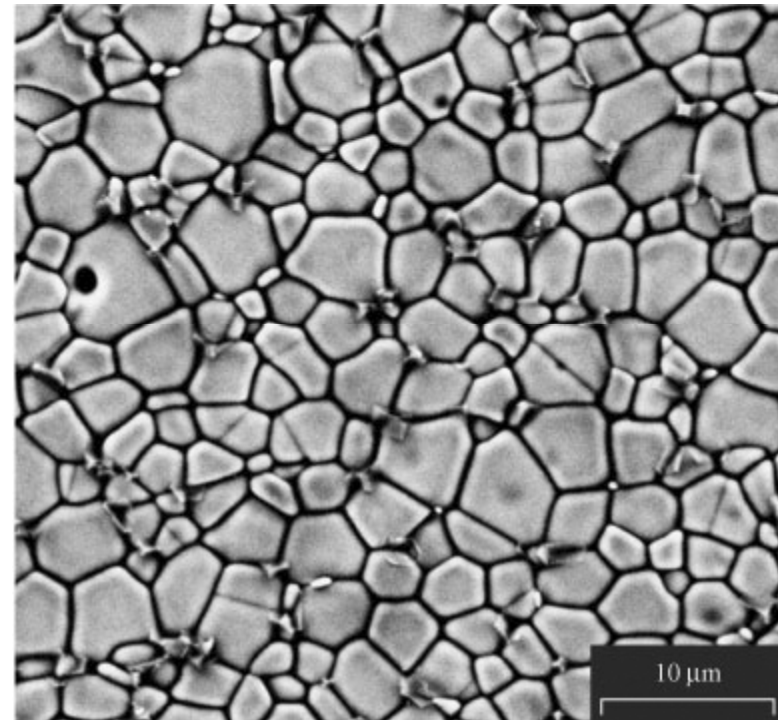


# Motivation

- Voronoi diagrams offer a simple way to discretize geometries. They have been widely used to describe the material structure in:

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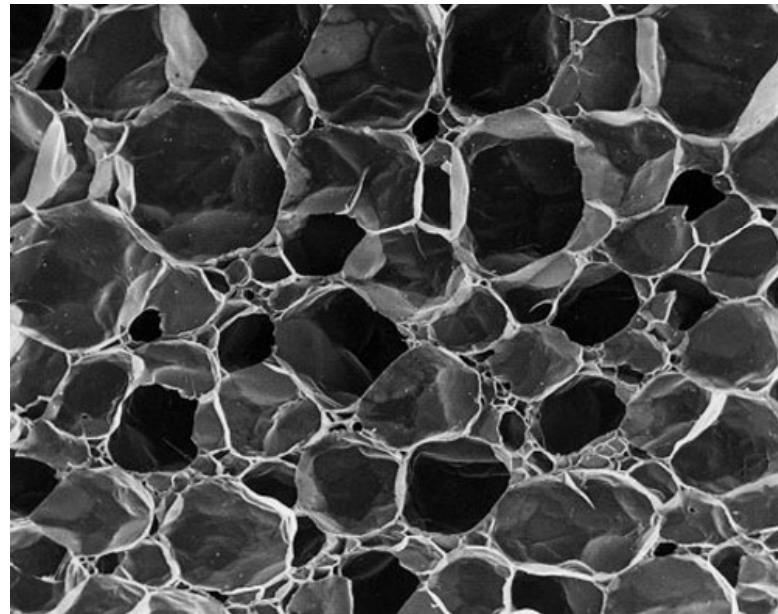
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  - polycrystalline microstructures,



PR Bueno and JA Varela. Electronic ceramics based on polycrystalline SnO<sub>2</sub>, TiO<sub>2</sub> and (Sn<sub>x</sub>Ti<sub>1-x</sub>)O<sub>2</sub> solid solution. *Mat. Res.* [online]. 2006, vol.9, n.3, pp. 293-300

# Motivation

- Voronoi diagrams offer a simple way to discretize geometries. They have been widely used to describe the material structure in:
  - polycrystalline microstructures,
  - cellular foams,



Cellular polyethylene

<http://www.koepp.de>

# Motivation



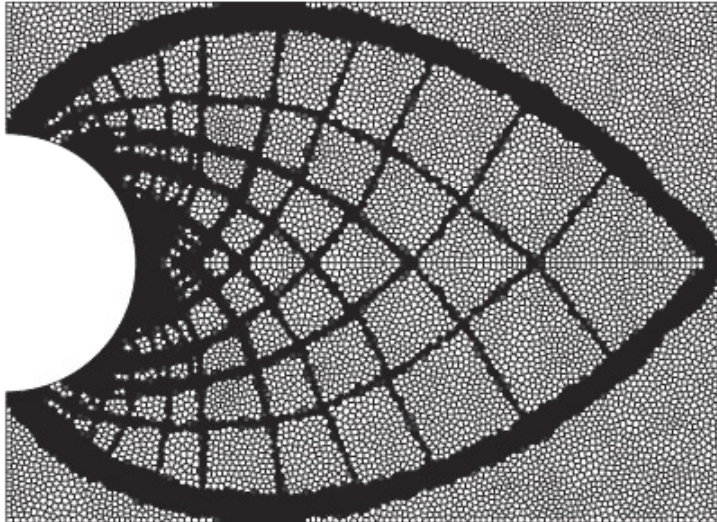
- Voronoi diagrams offer a simple way to discretize geometries. They have been widely used to describe the material structure in:
  - polycrystalline microstructures,
  - cellular foams,
  - and other materials that exhibit cell-like features.
- For such applications, numerical modeling and simulation of Voronoi meshes is a natural choice.
- Finite element analyses can also be based on the Delaunay/Voronoi dual tessellations for both defining the computational mesh and approximating the field quantity within each element.



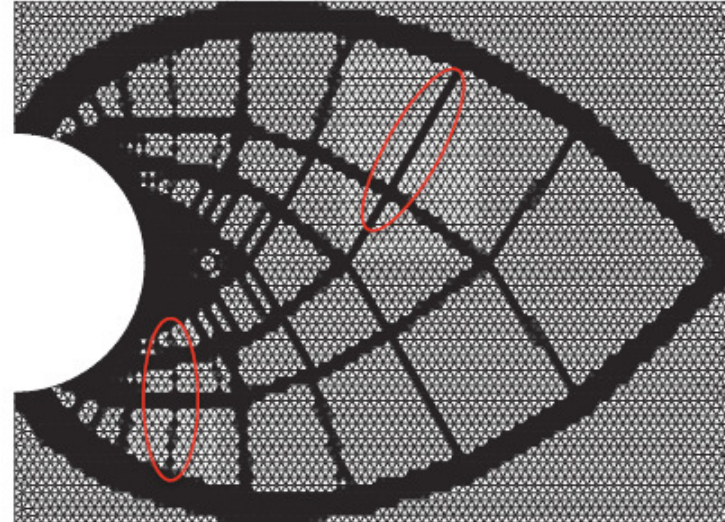
# Motivation

- Recently, polygonal meshes were used in topology optimization yielding good results.

Polygonal Elements



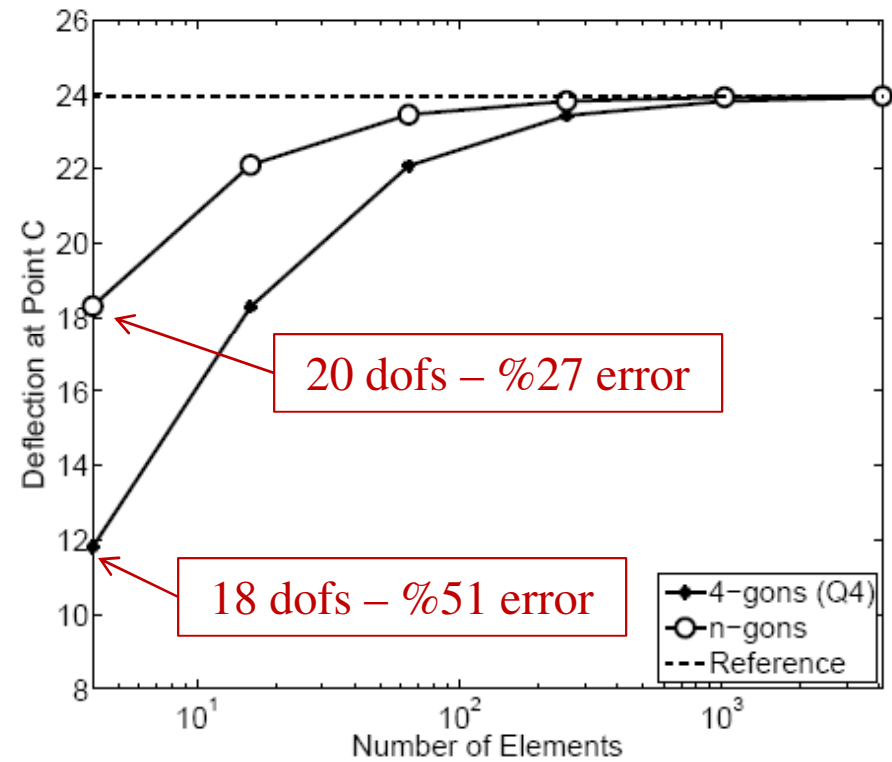
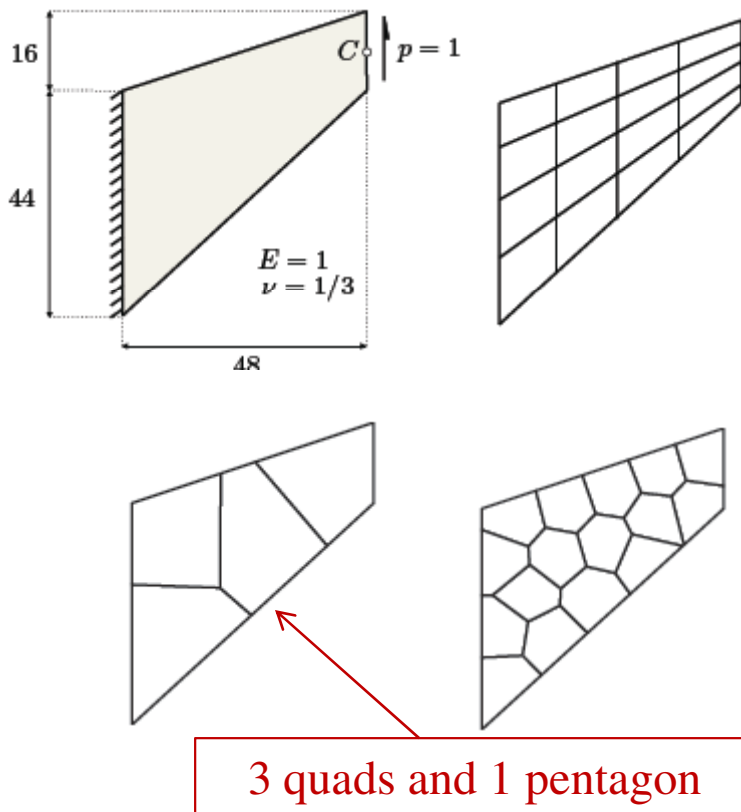
T6 Elements





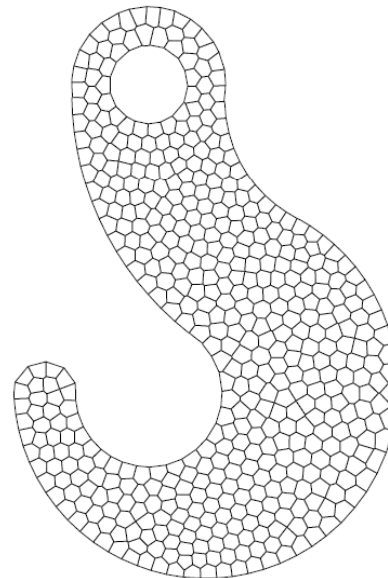
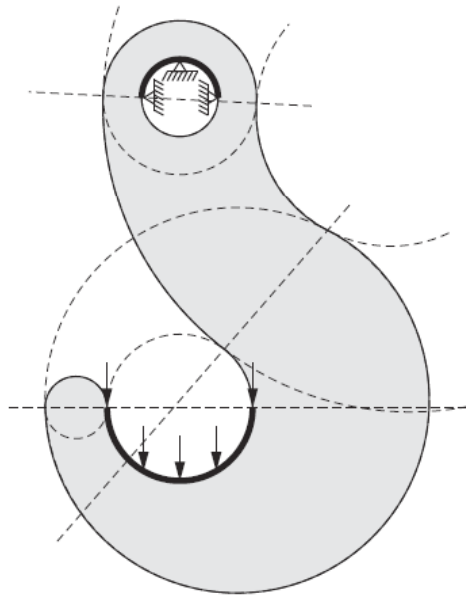
# Motivation

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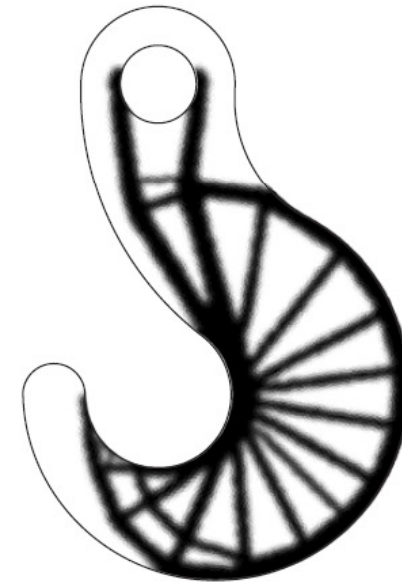


# Motivation

- Our main goal here is to provide the users a self-contained Matlab implementation of a general topology optimization framework using unstructured polygonal finite element meshes. In this presentation we will explain PolyMesher, responsible for the polygonal discretization.



PolyMesher



PolyTop





- Voronoi diagrams, CVTs and Lloyd's algorithm
- Meshing algorithm
- Implicit representation
- Matlab implementation
- Examples
- Concluding remarks
- Ongoing work

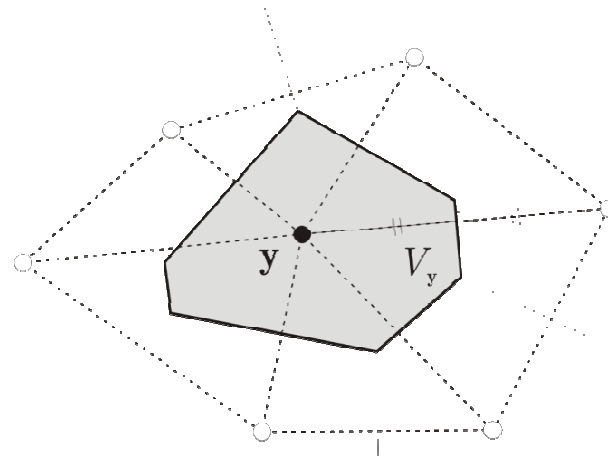


# Voronoi diagrams, CVTs and Lloyd's algorithm

The concept of Voronoi diagrams plays a central role in our meshing algorithm.

Given a set of  $n$  distinct points of seeds  $P$ , a Voronoi cell  $V_y$  consists of points in the plane closer to  $y$  than any other point in  $P$ .

$$V_y = \{x \in \mathbb{R}^2 : \|x - y\| < \|x - z\|, \forall z \in P \setminus \{y\}\}$$



.....  
Delaunay  
triangulation

Voronoi  
diagram

# Voronoi diagrams, CVTs and Lloyd's algorithm



Centroidal Voronoi tessellations (CVTs) enjoy a higher level of regularity which are suitable for use in finite element analysis.

A Voronoi tessellation  $\mathcal{T}(\mathbf{P}; \Delta)$  is centroidal if, for every  $\mathbf{y} \in \mathbf{P}$ :

$$\mathbf{y} = \mathbf{y}_c \quad \text{where} \quad \mathbf{y}_c := \frac{\int_{V_{\mathbf{y}} \cap \Delta} \mathbf{x} \mu(\mathbf{x}) d\mathbf{x}}{\int_{V_{\mathbf{y}} \cap \Delta} \mu(\mathbf{x}) d\mathbf{x}}$$

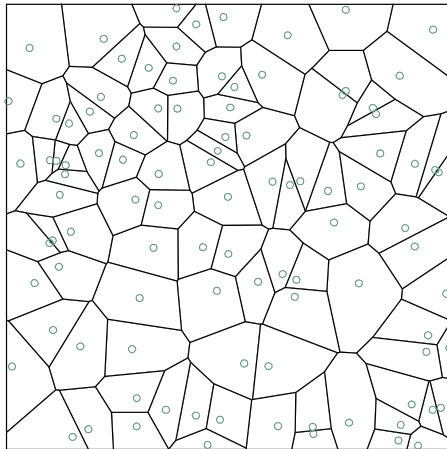
For computing CVTs we used the *Lloyd's algorithm*, which iteratively replaces the given generating seeds by the centroids of the corresponding Voronoi regions. Lloyd's algorithm can be thought of as a fixed point iteration for the mapping:

$$\mathbf{L} = (\mathbf{L}_{\mathbf{y}})_{\mathbf{y} \in \mathbf{P}}^T : \mathbb{R}^{n \times 2} \rightarrow \mathbb{R}^{n \times 2}$$

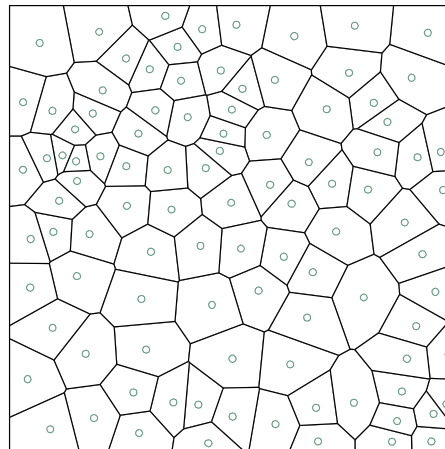
$$\mathbf{L}_{\mathbf{y}}(\mathbf{P}) = \frac{\int_{V_{\mathbf{y}}(\mathbf{P}) \cap \Delta} \mathbf{x} \mu(\mathbf{x}) d\mathbf{x}}{\int_{V_{\mathbf{y}}(\mathbf{P}) \cap \Delta} \mu(\mathbf{x}) d\mathbf{x}}$$



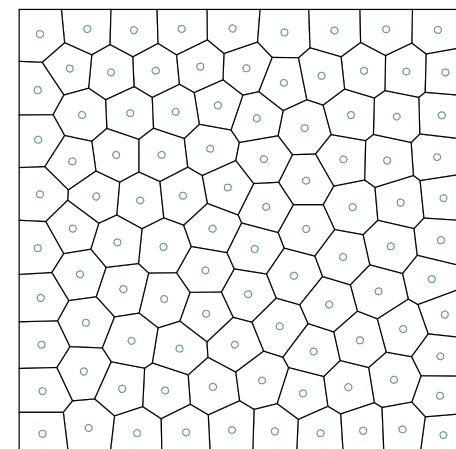
# Voronoi diagrams, CVTs and Lloyd's algorithm



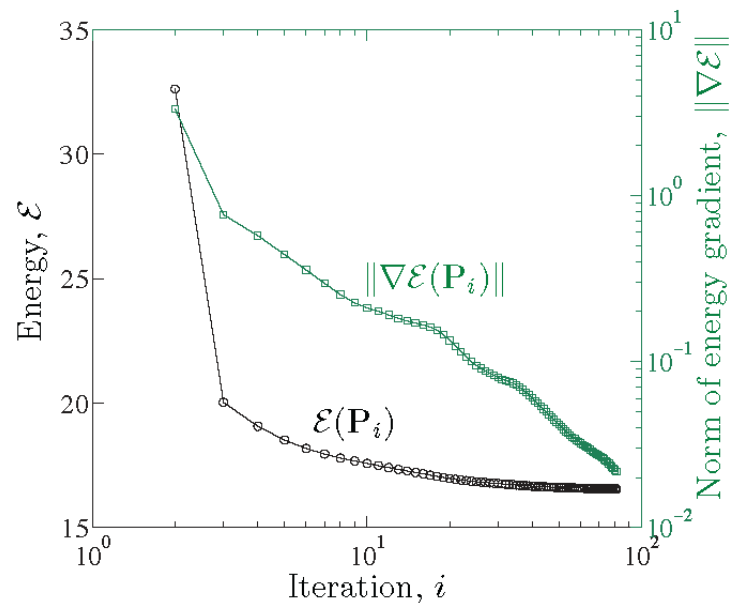
Initial Random points



First iteration



After 80 iterations

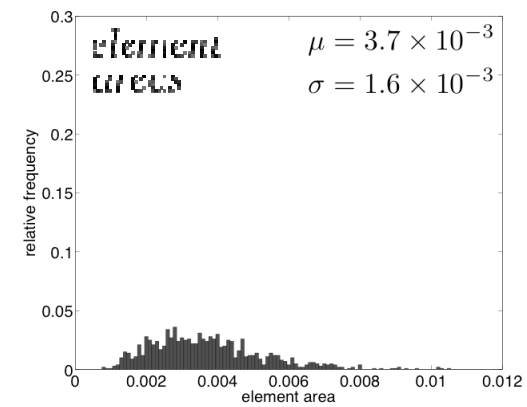
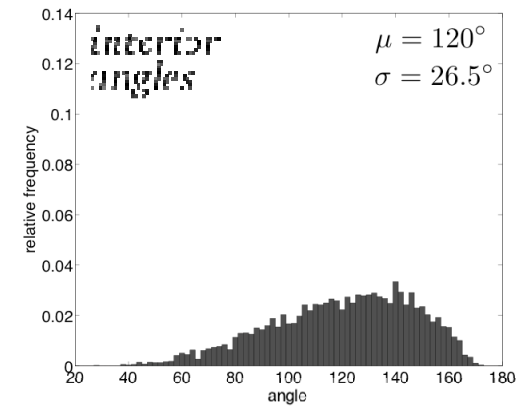
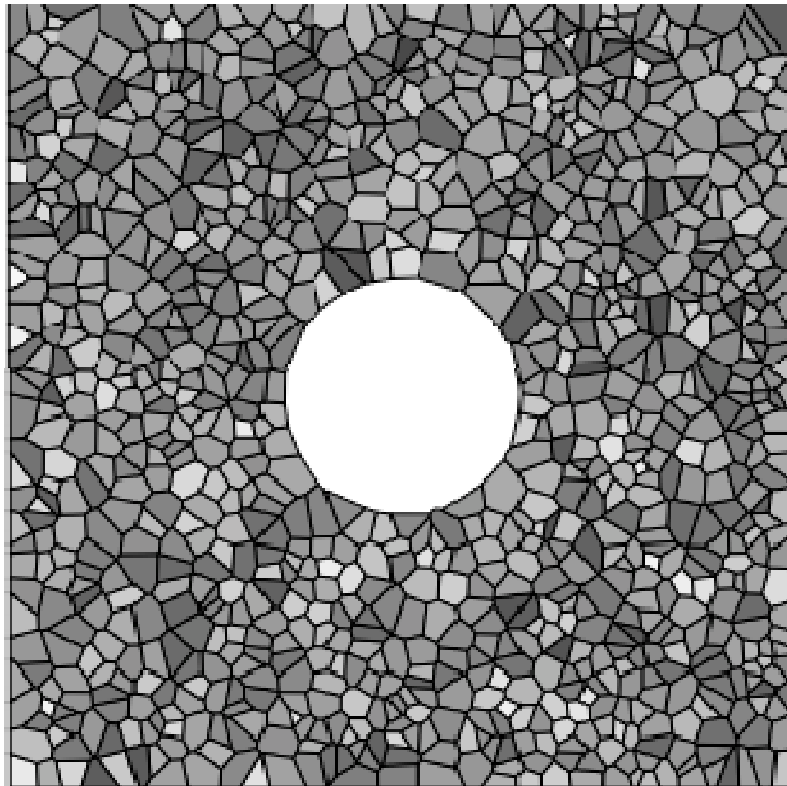


$$\mathcal{E}(\mathbf{P}; \Delta) = \sum_{\mathbf{y} \in \mathbf{P}} \int_{V_{\mathbf{y}}(\mathbf{P}) \cap \Delta} \mu(\mathbf{x}) \|\mathbf{x} - \mathbf{y}\|^2 d\mathbf{x}$$

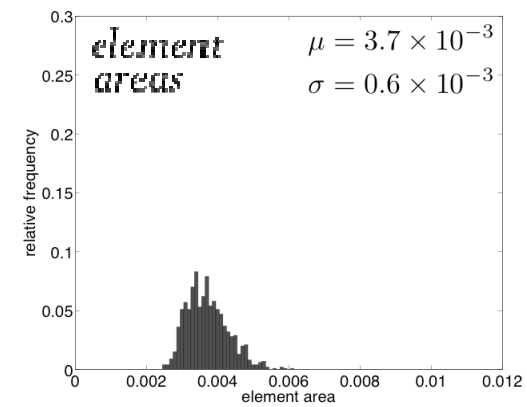
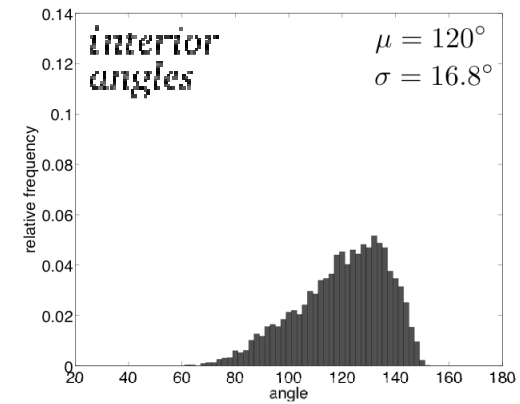
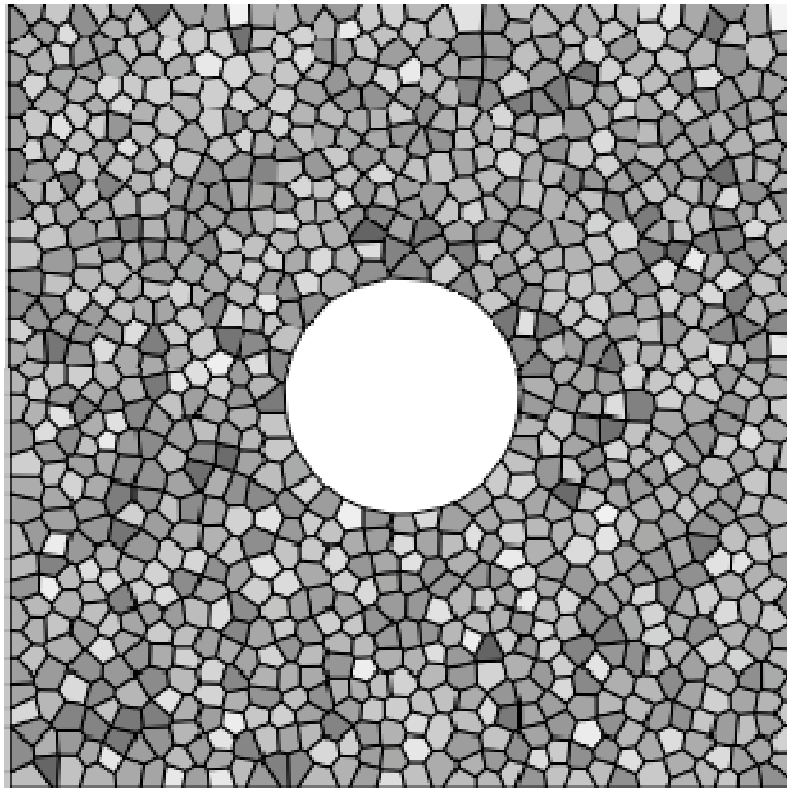
$$\nabla_{\mathbf{y}} \mathcal{E} = 2m_{\mathbf{y}} (\mathbf{y} - \mathbf{y}_c)$$

$$m_{\mathbf{y}} = \int_{V_{\mathbf{y}} \cap \Delta} \mu(\mathbf{x}) d\mathbf{x}$$

# Voronoi diagrams, CVTs and Lloyd's algorithm

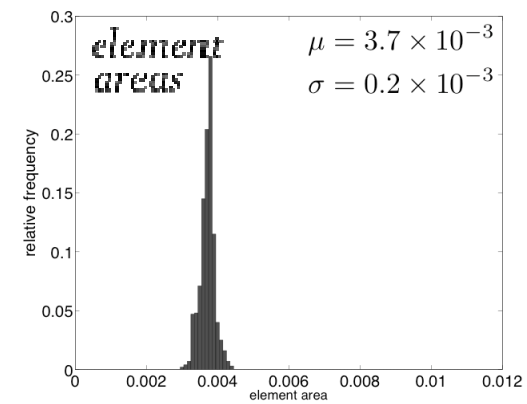
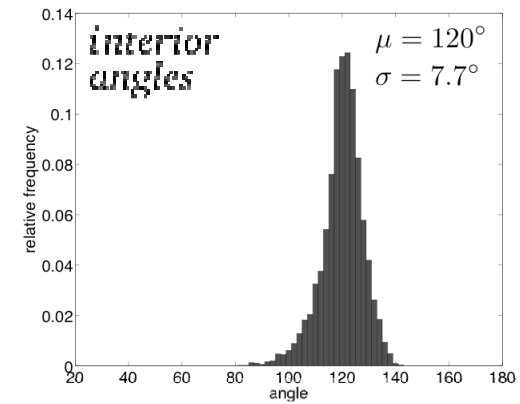
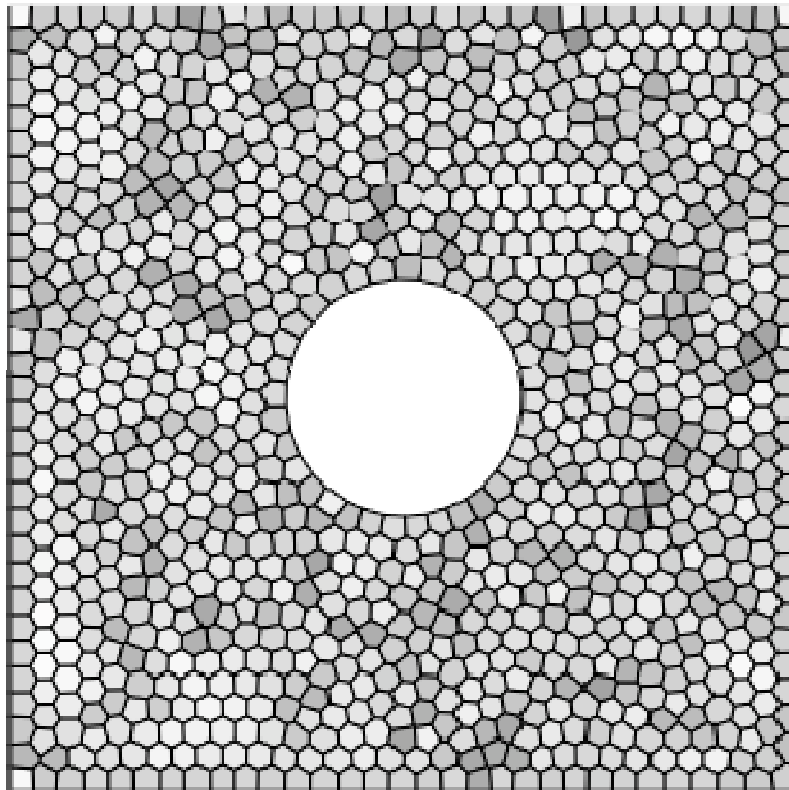


# Voronoi diagrams, CVTs and Lloyd's algorithm



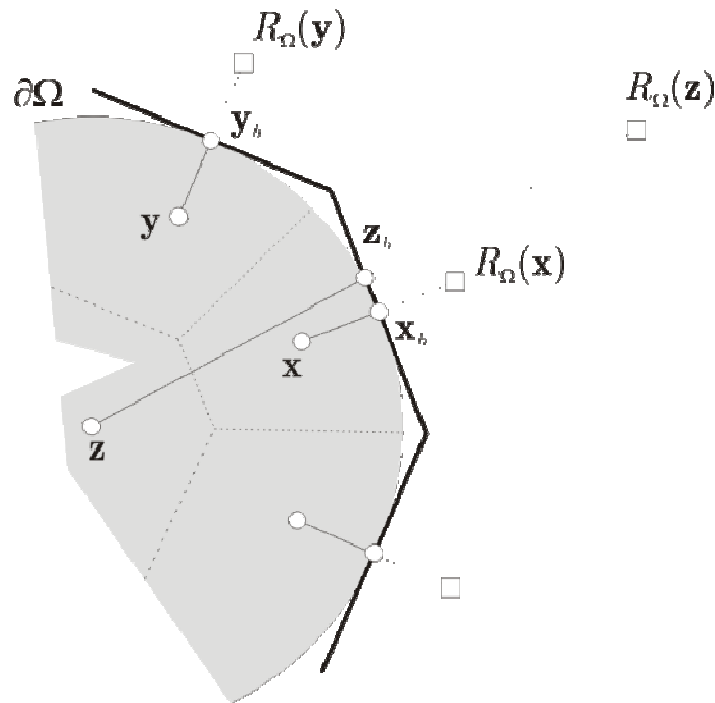


# Voronoi diagrams, CVTs and Lloyd's algorithm



## Meshing approach: basic ideas

A polygonal discretization can be obtained from the Voronoi diagram of a given set of seeds and their reflections.



- We first reflect each point in  $\mathbf{P}$  about the *closest* boundary point of  $\Omega$  and denote the resulting set of points by  $R_{\Omega}(\mathbf{P})$ .

- We then construct the Voronoi diagram of the plane by including the original point set as well as its reflection.

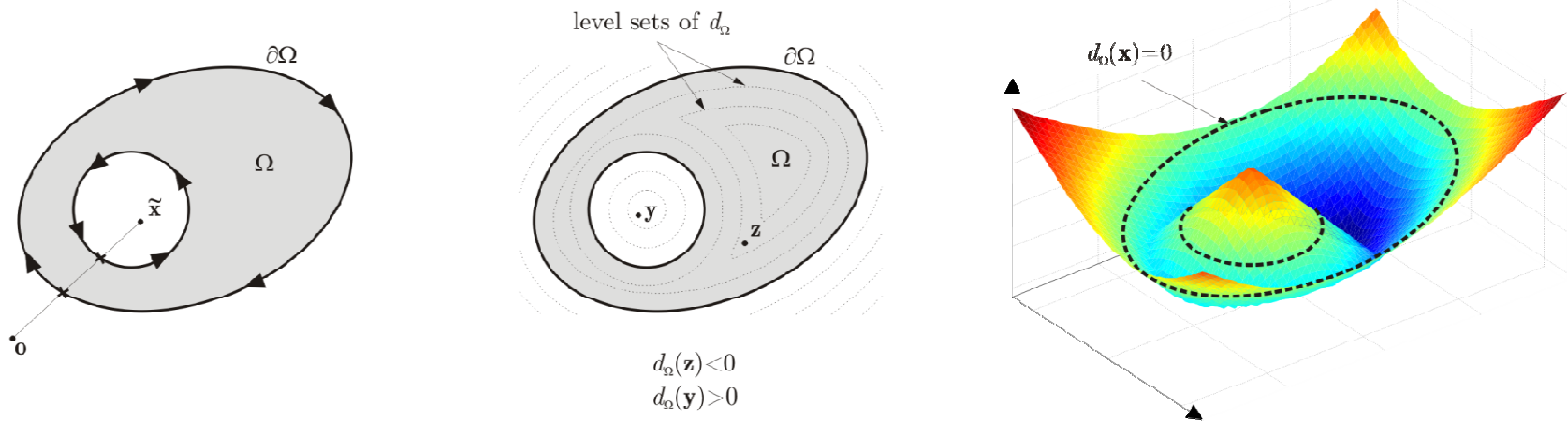
- Finally we incorporate Lloyd's iterations to obtain a point set  $\mathbf{P}$  that produces a CVT.

$$R_{\Omega}(\mathbf{x}) = \mathbf{x} - 2d_{\Omega}(\mathbf{x})\nabla d_{\Omega}(\mathbf{x})$$

$$R_{\Omega}(\mathbf{P}) := \{R_{\Omega}(\mathbf{y}) : \mathbf{y} \in \mathbf{P}\}$$

# Implicit representation

One of the main ingredients of our mesh generator is the **implicit representation** of the domain:



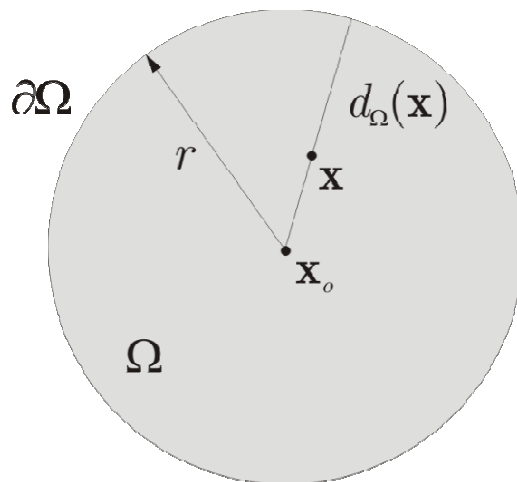
The signed distance function contains all the essential information about the meshing domain needed in our mesh algorithm.

$$d_\Omega(\mathbf{x}) = s_\Omega(\mathbf{x}) \min_{y \in \partial\Omega} \|\mathbf{x} - \mathbf{y}\|$$

$$s_\Omega(\mathbf{x}) := \begin{cases} -1, & \mathbf{x} \in \Omega \\ +1, & \mathbf{x} \in \mathbb{R}^2 \setminus \Omega \end{cases}$$

# Implicit representation: construction of signed distance functions

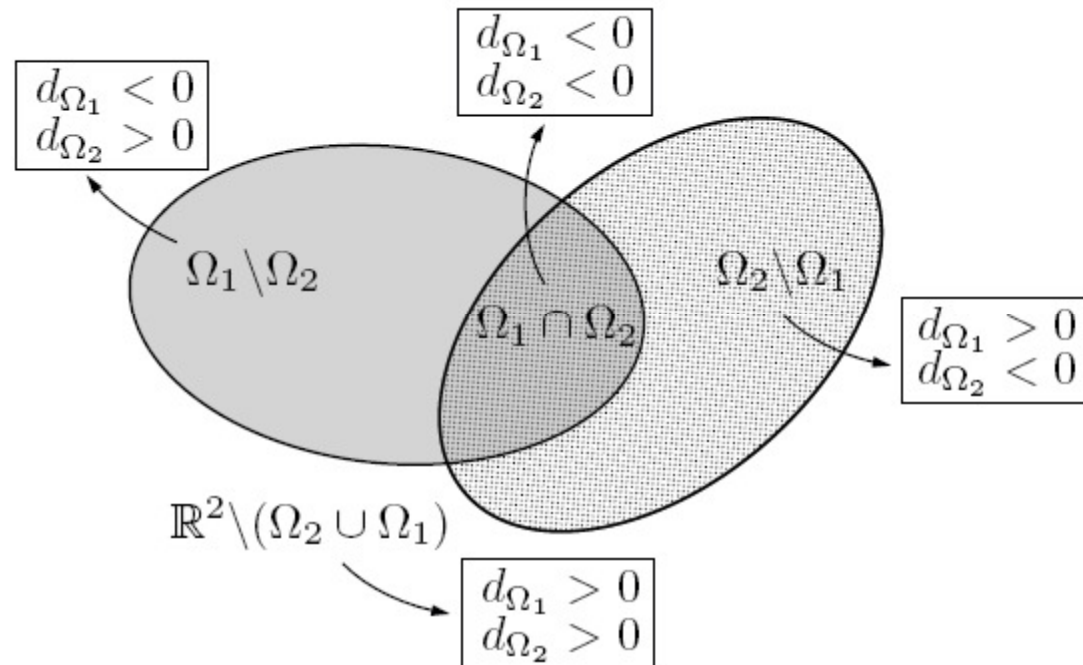
For many simple geometries, the signed distance function can be readily identified, for example:



$$d_\Omega(\mathbf{x}) = \|\mathbf{x} - \mathbf{x}_0\| - r$$

# Implicit representation: construction of signed distance functions

Moreover, set operations such as union, intersection, and complementation can be used to piece together and combine different geometries:



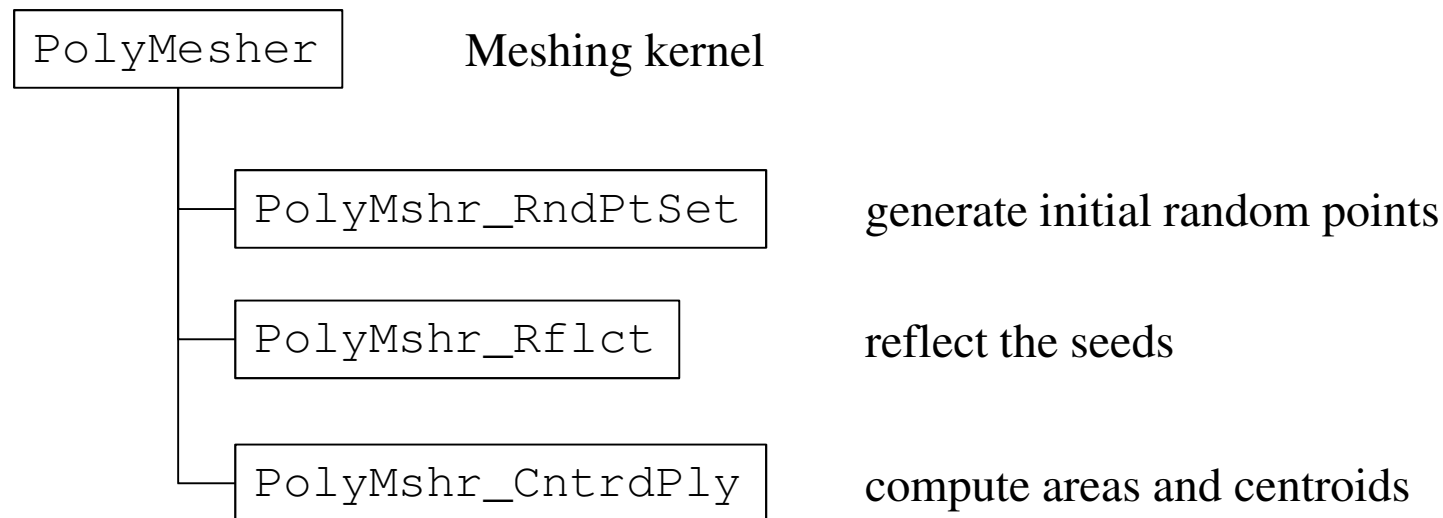
$$d_{\Omega_1 \cup \Omega_2}(\mathbf{x}) = \min(d_{\Omega_1}(\mathbf{x}), d_{\Omega_2}(\mathbf{x}))$$

$$d_{\Omega_1 \cap \Omega_2}(\mathbf{x}) = \max(d_{\Omega_1}(\mathbf{x}), d_{\Omega_2}(\mathbf{x}))$$

# Matlab implementation

Based on the previous considerations, an algorithm was proposed and implemented in Matlab.

The code has fewer than 135 lines and it is composed by the following main functions:





# Matlab implementation: meshing kernel

```
06 function [Node,Element,Supp,Load,P] = PolyMesher(Domain,NElem,MaxIter,P)
07 if ~exist('P','var'), P=PolyMshr_RndPtSet(NElem,Domain); end
08 NElem = size(P,1);
09 Tol=5e-3; It=0; Err=1; c=1.5;
10 BdBx = Domain('BdBx');
11 Area = (BdBx(2)-BdBx(1))*(BdBx(4)-BdBx(3));
12 Pc = P; figure;
13 while(It<=MaxIter && Err>Tol)
14     Alpha = c*sqrt(Area/NElem);
15     P = Pc; %Lloyd's update
16     R_P = PolyMshr_Rflct(P,NElem,Domain,Alpha); %Generate the reflections
17     [Node,Element] = voronoin([P;R_P]); %Construct Voronoi diagram
18     [Pc,A] = PolyMshr_CntrdPly(Element,Node,NElem);
19     Area = sum(abs(A));
20     Err = sqrt(sum((A.^2).*sum((Pc-P).*(Pc-P),2)))*NElem/Area^1.5;
21     fprintf('It: %3d   Error: %1.3e\n',It,Err); It=It+1;
22     if NElem<=2000, PolyMshr_PlotMsh(Node,Element,NElem); end;
23 end
24 [Node,Element] = PolyMshr_ExtrNds(NElem,Node,Element); %Extract node list
25 [Node,Element] = PolyMshr_CllpsEdgs(Node,Element,0.1); %Remove small edges
26 [Node,Element] = PolyMshr_RsqsNds(Node,Element); %Reorder Nodes
27 BC=Domain('BC',Node); Supp=BC{1}; Load=BC{2}; %Recover BC arrays
28 PolyMshr_PlotMsh(Node,Element,NElem,Supp,Load); %Plot mesh and BCs
```

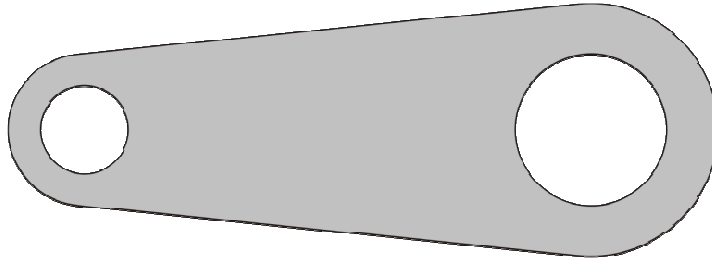


## Matlab implementation: Domain function

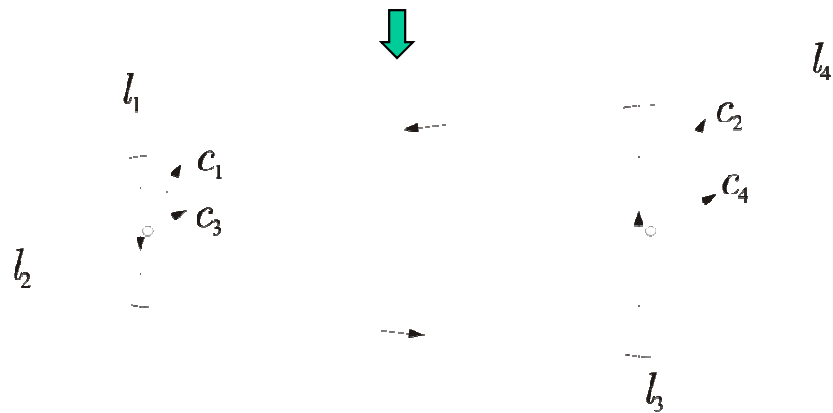
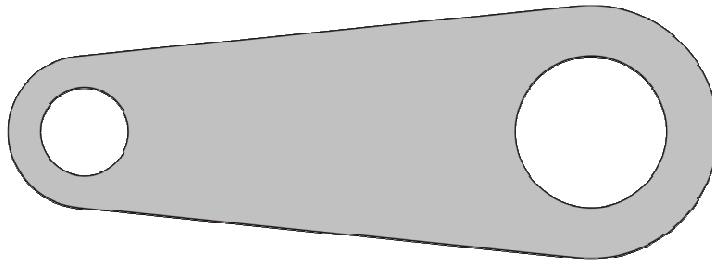
All domain-related information are included in `Domain` defined outside the meshing kernel.

Use	Input	Output
bounding box	<code>Domain('BdBox')</code>	coordinates of bounding box [xmin,xmax,ymin,ymax]
distance values	<code>Domain('Dist',P)</code>	$(m + 1) \times n$ matrix of distance values for point set <b>P</b> consisting of $n$ points
boundary conditions	<code>Domain('BC',Node)</code>	cell consisting of Load and Supp arrays

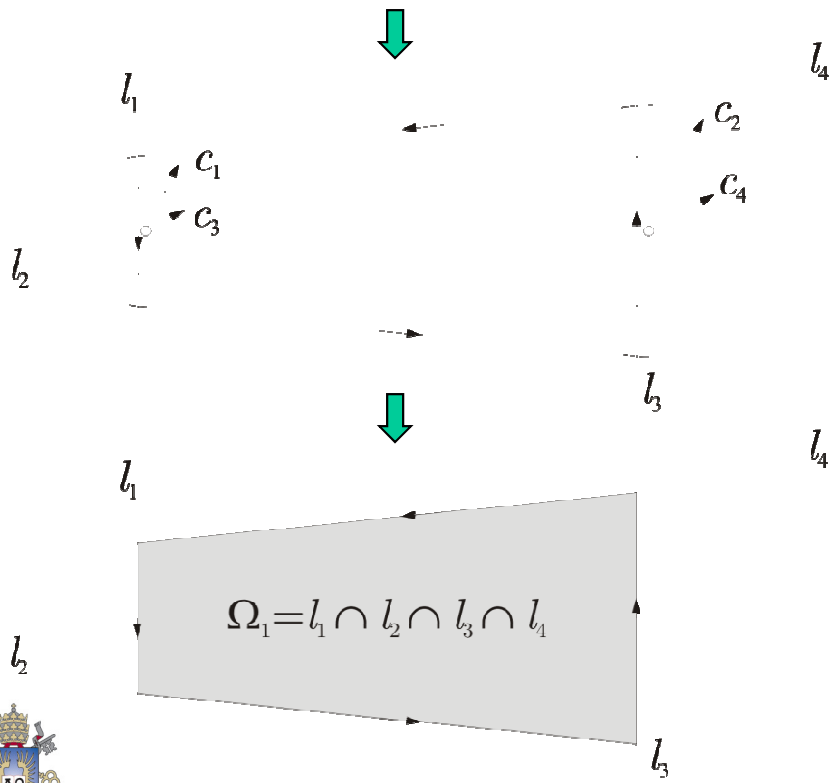
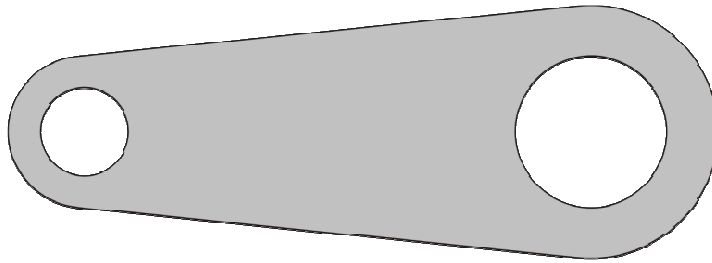
## Example: Wrench



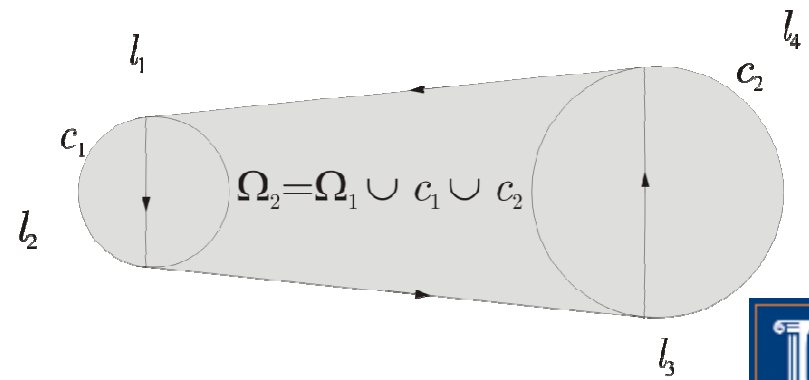
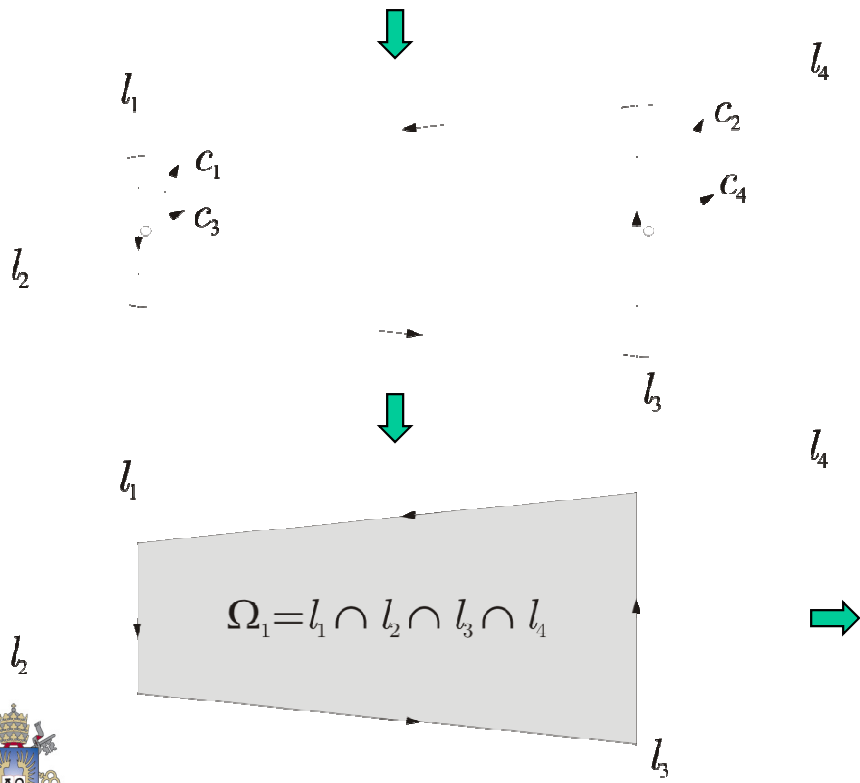
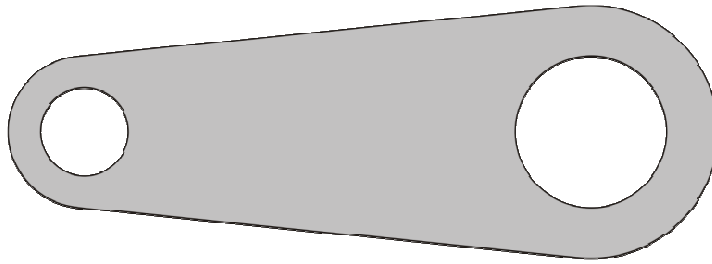
# Example: Wrench



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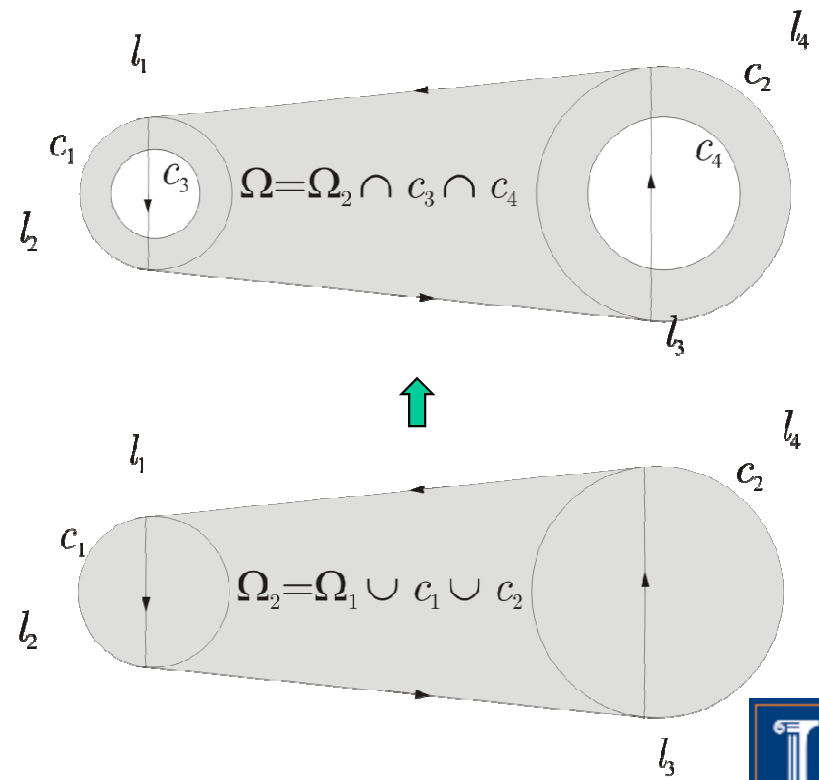
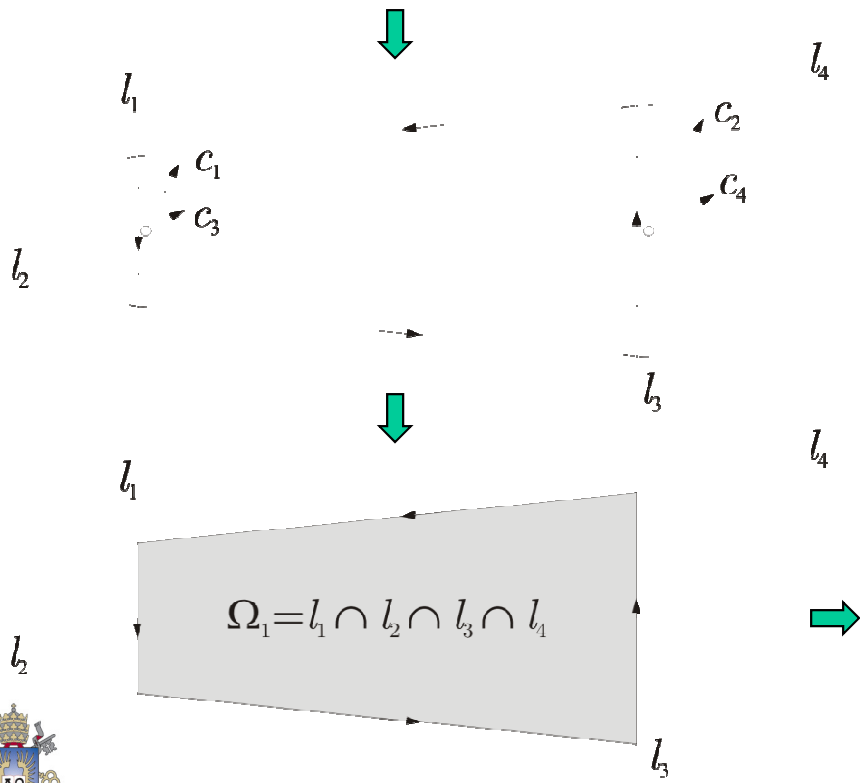
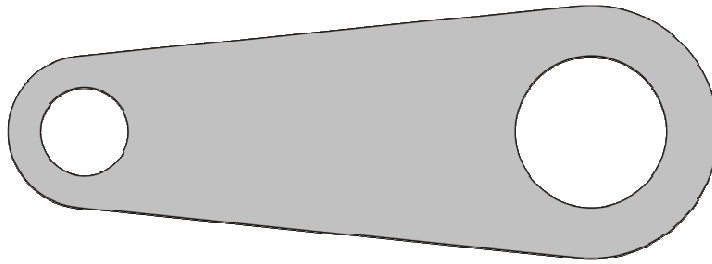


# Example: Wrench

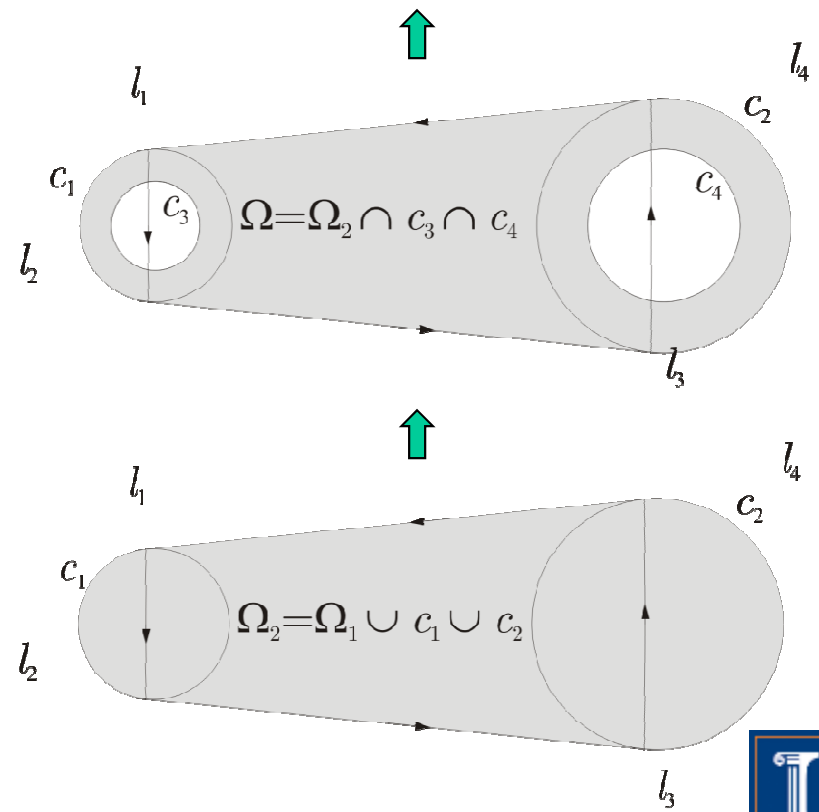
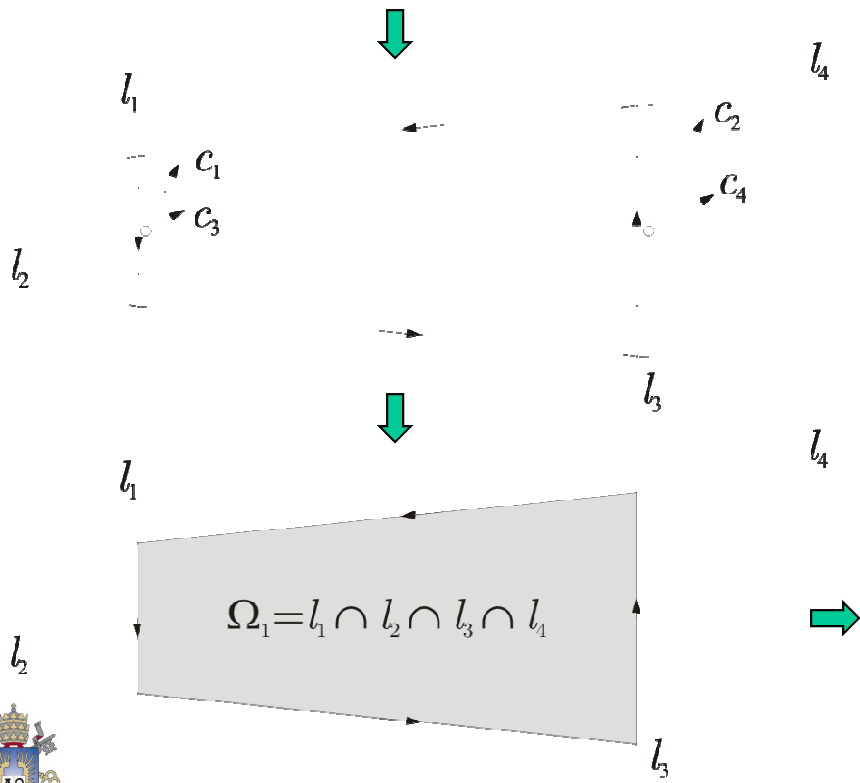
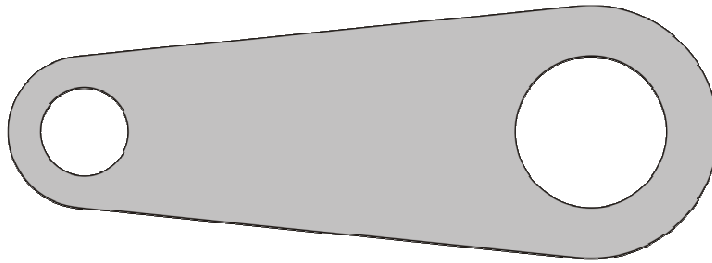




# Example: Wrench



# Example: Wrench

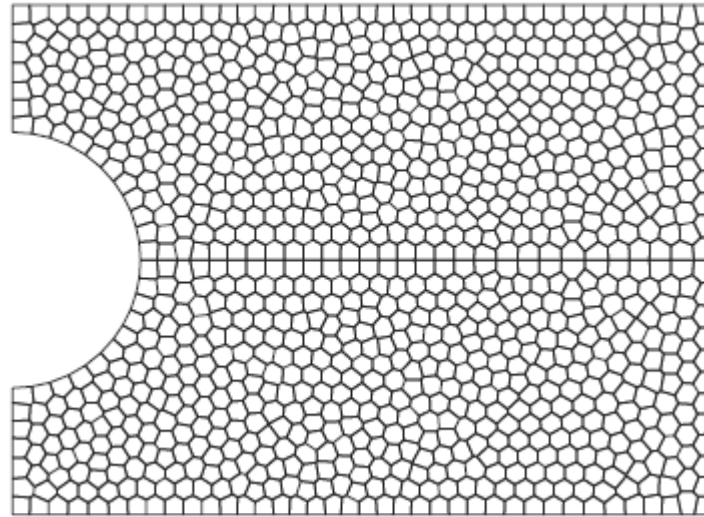




- Matlab demo



## Example: symmetric Michell cantilever

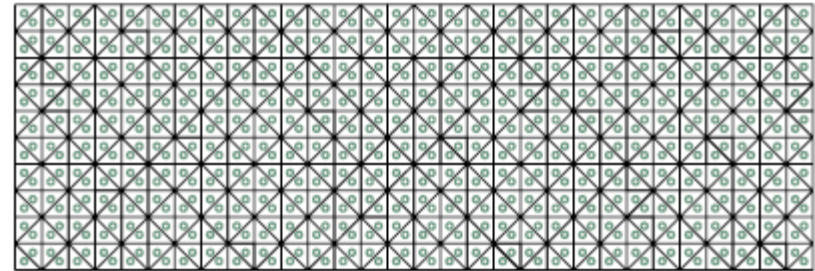
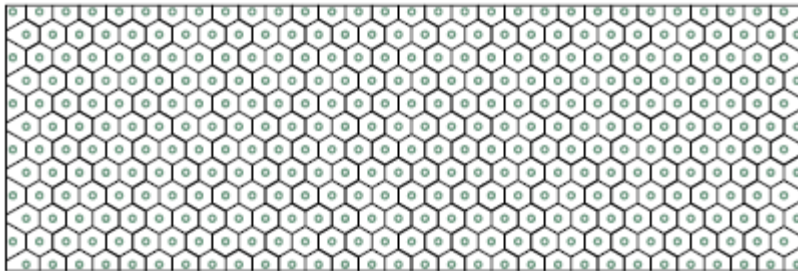
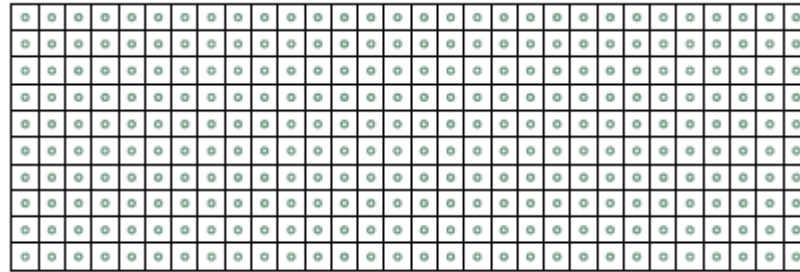


```
6 function [Node,Element,Supp,Load,P] = PolyMesher(Domain,NElem,MaxIter,P)
...
13 while(It<=MaxIter && Err>Tol)
14     Alpha = c*sqrt(Area/NElem);
15     P = Pc; %Lloyd's update
16     R_P = PolyMshr_Rflct(P,NElem,Domain,Alpha); %Generate the reflections
17     [Node,Element] = voronoin([P;R_P]); %Construct Voronoi diagram
18     [Pc,A] = PolyMshr_CntrdPly(Element,Node,NElem);
...
23 end
```

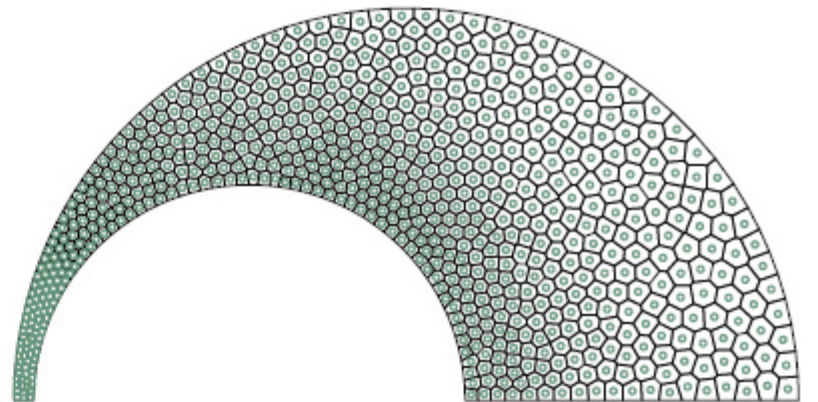
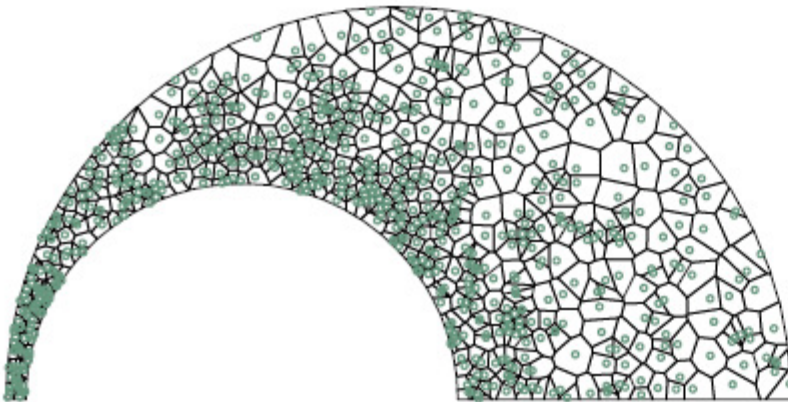
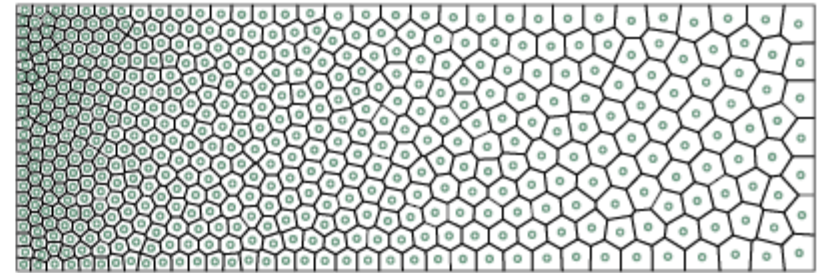
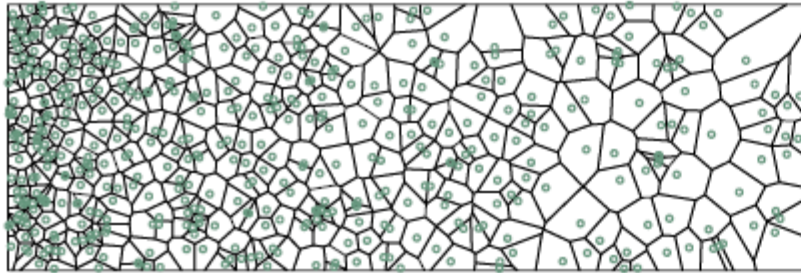
```
15 P = [Pc(1:NElem/2,:);[Pc(1:NElem/2,1),-Pc(1:NElem/2,2)]];
```

## Example: uniform discretizations

```
>> nelx = 30; nely = 10;  
>> dx = 3/nelx; dy = 1/nely;  
>> [X,Y] = meshgrid(dx/2:dx:3,dy/2:dy:1);  
>> P = [X(:) Y(:)];  
>> [Node,Element,Supp,Load] = PolyMesher(@MbbDomain,0,0,P);
```



# Example: non-uniform meshes



## Concluding remarks

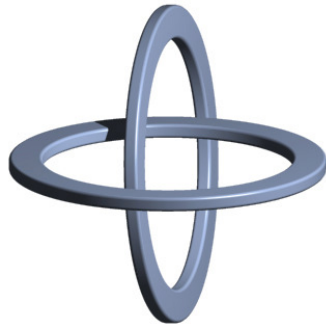


- Voronoi models arise in nature in various situations. In particular, polygonal meshes have been prominent in modeling structural problems;
- A simple and robust code based on the concept of Voronoi diagrams was presented. Using a simple and effective approach allows to discretize two-dimensional geometries with convex polygons;
- Its range of applications is broad, including optimization (shape, topology, etc), and other applications.





# Acknowledgment



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