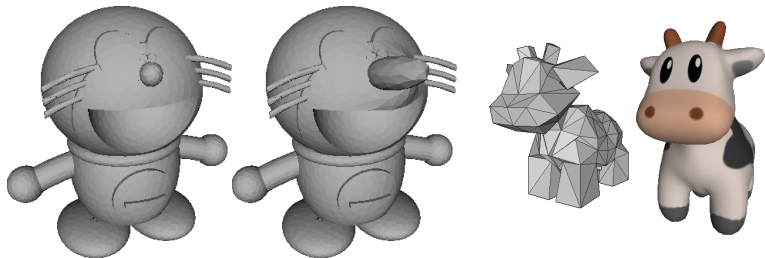


## Geometric Modeling II: Mesh Processing



# Content

Introduction

Pipeline

Data-Structures

Evaluation and Interrogation

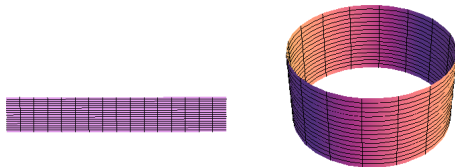
Processing

Libraries and software

Conclusion

# Parametric Representation

Represent a surface as a continuous function from a bounded domain  $U \subset \mathbb{R}^2$  to  $S \subset \mathbb{R}^3$ .



**Figure:** The rectangle  $[0, 2\pi] \times [0, 1]$  mapped to a cylinder.

# Parametric Representation

- ▶ Practically, it is rare to find a single function parametrizing the whole surface
- ▶ Instead, a surface is generally represented as a collection of functions from simple 2D domains to 3D
- ▶ Typical models usually consist of a huge collection of such surface patches

# Parametric Representation

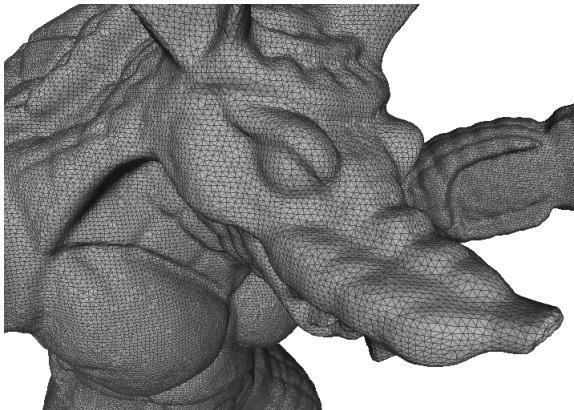
Precision: accuracy improves with refinement and depends on:

- ▶ The order of the polynomial used for the mapping:  $p$ ; in the case of a polygon mesh  $p = 1$  is fixed (linear functions are used);
- ▶ The length of the segment:  $h$ ; the smaller / the more segments, the more precise the approximation

The approximation error behaves as  $O(h^{p+1})$

# Triangle Mesh

- ▶ Connectivity: how vertices are connected to form edges, faces
- ▶ Geometry: the positions of the vertices in space



# Triangle Mesh

Main advantages:

- ▶ Easy to enumerate points on the surface
- ▶ Easy to compute neighbors to a given vertex, edge, face
- ▶ Can represent object with arbitrary topology
- ▶ Flexibility for piecewise smooth surface and adaptive refinement
- ▶ Approximation error:  $O(h^2)$  where  $h$  is edge segment
- ▶ Efficient rendering (rasterizer)

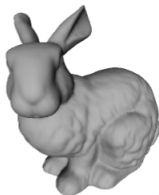
# Mesh construction



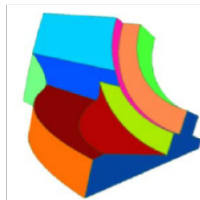
From subdivision surface  
(Catmull-Clark)



From parametric surface  
(Bezier)



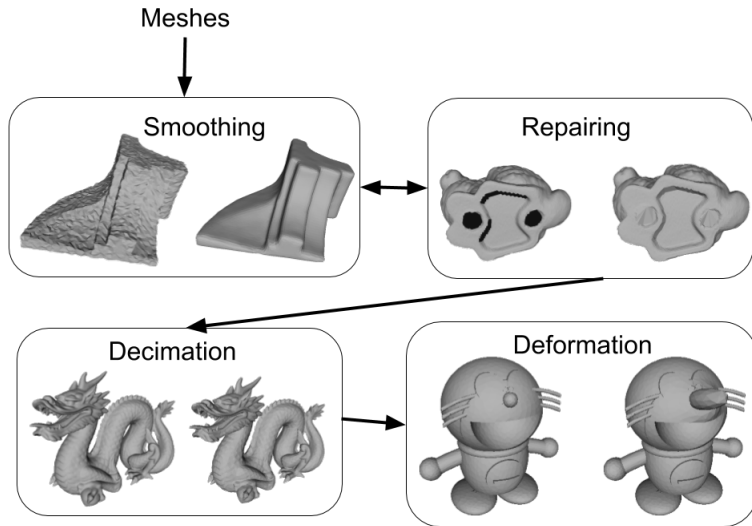
Scanned, registration,  
reconstruction



From a CAD package



# Mesh processing pipeline



# Triangle Soup

- ▶ List of faces
- ▶ Each face represented independently by the coordinates of its vertices

Number of triangles  $F$

$x_{11}$   $y_{11}$   $z_{11}$   $x_{12}$   $y_{12}$   $z_{12}$   $x_{13}$   $y_{13}$   $z_{13}$

...

$x_{f1}$   $y_{f1}$   $z_{f1}$   $x_{f2}$   $y_{f2}$   $z_{f2}$   $x_{f3}$   $y_{f3}$   $z_{f3}$

Example: STL file format used for rapid prototyping (3D printing)

# Triangle Soup Data-Structure

```
struct _Triangle {  
    struct _Vector3 _v0;  
    struct _Vector3 _v1;  
    struct _Vector3 _v2;  
};  
  
struct _TriMesh {  
    int _number_triangles;  
    struct _Triangle* _triangles;  
};
```

# Triangle Soup

## Advantages:

- ▶ Simple and general
- ▶ Sufficient for visualization (no smooth shading), 3D printing

## Inconvenients:

- ▶ Redundant information
- ▶ No connectivity information stored

# Indexed Triangle Set

- ▶ List of vertices and faces
- ▶ Each vertex stores its coordinates (geometry)
- ▶ Each face stores indices to its vertices (topology)

Example: most of the mesh file formats: OFF, PLY, OBJ etc

# Indexed Triangle Set

- ▶ Vertex List:

Number of vertices  $v$

$x_{11} \ y_{11} \ z_{11}$

...

$x_{v1} \ y_{v1} \ z_{v1}$

- ▶ Triangle List:

Number of faces  $f$

$v_{11} \ v_{12} \ v_{13}$

...

$v_{f1} \ v_{f2} \ v_{f3}$

# Indexed Triangle List Data-Structure

```
struct _Triple {  
    int _v0, _v1, _v2;  
};  
  
struct _TriMesh{  
    int _number_vertices;  
    int _number_triangles;  
  
    struct _Vector3* _vertices;  
    struct _Triple* _triangles;  
};
```

# Indexed Triangle Set

## Advantages:

- ▶ Simple
- ▶ Reduce storage (because vertex information is not repeated)

## Inconvenients:

- ▶ No explicit connectivity information
- ▶ No per-edge information (but can store attributes per vertex or face)



# Half-Edge

- ▶ List of vertices, half-edges, faces;
- ▶ Each vertex stores its coordinates and an half-edge;
- ▶ Each face stores the neighbor half-edge;
- ▶ Each half-edge points to a starting vertex, the adjacent face, and the opposite, next (and sometimes also previous) half-edges.

Notes: an half-edge is oriented;

# Half-Edge

List of vertices:

```
Number of vertices v  
x11 y11 z11; e1  
...  
xv1 yv1 zv1; ev
```

List of half-edges:

```
Number of edges e  
v1; f1; o1 n1 p1  
...  
ve; fe; oe ne pe
```

List of faces:

```
Number of faces f  
e1  
...  
ef
```

# Half-Edge Data-Structure

```
struct _Vertex {  
    struct _Vector3 _coordinates;  
    struct _HalfEdge* _he;  
};
```

```
struct _HalfEdge {  
    struct _Vertex* _start_vertex;  
    struct _Face* _face;  
    struct _HalfEdge *_opposite, *_next;  
};
```

# Half-Edge Data-Structure

```
struct _Face {  
    struct _HalfEdge* _he;  
};  
  
struct _TriMesh {  
    int _number_vertices;  
    int _number_half_edges;  
    int _number_faces;  
  
    struct _Vertex* _vertices;  
    struct _HalfEdge* _half_edges;  
    struct _Face* _faces;  
};
```

# Half-Edge

## Advantages:

- ▶ Reduced storage
- ▶ Fixed-size data-structure
- ▶ Connectivity information is easy to retrieve (for example: vertices neighbor to a given vertex, edges or faces incident to a given vertex, ...)

# Example: One Ring Traversal

One ring traversal: Given a vertex in the mesh, find all its neighboring vertices.

- ▶ Start at vertex
- ▶ Follow the outgoing half-edge
- ▶ Visit the neighbor
- ▶ Follow the opposite half-edge
- ▶ Follow the next half-edge
- ▶ ...

## Example: One Ring Traversal

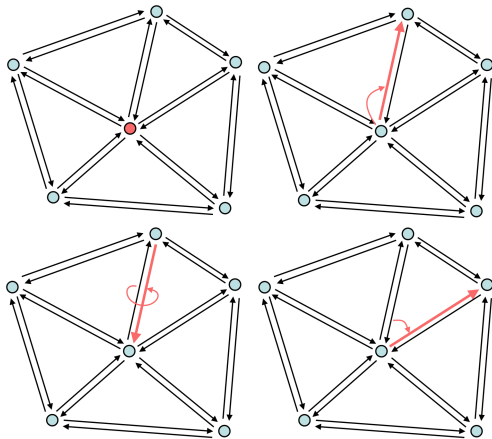


Figure: Some of the steps during the one-ring traversal of a given vertex

## Example: One Ring Traversal

In pseudo-code:

```
HalfEdge* curr_he = curr_v->_he;
HalfEdge* start_he = curr_he;
do {
    // get a pointer to the neighbor vertex v
    Vertex* v = curr_he->_next->_start_vertex;

    // do something with the neighbor v
    // ...

    // go to the next following the half-edges
    curr_he = curr_he->_opposite->_next;
} while (curr_he != start_he);
```



# One Ring Traversal: Half-Edge vs Indexed Triangle List

- ▶ Time complexity for one ring traversal using half-edge:  $O(1)$ ,
- ▶ Using an indexed triangle list:  $O(F)$  ( $F$  is the number of faces (triangles) in the mesh),
- ▶ For an indexed triangle list, possible to pre-compute adjacency tables (cost:  $O(F)$ ), queries are then  $O(1)$ . But: if the connectivity changes, all the tables should be recomputed,
- ▶ Conclusion: If looking for neighbors (or incident edges or faces) to a vertex (or face or edge) is an operation that will be executed often and if the mesh connectivity can change, then it is worthwhile to use a more sophisticated data-structure like the half-edge structure.

# Position evaluation

Coordinates of a point within a triangle are obtained from its barycentric coordinates:

$$(\alpha, \beta, \gamma) \rightarrow \alpha P_1 + \beta P_2 + \gamma P_3$$

where  $0 \leq \alpha$ ,  $0 \leq \beta$ ,  $0 \leq \gamma$ ,  $\alpha + \beta + \gamma = 1$  and  $P_1$ ,  $P_2$  and  $P_3$  are the vertex coordinates of the triangle.

## Face normal evaluation

Given the coordinates of the three vertices of a triangle:  $P_1$ ,  $P_2$  and  $P_3$ , the normal to the triangle (face normal) can be computed as:

$$n = \frac{(P_2 - P_1) \times (P_3 - P_1)}{\|(P_2 - P_1) \times (P_3 - P_1)\|}$$

where  $\times$  is the cross product (vector product between two vectors) and  $\|.\|$  is the Euclidean norm of a vector:

$$(x_1, y_1, z_1) \times (x_2, y_2, z_2) = (y_1 z_2 - y_2 z_1, z_1 x_2 - z_2 x_1, x_1 y_2 - y_1 x_2)$$

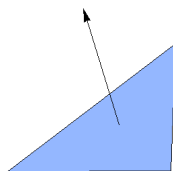
and

$$\|(x, y, z)\| = \sqrt{x^2 + y^2 + z^2}$$

Dividing by the norm is required to have a unit normal. A unit normal is required e.g. for applying an illumination model (like Blinn-Phong).

## Face normal evaluation: Example

A triangle has vertices  $((0, 0, 0), (1, 0, 0), (1, 1, 0))$ . A normal vector to the triangle has coordinates:  $(0, 0, 1)$ . It has already unit norm.



**Figure:** The triangle specified by its vertices:  $((0, 0, 0), (1, 0, 0), (1, 1, 0))$  and its outer unit normal.

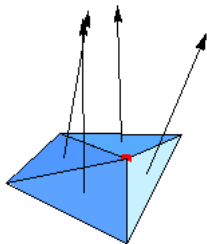
## Vertex normal evaluation

At a vertex the situation is a bit different, because the underlying surface is in general smooth, while its approximation by a triangle mesh is  $C^1$  discontinuous. There are different ways to solve the problem but in general they involve computing a weighted average of the normals of the neighbouring faces:

$$n(v) = \frac{\sum_{f \in \text{Neigh}(v)} w(v, f) n(f)}{\|\sum_{f \in \text{Neigh}(v)} w(v, f) n(f)\|}$$

where  $v$  is the vertex at which the normal  $n(v)$  is to be computed,  $\text{Neigh}(v)$  is the set of faces adjacent to  $v$ ,  $n(f)$  is the normal at a given face  $f$  and  $w(v, f)$  is a weight (that may depend on  $v$  and  $f$ )

## Vertex normal evaluation



**Figure:** A vertex (red), its adjacent faces and their normal

# Vertex normal evaluation: Weight

- ▶ Constant weight:  $w(v, f) = 1$ ;
- ▶ Area weighted:  $w(v, f) = \text{Area}(f)$  where  $\text{Area}(f)$  computes the area of the face (triangle)  $f$ ;
- ▶ Nelson Max's weight:  $w(v, f) = \frac{\sin \alpha_i}{\|vv_i\| \|vv_{i+1}\|}$ , where  $v_i$  and  $v_{i+1}$  are the two other vertices in the face  $f$  and  $\alpha_i$  is the angle between  $vv_i$  and  $vv_{i+1}$ ;
- ▶ Pseudo normal weight:  $w(v, f) = \alpha_i$  where  $\alpha_i$ ,  $v_i$  and  $v_{i+1}$  have the same signification as above.

# Shading

Normals are needed when applying an illumination model (such as the Phong model).

- ▶ Flat shading: one normal is computed per face, and the illumination model is applied once (e.g. at the barycenter); the same intensity is used everywhere inside the triangle;
- ▶ Gouraud shading: one normal is computed per vertex, the illumination model is applied at each vertex, and intensity inside the triangle is computed by interpolation of the intensity at the vertices.

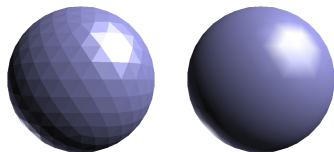


Figure: Left: flat shading; Right: Gouraud shading



# Flat shading in OpenGL

In OpenGL, flat shading is obtained by calling *glShadeModel(GL\_FLAT)* and specifying 1 normal per face:

```
glShadeModel(GL_FLAT);  
// ...  
glBegin(GL_TRIANGLES);  
// the normal vector should be unit  
glNormal3f(nx, ny, nz);  
  
glVertex3f(v0x, v0y, v0z);  
glVertex3f(v1x, v1y, v1z);  
glVertex3f(v2x, v2y, v2z);  
glEnd();
```

# Gouraud shading in OpenGL

In OpenGL, Gouraud (or smooth) shading is obtained by calling *glShadeModel(GL\_SMOOTH)* and specifying 1 normal per vertex:

```
glShadeModel(GL_SMOOTH);  
// ...  
glBegin(GL_TRIANGLES);  
glNormal3f(n0x, n0y, n0z);  
glVertex3f(v0x, v0y, v0z);  
  
glNormal3f(n1x, n1y, n1z);  
glVertex3f(v1x, v1y, v1z);  
  
glNormal3f(n2x, n2y, n2z);  
glVertex3f(v2x, v2y, v2z);  
glEnd();
```

# Rendering of triangle mesh - indexed triangle list

Let us assume that we want to render a triangle mesh stored as an indexed list of vertices and triangles.

```
TriMesh tri_mesh;  
  
void display(void) {  
    int n = tri_mesh._number_triangles;  
    int i;  
    for (i = 0; i < n; ++i) {  
        // ...  
    }  
}
```

## Rendering of triangle mesh

```
void display(void) {  
    // ...  
    for (i = 0; i < n; ++i) {  
        int v0, v1, v2;  
        Vector3 p0, p1, p2;  
        Vector3 n0, n1, n2;  
  
        v0 = tri_mesh._triangles[i]._v0;  
        v1 = tri_mesh._triangles[i]._v1;  
        v2 = tri_mesh._triangles[i]._v2;  
  
        n0 = tri_mesh._vertex_normals[v0];  
        n1 = tri_mesh._vertex_normals[v1];  
        n2 = tri_mesh._vertex_normals[v2];  
        // ...  
    }  
}
```

## Rendering of triangle mesh

```
void display(void) {  
    for (i = 0; i < n; ++i) {  
        // ...  
        p0 = tri_mesh._vertices[v0];  
        p1 = tri_mesh._vertices[v1];  
        p2 = tri_mesh._vertices[v2];  
  
        glBegin(GL_TRIANGLES);  
        glNormal3f(n0._x, n0._y, n0._z);  
        glVertex3f(p0._x, p0._y, p0._z);  
        glNormal3f(n1._x, n1._y, n1._z);  
        glVertex3f(p1._x, p1._y, p1._z);  
        glNormal3f(n2._x, n2._y, n2._z);  
        glVertex3f(p2._x, p2._y, p2._z);  
        glEnd();  
    }  
}
```

## Rendering of triangle mesh - Half-Edge

```
void display(void) {  
    int i;  
    for (i = 0; i < num_faces; ++i) {  
        Face f = tri_mesh.faces[i];  
        Halfedge* he = f._he;  
        glBegin(GL_POLYGON);  
        do {  
            Vector3 n = he->_vertex->_normal;  
            Vector3 v = he->_vertex->_coordinates;  
            glNormal3f(n._x,n._y,n._z);  
            glVertex3f(v._x,v._y,v._z);  
            he = he->_next;  
        } while (he != f._he);  
        glEnd();  
    }  
}
```

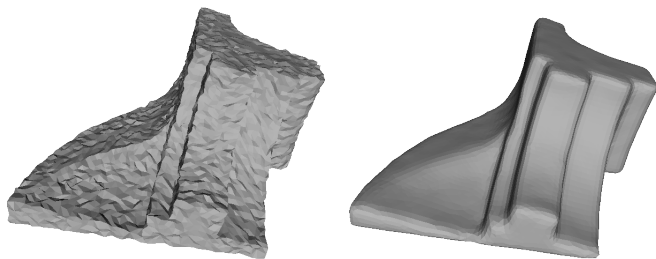
# Mesh processing

Over the years, a number of operations have been proposed:

- ▶ Smoothing,
- ▶ Decimation/Simplification,
- ▶ Repairing,
- ▶ Deformation,
- ▶ Parameterization,
- ▶ Remeshing,
- ▶ Shape correspondence and matching,
- ▶ ...

# Smoothing

Smoothing: remove noise from model. Typically needed for meshes acquired via scanning.



**Figure:** Left: noisy triangle mesh; Right: smoothed triangle mesh



# Laplacian smoothing

## Algorithm:

Repeat for a given number of iterations:

For each vertex  $v_i$ :

    Compute  $L(v_i)$

    Update  $v_i \leftarrow v_i + \lambda L(v_i)$

where  $0 < \lambda < 1$ .

Now we need to provide an expression for this operator  $L$ .

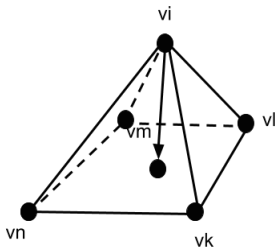
# Laplacian smoothing: umbrella operator

Use:

$$L(v_i) = \frac{1}{|N_i|} \left( \sum_{v_j \in N_i} v_j \right) - v_i$$

where  $N_i$  is the set of vertices adjacent to  $v_i$ , and  $|N_i|$  is the cardinality (number of elements) of this set.

Problem: shrinkage, modification of flat meshes.

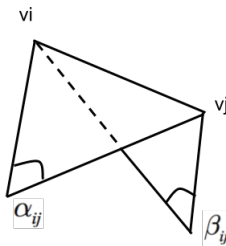


# Laplace operator discretization: Cotangent weights

Use  $L(v_i) = \Delta_S v_i$  and approximate the Laplace-Beltrami operator ( $\Delta_S$ ):

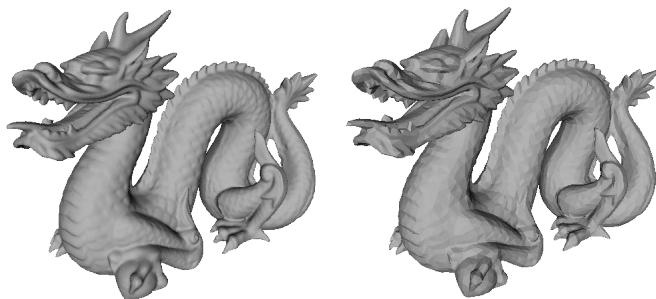
$$L(v_i) = \frac{1}{\sum_{j \in N_i} w_{ij}} \left( \sum_{j \in N_i} w_{ij} v_j \right) - v_i$$

where  $w_{ij} = \frac{1}{2}(\cot \alpha_{ij} + \cot \beta_{ij})$



# Decimation

Decimation: decrease the number of vertices / triangles while keeping the appearance of the original object



**Figure:** Left: input triangle mesh for a dragon (Number of vertices: 99892; Number of triangles: 200000); Right: decimated object (Number of vertices: 6247; Number of triangles: 12500)

# Decimation: Greedy optimization

## Algorithm:

For each vertex:

- Evaluate vertex quality

- Enqueue in priority queue

Repeat until satisfied criterion:

- Dequeue vertex from priority queue

- Identify neighboring triangles

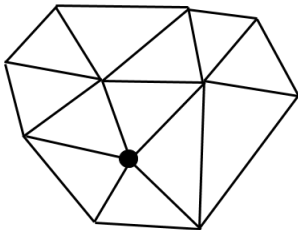
- Remove triangles

- Triangulate hole

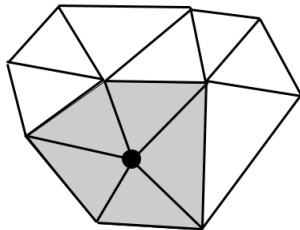
- Update vertex quality

For evaluating the quality of a vertex, one can use the squared distance to the best plane fitted from the vertex and its neighboring vertices.

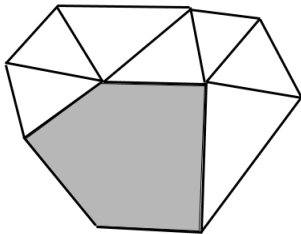
# Decimation operator: vertex removal



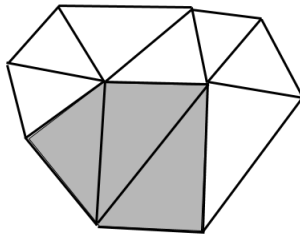
Select a vertex



Identify neighboring triangles



Remove the triangles



Triangulate the hole

# Libraries for mesh manipulation

- ▶ OpenMesh: <http://www.openmesh.org>. Generic and efficient polygon mesh data-structure (half-edge);
- ▶ OpenFlipper: <http://www.openflipper.org>. Programming framework for processing, modeling and rendering of geometric data (based on OpenMesh);
- ▶ CGAL: <http://www.cgal.org>. Robust library for computational geometry (half-edge);
- ▶ libigl: <http://libigl.github.io/libigl/>. A library for geometry processing (indexed triangle set).

# Software for mesh processing

- ▶ MeshLab: <http://meshlab.sourceforge.net/>. Implement most of the state of the art algorithms for mesh processing;
- ▶ Graphite: [http://alice.loria.fr/index.php?option=com\\_content&view=article&id=22;](http://alice.loria.fr/index.php?option=com_content&view=article&id=22;)
- ▶ Blender: <https://www.blender.org>; 3D creation suite; include functionalities for geometric modeling.



# Conclusion

Triangle meshes are a good compromise for representing surface:

- ▶ Approximation:  $O(h^2)$  error
- ▶ Efficient algorithms for rendering (rasterizer)
- ▶ Efficient techniques for evaluation and interrogation (position of point on the surface, normal, curvatures, etc)
- ▶ Many operations available (smoothing, decimation, etc)