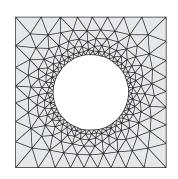
# From mesh generation to associahedra and related structures

Lionel Pournin Université Paris 13

April 20, 2017



## Summary

#### 1. Mesh generation

The Delaunay criterion, Some generation algorithms.

#### 2. The Euclidean case

Polygons and punctured polygons.

#### 3. Topological surfaces

Filling surfaces,

The growth rate of the diameter of flip-graphs.

#### 4. Conclusion

Open problems...

What is a mesh and what are they used for?

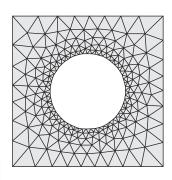
#### A mesh is....

... a decomposition of some (often Euclidean) space (or a portion of it) into elementary cells (triangles, polygons, simplices, polyhedra...)

Meshes are used in a number of applications:

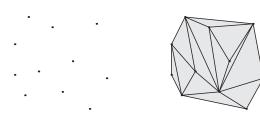
- Numerical Analysis,
- Engineering (all flavors),
- Computer graphics,
- ...

Meshes whose cells are triangular (or simplicial) are called **triangulations**.



What is a mesh and what are they used for?

A given portion of space can have several meshes, even for a same prescribed set of vertices. Not all of them are of the same quality.





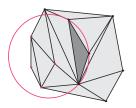
#### A good mesh usually...

- does not have elongated cells,
- has cells whose complexity is controlled (triangles),
- has vertices whose degree is controlled.

Delaunay triangulations

# Definition (Delaunay, 1934).

A *d*-dimensional triangulation is called *Delaunay* when the spheres circumscribed to its *d*-simplices do not enclose any vertex.





#### Properties.

- Cells are triangles whose elongation is the least possible,
- Minimal angle is maximal (vertex degree is controlled),
- Unique for a set of points in general position.

Delaunay triangulations

# Definition (Delaunay, 1934).

A *d*-dimensional triangulation is called *Delaunay* when the spheres circumscribed to its *d*-simplices do not enclose any vertex.





- 0) Consider a triangle that contains all the points,
- 1) Insert a point a in the triangulation,
- 2) If needed, modify the triangles around a and return to 1).

Delaunay triangulations

## Definition (Delaunay, 1934).

A *d*-dimensional triangulation is called *Delaunay* when the spheres circumscribed to its *d*-simplices do not enclose any vertex.



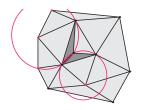


- 0) Consider a triangle that contains all the points,
- 1) Insert a point a in the triangulation,
- 2) If needed, modify the triangles around a and return to 1).

Delaunay triangulations

# Definition (Delaunay, 1934).

A *d*-dimensional triangulation is called *Delaunay* when the spheres circumscribed to its *d*-simplices do not enclose any vertex.



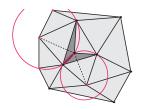


- 0) Consider a triangle that contains all the points,
- 1) Insert a point a in the triangulation,
- 2) If needed, modify the triangles around a and return to 1).

Delaunay triangulations

# Definition (Delaunay, 1934).

A *d*-dimensional triangulation is called *Delaunay* when the spheres circumscribed to its *d*-simplices do not enclose any vertex.



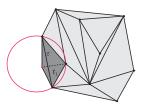


- 0) Consider a triangle that contains all the points,
- 1) Insert a point a in the triangulation,
- 2) If needed, modify the triangles around a and return to 1).

Delaunay triangulations

# Definition (Delaunay, 1934).

A *d*-dimensional triangulation is called *Delaunay* when the spheres circumscribed to its *d*-simplices do not enclose any vertex.





- 0) Consider the two triangles  $t_1$  and  $t_2$  incident to an edge  $\varepsilon$ ,
- 1) If the cirumcircle of  $t_1$  contains the opposite vertex of  $t_2$ , flip  $\varepsilon$ ,
- 2) If there is no such edge left, stop there. Otherwise return to 1).

Delaunay triangulations

# Definition (Delaunay, 1934).

A *d*-dimensional triangulation is called *Delaunay* when the spheres circumscribed to its *d*-simplices do not enclose any vertex.



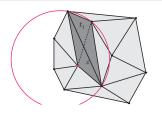


- 0) Consider the two triangles  $t_1$  and  $t_2$  incident to an edge  $\varepsilon$ ,
- 1) If the cirumcircle of  $t_1$  contains the opposite vertex of  $t_2$ , flip  $\varepsilon$ ,
- 2) If there is no such edge left, stop there. Otherwise return to 1).

Delaunay triangulations

# Definition (Delaunay, 1934).

A *d*-dimensional triangulation is called *Delaunay* when the spheres circumscribed to its *d*-simplices do not enclose any vertex.



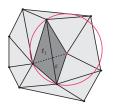


- 0) Consider the two triangles  $t_1$  and  $t_2$  incident to an edge  $\varepsilon$ ,
- 1) If the cirumcircle of  $t_1$  contains the opposite vertex of  $t_2$ , flip  $\varepsilon$ ,
- 2) If there is no such edge left, stop there. Otherwise return to 1).

Delaunay triangulations

# Definition (Delaunay, 1934).

A *d*-dimensional triangulation is called *Delaunay* when the spheres circumscribed to its *d*-simplices do not enclose any vertex.



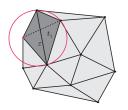


- 0) Consider the two triangles  $t_1$  and  $t_2$  incident to an edge  $\varepsilon$ ,
- 1) If the cirumcircle of  $t_1$  contains the opposite vertex of  $t_2$ , flip  $\varepsilon$ ,
- 2) If there is no such edge left, stop there. Otherwise return to 1).

Delaunay triangulations

# Definition (Delaunay, 1934).

A *d*-dimensional triangulation is called *Delaunay* when the spheres circumscribed to its *d*-simplices do not enclose any vertex.



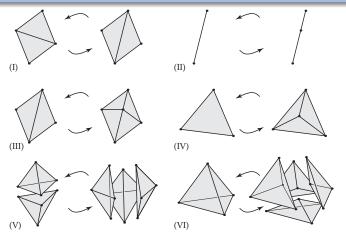


- 0) Consider the two triangles  $t_1$  and  $t_2$  incident to an edge  $\varepsilon$ ,
- 1) If the cirumcircle of  $t_1$  contains the opposite vertex of  $t_2$ , flip  $\varepsilon$ ,
- 2) If there is no such edge left, stop there. Otherwise return to 1).

**Flips** 

#### Informally, flips are...

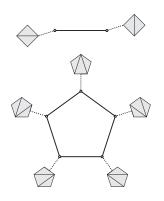
 $...local\ operations,$  that modify the triangulations of a  $\it fixed$  point set  $\it A.$ 

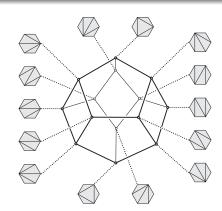


Flip-graphs

#### The flip-graph of a point set A is the graph whose...

- ullet ...vertices are the triangulations of  ${\cal A}$ ,
- ...edges are the flips between them.





Flip-graph connectedness

#### Question.

Is the flip-graph of a finite set of points  ${\mathcal A}$  always connected?

#### Yes when

- $\mathcal{A}$  has dimension at most 2 (Lawson, 1972),
- $|\mathcal{A}| \dim(\mathcal{A}) \le 4$  (Azaola and Santos, 2000).

#### No...

- $\bullet$  ... for particular sets  ${\cal A}$  of dimension 6 and above (Santos, 2000),
- ... or of dimension 5 (Santos, 2005).

#### Open Question.

Is the flip-graph of a finite, 3- or 4-dimensional set of points always connected?

Flip-graph connectedness

One can enumerate the triangulations of a finite set of points efficiently by exploring its flip-graph *provided this graph is connected!* 

#### Examples.

- If the set of points is made up of the vertices of a n-gon, the number of triangulations is Catalan number  $C_{n-2}$ ,
- The square has 2 symmetrical triangulations,
- The (3-dimensional) cube has 74 triangulations, partitioned into 6 symmetry classes (De Loera, 1996),
- The 4-dimensional cube has 92 487 256 triangulations, partitioned into 247 451 symmetry classes (P, 2013).

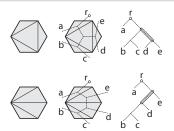
#### Open Question.

How many triangulations does the *d*-dimensional cube have when d > 4?

Polygons

#### Remark (Sleator, Tarjan, and Thurston, 1988).

The flip-graph of a convex polygon can be alternatively obtained by replacing triangulations by binary trees and flips by rotations.

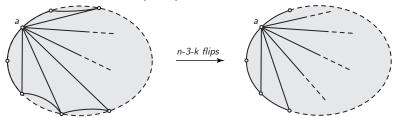


## Theorem (Sleator, Tarjan, and Thurston, 1988).

The diameter of the flip-graph of a convex n-gon is at most 2n-10 when n>12 and this bound is sharp when n is large enough.

#### Polygons

In order to obtain the upper bound of 2n-10, flip a triangulation U (left) to a canonical triangulation (right) as follows:



Here, k is the number of interior edges of U incident to vertex a. Call I the number of interior edges incident to a in another trianulation V. One can transform U into V with 2n-6-(k+I) flips.

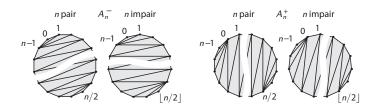
When n > 12, a counting argument provides a vertex a so that  $k + l \ge 4$ .

Hence  $d(U, V) \leq 2n - 10$  when n > 12.

Polygons

# Theorem (P, 2014).

The diameter of the flip-graph of a convex n-gon is 2n - 10 when n > 12.



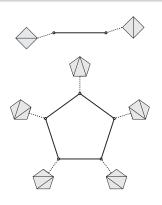
#### Open Questions.

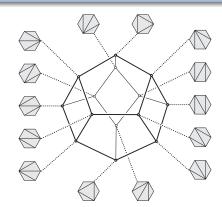
- Other pairs of triangulations with this distance?
- Polynomial algorithm to compute flip-distance?
- Other (2-dimensional) sets of points?

Polygons

## Theorem (Lee, 1989).

The flip-graph of a convex n-gon is the 1-skeleton of the (n-3)-dimensional associahedron.





Polygons

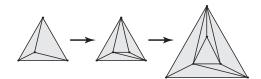
## Theorem (Lee, 1989).

The flip-graph of a convex n-gon is the 1-skeleton of the (n-3)-dimensional associahedron.

#### Definition.

A *d*-dimensional triangulation is *regular* if it can be obtained by projecting the *lower* faces of a (d + 1)-dimensional polytope.





Polygons

# Theorem (Lee, 1989).

The flip-graph of a convex n-gon is the 1-skeleton of the (n-3)-dimensional associahedron.

# Theorem (Gel'fand, Kapranov, and Zelevinskii, 1990).

The sub-graph induced by regular triangulations in the flip-graph of a d-dimensional set of n points is the 1-skeleton of a (n-d-1)-dimensional polytope, called the *secondary polytope*.

#### Open Questions.

- Diameter (of the 1-skeleton) of secondary polytopes?
- Do secondary polytopes satisfy the Hirsch bound ( $\Delta \leq f v$ )?
- Polytopal realizations of other flip-graphs?

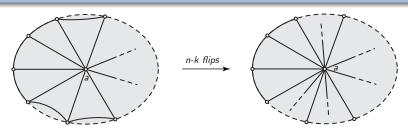
Punctured polygons

#### Remark.

All the triangulations of a *punctured* polygon (i.e. with a unique interior point), or of a twice punctured polygon are regular.

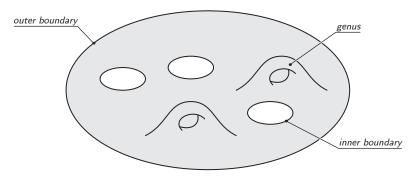
## Theorem (Parlier and P, 2016<sup>+</sup>)

The maximal distance between two triangulations of a punctured n-gon is at most 2n-7 and, for some placements of the puncture, at least 2n-8.



Filling surfaces

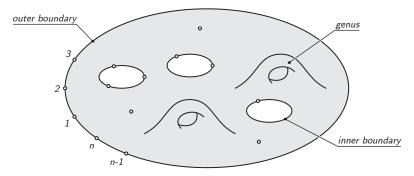
Consider an orientable surface  $\Sigma$  of genus g with r > 0 boundaries. One of the boundaries, the *outer boundary*, will be privileged.



(This is an orientable surface with 4 boundaries and genus 2)

Filling surfaces

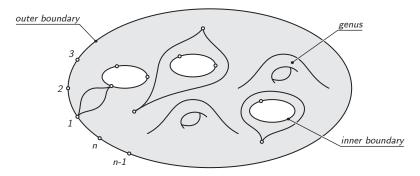
Place n on the outer boundary, labeled from 1 to n clockwise, as well as other vertices on the surface (with at least one vertex on each boundary). Let  $\Sigma_n$  denote the resulting surface.



(This is an orientable surface with 4 boundaries and genus 2)

Filling surfaces

Two arcs are *isotopic* if they can be continuously deformed into one another. They are non-isotopic when some obstacle lies between them (a boundary, a genus, or a vertex).

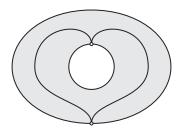


(This is an orientable surface with 4 boundaries and genus 2)

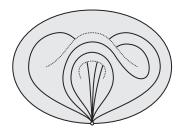
Filling surfaces

#### Definition.

A triangulation of  $\Sigma_n$  is a maximal set of pairwise non-crossing, non-isotopic arcs whose vertices are the ones we have placed on  $\Sigma$  in order to obtain  $\Sigma_n$ .



Triangulation of a cylinder with a vertex on each boundary.

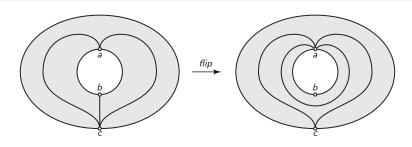


Triangulation of a bordered torus with a vertex on the boundary.

Filling surfaces

#### Definition.

A flip consists in exchanging the diagonals of a quadrilateral.



# Lemma (Švarc, 1955, Milnor, 1968).

The flip-graph whose vertices are the triangulations of  $\Sigma_n$  is quasi-isometric to any Cayley graph of the mapping class group of  $\Sigma_n$ .

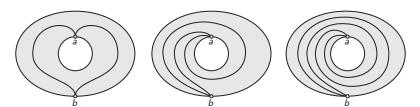
Filling surfaces

#### Question.

What can one tell about the flip-graph of  $\Sigma_n$ ?

#### Some answers.

- This graph is connected (Mosher, 1988),
- This graph can be infinite...



A natural way to solve this problem is to consider the triangulations of  $\boldsymbol{\Sigma}$  up to homeomorphism.

Filling surfaces

#### Question.

Call  $\mathcal{MF}(\Sigma_n)$  the quotient of the flip-graph of  $\Sigma_n$  by its homeomorphisms. What is the diameter  $\Delta$  of  $\mathcal{MF}(\Sigma_n)$ ?

#### What we know (so far!)

- Disk:  $\Delta = 2n 10$  when n > 12 (P, 2014),
- Cylinder with a unique point on the inner boundary:

$$\Delta = \lfloor 5n/2 \rfloor - 2$$
 (Parlier and P, 2014<sup>+</sup>),

- Surface with three boundaries:  $\Delta = 3n + O(1)$  (Parlier and P, 2014<sup>+</sup>),
- Torus with a boundary containing all the vertices:

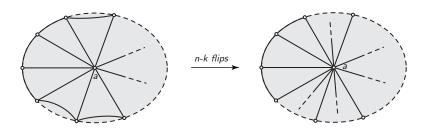
$$5n/2 + O(1) \le \Delta \le 23n/8 + O(1)$$
 (Parlier and P. 2015<sup>+</sup>),

• Punctured disk:  $\Delta = 2n - 2$  (Parlier and P, 2016<sup>+</sup>).

The punctured disk

## Theorem (Parlier and P, 2016<sup>+</sup>)

The maximal distance between two triangulations of the punctured disk is exactly 2n - 2.

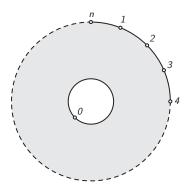


#### Remarks.

- i. The puncture cannot disappear and is incident to at least one edge.
- ii. The puncture can be incident to exactly one edge of the triangulation,

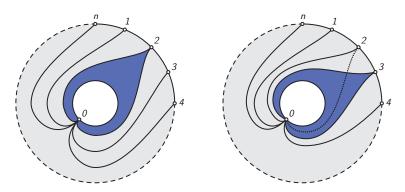
An upper bound for the cylinder

Consider a cylinder with n vertices in the outer boundary labeled 1 to n clockwise and one vertex labeled 0 in the inner boundary.



An upper bound for the cylinder

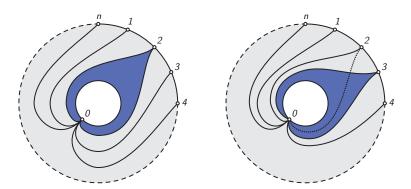
There is a (blue) triangle in any triangulation, whose vertices are 0 and a boundary vertex x. A triangulation has exactly n+2 interior edges.



Hence at most n-1 flips are required to insert all the edges incident to 0.

An upper bound for the cylinder

There is a (blue) triangle in any triangulation, whose vertices are 0 and a boundary vertex x. A triangulation has exactly n+2 interior edges.



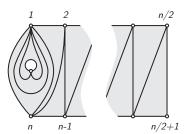
Boundary vertices are separated by at most n/2-1 vertices. Bringing the blue triangles together thus requires at most n/2 flips.

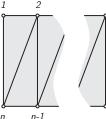
A lower bound for the cylinder

#### Lemma

The distance of two triangulations of  $\mathcal{A}$  is not greater than |5n/2| - 2.

This upper bound is sharp for all  $n \ge 1$ .







These two triangulations have flip distance exactly  $\lfloor 5n/2 \rfloor - 2$ .

#### 3. Conclusion

Open questions

#### Remarks.

- We have observed growth rates of 2 (disk, punctured disk), 5/2 (cylinder), 3 (surface with 3 boundaries).
- Growth rates cannot exceed 4 (Parlier and P, 2014<sup>+</sup>)...
- ...or be between 2 and 5/2 (Parlier and P, 2016<sup>+</sup>).

## Open Questions.

- What are all the possible growth rates?
- What is the exact growth rate for the bordered torus?
- What diameters can we compute when we allow the topology to vary (and not only *n*)?
- ...and when vertices are not marked?
- Polynomial algorithm to compute the distance?