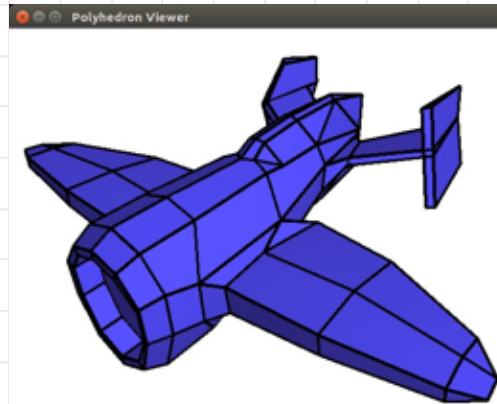
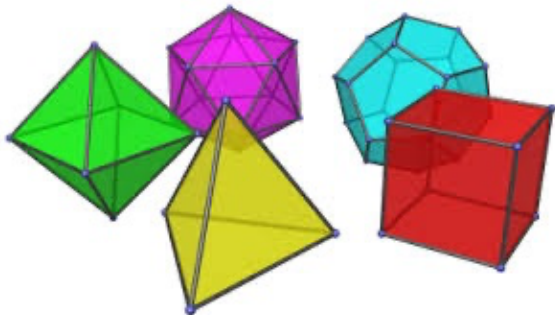


**Recall****Polyhedra**

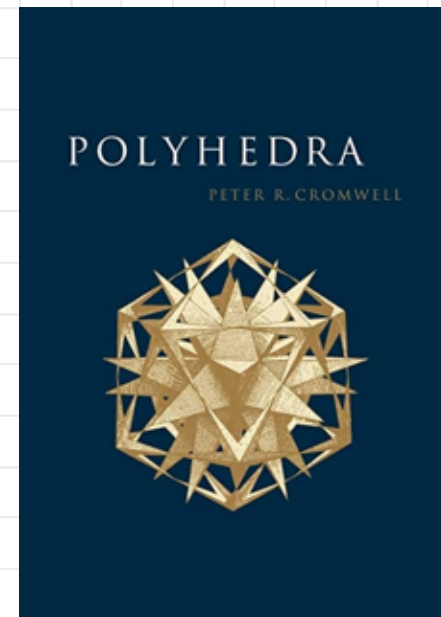
A **polyhedron** consists of a finite connected set of (plane) polygons called **faces** such that

1. if two faces intersect it is only at a common vertex or edge
2. every edge of every face is an edge of exactly one other face
3. the faces surrounding each vertex form a single circuit

<https://en.wikipedia.org/wiki/Polyhedron>



<https://doc.cgal.org/latest/Polyhedron/index.html>

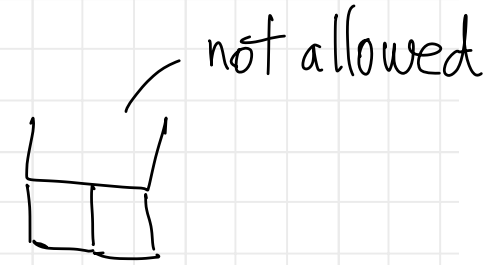


<https://tinyurl.com/yy5tt439>

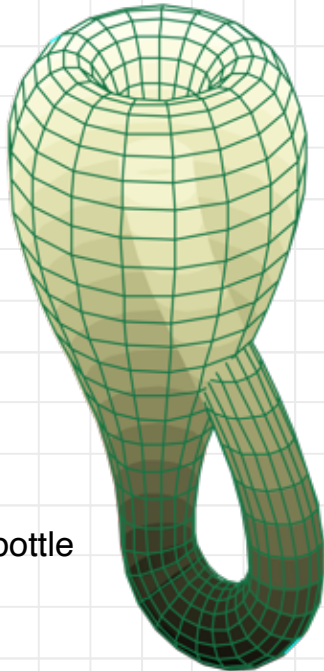
**Recall**

A **polyhedron** consists of a finite connected set of (plane) polygons called **faces** such that

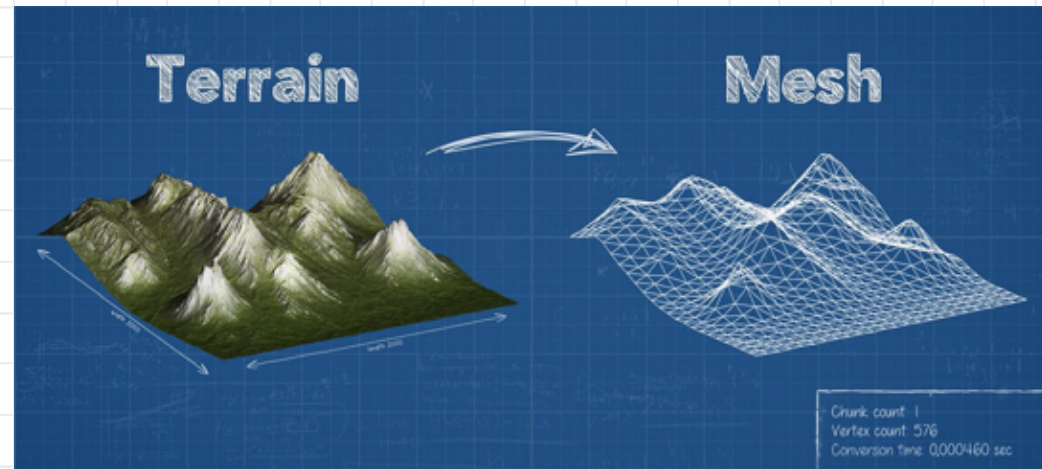
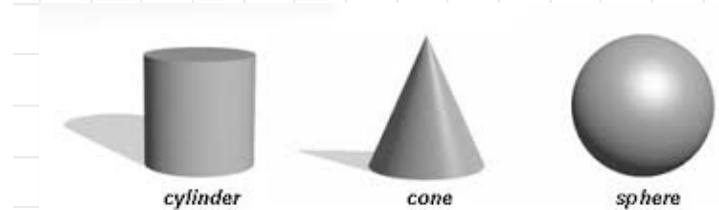
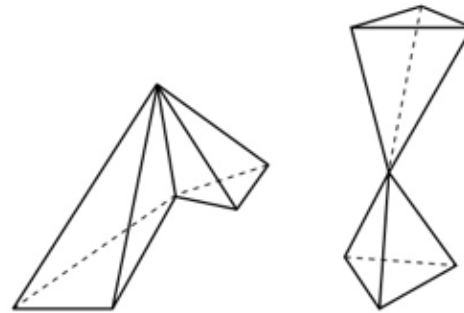
1. if two faces intersect it is only at a common vertex or edge
2. every edge of every face is an edge of exactly one other face
3. the faces surrounding each vertex form a single circuit



**NOT Polyhedra**



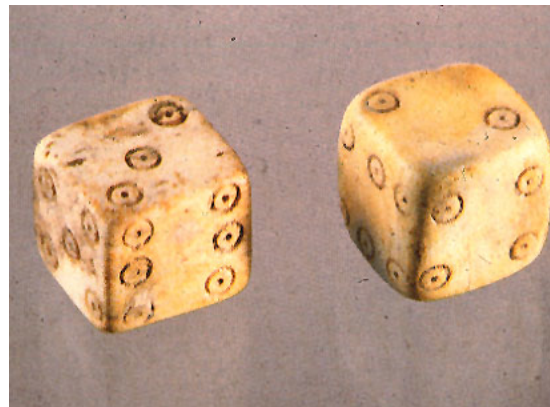
Klein bottle



terrain

Mesh Materializer

# Polyhedra



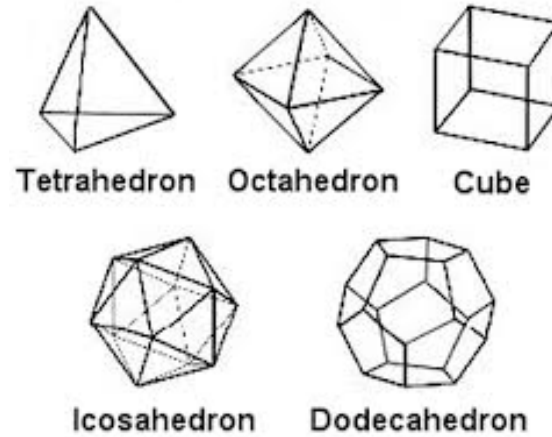
dice, Pompei, 1st century



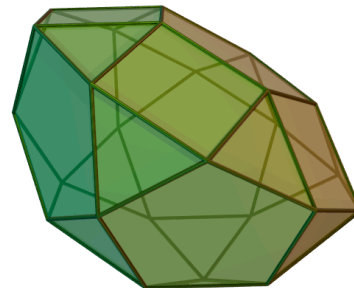
icosahedral die, Roman, 2nd century

# Polyhedra

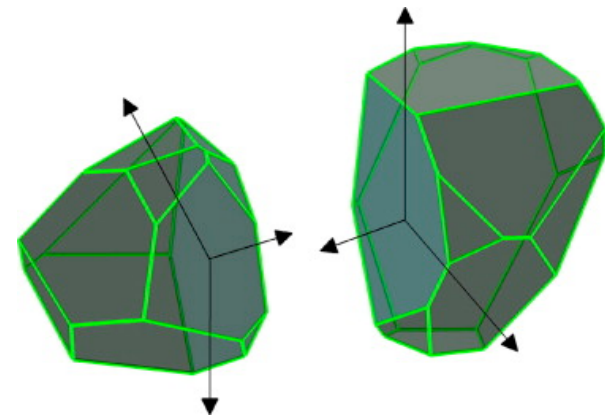
## Platonic solids



cuboctahedron



Pentagonal  
orthocupolarotunda



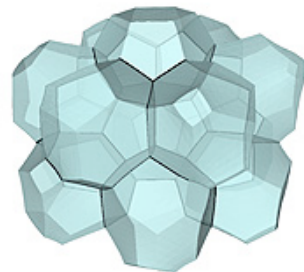
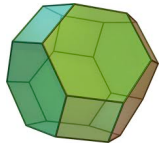
polycrystalline morphology

# Lord Kelvin's Bubble Problem

Cells of equal volume with minimum surface area

$m \geq 2D$   
~~grid~~ not  
 hex grid

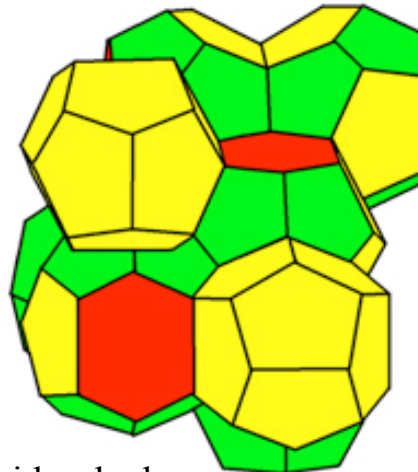
Kelvin structure, 1887 (truncated octahedra)



Gabrielli's structure, 2009

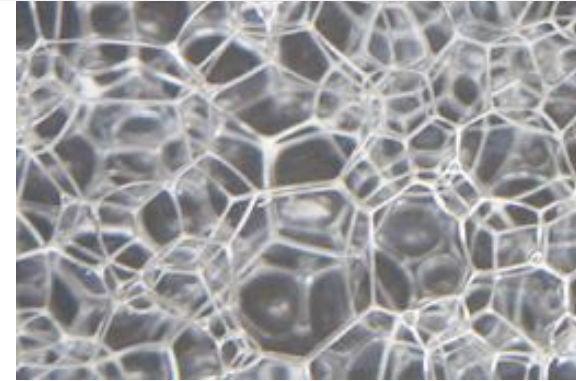
Weaire-Phelan structure, 1993

[https://en.wikipedia.org/wiki/Weaire-Phelan\\_structure](https://en.wikipedia.org/wiki/Weaire-Phelan_structure)



tetrakaidecahedron

irregular dodecahedron

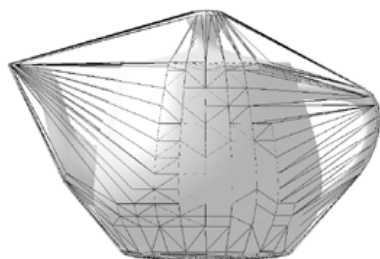
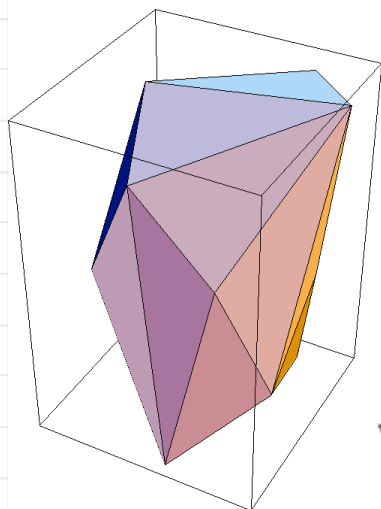
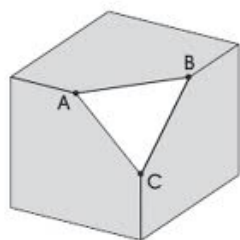


2008 Beijing Olympics

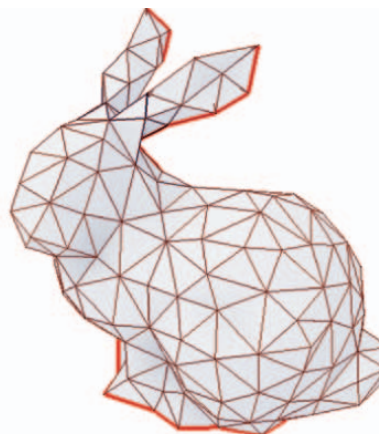
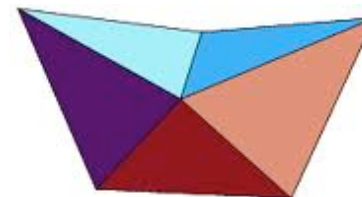
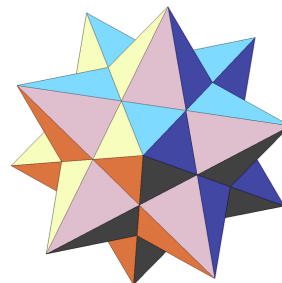


# Non-convex Polyhedra

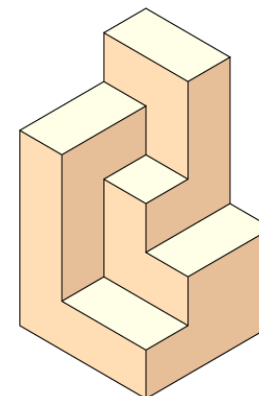
convex



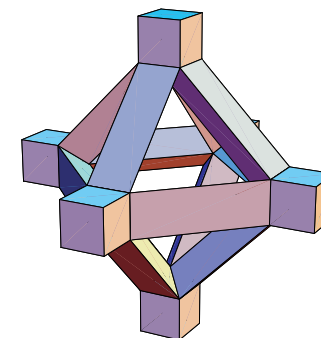
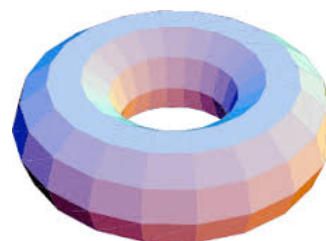
non-convex



Tomohiro Tachi



David Eppstein



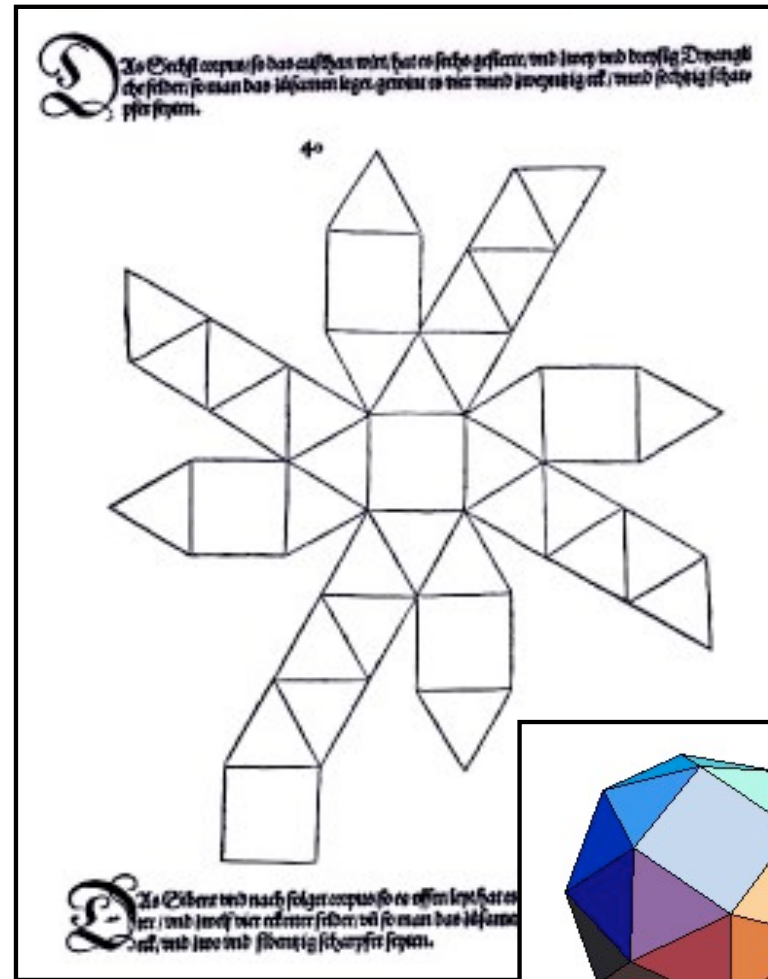
Donoso & O'Rourke

Maybe later in the course we will talk about unfolding polyhedra.

## Unfolding Polyhedra—Durer 1400's



Durer, 1498



snub cube

A **polyhedron** consists of a finite connected set of (plane) polygons called **faces** such that

1. if two faces intersect it is only at a common vertex or edge
2. every edge of every face is an edge of exactly one other face
3. the faces surrounding each vertex form a single circuit

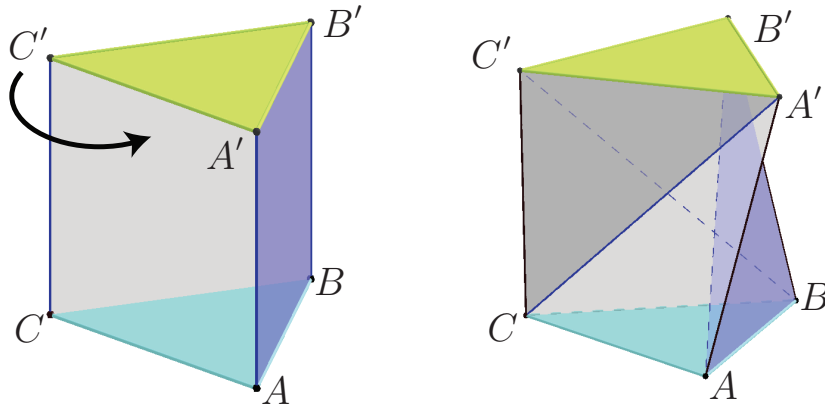
A **tetrahedron** is a polyhedron with 4 triangular faces. (aka a *simplex*)

To **tetrahedralize** a polyhedron means to partition its interior into disjoint tetrahedra whose vertices are vertices of the polyhedron.



## Not all polyhedra can be tetrahedralized

Schönhardt 1928



triangular prism with top face twisted,  
produces reflex edge in each  
rectangular face

why no tetrahedralization?

there is no single tetrahedron  
each vertex rules out one other

A — C'

B — A'

C — B'

we need 4 "independent"  
vertices.

But no such set.

$\mathbb{NP}$ -hard to test if a polyhedron can be tetrahedralized:

[On the difficulty of triangulating three-dimensional nonconvex polyhedra](#)

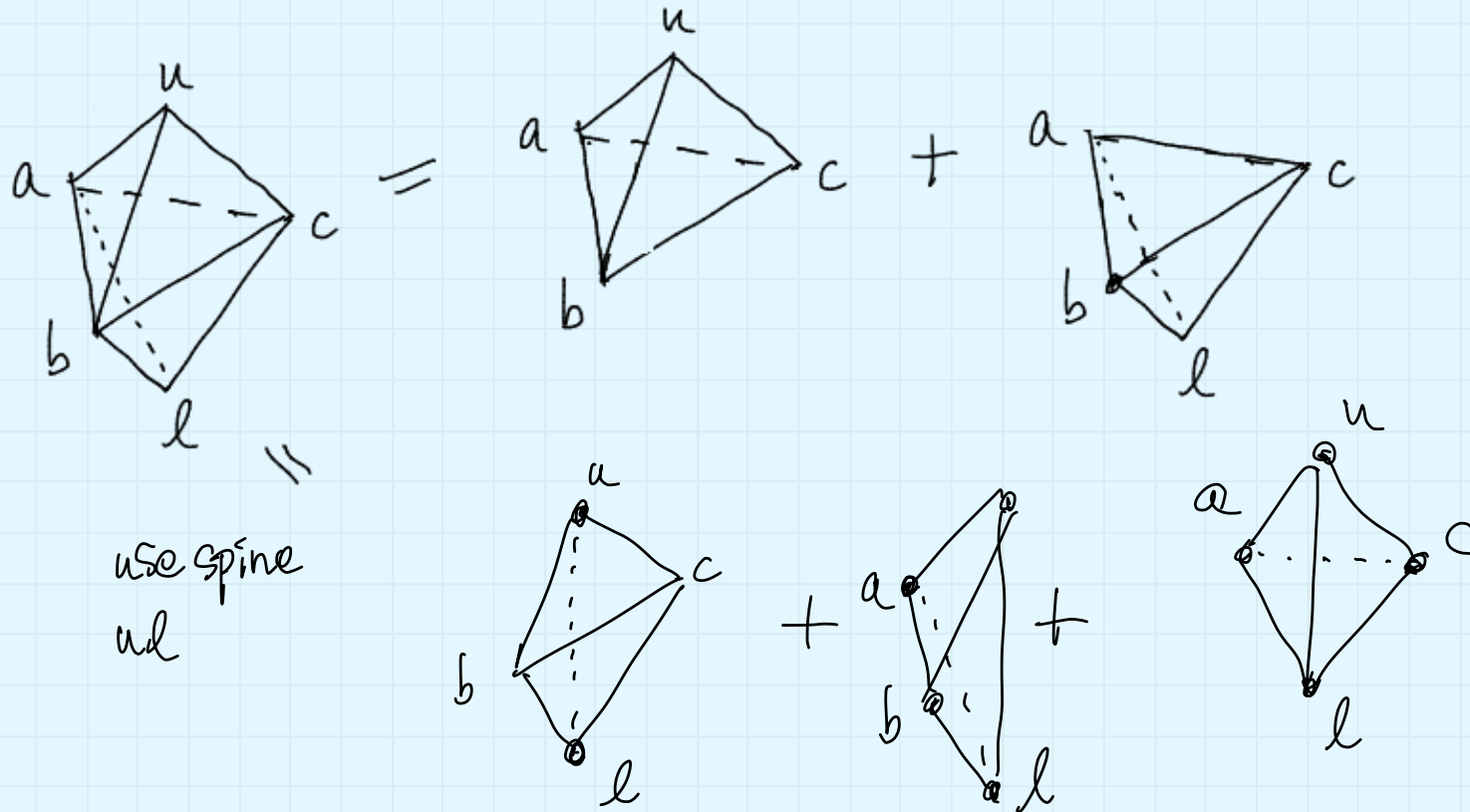
J Ruppert, R Seidel - Discrete & Computational Geometry, 1992 - Springer

<https://doi.org/10.1007/BF02187840>

A number of different polyhedral decomposition problems have previously been studied, most notably the problem of triangulating a simple polygon. We are concerned with the polyhedron triangulation problem: decomposing a three-dimensional polyhedron into a set ...

**The number of tetrahedra in a tetrahedralization is not unique**

Example:



use spine  
and

Exercise: Show that a cube can be cut into 5 tetrahedra and into 6 tetrahedra.

There are examples where number of tetra. can be  $2n-7$  or  $\binom{n-2}{2}$

## Using Steiner points to partition a polyhedron into tetrahedra

Note: the output is no longer combinatorial — we need coordinates for Steiner points

Determining the min number of Steiner points for a given polyhedron is NP-hard.

Determining the minimum number of tetrahedra for a given polyhedron is NP-hard.  
Even for convex polyhedra! (where min. number of Steiner points is 0)

 <https://link.springer.com/content/pdf/10.1007/s004540010058.pdf>

Minimal simplicial dissections and triangulations of convex 3-polytopes  
A Below, U Brehm, JA De Loera... - Discrete & Computational ..., 2000 - Springer

 [https://doi.org/10.1016/S0196-6774\(03\)00092-0](https://doi.org/10.1016/S0196-6774(03)00092-0)

The complexity of finding small triangulations of convex 3-polytopes  
A Below, [JA De Loera](#), [J Richter-Gebert](#) - Journal of Algorithms, 2004 - Elsevier

Can adding Steiner points reduce the number of tetrahedra? Yes.

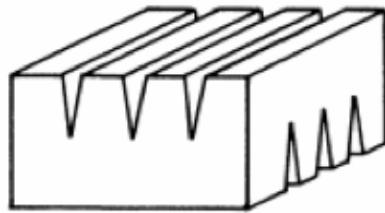
Exercise: Find an example.

Explore efficient algorithms to approximate the min number of Steiner points or tetrahedra to within some guaranteed ratio.

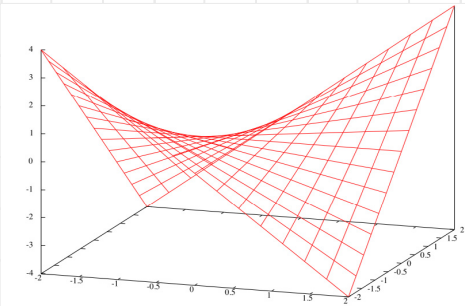
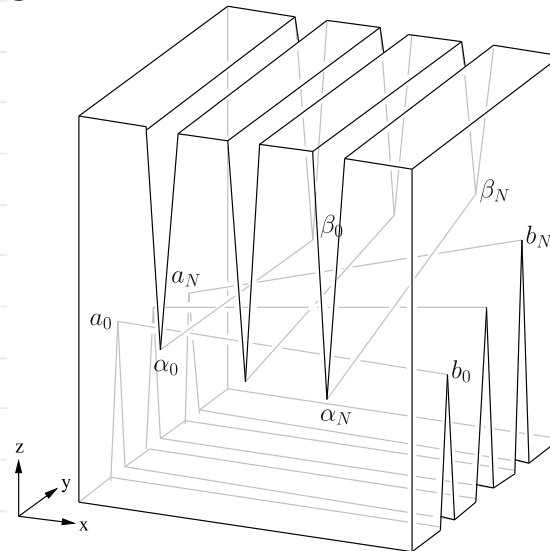
## Using Steiner points to partition a polyhedron into tetrahedra

a lower bound:

There are polyhedra that require  $\Omega(n^2)$  Steiner points even to partition into convex pieces. Chazelle, 1980's.



Chazelle



Hang Si & Nadja Goerigk

Cut wedges from a cube so they *almost* meet in the middle, and their lines form a hyperbolic paraboloid. The lines cut the hyperbolic paraboloid into  $\Theta(n^2)$  pieces, pairwise invisible, so  $\Omega(n^2)$  convex pieces are needed in any partition.

<https://doi.org/10.1137/0213031>

[Convex partitions of polyhedra: a lower bound and worst-case optimal algorithm](#)

[B Chazelle](#) - SIAM Journal on Computing, 1984 - SIAM

The problem of partitioning a polyhedron into a minimum number of convex pieces is known to be NP-hard. We establish here a quadratic lower bound on the complexity of this problem, and we describe an algorithm that produces a number of convex parts within a constant ...

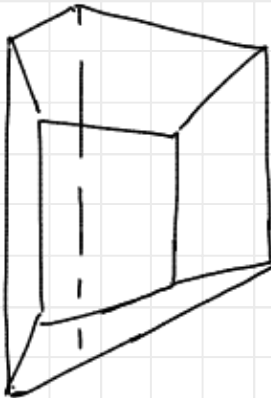
a positive result:

Any polyhedron can be partitioned into  $O(n^2)$  tetrahedra using  $O(n^2)$  Steiner points.

Bern and Eppstein, "Mesh generation and optimal triangulation", 1995

Idea — a bit like trapezoidization:

- from each edge of the polyhedron, extend a vertical wall up and down.
- pieces are "generalized prisms"



- vertical sides (each is a trapezoid)
- one top face, one bottom face (not necessarily parallel)

- this gives  $O(n^2)$  pieces
- then tetrahedralize these pieces:
  - cut into triangular prisms by triangulating the top and bottom the same way
  - then add one Steiner point in each, making sure that tetrahedra match face-to-face

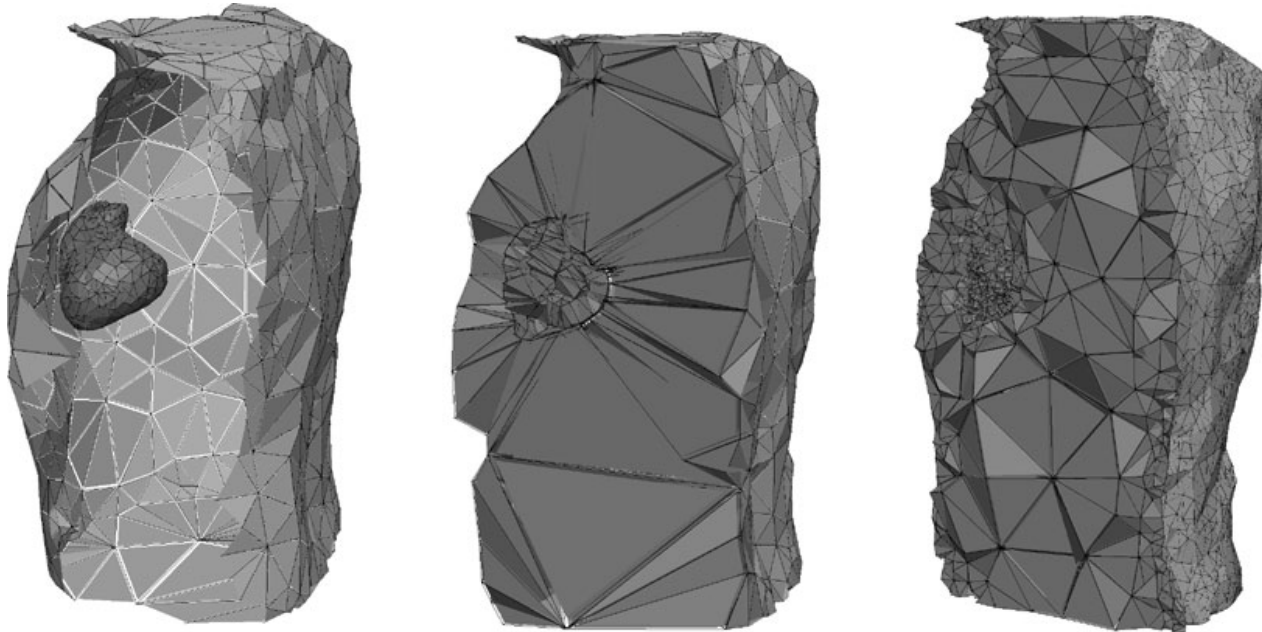
an approach from meshing (uses Delaunay tetrahedralization, which we'll cover later on)

[https://doi.org/10.1007/3-540-29090-7\\_9](https://doi.org/10.1007/3-540-29090-7_9)

[Meshing piecewise linear complexes by constrained Delaunay tetrahedralizations](#)

H Si, K Gärtner - *Proceedings of the 14th international meshing ...*, 2005 - Springer

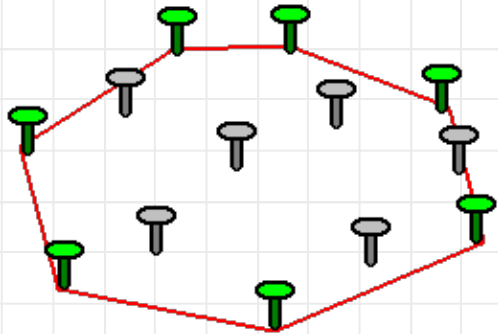
We present a method to decompose an arbitrary 3D piecewise linear complex (PLC) into a constrained Delaunay tetrahedralization (CDT).



## NEW TOPIC: Convex Hulls

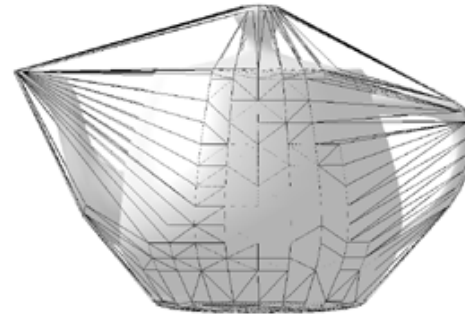
Given points in  $d$ -dimensional space, find a good “container” = convex polytope.  
 Many applications, e.g. collision detection, pattern recognition, motion planning . . .

In 2D, imagine putting a rubber band around the points



<https://brilliant.org/wiki/convex-hull/>

In 3D, wrap with shrink-wrap



Newton Collision Convex Hull

More formally:

In 2D, the **convex hull** of a set of points  $S$  is a convex polygon  $P$  with vertices in  $S$  such that every point of  $S$  lies inside.  
 (definition in 3D and higher later on)

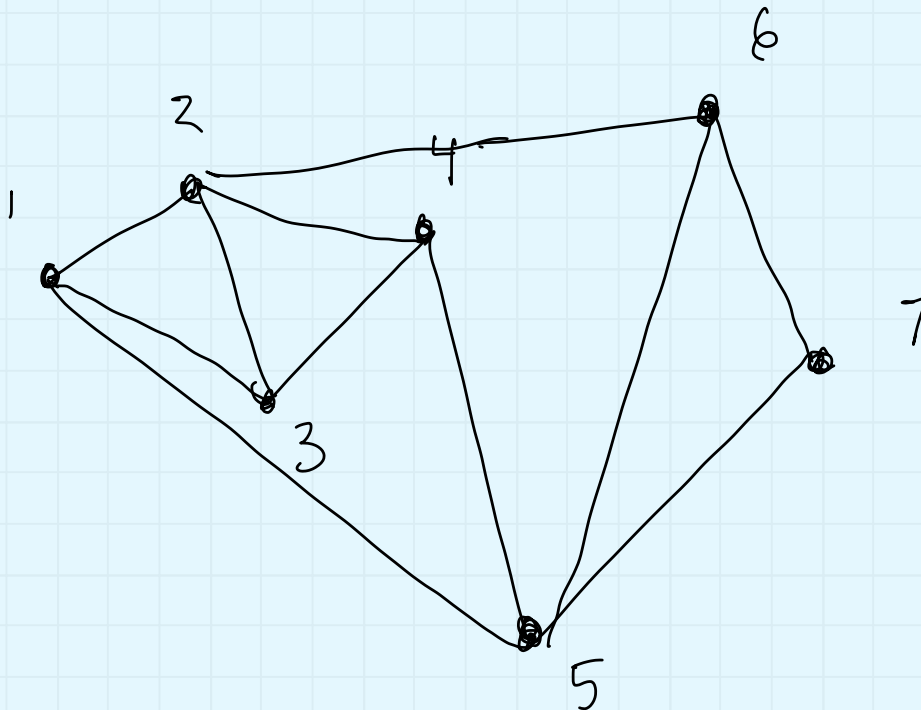
$\subseteq S$

## Convex Hull Algorithms in 2D

Almost any algorithmic paradigm will work, so this problem is a great one for Algorithms courses. See [Zurich notes, Chapter 4].

**Incremental Algorithm** — add points one by one in sorted order by x coordinate

### Example





**Incremental Algorithm** — add points one by one in sorted order by x coordinate

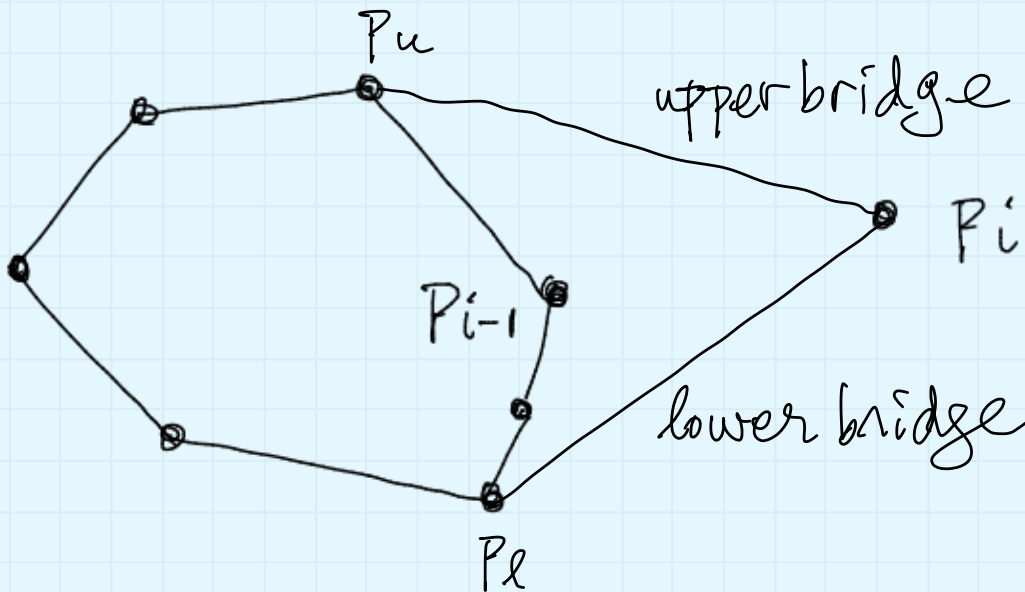
general situation

We have:

- $H_{i-1} = \text{CH}(p_1, \dots, p_{i-1})$
- as a doubly linked list
- $p_{i-1}$  is a vertex of  $H_{i-1}$

We want:

- add  $p_i$  to get  $H_i$
- $p_i$  is joined to:
  - $p_u$  by *upper bridge*
  - $p_l$  by *lower bridge*

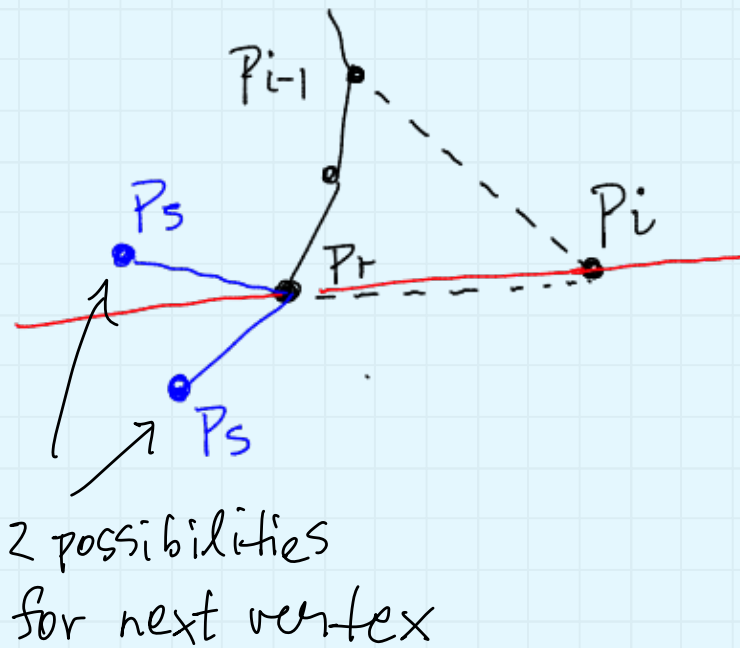


**Incremental Algorithm** — add points one by one in sorted order by x coordinate

- starting from  $p_{i-1}$  scan forward (clockwise) to find  $p_l$
- starting from  $p_{i-1}$  scan backward (counterclockwise) to find  $p_u$

invariant: the line segment from  $p_i$  to the current vertex is outside the  $CH_{i-1}$   
(true initially for line segment  $p_i p_{i-1}$ )

How to stop the scan



currently at  $p_r$   
next vertex is  $p_s$

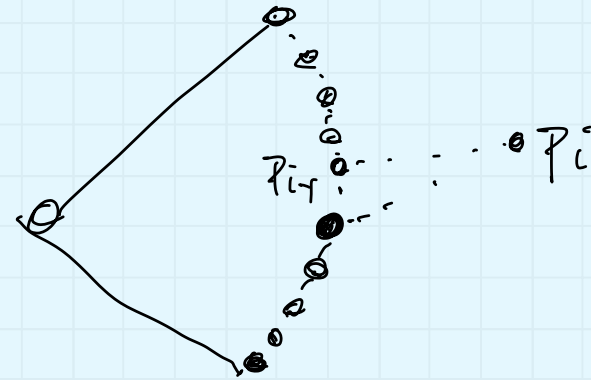
- if  $p_s$  is above line  $p_i p_r$   
then we have lower bridge

$p_l \leftarrow p_r$

- else scan moves to  $p_s$

**Run time**

Adding one point

can take  $\Theta(n)$ ? bound is  $\Theta(n^2)$ ??

Amortized analysis

each input point is added once  
and deleted at most once at  $\mathcal{O}(1)$  cost

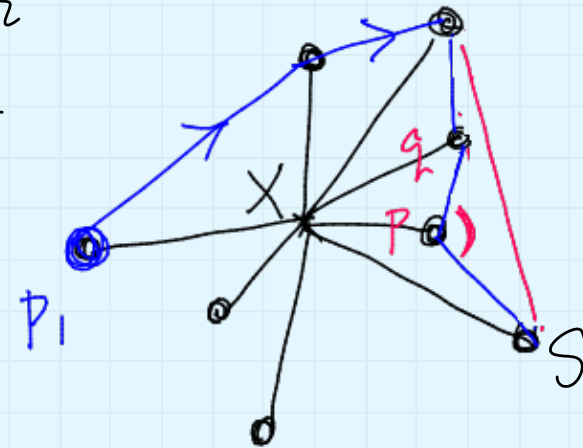
So total is  $\mathcal{O}(n)$ .+ sort  $\mathcal{O}(n \log n)$ final total  $\mathcal{O}(n \log n)$ .

## Graham's Algorithm

Another sorting-base approach.

1. Sort the points radially around some point  $X$  inside the convex hull.

2. scan from  $p_1$  in clockwise order repeatedly remove 2nd last point if it forms a reflex angle.



remove  $r$ ,

then remove  $q$ .

To find  $X$ : take average of any 3 non-collinear points. then go on from  $s$ .

To sort the points radially around  $X$ : use sidedness tests.

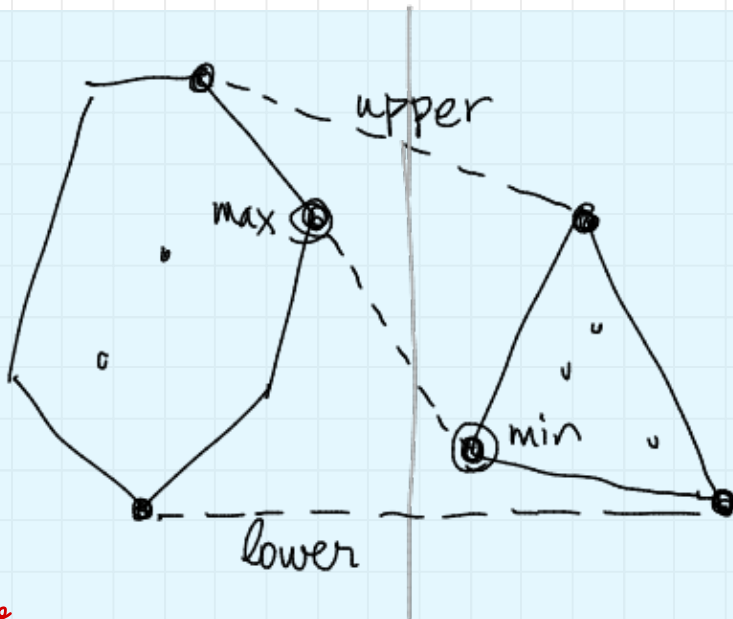
Runtime:  $O(n \log n)$  +  $O(n)$   
Sort scan.

## Divide and Conquer Algorithm

Divide the points in two by a vertical line (easy if we sort by x coordinate).

Recurse on each side.

Then combine the two sides.



EX.

Show that taking  
max  $y$  on left/right  
does not always give  
upper bridge.

To combine

Find upper & lower bridges

Start with segment

from max  $x$  on left

to min  $x$  on right

Walk up to get upper bridge

" down - - lower "

Time is  $O$  (# points that are  
removed)

(similar to incremental)

## Divide and Conquer Algorithm

### Runtime

Combine step  $O(n)$

Sort  $O(n \log n)$

combine step.

$$T(n) = 2T\left(\frac{n}{2}\right) + c \cdot n$$

$$T(n) = O(n \log n)$$

(recall from merge sort  
OR prove by induction).

## Lower Bound

There is an  $\Omega(n \log n)$  lower bound on computing the ordered convex hull in 2D on a RAM (Random Access Machine) with  $+, -, \times$ .

(recall sorting is  $\Omega(n \log n)$  on that model).

i.e. the polygon

**Proof.** Reduce sorting to finding the convex hull.

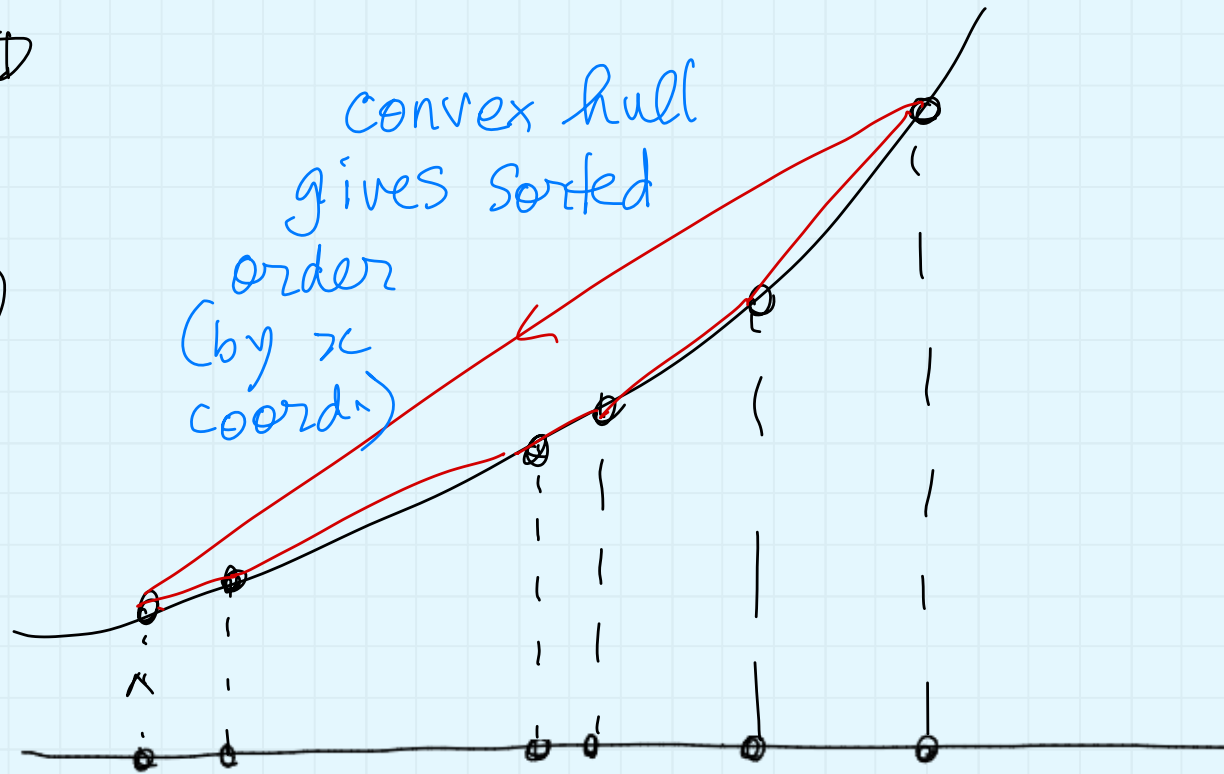
map points to 2D

map

$$x \mapsto (x, x^2)$$

convex hull  
gives sorted  
order  
(by  $x$   
coord)

input points we  
want to sort



Note: even finding the (unsorted) CH vertices takes  $n \log n$  (needs different proof)

## Summary

- partitioning polyhedra
- algorithms for convex hull in the plane

## References

- [Handbook] Chapter 30 for partitioning

For convex hulls:

- [CGAA] Section 1.1
- [Zurich notes] Chapter 4
- [O'Rourke] Chapter 3