



# Computing Convex Hulls in 3D

Computational Geometry

Dan Halperin

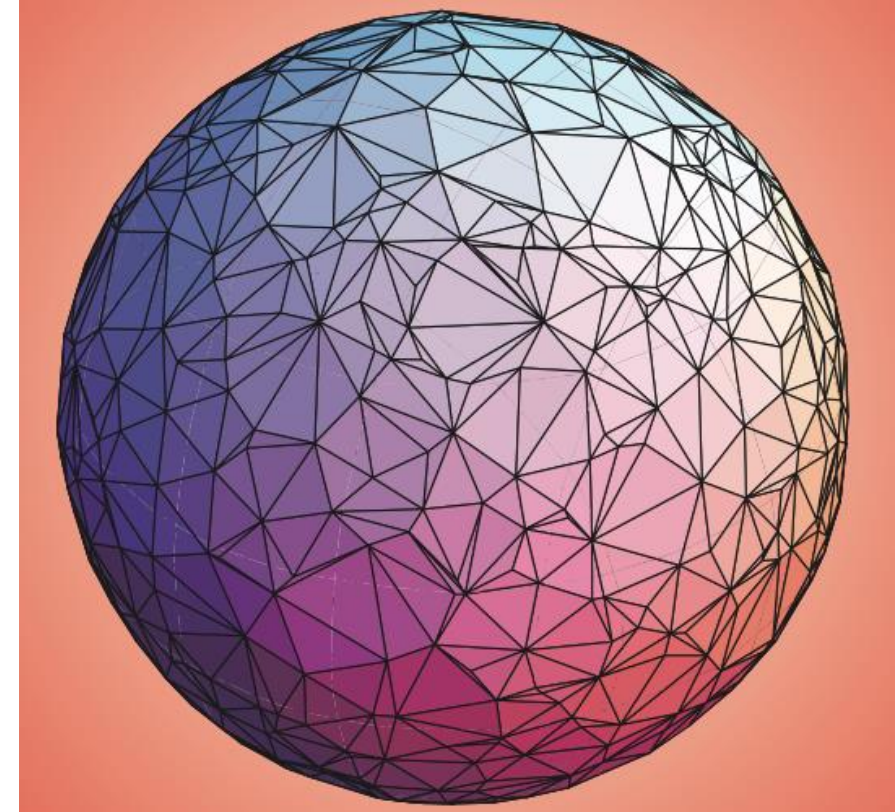
Tel Aviv University

# Credits

- figures and pseudocode pieces are taken from Chapter 11, Convex Hulls, in Computational Geometry Algorithms and Applications by de Berg et al [CGAA]
- the original figures and pseudocode are available at the book's site: [www.cs.uu.nl/geobook/](http://www.cs.uu.nl/geobook/)

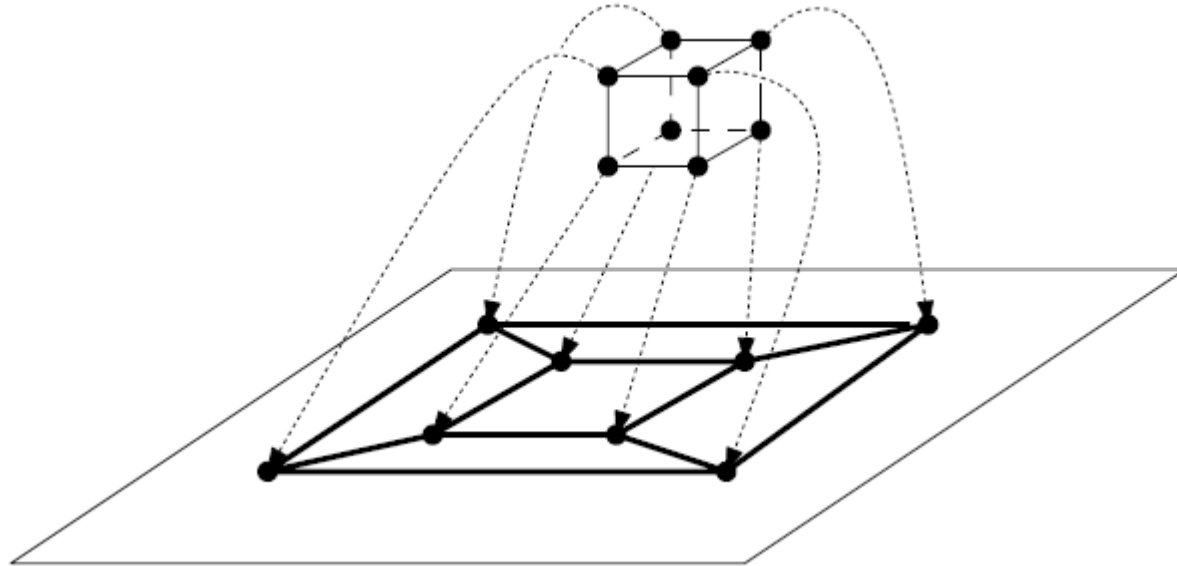
# Convex hull in 3D

- the convex hull of a set  $P$  of  $n$  points in  $R^3$  is a convex polytope whose vertices are points in  $P$
- it therefore has at most  $n$  vertices
- its vertices and edges constitute a planar graph
- $CH(P)$  has at most  $2n - 4$  faces and at most  $3n - 6$  edges



[O'Rourke]

# Convex polytopes and planar graphs



- the complexity bounds hold also for non-convex polytopes of *genus* zero with  $n$  vertices

# Gift wrapping

- the convex hull of  $n$  points in  $R^3$  can be computed in  $O(nF)$  time, where  $F$  is the number of facets in the convex hull
- hence, the worst case running time of the gift-wrapping algorithm is  $O(n^2)$

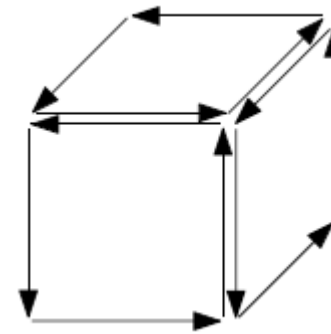
Randomized incremental  
construction

# Outline of the algorithm

- the input: a set  $P$  of  $n$  points in  $R^3$
- find four points not in a single plane, call them  $p_1, p_2, p_3, p_4$
- randomly permute the remaining points:  $p_5, p_6, \dots, p_n$
- let  $P_r$  denote the set  $\{p_1, \dots, p_r\}$
- at stage  $r = 5, \dots, n$  we add the point  $p_r$  and compute  $CH(P_r)$
- the output:  $CH(P_n)$

# Representation: DCEL

- $CH(P_r)$  is a convex polytope, its boundary is a planar graph
- the vertices are points in 3-space
- the half-edges are oriented counterclockwise around the boundary of each face, when viewed from outside  $CH(P_r)$



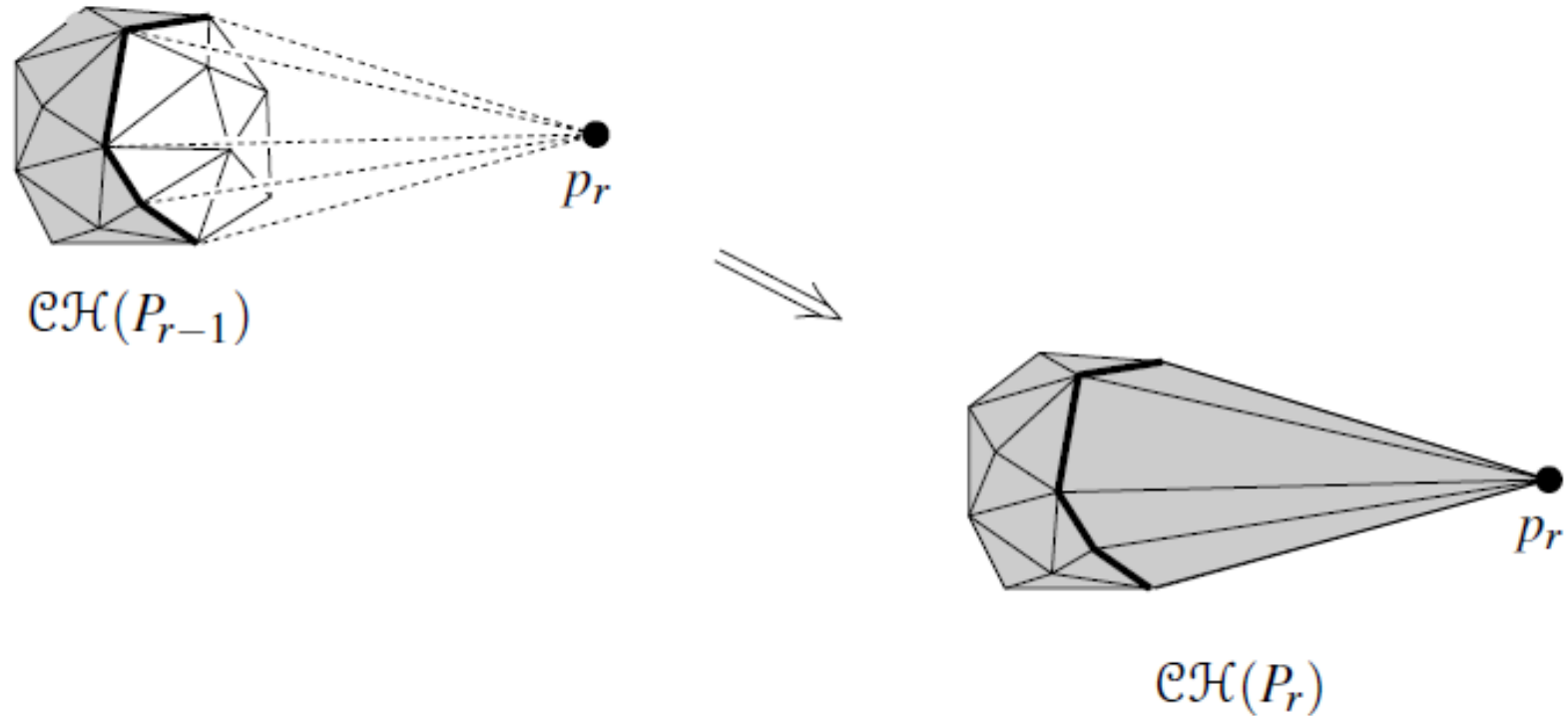


# Choosing the first four points

- choose two points arbitrarily
- choose the third point not to lie on the line through the first two
  - if all the points lie on a line, report the segment that is their convex hull
- choose the fourth point not to lie on the plane through the first three
  - if all the points lie on a plane, apply a two-dimensional CH algorithm

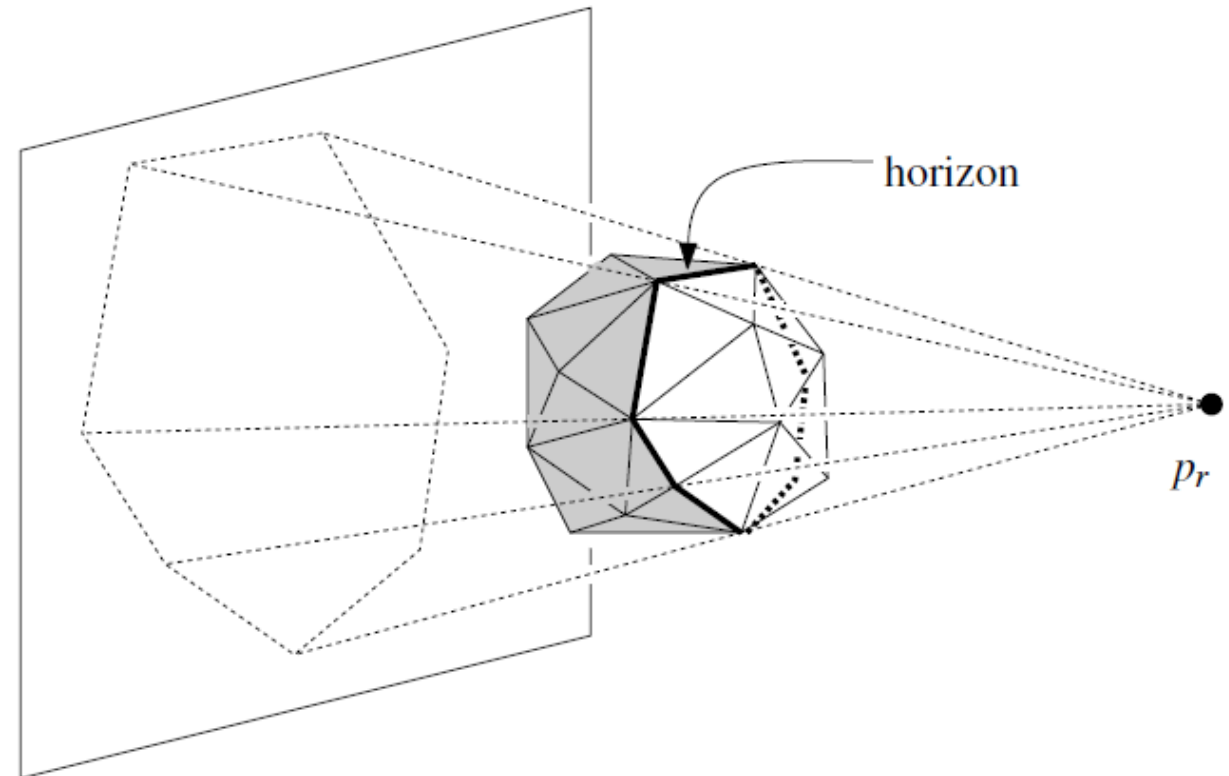
# Adding the next point $p_r$ to $CH(P_{r-1})$

- if  $p_r \in CH(P_{r-1})$  we do nothing (also when  $p_r$  is on the boundary of  $CH(P_{r-1})$ )
- else



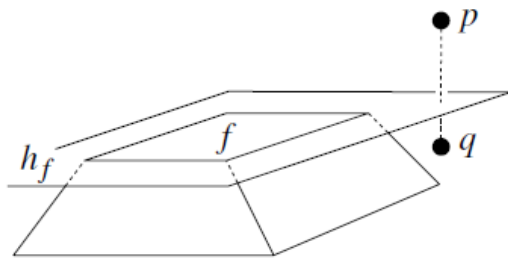
# Adding the next point $p_r$ , details

- if  $p_r \notin CH(P_{r-1})$  we distinguish between visible facets of  $CH(P_{r-1})$  and invisible facets (w.r.t.  $p_r$ )
- in-between visible and invisible facets lies the *horizon*
- the invisible facets will move on to  $CH(P_r)$
- the visible facets will be replaced by triangles between  $p_r$  and edges of the horizon

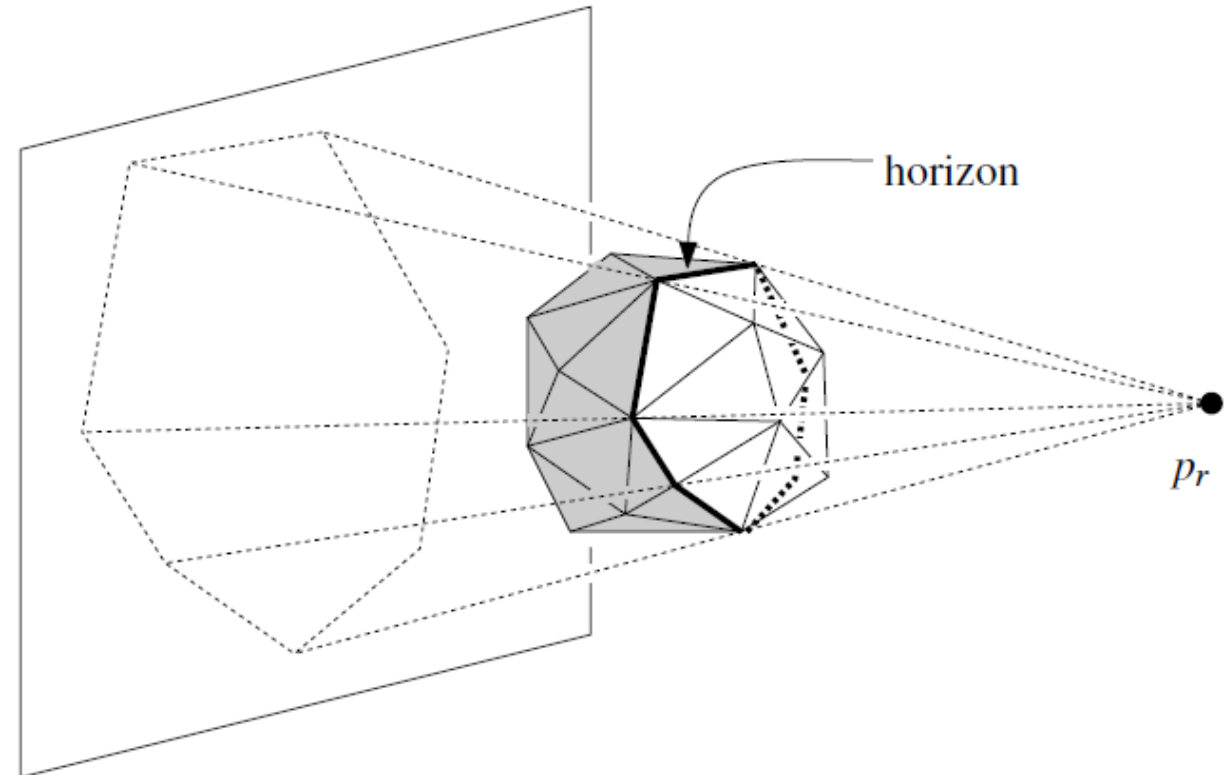


When is a face of  $CH(P_{r-1})$  visible from  $p_r$ ?

- let  $h_f$  be the plane through the facet  $f$  of  $CH(P_{r-1})$
- $CH(P_{r-1})$  is on one side of  $h_f$
- the facet  $f$  is visible from  $p_r$  if  $p_r$  is on the other side of  $h_f$  (not the side of  $CH(P_{r-1})$ )

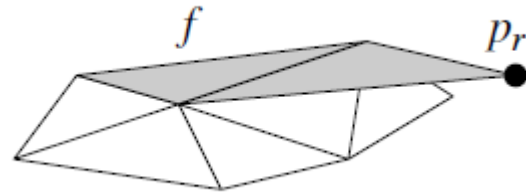


$f$  is visible from  $p$ ,  
but not from  $q$



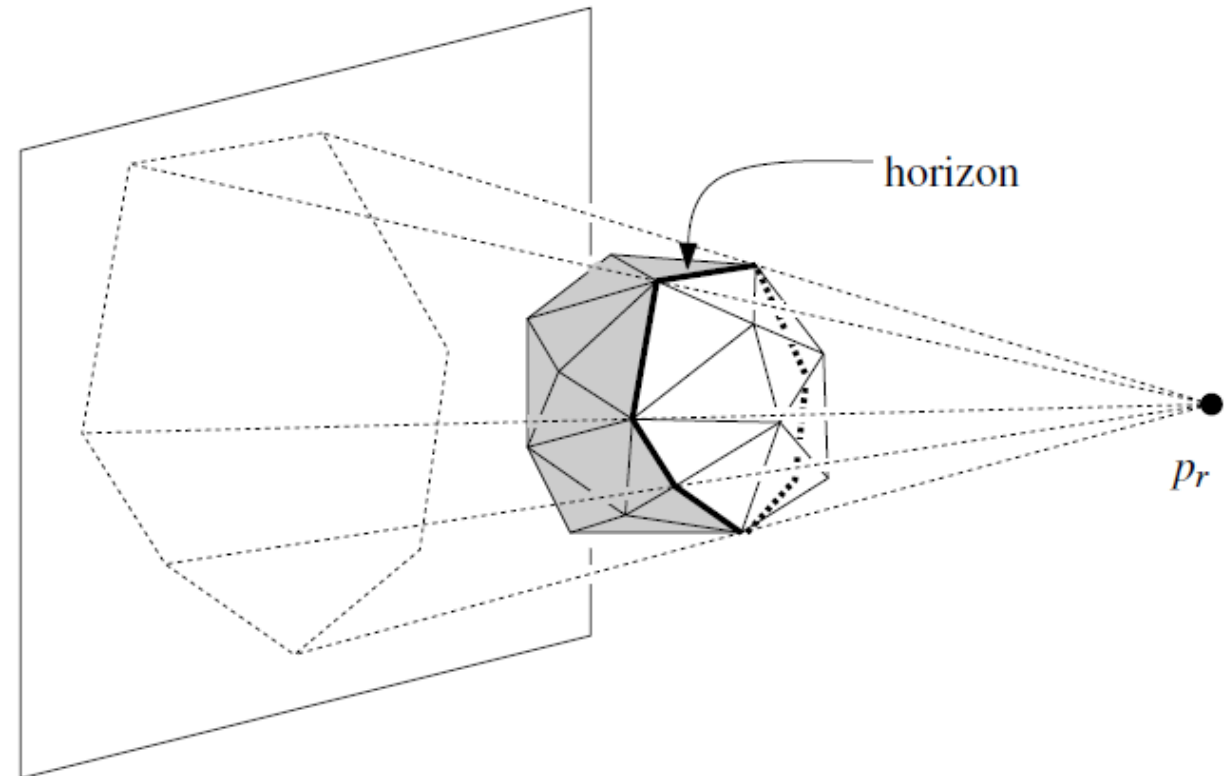
# Co-planar facets

- if  $p_r$  lies on the plane  $h_f$  of an invisible facet  $f$ , we will add triangles from  $p_r$  to boundary edges of  $f$  that lie on the horizon:  $f$  needs to be merged with these triangles into a single facet



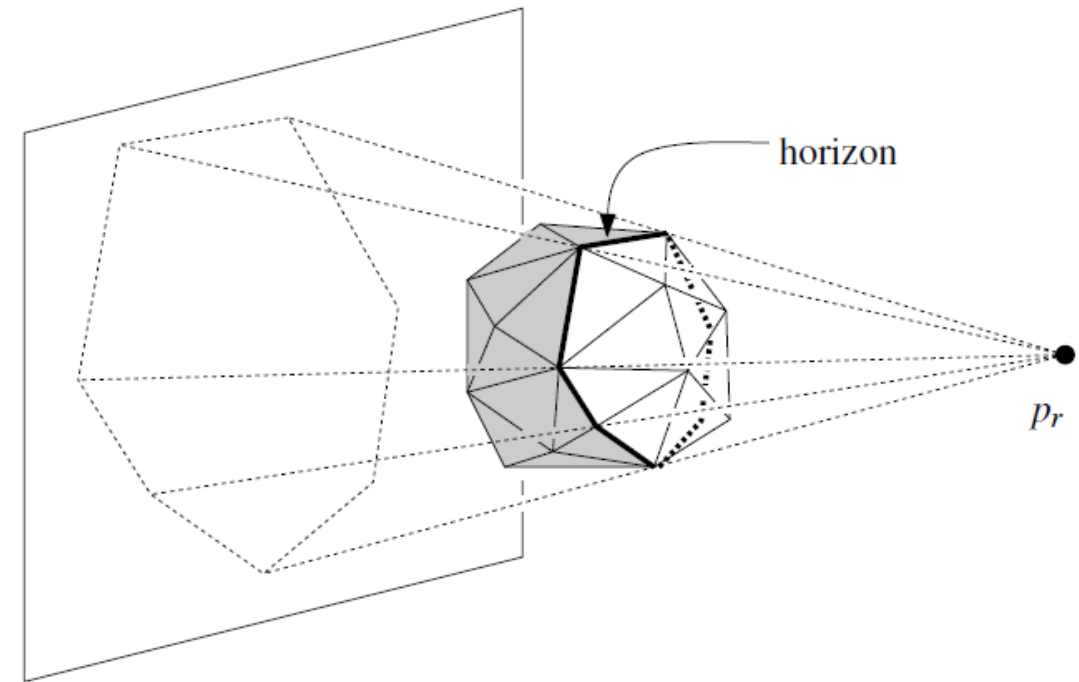
# Cost of modifying $CH(P_{r-1})$ into $CH(P_r)$

- the visible facets are removed and triangles between  $p_r$  and edges of the horizon are added
- assuming we are given the horizon, this process takes time linear in the number of removed facets



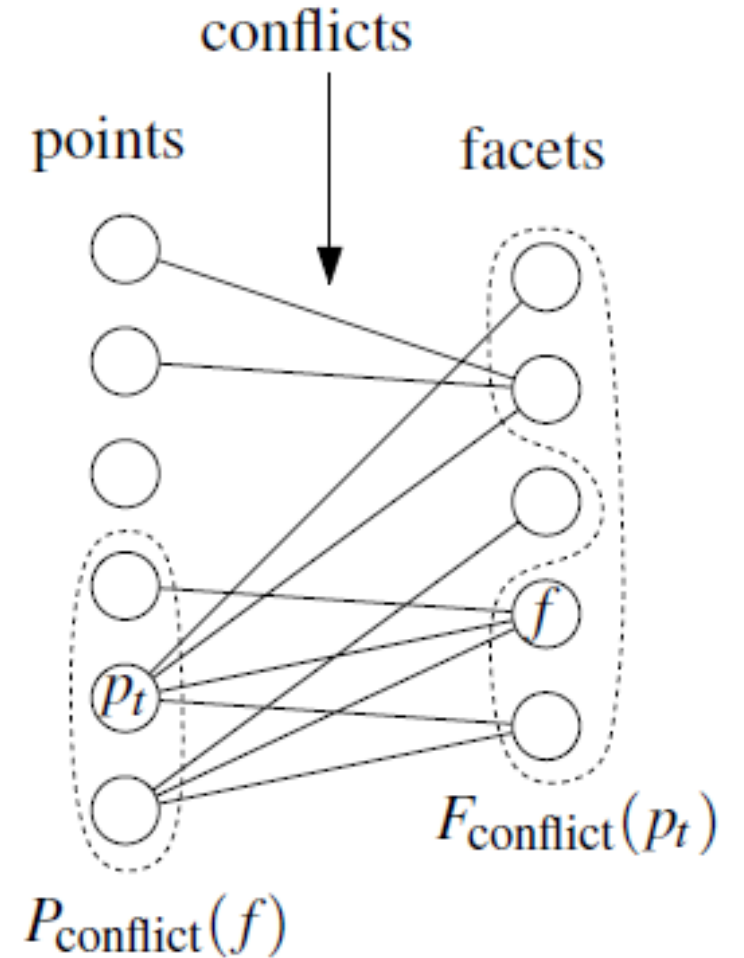
# How to find the horizon relative to the next point?

- can be done naively in  $O(r)$  time
- this will lead to an  $O(n^2)$  time algorithm
- we will maintain *conflict lists*
- a point  $p_t$  is in conflict with a face  $f$  of  $CH(P_r)$  iff  $f$  is visible from  $p_t$
- for each point  $p_t, t > r$ , we will maintain the list of facets visible from  $p_t$
- for each facet  $f$  of  $CH(P_r)$  we will maintain the list of points visible from  $f$



# Conflict graph

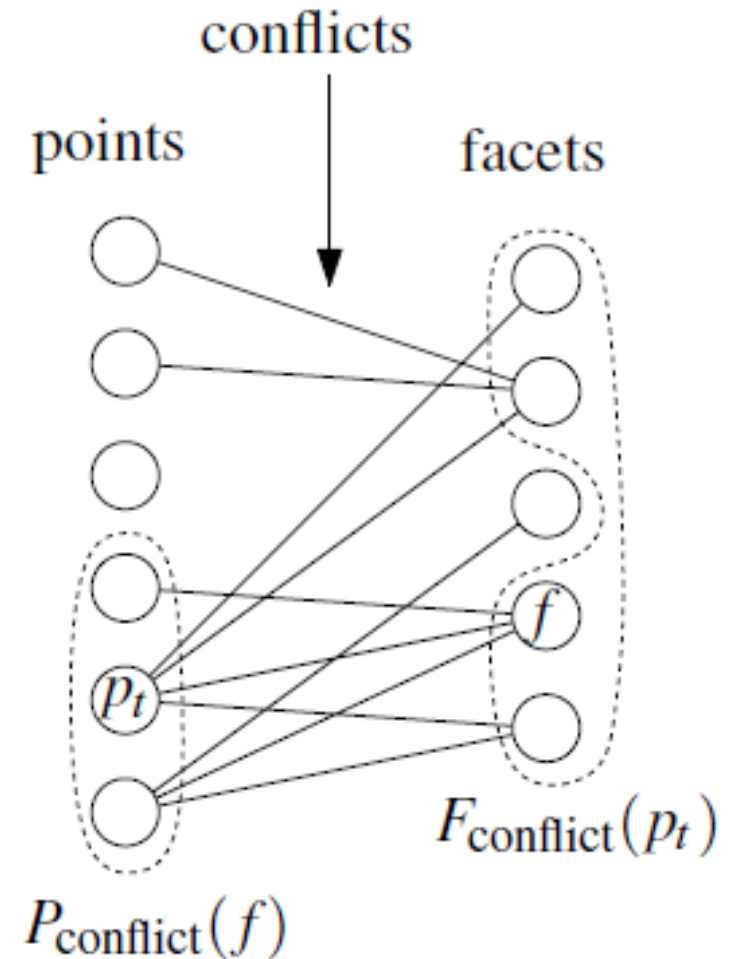
- a point  $p_t$  is in conflict with a face  $f$  since they cannot co-exist in a convex hull
- we initialize the conflict graph for  $CH(P_4)$  in linear time
- updating the graph I, removing visible facets when adding  $p_r$ : we remove their nodes from the graph as well as the arcs incident to these nodes; we also remove the node  $p_r$
- the visible facets are the neighbors of  $p_r$  in the graph, and so this update is easy





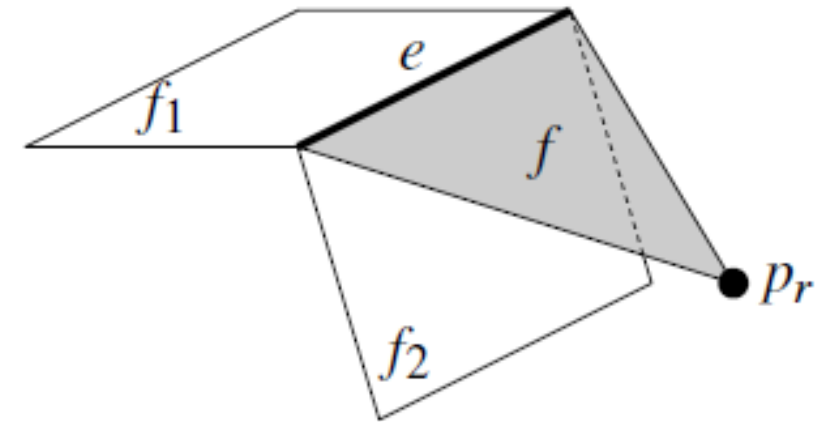
# Updating the conflict graph, II

- we add new nodes for the newly created facets—those that connect  $p_r$  to the edges of the horizon
- it remains to find the conflicts of these new facets, and record them in the conflict graph—this is the tricky part of the algorithm!
- let  $f$  be one of the new facets—it is a triangle connecting  $p_r$  to an edge  $e$  of the horizon ...



# Updating the conflict graph, II, cont'd

- let  $f$  be one of the new facets—it is a triangle connecting  $p_r$  to an edge  $e$  of the horizon
- if  $f$  sees a point  $p_t$ , then the edge  $e$  sees it as well
- the edge  $e$  sees whatever the incident facets  $f_1$  or  $f_2$  see, so we only need to check the current conflicts of these two facets
- (if  $f$  merges with an existing invisible facet  $g$ , the new merged facet inherits  $g$ 's conflicts)



# The algorithm, initial steps

## **Algorithm** CONVEXHULL( $P$ )

*Input.* A set  $P$  of  $n$  points in three-space.

*Output.* The convex hull  $\mathcal{CH}(P)$  of  $P$ .

1. Find four points  $p_1, p_2, p_3, p_4$  in  $P$  that form a tetrahedron.
2.  $\mathcal{C} \leftarrow \mathcal{CH}(\{p_1, p_2, p_3, p_4\})$
3. Compute a random permutation  $p_5, p_6, \dots, p_n$  of the remaining points.
4. Initialize the conflict graph  $\mathcal{G}$  with all visible pairs  $(p_t, f)$ , where  $f$  is a facet of  $\mathcal{C}$  and  $t > 4$ .

5. **for**  $r \leftarrow 5$  **to**  $n$
6.     **do** (\* Insert  $p_r$  into  $\mathcal{C}$ : \*)
7.         **if**  $F_{\text{conflict}}(p_r)$  is not empty (\* that is,  $p_r$  lies outside  $\mathcal{C}$  \*)
8.             **then** Delete all facets in  $F_{\text{conflict}}(p_r)$  from  $\mathcal{C}$ .
9.             Walk along the boundary of the visible region of  $p_r$  (which consists exactly of the facets in  $F_{\text{conflict}}(p_r)$ ) and create a list  $\mathcal{L}$  of horizon edges in order.
10.            **for** all  $e \in \mathcal{L}$
11.                 **do** Connect  $e$  to  $p_r$  by creating a triangular facet  $f$ .
12.                     **if**  $f$  is coplanar with its neighbor facet  $f'$  along  $e$
13.                         **then** Merge  $f$  and  $f'$  into one facet, whose conflict list is the same as that of  $f'$ .
14.                         **else** (\* Determine conflicts for  $f$ : \*)
15.                             Create a node for  $f$  in  $\mathcal{G}$ .
16.                             Let  $f_1$  and  $f_2$  be the facets incident to  $e$  in the old convex hull.
17.                              $P(e) \leftarrow P_{\text{conflict}}(f_1) \cup P_{\text{conflict}}(f_2)$
18.                             **for** all points  $p \in P(e)$
19.                                 **do** If  $f$  is visible from  $p$ , add  $(p, f)$  to  $\mathcal{G}$ .
20.             Delete the node corresponding to  $p_r$  and the nodes corresponding to the facets in  $F_{\text{conflict}}(p_r)$  from  $\mathcal{G}$ , together with their incident arcs.
21. **return**  $\mathcal{C}$

The algorithm,  
inserting new  
points

- DCEL operations are omitted—they are fairly straightforward

# Analysis

- see Section 11.3 in [CGAA]
- the expected number of facets created during the algorithm for  $n$  input points is  $6n - 20$  (proof uses backward analysis similarly to what we have seen in other algorithms)
- the overall expected size of the list of conflicts (visible points) of horizon edges is  $O(n \log n)$  (proof has novel components)
- in summary: the convex hull of  $n$  points in  $R^3$  can be computed in expected  $O(n \log n)$  time

# Remarks

- the algorithm is due to Clarkson and Shor, Test of Time Award, SoCG 2020 (together with Haussler and Welzl)
- the analysis as presented in [CGAA] is due to Mulmuley
- the algorithm extends to higher dimensions and runs in expected  $\Theta(n^{\lfloor d/2 \rfloor})$  time in  $R^d$ , for  $d > 3$

THE END

[Jeb Gaither, CGAL arrangements]

