

### **Search and Intersection**

O'Rourke, Chapter 7

### **Outline**



- Trapezoidal Decomposition
- Extreme Points (2D)
- Extreme Points (3D)



#### Goal:

Given a partition of 2D space into polygons, (efficiently) compute a (compact) data-structure that enables fast point-in-polygon queries.

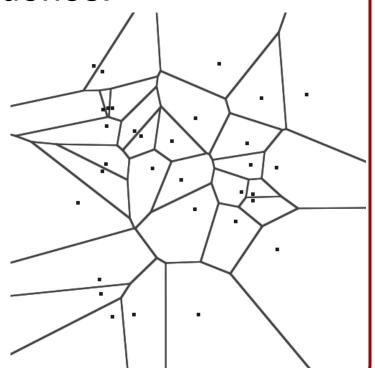


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Example (Nearest-Neighbor):

Given the Voronoi diagram of a set of points, we would like to quickly determine to which Voronoi cell a point belongs.



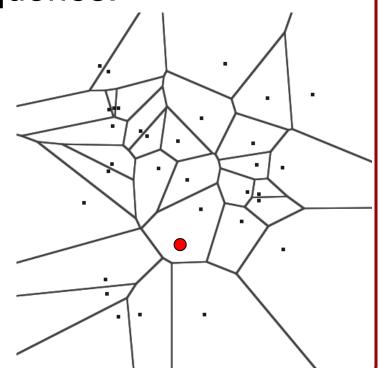


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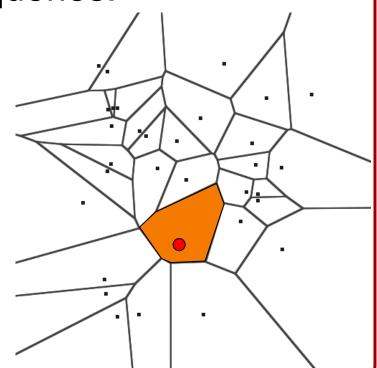


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Construct the partition iteratively, adding new linesegments into an existing partition:

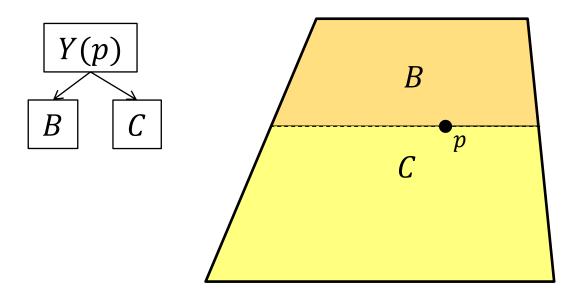
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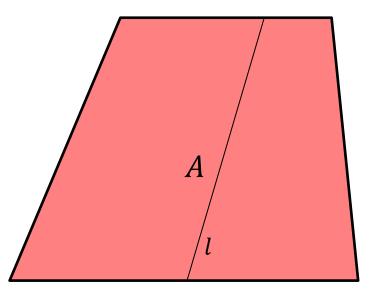


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Construct the partition iteratively, adding new linesegments into an existing partition:

- Add end-point.
- Add line segment, splitting the trapezoid into 2, 3, or 4 sub-trapezoids.

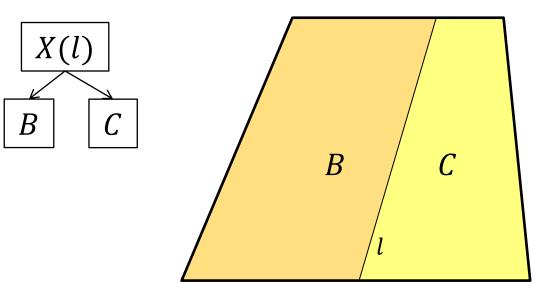
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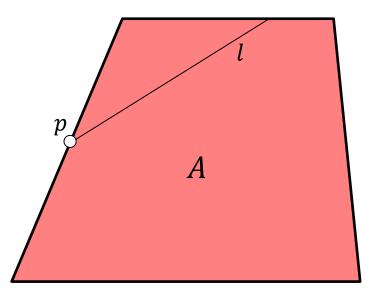


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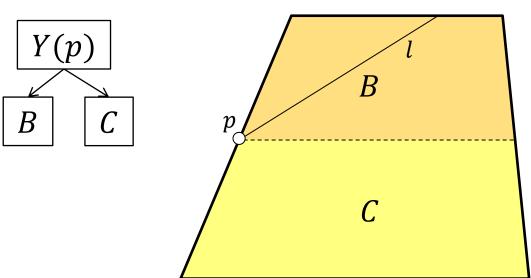
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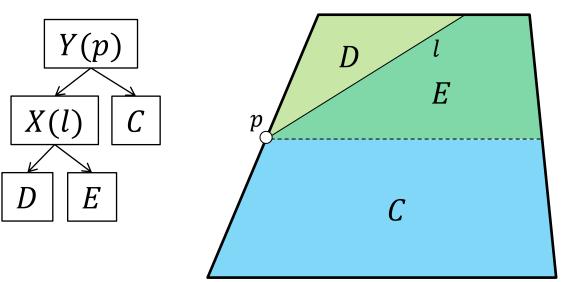
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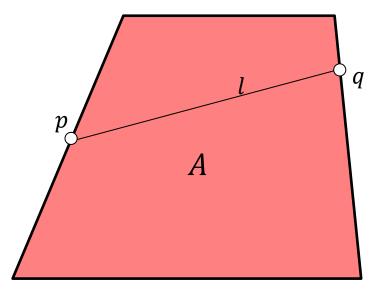


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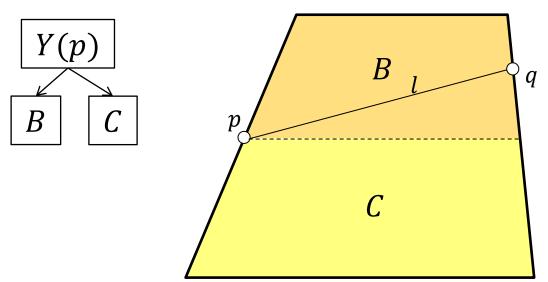
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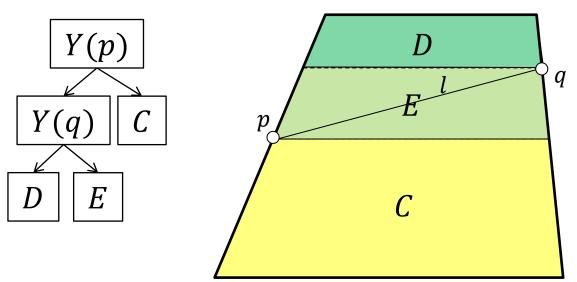
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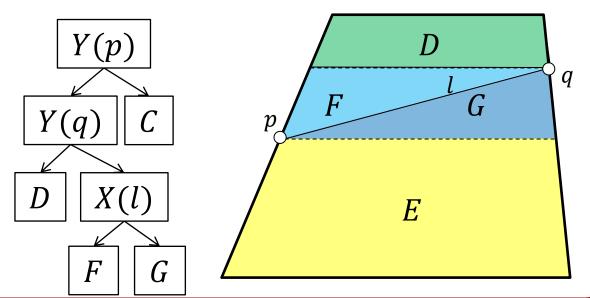
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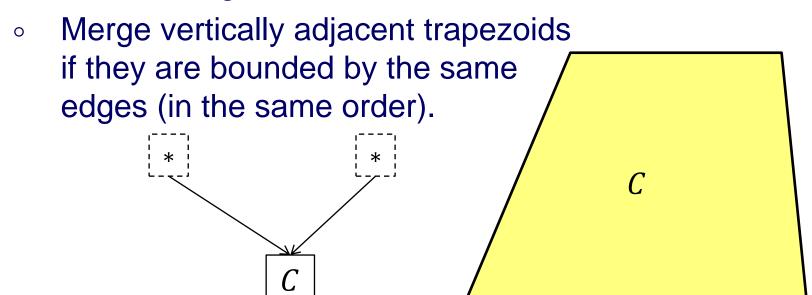
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Merge vertically adjacent trapezoids if they are bounded by the same edges (in the same order).



### Approach:

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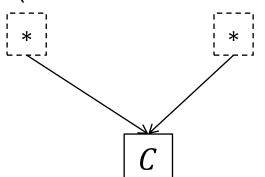




#### Approach:

We get a directed binary tree with:

- interior nodes ⇒ left/right or top/bottom partitions
- leaves ⇒ trapezoids
  - Add line Left child: above/left
  - Merge v Right child: below/right if they are bounded by the same edges (in the same order).



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- Add end-point
- Add line segment
- Merge adjacent trapezoids

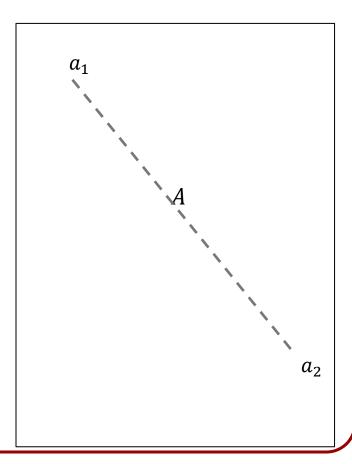
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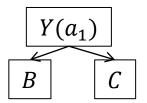
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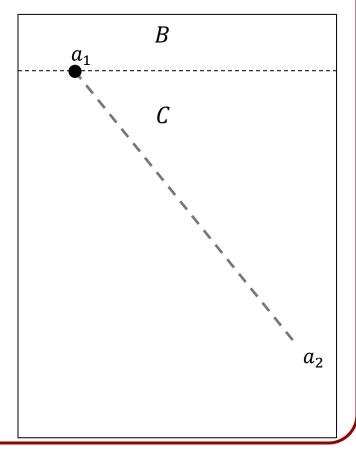
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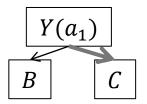
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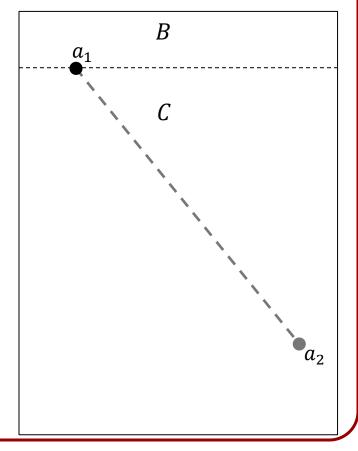






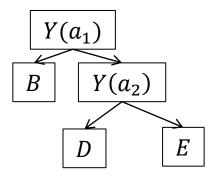
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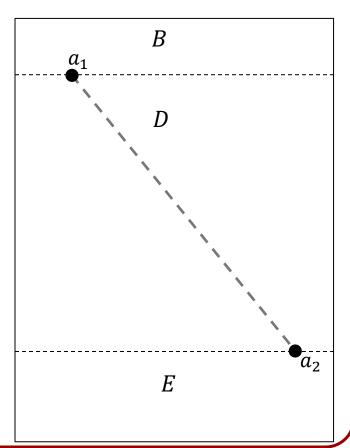






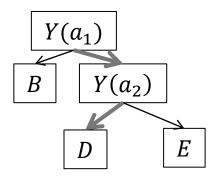
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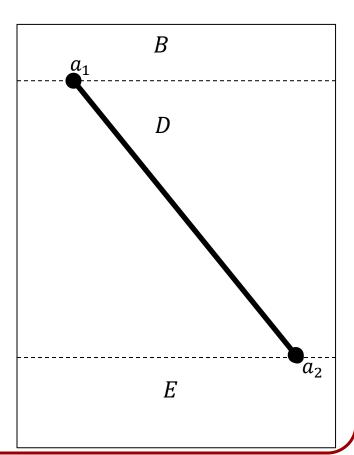






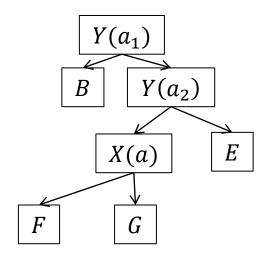
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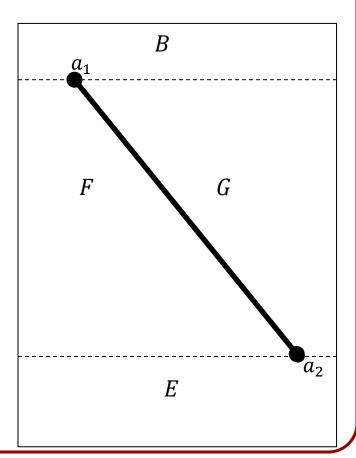






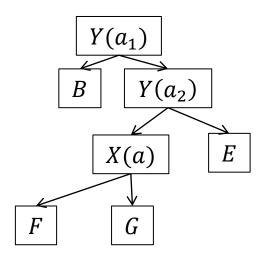
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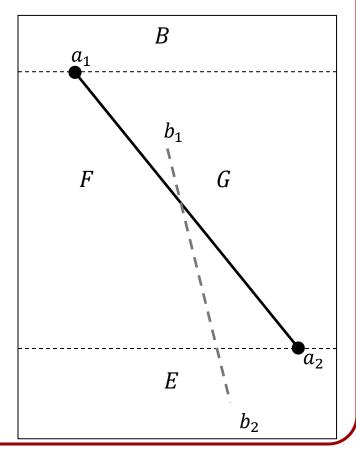






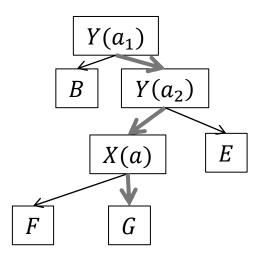
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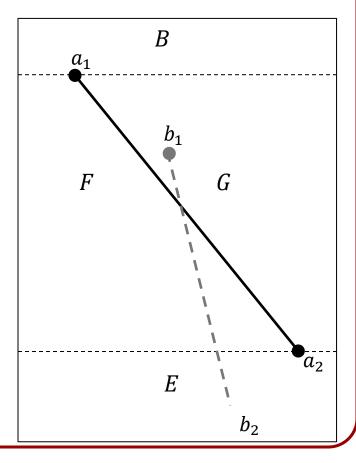






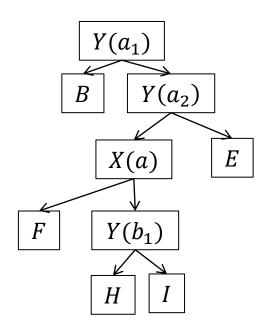
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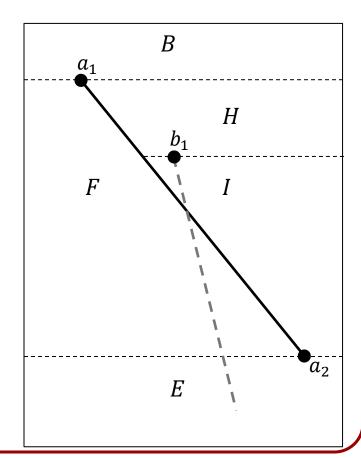






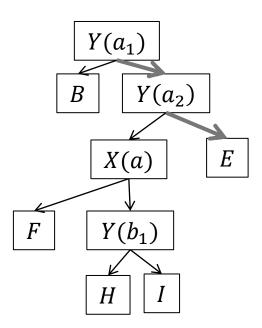
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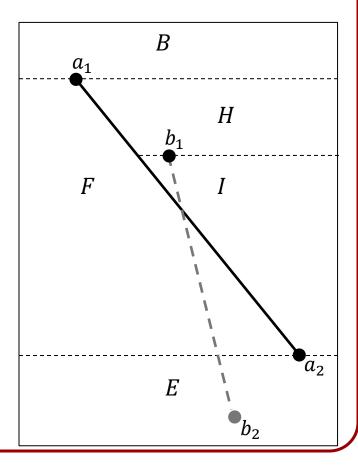






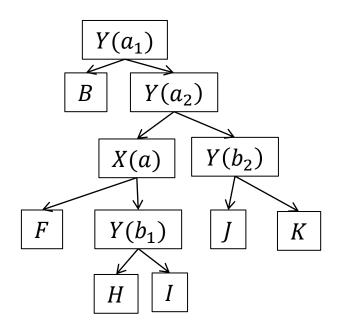
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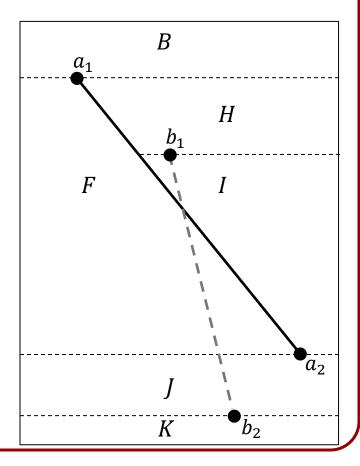






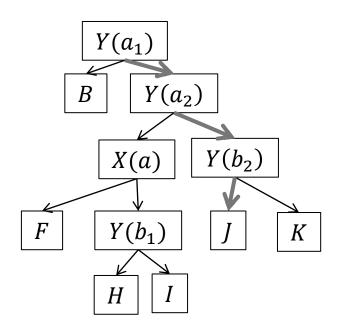
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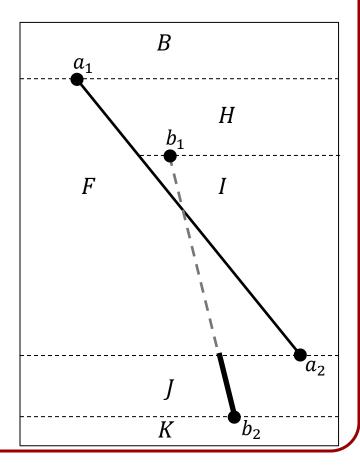






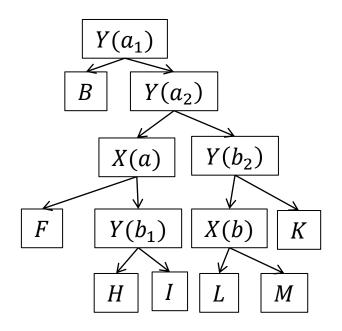
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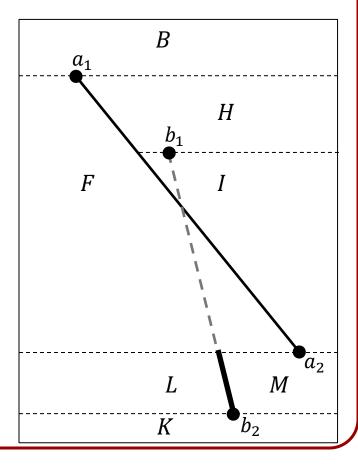






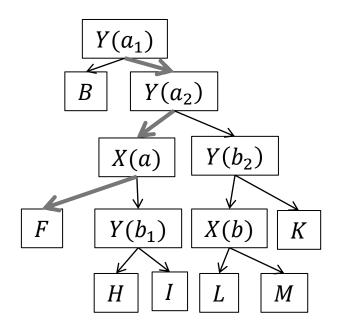
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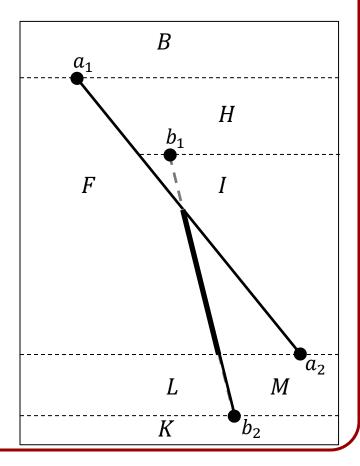






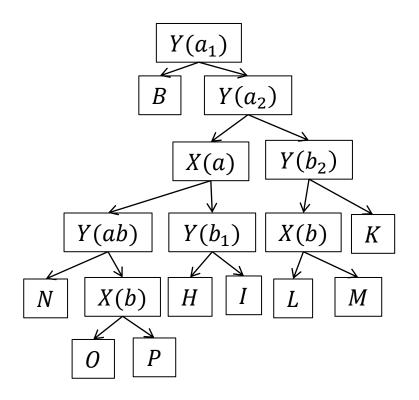
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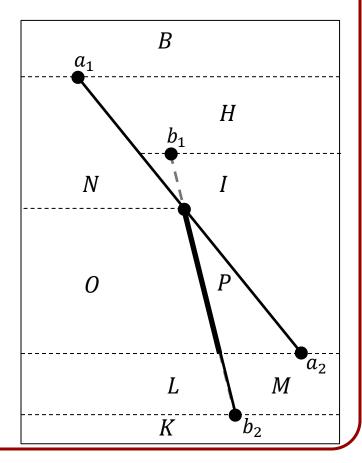






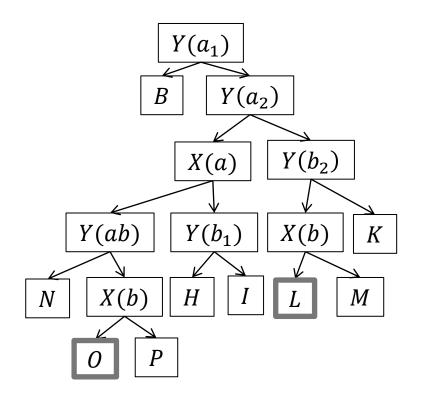
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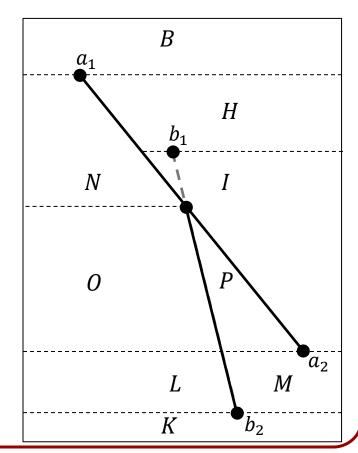






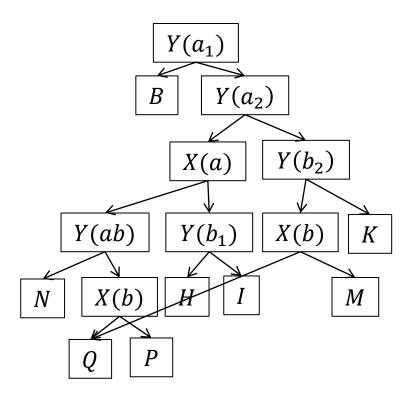
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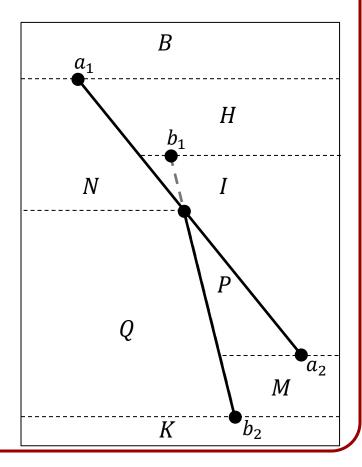






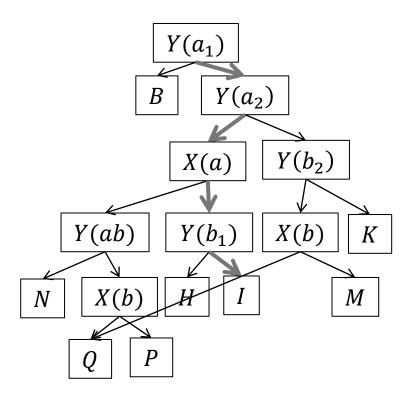
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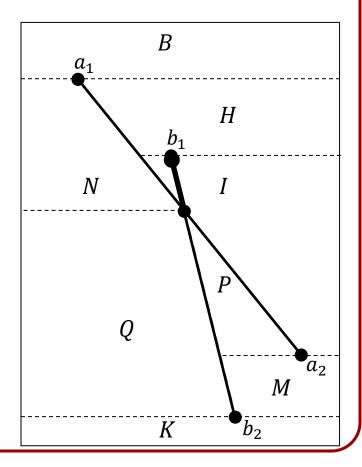






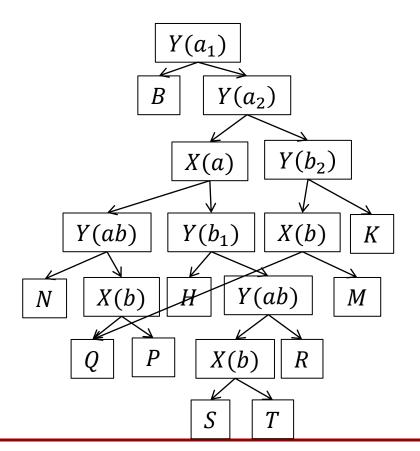
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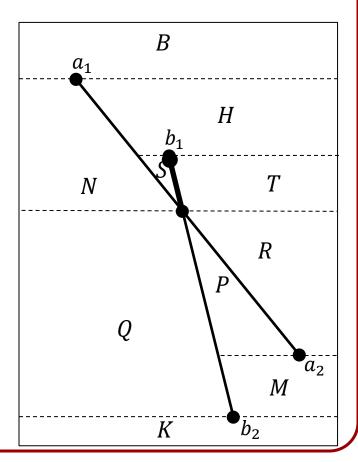






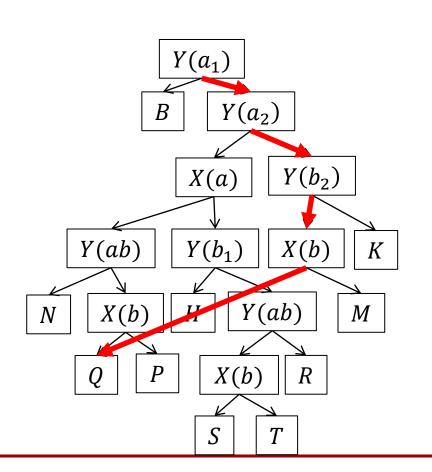
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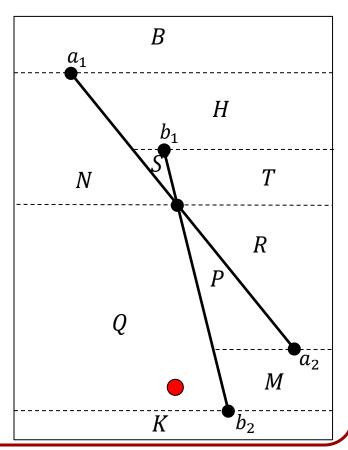






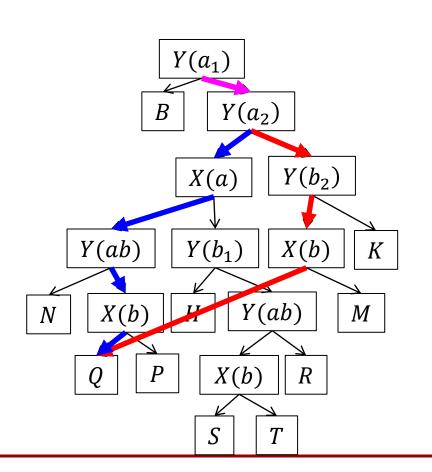
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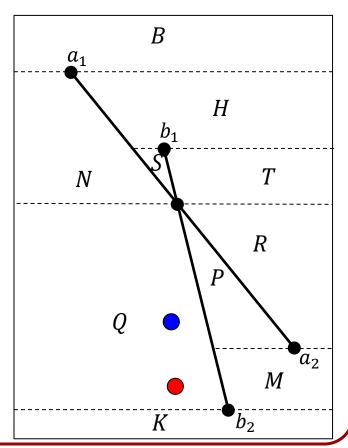






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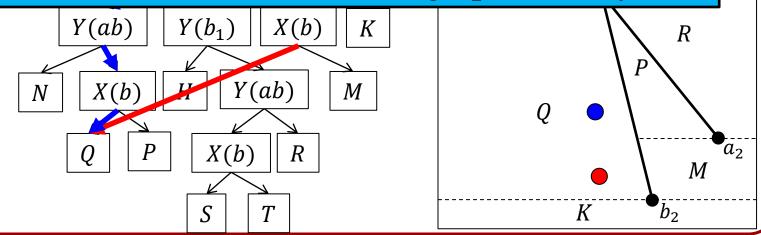




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Assuming the tree stays balanced, construction has complexity  $O((n+k)\log n)$  and query has complexity  $O(\log n)$ .

If line segments are added in random order, the tree will be well-balanced, with high probability.



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- Extreme Points (2D)
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#### **Linear Programming:**

Given a set of linear constraints:

$$C_i = \{p | \langle p, n_i \rangle \ge d_i\}$$

and a linear energy function:

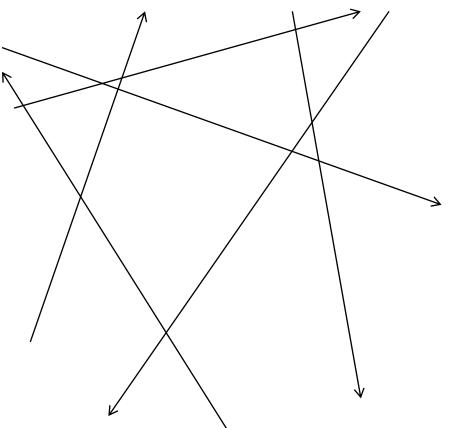
$$E(p) = \langle p, n \rangle + d$$

we would like to find the point p that satisfies the constraints and minimizes the energy.



#### **Linear Programming:**

 Since the constraints are linear, each one defines a half-space of valid solutions.

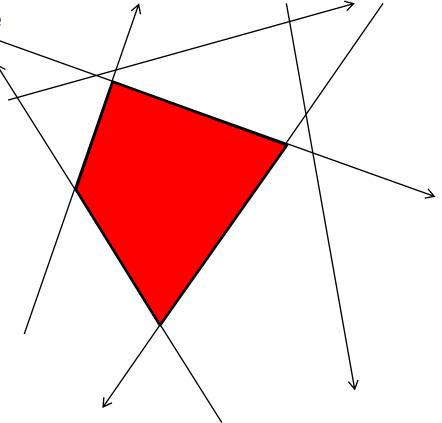




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 The intersection of these half-spaces is convex.



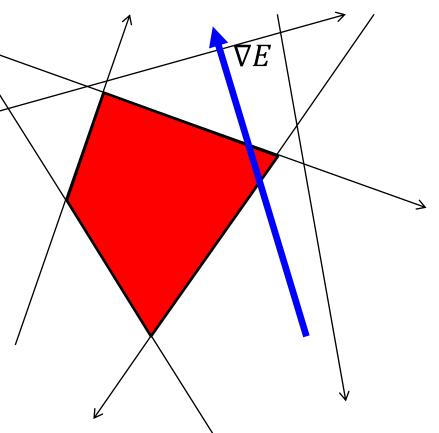


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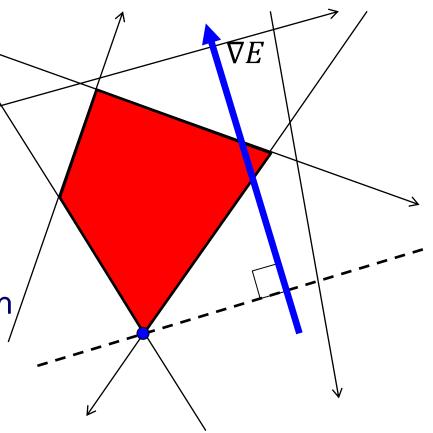
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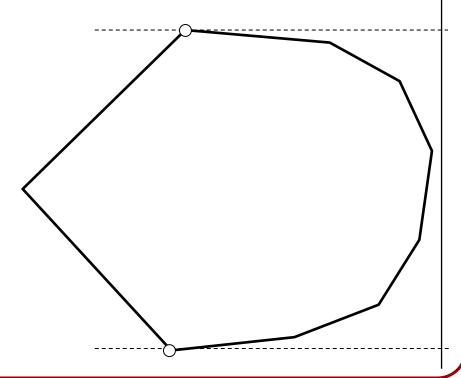
• The minimizer is the point in the convex region which is extreme along the gradient direction,  $\nabla E$ .





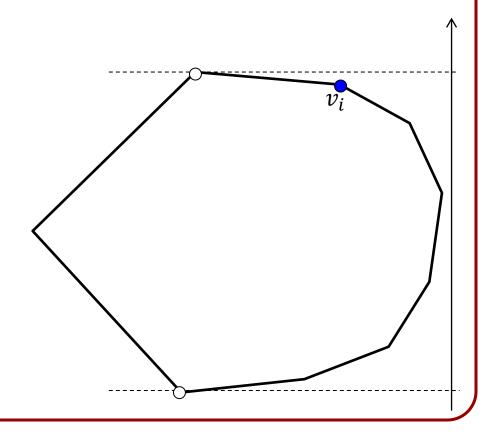
Given a convex polygon P, we would like to find the extreme points along a particular direction.

Without loss of generality, we can assume that the direction is vertical.





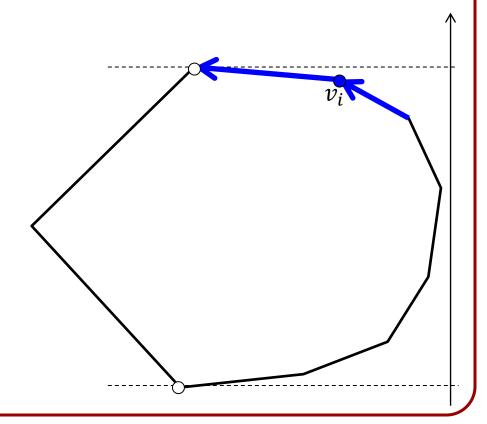
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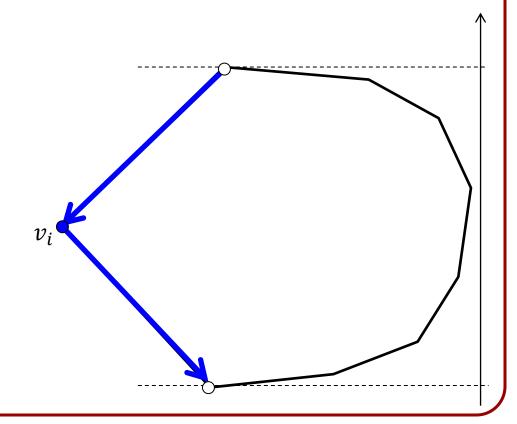
Incoming and outgoing edge rising ⇒ Right





#### Pick a vertex $v_i$ at random:

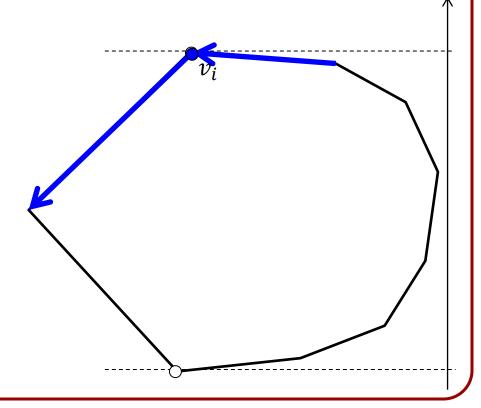
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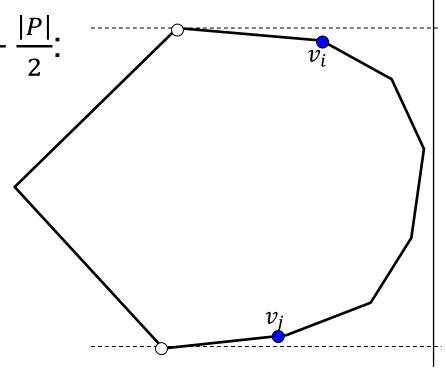
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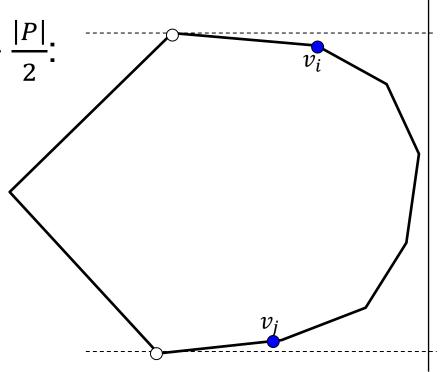
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Consider vertex  $v_j$ ,  $j = i + \frac{|P|}{2}$ :

• If  $v_i$  is left and  $v_i$  right:

 $\Rightarrow$  max  $\in$  [j, i] min  $\in$  [i, j]

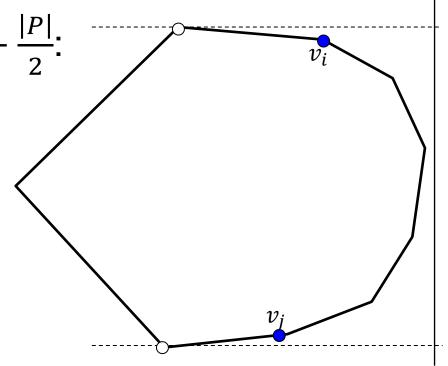




#### Pick a vertex $v_i$ at random:

- Incoming and outgoing edge rising ⇒ Right
- Incoming and outgoing falling ⇒ Left
- Otherwise  $v_i$  is extremal

- If  $v_i$  is left and  $v_i$  right:
  - $\Rightarrow$  max  $\in [j,i]$  min  $\in [i,j]$
- $\circ$  If  $v_i$  right and  $v_j$  left: ...

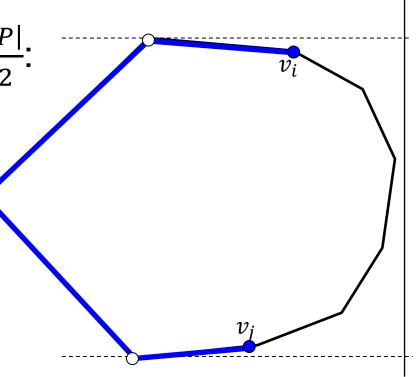




#### Pick a vertex $v_i$ at random:

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- Incoming and outgoing falling ⇒ Left
- Otherwise  $v_i$  is extremal

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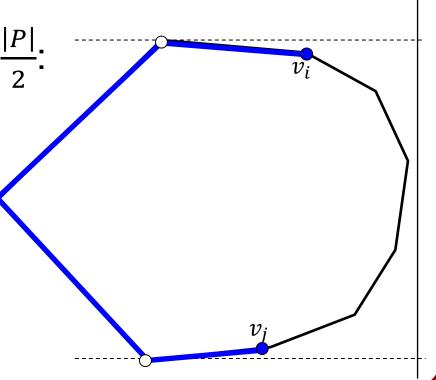




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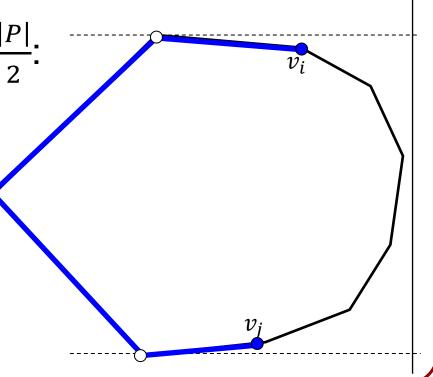
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**»** ...





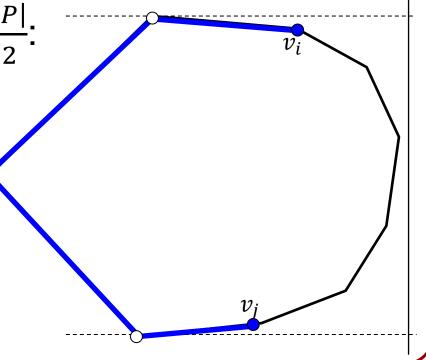
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**>>** 



### **Outline**



- Trapezoidal Decomposition
- Extreme Points (2D)
- Extreme Points (3D)



Given a convex polyhedron P, we would like to find the (without loss of generality) highest point.



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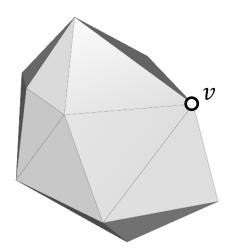
#### **Challenge**:

We can no longer order points on the convex hull.



#### Observation 1:

Given a convex polyhedron and a vertex  $v \in P$ , the cone apexed at v and going through the neighbors of v must contain all of P.



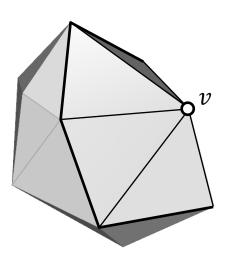


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 The cone is the intersection of the half spaces defined by the triangles incident on v.



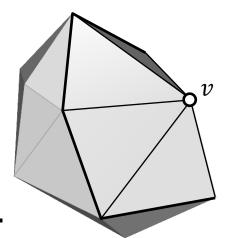


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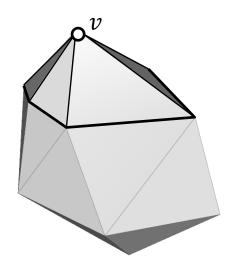
- The cone is the intersection of the half spaces defined by the triangles incident on v.
- Since each triangle incident to v is on the hull, the set P is entirely to one side.





#### Observation 2:

Given a convex polyhedron and a vertex  $v \in P$ , if v is higher than its neighbors, then v is the highest point on P.



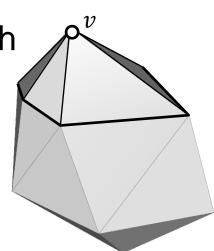


#### Observation 2:

Given a convex polyhedron and a vertex  $v \in P$ , if v is higher than its neighbors, then v is the highest point on P.

#### Proof:

 The cone apexed at v and going through the neighbors of v contains all of P and is below v.





Given a convex polyhedron *P*, we would like to find the (without loss of generality) highest point.

#### **Challenge**:

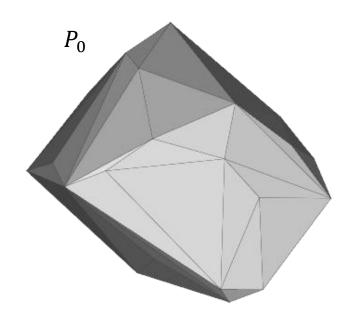
We can no longer order points on the convex hull.

### [Kirkpatrick, 1983]

Compute a hierarchy of nested polytopes, compute the highest point on the coarsest polytopes and use that to efficiently compute the highest point on the next polytope.

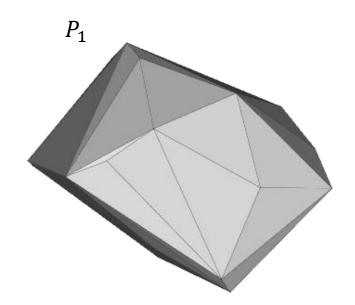


Compute a hierarchy of nested polytopes,  $\{P_0 = P \supset P_1 \supset \cdots \supset P_l\}$ , use extremals on  $P_{k+1}$  to find extremals on  $P_k$ .

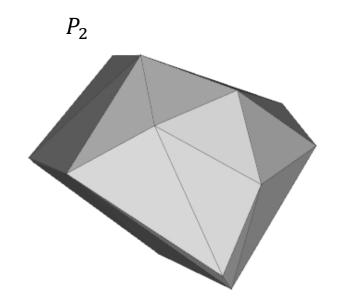




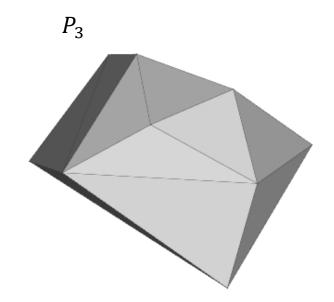
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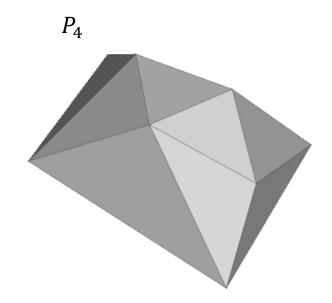




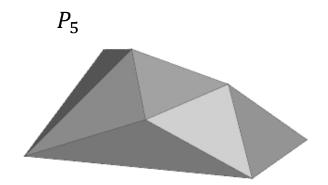




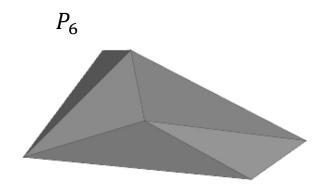




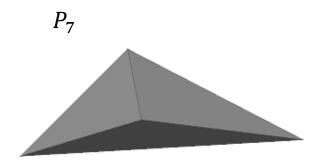




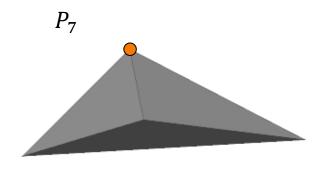




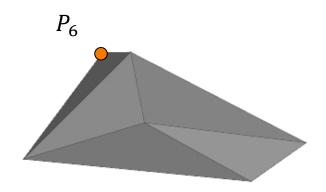




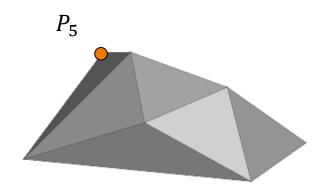




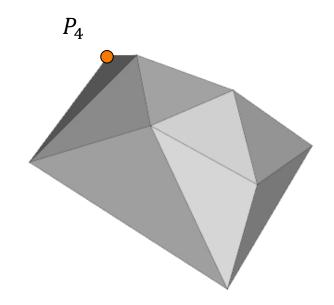




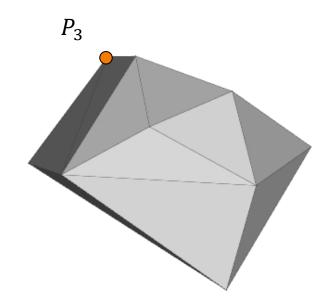




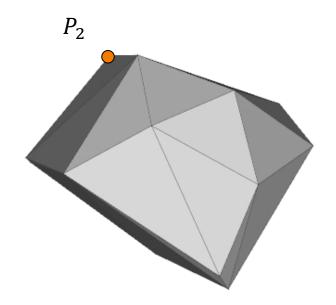




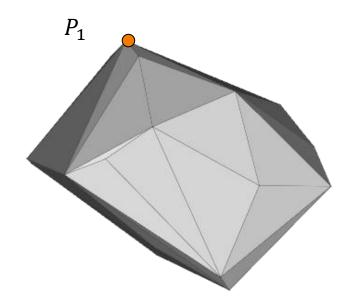




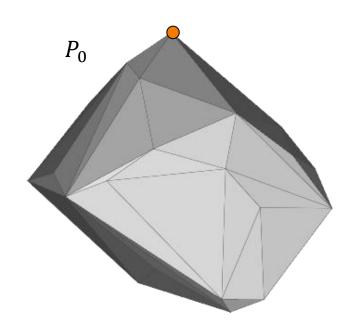








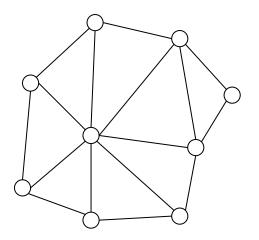






#### **Definition**:

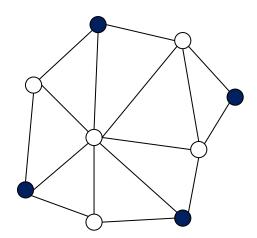
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#### Key Idea:

Identify an independent set of vertices on  $P_k$  with low degree, remove those, and set  $P_{k+1}$  to the convex hull of what's left.

Repeat for subsequent levels of the hierarchy.



### **Greedy Algorithm:**

- While not done
  - ∘ Find a vertex with degree  $\leq 8$ .
  - If none of its neighbors have been marked as independent, mark it as independent.



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Need to show this generates a sufficiently large subset of independent vertices.

#### Claim:

This algorithm will mark at least 1/18 of the vertices as independent.



#### Proof:

By Euler's formula, for a triangulated polyhedron: E = 3V - 6.



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.

 $\Rightarrow$  The sum of the degrees of the vertices,  $\Sigma$ , is equal to twice the number of edges, and hence:

$$\Sigma = 6V - 12.$$



#### Proof:

$$\Sigma = 6V - 12.$$

 $\Rightarrow$  There are at least V/2 vertices with degree  $\leq 8$ .

Otherwise, there are at least V/2 vertices with degree  $\geq 9$  and the rest have degree at least 3:

$$\Sigma \ge \frac{9V}{2} + \frac{3V}{2}$$

$$= 6V$$

$$> 6V - 12$$

$$= \Sigma$$



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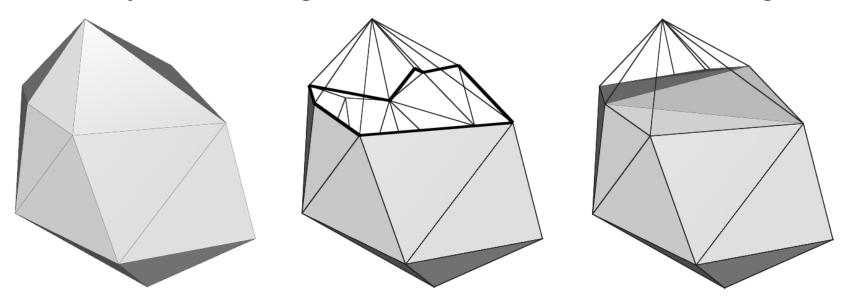
Using this to construct our polytope hierarchy:

- We will have  $O(\log |P|)$  levels.
- We will require O(|P|) storage.



### Claim:

If we remove a point on a polytope, the convex hull of the remaining points can be obtained by computing the convex hull of the points on the boundary and using the "outer" half of the triangles.





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If we remove a point on a polytope, the convex hull of the remaining points can be obtained by computing the convex hull of the points on the boundary and using the "outer" half of the triangles.

#### Proof:

The remaining triangles must still be on the hull.

Any new triangles can't connect to non-boundary vertices because then the hull would be non-manifold.



### Claim:

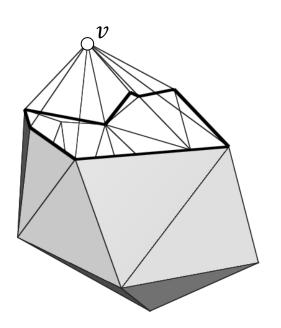
Since the removed vertices are independent and have degree ≤ 8, the coarser convex hull can be computed in time proportional to the number of removed points.

Since a removed vertex does not appear later gles. in the hierarchy, the complexity of computing the hierarchy is O(|P|).



### Claim:

After removing the highest vertex  $v \in P$ , the next highest vertex w has to be in the one-ring of v.



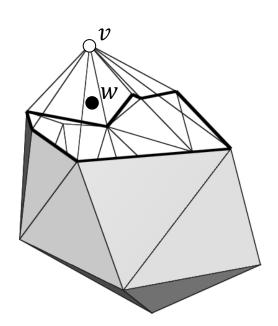


### Claim:

After removing the highest vertex  $v \in P$ , the next highest vertex w has to be in the one-ring of v.

Proof: (by contradiction)

Assume w is interior.





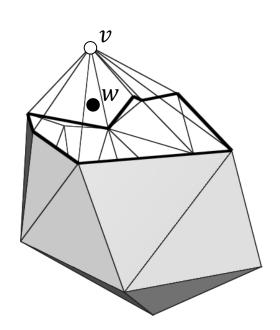
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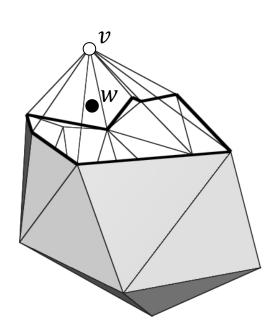
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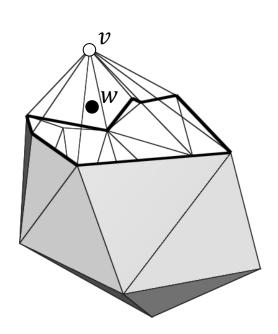
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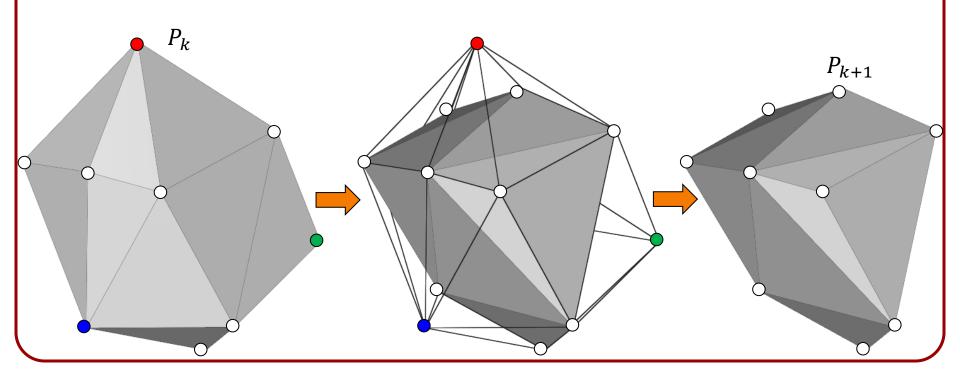
Proof: (by contradiction) vGiven the highest vertex,  $v_{k+1} \in P_{k+1}$  the highest vertex  $v_k \in P_k$  is either  $v_{k+1}$  or is in its one-ring.

- $\Rightarrow$  The We can't test all neighbors of  $v_{k+1}$  because  $v_{k+1}$  may have arbitrarily large degree!
- $\Rightarrow$  w is the highest vertex.
- $\Rightarrow v$  was not highest.



#### **Definition**:

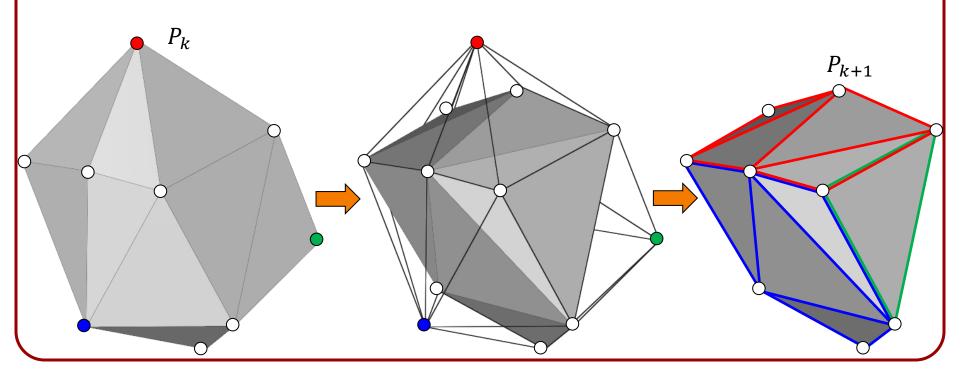
An edge e on  $P_{k+1}$  is *exposed* by a vertex  $p \in P_k$ , if e is in the triangulation of the hole resulting from the removal of p.





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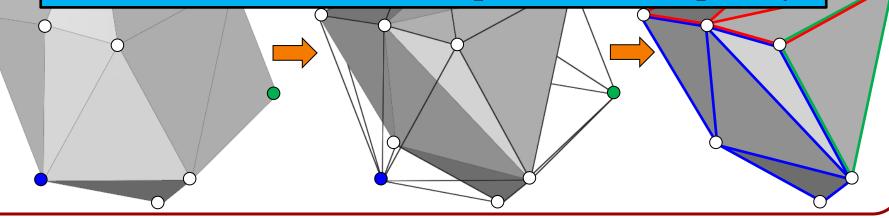


### **Definition:**

An edge  $e \subset P_{k+1}$  is exposed by  $p \in P_k \not\models P_k$ , if e is in if e is visible to p when viewing  $P_{k+1}$ . om the

An edge in  $P_{k+1}$  can be exposed by at most two vertices.

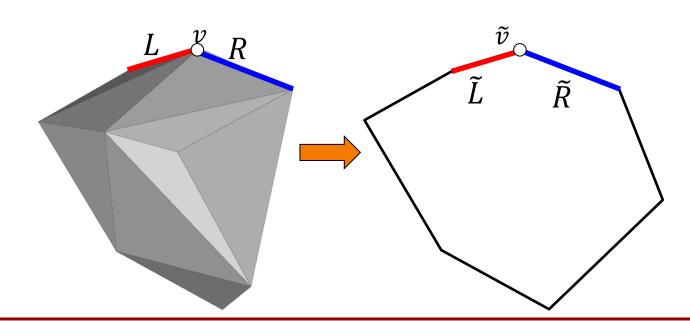
In constructing the hierarchy, we can also track which finer vertex exposed a coarser edge with no additional overhead in computational complexity





#### **Notation**:

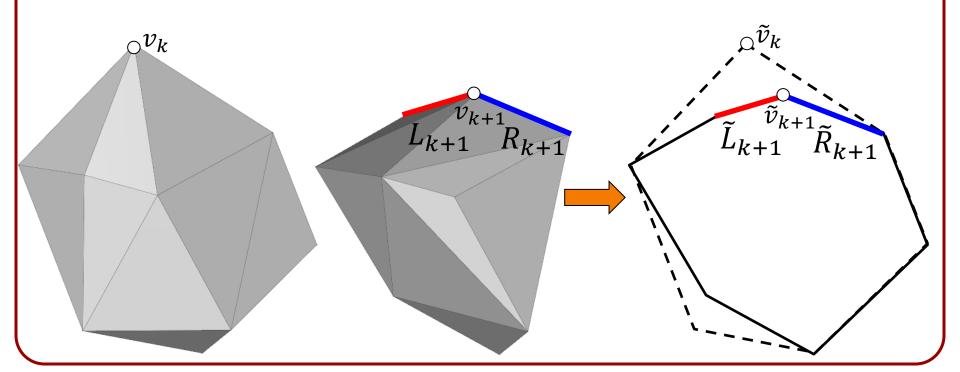
Given a polytope P, we can project it onto the yzplane. We denote by L and R the edges that project
on to the left-most and right-most edges coming out
of the projected highest vertex.





### Claim:

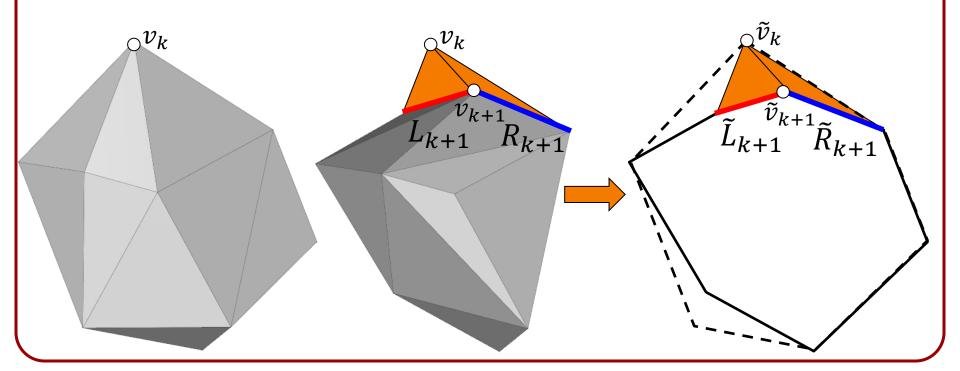
Given the highest vertex,  $v_{k+1} \in P_{k+1}$  the highest vertex  $v_k \in P_k$  is either  $v_{k+1}$ , or a vertex that exposes one of  $L_{k+1}$  and  $R_{k+1}$ .





#### **Proof**:

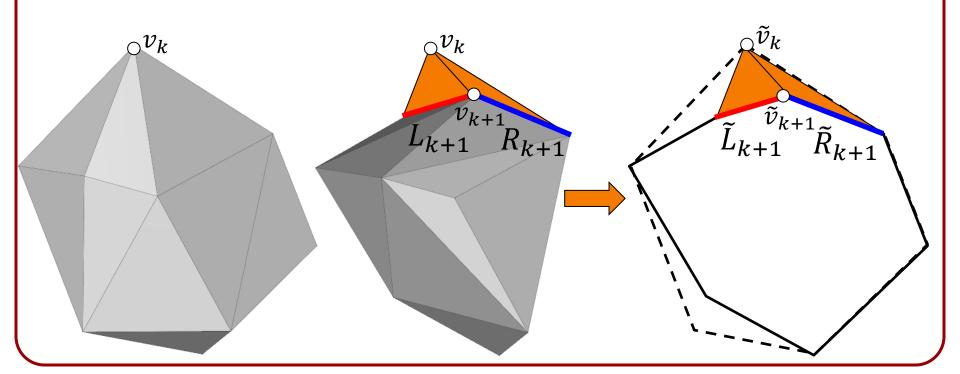
• Draw triangles  $(v_k, L_{k+1})$  and  $(v_k, R_{k+1})$  and project.





#### Proof:

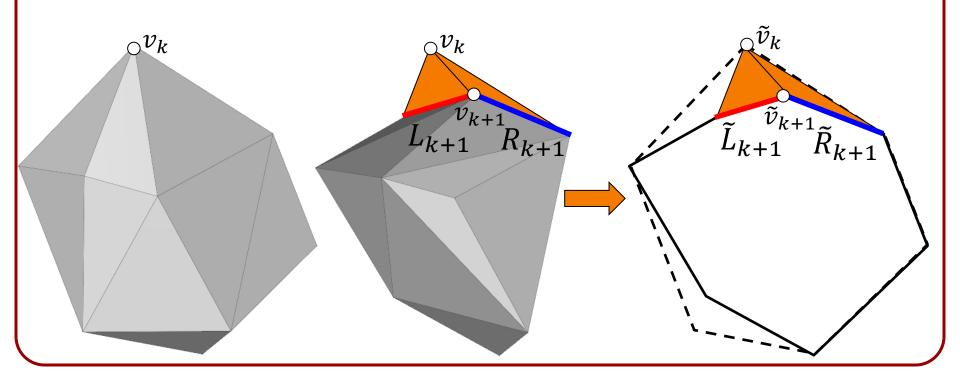
- Draw triangles  $(v_k, L_{k+1})$  and  $(v_k, R_{k+1})$  and project.
- One of these does not intersect the projection of  $P_{k+1}$ .





#### Proof:

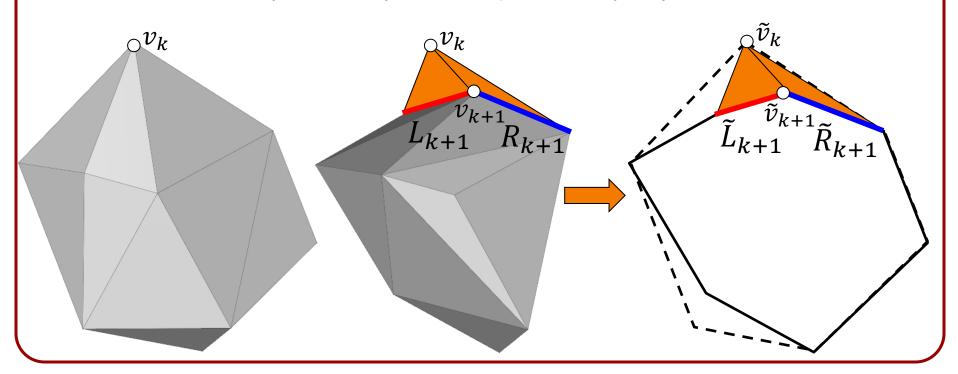
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- $\Rightarrow$  One of the original triangles does not intersect  $P_{k+1}$





#### Proof:

- Draw triangles  $(v_k, L_{k+1})$  and  $(v_k, R_{k+1})$  and project.
- One of these does not intersect the projection of  $P_{k+1}$ .
- $\Rightarrow$  One of the original triangles does not intersect  $P_{k+1}$
- $\Rightarrow$  One of  $L_{k+1}$  or  $R_{k+1}$  is exposed by  $v_k$ .





#### Proof:

If we know the highest vertex  $v_{k+1} \in P_{k+1}$  and we know  $L_{k+1}$  and  $R_{k+1}$ , then we get the highest vertex  $v_k \in P_k$  in O(1).

If  $v_{k+1}$  is removed at level k+2:

- $\Rightarrow v_{k+1}$  has degree  $\leq 8$  in  $P_{k+1}$
- $\Rightarrow$  We can find  $L_{k+1}$  and  $R_{k+1}$  with exhaustive search.

Otherwise, we can use  $L_{k+2}$  and  $R_{k+2}$  to compute  $L_{k+1}$  and  $R_{k+1}$  in time O(1).

- We can construct the polytope hierarchy in O(|P|) time.
- We can find the extreme point, with respect to an arbitrary direction, in  $O(\log|P|)$ .