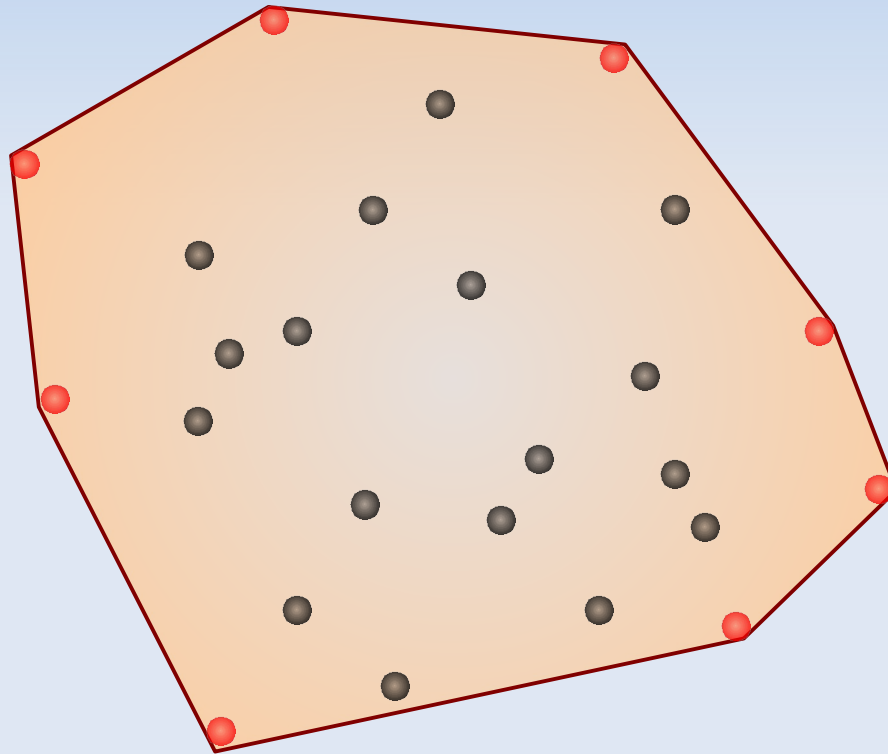


# Week 5 Convex Hulls in 2D

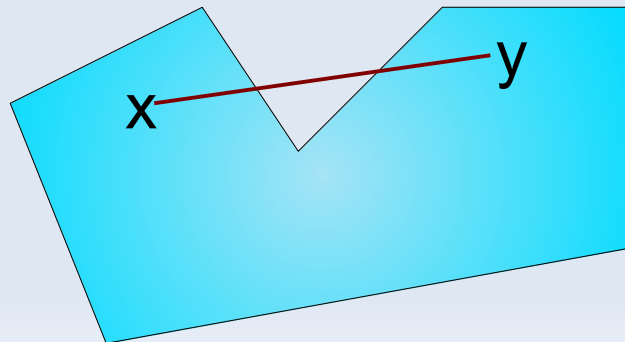


# Week 5 Convex Hulls in 2D

- Applications
  - Collision avoidance
  - Fitting ranges with a line
  - Smallest box
  - Shape Analysis

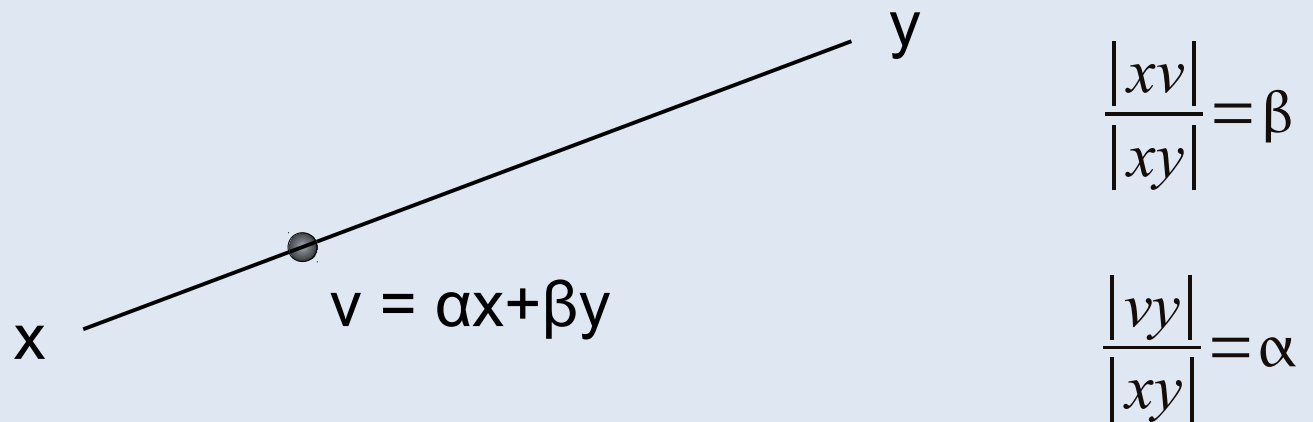
# Convexity

- A set  $S$  is convex,
  - if  $x, y$  in  $S$  implies that
  - the segment  $xy$  is a subset of  $S$
- Works in any dimensions
- A polygon with a reflex vertex is not convex



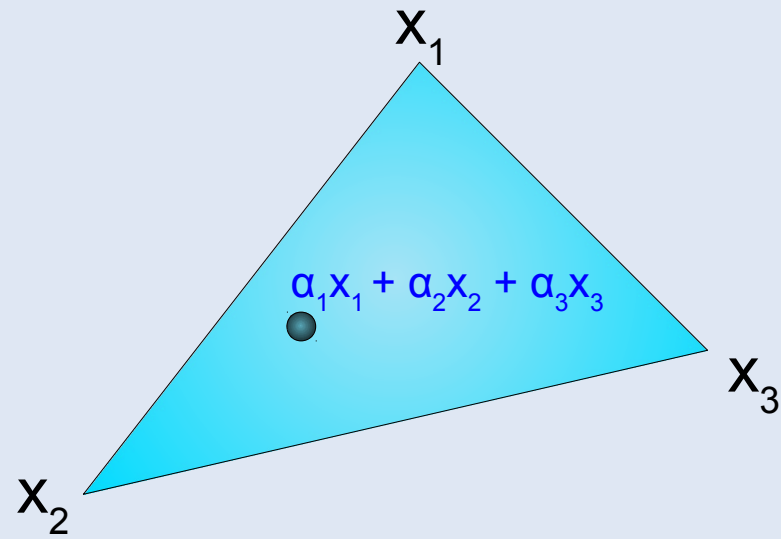
# Formal Segment Definition

- The **segment  $xy$**  is the set of all points of the form  $\alpha x + \beta y$  with  $\alpha \geq 0$ ,  $\beta \geq 0$  and  $\alpha + \beta = 1$
- $\alpha x + \beta y = \alpha x + (1 - \alpha)y = \alpha(x - y) + y = x + \beta(y - x)$



# Convex Combination

- A **convex combination** of points  $x_1, x_2, \dots, x_k$  is
  - a sum of the form  $\alpha_1 x_1 + \alpha_2 x_2 + \dots + \alpha_k x_k$
  - $\alpha_i \geq 0$  for all  $i$
  - $\alpha_1 + \alpha_2 + \dots + \alpha_k = 1$



# Convex Hull

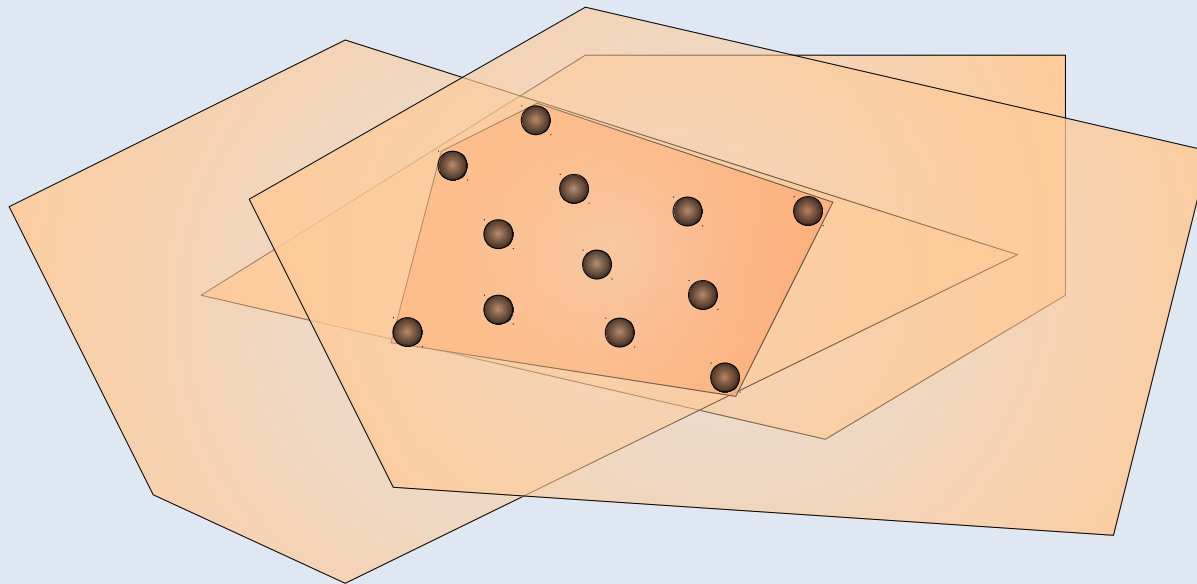
- Definition I
  - The **convex hull** of a **set of points S** is
    - the set of all **convex combinations** of points of **S**

# Convex Hull

- Definition II
  - The **convex hull** of a **set of points S**
    - in **d dimensions** is
    - the set of all **convex combinations** of **d+1 (or fewer)** points of **S**
- For  $d=2$ , convex hull is the combination of all triangles

# Convex Hull

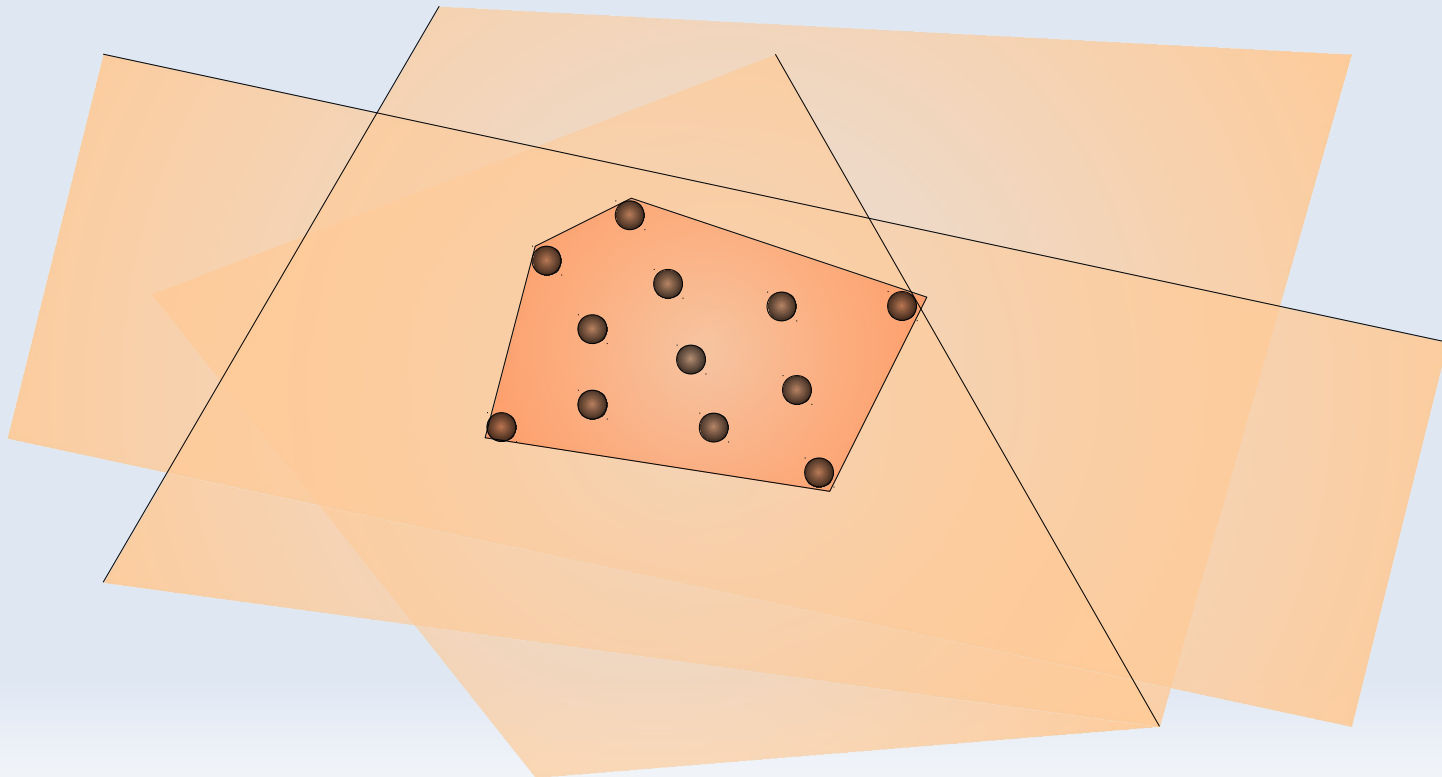
- Definition III
  - The **convex hull** of a **set of points  $S$**  is
    - the intersection of all convex sets that contain  $S$





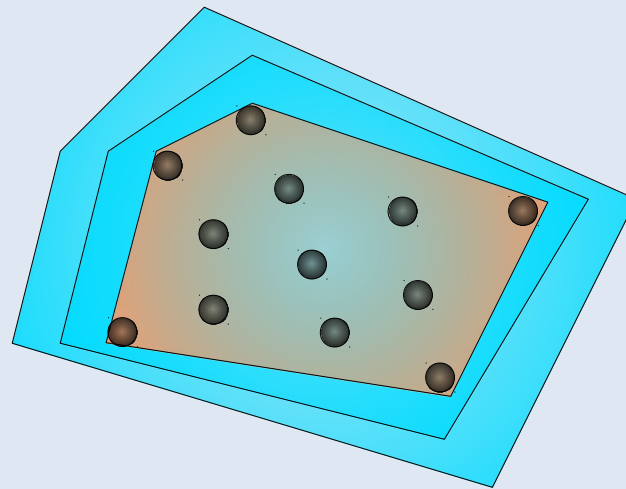
# Convex Hull

- Definition IV
  - The **convex hull** of a **set of points  $S$**  is
    - the intersection of all **halfspaces** that contain  **$S$**



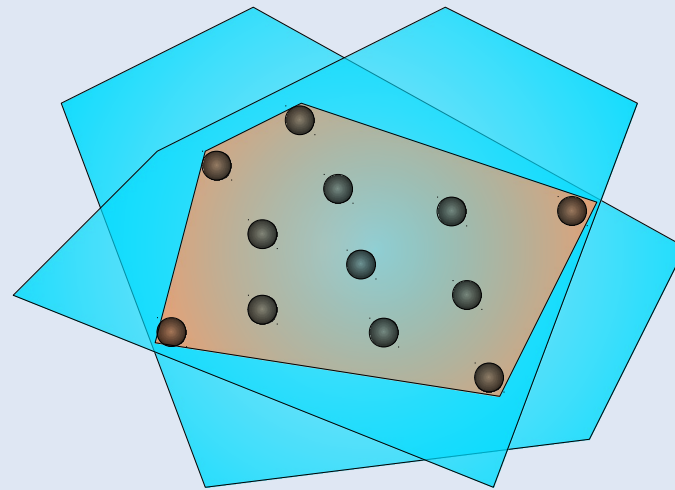
# Convex Hull

- Definition V
  - The **convex hull** of a **set of points S** is
    - the **smallest convex polygon** that encloses S



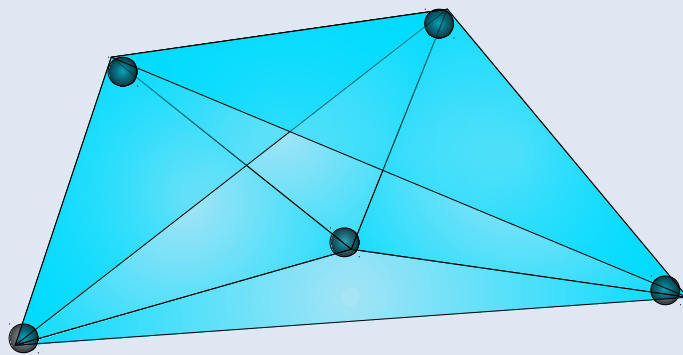
# Convex Hull

- Definition VI
  - The **convex hull** of a **set of points S** is
    - the **enclosing convex polygon** with **smallest area**



# Convex Hull

- Definition VII
  - The **convex hull** of a **set of points S** in the plane is
    - the **union** of all the **triangles** determined by points in **S**



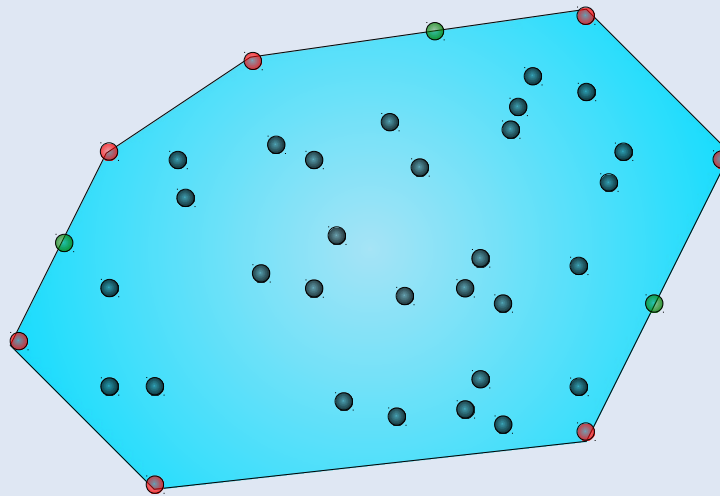
# Output

- A convex hull algorithm may have the following outputs:
  - all the points on the hull, in arbitrary order
  - extreme points, in arbitrary order
  - all the points on the hull, in BTO\*
  - extreme points, in BTO

\* BTO: Boundary Traversal Order

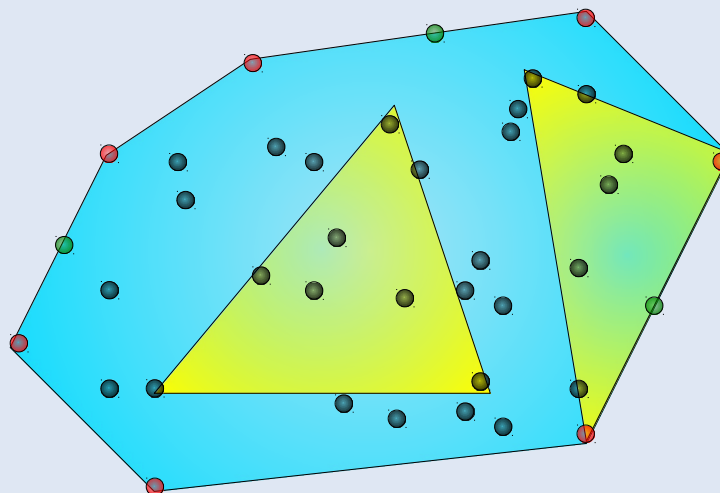
# Extreme Points

- Extreme points
  - are the vertices of the convex hull at which the interior angle is strictly convex



# Naive Algorithms

- Nonextreme Points
  - A point is **nonextreme** iff it is inside some **triangle** whose **vertices** are **points of the set** and is not itself a corner of that triangle



# Naive Algorithms

- Algorithm: INTERIOR POINTS

- for each  $i$  do

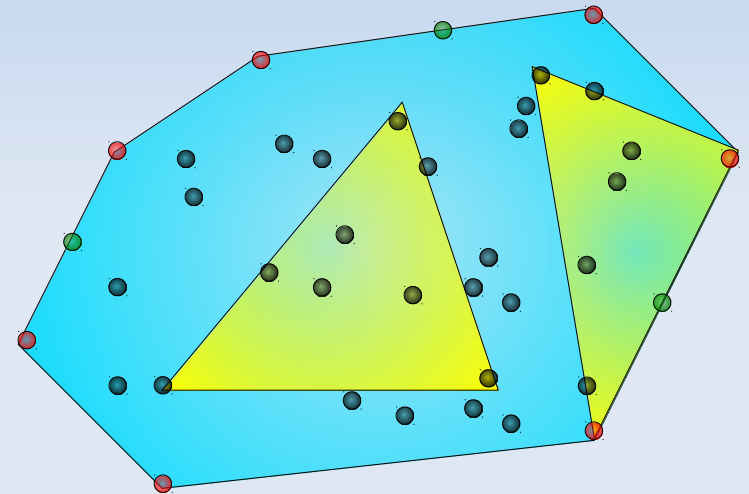
- for each  $j \neq i$  do

- for each  $k \neq j \neq i$  do

- for each  $l \neq k \neq j \neq i$  do

- if  $p_l$  in triangle  $p_i p_j p_k$  then  $p_l$  is **nonextreme**

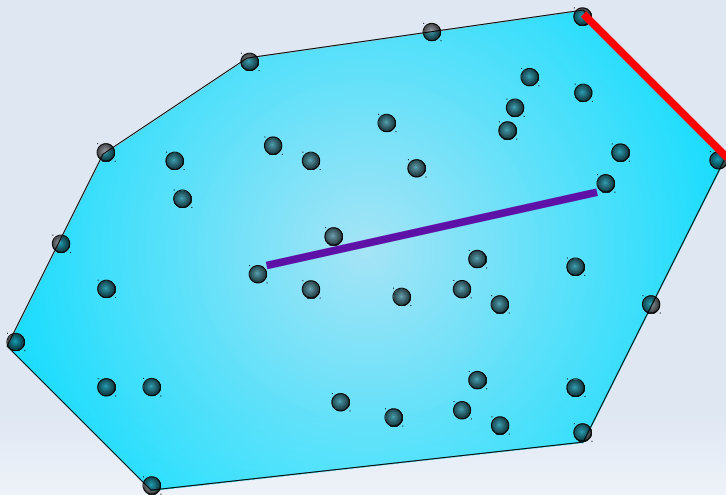
- $O(n^4)$  !!!





# Extreme Edges

- Algorithm: EXTREME EDGES
  - for each  $i$  do
  - for each  $j \neq i$  do
    - for each  $k \neq j \neq i$  do
      - if  $p_k$  is not (left or on)  $(p_i, p_j)$  then  $(p_i, p_j)$  is not extreme

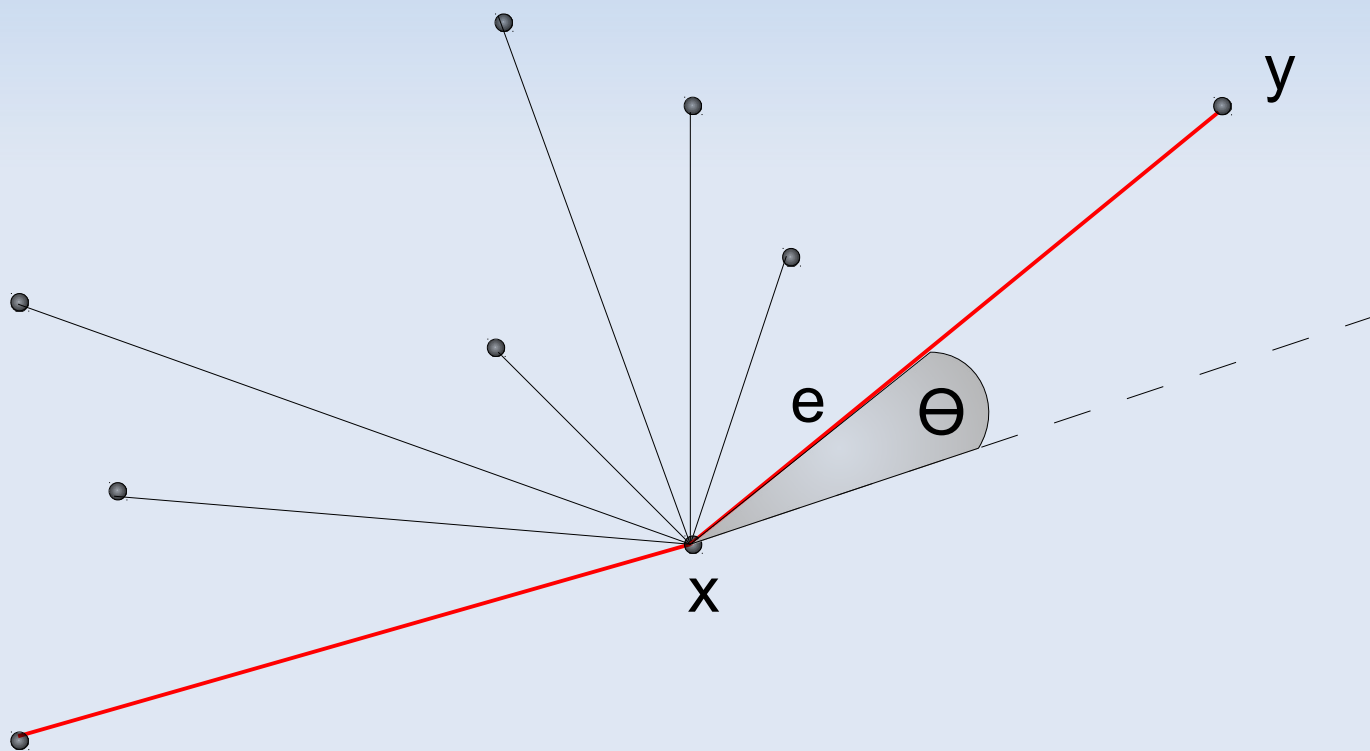


$O(n^3)$ , still very slow

# Gift Wrapping

- All edges of the convex hull are **connected**
- **Find** one, then **search** for the **next**
  - Use the lowest vertex to start with
- Works much faster:  $O(nh)$

# Gift Wrapping



# Gift Wrapping

- For each edge
  - **Compute** theta with  $O(n)$  vertices
  - **Choose** the vertex with the **smallest** theta
- There are only  **$h$  edges** on the boundary
  - $O(n)$  time for each edge
  - Overall running time  **$O(nh)$**

# Quickhull

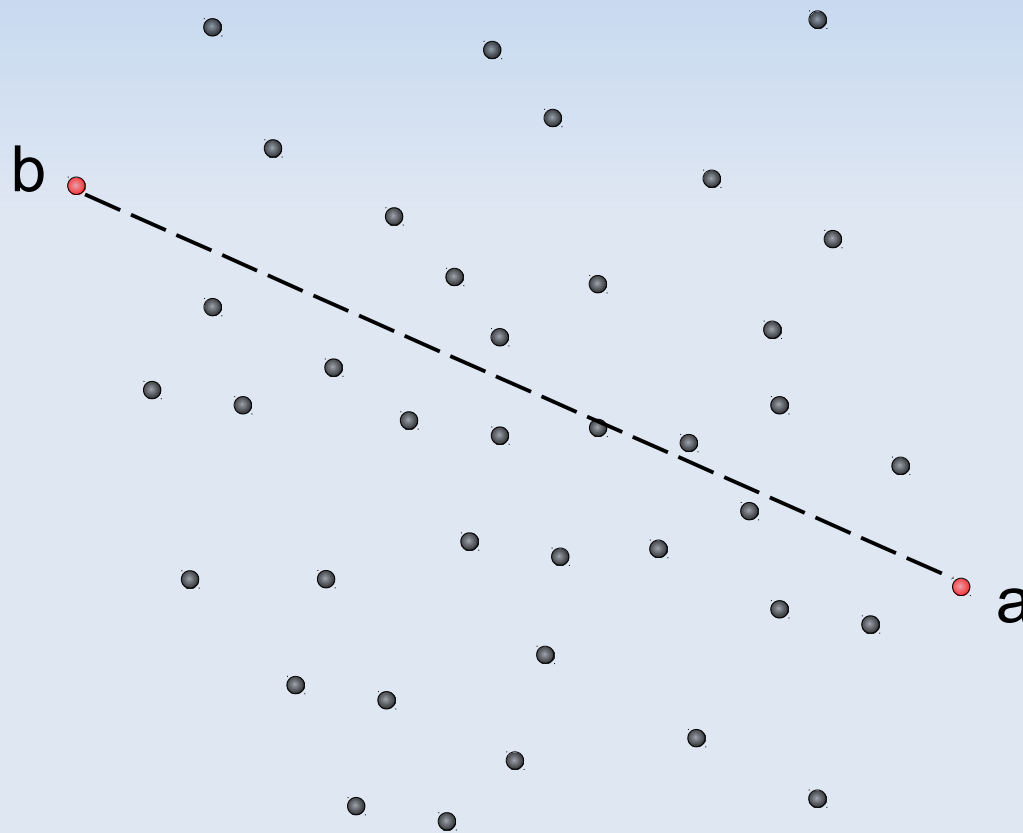
- Similar to Quicksort
- It is easy to **discard** many points
  - But may **not** work **always**
- Running time:
  - Best case:  $O(n \log n)$
  - Worst case:  $O(n^2)$

# Quickhull

- Algorithm: QUICKHULL( $a, b, S$ )
  - If  $S = \emptyset$  then return
  - else
    - $c \leftarrow$  index of point with max distance from  $ab$
    - $A \leftarrow$  points strictly right of  $(a, c)$
    - $B \leftarrow$  points strictly right of  $(c, b)$
    - return QUICKHULL( $a, c, A$ ) + ( $c$ ) + QUICKHULL( $c, b, B$ )

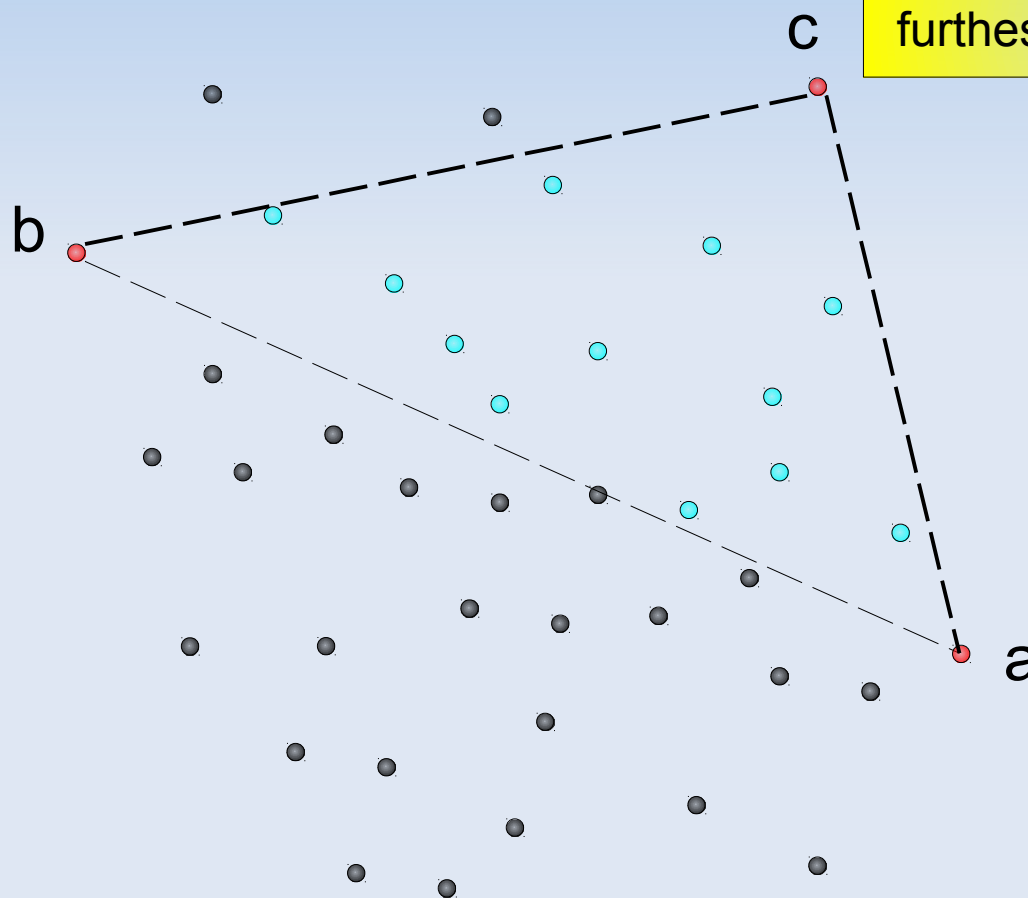
# Quickhull

Start with the leftmost  
and rightmost vertices



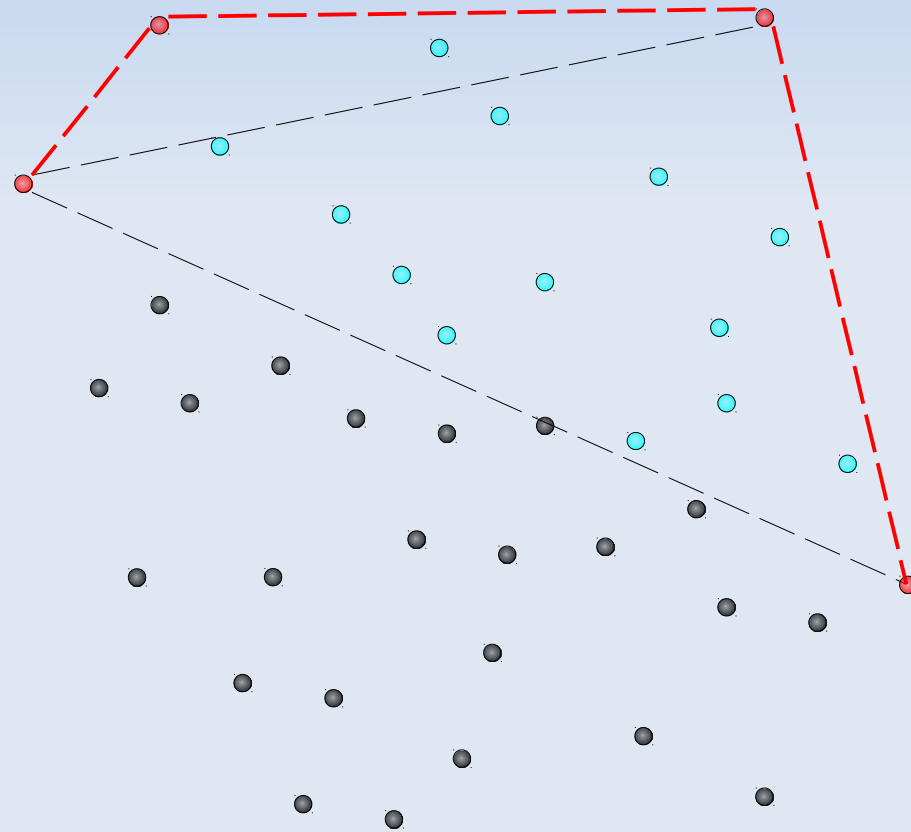
# Quickhull

Points in the triangle  $abc$   
are interior to the hull

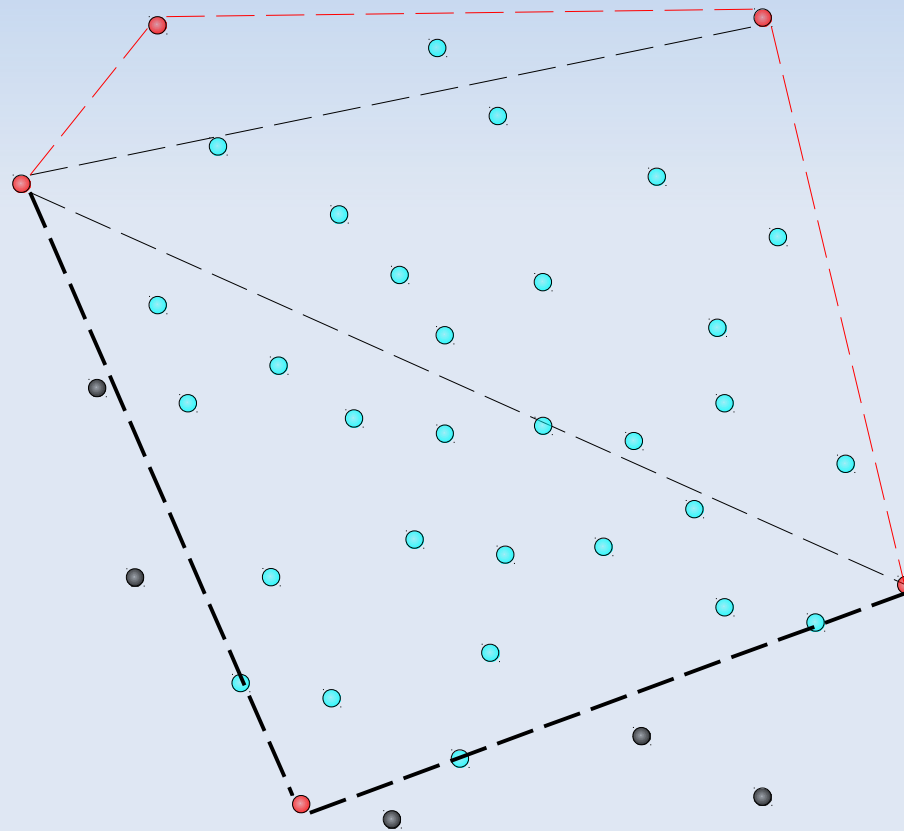




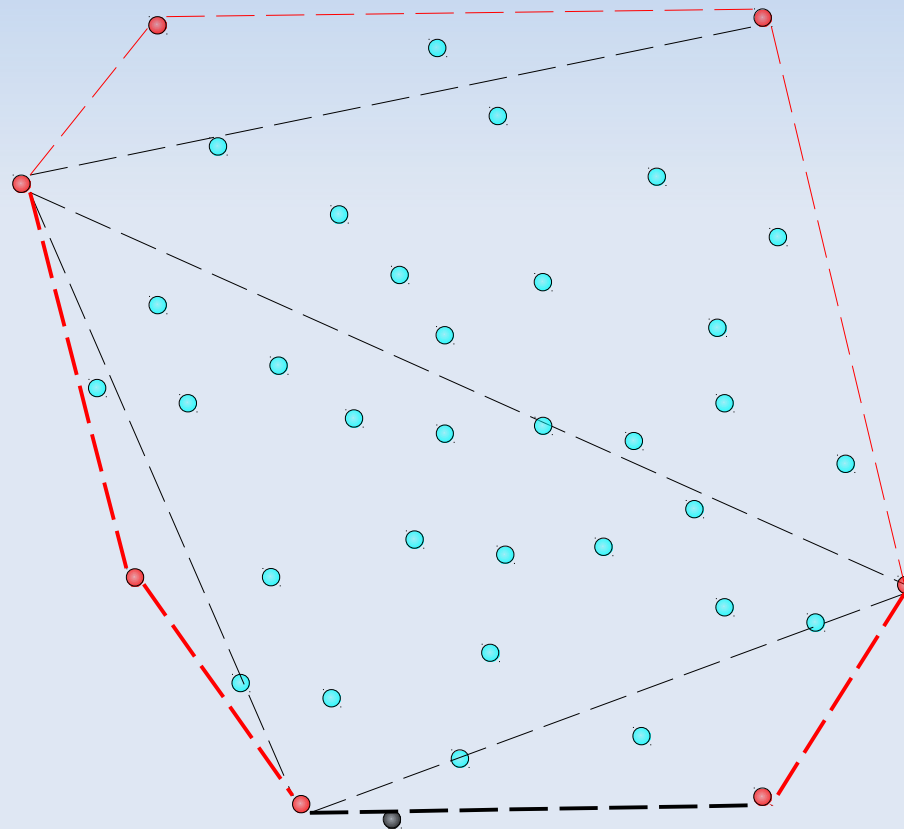
# Quickhull



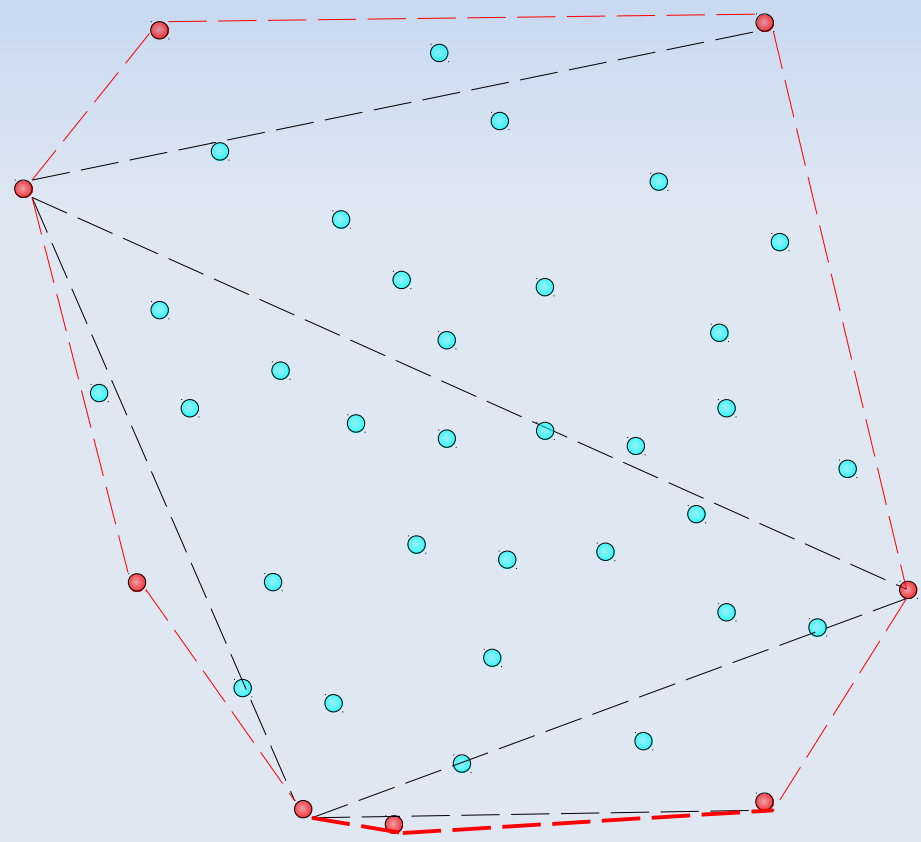
# Quickhull



# Quickhull



# Quickhull



# Quickhull

- Running Time:
  - Initial extremes a,b and separating S:  $O(n)$
  - Finding extreme point c and eliminating points in triangle acb:  $O(n)$ 
    - Recursive steps:  $T(n) = O(n) + T(\alpha) + T(\beta)$
    - Best case:  $T(n) = 2T(n/2) + O(n) = O(n \log n)$
    - Worst case:  $T(n) = O(n) + T(n-1) = O(n^2)$

# Graham's Scan

- Probably the **first scientific paper** in the history of Computational Geometry (1972)
- Bell laboratories required the hull of  $\approx 10,000$  vertices
  - The  $O(n^2)$  algorithm took **too much time**
    - $n^2 = 100,000,000$
  - Graham invented this  $O(n \log n)$  algorithm
    - $n \log n = 133,000$

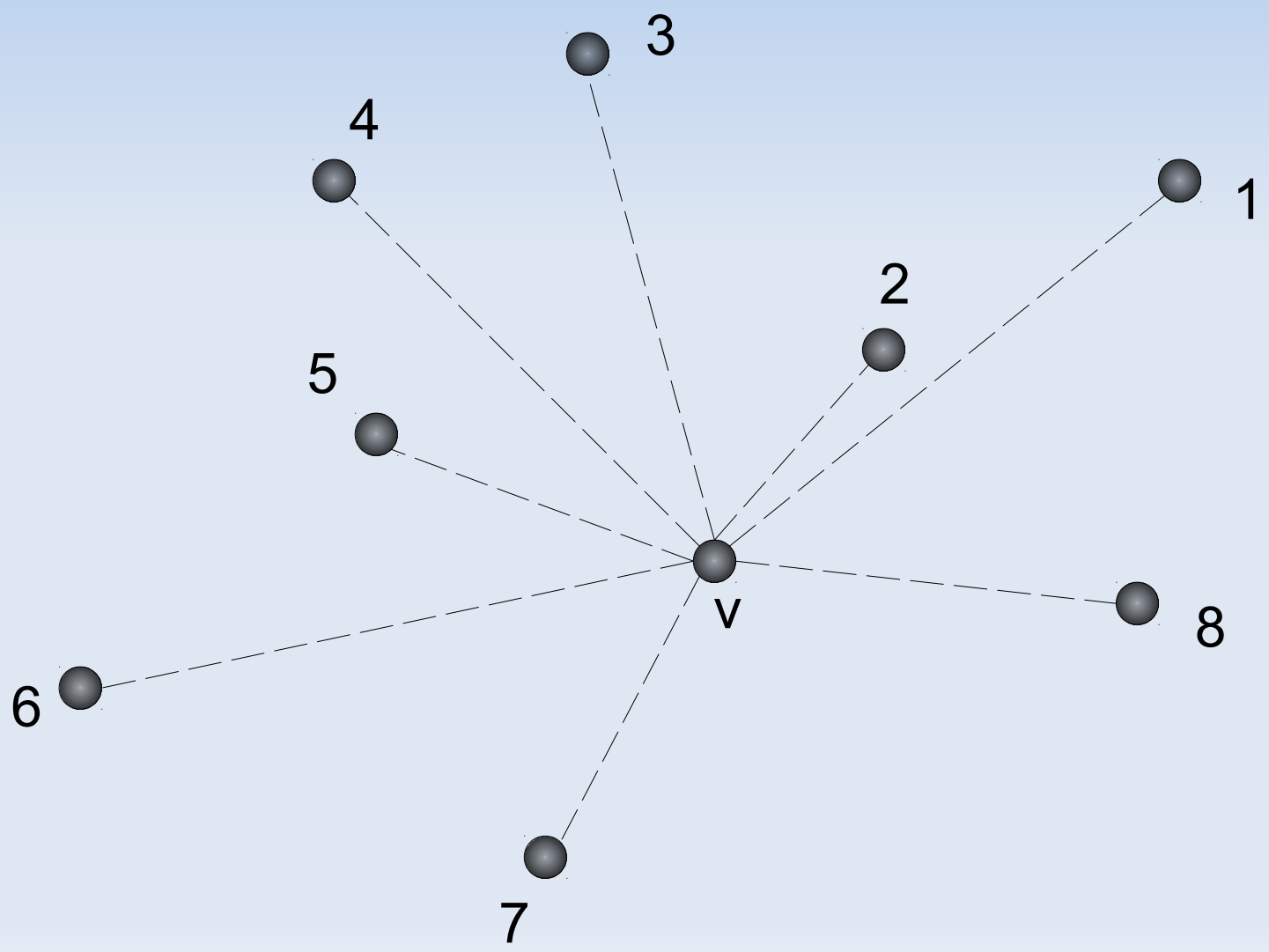
# Outline

- Choose a **vertex  $v$**  inside the hull
- **Sort** the rest of the vertices in counter clockwise **angular order around  $v$**
- Build the hull via **left turns** at each hull vertex
  - All turns on the convex hull are left turns during a boundary traversal

# Graham's Scan



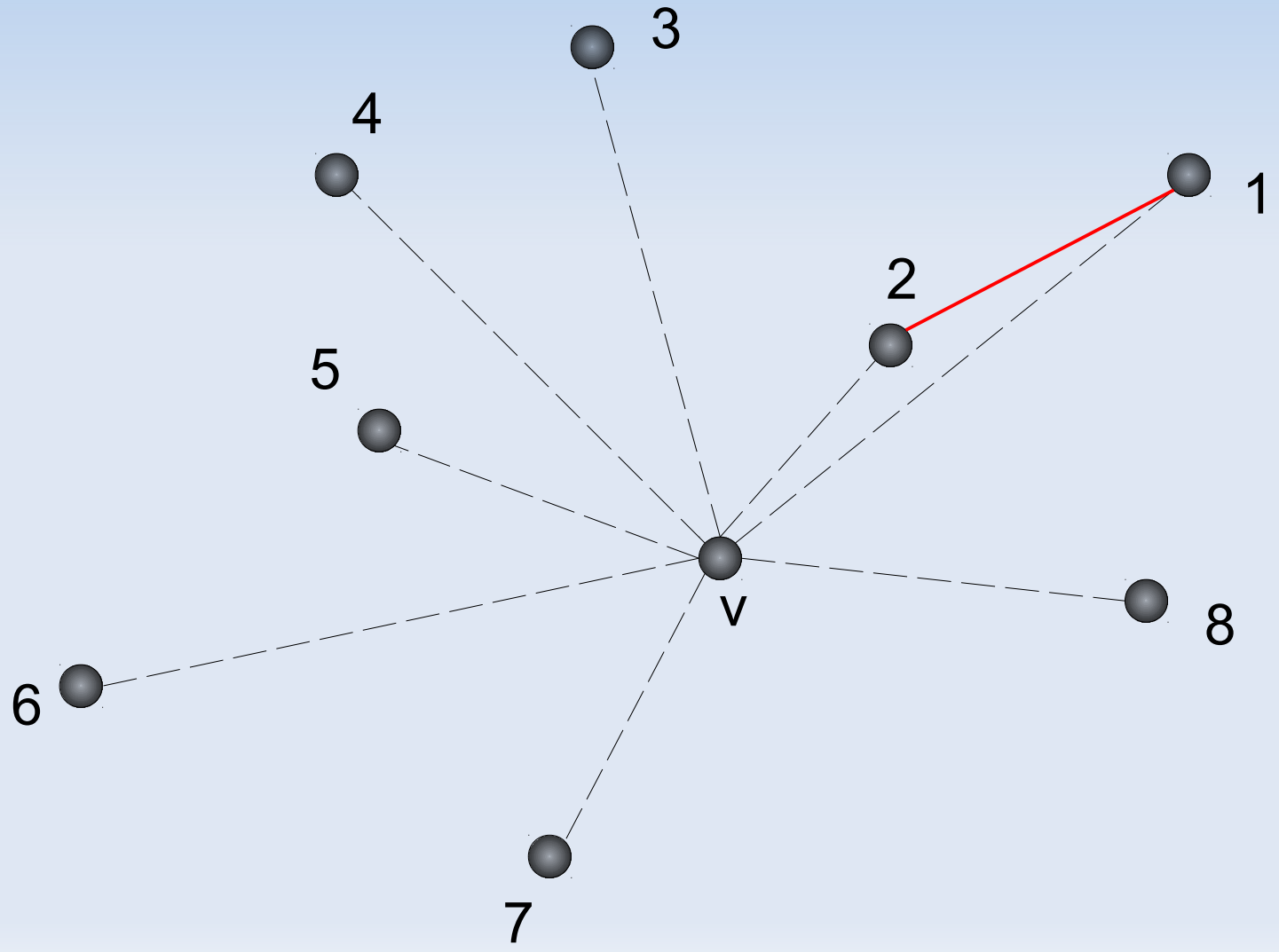
Stack S





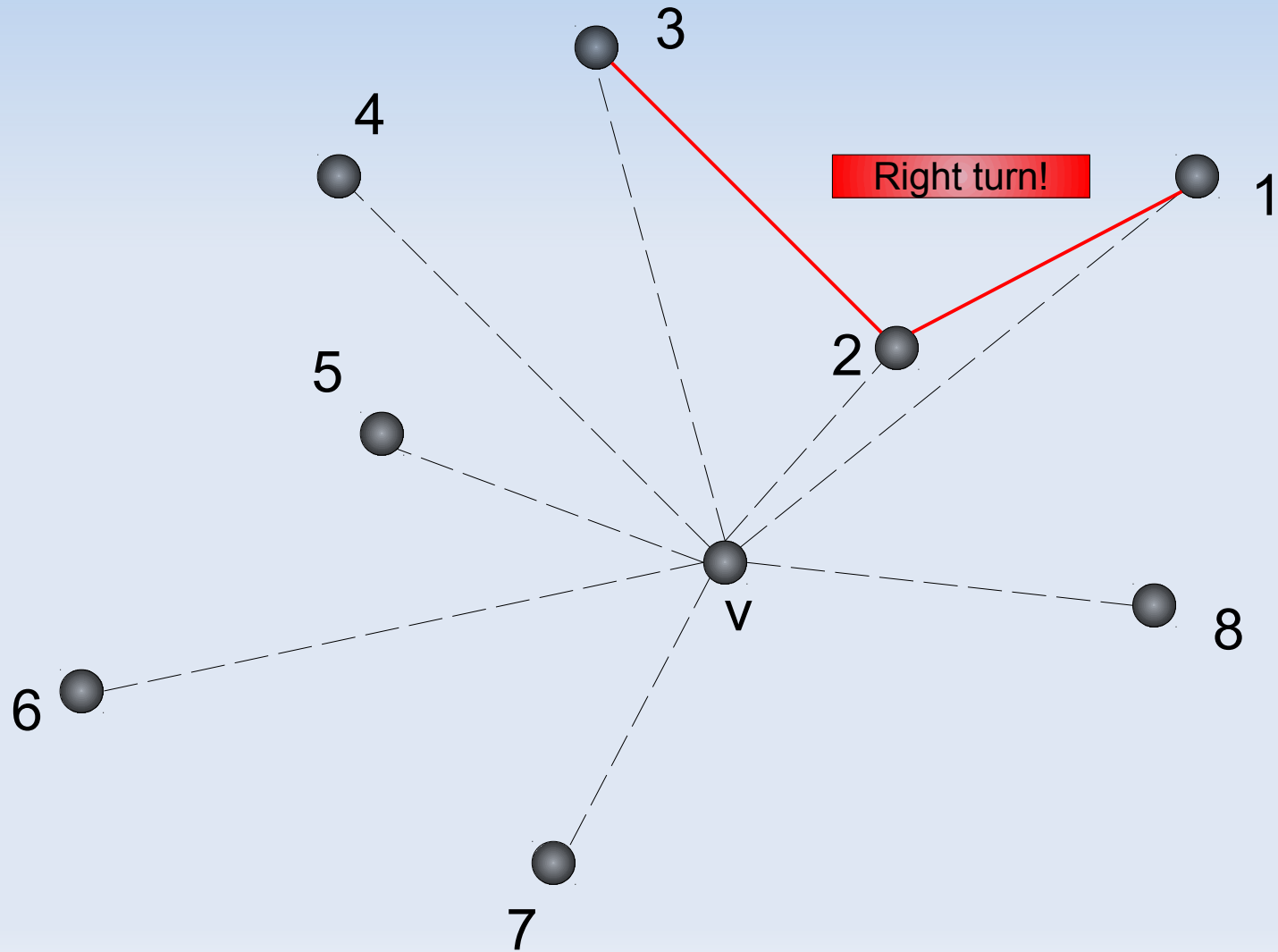
# Graham's Scan

2  
1



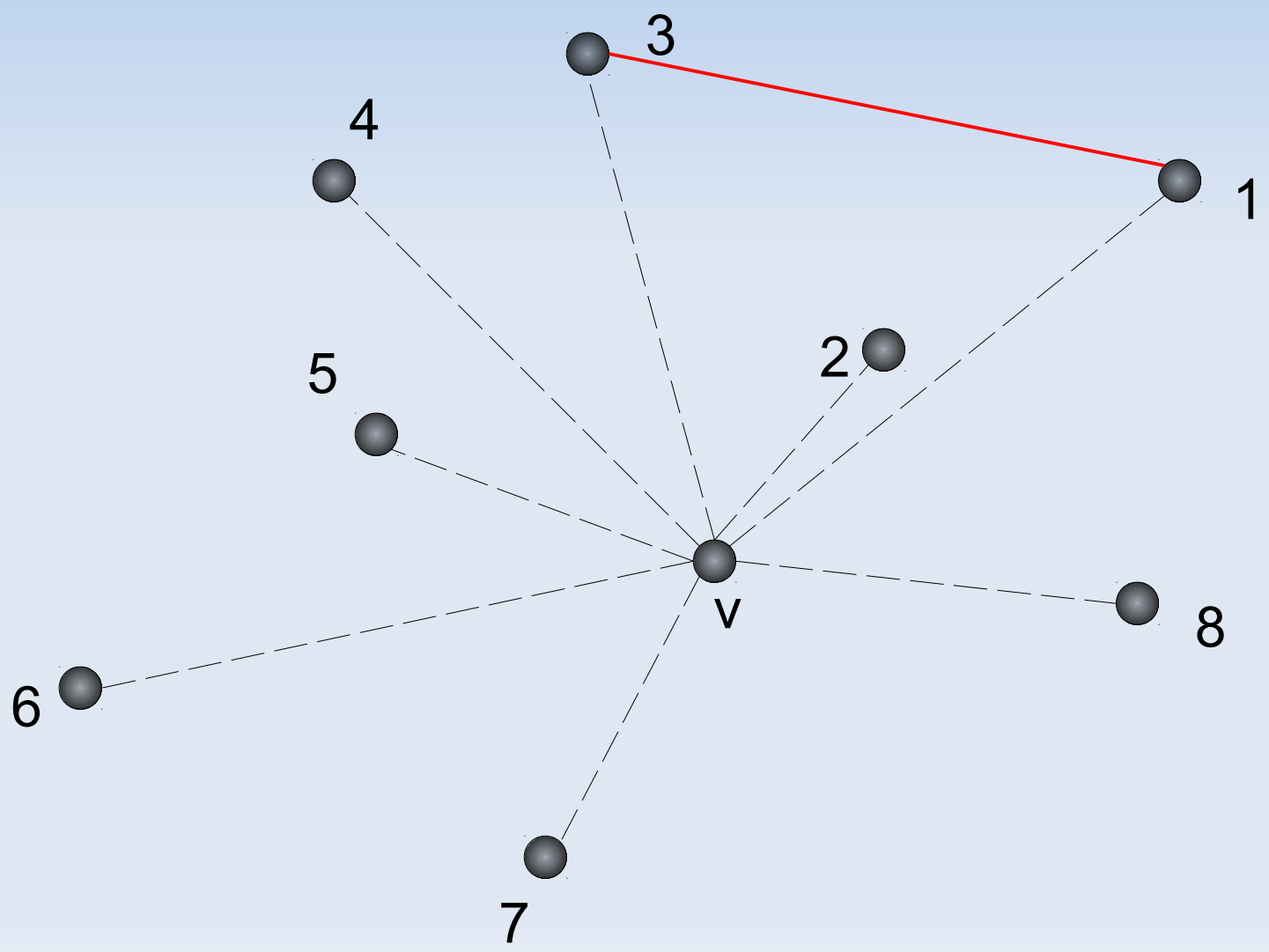
# Graham's Scan

2  
1



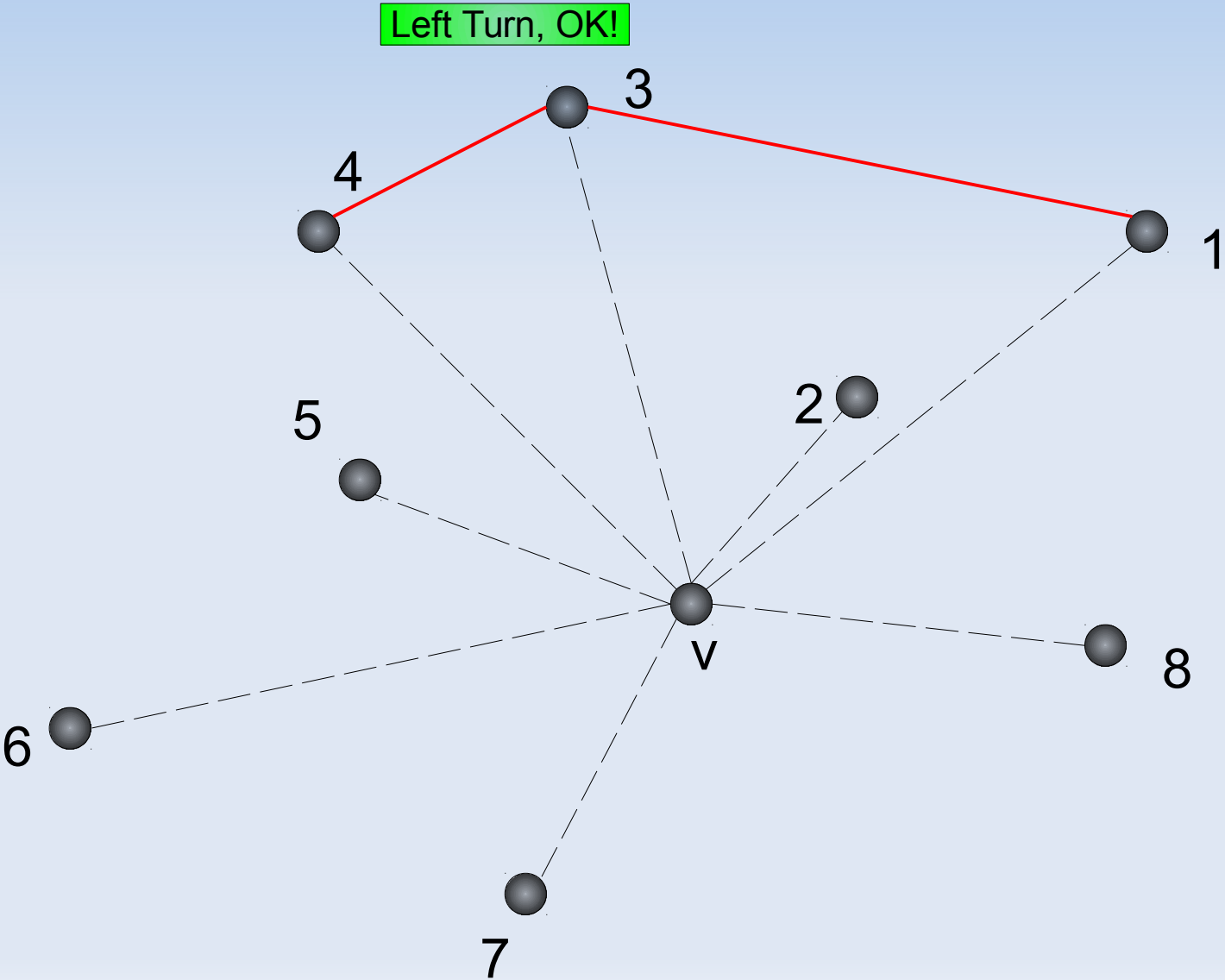
# Graham's Scan

3  
1



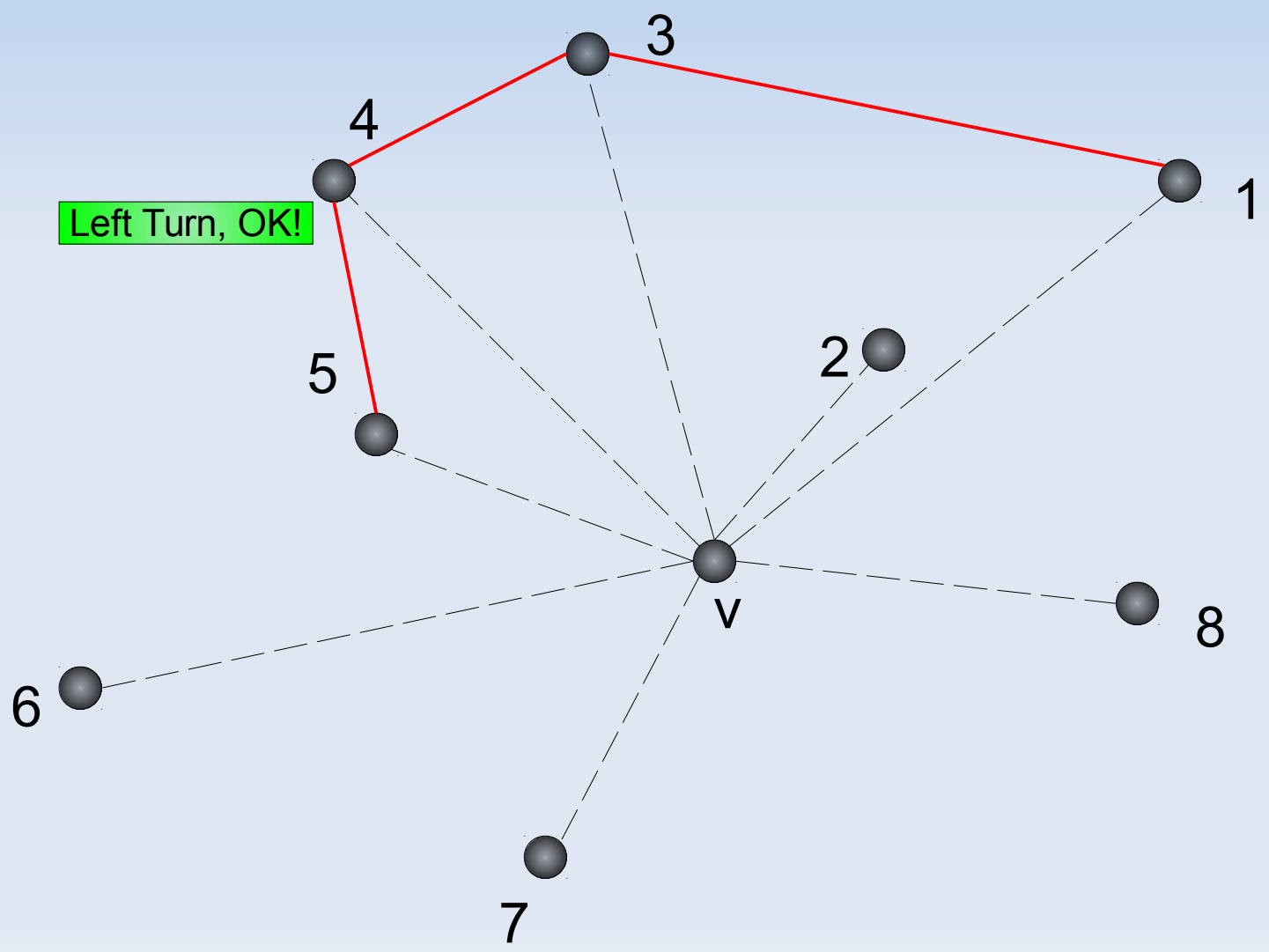
# Graham's Scan

4  
3  
1



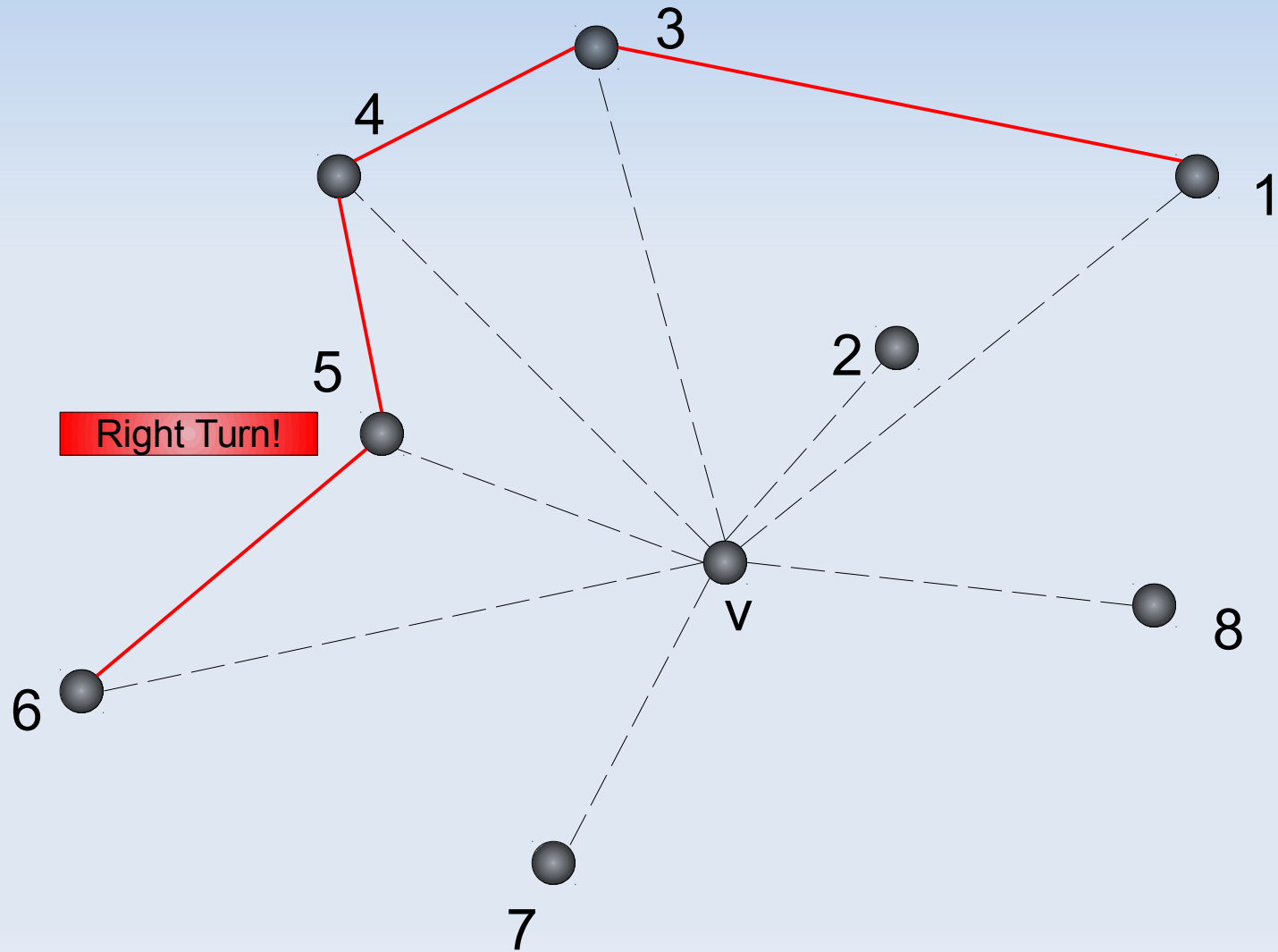
# Graham's Scan

- 5
- 4
- 3
- 1



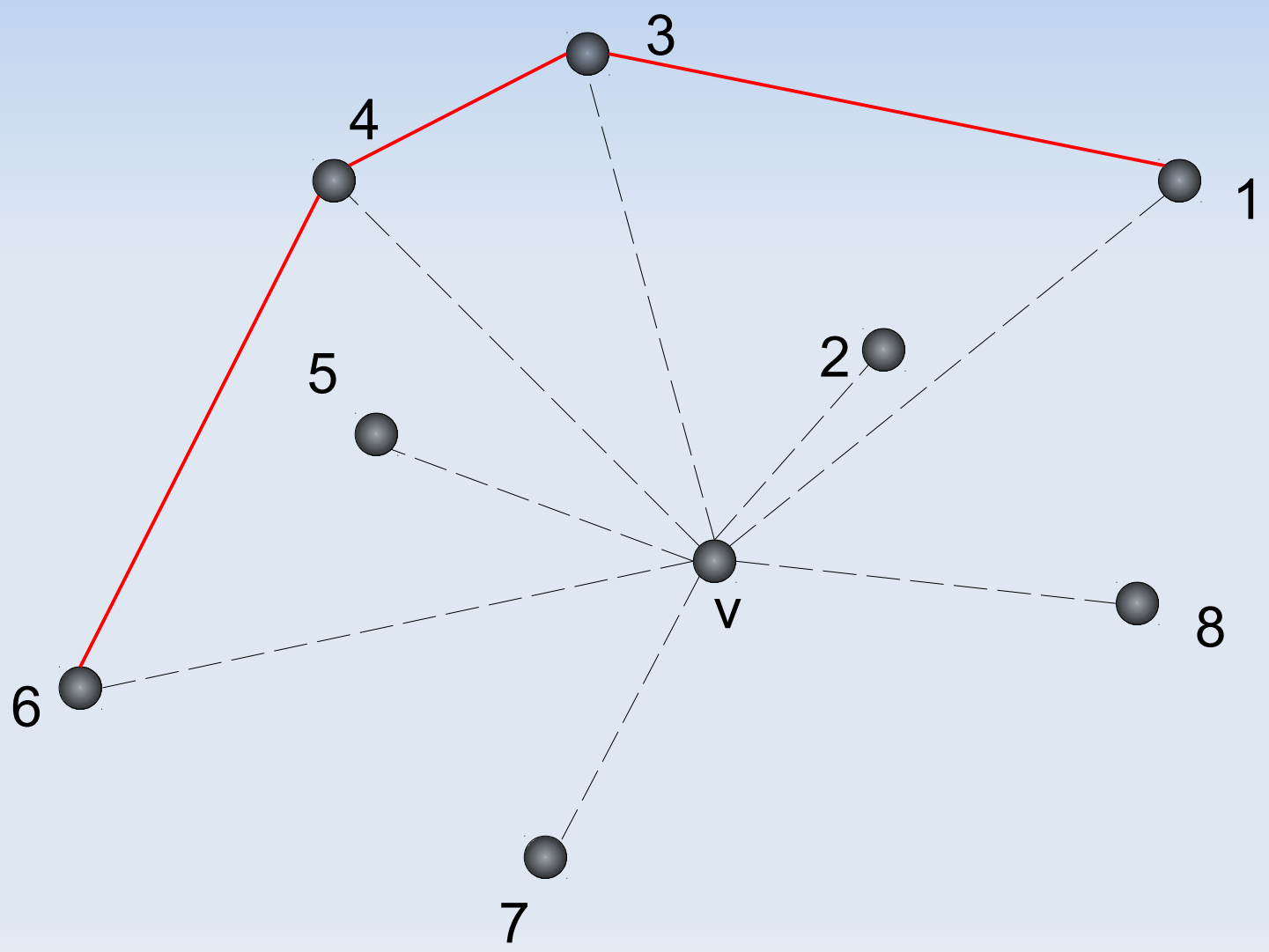
# Graham's Scan

- 5
- 4
- 3
- 1



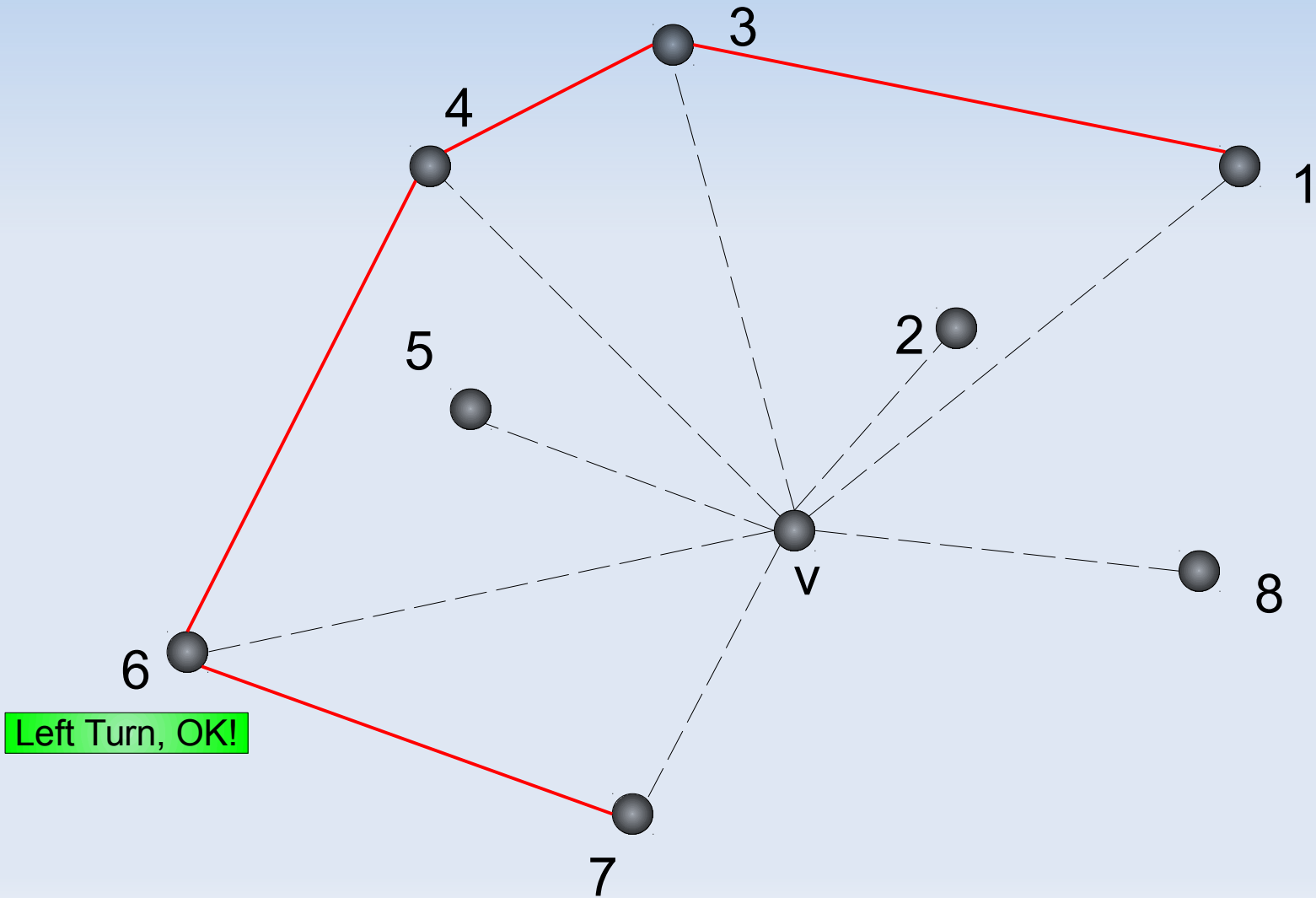
# Graham's Scan

- 6
- 4
- 3
- 1



# Graham's Scan

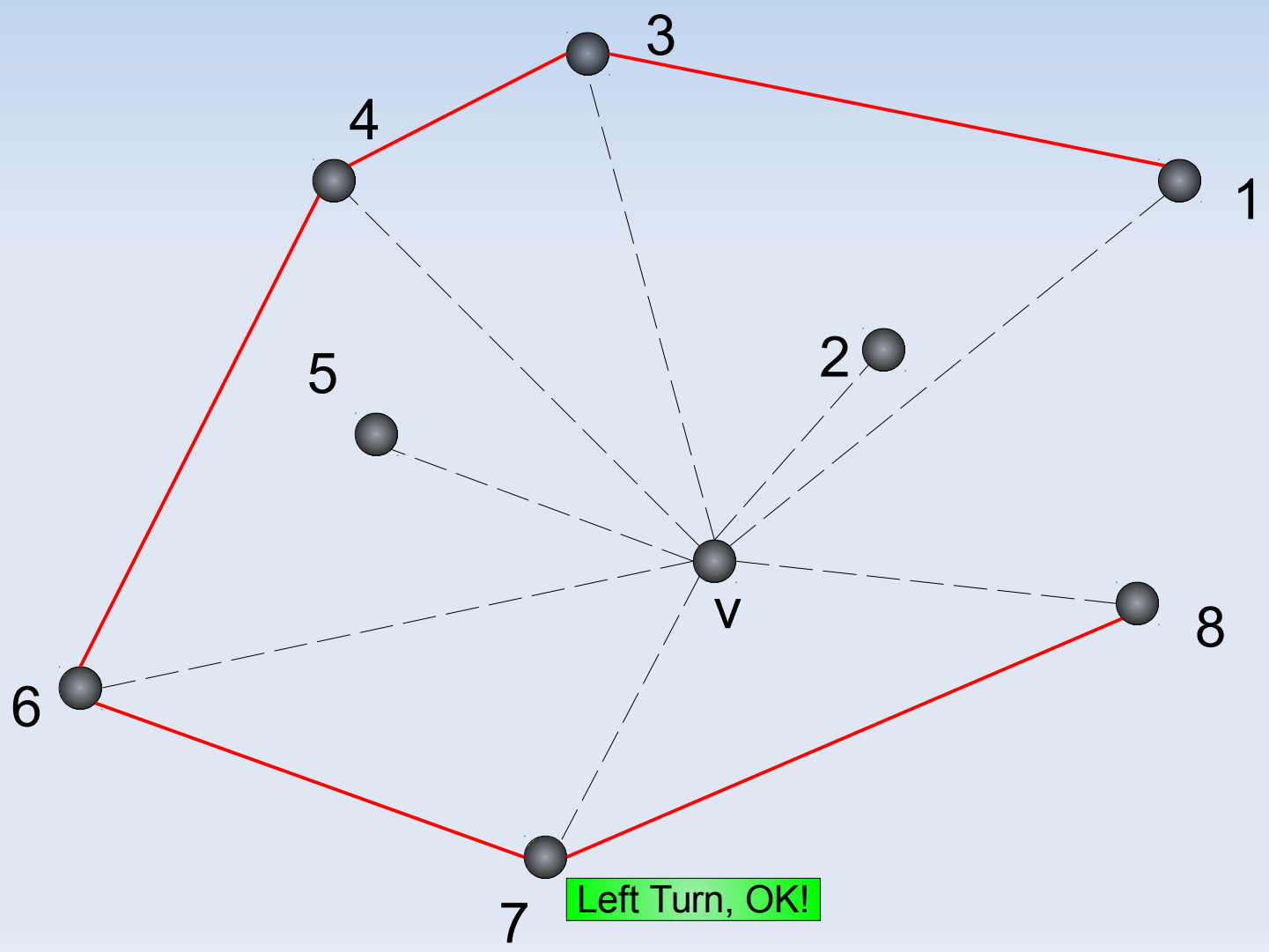
- 7
- 6
- 4
- 3
- 1





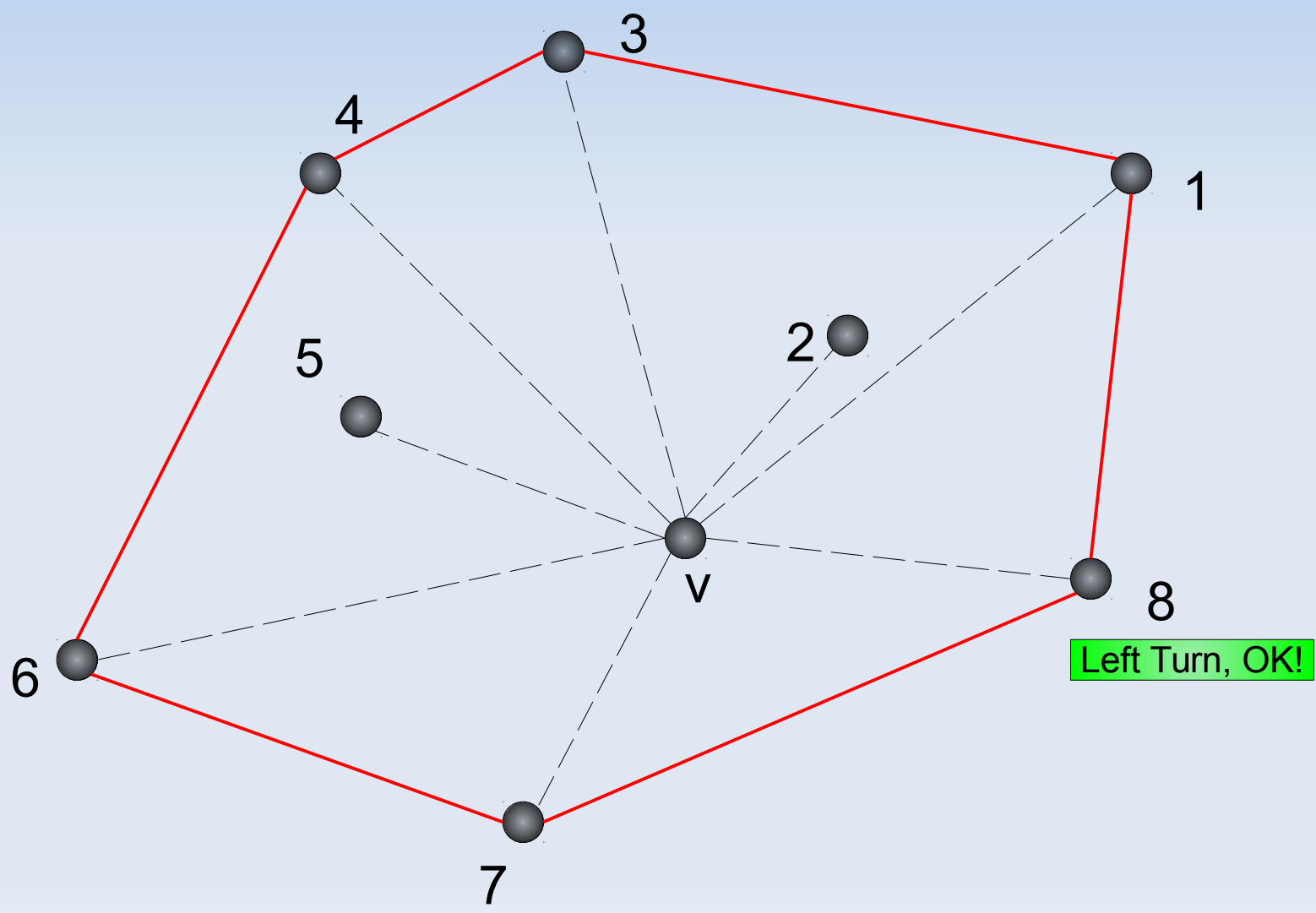
# Graham's Scan

- 8
- 7
- 6
- 4
- 3
- 1



# Graham's Scan

- 8
- 7
- 6
- 4
- 3
- 1



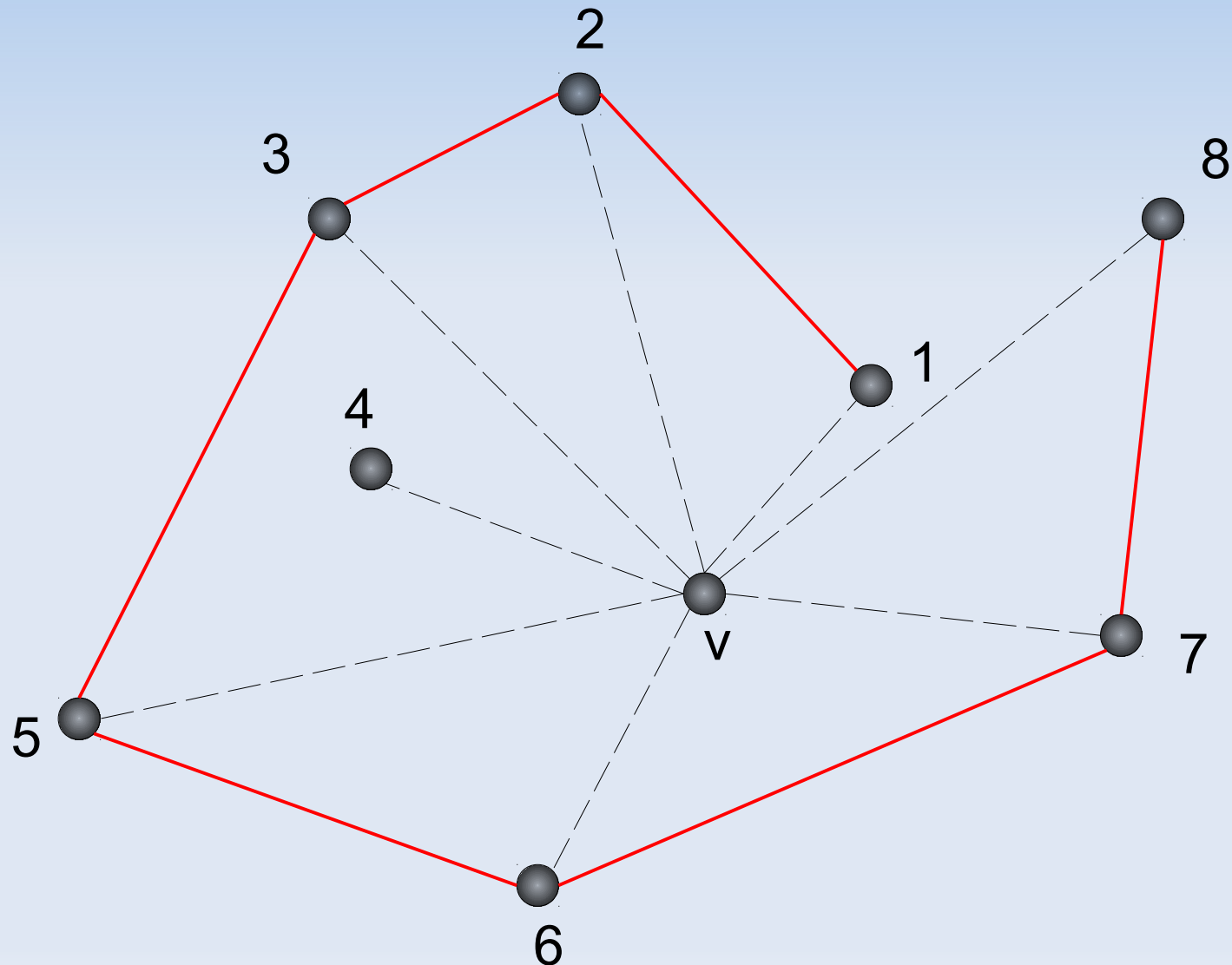
# Running Time

- **Sorting** the vertices:  $O(n \log n)$
- Each vertex is **added** to the stack **once**
  - May be **removed** only **once**
- Overall running time:  $O(n \log n)$

# Some Problems

- The algorithm so far is not perfect
  - What happens at the **end** if the **bottom vertex** is **not a hull vertex**?
  - What happens at the **start** if the **second vertex** is **not a hull vertex**?
  - Which **vertex** to use as **origin** for sorting?
  - How about **collinear** vertices?

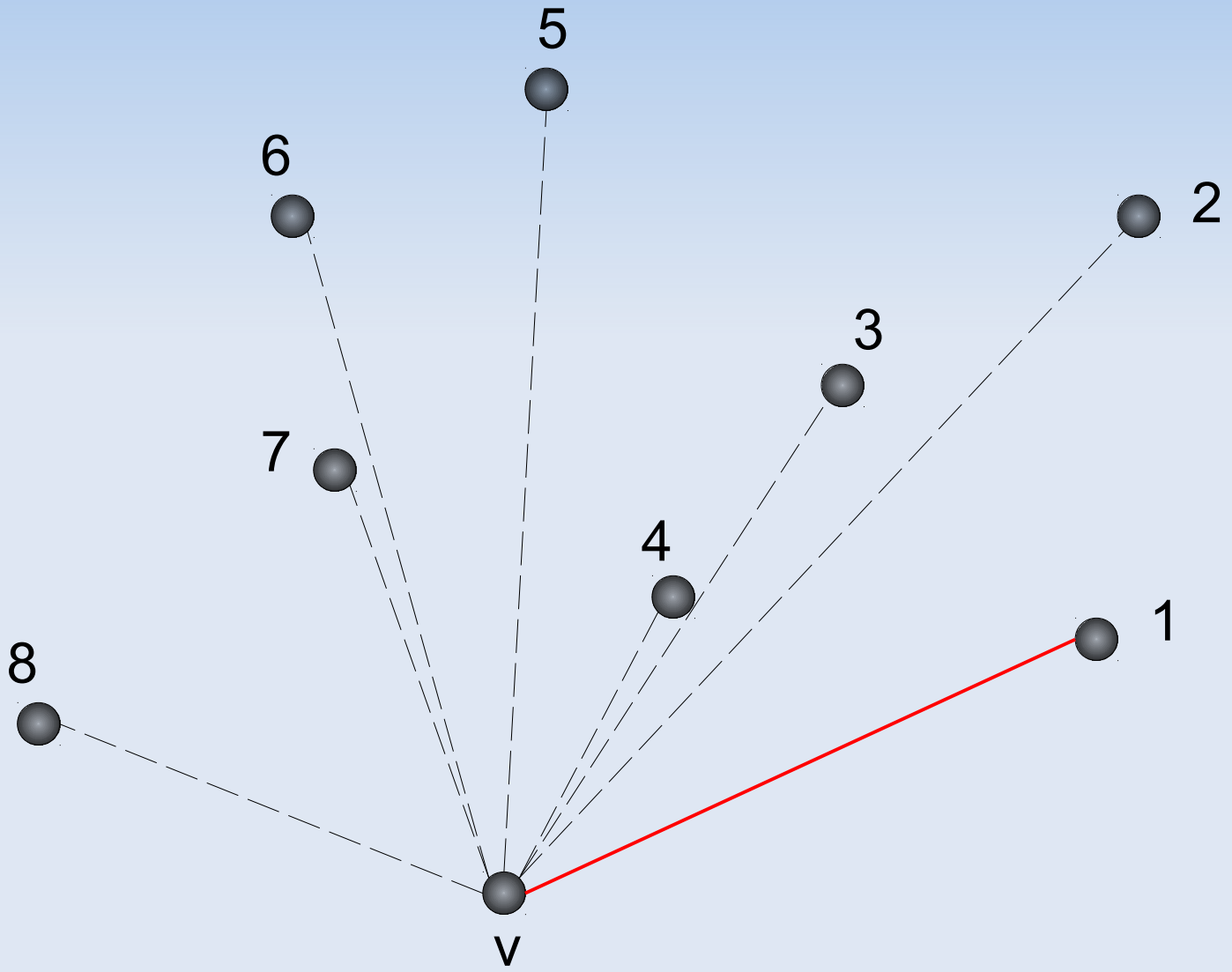
# Some Problems



# Solutions

- **Origin of sorting:** The rightmost vertex with **smallest y-coordinate**
  - Can be found in  $O(n)$  time
  - Always a **hull vertex**
  - After the sort, the **first vertex** is also a **hull vertex**

# Solutions

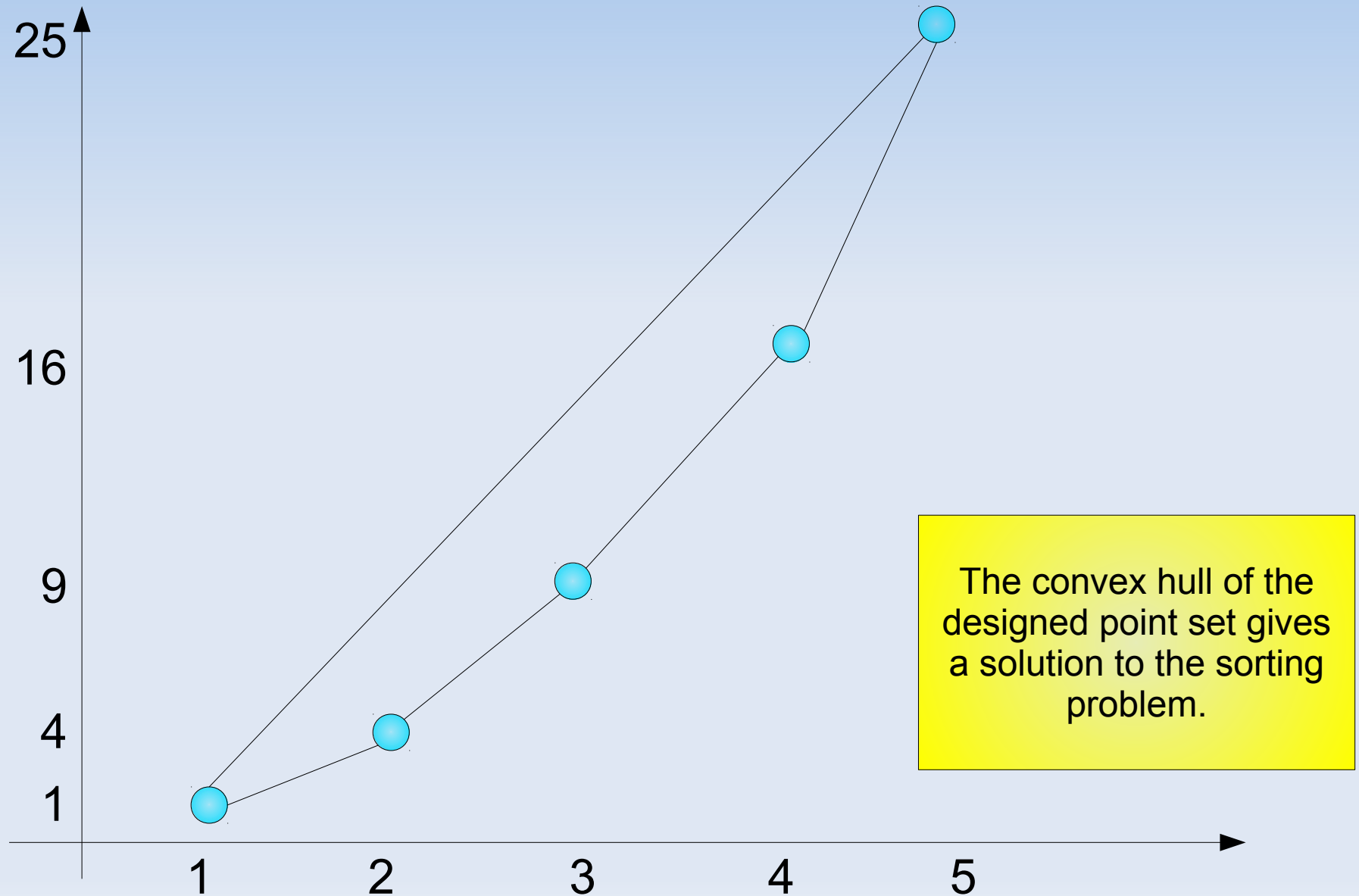


# Solutions

- Hull collinearities
  - require a **strict** left turn
- Sorting collinearities
  - Arbitrary solutions cause **hull overlaps**
    - or **bugs** in the implementation
  - **Delete** the vertices **closer** to the origin



# Lower Bound



# QUIZ TIME

Prepare for the quiz!

# QUIZ 4

Consider the following pseudocode on a set  $S$  of  $n$  points:

```
 $i \leftarrow 1$   
 $S_1 \leftarrow S$   
 $n_1 \leftarrow n$   
while ( $n_i > 3$ )  
    compute the convex hull  $H(S_i)$  of  $S_i$   
     $S_{i+1} \leftarrow S_i - H(S_i)$   
     $n_{i+1} \leftarrow n_i - |H(S_i)|$   
     $i \leftarrow i + 1$ 
```

where  $|H(S_i)|$  is the number of points on  $H(S_i)$

What is the **maximum** value  $i$  can obtain **at the end**?  
**Justify** your answer.