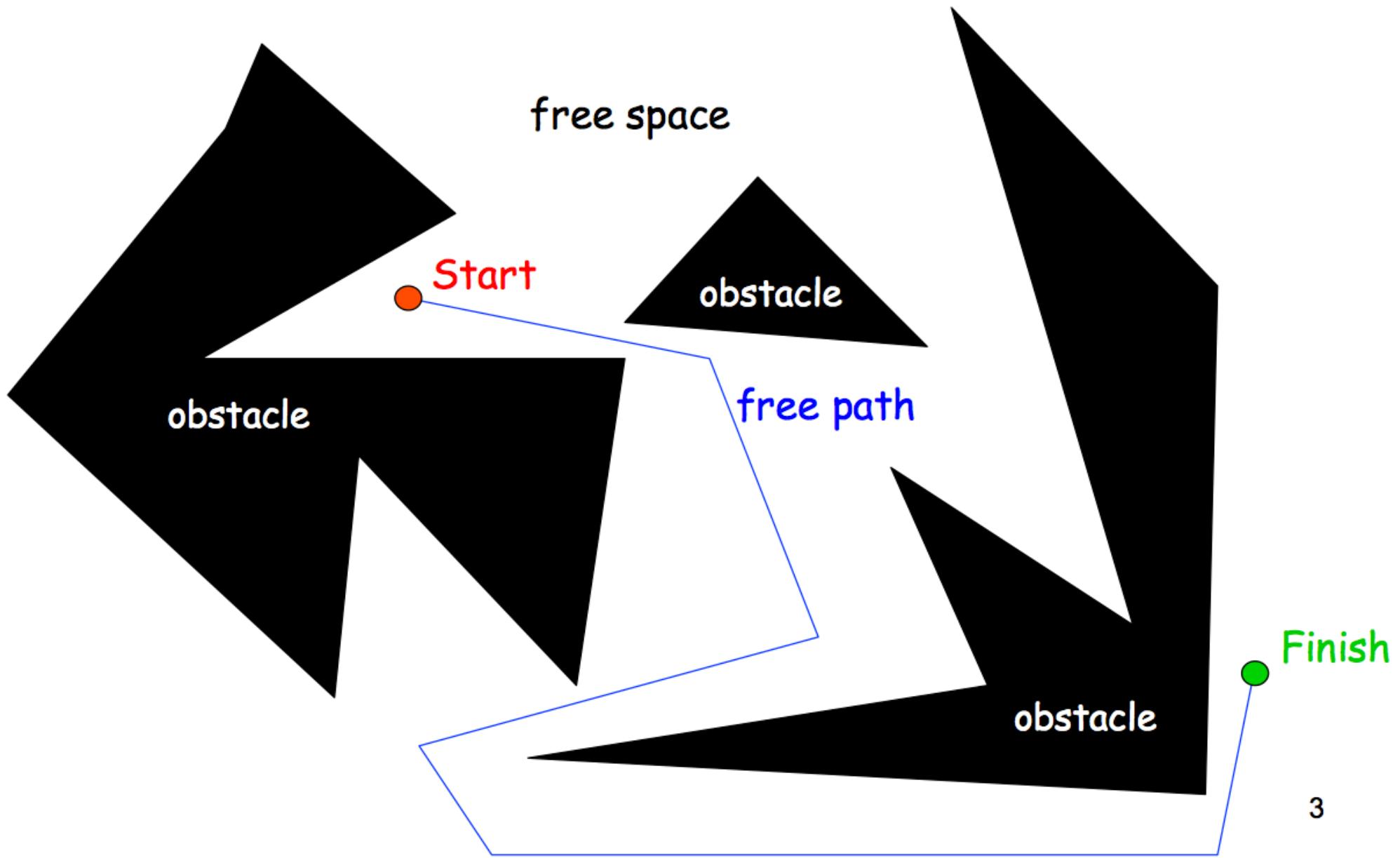


# Combinatorial motion planning

## 1. Point robot among obstacles in 2D

# Motion planning



screenshot from: [ai.stanford.edu/~latombe/cs26n/2012/slides/point-robot-bug.ppt](http://ai.stanford.edu/~latombe/cs26n/2012/slides/point-robot-bug.ppt)

# Motion Planning

## Input:

- a robot  $R$
- start and end position
- a set of obstacles  $S = \{O_1, O_2, \dots\}$

Find a path from start to end (that optimizes some objective function).

## Parameters:

- physical space (2d, 3d)
- geometry of obstacles (polygons, disks, convex, non-convex, etc)
- geometry of robot (point, polygon, disc)
- robot movement —how many degrees of freedom (dof); 2d, 3d
- objective function to minimize (euclidian distance, nb turns, etc)
- static vs dynamic environment
- exact vs approximate path planning
- known vs unknown map

# Motion Planning

algorithm that finds a path



Ideally we want a **planner** to be complete and optimal.

- A planner is **complete**: it always finds a path when a path exists
- A planner is **optimal**: it finds an optimal path (wrt an objective function)

# Path planning problems

- point robot moving among (arbitrary) polygons in 2D
- polygonal robot moving among (arbitrary) polygons in 2D
  - translation only
  - translation+rotation
- ....
- robot with arms and articulation moving in 3D

we'll talk about  
these

harder

# Approaches

- **Combinatorial (exact)**
  - Used for path planning in 2D
  - Idea:
    - Compute an exact representation of free space as a graph
    - Find a path using the graph
- **Approximate**
  - Used for higher dimensional planning
  - Idea:
    - sample and approximate free space

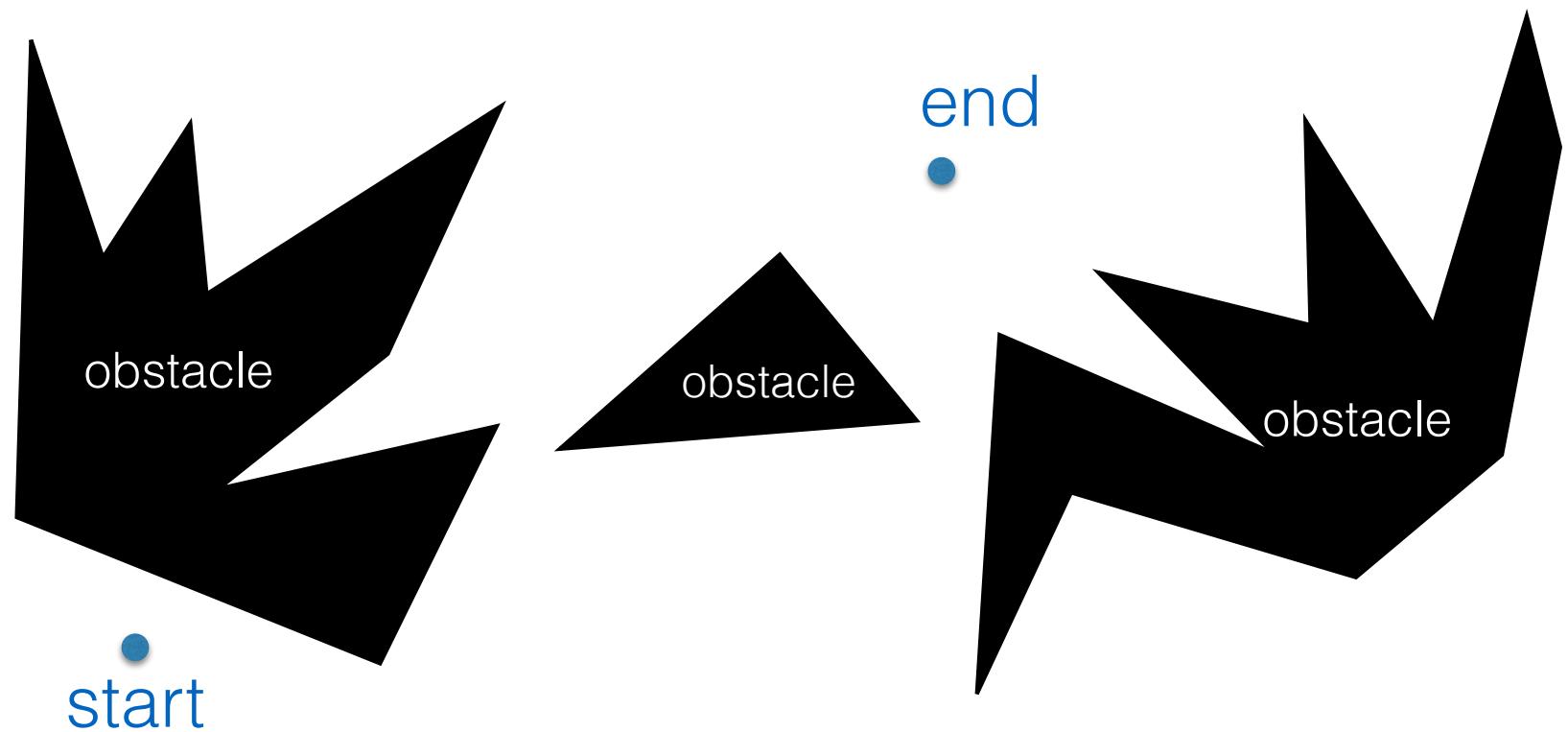
# 1. Point robot moving in 2D

# Point robot in 2D

Input:

- start and end position
- a set of polygonal obstacles  $S = \{O_1, O_2, \dots\}$

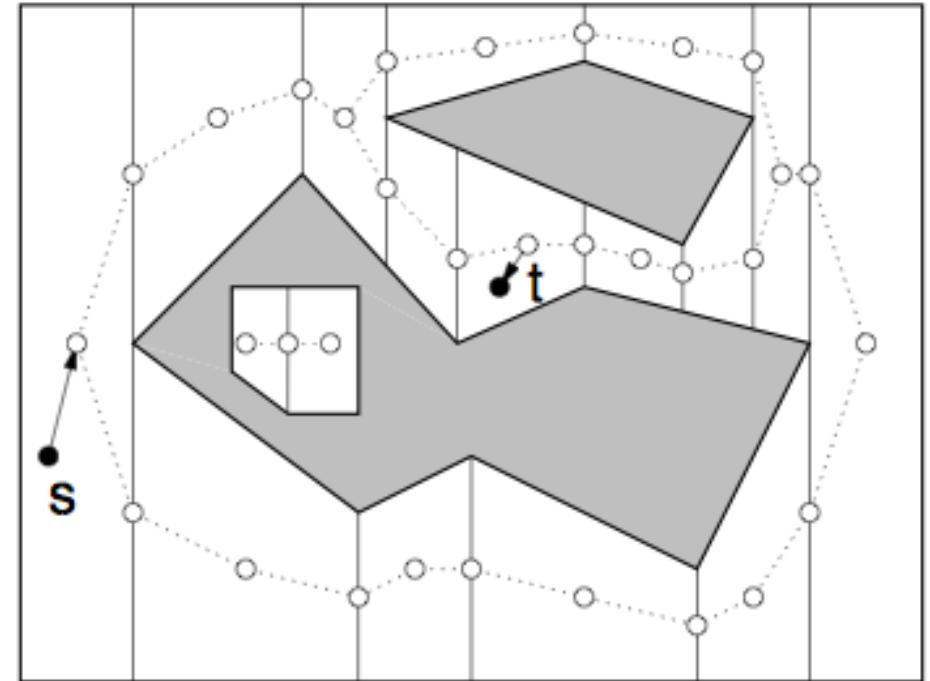
Find a path from start to end.



# Point robot in 2D

## General idea

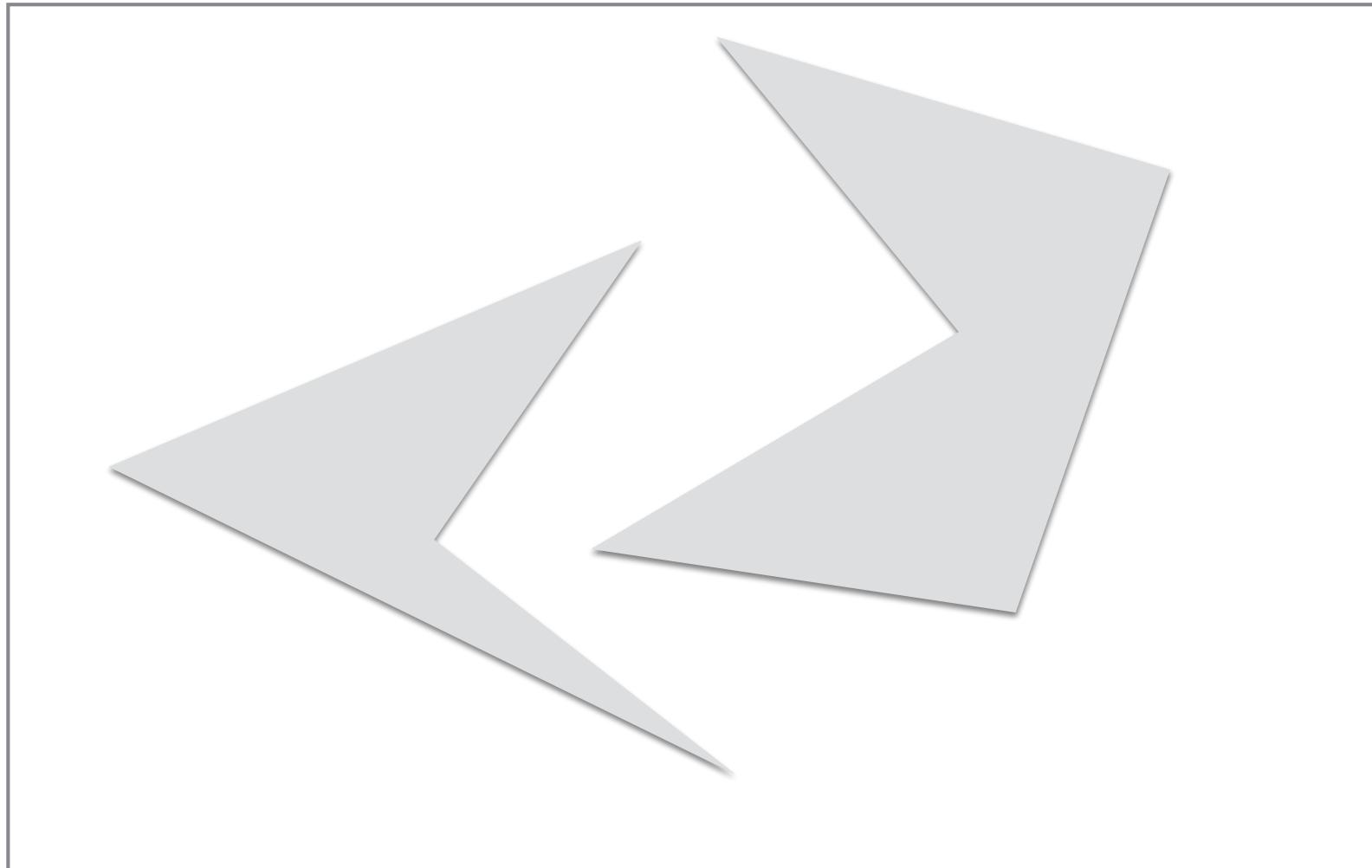
- Build a graph that represents movement through the free space
  - based on trapezoid decomposition of free space
- Search graph to find path



(screenshot from O'Rourke)

- Questions: How? How long? Size?

Let's consider the following scene. Show a trapezoid decomposition of free space and the corresponding graph ("roadmap").



# Point robot in 2D

$n$  = complexity of obstacles  
(total number of edges)

- Compute a trapezoid partition of free space
- Build graph of free space
- Search graph to find path

Has size  $O(n)$  and can be computed in  $O(n \lg n)$  time

Has size  $O(n)$  and can be computed in  $O(n)$  time

BFS or DFS in  $O(n)$  time

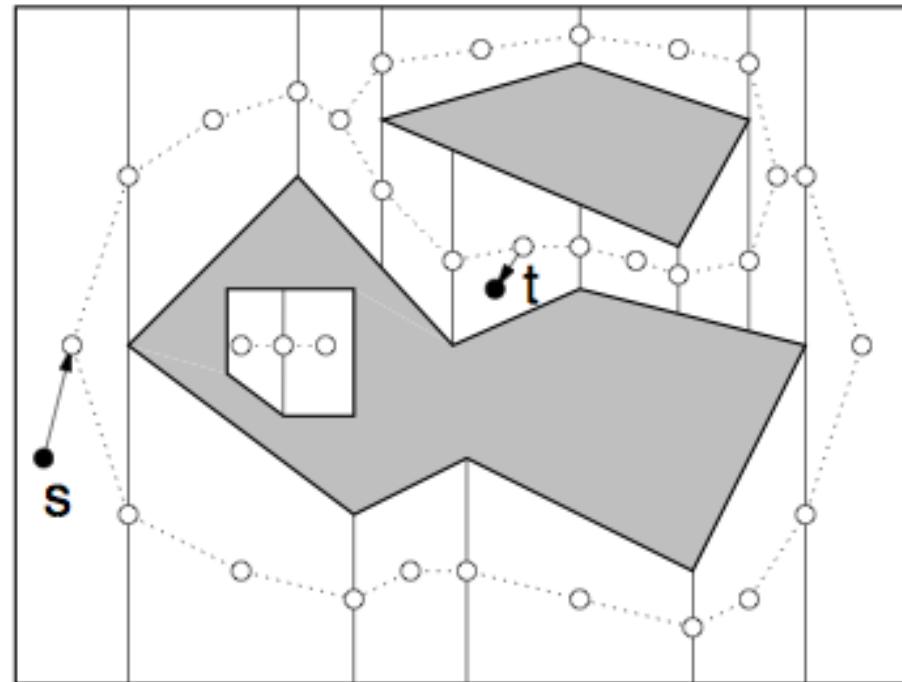
**Result:** Let  $R$  be a point robot moving among a set of polygonal obstacles in 2D with  $n$  edges in total. We can pre-process the scene in  $O(n \lg n)$  expected time such that, between any start and goal position, a collision-free path for  $R$  can be computed in  $O(n)$  time, if it exists.

- Big idea: Path planning for point robot in 2D reduces to graph search in the “free space” graph

# Point robot in 2D

Is this complete?

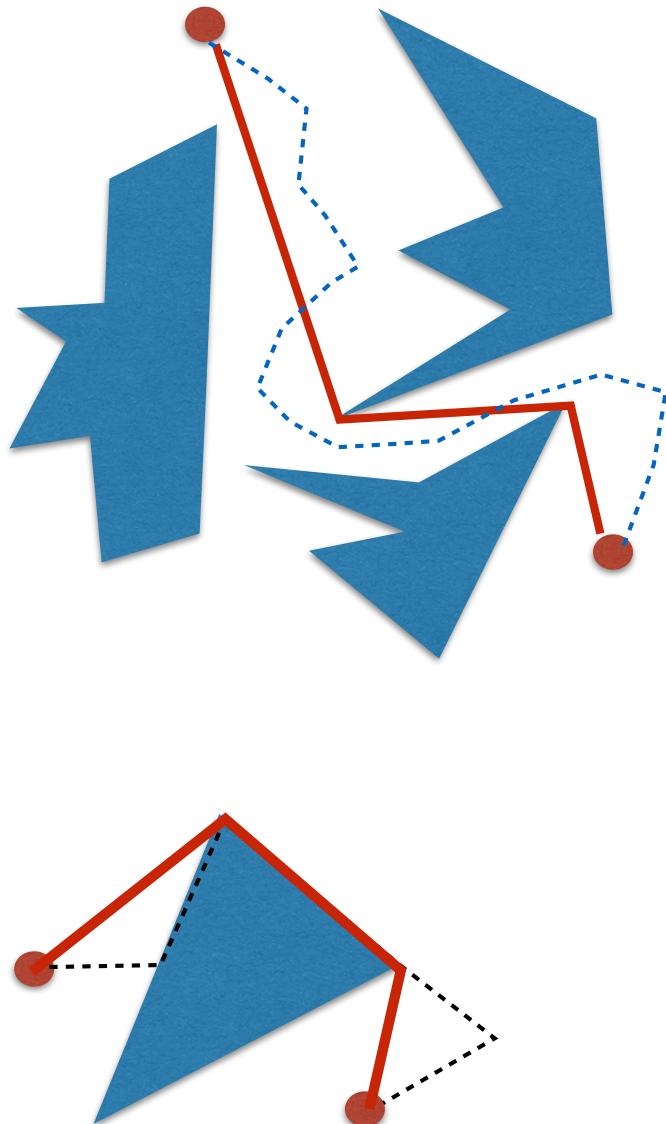
YES



Is this optimal?

No

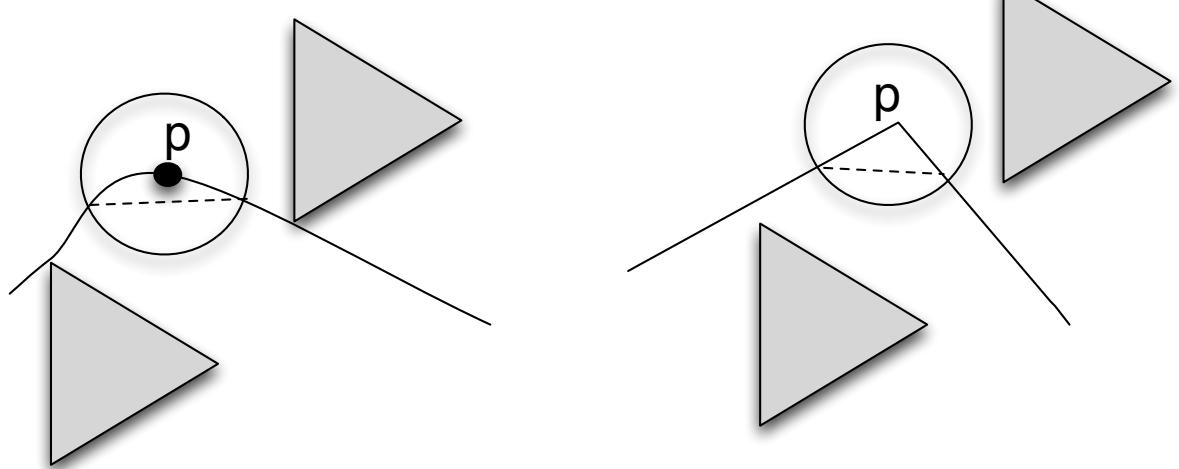
# What if we wanted an **optimal** path?



## Theorem:

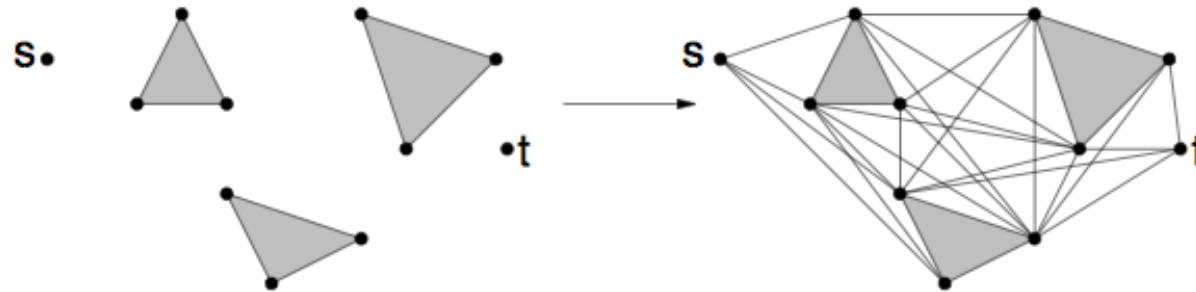
Any shortest path among a set  $S$  of disjoint polygonal obstacles:

1. is a polygonal path (that is, not curved)
2. its vertices are the vertices of  $S$ .



# Visibility graph

- Idea: Since the vertices of any shortest path are the vertices of  $S$ , build a graph that represents all possible ways to travel between the vertices of the obstacles
  - $V = \{\text{set of vertices of obstacles} + p_{start} + p_{end}\}$
  - $E = \{\text{all pairs of vertices } (v_i, v_j) \text{ such that } v_i v_j \text{ are visible to each other (and not inside a polygon)}\}$
- Claim: any shortest path must be a path in the VG

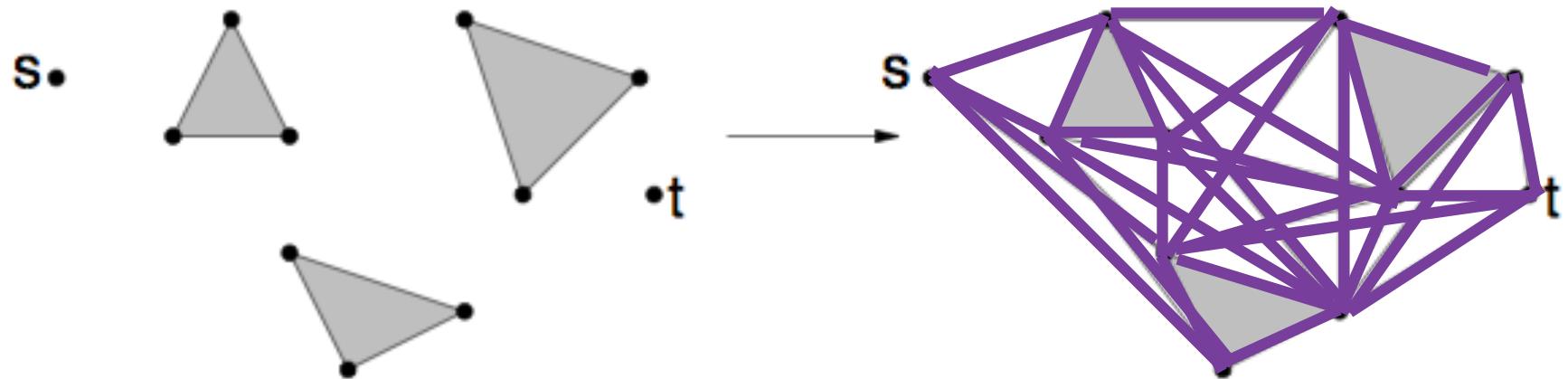


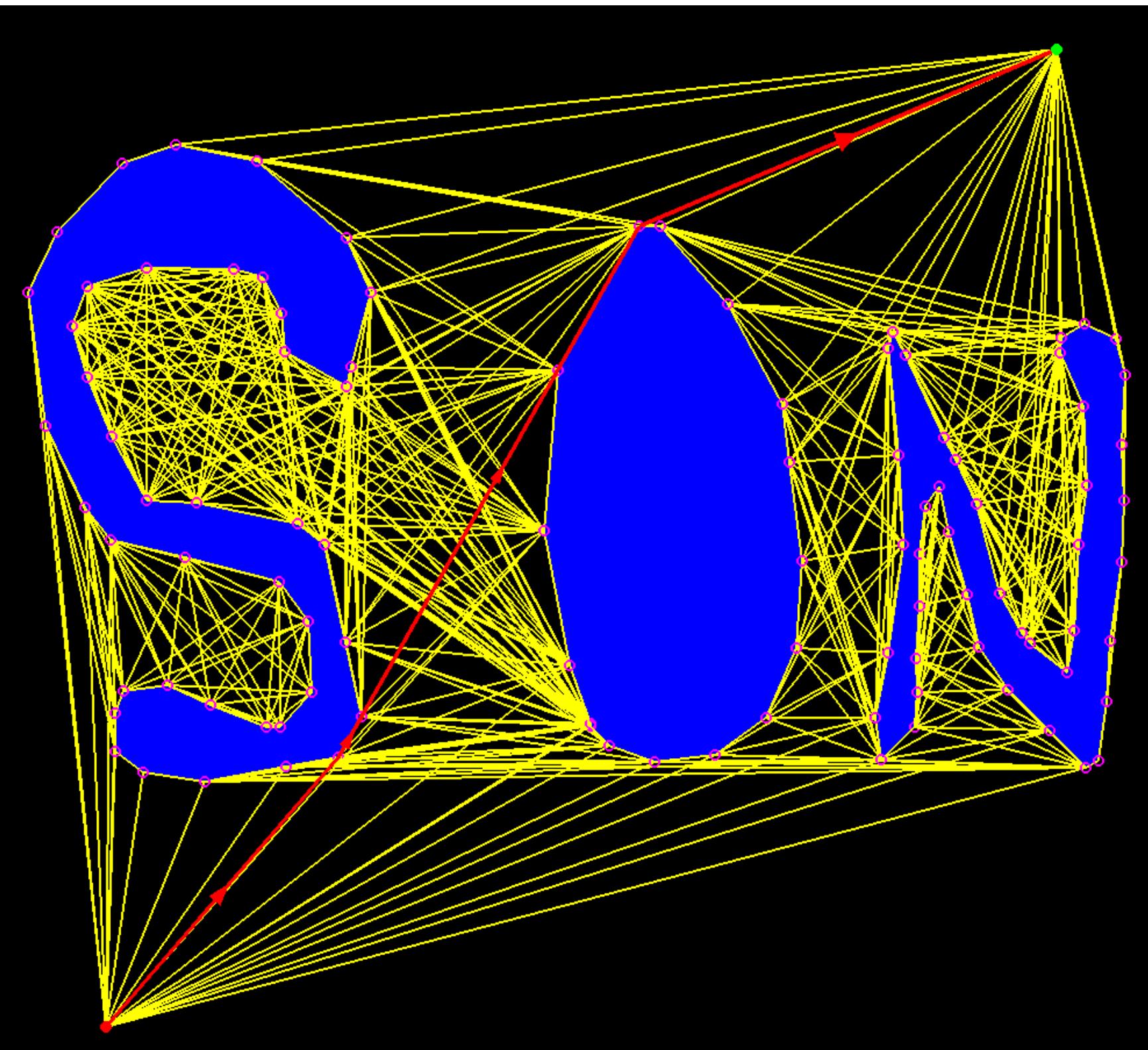
## Path planning:

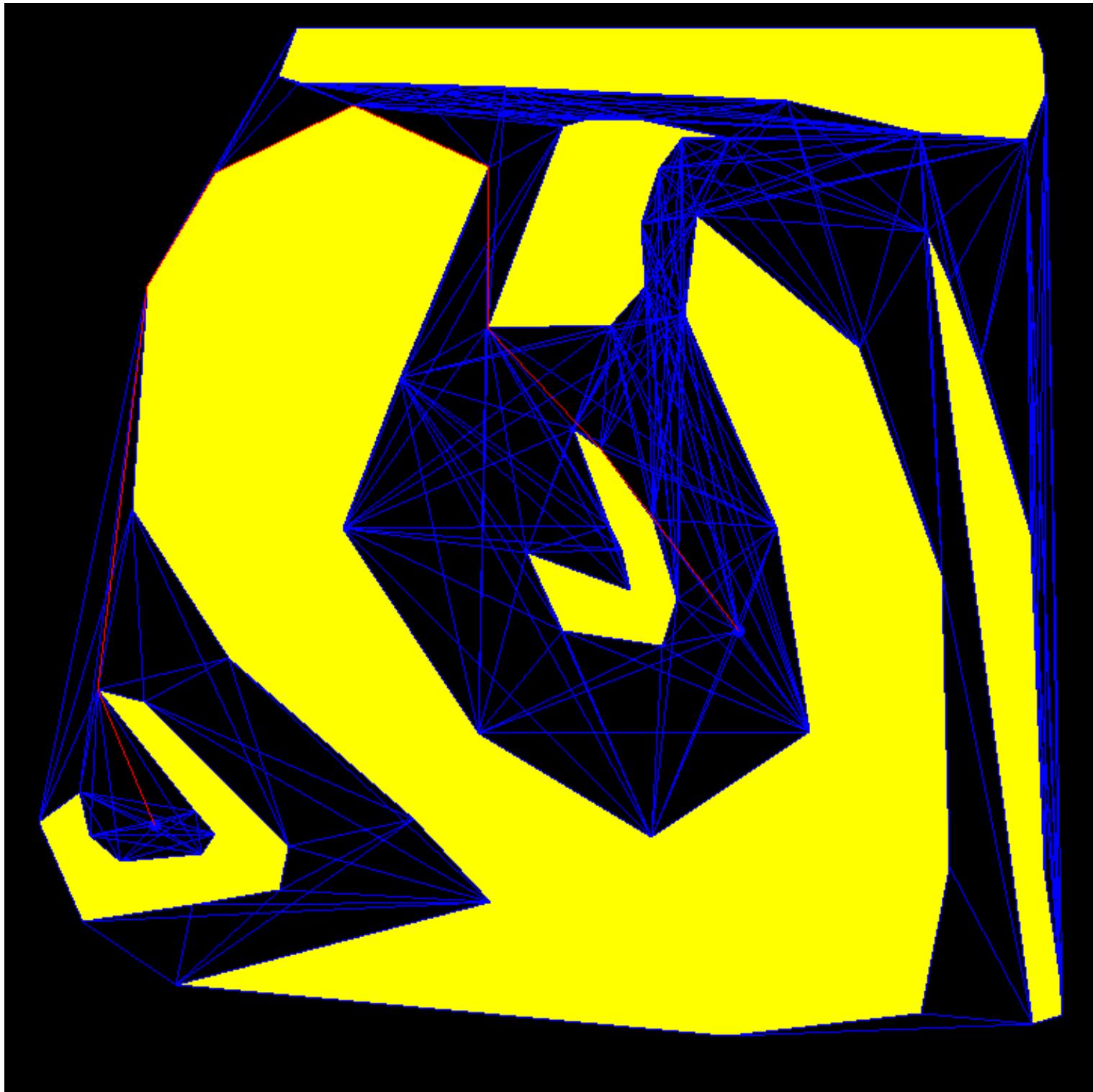
- Compute visibility graph
- SSSP (Dijkstra) in VG from  $p_{start}$  to  $p_{end}$

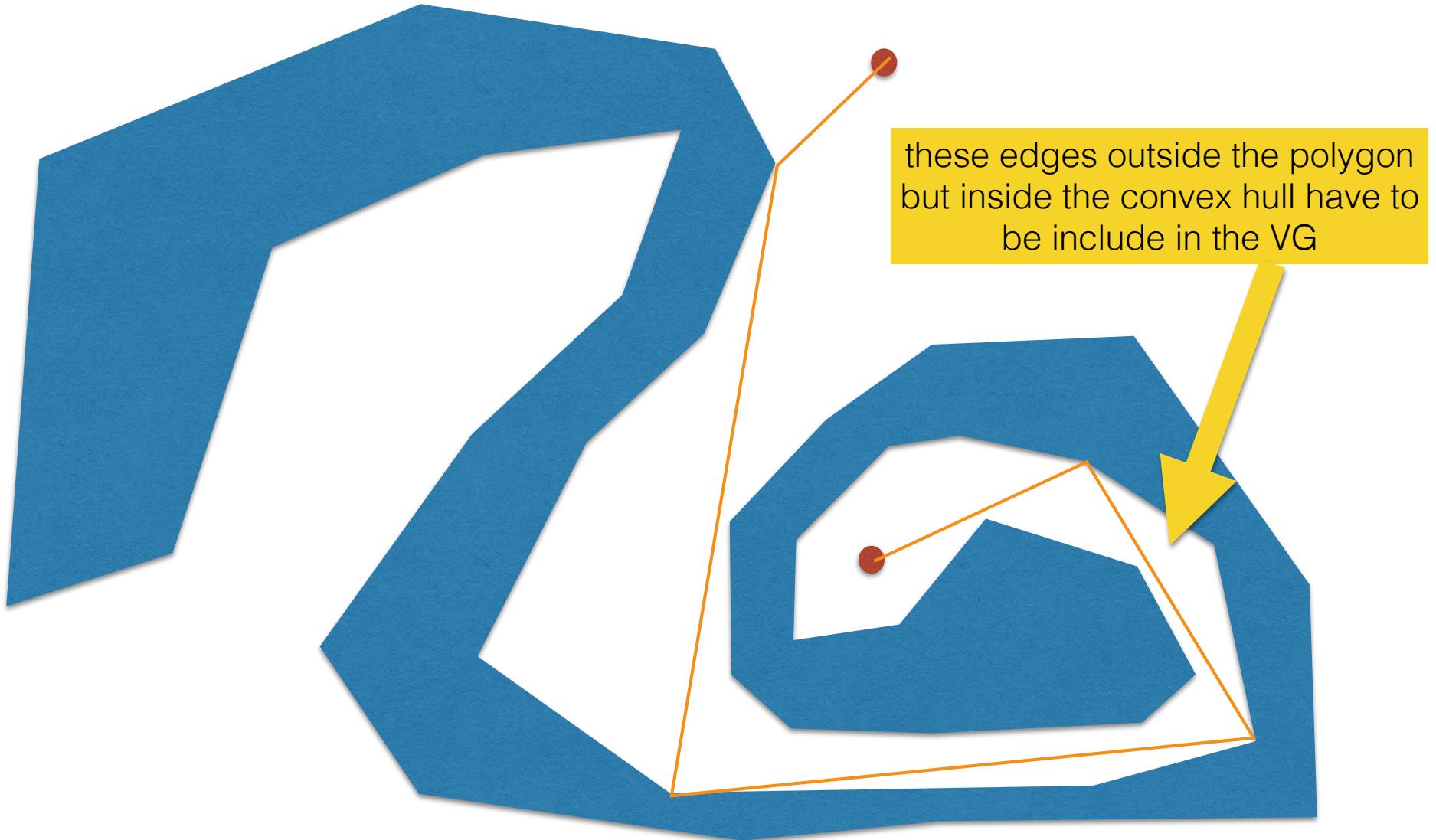
# Visibility graph

- $V = \{\text{set of vertices of obstacles} + p_{start} + p_{end}\}$
- $E = \{\text{all pairs of vertices } (v_i, v_j) \text{ such that } v_i v_j \text{ are visible to each other (and not inside a polygon)}\}$









$n$  = complexity of obstacles  
(total number of edges)

# Computing the Visibility Graph

- Straightforward:
  - $V = \{\text{set of vertices of obstacles} + p_{start} + p_{end}\}$
  - for each vertex  $u$ :
    - for each vertex  $v$ :
      - if segment  $uv$  does not intersect any edges of the polygon properly AND  $uv$  is NOT interior to a polygon: add  $uv$  as an edge
- Notes:
  - the edges of the polygons must be in the VG
  - interior edges: use `inCone( $a, b$ )` to determine if  $b$  is in the cone of  $a^-aa^+$
- Running time:  $O(n^3)$
- Size of visibility graph:
  - nb of vertices  $V$ :  $n + 2 = \Theta(n)$
  - nb of edges:  $\Omega(n)$ ,  $O(n^2)$

$n$  = complexity of obstacles  
(total number of edges)

# Optimal planning for point robot in 2D

Path planning:

- Compute visibility graph ← can have quadratic size
- SSSP (Dijkstra) in VG from  $p_{start}$  to  $p_{end}$

- Computing the visibility graph
  - $O(n^3)$  straightforward
  - $O(n^2 \lg n)$  improved
- Dijkstra in VG
  - $O(|E| \lg n)$

- Data structures
  - PQ of  $(u, dist[u])$  with `decreaseKey()`
  - for all vertices  $u$ :  $dist[u]$ ,  $pred[u]$ ,  $done[u]$

## Dijkstra(vertex s)

- initialize
  - $dist[v] = \infty$ ,  $pred[v] = \text{null}$  for all  $v$ ,  $dist[s] = 0$
  - for all  $v$ :  $\text{PQ.insert}(v, dist[v])$
- while PQ not empty
  - $(u, dist[u]) = \text{PQ.deleteMin}()$
  - $done[u] = \text{true}$   //claim:  $dist[u]$  is the shortest path from  $s$  to  $u$
  - for each edge  $(u,v)$ , if  $v$  not done:
    - $alt = dist[u] + \text{edge}(u,v)$
    - if  $alt < dist[v]$ 
      - $dist[v] = alt$ ,  $pred[v] = u$ ,  $\text{PQ.decreasePriority}(v, dist[v])$

requires a structure that can search, or a PQueue with additional book-keeping

not all pqueues support it

## Improvement/simplification

PQ of  $(u, dist[u])$  without `decreaseKey()`

### Dijkstra(vertex s)

- initialize
  - $dist[v] = \infty$ ,  $pred[v] = \text{null}$  for all  $v$ ,  $dist[s] = 0$
  - `PQ.insert(<s, dist[s]>)`
- while PQ not empty

1: insert only the start

- $(u, dist[u]) = PQ.deleteMin()$
- if  $u$  not done, for each edge  $(u,v)$ , if  $v$  not done

- $alt = dist[u] + \text{edge}(u,v)$
- if  $alt < dist[v]$

- $dist[v] = alt$ ,  $pred[v] = u$ , `PQ.insert(<v, dist[v]>)`

Because we don't decreaseKey,  
PQ may contain the same vertex  
with different  $dist[]$ . We process  $u$  only  
the first time we see it

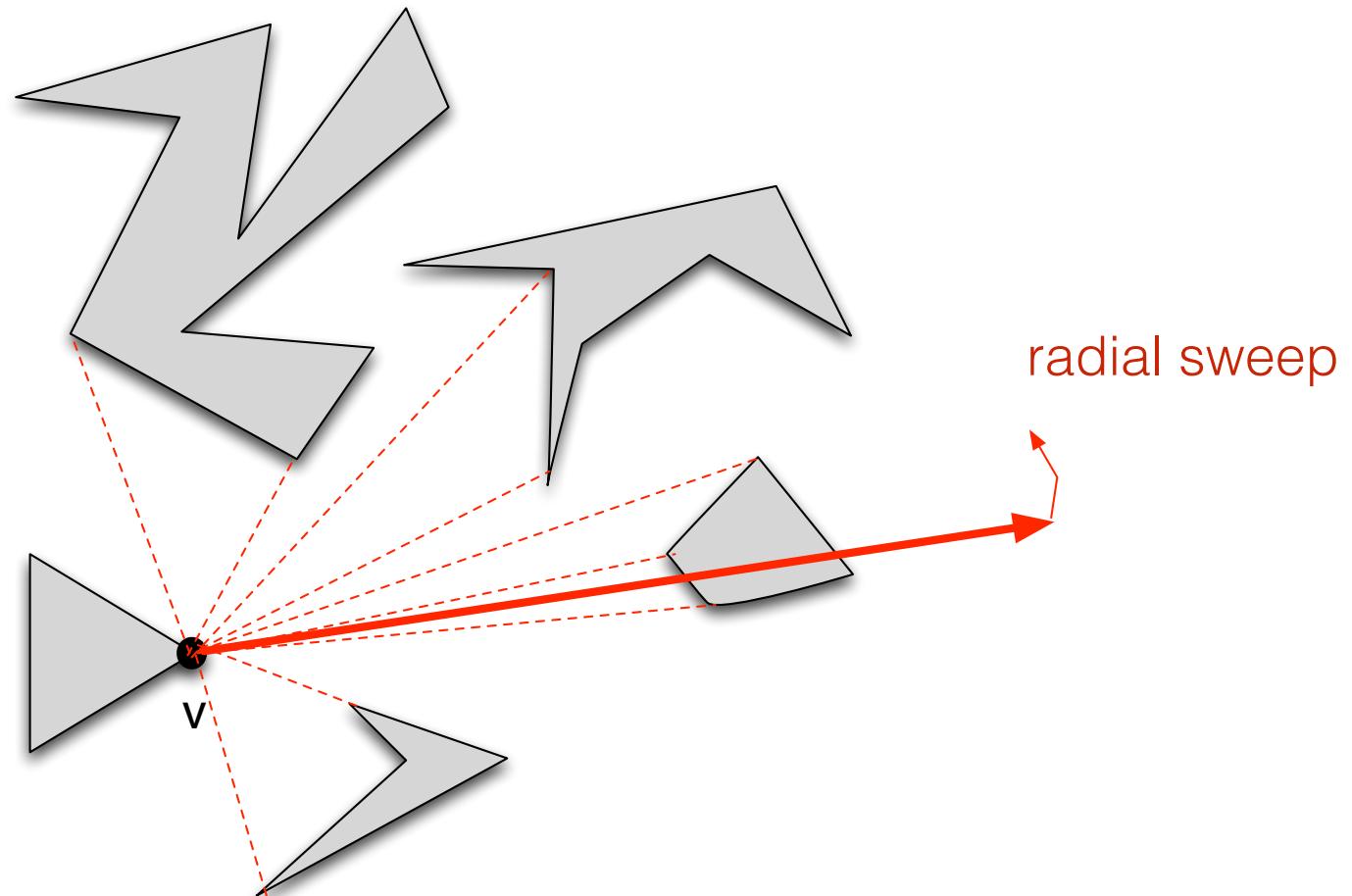
- $done[u] = \text{true}$

2. insert it  
(even if it's already there)

Computing the visibility graph in  $O(n^2 \lg n)$

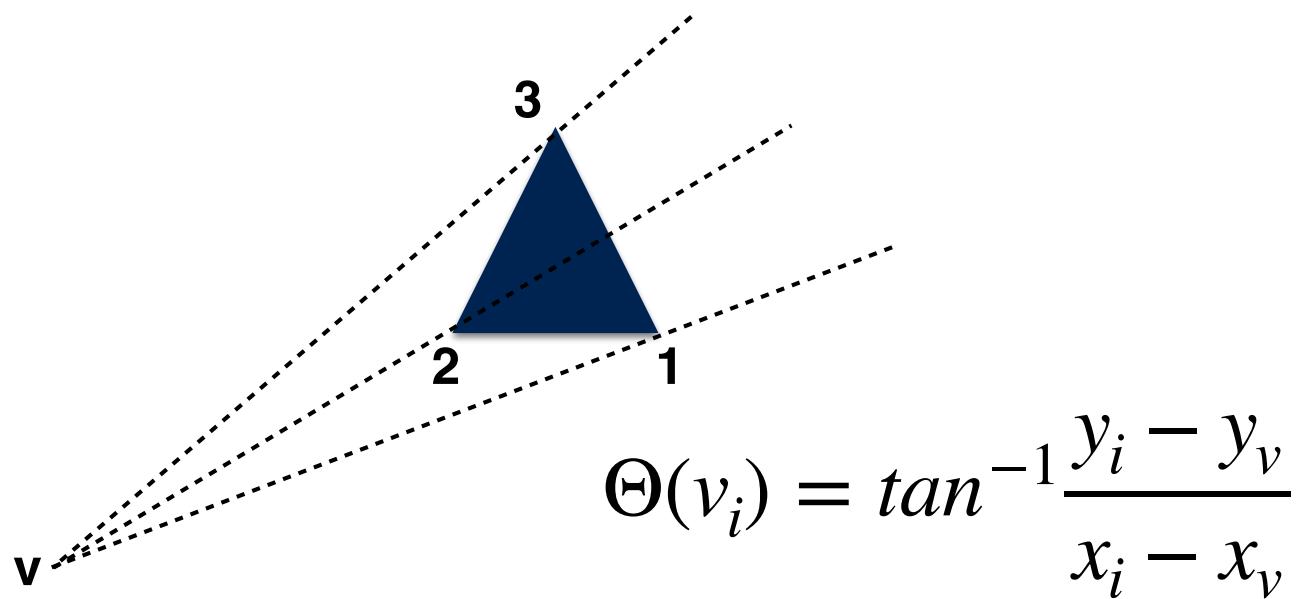
# Improved computation of VG

- For every vertex  $v$ : compute all vertices visible from  $v$  in  $O(n \lg n)$



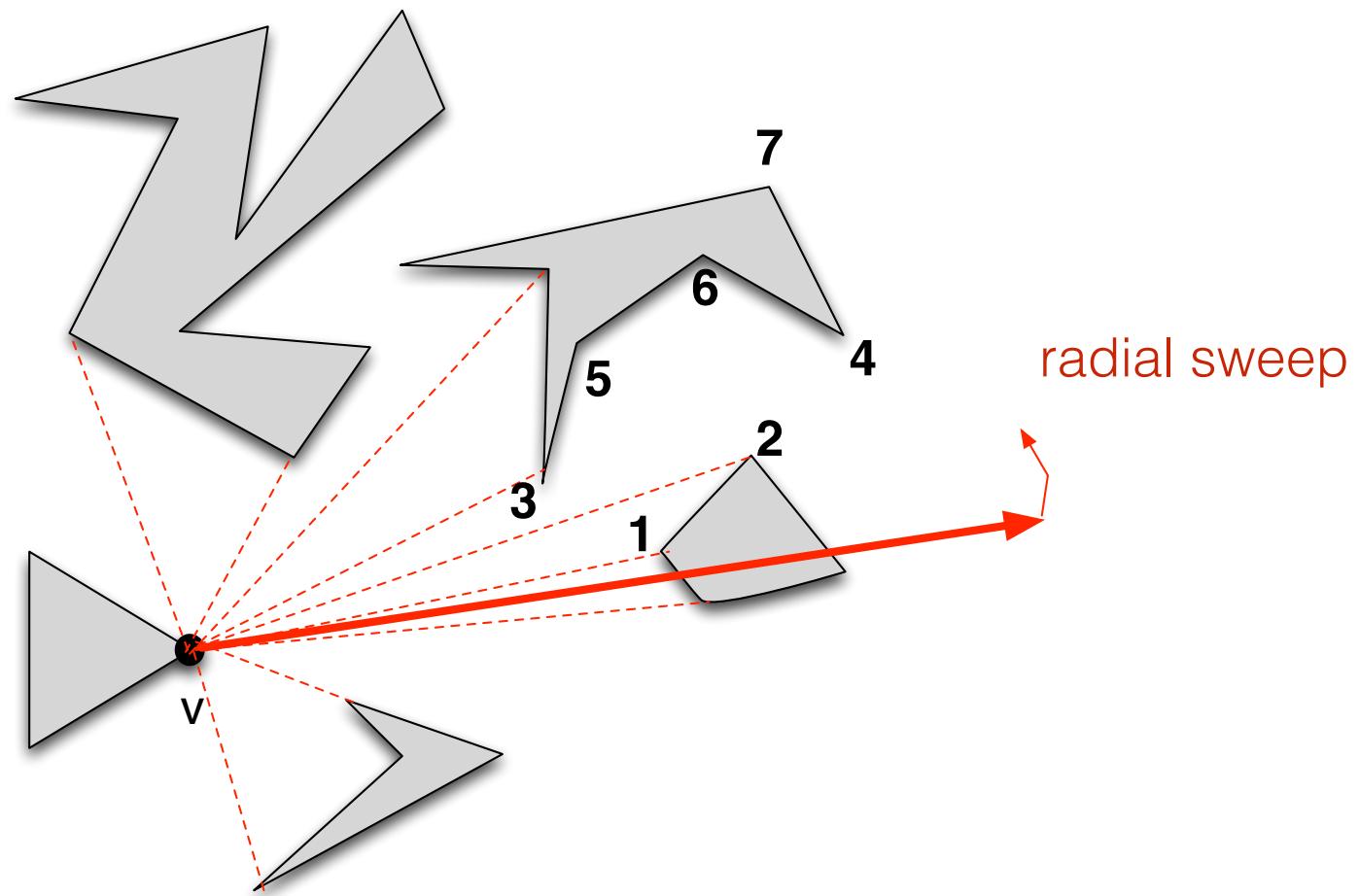
## Improved computation of VG

- Radial sweep: rotate a ray centered at  $v$
- Events: vertices of polygons (obstacles) sorted in radial order
  - events of equal angle, sorted by distance from  $v$

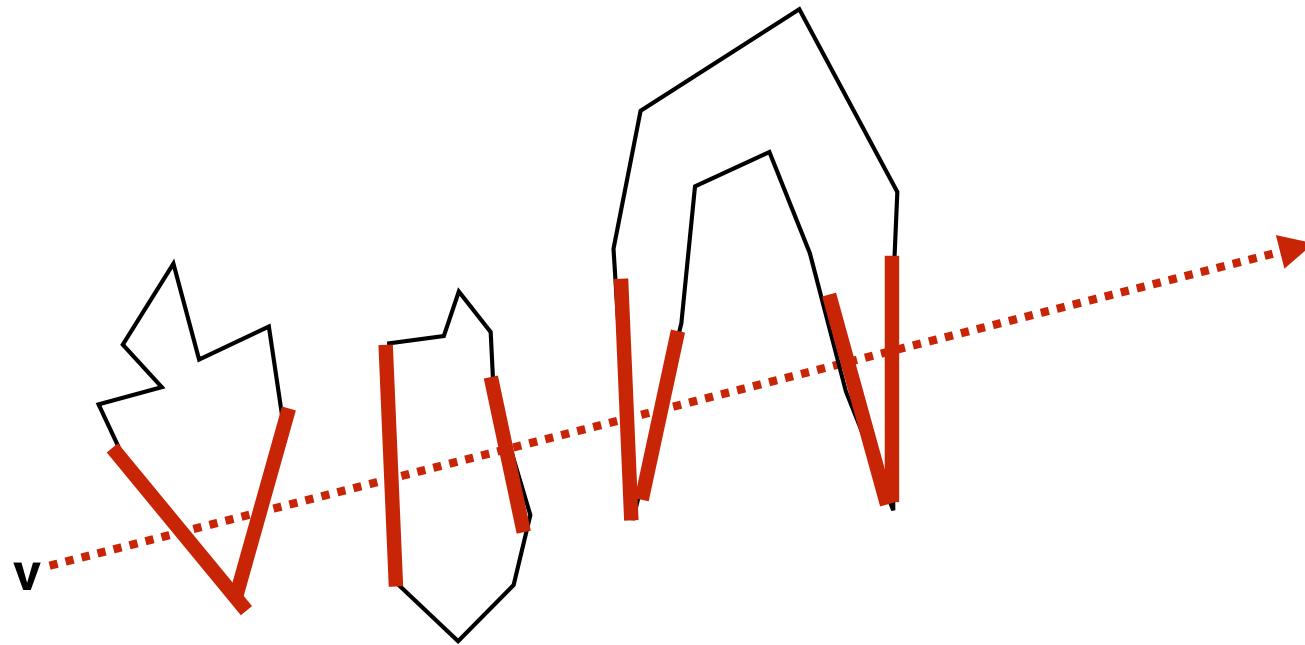


## VG via line sweep

- Radial sweep: rotate a ray centered at  $v$
- Events: vertices of polygons (obstacles) sorted in radial order
  - events of equal angle, sorted by distance from  $v$



## VG via line sweep



Active structure (AS) stores all the edges that intersect the sweep line,  
ordered by distance from v

## VG via line sweep

//find all vertices visible from a vertex p

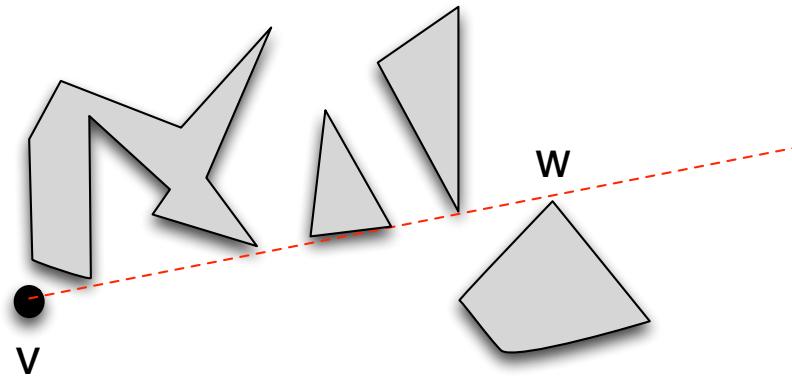
RadialSweep(polygon vertices V, vertex p)

- sort V radially from p, and secondarily by distance from p
- initialize AS with all edges that intersect the horizontal ray from p
- For each vertex v in sorted order:
  - use AS to determine if v is visible from p
  - figure out if the edges incident to v are above/below the sweep line.  
If above -> insert edge in AS. If below => delete edge from AS

Runs in  $O(n \lg n)$  time

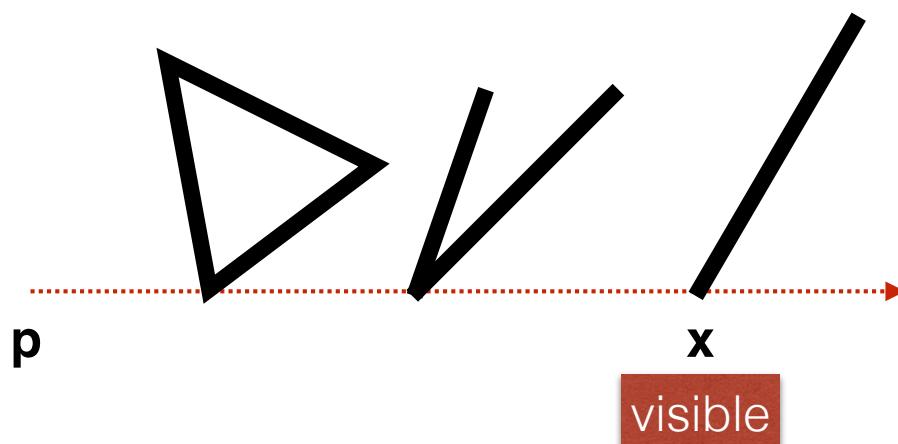
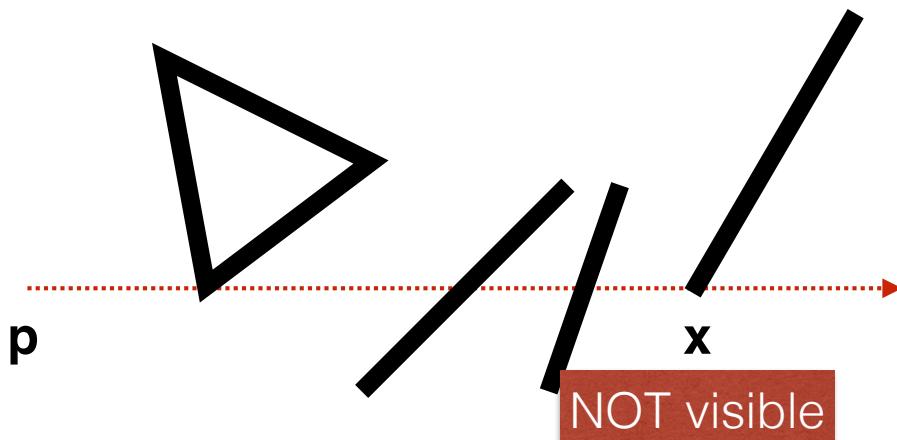
Repeat for all vertices p ==>  $O(n^2 \lg n)$

## VG via line sweep



w visible if vw does not intersect the interior of any obstacle

# Is vertex x visible from p? some cases



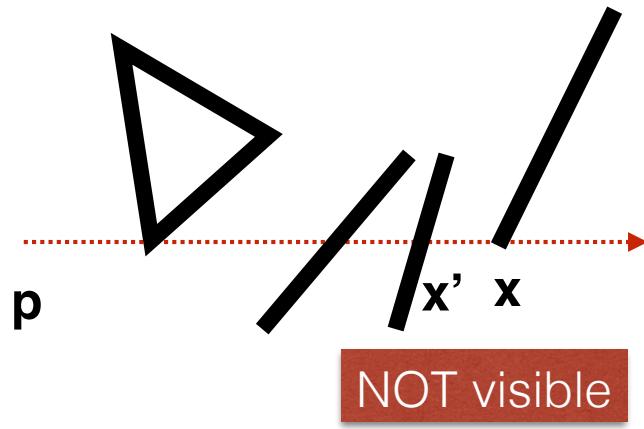
x is NOT visible:

If there is any edge in AS left of x,  
whose interior intersects the line

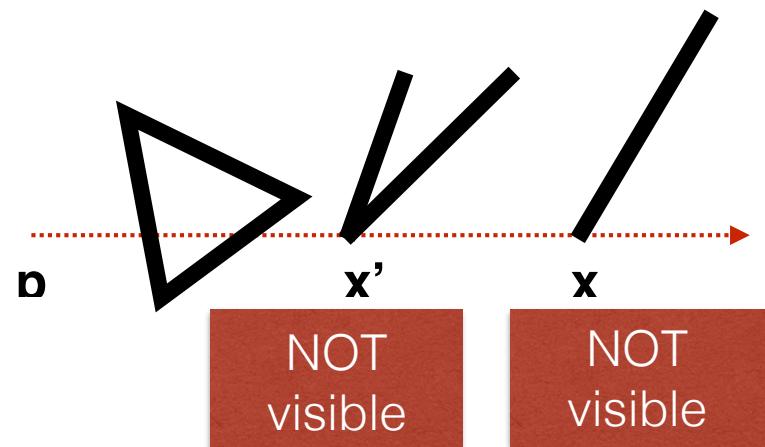
# Is vertex $x$ visible from $p$ ?

Let  $x'$  be the edge just before  $x$  in the AS,  $x' = \text{AS.predecessor}(x)$

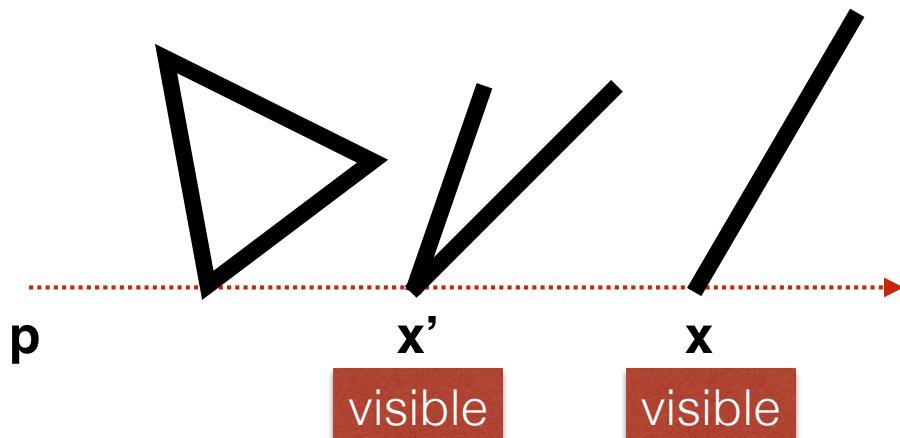
$x'$  interior intersects line



$x'$  is a vertex and it's not visible



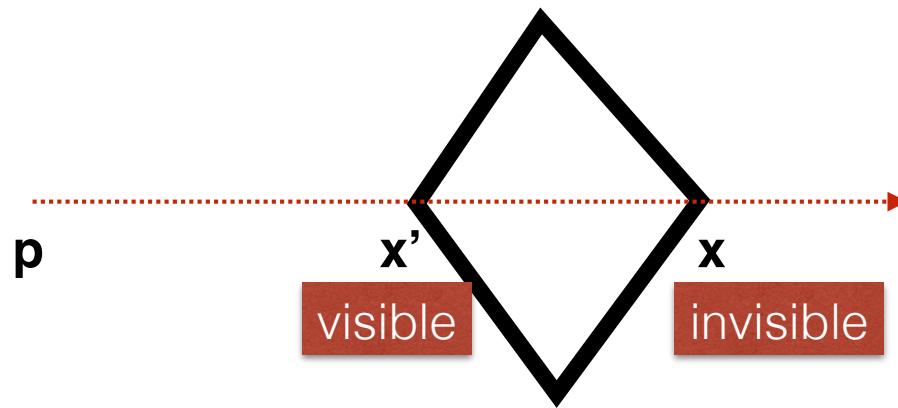
$x'$  is a vertex and it's visible



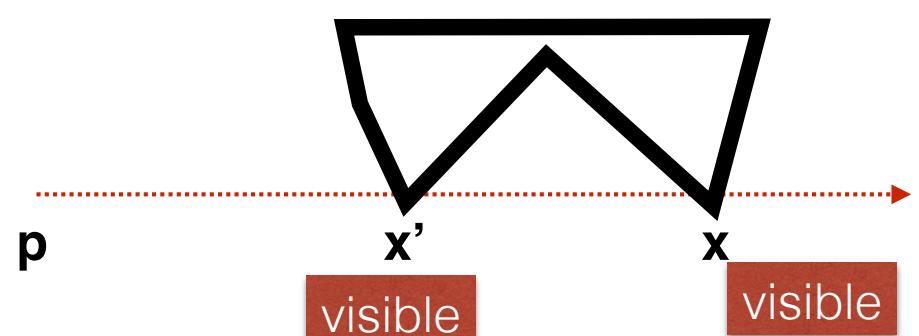
# Is vertex x visible from p?

Let  $x'$  be the edge just before  $x$  in the AS,  $x' = \text{AS.predecessor}(x)$

$x'$  is a vertex and it's visible  
 $x, x'$  part of same polygon



$x'$  is a vertex and it's visible  
 $x, x'$  part of same polygon



## Is vertex x visible from p?

- check the event just before x in AS. Call this x',  $x' = \text{AS.predecessor}(x)$
- if x' is an edge whose interior intersects sweep line  $\Rightarrow x$  is not visible
- if x' has a vertex on the sweep line then:
  - if x' is not visible  $\Rightarrow x$  not visible
  - if x' is visible  $\Rightarrow x$  visible, unless they are both on the same polygon  
(a few cases to check)

Runs in  $O(\lg n)$  time

Computing the visibility graph in  $O(n^2 \lg n)$

END

# Recap: Point robot in 2D

- **Complete, not optimal**
  - Compute the trapezoid decomposition of free space and a graph that represents it in  $O(n \lg n)$  time
  - BFS in this graph in  $O(n)$  time
- **Complete and optimal**
  - Compute visibility graph in  $O(n^2 \lg n)$
  - Dijkstra in VG in  $O(E_{VG} \lg n)$

+ Any shortest path must be a path in VG

+ VG needs to be computed only once, so we can think of it as pre-processing

- VG may be large, so this approach is doomed to  $\Omega(n^2)$

# Point robot in 2D

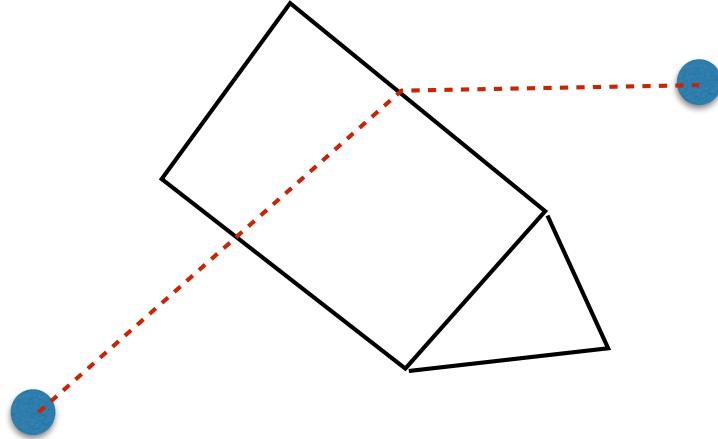
Long history of research and results

- $O(E_{VG} \lg n) = O(n^2 \lg n)$
- Improved to  $O(n^2)$
- Quadratic barrier broken by Joe Mitchell: shortest path for a point robot moving in 2D can be computed in  $O(n^{1.5+\epsilon})$
- Continuous Dijkstra approach: SP of a point robot moving in 2D can be computed in  $O(n \lg n + k)$  [Hershberger and Suri 1993]
- Special cases can be solved faster:
  - e.g. SP inside a simple polygon w/o holes:  $O(n)$  time

# Point robot in 3D

## Visibility graph does not generalize to 3D

- Inflection points of SP are not restricted to vertices of S, can be inside edges



- Shortest paths in 3D much harder
  - Computing 3D shortest paths among polyhedral obstacles is NP-complete
  - Complete and optimal planning in 3D is hopeless

# Path planning in 2D



**point** robot moving among arbitrary polygons in 2D

next



• **polygonal** robot moving among arbitrary polygons in 2D

- translation only
- translation+rotation

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