

# Lecture 1: September 6, 2001

Welcome to 6.838J, Geometric Computation!

- Introductions
- Overview and Goals
- General Information
- Syllabus
- 2D Convex Hull
- Signup sheets (return by end of class)

# Course Overview

Geometric Computation is Pervasive

Robotics, Graphics, CAD/CAM, GIS, Medicine, Net  
Geographic resource discovery

Classic examples: nearest post office, hospital

GIS overlay: efficient geometric co-occurrence

Resource simulation and management

Art-gallery problem: place minimal set of guards

Air-traffic control: when is next collision

Computer graphics

Scalable visibility tests for rendering

Global lighting simulations (ray-tracing, radiosity)

Collision detection for realistic physically-based a

Computational drug design and discovery

Spatial indexing for protein folding

Spatial signatures for docking studies

Robotics

Motion planning among obstacles

Scalable map construction and localization

Location-aware computing

Location-based services, Mobile dynamic network

# Course Goals

Solid introduction to fundamental geometric data structures  
Experience with algorithm design and analysis (and optimization)  
Intuition about what methods might be applicable as you progress

# General Information

Class has no final, or final project

Components of course grade:

50% Lecture/presentation (typically, one per student)

Developed jointly with one or both professors

Start with list of concepts (two weeks before hand)

Review slides, figures, demos (one week before hand)

Expect to devote significant time with us, and o

Use signup sheet to rank your preference for ea

50% Assignments (part mandatory, part optional)

Four assignments, roughly one every three weeks

Two weeks to complete each one (see syllabus)

Mandatory component: problems with written

Optional component:

Either: additional written problems

Or: a Java programming assignment

Open Problems (Optional)

Problems stated upon request

Solving a significant open problem yields an A+

# Syllabus

## Low-dimensional computational geometry

L1: 2D Convex Hulls

L2: GIS Overlay and Segment Intersection

L3: Low-Dimensional Linear Programming

L4: Polygon Triangulation

## Organizing Objects and Spaces

L5: Orthogonal Range Searching

L6: Point Location / Spatial Indexing

L7: Voronoi Diagrams

L8: Robustness and Perturbation Schemes

L9: Arrangements and Duality

L10: Delaunay Triangulations, CDTs

## Surface Representations and Algorithms

L11: Representing Polyhedra

L12: 3D Convex Hulls

L13: Representing Smooth Surfaces

L14: Binary Space Partitions

## Syllabus (Cont.)

### Accounting for Motion

L15: Kinetic Algorithms

L16: Robot Motion Planning

L17: Quadtrees and Non-Uniform Meshing

L18: Visibility Data Structures

### Higher Dimensions

L19: Medial Axis, Surface Reconstruction

L20: Higher- and High-Dimensional LP

L21: Closest-Pair Algorithms

L22: Approximate Nearest Neighbor

L23: Iterative Algorithms

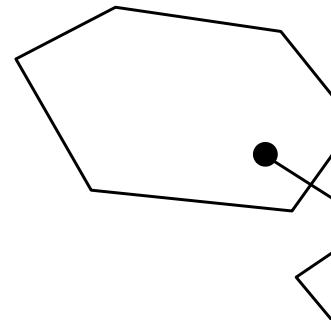
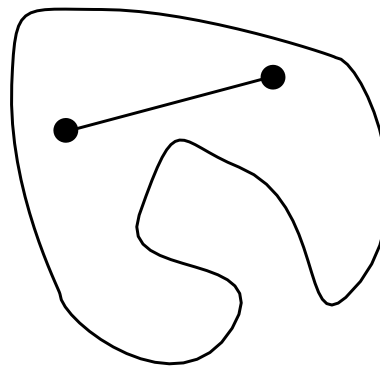
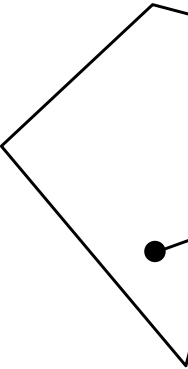
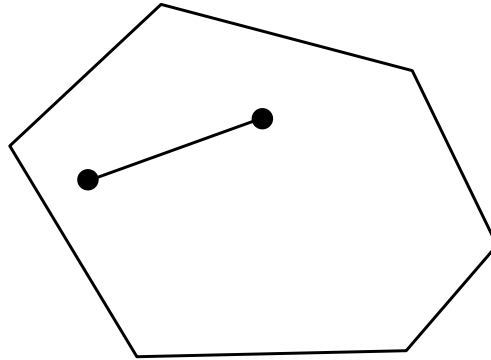
L24: Approximate Nearest Neighbor (Hamming)

L25: Low-Distortion Embeddings

L26: Reductions to Approximate Nearest Neighbor

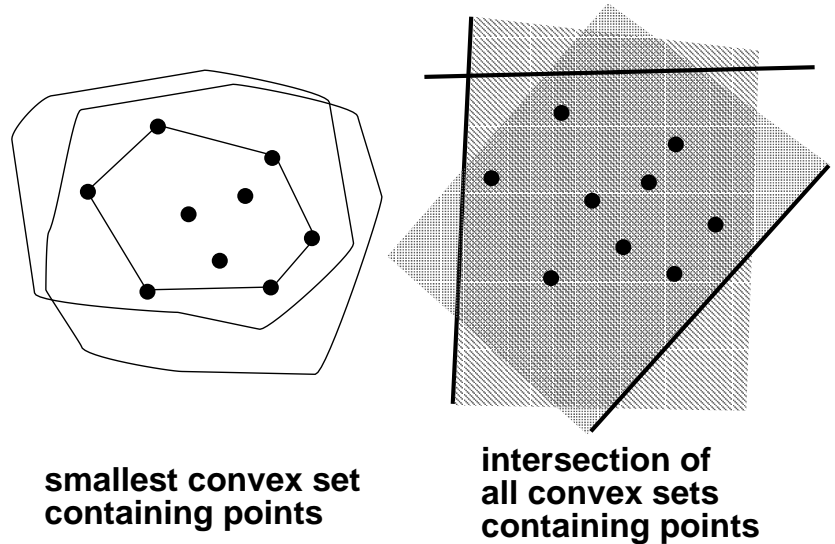
# Convexity

A set is convex when every line segment connecting two points in the set is itself contained in the set



# Convex Hull

What is the convex hull of a set of points?  
Several equivalent definitions:



1. The smallest convex set containing the points
2. The *intersection* of all convex sets containing the points
3. The *union* of all points expressible as convex combinations

$$\mathbf{u} \text{ or } \mathbf{v} = \sum_{i=1}^n c_i \mathbf{p}_i; \quad \forall i, c_i \geq 0; \quad \text{and} \quad \sum_{i=1}^n c_i = 1$$

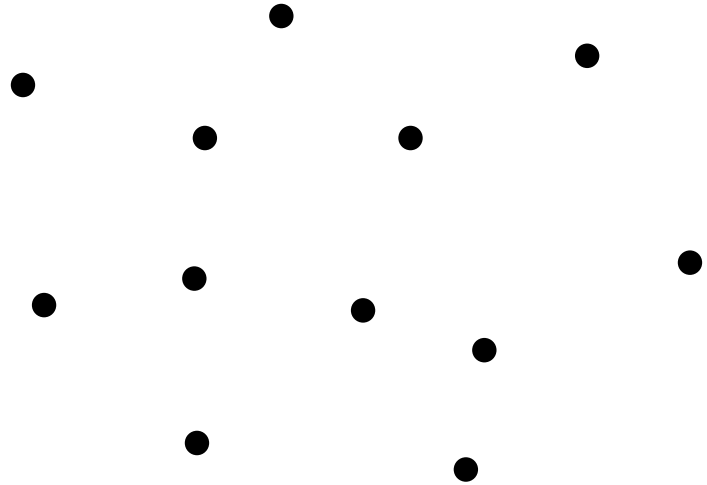
(“Convex combination” means coefficients  $c_i$  are non-negative)  
Relax non-negativity requirement: get “affine combination”

None of these are particularly well-suited to algorithmic computation



# 2D Convex Hull

The **2D Convex Hull** problem:



Given a finite set  $S \subset \mathbb{R}^2$  of  $n$  points on plane, determine the convex hull of  $S$ , denoted  $\text{Conv}(S)$ .

We'll compute the *boundary* of the convex hull:

In this case, a closed polygonal chain of vertices and (or simply an ordered list of vertices, with edges implied)

For a set  $S$  of  $n$  points:

What is worst-case complexity of  $\text{Conv}(S)$ ?

... Best-case?

What if all  $n$  points are distinct?

# 2D Convex Hull

Seemingly simple, but illustrates several recurring issues

Algorithm design, analysis, correctness

Progression from brute-force to efficient algorithms

Underlying geometric predicates

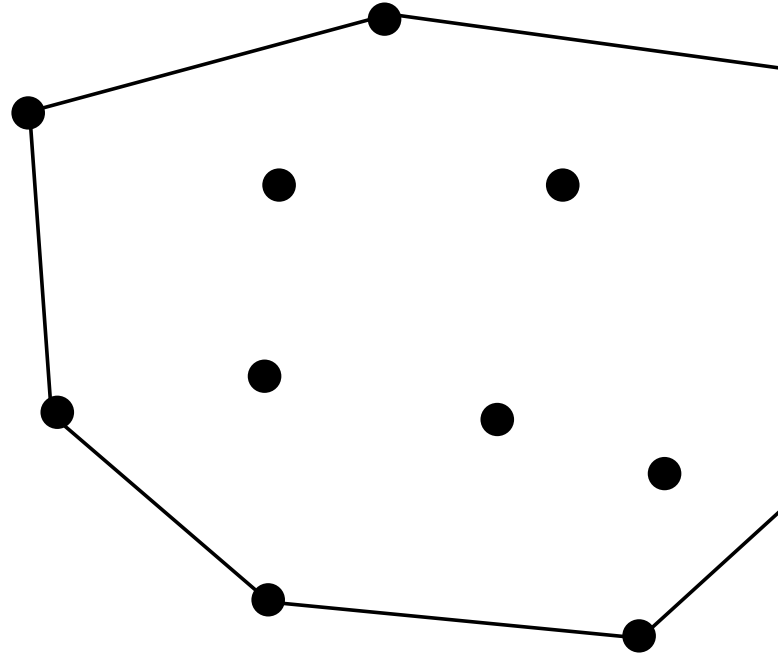
Robustness / Underlying number representations

Genericity assumptions / input degeneracies

Output-sensitive running time

## Extremal points

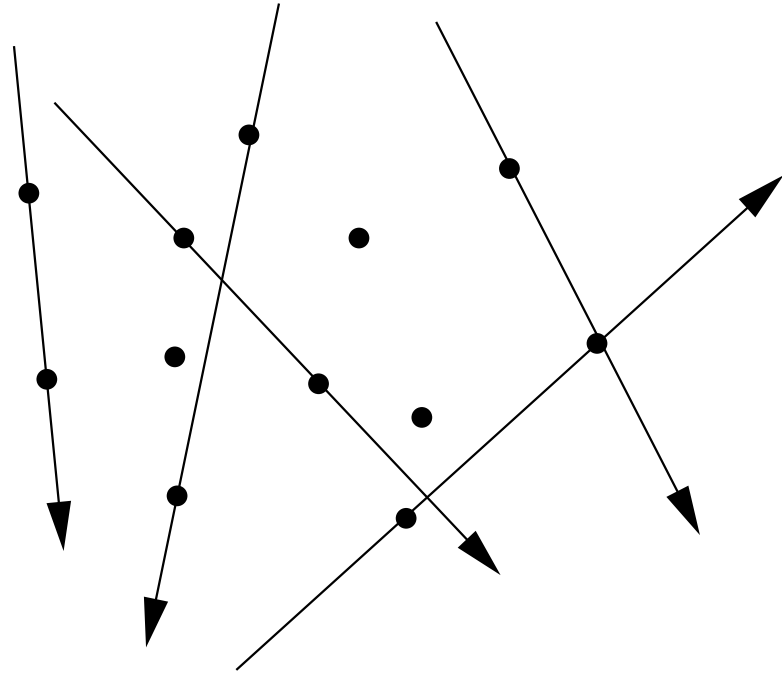
The planar convex hull is a convex polygon.



It can therefore be specified completely by a list of its  $e$   
These corner points are drawn from the set  $S$ .  
For now, assume  $S$  contains  $n$  distinct points

# Brute-Force Algorithm

Check each point pair: does it form a boundary edge?

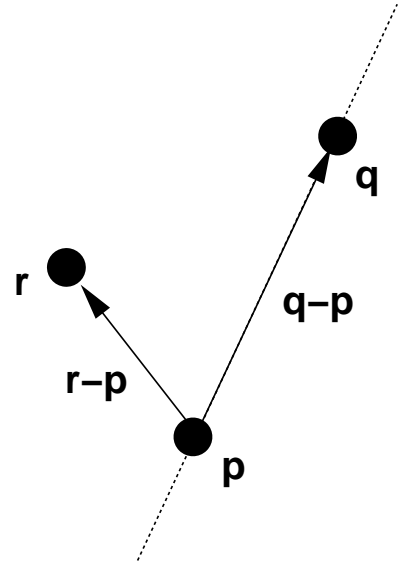


I.e. for all pairs  $p, q \in S$ , if for *all*  $x \in S - \{p, q\}$ ,  $x$  lies to the right of the oriented line  $\overrightarrow{pq}$ , emit an edge  $pq$  on the boundary of  $S$ .

To determine whether point  $r = (r_x, r_y)$  lies to the left of the oriented line  $\overrightarrow{pq}$  (where  $p = (p_x, p_y)$  and  $q = (q_x, q_y)$ ), compute the *sign* of

$$\begin{vmatrix} 1 & r_x & r_y \\ 1 & p_x & p_y \\ 1 & q_x & q_y \end{vmatrix}$$

# Leftof Predicate



Why? Just  $z$  component of  $(\mathbf{q} - \mathbf{p}) \times (\mathbf{r} - \mathbf{p})$ :

$$\begin{vmatrix} \hat{\mathbf{i}} & \hat{\mathbf{j}} & \hat{\mathbf{k}} \\ q_x - p_x & q_y - p_y & 0 \\ r_x - p_x & r_y - p_y & 0 \end{vmatrix}$$

Running time of brute-force algorithm?

Each **LEFTOF** predicate takes  $O(1)$  time

There are  $\binom{n}{2}$  candidate point pairs

Checking one candidate edge against  $n - 2$  points takes  $O(n)$  time

Chaining isolated hull edges takes  $O(n^2)$  time, naive

Thus total time is  $\binom{n}{2} \cdot n + O(n^2) = O(n^3)$

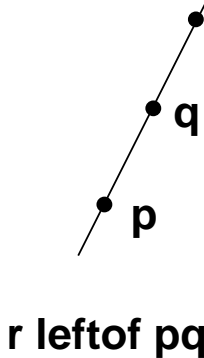
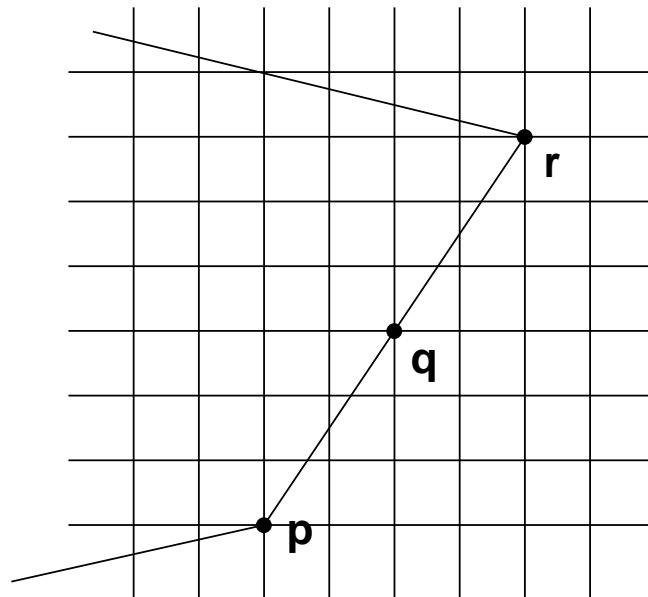
# Degeneracy

As defined, `LEFTOF` must return either true or false  
What if three input points happen to be collinear?

Suppose `LEFTOF` returns true. What happens?

Suppose `LEFTOF` returns false. What happens?

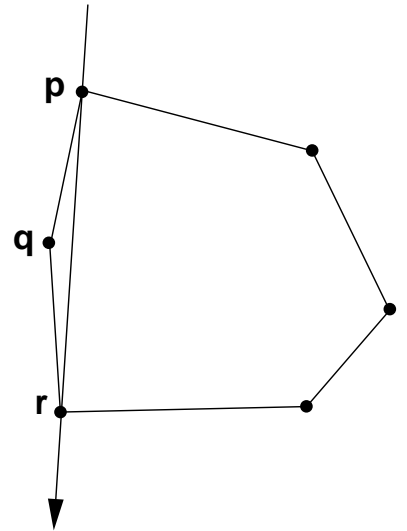
Problem: sidedness test alone isn't sufficient.



How can this be fixed?

# Robustness

Suppose three input points are *nearly* collinear



Finite-precision (integer, floating-point) arithmetic can

**r** is LEFTOF **pq**, and

**p** is LEFTOF **qr**, and

**q** is LEFTOF **pr** !

What happens?

Algorithm is not **robust**.

It can produce non-sensical output.

# Robustness Issues

How can this be fixed?

Several options:

- Use arbitrary-precision arithmetic

  - Often overkill

  - Incompatibility with downstream implementation

- Use precision as necessitated by data

  - Composite quantities

  - Custom predicates

  - Overhead in ordinary case

Robustness is a major, recurring issue in design of geometric algorithms



## Andrews' (1979) modification of Graham

Idea: sort points left to right, then add to hull incrementally

Particularly simple; handles degeneracies; robust.

**CONVEXIFY**( $\mathcal{S}, \mathbf{p}$ )

*/\*  $\mathcal{S}$  is a stack of points; TOS is  $t$  \*/*

**while** ( $\mathcal{S}.\text{len} \geq 2$ ) **and** ( $\mathbf{p}$  **LEFTOF** ( $p_{T-1}, p_T$ ))

**POP**( $\mathcal{S}$ )

**PUSH**( $\mathcal{S}, \mathbf{p}$ )

**SWEEP-HULL**( Array  $\mathbf{p}_i$  )

Sort  $\mathbf{p}_i$  in place, by  $x$  coordinate

**STACK** UpperHull = {  $\mathbf{p}_1$  }

**For**  $i = 2$  to  $n$

**CONVEXIFY** ( UpperHull,  $\mathbf{p}_i$  )

**STACK** LowerHull = {  $\mathbf{p}_n$  }

**For**  $i = n - 1$  downto 1

**CONVEXIFY** ( LowerHull,  $\mathbf{p}_i$  )

Remove first, last points of LowerHull

**Output** UpperHull **concat** LowerHull

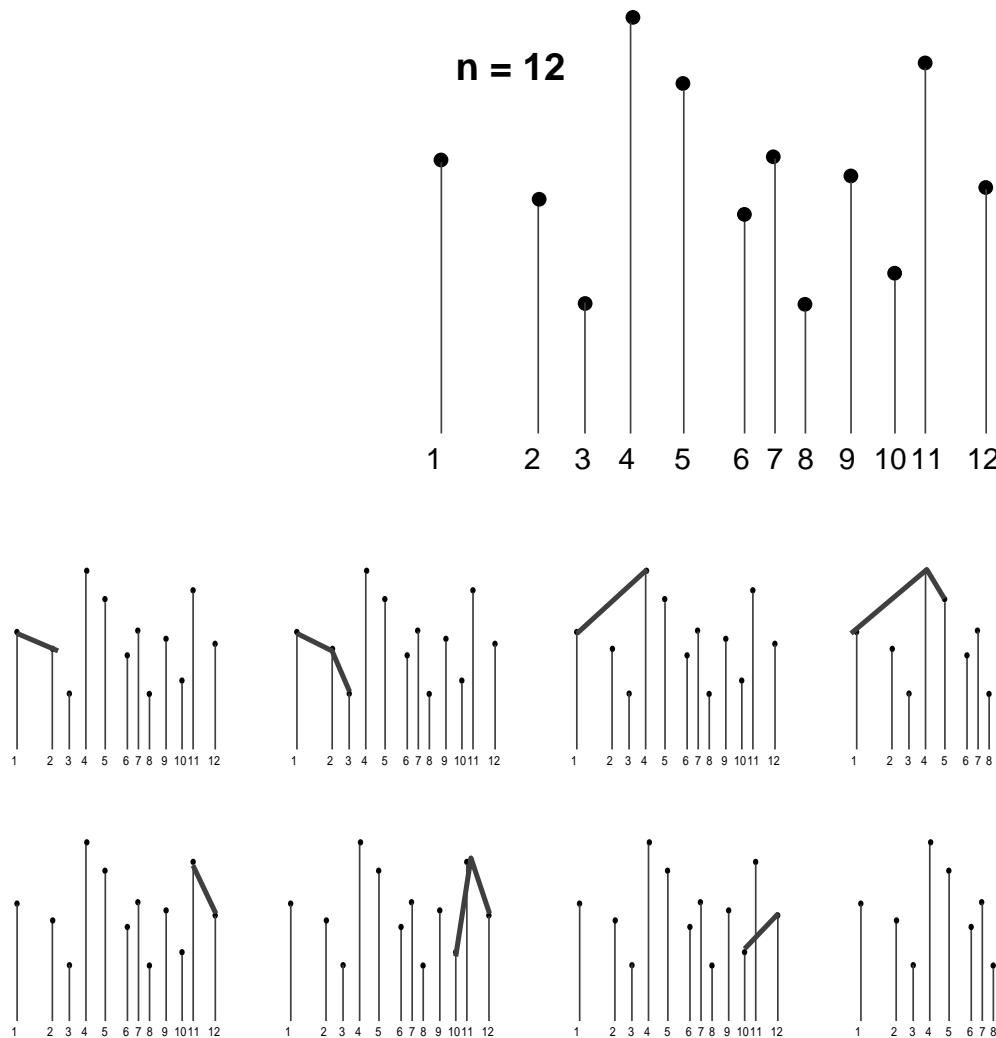
# Andrews' Algorithm: Example

Intuition: Repeatedly

Compare  $\mathbf{p}_k$  to directed line from  $\mathbf{p}_{T-1}$  to  $\mathbf{p}_T$

If  $\mathbf{p}_k$  is left of this line, pop  $\mathbf{p}_T$  off of stack

Otherwise, push  $\mathbf{p}_k$  onto stack



Running time:  $O(n \lg n) + 2 \cdot O(n) = O(n \lg n)$

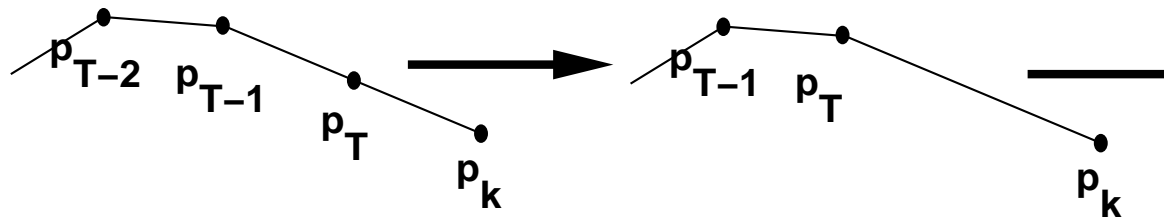
# Degeneracy

Are three collinear points a problem?

Middle point should not occur on output hull

Make **LEFTOF** true for this case

Note how  $x$  ordering simplifies things

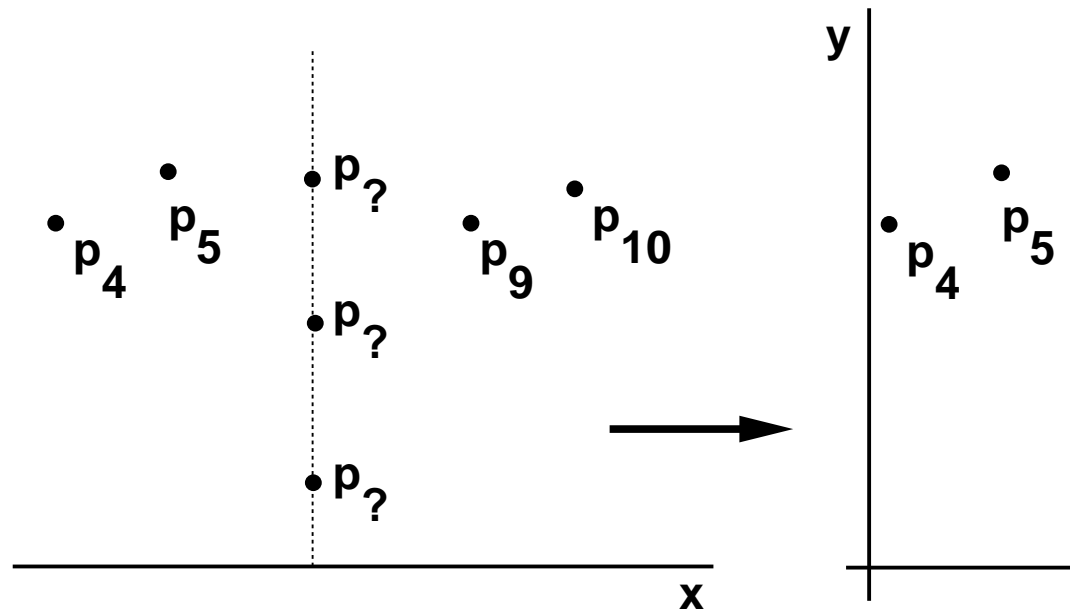


Is this algorithm well-defined?

## Degeneracy (cont.)

Algorithm assumed that all  $x$  coordinates distinct

What if multiple points with same  $x$  coordinate occur?



What is solution?

Called “lexicographic sorting”

## Robustness, Running Time

Algorithm is guaranteed to produce a closed polygonal hull.  
Insufficient precision can still cause erroneous output:

- Omission of input point that should occur on hull

- Inclusion of input point lying inside hull (“dent” in hull)

So the algorithm is robust, but not necessarily correct.

Running time:

- Dominated by initial sort,  $O(n \lg n)$  time

- POP and PUSH can happen at most  $O(n)$  times

# Example homework questions

Written questions:

Give a linear-time algorithm to compute the convex hull of a set of points in the plane.

Make reasonable assumptions, and state them.

How can isolated hull edges be chained together in a linear-time algorithm?

Assume each input vertex occurs on either zero or two edges.

Programming questions:

Implement and animate Andrew's convex hull algorithm.

Free to use public-domain GUI, graphics code wherever available.

Implement a solution to either of the written questions.

OK to work with someone who is writing up the solution.