

Geometric Algorithms

overview
primitives
convex hull algorithms
context

Geometric algorithms

Important and far-reaching applications

- models of physical world
examples: maps, architecture, medical imaging
- computer graphics
examples: movies, games, virtual reality
- mathematical models
stay tuned

Ancient mathematical foundations, but
most geometric algorithms are less than 30 years old

Knowledge of fundamental algorithms is critical

- use them directly
- use the same design strategies for harder problems
- learn how to compare and evaluate algorithms

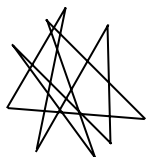
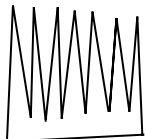
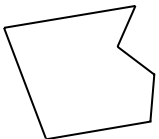
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Warning: intuition may not be helpful

Humans have spatial intuition in 2D and 3D: computers do not!

Example: Is a given polygon convex?

we see these



programs see these

1	6	5	8	7	2
7	8	6	4	2	1

1	15	14	13	12	11	10	9	8	7	6	5	4	3	2
1	2	18	4	18	4	19	4	19	4	20	3	20	3	20

1	10	3	7	2	8	8	3	4
6	5	15	1	11	3	14	2	16

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Elementary geometric primitives (2D)

Point

- two numbers (x, y)
`#typedef struct {double x; double y;} Point;`

Line

- two numbers a and b [$ax + by = 1$] ← lines through origin are exceptional

Line segment

- four numbers (x1, y1) and (x2, y2)
- two points p0 and p1
`#typedef struct {Point x; Point y;} LineSegment;`

Polygon

- sequence of points
`Point p[N];`

No shortage of other geometric shapes

triangle, square, circle, quadrilateral, parallelogram, ...

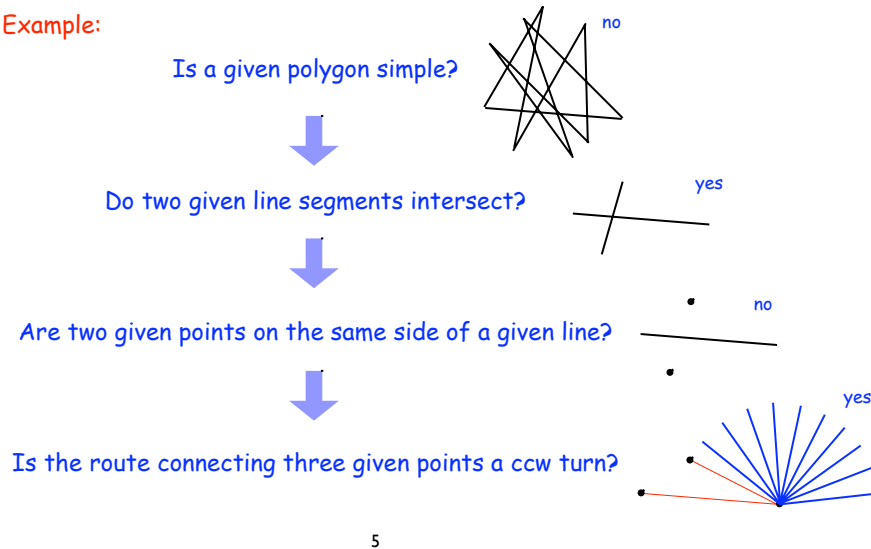
3D and higher dimensions more complicated

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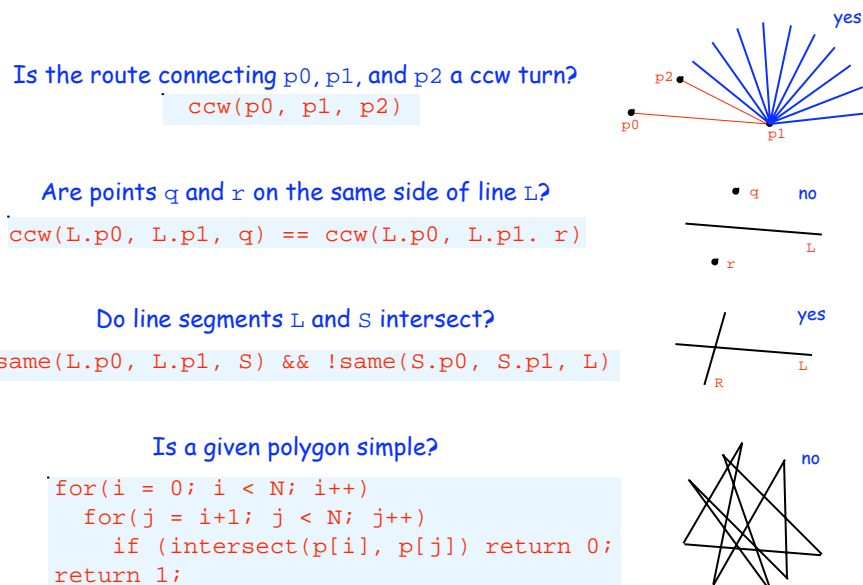
Building layers of abstraction

Typical scenario in algorithm design: **Use a more primitive operation!**

Example:



Layers of abstraction example (continued)



Stay tuned (next lecture)
for faster implementation

CCW implementation

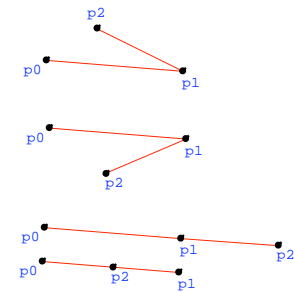
Input: points p_0, p_1 , and p_2

Output:

1 if $p_0-p_1-p_2$ is a ccw turn

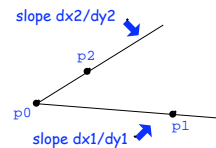
-1 if $p_0-p_1-p_2$ is a cw turn

0 if p_0, p_1, p_2 are collinear



Approach: compare slopes

```
int ccw(Point p0, Point p1, Point p2)
{
  int dx1, dx2, dy1, dy2;
  dx1 = p1.x - p0.x; dy1 = p1.y - p0.y;
  dx2 = p2.x - p0.x; dy2 = p2.y - p0.y;
  if (dx1*dy2 > dy1*dx2) return 1;
  if (dx1*dy2 < dy1*dx2) return -1;
  return 0; // slopes are equal
}
```



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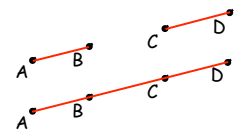
Line-segment intersection implementation bug

Still not quite right!

Bug in degenerate case with **four collinear points**

Does AB intersect CD?

- on the line in the order ABCD: NO
- on the line in the order ACDB: YES



Need more careful CCW implementation

- more work when $dx1*dy2 == dx2*dy1$ (see book)

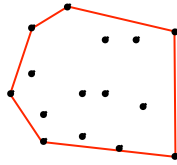
Lessons:

- geometric primitives are tricky to implement
- can't ignore degenerate cases

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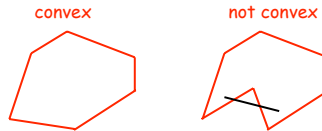
Convex hull of a point set

Convex hull: smallest polygon enclosing a given set of points



A polygon is **convex** iff every line whose endpoints are within the polygon falls entirely within the polygon

Lemma: Hull must be convex



Running time of convex hull algorithms can depend on

- **N**: number of points
- **M**: number of points **on the hull**
- point distribution

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Incremental convex hull algorithms

Idea: consider points one by one

- next point **inside** current hull—ignore
- next point **outside** current hull—update

Two subproblems to solve

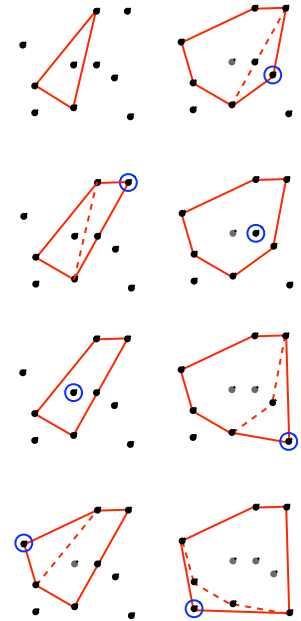
- test if point inside or outside polygon
- update hull for outside points

Both subproblems

- brute force: $O(M)$ to check all hull points
- can be improved to $O(\log M)$ with binary search
- relatively cumbersome to code

Randomize: take points in random order

Total running time: $O(N \log M)$



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Sweep-line convex hull algorithm

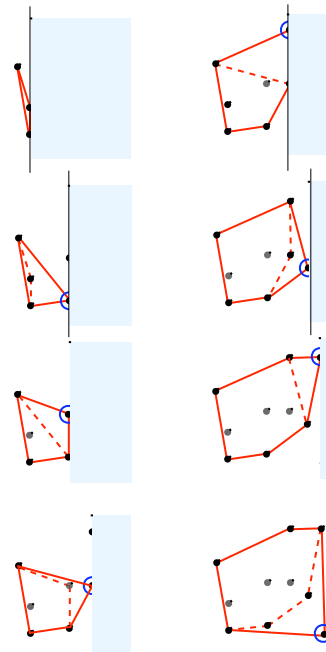
Idea: presort on x for incremental algorithm

Equivalent to imagining **sweep line** moving from left to right through points

plus: eliminates "inside" test

minus: have to pay cost of sort

Total cost: $O(N \log N)$



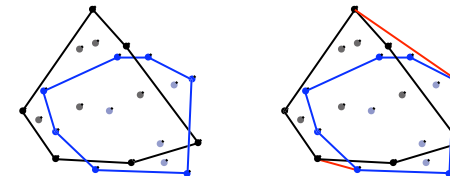
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Divide-and-conquer convex hull algorithms

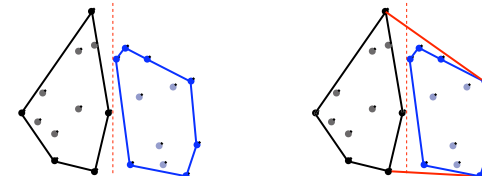
Divide point set into two halves

- solve subproblems recursively
- merge results

Idea 1: take points in random order



Idea 2: divide **space** in half (presort on one coordinate)



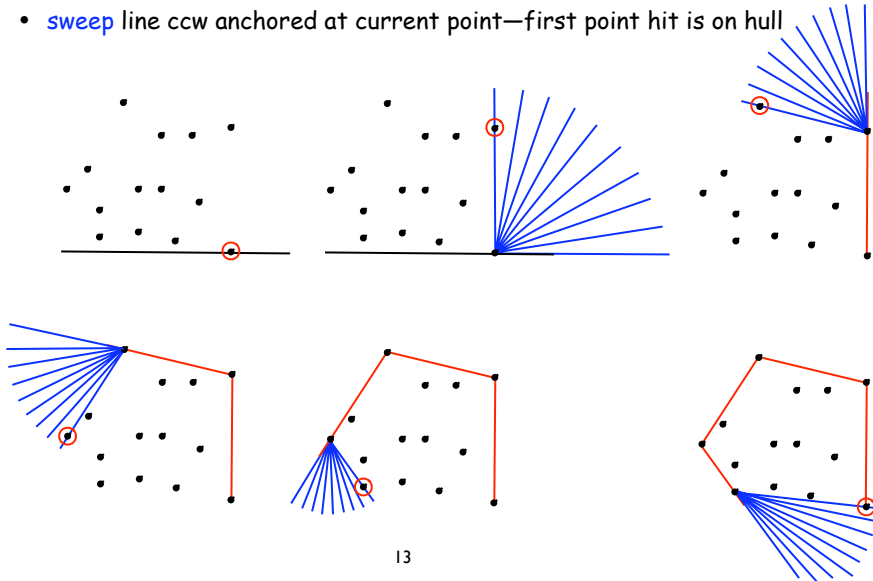
Both $O(N \log N)$ but relatively cumbersome to code

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Package-wrapping convex hull algorithm

Idea:

- point with lowest y coordinate is on the hull
- sweep line ccw anchored at current point—first point hit is on hull



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Implementation of package-wrapping algorithm

Input: polygon (represented as an array of N points)

Output: M (array rearranged such that first M points are convex hull)

```
int wrap(Point p[], int N)
{
    int i, min, M; double th, v; Point t;
    for (min = 0, i = 1; i < N; i++)
        if (p[i].y < p[min].y) min = i; // find point with min y coordinate
    p[N] = p[min]; th = 0.0;
    for (M = 0; M < N; M++)
    {
        t = p[M]; p[M] = p[min]; p[min] = t;
        min = N; v = th; th = 360.0;
        for (i = M+1; i <= N; i++)
        {
            if (theta(p[M], p[i]) > v) // find min angle > v
            {
                if (theta(p[M], p[i]) < th)
                {
                    min = i; th = theta(p[M], p[min]);
                }
            }
        }
    }
}
```

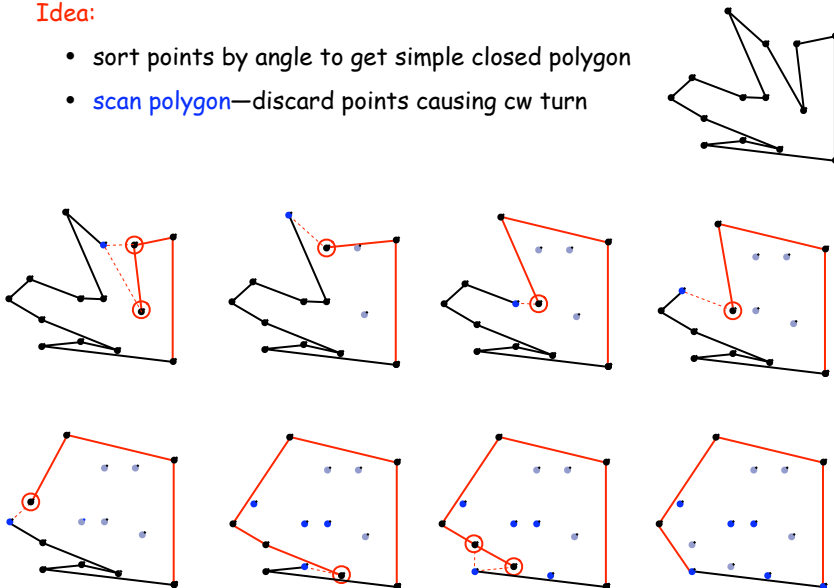
2D analog of selection sort: $O(NM)$ running time

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Graham scan convex hull algorithm

Idea:

- sort points by angle to get simple closed polygon
- scan polygon—discard points causing cw turn



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Implementation of Graham scan algorithm

Input: polygon (represented as an array of N points) ← points in $p[1] \dots p[N]$

Output: M (array rearranged such that first M points are convex hull)

```
int grahamscan(Point p[], int N)
{
    int i, min, M; Point t;
    for (min = 1, i = 2; i <= N; i++)
        if (p[i].y < p[min].y) min = i;
    for (i = 1; i <= N; i++)
        if (p[i].y == p[min].y)
            if (p[i].x > p[min].x) min = i; // swap "lower left" point with first
    t = p[1]; p[1] = p[min]; p[min] = t;
    quicksort(p, 1, N); // implementation of less uses angle with p[1]
    p[0] is sentinel → p[0] = p[N];
    for (M = 3, i = 4; i <= N; i++)
    {
        while (ccw(p[M], p[M-1], p[i]) >= 0) M--; // back up to include i on hull
        M++; t = p[M]; p[M] = p[i]; p[i] = t; // add i to putative hull
    }
    return M;
}
```

Total cost: $O(N \log N)$ (for sort).

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Quick-elimination convex hull algorithms

Idea: fast test to eliminate most inside points

quick: use quadrilateral Q
 $\min(x+y), \max(x+y), \min(x-y), \max(x-y)$

quicker: use inscribed rectangle R

Three-phase algorithm

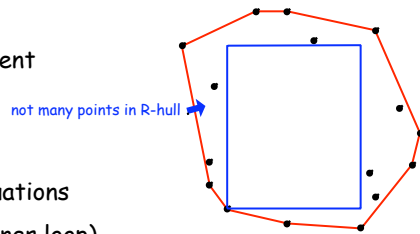
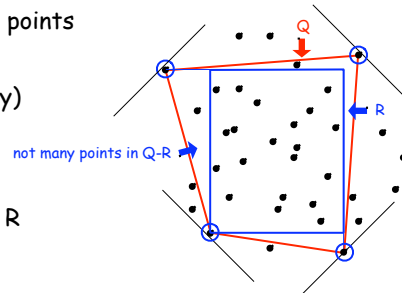
- pass through all points to compute R
- eliminate points inside R
- find convex hull of remaining points

Option 1: use recursion ("quickhull")

- relatively cumbersome to implement
- $O(N)$ worst case

Option 2: use Graham scan

- few points remaining in many situations
- $O(N + M \lg M)$ avg case (+ fast inner loop)



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Higher dimensions

Multifaceted (convex) polytope encloses points

NOT a simple object

- vertices, edges, facets
- return extreme points (hull vertices)—no natural order

Example: N points d dimensions

- $d=2$: convex hull
- $d=3$: Euler's formula ($v - e + f = 2$)
- $d>3$: exponential number of facets at worst

Some of the same approaches work (costs higher)

- Package-wrap
- Divide-and-conquer
- Randomized
- Interior elimination

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Convex hull algorithms cost summary

"Guaranteed" asymptotic cost to find M-point hull in N-point set

Package wrap	NM
Graham scan	$N \log N$ (sort time)
Divide and conquer *	$N \log N$
Quick elimination *	N
Incremental elimination	$N \log M$
Sweep line	$N \log N$ (sort time)

* assumes "reasonable" known point distribution

* leading coefficient higher than for sorting

How many points on hull?

- Worst case: N
- Average case: difficult problems in stochastic geometry
 - uniform in a convex polygon with $O(1)$ edges: $\log N$
 - uniform in a disc: $N^{1/3}$

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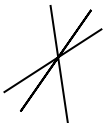
Context: mathematics

Geometric models of mathematical problems extend impact of geometric algs far beyond direct application to physical models

Example 1:

geometric problem	mathematical equivalent
intersect two lines (2D)	solve 2 equations in 2 unknowns
intersect three planes (3D)	solve 3 equations in 3 unknowns

algorithm: **gaussian elimination**

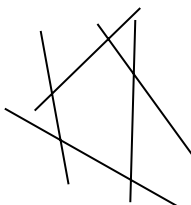


Example 2:

geometric problem	math equivalent
find convex polytope defined by intersecting half-planes	solve simultaneous inequalities
is given point inside polytope?	linear programming

algorithm: **simplex**

Vast number of applications (stay tuned)



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Context: algorithm design paradigms

Draw from knowledge about fundamental algorithms

Design and use levels of abstraction

- use fundamental algorithms and data structures
- know their performance characteristics

Carefully implement primitives

Recognize intrinsically difficult problems

For many important problems

- classical approaches give good algorithms
- need research to find **best** algorithms
- no excuse for using **dumb** algorithms

all possibilities	double recursion	2^N
brute force	nested for loops	N^2
divide-and-conquer	recursion, trees	$N \log N$
elegant idea	single for loop	N
randomization	random choices	N