

CS60064

Spring 2022

# Computational Geometry

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## Instructors

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16 February 2022

Lecture #18

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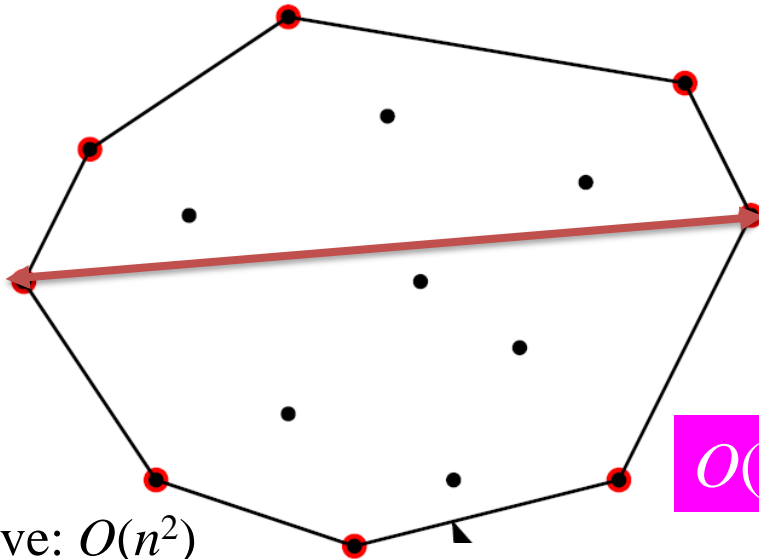
Indian Institute of Technology Kharagpur  
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# Problem of the day:

# Find the farthest pair of points

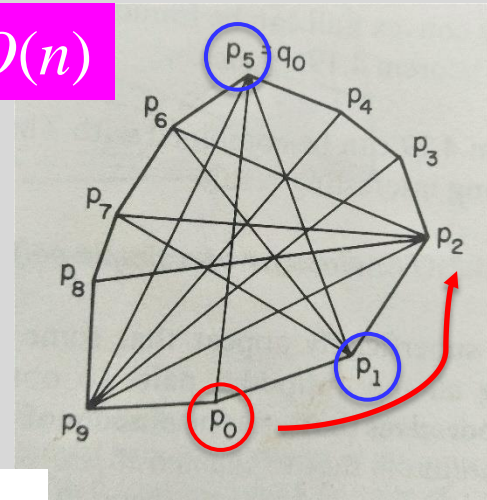
diameter of a point set ( $|n|$ )

*Claim:* Farthest pair on a convex hull must be antipodal points



$O(n \log n)$

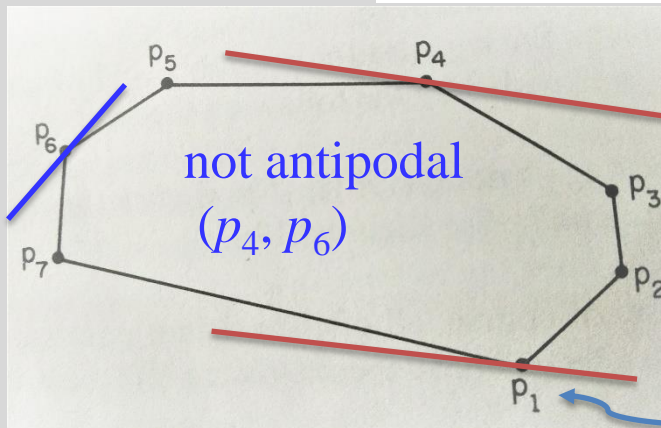
$O(n)$



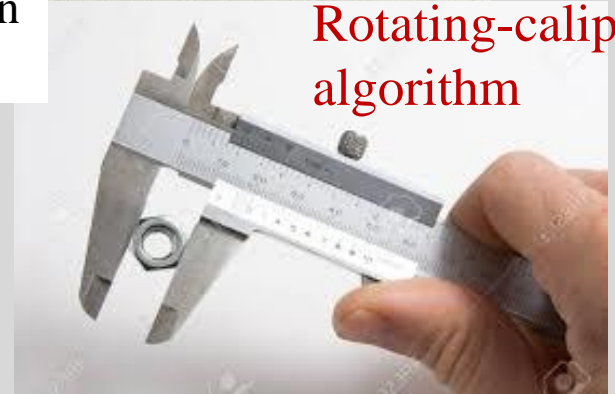
Naïve:  $O(n^2)$

unlike circles, a tangent to a polygon through a vertex is not unique

Rotating-calipers algorithm



antipodal pairs  $(p_1, p_4)$ , i.e, they admit parallel tangents (lines of support)

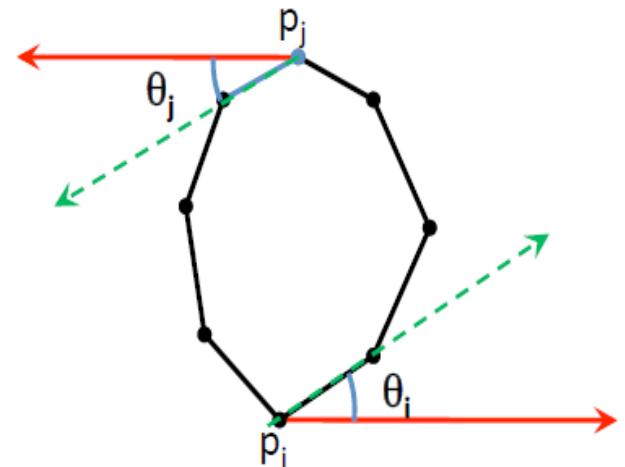


# Antipodal Points

Antipodal pairs of a set  $S$  must be extreme points and therefore must be the vertices of  $\text{CH}(S)$

## Rotating Calipers (Shamos)

- Find the convex hull
- Find an antipodal pair  $(p_i, p_j)$  by marching along the hull
- Generate the next antipodal pair:
  - Determine  $\theta_i$  &  $\theta_j$
  - (suppose  $\theta_i < \theta_j$ ) rotate the lines of support by  $\theta_i$
  - Output  $(p_{i+1}, p_j)$  as the next antipodal pair
- Repeat step 2 until  $L_1$  or  $L_2$  is rotated by  $180^\circ$



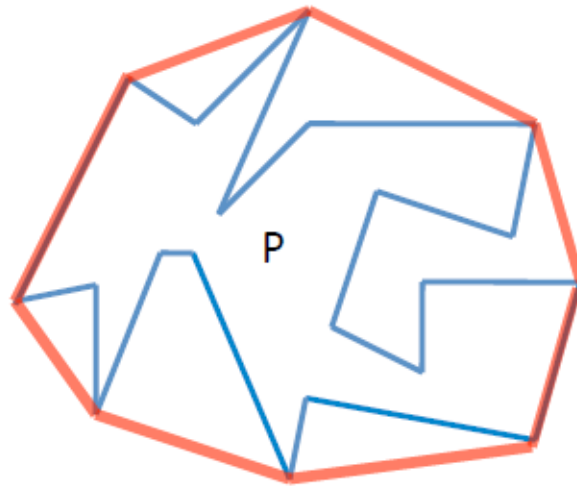
Farthest or nearest pairs between two parallel lines of support can thus be found in  $O(n)$  time

# 2D Convex Hull: Summary

- Brute-force algorithm:  $O(n^3)$
- Quick hull:  $O(n^2)$
- Jarvis' march (gift wrapping):  $O(nh)$ ; output-sensitive
- Incremental hull:  $O(n \log n)$
- Divide-and-conquer:  $O(n \log n)$
- Graham's scan:  $O(n \log n)$
- Lower bound:  $\Omega(n \log n)$
- Chan's algorithm:  $O(n \log h)$ ;  
output-sensitive;
- Convex hull of a simple polygon/poly-chain with  $n$  vertices: ?

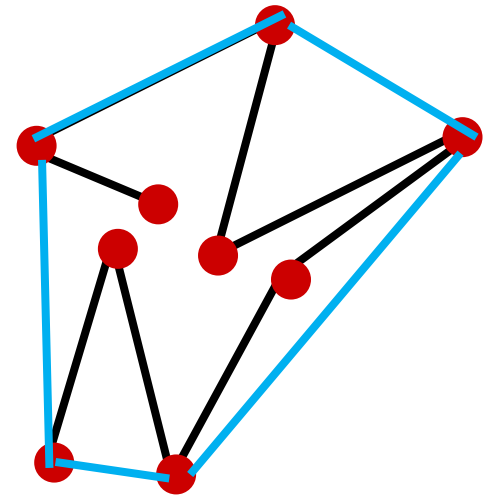
# Convex Hull of a Simple Polygon

- **Problem:** Given a simple polygon  $P$ , determine its convex hull.



Convex Hull of  $P$

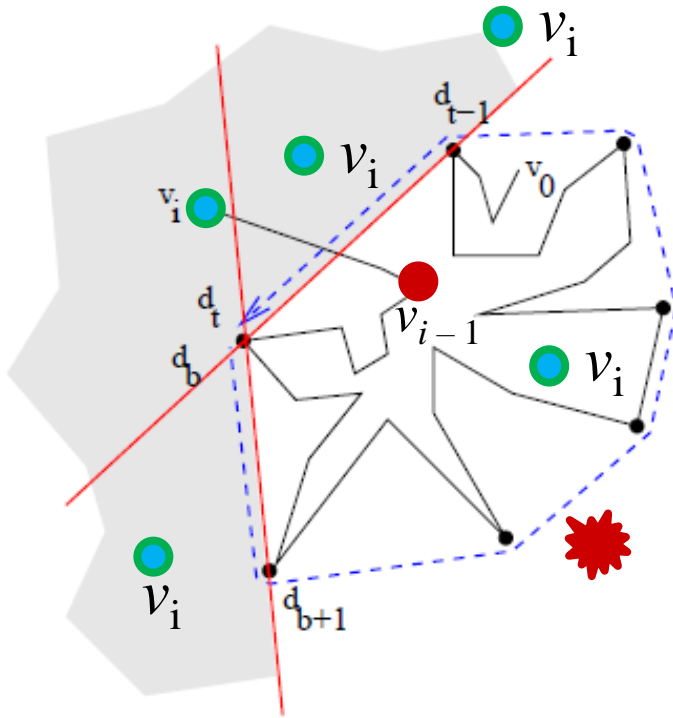
CH of a simple polygonal chain



- $O(n \log n)$  algorithm is easy
- Linear time algorithm is tricky but can be designed.
- **Note:**  $\Omega(n \log n)$  lower bound does not apply since the points of  $P$  are not unorganized points

A. Melkman, On-line Construction of the Convex Hull of a Simple Polyline, *Information Processing Letters*, Vol. 24, pp. 11-12, 1987;  $O(n)$ -time algorithm

# Melkman's Algorithm: Key Ideas



Process the poly-chain/polygon sequentially:  
 $v_0, v_1, \dots, v_{i-1} \dots$ , and construct incremental hull;

let  $d_b = d_t$  = last vertex that is added to the hull;

let the next vertex be  $v_i$ ; can we draw tangents and proceed as in incremental hull?  
partial hull is stored as “deque”

Q1: Where can  $v_i$  appear??

Q2: Why deque??

*push v:*

$(t \leftarrow t + 1; d_t \leftarrow v)$

*pop  $d_t$ :*  $t \leftarrow t - 1$

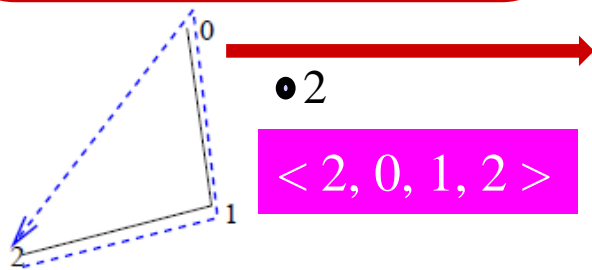
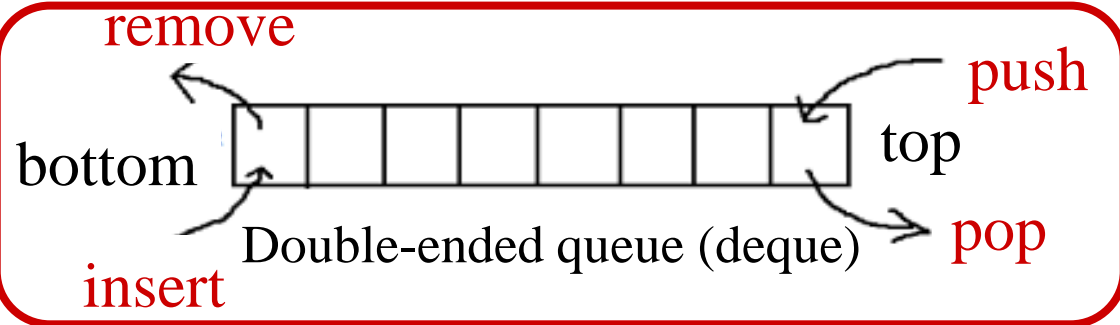
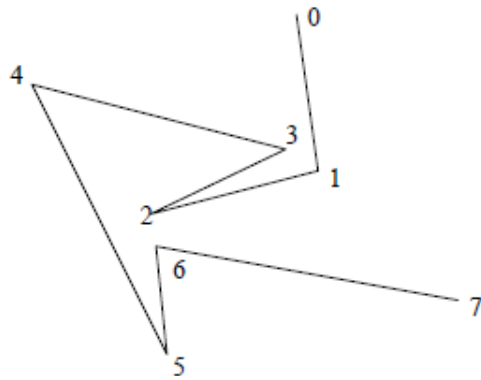
*insert v:*

$(b \leftarrow b - 1; d_b \leftarrow v)$

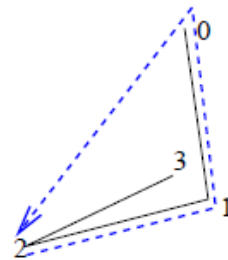
*remove  $d_b$ :*  $b \leftarrow b + 1$

- If  $v_i$  lies in the interior, do nothing;
- Else keep on popping/deleting from the queue based on the test, and update the hull by pushing/inserting  $v_i$  when tests flag convexity;
- Repeat until the last vertex is processed

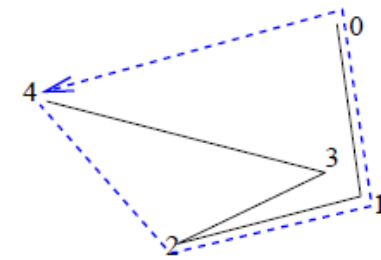
# Melkman's Algorithm: Snapshots



$\langle 2, 0, 1, 2 \rangle$



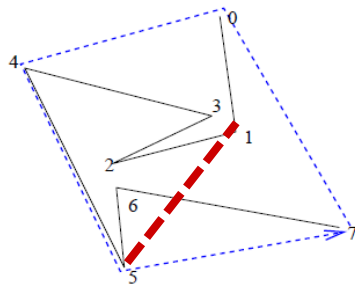
$\langle 2, 1, 0, 2 \rangle$



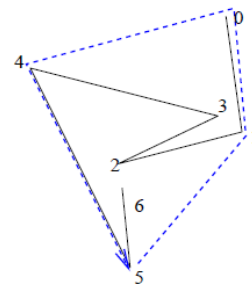
$\langle 4, 2, 1, 0, 4 \rangle$

$\langle 2, 1, 0, 2 \rangle$

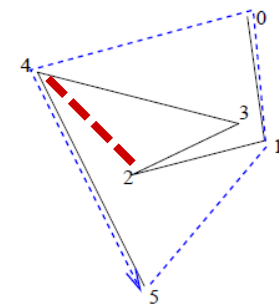
*deque*



$\langle 7, 0, 4, 5, 7 \rangle$



$\langle 5, 1, 0, 4, 5 \rangle$



$\langle 5, 1, 0, 4, 5 \rangle$

Final hull vertices in CCW

Courtesy: Joe Mitchell

# Melkman's Algorithm

Let the simple chain be  $C = (v_0, v_1, \dots, v_{n-1})$ , with vertices  $v_i$  and edges  $v_i v_{i+1}$ , etc.

(0) Initialize: If  $\text{Left}(v_0, v_1, v_2)$ , then  $D \leftarrow \langle v_2, v_0, v_1, v_2 \rangle$ ; else,  $D \leftarrow \langle v_2, v_1, v_0, v_2 \rangle$ .

$i \leftarrow 3$

(1) While ( $\text{Left}(d_{t-1}, d_t, v_i)$  and  $\text{Left}(d_b, d_{b+1}, v_i)$ ) do

$i \leftarrow i + 1$

If  $i = n$ , Exit

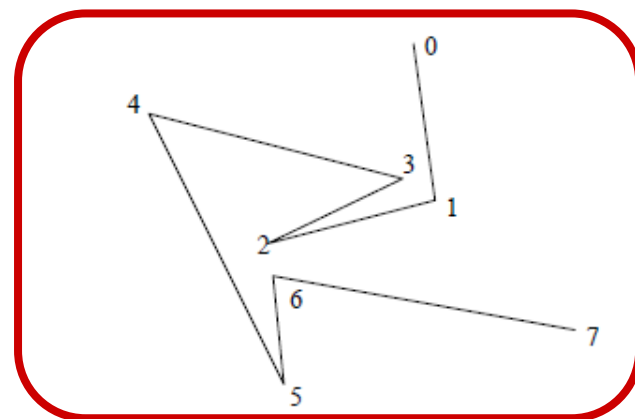
(2) Restore convexity:

Until  $\text{Left}(d_{t-1}, d_t, v_i)$ , do pop  $d_t$ . Push  $v_i$ .

Until  $\text{Left}(v_i, d_b, d_{b+1})$ , do remove  $d_b$ . Insert  $v_i$ .

$i \leftarrow i + 1$ ; If  $i = n$ , Exit

Go to (1).



Assume all vertices are  
in general positions

On termination, the content of the deque read from  $L \rightarrow R$  would provide the CCW-ordering of vertices on the CH; each vertex is processed  $O(1)$  times. Hence, time complexity:  $O(n)$



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## Instructors

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18 February 2022

Lecture #19 & Lecture #20

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# Agenda Today

- Problem of the day: Maximum-Containment Problem or MaxRS (Maximum Range-Search Query)
- Convex hull: Chan's Method
- Bi-chromatic non-crossing matching using convex hull
- Proximity problem: Closest-pair of points

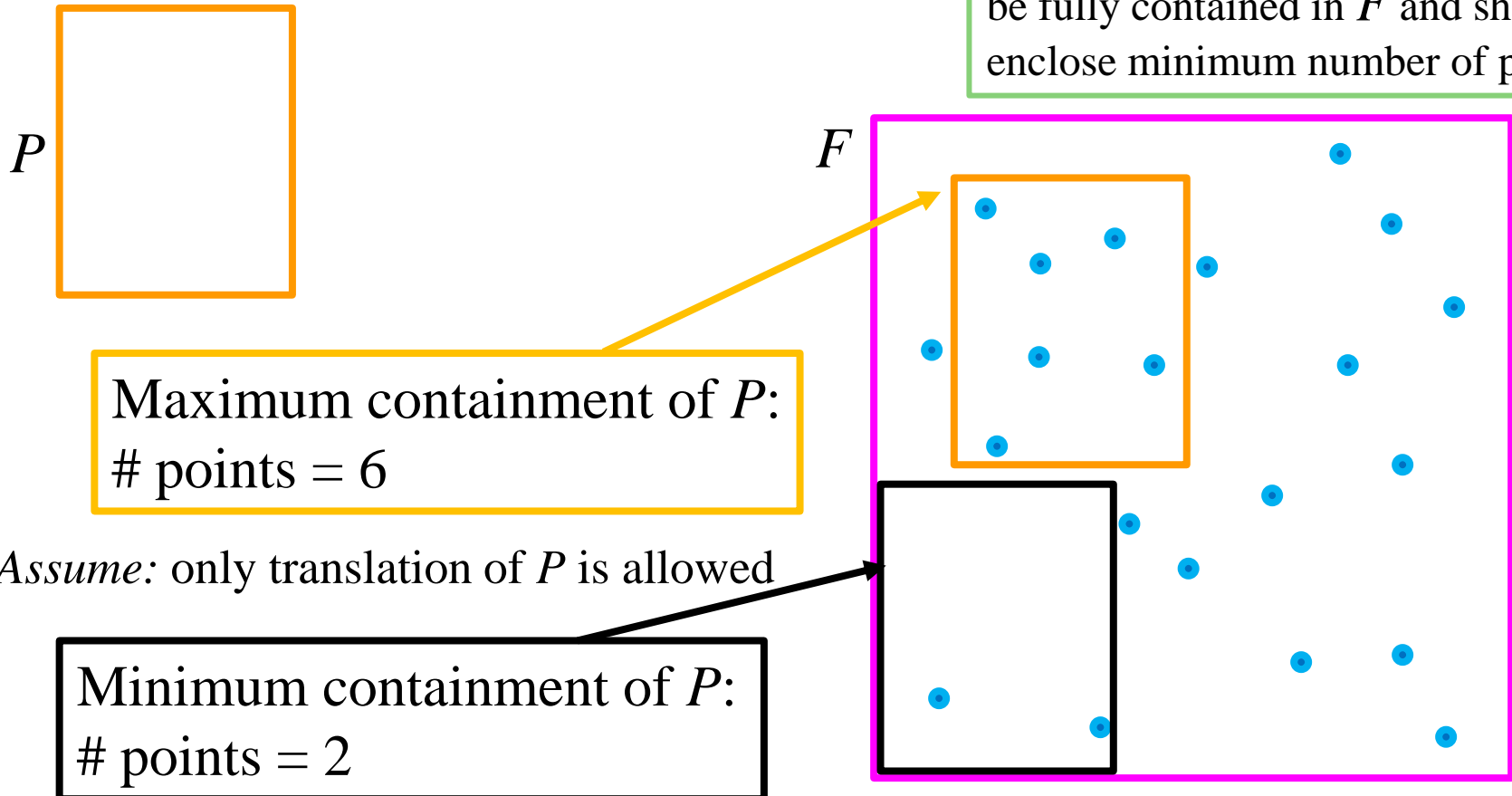
# Problem of the Day: Maximum-Containment Problem

$F$ : A rectangle comprising  $n$  random points in general positions

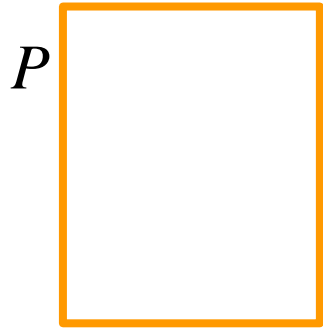
$P$ : A smaller rectangle with given aspect ratio

**Max-containment:** Find an isothetic position of  $P$  in  $F$  that encloses the maximum number of points (MaxRS)

**Min-containment (MinRS):**  $P$  should be fully contained in  $F$  and should enclose minimum number of points

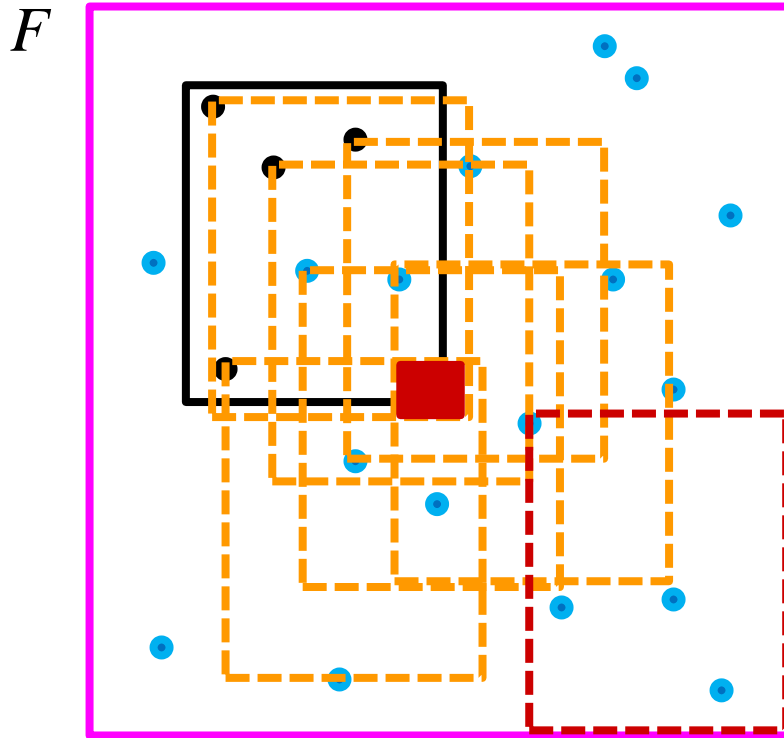
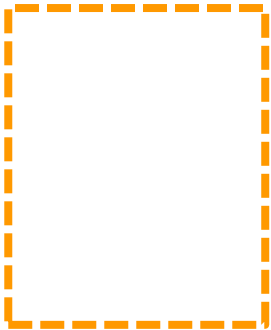
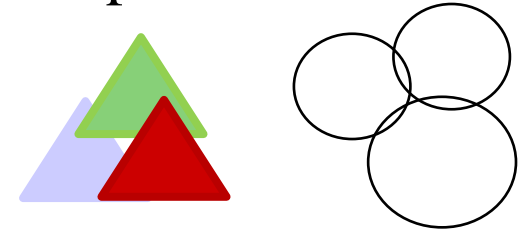


# Maximum-Containment Problem (MaxRS)

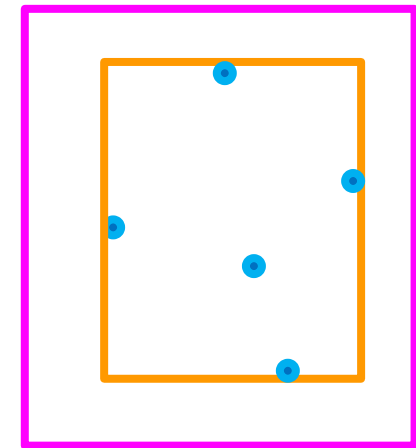


(Max-containment): find an isothetic position of  $P$  that encloses the maximum number of points in  $F$

Naïve:  $O(n^3)$  time



Helly property



*Max-enclosure*: find the maximum clique of the rectangle intersection graph  $\Rightarrow O(n \log n)$

How?

Use line-sweep algorithm and determine intersections of rectangles

# Convex Hull: Summary So Far

- Brute force algorithm:  $O(n^3)$
- Quick-Hull:  $O(n^2)$
- Jarvis' march (gift wrapping):  $O(nh)$
- Incremental insertion:  $O(n \log n)$
- Divide-and-conquer:  $O(n \log n)$
- Graham's scan:  $O(n \log n)$
- Lower bound:  $\Omega(n \log n)$
- CH for simple polygons/poly-chains:  $O(n)$

*Longstanding open question:*

Is it possible to improve the time complexity of a convex-hull algorithm to  $O(n \log h)$ , where  $h$ : #hull vertices ?

# Faster Algorithms (Output-Sensitive)

Kirkpatrick-Seidel (1986): an  $O(n \log h)$  worst-case algorithm  
 $n$ : # vertices;  $h$ : # vertices on the hull

Chan (1996)\*:  $O(n \log h)$  algorithm - combines two slower methods (Jarvis March and Graham Scan)

Note:

Jarvis' is good when  $h \ll n$ ;

Graham's is good when  $h \approx n$  (i.e., reduces backtracks)

\*Timothy Chan, "Output-sensitive results on convex-hulls, extreme points, and related problems", *Discrete & Computational Geometry*, Vol. 16, pp. 369-387, 1996

# Timothy Chan's Algorithm (DCG, 1996)

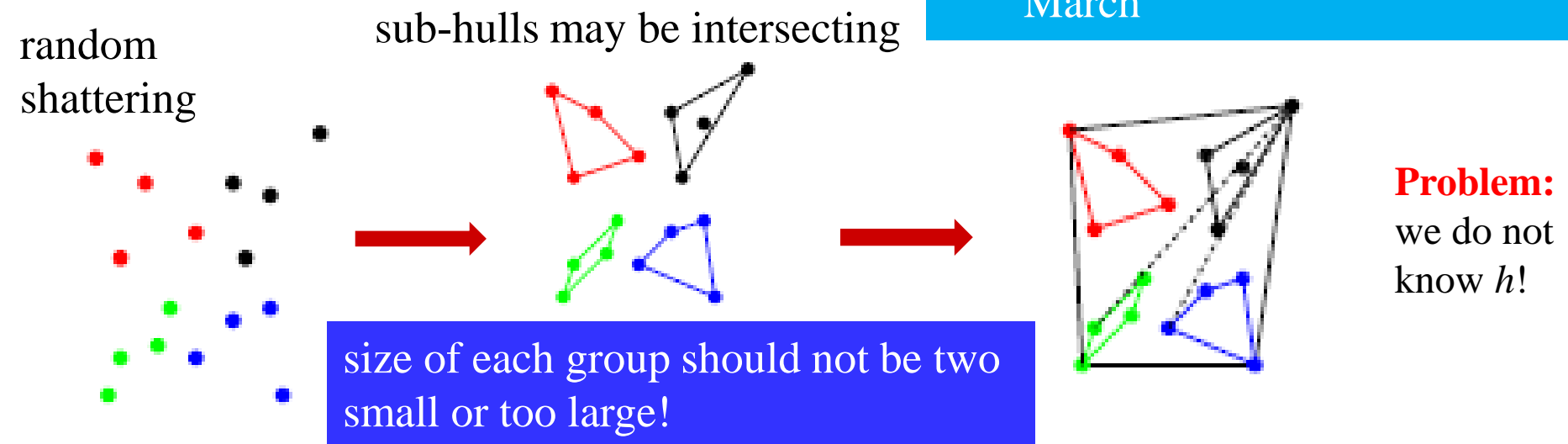
*Objective:* Can we implement CH for an  $n$ -set in  $O(n \log h)$  time, where  $h$  denotes the number vertices on the hull?

**Note:** Full sorting cannot be done!

**Main Idea:**

Integrate: Divide-and-Conquer (D&C), Graham Scan, and Jarvis March

1. Suppose we shatter (D&C) the point-set into  $r = \lceil n/m \rceil$  groups each having size “ $m$ ”,  $m \approx h$
2. (convex hulls of these groups may not be *disjoint*)
3. Run Graham scan on each group  $\Rightarrow$  “ $\log h$ ” factor
4. Wrap these groups using Jarvis March



*Observation:* Interior points within the convex hull of each partition cannot appear on the final hull; only a subset of their *hull points* can! Two-fold reduction: Discard interior points; also the hull points that do not satisfy tangency will not appear in Jarvis-M

# Timothy Chan's algorithm (1996): Key Ideas

*Objective:* Can we implement CH for an  $n$ -set in  $O(n \log h)$  time, where  $h$  denotes the number vertices on the hull?

**Basic Idea:** Partition into smaller groups, and combine Graham scan and Jarvis March

**Problem:** we need to choose a suitable size for each group! Assume each group has size  $m$ ; during execution of the algorithm, we will fix  $m$  iteratively. Note that  $1 \leq m \leq n$ ; If  $m$  is too large or too small, we have no benefit;

Partition the  $n$  points into groups of size  $m$ ; number of groups is  $r = \lceil n/m \rceil$ .

Compute hull of each group with Graham's scan.

Next, run Jarvis on the groups.



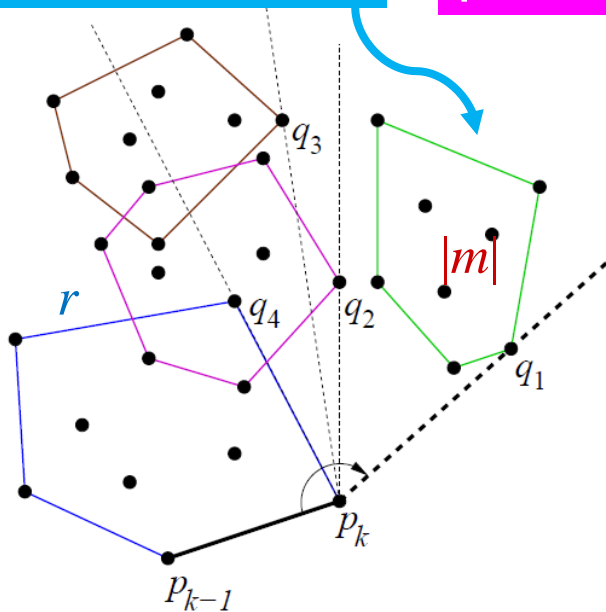
# Chan's Algorithm

Partition points  $P$  into  $r$ -groups of size  $m$ ,  $r = \lceil n/m \rceil$

- Each group takes  $O(m \log m)$  time - sort + Graham
- $r$ -groups take  $O(r m \log m) = O(n \log m) \longrightarrow (1)$

$r$  groups, each of size  $m$

A tangent to a convex  $m$ -gon from an external point can be found in  $O(\log m)$  by binary search



- Cost of Jarvis on  $r$  convex hulls: Each step takes  $O(r \log m)$  time; total  $O(hr \log m) = O((hn/m) \log m)$  time.  $\longrightarrow (2)$

- Thus, total complexity

$h$ : number of points on  $\text{CH}(P)$

$$(1) \ \& \ (2) \Rightarrow O\left(\left(n + \frac{hn}{m}\right) \log m\right)$$

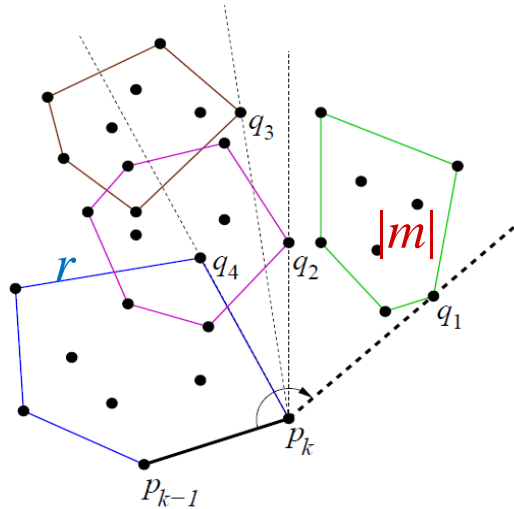
- If  $m = h$ , this gives  $O(n \log h)$  bound.

Find CH of each group

Unfortunately we do not know  $h$  and hence,  $m$ . Ideas?

# First Part of Chan's algorithm: Partial\_Hull ( $P, m$ )

As if  $m$  is known via Little Birdie!



Partition  $P$  into  $r$  groups of  $m$  each.

Compute  $\text{Hull}(P_i)$  using Graham scan,  
 $i = 1, 2, \dots, r$ .

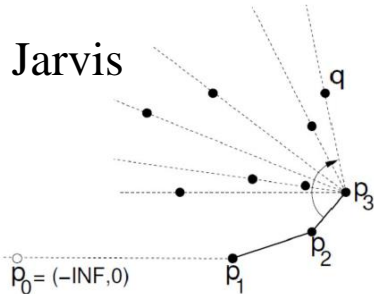
$p_0 = (-\infty, 0)$ ;  $p_1$  bottom point of  $P$ .

For  $k = 1$  to  $m$  do

Run Jarvis March on  $r$  hulls: for  $i = 1$  to  $r$ , do

Draw tangent from  $p_k$  to  $r$ -hulls and choose the one that first hits the sweep-line when rotated CCW with pivot at  $p_k$ ;

If  $p_{k+1} = p_1$ , then return the convex hull  $\{p_1, p_2, \dots, p_k\}$   
else  $m$  is too small, “try again” [for success,  $m \geq h$ ]



Fact:  $m = 1 \Rightarrow$  the problem reduces to full Jarvis March  
 $m = n \Rightarrow$  the problem reduces to full Graham scan

# Finishing Chan's algorithm: Analysis

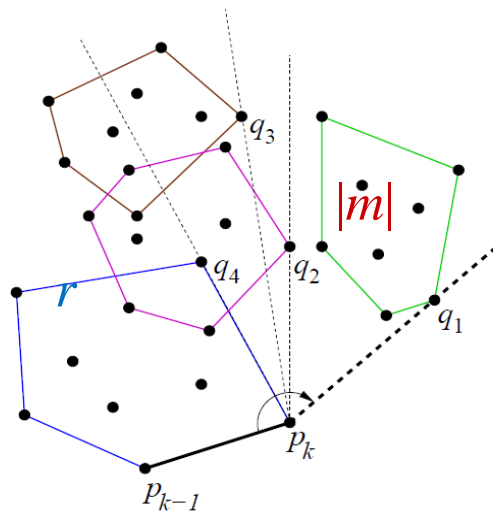
How to choose  $m$ ? use doubly-exponential search

**Hull( $P$ )**

• for  $t = 1, 2, \dots$  do

1. Let  $m = \min(2^{2^t}, n)$ .
2. Run Chan with  $m$ , output to  $L$ .
3. If  $L \neq \text{"try again"}$  then return  $L$ .

Partial\_Hull( $P, m$ )



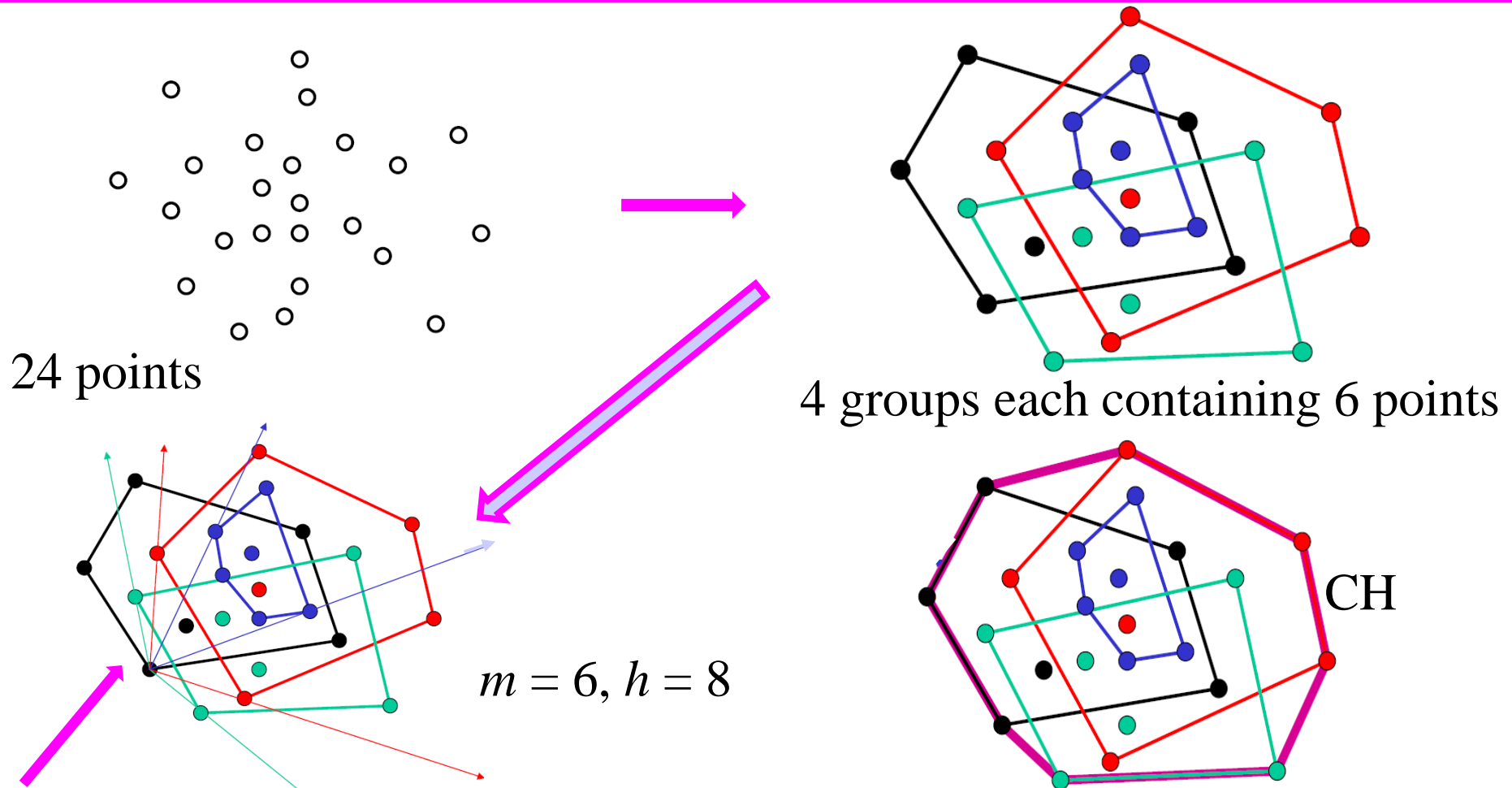
Referring to Exp. (2):  
Jarvis-M is being  
wrapped  $m$  times  $\Rightarrow$   
thus for each value of  
 $t$ , the time including  
Graham's and Jarvis'  
becomes  $O(n \log m)$

Iteration  $t$  takes time  $O(n \log 2^{2^t}) = O(n 2^t)$ .

Max value of  $t = \lceil \lg \lg h \rceil$ , since we succeed  
as soon as  $2^{2^t} \geq h$ . [Note that for success,  $m \geq h$ ]

Hence, the running time  
(ignoring constant factors) = 
$$\sum_{t=1}^{\lg \lg h} n 2^t = n \sum_{t=1}^{\lg \lg h} 2^t \leq n 2^{1+\lg \lg h} = 2n \lg h$$
  
$$\Rightarrow O(n \log h) \quad \square$$

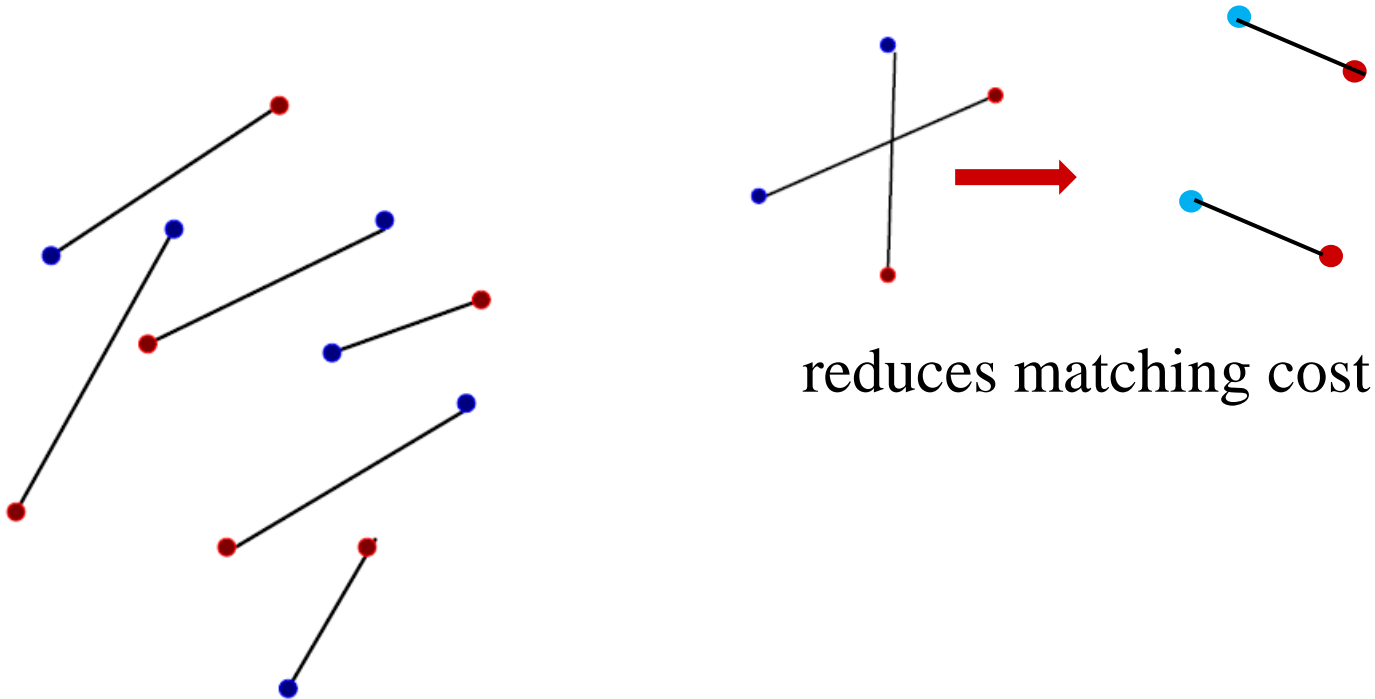
# Chan's Algorithm: Example



One iteration of gift wrapping: find tangents to convex hulls and take the one with the least slope; since  $m = 6$ , continue wrapping six times; however, Jarvis-M will not take you to the start vertex in six steps. More wraps are needed. Instead,  $m$  should be incremented, Graham's and Jarvis' be redone so as to construct the hull in  $m \geq h$  steps and to achieve the intended complexity results.

# Non-Crossing Matching

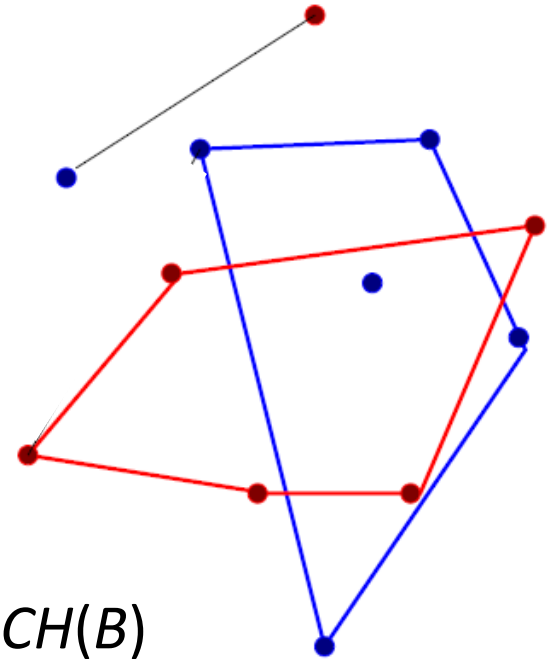
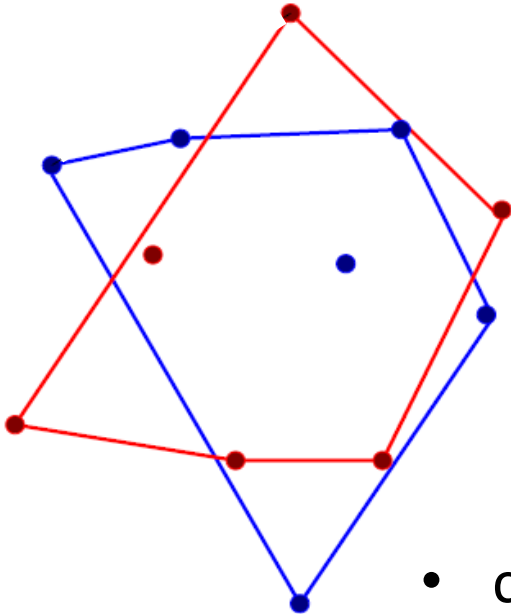
Given  $n$  red and  $n$  blue points in the plane (no three collinear), compute a red-blue non-crossing matching



A non-crossing matching always exists;  
Matching with minimum total length must be non-crossing

# Non-Crossing Matching

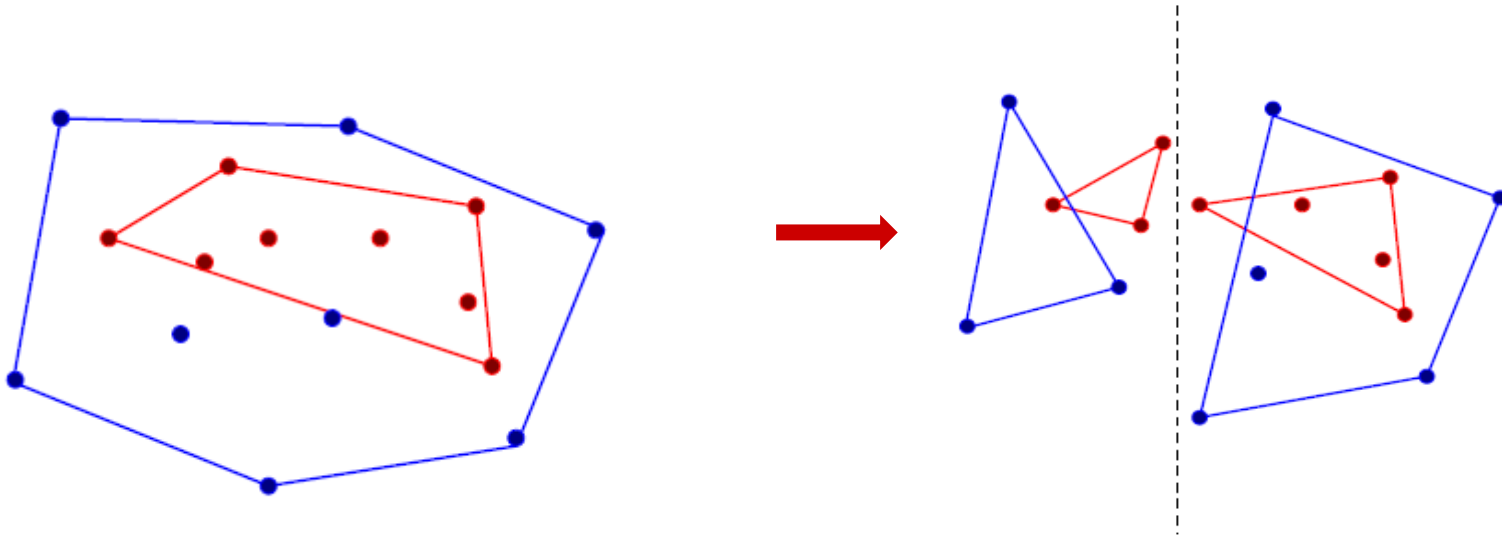
Given  $n$  red and  $n$  blue points in the plane (no three collinear), compute a red-blue non-crossing matching



- compute  $CH(R)$  and  $CH(B)$
- find a common tangent, say,  $rb$
- output  $(r, b)$  as a matching edge
- remove points  $r, b$
- update convex hulls and iterate

# Non-Crossing Matching

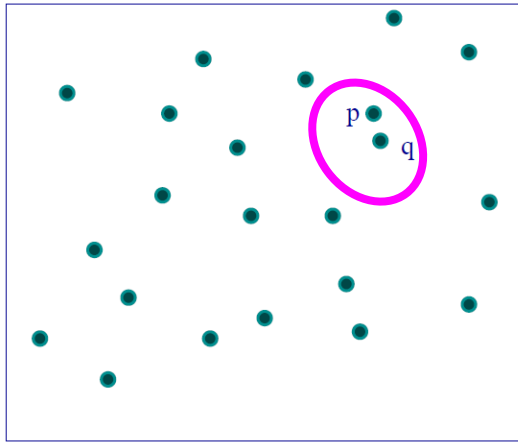
What if Red, Blue CHs are nested? No tangents can be drawn!



- Split by a vertical line, creating two smaller, intersecting or disjoint hull problems; select tangents and iterate as before
- [Hershberger-Suri '92] gives optimal  $O(n \log n)$  solution

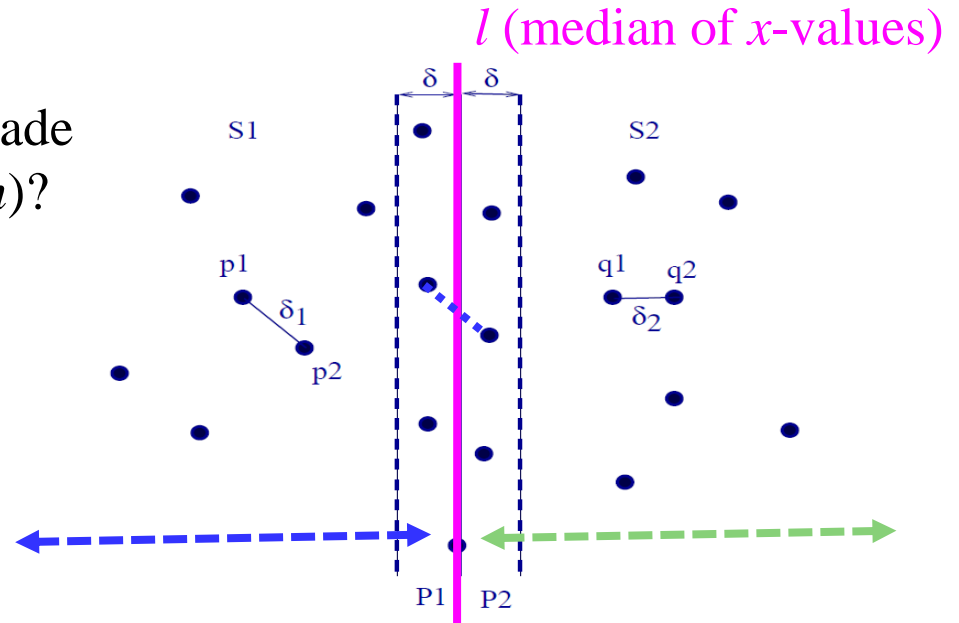
# Proximity Problem: Closest Pair of Points

Given  $n$  points on the plane determine the closest pair



Naïve:  $O(n^2)$  time

Can it be made  
in  $O(n \log n)$ ?



1D problem is easy;  
sort and check

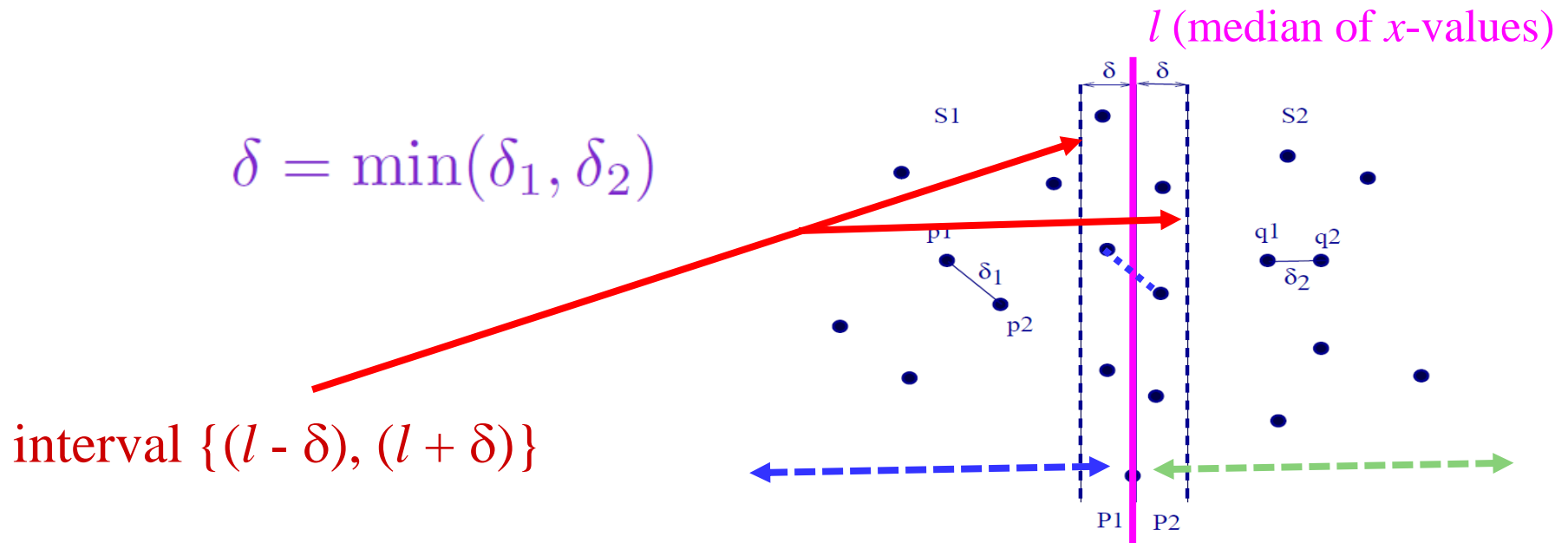
2D problem: use  
Divide-and-Conquer

- We partition  $S$  into  $S_1, S_2$  by vertical line  $\ell$  defined by median  $x$ -coordinate in  $S$ .
- Recursively compute closest pair distances  $\delta_1$  and  $\delta_2$ . Set  $\delta = \min(\delta_1, \delta_2)$ .
- Now compute the closest pair with one point each in  $S_1$  and  $S_2$ .



# Closest Pair of Points

Given  $n$  points on the plane determine the closest pair

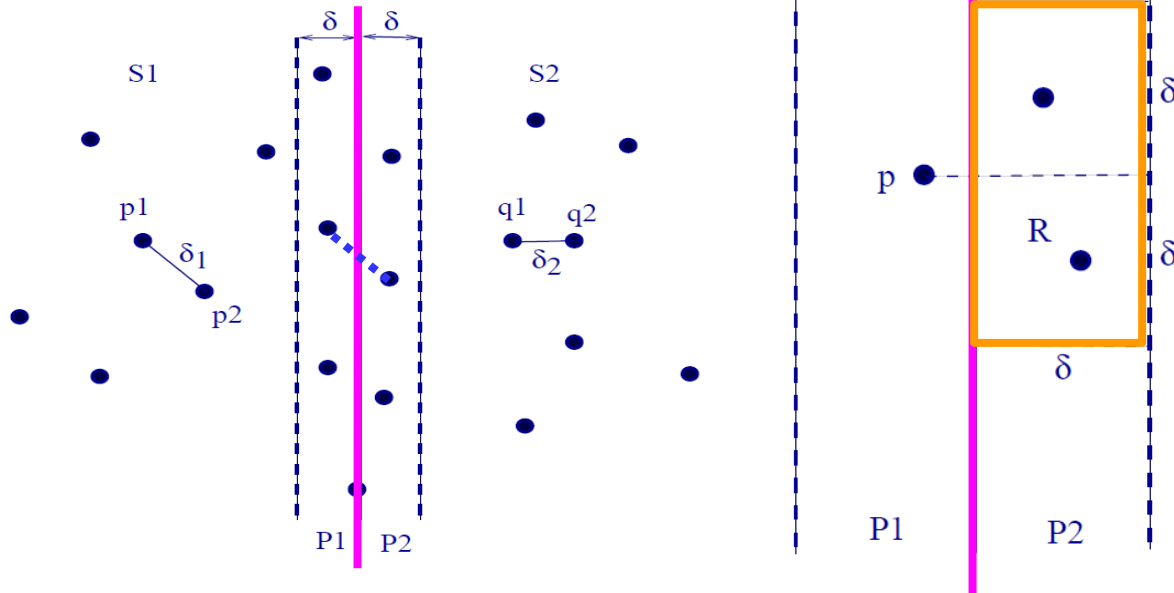


In each candidate pair  $(p, q)$ , where  $p \in S_1$  and  $q \in S_2$ , the points  $p, q$  must both lie within  $\delta$  of  $\ell$ .

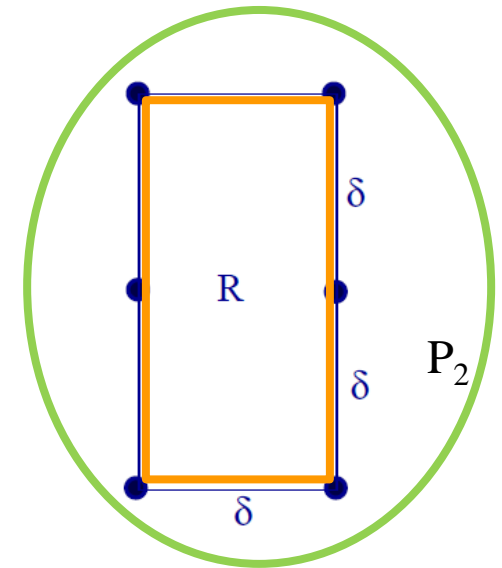
Is it possible that all  $n/2$  points of  $S_1$  (and  $S_2$ ) lie within  $\delta$  of  $\ell$ ? Complexity still remains  $O(n^2)$ !

# Closest Pair of Points

$$\delta = \min(\delta_1, \delta_2)$$



$R$  can contain at most six points!  
 $\Rightarrow$  # Overall tests  $\leq 6 \times n/2$   
 distance comparisons



Use some properties from discrete geometry: packing

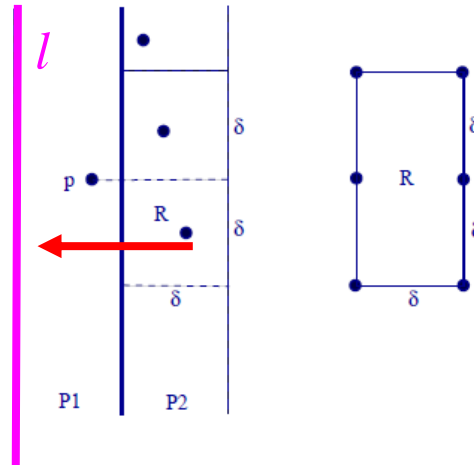
Consider a point  $p \in S_1$ . All points of  $S_2$  within distance  $\delta$  of  $p$  must lie in a  $\delta \times 2\delta$  rectangle  $R$ .

How many points can be inside  $R$  if each pair is at least  $\delta$  apart?

Courtesy:  
 Subhash Suri

# Closest-Pair Problem: Analysis

- In order to determine at most 6 potential mates of  $p$ , project  $p$  and all points of  $P_2$  onto line  $\ell$ .



Ref: Preparata and Shamos,  
Computational Geometry

Analogous to merge sort

- Pick out points whose projection is within  $\delta$  of  $p$ ; at most six.
- We can do this for all  $p$ , by walking sorted lists of  $P_1$  and  $P_2$ , in total  $O(n)$  time.
- The sorted lists for  $P_1, P_2$  can be obtained from pre-sorting of  $S_1, S_2$ .
- Final recurrence is  $T(n) = 2T(n/2) + O(n)$ , which solves to  $T(n) = O(n \log n)$ .

# Announcement of Online Test - 01

Friday, 25 February, 2022; 11:05 am - 12:50 pm

**Coverage:** Polygons, point-inclusion queries, orientation test, robustness issues, polygonization, diagonals, triangulation, convex partition, art-gallery problems, DCEL, intersections, map overlay, convex hull, related algorithms, data structures, and complexities (material covered until 18 February 2022);

Questions will be made available through Moodle and answers should also be submitted via Moodle. The submission server will open at 10:55 am and close at 1:05 pm, 25 February 2021.

**Credit:** 25%