## 24. Geometric Algorithms

Properties of Line Segments, Intersection of Line Segments, Convex Hull, Closest Point Pair [Ottman/Widmayer, Kap. 8.2,8.3,8.8.2, Cormen et al, Kap. 33]

### 24.1 Properties of Line Segments

## Properties of line segments.

Cross-Product of two vectors $p_{1}=\left(x_{1}, y_{1}\right)$, $p_{2}=\left(x_{2}, y_{2}\right)$ in the plane

$$
p_{1} \times p_{2}=\operatorname{det}\left[\begin{array}{ll}
x_{1} & x_{2} \\
y_{1} & y_{2}
\end{array}\right]=x_{1} y_{2}-x_{2} y_{1}
$$

Signed area of the parallelogram


## Turning direction


nach links:
$\left(p_{1}-p_{0}\right) \times\left(p_{2}-p_{0}\right)>0$
nach rechts:
$\left(p_{1}-p_{0}\right) \times\left(p_{2}-p_{0}\right)<0$

## Intersection of two line segments



Intersection: $\quad p_{1}$ and $p_{2}$ opposite w.r.t $\overline{p_{3} p_{4}}$ and $p_{3}, p_{4}$ opposite w.r.t. $\overline{p_{1} p_{2}}$

No intersection: $p_{1}$ and $p_{2}$ on the same side of $\overline{p_{3} p_{4}}$

No intersection: $p_{3}$ Intersection: $p_{1}$ on and $p_{4}$ on the same $\overline{p_{3} p_{4}}$ side of $\overline{p_{1} p_{2}}$
24.2 Convex Hull

## Convex Hull

Subset $S$ of a real vector space is called convex, if for all $a, b \in S$ and all $\lambda \in[0,1]$ :

$$
\lambda a+(1-\lambda) b \in S
$$



## Convex Hull

Convex Hull $H(Q)$ of a set $Q$ of points: smallest convex polygon $P$ such that each point of $Q$ is on $P$ or in the interior of $P$.


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## Convex Hull

Identify segments of $P$


## Convex Hull

Identify segments of $P$


Observation: for a a segment $s$ of $P$ it holds that all points of $Q$ not on the line through $s$ are either on the left or on the right of $s$.

## Jarvis Marsch / Gift Wrapping algorithm

1. Start with an extremal point (e.g. lowest point) $p=p_{0}$
2. Search point $q$, such that $\overline{p q}$ is a line to the right of all other points (or other points are on this line closer to $p$.
3. Continue with $p \leftarrow q$ at (2) until $p=p_{0}$.

Illustration Jarvis

$$
\begin{aligned}
& \stackrel{p_{1}}{p_{0}}
\end{aligned}
$$

Illustration Jarvis


Illustration Jarvis


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## Analysis Gift-Wrapping

- Let $h$ be the number of corner points of the convex hull.
- Runtime of the algorithm $\mathcal{O}(h \cdot n)$.


## Convex Hull

Identify segments of $P$


## Convex Hull

Identify segments of $P$


Observation: if the points of the polygon are ordered anti-clockwise then subsequent segments of the polygon $P$ only make left turns.

## Algorithm Graham-Scan

Input: Set of points $Q$
Output: Stack $S$ of points of the convex hull of $Q$
$p_{0}$ : point with minimal $y$ coordinate (if required, additionally minimal $x$-) coordinate
$\left(p_{1}, \ldots, p_{m}\right)$ remaining points sorted by polar angle counter-clockwise in relation to $p_{0}$; if points with same polar angle available, discard all except the one with maximal distance from $p_{0}$
$S \leftarrow \emptyset$
if $m<2$ then return $S$
Push $\left(S, p_{0}\right) ; \operatorname{Push}\left(S, p_{1}\right) ; \operatorname{Push}\left(S, p_{2}\right)$
for $i \leftarrow 3$ to $m$ do
while Winkel $\left(\operatorname{Next} \operatorname{ToTop}(S), \operatorname{Top}(S), p_{i}\right)$ nicht nach links gerichtet do $\operatorname{Pop}(S)$;
$\operatorname{Push}\left(S, p_{i}\right)$
return $S$

## Illustration Graham-Scan



## Stack: <br> $p_{0}$

## Illustration Graham-Scan



Stack:
$p_{1}$
$p_{0}$

## Illustration Graham-Scan



Stack:
$p_{2}$
$p_{1}$
$p_{0}$

## Illustration Graham-Scan


Stack:
$p_{3}$
$p_{2}$
$p_{1}$
$p_{0}$

## Illustration Graham-Scan



## Stack: <br> $p_{4}$ <br> $p_{2}$ <br> $p_{1}$ <br> $p_{0}$

## Illustration Graham-Scan


Stack:
$p_{5}$
$p_{4}$
$p_{2}$
$p_{1}$
$p_{0}$

## Illustration Graham-Scan



## Stack: <br> $p_{4}$ <br> $p_{2}$ <br> $p_{1}$ <br> $p_{0}$

## Illustration Graham-Scan



## Stack: <br> $p_{6}$ <br> $p_{2}$ <br> $p_{1}$ <br> $p_{0}$

## Illustration Graham-Scan



Stack:
$p_{7}$
$p_{6}$
$p_{2}$
$p_{1}$
$p_{0}$

## Illustration Graham-Scan



Stack:
$p_{8}$
$p_{6}$
$p_{2}$
$p_{1}$
$p_{0}$

## Illustration Graham-Scan


Stack:
$p_{9}$
$p_{6}$
$p_{2}$
$p_{1}$
$p_{0}$

## Illustration Graham-Scan


Stack:
$p_{10}$
$p_{9}$
$p_{6}$
$p_{2}$
$p_{1}$
$p_{0}$

## Illustration Graham-Scan


Stack:
$p_{11}$
$p_{9}$
$p_{6}$
$p_{2}$
$p_{1}$
$p_{0}$

## Illustration Graham-Scan


Stack:
$p_{12}$
$p_{11}$
$p_{9}$
$p_{6}$
$p_{2}$
$p_{1}$
$p_{0}$

## Illustration Graham-Scan


Stack:
$p_{13}$
$p_{11}$
$p_{9}$
$p_{6}$
$p_{2}$
$p_{1}$
$p_{0}$

## Illustration Graham-Scan



Stack:
$p_{11}$
$p_{9}$
$p_{6}$
$p_{2}$
$p_{1}$
$p_{0}$

## Illustration Graham-Scan



Stack:
$p_{14}$
$p_{9}$
$p_{6}$
$p_{2}$
$p_{1}$
$p_{0}$

## Illustration Graham-Scan


Stack:
$p_{15}$
$p_{14}$
$p_{9}$
$p_{6}$
$p_{2}$
$p_{1}$
$p_{0}$

## Illustration Graham-Scan



Stack:
$p_{15}$
$p_{14}$
$p_{9}$
$p_{6}$
$p_{2}$
$p_{1}$
$p_{0}$

## Analysis

Runtime of the algorithm Graham-Scan

- Sorting $\mathcal{O}(n \log n)$
- $n$ Iterations of the for-loop
- Amortized analysis of the multipop on a stack: amortized constant runtime of mulitpop, same here: amortized constant runtime of the While-loop.
Overal $\mathcal{O}(n \log n)$


### 24.3 Intersection of Line Segments

## Preparation: Overlapping Intervals



Questions:
■ How many intervals overlap maximally?

## Preparation: Overlapping Intervals



Questions:
■ How many intervals overlap maximally?

- Which intervals (don't) get wet?


## Preparation: Overlapping Intervals



Questions:
■ How many intervals overlap maximally?
■ Which intervals (don't) get wet?

- Which intervals are directly on top of each other?


## Preparation: Overlapping Intervals



Idea of a sweep line: vertical line, moving in $x$-direction, observes the geometric objects.

## Preparation: Overlapping Intervals



Event list: list of points where the state observed by the sweepline changes.

## Preparation: Overlapping Intervals



Q: How many intervals overlap maximally?

## Preparation: Overlapping Intervals



Q: How many intervals overlap maximally?

Sweep line controls a counter that is incremented (decremented) at the left (right) end point of an interval.

## Preparation: Overlapping Intervals



Q: How many intervals overlap maximally?

Sweep line controls a counter that is incremented (decremented) at the left (right) end point of an interval.

A: maximum counter value

## Preparation: Overlapping Intervals



## Q: Which intervals get wet?

## Preparation: Overlapping Intervals



Q: Which intervals get wet?

Sweep line controls a binary search tree that comprises the intervals according to their vertical ordering.

## Preparation: Overlapping Intervals



Q: Which intervals get wet?

Sweep line controls a binary search tree that comprises the intervals according to their vertical ordering.
A: intervalls on the very left of the tree.

## Preparation: Overlapping Intervals



Q: Which intervals are neighbours?

## Preparation: Overlapping Intervals



Q: Which intervals are neighbours?

A: intervalls on the very left of the tree.

Cutting many line segments


## Sweepline Principle



## Simplifying Assumptions

■ No vertical line segments
■ Each intersection is formed by at most two line segments.

## (Vertical) Ordering line segments



Preorder (partial order without anti-symmetry)

$$
\begin{aligned}
& s_{2} \prec_{h_{1}} s_{1} \\
& s_{1} \prec_{h_{2}} s_{2} \\
& s_{2} \prec_{h_{2}} s_{1} \\
& s_{3} \prec_{h_{2}} s_{2}
\end{aligned}
$$

W.r.t. $h_{3}$ the line segments are uncomparable.

[^0]
## Observation: two cases


(a) Intersecting line segments are neighbours w.r.t. quasi-order from above directly from the start.

(b) Intersecting line segments are neighbours w.r.t. quasi-order from above after the last segment between them ends.

## Observation: possible misunderstanding



It does not suffice to compare the $y$-coordinates of starting points of lines. Positions on the sweep line have to be compared.

## Moving the sweepline

■ Sweep-Line Status : Relationship of all objects intersected by sweep-line
■ Event List : Series of event positions, sorted by $x$-coordinate. Sweep-line travels from left to right and stops at each event position.

## Sweep-Line Status

Preorder $T$ of the intersected line segments
Required operations:
■ Insert( $T, s$ ) Insert line segment $s$ in $T$
■ Delete $(T, s)$ Remove $s$ from $T$
■ Above( $T, s$ ) Return line segment immediately above of $s$ in $T$
■ Below( $T, s$ ) Return line segment immediately below of $s$ in $T$
Possible Implementation:

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Possible Implementation: Blanced tree (AVL-Tree, Red-Black Tree etc.)

## Algorithm Any-Segments-Intersect(S)

Input: List of $n$ line segments $S$
Output: Returns if $S$ contains intersecting segments
$T \leftarrow \emptyset$
Sort endpoints of line segments in $S$ from left to right (left before right and lower before upper)
for Sorted end points $p$ do
if $p$ left end point of a segment $s$ then
Insert $(T, s)$
if $\operatorname{Above}(T, s) \cap s \neq \emptyset \vee \operatorname{Below}(T, s) \cap s \neq \emptyset$ then return true
if $p$ right end point of a segment $s$ then
if $\operatorname{Above}(T, s) \cap \operatorname{Below}(T, s) \neq \emptyset$ then return true
Delete $(T, s)$
return false;

Illustration


## Analysis

Runtime of the algorithm Any-Segments-Intersect

- Sorting $\mathcal{O}(n \log n)$

■ $2 n$ iterations of the for loop. Each operation on the balanced tree $\mathcal{O}(\log n)$
Overal $\mathcal{O}(n \log n)$
24.4 Closest Point Pair

## Closest Point Pair

Euclidean Distance $d(s, t)$ of two points $s$ and $t$ :

$$
\begin{aligned}
d(s, t) & =\|s-t\|_{2} \\
& =\sqrt{\left(s_{x}-t_{x}\right)^{2}+\left(s_{y}-t_{y}\right)^{2}}
\end{aligned}
$$

Problem: Find points $p$ and $q$ from $Q$ for which

$$
d(p, q) \leq d(s, t) \forall s, t \in Q, s \neq t
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Naive: all $\binom{n}{2}=\Theta\left(n^{2}\right)$ point pairs.

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## Divide And Conquer

■ Set of points $P$, starting with $P \leftarrow Q$

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- Set of points $P$, starting with $P \leftarrow Q$
- Arrays $X$ and $Y$, containing the elements of $P$, sorted by $x$ - and $y$-coordinate, respectively.
- Partition point set into two (approximately) equally sized sets $P_{L}$ and $P_{R}$, separated by a vertical line through a point of $P$.



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- Arrays $X$ and $Y$, containing the elements of $P$, sorted by $x$ - and $y$-coordinate, respectively.
- Partition point set into two (approximately) equally sized sets $P_{L}$ and $P_{R}$, separated by a vertical line through a point of $P$.
- Split arrays $X$ and $Y$ accrodingly in $X_{L}$, $X_{R} . Y_{L}$ and $Y_{R}$.



## Divide And Conquer

■ Recursive call with $P_{L}, X_{L}, Y_{L}$ and $P_{R}, X_{R}, Y_{R}$. Yields minimal distances $\delta_{L}$, $\delta_{R}$.


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■ Recursive call with $P_{L}, X_{L}, Y_{L}$ and $P_{R}, X_{R}, Y_{R}$. Yields minimal distances $\delta_{L}$, $\delta_{R}$.
■ (If only $k \leq 3$ points: compute the minimal distance directly)

## Divide And Conquer

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■ (If only $k \leq 3$ points: compute the minimal distance directly)

- After recursive call $\delta=\min \left(\delta_{L}, \delta_{R}\right)$. Combine (next slides) and return best result.



## Combine

■ Generate an array $Y^{\prime}$ holding $y$-sorted points from $Y$, that are located within a $2 \delta$ band around the dividing line


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## Combine

■ Generate an array $Y^{\prime}$ holding $y$-sorted points from $Y$, that are located within a $2 \delta$ band around the dividing line

- Consider for each point $p \in Y^{\prime}$ the maximally seven points after $p$ with $y$-coordinate distance less than $\delta$. Compute minimal distance $\delta^{\prime}$.
■ If $\delta^{\prime}<\delta$, then a closer pair in $P$ than in $P_{L}$ and $P_{R}$ found. Return minimal distance.



## Maximum number of points in the $2 \delta$-rectangle



Two points in the $\delta / 2 \times \delta / 2$-rectangle have maximum distance $\frac{\sqrt{2}}{2} \delta<\delta$. $\Rightarrow$ Square with side length $\delta / 2$ contains a maximum of one point. Eight non-overlapping $\delta / 2 \times \delta / 2$-Rectangles span the $2 \delta \times \delta$ rectangle.

## Implementation

■ Goal: recursion equation (runtime) $T(n)=2 \cdot T\left(\frac{n}{2}\right)+\mathcal{O}(n)$.
■ Consequence: forbidden to sort in each steps of the recursion.
■ Non-trivial: only arrays $Y$ and $Y^{\prime}$
■ Idea: merge reversed: run through $Y$ that is presorted by $y$-coordinate. For each element follow the selection criterion of the $x$-coordinate and append the element either to $Y_{L}$ or $Y_{R}$. Same procedure for $Y^{\prime}$. Runtime $\mathcal{O}(|Y|)$.
Overal runtime: $\mathcal{O}(n \log n)$.


[^0]:    ${ }^{37}$ No anti-symmetry: $s \prec t \wedge t \prec s \nRightarrow s=t$

