## UCRIVERSIDE

## CS133 Computational Geometry <br> Convex Hull

## Convex Hull

, Given a set of $n$ points, find the minimal convex polygon that contains all the points


## Convex Hull Properties



## Convex Hull Representation

, The convex hull is represented by all its points sorted in CW/CCW order
> Special case: Three collinear points


## Naïve Convex Hull Algorithm

, Iterate over all possible line segments
, A line segment is part of the convex hull if all other points are to its left
, Emit all segments in a CCW order
> Running time $O\left(n^{3}\right)$

## Naïve Convex Hull Algorithm



## Graham Scan Algorithm



## Graham Scan Algorithm



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## Example





## Graham Scan Pseudo Code

, Select the point with minimum $y$
, Sort all points in CCW order $\left\{p_{0}, p_{1}, \ldots, p_{n}\right\}$
> $S=\left\{p_{0}, p_{1}\right\}$
> For $i=2$ to $n$
, While $|S|>2 \& \& p_{i}$ is to the right of $S_{-2}, S_{-1}$
, S.pop
, S.push $\left(p_{i}\right)$

## Monotone Chain Algorithm

, Has some similarities with Graham scan algorithm
> Instead of sorting in CCW order, it sorts by one coordinate (e.g., x-coordinates)


## Example



## Pseudo Code

, Sort $S$ by $x$
> $U=\left\{S_{0}\right\}$
, For $i=1$ to $n$
$>$ while $|U|>1 \& \& S_{i}$ is to the left of $\overrightarrow{U_{-2} U_{-1}}$
, U.pop
> U.push $\left(S_{i}\right)$
> $L=\left\{S_{0}\right\}$
, While $|L|>1 \& \& S_{i}$ is to the right of $\overrightarrow{L_{-2} L_{-1}}$
> L.pop
> L.push $\left(S_{i}\right)$

## Gift Wrapping Algorithm

> Start with a point on the convex hull
, Find more points on the hull one at a time
> Terminate when the first point is reached back
, Also knows as Jarvi's March Algorithm


## Gift Wrapping Example



## Gift Wrapping Example



## Gift Wrapping Example



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## Gift Wrapping Example



## Gift Wrapping Example



## Gift Wrapping Example



## Gift Wrapping Pseudo Code

, Gift Wrapping(S)
, $\mathrm{CH}=\{ \}$
, CH << Left most point
, do
, Start point $=$ CH.last
, End point $=\mathrm{CH}[0]$
> For each point $s \in S$
> If Start point = End Point OR
s is to the left of $\overrightarrow{\text { Start point, End point }}$
> End point = s
> $\mathrm{CH} \ll$ End point
> Running time $O(n \cdot k)$

## Divide \& Conquer Convex Hull

> ConvexHull(S)
, Splits S into two subsets S1 and S2
, Ch1 = ConvexHull(S1)
, Ch2 = ConvexHull(S2)
, Return Merge(Ch1, Ch2)


## Divide \& Conquer Convex Hull

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## Merge: Upper Tangent



## Merge: Upper Tangent



## Merge: Upper Tangent



## Merge: Lower Tangent



## Merge: Lower Tangent



## Merge: Lower Tangent



## Merge: Lower Tangent



## Merge: Lower Tangent



## Merge: Lower Tangent



## Merge Step

, Upper Tangent $(L, R)$
> $P_{i}=$ Right most point in $L$
> $P_{j}=$ Left most point in $R$
Do
) Done = true
, While $P_{i+1}$ is to the right of $\overrightarrow{p_{j} p_{i}}$
> $i++$; done $=$ false
, While $P_{j-1}$ is to the left of $\overrightarrow{p_{i} p_{j}}$
> $j-$-; done = false

## Analysis

, Sort step: $O(n \cdot \log n)$
> Merge step: $O(n)$
, Recursive part
> $T(n)=2 T\left(\frac{n}{2}\right)+c \cdot n$
> $T(n)=O(n \cdot \log n)$
> Overall running time $O(n \cdot \log n)$

## Incremental Convex Hull

> Start with an initial convex hull
> Add one additional point to the convex hull
> Given a convex hull CH and a point p , how to compute the convex hull of $\{\mathrm{CH}, \mathrm{p}\}$ ?
> Think: Insert an element into a sorted list

## Case 1: p inside CH



## Case 2: p on CH



## Case 3: p outside CH



## Case 3: p outside CH



# Analysis of the Insert Function 

> Test whether the point is inside, outside, or on the polygon $\mathrm{O}(\mathrm{n})$
> Find the two tangents $\mathrm{O}(\mathrm{n})$
> A more efficient algorithm can have an amortized running time of $\mathrm{O}(\log n)$

## Quick Hull

, If we can have a divide-and-conquer algorithm similar to merge sort ...
, why not having an algorithm similar to quick sort?
, Sketch
, Find a pivot
, Split the points along the pivot
, Recursively process each side

## Quick Hull



## Quick Hull



How to split the points across the line segment?

## Quick Hull



How to select the farthest point?

## Quick Hull



## Quick Hull



## Quick Hull



How to split the points into three subsets?

## Quick Hull



## Quick Hull



## Quick Hull



## Quick Hull



## Quick Hull



## Quick Hull



## Quick Hull



## Example



## Running Time Analysis

$\Rightarrow T(n)=T\left(n_{1}\right)+T\left(n_{2}\right)+O(n)$
, Worst case $n_{1}=n-k$ or $n_{2}=n-k$, where $k$ is a small constant (e.g., $\mathrm{k}=1$ )

$$
T(n)=O\left(n^{2}\right)
$$

, Best case $n_{1}=k$ and $n_{2}=k$, where $k$ is a small constant
> In this case, most of the points are pruned

$$
\Rightarrow T(n)=O(n)
$$

> Average case, $n_{1}=\alpha n$ and $n_{2}=\beta n$, where $\alpha<$ 1 and $\beta<1$
, $T(n)=O(n \log n)$

