## Computational Geometry

## Lecture 9: <br> Convex Hulls in 3D <br> Or <br> Mixing More Things

Part I:
Complexity \& Visibility

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## Construction

randomized-incremental!


## Visibility



## Visibility



## Visibility

${ }^{p}$


Visibility

- $p$



## Visibility



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## Visibility

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Part II:
Randomized Incremental Algorithm

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## Rand3DConvexHull $\left(P \subset \mathbb{R}^{3}\right)$

pick non-coplanar set $P^{\prime}=\left\{p_{1}, \ldots, p_{4}\right\} \subseteq P$ $C \leftarrow \mathrm{CH}\left(P^{\prime}\right)$
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Worst-case running time:

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## Computational Geometry

## Lecture 9: <br> Convex Hulls in 3D <br> Or <br> Mixing More Things

Part III:<br>Analysis

## Analysis

Idea. Bound expected structural change

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=4+\sum_{r=5}^{n} E\left[\# \text { facets incident to } p_{r} \text { in } \mathrm{CH}\left(P_{r}\right)\right]
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\operatorname{deg}\left(p_{r}, \mathrm{CH}\left(P_{r}\right)\right)
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For $r>4$ :
$\operatorname{deg}\left(p_{r}, \mathrm{CH}\left(P_{r}\right)\right)$
$E\left[\operatorname{deg}\left(p_{r}, \mathrm{CH}\left(P_{r}\right)\right)\right]=$

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$\leq \frac{1}{r-4}\left[\left(\sum_{i=1}^{r} \operatorname{deg}\left(p_{i}\right)\right)-12\right]$

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$$
\begin{gathered}
\leq \frac{1}{r-4}[(\underbrace{\left.\sum_{i=1}^{r} \operatorname{deg}\left(p_{i}\right)\right)}_{i=1}-12] \\
2 \cdot \text { edges of } \mathrm{CH}\left(P_{r}\right)
\end{gathered}
$$

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& \leq \frac{1}{r-4}[(\underbrace{\left.\sum_{i=1}^{r} \operatorname{deg}\left(p_{i}\right)\right)}_{i=1}-12] \\
& \quad 2 \cdot \# \text { edges of } \mathrm{CH}\left(P_{r}\right) \\
& \leq \frac{1}{r-4}[2 \cdot(3 r-6)-12]
\end{aligned}
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$\leq \frac{1}{r-4}[(\underbrace{\left.\sum_{i=1}^{r} \operatorname{deg}\left(p_{i}\right)\right)}-12]$
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## Running Time

## Theorem. The convex hull of a set of $n$ pts in $\mathbb{R}^{3}$ can be computed in $O(\quad)$ expected time.

```
Rand3DConvexHull \(\left(P \subset \mathbb{R}^{3}\right)\)
    pick non-coplanar set \(P^{\prime}=\left\{p_{1}, \ldots, p_{4}\right\} \subseteq P\)
    \(C \leftarrow \mathrm{CH}\left(P^{\prime}\right)\)
    compute rand. perm. \(\left(p_{5}, \ldots, p_{n}\right)\) of \(P \backslash P^{\prime}\)
    initialize conflict graph \(G\)
    for \(r=5\) to \(n\) do
    if \(F_{\text {conflict }}\left(p_{r}\right) \neq \varnothing\) then
        delete all facets in \(F_{\text {conflict }}\left(p_{r}\right)\) from C
        \(\mathcal{L} \leftarrow\) list of horizon edges visible from \(p_{r}\)
        foreach \(e \in \mathcal{L}\) do
        \(f \leftarrow\) C.create_facet \(\left(e, p_{r}\right)\); create vtx for \(f\) in \(G\)
        \(\left(f_{1}, f_{2}\right) \leftarrow\) previously _incident \({ }_{C}(e)\)
        \(P(e) \leftarrow P_{\text {conflict }}\left(f_{1}\right) \cup P_{\text {conflict }}\left(f_{2}\right)\)
        foreach \(p \in P(e)\) do
            if \(f\) visible from \(p\) then add edge \((p, f)\) to \(G\)
        delete vtc \(\left\{p_{r}\right\} \cup F_{\text {conflict }}\left(p_{r}\right)\) from \(G\)
    return \(C\)
```


## Running Time

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## Running Time

## Theorem. The convex hull of a set of $n$ pts in $\mathbb{R}^{3}$ can be computed in $O(\quad)$ expected time.

```
time
Rand3DConvexHull(P\subset\mp@subsup{\mathbb{R}}{}{3})
    pick non-coplanar set }\mp@subsup{P}{}{\prime}={\mp@subsup{p}{1}{},\ldots,\mp@subsup{p}{4}{}}\subseteq
    C}\leftarrow\textrm{CH}(\mp@subsup{P}{}{\prime}
    compute rand. perm. ( }\mp@subsup{p}{5}{},\ldots,\mp@subsup{p}{n}{})\mathrm{ of }P\\mp@subsup{P}{}{\prime
    initialize conflict graph G
    for }r=5\mathrm{ to }n\mathrm{ do
        if F}\mp@subsup{F}{\mathrm{ conflict }}{}(\mp@subsup{p}{r}{})\not=\varnothing\mathrm{ then
        delete all facets in F}\mp@subsup{F}{\mathrm{ conflict }}{}(\mp@subsup{p}{r}{})\mathrm{ from C
        \mathcal { L } \leftarrow \text { list of horizon edges visible from } p _ { r }
        foreach e}e\in\mathcal{L}\mathrm{ do
            f\leftarrowC.create_facet (e, pr ); create vtx for f in G
            (f1, f2)\leftarrow previously_incident }\mp@subsup{C}{C}{(e)
            P(e)\leftarrow P conflict }(\mp@subsup{f}{1}{})\cup\mp@subsup{P}{\mathrm{ conflict }}{}(\mp@subsup{f}{2}{}
            foreach p\inP(e) do
                    if f}\mathrm{ visible from p then add edge (p,f) to G
            delete vtc { {pr }\cup F conflict ( }\mp@subsup{p}{r}{})\mathrm{ from G
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## Running Time

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Stage $r$ of for-loop (w/o foreach loop)

## Running Time

## Theorem. The convex hull of a set of $n$ pts in $\mathbb{R}^{3}$ can be computed in $O(\quad)$ expected time.

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```

Stage $r$ of for-loop (w/o foreach loop) takes time $O\left(\left|F_{\text {conflict }}\left(p_{r}\right)\right|\right)=$

## Running Time

## Theorem. The convex hull of a set of $n \mathrm{pts}$ in $\mathbb{R}^{3}$ can be computed in $O(\quad)$ expected time.

```
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            foreach p\inP(e) do
                    if f}\mathrm{ visible from }p\mathrm{ then add edge (p,f) to G
            delete vtc { }\mp@subsup{p}{r}{}}\cup\mp@subsup{F}{\mathrm{ conflict }}{}(\mp@subsup{p}{r}{})\mathrm{ from G
    return C
```

Stage $r$ of for-loop (w/o foreach loop) takes time $O\left(\left|F_{\text {conflict }}\left(p_{r}\right)\right|\right)=$ $O\left(\# f a c e t s\right.$ del. when adding $\left.p_{r}\right)$

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            f\leftarrowC.create_facet(e, pr ); create vtx for f in G
            (f},\mp@subsup{f}{2}{})\leftarrow\mathrm{ previously_incident }(C
            P(e)}\leftarrow\mp@subsup{P}{\mathrm{ conflict }}{}(\mp@subsup{f}{1}{})\cup\mp@subsup{P}{\mathrm{ conflict }}{}(\mp@subsup{f}{2}{}
            foreach p\inP(e) do
                    if f}\mathrm{ visible from p}\mathrm{ then add edge (p,f) to G
            delete vtc { }\mp@subsup{p}{r}{}}\cup\mp@subsup{F}{\mathrm{ conflict }}{}(\mp@subsup{p}{r}{})\mathrm{ from G
    return C
```

Stage $r$ of for-loop (w/o foreach loop) takes time $O\left(\left|F_{\text {conflict }}\left(p_{r}\right)\right|\right)=$
$O$ (\#facets del. when adding $p_{r}$ )
This part of for-loop in total:

## Running Time

## Theorem. The convex hull of a set of $n \mathrm{pts}$ in $\mathbb{R}^{3}$ can be computed in $O(\quad)$ expected time.

Rand3DConvexHull $\left(P \subset \mathbb{R}^{3}\right)$
pick non-coplanar set $P^{\prime}=\left\{p_{1}, \ldots, p_{4}\right\} \subseteq P$
$C \leftarrow \mathrm{CH}\left(P^{\prime}\right)$
compute rand. perm. $\left(p_{5}, \ldots, p_{n}\right)$ of $P \backslash P^{\prime}$
initialize conflict graph $G$
for $r=5$ to $n$ do
if $F_{\text {conflict }}\left(p_{r}\right) \neq \varnothing$ then
delete all facets in $F_{\text {conflict }}\left(p_{r}\right)$ from C
$\mathcal{L} \leftarrow$ list of horizon edges visible from $p_{r}$
foreach $e \in \mathcal{L}$ do
$f \leftarrow$ C.create_facet $\left(e, p_{r}\right)$; create vtx for $f$ in $G$
$\left(f_{1}, f_{2}\right) \leftarrow$ previously_incident ${ }_{C}(e)$
$P(e) \leftarrow P_{\text {conflict }}\left(f_{1}\right) \cup P_{\text {conflict }}\left(f_{2}\right)$
foreach $p \in P(e)$ do
if $f$ visible from $p$ then add edge $(p, f)$ to $G$
delete vtc $\left\{p_{r}\right\} \cup F_{\text {conflict }}\left(p_{r}\right)$ from $G$
return $C$

Stage $r$ of for-loop (w/o foreach loop) takes time $O\left(\left|F_{\text {conflict }}\left(p_{r}\right)\right|\right)=$
$O$ (\#facets del. when adding $p_{r}$ )
This part of for-loop in total:
$E[\#$ facets deleted $]=$

## Running Time

Theorem. The convex hull of a set of $n$ pts in $\mathbb{R}^{3}$ can be computed in $O$ (
) expected time.

```
Rand3DConvexHull( }P\subset\mp@subsup{\mathbb{R}}{}{3}
    pick non-coplanar set }\mp@subsup{P}{}{\prime}={\mp@subsup{p}{1}{},\ldots,\mp@subsup{p}{4}{}}\subseteq
    C}\leftarrow\textrm{CH}(\mp@subsup{P}{}{\prime}
    compute rand. perm. ( }\mp@subsup{p}{5}{},\ldots,\mp@subsup{p}{n}{})\mathrm{ of }P\\mp@subsup{P}{}{\prime
    initialize conflict graph G
    for r=5 to }n\mathrm{ do
        if }\mp@subsup{F}{\mathrm{ conflict }}{}(\mp@subsup{p}{r}{})\not=\varnothing\mathrm{ then
            delete all facets in F}\mp@subsup{F}{\mathrm{ conflict }}{}(\mp@subsup{p}{r}{})\mathrm{ from C
            \mathcal { L } \leftarrow \text { list of horizon edges visible from } p _ { r }
            foreach }e\in\mathcal{L}\mathrm{ do
                f\leftarrowC.create_facet (e, pr); create vtx for f in G
                (f1,f2)\leftarrow previously_incident 
        P ( e ) \leftarrow P P _ { \text { conflict } } ( f _ { 1 } ) \cup P _ { \text { conflict } } ( f _ { 2 } )
            foreach }p\inP(e)\mathrm{ do
                    if f}\mathrm{ visible from }p\mathrm{ then add edge }(p,f)\mathrm{ to G
            delete vtc }{\mp@subsup{p}{r}{}}\cup\mp@subsup{F}{\mathrm{ conflict }}{}(\mp@subsup{p}{r}{})\mathrm{ from G
    return C
```

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This part of for-loop in total:
E[\#facets deleted] $=$
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## Running Time

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            \(f \leftarrow\) C.create_facet \(\left(e, p_{r}\right)\); create \(v \operatorname{tx}\) for \(f\) in \(G\)
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            foreach \(p \in P(e)\) do
                    if \(f\) visible from \(p\) then add edge \((p, f)\) to \(G:\) in total:
            delete vtc \(\left\{p_{r}\right\} \cup F_{\text {conflict }}\left(p_{r}\right)\) from \(G\)
    return \(C\)
    Stage $r$ of for-loop (w/o foreach loop) takes time $O\left(\left|F_{\text {conflict }}\left(p_{r}\right)\right|\right)=$
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- in stage $r: O\left(\sum_{e \in \mathcal{L}}|P(e)|\right)$
- in total:


## Running Time

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            foreach \(p \in P(e)\) do
                if \(f\) visible from \(p\) then add edge \((p, f)\) to \(G\) in total:
            delete voc \(\left\{p_{r}\right\} \cup F_{\text {conflict }}\left(p_{r}\right)\) from \(G\)
    return \(C\)
    Stage $r$ of for-loop (who foreach loop) takes time $O\left(\left|F_{\text {conflict }}\left(p_{r}\right)\right|\right)=$
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This part of for-loop in total:
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Lemma
Outer foreach-loop:

- in stage $r: O\left(\sum_{e \in \mathcal{L}}|P(e)|\right)$
- in total:
$O\left(\sum_{e \text { on horizon at some time }}|P(e)|\right)$


## Running Time

Theorem. The convex hull of a set of $n$ pts in $\mathbb{R}^{3}$ can be computed in $O(\quad)$ expected time.

```
Rand3DConvexHull \(\left(P \subset \mathbb{R}^{3}\right)\)
    pick non-coplanar set \(P^{\prime}=\left\{p_{1}, \ldots, p_{4}\right\} \subseteq P\)
    \(C \leftarrow \mathrm{CH}\left(P^{\prime}\right)\)
    compute rand. perm. \(\left(p_{5}, \ldots, p_{n}\right)\) of \(P \backslash P^{\prime}\)
    initialize conflict graph \(G\)
    for \(r=5\) to \(n\) do
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    if \(F_{\text {conflict }}\left(p_{r}\right) \neq \varnothing\) then
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            \(f \leftarrow\) C.create_facet \(\left(e, p_{r}\right)\); create vtx for \(f\) in \(G\)
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            foreach \(p \in P(e)\) do
                    if \(f\) visible from \(p\) then add edge \((p, f)\) to \(G\)
            delete vtc \(\left\{p_{r}\right\} \cup F_{\text {conflict }}\left(p_{r}\right)\) from \(G\)
    return \(C\)
            C
    Stage $r$ of for-loop (w/o foreach loop) takes time $O\left(\left|F_{\text {conflict }}\left(p_{r}\right)\right|\right)=$
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This part of for-loop in total:
$E[\#$ facets deleted $]=$
$\leq E[\#$ facets created $]=O(n)$.
Lemma
Outer foreach-loop:

- in stage $r: O\left(\sum_{e \in \mathcal{L}}|P(e)|\right)$
- in total:

$$
\begin{aligned}
& O\left(\sum_{e \text { on horizon at some time }}|P(e)|\right) \\
& =O\left(n^{2}\right)
\end{aligned}
$$

## Running Time

Theorem. The convex hull of a set of $n$ pts in $\mathbb{R}^{3}$ can be computed in $O(\quad)$ expected time.

```
Rand3DConvexHull \(\left(P \subset \mathbb{R}^{3}\right)\)
    pick non-coplanar set \(P^{\prime}=\left\{p_{1}, \ldots, p_{4}\right\} \subseteq P\)
    \(C \leftarrow \mathrm{CH}\left(P^{\prime}\right)\)
    compute rand. perm. \(\left(p_{5}, \ldots, p_{n}\right)\) of \(P \backslash P^{\prime}\)
    initialize conflict graph \(G\)
    for \(r=5\) to \(n\) do
```

    if \(F_{\text {conflict }}\left(p_{r}\right) \neq \varnothing\) then
        delete all facets in \(F_{\text {conflict }}\left(p_{r}\right)\) from C
        \(\mathcal{L} \leftarrow\) list of horizon edges visible from \(p_{r}\)
        foreach \(e \in \mathcal{L}\) do
            \(f \leftarrow\) C.create_facet \(\left(e, p_{r}\right)\); create vtx for \(f\) in \(G\)
            \(\left(f_{1}, f_{2}\right) \leftarrow\) previously_incident \({ }_{C}(e)\)
            \(P(e) \leftarrow P_{\text {conflict }}\left(f_{1}\right) \cup P_{\text {conflict }}\left(f_{2}\right)\)
            foreach \(p \in P(e)\) do
                    if \(f\) visible from \(p\) then add edge \((p, f)\) to \(G\)
            delete vtc \(\left\{p_{r}\right\} \cup F_{\text {conflict }}\left(p_{r}\right)\) from \(G\)
    return \(C\)
    using configuration spaces, Section 9.5 [Comp. Geom A\&A]
    Stage $r$ of for-loop (w/o foreach loop) takes time $O\left(\left|F_{\text {conflict }}\left(p_{r}\right)\right|\right)=$
$O$ (\#facets del. when adding $p_{r}$ )
This part of for-loop in total:
$E[\#$ facets deleted $]=$
$\leq E[\#$ facets created $]=O(n)$.
Lemma
Outer foreach-loop:

- in stage $r: O\left(\sum_{e \in \mathcal{L}}|P(e)|\right)$
- in total:
$O\left(\sum_{e \text { on horizon at some time }}|P(e)|\right)$
$=O\left(n^{2}\right)$


## Running Time

Theorem. The convex hull of a set of $n$ pts in $\mathbb{R}^{3}$ can be computed in $O(\quad)$ expected time.

```
Rand3DConvexHull \(\left(P \subset \mathbb{R}^{3}\right)\)
    pick non-coplanar set \(P^{\prime}=\left\{p_{1}, \ldots, p_{4}\right\} \subseteq P\)
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    for \(r=5\) to \(n\) do
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This part of for-loop in total:
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- in stage $r: O\left(\sum_{e \in \mathcal{L}}|P(e)|\right)$
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$O\left(\sum_{e \text { on horizon at some time }}|P(e)|\right)$
$=O\left(n^{2}\right) O(n \log n)$


## Running Time

Theorem. The convex hull of a set of $n$ pts in $\mathbb{R}^{3}$ can be computed in $O(n \log n)$ expected time.

```
Rand3DConvexHull \(\left(P \subset \mathbb{R}^{3}\right)\)
    pick non-coplanar set \(P^{\prime}=\left\{p_{1}, \ldots, p_{4}\right\} \subseteq P\)
    \(C \leftarrow \mathrm{CH}\left(P^{\prime}\right)\)
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        \(P(e) \leftarrow P_{\text {conflict }}\left(f_{1}\right) \cup P_{\text {conflict }}\left(f_{2}\right)\)
        foreach \(p \in P(e)\) do
            if \(f\) visible from \(p\) then add edge \((p, f)\) to \(G\) in total:
        delete vtc \(\left\{p_{r}\right\} \cup F_{\text {conflict }}\left(p_{r}\right)\) from \(G\)
    return \(C\)
    using configuration spaces, Section 9.5 [Comp. Geom A\&A]

Stage $r$ of for-loop (w/o foreach loop) takes time $O\left(\left|F_{\text {conflict }}\left(p_{r}\right)\right|\right)=$
$O$ (\#facets del. when adding $p_{r}$ )
This part of for-loop in total:
$E[\#$ facets deleted $]=$
$\leq E[\#$ facets created $]=O(n)$.

## Lemma

Outer foreach-loop:

- in stage $r: O\left(\sum_{e \in \mathcal{L}}|P(e)|\right)$
- in total:
$O\left(\sum_{e \text { on horizon at some time }}|P(e)|\right)$
$=O\left(n^{2}\right) O(n \log n)$


## Running Time



Theorem. The convex hull of a set of $n$ pts in $\mathbb{R}^{3}$ can be computed in $O(n \log n)$ expected time.

if $F_{\text {conflict }}\left(p_{r}\right) \neq \varnothing$ then
delete all facets in $F_{\text {conflict }}\left(p_{r}\right)$ from C
$\mathcal{L} \leftarrow$ list of horizon edges visible from $p_{r}$
foreach $e \in \mathcal{L}$ do
$f \leftarrow$ C.create_facet $\left(e, p_{r}\right)$; create vtx for $f$ in $G$
$\left(f_{1}, f_{2}\right) \leftarrow$ previously_incident $_{C}(e)$
$P(e) \leftarrow P_{\text {conflict }}\left(f_{1}\right) \cup P_{\text {conflict }}\left(f_{2}\right)$
foreach $p \in P(e)$ do
if $f$ visible from $p$ then add edge $(p, f)$ to $G$ in total:
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return $C$
using configuration spaces, Section 9.5 [Comp. Geom A\&A]
$O\left(n^{[d / 2\rfloor}\right)$ Stage $r$ of for-loop (w/o foreach loop) takes time $O\left(\left|F_{\text {conflict }}\left(p_{r}\right)\right|\right)=$ $O$ (\#facets del. when adding $p_{r}$ )
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## Lemma

Outer foreach-loop:

- in stage $r: O\left(\sum_{e \in \mathcal{L}}|P(e)|\right)$
$O\left(\sum_{e \text { on horizon at some time }}|P(e)|\right)$
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## Computational Geometry

Lecture 9:<br>Convex Hulls in 3D<br>Or<br>Mixing More Things

Part IV:
Half-Space Intersections

## Convex Hulls and Half-Space Intersections Plane

Convex Hulls and Half-Space Intersections
Define dualtity $\star$ between pts and (non-vertical) lines:

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Observe. Let $p \in \mathbb{R}^{2}$ and let $\ell$ be a non-vertical line.

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Observe. $\square$ upper convex hulls of pts $\leftrightarrow$ lower env. of lines

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- can compute inters. of "lower/upper" half planes (spaces) via upper/lower convex hulls


## Computational Geometry

## Lecture 9: <br> Convex Hulls in 3D <br> Or

Mixing More Things
Part V:
Voronoi Diagrams Revisited

## Voronoi Diagrams Revisited

Let $U: z=x^{2}+y^{2}$ be the unit paraboloid in $\mathbb{R}^{3}$.



Yoronoi Diagram/s Revisited Let $U: z=x^{2}+y^{2}$ be the unit paraboloid in $\mathbb{R}^{3}$.

$$
p=\left(p_{x}, p_{y}, 0\right)
$$

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Note that $p^{\prime} \in h(p)$.

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p=\left(p_{x}, p_{y}, 0\right)
$$

$$
|p q|=\sqrt{\left(q_{x}-p_{x}\right)^{2}+\left(q_{y}-p_{y}\right)^{2}}
$$

$$
q(p)=\left(q_{x}, q_{y}, 2 p_{x} q_{x}+2 p_{y} q_{y}-\left(p_{x}^{2}+p_{y}^{2}\right)\right)
$$

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Note that $p^{\prime} \in h(p)$.

$$
\begin{aligned}
z_{q^{\prime}}-z_{q(p)} & p=\left(p_{x}, p_{y}, 0\right) \\
& q(p)=\left(q_{x}, q_{y}, 2 p_{x} q_{x}+2 p_{y} q_{y}-\left(p_{x}^{2}+p_{y}^{2}\right)\right)
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$z_{q^{\prime}}-z_{q(p)}$
$q_{x}^{2}+q_{y}^{2}-2 p_{x} q_{x}-2 p_{y} q_{y}+\left(p_{x}^{2}+p_{y}^{2}\right)$

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$p=\left(p_{x}, p_{y}, 0\right)$
$|p q|=\sqrt{\left(q_{x}-p_{x}\right)^{2}+\left(q_{y}-p_{y}\right)^{2}}$
$\rho^{\prime}(p)=\left(q_{x}, q_{y}, 2 p_{x} q_{x}+2 p_{y} q_{y}-\left(p_{x}^{2}+p_{y}^{2}\right)\right)$
$q_{x}^{2}+q_{y}^{2}-2 p_{x} q_{x}-2 p_{y} q_{y}+\left(p_{x}^{2}+p_{y}^{2}\right)$
$\left(q_{x}^{2}-2 p_{x} q_{x}+p_{x}^{2}\right)+\left(q_{y}^{2}-2 p_{y} q_{y}+p_{y}^{2}\right)$

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$$
\begin{aligned}
& z_{q^{\prime}}-z_{q(p)} \\
& =|p q|^{2}
\end{aligned}
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$$
q_{x}^{2}+q_{y}^{2}-2 p_{x} q_{x}-2 p_{y} q_{y}+\left(p_{x}^{2}+p_{y}^{2}\right)
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$$
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$\Rightarrow h(p)$ and $U$ encode dist. betw. $p$ and any other pt in $z=0$.

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Let $U: z=x^{2}+y^{2}$ be the unit paraboloid in $\mathbb{R}^{3}$.

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