## UNIVERSITÄT WÜRZBURG

## Chair for <br> INFORMATICS I

Efficient Algorithms and Knowledge-Based Systems

# Computational Geometry 

## Convex Partition <br> or

Oblivious Routing

Oblivious routing

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Oblivious routing
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## Minimum Convex Partition of Points Sets

(Often: assume no colinear points.)
$\qquad$

Point set $P$

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Convex hull $\mathrm{CH}(P)$

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A minimal convex partition: 5 faces

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Given a graph $G=(V, E)$, pick a maximum cardinality set $S \subseteq V$ such that no two vertices are adjacent.

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\sum_{j \in P} x_{i j} \geq 3 \quad \forall i \in P, \text { where } i \text { is interior }
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## 3-Approximation

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Degree sum: $2(n-k)+3 k$
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Degree sum: $2(n-k)+3 k+a+2 b$
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There are $a+2 b$ edges arriving at $C H$ from interior.

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\# edges $\geq n+\frac{k}{2}+\frac{a}{2}+b$

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\# edges $\geq n+\frac{k}{2}+\frac{a}{2}+b \xrightarrow{\text { Euler }} \#$ faces $\geq \frac{k}{2}+\frac{a}{2}+b+1$

## An upperbound

Lemma There is a convex partition $E$ of $P$ such that $|R(E)| \leq \frac{3}{2} k+\frac{3}{2}$.

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## Induction on $k: \quad k \geq 2$

## Chain $C$ with $\ell \geq 2$ points.



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$Q$ has partition with $\frac{3}{2}(k-\ell)+\frac{3}{2}$ faces.


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Total: $\frac{3}{2} k+\frac{3}{2}-\frac{1}{2} \ell+1$.

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Total: $\frac{3}{2} k+\frac{3}{2}-\frac{1}{2} \ell+1$.
Note! $\ell \geq 2 \quad \square$

## Putting it together

Theorem A 3-approximation of a minimum convex partition of $P$ can be computed in $O(n \log n)$ time. (This assumes no colinear points.)

Proof:

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Proof: At the excercise sheet!

