# Seminar Combinatorial Optimization: <br> Graph Decompositions 

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Introduction
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## Main Topics

Idea

- Many combinatorial optimization problems are formulated on graphs.
- Real-world applications typically lead to NP-hard optimization problems on large graphs.
- Global solution algorithms scale badly.
- Idea: Divide and conquer!

Graph Decomposition Toolbox

- Graph Partitioning / Graph Bisection
- Tree Decompositions
- Branch Decompositions


## Minimum Cuts

Let $G$ be an undirected graph with edge weights $w: E(G) \rightarrow \mathbb{R}_{\geq 0}$.
Minimum Cut
Find a non-empty proper subset of vertices $S \subsetneq V(G)$ such that the weight of the edges connecting $S$ with $V(G) \backslash S$ is minimum, i.e., minimize

$$
w(\delta(S))=\sum_{\{u, v\} \in E(G): u \in S, v \notin S} w(u v) .
$$

A minimum cut $\delta(S)$ can be found in polynomial time.
Example ( $w \equiv 1$ )


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Any minimum cut in the cycle graph $C_{n}$ with uniform weights has weight 2 , but the size of $S$ can be any number between 1 and $n-1$.

## Graph Partitioning

Let $G, w$ be as before, and let $\alpha \geq 0$.

## Graph Bisection / Balanced Minimum Cut

Find a non-empty proper subset of vertices $S \subseteq V(G)$ such that $w(\delta(S))$ is minimum and $|V(G)| / 2 \leq|S| \leq(1+\alpha) \cdot|V(G)| / 2$.

Graph $k$-Partitioning
For $k \in \mathbb{N}$, find a $k$-partition $\left(S_{1}, \ldots, S_{k}\right)$ of $V(G)$ such that the weight of the edges between distinct parts is minimum and $\left|S_{i}\right| \leq(1+\alpha) \cdot|V(G)| / k$ for all $i \in\{1, \ldots, k\}$.

Theorem (Garey, Johnson, Stockmeyer, 1976)
The graph bisection problem is NP-hard for $w \equiv 1$ and $\alpha=0$.

## Remark

Terminology: Cut vs. partition $\leftrightarrow$ connected vs. arbitrary. If $\delta(S)$ is an unbalanced minimum (2-)cut in a connected graph, then $S$ is connected.

## Treewidth

Idea
Many NP-hard optimization problems are easy on trees, e.g.:

- longest path
- minimum vertex coloring / chromatic number
- maximum independent set
- periodic timetabling in public transport


## Treewidth

Treewidth measures how "similar" a graph is to a tree.

## Examples



## Tree Decompositions

## Informal Description

Tree decompositions define a "parsing tree" for vertices of a graph. Interpretations of Treewidth

- minimum maximum bag size - 1 among all tree decompositions
- minimum clique size - 1 among all chordal completions
- minimum $k$ for which the graph is a partial $k$-tree

Examples


$$
\{1,2\}-\{2,3\}-\{3,4\}-\{4,5\}-\{5,6\}
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treewidth 2

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Examples


$$
\{3,4,5\} \longrightarrow\{2,3,5,6\} \longrightarrow\{1,2,6\}
$$

treewidth 3

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treewidth 4

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Examples


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treewidth 5

## Branch Decompositions

## Branch Decomposition

A branch decomposition of a graph $G$ is an unrooted binary tree whose leaves are in bijection with $E(G)$.

## Branchwidth

Any edge of a branch decomposition tree gives a partition $E(G)=E_{1} \dot{\cup} E_{2}$. The width of such an edge is the number of vertices incident to both $E_{1}$ and $E_{2}$ (cardinality of vertex separator). The branchwidth of a graph is the minimum maximum width of an edge among all branch decompositions.

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Example


## More on Tree- and Branchwidth

## More Facts

- Computing tree- and branchwidth is in general NP-hard.
- Tree- and branchwidth are within constant factors of each other:

$$
b w \leq t w+1 \leq\lfloor 3 / 2 b w\rfloor .
$$

## Impact on Optimization

Some problems become solvable in polynomial time on graphs with fixed tree- or branchwidth:

- minimum vertex coloring / chromatic number
- maximum independent set
- computing an optimal tree or branch decomposition
- Courcelle's meta theorem on monadic second-order logic


## Organization

## Outline

- Papers: will be sent by e-mail this week.
- Kick-off: short (5 minutes) presentation on your topic Wednesday, November 20, 10 am, ZIB 2006 (this room)
- Summary: 5-8 pages, LaTeX, January
- Talks: 45 minutes, February
- Details and reminders will be sent in time by e-mail.


## Contact

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